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# PREFACE

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# A deep learning approach to dysarthric utterance classification with BiLSTM-GRU, speech cue filtering, and log mel spectrograms

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## Abstract

Assessing the intelligibility of dysarthric speech, characterized by intricate speaking rhythms presents formidable challenges. Current techniques for objectively testing speech intelligibility are burdensome and subjective, particularly struggling with dysarthric spoken utterances. To tackle these hurdles, our method conducts an ablation analysis across speakers afflicted with speech impairment. We utilize a unified approach that incorporates both auditory and visual elements to improve the classification of dysarthric spoken utterances. In our quest to enhance spoken utterance recognition, we propose employing two distinctive extractive transformer-based approaches. Initially, we employ SepFormer to refine the speech signal, prioritizing the enhancement of signal clarity. Subsequently, we feed the improved audio samples into Swin transformer after converting them into log mel spectrograms. Additionally, we harness the power of the Swin transformer for visual classification, trained on a dataset of 14 million annotated images from ImageNet. The pre-trained scores from the Swin transformer are utilized as input for the deep bidirectional long short-term memory with gated recurrent unit (deep BiLSTM-GRU) model, facilitating the classification of spoken utterances. Our proposed deep BiLSTM-GRU model for spoken utterance classification yields impressive results on the EasyCall speech corpus, encompassing cognitive characteristics across spoken utterances ranging from 10 to 20, delivered by both healthy individuals and those with dysarthria. Notably, our results showcase an accuracy of 98.56% for 20 utterances in male speakers, 95.11% in female speakers, and 97.64% in combined male and female speakers. Across diverse scenarios, our approach consistently achieves remarkable accuracy, surpassing other contemporary methods, all without necessitating data augmentation.

**Keywords** Supervised model · Dysarthric utterance classification · SepFormer · Swin transformer · Audio-visual modalities

Extended author information available on the last page of the article

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## 1 Introduction

A brain injury can lead to a motor speech disorder called dysarthria, where the muscles involved in speech production become weakened or paralyzed, resulting in unclear or disorganized speech [1]. While speech recognition technology performs impressively for typical speakers, options for dysarthric speakers using these systems are limited, often lacking training with statistical acoustic models alone [2]. This limitation arises from the substantial training data needed by recently developed deep neural network (DNN) architectures. Gathering a significant amount of speech data from individuals with dysarthria poses challenges, and accurately distinguishing between normal and impaired speech remains difficult [3, 69]. Dysarthria commonly occurs in elderly individuals with neurocognitive conditions like Alzheimer's disease (AD) and is linked with neuro-motor abnormalities. Tailoring automatic speech recognition (ASR) technologies specifically for this demographic can notably enhance their quality of life by enabling widespread automatic early detection of neurocognitive impairment [4].

A two-step model adaptation approach for dysarthric speech recognition (DSR) is introduced by [5]. Initially, a speaker-independent (SI) dysarthria model is trained by adapting an SI non-dysarthria model to the speech of various dysarthric speakers. In the subsequent step, a speaker-dependent (SD) dysarthria model is derived by further adapting the SI dysarthria model to the specific target dysarthric speaker. This method involves adapting the SI non-dysarthria model to prevalent dysarthric speech characteristics such as unclear consonants, inserted speech noise, and prolonged duration. The approach transfers shared knowledge from the SI non-dysarthria to SI dysarthria models and extends it to the target SD dysarthria model. The two-step adaptation method demonstrates superior performance over a traditional one-step adaptation approach. Inconsistent vowel articulation and insufficient consonant articulation are primary contributors to the degradation of speech understanding in dysarthria. The speech recognition model [6] is notably more suitable for dysarthric speakers compared to a generic system [7] due to these significant differences.

The primary objective of this study is to develop a recognition model for detecting dysarthric speech by leveraging two pre-trained networks: the SepFormer model [47] for speech enhancement (denoising) and the Swin Transformer v2 [63] for log mel spectrogram classification. This paper extensively utilizes a speech enhancer and an image model to integrate the simultaneous functionalities of both audio and visuals. The model presented here comprises four primary components: (a) a SepFormer transformer as a speech enhancement tool to separate noise from spoken utterances, thereby enhancing the quality of dysarthric speech; (b) extraction of log mel spectrograms from the enhanced audio samples in 2D image format; (c) utilization of a Swin Transformer pre-trained network to analyze the obtained 2D log mel spectrograms, leveraging pre-training on 14 million Annotated ImageNet images; and (d) the proposed deep BiLSTM-GRU model. To capture intricate characteristics, our proposed model utilizes advanced deep learning techniques. Furthermore, given that speech recognition statistics

often incorporate visual data, we opt to evaluate the proposed method for spoken utterance classification on a challenging dataset featuring speech impairments.

The primary contributions of our research are outlined as follows:

1. We have introduced an optimized deep BiLSTM-GRU model tailored specifically for spoken utterance classification.
2. Additionally, we have presented a singular-branch architecture for audio and visual pre-trained processing networks, employing two distinct transformers [68]. This architecture aims to extract salient features.
3. We conduct comprehensive analysis and testing using challenging dysarthric datasets, notably the EasyCall corpus [31], to showcase how our proposed model effectively replicates representations of descriptive audio and visuals. Our model delivers ground-breaking results for dysarthric spoken utterance classification (DSUC).

Our motivation for exploring dysarthric speech lies in our endeavor to develop an enhanced classification model that can greatly benefit individuals with speech impairments. We are driven by the belief that technology can play a transformative role in promoting inclusivity and overcoming communication barriers. Our commitment to this cause is unwavering, as we aim to contribute further to this field, recognizing the profound impact it can have on society.

The structure of this article is as follows: Sect. 2 provides an overview of recent advancements in the field of DSR, with a strong emphasis on the use of deep learning techniques. In Sect. 3, we delve into detail about our proposed approach. Section 4 discusses the experimental details, including insights from the EasyCall corpus and the results of the ablation study. Finally, Sect. 5 offers concluding remarks on our research analysis.

## 2 Related work

This section provides a summary of the literature on DSR in datasets featuring strong cognitive qualities. It outlines various conventional speech enhancement and speech recognition techniques, highlighting their respective advantages and disadvantages. Commonly used classical ASR models include hidden Markov models (HMMs), support vector machines (SVMs), and artificial neural networks (ANNs). However, it is observed that deep learning (DL) techniques have been notably successful in achieving state-of-the-art (SOTA) performance in this domain.

In 1995, Jayaram and Abdelhamied utilized data from individuals with mild speech intelligibility issues to create a dysarthric-specific ASR, combining HMM-ANN hybrid technology [8]. While existing speech recognition technology on the market exhibits remarkable performance for typical speakers, its availability for individuals with dysarthria is limited, and statistical acoustic models alone are not commonly employed [2]. This limitation arises from the fact that recent advancements in deep neural network architectures necessitate extensive training data, which can be

challenging to collect, particularly from individuals with dysarthria. To address this challenge, the universal access (UA)-Speech database is utilized for ASR training, showcasing superior performance over traditional models across various dysarthria severities [10]. The dysarthric-specific HMM-based speech recognizer, as documented by [11], achieves an average recognition rate of 69.1%. However, the study does not delve into word error rate (WER) or dysarthric speech intelligibility.

Another dysarthric ASR, detailed in [12], employs ANNs to recognize 10 utterances from a single dysarthric subject with 20% speech intelligibility, achieving a recognition rate of 78.25%. While ANNs have demonstrated success with natural speech, they are increasingly utilized in products such as smartphone personal assistants. However, significant amounts of training data are required for advancements in ASR with deep learning to yield substantial progress. Since ASR systems are primarily trained on regular speech, they often misclassify the majority of dysarthric speech [13]. Obtaining a sufficient amount of speech data [14] for training models on individuals with articulation difficulties pose a significant challenge. Their speech patterns, characterized by athetoid symptoms, differ markedly from those without physical disabilities, presenting a more intricate challenge for speech recognition.

In [15], authors propose dysarthric speech synthesis by applying temporal and speed adjustments to natural speech from the UA corpus. The healthy speech data, subjected to tempo perturbations, is then categorized into various forms of dysarthric speech using a random forest classifier. Subsequently, a DNN-HMM-based ASR system is trained for each class of dysarthric speakers using the additional data. For the isolated words utilized in this study, the average WER for speakers in the severe dysarthric speech group is reported as 70.47%.

Modifying dysarthric speech increases the training data [16]. The application of speed and tempo perturbation techniques to the signal enhances the dysarthric speech dataset. By employing a data selection approach, information is transferred from the source data (normal speakers) to the enhanced target dysarthric speech data. The augmented dataset is then trained using a factored version of temporal delay neural networks (TDNN-F) incorporating convolutional neural networks (CNNs). The study specifically focuses on the UA single-word speech corpus. The combination of transfer learning and data augmentation results in an average WER of 30.76%.

Recent advancements in neural networks over the past decade have significantly improved speech augmentation and audio source separation tasks, surpassing traditional spectrum-based speech enhancement methods [48, 50]. A modified DNN proposed by [17] aims to enhance the understandability of speech. This hybrid model enhances signal quality, achieving higher efficiency and improved results through the calculation of minimal error values. However, it is limited in reducing computational expenses.

In the pursuit of enhancing speech intelligibility, [18] introduced a deep learning-based method for speech improvement. The signal is divided into features, or frames, which are utilized for channel estimation. Performance is evaluated under the influence of ambient noise, resulting in reduced processing delay and enhanced reliability across all auditory devices. Additionally, [19] models the delta-amplitude modulation spectrogram (delta-AMS) method to improve speech understanding. A

feature extraction model is employed to eliminate the noise spectrum. The features extracted from the frames are then utilized to select the optimal frame mask within the noisy signal, leading to improved outcomes across varying levels of noise. The deep belief network (DBN) is utilized to enhance the signal by adjusting the delta parameter.

For voice recognition, [20] developed an adversarial neural network. The improved results and enhanced performance are observed across all severity levels. Researchers have indicated that speakers encompassing 11 subjects exhibit greater effectiveness. Neurological conditions such as Parkinson's disease (PD) [21], cerebral palsy (CP) [22], and brain damage resulting from strokes or head injuries are among the root causes of dysarthria. Characterized by weakness, sluggishness, lack of coordination, altered muscle tone, and imprecise oral and vocal movements [7], this condition leads to distorted speech quality and reduced intelligibility. Utilizing speech-driven assistive technology proves advantageous for individuals with dysarthria, providing speech as an interface for communication [24] or enabling them to control physical devices [25]. This is particularly valuable given the frequent association of dysarthria with physical disabilities. Table 1 offers an overview of pertinent techniques for DSR and analysis.

Researchers have endeavored to advance DSR systems through the generation of novel datasets [10] or the application of data augmentation techniques to mitigate data sparsity [27, 28]. Diverse approaches have been employed to capture the variability inherent in dysarthric speech. Modifying speech tempo can be achieved both in the signal domain [15] and the feature domain [30] to alleviate discrepancies between dysarthric and typical speech. In articulatory knowledge is utilized to mitigate inter-speaker variability [30]. The variability of DNN models can be reduced by incorporating visual information [32]. In endeavors to enhance DSR, bottleneck features have been extracted by leveraging extensive data from typical speakers using DNNs [33] or convolutive bottleneck networks [34]. Adaptation techniques are commonly employed to address the inherent diversity in the data.

The PEAKS method utilizes ASR for assessing speech and voice abnormalities in laryngectomees and children with cleft lip and palate [36]. WER proves beneficial in assessing speech impairments, offering insights not only into speech recognition systems but also for the evaluation of communication challenges [35]. To assess intelligibility problems in PD patients, two characteristics based on word correctness and dynamic-time warping techniques are developed [37]. The effectiveness of these characteristics is evaluated on the PC-GITA corpus [37] for recognizing words in numerous phrases and for use in differentiating PD patients from healthy control (HC) participants (with accuracies of up to 92%) [38]. Similarly, [39] proposes an ASR system based on HMMs. The authors evaluated this approach through diadochokinetic tasks within the same corpus, revealing WERs of 2.90 for healthy control (HC) participants and 7.10 for individuals with PD [39].

The domain of trained speech representations for impaired speech is still in its early stages of development. Wav2Vec has shown promising results in identifying Alzheimer's disease through speech analysis [40]. The utility of speech representations for DSR [64–66] has been explored in only a limited number of research studies. By simulating dysarthria aspects in the training data, the speech synthesis

**Table 1** DSR literature summaries relevant to the topic

| References | Method | Dysarthria | Performance |
|---|---|---|---|
| (Hasegawa-Johnson et al. 2006) [9] | HMM—SVM | ✓ | The HMM and SVM-ASRs are efficient; however, they tend to omit consonants from the words. Although HMM dysarthric ASRs provide robustness against changes in large-scale word lengths, SVMs may sustain the loss of consonants |
| (Kim et al. 2008) [10] | Phonetic and phonological analysis | ✓ | The ASR is trained using the UA-Speech database and performs more effectively than conventional ASRs at all degrees of dysarthria severity |
| (Selouani et al. 2009) [11] | HMM | ✓ | The HMM-based dysarthric-specific speech recognizer is reported to have an average recognition rate of 69.1%; however, WERs and dysarthric speech intelligibility are not examined in this study |
| (Dede et al. 2010) [12] | ANN | ✓ | A dysarthric ASR used ANNs to recognize a single dysarthric subject's 10-word utterances with 20% speech intelligibility, and it successfully achieved a 78.25% recognition rate |
| (Xiong et al. 2018) [13] | DNN-HMM | ✓ | The best baseline performance, with a WER of 48.36%, is provided by the combination of fMLLR features and DNNs, surpassing traditional FBANK features as the input for DNN |
| (Vachhani et al. 2018) [15] | DNN-HMM | ✓ | As compared to ASR performance utilizing healthy speech alone for training, tempo-based and speed-based data augmentation produced absolute improvements of 4.24% and 2%, respectively |
| (Khaleelur et al. 2021) [18] | Speech Enhancement using DNN | ✓ | 0.0157, 0.0131, and 0.0121, respectively, for the Speech Intelligibility Index (SII); and 0.00807, 0.00424, and 0.00357 for the SII at +4 dB SNR |
| (Woszczyk et al. 2020) [20] | Domain adversarial neural networks (DANN) | ✓ | DANN outperforms the baseline by 12.18% and achieves an absolute recognition rate of 74.91% |

models can learn to generate speech that is more robust and adaptable to different speech disorders or variations in speech patterns. Tacotron [41], FastSpeech [42], and Deep-Voice [43] are examples of end-to-end Text-to-Speech (TTS) systems that produce synthesized speech with excellent quality and naturalness while adjusting prosody. These neural voice synthesizers have been used to generate new utterances for low-resource language ASR applications [44]. In multi-speaker speech synthesis systems, the incorporation of speaker embeddings enables the generation of speech across various speaker styles, facilitating the learning of prosodic features and speaker and style variations from the training set [45]. This capability allows for the creation of a substantial amount of high-quality synthesized speech, encompassing diverse speaker characteristics and speech patterns. These advancements in speech analysis inspired us to undertake an ablation analysis of dysarthric speech without augmenting training data.

## 3 Proposed methodology

We present a novel approach for classifying dysarthric spoken utterances, utilizing a deep BiLSTM-GRU model. Our method leverages denoised audio signals alongside visual representations. The subsequent subsections outline the procedural flow of our proposed approach.

### 3.1 Data-handling and preprocessing

In our approach, we employed the SepFormer to improve the quality of audio samples. The SepFormer model [46] plays a crucial role in handling audio samples by effectively separating them into distinct sources. It achieves this by identifying and isolating two main sources within the audio input [47, 49, 67]. Typically, these two sources capture the primary signal of interest, such as speech, along with any accompanying noise or background interference. Once the separation process is completed, the SepFormer model produces the final output consisting of the isolated sources. Each source represents a distinct element of the original audio input. For instance, one source might contain the extracted speech signal, while the other could contain residual noise or unwanted elements. By isolating various sources within the audio input, SepFormer significantly enhances the performance of subsequent tasks such as speech recognition, speaker diarization, or sound classification. This capability to separate out noise helps mitigate interference and ultimately improves the accuracy of these tasks.

The use of this tool aims to refine the audio features, potentially leading to enhanced clarity and quality of the spoken phrase/utterance.

### 3.2 Log mel spectrograms (voicegrams)

Following the acquisition of enhanced speech audio samples, we utilize the Librosa package to generate log mel spectrograms. This extraction process involves applying

a short-time Fourier transform to the spoken signal, converting the resulting amplitudes to decibels, and mapping the frequencies to the Mel scale. These 2D representations of log mel spectrograms, extracted from audio samples featuring diverse speakers, serve as input for speech classification across both the 10 and 20 spoken utterances of the EasyCall corpus.

Figure 1 illustrates a selection of extracted log mel spectrograms derived from enhanced audio samples processed using SepFormer. These spectrograms depict the transformed audio data, demonstrating the effectiveness of SepFormer in enhancing audio quality. Subsequently, the enhanced log mel spectrograms are input into the Swin transformer, as detailed in the subsequent section.

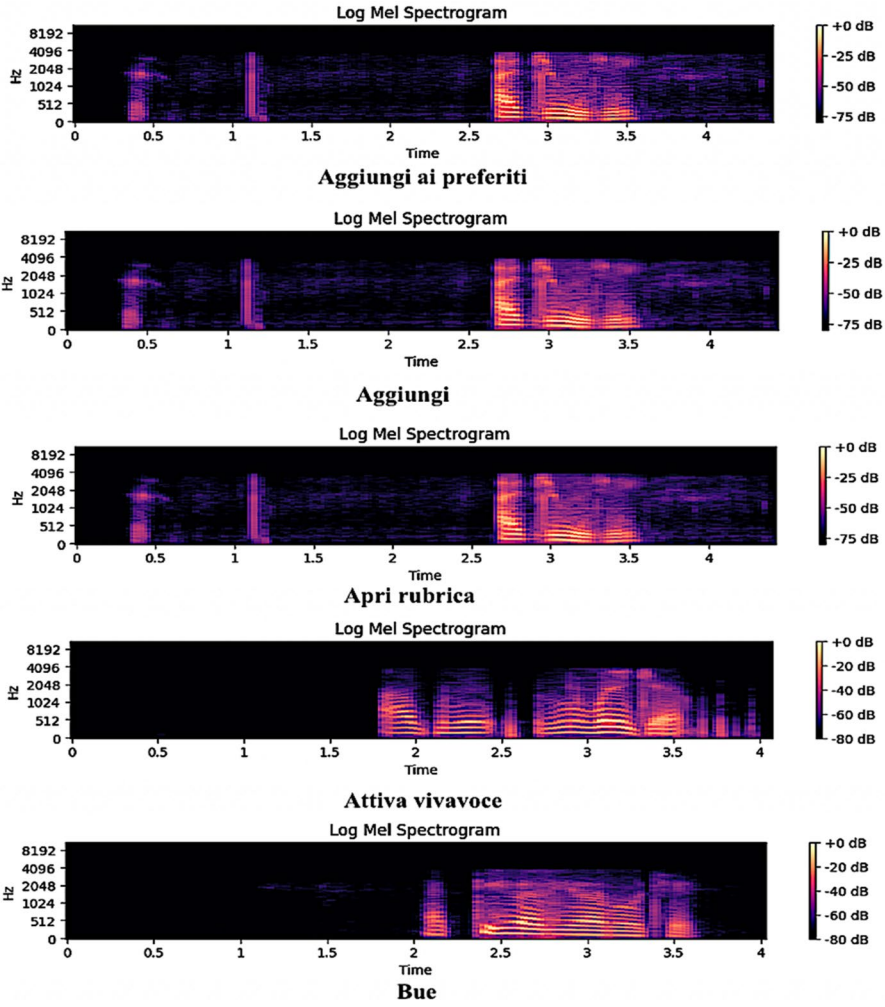


**Fig. 1** A snippet of a few samples of extracted log mel spectrograms from enhanced audio samples processed through SepFormer

### 3.3 Computer vision Swin transformer

The Swin transformer [63] boosts its performance through smart techniques like residual-post-norm and cosine attention, which make training more stable. It also uses log-spaced continuous position bias and a self-supervised training method called SimMIM, reducing the need for tons of labeled images. In real-world situations, it is great at classifying log mel spectrograms from a massive ImageNet dataset. Its main job is to predict labels for 20 spoken phrases by comparing these spectrograms. It does this by building feature maps through self-attention [52] in small chunks. The end result is a set of probability scores, generated by running the spectrogram data through a pre-trained network trained on ImageNet. Swin Transformer, often regarded as a variant of space transformation, is especially relevant in computer vision. It functions by breaking down the input image into patches and systematically processing them through several layers [51] of self-attention mechanisms [52]. Through this method, the original spatial layout of the image is effectively converted into a sequential arrangement of tokens, enabling further processing using the Transformer architecture.

Utilizing denoised audio signals alongside visual representations, such as log mel spectrograms, for image classification via Swin Transformer has demonstrated remarkable effectiveness, particularly for impaired speakers.

Our approach involves employing a sophisticated strategy that seamlessly integrates the use of both audio and visual information to classify spoken utterances.

Figure 2 illustrates the sequential flow of our proposed approach, leveraging SepFormer and Swin Transformer, leading to the incorporation of BiLSTM-GRU for enhanced classification.

### 3.4 Proposed unified deep framework for single-branch integration of audio and visual representations

Our work assumes that combining denoised audio signals with enhanced log mel spectrograms in a single deep framework will boost speech recognition performance. We use the BiLSTM-GRU to enhance classification accuracy. It takes pretrained scores from the Swin transformer as input. Figure 3 shows the architecture of our deep BiLSTM-GRU model for classifying spoken phrases. In Fig. 3, a single layer of BiLSTM consists of L cells, representing the cells of the forward LSTM, and L' cells, representing the cells of the backward LSTM.

The deep BiLSTM-GRU model receives the extracted visual information of audio as input. Our proposed deep BiLSTM-GRU model comprises two initial BiLSTM layers with 512 and 256 units each, followed by a gated recurrent layer with 128 units and the *tanh* activation function. Subsequently, it features a high-level combination of alternate BiLSTM and GRU layers with 64 units and 32 units of another BiLSTM, alongside dense layers of 32, dropout of 0.3, and dense layers of 20.

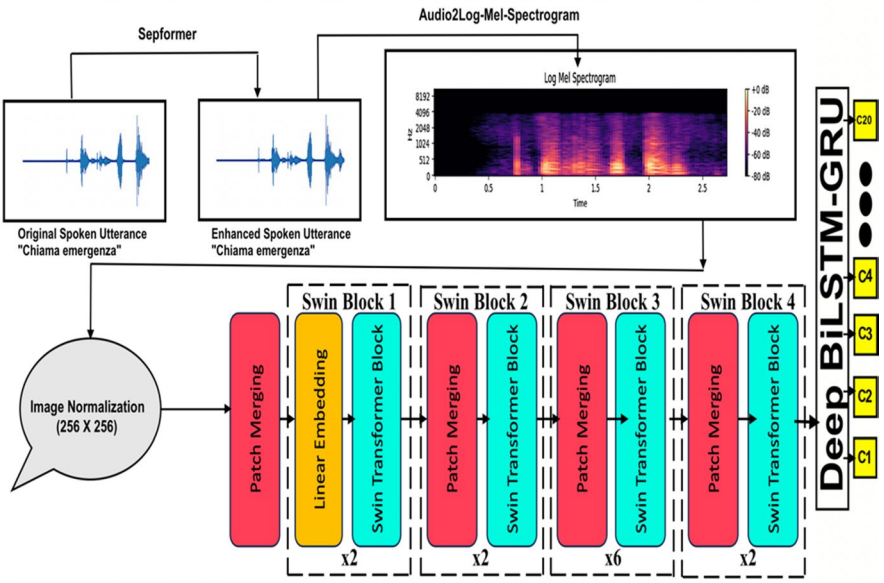


**Fig. 2** A step-by-step procedure for the proposed approach

Notably, the model is deep, consisting of a total of 4 BiLSTM layers and 2 GRU layers. The forward and backward hidden states are obtained by feeding the input features into two LSTMs, one forward and one backward. Our deep BiLSTM-GRU model utilizes the *softmax* activation function, which generates a probability for each class prediction.

One of the primary challenges with basic RNNs is their tendency to lose crucial information when processing lengthy sequences. Long Short-Term Memory (LSTM) networks [53] are designed to address this issue by effectively retaining and recalling information from long data sequences to comprehend relationships between disparate data points. These models are equipped with three gates—an output gate, an input gate, and a forget gate—which facilitate the flow of gradients. Additionally, LSTMs feature a cell state (representing the network's memory) and a hidden state used for making predictions. The forget gate determines which information should be discarded from the cell state. The forget gate, essentially a sigmoid function, outputs a value between 0 and 1 for each component of the cell state when the data $x_t$ and the hidden state $h_{t-1}$ are provided as inputs. A 0 signifies information discarding, whereas a 1 indicates information retention. The output gate first runs a sigmoid layer over the data $x_t$ and the hidden state $h_{t-1}$. After passing through a *tanh* layer, the results are multiplied by $c_t$ to create the new hidden state $h_t$.

The process of first computing the hidden states from the front to the back and then vice versa, and then integrating the two results is referred to as "bidirectional LSTM". LSTM accepts three types of inputs: samples, features, and time-steps. The preceding

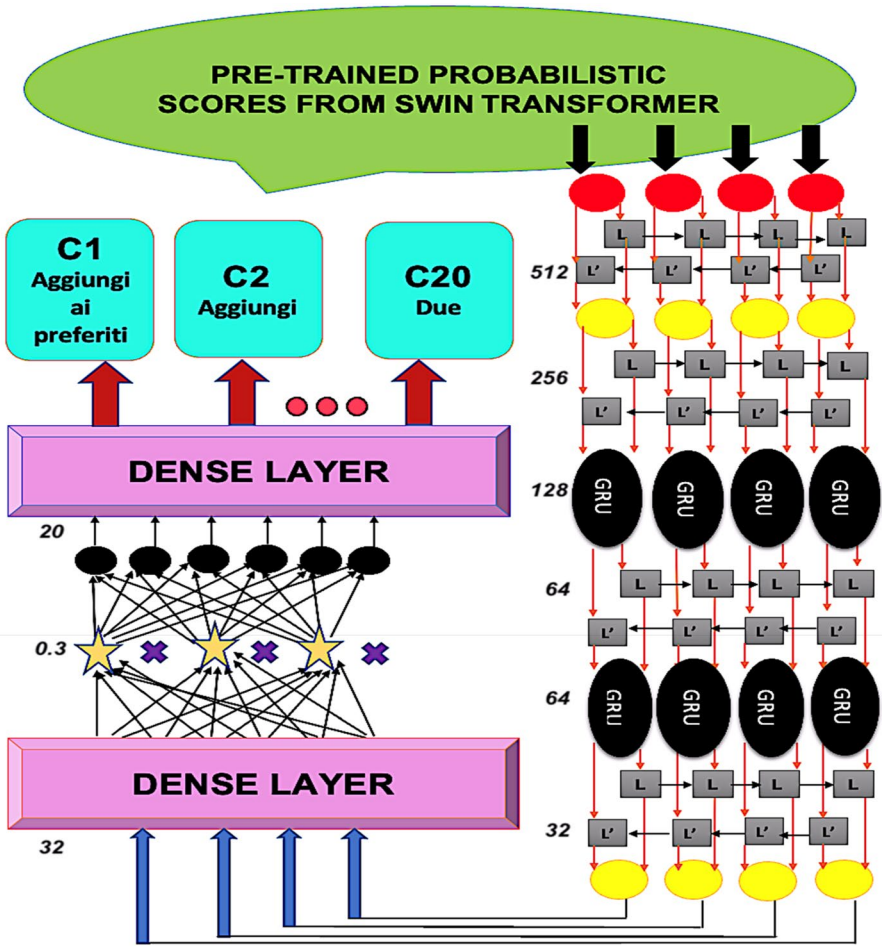


**Fig. 3** A proposed deep BiLSTM-GRU model for dysarthric spoken utterance classification

memory is recursively linked to each time-step input. The classification of sequential data, including audio [53] and images, is frequently employed. Let $x_t$ denote the LSTM input, representing the vectors derived from sequential data. The hidden state of the current timestamp is denoted by $h_t$, and the hidden state of the prior timestamp is denoted by $h_{t-1}$. For the forget, input, and output gates (Eq. (2–4)), the input and previous hidden state combine to form the vector $X$ shown in (1), which is the input. Here, the biases are $b_i$, $b_f$, and $b_o \in R^h$ for the input ($i$), forget ($f$), and output ($o$) gates, which are calculated during the training phase. Additionally, *Wi, Wf, Wo* are weight matrices. The sigmoid function is denoted as $\sigma$.

$$X = [ht - 1; xt] \tag{1}$$

$$ft = \sigma\,(Wf\,X\,+\,bf) \tag{2}$$

$$it\,=\,\sigma\,(Wi\,X\,+\,bi) \tag{3}$$

$$ot\,=\,\sigma\,(Wo\,X\,+\,bo) \tag{4}$$

Gate activations are represented by *f*, *i*, and *o* in Eq. (2)–(4). The hyperbolic tangent function is referred to as *tanh*, and * denotes element-wise multiplication. The previous and present cell states are denoted in Eq. (5) by the letters $c_{t-1}$ and $c_t$, respectively.

$$c_t = f\,t * c_{t-1} + it * \tanh\,(Wc * X\,+\,bc) \tag{5}$$

The hidden state at time-step *t* is represented as:

$$ht\,=\,ot * \tanh\,(ct) \tag{6}$$

Two hidden layers, one for the forward pass and the other for the backward pass, are used in BiLSTM. The final hidden state is the concatenation of the hidden states computed in the forward ($h_{tf}$) and backward ($h_{tb}$) passes. BiLSTM-GRU can produce effective outcomes. Moreover, the network can conduct training more easily due to GRU, significantly increasing training effectiveness. The advantage of a bidirectional recurrent neural network is present in BiLSTM-GRU. Consequently, the bidirectional LSTM-GRU, incorporating advanced learning technology, is used in this work. To obtain the latest node input $c_t$, the neural network combines the previous node $h_{tf}$ and the node input $x_t$ simultaneously, and then obtains the output $h_{tb}$. This process involves passing through LSTM, including the forget gate, input gate, and output gate. Finally, the output $h_{tb}$ is used as the output of the previous stage of the GRU, and the most recent state $h_t$ is obtained after the update gate and reset gate. Data are input and initialized to establish the parameters necessary for LSTM to learn when modifying the model to define the LSTM cell class. Likewise, data are input and initialized to determine the parameters that GRU needs to learn when defining the GRU cell class. The output layer utilizes a softmax operation to produce the probability distribution of normal rolling bearing life samples or major problems, while the hidden layer in the RNN employs the tanh activation function.

$$\mathrm{ht}\,=\,\tanh\,(\mathrm{Whh} * \mathrm{ht} - 1\,+\,\mathrm{Wxh} * \mathrm{xt}) \tag{7}$$

$x_t$ is the RNN input at time *t*. The forward and reverse cells of the bidirectional RNN use LSTM and GRU cells, respectively. Data are input and initialized to establish the parameters necessary for LSTM to learn when modifying the model to define the LSTM cell class. Likewise, data are input and initialized to determine the parameters that GRU needs to learn when defining the GRU cell class. The output layer utilizes a softmax operation to produce the probability distribution of normal rolling bearing life samples or major problems, while the hidden layer in the RNN employs the tanh activation function.

## 4 Experimental results and discussion

### 4.1 EasyCall corpus: a dysarthric speech dataset

The EasyCall corpus [31] consists of Italian 31 dysarthric speakers (11 females, 20 males) and 24 healthy speakers (10 females, 14 males) who contributed utterances to the corpus. Inclusion criteria for dysarthric speakers include age greater than or equal to 18 and dysarthria resulting from Parkinson's disease, Huntington's disease, Amyotrophic Lateral Sclerosis, peripheral neuropathy, or myopathic or myasthenic lesions. Exclusion criteria encompass aphasic syndromes, dementia, and intellectual incapacity. An expert neurologist employed the therapy outcome measure (TOM) to assess the type and severity of dysarthria in each dysarthric speaker. TOM scores range from 1 to 5, with 1 indicating mild, 2 mild-moderate, 3 moderate, 4 moderate-severe, and 5 severe dysarthria. The summary of challenges per spoken utterance is presented in Table 2. Additionally, Fig. 4 illustrates the number of samples in the dysarthric speech corpus. Spoken utterances are represented on the x-axis, while the y-axis displays the count of samples. We have categorized the information pertaining to both healthy individuals and those with dysarthria into a single group.

These utterances include various commands such as "Aggiungi ai preferiti", "Aggiungi", "Apri rubrica", "Apri", "Attiva vivavoce", "Bue", "Cancella contatto", "Cancella tutto", "Cancella", "Cella", "Chiama emergenza", "Chiama ultimo numero", "Chiama", "Chiamata", "Chiudi applicazione", "Chiudi rubrica", "Chiudi", "Cinque", "Deseleziona", "Disattiva vivavoce", and "Due".

The Easy Call Corpus can potentially be used for developing voice-controlled contact information systems. By providing a dataset of spoken utterances, including those from individuals with dysarthria, the corpus offers a diverse range of speech samples that can be utilized to train and evaluate voice recognition and command systems.

### 4.2 Experimental details and analysis

We conducted our experiments using Python version 3.10.0 on a Mac computer with macOS Big Sur and an M1 chip. Our code is available online at https://github.com/sunakshimehra/ADVANCE-DUSC for future reference. To handle audio samples and transformers, which require substantial computation, we used Google Colab Pro, which offers a GPU and 32 GB of RAM.

Before using the deep BiLSTM-GRU model, we first calculated the log mel spectrogram feature matrix for each raw audio file, resulting in a $256 \times 256$ dimension. This matrix is then fed into the Swin transformer. After that, we input the pre-trained probabilistic scores obtained from the Swin transformer into the trained deep BiLSTM-GRU model.

For our ongoing experiment, we ran the model for 100 epochs, using the "ReLu" activation function to enhance nonlinearity. We used the Adam optimizer to control

**Table 2** Summary of EasyCall Corpus data used in data preprocessing

| Spoken Utterances | Speaker code | Type of dysarthria | Therapy Outcome Measure (TOM) | *Number of Sessions* | *Number of wav files* |
|---|---|---|---|---|---|
| Aggiungi ai preferiti | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Aggiungi | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Apri rubrica | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Attiva vivavoce | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 353 |
| Bue | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Cancella contatto | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Cancella tutto | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Cancella | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Cella | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 166 |
| Chiama emergenza | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Chiama ultimo numero | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Chiama | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Chiamata | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Chiudi applicazione | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Chiudi rubrica | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 168 |
| Chiudi | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Cinque | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Deseleziona | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 167 |
| Disattiva vivavoce | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 169 |
| Due | *[F01-F11, M01-M20]* | *Paretic, cerebellar, extrapyramidal, pyramidal* | [_, 1, 2, 3, 4, 5] | [2–6] | 166 |

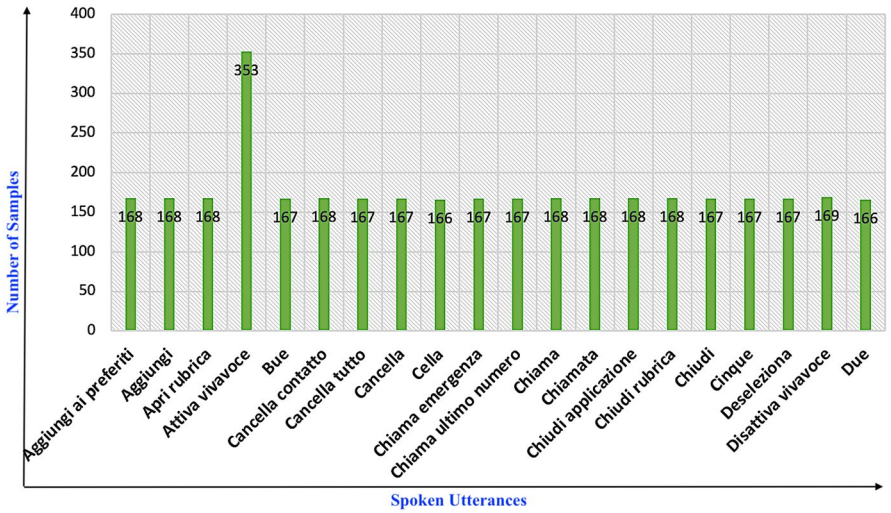


**Fig. 4** Characteristics of EasyCall Corpus for first 20 spoken utterance

the learning rate during stochastic gradient descent [54], as it is known for its consistent performance in classification tasks.

In our experiments, we used a 70:30 train-test ratio and applied fivefold cross-validation. We did not need separate folders for training and testing because of our dataset structure. Our method performed exceptionally well, reaching a maximum test accuracy of 97.64%, outperforming other methods like CNNs using 2D MFCC features. While LSTMs are good at categorizing sounds with mel spectrograms, our approach is even more effective. Table 3 provides summaries of various measures.

**Table 3** List of Abbreviations

| Definition | Abbreviation |
|---|---|
| True positives | TP |
| True negatives | TN |
| False positives | FP |
| False negatives | FN |
| Matthews correlation coefficient | MCC |
| Cohen's kappa | k |
| Observed agreement between raters | po |
| Expected agreement between raters | pe |
| Negative Predictive Value | NPV |
| False Positive Rate | FPR |
| False Negative Rate | FNR |
| False Discovery Rate | FDR |

**Table 8** Performance analysis with different techniques by evaluation measures on EasyCall corpus

| 20 Male and Female Spoken Utterances | Macro | Accuracy (%) | MCC | k | Precision | Recall | F1-Score |
|---|---|---|---|---|---|---|---|
| MFCC + LSTM [55] | 0.4099 | 40.98% | 0.4084 | 0.4084 | 37.88 | 42.77 | 40.33 |
| MFCC + LSTM [56] | 0.4361 | 43.63% | 0.4353 | 0.4353 | 40.11 | 46.47 | 43.29 |
| Mel-Spectrogram + LSTM [57] | 0.3787 | 37.85% | 0.3777 | 0.3777 | 34.29 | 40.93 | 37.61 |
| GFCC + CNN [58] | 0.4345 | 43.44% | 0.4332 | 0.4332 | 39.13 | 47.02 | 43.07 |
| MFCC + CNN [59] | 0.4123 | 41.21% | 0.4112 | 0.4112 | 37.52 | 44.85 | 41.19 |
| MFCC + CNN [60] | 0.4325 | 43.21% | 0.4315 | 0.4315 | 40.01 | 44.86 | 42.44 |
| Hybrid CNN + BiLSTM [61] | 0.4711 | 47.08% | 0.4701 | 0.4701 | 42.61 | 51.09 | 46.83 |
| Our proposed deep BiLSTM-GRU | 0.9769 | 97.64% | 0.9756 | 0.9756 | 96.06 | 98.33 | 97.20 |

The accuracy of our proposed technique is compared to current best practices in Table 8

The MCC provides a comprehensive evaluation of classification quality by considering TP, TN, FP, and FN. It ranges from -1 to 1, where 1 indicates perfect prediction, 0 suggests random prediction, and -1 signifies complete disagreement between prediction and observation. Our approach achieves an MCC of 0.9756, indicating well-balanced classification performance assessment, particularly beneficial for handling imbalanced datasets.

Cohen's kappa coefficient is like a measure of how much people agree when sorting things into categories. It takes into account if they might just agree by chance. The score goes from 0 to 1, where 1 means there's perfect agreement. Our method got a really high score of 0.9756, showing that there's a strong agreement between different raters or observers when categorizing things.

$$\text{MCC} = (\text{TP}*\text{TN} - \text{FP}*\text{FN}) / \sqrt{(\text{TP} + \text{FP})(\text{TP} + \text{FN})(\text{TN} + \text{FP})(\text{TN} + \text{FN})} \quad (8)$$

$$k = \frac{\text{po} - \text{pe}}{1 - \text{pe}} \quad (9)$$

Using the true positives, true negatives, false positives, and false negatives as indicated in Eq. 10, the accuracy is determined. Precision, recall, and F1-score shown in Eq. 11–13, respectively, are vital metrics when it comes to assessing the effectiveness of classification models.

$$\text{Accuracy}\ (\%) = (\text{TP} + \text{TN}) / (\text{TP} + \text{FP} + \text{FN} + \text{TN}) * 100 \quad (10)$$

$$\text{Precision} = \frac{\text{TP}}{[\text{TP} + \text{FP}]} \quad (11)$$

$$\text{Recall} = \frac{\text{TP}}{[\text{TP} + \text{FN}]} \tag{12}$$

$$F1 - \text{Score} = \frac{2 \times \text{Precision} \times \text{Recall}}{\text{Precision} + \text{Recall}} \tag{13}$$

### 4.3 Ablation study

In this section, we conduct ablation research to examine the effects of individual speakers (male or female) as well as the combination of both on our deep BiLSTM-GRU model. We investigate the relevance of the denoised (audio) and log mel spectrogram (visual) component, combinations of male and female speakers, and the deep model itself within our proposed unified framework.

The ablation analysis reveals the following findings, summarized in Table 4, 5, and 6, with an overall assessment presented in Table 7 for each speaker and class. Our new deep framework works better when we use two pretrained networks together in one chain, instead of using each network separately for different things.

Specific scores obtained, including NPV, FPR, FNR, and FDR for each spoken utterances, are provided in Table 4–6. Symbolically, FPR, FNR, and FDR are denoted by Eqs. (15), (16), and (17), respectively.

**Table 4** Classification results on our proposed method for 20-spoken utterances for male speakers

| Spoken Utterances | Sensitivity | Specificity | NPV | FPR | FNR | FDR | Precision |
|---|---|---|---|---|---|---|---|
| Aggiungi ai preferiti | 0.9411 | 0.9984 | 0.9969 | 0.0015 | 0.0588 | 0.0303 | 0.9696 |
| Aggiungi | 0.9743 | 1.0000 | 0.9984 | 0.0000 | 0.0256 | 0.0000 | 1.0000 |
| Apri rubrica | 0.9655 | 1.0000 | 0.9984 | 0.0000 | 0.0344 | 0.0000 | 1.0000 |
| Attiva vivavoce | 0.9666 | 0.9968 | 0.9968 | 0.0031 | 0.0333 | 0.0333 | 0.9666 |
| Bue | 0.9459 | 0.9969 | 0.9969 | 0.0030 | 0.0540 | 0.0540 | 0.9459 |
| Cancella contatto | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0312 | 0.9687 |
| Cancella tutto | 0.9130 | 1.0000 | 0.9970 | 0.0000 | 0.0869 | 0.0000 | 1.0000 |
| Cancella | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Cella | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Chiama emergenza | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Chiama ultimo numero | 0.9565 | 0.9970 | 0.9985 | 0.0029 | 0.0434 | 0.0833 | 0.9166 |
| Chiama | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0285 | 0.9714 |
| Chiamata | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0238 | 0.9761 |
| Chiudi applicazione | 0.9428 | 0.9969 | 0.9969 | 0.0030 | 0.0571 | 0.0571 | 0.9428 |
| Chiudi rubrica | 0.9411 | 0.9969 | 0.9969 | 0.0030 | 0.0588 | 0.0588 | 0.9411 |
| Chiudi | 0.9696 | 1.0000 | 0.9984 | 0.0000 | 0.0303 | 0.0000 | 1.0000 |
| Cinque | 1.0000 | 0.9969 | 1.0000 | 0.0030 | 0.0000 | 0.0476 | 0.9523 |
| Deseleziona | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Disattiva vivavoce | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Due | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |

**Table 5** Classification results on our proposed method for 20-spoken utterances for female speakers

| Spoken Utterances | Sensitivity | Specificity | NPV | FPR | FNR | FDR | Precision |
|---|---|---|---|---|---|---|---|
| Aggiungi ai preferiti | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Aggiungi | 0.9444 | 1.0000 | 0.9971 | 0.0000 | 0.0555 | 0.0000 | 1.0000 |
| Apri rubrica | 1.0000 | 0.9971 | 1.0000 | 0.0028 | 0.0000 | 0.0625 | 0.9375 |
| Attiva vivavoce | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Bue | 0.9500 | 1.0000 | 0.9971 | 0.0000 | 0.0500 | 0.0000 | 1.0000 |
| Cancella contatto | 0.8888 | 1.0000 | 0.9943 | 0.0000 | 0.1111 | 0.0000 | 1.0000 |
| Cancella tutto | 1.0000 | 0.9941 | 1.0000 | 0.0058 | 0.0000 | 0.0689 | 0.9310 |
| Cancella | 1.0000 | 0.9971 | 1.0000 | 0.0028 | 0.0000 | 0.0526 | 0.9476 |
| Cella | 0.9444 | 1.0000 | 0.9971 | 0.0000 | 0.0555 | 0.0000 | 1.0000 |
| Chiama emergenza | 0.8888 | 1.0000 | 0.9943 | 0.0000 | 0.1111 | 0.0000 | 1.0000 |
| Chiama ultimo numero | 1.0000 | 0.9916 | 1.0000 | 0.0083 | 0.0000 | 0.2500 | 0.7500 |
| Chiama | 0.9444 | 0.9971 | 0.9971 | 0.0028 | 0.0555 | 0.0555 | 0.9444 |
| Chiamata | 1.0000 | 0.9943 | 1.0000 | 0.0056 | 0.0000 | 0.1333 | 0.8666 |
| Chiudi applicazione | 0.9230 | 0.9971 | 0.9971 | 0.0028 | 0.0769 | 0.0769 | 0.9230 |
| Chiudi rubrica | 0.9583 | 0.9941 | 0.9970 | 0.0058 | 0.0416 | 0.0800 | 0.9200 |
| Chiudi | 0.8823 | 1.0000 | 0.9943 | 0.0000 | 0.1176 | 0.0000 | 1.0000 |
| Cinque | 0.8235 | 0.9914 | 0.9914 | 0.0085 | 0.1764 | 0.1764 | 0.8235 |
| Deseleziona | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Disattiva vivavoce | 0.8888 | 0.9971 | 0.9943 | 0.0028 | 0.1111 | 0.0588 | 0.9943 |
| Due | 0.9500 | 0.9971 | 0.9971 | 0.0028 | 0.0500 | 0.0500 | 0.9971 |

This comprehensive analysis sheds light on the contributions of each component to the overall classification performance of our model.

$$\mathrm{NPV} = \frac{\mathrm{TN}}{[\mathrm{FN} + \mathrm{TN}]} \tag{14}$$

$$\mathrm{FPR} = \frac{\mathrm{FP}}{[\mathrm{FP} + \mathrm{TN}]} \tag{15}$$

$$\mathrm{FNR} = \frac{\mathrm{FN}}{[\mathrm{FN} + \mathrm{TP}]} \tag{16}$$

$$\mathrm{FDR} = \frac{\mathrm{FP}}{[\mathrm{FP} + \mathrm{TP}]} \tag{17}$$

Figures 5, 6, and 7 show the confusion matrices of our deep BiLSTM-GRU model applied to the first 20 utterances of female speakers, male speakers, and both male and female speakers, respectively. These matrices illustrate the actual values along the y-axis and the predicted values along the x-axis. We used a unified branching technique [23, 26, 29, 62], incorporating both audio and image data for analysis.

**Table 6** Classification results on our proposed method for both male and female with 20-spoken utterances

| Spoken Utterances | Sensitivity | Specificity | NPV | FPR | FNR | FDR | Precision |
|---|---|---|---|---|---|---|---|
| Aggiungi ai preferiti | 0.9705 | 1.0000 | 0.9984 | 0.0000 | 0.0294 | 0.0000 | 1.0000 |
| Aggiungi | 0.9743 | 1.0000 | 0.9984 | 0.0000 | 0.0256 | 0.0000 | 1.0000 |
| Apri rubrica | 0.9642 | 0.9984 | 0.9984 | 0.0015 | 0.0357 | 0.0357 | 0.9642 |
| Attiva vivavoce | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Bue | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0270 | 0.9729 |
| Cancella contatto | 0.9393 | 0.9984 | 0.9969 | 0.0015 | 0.0606 | 0.0312 | 0.9687 |
| Cancella tutto | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Cancella | 0.9696 | 1.0000 | 0.9984 | 0.0000 | 0.0303 | 0.0000 | 1.0000 |
| Cella | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Chiama emergenza | 1.0000 | 0.9954 | 1.0000 | 0.0045 | 0.0000 | 0.0789 | 0.9210 |
| Chiama ultimo numero | 0.9600 | 1.0000 | 0.9985 | 0.0000 | 0.0400 | 0.0000 | 1.0000 |
| Chiama | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0285 | 0.9714 |
| Chiamata | 0.9762 | 0.9984 | 0.9984 | 0.0015 | 0.0238 | 0.0238 | 0.9761 |
| Chiudi applicazione | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Chiudi rubrica | 0.9714 | 1.0000 | 0.9984 | 0.0000 | 0.0285 | 0.0000 | 1.0000 |
| Chiudi | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0312 | 0.9687 |
| Cinque | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Deseleziona | 1.0000 | 1.0000 | 1.0000 | 0.0000 | 0.0000 | 0.0000 | 1.0000 |
| Disattiva vivavoce | 1.0000 | 0.9984 | 1.0000 | 0.0015 | 0.0000 | 0.0285 | 0.9714 |
| Due | 0.9714 | 1.0000 | 0.9984 | 0.0000 | 0.0285 | 0.0000 | 1.0000 |

In the confusion matrix, "c1" to "c20" represent the classes of spoken utterances. "c1" stands for the first utterance on both axes, while "c2" represents the second utterance, and so on. The ROC curves in Figs. 8, 9, and 10 show how well our technique accurately identifies each speaker's utterances across 20 spoken phrases. Our method achieves high accuracy scores, even with challenging datasets, highlighting its potential for improving dysarthric speech recognition. When building a dysarthric speech database, it is important to consider that people with speech impairments might use unconventional phrases due to difficulty pronouncing certain words. Also, older individuals, who are more prone to speech issues, might have different vocabulary influenced by cultural and generational factors compared to younger individuals.

In the Figs. 8, 9, and 10, the false positive rate is plotted on the x-axis, while the true positive rate is plotted on the y-axis. Each color in the ROC curve corresponds to a different spoken utterance. The ROC analysis unequivocally demonstrates precise classification across all categories, consistently achieving high scores even in challenging datasets for 20-spoken utterances. Each spoken utterance attains commendable scores, highlighting the robustness of the classification approach.

**Table 7** Accuracy per speakers per class

| Spoken Utterances | 20 spoken utterances of Male Speakers | 20 spoken utterances of Female Speakers | 20 spoken utterances of both Male and Female Speakers |
|---|---|---|---|
| Aggiungi ai preferiti | 0.9985 | 1.0000 | 0.9956 |
| Aggiungi | 0.9985 | 0.9972 | 0.9985 |
| Apri rubrica | 0.9971 | 0.9972 | 0.9985 |
| Attiva vivavoce | 1.0000 | 1.0000 | 0.9942 |
| Bue | 0.9985 | 0.9972 | 0.9942 |
| Cancella contatto | 0.9956 | 0.9945 | 0.9985 |
| Cancella tutto | 1.0000 | 0.9945 | 0.9971 |
| Cancella | 0.9985 | 0.9972 | 1.0000 |
| Cella | 1.0000 | 0.9972 | 1.0000 |
| Chiama emergenza | 0.9957 | 0.9945 | 1.0000 |
| Chiama ultimo numero | 0.9985 | 0.9918 | 0.9956 |
| Chiama | 0.9985 | 0.9945 | 0.9985 |
| Chiamata | 0.9971 | 0.9945 | 0.9985 |
| Chiudi applicazione | 1.0000 | 0.9945 | 0.9942 |
| Chiudi rubrica | 0.9985 | 0.9918 | 0.9942 |
| Chiudi | 0.9985 | 0.9945 | 0.9985 |
| Cinque | 1.0000 | 0.9836 | 0.9971 |
| Deseleziona | 1.0000 | 1.0000 | 1.0000 |
| Disattiva vivavoce | 0.9985 | 0.9918 | 1.0000 |
| Due | 0.9985 | 0.9945 | 1.0000 |

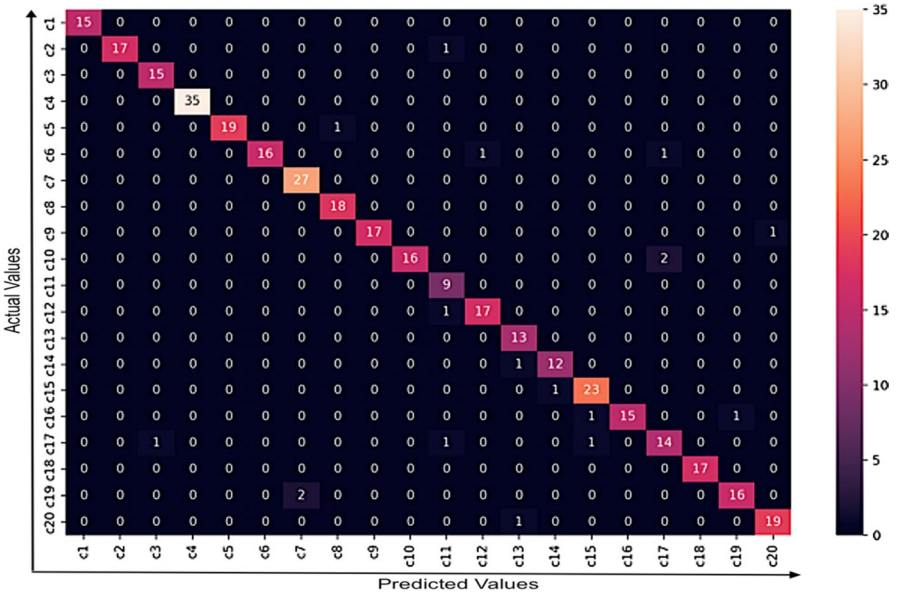


**Fig. 5** Confusion Matrix of first 20 spoken utterances of female speakers

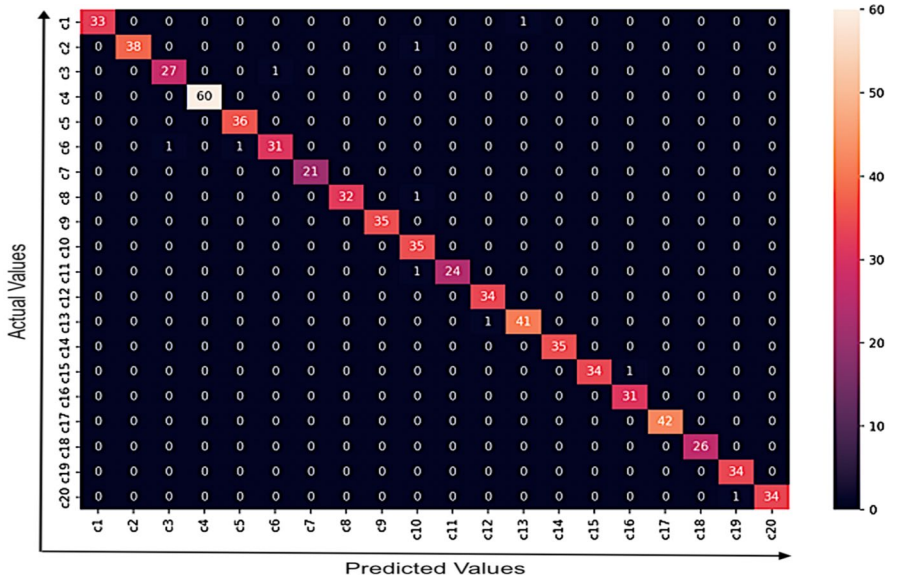


**Fig. 6** Confusion Matrix of first 20 spoken utterances of male speakers

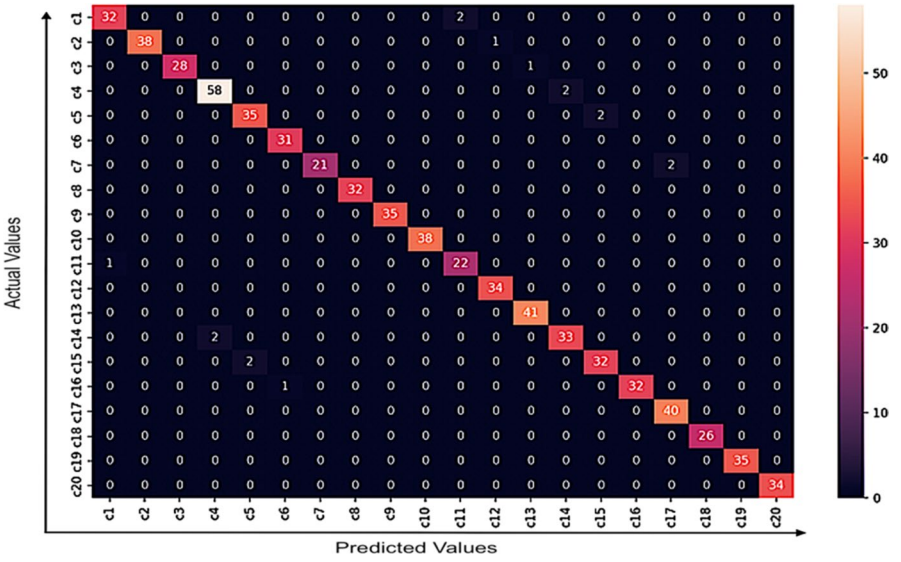


**Fig. 7** Confusion Matrix of first 20 spoken utterances of both gender speakers

## 5 Conclusion and future scope

We utilize a unified approach that incorporates both auditory and visual elements to improve the classification of dysarthric spoken utterances. To enhance spoken

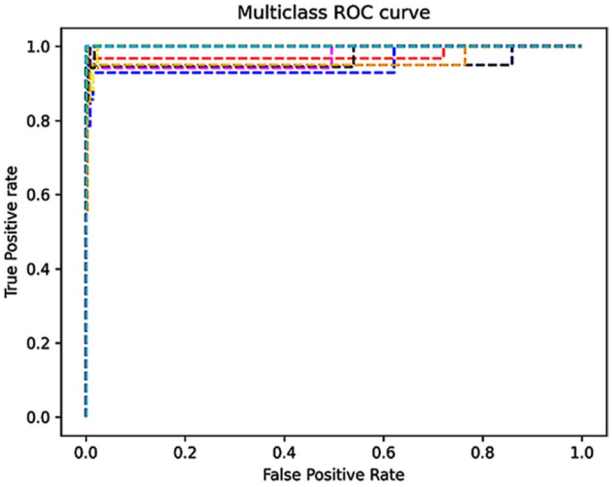


**Fig.8** 20 spoken utterances of male

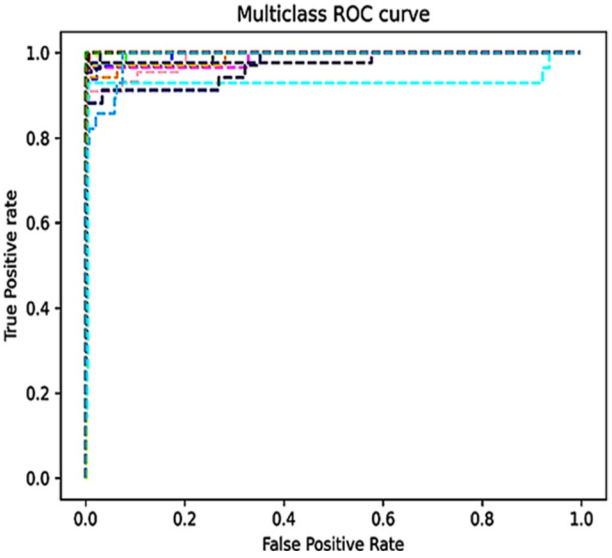


**Fig.9** 20 spoken utterances of female

utterance recognition, we introduce two distinct extractive transformer-based techniques. Initially, SepFormer is employed to refine speech clarity, followed by the transformation of improved audio into log mel spectrograms and subsequent processing through the Swin transformer. Furthermore, we harness the Swin transformer's capabilities for visual classification, leveraging a vast dataset of 14 million annotated images from ImageNet. The pre-trained scores from the Swin transformer

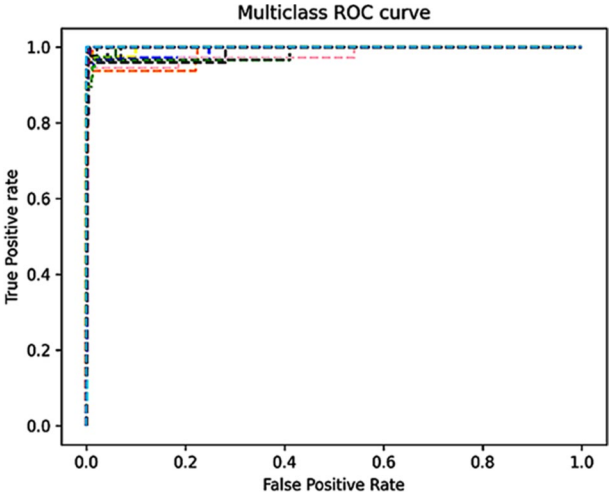


**Fig. 10** 20 spoken utterances of both gender

are then amalgamated into the deep BiLSTM-GRU model, facilitating the classification of spoken utterances. Our proposed model demonstrates remarkable performance on the EasyCall speech corpus, covering cognitive characteristics across utterances ranging from 10 to 20, inclusive of both healthy individuals and those with dysarthria. Specifically, we achieve an accuracy rate of 98.56% for male speakers, 95.11% for female speakers, and 97.64% for a combined dataset of male and female speakers. Notably, our approach consistently surpasses contemporary methodologies across various experimental scenarios, all without resorting to data augmentation techniques. While the EasyCall corpus provides a rich resource of spoken utterances, managing a larger volume of samples and categories introduces challenges, notably heightened complexity and computational demands. Nonetheless, our future endeavors entail the exploration of additional categories as part of an ongoing pursuit for specific application domains. Despite the encouraging findings, there remain ample opportunities for further research and refinement in this domain.

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**Authors' contributions** SM contributed to implementation of proposed approach, wrote the manuscript text, writing—original draft, conceptualization, methodology, and visualization. VR contributed to conceptualization, methodology, writing—review and editing, supervision, and investigation. RA contributed to conceptualization, methodology, writing—review and editing, supervision, and investigation.

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**Data availability** On reasonable request, the corresponding author can make the data underlying the conclusions of this research available.

**Code availability** We have added the GitHub repository link https://github.com/sunakshimehra/ADVANCE-DUSC.

## Declarations

**Conflict of interest** The authors state that they have no known financial or personal interests that could have impacted the conclusions described in this work.

**Ethical approval** There is no research involving human or animal subjects in the article.

**Consent for publication** All authors have approved the manuscript and given their full consent for its publication.

**Human and animal rights** Not applicable.

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ORIGINAL ARTICLE

# A novel decomposition-based architecture for multilingual speech emotion recognition

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**Abstract**
Multilingual speech emotion recognition (MLSER) is a significant and demanding research domain to improve the utility of human–computer interaction systems. Identifying the emotions from the spoken sentence is one of the most challenging tasks due to the dependency of the MLSER system on spoken languages. This study proposes a novel decomposition-based architecture for MLSER. The architecture includes silence removal, mode tuning, signal reconstruction, feature extraction, feature optimization and classification. In preprocessing, the silence part is removed using short-time energy and spectral centroid. After that, variational mode decomposition is applied for signal decomposition, where the improved Bhattacharyya distance is explored for the decomposition mode tuning. The tuned modes are examined for noise removal, and the signal is reconstructed using denoised modes. The spectral and prosodic features are computed from the reconstructed signal. The optimized features are obtained from the extracted features using the ReliefF algorithm. Finally, the fine k-nearest neighbor classifier is explored with optimized features to identify the emotions. For the experiment, three publicly available emotion databases, namely the English language-based Ryerson audio–visual database (RAVDESS), German language-based emotional speech Berlin database (Emo-DB) and Italian emotional speech database (EMOVO), are used. The proposed method yielded 90.7%, 94% and 91.1% accuracy for English, German and Italian language-based database, respectively. A multilingual database is created with these three databases, and the proposed method yields 93.4% accuracy for this database. The proposed framework provides more efficient and minimum language dependency compared to available traditional and deep learning-based approaches.

**Keywords** Multilingual speech emotion recognition · Speech signal processing · Variational mode decomposition · Feature optimization · Machine learning

## 1 Introduction

Speech is an effective and easiest way to communicate. Speech is a physiological signal that conveys the speaker's mental state or mode, like neutral, happiness, anger, sadness, etc. [1]. If speech is added with emotion, it becomes more effective for information exchange. It improves the utility of human–computer interaction (HCI) systems in multiple applications like robot interfaces, computer games, call centers, Web-based E-learning, entertainment, etc. Also, speech is widely used for medical applications to understand a person's physical and mental condition [2].

Speech emotion recognition (SER) provides a deeper understanding of human feelings and helps improve the HCI system's applications. However, the emotion recognition accuracy of the SER system depends on the preprocessing of the raw speech signal, quality of feature selection, classifier selection, the language of the speaker and the training database used. Specifically, the multilingual speech emotion recognition (MLSER) presents a formidable challenge, primarily due to various factors such as variations in signal characteristics, the diverse nature of emotion elicitation methods and the limited availability of data. Numerous efforts by researchers have aimed to

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address these challenges through initiatives like constructing emotional corpora [3, 4], experimenting with various feature sets [5], and employing multiple machine learning and deep learning-based methods. Despite these endeavors, there remains significant potential for enhancement in this field. Further, using a traditional approach is also a hurdle for developing an effective MLSER system. The adoption of decomposition-based techniques has proved effective in boosting the performance of machine learning-based architectures [6–26]. Such advancements will pave the way for the practical deployment of speech emotion recognition systems in real-world applications.

Several approaches based on linearity and stationary hypothesis are used for emotion detection. The most helpful method is based on fast Fourier transform, but this approach loses some information [6]. To overcome the stationarity issue, a short-time Fourier transform (STFT) is suggested to upgrade the conventional Fourier transform [7, 8]. Despite improvement, STFT-based approach still needs to be improved by the fundamental uncertainty. The non-stationary behavior of the signal remains challenging [9]. Hence, STFT is not suitable for feature extraction from non-stationary signal. The nonlinear methods for the non-stationary call significantly improve over the linear techniques [10–13].

Based on EMD and wavelet transform, various methods are suggested for the statistical analysis and classification of non-stationary one-dimensional signals [14–18]. The EMD-based decomposition method suffers from the mode mixing problem, which is solved by Huang [19] and proposes the empirical ensemble mode decomposition. Despite improvement, EMD is still noise-sensitive and limits the model's accuracy [20]. The variational mode decomposition overcomes these limitations (VMD) [20]. VMD has several advantages over EMD and wavelet transform-based methods [20]. For example, EMD is recursive, while VMD is a non-recursive method. The VMD-based approach significantly improves the statistical analysis and classification of several physiological signals [21, 22]. VMD is also used for denoising and detecting voiced and unvoiced speech signal parts [23, 24].

In [25], Empirical mode decomposition (EMD) is used with an energy operator and tested on Berlin and Spanish corpus. In [26], the rational dilation wavelet transform-based method is proposed to identify human emotion from speech. Apart from traditional and decomposition-based methods, several deep learning (DL)-based approaches have also been developed for the SER [27, 28]. In [28], a convolutional neural network and bidirectional extended short-term memory-based framework are proposed for emotion classification. This method was tested on three different databases, and the highest achieved accuracy was 85.57% [28]. In [29], a profound stride convolutional neural network-based approach is used for emotion classification. However, a deep learning-based approach also suffers due to the variability of speech data. Furthermore, speech data often come in variable-length sequences, and handling such variability can be challenging for deep learning-based models. While techniques like padding or masking sequences can be used, they may introduce additional complexities and affect performance. Although RNN-based architectures can capture temporal dependencies to some extent, they may struggle with capturing the complex temporal dynamics present in speech signals. This could be a limitation when dealing with subtle changes in emotional expression over time.

Most research in the field of speech emotion recognition has predominantly concentrated on a single language, with only a limited number of studies exploring MLSER. The method proposed in [30] reduces the computational complexity and is tested on the publicly available Ryerson audio–visual database of emotional speech and song (RAVDESS) and interactive emotional dyadic motion capture. In [31], six different datasets are used to test the proposed method. This method uses the multi-class support vector machine with a well-crafted feature set for emotion identification. This method shows high language dependency. This method achieves 95.25% accuracy for the Urdu language database, while for the other language, the highest accuracy is 81.5% [31]. In [32], a two-stream deep convolutional neural network is used to classify, and iterative neighborhood component analysis is used to optimize the feature set. This technique is tested on three different databases of two other languages. The proposed framework constitutes two channels and the convolution neural network to compute the feature. The accuracy of this method is suffered by 10% with the change of language [32]. In [33], a multi-level feature selection approach is used with uncorrelated regression for emotion classification. This method is tested on four datasets of three different languages. With the change of language, the accuracy of this method is reduced by approximately 10%.

Emotions are conveyed through subtle changes in speech parameters, such as pitch, loudness and speaking rate. Noise in the speech signal can mask these changes, making it challenging to recognize emotions accurately. Denoising can help remove the noise and reveal subtle changes in the speech signal. The MLSER system can produce more consistent results by eliminating the noise, regardless of the recording conditions. Hence, this work focuses on the preprocessing of input speech data. The proposed framework has three sections. The raw speech signal is preprocessed in the first section and removes the unwanted or noisy part from the signal. The second section includes computing prosodic and spectral features from

preprocessed speech signals and selecting an optimized feature set. The third section uses a fine K-nearest neighbors (KNN) classifier for emotion identification. The proposed architecture is tested separately on three different languages database (English, German and Spanish). Finally, the proposed architecture is tested for multilingual database.

## 2 Emotion database

This work uses three publicly available emotion databases Berlin database of emotional speech (Emo-DB), the RAVDESS emotional speech database and the Italian emotional speech database (EMOVO).

### 2.1 RAVDESS emotion database

The RAVDESS speech database was recorded in English by 24 speakers [34], where twelve orators are mail and twelve orators are female. Every sentence is uttered twice in 2 different intensities (high and low) and eight different emotions. The available emotions are fearful, calm, sad, neutral, disgust, angry, happy and surprised. Each emotion class database contains 192 utterances except the neutral class. In the neutral category, only 96 utterances are available. The sampling frequency of each utterance for the recording is 48 kHz. The distribution of emotion class in the database is shown in Fig. 1.

### 2.2 Emo-DB database

The Emo-DB emotional speech database was recorded by ten actors in the German language [35], where five actors are male and five actors are female. In this database, a total of 535 utterances of 10 sentences are available in disgust, boredom, neutral, fear, happiness, sadness and anger. The distribution of emotion class in the database is shown in Fig. 2.

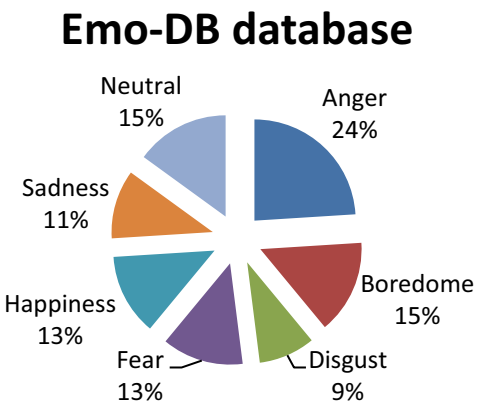


**Fig. 2** Emotion distribution in percentage for Emo-DB database

### 2.3 EMOVO database

The EMOVO database was recorded by three male and three female speakers [36]. This database contains a total of 14 Italian sentences in seven different emotions. In this database, a total of 588 utterances are available in disgust, fear, anger, joy, surprise, sadness and neutral feelings. The sampling frequency of this database is 48 kHz. The distribution of emotional utterances in the database is shown in Fig. 3.

### 2.4 Multilingual database

The multilingual database is created using the six common emotion classes fear, happy, sad, neutral, angry and disgust from the three publicly available emotion databases, namely the English language-based RAVDESS speech database, German language-based Emo-DB speech database and EMOVO Italian emotional speech database. During the mixing of database, common classes are labeled

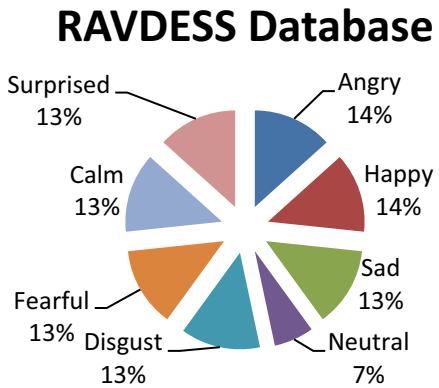


**Fig. 1** Emotion distribution in percentage for RAVDESS database

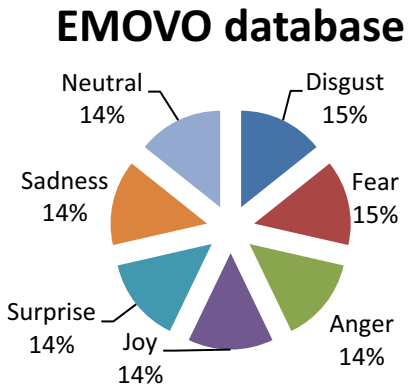


**Fig. 3** Emotion distribution in percentage for EMOVO database

with same label; for example, angry emotion database of all three databases are combined and labeled as angry. The joy emotion of the EMOVO database is labeled as a happy emotion in the multilingual database. The distribution of emotion classes in the database is shown in Fig. 4.

## 3 Overview of the proposed framework

The block diagram of the proposed framework is presented in Fig. 5. Initially, the silence part is removed from the raw speech signal. After that, decomposition and mode tuning are performed. The noisy modes are removed at the denoising stage, and the denoised speech signal is reconstructed from the filtered modes. The relevant features are extracted from the reconstructed signal, and feature selection is performed using the rank-based algorithm. Finally, the KNN classifier is trained and tested optimal feature set to recognize different emotions.

## 4 Signal preprocessing

In this section, the preprocessing of the input signal is described. In the first step, the short-time energy and spectral centroid-based method remove the silence part from the speech signal, as explained in [37]. After silence removal, signal decomposition and mode tuning are performed. Finally, the unwanted modes of the decomposed signal are removed, and the signal is reconstructed.

### 4.1 Silence removal

In this framework, two simple features, short-time energy and spectral centroid, are computed to remove the silence part from the speech signal [37] and the speech signal after silence removal is presented in Fig. 6.

Let $y(n)$, $n \geq 0$, be a speech signal, and $n$ is the discrete time. The speech signal $y(n)$ is fragmented into frames of length 50 ms. Let $y_l(n)$, $n = 1,2,3\ldots N$ is $l$th frame of $y(n)$. Then, for each frame short-time energy is calculated using Eq. (1) [37]:

$$E(l) = \frac{1}{N}\sum_{n=1}^{N}(y_l(n))^2 \tag{1}$$

The spectral centroid $C_l$ for $l$th frame is calculated using Eq. (2) [37]:

$$C_l = \frac{\sum_{r=1}^{N}(r+1)x_l(r)}{\sum_{r=1}^{N}x_l(r)} \quad r = 1,2\ldots N \tag{2}$$

where $x_l(r)$ is the discrete Fourier transform coefficient of $l$th frame and $N$ is frame length.

The extracted features are compared with threshold $T_c$ and $T_e$ based on the spectral centroid and energy sequences, respectively. For the calculation of $T_e$, the histogram of extracted feature sequence short-time energy is calculated, and a smoothing filter is applied. Then the first and second local maxima $m1$ and $m2$ are identified and used to estimate the threshold. Same process is followed for the calculation of $T_c$. The threshold value $T_e$ is calculated using Eq. (3) [37]:

$$T_e = \frac{w \cdot m1 + m2}{w+1} \tag{3}$$

where $w$ is a user-defined parameter.

### 4.2 Variational mode decomposition (VMD)

After the silence removal, the speech signal is decomposed into modes using VMD. The VMD is the extended version of EMD. It overcomes the limitation of EMD, like noise sensitivity and sampling [20]. In this method, the number of maxima and minima of each mode must be equal or differ by one. Also, at every instant, the average value of the envelope defined by local maxima and minima must be zero. The VMD decomposition is based on the central frequency.

The basic concept of VMD is to decompose the non-stationary signal so that each mode is concentrated around the central frequency $c_k$, estimated in the decomposition process. The Hilbert transform (HT) is used for calculating the frequency and amplitude of each mode, which in turn defines a unilateral spectrum. Initially, the unilateral spectrum is computed using HT for each mode's bandwidth. After that, the unilateral spectrum shifted toward the baseband by mixing with exponential, which is tuned to the center frequency. Finally, the bandwidth of the signal is calculated by using Gaussian smoothness. The resulting problem can be defined in Eq. (4) [20].

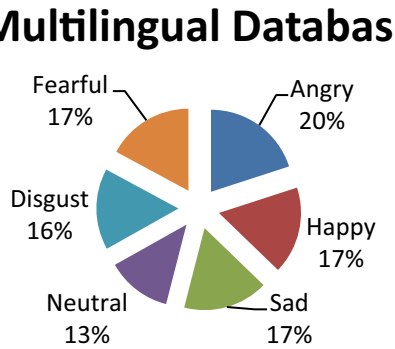


**Fig. 4** Emotion distribution in percentage for multilingual database

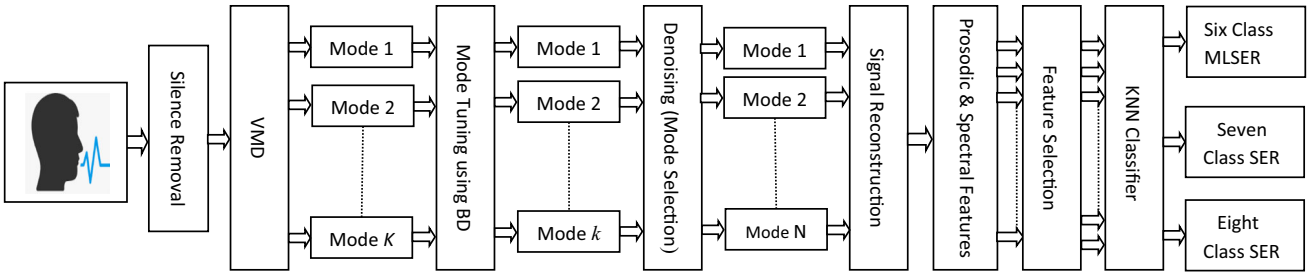


**Fig. 5** Process flow diagram of the proposed framework. Note: $K > k$, $k > N$ and MLSER is multilingual speech emotion recognition

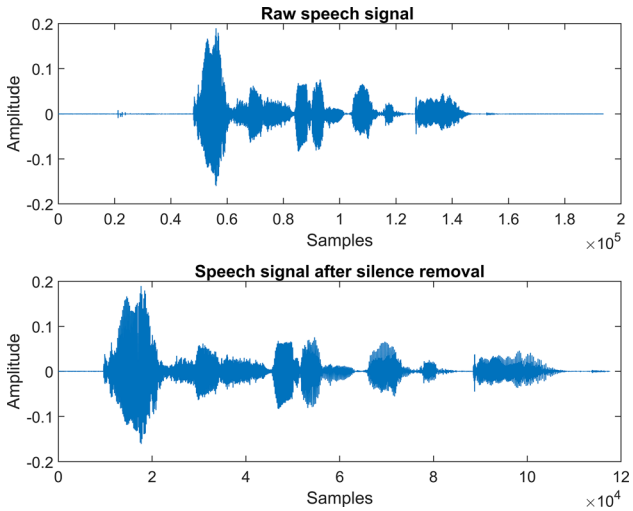


**Fig. 6** Raw speech signal and speech signal after silence removal

$$\min_{u_k,c_k}\left\{\sum_k \left|\partial_t\left[\left(\delta(t)+\frac{j}{\pi t}\right)*d_k(t)\right]e^{-jc_k t}\right|^2\right\}$$

$$\text{Subject to } \sum_k d_k(t) = s(t) \tag{4}$$

where $s(t)$ is input speech signal, $k$ is number of mode, $d_k(t)$ represent the mode of signal and $c_k$ is corresponding central frequency. The central frequency is estimated using Eq. (5) [20]:

$$c_k^{n+1} = \text{argmin}_{c_k}\left\{\left\|\partial_t\left[\left(\partial(t)+\frac{j}{\pi t}\right)*u_k(t)\right]e^{-jc_k t}\right\|_2^2\right\} \tag{5}$$

### 4.3 Noise removal

In noise removal, mode tuning and mode selection are performed. The choice of the number of modes is based on the improved Bhattacharyya distance (BD) [38]. In this method, initially, the original signal's variance and each mode's variance are computed using Eqs. (6) and (7). After that, BD is computed using Eqs. (8) and (9) to measure the similarity between the original and decomposed signals. Finally, the distance between adjacent modes is calculated using Eq. (10). Initially, the input signal is decomposed up to 15 modes, and BD is calculated. It is observed that, as the number of modes increased in VMD, the similarity of the original signal with the modes is reduced, and most of the information is present in the first nine modes. Figure 7 and Table 1 present an example of the BD value of 15-mode and 9-mode decomposition. Table 2 signifies after the 9th mode, the BD distance $D$ of the adjacent mode comparatively increased. Hence, in this work signal is decomposed in nine modes only. The bold numbers in Tables 1 and 2 show the significant change in BD values with the increase of mode number.

Let the $A$ and $B$ be two probability distributions, then variance can be defined as [38]:

$$V(A) = E\left(A^2\right) + [E(A)]^2 \tag{6}$$

$$V(B) = E\left(B^2\right) + [E(B)]^2 \tag{7}$$

The Bhattacharya distance is defined as follows [38]:

$$\text{BD}(V(A), V(B)) = -\ln[\text{BC}(V(A), V(B))] \tag{8}$$

where BC is Bhattacharya coefficient, which is defined as follows [38]:

$$\text{BC}(V(A), V(B)) = \sum_{a\in A, b\in B}\sqrt{V(A)V(B)} \tag{9}$$

$$D = \max[\text{BD}(\text{Mode}(i+1)) - \text{BD}(\text{Mode}(i))], \quad i = 1, 2\ldots N-1 \tag{10}$$

where $D$ is a maximum distance of adjacent mode.

However, it is also observed in [39, 40] that the first two modes have the highest similarity with the original signal, but it contains no information for speech signal. The central frequency of a VMD mode is defined as the frequency at which the mode's spectral energy is concentrated. The central frequency of each mode is calculated using Eq. (5). The first and second modes have a higher central frequency and contain noise. Hence, the first two modes are removed during the reconstruction of the speech signal. Finally, the signal is reconstructed using the three to nine modes and residue part. After the reconstruction of the signal, it is observed that the energy of the voiced region is enhanced [40]. Figure 8 shows the speech signal after silence

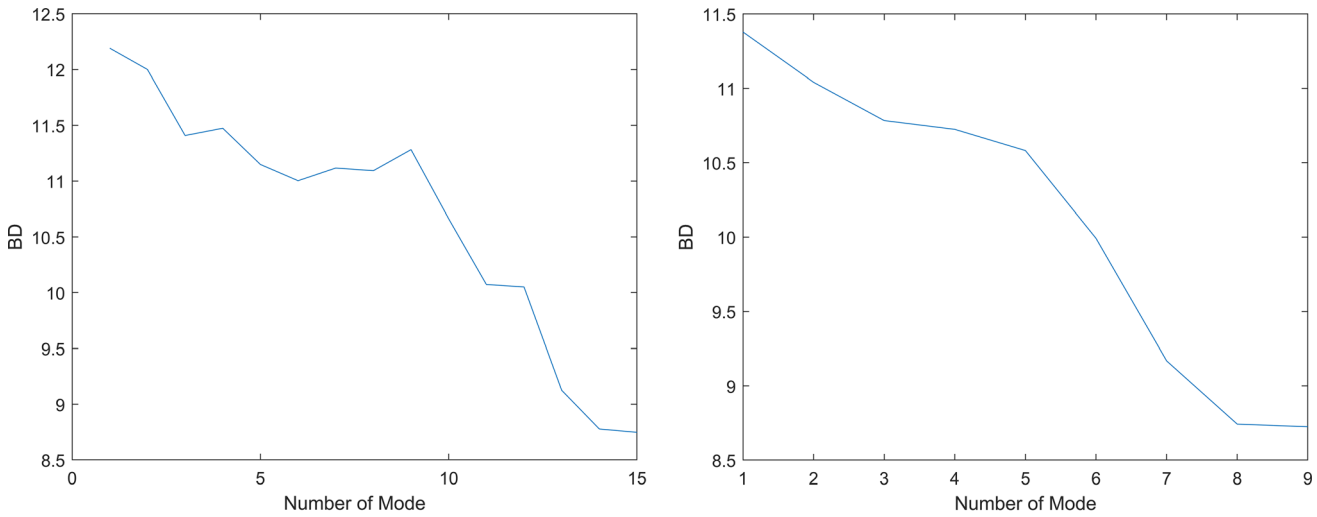


**Fig. 7** **a** BD for 15-mode decomposition; **b** BD for 9-mode decomposition

**Table 1** Bhattacharya distance for 9-mode and 15-mode decomposition

| Decomposition in 15 modes | | | | Decomposition in 9 modes | |
|---|---|---|---|---|---|
| Modes | BD | Modes | BD | Modes | BD |
| Mode1 | 12.19 | Mode10 | **10.70** | Mode1 | 11.37 |
| Mode2 | 11.99 | Mode11 | **10.07** | Mode2 | 11.04 |
| Mode3 | 11.40 | Mode12 | 10.05 | Mode3 | 10.78 |
| Mode4 | 11.47 | Mode13 | 9.12 | Mode4 | 10.72 |
| Mode5 | 11.15 | Mode14 | 8.77 | Mode5 | 10.58 |
| Mode6 | 11.00 | Mode15 | 8.74 | Mode6 | 10.10 |
| Mode7 | 11.11 | | | Mode7 | 9.16 |
| Mode8 | 11.09 | | | Mode8 | 8.74 |
| Mode9 | **11.21** | | | Mode9 | 8.72 |

removal and the reconstructed signal after preprocessing. For the reconstruction of the signal, Eq. (11) is used:

$$u = \sum_{i=3}^{N} mode_i + \text{residue} \tag{11}$$

## 5 Feature extraction and classification

The frame-level features are calculated from the preprocessed signal. The reconstructed signal is fragmented into 80 ms (ms) frame length with 75% overlapping. After that, the hamming window smoothens the edge [26]. From each frame, mel frequency cepstral coefficients (MFCC), mel spectrum, first and second derivatives of MFCC, gammatone cepstral coefficients (GTCC), the first derivative of GTCC, pitch, spectral crest, spectral entropy, spectral kurtosis, spectral skewness, spectral spread, harmonic ratio and spectral centroid are calculated [41–46].

In the rank-based feature selection method, ReliefF algorithm is applied to select features [47]. This algorithm selects the instances randomly from the same class and different classes. When randomly selecting $R$ data instances from the total $n$ instances, the ReliefF algorithm calculates the feature score $fi$ for each original feature ($i$ = 1, 2, 3,…, $d$), where $d$ is the number of original features. This computation is based on Eq. (12) from reference [47].

**Table 2** Maximum distance of adjacent mode

| Decomposition in 15 modes | | | | Decomposition in 9 modes | |
|---|---|---|---|---|---|
| Modes | $D$ | Modes | $D$ | Modes | $D$ |
| Mode1–Mode2 | 0.2 | Mode9–Mode10 | **0.51** | Mode1–Mode2 | 0.33 |
| Mode2–Mode3 | 0.59 | Mode10–Mode11 | **0.63** | Mode2–Mode3 | 0.26 |
| Mode3–Mode4 | − 0.07 | Mode11–Mode12 | 0.02 | Mode3–Mode4 | 0.06 |
| Mode4–Mode5 | 0.32 | Mode12–Mode13 | 0.93 | Mode4–Mode5 | 0.14 |
| Mode5–Mode6 | 0.15 | Mode13–Mode14 | 0.35 | Mode5–Mode6 | 0.48 |
| Mode6–Mode7 | − 0.11 | Mode14–Mode15 | 0.03 | Mode6–Mode7 | 0.94 |
| Mode7–Mode8 | 0.02 | | | Mode7–Mode8 | 0.42 |
| Mode8–Mode9 | − 0.12 | | | Mode8–Mode9 | 0.02 |

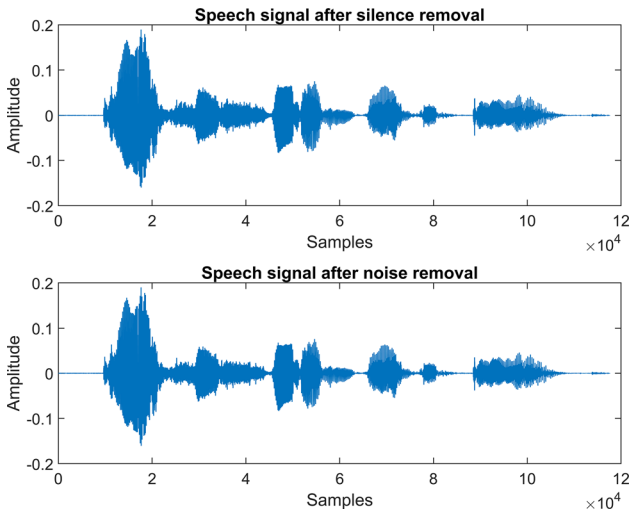


**Fig. 8** speech signal after silence removal and noise removal

$$f_i = \frac{1}{c}\sum_{q=1}^{R}\left(-\frac{1}{m_q}\sum_{x_l \in \mathrm{NS}(q)} d(X(q,i) - X(l,i))\right) + \sum_{z \neq z_q}\frac{1}{h_{qz}}\frac{p(z)}{1-p(z)}\sum_{x_l \in \mathrm{NH}(q,z)} d(X(q,i) - X(l,i)) \quad (12)$$

Here $c$ represents is number of classes. The terms NS($q$) and NH($q$,$y$) are defined as the closest instances of $x_q$ in same class of size $m_q$ and in class $z$ of size $h_{qz}$, respectively. For $z$ class, the ratio of instances is defined by $p(y)$.

In the proposed framework, k-nearest neighbor (KNN) classifier is used for emotion identification. KNN classifier is based on the computation of the Euclidean distance function between pre-defined classes and each varying sample [48]. The Euclidean distance is used in the KNN algorithm to find the nearest neighbor according to each type. The most common method for calculating Euclidean distance is presented in Eq. (13) [49]. Finally, the samples are assigned to the respective class based on the nearest $n$ neighbors. In this work, fine KNN is chosen for the classification. Fine KNN takes one sample to differentiate the data. The precision, recall and F1-score are calculated to evaluate the performance [48]:

$$D = \sqrt{\sum_{i=1}^{n}(x_{1i} - x_{2i})^2} \quad (13)$$

where $i$ is the number of discrete points in each sample and $x_1$ and $x_2$ are input samples.

## 6 Results and discussion

This work uses four database, RAVDESS speech, Emo-DB, EMOVO and multilingual database, for the experiment. In the multilingual database, the six standard classes (fear, happy, sad, neutral, angry and disgust) of three different languages, English, German and Italian, from three databases, RAVDESS speech, Emo-DB and EMOVO, are combined. Each speech signal is preprocessed using the procedure explained in Sect. 4. The unwanted part is removed in the preprocessing to reduce the misclassification error. After silence removal, VMD is applied to the speech signal to decompose into nine modes. The number of modes is decided using BD. The signal is reconstructed using the *3* to *9* modes, and the first two modes are left. The reconstructed signal is used for feature extraction. Initially, *105* prosodic and spectral features, as explained in Sect. 5, are extracted from each frame. After that, the ReliefF algorithm is used for the feature selection. The predictor importance weight bar for each database is presented in Fig. 9. This experiment selects features with an importance weight equal to or greater than *0.002* for the classifier training. Finally, all selected features are put into the KNN classifier for the training.

The accuracy of all four databases is presented in Fig. 10. All the classifications are performed with tenfold cross-validation. In tenfold cross-validation, data are split into ten subsets, where nine subsets are used for training, and one subset is used for testing. This process is repeated until each subset is used as test data. The proposed framework achieves an accuracy of 90.7% for the speech RAVDESS database, 94% for the Emo-DB database, 91.1% for the EMOVO database and 93.4% for the multilingual database. The results presented in Fig. 10 show that the proposed framework has the highest sensitivity for the Emo-DB database and the lowest sensitivity for the speech RAVDESS database. The confusion matrix of all four databases is presented from Figs. 11, 12, 13 and 14, and class-level balance accuracy is illustrated in Fig. 15.

The precision, recall and F1-score for each emotion are presented in Table 3, 4, 5 and 6. For the RAVDESS speech database, the highest precision of 94.02% is obtained for angry mode, while the highest recall of 93.0% and 92.15% is achieved for angry and calm mode, respectively. For the Emo-DB speech database, highest precision, 98.7%, is obtained for angry mode, and the highest recall, 96.52%, is achieved for angry mode. Similarly, for the EMOVO speech database, the highest precision of 93.44% is obtained for disgust mode, and the highest recall of 92.37% is achieved for angry mode. Finally, in Table 6, the proposed architecture is tested for the multilingual database. For the multilingual speech database, highest precision,

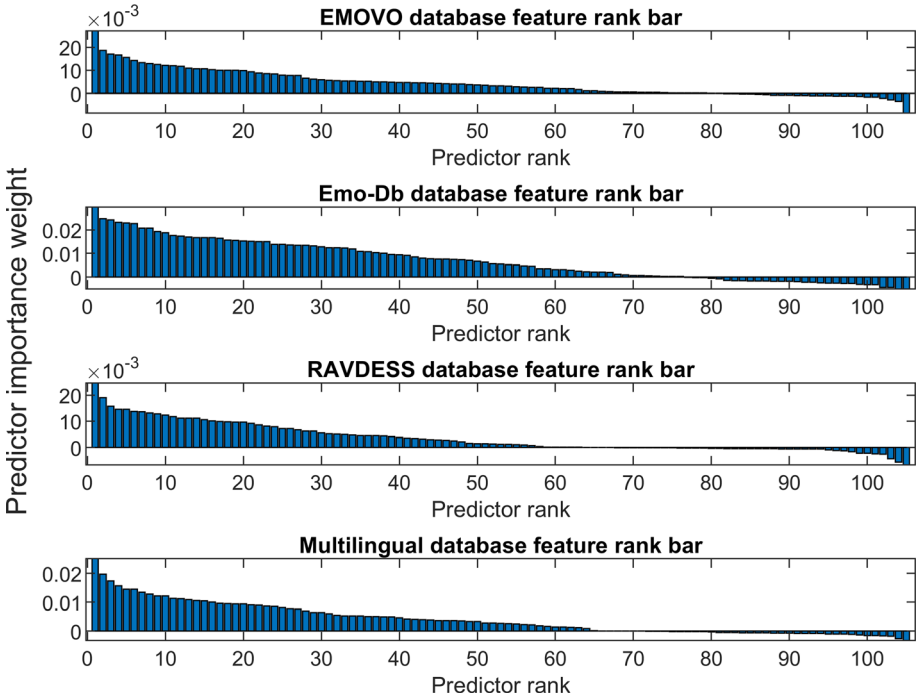


**Fig. 9** Predictor importance weight bar

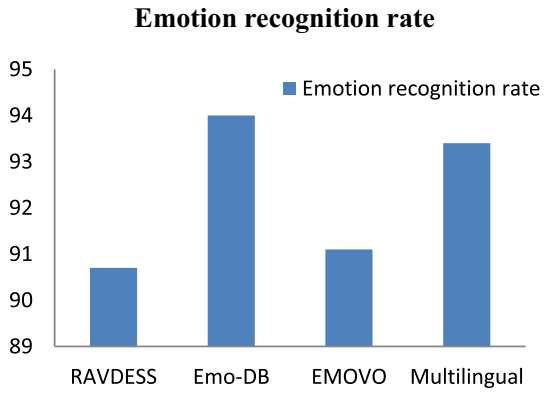


**Fig. 10** Recognition rate of the proposed method for all four databases

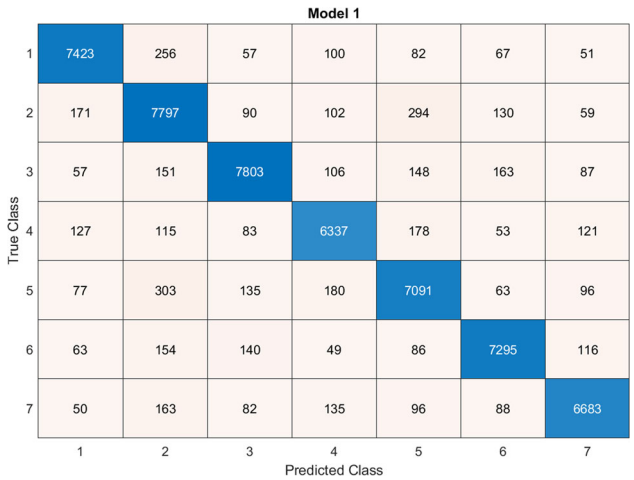


**Fig. 11** Proposed method confusion matrix for Italian language-based EMOVO database

94.57%, is obtained for angry mode, and the highest recall, 94.21%, is achieved for angry mode. Tables 3, 4, 5 and 6 show that the proposed emotion recognition architecture is comparatively more sensitive to angry class emotion.

In Tables 7 and 8, the proposed framework is compared with the other existing methods. Table 7 shows the emotion recognition accuracy of the individual database, and Table 8 shows the emotion recognition accuracy of multilingual database. Table 7 shows that all the available existing methods are highly language dependent. In [25], the Italian language database accuracy is 91.16%, while for the German language-based database, the achieved accuracy is 86.22% and shows approximately 5% variation in accuracy with the language change. In [28], the English language database accuracy is 85.57%, while for the German language-based database, the achieved accuracy is 77.02%. This method shows more than 8% variation in accuracy with the language change.

Similarly, [30] shows more than 24%, [31] shows more than 17%, [32] shows 10%, and [33] shows more than 10% variation in accuracy and shows high language dependency. Compared to existing methods, the proposed method has only 3.3% variation and proved more robust and has minimum language dependency. Many ways are available for the individual database, but more research is needed for the multilingual database. Because of the diverse language, the accuracy is drastically reduced. For

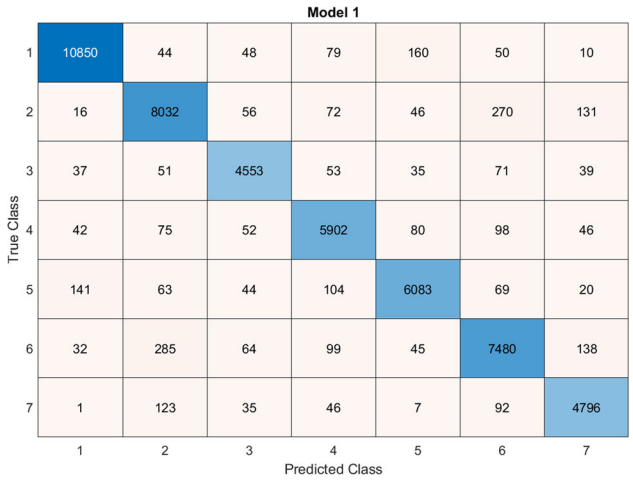


**Fig. 12** Proposed method confusion matrix for German language-based Emo-DB database

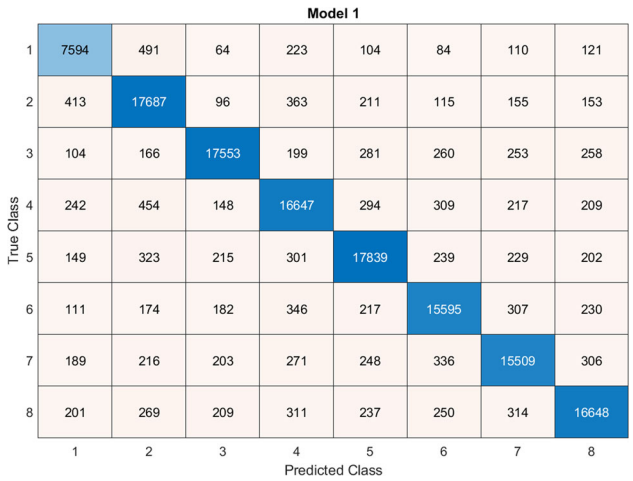


**Fig. 13** Proposed method confusion matrix for English language-based RAVDESS database

example, in [46], the highest achieved accuracy for the German language was 90.09%, but it declined to 80.05% for the multilingual database. This signifies the existing frameworks are highly language dependent.

In contrast, the proposed method shows a low language dependency; hence, the highest achieved accuracy for the German language is 94%, and for the multilingual, it is 93.4%. Only German, English and Italian language-based research work is included for the multilingual database comparison. The proposed method achieves the highest accuracy for the diverse language database compared to all existing methods.

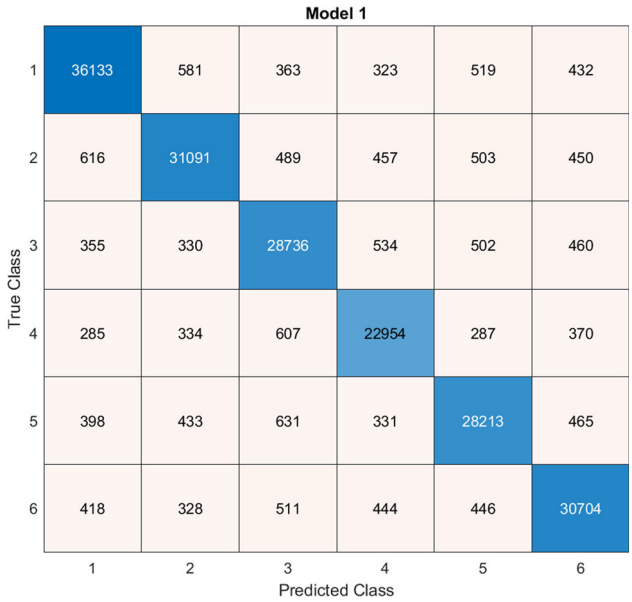


**Fig. 14** Proposed method confusion matrix for multilingual database

## 7 Conclusion

The proposed framework introduced a decomposition-based denoising approach for MLSER. The method includes the steps of silence removal, signal decomposition, number of mode selections, denoising and signal reconstruction. These steps make the signal more predictive for the recognition of respective emotions. After that, spectral and prosodic features are extracted, and the ReliefF algorithm is used to explore the optimal feature set. This optimal feature set is put into the KNN classifier for training and testing. The proposed method obtained 90.70%, 94% and 91.10% accuracies for RAVDESS speech, Emo-DB and EMOVO database, respectively. For multilingual database, the proposed method obtained 93.4% accuracy. The performance comparison shows that the proposed method provides more stable performance on multiple databases and the lowest language dependency, basically the needs of an ideal MLSER architecture. The proposed architecture provides the following advantages**.**

- Propose a novel preprocessing approach that includes silence removal, mode tuning, decomposition, mode selection and signal reconstruction
- Achieving the highest accuracy across various emotional speech signal databases.
- Show the low language dependency and robustness compared to all available state of the art.
- The proposed architecture is based on KNN classifier which does not involve the computation of weights or adjustments of parameters during training. Hence, it is computationally less expensive.

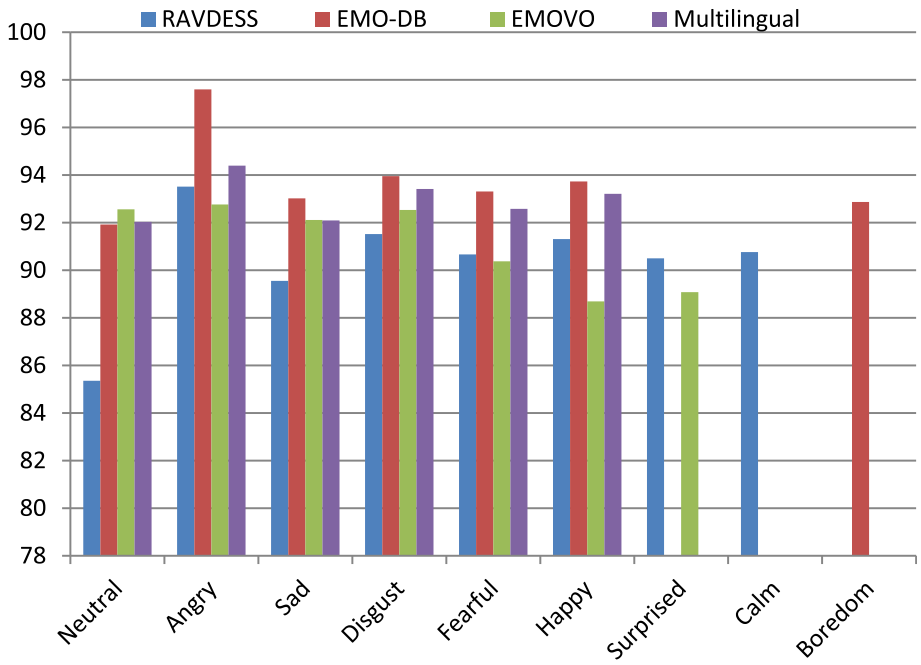


**Fig. 15** Class-level balance accuracy of the proposed method for RAVDESS, Emo-DB, EMOVO and multilingual database

**Table 3** Experimental result of the proposed method for RAVDESS database

| Emotions | Precision (%) | Recall (%) | F1 score (%) |
|---|---|---|---|
| Neutral | 84.35 | 86.38 | 85.35 |
| Calm | 89.42 | 92.15 | 90.76 |
| Angry | 94.02 | 93.00 | 93.51 |
| Sad | 89.21 | 89.89 | 89.55 |
| Disgust | 91.81 | 91.24 | 91.52 |
| Fearful | 90.45 | 90.87 | 90.66 |
| Surprised | 91.26 | 89.76 | 90.50 |
| Happy | 92.35 | 90.29 | 91.31 |

**Table 4** Experimental result of the proposed method for Emo-DB database

| Emotions | Precision (%) | Recall (%) | F1 score (%) |
|---|---|---|---|
| Angry | 98.70 | 96.52 | 97.60 |
| Boredom | 92.60 | 93.14 | 92.87 |
| Disgust | 93.83 | 94.08 | 93.95 |
| Fear | 92.87 | 93.75 | 93.31 |
| Happy | 94.22 | 93.24 | 93.73 |
| Neutral | 92 | 91.85 | 91.92 |
| Sad | 92.58 | 93.47 | 93.02 |

**Table 5** Experimental result of the proposed method for EMOVO database

| Emotions | Precision (%) | Recall (%) | F1 score (%) |
|---|---|---|---|
| Angry | 93.16 | 92.37 | 92.76 |
| Happy | 87.22 | 90.21 | 88.69 |
| Disgust | 93.44 | 91.63 | 92.53 |
| Fear | 90.41 | 90.34 | 90.37 |
| Surprised | 88.91 | 89.25 | 89.08 |
| Neutral | 92.82 | 92.30 | 92.56 |
| Sad | 92.65 | 91.58 | 92.11 |

**Table 6** Experimental result of the proposed method for multilingual database

| Emotions | Precision (%) | Recall (%) | F1 score (%) |
|---|---|---|---|
| Angry | 94.57 | 94.21 | 94.39 |
| Happy | 93.93 | 92.50 | 93.21 |
| Sad | 91.69 | 92.49 | 92.09 |
| Neutral | 91.65 | 92.41 | 92.03 |
| Fearful | 92.59 | 92.58 | 92.58 |
| Disgust | 93.37 | 93.46 | 93.41 |

**Table 7** Performance comparison benchmark for individual database

| Author | Database | Classifier | Method | Accuracy (%) |
|---|---|---|---|---|
| Kerkeni et al. [25] | EMOVO | RNN | EMD combined with the Teager–Kaiser energy operator and then features are extracted | 91.16 |
| | Emo-DB | SVM | | 86.22 |
| Mustaqeem et al. [28] | Emo-DB | RBFN | Sequence-based spectrogram is passed through CNN to extract feature | 85.57 |
| | RAVDESS speech | CNN | | 77.02 |
| | | BILSTM | | |
| Mustaqeem et al. [29] | RAVDESS speech | DSCNN | Spectrogram of speech signals is passed through the deep stride convolutional neural network (DSCNN) | 79.5 |
| Özseven et al. [30] | Emo-DB | SVM | Emotion-based acoustic feature selection method is used | 84.62 |
| | SAVEE | | | 74.39 |
| | EMOVO | | | 60.4 |
| Ancilin et al. [31] | Emo-DB | MSVM | Energy spectrum and Mel frequency magnitude coefficient-based features are used | 81.5 |
| | RAVDESS speech | | | 64.31 |
| | EMOVO | | | 73.3 |
| Kwon, et al.[32] | Emo-DB | Two-stream CNN | Iterative neighborhood component analysis (INCA) is applied for learning spatial–spectral features that are mutually learned, and then, the optimal features are selected | 95 |
| | SAVEE | | | 82 |
| | RAVDESS speech | | | 85 |
| Tuncer et al. [33] | EMOVO | SVM | Used twine shuffle pattern with tunable Q wavelet transform for multi-level feature generation | 90.09 |
| | RAVDESS speech | | | 84.79 |
| | Emo-DB | | | 79.08 |
| | SAVEE | | | 87.43 |
| **Proposed method** | RAVDESS speech | Fine KNN | Used VMD decomposition, BD-based mode tuning and denoising after that features are extracted | 90.7 |
| | Emo-DB | | | 94 |
| | EMOVO | | | 91.1 |

**Table 8** Performance comparison benchmark for multilingual database

| Author | language | Classifier | Method | Accuracy (%) |
|---|---|---|---|---|
| Tuncer et al. [30] | German | SVM | Used twine shuffle pattern with Tunable Q wavelet transform for multi-level feature generation | 80.05 |
| | English | | | |
| | Italian | | | |
| **Proposed method** | German | Fine KNN | Used VMD decomposition, BD-based mode tuning and denoising after that features are extracted | 93.4 |
| | English | | | |
| | Italian | | | |

Nevertheless, there is still a scope in the SER domain to improve accuracy and reduce language dependency. This can be obtained by better preprocessing methods and optimizing feature sets, which can improve the overall performance of the SER system.

**Data availability** The databases generated during and/or analyzed during the current study are available in the [Ryerson Audio-Visual Database of Emotional Speech and Song (RAVDESS) [31], German language-based emotional speech Berlin database (Emo-DB) [32], Italian emotional speech database (EMOVO) [33]] repository, [https://zenodo.org/record/1188976#.ZBlFonZBzIU, http://emodb.bilderbar.info/download/, http://voice.fub.it/activities/corpora/emovo/index.html].

## Declarations

**Conflict of interest** There is no conflict of interest.

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ORIGINAL PAPER

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# A novel framework for optimizing Gurney flaps using RBF surrogate model and cuckoo search algorithm

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**Abstract** Enhancing aerodynamic efficiency is vital for optimizing aircraft performance and operational effectiveness. It enables greater speeds and reduced fuel consumption, leading to lower operating costs. Hence, the implementation of Gurney flaps represents a promising avenue for improving airfoil aerodynamics. The optimization of Gurney flaps holds considerable ramifications for improving the lift and stall characteristics of airfoils in aircraft and wind turbine blade designs. The efficacy of implementing Gurney flaps hinges significantly on its design parameters, namely, flap height and mounting angle. This study attempts to optimize these parameters using a design optimization framework, which incorporates training a Radial Basis Function surrogate model based on computational fluid dynamics (CFD) data from two-dimensional (2D) Reynolds-Averaged Navier–Stokes (RANS) simulations. The Cuckoo search algorithm is then employed to obtain the optimal design parameters and compared with other competing optimization algorithms. The optimized Gurney flap configuration shows a notable improvement of 10.28% in $C_l/C_d$, with a flap height of 1.9%$c$ and a flap mounting angle of $-58°$. The study highlights the effectiveness of the proposed design optimization framework and furnishes valuable insights into optimizing Gurney flap parameters. The comparison of metaheuristic algorithms serves to enhance the study's contribution to Gurney flap design optimization.

## 1 Introduction

The economic viability of a commercial aircraft is heavily dependent on its high-lift performance. For a given wing size, the payload capacity and the flight range of an aircraft can be increased using an efficient high-lift system. Furthermore, improved lift performance enables steeper takeoff ascents, which can significantly reduce noise pollution around airports. By enhancing the efficiency of the wing during ascent, the aircraft can attain its optimal cruising altitude quickly, resulting in a more fuel-efficient flight. As a result of these benefits, aircraft designers and engineers have increasingly turned their attention to these devices over time. Trailing-edge flaps and leading-edge slotted flaps are examples of such devices currently being used in the aviation industry. The flow over these elements involves boundary layer interactions, main element wakes, flow through flap slot, and potential flow outside the boundary layer. These complexities make the design, manufacturing, and maintenance of these devices very challenging, providing an impetus for the implementation of mechanically simpler performance enhancement devices like Gurney flaps (GF).

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A GF is a small rectangular strip-like element fixed near the airfoil's trailing edge facing the pressure side to enhance its performance. Its size varies from 1% to 5% of the chord ($c$) [1]. It was invented by the American racecar driver, Dan Gurney who implemented it on the rear wing of his racecar. While conducting on-track testing he found that his racecar was able to carry more momentum in the corners while also attaining greater straight-line speeds [2], indicating an improvement in the ratio of lift ($C_l$) and drag ($C_d$) coefficients. Gurney flap operates by inducing a separation of the airflow as it passes over its rear end near the trailing edge due to a sharp change in the airfoil profile causing a pressure decrement near the upper surface and an increment in pressure near the lower surface of the airfoil [3]. The increase in the pressure difference between the pressure and suction side of the airfoil leads to a decrement in the zero-lift angle of attack, an increment in the airfoil's maximum lift coefficient ($C_l$ max), and also an increment in the nose-down pitching moment ($C_m$), typically indicating an increment in the overall camber of the airfoil [3]. It also leads to an increment in the value of $C_d$, particularly at lower Angles of Attack (AoA) [4], but for thick airfoils, Neuhart and Pendergraft [5] has reported a reduction in the drag force. For obtaining a net improvement in $C_l/C_d$, the flap must be sized appropriately taking into account the boundary layer thickness, as recommended by Giguere et al. [6].

Over time, numerous experiments and numerical simulations have been performed to understand flow physics and optimize the performance of Gurney flaps. Liebeck [7] conducted an experimental study on Newman airfoil using a GF having a flap height ($h$) of 1.25%$c$. The results showed an increment in the Lift force (L) and a small decrement in the Drag force (D) acting on the airfoil. Also, it was observed that larger flap heights resulted in a greater increase in lift, but this was accompanied by a significant increase in drag beyond flap heights of 2%$c$. To explain these effects, Liebeck [7] hypothesized that the reversed flow region behind a GF comprises two contra-rotating vortices, altering the circulation and the Kutta condition in that region. Katz and Largman [8], as well as Katz and Dykstra [9], later conducted wind tunnel experiments by incorporating a GF on the trailing element of multi-element racecar wings. Their studies also reported a significant increment in lift, with the use of a 5%$c$ GF resulting in up to a 50% lift increase. However, the corresponding $C_l/C_d$ of the wing was found to decrease over the design angle of attack range ($2^\circ \leq \text{AoA} \leq 12^\circ$).

Jang et al. [2] conducted numerical investigations on NACA 4412 airfoil with GF attached to its trailing edge. The simulated GF heights ($h$) ranged from 0.5 to 3%$c$. The numerical solution indicated a significant increase in $C_l$ and $C_m$ with the use of GF. An increment in $C_l$ with a slight increase in $C_d$ was observed with flap heights less than 1.25%$c$. Compared to the baseline case (without the GF), the computed pressure distribution indicated an increment in the load along the airfoil section, predominantly near the trailing edge and the suction peak. Also, with the use of the GF, Jang et al. [2] reported a shift in the separation point farther aft at moderate Angles of Attack compared to the clean airfoil. These numerical results were consistent with the wind tunnel tests performed by Wadcock [10].

A comprehensive experimental study was performed by Jeffrey et al. [11] on single-element wings equipped with a Gurney flap. Forces, surface pressures, and velocities were measured using Laser Doppler Anemometry (LDA). The temporal-averaged streamlines and velocity vectors showed the presence of contra-rotating vortices behind the GF, which was in line with the earlier hypothesis by Liebeck [7] and numerical data of Jang et al. [2]. The counter-rotating vortices behind the GF modify the trailing edge Kutta condition and shift the meeting point of air flowing over the pressure and suction side further away from the airfoil in the downstream direction causing an increase in the overall camber and chord of the airfoil leading to an increase in the lift force and a small reduction in the drag force. This ultimately contributes to the increase in the airfoil efficiency ($C_l/C_d$). Additionally, smoke visualizations and LDA measurements revealed the presence of a Karman vortex street in the wake region of the GF. The periodic vortex shedding decreases the trailing edge pressure, while the bluff shape of GF retards the flow at the windward side of GF, increasing the pressure on the lower surface, thus increasing the overall lift force. Bloy and Durrant [12] carried out wind tunnel tests for finding surface pressure distributions and wake profiles of NACA $63_2 - 215$ airfoil having a GF and a 45° trailing edge flap. The data gathered from the experiments indicated that the 45° trailing edge flap performed better in comparison to the GF for the same flap height. Significant lift increments were observed for both flaps, with the trailing edge flap providing a lesser drag penalty compared with the GF. The addition of a 2%$c$ 45° trailing edge flap resulted in a significant increase in $C_l$ max, raising it from 1.06 to approximately 1.40. The maximum $C_l/C_d$ remained comparable to the baseline airfoil without GF but was achieved at a higher value of $C_l$. Furthermore, the flapped airfoil produced a lower value of $C_l/C_d$ at low to moderate values of $C_l$.

Hence, it can be concluded that the performance of the GF is highly sensitive to the values of its design parameters (flap height, width, mounting angle, and position on the chord line), which can be challenging to determine through traditional methods. To address this challenge, the present study proposes an optimization framework that uses a metaheuristic algorithm called the cuckoo search (CS) algorithm Yang and Deb [13] for

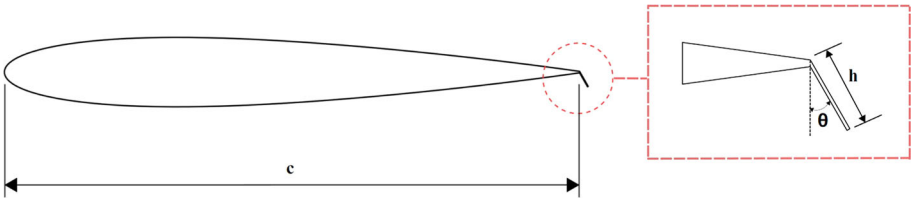



**Fig. 1** Schematic of NACA 0012 airfoil with GF fixed at the trailing edge

finding the optimal parameters for the GF. Studies [14–16] in the past have shown promising results and the CS algorithm has been shown to outperform widely used algorithms like PSO and GA on several occasions [17–19]. Previously, the cuckoo search algorithm has been utilized to address a broad spectrum of optimization problems. Roeva and Atanassova [20] used the CS algorithm in an *E. Coli* fed-batch fermentation procedure to identify the model parameters for the process. Their results indicated that the CS algorithm was highly effective in identifying optimal parameters for the process when compared to genetic algorithm (GA) and ant colony optimization (ACO). Yildiz [21] implemented the CS algorithm for optimizing machining parameters in milling operations. The results of the study indicated a substantial reduction in manufacturing time when compared to other optimization techniques like ACO, PSO, and handbook recommendations. Kaveh et al. [22] highlights the advantages of using the CS algorithm for designing two-dimensional steel frames. The findings indicated that Lévy flights were more efficient and effective in the searching process for large design spaces compared to the Gaussian or uniform distributions commonly used by other metaheuristic algorithms. Valian et al. [23] used a modified CS algorithm where the parameters are tuned to increase the algorithm's efficiency and used the improved CS algorithm by calculating the weights and biases of a neural network. Their study highlights the importance of metaheuristic algorithms in neural network parameter optimization problems where a differentiable neuron transfer function is not available.

Studies in the past have either analyzed only one parameter of the GF [24] or used time-consuming heuristic methods to optimize the multiple GF parameters [25]. In the present study, a novel optimization framework is employed to optimize the mounting angle ($\theta$) and height ($h$) of a Gurney flap. This is achieved by utilizing the Radial Basis Function (RBF) surrogate model to generate a response surface. This response surface captures the behavior of force coefficients with the simultaneous variation of $\theta$ and $h$. The present study can be broken down into three objectives:

1. The first objective is to develop a framework comprising the usage of CFD data to train a surrogate model.
2. The second objective is to execute the CS algorithm to obtain the Gurney flap configuration with the optimal design parameters and analyze its effect on the flow field.
3. The third objective is to quantitatively compare the CS algorithm with respect to five other prominent metaheuristic algorithms.

To the best of the authors' knowledge, this is the first study that provides a comprehensive quantitative comparison among state-of-the-art metaheuristic algorithms for the design optimization of a Gurney flap.

## 2 Computational modeling

### 2.1 Gurney flap layout and parameterization

NACA 0012 airfoil of chord ($c$) 1 m was chosen for the optimization study. This choice was based on the comprehensive experimental research conducted by Li et al. [26], which extensively examined the baseline as well as the airfoil with a GF. The configuration of the GF is determined by four key parameters: flap height, flap width, mounting angle in relation to the chord, and its position along the chord. Figure 1 depicts the schematic of a NACA 0012 airfoil having a GF mounted to its trailing edge facing the pressure side. The flap height is represented by $h$, and the angle made by the GF with the normal to the chord is denoted by $\theta$. The flap angle is assigned a positive value when measured clockwise and a negative value when measured anticlockwise from the line normal to the chord. Based on past experimental and numerical studies [1,4–7,26], adjusting $h$ and $\theta$ of the GF can significantly improve the airfoil's efficiency ($C_l/C_d$), while changing the GF width has no significant impact on the airfoil's performance. Additionally, investigations conducted by Li et al. [25] on NACA 0012 to examine the impact of the mounting position of GF on the airfoil's performance showed that

mounting the GF at the trailing edge resulted in a more efficient airfoil than shifting it forward. Therefore, the present optimization study focuses on the parameters, $h$ and $\theta$, with GF placed at the trailing edge and the flap width kept constant at 0.2%c. The limits for both parameters are determined based on previous investigations, with $h$ ranging from 0.5 to 4%$c$ and $\theta$ ranging from $-60°$ to $30°$.

## 2.2 Numerical model

The surrogate model for the optimization study was trained on the CFD data generated using two-dimensional RANS simulations carried out using ANSYS Fluent version 22.1 [27]. The selection of a turbulence closure model is a crucial part affecting the accuracy of CFD solutions. The flow over an airfoil involves adverse pressure gradients, flow separation, and re-circulation zones, hence the $k-\omega$ Shear Stress Transport (SST) turbulence model of Menter [28] was used to carry out these simulations due to its ability to model such type flows accurately, which was verified by past numerical studies on airfoils [29–31]. In these numerical investigations, several turbulence models like the one-equation Spalart-Allmaras model, two-equation Standard, RNG, and Realizable $k-\epsilon$ models, as well as Standard, BSL, and SST $k-\omega$ models were compared based on their capability to model the flow over airfoils below the stall angle. It was concluded from these studies that the SST $k-\omega$ turbulence model performs better in comparison to the other investigated models for accurately modeling the flow features around airfoils, thus informing the decision to use this model for the present study. Moreover, $k-\omega$ SST model utilizes a blending function to switch between Wilcox $k-\omega$ and $k-\epsilon$ model. Close to a wall, the blending function preserves the characteristics of the $k-\omega$ model while gradually transitioning toward the conventional $k-\epsilon$ model as the distance from the surface increases. This is done due to the robustness of the $k-\omega$ model in capturing the effect of the viscous sub-layer and using the $k-\epsilon$ model in the free-stream region to overcome the sensitivity of the $k-\omega$ turbulence model to entrance turbulence parameters. The mathematical formulation [28] of the numerical model is as follows: Continuity Equation:

$$\frac{\partial(u_x)}{\partial x}+\frac{\partial(u_y)}{\partial y}=0 \tag{1}$$

Two-dimensional viscous incompressible Navier–Stokes equations:

$$\begin{aligned}\frac{\partial(\rho u_x)}{\partial t}+u_x\frac{\partial(\rho u_x)}{\partial x}+u_y\frac{\partial(\rho u_x)}{\partial y}&=-\frac{\partial p}{\partial x}+\mu\left(\frac{\partial^2 u_x}{\partial x^2}+\frac{\partial^2 u_x}{\partial y^2}\right)\\ \frac{\partial(\rho u_y)}{\partial t}+u_x\frac{\partial(\rho u_y)}{\partial x}+u_y\frac{\partial(\rho u_y)}{\partial y}&=-\frac{\partial p}{\partial y}+\mu\left(\frac{\partial^2 u_y}{\partial x^2}+\frac{\partial^2 u_y}{\partial y^2}\right)\end{aligned} \tag{2}$$

Transport Equations for k and $\omega$:

$$\frac{D(\rho k)}{Dt}=\Gamma_{ij}\frac{\partial u_i}{\partial x_j}-\beta^*\rho\omega k+\frac{\partial}{\partial x_j}\left[(\mu+\sigma_k\mu_t)\frac{\partial k}{\partial x_j}\right] \tag{3}$$

$$\frac{D(\rho\omega)}{Dt}=\frac{\gamma\rho}{\mu_t}\Gamma_{ij}\frac{\partial u_i}{\partial x_j}-\rho\beta\omega^2+\frac{\partial}{\partial x_j}\left[(\mu+\sigma_\omega\mu_t)\frac{\partial\omega}{\partial x_j}\right]+2(1-F_1)\rho\sigma_\omega\frac{1}{\omega}\frac{\partial k}{\partial x_j}\frac{\partial\omega}{\partial x_j} \tag{4}$$

In the above equations, the Reynolds stress tensor ($\Gamma_{ij}$) is given by:

$$\Gamma_{ij}=\mu_t\left(1-\frac{1}{3}\frac{\partial u_k}{\partial x_k}-\frac{1}{3}\rho k\right)\left(\frac{\partial u_i}{\partial x_j}+\frac{\partial u_j}{\partial x_i}\right) \tag{5}$$

At this point, the eddy viscosity ($\mu_t$) is defined as:

$$\mu_t=\frac{a_1\rho k}{\max(a_1\omega,\Omega F_2)} \tag{6}$$

The model parameters in all the above equations are as follows:

$$\begin{aligned}\sigma_k=0.85,\sigma_{\omega1}=0.5,\beta=0.0750,a_1=0.31\\ \beta^*=0.09,k=0.41,\gamma=\frac{\beta}{\beta^*}-\sigma_{\omega1}k^2\sqrt{\beta^*}=0.55317\end{aligned} \tag{7}$$

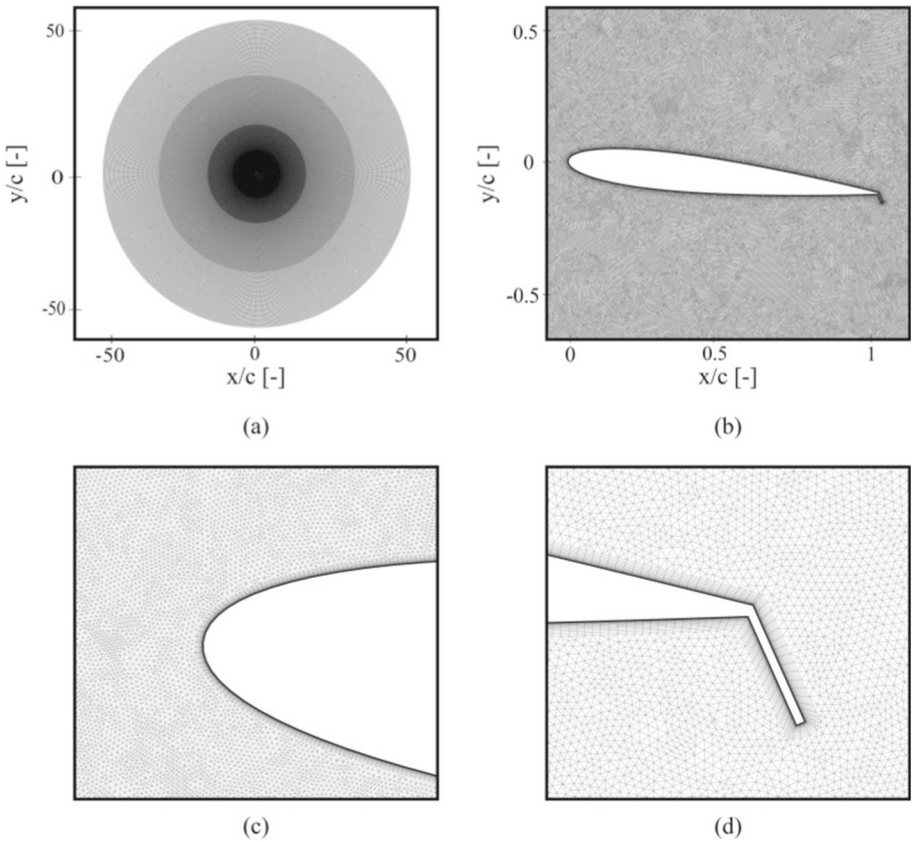



**Fig. 2** Computational grid of NACA 0012 airfoil (AoA = 6°) equipped with a GF ($h$ = 30%$c$ and $\theta$=-30°). **a** Overall mesh, enlarged views near the **b** airfoil, **c** leading edge, and **d** trailing edge

## 2.3 Computational grid

An O-type flow domain was used for the CFD simulations. The chord of the NACA 0012 airfoil was taken as 1 m. The origin of the flow domain was fixed at the leading edge of the airfoil and the outer periphery of the domain was kept at 50 times the chord, $R = 50c$ from the origin. A large domain size was chosen to prevent flow reflection from the outer periphery. Furthermore, the outer periphery was split into two parts, where the left part served as the inlet and the right part as the outlet. To reduce the discretization error, second-order grid cells were used. The flow domain was divided into two parts; the region close to the airfoil having an unstructured tri mesh and the other part having a structured O-grid quad mesh. This was done to avoid bad quality and high aspect ratio cells near the airfoil and the GF. Another major reason for taking this approach is based on the parametric framework that was developed for carrying out the simulations. In simulating each new design point (with a new value of $h$ and $\theta$ for the GF) the geometry would get updated first, followed by the re-meshing and solution process. By taking the current approach of splitting the domain, the mesh generator would keep the mesh in the outer domain unchanged while updating the mesh only inside the inner domain. This speeds up the meshing process and ultimately reduces the overall simulation time. The $y^+$ of the grid was kept below 1 to capture the boundary layer effects and about 32 inflation layers were wrapped around the airfoil and the GF.

The first layer height was taken as $5 \times 10^{-3}$mm, and the height of subsequent layers was based on a constant growth rate of 1.14. Figure 2 shows the cell distribution inside the flow domain of the airfoil equipped with a GF ($h = 30$ mm and $\theta$ =-30°). A higher grid density near the airfoil and the GF can be observed from Fig. 2. This was done to resolve the flow physics accurately in regions of the flow domain with high-velocity gradients and turbulence and at the same time keep the overall computational cost low by avoiding excessive cells in far-field regions.

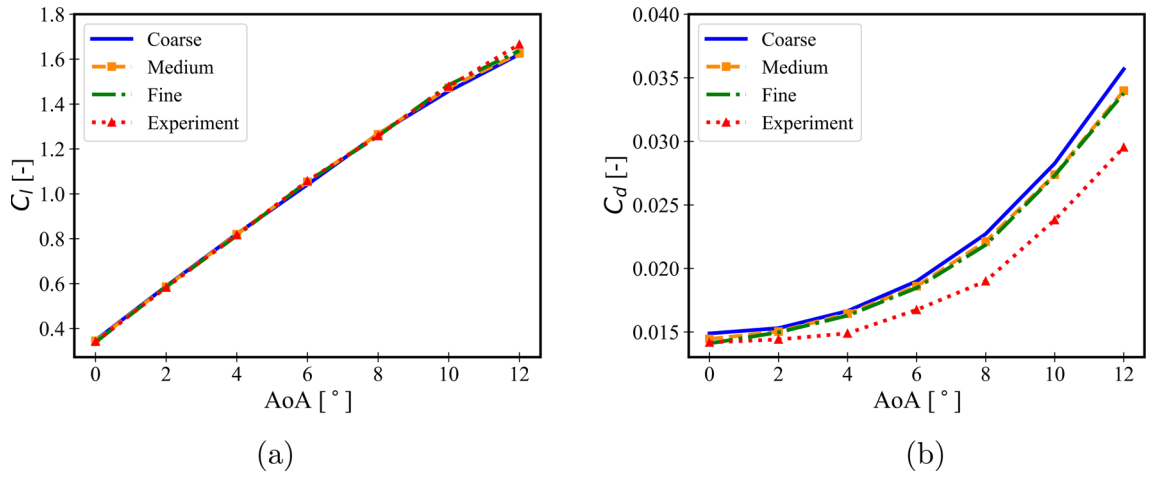



**Fig. 3** Comparison of CFD results for three different grid resolutions (Coarse, Medium, and Fine) with experimental [26] data for the airfoil with GF ($h = 2\%$, $\theta = 0°$). **a** $C_l$ and **b** $C_d$

## 2.4 Setup and boundary conditions

Steady-state RANS simulations were carried out utilizing k-$\omega$ SST [28] model for turbulence closure. The inlet was assigned with the default values of turbulent intensity ($I = 5$ %) and turbulent viscosity ratio ($\mu_t/\mu = 10$). A free-stream velocity ($U_\infty$) of 31 m/s (Mach number = 0.091) was assigned at the inlet and the Reynolds number (Re) was kept at $2.1 \times 10^6$. The no-slip condition was assigned to the airfoil and the outlet was assigned the pressure outlet boundary condition. The operating pressure was taken as 101325 *Pa*, and both the inlet and outlet were assigned a gauge pressure of 0 *Pa*. Since the Mach number for the simulation is much less than 0.3, an incompressible pressure-based solver was used for the simulation. The density ($\rho = 1.225\,\mathrm{kg/m^3}$) and the dynamic viscosity ($\mu = 1.7894 \times 10^{-5}\,\mathrm{kg/ms}$) were kept constant. The force coefficients ($C_l$ and $C_d$) were non-dimensionalized using a reference area, $A = 1.6\,\mathrm{m}^2$, and a reference length, $l = 1\,\mathrm{m}$. The pressure–velocity coupling utilized the COUPLED algorithm [27], while gradient discretization employed the least square cell-based scheme. For the spatial discretization of pressure, momentum, turbulent kinetic energy, and specific dissipation rate, the second-order linear upwind scheme was used. To ensure the convergence of $C_l$ and $C_d$ monitors and the residuals to fall below the specified limit of $1 \times 10^{-5}$, 1000 iterations were used for all the simulation cases.

## 2.5 Grid convergence study and numerical model validation

To examine the sensitivity of the CFD solution on the grid size and estimate the discretization error, a grid convergence study was conducted using the Richardson Extrapolation method [32]. For the study, three different grids were constructed, namely Coarse, Medium, and Fine and their cell counts are $2 \times 10^5$, $4 \times 10^5$, and $8 \times 10^5$, respectively. For clarity and ease of tracking, instead of cell count $N_c$, the representative cell length $h_c$ was used for the study as $h_c \to 0$ while $N_c \to \infty$ for an infinitely fine grid. The representative cell length $h_c$ is given by

$$h_c = \frac{1}{N_c} \sum_{\text{Cells}} A_p^{1/2} \tag{8}$$

where $A_p$ is the cell area and $N_c$ is the cell count in the grid. After this, the refinement ratio $r$ was calculated which is the ratio of $h_c$ for medium and fine grids. Celik et al. [32] recommends that the representative cell lengths ($h$) should be at least 30% different between each grid size. In the next step, the order of convergence $p$ of the grid was determined based on the values of solution variable $\phi$ for the coarse, medium, and fine grids. For the present study, the ratio of $C_l/C_d$ was selected as the solution variable. The parameter $p$ gives a quantitative indication of the change in discretization error with a change in grid size. The order of convergence $p$ is given

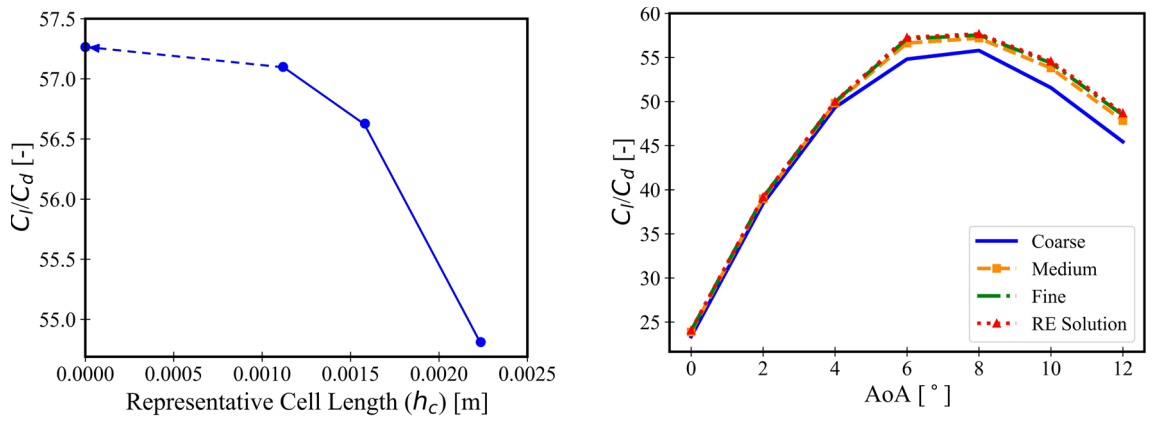



**Fig. 4** **a** Variation of the computed value of $C_l/C_d$ for the airfoil with GF ($h = 2\%, \theta = 0°$) at AoA = 6° with decreasing grid sizes and **b** Comparison of $C_l/C_d$ for the airfoil with GF ($h = 2\%, \theta = 0°$) computed using three different grid resolutions (Coarse, Medium, and Fine) with Richardson Extrapolation (RE) solution

by

$$p = \frac{\ln\left(\frac{\phi_{\text{coarse}} - \phi_{\text{medium}}}{\phi_{\text{medium}} - \phi_{\text{fine}}}\right)}{\ln(r)} \tag{9}$$

After finding the parameter $p$, the solution variable for an infinitely fine grid ($N_c \to \infty$ or $h_c \to 0$) $\phi_{\text{exact}}$ was estimated. It is also called Richardson Extrapolation (RE) solution and is given by

$$\phi_{\text{exact}} = \phi_{\text{fine}} - \frac{\phi_{\text{medium}} - \phi_{\text{fine}}}{r^p - 1} \tag{10}$$

From all the values calculated above, three different error metrics are calculated. These are as follows:

1. Relative Error: It indicates the closeness of the solution of the medium and fine grids. It is not the most reliable metric since it ignores the estimated solution of the infinitely fine grid. It is given by

$$e = \frac{\phi_{\text{medium}} - \phi_{\text{fine}}}{\phi_{\text{fine}}} \tag{11}$$

2. Extrapolated Relative Error: It indicates the closeness of the solution of fine grid to the estimated value for the infinitely fine grid. It is given by

$$e^{\text{extr}} = \frac{\phi_{\text{fine}} - \phi_{\text{exact}}}{\phi_{\text{exact}}} \tag{12}$$

3. Grid Convergence Index: It was proposed by Roache [33] for improving the relative error metric. The relative error is scaled by a factor of $1/(r^p - 1)$. This scaling accounts for the order of convergence of the solution, which is absent in the definition of relative error. To complete its definition, Roache [33] applied a factor of safety of 1.25. Hence, it is given by

$$\text{GCI} = \frac{1.25e}{r^p - 1} \tag{13}$$

The findings of the grid convergence and validation studies are summarized below:
For the validation of the numerical model, results of wind tunnel experiments carried out by Li et al. [26] were used. Figure 3 represents the comparison of the CFD solutions with the wind tunnel data for $C_l$ and $C_d$. At higher values of AoA, the discrepancy between the CFD results and experimental data grows more pronounced, particularly when using coarser grid resolutions. By using the fine grid, the maximum deviation from the experimental results for the airfoil equipped with GF ($h = 2\%, \theta = 0°$) was found to be 1.69% and

**Table 1** Results of grid dependency study for airfoil equipped with GF ($h = 2\%, \theta = 0°$)

| AoA [°] | $C_l/C_d$ [−] | | | | p [−] | e% | $e^{extr}$[%] | GCI [%] |
|---|---|---|---|---|---|---|---|---|
| | Coarse | Medium | Fine | RE solution | | | | |
| 0 | 23.351 | 23.877 | 24.024 | 24.081 | 1.843 | 0.610 | 0.235 | 0.295 |
| 2 | 38.446 | 38.987 | 39.124 | 39.170 | 1.984 | 0.350 | 0.118 | 0.148 |
| 4 | 49.333 | 49.827 | 49.958 | 50.006 | 1.910 | 0.263 | 0.095 | 0.119 |
| 6 | 54.811 | 56.628 | 57.100 | 57.265 | 1.945 | 0.826 | 0.289 | 0.362 |
| 8 | 55.787 | 57.185 | 57.543 | 57.667 | 1.965 | 0.623 | 0.214 | 0.268 |
| 10 | 51.571 | 53.798 | 54.373 | 54.573 | 1.953 | 1.058 | 0.367 | 0.460 |
| 12 | 45.444 | 47.840 | 48.469 | 48.693 | 1.930 | 1.298 | 0.460 | 0.577 |

15.00% for $C_l$ and $C_d$, respectively. The deviation in the results could be due to various factors: geometric simplification and 2D modeling in CFD simulations, differences in the surface roughness characteristics of the airfoil, uncertainties in measurements inside the wind tunnel, differences in free-stream turbulence parameters, steady-state assumption, numerical and modeling errors, etc. Despite this, the deviation in the results is within the acceptable range. Hence the fine grid will be used for the further part of the optimization study.

The solution at $h_c = 0$ in Fig. 4a represents the RE solution or the solution at the infinitely fine grid. It also depicts the variation in the value of $C_l/C_d$ with decreasing grid sizes for the airfoil at AoA 6°. It is evident that the solution obtained from the refined grid closely aligns with the RE solution. In addition, Fig. 4b represents the comparison of the computed solution for the coarse, medium, and fine grids with the RE solution at various AoA. This plot also shows the accuracy of the fine grid in capturing the flow physics better in comparison to the medium and coarse grids. Finally, computed values of all the error metrics discussed earlier and the order of convergence of the grids for the airfoil with GF are presented in Table 1. It can be concluded that all the error metrics are less than 1.3% for the validation case. Also, the order of convergence of the grid is slightly less than two. This could be due to the presence of skewness errors in the grids and gradient limiters in the face interpolation schemes.

## 3 Optimization framework

### 3.1 Sample acquisition

Before creating a successful surrogate model, an important step is to generate the required training data. The data points must be spread evenly to represent the entire design space. Latin Hypercube Sampling (LHS) by McKay et al. [34] is a popular method for sampling data points in the design space.

### 3.2 Surrogate modeling

Design optimization problems that make use of a large number of computational simulations require expensive computational resources [35]. Surrogate models may solve the problem of simulations' high computing costs. These models build a response surface from a small number of simulations to efficiently explore the design space and predict output variables. This enables researchers to simulate complicated systems more accurately with fewer computational resources. These models are trained using a subset of simulation data and validated using the rest. In previous investigations [36–39], the RBF surrogate model has accurately described significant nonlinear interactions between variables. Its simplicity, ease of implementation, versatility, and efficiency made it the appropriate surrogate model for this investigation.

Design optimization problems that make use of a large number of computational simulations require expensive computational resources [35]. The development of surrogate models has emerged as a promising approach to address the challenges posed by the high computational costs associated with simulations. These models involve constructing a response surface using data obtained from a limited number of simulations, allowing for the efficient exploration of the design space and prediction of the relevant output variables. By utilizing surrogate models, researchers have been able to simulate complex systems with a higher degree of accuracy while minimizing the computational resources required to do so. These models are typically trained using a subset of the available simulation data, with the rest of the data used for the purpose of validation. The

**Table 2** RBF Kernel functions

| Kernel function type | Formula |
|---|---|
| Multiquadratic | $\psi(r) = (r^2 + c^2)^{0.5}$ |
| Thinplate | $\psi(r) = r^2 \log(r + 1)$ |
| Gaussian | x $\psi(r) = \exp(-\frac{1}{2}\frac{r^2}{c^2})$ |
| Cubic | $\psi(r) = r^3$ |
| Linear | $\psi(r) = r$ |

RBF surrogate model has been widely used in past studies [36–38] and has been shown to describe strong nonlinear relationships between variables with sufficient accuracy [39]. Moreover, its simple structure, ease of implementation, flexibility, and efficiency are the key factors for which it has been chosen as the surrogate model in this study.
The following steps describe the construction of the surrogate model:

1. Each design sample obtained from LHS and its corresponding objective function value ($C_l/C_d$) is recorded as $x_i$ and $F_i(i = 1, 2, 3...n)$, respectively. Here, $n$ is the number of samples generated from LHS.
2. The Basis Function is selected. Commonly used basis functions are shown in Table 2. The Gaussian basis function is a popular choice for radial basis function (RBF) surrogate models due to its ability to effectively capture smooth variations in the data. This basis function is defined by a Gaussian distribution centered at each data point, which creates a smooth surface that can be used to approximate the behavior of the underlying system. In the context of the current problem, the CFD data provided is relatively smooth and does not have many sharp variations, which makes the Gaussian basis function a logical choice. Additionally, the Gaussian basis function is computationally efficient, which is an important consideration when working with large data sets. By using the Gaussian basis function in the RBF model, one can effectively capture the behavior of the system in a simplified and computationally efficient manner.
3. The RBF is then expressed as:

$$\hat{y} = \sum_{i=1}^{n} \lambda_i \phi(r(x, x_i)) \tag{14}$$

   where $\hat{y}$ is the predicted value for design sample $x$, $\lambda_i$ is the weighted coefficient of the $i^{th}$ basis function, $r(x, x_i)$ is the distance between sample $x_i$ and the testing point $x$, and $\phi$ is the basis function.
4. The parameters $\lambda_i$, can be interpolated using the condition that the predicted value of the objective function at the known sample points is equal to the true response value of the sample point.

$$\hat{y} = y(x_i), i = 1, 2, 3, ..., n \tag{15}$$

5. Combining Eqs. (14) and (15), leads to the matrix equation given by:

$$\phi\lambda = \mathbf{y} \tag{16}$$

   Based on Eq. (16), $\lambda$ can be determined and the RBF surrogate model can be used to predict $C_l/C_d$ values for any sample point in the design space.

### 3.3 Cuckoo search algorithm

Cuckoo search algorithm was proposed by Yang and Deb [13]. The algorithm takes its inspiration from the behavior of cuckoos and their brood parasitism. Cuckoo birds exhibit a highly aggressive reproductive strategy, with certain species laying eggs in communal nests and removing the host bird's eggs to increase the chances of their eggs being hatched. As a result, host birds often engage in conflict with cuckoos, with some host birds discovering the cuckoo eggs and responding by either abandoning the nest or building a new nest somewhere else. The probability of this behavior occurring is controlled by a parameter, denoted by $p_a$. Studies have also shown that cuckoo chicks can mimic host chicks' calls, potentially gaining more opportunities for feeding

**Algorithm 1:** Cuckoo search algorithm

**Input**: Number of nests $N$, maximum generation $T_{\max}$, fitness function $f(\cdot)$
**Output**: Global optimum solution $\mathbf{x}^{\star}$

```
Objective Function f(x)
Initialize nests with random solutions x_i (i = 1, 2, .., N) and set t ← 0
while t < T_max do
    Get random cuckoo i and use Lévy flights for generating new solution;
    Calculate fitness of each nest f_i = f(x_i)
    Sort the nests based on their fitness values.
    Randomly select a nest (say j);
  if f(x_i) > f(x_j) then
    Replace j with the new solution
  end
    Abandon a fraction (P_a) of worse nests
    Build new nests via Lévy flights
    Nests with best solutions are kept
    Rank the solutions and find the current best
end
  t ← t + 1
return x*;
```

from host parents. These adaptive behaviors suggest that cuckoos have evolved to exploit the reproductive strategies of their host birds, allowing them to increase their own fitness and ensure their survival.

It has been discovered that the majority of the wildlife creatures follow a randomized path in order to search for potential food or preys. The subsequent movement of the animals is determined by both its current location and the next probable location. The direction of their next move can be chosen using a mathematical probability function.

Many studies in the past have shown the use of Lévy flights in the behavior of animals and insects [40–42]. A study by Reynolds and Frye [43] has highlighted the search patterns of fruit flies where they explore their surroundings in straight paths followed by sudden right-angle turns. This leads to a Lévy flight style of searching patterns. The patterns of Lévy flight have also been observed in the hunting patterns of the Ju/'hoansi tribe [44]. Rays of light are also found to have the same mathematical behavior as found in Lévy flights. Many studies have applied this behavior to solve problems in system optimization, showing promising capabilities [45,46].

Lévy flight is performed each time while generating new solutions $x_i^{t+1}$ for cuckoo $i$.

$$x_i^{t+1} = x_i^t + \alpha \oplus L\acute{e}vy(\beta_s) \tag{17}$$

$$L\acute{e}vy(\beta_s) = 0.01 \times \frac{u \times v}{|v|^{\frac{1}{\beta_s}}}, \qquad \sigma = \frac{\Gamma(1+\beta_s) \times \sin(\frac{\pi\beta_s}{2})^{\frac{1}{\beta_s}}}{\Gamma(\frac{1+\beta_s}{2}) \times \beta_s \times 2^{\frac{\beta_s-1}{2}}} \tag{18}$$

Lévy flights provide a random walk where the steps are drawn from a Lévy distribution. The variables $u$ and $v$ denote random numbers in the range (0, 1) and $\beta_s$ is a hyper-parameter set to 1.5.

$$L\acute{e}vy \sim u = t^{-\lambda}, \quad (1 < \lambda \leq 3) \tag{19}$$

which has an infinite variance with an infinite mean.

For maximization problems, such as the one in the present study, the quality of an egg is proportional to $C_l/C_d$ at each design point. Algorithm 1 presents the pseudo-code of the CS algorithm. After successful training of the surrogate model and the subsequent generation of the response surface, the CS algorithm is used on the response surface to obtain the most optimal configuration of the gurney flap. The entire framework is summarized in a flowchart shown in Fig. 5.

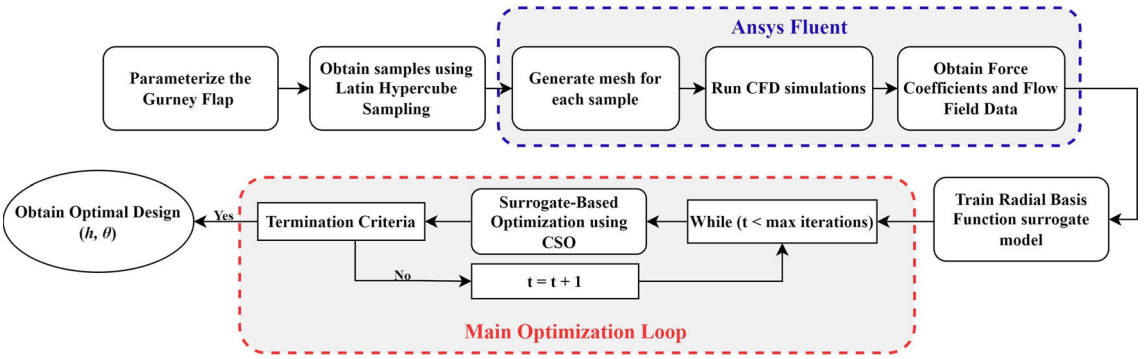



**Fig. 5** Flowchart of optimization framework

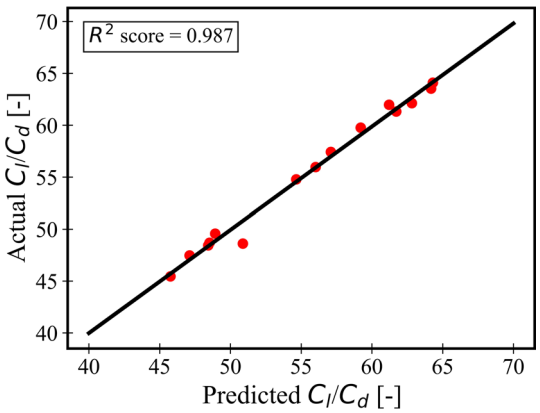



**Fig. 6** Validation of the RBF surrogate model

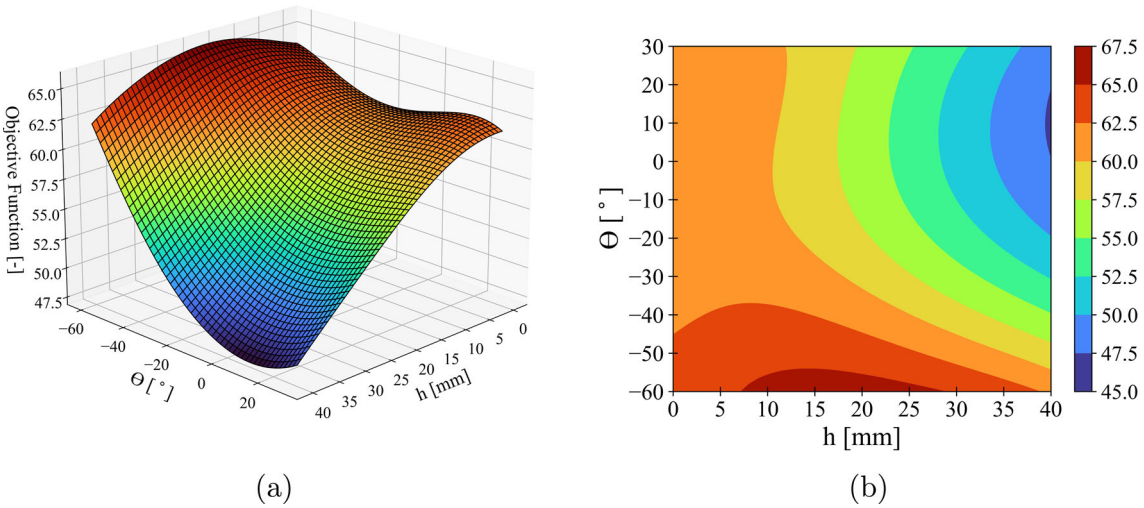



**Fig. 7** Response surface generated using RBF surrogate model

## 4 Results and discussion

### 4.1 Radial basis function surrogate model

Eighty sample points with different design parameters were generated using LHS, and these sample points were used to carry out CFD simulations. Out of the 80 sample points, 65 were used for training the surrogate model, and the rest were used to validate the model. In light of minimal deviation from experimental data, an

AoA of 6° was selected as the focal point of the present study. While a similar framework could be constructed for other angles of attack, such an attempt was deemed redundant for this study, and thus the present analysis was concentrated on the aforementioned 6° AoA. The accuracy of the RBF surrogate model has been assessed as shown in Fig. 6. The $R^2$ score of the data is observed to be 0.984. The response surface generated by the RBF surrogate model highlights the nonlinear dependency of the airfoil's efficiency on the Gurney flap height. The response surface generated by the surrogate model is shown in Fig. 7, illustrating the strong nonlinear dependence of the objective function on the design parameters. The response surface reveals that increasing h beyond 2.5%$c$ and increasing the flap mounting angle beyond −40° results in a decrease in the airfoil efficiency ($C_l/C_d$). Conversely, the maximum airfoil efficiency is achieved when h is in the range of 1.5%$c$ to 25%$c$, and the flap mounting angle is in the range of −60° to −50°. These findings provide valuable insights for optimizing the design of Gurney flaps, as they provide an indication of the ranges of flap height and mounting angle that can significantly improve the airfoil efficiency.

### 4.2 Cuckoo search probability parameter

After the RBF surrogate model has been trained with the CFD data, cuckoo search optimization is performed on the response surface to maximize the objective function. As discussed earlier, the CS algorithm has a probability parameter that is responsible for the exploratory phase of the algorithm. The probability parameter must be chosen carefully after a thorough inspection to ensure that the algorithm performs most efficiently. Figure 8a illustrates the impact of various probability parameters on the algorithm's performance. As the algorithm operates stochastic fashion, it was executed 20 times for each probability parameter, and the mean performance of each parameter was recorded and is shown in the figure. The convergence of the CS algorithm was compared for the following values of $p_a$, 0.1, 0.25, 0.4, 0.5, and 0.8. It can be observed in Fig. 8 that the CS algorithm performs best for $p_a = 0.8$, as it converges much quicker than and also obtains the most optimal solution. At $p_a = 0.4$, the algorithm converges at a similar rate but seems to move toward a local minimum and obtains a sub-optimal solution. For $p_a = 0.1$, the optimal solution is obtained but at a much slower rate when compared to $p_a = 0.8$. For $p_a = 0.25$ and 0.5, the algorithm fails to obtain an optimal solution. Therefore, in this study, $p_a = 0.8$ is observed to generate the best design for the gurney flap.

### 4.3 Performance against other algorithms

The results obtained by the CS algorithm are quantitatively compared against other optimization methods to objectively assess its performance. For increased computational efficiency, $N_p$ was set to 5 for all algorithms. The following metaheuristic algorithms were used for comparison:

- Particle Swarm Optimisation (PSO): PSO involves the swarm intelligence of bird flocks. Owing to its simplicity and efficiency, it has become a tool to solve optimization problems [47].
- Harris' Hawk Optimizations (HHO): HHO is a novel, complex meta-heuristic approach that utilizes the intelligence of hawks in attacking and chasing their prey [48].
- Whale Optimization Algorithm (WOA): WOA is a novel swarm-based algorithm based on humpback whale's hunting behavior [49].
- Bat Algorithm (BA): BA is an algorithm that mimics the echolocation ability of micro bats for solving mathematical problems [50].
- Grey Wolf Optimization (GWO): GWO is an optimization algorithm inspired by wolves' hunting behavior [51].

As observed in Fig. 8b, the highest percentage of improvement in the objective function is obtained by the cuckoo search algorithm, followed closely by WOA and GWO. The better results obtained by the CS algorithm can be attributed to the superior exploration capabilities of CS that help it generate new solutions to escape from local optima. CS has a good exploration capability due to its ability to generate new solutions using random walk steps and the Lévy flight step. In contrast, PSO and HHO are reliant on the current best-known solutions, making them prone to getting trapped in local optima. GWO's premature convergence can be explained by considering the dominance of alpha and beta wolves. BA and WOA do not show as good an exploration capability since they rely mainly on the random search and adaptive movement, respectively. Also, the CS algorithm has a mechanism to maintain diversity by replacing the worst solutions with new ones. This helps to prevent the search from getting stuck in a sub-optimal region. PSO and HHO lack such a mechanism, which

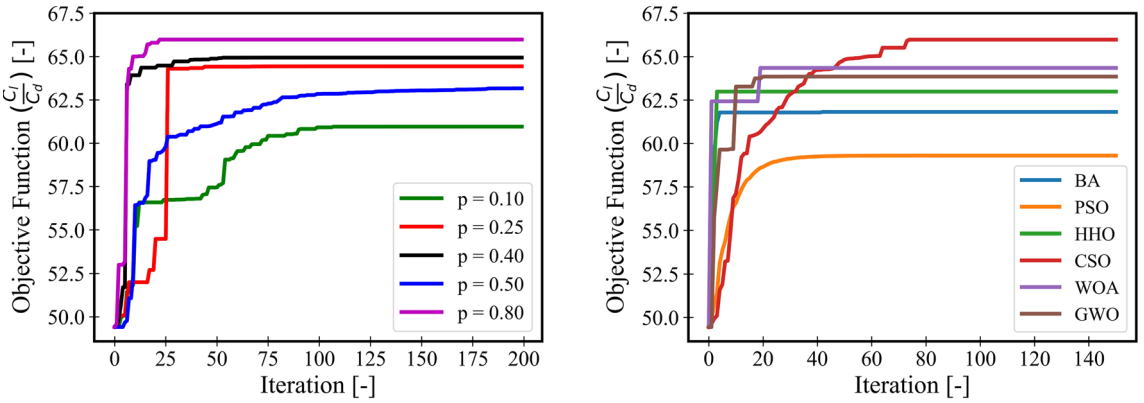



**Fig. 8** **a** Performance of CS algorithm for different values of probability parameter, **b** Performance of other metaheuristic algorithms compared to CS algorithm

**Table 3** Comparison of force coefficients between Foil A, Foil B, and Foil C

| Case | $C_d$ [−] | $C_l$ [−] | $C_l/C_d$ [−] | Change in $C_l/C_d$ [%] |
|---|---|---|---|---|
| Foil A | 0.011 | 0.647 | 58.818 | 0 |
| Foil B | 0.025 | 1.223 | 48.920 | −16.838 |
| Foil C | 0.015 | 0.973 | 64.867 | +10.284 |

can limit their ability to explore the search space. GWO has a diversity mechanism, but it may be insufficient in some cases.

### 4.4 Convergence monitors

Convergence monitoring was employed during the steady-state simulations, where the iteration count was set at 1000, and a combination of convergence monitors was used. These included scaled residuals for continuity, momentum, k, $\omega$, computed values of global mass imbalance, and the coefficients of lift and drag ($C_l$ and $C_d$). The convergence monitors for the Foil A case are presented in Fig. 9, indicating that the residuals fall below the tolerance limit of $1 \times 10^{-5}$ within the preset 1000 iterations. The constant values attained by $C_l$ and $C_d$ suggest that the simulation had converged to a stable solution. Moreover, the net outflow of mass settled at a value in close proximity to zero well before the completion of 1000 iterations. These results, in conjunction with the comprehensive grid dependence and validation studies conducted in Sect. 2, supports the accuracy of the numerical model in capturing the flow physics of the current study. These findings provide valuable insights for future studies seeking to predict and analyze the aerodynamic performance of Gurney flaps.

### 4.5 Optimum Gurney flap parameters

The findings of the optimization study are summarized in Table 3, where Foil A represents the baseline airfoil without the GF, Foil B represents the initial design point ($h = 35$ mm and $\theta = 8°$) of the optimization algorithm, and Foil C represents the optimum GF configuration ($h = 19$ mm and $\theta = -58°$). It can be observed that the implementation of the GF in the Foil B configuration significantly increases the value of $C_l$ compared to Foil A, but at the same time, the value of $C_d$ also increases considerably, resulting in a decrement in the value of $C_l/C_d$ compared to Foil A. Conversely, for the Foil C configuration, while the value of $C_l$ increases significantly compared to Foil A, the increase in the value of $C_d$ is relatively low, leading to an increase in $C_l/C_d$ compared to Foil A. Overall, the results demonstrate that the optimized Gurney flap configuration (Foil C) offers a substantial improvement in airfoil efficiency (measured by $C_l/C_d$) compared to the baseline (Foil A) and the initial design point (Foil B).

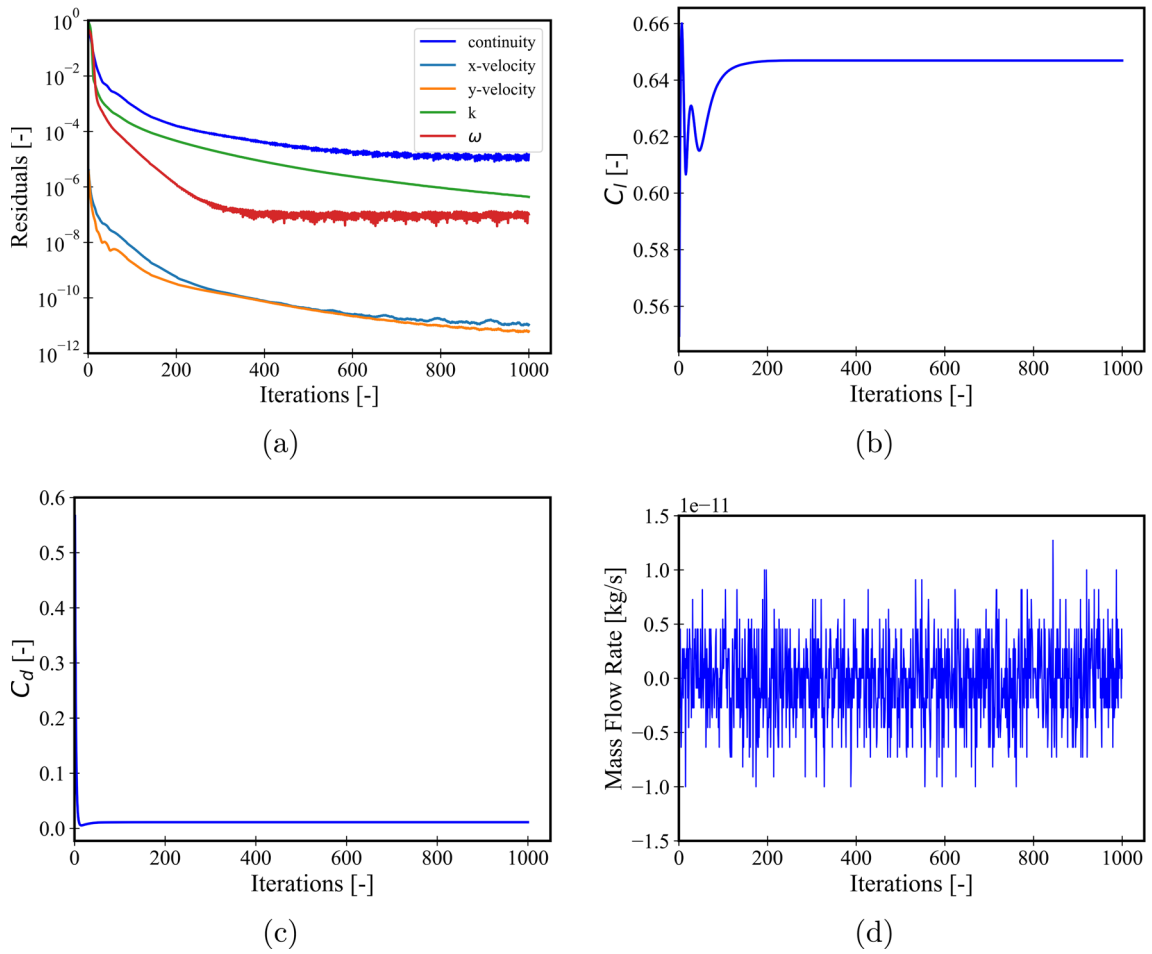



**Fig. 9** Convergence monitors for Foil A. **a** Residuals, **b** $C_l$, **c** $C_d$, and **d** Global mass imbalance

### 4.6 Trailing edge flow structure

The pathlines in the vicinity of the trailing edge (AoA = 6°) are shown in Fig. 10. For Foil B and C, re-circulation zones can be observed upstream and downstream of the GF consistent with Liebeck's hypothesis [7]. In addition, a downwash of air at the trailing edge is present due to the GF. The re-circulation zone downstream of the GF is inclined downwards and shifts the stagnation point far aft of the flap, increasing the effective chord and camber of the airfoil. This ultimately suggests that instead of using a longer and more cambered airfoil, one can get the same performance with a smaller airfoil equipped with a GF. From Fig. 10b and c, it can be inferred that Foil B has a larger re-circulation zone and a stronger down-washing effect compared to Foil C thus explaining its higher lift ($C_l$) and drag ($C_d$) coefficients and lower airfoil efficiency ($C_l/C_d$).

### 4.7 Velocity distribution

From the velocity contours shown in Fig. 11, it can be observed that there is a greater momentum deficit in the wake of Foil B compared to Foil A and Foil C. With the use of a larger GF, the flow over the suction surface is accelerated to higher velocities, thus increasing the suction pressure. Also, in the case of Foil B, the steep mounting angle of the GF with the chord stagnates the incoming air beneath the airfoil near the windward side of the flap thus raising the pressure on the pressure side and ultimately contributing toward an increment in the lift force that the airfoil generates. But at the same time, the increased pressure on the windward side and decreased pressure on the leeward side of the GF increases the net pressure drag acting on Foil B compared to

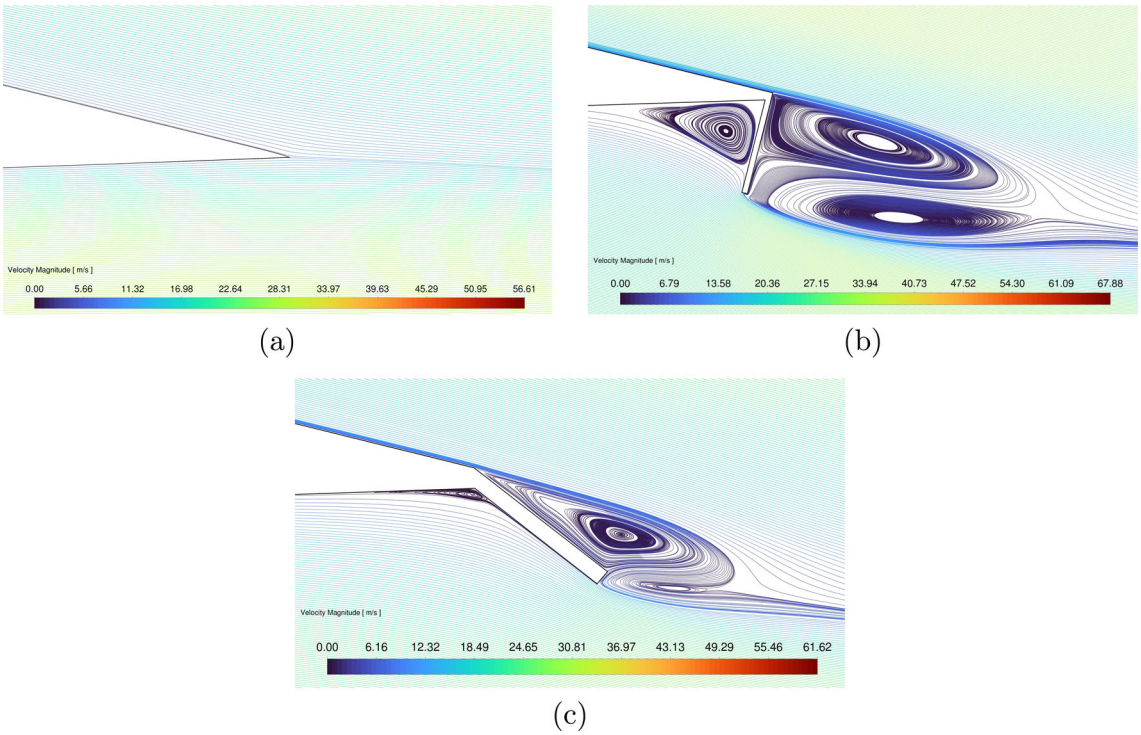



**Fig. 10** Computed pathlines in the vicinity of the trailing edge of NACA 0012 airfoil at AoA = 6° for **a** Foil A, **b** Foil B, and **c** Foil C

Foil A and Foil C and thus contributes to the increment in its drag coefficient ($C_d$) and a reduction in airfoil efficiency ($C_l/C_d$).

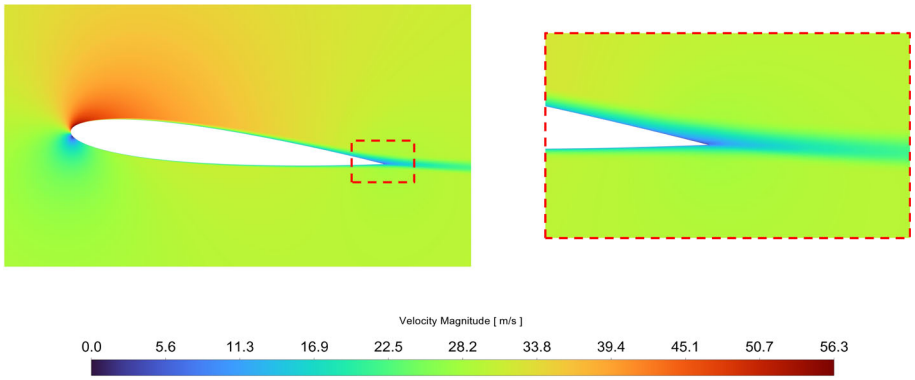
### 4.8 Pressure distribution

The inclusion of GF increases the pressure levels adjacent to the lower surface while concurrently reducing the pressure along the upper surface. This can be observed from the pressure contours shown in Fig. 12. The re-circulation zone downstream of the GF (Fig. 10) generates a low-pressure region near the leeward side. This effectively mitigates the adverse pressure gradient near the rear end of the airfoil. As a result, flow separation over the suction surface of the airfoil at higher angles of attack is delayed or even eliminated. Also, for small flap heights ($h \leq 2\%c$), this effect reduces the stall angle of attack while also making the loss of lift near the stall region more gradual. For Foil B, when the incoming airfoil beneath the airfoil encounters the flap, it stagnates due to the sharp change in its flow direction leading to larger increments in pressure at the bottom of the airfoil close to the windward side of GF. On the other hand, it is comparatively easier for the incoming air to follow the contour of the airfoil and the GF in the case of Foil C as its inclination is greater toward the leeward side, hence the pressure increase is less compared to Foil B, explaining its lower lift coefficient ($C_l$).

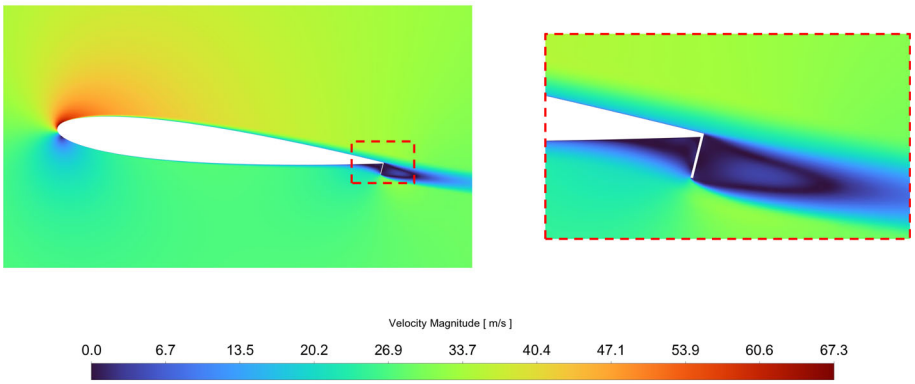
This observation is further supported by the distribution of the pressure coefficient ($C_p$) along the airfoil, as depicted in Fig. 13a. Clearly, along the suction surface, particularly near the leading and trailing edge, the suction pressure is more for Foil B followed by Foil C and Foil A. In addition, the highest pressure near the windward side of the GF is present in Foil B followed by Foil C and Foil A.

### 4.9 Wake velocity

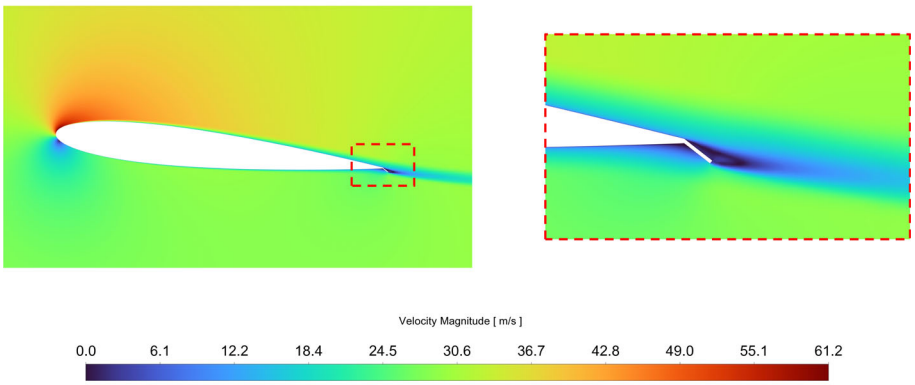
The wake velocity distribution at a distance of $1.7c$ from the airfoil's leading edge for Foil A, B, and C at AoA = 6° is shown in Fig. 13b. The highest momentum deficit in the wake region is observed for Foil B, followed by Foil C and Foil A, respectively. This effect is due to the stronger re-circulation zone in the case of Flap B which extracts more energy from the incoming flow. By reducing the flap height and increasing its inclination




(a)




(b)




(c)

**Fig. 11** Velocity contours in the vicinity of NACA 0012 airfoil at AoA = 6° for **a** Foil A, **b** Foil B, and **c** Foil C

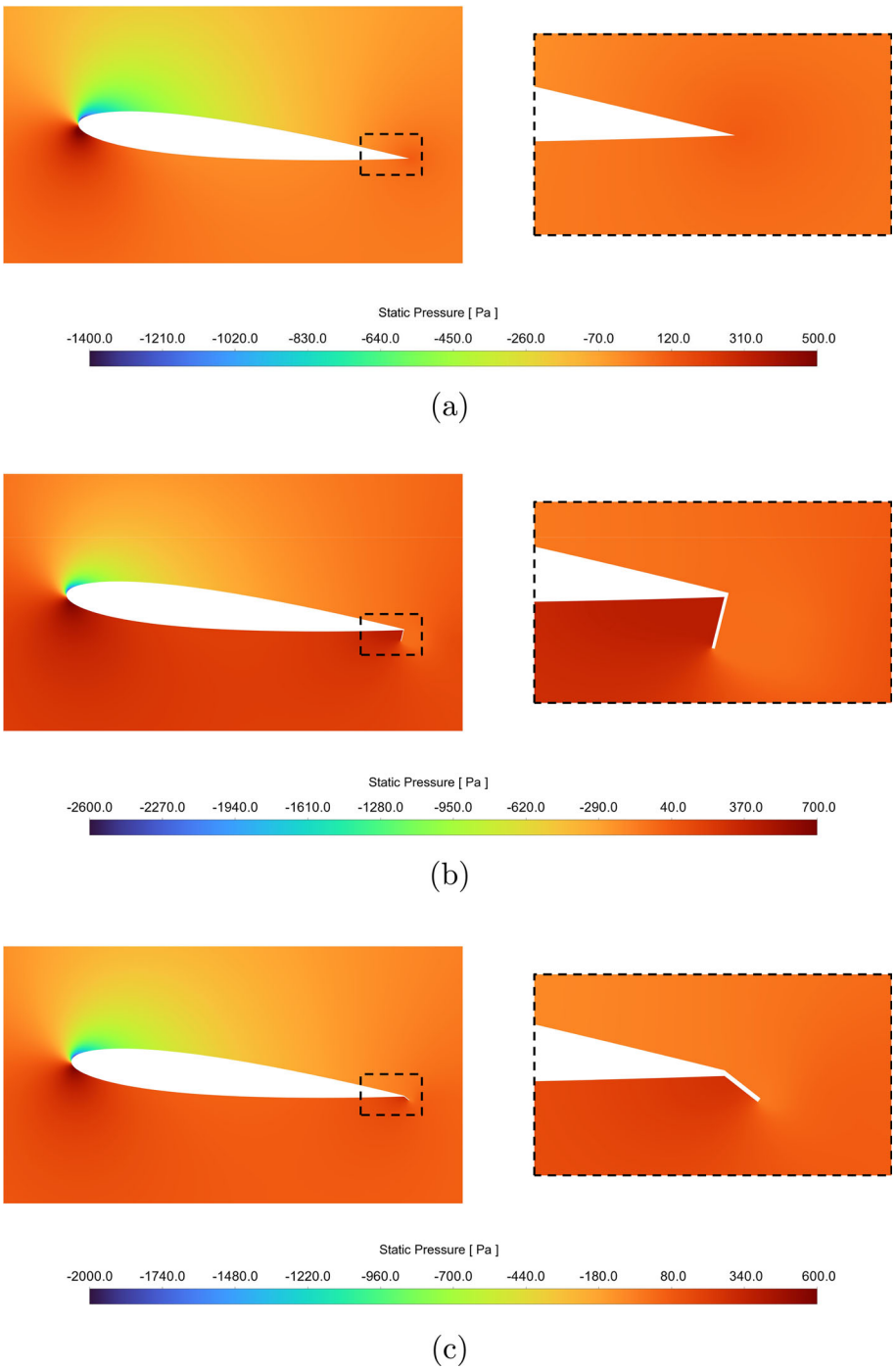



**Fig. 12** Pressure contours in the vicinity of NACA 0012 airfoil at AoA = 6° for **a** Foil A, **b** Foil B, and **c** Foil C

from the vertical toward the leeward side, the size of the re-circulation region is reduced, thus reducing the dissipation of energy in that area. This results in a greater wake velocity in the case of Foil C compared to Foil B. There is an absence of any re-circulation zone at the trailing edge of Foil A which explains the presence of greater momentum in its wake. Also, it can be observed that there is a shift in the wake profiles in the downward direction for airfoils equipped with GF. This shift is greater for Foil B compared to Foil C indicating that Foil B shifts the Kutta condition further downwards. The bending of flow due to the presence of GF is equivalent to the increment in the airfoil's trailing edge camber, as documented by Neuhart and Pendergraft [5]. Hence

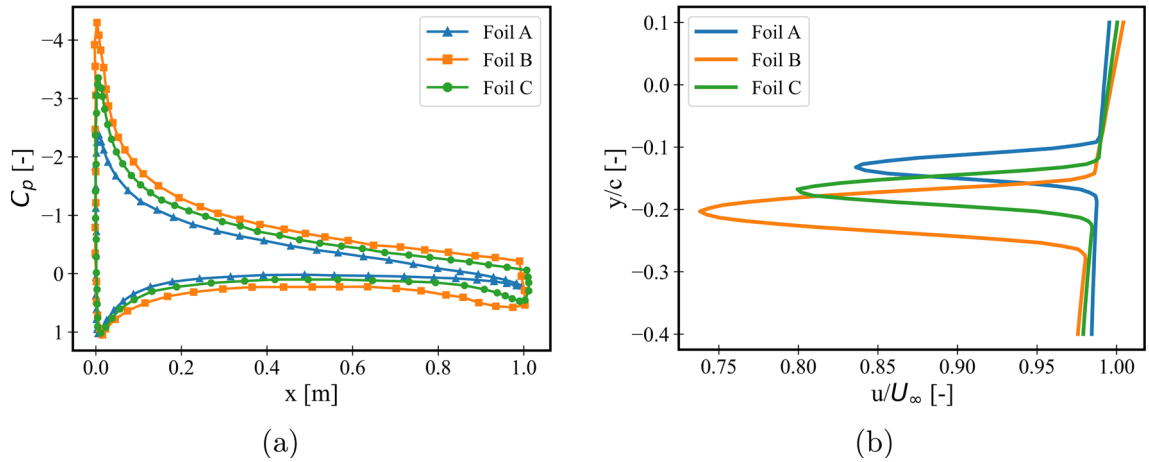



**Fig. 13** **a** Pressure distribution along the surface of NACA 0012 airfoil (AoA = 6°) for Foil A, B, and C and **b** Wake velocity profiles at $x = 1.7\%c$ downstream of the leading edge of NACA 0012 airfoil (AoA = 6°) for Foil A, B, and C

Foil B has a greater effective camber in comparison to Foil C leading to a larger lift coefficient ($C_l$). But due to the larger momentum deficit in the wake, the drag coefficient ($C_d$) of Foil B is greater as compared to Foil C.

## 5 Conclusion

This study proposed an optimization framework for a GF mounted on a NACA 0012 airfoil. The use of RBF as a surrogate model in the framework resulted in a notable enhancement in computational efficiency. The cuckoo search algorithm was found to be superior to other state-of-the-art algorithms for attaining optimal design parameters for the Gurney flap. The shift in the trailing edge Kutta condition vertically downwards and away from the flap toward the leeward side for airfoils equipped with Gurney flaps suggests an increment in the effective camber and chord. The optimal Gurney flap configuration was found to have a flap height of $1.9\%c$ and a flap mounting angle of $-58°$, resulting in an improvement in the airfoil's efficiency ($C_l/C_d$) by 10.28% compared to the baseline airfoil. However, there were some limitations to this study. The use of only a section of a wing ignored the flow change effects in the span-wise direction. Additionally, the optimization framework only considered parameters for flap height and mounting angle, without exploring changes in the overall shape of the Gurney flaps, which limits the potential for greater performance gains. The use of steady-state RANS simulations, due to limited computational resources, also limits the accuracy of the results compared to high-fidelity DES and LES simulations. The use of surrogate models can also lead to less accurate results and in future studies, improved optimization algorithms can be used to obtain better results.

In addition to its application in the optimization of the Gurney Flap, the proposed framework exhibits potential for broader utilization in the design optimization of various other aerodynamic elements employed in automotive, aerospace, and wind engineering applications. Considering the underlying principles and methodologies employed within the proposed framework, it can be assumed that the framework's applicability extends beyond the immediate scope of the current research.

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**Declarations**

**Conflict of interest** The authors declare that they have no conflict of interest.

**Replication of Results** The source code developed for this work, the data, and the scripts required to run the optimizations are available at https://github.com/GipsyOmega/Surrogate-Metaheuristics.

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# A Proposed IOT-based Smart Healthcare Management Framework for Performing Lossless Data Compression using Concept of Ontology

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The most efficient use of storage space is anticipated to be made possible by the adoption of one or more data compression techniques, which are expected to increase transmission bandwidth. The majority of IoT-based devices may store data on the cloud, which emphasizes the importance of making the best use of already-available storage. Due to these and other factors, data reduction is a crucial topic for IoT vision research. The main idea of our proposed work is to develop an IoT-based Smart healthcare management framework to achieve lossless data compression with the help of ontology. In this proposed work, a framework is divided into three modules namely pre-processing, ontology, and compression module. The sampling is done with the help of a healthcare analytics dataset taken from the Kaggle repository. The results are evaluated using metrics affecting data compression. The results obtained showed that the average compression ratio and average compression factor of the proposed work are 0.69 and 1.40 which is much better than existing recent works and compression algorithms. Furthermore, the proposed framework achieves highest compression percentage (31%), lesser time to compress original data (5.12 sec), highest peak signal to noise ratio value (91.18) and the lowest root mean squared error value (0.7853) thereby validating the performance of the given IoT-based framework. It shows that the proposed approach is better than existing compression techniques and recent review studies.

**Keywords:** Compression factor, Compression percentage, Compression ratio, Internet of Things, Ontology

## Introduction

One of the newest study areas to develop is the Internet of Things (IoT). Numerous smart gadgets can be connected and managed online, as the name would imply. The IoT is an amalgamation of smart devices and sensors that can gather, transmit, and interpret data from their surroundings.[1] These devices include embedded processors and communication capabilities. Because of its infinite monitoring capabilities, it has been employed in a wide range of applications, including smart cities, health care monitoring, smart grids, vehicles, and many more. To make the best decisions possible, these applications need data to be continuously gathered, processed, and wirelessly transmitted to a remote centre. Data processing within a network is conceivable due to the built-in data storage and processing capabilities of modern smart sensing devices.[2–3] Any IoT-based applications for *Smart Healthcare Management Framework* generate enormous amounts of data. This data is represented as bytes or bits in digital form and because there are so many of them, processing them can be time-consuming. The acquired information from the healthcare network, such as the flow of the blood pressure monitor, the rate of the electrocardiogram, the rate of the heartbeat, etc., is transformed into a digital stream made up of a significant number of data bits. Data are handled bit by bit during data pre-processing because huge data sizes require several bits to represent them. By employing data compression, bit size can be decreased. The outcome is a reduction in the number of bits that need to be processed, which enhances data computation.

### Knowledge Gaps

Data compression algorithms have been employed in a wide variety of applications.[4–6] Healthcare is one of the main applications.[7–9] Critical infrastructure is currently being monitored by IoT devices.[10–11] The monitoring of medical care is one common application of this. The major contributions of this paper involve the proposed IoT-based smart healthcare framework that is used to perform lossless data compression using the concept of ontology. The framework comprises data pre-processing module (to parse and split training dataset), an ontology generation module (to retrieve relevant and enhanced

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information) followed by a compression module involving algorithms like Lempel-Ziv-Welch (LZW), Run-length encoding (RLE), and Huffman coding.

**Literature Review and Gap Analysis**

This section summarises recent studies conducted in the context of lossless compression algorithms to achieve higher efficiency and better support systems. Liu *et al.*[12] evaluated the LZW lossless data compression method and revised it for real-time hardware implementation. They recommended two hardware designs that utilized FPGa kits and both compressors and decompressors. This can be used by high-end solid-state devices to increase their storage performance and longevity. However, this approach does not work for producing optimized compressed data.

Hameed *et al.*[13] proposed a model based on the scaling of frequencies using Huffman coding by utilizing the form of a binary tree. The method does not mention the complexities and time needed to form a data tree. Liu *et al.*[14] reported a channel state information-containing on-chip memory system. It boasts high bandwidths, good area efficiency, and flexible access support. Hardware for system algorithms is optimized to give hardware-friendly compression algorithms that examine enormous antenna array features and propagation characteristics. But, the method is proved to be time consuming and cannot able to perform lossless compression of bits. Zeynep *et al.*[15] suggested the tri-diagonal folded matrix enhanced multi-variance product representation, a recently developed lossy compression method. This method for multidimensional array decomposition uses folded matrices, a novel mathematical concept, to enable binary breakdown for multidimensional arrays. The authors failed to integrate folded matrix with ontology based approach.

Tang *et al.*[16] proposed a hardware accelerator that delivers considerably greater detection accuracy by utilizing aggregated channel characteristics at multiple sizes and enhanced decision trees for classification. As a result, a pedestrian detection system that uses statistical error correction for lossy memory data compression is created. However, the detection system failed in case of huge segments of data and leads to deadlock condition in the system. Ghanbari *et al.*[17] introduced a fast 2D-DCT architecture for embedded devices with effective hardware and power-constrained applications like the Internet of Things. It makes use of a new high-speed architecture and a second operational reduction strategy. The reduction strategy works well for strings of data but failed to compress numerals and digits.

Lin *et al.*[18] proposed a new lossless compression technique that compresses the initially recorded continuous-intensity images to obtain higher compression efficiency. The run length-based symbol grouping entropy coding approach is used to carry out the entropy coding. The quantization is carried out using entropy-constrained scalar quantization. In the said approach, no validation is done to test entropy quantization of bits of data. Lee *et al.*[19] created a simple and efficient method as a result of their examination of existing IQ data compression techniques. Following the average signal power and intended error vector magnitude, it outlines strategies to reduce the magnitude of the error vector induced by K/L decimation and to maximize the number of detachable low bits and available Huffman encoding bits. However, signals are unable to locate bits of data in case of power loss and the model failed to perform accurate results.

Pandey *et al.*[20] describes a hybrid text data compression strategy which is a combination of Run Length Encoding (RLE), Infix Encoding, and bit reduction approaches. The mentioned approaches do not work in case of ontology representation of data. Rasheed *et al.*[21] established a lossless bio-signal compression method named Log2 sub-band compression for medical signals. To build a resource-efficient dependable QRS detector, they used a reconfigurable time-sharing compute unit with a pipeline schedule and built the position calibration unit based on the data compression technique. However, the method uses lossless compression but it fails to compress hidden bits of medical data due to which important details related to patients may get lost.

Wolf *et al.*[22] offers several pre-processing techniques to convert arbitrary input data packed in bytes into a bit-string appropriate for RLE compression. It starts with the reading of input bits from the end followed by the subsequent most significant bit and the process continues. Finally, to give more code words with varying lengths for RLE runs, it is employed with Huffman coding. The hybrid approach does not introduce any ontology mechanism for extraction of relevant and compressed data in shorter time.

Ebraheem *et al.*[23] consider the features of compression using statistical and linguistic approaches, with and without losses, and relatively

static and dynamic models, summarising the known ways of data compression. The approach does not perform evaluation based on metrics like precision, recall and accuracy.

Sharma *et al.*[24] present an IQ data compression and decompression method based on FPGA hardware and in line with programmable logic device characteristics. The antenna design reduces operational and maintenance expenses while increasing the efficiency of radio frequency power amplifiers. But, there is nothing mentioned about integration of antennae design with ontological base to retrieve relevant bits of compressed data.

David *et al.*[25] used a dictionary-based lossless data compression. The method incorporates arithmetic coding, context modelling, and dictionary utilization. These dictionary based methods do not incorporate IoT and machine learning techniques and works like traditional compression module.

**Novelty and Contributions**

The present paper proposes a novel IoT based smart healthcare management framework that can perform lossless compression by incorporating ontology module in it. It overcomes the aforementioned limitations of existing studies in the following ways:

## Overview of Data Compression Algorithms

**(a) LZW Algorithm[26]**

The well-known data compression method LZW was developed by Abraham Lempel, Jakob Ziv, and Terry Welch.[26] A group of symbols is read in, put into strings, and then the strings are changed into codes. The CHAR and STR variables were used during the compression procedure. CHAR stores a single character, whereas STR records a set of one or more characters. The STR has one byte for each character. The procedure starts by reading the first byte of the test file and saving it in the STR, as seen in Fig. 1. The additional input file bytes are then repeatedly looped over. A data table is created by reading additional bytes from the input file and writing them to the CHAR.

***Algorithm 1: LZW*** [26]

Input: Strings of data
Output: Strings into codes
1. Initialize CHAR and STR as variables
2. CHAR holds a character i.e. 1 byte
3. STR is a group of characters
4. do STR holds 1 byte
 store 2nd byte in CHAR
 create data table
 while bytes<= len of data
5. If both STR and CHAR are found in a table then
 update STR = STR+CHAR
 else
 STR = CHAR
6. end

**(b) Huffman Coding Algorithm[27]**

This well-known algorithm is used to compress data without any loss. Following the estimation of each symbol's likelihood, the algorithm creates a complete binary tree with child nodes for each symbol and arranges it in decreasing order as seen in Fig. 2. Variable-length encoding is used in Huffman Coding where each character is assigned a code based on its frequency of occurrence.[27] Characters with the highest frequency of occurrence have the shortest codes whereas those with the lowest frequency have the largest codes.

***Algorithm 2: Huffman coding***[27]

Input: Symbols of data
Output: Binary tree with Prefix codes
1. Initialize all nodes as leaf nodes
2. Every node has a symbol and weight associated with it

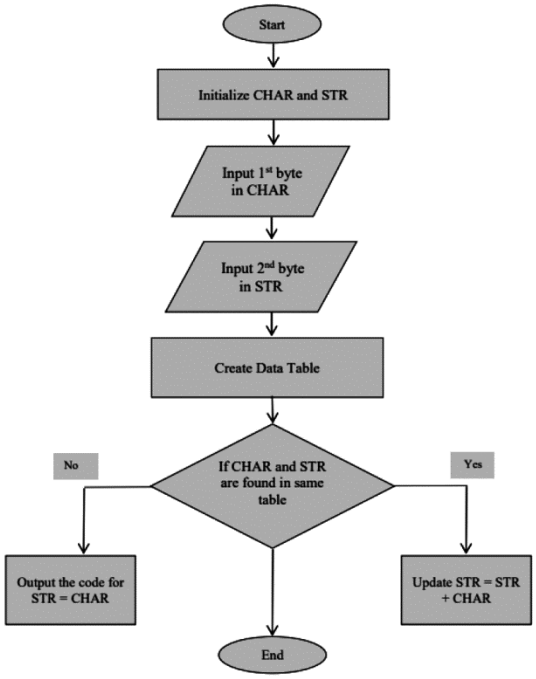


Fig. 1 — Flowchart of LZW algorithm

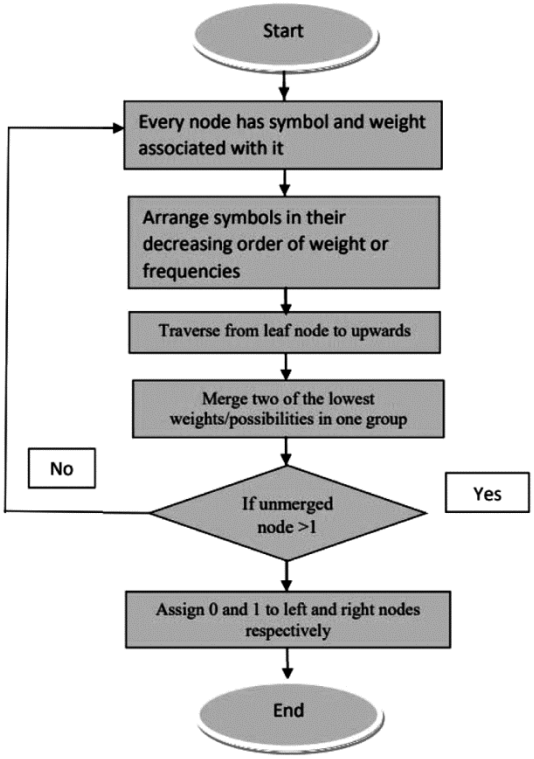


Fig. 2 — Flowchart of Huffman coding algorithm

3. The weight of the node represents the frequency or probability of appearance
4. Arrange symbols in the decreasing order of their frequencies or probabilities of appearance
5. Traverse from leaf nodes to upward nodes
6. Keep merging two of the lowest possibilities/weights into one group
7. While unmerged nodes>1
do until one node is left in the binary tree and repeat step 5.
8. Assign 0 and 1 to the left child and right child of the binary tree respectively
9. end

**(c) RLE Algorithm[27]**

It is the lossless data compression technology which involves the process of data compression for reduction of repetitive and sequential data, sometimes referred to as runs. This is accomplished by retaining the count of these sequences, subsequently followed by the corresponding data. A pseudo code of the RLE algorithm is described in Fig. 3.

***Algorithm 3: RLE*** [27]

Input: Bits of data
Output: Compressed bits

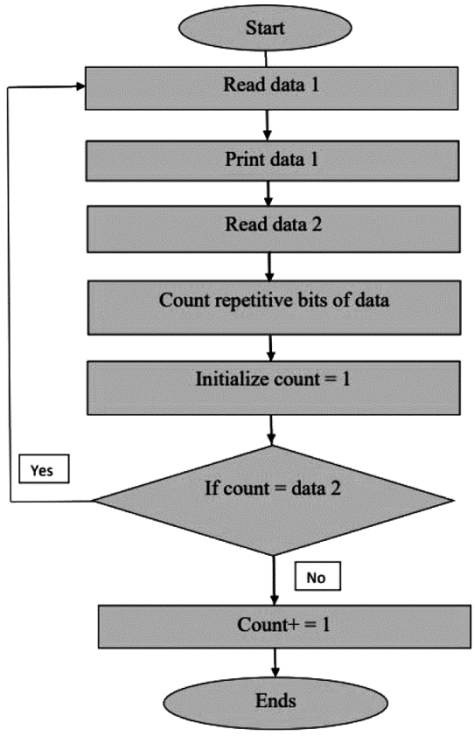


Fig. 3 — Flowchart of RLE algorithm

1. Read data 1
2. Print data 1
3. Read data 2
4. Count repetitive bits of data
5. Initialize count = 1
6. If count = data 2
Go to step 1
Else
Count+=1
7. Go to step 2
8. End

## Proposed Framework

The framework comprises three modules namely Pre-processing, Ontology, and Compression module. Its layout is shown in Fig. 4.

## Pre-Processing Module

It creates the structure or prepares the base for designing ontologies by performing the Tokenization of data, POS tagging (involves Stanford parser), removal of stop words, establishing a relationship between similar words using WordNet, and generating RDF files of data. RDF acts as the backbone of ontologies. *Tokenization* is defined as a process of chopping the character set into small units called a token. Sentences are therefore segmented into a list of

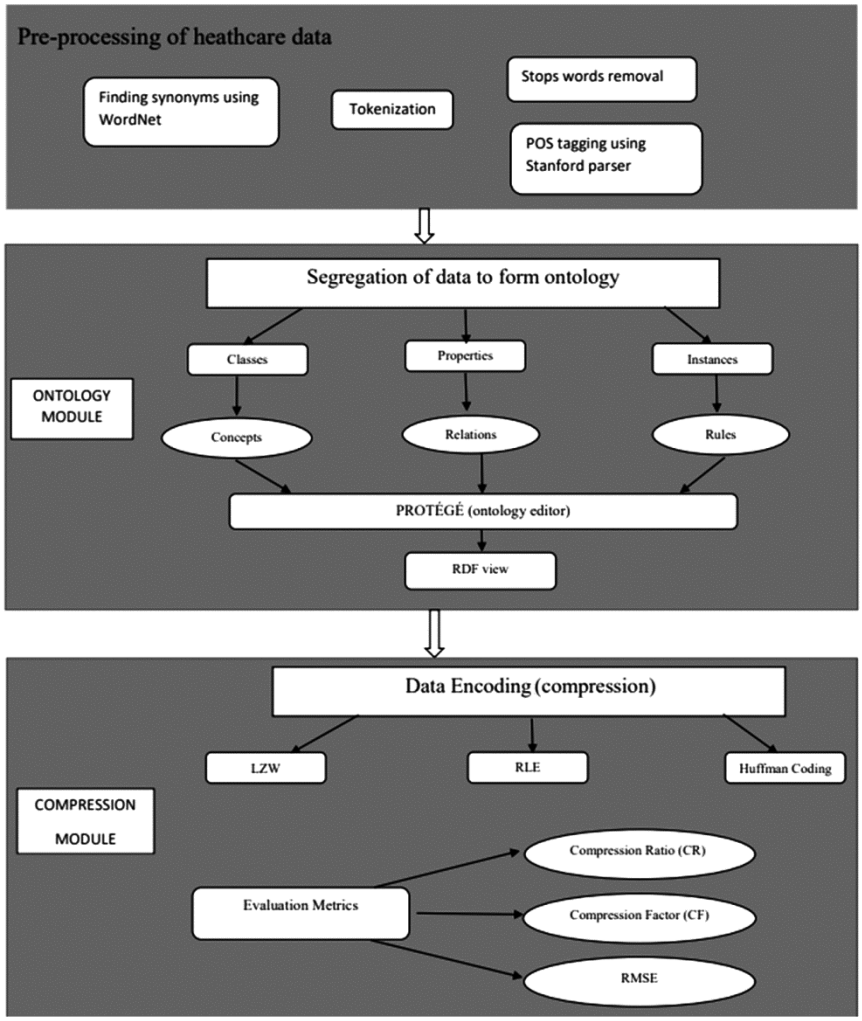


Fig. 4 — Layout of the proposed IoT-based smart healthcare management framework

words to give suitable semantic units called words.

*Stop word removal* is used to reduce frequently occurring and unnecessary text content which does not affect the meaning of the text. Commonly determiners, prepositions, and proper nouns like with, in, the, is, etc. words are eliminated which affects the grammar of a sentence.

*Establishing the relationship between similar words*: One of the most well-known thesauruses is WordNet.[28] WordNet is used to map each query phrase to its synonyms and a related set of terms in the expanded query. According to the common understanding of word similarity, two terms are semantically similar if they exist in the same text. Like this, texts are judged comparable if they include similar language. The degree of phrase similarity between WordNet synsets is assessed using path length-based metrics. The similarity between the terms $t_1$ and $t_2$ can be computed by the Cosine similarity measure defined as:

$$Sim_{cosine} = \frac{C_{t_1, t_2}}{\sqrt{\sum_{dj} w \times w(t1,j) . \sum_{dj} w \times w(t2,j)}} \quad \ldots (1)$$

where, $C_{t_1, t_2}$ denotes similarity between terms $t_1$ and $t_2$

W ($t_1$, j), w ($t_2$, j) are the weight of terms $t_1$, $t_2$ in $j^{th}$ document

**Ontology Module**

A hierarchical representation of data in the form of classes, properties, and instances to make it more meaningful and representable is termed Ontology. Ontology is treated as the formal, explicit specification of a shared conceptualization.[29] Besides its formal nature, philosophical aspects, and handling

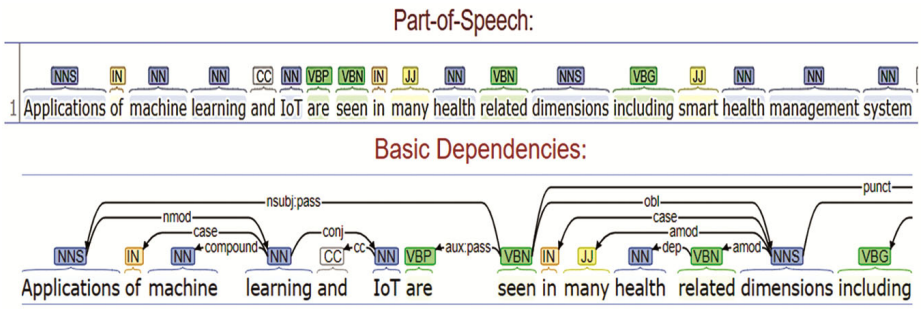


Fig. 5 — Parsing an excerpt from the healthcare dataset

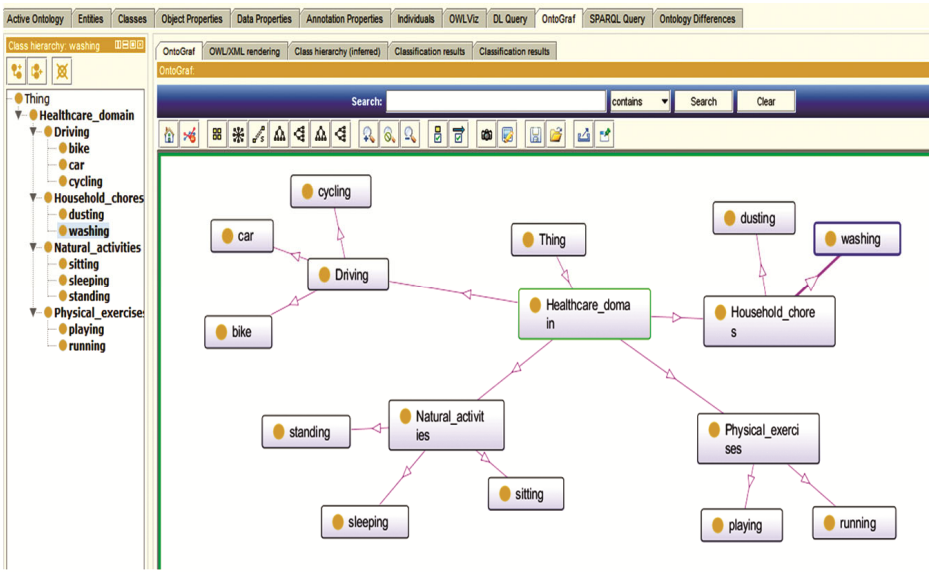


Fig. 6 — Designed ontology on healthcare dataset

of real-world scenarios, it also acts as a medium for linking humans and machines.[30]

After parsing of data (Fig. 5), it is subjected to the segregation of data to represent classes, properties, and instances by designing ontology in the context of a healthcare dataset using an editor PROTÉGÉ 4.3.(30) It is seen in Fig. 6.

***Application Specific Details of Ontology Module in IoT Healthcare System***

- Describes perspectives related to deployment of sensor network ontology[34] used in the monitoring of health records remotely.
- A tree-based structure as shown in Fig. 6 which clearly creates connectivity between attributes related to healthcare management system.
- Ensures interoperability and sensory data in IoT based healthcare management system by modelling information in conceptual form.

***RDF View***

RDF is an acronym for Resource Description Framework.[31] It acts as a way to model web information conceptually. RDF model is based on triples- <subject, predicate, and object> where subject denotes resource; predicate means features of resource and maintains a relationship between subject and object.

**Compression Module**

After generation of ontology related to healthcare domain, the data from classes, properties and instances is fed into compression module. Either of the compression techniques (LZW, Huffman coding and RLE) can be applied in conjunction with the structured data since ontology module itself produces structured and relevant information which can be compressed and become more precise after applying any one of the three compression algorithms. Later on, the performance of individual three compression algorithms is validated on the dataset as given in Table 1.

Table 1 — Comparative analysis of the proposed approach with existing compression algorithms and recent studies

| Approaches / Algorithms | Avg. CF | Avg. CR | Avg. RMSE | Avg. PSNR | CT (sec) | CS (MB/s) | CP (%) |
|---|---|---|---|---|---|---|---|
| Pandey *et al.*[20] | 1.28 | 0.79 | 1.8295 | 80.02 | 6.54 | 83 | 21 |
| Rasheed *et al.*[21] | 1.20 | 0.82 | 1.7767 | 86.43 | 6.12 | 89 | 16 |
| Sharma *et al.*[24] | 1.23 | 0.80 | 1.2356 | 84.45 | 5.87 | 87 | 20 |
| LZW [26] | 1.1 | 0.74 | 1.5567 | 79.12 | 5.82 | 82 | 23 |
| Huffman Coding [27] | 1.18 | 0.86 | 1.4712 | 83.76 | 5.89 | 76 | 20 |
| RLE [27] | 1.13 | 0.89 | 1.2583 | 82.35 | 6.10 | 85 | 25 |
| Proposed | 1.4 | 0.69 | 0.7853 | 91.18 | 5.12 | 91 | 31 |

## Implementation Process

Hardware requirements: i3/i5/i7 processor with 2.2 GHz with 4 GB RAM or higher

Operating system: Windows 64 bit

IDE: NetBeans 8.2, Java Development Kit (JDK)

Simulator: MATLAB 2015R1[33]

**Specific Metrics Used to Evaluate the Performance of the Proposed Model with Existing Algorithms[26,27] and Recent Studies[20,21,24]**

(1) *Compression Ratio (CR):* It is defined as the average number of bits required to store the compressed data. Mathematically, it is given as:

$$CR = \frac{N_c}{N_o} \quad \ldots (2)$$

where, $N_c$ is the number of bits or size of compressed data

$N_o$ is the number of bits or size of the original data

(2) *Compression Factor (CF):* It is defined as the reciprocal of CR and is used to evaluate the performance of compression algorithms for the healthcare dataset. Mathematically, it is given as:

$$CR = \frac{1}{CR} = \frac{N_o}{N_c} \quad \ldots (3)$$

(3) *Root Mean Squared Error (RMSE):* It is used to check the accuracy of the given results. It is computed by the square of the difference between the proposed and actual value taken square root divided by N. Mathematically, it is given as:

$$RSME = \sqrt{\sum_i \frac{Proposed\ CF - Actual\ CF}{N}} \quad \ldots (4)$$

(4) *Peak Signal to Noise Ratio (PSNR):* It measures the quality between original data and compressed data. The higher the value of PSNR, the better will be quality of compression. It is given as:

$$PSNR = 10\ log_{10}(\frac{Original\ file\ size}{RSME}) \quad \ldots (5)$$

(5) *Compression Speed (CS):* It specifies how fast the original data can be compressed. It is given by:

$$CS = (\frac{Original\ file\ size}{Compression\ time}) \quad \ldots (6)$$

Table 2 — Some of the training samples of the dataset used in the experimentation.[32]

| Data file # | Size (in KB) | Description |
|---|---|---|
| File 1 | 177 | First health camp attended |
| File 2 | 150 | Details of the health camp |
| File 3 | 160 | Patients profile |
| File 4 | 195 | Patient activities |
| File 5 | 120 | Second health camp attended |
| File 6 | 210 | Third health camp attended |
| File 7 | 130 | Patients profile |
| File 8 | 135 | Type of diseases |
| File 9 | 155 | Patient activities |
| File 10 | 145 | Fourth health camp attended |
| File 11 | 178 | Diseases monitored |
| File 12 | 167 | Last check-up |
| File 13 | 189 | Routine medicines |
| File 14 | 245 | Vaccine information |
| File 15 | 220 | Fifth health camp attended |
| File 16 | 234 | Patients profile |
| File 17 | 157 | Previous check-up record |
| File 18 | 203 | Diseases monitored |
| File 19 | 230 | Type of diseases |
| File 20 | 278 | Patient activities |

(6) *Compression Percentage (CP):* It is defined as percentage of reduction in memory size from original file size. It is given as:

$$CP = \frac{N_o - N_c}{N_o} \times 100 \quad \ldots (7)$$

## Experimental Dataset

This section presents an analysis of the experimental results obtained from the proposed ontology-based model for the healthcare analytics dataset taken from Kaggle.[32] This healthcare analytics dataset is justified in such a way that it clearly mentions the attributes and description related to the prediction of patient outcomes in smart IoT-based systems including handling patient data, recording daily activities for monitoring blood pressure and heart rate, attending health camps, treatment of chronic diseases and many more. The dataset comprises 20 test files of varying sizes as shown in Table 2. A few evaluation metrics are used to evaluate the performance of the proposed system by comparing with recent studies.[20,21,24]

In addition to this, performance of the proposed approach is evaluated by comparing with existing compression algorithms namely LZW[26], Huffman coding[27] and RLE.[27]

## Results and Discussions

In Table 1, we collate our proposed system results with the existing compression algorithms[26,27] and recent studies.[20,21,24] The type of dataset includes information stored in the form of hierarchy which is linked to IoT elements and patients visits, health camps attended, previous health records, patient activities and monitoring of diseases.

Comparison of CF and CR of the recent studies and existing three compression algorithms with the proposed approach by taking an average of 20 test files is done in Table 1. It can be seen that average CR of the three recent studies and the proposed approach is 0.79, 0.82, 0.80 and 0.69 respectively. In addition to this, average CR of existing three compression algorithms (LZW, Huffman coding, RLE) and the proposed approach is 0.74, 0.86, 0.89 and 0.69 respectively. In both cases, it is the lowest for our proposed approach with the highest CF as compared to recent studies and existing three compression algorithms. It implies that the proposed approach requires the least number of bits to compress data. The average CF for the proposed approach is the highest (1.4) as compared to LZW (1.1), Huffman (1.18), RLE (1.13) and recent studies. Also, average RMSE of the recent studies (1.8295, 1.7767 and 1.2356) and existing algorithms (1.5567, 1.4712 and 1.2583) is much higher than the proposed approach (0.7853). Lesser value of RMSE indicates that the proposed approach is prone to fewer errors and proves to be the most suitable for data compression. Since RMSE is inversely proportional to PSNR, therefore the proposed approach has the highest PSNR (91.18).

It is also observed that it takes less time to compress data in the proposed model (5.12 sec) as compared to recent studies (6.54, 6.12, and 5.87 sec) and three compression algorithms (5.82, 5.89, and 6.10 sec). In addition to this, the compressed data percentage by proposed approach is the highest (31%) as compared to recent studies (21%. 16% and 20%). It indicates better performance of our approach.

Similarly, the compression speed of the proposed approach is the highest (91 MB/s) as compared to LZW (82 MB/s), Huffman coding (76 MB/s) and RLE (85 MB/s) whereas the values of compression % in case of LZW, Huffman and RLE are 23%, 20% and 25% respectively.

## Daily Life Applications of the Proposed IoT based Smart Healthcare System

- It will lead to hassle free treatment of patients by monitoring their health records remotely, efficiently and securely.
- It also helps in developing tailored and patient centric equipment.
- It may also lead to integration of various medical devices for enhancing patient outcomes and providing better access to healthcare.

## Incorporation of IoT Elements in the Proposed Smart Healthcare Management System

- The most important and foremost element in this framework is pre-processing of data. It involves POS tagging, tokenization and removal of stop words to ensure filtered data in the form of information. This information will act as a benchmark for identification of patients health records.
- Connectivity is another important element in IoT systems. In the proposed system, connectivity is achieved by segregating filtered data to form ontology. It creates the hierarchy of patient's test records to current illness description.
- Thirdly, user interface is another element in IoT systems. The proposed healthcare system supports user friendly interface which enables the patients as well as doctors to access their information remotely in a secured way.

## Conclusions

For an IoT-based Smart Healthcare Management Framework, the performance of a few recent studies is compared with the proposed ontology-based model. The results obtained showed that the average compression ratio and average compression factor of the proposed work are 0.69 and 1.40 which is much better than existing studies. Further, the proposed framework achieves higher compression percentage, lesser time to compress original data and the lowest RMSE values thereby validating the performance of the given IoT-based framework. Future IoT-based applications will have more demanding requirements, necessitating on-going improvement of the smart sensors that are already present. As a result, the

numerous IoT smart sensing devices may be used for generating an increased volume of data which have potential impacts on storage, transmission bandwidth, and processing of data. The impacts are in such way that more storage space is needed to address this requirement. It can be done by shifting towards Platform-as-a-service (PaaS) cloud platform which enables to store endless data. The processing and capturing of data will be done faster and in vast amounts. It will directly enhance bandwidth by capturing more number of data packets in bits per second (Bps or Mbps).

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## Conflicts of Interest (COI)

The authors declare that they have no conflicts of interest to report regarding the present study.

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# A review on deepfake generation and detection: bibliometric analysis

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**Abstract**
Deepfake refers to an artificial intelligence-based technique to produce manipulated videos that look realistic. However, this good aspect of Deepfake sometimes pose serious threats to society as malicious intenet users exploit deepfakes to disseminate false information. That's why a lot of research and applications are being developed in both the deepfake generation as well as detection field to mitigate its negative effect. Given the intensity of the work and its imporatnce in the field, there is a need to comprehensively review the existing literature and provide probable directions for future works considering the identified gaps and limitations. So, in this paper, a bibliometric analysis is conducted to provide a comprehensive analysis of this topic from various aspects such as influential authors who are active in this field and their collaboration, as well as countries and more specific institutions investing annually. In this study, the primary source of data is Web of Science (WoS), and we've employed keyword-based searches to retrieve pertinent information. The collected data from WoS has been scrutinized along several dimensions, including top document types, publication trends, source titles, and the productivity of various locations with an annual breakdown. To delve into collaborative efforts among institutions, authors, and regions, we utilized the VOSviewer tool. Additionally, the CiteSpace tool aided in identifying key focal points, research trajectories, and pinpointing significant shifts in citations for keywords. This comprehensive approach contributes to the in-depth analysis presented in this paper.

**Keywords** Deepfake · Bibliometric analysis · WoS · GAN

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## 1 Introduction

The origin of this term can be traced back to a Reddit[1] user named "deepfakes" who claimed to have developed a machine learning system allowing the insertion of recognizable faces into explicit content. The term "deepfake" is coined to refer to the process of creating deceptive videos using deep learning methods, notably GANs. Specifically, the deepfake technique generates fabricated videos by either predicting future events or substituting one person's face with another's in the video footage. Previously, the alteration of facial features was limited by the availability of advanced editing tools, the need for specialized expertise, and the manpower-intensive process involved. Artificial Intelligence (AI) technologies are becoming increasingly pervasive across various sectors of everyday life, offering automated solutions that undeniably simplify and enhance our activities. With the reliance on AI-based systems, often functioning as black boxes for evaluations and decision-making, it is critical to consider the use of AI-based tools for manipulating and generating multimedia content, which can distort reality and polarize public opinions [1]. Nowadays, the ease of creating fake faces or altering the appearance of real individuals in images or videos has significantly increased. This trend can be attributed to two main factors: the vast availability of publicly accessible data and the advancements in deep learning techniques, which eliminate the necessity for manual editing processes.

One common application of deepfake technology is face swapping [2], where the facial features of one individual are seamlessly transposed onto another person's face in a video or image. Face reenactment [3] is another facet of deepfake generation that involves mapping the facial expressions and movements of one person onto the face of another in a way that is synchronized and appears natural.

The advent of Generative Adversarial Networks (GANs) has significantly popularized the process of generating fake images. Notably, recent years have witnessed advancements in both GANs and CNN models, leading to an upsurge in research publications focused on both the generation and detection of deepfakes. Deep learning network-based models offer an effective means to accurately represent the data distribution of a specific training set. This acquired distribution can subsequently be sampled and modified by employing GANs, as outlined by Goodfellow [4] in the year 2014.

### 1.1 Ethical considerations in deepfake generation and impact

Deepfakes are primarily generated using Deep Neural Networks and various Deep learning models, such as GANs, Convolutional Neural Networks (CNNs), and Recurrent Neural Networks (RNNs), are commonly employed. Among these, GANs have gained significant popularity for deepfake generation due to their specific architecture and capabilities. The key reasons for using GANs in deepfake generation include:

- **Generative capabilities:** GANs are designed to generate new data that resembles a given dataset. The generator network of a GAN learns to create synthetic data samples that are indistinguishable from real data. This capability is crucial for generating convincing deepfake content. Popular Datasets generated are Deepfake[2], DFDC Dataset[3] by Dolhansky et al. [5] and faceforensics++ Dataset[4] by Rossler et al. [6]

[1] https://www.reddit.com/r/DeepFakeOne

[2] https://github.com/Deepfakes/

[3] https://www.kaggle.com/c/deepfake-detection-challenge

[4] https://github.com/ondyari/FaceForensics/tree/master/dataset

- **Adversarial training:** GANs constitute a class of machine learning frameworks characterized by the training of two competing networks. In this analogy, one network is akin to an art forger (the generator, denoted as G), while the other plays the role of an expert in the field (the discriminator, referred to as D), as presented in the work by Goodfellow [4]. To produce realistic visuals, the generator G creates forgeries, while the discriminator D endeavors to differentiate between forgeries and genuine photographs after being presented with both types of images. These networks are trained simultaneously and in opposition to each other as presented in Fig. 1.
- **Capturing high-level features:** GANs are effective in capturing high-level features and patterns in data, making them suitable for complex tasks like face synthesis in deepfakes. The learned representations often exhibit a high degree of realism, capturing intricate details and facial expressions.
- **Flexibility and versatility:** GANs are versatile and can be adapted for various applications, including image and video generation. This flexibility makes them well-suited for the diverse requirements of deepfake content creation, whether it involves faces, voices, or other multimedia elements.
- **Training on diverse datasets:** GANs can be trained on diverse datasets, allowing them to learn and replicate the statistical patterns present in the training data. This is crucial for deepfake generation as it enables the model to understand and mimic the variations in real-world data.
- **State-of-the-art performance:** GANs have demonstrated state-of-the-art performance in image synthesis tasks, making them a natural choice for deepfake generation. Advances in GAN architectures, such as StarGAN by Choi et al. [7], FSGAN by Nirkin et al. [8], GANimation by Pumarola et al. [9], have further improved their ability to generate high-quality and diverse content.

The technology behind deepfakes has advanced rapidly, fueled by the increasing accessibility of powerful computing resources and large datasets. A review of the most popular and state-of-the-art deepfake generation techniques is given in Table 1.

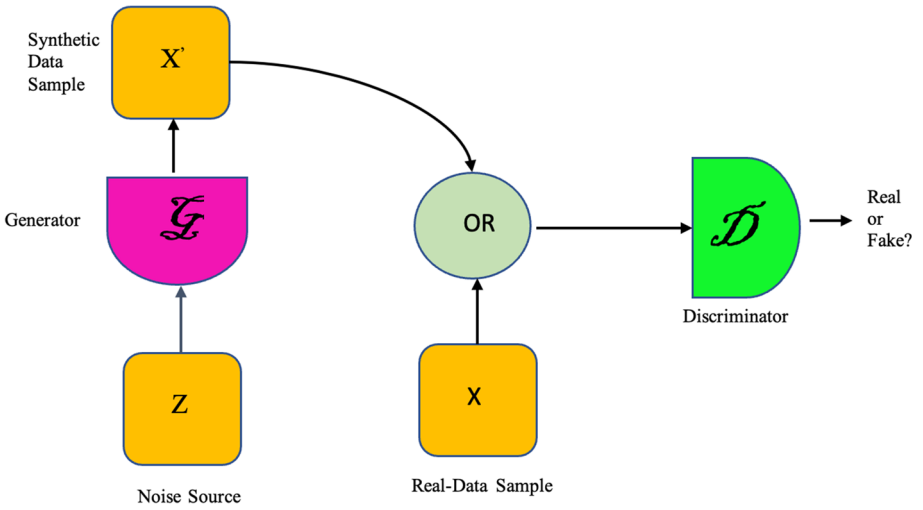


**Fig. 1** Illustrative representation of training of Discriminator (D) and Generator (G) for a GAN

**Table 1** Summary of key advancements in deepfake generation techniques

| Author & Year | Aim | Strategy | Key feature | Limitation |
|---|---|---|---|---|
| Thies et al. [3] | To Achieve real-time facial reenactment of monocular target videos using a commodity webcam and live-captured source sequences | Address under-constrained facial identity recovery through non-rigid model-based bundling and track expressions using a dense photometric consistency measure. | Achieve reenactment through fast deformation transfer, retrieve and warp the target's mouth interior, and convincingly re-render the synthesized face for seamless blending in real-world illumination. | Challenges in scenes with face occlusions, limited reconstruction detail, and dependency on visible expression variation in the target sequence. |
| Suwajanakorn et al. [10] | To synthesize realistic lip-sync videos from audio features | Train an RNN on address footage. Use 3D pose matching and texture synthesis for accurate lip sync. | Seamless cuts even with changing head position, lighting, or background. | Potential 3D geometry errors leading to artifacts in chin alignment & tongue movements based solely on lip fiducials. Lack of explicit emotion modeling. |
| Natsume et al. [2] | To develop a region-separative GAN (RSGAN) for robust face swapping and editing; | Utilize a variational autoencoder for visual feature extraction in RSGAN; Employ region separation in latent spaces for face swapping by replacing latent-space representations of faces; Explore the use of LSTM for region memorization in image parts synthesis | Robust face swapping in latent space; Ability to edit face-swapped images by manipulating visual attributes or incorporating randomly generated face or hair parts; | Image editing can only be performed at the limited resolution of the training dataset; Resolution improvement requires training with higher-resolution datasets. |
| Wu et al. [11] | To develop a novel learning-based framework, ReenactGAN, for photo-realistic face reenactment. | Map the source face onto a boundary latent space to avoid structural artifacts; Implement target-specific transformers in the latent space for many-to-one face reenactment. | Achieves photo-realistic face reenactment with effective and reliable boundary-based transfer; The boundary latent space is robust to challenging poses, expressions, and lighting conditions; Accommodating faces from unseen people. | Training subject-agnostic face reenactment is non-trivial and may fail when applied to unseen face images with large poses. |

**Table 1** continued

| Author & Year | Aim | Strategy | Key feature | Limitation |
|---|---|---|---|---|
| Nirkin et al. [12] | To develop a Face Swapping GAN (FSGAN) for subject-agnostic face swapping and reenactment in images and videos by eliminating the need for person-specific or pair-specific training. | Implement a subject-agnostic approach and introduce a novel multiple-view interpolation scheme based on delaunay, triangulation, and barycentric coordinates; propose two new loss functions for progressive training and seamless integration. | Achieve high-quality and temporally coherent results without person-specific training; provide a continuous interpolation scheme for multiple views of the same face; introduce innovative loss functions enhancing face reenactment quality. | Identity and texture quality degrades with larger facial yaw angles; resolution limited to training data; reliance on a sparse landmark tracking method hinders the capture of facial expression complexity. |
| Natsume et al. [13] | To develop a face-swapping model using only a single source and target image, eliminating the need for additional data or fine-tuning. | Represent the face region with a DNN-generated latent variable, disentangling face appearance from geometry and non-face parts. Bypass the challenges of 3DMMs[1] by directly synthesizing face-swapped images using the proposed DNN[2]. | Maintain face identity and details like hairstyle and background, resulting in higher-quality face-swapping results. | Struggles with accurate face swapping when face regions are occluded, reflecting limitations due to a lack of diverse training data. |
| Ha et al. [14] | To achieve few-shot face reenactment preserving target identity without fine-tuning. | Leverage image attention and target feature alignment for enhanced face reenactment quality. Introduce an unsupervised landmark transformer to mitigate identity preservation issues. | Successful preservation of target identity, even with diverse facial characteristics. Improved face reenactment quality through image attention and feature alignment. Unsupervised landmark transformation adapts to varying facial characteristics without labelled data. | Fails to completely preserve source facial characteristics. |

**Table 1** continued

| Author & Year | Aim | Strategy | Key feature | Limitation |
|---|---|---|---|---|
| Hao et al. [15] | To Develop FaR-GAN, a GAN-based model, for one-shot face reenactment, transforming a face image to a target expression with one input image and facial landmarks. | Leverage GAN-based method for effective face modeling, combining appearance and expression information. Ensure reenacted faces retain source identity, background, and clothing, without assuming source identity, facial expression, head pose, or image background. | Achieves higher image quality compared to existing methods, validated on VoxCeleb1 dataset. | Identity gap may occur for significant appearance differences in source and target identities; Pupil movement not considered in the landmark representation. Qualitatively poorer results compared to unconditional face generation methods like Progressive-GAN and StyleGAN. |
| Thies et al. [16] | To achieve photo-realistic digital assistant renderings and audio-driven facial reenactment. | Introduce Audio2Expression-Net for mapping audio to person-specific 3D blendshapes; Implement a neural rendering network with neural textures for efficient and high-quality video content generation. | Generalized approach allows synthesis of talking head videos with artificial voices for photo-realistic results. | Fails in scenarios with multiple voices in the audio stream; Requires occlusion-free target videos and good audio-visual sync for effective reenactment. |
| Yang et al. [17] | To develop Face2Face$^{\rho}$, the first Real-time High-resolution and One-shot face reenactment framework. | Utilize a 3DMM-assisted warping-based architecture with u-shaped rendering and hierarchical coarse-to-fine motion networks. | State-of-the-art visual quality with reduced computational complexity; Efficiently generates high-resolution face images in real-time; Addresses limitations in preserving identity and handling large pose transformations. | Visible artifacts in background regions during large head transformations; Potential blurriness with abnormal foreground objects; Misuse potential for generating unauthorized videos requires ethical use and image forensic techniques |

**Table 1** continued

| Author & Year | Aim | Strategy | Key feature | Limitation |
|---|---|---|---|---|
| Nirkin et al. [18] | To develop FSGAN for subject-agnostic face swapping and reenactment. | Use iterative deep learning for versatile face reenactment in images and videos. Employ continuous interpolation for video face views and address occluded regions. Utilize a face blending network with a novel Poisson blending loss for seamless blending. | Subject-agnostic swapping eliminates the need for face-specific training. Enables accessible face swapping without laborious data collection and model training. | Identity and texture degrade with larger facial yaw angles. Excessive reenactment iterations may blur texture; Resolution is limited to training data; Sparse landmark tracking may not fully capture facial expressions; Trade-off between preserving source identity and target attributes. |

[1]Three-Dimensional Morphable models
[2]Deep Neural Network

While GANs provide powerful capabilities for deepfake generation, it's important to note that they also pose challenges, particularly in terms of ethical considerations, deepfake advancement can be misused to create convincing fake videos or audios, leading to the spread of misinformation and contributing to the challenges associated with fake news. The prevalence of deepfakes may undermine the credibility of media sources, requiring the development of new strategies to authenticate and verify visual and auditory information. Researchers and practitioners are actively working on both advancing the technology and developing countermeasures to address these challenges.

### 1.2 Challenges in detecting evolving deepfake techniques

This is the specific case of the well-known phenomenon of Deepfake videos that constitute a serious threat; in fact, AI-based easy-to-use functionalities can be made available to create extremely realistic videos that can have a substantial impact in altering personal reputation. Deepfake is a phrase used to describe face manipulation techniques used in videos. It is also referred to as face swapping, facial reenactment, cheap fake, forged face, and synthesis face. Such fake images or videos can go viral through social media producing a tremendous impact on fake news. That's why Deepfake is becoming increasingly popular as a possible threat due to recent improvements in deepfake generation that make it more realistic and simpler to build. Methods for detecting deepfakes are mainly based on characteristics and techniques for machine learning. Deepfake generation advances, a dearth of high-quality datasets, and a lack of benchmarks are some of the remaining difficulties in deepfake detection. High-quality datasets with systematic, efficient, and reliable detection techniques may be the future of deepfake detection.

Detecting deepfakes presents several challenges due to the rapid advancement of deepfake technology. The following points highlight some key challenges in deepfake detection:

- **Advancements in deepfake technology:** Continuous improvements in the generation of deepfake content make it challenging for detection methods to keep up with evolving techniques as mentioned by Rossler et al. [6].
- **Variability in deepfake quality:** Deepfakes exhibit varying degrees of quality, making it difficult for detectors to establish a consistent threshold for identification Matern et al. [19].
- **Zero-shot learning and generalization:** When manipulation techniques that are entirely new or different from those in its training data, it faces challenges in generalizing its learning to effectively identify and classify these novel techniques [20].
- **Limited training data:** Insufficient labelled data for training detectors on diverse deepfake scenarios can hinder their overall performance [1].
- **Adversarial attacks on detectors:** Attackers may employ adversarial techniques to bypass detection models, leading to a cat-and-mouse game between detectors and generators [21].

In Table 2, we examine the domain of deepfake detection techniques, exploring diverse datasets, emphasizing essential features utilized for identification, and examining the inherent constraints associated with these detection methods. In Table 2, DF Stands for Deepfake, F2F for Face2Face, CBA for CelebA-DF, FF++ for FaceForensics++, DFS for Deeperforensics, NT for NeuralTextures, DFD for DeepfakeDetection, WD for WildDeepfake & DFDC-P for DFDC Preview Datasets.

**Table 2** Key findings and limitations from a comprehensive survey of face deepfake detection techniques

| Author & Year | Dataset | Network type/Name | Key features | Limitation |
|---|---|---|---|---|
| Afchar et al. [22] | – DF[1] | CNN Model named as Meso-4 & MesoInception -4 (with inception module [23]) | – Proposed two network architectures for efficient and low-cost detection of such forgeries | – Downsampling frames reduced computational costs but sacrificed deepfake detection accuracy. |
| | – F2F [17] | | – Analysis of layers and filters reveals the crucial role of eyes and mouth in detecting Deepfake-generated faces. | – Performance decline in low-quality videos. |
| Dang et al. [24] | – MANFA dataset (Proposed) | CNN (MANFA), A hybrid framework (HF-MANFA) use AdaBoost (ADA-MANFA) & XGBoost (XGB-MANFA) | Conducted experiments on balanced and imbalanced[2] datasets & developed XGB-MANFA, achieving a 93.4% AUC and outperforming the best-known result by approximately 6%. | Lack of image pre-processing, challenges in detecting computer-generated images, and the absence of localized manipulated region detection. |
| | – SwapMe | | | |
| | – FaceSwap [25] | | | |
| Guarnera et al. [26] | CBA and Dataset Generated By GANs[3] | An Expectation Maximization (EM) with KNN Classifier, Linear SVM & Linear Discriminant Analysis (LDA). | Utilizing the expectation-maximization algorithm to extract local features from GAN-based image deepfake generators. | Suboptimal performance is observed for compressed images. |
| Masi et al. [31] | – FF++[6] | Two-branch Recurrent Network | Tailored solution for identifying hyper-realistic deepfake faces in video streams with a focus on low false alarms. | – Attains cutting-edge cross-dataset detection performance but sacrifices accuracy at the frame level. |
| | – CBA [5] | | | – Relies on fixed filter banks for frequency information extraction, constraining the capability to capture distinctive features. |
| | – DFDC [1] | | | |

**Table 2** continued

| Author & Year | Dataset | Network type/Name | Key features | Limitation |
|---|---|---|---|---|
| Zhao et al. [32] | – FF++[6] | A multi-attentional network architecture | – Capturing local discriminative features from various face attentive regions. | Focusing solely on RGB features may result in overlooking subtle color-space manipulations in detecting forged images. |
| | – CBA [5] | | – Outperformance over vanilla binary classification baselines and achieving state-of-the-art face detection performance. | |
| | – DFDC [1] | | | |
| Liu et al. [33] | – FF++[6] | A novel Spatial-Phase Shallow Learning method | Exploits phase spectrum for abundant appreciable frequency components, duplicated during upsampling in forged face generation. | – Performance may drop if forgery is not up-sampled by generative models. |
| | – CBA [5] | | | – Encounter reduced transferability with entirely different types of face forgery manipulation due to specific traces in the phase spectrum. |
| | – DFDC [1] | | | |
| Yang et al. [34] | – FF++[6] | Multi-scale self-texture attention Generative Network | – Introduces a self-texture attention algorithm for improved representation of intricate details in the input texture. | The model faces difficulties addressing the generalization problem, resulting in suboptimal overall detection accuracy. |
| | – DFS [35] | | – Proposes a prob-tuple loss with direct feedback from classification results, guiding trace generation with specific constraints for enhanced output. | |
| | – CBA [5] | | | |
| | – DFDC [1] | | | |

**Table 2** continued

| Author & Year | Dataset | Network type/Name | Key features | Limitation |
|---|---|---|---|---|
| Zhao et al. [36] | FF++ [6], DF, F2F [17], FaceSwap[25], NT [37], DFD [38], CBA-v1 & -v2 [5], DFDC [1], DFDC-P [39] and DFS- 1.0 [35] | A CNN | – Introduced PCL[4] | – Uncertain if PCL can handle direct output of entire face synthesis. |
| | | | – Developed I2G[5] for efficient synthesis, aiding dynamic forged image generation with annotated manipulated regions for PCL training. | – Model performance can be enhanced with further improvement on low-quality data, by false predictions. |
| Hu et al. [40] | – CBA [5] | Frame Inference-Based Detection Framework | finfer Excels detecting high-quality videos, FInfer infers and compares facial representations rather than directly extracting frame features. | – Learned frame features in high-quality videos increase computational complexity. |
| | – DFDC-P [39] | | | Most existing methods employ a sparse sampling strategy, which hinders their ability to model local motions among adjacent frames. |
| | – WD [41] | | | |
| | – FF++ [6] | | | |
| Chen et al. [42] | – FF++ [6] | Xception[43] for synthesizer & detector networks | Introduces self-supervised tasks in the training pipeline to enforce sensitivity to forgery configurations, enriching the learning process for deepfake detection. | The current method is constrained by a restricted set of augmentation types in the synthesizer. |
| | – DF | | | |
| | – F2F [17] | | | |
| | – FaceSwap[25] | | | |
| | – CBA [5] | | | |

**Table 2** continued

| Author & Year | Dataset | Network type/Name | Key features | Limitation |
|---|---|---|---|---|
| | – DFDC [1] | | | |
| | – DFS-1.0 [35] | | | |
| | – NT Thies et al. [37] | | | |
| Shiohara and Yamasaki [44] | – FF++ [6] | Novel synthetic training data called self-blended images with EfficientNet-b4 [46] | Utilizes a synthetic data generation pipeline to train detectors with common forgery traces and focuses on identifying statistical inconsistencies between manipulated faces and background images in deepfake content. | Model is unable to capture temporal inconsistencies across video frames. |
| | – CBA [5] | | | |
| | – DF | | | |
| | – DFDC [1] | | | |
| | – DFDCP [39] | | | |
| | – FFIW[45] | | | |
| Liao et al. [47] | – FF++ LQ | A facial-muscle-motions- based framework | Investigated geometric features to effectively mine and enhance unnatural facial muscle motions for compressed Deepfake video detection. | Struggles with unseen face manipulations hinder the approach's generalization capabilities. |
| | – Social[6] | | | |
| Cai et al. [48] | – CelebV-HQ [49] | A universal and task-agnostic facial encoder | Tackles a challenging auxiliary task by reconstructing spatio-temporal details from densely masked facial regions, enhancing the encoding of both local and global facial aspects for generic and transferable features. | The use of an existing face detection library may contribute to biases |

**Table 2** continued

| Author & Year | Dataset | Network type/Name | Key features | Limitation |
|---|---|---|---|---|
| | – CMU-MOSEI [50] | | | |
| | – FF++(LQ)[6] | | | |
| | – LRS2 [51] | | | |
| Nawaz et al. [52] | – FF++[6] | A ResNet-Swish-Dense54 model | Demonstrates proficiency in handling visual sample adversarial attacks such as compression, noise, blurring, zooming, rotation, and translation with resilience. | The current work acknowledges a limitation in temporal sequence analysis absence, with plans to include it for improved detection and generalization capabilities. |
| | – CBA [5] | | | |
| | – DFDC [1] | | | |

[1] https://github.com/Deepfakes/
[2] Training and testing on datasets where the distribution of classes is uneven, potentially leading to biased model performance
[3] GDWCT (group-wise deep whitening-and-coloring transformation) Cho et al. [27], StarGAN Choi et al. [7], AttGAN He et al. [28], StyleGAN Karras et al. [29] and StyleGAN2 Karras et al. [30]
[4] Pair-wise Self-Consistency Learning for precise detection using source feature inconsistencies.
[5] Inconsistency Image Generator

### 1.3 A concise discussion on the deepfake bibliometric analysis

Bibliometric analysis is a quantitative method used to evaluate and analyse academic literature based on bibliographic data. This analysis involves examining patterns, trends, and relationships within a collection of publications, including journals, articles, authors, and keywords. By examining citation patterns, researchers can identify influential authors and institutions, facilitating collaboration and understanding of expertise within the field. Furthermore, bibliometric indicators, such as citation counts and journal impact factors, allow for the evaluation of research impact and quality, aiding researchers and policymakers in assessing the significance of specific studies or journals. Additionally, bibliometric analysis helps map collaborative networks among researchers and institutions, essential for fostering collaboration and knowledge exchange. Moreover, identifying areas with fewer publications or citations through bibliometric analysis can highlight research gaps, enabling researchers to address underexplored aspects of deepfake technology [53, 54].

To comprehensively examine the progression and diverse range of techniques related to the creation and identification of Deepfakes, we believe it is essential to conduct an extensive survey [55]. As a result, we present a bibliometric investigation encompassing both the generation and detection of Deepfakes. To accomplish this, we relied on the WoS as our primary source for data and scholarly publications. A total of 621 publications were identified through a targeted keyword search, employing terms such as "deepfake," "face app," "face2face," "face manipulation," "face synthesis," "face swap," "face alter," and "face temper". Additionally, we included specialized deep learning models such as GANs, RNN, CNN, Neural networks, and ANN to ensure a comprehensive retrieval of pertinent data.

We conducted an in-depth examination of research data encompassing various facets, including yearly publication trends, publication categories, potential future research trajectories, countries of origin, and authors. Additionally, we analyzed the collaboration network aspect utilizing data points such as authors, nations, and organizations. Another dimension of our analysis involved scrutinizing the citation structure, with the final dimension encompassing burst detection.

Beginning in 2012, Jayne et al. [56] published a paper titled "One-to-many neural network mapping strategies for face image synthesis," focusing on artificial face generation. This work is identified as the starting point for advancements in this field. Therefore, the analysis presented herein covers the period from 2012 to September 2023. Within this analysis, the following points are considered:

1. The number of documents published in the period 2012-2022 and 2023 (Sep);
2. Types of document;
3. The most prominent sources of publications;
4. The top research directions include computer science, electrical engineering, telecommunications, etc.;
5. The top countries/regions;
6. Mapping of top countries, the number of documents produced every year; and
7. Mapping of top authors and respective countries, and documents produced.

To visualize and explore maps from network data, the VOSviewer software is used. Various forms of collaborative interactions are also examined using VOSviewer. These include working partnerships between :

1. The most influential countries/regions,
2. The most influential institution, and
3. The most influential publication.

Finally, we provide information regarding burst detection to pinpoint the periods of popularity of particular articles, technologies, etc., in the deepfake industry, using Citespace.

### 1.4 Data analysis using web of science (WoS)

The widely used WoS is a valuable resource for accessing scientific content, impact assessments, and collections spanning from the Start Year to the present. Within WoS, the WoS Core Collection is particularly noteworthy, offering scholars access to a substantial repository of reputable journals and publications, as well as pertinent information that can be seamlessly integrated into bibliometric analysis platforms. This collection encompasses four key databases: Science Citation Index Expanded (SCI-EXPANDED), Social Sciences Citation Index (SSCI), Proceedings Citation Index - Science (CPCI-S), and Arts & Humanities Citation Index (A&HCI).

To ensure the accuracy and comprehensiveness of our data, we conducted a thorough examination of all the aforementioned databases. Our investigation revealed that SCI-EXPANDED, SSCI, CPCI-S, and A&HCI constitute the most precise set of databases. Using keywords related to video image modification, we performed a search, yielding 621 publications with terms such as "Deepfake," "Face forgery," "Cheap fake," and "Face manipulation."

The rest of the paper is organized as follows: Section 2 presents a detailed analysis of publications using filtered data from the WoS. The objective is to identify emerging topics, influential publications, and key trends within the deepfake technology realm. In Section 3, a citation structure analysis is conducted using the VOSviewer tool. The focus is on identifying the top influential countries, institutions, and researchers contributing to the field of deepfake research. In Section 4, collaboration networks are constructed using VOSviewer. The tool facilitates the creation of collaboration networks among nations/regions, institutions, and authors, enabling a comprehensive assessment of collaborative relationships within the deepfake research community. In Section 5, references burst detection is performed using CiteSpace. The temporal analysis aimed to identify significant moments and breakthroughs in deepfake research over time, adding a dynamic dimension to our understanding and highlighting periods of heightened research activity. Finally, the Conclusion 6 encapsulates the key findings and insights obtained throughout the analysis, offering a holistic summary of our in-depth exploration of the deepfake research landscape.

## 2 Publication structure analysis

In this section, we conduct a comprehensive examination of the publication landscape, considering various facets such as yearly publication trends, prolific nations/regions, productive institutions, and notable authors.

### 2.1 Publications analyzed: year-on-year basis

The WoS is instrumental in scrutinizing the current and prospective research domains within which the published studies are conducted. After employing a topic-specific filter search using WoS data, a total of 621 papers from the last ten years and the current year are retrieved, as depicted in Fig. 2. Here, the x-axis denotes the year, while the y-axis indicates the quantity of publications. The data collection spans from 2014 up to the present year. Notably, the

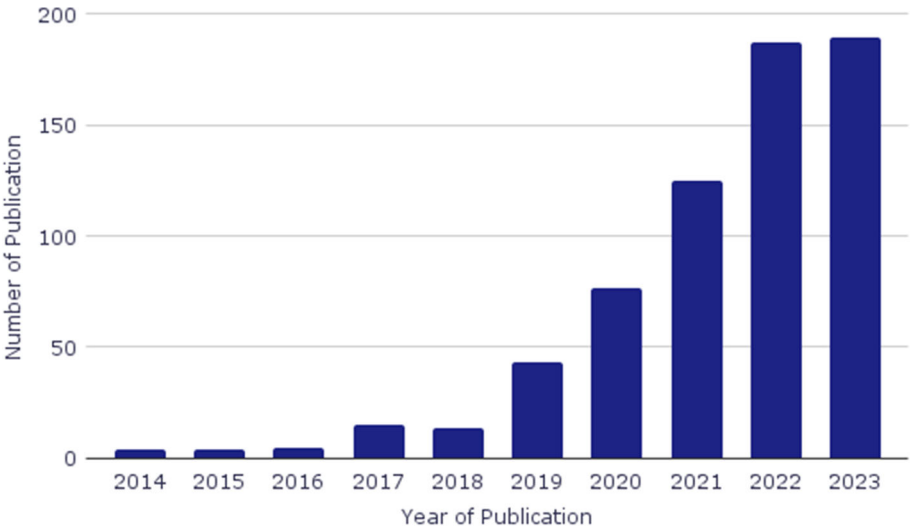


**Fig. 2** Yearly progression of publications from 2014 to 2023, illustrating the growth in the number of publications each year

research on this subject matter exhibits a notable upward trajectory from 2019 onwards, as revealed by the data amassed over the past decade.

The burgeoning field of deepfake research is witnessing an unprecedented surge, driven by a convergence of influential factors shaping its trajectory. Primarily, rapid advancements in deep learning, particularly the evolution of GANs, are revolutionizing the quality and authenticity of deepfake content [4, 7–9]. This progress is further amplified by the parallel surge in computational power, stemming from advancements in hardware and GPU technology [57]. The synergistic effect of these developments is empowering researchers to craft increasingly intricate and sophisticated deepfake models, utilizing efficient hardware architectures designed for accelerating deep neural networks [58], high-performance hardware accelerators for deep learning inferencing [57], and frameworks evaluated for performance on platforms like Nvidia Jetson [59], featuring notable GPU and CPU highlights [60].

Furthermore, the accessibility of expansive datasets encompassing diverse facial images and videos have played a pivotal role in refining the generalization capabilities of deepfake models [5, 6]. As industries recognize the vast potential, both positive and negative, inherent in deepfake technology, sectors such as entertainment, advertising, and cybersecurity have directed substantial interest and resources toward its exploration. This surge in attention has fueled research endeavours and underscored the need for effective detection methods to mitigate the adverse impacts of deepfakes [61].

In parallel, heightened media coverage and public awareness surrounding instances of deepfake misuse or involvement of high-profile individuals have prompted increased societal concern. This, in turn, has catalyzed research efforts aimed at comprehending, mitigating, and regulating the technology. Beyond technological advancements, the ethical and societal implications of deepfake technology, spanning misinformation, identity theft, and privacy concerns, have spurred researchers to delve into broader implications and potential mitigations [62].

The interdisciplinary nature of deepfake research has emerged as a hallmark, fostering collaboration across diverse domains, including computer vision, machine learning, ethics,

law, and psychology. This holistic approach is instrumental in understanding and effectively addressing the multifaceted challenges posed by deepfake technology. Finally, as governments and regulatory bodies recognize the inherent risks associated with deepfakes, there is increasing interest in funding research endeavours to develop countermeasures and establish regulatory frameworks [62].

A substantial percentage of publications-more than 85% of the total, appeared in the last four years. It is highlighted that more than 50% publications were published in the previous two years. With this growth, the topic is progressing forward and potentially becoming a prominent research topic or topic of discussion. In the paper cited as [63] from the year 2021, a clear trend emerges, showcasing the rapid expansion of DeepFake-related publications. These publications, originating from sources like arXiv, conferences, and journals, are systematically categorized based on their last updated year. The study elucidates the yearly publication count in the DeepFake domain since its commencement in 2016.

### 2.2 Publications analyzed: document type

To analyze the type of publications, an analysis of the WoS from the 621 total documents gathered is depicted in Fig. 3. It can be observed that most types of publications are Articles which counts for 601 and 96.779% of the publications overall. There are also proceeding papers and letters; review articles 23 (3.060%), early access 23 (5.314%), and others.

### 2.3 Publications analyzed: WoS categories

This sub-section discusses the organization of publication based on branch field of WoS categories as the deepfakes are usually the result of collaborative efforts across various engineering disciplines such as signal processing, a subfield of Electrical and Electronics Engineering, are used in various stages of deepfake creation and detection. For example, signal processing methods are employed for analyzing and manipulating audio and video signals to generate realistic deepfake content or to detect anomalies indicative of manipulation. Engineering field Computer Science provides foundational knowledge and techniques in machine learning and artificial intelligence, which are essential for developing deep learning models used in deepfake generation and detection.

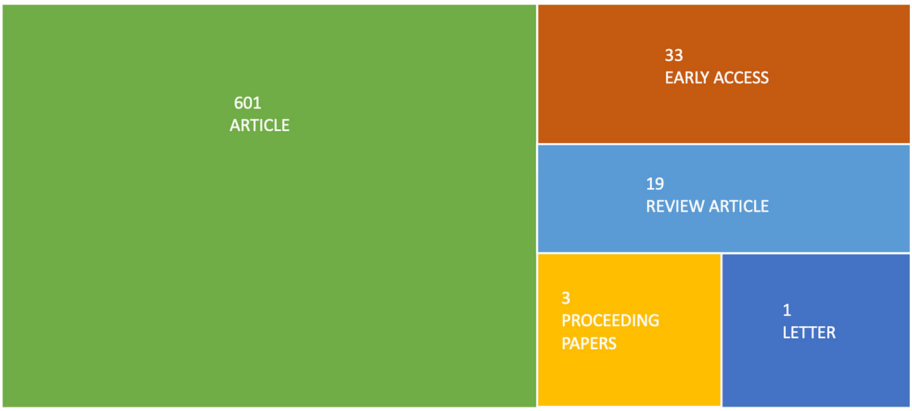


**Fig. 3** The top 10 types of the publications

Figure 4 illustrates the significant impact of various fields on the deepfake, with the Electrical and Electronics Engineering branch having the highest publication count at 289, contributing to 46.538% of overall publications. Upon closer examination, it is found that there are approximately 608 publications in the field of Computer Science, a number that surpasses or may even overlap with those in Electrical and Electronics Engineering. Computer Science is further subdivided into Software Engineering, Artificial Intelligence, Information Systems, Interdisciplinary Applications, Theory and Methods, and Medical Technology. In addition to these fields, there are 30 publications in Neurosciences, 85 in Telecommunications, 20 in Engineering Multidisciplinary, 21 in Instruments, 20 in Materials Science Multidisciplinary, and so on. This suggests that image manipulation offers a broad range of applications beyond possessing a well-developed concept and methodology.

### 2.4 Publications analyzed: publication titles

The top 10 publication titles are displayed in Fig. 5, from which it can be seen that IEEE Access has the highest percentage of results, accounting for 61 articles, which is 9.823%. It is followed by MULTIMEDIA TOOLS AND APPLICATIONS (6.119%). Subsequently, IEEE TRANSACTIONS ON INFORMATION FORENSICS AND SECURITY contains 26 articles, followed by NEUROCOMPUTING (17), SENSORS (19), IEEE TRANSACTIONS ON IMAGE PROCESSING (16), APPLIED SCIENCES BASEL (15), IEEE TRANSACTIONS ON PATTERN ANALYSIS AND MACHINE INTELLIGENCE (13), and IEEE TRANSACTIONS ON NEURAL NETWORKS AND LEARNING SYSTEMS (9), among other source titles present. Comparing the publishers of the top-cited papers, the most frequently cited paper, authored by Suwajanakorn et al. [10], has 389 citations as of the current year and is published in ACM Transactions on Graphics, while Mirsky and Lee [64] from ACM Computing Surveys has 178 citations. However, ACM Transactions on Graphics published only 0.579% and ACM Computing Surveys published 0.145% of the total number of publications, so papers are not included in the figure. Papers with notable citation counts and with good number of publications include Verdoliva [65] from the IEEE JOURNAL OF SIGNAL PROCESSING, accruing 188 citations, Tolosana et al. [66] from INFORMATION FUSION, with 157 citations, Shelke and Kasana [67] from MULTIMEDIA TOOLS

**Fig. 4** The primary focus areas outlined by the top 10 research directions in the publications

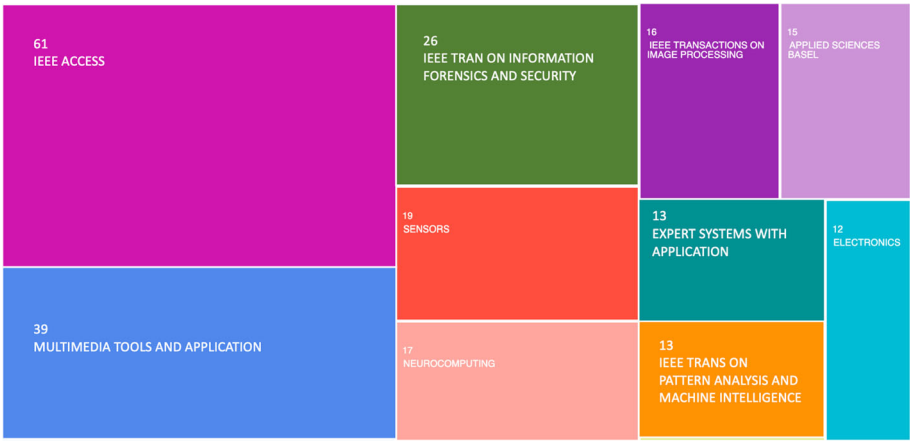


**Fig. 5** The top 10 source title of the publications

AND APPLICATIONS, earning 30 citations, Shen et al. [68] and Nirkin et al. [69] form IEEE TRANSACTIONS ON PATTERN ANALYSIS AND MACHINE INTELLIGENCE with 171 and 56 citations, Jung et al. [70] and Hasan and Salah [71] form IEEE Access with 69 and 135 citations, Bharati et al. [72] from IEEE TRANSACTIONS ON INFORMATION FORENSICS AND SECURITY with 86 citations and Hsu et al. [73] from APPLIED SCIENCES-BASEL with 71 citations. The top-cited papers along with their publication titles are depicted in Fig. 6, illustrating the publications that have achieved the highest citation count for their respective papers.

## 2.5 Publications analyzed: popular places

The analysis identifies the leading nations/regions with the highest publication counts. Figure 7 illustrates the distribution of publications across different countries and locations. Notably, the top-performing nations include the People's Republic of China (281 publications), the USA (93 publications), India (69 publications), South Korea (52 publications), England (41 publications), Saudi Arabia (29 publications), Australia (20 publications), alongside other countries.

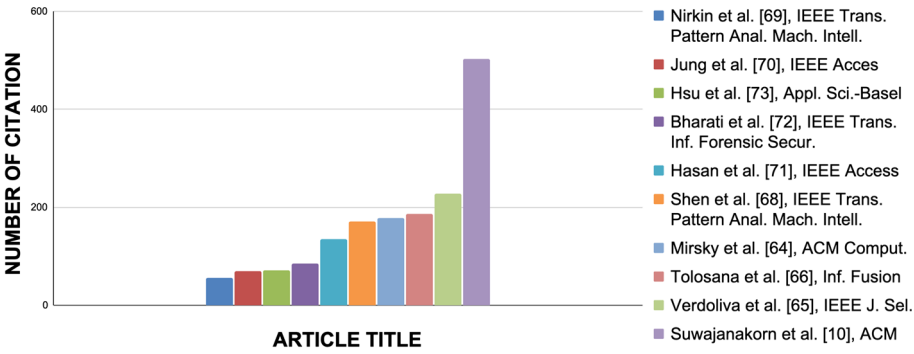


**Fig. 6** Visualization of Top 10 cited papers, depicting publication titles, authors, and citation counts

**Fig. 7** The top 10 productive places

At the outset, articles on this topic were published by researchers from England, USA, South Korea, Canada, and Italy. Subsequently, there was a surge in publications from the People's Republic of China, and by 2019, People's Republic of China become the leading contributor in this field. Since 2014, authors from the USA and People's Republic of China have consistently produced a greater number of research articles. Notably, England led the contributions in 2012, followed by the USA, South Korea, Canada, and Italy in 2013. Additionally, both England and Italy made early entries in 2012. In contrast to this trend, several nations commenced their publications in 2013 onwards.

It is evident from Fig. 8 that the trend is steadily increasing. People's Republic of China leads with the highest publication count, exceeding 50 publications in 2020 and maintaining its position at the top for the subsequent four years. In contrast, the United States achieved

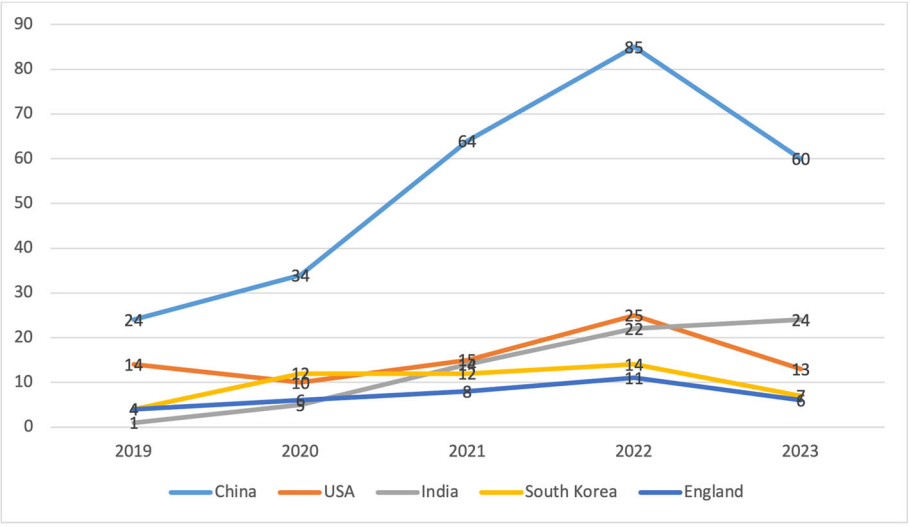


**Fig. 8** Year analysis of the top 5 productive places

over 50 publications in 2022, securing the second position. Additionally, the top three nations, People's Republic of China, the USA, and India, covered more than 60% of publications over the last four years. The graph shows a noticeable drop, indicating the incomplete status of the data as of September 2023, with available data extending only up to that point. Anticipated changes in these figures by year-end should also be noted. these figures may undergo further changes. Among the top three countries, China has the highest number of influential papers that include the works of Ding et al. [74], Bin et al. [75], Kong et al. [76], Yang et al. [77], and Wang et al. [78]. The United States follows as the second leading contributor, with notable works of Zhang et al. [79], Sun et al. [80], Nirkin et al. [81], Kuang et al. [82], and Gao et al. [83]. India also makes a significant impact, with key works of Yadav et al. [84], Arunkumar et al. [85], Kaur et al. [86], Kumar and Sharma [87], and Kingra et al. [88].

### 2.6 Publications analyzed: productive institutions and authors

This sub-section offers a comprehensive exploration of the publication landscape, considering both authorship and geographical affiliations. Table 3 provides a detailed analysis of the top 20 authors with notably high productivity, where 'P' represents the publication count, highlighting authors with extensive publication records and shedding light on the countries or regions where their affiliated universities are located. Xinbo Gao, an author hailing from Xidian University in PEOPLES R CHINA, holds the highest publication count and has co-authored the highly cited paper [89] with Nannan Wang, also from Xidian University, who ranks second in terms of publications. Additionally, Gao collaborated with Wenjin Zha and

**Table 3** List of the top 20 most productive authors

| Rank | Authors | Affiliation | Country/Region | P |
|---|---|---|---|---|
| 1 | Gao XB | Xidian University | People R China | 19 |
| 2 | Wang NN | Xidian University | People R China | 15 |
| 3 | Javed A | Univ Engn & Technol Taxila | Pakistan | 8 |
| 4 | Chen X | Univ Leeds | People R China | 7 |
| 5 | Zhang J | Univ Southern Queensland | People R China | 7 |
| 6 | Li J | Xidian Univ | People R China | 6 |
| 7 | Li Q | Shanghai Univ | People R China | 6 |
| 8 | Lu W | Xidian Univ | People R China | 6 |
| 9 | Peng CL | Xidian Univ | People R China | 6 |
| 10 | Yang GB | Hunan Univ | People R China | 6 |
| 11 | Cao J | Chinese Acad Sci | People R China | 5 |
| 12 | Guo ZQ | Hangzhou Dianzi Univ | People R China | 5 |
| 13 | Irtaza A | Univ Michigan | USA | 5 |
| 14 | Liu YF | Chinese Acad Sci | People R China | 5 |
| 15 | Shen LL | Shenzhen Univ | People R China | 5 |
| 16 | Xiao S | Tianjin Univ | People R China | 5 |
| 17 | Xu M | Hangzhou Dianzi Univ | People R China | 5 |
| 18 | Yang JC | Hangzhou Dianzi Univ | People R China | 5 |
| 19 | Yu J | Hangzhou Dianzi Univ | People R China | 5 |
| 20 | Yu Y | Natl Inst Informat | People R China | 5 |

Jie Li on 15 and 6 publications, respectively. Moreover, Gao worked with Chunlei Peng on 6 publications. In total, Gao has engaged in collaborative efforts with 26 other researchers.

### 2.7 Publications analyzed: productive organisations and researchers

The TreeMap map in Fig. 9 displays the top ten organizations based on affiliation type after a WoS analysis, revealing contributions from 927 organizations in total. Figure 10 specifically showcases the top 10 organizations, highlighting the Chinese Academy of Sciences as the most prolific contributor with 43 publications, followed by other Chinese institutions including the University of Chinese Academy of Sciences with 25 publications, Xidian University with 21 publications, the Institute of Automation CAS with 17 publications, and the Hangzhou Dianzi University with 13 publications. Similarly, the Egyptian Knowledge Bank EKB, representing an Egyptian institution, also contributed 13 publications. Noteworthy publications relevant to the subject matter from the Chinese Academy of Sciences include the works of [90–94], while the University of Chinese Academy of Sciences produced significant works, including [95–99]. Additionally, Xidian University has made notable contributions with publications such as [100–104].

## 3 Citation structure analysis

The objective of this investigation is to illustrate the extent of collaboration among researchers, organizations, and locations along this vertical axis. To facilitate this research, a VOSviewer was employed. Now, let's delve into each aspect in greater detail to gain a comprehensive understanding.

In the realm of deepfake research, bibliometric analysis using tools like VOSviewer involves several key terms and understanding these terms aims to interpret visualizations, collaboration patterns, and the scholarly impact of research within the dynamic and evolving field of deepfake technology. Key term publication Count (P) serves as a quantitative measure of scholarly output, indicating the volume of research contributions in the field of deepfake technology. Citation (C) signifies the number of citations received by a particular

**Fig. 9** The top 10 most research article-contributing organizations

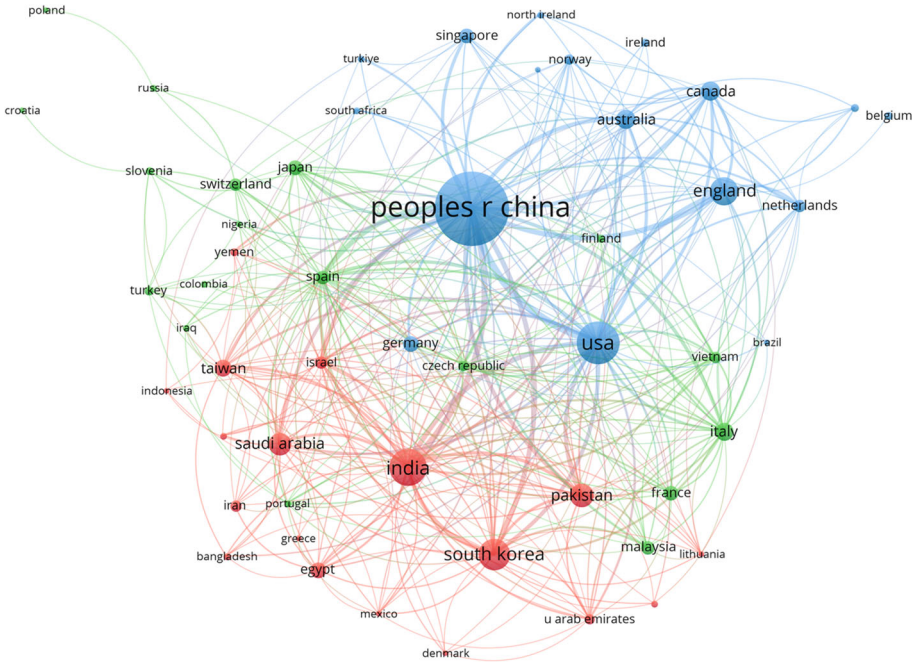


**Fig. 10** The collaborative network of places

deepfake-related document, author, or keyword. This metric indicates the influence and impact of specific contributions within the deepfake research landscape. Average Citation (AC) is the average number of citations received per deepfake-related publication. It offers a normalized measure, helping to assess the average impact of scholarly works relative to their respective publication counts. The reference link indicates the number of co-citations, while the abbreviation 'TLS' is the total link strength that quantifies how frequently the co-cited article is referenced. In VOSviewer, Link Strength (LS) pertains to the level or strength of associations between two entities, be they institutions or countries. Conversely, TLS encompasses the overall strength of all connections associated with an entity, taking into account its entire network of relationships.

In VOSviewer, each color in the visualization represents a distinct cluster or community of items that exhibit strong connections or similarities. This grouping is based on the network's underlying structure, which is determined by factors such as co-authorship, co-citation, or co-occurrence, depending on the type of bibliometric analysis being conducted. Overlapping colors are used in a network visualization, it indicates instances where items (such as authors, documents, or keywords) belong to multiple clusters or communities simultaneously. Overlapping colors represent the shared characteristics or connections between items that cut across different thematic groups within the network

In this sub-section, an analysis of citations from four distinct viewpoints is presented to showcase the impact of the publications. The focus is on highlighting the most frequently cited papers and providing instances of citations originating from various countries/regions, organizations, and authors.

### 3.1 Top influential countries/regions

Detected 53 locations (countries/regions) by utilizing the VOSviewer to assess the collaborative capacity of each, each of which has produced a minimum of two research outputs. This information is visually represented in Fig. 10. Within the graphic, the connection between two nodes and the width of the link indicates the extent and strength of cooperation, respectively. The size of a node, or its TLS, can be determined by aggregating all of the link strengths associated with that node.

Table 4 The top 10 countries are presented, ranked by the quantity of links, signifying the number of nations or regions collectively referenced. People's Republic of China, as the most prolific nation, also garners the highest number of citations. Specifically, each publication from China is cited an average of 9.2553 times, indicating frequent inclusion in scholarly articles. India also boasts a substantial average of 9.9861 citations per article. Noteworthy nations in terms of average citations include the USA (23.125), England (12.878), Italy (24.4706), and Canada (25.5).

With only 96 papers published, the USA ranks second in terms of citations behind the People's Republic of China, which has 282 papers published. The average number of citations per paper published in the USA is 23, which is higher than the People's Republic of China's average of 9. The article with the most citations, "Synthesizing Obama: Learning Lip Sync from Audio" by Suwajanakorn et al. [10], was published in 2017 by the USA and has 389 citations.

### 3.2 The most influential institutions

The VOSviewer's representation of the organisation's ability to cooperate is shown in Fig. 11. The figure is mainly composed of the links that connect them. The node's size and the link's thickness serve as indicators of the node's cooperation numbers and link strength, respectively.

In Fig. 11, 34 institutions have contributed to the research, each with at least five documents and a presence in the TLS. This section examines the institutional-level citation network. According to the databases, in the initial phase of this research area, 5 out of the 664 institutions publishing in the area have achieved this with at least 10 publications. Additionally, Fig. 11 illustrates the association between citations and organizations for 10 institutions, 10 of which have received more than 100 citations.

**Table 4** The top 10 most cited countries/regions

| Rank | label | Links | TLS | P | C | AC |
|---|---|---|---|---|---|---|
| 1 | Peoples R China | 43 | 673 | 282 | 2610 | 9.26 |
| 2 | USA | 41 | 434 | 96 | 2220 | 23.12 |
| 3 | India | 38 | 322 | 72 | 719 | 9.99 |
| 4 | South Korea | 29 | 200 | 53 | 414 | 7.81 |
| 5 | Spain | 34 | 172 | 10 | 204 | 20.40 |
| 6 | England | 23 | 158 | 41 | 528 | 12.87 |
| 7 | Pakistan | 29 | 154 | 31 | 131 | 4.22 |
| 8 | Italy | 28 | 122 | 17 | 416 | 24.47 |
| 9 | Australia | 21 | 119 | 20 | 190 | 9.50 |
| 10 | Canada | 19 | 107 | 20 | 510 | 25.50 |

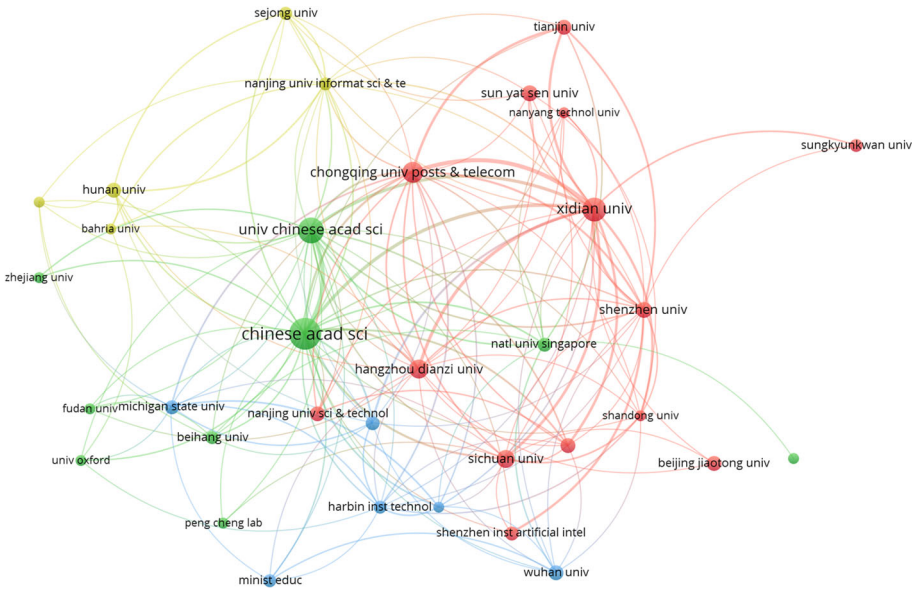


**Fig. 11** The citation network of institutions

These 34 institutions are divided into 4 clusters, each denoted by different colors. The linked institutions with publications cited together are shown by the line connecting the two nodes. The thickness of the link indicates the strength of the co-cited relationship. The number of citations for the institution's articles increases with the node's size. For better clarity, Table 5 presents the top 15 universities that have been cited more than 1924 times, along with related information.

The majority of the institutions shown in Table 5 are from the People's Republic of China, while two are from the USA, one from Canada, and one from Spain. The University of Washington (USA), Bennett University (India), and Universidad Autónoma de Madrid (Spain) have fewer publications in the area but have received the most citations and average citations, according to the table, which was constructed based on the sorted order of maximum TLS.

These institutions have produced 26 and 17 works in the field, each receiving 381 and 273 citations. The two institutions were then ranked 25th and 19th, respectively, in terms of average citations. The TLS indicates the strength of the co-cited link, and the number of links shows the number of co-cited institutions. For instance, Xidian University has worked with 42 institutions on 42 occasions (with 42 links and 145 TLS).

### 3.3 Collaboration strength among the researchers

The relationship between the authors referenced and those co-cited can be explained as follows: Initially, there were 12,028 authors and researchers who made contributions. Subsequently, the results were refined by considering the minimum number of citations for an author. Upon examination, it was found that out of the initial 12,028, only 23 authors had received at least 100 citations in this field. These authors had garnered more than 100 citations each. In Fig. 12, the network diagram of these authors is presented. The tool's default

**Table 5** The top 15 most influential institutions based on citation count

| Rank | Institute/ Affiliation | Country | Links | TLS | P | C | AC |
|---|---|---|---|---|---|---|---|
| 1 | Chinese Acad Sci | Peoples R China | 84 | 177 | 38 | 595 | 15.66 |
| 2 | Univ Washington | USA | 46 | 53 | 2 | 415 | 207.50 |
| 3 | Xidian Univ | Peoples R China | 69 | 246 | 21 | 404 | 19.23 |
| 4 | Bits Pilani | India | 7 | 10 | 4 | 319 | 79.75 |
| 5 | Michigan State Univ | USA | 22 | 34 | 7 | 318 | 45.43 |
| 6 | Bennett Univ | India | 7 | 10 | 3 | 318 | 106.00 |
| 7 | Univ Chinese Acad Sci | Peoples R China | 57 | 116 | 24 | 277 | 11.54 |
| 8 | Univ Autonoma Madrid | Spain | 72 | 112 | 4 | 201 | 50.25 |
| 9 | Univ Michigan | USA | 24 | 29 | 4 | 189 | 47.25 |
| 10 | Chongqing univ posts & Telecommun | Peoples R China | 59 | 135 | 16 | 156 | 9.75 |
| 11 | Natl Univ Singapore | Singapore | 18 | 25 | 7 | 150 | 21.42 |
| 12 | Ben Gurion Univ Negev | Israel | 37 | 44 | 2 | 149 | 74.50 |
| 13 | Univ Victoria | Canada | 18 | 39 | 4 | 141 | 35.25 |
| 14 | Univ Oxford | United Kingdom | 15 | 16 | 5 | 130 | 26.00 |
| 15 | Univ Hong Kong | HONG KONG | 3 | 6 | 4 | 128 | 32.00 |

setting requires a minimum of 20 citations for inclusion, resulting in 242 authors meeting this criterion and being depicted in the figure.

The VOSviewer made it possible to determine the level and scope of collaboration among the researchers those are contributed to the research from across the World. This tool produces numerical output that is simple to understand. Furthermore, 571 of the 1488 researchers who published on these topics possessed the most extensive collaboration (cooperation) network, with a TLS of more than 10, while 246 of the 1488 researchers contributed at least two research outputs. Figure 12 illustrates it clearly. Some adjustments show that 149 authors with at least two documents have at least ten citations. If the document number is one, consequently, there are 466 researchers and at least ten citations.

In this diagram, the size of each node corresponds to the TLS of 152 researchers, indicating their affinity for frequent collaboration. The TLS serves as a measure of the frequency of interaction between two researchers, established through direct links between separate nodes. As depicted in Fig. 12, the community of researchers has constructed 17,306 links and 19,776 TLS. Table 6 lists the top researchers with the highest TLS values.

### 3.4 Collaboration strength among the researchers

A table is generated with various fields to examine the most cited publications, year of publication, and many more to further assess the characteristics and content of the publications.

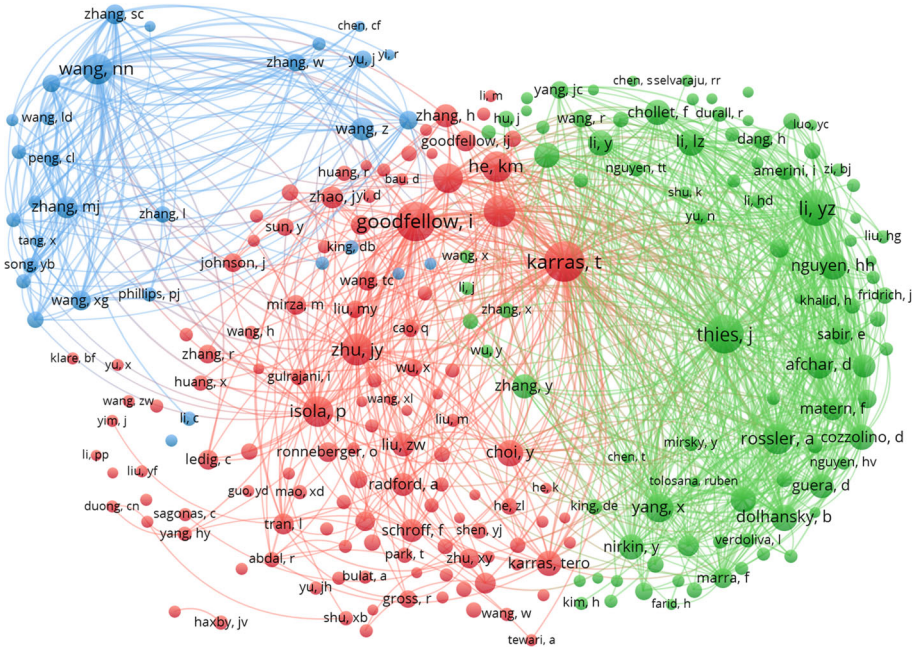


**Fig. 12** The citation network of authors

The requirements for citation and co-citation are also explained and shown in the paragraphs that follow. As depicted in Fig. 13, the co-citation relationship is described as a network of connections. The Table 7 labeled "Top 10 Most Influential Publications" with the highest number of citations is a vital component in bibliometric analysis, serving as a comprehensive snapshot of the scholarly landscape in a specific research domain. The table provides essential details such as the rank of each publication, the title of the article, the author's name, the type of publication, the year of publication, the research direction it pertains to, the citation count (denoted by 'C'), and a link column indicating connections between different entities, such as researchers, research papers, or key concepts.

**Table 6** The top ten researchers with the strongest TLS values

| Rank | Authors | Links | TLS | P |
|---|---|---|---|---|
| 1 | Gao, X | 80 | 239 | 14 |
| 2 | Wang, N | 60 | 190 | 11 |
| 3 | Li, J | 73 | 149 | 10 |
| 4 | Li, Y | 49 | 111 | 13 |
| 5 | Yang, J | 29 | 93 | 7 |
| 6 | Xiao, S | 18 | 81 | 5 |
| 7 | Xu, X | 40 | 73 | 5 |
| 8 | Fierrez, J | 49 | 66 | 3 |
| 9 | Tolosana, R | 49 | 66 | 2 |
| 10 | Vera-Rodriguez, R | 49 | 66 | 2 |

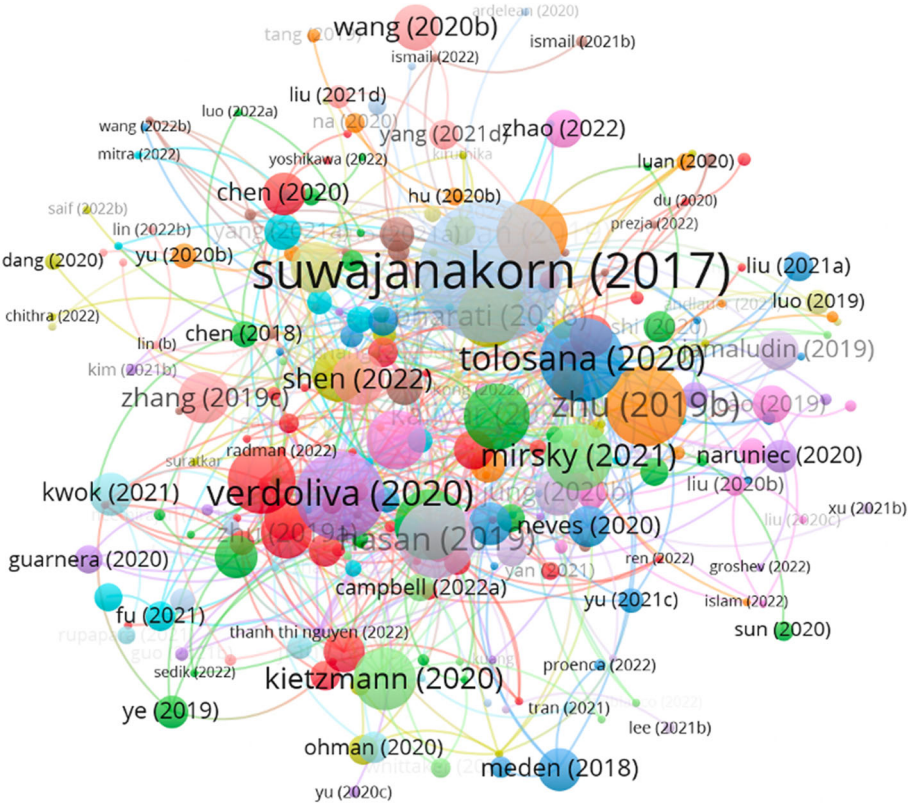


**Fig. 13** The co-citation network of articles

In bibliometric analysis, the ranking of publications based on their influence, often measured by citation count, is instrumental in identifying seminal works that have significantly impacted the field. The inclusion of author names, publication types, and research directions offers a multidimensional perspective on the nature and diversity of influential contributions. Moreover, the links between entities contribute to network analysis, revealing the interconnectedness of various elements within the scholarly discourse. This table, as part of bibliometric analysis, aids researchers in understanding the intellectual structure, trends, and key players in a specific research domain, facilitating informed decision-making and further exploration of impactful contributions.

In their study, Suwajanakorn et al. [10] utilize audiovisual synchronization techniques to craft a realistic video featuring a renowned personality. The paper's primary aim is to achieve photorealistic outcomes by tackling challenges related to face synthesis, lip sync, and audio-to-video mapping through the implementation of an LSTM architecture, a prevalent type of RNN extensively utilized in Deep Learning. Additionally, this research has prompted the integration of several other techniques in deepfake generation [1, 6, 8, 105, 106]. The paper's details are comprehensively outlined in Table 1.

The publications in Table 7, notably [64, 65, 107], are highly cited surveys providing comprehensive insights into various aspects of Deepfake.The paper includes a survey of generation methods, detection techniques, current trends, and limitations in existing defences.

**Table 7** Top 10 most influential publications

| Rank | Article | Author | Type | Publication year | Research direction | C | Links |
|---|---|---|---|---|---|---|---|
| 1 | Deepfakes and beyond: A Survey of face manipulation and fake detection [66] | Tolosana, Ruben; Vera-Rodriguez, Ruben; Fierrez Julian; Morales, Aythami; Ortega-Garcia, Javier | Article | 2020 | Electrical Engineering, Electronics & Computer Science; Computer Vision Graphics; Face Recognition | 156 | 66 |
| 2 | Synthesizing Obama: Learning Lip Sync from Audio [10] | Suwajanakorn, S; Seitz, SM; Kemelmacher-Shlizerman | Article | 2017 | Electrical Engineering, Electronics & Computer Science; Computer Vision Graphics; Face Recognition | 389 | 50 |
| 3 | The Creation and Detection of Deepfakes: A Survey [108] | Mirsky,Yisroel; Lee, Wenke | Article | 2021 | Electrical Engineering, Electronics & Computer Science; Computer Vision & Graphics; Face Recognition | 128 | 40 |
| 4 | Media Forensics and DeepFakes: An Overview [65] | Verdoliva, Lusia | Article | 2020 | Electrical Engineering, Electronics & Computer Science; Computer Vision Graphics; Face Recognition | 186 | 32 |
| 5 | Deepfakes generation and detection: state-of-the-art, open challenges, countermeasures, and way forward [61] | Masood, M ; Nawaz, M; Malik, KM ; Javed, A ;Irtaza, A ; Malik, H | Article | 2020 | Electrical Engineering, Electronics & Computer Science; Digital signal processing; Speech Recognition | 20 | 27 |
| 6 | Face Alignment in Full Pose Range: A 3D Total Solution [109] | Zhu, Xiangyu; Liu, Xiaoming ; Lei Zhen ; Li, Z | Article | 2019 | Electrical Engineering, Electronics & Computer Science; Computer Vision Graphics; Face Recognition | 98 | 5 |
| 7 | FakeBERT: Fake news detection in social media with a BERT-based deep learning approach [118] | Narang, Pratik | Article | 2021 | Social Sciences; Social Psychology; Moral Judgment | 107 | 43 |
| 8 | Combating Deepfake Videos Using Blockchain and Smart Contracts [71] | Hasan, Haya; Salah,Khaled | | 2019 | Electrical Engineering, Electronics & Computer Science; Telecommunications; Internet Of Things | 116 | 17 |

**Table 7** continued

| Rank | Article | Author | Type | Publication year | Research direction | C | Links |
|---|---|---|---|---|---|---|---|
| 9 | FNDNet - A deep convolutional neural network for fake news detection [110] | Kaliyar, Rohit Kumar; Goswami,Anurag; Narang, Pratik; Sinha, Soumendu | Article | 2020 | Electrical Engineering, Electronics & Computer Science; Knowledge Engineering & Representation; Natural Language Processing | 130 | 7 |
| 10 | Representation Learning by Rotating Your Faces [111] | Tran, Luan ; Yin, Xi ; Liu, Xiaoming | | 2019 | Electrical Engineering, Electronics & Computer Science; Computer Vision & Graphics; Face Recognition | 88 | 12 |

Their popularity arises from their detailed overviews, contributing to an in-depth understanding of the landscape surrounding the generation and detection of deepfake.

In 2018, Tolosana et al. [107] conducted a review exploring reenactment and replacement deepfakes involving humans for malicious applications. The study examines detailed architectures, explaining technical concepts like Neural Networks, Loss Functions, RNNs, and GANs. Additionally, it addresses challenges in creating deepfakes, shedding light on complexities in this rapidly evolving field.

In 2020, Mirsky and Lee [64] conducted a detailed examination of various types of facial manipulation. The study extensively compared performance metrics based on factors like databases, classifiers, and generation methods, which include visual, mesoscopic, steganalysis, and deep learning features. The paper also provides links to databases, aiding readers in gaining a comprehensive overview and a starting point for exploring the models, methods, and databases discussed in the survey.

Verdoliva [65] provides an overview of techniques in multimedia forensics, emphasizing the need to authenticate high-quality manipulations like deepfakes. The paper aims to enhance detection methods for manipulated multimedia content, focusing on countering challenges posed by advanced manipulations. Additionally, suggested keywords for an effective search query related to this paper are provided such as "shallowfakes" or "cheapfakes"

Figure 13 illustrates that 16 articles receive more than 50 citations. The size of each node in the figure corresponds to the number of times a publication is referenced, and these publications are all cited together. They are categorized into 15 clusters, each denoted by a different color. Table 5 presents the top 10 most cited publications and their relevant data, emphasizing their significance.

Table 7 comprises 10 articles spanning various fields, including Electrical Engineering, Electronics & Computer Science, Computer Vision & Graphics, and Face Recognition, demonstrating significant research interest. This level of interest rivals that seen in social science fields like moral judgment, social psychology, and human rights. Additionally, connections to other areas within computer science, such as Telecommunications, Knowledge Engineering & Representation, the Internet of Things, and Natural Language Processing, are evident.

## 4 Cooperation analysis

Utilizing the VOSviewer, collaboration networks among nations/regions, institutions, and authors are constructed, enabling the assessment of collaborative relationships and fostering a deeper understanding of research collaborations within the field.

### 4.1 Cooperation network of countries/regions

Relevant data from WoS were collected and input into the VOSviewer to analyze collaboration networks among countries/regions. By setting the criteria for a country or region to a minimum of two documents, 53 out of the 67 countries or regions met the threshold and formed collaborative networks, as depicted in Fig. 14.

These 53 nations and regions are further categorized into 8 clusters, each distinguished by a unique color, illustrating various collaborative relationships. The connections between nodes represent collaborations, with the width of the link indicating its strength or the frequency

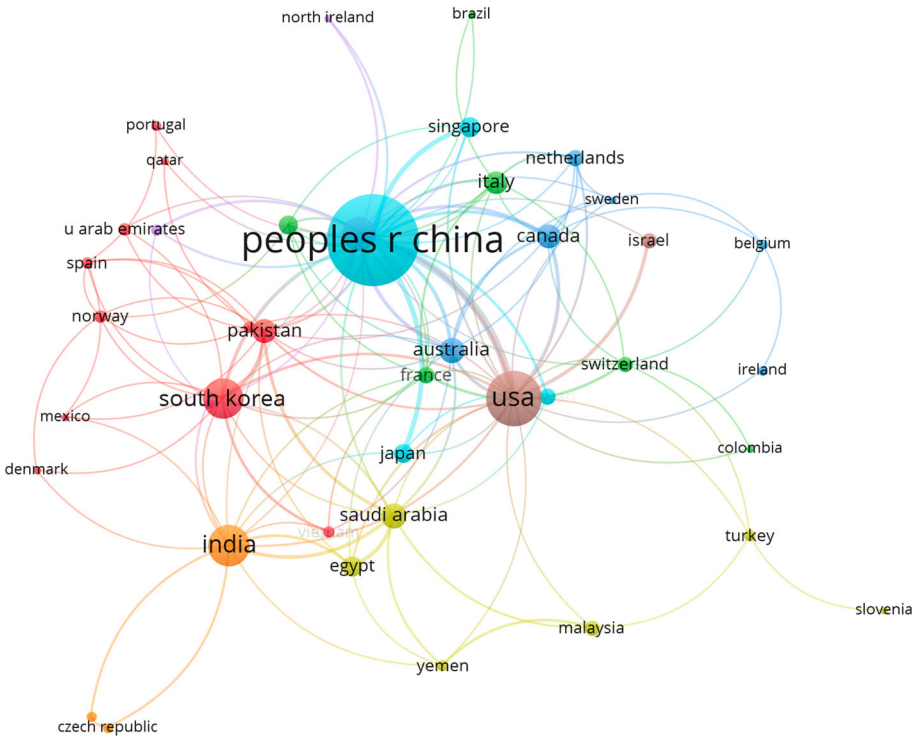


**Fig. 14** The collaborative network of places

of cooperation. The TLS of a node, which is the sum of all link strengths, determines its size.

In Figure 14, the United States, the People's Republic of China, and England emerge as the top three countries with the highest TLS, highlighting their significant collaborative efforts. Notably, the link strength between the USA and the People's Republic of China is particularly robust.

Utilizing the VOSviewer, a co-authorship network for the organization is constructed. The analysis throughout the paper reveals that the People's Republic of China emerges as the foremost country actively engaged in this field. Notably, two Chinese institutions, namely the Chinese Academy of Sciences and the University of Chinese Academy of Sciences (CAS), exhibit the highest link strength. Specifically, the Chinese Academy of Sciences demonstrates a total collaboration strength of 234.61%. The collaboration between these two entities encompasses 13 documents, yielding a collaboration strength of 0.232, which is notably significant given the nascent phase of this area.

Moving forward, the examination shifts towards identifying the countries with the most robust collaborative efforts. People's Republic of China, the United States, India, and England emerge as the top four nations in terms of both publications and citations. Notably, the People's Republic of China and the USA lead the way in collaboration, co-authoring 26 publications together. Further exploration into the People's Republic of China's role as a

primary collaborator reveals its involvement in producing 12 documents in partnership with England, followed by 5 with South Korea and 4 with Canada.

## 5 Exploring burst detection

In this section, two key subsections are presented: Keyword Burst Detection and References Burst Detection, each addressing distinct aspects of the analysis. Burst detection in CiteSpace involves identifying significant spikes or surges in the frequency of citations associated with specific keywords or references over a defined period. This technique plays a crucial role in understanding the temporal dynamics and key focal points within a research field. In the study of deepfake, the relevance of burst detection is highlighted by the findings obtained through an examination of CiteSpace data, specifically in the context of keyword and reference burst detection.

In the context of deepfake and image manipulation, staying abreast of the latest advancements is vital for both generating convincing content and developing effective detection methods. Keyword burst detection allows researchers to pinpoint key terms associated with cutting-edge technologies or methodologies, providing insights into the forefront of innovation. Additionally, tracking reference bursts helps identify influential publications or seminal works, enabling researchers to build upon existing knowledge and contribute to the ongoing discourse.the dynamic nature of the deepfake landscape requires a proactive approach to anticipate emerging challenges and devise robust countermeasures.

### 5.1 Keyword burst detection

The findings of the top 20 keywords and their associated metrics meticulously obtained through an exhaustive examination of CiteSpace data, focusing intently on keywords that experienced a notable surge in citations from 2018 to 2023.

The detailed findings, as elaborated in Table 8, present a comprehensive list of specific keywords meticulously analyzed. Through the utilization of sophisticated analytical tools, various keywords such as “Face Swap,” “Image Editing,” “Deepfake Video Detection,” “Fake News,” “Image Generation,” and “Facial Features” were meticulously identified, all of which exhibit a remarkable alignment with their respective topics. This meticulous approach enables a precise pinpointing and highlighting of key terms that experience notable citation surges during the specified time frame, thereby providing invaluable insights into emerging trends and focal points within the domain of our study.

### 5.2 References burst detection

The notable citations, as presented in Table 9, are accompanied by burst strength values determined by CiteSpace, serving as a measure to assess and visually represent sudden surges in a publication’s citations. Reference bursts highlight papers that are gaining rapid attention and citations, aiding in recognizing seminal works and influential research crucial for understanding the foundational principles in deepfake detection. Within the inventory in Table 8, primary papers such as Isola et al. [112], Simonyan [113], Ledig et al. [114], and He et al. [115] serve as general references and are positioned at the forefront. These papers are considered foundational in the field, contributing significantly to the understanding of deepfake detection. Remarkable papers related to specific subjects include Zhou et al. [25], which

**Table 8** Top 20 Keywords Experiencing the Most Pronounced Citation

**Top 20 Keywords with the Strongest Citation Bursts**

| Keywords | Year | Strength | Begin | End | 2018 - 2023 |
|---|---|---|---|---|---|
| recognition | 2018 | 4.62 | **2018** | 2019 | |
| algorithm | 2018 | 1.97 | **2018** | 2019 | |
| face recognition | 2018 | 1.57 | **2018** | 2019 | |
| image generation | 2019 | 3.16 | **2019** | 2020 | |
| image-to-image translation | 2019 | 2.06 | **2019** | 2020 | |
| face sketch synthesis | 2019 | 1.97 | **2019** | 2019 | |
| pose-invariant face recognition | 2019 | 1.9 | **2019** | 2020 | |
| model | 2019 | 1.9 | **2019** | 2019 | |
| shape | 2019 | 1.56 | **2019** | 2019 | |
| face frontalization | 2019 | 1.5 | **2019** | 2020 | |
| gallium nitride | 2020 | 5.67 | **2020** | 2021 | |
| fake news | 2020 | 2.44 | **2020** | 2021 | |
| image editing | 2020 | 1.65 | **2020** | 2020 | |
| three-dimensional displays | 2020 | 2.54 | **2021** | 2021 | |
| perception | 2021 | 1.97 | **2021** | 2021 | |
| facial features | 2021 | 1.57 | **2021** | 2021 | |
| fake news detection | 2022 | 2.53 | **2022** | 2023 | |
| face swap | 2022 | 1.56 | **2022** | 2023 | |
| image processing | 2022 | 1.56 | **2022** | 2023 | |
| deepfake video detection | 2022 | 1.56 | **2022** | 2023 | |

delves into Two-Stream Neural Networks for Tampered Face Detection; Nguyen et al. [116], which introduces Capsule-forensics: Employing Capsule Networks for Detecting Altered Images and Videos; Li et al. [1], which presents Celeb-DF: A Large-Scale Challenging Dataset for DeepFake Forensics; and Li et al. [117], which explores Face X-Ray for More Comprehensive Face Forgery Detection. These papers are instrumental in advancing techniques and methodologies in the detection of deepfake content. They are accompanied by other pertinent research works, collectively contributing to the comprehensive understanding and development of deepfake detection methods.

## 6 Conclusion

This paper discusses the emerging topics of "Deepfake" and conducts bibliometric analysis spanning from 2012 to 2023. By utilizing the WoS analysis filter feature, 621 documents relevant to the topic were filtered out, and the analysis is conducted using the tool's details table and network graph. VoS Viewer further aids in understanding collaboration among various dimensions and offers guidance through its map file and network file features.

Furthermore, this paper significantly contributes to the field of deepfake generation and detection by offering a comprehensive analysis of prominent existing work. Through the

**Table 9** The top 20 references with the strongest citation bursts

**Top 20 References with the Strongest Citation Bursts**

| References | Year | Strength | Begin | End | 2018 - 2023 |
|---|---|---|---|---|---|
| Isola P, 2017, IMAGE TO IMAGE TRANS, V0, PP1125, DOI 10.1109/CVPR.2017.632, DOI | 2017 | 11.78 | 2018 | 2020 | |
| Simonyan K, 2015, ARXIV, V0, P0 | 2015 | 11.31 | 2018 | 2020 | |
| Ledig C, 2017, PROC CVPR IEEE, V0, PP105, DOI 10.1109/CVPR.2017.19, DOI | 2017 | 11.08 | 2019 | 2021 | |
| Zhou P, 2017, IEEE COMPUT SOC CONF, V0, PP1831, DOI 10.1109/CVPRW.2017.229, DOI | 2017 | 7.84 | 2021 | 2023 | |
| He KM, 2016, PROC CVPR IEEE, V0, PP770, DOI 10.1109/CVPR.2016.90, DOI | 2016 | 12.92 | 2020 | 2021 | |
| Zhu JY, 2017, IEEE I CONF COMP VIS, V0, PP2242, DOI 10.1109/ICCV.2017.244, DOI | 2017 | 11.3 | 2020 | 2021 | |
| Schroff F, 2015, PROC CVPR IEEE, V0, PP815, DOI 10.1109/CVPR.2015.7298682, DOI | 2015 | 10.33 | 2019 | 2020 | |
| Karras Tero, 2020, 2020 IEEE/C ..... CVPR). PROCEEDINGS, V0, PP8107, DOI | 2020 | 10.3 | 2022 | 2023 | |
| Nguyen HH, 2019, INT CONF ACOUST SPEE, V0, PP2307, DOI 10.1109/ICASSP.2019.8682602, DOI | 2019 | 9.49 | 2022 | 2023 | |
| Li YZ, 2020, PROC CVPR IEEE, V0, PP3204, DOI 10.1109/CVPR42600.2020.00327, DOI | 2020 | 9.27 | 2022 | 2023 | |
| Tran L, 2017, PROC CVPR IEEE, V0, PP1283, DOI 10.1109/CVPR.2017.141, DOI | 2017 | 8.83 | 2019 | 2020 | |
| Korshunov P, 2018, ARXIV, V0, P0 | 2018 | 8.69 | 2022 | 2023 | |
| Li LZ, 2020, PROC CVPR IEEE, V0, PP5000, DOI 10.1109/CVPR42600.2020.00505, DOI | 2020 | 8.12 | 2022 | 2023 | |
| Taigman Y, 2014, PROC CVPR IEEE, V0, PP1701, DOI 10.1109/CVPR.2014.220, DOI | 2014 | 7.04 | 2018 | 2019 | |
| Isola P, 2017, PROC CVPR IEEE, V0, PP5967, DOI 10.1109/CVPR.2017.632, DOI | 2017 | 6.72 | 2020 | 2021 | |
| Thies J, 2016, PROC CVPR IEEE, V0, PP2387, DOI 10.1109/CVPR.2016.262, DOI | 2016 | 9.65 | 2021 | 2021 | |
| Kingma DP, 2014, ICLR, V0, P22 | 2014 | 8.53 | 2019 | 2019 | |
| Wang TC, 2018, PROC CVPR IEEE, V0, PP8798, DOI 10.1109/CVPR.2018.00917, DOI | 2018 | 8.11 | 2021 | 2021 | |
| Radford A, 2016, UNSUPERVISED REPRESE, V0, P0 | 2016 | 7.55 | 2020 | 2020 | |
| Johnson J, 2016, LECT NOTES COMPUT SC, V9906, P694, DOI 10.1007/978-3-319-46475-6, 43, DOI | 2016 | 7.32 | 2020 | 2020 | |

inclusion of two detailed tables, it provides invaluable insights into deepfake generation and detection techniques, effectively highlighting key findings and limitations in the field.

Moreover, citing the strongest references and keywords underscores the necessity for thorough analysis in this rapidly evolving field. Over the past four years, deepfake technology has experienced exponential growth, necessitating continuous exploration and advancement. Given the pivotal role of deep learning in both the generation and detection processes of deepfake, ongoing developments in deep learning methods further emphasize the importance of exploring and enhancing deepfake technology.

The key findings from the analysis on deepfake from the year 2012 to September 2023,

- A total of 621 papers spanning from 2012 to 2023 (September) were selected for examination.
- Term searches included "Deepfake," "face swapping," "facial reenactment," "cheap fake," "forged face," and "synthesis face."
- Publications were scarce in the initial four years; however, with the introduction of the new GANs method in 2016, interest in the subject surged, leading to significant works emerging in 2019.
- In 2023, People's Republic of China, USA, England, and India emerged as the leading contributors to publications on this topic.
- With the most documents, citations, and collaborations in this field, People's Republic of China is the leading nation. The top collaborators of People's Republic of China are USA, followed by England.
- The USA competes with other regions for the highest average citations.

Based on the key findings outlined above, this offers valuable insights for other nations and institutions across various regions, enabling them to grasp emerging trends from top publications and fostering potential collaborative opportunities. However, it's important to

acknowledge the limitations of our study, given the evolving nature of the field of deepfake, where significant changes are expected in the near future. Nonetheless, we are confident that our bibliometric evaluation provides a comprehensive overview for researchers, particularly those new to the field of deepfake.

**Author Contributions** AK conceived the idea, collected the data, perform the analysis and wrote the original manuscript. SK performed writing - review and editing. RK identified the problem and provided guidance throughout the project.

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**Data and code Availability** The data and code used for the experiments in this research project is available upon request via mail.

## Declarations

**Conflicts of interest** The authors declare no conflicts of interest.

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# A secure and energy-efficient edge computing improved SZ 2.1 hybrid algorithm for handling iot data stream

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**Abstract**
IoT devices generate a massive amount of sensitive data, which is transferred tremendously to the cloud for processing and decision-making. The most significant issues that need to be solved for IoT devices are improving energy efficiency and guaranteeing data security while several devices are connected. In this paper, for edge computing, a hybrid algorithm is proposed that uses compression and encryption in the same manner to improve efficiency in terms of energy and data security in IoT devices. The authenticated encryption with associated data (AEAD) ChaCha12-Poly1305 algorithm and improved SZ 2.1 compression are used in this hybrid architecture. While sending the data to the edge, confidentiality, integrity, and authentication are maintained. Several experiments were conducted considering the driver stress detection dataset (Bernstein DJ. Lecture Notes in Computer Science including subseries Lecture Notes in Artificial Intelligence and Lecture Notes in Bioinformatics 4986:84–97 (2008); Lakshminarasimhan S et al. LNCS 6852(1):366–379 (2011)) and gas-sensor dataset (Ibarria L et al. Comput Graph Forum 22(3):343–348 (2003)) for monitoring the home activity to validate this approach. The performance of the proposed improved SZ 2.1 compression algorithm is compared with the five baseline algorithms including SZ 1.4, original SZ 2.1, selective compression, algorithm-based fault tolerance (ABFT), and digit rounding algorithms. The key parameters used in the experiment to measure the performance of the proposed algorithm are data reduction, compression ratio, power consumption, encryption time, total processing time, and error. Using the improved SZ 2.1 compression algorithm in conjunction with the ChaCha12-Poly1305 AEAD algorithm, the device's battery life is also enhanced by about 10% while ensuring the security of data disseminated to the Edge. The use of the proposed secure hybrid model reduces both encryption and overall processing time by 95% and 98% respectively for both datasets.

**Keywords** IoT · Power consumption · Security · Encryption · Edge computing

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## 1 Introduction

IoT is a network of computational devices or entities with distinct identities that can automatically exchange data over the internet without the intervention of humans. The accessibility of cloud computing, which is essential for processing IoT data, has allowed IoT to grow to its current size and complexity on a worldwide scale [1]. However, there are several drawbacks to this approach, including bandwidth issues, network latency in transmission, high energy consumption, and security threats. These factors reduce the longevity and reliability of IoT systems. The most significant challenge that IoT devices must address is improving energy efficiency while still maintaining data security [2]. In IoT applications, sensors capture constant real-time streaming of data that must be cloud based processed. Because of the huge amount of streaming data, transmission is energy consuming in IoT devices, reducing their efficiency and lifetime. A mobile phone, a local PC, or an IoT gateway are examples of edge devices. By bringing computing capacity closer to IoT devices, the edge computing architecture, depicted in Fig. 1, has developed as a viable solution for this. The data that is initially gathered by smart items such as sensors and wearables is used here. The edge node may then process the data locally before transmitting it to the cloud. Moving cloud services to the edge of the network is the practice of edge computing. Effectively, it can be compared to a decentralized cloud that places computing power near the data source to support local decision-making. SZ 2.1[3] is an enhanced version of the fast error bounded lossy method. The proposed hybrid SZ compression method is used in conjunction with an algorithm namely, ChaCha12-Poly1305 AEAD. Use of the proposed hybrid SZ 2.1 compression approach reduces the quantity of data delivered from the IoT device to the edge device. As a consequence, the results reached by processing this data do not vary much from those acquired by analyzing the original bulk of data. The ChaCha12-Poly1305 algorithm is a hybrid of the ChaCha encryption method [4] and the Poly1305 message authentication technique [5]. The combination of these two methods offers data secrecy, authentication, and integrity at the same time and can guarantee efficiency with

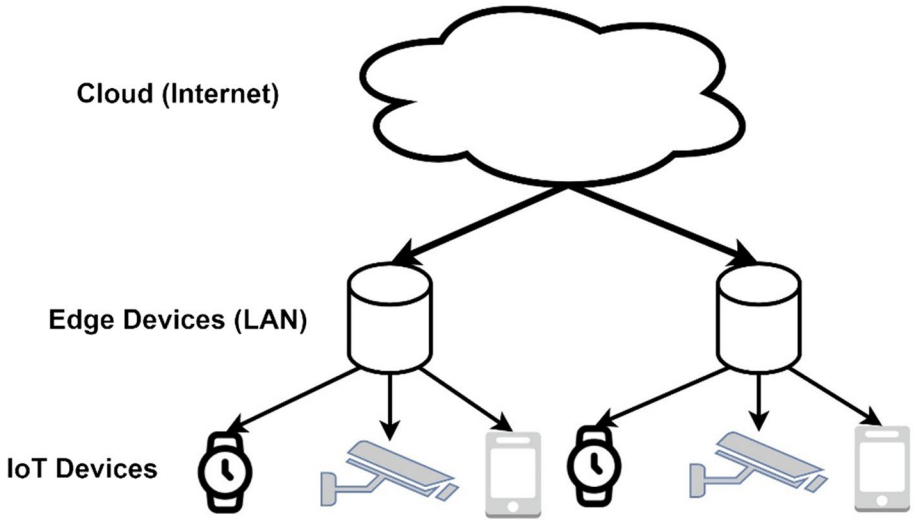



**Fig. 1** - Edge computing architecture

security in IoT devices. On devices with little power, these light-weight algorithms are simple to use. In this paper, the effects of applying these algorithms on IoT devices are studied and the performance of the proposed hybrid improved SZ 2.1 compression method is compared to SZ 1.4 [6], SZ 2.1 [6], selective compression [39], algorithm-based fault tolerance (ABFT) [40], and digit rounding algorithms [41]. Additionally, compared the three AEAD algorithms ChaCha8-Poly1305, ChaCha12-Poly1305, and ChaCha20-Poly1305 [7, 8].

The motivation of this study is that the IoT devices have not yet become commonplace in everyday life due to their inherent challenges in battery life and efficient data management when transmitting real-time data streams. These challenges necessitate a trade-off between data usage and battery consumption on IoT devices. In response to this problem statement, the proposed enhanced SZ2.1 algorithm makes a significant contribution in addressing these specific issues.

One of the key aspects we address is authenticated encryption with associated data (AEAD), which demands an intermediate level of security. To achieve this, we employ the ChaCha12-Poly1305 encryption algorithm. It's worth noting that the number of rounds in the ChaCha algorithm directly impacts the time required for execution. Consequently, the ChaCha8-Poly1305 algorithm boasts the shortest execution time, while the ChaCha20-Poly1305 algorithm requires the longest. The ChaCha12-Poly1305 algorithm strikes a balance, necessitating an intermediate amount of time for execution. However, it's essential to emphasize that the greater the number of rounds, the stronger the security provided by the algorithm. Therefore, our selection of the 12-round variant reflects a deliberate trade-off between security and performance—a distinctive feature of our AEAD approach. On the basis of the above motivation and novelty proposed in improved SZ2.1, the study have following contributions to the proposed work:

1. **Balancing Security and Performance:** Our proposed approach revolves around the strategic use of security and encryption algorithms to strike a delicate equilibrium between the security and performance aspects inherent to IoT-based systems. The novelty of our work lies in effectively managing both these critical elements to facilitate seamless data transfer within diverse IoT-based systems.
2. **Exploring Data Security Mechanisms**: Our research endeavors delve deep into the realm of data security mechanisms. To achieve an intermediate level of security, we adopt the ChaCha12-Poly1305 encryption algorithm for authenticated encryption with associated data (AEAD). The ChaCha algorithm's execution time is intrinsically linked to the number of rounds employed, with the ChaCha8-Poly1305 algorithm demonstrating the swiftest execution, while the ChaCha20-Poly1305 algorithm necessitates the maximum time investment. In contrast, the ChaCha12-Poly1305 algorithm strikes a well-calibrated balance by requiring an intermediate amount of time. It is imperative to highlight that the algorithm's security strengthens with an increased number of rounds. Our deliberate selection of the 12-round variant underscores our commitment to preserving an equilibrium between security and performance.
3. **Enhancing the SZ Compression Algorithm:** We have introduced specific enhancements to the SZ compression algorithm, culminating in the creation of the improved SZ2.1 version. This enhanced iteration seamlessly integrates with the selected encryption algorithm, effectively harmonizing time efficiency, security, and power consumption within IoT devices. Our work significantly contributes to optimizing the interplay between power efficiency and security measures inherent in the management of data transfers for IoT devices.

4. **Data Reduction through Compression and Encryption:** Our approach ingeniously combines compression and encryption algorithms to achieve a substantial reduction in data volume. This reduction indirectly translates into reduced transmission times and enhanced power efficiency, ultimately leading to prolonged battery life. Conversely, employing fewer encryption rounds expedites the encryption process, directly benefiting battery power consumption due to the reduced algorithmic complexity.
5. **Enhancing Energy Efficiency:** We further bolster the energy efficiency of IoT systems by reducing the number of rounds within the ChaCha encryption algorithm. This strategic reduction serves to conserve the battery life of IoT devices. This optimization is complemented by the use of the Improved SZ2.1 compression algorithm, which simultaneously reduces data transfer times, thus further extending battery longevity.
6. **Impact Assessment:** To comprehensively assess the collective impact of compression and encryption algorithms on device energy consumption and network latency, we conduct an extensive comparative analysis of performance parameters. These parameters encompass data reduction, power consumption, encryption time, total processing time, and error metrics across various versions of existing compression methods.
7. **Impact Analysis:** An analysis is conducted on the speed of the proposed compression method for various input sizes. It investigates current data compression methods that may be implemented on IoT devices to decrease the quantity of data transmitted to the edge device, thus decreasing the consumption of energy in IoT devices. The study investigates an improved and more efficient data compression method than the existing state of art methods to improve the compression ratio while maintaining data quality and reducing network load.

| Nomenclature | |
|---|---|
| AAD | Additional Associated Data(optional) |
| CD | Compressed Data obtained after compression |
| Ciphertext | Encrypted data obtained from ChaCha12 |
| Data | Data collected through sensors |
| E | Error bound for compression |
| Energy | Energy level of device |
| Hash | Message Authentication Code (MAC) obtained from Poly1305 |
| IoT | Internet of Things |
| K | Key for encryption |
| M | Ciphertext is combined with additional related data to create MAC data |
| N | Nonce in ChaCha12-Poly1305 |
| OTK | One Time Key for Poly1305 algorithm |
| P | period to collect data before transmitting |
| S | Sampled Dataset |
| Sensor status | Status or mode of the device |
| X | Number of data points in data |
| Y | Number of points sampled from data |

The arrangement of paper is as follows: the literature review discussed in Section 2; the basic terminologies related to architecture, domain protocols, and coding described in

Section 3; the proposed methodology and experimental analysis using two different datasets i.e., drivers stress detection dataset and gas sensors for home activity monitoring Data set illustrated in Section 4; the result analysis using the improved SZ 2.1 compression algorithm in combination with the ChaCha12-Poly1305 algorithm for making sure the security of IoT data in Section 5. Subsequently, the conclusion in Section 6.

## 2 Literature review

Several approaches have been put up in relation to data minimization and data security enhancement in IoT applications. S. Lakshminarasimhan et al. [9] proposed an algorithm ISABELA for compression that uses B-spline interpolation after sorting the data. The reallocation of each point must, however, be stored separately because sorting destroys this data, necessitating additional storage. Thus, when there is a lot of data, this approach generates low compression. Furthermore, this technique depends heavily on the smoothness of the local region data considered as a drawback because spikey and abrupt data changes frequently occur in simulated data. This results in low prediction accuracy and degraded quality of compression. Z. Chen et al. [10] proposed a compression algorithm called NUMARCK. It uses vector quantization while compressing data. It stores two successive iterated data. N. Sasaki et al. [11], just like NUMARCK, also quantizes the data distribution. This algorithm effectively overcomes the limitation of ISABELA by alleviating the dependence on the efficacy of data. Although, this algorithm is not error bound. Additionally, the compression ratio obtained is low as well. A lossy compressor developed by P. Lindstrom et al. [12] is based on lifted orthogonal data block transform and can give error bounded compression as an option. It doesn't rely upon the smoothness of data. However, using this method there is no way to guarantee that the decompressed results will satisfy the error bound. SZ 1.1 deals with a considerable amount of data that is produced while HPC applications are running. The difference between the input data and the decompressed data is designed to stay within the error bound. On the driver stress detection dataset, it has been experimentally demonstrated that an altered version of this technique can achieve a maximum compression ratio of 103. Using physiological signals, Healey et al. [13] suggested a method for measuring stress. These signals can be used for gathering the continuous driving task performance as well as providing feedback related to the driver stress. In [14], Goldberger et al. explained different components of research resources related to complex physiologic signals. In [15] for high-performance computing applications (HPC), Azar et al. suggested a fast error-bounded lossy compression scheme that deals with the wide range of HPC applications generated data. The authors in M. Burtscher et al. [16] describe a lossless data compression technique called FPC. It is fabricated to effectively compress and simultaneously meet scientific computing environments' i.e., high throughput requirements. Although it is a fast-lossless compression technique, which is not capable of achieving the large compression ratios required for IoT applications. P. Lindstrom et al. [17] proposed a data compression technique that, unlike FPC, works well with integer data and variable-precision floating points. When compared to its predecessors, this compression method achieves a higher throughput. However, it doesn't attain compression rates appropriate for IoT devices that produce a lot of data. K. L. Tsai et al. [18] proposed the strategy of secure low power communication. This approach uses incredibly little power and is safe. By using fewer AES encryption cycles, it lowers energy usage. Additionally, the authors' suggested key management and the D-Box upgrade process. LPADA is an architecture for

the AES cipher proposed by K. L. Tsai et al. [19]. This architecture has been designed to lower the energy consumption of AES by making use of energy-efficient S-Box, power gating strategies, and other energy management methods. The outcomes the writers were able to achieve were a dynamic power reduction of 62.0% in contrast to the traditional AES data encryption. S. Roy et al. [20] proposed another encryption technique that has been proposed for IoT systems. It is essentially a lightweight cipher based on cellular automata. While the edge node performs the decryption, the IoT node performs the encryption. It can achieve better results than DES and 3-DES and is shown to be advantageous for resource-constrained IoT devices. SAFER (secure and fast encryption routine) proposed by X. Guo et al. [21], is a complexity-reduced format block encryption method. It takes into account the diffusion and confusion theories. In essence, the confusion layer is made up of the SAFER algorithm, and the diffusion layer is composed of the fermat number theory transform. Due to the lack of multipliers and the focus on integer operations alone, this method has a low level of complexity. This method is suitable for Internet of Things devices with minimal power. S. Singh et al. [22] proposed a suite of cryptographic algorithms comprising encryption algorithms and hashes to design an efficient system consisting of resource-constrained IoT devices. They also analyzed a variety of lightweight ciphers based on certain characteristics viz. the number of rounds, size of the key, and block. D. A. F. Saraiva et al. [23] talk about how AES, ChaCha20-Poly1305, and a few more algorithms perform in IoT applications. The operating times, throughputs, and energy requirements of these algorithms were contrasted. They discovered that the lightweight block ciphers (such as SPECK and LEA) and the ChaCha20-Poly1305 stream cipher are suitable alternatives for devices with limited resources. B. J. Mohd et al. [24] offered a straightforward approach for measuring the effectiveness of light cyphers. The model is used to look for areas where the encryption structure can be more effective. In order to ensure high throughput and minimal energy consumption, it is utilized to forecast the ideal block size and the number of rounds. They also provided an enhanced energy management algorithm that enables a device to handle critical data even when there is a low energy level. A. A. Diro et al. [25] uses Fog computing architecture to ensure distribution and scalability and offload the security functions from IoT devices to Fog nodes to lower the burden on resource-constrained IoT devices. They use elgamal based elliptic curve cryptography for data security while ensuring simplicity and energy efficiency. A. O. Akmandor et al. [26] proposed several architectures for different IoT applications. In order to boost security and energy efficiency while maintaining the devices' intelligence, this article combined decision-making utilizing machine learning and cryptography algorithms on IoT devices. On the IoT device, they applied compressive sensing, compressed signal processing, and machine learning inference to achieve high classification accuracy while drastically reducing energy usage. A. Fragkiadakis et al. [27] presented the use of Adaptive Compressive Sensing. Compressive sensing is utilized to deliver compression and encryption at the same time. In order to assure the effectiveness of the system, the compression rate in this study is chosen based on the projected data scarcity. Y. Zhang et al. [28] appraised Compressive Sensing's security features. The ChaCha20-Poly1305 AEAD algorithm was described by the authors as a small and quick implementation for ARM Cortex-M4 processors. J. Qi et al. [29] used a hybrid securing and CS-based scheme for ensuring energy efficiency and security in IoT devices. They used compressive sensing for compressing signals, chaotic block encryption of 8-bit for privacy, and message authentication codes for authentication. F. de Santis et al. [30] presented a compact and fast implementation of the ChaCha20-Poly1305 AEAD algorithm for ARM Cortex-M4 processors. The results show that ChaCha20- Poly1305 is a reliable technique to ensure security in IoT devices. To secure data packets in lossy

and low-powered networks, S. Luangoudom et al. [31] proposed using an Authenticated Encryption method based on XSalsa20 and Poly1305.

Till now different researchers focused on the security and the energy efficiency of IoT devices as a separate subject, because these two are competing ideas [32, 39–41]. Currently, Compressive Sensing is being used for simultaneously providing security and energy efficiency to IoT systems. Compressive sensing involves efficiently reconstructing a signal by solving undermined linear systems. However, compressive sensing has certain limitations. The first one is sparsity and the second one is incoherence. The signal to be compressed must be sparse in some domain to allow compression. Hence this approach is not applied in cases when the signal is not sparse. Moreover, the compression ratio obtained is limited and much less than what can be obtained from the recent state-of-the-art lossy compression algorithms. Hence, this work is focused on reducing the power consumption in IoT devices by using a lossy error bounded compression algorithm that can be applied irrespective of the characteristics of the input data. At the same time, it is aimed to increase the security of IoT devices by employing the trusted ChaCha20-Poly1305 AEAD algorithm and adapting it for IoT devices.

## 3 Background

This section covers the background knowledge of the work including basic terminologies, coding and domain protocols.

### 3.1 Compression and decompression

Compression is a method for encoding input data with fewer bits than the original representation requires to decrease its size. Decompression is the method used to recover the original data representation from compressed data [33]. It is the process of reversing compression. Lossy and lossless compression, these are two classification of data compression methods. Lossy compression methods decrease the data size by eliminating extraneous or unimportant information [42, 43]. This creates some data distortion. These methods are irreversible and use some inexact approximations to compress the data. The data's quality is compromised and merely allowed for the reconstruction of an approximation of the original data. Data loss enables these methods to achieve high compression ratios. On other hand, lossless compression methods decrease the data size without distorting the data. The quality of the data is not affected in lossless compression. These techniques make it possible to fully recreate the original data from the compressed data. They only achieve a limited degree of compression since they are lossless.

#### 3.1.1 Fast error bounded lossy compression

The SZ compression algorithm described in [1, 4], and [7] is used in this work. They are lossy error-bounded compression algorithms. It has been suggested as a method of compressing massive amounts of data produced by simulation software. It can compress all data types, including integers, floating-point numbers, and doubles. However, in this study, floating-point data is taken into account. For data compression, the SZ method relies on a prediction model. It looks for patterns and then utilizes those patterns to anticipate previously not known data. It predicts new data

points based on previously observed data points. The algorithm's design enables the error to stay precisely within the defined range. This approach also enables a maximum compression ratio while keeping error bounds depending on the application. The absolute error bound value of 0.1 is considered in this research [7]. The absolute error is computed u the Eq. (1), where $d_o$ represents the actual value of data and $d_c$ represents the decompressed data value. As a result, any data value X after decompression should lie between X—0.1 and X + 0.1.SZ algorithms are lossy error bounded compression techniques. They use a prediction model to forecast new data based on previously observed data. As a result, when data is compressed, instead of retaining the original data, it saves specific information about the prediction model. Using the prediction model, the algorithm can recreate an approximation to the initial data during decompression. The SZ compression method consists of three varieties: SZ 1.1 [7], SZ 1.4 [4], and SZ 2.1 [1]. In the proposed work, the SZ 2.1 compression method is modified to produce better compression.

$$Error = \left| d_c - d_o \right| \tag{1}$$

***Variable-length encoding—***The quantization codes generated after quantization were discovered to have an uneven distribution. To compress this non-uniform distribution, variable-length encoding is employed. More frequent symbols were given a smaller code than less frequent symbols in variable-length encoding. The overall length of the data is successfully decreased in this manner. It's a lossless data compression method. For variable-length encoding, all three methods use Huffman encoding.

### 3.1.2 SZ 1.1 Compression

SZ 1.1tries to predict new data based on previously observed data by using several curve fittings models. The multi-dimensional data array is initially converted to a single dimensional array using the compression technique. Then, for each data point, on the basis of previous three data points, it uses the best fit curve fitting model to forecast the following data point. The Preceding Neighbor Fitting Model, the Linear Curve Fitting Model, and the Quadratic Curve Fitting Model are the three models used by the method. The predictable data is replaced with the model's two-digit code. The Preceding Neighbor Curve Fitting Model is represented by Eq. (2). Here, $\widehat{p}_i^P$ denotes the $i^{th}$ predicted point, and $\widehat{p}_{i-1}$ denotes the final expected data point. The Eq. (3) represents the linear curve fitting model, where $\widehat{p}_i^L$ represents the $i^{th}$ predicted point and $\widehat{p}_{i-1}$ and $\widehat{p}_{i-2}$ represents the last and the second last predicted data points and Eq. (4) represents the quadratic curve fitting model, where $\widehat{p}_i^Q$ represents the $i^{th}$ predicted point and $\widehat{p}_{i-1}$, $\widehat{p}_{i-2}$ and $\widehat{p}_{i-3}$ represents the last, the second last and the third last predicted data points.

$$\widehat{p}_i^P = \widehat{p}_{i-1} \tag{2}$$

$$\widehat{p}_i^L = 2 \times \widehat{p}_{i-1} - \widehat{p}_{i-2} \tag{3}$$

$$\widehat{p}_i^Q = 3 \times \widehat{p}_{i-1} - 3 \times \widehat{p}_{i-2} + \widehat{p}_{i-3} \tag{4}$$

### 3.1.3 SZ 1.4 Compression

SZ 1.4 [4] uses a multidimensional prediction model to predict new data based on previously observed data. If a data point is predictable, some metadata that can be used to recover the point after decompression is saved instead of the data point itself. The general formula [4] of the n layer prediction model, as described in [4] is given by Eq. (5). Where, d denotes the number of dimensions, *g(i,j)* the initial value of the data point, and *f(i,j)* the value predicted for the point. Finally, variable length encoding is applied to further enhance compression. SZ 1.4 additionally employs adaptive error-controlled quantization to hold back the predicted points under a defined error limit, allowing to achieve the highest compression ratio while ensuring an error bound depending on the application. A higher n may lead to a more précised prediction, which leads to greater compression quality. A good n choice will result in a good compression ratio, reduced compression error, and faster compression.

$$f(a_1,\ldots,a_d) = \sum_{0\le b_{1,\ldots,b_d}\le n}^{(b_1,\ldots,b_d)\neq(0,\ldots,0)} - \prod_{j=1}^{d}(-1)^{b_j}(nb_j).g(a_1-b_1,\ldots,a_d-b_d) \quad (5)$$

### 3.1.4 SZ 2.1 Compression

SZ 2.1 [1] uses three different prediction models to predict the data points namely the Lorenzo Prediction Model [34], the Mean Integrated Lorenzo Prediction Model [1] and the Linear Regression Model. In SZ 2.1 the algorithm divides the input data into blocks of equal size. Then for each block, it tries to find out the best model for predicting the data. The best model for prediction is decided dynamically for each data block. Then the prediction model is used to get predicted values after which linear-scaling quantization and variable length encoding are performed. For blocks that use the Linear Regression Model, the regression coefficients are compressed using IEEE 754 binary representation analysis [7]. In the end the algorithm compresses the resulting stream using the zstd lossless compression algorithm [35].

### 3.1.5 Compression using 754 binary representation analysis

The unpredictable data is compressed using IEEE 754 binary representation analysis. This is a three-step process. First, all the unpredictable data is mapped to a smaller range by subtracting the median value of the range from all the values. This data is now referred to as normalized data. The data will be closer to 0, and it requires fewer mantissa bits to meet specified precision. Second, the value is curtailed by ignoring the insignificant mantissa part which is in accordance with the user-specified error bounds. Third, to further minimize the storage space, the leading zero-based floating-point compression is utilized. In essence, each point is compressed by making use of a leading zero count followed by the left over significant bits following the XORed of the subsequent normalized values. With the aid of three separate prediction models, SZ 2.1 forecasts data points: Lorenzo prediction model [34], Mean integrated Lorenzo prediction model, and linear regression model. The SZ 2.1 method splits the incoming data into equal-sized blocks. Then it attempts to identify the best model for predicting the data for each block. For each data block, the optimal model for prediction is determined dynamically. The predicted values are then obtained using the prediction model, which is followed by linear-scaling quantization and variable length encoding. The regression coefficients for blocks that utilize the Linear Regression Model are compressed using IEEE 754 binary representation analysis. Finally, the method uses

the zstd lossless compression algorithm [35] to compress the output stream. The Lorenzo model is a prediction model that uses the values of adjacent points to predict the value of a point. It is a special case of the multidimensional prediction model represented by Eq. (5) with the value of n set to 1. For each block, it selects the best prediction model between the best Lorenzo predictor L-predictor and linear regression predictor dynamically based on the cost function. The cost function for linear regression model, Lorenzo model, and mean integrated Lorenzo model is given by Eqs. (6), (7) and (8) *respectively*, where $p_i$ is the predicted value, $o_i$ is the original value, Y is the sample size and E is the error bound, and mean is the mean calculated for the Mean Integrated Lorenzo model.

$$E_r = \sum_{i \in S} |p_i - o_i| \tag{6}$$

$$E_r = \sum\nolimits_{i \in S} |p_i - o_i| + Y * 1.22 * E \tag{7}$$

$$E_r = \sum\nolimits_{i \in S} \left( |p_i - o_i| + Y * 1.22 * E, |mean - o_i| \right) \tag{8}$$

### 3.2 Encryption and decryption

Data must be encoded through the process of encryption so that anyone other than the intended recipient cannot access it. Decryption is the process of breaking the encryption for the sake of recovering the original data. The plaintext is the original data, whereas the ciphertext is the encrypted data. For encrypting and decrypting data, a pseudo-random key is required called the encryption key. To access the plaintext, only the authorized entity with a valid key may decode the ciphertext. In this study, the following methods are utilized to manage security.

#### 3.2.1 MAC (Messages authentication code)

By using MAC, the recipient can confirm that the message was sent by the designated sender and was not altered. The MAC code is produced using both the message and a shared key of the sender and the receiver. The receiver then receives this code along with the message. After that, the receiver recreates the code and compares it with the code sent by the sender. If the generated code matches the received code, the authenticity and integrity of the received message are verified. Otherwise, the communication is invalid, and the receiver should reject it and take the necessary action.

#### 3.2.2 ChaCha20 encryption algorithm

This algorithm belongs to the family of stream ciphers that are specially designed for the software platform. To support divers' performance versus security trade-offs, it permits for different rounds, nonce, key, and counter length. This stream cipher was designed as a concentration of Salsa20 stream cipher, as it provides security as well as high throughput without degrading performance on different software platforms.

#### 3.2.3 Poly1305 Message authentication algorithm

Daniel J. Bernstein developed the message authentication code Poly1305. It is used to validate the message's validity and integrity. From the message, the algorithm generates a MAC. For key expansion, the Poly1305 architecture uses the AES encryption. Poly1305-AES uses two 128-bit keys and a 128-bit nonce to calculate a 128-bit MAC from a variable length message. The message is processed by the algorithm in 16-byte chunks.

#### 3.2.4 ChaCha20-Poly1305 for IoT data eEncryption

To authenticate encrypted communications, the encryption algorithmChaCha20 is often coupled with the Poly1305 authentication algorithm. The ChaCha20 algorithm is used to encrypt communications and generate keys for the Poly1305 method. The message authentication code is generated using the Poly1305 algorithm. The ChaCha20-Poly1305 authenticated encryption with associated data, or AEAD algorithm, is formed by their combination. In this work, the Poly1305 message authentication technique and the ChaCha symmetric key stream cipher with 12 rounds are combined. The integrity, validity, and confidentiality of data exchanged over the network are all guaranteed by this architecture.

## 4 Proposed approach & experimental analysis

The goal of this study is to enhance battery life as well as the security of IoT devices. This objective is to be achieved by implementing appropriate compression and encryption algorithms in IoT devices. Because data transmission consumes energy and significantly reduces the life duration of IoT devices. It is aimed that by using data compression, the amount of data to be sent would be reduced, resulting in lower energy usage. Therefore, the advantage of this study are lesser time for encryption, lesser complex computations for decryption stage as well, middle level compression, relatively lower bandwidth for data transmission, significant reduction in battery consumed by IoT system involved proposed work.

### 4.1 Different proposed model to enhance battery life as well as the security of IoT devices

IoT devices consume the energy while data transmission, which also degrades the battery's life. Therefore, the following models are proposed to enhance battery life as well as the security of IoT devices.

#### 4.1.1 Proposed hybrid model

A hybrid SZ and ChaCha12-Poly1305 based secure energy-efficient model is presented in this study. The work is compared to current SZ 1.4, original SZ 2.1, selective compression, algorithm-based fault tolerance (ABFT) and digit rounding compression algorithms, as well as the version of the ChaCha-Poly1305 algorithm, to enhance the security and energy of IoT devices. The performance of the three compression algorithms is compared in terms of compression and speed. Similarly, the ChaCha12-Poly1305 technique is compared to the inferior ChaCha8-Poly1305 and ChaCha20-Poly1305 algorithm which are used more frequently. The block diagram of the procedure on the

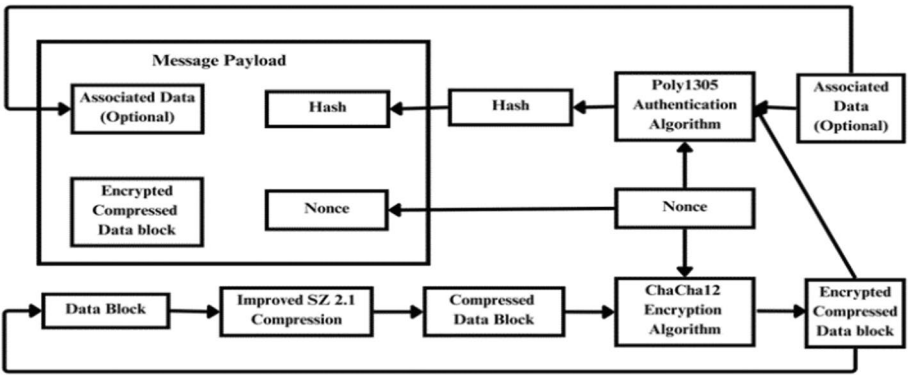



**Fig. 2** - Client (IoT device)

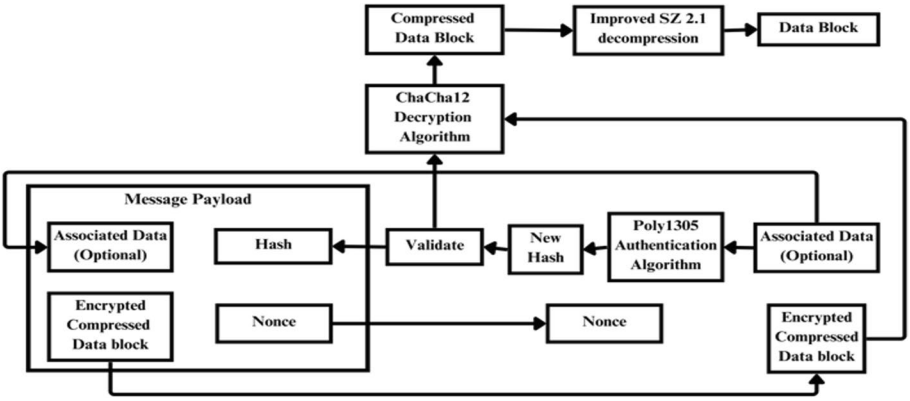



**Fig. 3** –Server (IoT edge device)

Client device is shown in Fig. 2. The data is first gathered by the client device and then compressed using the SZ compression method. The compressed data, along with any additional associated data and a nonce N, are used in the ChaCha12-Poly1305 algorithm. It generates both the Ciphertext and the hash. The message payload consists of the ciphertext, hash, nonce, and any other related data that is transmitted to the edge device. While Fig. 3 depicts the process block diagram on the Edge device. The hash is computed after extracting the ciphertext, additional associated data, and nonce N from the message payload. If the generated hash matches the hash in the message payload, the message is authenticated and proceeds. In the case of a mismatch, the message may be denied, and precautionary actions will be taken. If the communication is authenticated, the ChaCha12 algorithm is used to decode the ciphertext into plaintext. To retrieve the original data, the encrypted data is decompressed using the SZ method.

Algorithm 1 describes the proposed hybrid algorithm. The error bound E, key K, time period P, and SZ compression algorithm version V are all inputs to the algorithm. Initially, P days are needed to gather data utilizing sensors. The gathered data is then leveled into a one-dimensional array and compressed using the SZ compression method. Any extra associated data that must be sent in addition to the gathered data does not need to be protected or encrypted. In addition, a nonce N is produced. It must be distinct for each invocation of

a given key. Finally, the ChaCha12-Poly1305 algorithm, which created the Ciphertext and Hash, was applied to the compressed data CD, key K, nonce N, and additional related data AAD. However, as the SZ technique uses lossy compression, the decompressed data will contain mistakes up to the set error limit. The decompressed data could be examined at the edge device before being transmitted to the cloud for archival and further processing.

**Algorithm 1 Proposed Hybrid Algorithm**

```
Input: Error_BoundE, Key K, Period P, SZ Compression Algorithm Version V
Begin
    while Energy > 0 and Sensor_Status = active do
        data = data collected for time period P
        input_data = flatten(data)
        CD = SZ_Compression (input_data, E, V)    // Collect ADD (additional associated data) to Generate Nonce
        N//
        Ciphertext, Hash = Chacha12_poly1305_AEAD (CD, K, N, AAD)
        transmit_data (Ciphertext, Hash, N, AAD)
    End
End
```

It is believed that the IoT device is constantly collecting data. It transmits the data to the edge node after P seconds of waiting. The gathered data is leveled before being compressed using the SZ compression method. The ChaCha12-Poly1305 technique is used to protect the compressed data once it has been compressed. The ChaCha12 encryption algorithm is used to encrypt the data first. The Poly1305 authentication technique, which creates the Hash for the input, sends the encrypted data together with any optional related data. The hash, encrypted data, and accompanying information was then delivered to the edge node. The data may be authenticated, decrypted, and decompressed at the edge node in order to restore the original data.

### 4.1.2 Proposed SZ compression

SZ 2.1 compresses the data after lossy compression using the zstd lossless compression algorithm to achieve even more compression. The Burrows-Wheeler transform (BWT) compression algorithm SZ 2.1 is replaced within the proposed SZ. The BWT technique is used by bzip2 [36], a free and open-source lossless compression software. When compared to the LZW and Deflate algorithms, bzip2 achieves a significantly greater compression ratio. To achieve high compression, bzip2 uses the Burrows-Wheeler transform, run-length encoding, move to front transform, and Huffman encoding techniques. By sorting the data, the Burrows-Wheeler transform helps in data compression. This produces a series of symbols that can be easily compressed using run-length encoding and Huffman encoding. The improved SZ compression algorithm is represented by Algorithm 2. The densest location v and frequency f 1 are calculated by sampling X points, where X is the number of points in D. The densest frequency f2 is determined by sampling 1% of the data. If f 1 > f 2, the mean integrated Lorenzo predictor is chosen as the best Lorenzo predictor for the data. Otherwise, the original Lorenzo predictor is used to compute the mean value. Following that, the regression coefficients for all blocks are computed. This method eventually divides the data into chunks. To generate a sample dataset S for the block, Y points are sampled. The cost of both prediction models is determined using S. Based on the cost function, it dynamically chooses the best prediction model among the best Lorenzo predictor, L-Predictor, and linear regression predictor. To create predictions, the best-fit prediction model is utilized. This is followed by quantization based on linear scaling and variable-length encoding. Finally, the data is compressed

further using bzip2. Algorithm 3 represents the bzip2 compression. It begins by dividing the data into blocks. Then it conducts a series of actions on each block to compress the data. It encodes the data using run length. This is followed by the most crucial step in bzip2 compression, the Burrows-Wheeler transformation. Following this, apply run-length encoding, Huffman, and delta encoding to generate compressed data CD.

**Algorithm 2 SZ_Compression**

```
Input- Data_D, Error_Bound E
Output- CD (Compressed Data)
Begin
    v, f1 = estimate_densest_position_and_frequency (D, E)
    f2 = estimate_densest_frequency_Lorenzo (D, E)
    If f1 > f2 then
        L-Predictor = Mean Integrated Lorenzo Prediction Model
        mean = compute_mean (D, v, E)
    Else
        L-Predictor = Lorenzo Prediction Model
    end
    coefficients= compute_linear_regression_coefficients(D)
    for each block in D do
        S = sample_points (D, Y)
        El = compute_cost (S, L-Predictor)
        Er = compute_cost (S, Linear Regression Model)
        If Er < El then
            temp_block = compress (block, Linear Regression Model)
        Else
            temp_block = compress (block, L-Predictor)
        End
        temp += temp_block
    End
    temp += compress_IEEE_binary_representation_analysis(coefficients)
    CD = compress_bzip2(temp)
End
```

**Algorithm 3 bzip2_compression**

```
Input- Data D
Output- Compressed_Data CD
Begin
for each block in D do
temp_block = run_length_encode(block)
temp_block = burrow_wheeler_transform(temp_block)
temp_block = move_to_front(temp_block)
temp_block = run_length_encode(temp_block)
temp_block = huffman_encode(temp_block)
temp_block = delta_encode(temp_block)
temp_block += append_symbol_array(temp_block)
CD+=temp_block
End
End
```

### 4.1.3 Chacha12-Poly1305 Encryption

In this section the ChaCha12 encryption algorithm and the Poly1305 message authentication code are described. ChaCha12 is the twelve rounds variant of the popular ChaCha20

stream cipher presented by Daniel J. Bernstein. Instead of 20 rounds of computation, it takes 12 rounds. It is like the 20 rounds variant in all other aspects. The method becomes faster when the number of rounds is reduced. However, a smaller number of rounds implies degradation in terms of security.

**Algorithm 4 ChaCha12-Poly1305-AEAD-Algorithm**

```
Input: Plaintext P, Key K, Nonce N, Additional Associated Data (AAD)
Output: Ciphertext, Hash
Begin
    OTK= generate_one_time_key (K, N)
    Ciphertext = ChaCha12-Encrypt (P, K, N)
    M = AAD + pad16(AAD)
    M += Ciphertext + pad16(Ciphertext)
    M += AAD_length_in_bytes
    M += Ciphertext_length_in_bytes
    Hash = Poly-1305(M, OTK)
End
```

**Algorithm 5 ChaCha12-Encrypt**

```
Input: Plaintext P, Key K, Counter C=1, Nonce N
Output: Ciphertext
Begin
    constants = [0x61707865, 0x3320646e, 0x79622d32, 0x6b206574]
    roundSchedule = [(0, 4, 8, 12), (1, 5, 9, 13), (2, 6, 10, 14), (3, 7, 11, 15), (0, 5, 10, 15),
    (1, 6, 11, 12), (2, 7, 8, 13), (3, 4, 9, 14)]
    Ciphertext = []
    for index, block in enumerate (P [index: index+64] for index in range (0, length(P),64) do
        state = constants + K + [C] + N
        workingState = state
        for rounds=1…3 do
            for a, b, c, d in roundSchedule do
                x_a = workingState [a]
                x_b = workingState [b]
                x_c = workingState [c]
                x_d = workingState [d]
                x_a = (x_a + x_b) & 0xffffffff
                x_d = x_d ^ x_a
                x_d = ((x_d << 16) & 0xffffffff | (x_d >> 16))
                x_c = (x_c + x_d) & 0xffffffff
                x_b = x_b ^ x_c
                x_b = ((x_b << 12) & 0xffffffff | (x_b >> 20))
                x_a = (x_a + x_b) & 0xffffffff
                x_d = x_d ^ x_a
                x_d = ((x_d << 8) & 0xffffffff | (x_d >> 24))
                x_c = (x_c + x_d) & 0xffffffff
                x_b = x_b ^ x_c
                x_b = ((x_b << 7) & 0xffffffff | (x_b >> 25))
                workingState [a] = x_a
                workingState [b] = x_b
                workingState [c] = x_c
                workingState [d] = x_d
            End
        end
        keyStream = [(s + w) & 0xffffffff for s, w in zip (state, workingState)]
        Ciphertext += [x ^ y for x, y in zip (keyStream, block)]
    End
End
```

**Algorithm 6 Poly1305 Algorithm**

```
Input: Message M, Key K
Output: Hash
Begin
  P = 0x3fffffffffffffffffffffffffffffffb
  accumulator = 0
  set r to first 16 bytes of K and read as a little-endian number
  clamp r by setting r to r & 0x0ffffffc0ffffffc0ffffffc0fffffff
  set s to the last 16 bytes of K and read as a little-endian number
  for each 16-byte block in M do
      set n to block + b'\x01' and read as a little-endian number
      accumulator += n
      accumulator = (r * accumulator) % P
      accumulator += s
  End
  set Hash to the 16 least significant bytes from the accumulator read as a little-endian number
End
```

In this work, the ChaCha12-Poly1305-AEAD algorithm is proposed. The Poly1305 message authentication code and the ChaCha12 encryption algorithm are combined to create this algorithm. The ChaCha12-Poly1305 algorithm is represented by Algorithm 4. Here, the key K and the nonce N are first combined to create a one-time key. Before concatenation, AAD and Ciphertext were padded until they were a multiple of 16. Finally, the Poly1305 Algorithm is used to calculate the hash value. These two algorithms were selected because they are portable and may be used on IoT devices. Particularly, the CPU-friendly Add-Rotate-XOR (ARX) operations used by the ChaCha12 encryption algorithm make it simple to operate on devices with limited resources. Algorithm 5 represents the ChaCha12 encryption. The ChaCha12 algorithm accepts the plaintext P, key K, nonce N, and a counter with the default value of 1 as input. It begins by initializing some constants then divides the input plaintext P into blocks of 64 bytes. The size of the last block can be less than 64 bytes. For each block, it creates a state variable from the constants, the key K, the counter C, and the nonce N, then creates a copy of the state variable and performs three double rounds. In each double round, it performs some Add-Rotate-XOR operations. Finally, it constructs a key-stream by combining the working state variable with the state variable. To get the cipher text, this key-stream is XORed with the block. Daniel J. Bernstein developed the message authentication code Poly 1305, represented by algorithm 6. It is used to validate the message's validity and integrity. As input, it takes the message M and the key K. It begins by initializing certain constants. The key is then used to generate two variables, r, and s, then it adds b '$\times$01' to each block of 16 bytes in M and reads it as a little-endian integer. This value is appended to the accumulator variable, following that, the value of the accumulator is updated using r and s. After all of the blocks have been processed, the hash value is calculated by reading the accumulator's 16 least significant bytes as a little-endian integer.

### 4.1.4 Example of chacha12-poly1305 algorithm

The ChaCha12-Poly1305 algorithm is implemented using the technique described in [5, 6], except that instead of 20 rounds, the ChaCha encryption algorithm is performed using just 12 rounds. Although a larger number of rounds indicated better cryptographic security. The research provided in [37] demonstrates an attack against seven-round versions of the ChaCha algorithm. Even though there is no known attack on the ChaCha algorithm's

8 rounds version, the 12 rounds variant was selected since it offers a larger security gap. The 20-round version would improve security while also increasing computing complexity. Table 1 shows the results achieved while using the ChaCha12-Poly1305 method as an example.

### 4.2 Experimental analysis

We have utilized two datasets for our experimental analysis, namely, the Drivers Stress Detection Dataset [13, 14], and the Gas Sensors for Home Activity Monitoring Dataset [38]. The first dataset contains a variety of signals collected from individuals while doing real-world driving activities. The sample of sample were at a rate of 496 Hz. They were captured as vehicles in the Greater Boston region followed a predetermined path. Three segments—rest, city, and highway—each driving job lasts at least 50 min. Rest refers to the intervals of rest at the start and end of a driving task that is classified as "Low Stress". City is the period when the driving job is carried out inside the city and the driver may have encountered a range of traffic conditions. These were referred to as "High Stress". Highway periods include the time spent traveling on the highway. These were designated as "Moderate Stress" periods. This data labeling is verified by the drivers themselves using self-reporting questionnaires. Five psychological signals were used to identify stress. ECG (electrocardiogram), HR (Heart Rate), GSR (Galvanic skin response) of the hand, GSR (Galvanic skin response) of the foot, RR (respiration rate). The WFDB (waveform database) format is used to store the data, which is preprocessed to convert into a 32-bit binary file. The second dataset of gas sensor home activity monitoring consists of 100 recordings which is an array of eight MOX gas sensors, a humidity sensor, and a temperature sensor. The sensor array is exposed to two different stimuli: wine and banana. The duration of each stimulation ranges from seven minutes to two hours, with an average of 42 min. There are 36 wine readings, 33 banana readings, and 31 background activity readings. Readings are taken at one sample per second, with minor variations due to wireless communication issues. From this dataset, only the temperature sensor readings are used. Three experiments were performed on these datasets to study the Application of the suggested protocol and its effects on IoT devices, Effect of larger input data size on SZ compression techniques and Effect of increase in the size of input data on ChaCha8-Poly1305, ChaCha12-Poly1305, and ChaCha20-Poly1305 algorithms.

#### 4.2.1 Effect of applying the proposed protocol on IoT Devices

This section consists experiments that were conducted for verifying the effectiveness of the SZ 1.4, original SZ 2.1, selective compression, algorithm-based fault tolerance (ABFT), digit rounding algorithms and the improved SZ 2.1 compression algorithms in combination with the ChaCha12-Poly1305 algorithm have been explained. A client and server program for this purpose were implemented. Those experiments were conducted as mentioned in [15].

***Client IoT Program:*** This program was deployed on Raspberry pi. Figure 2 represents the IoT Client Program written in Python programming language. The existing compression algorithms, and the improved SZ 2.1 with AEAD algorithm ChaCha12-Poly1305 were deployed on the client IoT device.

**Table 1** An example of the ChaCha12-Poly1305 algorithm

| Variable | Value (in hexadecimal) |
|---|---|
| Key | *2c1f5718c0175025f56ce7622d8016607751f d1a988a2e163c0e6c90802ead32* |
| Nonce | *69cc92e6bda 9099bb1d4ccfc* |
| Plaintext | *74657374706c61696e74657874* |
| Initial State | *657870616e642033322d62797465206b2c1f5718c0175025f56ce7622d801660 7751fd1a988a2e163c0e6c90802ead320100000069cc92e6bda9099bb1d4ccfc* |
| Key Stream | *88ca722a8ebfe2f032432d55c5ea4f3103f97b3ae9de0bc4d20e1f8272dd3490 d05b4998700d336178fe79bf3d17f0144b5a351c799c47cee10df52716d66f7d* |
| Ciphertext | *fcaf015efed38 3995c37482db1* |
| One Time Key | *fd7185f331cb6a8239a21b56ebe94c0704061847703c94cd3687d29902df 5b13* |
| AAD | *74657374686561646 572* |
| Hash | *8a8db0c937371c28f43165fb0196b674* |

***Server IoT Program:*** This program was deployed on the Asus-X541UA laptop running on the Ubuntu 18.04.03 LTS. The existing compression algorithms, and the improved SZ 2.1 as well as the AEAD_algorithm ChaCha12Poly1305 were deployed on the edge device. Table 2 lists the two devices' specifications.

The Raspberry Pi 4B with power 5 V|USB-C having processor ARM-CORTEX-A72 BCM2711 was used for the experiment as a client device. It is assumed that the client and server have previously used a secure key exchange mechanism to establish the shared secret key for the encryption algorithm. The data is broken up into blocks that are 2,976,000 bytes in size. A data block is sent to the edge device, where the received data is processed, after one minute. If the data is encrypted at the client device, the edge device must first verify its authenticity using the tag or hash that was delivered with the data. Data is decrypted after it has been authenticated. If the client device compresses the data, the edge device will decompress it. The processing of that data would follow. After that, the data might be processed again or uploaded to the cloud. Four hours, or 241 intervals, of this process are repeated.

#### 4.2.2 Impact of increase in the size of input Data on SZ compression algorithms

In this section, the experiments performed for studying the effect of size of input data on the existing algorithms have been explained. The experiments were conducted using data blocks of size 100 KB, 200 KB, 400 KB, 800 KB, 1200 KB, 1600 KB, 3200 KB, 6400 KB, 12,800 KB, 25,600 KB, and 51,200 KB. The data blocks were created from the Driver Stress Detection Dataset and the Gas Sensors for Home Activity Monitoring Dataset. The experiments were conducted on the **Asus X541UA** whose specifications are mentioned in Table 2.

#### 4.2.3 Impact of increase in the size of input data on CHACHA8-POLY1305, CHACHA12-POLY1305, and CHACHA20-POLY1305 algorithms

In this section, the experiments performed for studying the effect of size of input data on the ChaCha8-Poly1305, ChaCha12-Poly1305, and the ChaCha20-Poly1305

**Table 2** Device Specification

| Specification | Raspberry Pi 4B | Asus X541UA |
|---|---|---|
| OS | Ubuntu-18.04.3 LTS | Ubuntu-18.04.3 LTS |
| CPU | ARM-CORTEX-A72 BCM2711 | Intel Core i3 7100U CPU 2.4 GHz |
| RAM | 4 GB | 4 GB |
| Storage | 64 GB | 64 GB |

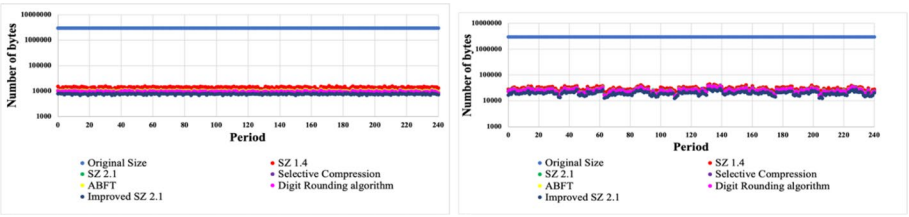
algorithms has been explained. The experiments were conducted using data blocks of size 100 KB, 200 KB, 400 KB, 800 KB, 1200 KB, 1600 KB, 3200 KB, 6400 KB, 12,800 KB, 25,600 KB, and 51,200 KB. The data blocks were created from the Driver Stress Detection Dataset and The Gas Sensors for Home Activity Monitoring Dataset. The experiments were conducted on the Dell Inspiron 15R 5537 whose specifications are mentioned in Table 2.

## 5 Result and discussion

In this section, the results obtained from these experiments are presented. The observations were made during experimental analysis by applying the proposed protocol i.e., Data reduction, Power consumption, Encryption time, Total processing time, and Error on IoT devices which are explained as follows:

### 5.1 Data reduction

This subsection includes the results of data reduction i.e., the amount of data reduced due to compression and its effect on both the datasets. Figure 4(a) shows the variation in data transmission to the edge device during each period when no compression algorithms are utilized. Figure 4(b) shows the same when the existing compression algorithms are used. The data transmitted is obtained from the driver stress detection and home activity monitoring dataset. The vertical axis on a logarithmic scale shows the data delivered in bytes, while the horizontal axis represents the periods. Without compression, 2,976,000 bytes of data are transmitted. When the SZ 1.4 compression algorithm is used, the transmitted data varies between 19,171 bytes to 44,588 bytes and 11,388 bytes to 15,926 bytes. Also, the maximum compression ratio obtained is 155, and 261 times while the average compression ratio is 100, and 214 times respectively for driver stress detection and home activity monitoring dataset. Similarly the compression ratio of existing algorithms is also presented in Fig. 4a and b. When the SZ 2.1 compression algorithm is used, the amount of data transmitted varies between 16,444 bytes and 40,821 bytes and 6723 bytes and 8291 bytes. Also, the maximum data reduction achieved is 180 times and 442 times. The average compression ratio achieved is 116 times, and 392 times respectively for driver stress detection and home activity monitoring dataset. When the improved SZ 2.1 compression algorithm is used, the amount of data transmitted varies between 12,296 to 29,408 bytes and 6723 to 8291 bytes. Also, a maximum data reduction of up to 242 and 442 times can be achieved while the average compression ratio achieved is 154 and 392 times respectively for driver stress detection and home activity monitoring dataset.




a Driver stress data detection dataset b Gas sensor data dataset

**Fig. 4** Data transmitted during each period**. a.** Driver stress data detection dataset. **b**. Gas sensor data dataset

Variations in the amount of data transmitted are seen when these compression algorithms were used. This is because some blocks are easy to compress while some are harder to compress. The results showed that using the improved SZ 2.1, the data to be transmitted was significantly able to be reduced. It also showed that the improved SZ 2.1 compression algorithm performed much better than the existing compression algorithms for driver stress detection and home activity monitoring dataset. Figure 5 presented the comparison of both the datasets using the existing compression algorithms with the improved SZ 2.1 and also out of all the algorithms, the improved SZ 2.1 compression algorithm has the highest average compression ratio.

## 5.2 Power consumption

This subsection includes the details of the power consumption factor on two different datasets, that is, the power consumed during each experiment. That experiment is conducted in different scenarios such as: An inactive client, The client is utilizing sensors to collect data, The client collects data and sends it to the edge at the end of each period, After each

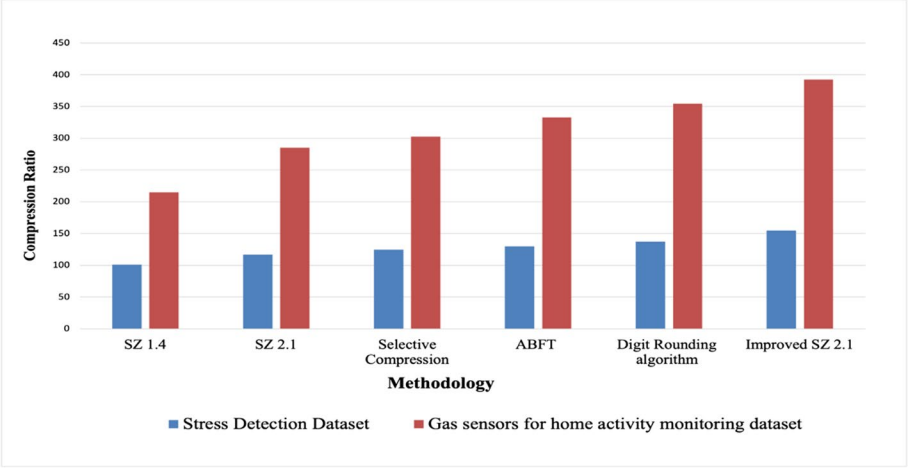



**Fig. 5** Comparison of both the datasets using the compression algorithms SZ 1.4, original SZ 2.1, selective compression, algorithm-based fault tolerance (ABFT), digit rounding algorithms, and the improved SZ 2.1

period, the client gathers data and encrypts it, After each period, the client collects data, encrypts it, and sends it to the edge, After each period, the client gathers data, compresses it, and encrypts it, After each period, the client gathers data, compresses it, encrypts it, and then sends it to the edge. For the measurement of power consumption during data transmission and compression, we employed a power meter, as described by Eq. 9. During data stream transmission, the power consumption was recorded at 1.253 W, and it increased to 1.44 W during the compression process.

$$Power\ Consumption\ (W) = Transmission\ Time\ *\ 1.253 + Compression\ Time\ *\ 1.44 \tag{9}$$

### 5.2.1 Driver stress detection dataset

These power consumption results shown by Fig. 6a, b,c, d, e and f present the level of battery of the client IoT device over 4 h during various scenarios when it is sending the data of the stress detection dataset and uses with versions of the SZ compression algorithms namely, (SZ1.4, SZ2.1), and selective compression, ABFT, digit rounding algorithm and the proposed hybrid model improved SZ2.1 algorithm and ChaCha12-Poly1305 encryption algorithm over 241 periods in different scenarios as follows: Blue line: Reduction of battery level when the client is inactive. The level of battery reduces to 51% using the proposed hybrid model. Redline: Reduction of battery level when a client is sensing data. The battery level reduces to 46% in this case. Orange Line: Data is being sensed by the client and sent to the edge. In this instance, the battery level drops to 37%. Black Line: Using the ChaCha12-Poly1305 algorithm, the client senses the data and encrypts it. In this instance, the battery level drops to 37%. Purple Line: The client detects the data, compresses it with the existing and proposed algorithms and encrypts it with the ChaCha12-Poly1305 technique. In this instance, the battery level drops to 45%. Green Line: Data is being sensed by the client, encrypted with the ChaCha12-Poly1305 algorithm, and sent to the edge. In this instance, the battery level drops to 37%. Yellow Line: The client is detecting the data, encrypting it with the ChaCha12-Poly1305 algorithm, compressing it with the existing and proposed algorithm, and sending it to the edge. In this instance, the battery level drops to

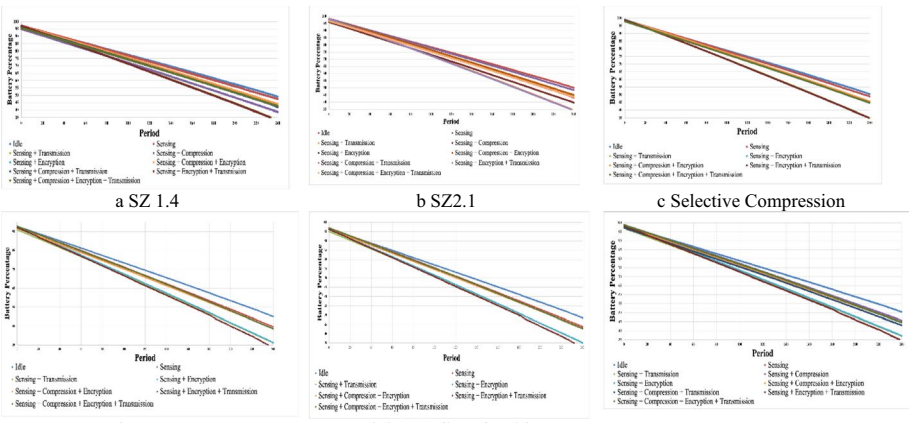



**Fig. 6** Battery level of the client for Driver Stress Detection Dataset during 241 periods

45%. It shows the in green line that the data is being sensed by the client, encrypted with the ChaCha12-Poly1305 method, and sent to the edge. In this instance, the battery level drops to 35%.

### 5.2.2 Gas Sensors for home activity monitoring dataset

These power consumption results are shown by Fig. 7a, b, c, d, e and f depict the level of battery of the client over 4 h during different scenarios when it is sending the data from the Gas Sensors for Home Activity Monitoring Dataset and by using using SZ 1.4, original SZ 2.1, selective compression, algorithm-based fault tolerance (ABFT), digit rounding algorithms and the proposed hybrid model improved SZ 2.1 algorithm and ChaCha12-Poly1305 encryption algorithm over 241 periods. It shows the following different cases which are explained as follows: blue line: An inactive client. In this case, the level of the battery reduces to 51%. Redline: Client is gathering information. In this instance, the battery level drops to 49%. Pink Line: The data is being sensed by the client and sent to the edge. In this instance, the battery level drops to 36%. Black Line: The data is being sensed by the client, who is then utilizing the ChaCha12-Poly1305 method to encrypt it. In this instance, the battery level drops to 45%. Purple Line: Data is being sensed by the client, which then uses the SZ 1.4 method to compress it and the ChaCha12-Poly1305 algorithm to encrypt it. In this instance, the battery level drops to 46%. Green Line: The data is being sensed by the client, encrypted with the ChaCha12-Poly1305 method, and sent to the edge. In this instance, the battery level drops to 35%. Yellow Line: Data is being sensed by the client, which then compresses it with the existing and proposed algorithm, encrypts it with the ChaCha12-Poly1305 method, and sends it to the edge. In this instance, the battery level drops to 43%. Figure 7a represents the battery level of the client with SZ 1.4. Similarly, the battery level of the client for other algorithms selective compression, ABFT, digit rounding algorithm and the proposed hybrid model improved SZ2.1 algorithm are shown in the Fig. 7b, c, d, e and f.

All of these findings demonstrated that when the client is idle, the battery is used the least. When detecting data, the client device used more battery. The battery was further depleted by using the encryption technique. The maximum amount of energy is consumed

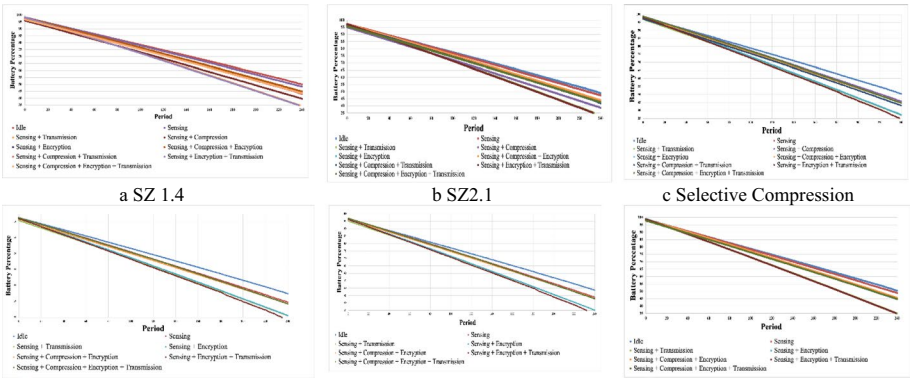



**Fig. 7** Battery level of the client with home activity monitoring dataset during 241 periods

when the device is encrypting data and then transmits it directly. However, using compression considerably lowers energy use.

### 5.2.3 Percentage of battery saved

Tables 3 and 4 shows the amount of battery saved when the compression is used before encryption and transmission as compared to the case when the data is just encrypted and then transmitted. Using SZ1.4, 7.41% of battery in the case of the driver stress detection dataset and 7.42% of battery in case of gas sensors for home activity monitoring dataset were able to be saved. Through the use of compression algorithm SZ 2.1, battery life by up to 10.02% could be increased in the case of driver stress detection dataset and by 9.74% in the case of gas sensors for home activity monitoring dataset. By using Selective Compression algorithm, the percentage of battery saved in the case of the driver stress detection dataset was 8.89 and 8.98 in the case of gas sensor dataset. The ABFT algorithm was able to save the battery by 9.57% for the driver stress detection dataset and by 8.99% for the gas sensor dataset. Next the table shows the result for the digit rounding algorithm where 9.98% of battery in the case of the driver stress detection dataset and 9.45% of battery in case of gas sensors for home activity monitoring dataset were able to be saved. Lastly, we have the Improved SZ 2.1 algorithm with the highest percentage of battery saved in comparison to the previously mentioned algorithms by producing 10.12% and 9.75% of battery saved for the driver detection dataset and gas sensor dataset, respectively because original SZ2.1 use zstd lossless compression and improved SZ2.1 uses bzip2_compression [39]. To achieve high compression, bzip2 uses the Burrows-Wheeler transform, run-length encoding, move to front transform, and Huffman encoding techniques. By sorting the data, the Burrows-Wheeler transform helps in data compression. This produces a series of symbols that can be easily compressed using run-length encoding and Huffman encoding. The improved SZ compression algorithm is represented by Algorithm 2.

Through the use of proposed improved SZ 2.1, battery life by up to 10.12% could be increased in the case of Driver Stress Detection Dataset and by 9.75% in the case of Gas Sensors for Home Activity Monitoring Dataset. Hence, the battery life of the device is improved even after using the encryption algorithm. The results also showed that more energy is saved when using the improved SZ 2.1 algorithm as compared to other state of art techniques. This is because for both datasets, the improved SZ 2.1 compression algorithm has a higher compression ratio as compared to others. A higher compression ratio implies lower encryption and transmission time which leads to lower energy consumption. The amount of energy spent in compressing the data is lower than the amount of energy saved during transmission.

### 5.2.4 Encryption time

Encryption plays an important role in the security aspect. This subsection shows the result of the time taken to perform encryption. The time required by the ChaCha12-Poly1305 algorithm to process every block of data from the Stress Detection Dataset over the course of 241 periods is displayed in Fig. 8a. The vertical axis shows the time required on a logarithmic scale, while the horizontal axis shows the periods. The time needed by the ChaCha12-Poly1305 algorithm was greatly reduced by the use of the compression algorithm improved SZ 2.1. The average encryption time is 0.026 for improved SZ 2.1 and it is lower than remaining SZ 1.4,the SZ 2.4, selective compression, ABFT, digit rounding algorithm.

**Table 3** Percentage of Battery Saved for Drivers Stress Detection Dataset

| Dataset | Drivers Stress Detection Dataset | | | | | |
|---|---|---|---|---|---|---|
| Compression Algorithm | SZ 1.4 | SZ 2.1 | Selective Compression | ABFT | Digit Rounding algorithm | Improved SZ 2.1 |
| % of Battery Saved | 7.41 | 10.02 | 8.89 | 9.57 | 9.98 | 10.12 |

**Table 4** Percentage of Battery Saved for Gas Sensors Dataset

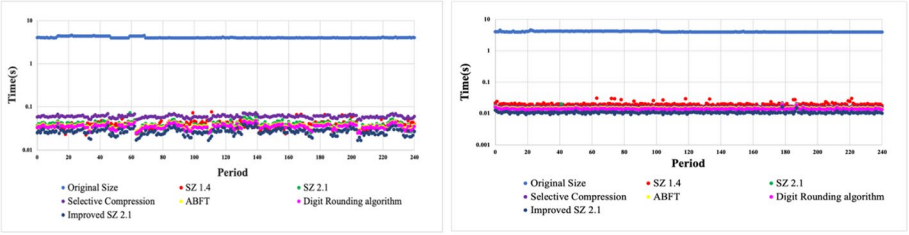
| Dataset | Gas sensors for home activity monitoring dataset | | | | | |
|---|---|---|---|---|---|---|
| Compression Algorithm | SZ 1.4 | SZ 2.1 | Selective Compression | ABFT | Digit Rounding algorithm | Improved SZ 2.1 |
| % of Battery Saved | 7.42 | 9.74 | 8.98 | 8.99 | 9.45 | 9.75 |

Hence the encryption time is lowest for the improved SZ 2.1 algorithm. Figure 8b shows the data from the gas sensors for the home activity monitoring dataset during 241 periods. The average encryption time is 0.010 for improved SZ 2.1, 0.014 for SZ 2.1, and 0.019 for the SZ 1.4 compression algorithm and its also lower than other algorithms selective compression, ABFT, and digit rounding algorithm. Hence once again, encryption time is the lowest for the improved SZ 2.1 algorithm. Equation (10) defines the formula for calculating encryption time, with the following parameters: "size of data" representing the total data volume intended for encryption, and "Encryption speed" denoting the rate at which the encryption algorithm handles data.

$$\text{Encryption Time} = \frac{Size\ of\ Data\ (in\ bytes)}{Encryption\ Speed\ (\ bytes/sec)} \tag{10}$$

### 5.2.5 Total processing time

This subsection includes the details of processing time that is, the time taken to process a data block. The overall processing time for each data block over 241 different periods is shown in Fig. 9a. The Driver Stress Detection Dataset is where the information came from. On a logarithmic scale, the horizontal axis depicts the periods and the vertical axis the time. When the ChaCha12-Poly1305 technique is employed to secure data before transmission, the total time needed is at its greatest. The processing time is shortened by using the SZ 1.4, SZ 2.1, and improved SZ 2.1 compression algorithms. According to the Figure, the enhanced SZ 2.1 algorithm requires the least amount of processing time overall among the three compression techniques. Figure 9b shows data obtained from the gas sensors for the home activity monitoring dataset. The use of compression algorithms SZ 1.4, SZ 2.1, and the improved SZ 2.1 reduces the time required for processing. For the Driver Stress Detection Dataset and the Gas Sensors for Home Activity Monitoring Dataset, on average, the total processing time required when using improved SZ 2.1 compression as well as encryption before transmitting is significantly lower than the processing time required when data is just transmitted without compression and encryption. It is clear from this that using compression and encryption together is possible without having a negative impact on the system. Even better, it reduces latency, which enhances the system.




a Driver Stress Detection Dataset b Gas Sensors for Home Activity Monitoring Dataset

**Fig. 8** Encryption Time

### 5.2.6 Error

This subsection includes the results of error parameters generated while working on driver stress detection and gas sensor dataset, that is, the error produced in the decompressed data due to lossy compression.

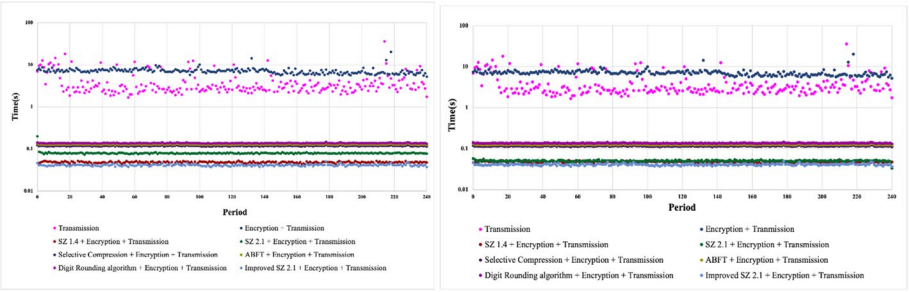
Figure 10a shows the error produced due to lossy compression in each data block during 241 periods. The data is obtained from the driver stress detection dataset. The absolute inaccuracy is shown by the vertical axis, while the horizontal axis indicates the periods. The error bound is set as 0.1. However, for all three algorithms the error remains around 0.05 well below the error bound. Figure 10b shows the data is obtained from the gas sensors for home activity monitoring dataset.

## 5.3 Impact of increase in the size of input data on SZ compression algorithm

Figure 11a and b show that the time required for compression or decompression by all three algorithms increases linearly with size. Also, the time taken for decompression is always smaller than the time required for compression. This is because compression involves more complex calculations than decompression. Although the improved SZ 2.1 compression algorithm takes a longer time than the original SZ 2.1 algorithm for compression in the case of the gas sensors for home activity monitoring dataset, the algorithm can achieve much higher compression as compared to the original version. Therefore, the time required for encrypting and transmitting the data is less for the improved SZ 2.1 compression algorithm and it can effectively reduce the total processing time required.

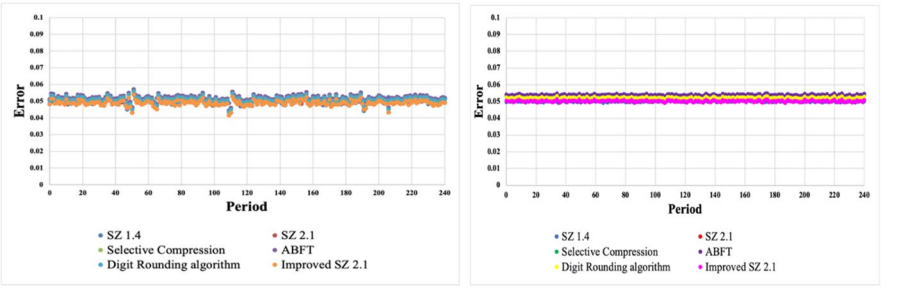
## 5.4 Impact of increase in the size of input data on CHACHA8-POLY1305, CHACHA12-POLY1305, and CHACHA20-POLY1305 algorithms

Figure 12a depicts the time required by the ChaCha12-Poly1305 algorithm for processing blocks of different sizes. The encryption and decryption time required is approximately the same for all the data sizes. Hence the points in the Figure are overlapping. Additionally, the it shows that the time complexity of both encryption and decryption is linear. The time utilized by the algorithm increases linearly as the data size increases. Figure 12b depicts the time taken by the three AEAD algorithms viz. ChaCha8-Poly1305, ChaCha12-Poly1305




a Driver Stress Detection Dataset b Gas Sensors for Home Activity Monitoring Dataset

**Fig. 9** Total Processing Time




a Driver Stress Detection Dataset b Gas Sensors for Home Activity Monitoring Dataset

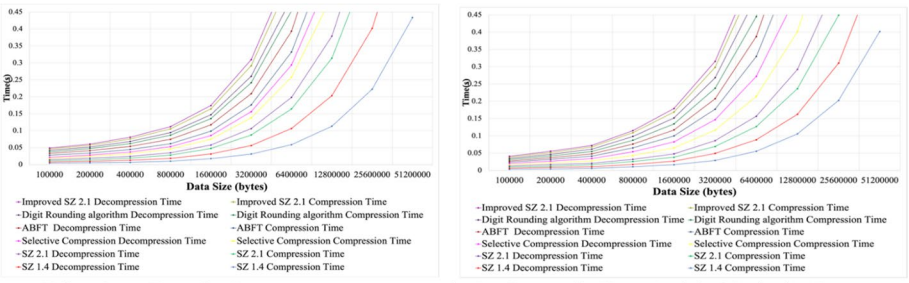
**Fig. 10** Error produced due to lossy compression

and ChaCha20-Poly1305 algorithms for different data sizes. It shows that the time required by each algorithm increases as the size of the data block increases.

Also, as the number of rounds in the ChaCha algorithm increases, so does the time required by the algorithm. Thus the ChaCha8-Poly1305 algorithm requires the least amount of time and the ChaCha20-Poly1305 requires the maximum amount of time while ChaCha12- Poly1305 requires an intermediate amount of time. However, the greater the number of rounds, the greater is the security of the algorithm. By choosing the 12 rounds variant we maintain a trade-off between security and performance.

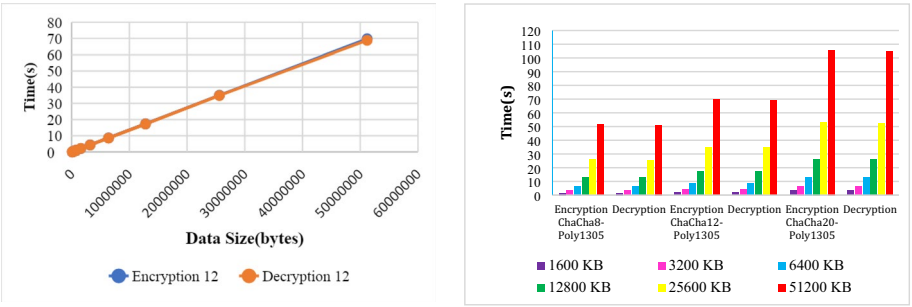
## 6 Conclusion and future work

In this paper, proposed algorithm (improved sz2.1) is compared with existing five state of art methodology. The usage of the improved SZ 2.1 (compression algorithm) in combination with the ChaCha12-Poly1305 algorithm is presented for ensuring the data security in IoT devices and it increases the energy efficiency of the edge computing architecture system. Both the ChaCha12-Poly1305 technique and the modified SZ 2.1 algorithm can be simply deployed for IoT devices on a real time solution because of their simplicity. The results of the experimental research demonstrate that this combination boosts the battery life of IoT devices while also securing data. This combination improves security while preserving about 10% of the device's energy. Additionally, the




a Driver Stress Detection Dataset b Gas Sensors for Home Activity Monitoring Dataset

**Fig. 11** Compression and Decompression Time




a ChaCha12-Poly1305 algorithm

b Three AEAD algorithms for blocks of different sizes

**Fig. 12** Encryption and Decryption Time for ChaCha12-Poly1305 algorithm.**a**. ChaCha12-Poly1305 algorithm. **b**. Three AEAD algorithms for blocks of different sizes

latency is decreased, improving system performance. The improved SZ 2.1 compression algorithm achieves such high compression because of is a lossy compression algorithm. It also reduces the encryption time and the total processing time required by 95% and 98% for both the datasets. In this paper, the impact of the increase in input data size for the ChaCha12-Poly1305 algorithm is also analyzed. The time taken by the ChaCha12-poly1305 algorithm increases linearly with size. Based on the performance of the ChaCha12-Poly1305 algorithm, ChaCha8-Poly1305 algorithm, and ChaCha20-Poly1305 algorithm it is observed that ChaCha8-Poly1305 is faster than the ChaCha12-Poly1305 algorithm, as it provides very little security margin. On the other hand, the ChaCha20-Poly1305 algorithm is very slow and computationally expensive. Hence, by choosing the ChaCha12-Poly1305 algorithm, a balance between the security-energy tradeoff is achieved.

In order to strike a balance between power efficiency and security, our study primarily emphasizes energy conservation. We opt for a moderate level of security by implementing data compression during data transmission among IoT devices, as higher security levels tend to entail greater computational demands and costs. Consequently, for future work, we aimed at elevating security, we envision the potential for reducing the complexity of encryption algorithms. Our forthcoming work will target the reduction of computational time by exploring encryption algorithms with 20 rounds or more within the ChaCha Poly1305 encryption algorithm.

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**Data availability** Availability of data as per request.

## Declarations

**Ethical approval** This article does not contain any studies on human participants or animals performed by any of the authors.

**Informed consent** Informed consent was obtained from all individual participants included in the study.

**Conflict of interest** The authors declare that they have no conflict of interest.

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# A Statistical Analysis Model of Wind Power Generation Forecasting for the Western Region of India

Sulagna M., Piyush H., Vineet S., and Pankaj R.

***Abstract*— Wind energy has witnessed an upswing, with the improvement in current technology and cost-effective electricity production but due to uncertain wind behaviour and weather trends, it is essential to forecast wind energy. The paper presents the Autoregressive Integrated Moving Average model, a statistical analysis model, to forecast future power generation values, for the Kutch region of Gujarat, India. The historical wind power generation data and weather parameters have been taken into consideration for the predictive analysis of future trends in power generation. Wind power generation is dependent on various weather factors like wind speed, wind direction, temperature, humidity, air density, etc. The historical data obtained from Central Electricity Authority (CEA), India, and weather data collected from regional weather stations have been made into use for the forecast. A summary of the results is shown using the performance metrics for model evaluation, indicating that the model can forecast wind power generation with higher accuracy.***

***Keywords*— ARIMA, Power System, Renewable Energy, Wind Power forecasting***

## I. Introduction

Depleting natural resources and increasing global pollution have wheeled the development of the Renewable Energy industry. Human evolution has been fuelled by fossil fuels which are exhaustible and finite in number. The use of these non-renewable fuels has now become a major threat to the existence of mankind. The introduction of renewable energy sources instead of coal and oil-fuelled power plants has provided an alternative to conventional energy sources. Energy is vital for the economic and infrastructural development of the country. With the increasing demand for electricity in a developing country like India, energy sources like Solar Power, Wind Energy, and Geothermal Energy sources are the highlights for the days to come.

The Indian economy and growth have been so far anchored by fossil fuels. Recently, the wind power sector has witnessed a tremendous growth rate providing a key opportunity for the expansion and its integration into the power grid. With reference to the report by the Ministry of New and Renewable Energy, Govt. of India, India produces 42.633 GW of wind power making it the four largest installed wind power capacity in the world [1]. Accounting for about 10% of India's total installed energy generation capacity, Wind energy is India's oldest developed renewable energy technology [2]. More than 800 wind monitoring stations have been installed nationwide by the Indian government through the National Institute of Wind Energy (NIWE), which has also produced wind potential maps at elevations of 50, 80, 100, and 120 metres above ground level. According to the most current study, the country has a total wind power potential of 302 GW at 100 metres and 695.50 GW at 120 metres above ground level [1].

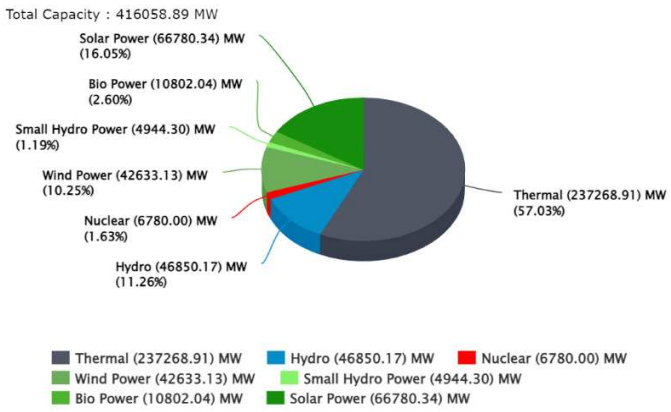


Fig. 1. Generation Category-wise Installed Capacity (as of 18/04/2023) [3]

Studies rank the state of Tamil Nadu with the highest installed capacity, which is well ahead of Gujarat which ranks second in terms of installed capacity. But in terms of potential energy generation, Gujarat ranks first with 142.56 GW (at 120 m AGL) [4].

Agricultural and industrial activities demand an extensive energy supply which the country can be with fulfil through a properly balanced energy supply through renewable energy and conventional energy sources. Thus, an precise prediction is needed to strategize, plan, and to schedule the power generation for smooth integration with the current power grid. A forecast of anticipated load requirements is essential for power system expansion, for determining generation capacity, transmission, etc. Smart management and the inclusion of renewable energy are important in today's scenario to meet the increasing demands. Wind power forecasting has been a focal point for researchers, hailing to its significance in energy balance in the grid and for proper scheduling of power generation.

Wind power forecasting methods broadly are of two types which include the physical method of analysing the physical quantity to obtain wind speed and then calculating the power thereafter, and the statistical method for establishing wind power prediction models by collecting historical data and training the model to yield future results [5].

Load forecasting is categorised into the following forms based on the forecasting horizon: Short-term (STLF), medium-

term (MTLF), and long-term load forecasting (LTLF). While the STLF technique typically spans time frame between an hour and one-week, medium-term load forecasts range from a few weeks to months and are considered a vital step in the electric power system. Long-term projections typically range from one year to 10 years in length [6] [7]. While LTLF is essential for the planning of power systems, MTLF is crucial for controlling fuel supply and maintenance [8]. STLF is important for daily operations of power systems such as energy trading in unregulated markets and unit dispatching or energy management [9].

### A. *Literature Review*

In literature, time series forecasting methods are based on the analysis of historical data to predict future data points [10]. Load forecasting can be defined as the assessment of the amount of electricity needed by the customer and the utility systems. Various methods have been developed and deployed for forecasting. Average Meteorological Forecast (AMF) models are numerical weather prediction models, used to make predictions of wind speed are produced and then utilised to calculate wind power. Spatial Correlation Models make use of spatial relationships of wind speed of different sites [11]. Statistical models include models such as Auto-Regressive (AR), Auto-Regressive Moving Average (ARMA), and Auto-Regressive Integrated Moving Average (ARIMA), to find the correlation between on-line measured power data with off-line [10].

Adrian-Nicolae Buturache et al. presented a well-tuned ANN model to accurately forecast wind energy predictions but required time and computational power to find the optimum hyperparameter combination [12] Regression Tree models such as SVR provided transparency in comparison to ANN which required fine-tuning and optimization for the best results. But these tree-based models performed best when considering a single metric [12]. Wind energy is a very reliable energy source since weather factors crucially determine energy production. So, practically single metric models are not feasibly correct. Jung et al. reviewed the physical, statistical, spatial correlation, and regional forecasting models for wind speed and wind power forecasting [13].

On the basis of historical observations, Ernesta Grigonyte et al. applied ARIMA to forecast wind speed for a short-term period, considering the Baltic region. The authors tried to establish an optimal model, but a season-specific structure could not be attained [14]. Eddie Yatiyana et al. focused on forecasting wind speed and wind direction using a week of data from Western Australia based on the ARIMA model but could not perform the prediction using a single model to integrate wind speed and wind direction whereby the scenario becomes hypothetical [15]. Ilham Tyass et al. made predictions based on he Seasonal ARIMA model for the Morocco region. They obtained a forecast error of about 16% on an hour ahead forecast [16]. Similarly, Bri-Mathias Hodge et al. [17], Jing Shi et al. [18] and Pei Du et al. [19] addressed short-term wind power forecasting using statistical models, obtaining a similar trend in results with about 10% error percentage.

### B. *Location Analysis*

Analysing the wind potential regions for energy generation in India and locating potent areas of Gujarat, this paper is focused on forecasting wind power generation in the Kutch region of Gujarat. Features like wind speed, temperature, humidity, and air density in the region favour the establishment of wind farms in this region. According to the National Renewable Energy Laboratory (NREL), the annual average wind speed concentrated in the region of the Gulf of Kutch and on the southern part of the peninsula is more than 8 m/s [20]. Also, due to the proximity of the Arabian Sea, the region has a higher air density which in turn helps in the rotation of the blades. Local air density changes with altitude, pressure, and temperature, thus directly affecting power output. Denser air exerts more force on the rotors, increasing power output.

### C. *Organisation of the paper*

The authors are focused on long-term forecasting since the output would help strategize and plan for future expansion projects. Section I introduces the topic of interest and existing publications in the field, whereas the remainder of the paper is structured as follows: – Section II establishes the methodology i.e., the ARIMA model; in Section III, the experimentation and evaluation are discussed; and Section IV concludes the work and discusses the result.

## II. PROBLEM FORMULATION

The paper implements an optimized statistical model, ARIMA in conjunction with the Nelder-Mead optimization method after a comparative analysis with BFGS and L-BFGS optimisation methods.

### A. *Conceptualisation of Dependencies*

The generation of wind power is significantly impacted by wind speed, wind direction and air density. The wind power can be determined using (1).

$$P = \frac{1}{2}\rho A V^3 \qquad (1)$$

Where,
$P$ is the power in Watts,
$\rho$ is the density of air in kg/m$^3$,
$A$ is the cross-sectional area of the wind in m$^2$,
$V$ is the velocity of the wind in m/s.

However, when calculating the wind power output, the coefficient of rotor performance is multiplied by the wind power obtained.

$$P = \frac{1}{2}\rho A V^3 C_p \qquad (2)$$

Where, $C_p$ is the rotor coefficient of performance.

The coefficient of performance depends on the particular turbine and varies non-linearly with wind speed. The power a wind turbine can produce depends on the density of the air, the area swept by the turbine blades and the wind velocity. Among these, wind speed is a prominent factor, affecting power generation.

Air density also affects wind power generation, which is a function of pressure and temperature. In a real-world scenario, the air always consists of moisture.

$$\rho_{humid} = \frac{P_d}{R_d.T} + \frac{P_v}{R_v.T} \qquad (3)$$

Where,

$\rho_{humid}$ is the density of humid air,
$P_d$ is the partial pressure of dry air,
$P_v$ is the partial pressure of water vapour,
T is the temperature (in K),
$R_d$ is the specific gas constant for dry air,
$R_v$ is the specific gas constant for water vapour.

### *B. Time Series Forecasting with ARIMA model*

Time series forecasting models differ from traditional models since historical data is used to gauge future predictions. The proposed model for the forecasting of wind power is ARIMA which is a statistical model for non-stationary time series, widely used for short-term predictions. The notion of ARIMA was first developed by George Box and Gwilym Jenkins in their work "Time Series Analysis: Forecasting and Control" released in 1970 [21]. Box and Jenkins developed the ARIMA model as an extension of the autoregressive moving average (ARMA) model [14].

ARIMA models are based on the autoregressive (AR), moving average (MA), and differencing (I) concepts. The AR component simulates the linear dependence on its current and previous values. The error term is modelled by the MA component as a linear combination of previous error terms while the I component deals with the non-stationary nature by differencing it until it becomes stationary. p is the order of the autoregressive model (number of time lags), d is the degree of differencing (the number of times the data have had previous values subtracted), and the order of the moving-average part is denoted by q.

Mathematically, Autoregressive (AR) models are formulated as:

$$\gamma_t' = C + \phi_1\gamma_{t-1}' + \phi_2\gamma_{t-2}' \dots + \phi_p\,\gamma_{t-p}' + e_t \qquad (4)$$

And Moving Average (MA) components are formulated as follows:

$$\gamma_t' = C + \psi_1\varepsilon_{t-1} + \psi_2\varepsilon_{t-2} \dots + \psi_q\,\varepsilon_{t-q} + e_t \qquad (5)$$

Where,

$\gamma_t'$ where is the differenced series (it may have been differenced more than once),
'p' is the auto-regressive component,
'q' is the moving-average component,
$e_t$ is white noise,
$\gamma_{t-1}'$, $\gamma_{t-2}'$, …, $\gamma_{t-p}'$ denote the value of the variable at previous time periods, and
$\varepsilon_{t-1}$, $\varepsilon_{t-2}$, …, $\varepsilon_{t-q}$ denote the error terms at previous time periods.

Combining both AR and MA parts, a typical ARIMA model denoted as ARIMA (p, d, q), is mathematically written as follows:

$$\gamma_t' = C + \phi_1\gamma_{t-1}' + \cdots + \phi_p\,\gamma_{t-p}' + \psi_1\varepsilon_{t-1} + \cdots + \psi_q\,\varepsilon_{t-q} + e_t \qquad (6)$$

In this work, the standard ARIMA model approach has been used for forecasting wind power generation. Based on the data records gathered, an optimised model was established using the Nelder-Mead optimisation method in conjunction with the estimation of parameters in the ARIMA model and compared with other ARIMA models with optimization methods, BFGS and LBFGS.

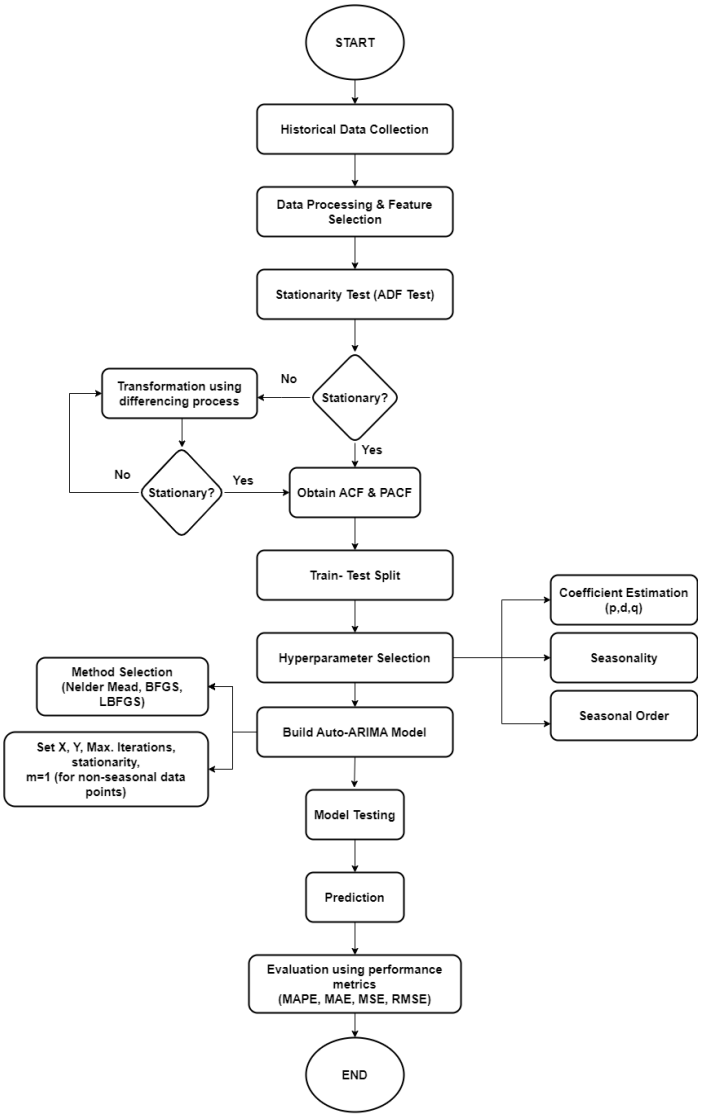


Fig. 2. ARIMA model for wind power forecasting

To begin with, the time series data's stationarity was examined by checking the run order plot and Auto-Correlation function (ACF) plots of the data points. Auto-Correlation Function (ACF) and Partial Auto-Correlation Function (PACF) plots can be used to examine patterns in time series data and the constant variance assumption. Augmented Dickey-Fuller (ADF) Test was also performed to quickly determine the stationarity. In addition, the ACF and PACF plots also aid in determining the AR and MA terms. The values for (p, d, q) were also determined. Fig. 3 and Fig. 4 show the ACF and PACF for the collected daily wind power generation data, respectively.

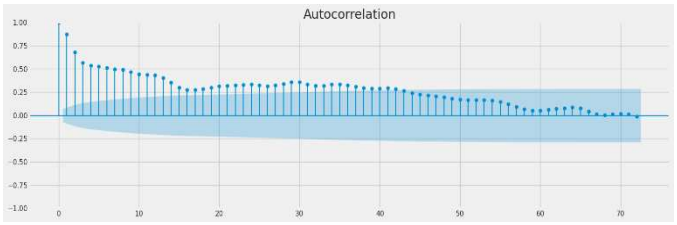


Fig. 3. Autocorrelation functions for wind energy generation data

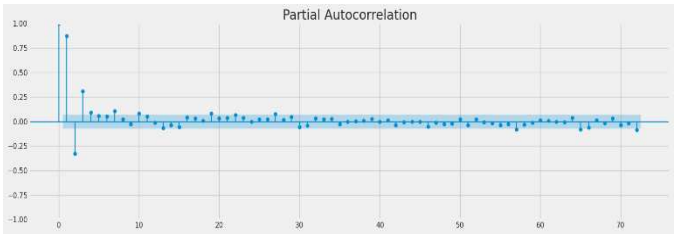


Fig. 4. Partial Autocorrelation functions for wind power generation data

Starting with a visual representation of the time series, several parameter values are then tried intuitively and changed repeatedly until a suitable fit is found. For the ARIMA model, the estimation can be done using an auto-correlation plot for the 'p' parameter, while the partial auto-correlation plot can be used for estimating the 'q' parameter. The Augmented Dickey-Fuller (ADF) test can be used to determine the stationarity of the model and estimate the value for the 'd' parameter.

### C. *Optimisation Methods*

a) Nelder-Mead method:

The NM technique (Nelder-Mead) is popularly used in tackling the unconstrained optimisation problems. It is a direct search approach that does not need the computation of gradients or Hessians.

$$\min f(x), \qquad (7)$$

Where $f: \mathbb{R}^n \to \mathbb{R}$ is called the objective function and $n$ is the dimension. [22]

The NM approach begins with a guess of the parameter values and iteratively seeks the optimal values that minimise the goal function. The approach iteratively constructs an ordered sequence of simplices and attains an optimal point of (7).

At every iteration, the vertices are ordered in line with the values of the objective function.

$$f(x_1) \leq f(x_2) \leq \cdots \leq f(x_{n+1}) \qquad (8)$$

Let $\overline{x}$ be the centroid of the $n$ best vertices, then

$$\overline{x} = \frac{1}{n}\sum_{i=1}^{n} x_i \qquad (9)$$

The NM method is easy to construct and is generally used as a foundation for more complicated optimisation methods. The best results are obtained while using the NM method for optimization.

b) Broyden Fletcher Goldfarb Shanno (BFGS) technique:

BFGS (Broyden Fletcher Goldfarb Shanno) is a quasi-Newton approach that applies the knowledge from past iterations to approximate the Hessian matrix. The BFGS technique is a gradient-based optimisation approach that iteratively updates parameter estimates in the negative gradient direction until convergence.

The optimisation problem is equation (4), where $f$ is a differential scalar function and $x$ a vector in $\mathbb{R}^n$. The equivalent solution of Newton equation provides the search direction $p_h$ at $h$:

$$B_h p_h = -\nabla f(x_h) \qquad (10)$$

Where $B_h$ is approximated to the Hessian matrix at $x_h$ and $\nabla f(x_h)$ is the gradient evaluated at $x_h$. Then, by minimising $f(x_h + \gamma p_h)$ over the scalar $\gamma > 0$, the next point $x_{h+1}$ is found using a line search in the direction $p_h$.

The BFGS approach is efficient in terms of computing and can handle a high number of parameters.

c) Limited-Memory BFGS (L-BFGS) method:

The L-BFGS (Low-Memory BFGS) method is a memory-efficient variant of the BFGS method that stores information from earlier iterations in a restricted amount of memory.

Similar to the other two mentioned algorithm, this method also aims to solve minimise the function, $f: \mathbb{R}^n \to \mathbb{R}$. L-BFGS just saves a small number of vectors that implicitly indicate the approximation, whereas BFGS saves a dense $n \times n$times approximation to the inverse Hessian ($n =$ the number of variables).

$$g_h = \nabla f(x_h), \qquad (11)$$

Where $f$ being the function to be minimised.

The L-BFGS method is very beneficial for large-scale optimization problems with many parameters.

### D. *Performance Metrics*

For evaluating the accuracy of the method, Root Mean Square Error (RMSE), Mean Square Error (MSE), Mean Absolute Error (MAE), and Mean Absolute Percentage Error (MAPE) are employed.

Mean Absolute Error (MAE):

The mean absolute error is the mean of the absolute difference between the actual and predicted numbers. It calculates the mean of the residuals in the dataset. Mathematically, MAE is as follows:

$$MAE = \frac{1}{n}\sum_{i=1}^{n} |\, y_i - \hat{y}_i \,| \qquad (12)$$

Where,

$y_i$ - the actual value,
$\hat{y}_i$ - the predicted value, and
n - the sample size

Mean Absolute Percentage Error (MAPE):

The mean absolute percentage error is defined as the difference between the actual and anticipated values divided

by the actual value. This number is assigned an absolute percentage and averaged throughout the dataset. The performance of the model improves with decreasing MAPE.

$$MAPE = \frac{1}{n}\sum_{i=1}^{n}\frac{|y_i - \hat{y}_i|}{y_i} .100\% \quad (13)$$

Mean Squared Error (MSE):

The average of the squared difference between the data set's original and expected values is the Mean Squared Error. It computes the residual variance.

$$MSE = \frac{1}{n}\sum_{i=1}^{n}(y_i - \hat{y}_i)^2 \quad (14)$$

Root Mean Squared Error (RMSE):

RMSE is determined by taking the square root of MSE. It examines the deviation from the actual value and calculates the average magnitude of the errors. RMSE value with zero implies that the model has a perfect fit.

$$RMSE = \sqrt{\frac{1}{n}\sum_{i=1}^{n}(y_i - \hat{y}_i)^2} \quad (15)$$

## III. EXPERIMENT & EVALUATION

In this research work, the authors have proposed a time-series forecasting model to forecast wind power generation using the ARIMA model. The experiments were conducted on a machine running Windows 11 with an Intel Core i5-10210U CPU, 8 GB RAM, and a 64-bit operating system. Python 3.10 was used throughout for data processing and to develop the ARIMA model.

### *A. Data Collection*

The authors have focused their research on the potential region of Gujarat, more precisely in the Kutch region (Latitude: 23.7337° N, Longitude: 69.8597° E) which according to the data ranks first on the list for wind power potential with 142.56 GW (at 120 M AGL) [4].

The historical data for wind power generation has been gathered from the Central Electricity Authority (CEA), Govt. of India [23], and weather data from the timeanddata website [24]. The data has been recorded daily for more than two years, from 1 January 2021 to 22 January 2023. Fig. 5 represents the wind power generation time series data.

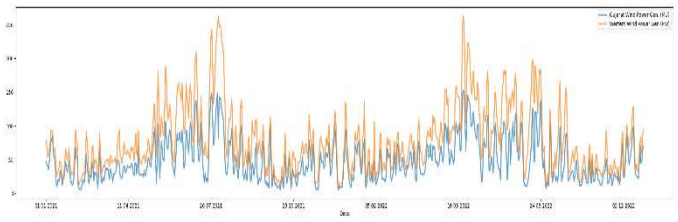

Fig. 5. Power Generation: Western Region of India vs Gujarat

### *B. Data Pre-processing*

In the data processing part, feature extraction was performed and important features for the model training are filtered out. Weather factors like wind speed, wind direction, air density, temperature, and humidity and the wind power generation records were filtered and analysed and checked for seasonality and trends. In the case of NaN and/or infinite values, they were checked and removed from the dataset.

The data collected was analysed and plotted using Python libraries like Plotly and Matplotlib to analyze the trends. It was observed that the general pattern for the wind direction was mostly in the South-West direction followed by North East. Fig. 7 represents the windrose graph for the wind direction. To analyze the correlation between different parameters, a Seaborn heatmap was generated as shown in Fig. 6.

Fig. 6. Correlation Heatmap between the different parameters

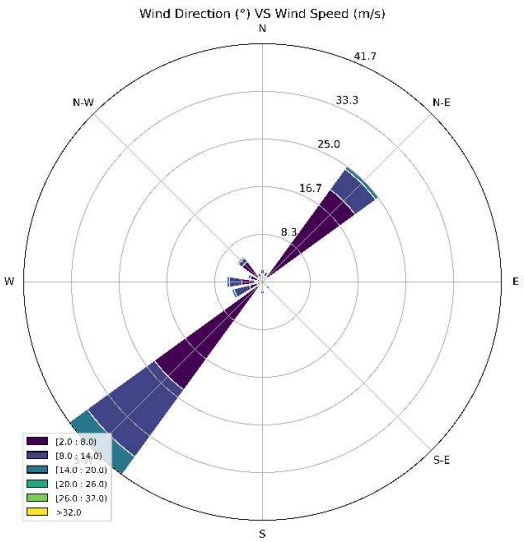


Fig. 7. Windrose plot for Wind Direction in Kutch Region, Gujarat

Boxplots were generated to understand the seasonality patterns for different parameters. The wind power generation for the Gujarat region was observed to be greater between May and August when the demand was higher during the summers, illustrated in Fig. 8.

The seasonality plot for the wind speed showed a similar pattern which depicted a strong correlation between wind power and wind speed of the region. In contrast, the air density plot revealed an opposite trend to the wind speed. Fig. 9 depicts the Annual Seasonality in the Average Wind Speed of the region in kilometres per hour (kmph), while Fig.10 shows the Annual Seasonality of the Average Air Density.

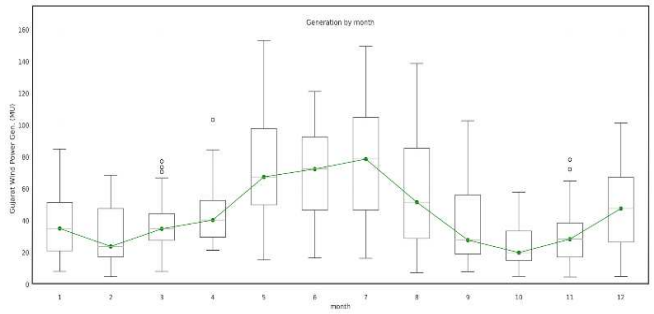


Fig. 8. Annual Seasonality Boxplot: Wind Power Generation

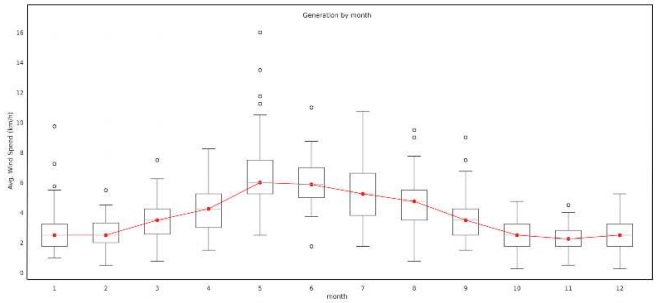


Fig. 9. Annual Seasonality Boxplot: Average Wind Speed (kmph)

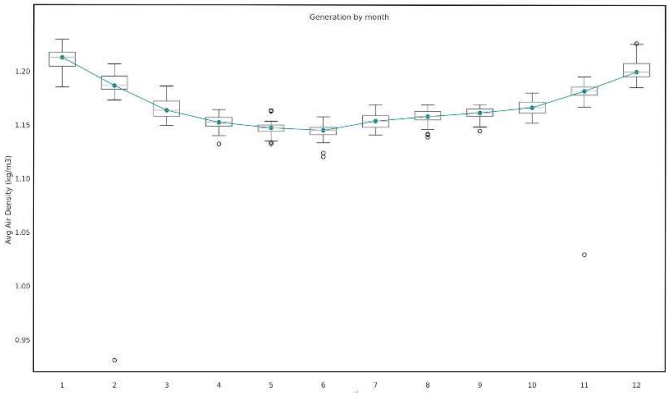


Fig. 10. Annual Seasonality Boxplot: Air Density Generation

## C. Evaluation

Four model evaluation criteria were used in this study: the mean absolute error (MAE), which indicates the size of predictive errors, the mean squared error (MSE), which calculates the square of the difference between actual and predicted values, the root mean square error (RMSE), which indicates the severity of discrepancies between actual values and forecasts, and the mean absolute percent error (MAPE), which can avoid the problem that errors cancel each other out and accurately reflect actual data.

The dataset was at first separated into 95% and 5% train and test samples, respectively. Subsequently, different train and test sizes in different ratios were used – 95:5, 96.5:3.5, 97:3, 97.5:2.5, and 98:2, to find the best scores. Auto-ARIMA was applied to select best settings for p, d, and q parameters. The best parameters were obtained at ARIMA (1,2,2) and thereafter the error calculated was optimised and hyperparameter tuning was performed for further results. Auto-ARIMA is the automated version of ARIMA which automatically searches for the best combination of parameters depending on the AIC (Akaike Information Criterion) or BIC (Bayesian Information Criterion).

## D. Results

Further computations were performed using the ARIMA (1,2,2) model. The model and its performance are assessed in this study using the performance measures MSE, MAE, MAPE, and RMSE. Optimisation algorithms like Nelder-Mead Method, BFGS and L-BFGS methods were adopted to improve performance of the method. The results obtained from model optimisation using NM method are depicted in Table II. Similarly, Table III and Table IV illustrates the results obtained using the BFGS and L-BFGS method, respectively. The authors have considered two different datasets, the Test dataset and Predict dataset, for testing to obtain the best results and verify the applicability of the model and whether it gives desired results with a different dataset. The Test data has been taken between the date range: 05/12/2022 – 26/12/2022 while the Predict Dataset range from 27/12/2022 to 22/01/2023. Table represents the values for the Test Dataset and Table V depicts the values for the Predict Dataset.

In comparison to the other works on wind power forecasting, cited in literature, ARIMA method accurately predicts the forecast for 22 days with 5.87 MAPE on Predict dataset using the NM method (training size of 97% of the main dataset is considered in this). Notably, the 11.50 MAPE was recorded in the test dataset while considering the training size of 95% of the main dataset. For the NM method, 6.24 MAE, 54.88 MSE and 7.4 RMSE were obtained on the test dataset, best performed on training size of 95%, while on predict data (training size: 97%), 3.82 MAE, 20.71 MSE and 4.55 RMSE were obtained, respectively. For the BFGS method, the best results were obtained on a training size of 96.5% of the main dataset on ARIMA (4,2,5) and for the LBFGS method, the best results were obtained on a training size of 97.5% on ARIMA (5,2,0).

Fig. 11 shows the plot between the actual power generation value versus the forecasted values, all values are in Mega Units (MU). It is evident that the model can fairly accurately trace the actual value. Based on the performance solely and reducing hardware limitations, ARIMA can produce benchmark results and is still a popular model for time series forecasting problems. Data quality and availability still can be considered a major drawback for working on projects like these since time series forecasting is crucially based on historical data.

Table I: Test Dataset Results using the NM method

| Date | Actual Generation (MU) | Predicted (MU) | Absolute Error | Absolute Error Percentage | Squared Error | Root of Squared Error | Accuracy |
|---|---|---|---|---|---|---|---|
| 05-12-2022 | 78.78 | 78.198046 | 0.581954 | 0.738707794 | 0.338670458 | 0.581954 | 99.26129221 |
| 06-12-2022 | 101.93 | 103.847281 | 1.917281 | 1.880978122 | 3.675966433 | 1.917281 | 98.11902188 |
| 07-12-2022 | 89.27 | 91.487016 | 2.217016 | 2.483495015 | 4.915159944 | 2.217016 | 97.51650498 |
| 08-12-2022 | 68.34 | 61.919892 | 6.420108 | 9.394363477 | 41.21778673 | 6.420108 | 90.60563652 |
| 09-12-2022 | 73.85 | 53.134296 | 20.715704 | 28.05105484 | 429.1403922 | 20.715704 | 71.94894516 |
| 10-12-2022 | 78.5 | 64.813535 | 13.686465 | 17.43498726 | 187.3193242 | 13.686465 | 82.56501274 |
| 11-12-2022 | 88.76 | 74.448076 | 14.311924 | 16.12429473 | 204.8311686 | 14.311924 | 83.87570527 |
| 12-12-2022 | 96.42 | 87.796981 | 8.623019 | 8.943185024 | 74.35645667 | 8.623019 | 91.05681498 |
| 13-12-2022 | 125.64 | 112.874385 | 12.765615 | 10.16047039 | 162.9609263 | 12.765615 | 89.83952961 |
| 14-12-2022 | 128.56 | 118.706496 | 9.853504 | 7.664517735 | 97.09154108 | 9.853504 | 92.33548227 |
| 15-12-2022 | 75.9 | 76.940114 | 1.040114 | 1.370374177 | 1.081837133 | 1.040114 | 98.62962582 |
| 16-12-2022 | 41.61 | 42.018831 | 0.408831 | 0.982530642 | 0.167142787 | 0.408831 | 99.01746936 |
| 17-12-2022 | 36.11 | 32.961906 | 3.148094 | 8.718067017 | 9.910495833 | 3.148094 | 91.28193298 |
| 18-12-2022 | 42.81 | 31.090917 | 11.719083 | 27.3746391 | 137.3369064 | 11.719083 | 72.6253609 |
| 19-12-2022 | 34.32 | 30.118811 | 4.201189 | 12.24122669 | 17.64998901 | 4.201189 | 87.75877331 |
| 20-12-2022 | 30.85 | 27.169525 | 3.680475 | 11.9302269 | 13.54589623 | 3.680475 | 88.0697731 |
| 21-12-2022 | 54.67 | 53.524987 | 1.145013 | 2.094408268 | 1.31105477 | 1.145013 | 97.90559173 |
| 22-12-2022 | 76.38 | 85.966734 | 9.586734 | 12.55136685 | 91.90546879 | 9.586734 | 87.44863315 |
| 23-12-2022 | 82.9 | 55.358146 | 27.541854 | 33.22298432 | 758.5537218 | 27.541854 | 66.77701568 |
| 24-12-2022 | 58.96 | 57.643002 | 1.316998 | 2.233714383 | 1.734483732 | 1.316998 | 97.76628562 |
| 25-12-2022 | 85.37 | 76.516726 | 8.853274 | 10.37047441 | 78.38046052 | 8.853274 | 89.62952559 |
| 26-12-2022 | 93.09 | 83.433223 | 9.656777 | 10.37359222 | 93.25334203 | 9.656777 | 89.62640778 |

Table II: Comparison of Results obtained using NM optimization algorithm

| Train Size | Test Size | Model | Test Dataset | | | | Predict Dataset | | | |
|---|---|---|---|---|---|---|---|---|---|---|
| | | | MAPE | MAE | MSE | RMSE | MAPE | MAE | MSE | RMSE |
| **95.0%** | **5.0%** | (1,2,2) | 11.507257 | 6.241513 | 54.888966 | 7.408709 | 9.676041 | 6.030805 | 53.226633 | 7.295658 |
| **96.5%** | **3.5%** | (1,2,2) | 12.531718 | 7.353864 | 102.438129 | 10.121172 | 7.019101 | 4.421529 | 27.950861 | 5.286857 |
| **97.0%** | **3.0%** | (1,2,2) | 13.167187 | 7.881410 | 109.576279 | 10.467869 | 5.872073 | 3.821285 | 20.717587 | 4.551658 |
| **97.5%** | **2.5%** | (1,2,2) | 15.680275 | 9.187369 | 138.810791 | 11.781799 | 6.467925 | 4.325951 | 31.246006 | 5.589813 |
| **98.0%** | **2.0%** | (5,2,3) | 31.921045 | 29.494326 | 1052.903111 | 32.448469 | 75.163419 | 47.429191 | 2599.856705 | 50.988790 |

Table III: Comparison of Results obtained using BFGS optimization algorithm

| Train Size | Test Size | Model | Test Dataset | | | | Predict Dataset | | | |
|---|---|---|---|---|---|---|---|---|---|---|
| | | | MAPE | MAE | MSE | RMSE | MAPE | MAE | MSE | RMSE |
| **95.0%** | **5.0%** | (3,2,4) | 12.551753 | 6.840859 | 62.8912372 | 7.9303996 | 11.86181 | 6.842874 | 62.46632251 | 7.903564 |
| **96.5%** | **3.5%** | (4,2,5) | 10.975716 | 6.959213 | 69.349459 | 8.327632 | 7.893842 | 4.789487 | 30.217835 | 5.497075 |
| **97.0%** | **3.0%** | (5,2,3) | 16.505746 | 9.558660 | 156.825551 | 12.523001 | 8.463977 | 5.896083 | 52.880493 | 7.271897 |
| **97.5%** | **2.5%** | (3,2,4) | 20.589382 | 20.589382 | 182.883915 | 13.523458 | 9.709613 | 6.481890 | 59.573613 | 7.718394 |
| **98.0%** | **2.0%** | (2,2,2) | 19.851561 | 14.127983 | 264.860741 | 16.274543 | 33.084559 | 19.023742 | 396.311463 | 19.907573 |

Table IV: Comparison of Results obtained using L-BFGS optimization algorithm

| Train Size | Test Size | Model | Test Dataset | | | | Predict Dataset | | | |
|---|---|---|---|---|---|---|---|---|---|---|
| | | | MAPE | MAE | MSE | RMSE | MAPE | MAE | MSE | RMSE |
| **95.0%** | **5.0%** | (5,2,0) | 19.211025 | 12.598856 | 213.697871 | 14.618409 | 21.636511 | 13.420372 | 215.640635 | 14.684708 |
| **96.5%** | **3.5%** | (5,2,0) | 20.953278 | 17.151410 | 426.543925 | 20.652940 | 33.994366 | 21.852226 | 606.781865 | 24.632943 |
| **97.0%** | **3.0%** | (5,2,0) | 26.580088 | 12.823718 | 241.466078 | 15.539179 | 13.859349 | 9.178889 | 114.048131 | 10.679332 |
| **97.5%** | **2.5%** | (5,2,0) | 18.227243 | 10.476437 | 163.882306 | 12.801652 | 7.405681 | 4.983938 | 39.750960 | 6.304836 |
| **98.0%** | **2.0%** | (5,2,0) | 32.549829 | 30.541192 | 1128.614857 | 33.594864 | 78.381494 | 49.668267 | 2849.454744 | 53.380284 |

Table V: Predict Dataset Results using the NM method

| Date | Actual Generation (MU) | Predicted (MU) | Absolute Error | Absolute Error Percentage | Squared Error | Root of Squared Error | Accuracy |
|---|---|---|---|---|---|---|---|
| 27-12-2022 | 78.89 | 80.410519 | 1.520519 | 1.927391304 | 2.311978029 | 1.520519 | 98.07261 |
| 28-12-2022 | 50.58 | 53.875499 | 3.295499 | 6.515419138 | 10.86031366 | 3.295499 | 93.48458 |
| 29-12-2022 | 19.9 | 20.798685 | 0.898685 | 4.516005025 | 0.807634729 | 0.898685 | 95.48399 |
| 30-12-2022 | 66.69 | 74.077251 | 7.387251 | 11.07699955 | 54.57147734 | 7.387251 | 88.923 |
| 31-12-2022 | 98.17 | 105.457173 | 7.287173 | 7.423014159 | 53.10289033 | 7.287173 | 92.57699 |
| 01-01-2023 | 53.27 | 54.959916 | 1.689916 | 3.172359677 | 2.855816087 | 1.689916 | 96.82764 |
| 02-01-2023 | 32.28 | 28.057056 | 4.222944 | 13.08223048 | 17.83325603 | 4.222944 | 86.91777 |
| 03-01-2023 | 100.99 | 101.891266 | 0.901266 | 0.892430934 | 0.812280403 | 0.901266 | 99.10757 |
| 04-01-2023 | 159.44 | 157.544743 | 1.895257 | 1.188696061 | 3.591999096 | 1.895257 | 98.8113 |
| 05-01-2023 | 157.7 | 152.729402 | 4.970598 | 3.151932784 | 24.70684448 | 4.970598 | 96.84807 |
| 06-01-2023 | 117.25 | 109.599456 | 7.650544 | 6.524984222 | 58.5308235 | 7.650544 | 93.47502 |
| 07-01-2023 | 78.87 | 73.789484 | 5.080516 | 6.441633067 | 25.81164283 | 5.080516 | 93.55837 |
| 08-01-2023 | 43.16 | 40.037467 | 3.122533 | 7.234784523 | 9.750212336 | 3.122533 | 92.76522 |
| 09-01-2023 | 33.16 | 29.578985 | 3.581015 | 10.79920084 | 12.82366843 | 3.581015 | 89.2008 |
| 10-01-2023 | 40.12 | 37.16056 | 2.95944 | 7.376470588 | 8.758285114 | 2.95944 | 92.62353 |
| 11-01-2023 | 59.54 | 63.01681 | 3.47681 | 5.839452469 | 12.08820778 | 3.47681 | 94.16055 |
| 12-01-2023 | 99.09 | 98.748089 | 0.341911 | 0.345050964 | 0.116903132 | 0.341911 | 99.65495 |
| 13-01-2023 | 51.42 | 44.52908 | 6.89092 | 13.40124465 | 47.48477845 | 6.89092 | 86.59876 |
| 14-01-2023 | 72.35 | 75.796122 | 3.446122 | 4.763126469 | 11.87575684 | 3.446122 | 95.23687 |
| 15-01-2023 | 76.56 | 81.497256 | 4.937256 | 6.448871473 | 24.37649681 | 4.937256 | 93.55113 |
| 16-01-2023 | 48.44 | 47.460251 | 0.979749 | 2.02260322 | 0.959908103 | 0.979749 | 97.9774 |
| 17-01-2023 | 79.33 | 79.415832 | 0.085832 | 0.108196143 | 0.007367132 | 0.085832 | 99.8918 |
| 18-01-2023 | 76.4 | 71.439298 | 4.960702 | 6.493065445 | 24.60856433 | 4.960702 | 93.50693 |
| 19-01-2023 | 72.88 | 62.487742 | 10.392258 | 14.25940999 | 107.9990263 | 10.392258 | 85.74059 |
| 20-01-2023 | 83.28 | 79.727137 | 3.552863 | 4.266165946 | 12.6228355 | 3.552863 | 95.73383 |
| 21-01-2023 | 87.32 | 90.48525 | 3.16525 | 3.624885479 | 10.01880756 | 3.16525 | 96.37511 |
| 22-01-2023 | 79.32 | 83.801858 | 4.481858 | 5.650350479 | 20.08705113 | 4.481858 | 94.34965 |

Fig. 11. Wind Power Generation: Actual Values vs Predicted Values (in MU)

## IV. CONCLUSION

The authors in this study proposed a statistical model, ARIMA for wind power forecasting in Gujarat, depending on previous past load data and weather data. Modern energy systems require forecasting to operate loads properly, minimize risks and improve system performance. Statistical models, effectively ARIMA, have proved to be efficient prediction methods. The authors of this paper found the challenges with current forecasting models and poorly tuned machine learning models in the application. Forecasting wind power generation is complexly dependent on natural factors like weather factors and technical factors, like the height of windmills, wind turbines, etc. Given the erratic pattern of weather and an added level of uncertainty, the authors attempted to propose a plausible approach for forecasting over the long term that supports both strategic and tactical decisions. With fined tuned parameters, the authors were able to produce accurate results in comparison to previous historic data. With the proposed method, it is possible to precisely forecast the generation for each day.

## V. ACKNOWLEDGEMENT

The authors want to claim that there exists no known opposing interest or close ties which might affect the outcomes of the research presented in this study.

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## VII. BIOGRAPHIES

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ORIGINAL CONTRIBUTION

# An Experimental and Computational Comparison Between the Eco-Friendly PLA-Based 3D Printed Component and the GFRP Component

**Ravi Butola[1] · Ajay Singh Singholi[1] · S. L. Bhandarkar[2] · Jitendra Kumar[3] · Ishant Khurana[4] · Naman Choudhary[4]**

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**Abstract** 3D printing gives us a glimpse into the future of additive manufacturing that might possibly revolutionize the industry. It is a highly efficient manufacturing method as no waste formation occurs due to its "additive" nature. In this paper, we utilize eco-friendly polylactic acid (PLA) as a raw material in the fused deposition modelling approach of 3D printing. The component made through this approach is then tested against a glass fibre reinforced plastic (GFRP) component to test its utility and potentially offer PLA as a sustainable alternative. The comparison was conducted based on dynamic mechanical analysis to contrast their vibration damping properties and ultimate tensile strength using the universal testing machine. Computational simulation through ANSYS was explored to predict the ultimate tensile strength of the two components to eliminate the requirement of experimental tests for further studies. The results showed that the PLA-based component exhibited much higher vibration damping properties but lesser ultimate tensile strength when compared to the GFRP component.

**Keywords** Fused deposition modelling (FDM) · DMA · GFRP · 3D printing · Polylactic acid (PLA)

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## Introduction

3D printing is coming to be known as the manufacturing technology for the future. Currently, many steps are taken to adopt this technology in a diverse set of industries. The major reason for this excitement and proactivity towards adopting 3D manufacturing comes from the concept of "Economies of Scale". It is expected that, just like the computer in the past as the technology becomes widespread, significant innovations will come and lead to cheaper and more efficient methods of 3D manufacturing, and ultimately, it will dominate the manufacturing industry. So, since so many hopes and dreams have been pinned on this technology, it becomes necessary to conduct thorough research on 3D printing and find solutions where the product from this technology can be used in the industry. Hence, we see research focusing on utilization of 3D printing in various industries such as concrete 3D printing in construction by Manikandan et al. [1].

Looking at the future, we understand that sustainability will dominate our lives through biofuels [2] or green manufacturing. Bhardwaj et al. [3] conducted research on 3D printing using biomass–fungi composite material. Such sustainable aspects need to be included in research as we move towards a sustainable future. The future of manufacturing will be dominated by innovation towards cost elimination and environmentally friendly technologies. 3D printing technique utilized with the right raw material can offer environmentally friendly solutions and cost cutting for various industries. 3D printing has the added benefit of fabricating specimens without any wastage irrespective of its geometry [4, 5].

Glass fibre-reinforced polymeric (GFRP) composites find utility in a variety of industries including marine industry and piping industries. The elevated price of polymers has

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restricted their utility for commercial applications. Plastics constitute a significant ecological issue, due to their extended lifetime. Printed circuit boards are typically created from GFRP and are non-biodegradable [6, 7].

Polylactic acid (PLA) is a biodegradable polymer which is the need of the hour, in sustainable production of components through 3D printing [8]. PLA being a bio-based polymer is seen as desirable raw material for use in industry [9]. Recently, various types of polymer and eco-friendly materials are used in 3D printing [10–13].

In the current study, dynamic mechanical analysis and ultimate tensile strength are tested for component produced by fused deposition modelling (FDM) 3D printing and GFRP. The storage modulus, loss modulus, tan δ, and tensile strength of the two are compared to find the utility of PLA-based 3D printing which can present an environmentally friendly production method for the future. ANSYS simulation is also conducted to predict tensile strength, and results are validated from experimental data.

## Experimentation

### Dynamic Mechanical Analysis

Dynamic mechanical analysis, otherwise known as DMA, is a process in which minor deformation is sought in a cyclic manner which helps to study response to stress, temperature, frequency, and other values.

In DMA, a loss modulus and a storage modulus are evaluated from the response derived from sine wave subjected on to solid. An improved characterization of the solid is facilitated by these different moduli because it enables us to study the ability of the solid to store and lose energy, and damping is calculated using the ratio of the two.

$$\text{Tan}\,\delta = \frac{\text{Loss Modulus}}{\text{Storage Modulus}}$$

Tan δ is directly related to the damping. The more the value of tan δ, the more the damping.

### Universal Testing Machine (UTM)

Universal testing machine (UTM) is a materials testing apparatus utilized to examine the tensile and compressive strength of materials [14, 15]. The experimentation was completed on Instron 5895 as per the ASTM D3039 standard [16]. The tensile test was done by injecting the sample between the grips of the machine. The grips of UTM were stiffened & the tension load was applied at a fixed suggested strain rate of 0.01 mm/min.

### Sample Preparation

*GFRP*

DMA samples of GFRP were made of 30 × 10 mm dimension. Woven glass fibre sheets of 600 GSM were taken. SAP—ordinarily a 2-section thermoset polyester—is blended with its hardener and connected to the surface. Sheets of fiberglass tangling are laid into the shape, and after that, more gum blend is included utilizing a brush. Hand weight, vacuum, or rollers are utilized to make certain the pitch immerses and completely wets all layers. Process is done rapidly, before SAP begins to fix, except in case high temperature pitches are utilized which won't fix without prior warming [17]. Curing in air for 24 h, solidified sheets were achieved and were sliced to the essential size of 30 × 10 mm.

Hand layup process was used to make samples for testing of GFRP in the UTM as shown in Fig. 1b. A release agent, for the most part in either wax or fluid structure, is connected to the picked form to enable completed item to be neatly expelled from the shape. Resin—typically a 2-section thermoset polyester, vinyl or epoxy—is blended with its hardener and connected to the surface. Sheets of fiberglass tangling are laid into the form, and after that, more gum blend is included utilizing a brush or roller. The material must adjust to the shape, and air must not be caught between the fiberglass and the form. Hand weight, vacuum, or rollers are utilized to make sure the tar soaks and completely wets all layers, and that any air pockets are expelled. The material is relieved for 40–48 h. The tensile test was completed unidirectional. Test size was 165 mm with a width of 19 mm, and a holding length of 32 mm is given on each side [18]. This ASTM standard example was tried in the UTM.

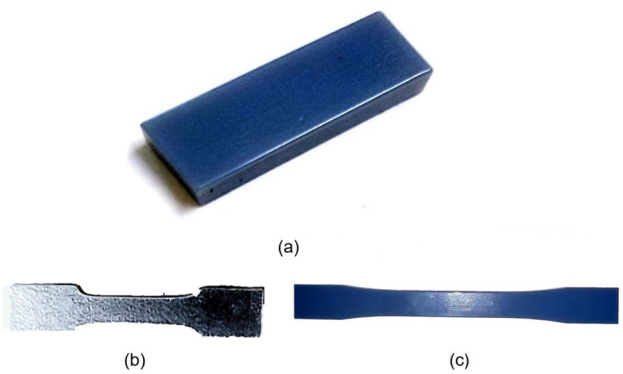


**Fig. 1** **a** PLA sample for DMA **b** GFRP sample for UTM **c** PLA sample for UTM

*PLA (3D Printed)*

In an ordinary FDM framework, the expulsion spout traverses over the stage evenly, "drawing" a cross-segment of the part onto the stage. This slender layer of plastic cools and solidifies. When one layer is completed, the base goes down by approximately 1/16th of an inch for the subsequent layer of plastic.

A 3D model of the test sample for DMA and UTM is prepared, utilizing SolidWorks software and kept as a stereolithography (.stl) file. The tool path generation, parameter combinations, support generation, and contour curves writing are completed, and a CMB (Chromeleon Backup Archive) file is generated which can then be printed. The sample is produced from the machine setup as shown in Fig. 2. The built sample is extracted from the machine, and the support material is detached and we obtain the printing of ASTM standard samples by the FDM printer. The samples obtained are shown in Fig. 1a and c.

## Results and Discussion

### Damping Behaviour

The height of the tan δ delta peak and the area under the tan δ and temperature curve tell us about how well the material will dissipate energy. As we apply load to the samples, some of the applied load is dissipated into the atmosphere and the remaining part is stored by the material. Tan δ peak, therefore, tells us the vibrational damping capacity of the material. For good energy dissipation, a high tan δ peak is desirable which in turn tells us about how well a material can absorb impact.

Figure 3 compiles the results of the tan δ versus temperature curve obtained. As concluded from the graphs of tan δ vs temperature for PLA and GFRP, the area under the tan δ curve is more for PLA than its GFRP counterpart. Hence, we conclude that the vibrational damping properties of PLA are better than GFRP, and therefore, it can absorb more of an impact as it dissipates the energy into the atmosphere.

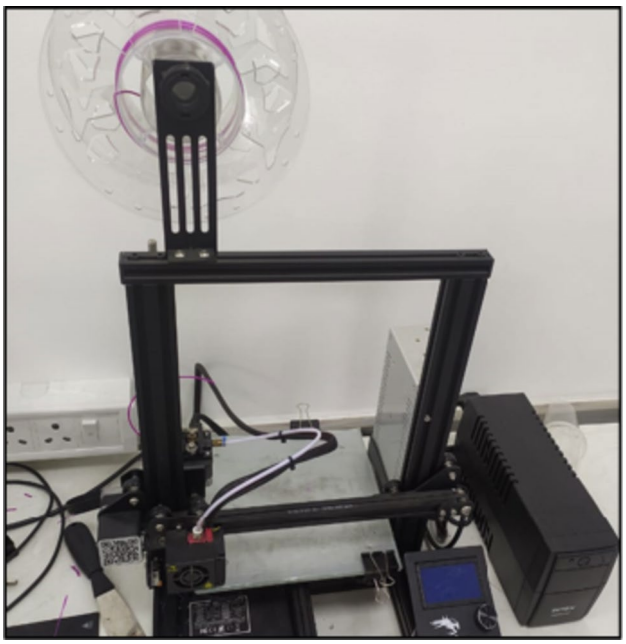

**Fig. 2** FDM 3D Printing Frame

### Ultimate Tensile Strength

An ANSYS simulation was conducted to predict the tensile strength of PLA and GFRP sample. From the simulation, the maximum tensile strength of PLA material came out to 56 MPa, and for GFRP material it was 88.4 MPa. Maximum tensile strength of PLA was 40 MPa and of GFRP material it was 96 on UTM. Simulation and experimentation results both suggest that GFRP sample has higher ultimate tensile strength. These results are shown in Fig. 4, and as these were close to the values achieved from experimentation on UTM machine, our simulation is verified[19, 20].

## Conclusions

This work was concerned with the DMA and tensile testing of GFRP and PLA. It was found that damping properties of PLA were better than GFRP, but on the other hand, tensile strength of GFRP was better than that of PLA. Hence, depending upon the application a trade-off between PLA and GFRP can be done. If strength is required in the application, then GFRP can be used, but if vibration damping is required, PLA can be preferred. Also, 3D printing technology is still in its early phase; hence, a lot of research is necessary about various techniques and the properties of 3D-printed parts in comparison with materials of similar properties like GFRP. No doubt 3D printing is costly in present, but in future 3D printing will undergo mass production which will lead to substantial reduction in price of desired product.

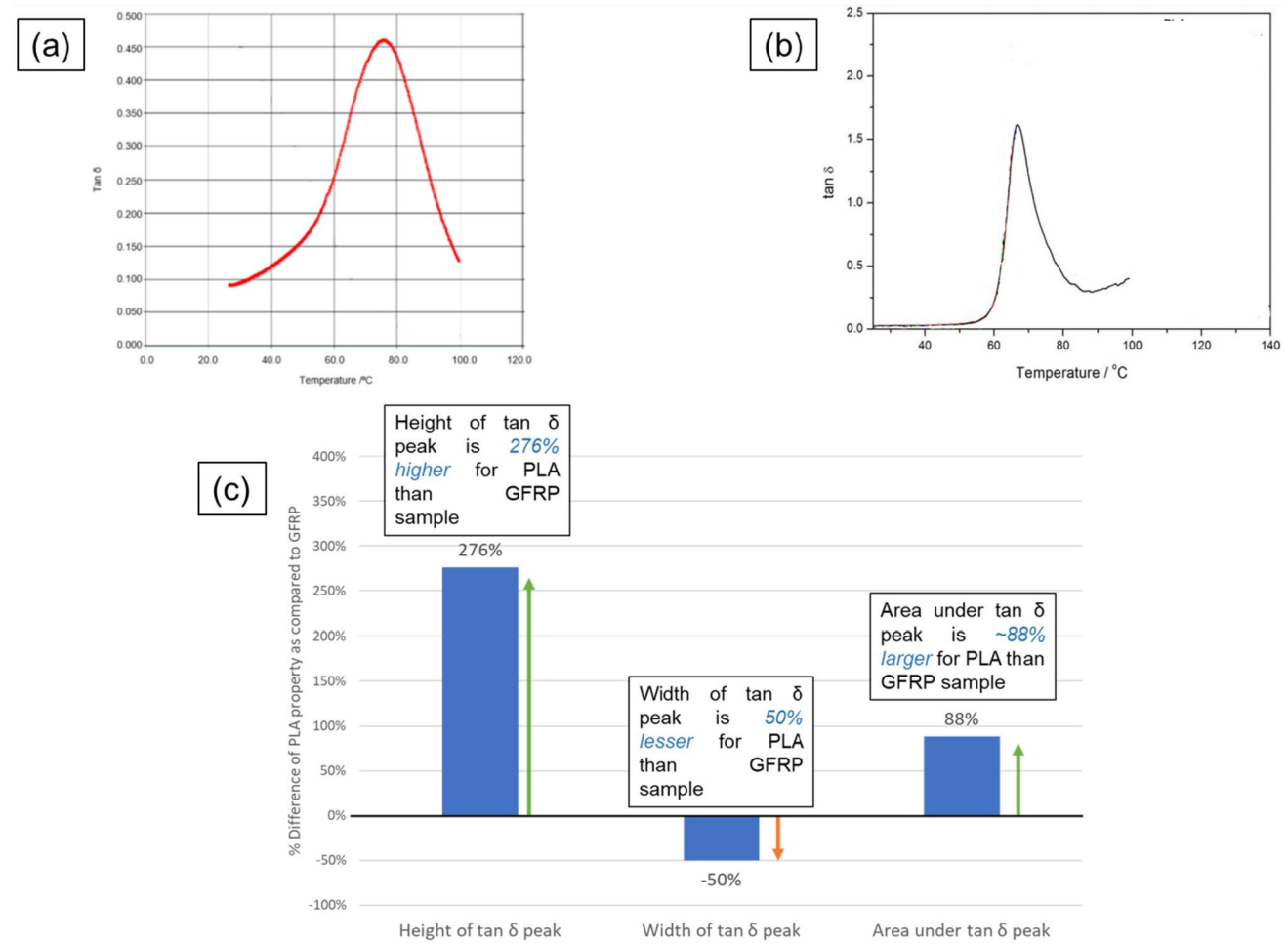


**Fig. 3** Tan δ vs temperature curve for **a** GFRP **b** PLA sample and **c** a comparison of PLA and GFRP results

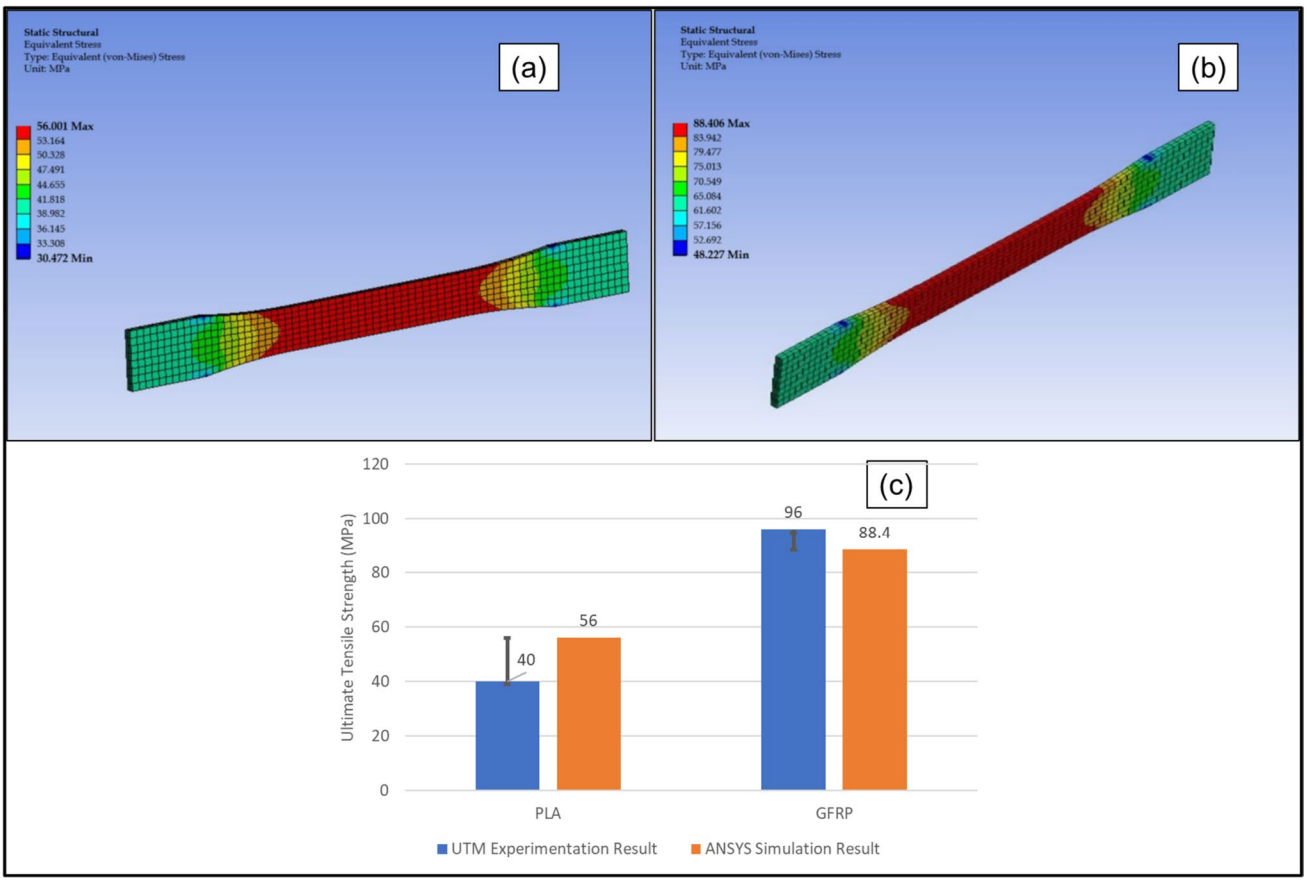


**Fig. 4** ANSYS Simulation for ultimate tensile strength **a** PLA sample **b** GFRP sample and **c** A comparison between simulation and UTM experimentation results

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**Declarations**

**Conflict of interest** On behalf of all authors, the corresponding author states that there is no conflict of interest.

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ORIGINAL PAPER

# An improved ANFIS model predictive current control approach for minimizing torque and current ripples in PMSM-driven electric vehicle

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**Abstract**
Electric Vehicles (EVs) are anticipated to dominate passenger car transportation, playing a pivotal role in advancing sustainable mobility. However, with the increasing enthusiasm for EVs, impediments endure within the realm of power transmission. This is especially evident in addressing challenges related to minimizing torque ripple and implementing advanced control techniques in traction for high-performance and efficient operation of EVs. Numerous control algorithms for motor drives have been developed in the recent past but face challenges in attaining effective control under varying drive cycles of EVs. To tackle these challenges, motor drive control algorithms integrate various control techniques, including field orientation control, model predictive control, intelligent control, etc. This paper proposes an innovative online-tuned MPCC algorithm based on the adaptive neuro-fuzzy inference system (ANFIS). The traditional proportional–integral (PI) controller is replaced with an adapted ANFIS algorithm, and the tuning of ANFIS parameters is achieved by leveraging the error between the reference and adjustable models through a hybrid training algorithm. The proposed novel control technique improves the dynamic speed response of permanent magnet synchronous motor drives EVs. This improvement is realized by replacing the PI-HCC controller with an ANFIS controller coupled with MPCC. A laboratory prototype of the proposed control technique for EVs has been developed, and a comparative analysis of ANFIS-MPCC techniques with other known control techniques has been presented. This paper also demonstrates the importance of choosing optimal motor control techniques for torque ripple minimization and improving the overall performance of EVs.

**Keywords** Electric vehicle (EV) · Permanent magnet synchronous motors (PMSM) · Adaptive neuro-fuzzy inference systems (ANFIS) · Model predictive current control (MPCC) · Field-oriented control (FOC)

## 1 Introduction

The PMSMs are now commonly used motors in electric cars due to their high torque-to-current and power-to-weight ratios, resulting in reduced physical size. PMSMs are light in weight, robust and require minimal maintenance with better dynamic performance due to the presence of a permanent magnet rotor [1]. These motors have a wide range of applications, including EVs, medical applications, aeronautics, robotics, rail transport, energy conversion systems, etc. [2]. However, it is crucial to recognize the significant challenges associated with controlling these motors due to their nonlinear and multivariable complex mathematical models. The presence of uncertainties in model parameters, such as the coefficient of friction, further complicates its control mechanism by introducing inherent uncertainties within the system [3].

The motor used for EV application may encounter various limitations, encompassing electrical, mechanical, magnetic, thermal, residual and environmental constraints [4]. In the quest for optimal performance, superior control, flexible operation, fast transient response and the mitigation of uncertainty-related challenges, several control methods have been developed in recent years. The exploration of control strategies for drives powered by power electronics converters represents a diverse field of applications.

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The controllable parameters of a motor include speed, position, torque, power and other relevant factors. Several well-established decoupled control techniques, such as FOC, sliding mode control, direct power control (DPC), direct torque control (DTC), active disturbance rejection control, back-stepping control, input–output linearization control, neuro-fuzzy control and iterative learning control, have been extensively reported [5–7] for high-performance drives.

Recent advancements in high-performance electric drives using PMSM have given rise to advanced control approaches. The contemporary integration of "predictive control" in power converters powering electrical drives aims to elevate the efficiency of motor drive and control systems. Significantly, this control methodology has been gainfully utilized to tackle complex multivariate constrained control challenges in motor drives [8, 9].

The evolution of digital signal processors (DSPs) has facilitated the utilization of predictive control methodologies for motion control. Recently, predictive control has surfaced as a resilient controller suitable for a variety of systems, such as power electronic converters, motor drives and other applications. The fundamental idea behind predictive control involves utilizing the system model to predict the future behavior of control variables and then optimizing actions according to specified criteria [10]. Predictive control (PC) schemes can be classified into five categories: MPC, Deadbeat PC, trajectory-based PC, hysteresis-based PC and alternative techniques with diverse optimal decision-making criteria [11, 12].

The Deadbeat PC method employs the system model to determine the control variable that eliminates the error between the actual value of control variables and reference value. While it achieves excellent dynamic response, its effectiveness declines in the presence of variations and disturbances. Additionally, addressing system nonlinearities and constraints present challenges in implementation [13]. PC strategies centered on hysteresis and trajectory do not incorporate a modulation block and explicitly introduce switching states to the converter.

MPC is acknowledged as a straightforward and efficient control methodology for power converters and electric motor drives, and MPC has advantages in uncomplicated implementation in multivariate systems, acknowledgment of nonlinearities/constraints and commendable dynamics. MPC utilizes a mathematical model to forecast system behavior and minimizes a predefined cost function to attain the necessary control objectives [14]. MPC strategies can be classified into finite control set model predictive control (FCS-MPC) and continuous control set MPC (CCS-MPC). The CCS-MPC excels in seamlessly integrating nonlinearities/constraints and maintaining a consistent switching frequency. However, executing the entire control system in real time using a basic hardware platform is difficult.

It is important to understand how changes in parameters and outside disturbances affect FCS-MPC in complex driving environments. When parameters change or outside factors interfere, it can disturb the control system, making it less effective. For example, change in resistance and inductance can effect the control algorithms. To deal with these challenges, strong control methods, techniques that can adapt and find ways to spot and fix problems early, must be used [15]. Ultimately, making sure the control system works well in tough situations is a big deal, and it takes smart planning and design.

FCS-MPC reduces computational optimization time by utilizing a restricted number of switching states, rendering it easily implementable with straightforward hardware. FCS-MPC provides superior performance, rapid response and the capacity to manage numerous variables and constraints, thereby optimizing system behavior [16].

Despite its benefits, FCS-MPC faces constraints that impede its adoption in drive system [17]. The utilization of a solitary voltage vector (VV) within a single control period results in a conspicuous steady-state ripple. While elevating the sampling frequency enhances steady-state performance, it imposes a substantial computational load [18].

Hence, enhancing the steady-state performance without increasing the sampling frequency of the FCS-MPC algorithm is crucial [19]. This concern has been addressed in the proposed novel adaptive neuro-fuzzy inference system-based model predictive current control (ANFIS-MPCC) strategy. The proposed approach utilizes the motor as the reference model, employing the current model in the rotor reference frame as an adaptive model. This strategy replaces the conventional PI adaptation mechanism with an ANFIS-based alternative, as depicted in Fig. 1. The inputs for adjusting the adaptive model include the estimated direct and quadrature axes currents ($i_d$, $i_q$) and the motor's electrical angular velocity ($\omega_r$). The error between the quadrature axes currents ($i_q$) from both models is employed for tuning ANFIS parameters. The proposed method contributes to the reduction of torque ripple during steady-state operation through

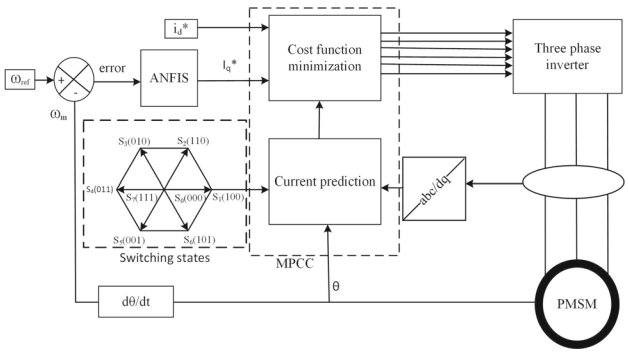


**Fig. 1** Proposed ANFIS-MPCC PMSM drive's block diagram

precise and seamless current regulation. Consequently, this enhances motor efficiency and alleviates mechanical strain on the PMSM drive mechanism. Furthermore, ANFIS hysteresis current control generally presents a simpler and more direct control approach compared to the multivector scheme for steady-state operation [20]. This simplicity streamlines the implementation and adjustment of control parameters, thus mitigating the complexity of the control system. The proposed novel ANFIS adaptation mechanism requires reduced computational power by incorporation of a hybrid learning algorithm which facilitates expedited convergence rates. Specifically, the ANFIS adaptation mechanism proficiently handles the nonlinearities and parameter variations intrinsic to the PMSM drive.

The novelty of the proposed controller and the authors' contributions can be encapsulated as follows:

(1) Implementation of innovative speed controller for EV drive applications, based on ANFIS-MPCC. This controller exhibits superior control and tracking capabilities under diverse operating conditions.
(2) Comparative analysis of the dynamic performance of developed laboratory PMSM drive-based prototype under different operating condition using the proposed ANFIS-MPCC with other control techniques. Comparative analysis of the dynamic performance of developed laboratory PMSM drive-based prototype under different operating conditions using the proposed ANFIS-MPCC with other control techniques. A reduction of 64% in torque ripples, 70 % in current ripples and 52% in phase current harmonics was achieved with the proposed method as compared to the traditional method PI-HCC
(3) To assess the effectiveness of the proposed controller under typical vehicular circumstances, several tests have been conducted, including dynamic performance evaluation, load simulation, and efficiency and range assessment. The Modified Indian Drive Cycle (MIDC), designed to encompass a wider range of speed profiles, has been employed to evaluate the performance of the proposed ANFIS-MPCC. These tests revealed a 10% energy savings compared to conventional method.

This paper is structured into six sections, inclusive of the introduction. Section 2 is dedicated to the modeling of EV and PMSM. The control scheme is discussed in Sect. 4. Sections 4 and 5 present the simulation studies and experimental results and discussions, respectively, culminating in the conclusion presented in Sect. 6.

## 2 Mathematical modeling

### 2.1 Mathematical modeling of PMSM-based EV

It is imperative for every EV to exhibit performance characteristics that ensure safe integration with regular urban traffic. To achieve this, a comprehensive understanding of the various forces influencing the dynamics of an EV is essential. This section aims to elucidate each of these forces, ultimately synthesizing their contributions to derive an expression for the total force that must be overcome. This total force signifies the effort required by the PMSM to induce the linear movement of the electric vehicle [21]. Figures 2 and 3 offer a graphical depiction of the forces influencing the dynamics of the vehicle. Table 1 presents the vehicle parameters.

*(a) Rolling resistance force* The force of rolling resistance primarily arises due to the friction between the tire and the ground. This force remains relatively constant and is directly proportional to the total weight of the vehicle. The mathematical representation of this force is given by:

$$F_{\mathrm{rr}} = \mu_{\mathrm{rr}} mg \tag{1}$$

where $\mu_{\mathrm{rr}}$ is the coefficient of rolling resistance, $m$ is vehicle mass in kg and $g$ is acceleration due to gravity.

*(b) Aerodynamic drag force* The aerodynamic drag force originates from the air resistance experienced by the moving vehicle body and is dependent on the frontal area. The equation governing this force is formulated as follows:

$$F_{\mathrm{ad}} = \frac{1}{2}\rho A C_{\mathrm{d}} v^2 \tag{2}$$

where $\rho$ represents the air density in kg/m$^3$, $A$ stands for the frontal area m$^2$, $v$ in m/s denotes the speed of the vehicle and $C_{\mathrm{d}}$, known as the drag coefficient, decreases its value, enhancing the aerodynamics of the vehicle

*(c) Hill climbing force* The force needed to drive the vehicle uphill on a slope $\psi$, designated as $F_{\mathrm{hc}}$ is essentially the weight of the vehicle component acting parallel to the incline. By analyzing the forces, it can be represented as illustrated in Fig. 2.

$$F_{\mathrm{hc}} = mg \sin \psi \tag{3}$$

*(d) Acceleration force* When the vehicle speed changes, an additional force beyond that depicted in Fig. 2 is necessary. This force, $F_{\mathrm{la}}$, induces the linear acceleration of the vehicle and is described by Newton's second law equation,

$$F_{\mathrm{la}} = ma \tag{4}$$

Both angular acceleration of the vehicle's rotating elements and linear acceleration must be considered.

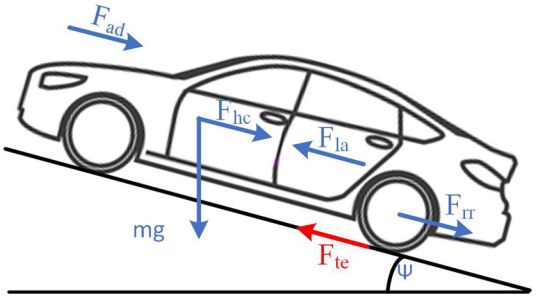


**Fig. 2** Forces acting on the vehicle

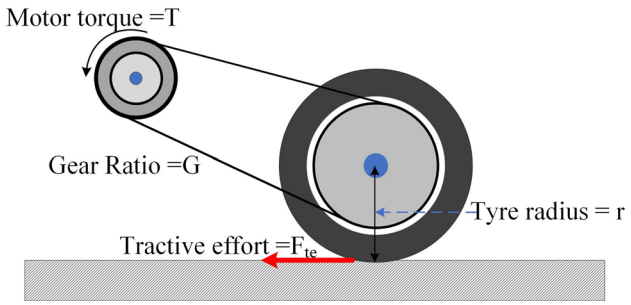


**Fig. 3** Motor gear arrangement

Figure 2 illustrates a simple method of connecting the PMSM with the traction wheels. The angular force required is:

$$F_{\omega a} = I\frac{G^2}{\eta_g r^2}a \tag{5}$$

The angular force required is linked to the motor transmission ratio ($G$), moment of inertia ($I$) of the motor's rotor, gear efficiency ($\eta_g$) and the radius ($r$) of the drive wheels. This relationship is expressed as follows: for: $\omega < \omega_c$, ov $< rG\omega_c$, then $T_L = T_{\max}$ where:

$$F_{\text{te}} = \frac{G}{r}T \tag{6}$$

$$F_{\text{te}} = \mu_{\text{rr}}mg + \rho AC_{\text{d}}v^2 + ma + I\frac{G^2}{\eta_g r^2}a \tag{7}$$

then substituting (6) in (7), we have:

$$T_L = \mu_{\text{rr}}mg + \frac{\rho}{2}AC_{\text{d}}\omega^2\frac{r^3}{G^3} + \left(m\frac{r}{G} + I\frac{G}{\eta_g r}\right)\dot{\omega}\frac{r}{G} \tag{8}$$

Considering that the Torque equation of the PMSM is:

$$J\dot{\omega} = T_e - T_L \tag{9}$$

substituting (8) in (9):

$$\dot{\omega} = \frac{T_e - \left(\mu_{\text{rr}}mg\frac{r}{G} + \frac{a}{2}Ac_{\alpha^2}\omega^2\frac{r^3}{c^2}\right)}{1 + \left(m\frac{r^2}{c^2} + \frac{1}{v_0}\right)} \tag{10}$$

The linear velocity $v$ is obtained as:

$$\frac{\text{d}v}{\text{d}t} = \frac{T_e - \left(\mu_{\text{rr}}mg\frac{r}{G} + \frac{\rho}{2}AC_{\text{d}}\omega^2\frac{r^3}{G^3}\right)}{J + \left(m\frac{r^2}{G^2} + \frac{\rho}{\eta_g}\right)} \tag{11}$$

**Table 1** Vehicle parameters

| Parameters | Symbols | Value | Unit |
|---|---|---|---|
| Vehicle mass | $m$ | 1.0 | Per unit |
| Vehicle frontal area | $A$ | 235 | $m^2$ |
| Wheel rolling radius | $r$ | 0.3048 | m |
| Gear ratio | $G$ | 2.5 | – |
| Rolling resistance coefficient | $\mu_{\text{rr}}$ | 0.015 | – |
| Wind resistance coefficient | $C_{\text{d}}$ | 03 | – |

## 2.2 Modeling of PMSM and inverter

The assumption posits the neglect of motor core saturation, excluding both hysteresis losses and eddy current in the motor. Additionally, the rotor is presumed to be undamped. In the $d-q$ coordinate system, the surface PMSM stator voltage equation is [22] expressed as

$$\begin{cases} u_{sd} = R_s i_{sd} + \frac{\text{d}\psi_{sd}}{\text{d}t} - \omega_r\psi_{sq} \\ u_{sq} = R_s i_{sq} + \frac{\text{d}\varphi_{sq}}{\text{d}t} + \omega_r\psi_{sd} \end{cases} \tag{12}$$

The stator's electromagnetic equation is formulated as

$$\begin{cases} \psi_{sd} = L_{sd}i_{sd} + \psi_f \\ \psi_{sq} = L_{sq}i_{sq} \\ |\psi_s| = \sqrt{\psi_{sd}^2 + \psi_{sq}^2} \\ \delta = \arctan\left(\frac{\varphi_{sq}}{\psi_{sid}}\right) \end{cases} \tag{13}$$

The equation for electromagnetic torque is articulated as

$$T_e = \frac{3p_\pi}{4L_{sid}L_{xp}}|\psi_s|\left[2\psi_f L_{sq}\sin\delta\right] \tag{14}$$

where $R_s$ is stator resistance; $T_e$ is electromagnetic torque; $|\Psi_s|$ is flux amplitude; $\omega_r$ is electrical angular velocity; $P_n$ is number of pole pairs; $u_{sd}, u_{sq}$ are stator voltages; $i_{s\phi}i_{sq}$ are stator currents; $\Psi_f$ is permanent magnet flux; $\delta$ is load angle $\Psi_{sd}$ and $\Psi_{sq}$ are stator direct and quadrature magnet flux; and $L_{sd}$ and $L_{sq}$ are direct axis and quadrature axis inductance.

For a two-level three-phase inverter, switching signals under ideal condition for each phase $Sa$, $Sb$, $Sc$ as follows $Sx(x = a, b, c)$.

$$S_x = \begin{cases} 0 & \text{if lower switch is on and upper switch is off} \\ 1 & \text{if upper switch is on and lower switch is off} \end{cases} \tag{15}$$

Hence, the two states for each phase can be consolidated into eight switching states, encompassing six nonzero vector states and two zero vector states, as shown in Fig. 1.

The output voltage vector in three phases is specified based on the inverter's switching state, as follows,

$$\begin{bmatrix} u_a \\ u_b \\ u_c \end{bmatrix} = \frac{v_{\text{dc}}}{3} \begin{bmatrix} 2 & -1 & -1 \\ -1 & 2 & -1 \\ -1 & -1 & 2 \end{bmatrix} \begin{bmatrix} S_a \\ S_b \\ S_c \end{bmatrix} \tag{16}$$

where $ux(x = a, b, c)$ represent phase voltages and $V_{\text{dc}}$ is the DC bus voltage of inverter. The voltage vector on the dq axis is:

$$\begin{bmatrix} u_d \\ u_q \end{bmatrix} = \frac{2}{3} \begin{bmatrix} \cos\theta & \cos(\theta - 120°) & \cos(\theta + 120°) \\ -\sin\theta & -\sin(\theta - 120°) & -\sin(\theta + 120°) \end{bmatrix} \times \begin{bmatrix} u_a \\ u_b \\ u_c \end{bmatrix} \tag{17}$$

## 3 ANFIS-MPCC controller for EV

### 3.1 Adaptive neuro-fuzzy inference system

ANFIS stands as a hybrid artificial intelligence paradigm that seamlessly integrates fuzzy logic and artificial neural networks for the purpose of acquiring a mapping input–output data, [23]. The holistic design of an ANFIS system, elucidated as shown Fig. 4, encompasses the subsequent components:

Layer 1: This layer assimilates fuzzy clusters from input data through the utilization of membership functions, articulated as:

$$O_i^1 = \mu_{A_i}(x) \tag{18}$$

In this equation, $\mu$ is the membership function, x represents the input to node i, $and\mathrm{A_i}$ indicates the linguistic label of the node function.

Layer 2: The rule layer determines strengths by multiplying the membership values obtained from the fuzzification layer:

$$O_i^2 = w_i = A_i(x) \times B_i(y) \tag{19}$$

- Layer 3: This layer calculates normalized strengths associated with each rule through the following formula:

$$O_i^3 = \bar{w}_i = \frac{w_i}{\sum_i^n w_i} \tag{20}$$

where $\overline{\boldsymbol{w}}_i$ is the normalized strength and $\boldsymbol{n}$ is the number of nodes.

Layer 4: The defuzzification layer determines weighted values of rules using first-order polynomials:

$$O_i^4 = \bar{w}_i f_i = \bar{w}_i (p_i x + q_i y + r_i) \tag{21}$$

In this context, $f_i$ constitutes the polynomial incorporating the parameter set $\{p_i, q_i, r_i\}$ identified as consequence parameters.

Layer 5: This layer consolidates all outputs from the defuzzification layer, yielding the ANFIS output:

$$y = O_i^5 = \frac{\sum_i \omega_i f_t}{\sum_i \omega_i} \tag{22}$$

The structured architecture of the ANFIS system, encompassing these layers, enables effective learning and interpretation of intricate mappings from input to output as guided

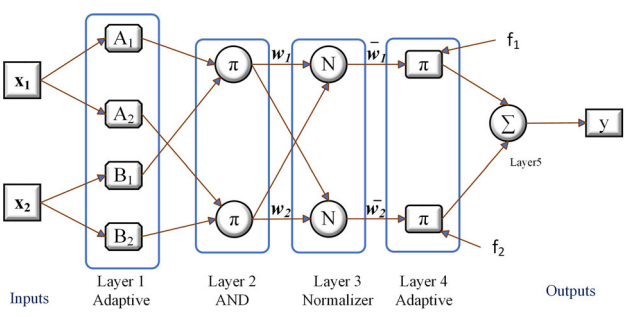


**Fig. 4** ANFIS architecture

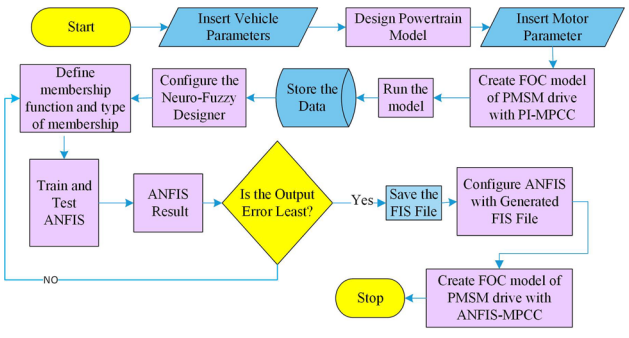


**Fig. 5** Flowchart of ANFIS training methodology

**Algorithm 1** ANFIS Training model

1: Define the vehicle and motor input parameters
2: Create FOC model for PMSM drive with PI-MPCC
3: Divide the dataset into training and testing set
4: Define the ANFIS architecture
5: Train the ANFIS model using a neural network
6: Evaluate the trained model
7: Use the trained ANFIS model for PMSM control

by the provided dataset and is shown through a flowchart as given in Fig. 5.

### 3.2 Model predictive current control

Following the fundamental tenet of predictive control, the Euler algorithm [24] is employed to discretize equation (23). Here, $T_s$ denotes the sampling period, and the current at time $(k+1)$ is predicted on the measurement available at time $(k)$. The resulting discrete linear time-invariant system is:

$$\begin{cases} i_{sd}(k+1) = \left(1 - \frac{R_s T_s}{L_{sd}}\right) i_{sd}(k) + \omega_r T_s \\ \frac{L_{sq}}{L_{sd}} i_{sq}(k) + \frac{T_s}{L_d} u_d^*(k) \\ i_{sq}(k+1) = \left(1 - \frac{R_s T_s}{L_{sq}}\right) i_{sq}(k) - \omega_r T_s \\ \frac{L_{sq}}{L_{sd}} i_{sd}(k) + \frac{T_s}{L_d} u_q^*(k) - \omega_r T_s \frac{\psi_f}{L_q} \end{cases} \quad (23)$$

Due to the extensive computational requirements of the MPC control scheme, there is an inherent delay in its execution [25]. Failure to address this delay issue can impede the controller's ongoing operations, potentially resulting in a decline in control performance. Consequently, it is imperative to account for time delay compensation. Time delay compensation represents a straightforward and effective computational approach, wherein prediction control involves forecasting future values to serve as delay compensation. This approach is applied to current predictions to mitigate the impact of delays in the control process. The delay compensation algorithm is for forecasting the value at time k + 2, with the available information at time k, where $u_d^*(k)$ and $u_d(k)$ represent the applied voltage vectors.

$$\begin{cases} i_{sd}(k+2) = \left(1 - \frac{R_s T_s}{L_{sd}}\right) i_{sd}(k+1) + \omega_r T_s \\ \frac{L_{sq}}{L_{sd}} i_{sq}(k+1) + \frac{T_s}{L_{dd}} u_d^*(k) \\ i_{sq}(k+2) = \left(1 - \frac{R_s T_s}{L_{sq}}\right) i_{sq}(k+1) - \omega_r T_s \\ \frac{L_{sq}}{L_{sd}} i_{sd}(k+1) + \frac{T_s}{L_{dd}} u_q^*(k) - \omega_r T_s \frac{\psi_f}{L_q} \end{cases} \quad (24)$$

The control objectives of FCS-MPC algorithms are articulated through a cost function, serving as an indicator of the extent to which each switching state of the inverter achieves the desired system behavior. Specifically, in the context of current control, where the aim is to follow a reference current ($i_{sd}^*$, $i_{sq}^*$) with predicted components ( $i_{sd}$, $i_{sq}$), the cost function is precisely defined as

$$g = |i_{sd}^*(k+2) - i_{sd}(k+2)|^2 + |i_{sq}^*(k+2) - i_{sq}(k+2)|^2 \quad (25)$$

**Table 2** PMSM parameters

| Parameters | Symbol | Value | Unit |
|---|---|---|---|
| Stall torque | $Ts$ | 8 | Nm |
| Peak torque | $T$ | 24 | Nm |
| Rated speed | $\omega_r$ | 3000 | rpm |
| Rated voltage | $V$ | 380 | V |
| No. of poles | $P_n$ | 6 | – |
| Stator resistance | $R$ | 0.95 | ohm |
| Rated current | $I$ | 5.4 | A |
| Inductance | $Ls$ | 8.2 | mH |
| Inertia | $J$ | 00.15 | $kg - m^2$ |

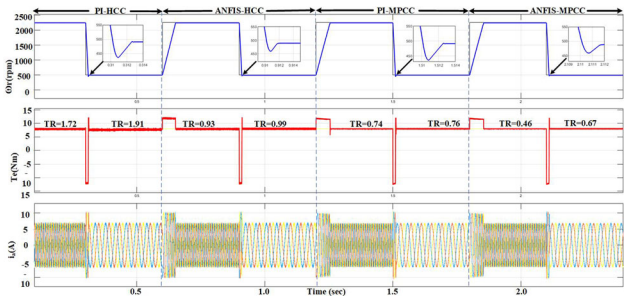


**Fig. 6** Dynamic response while speed changes from 2250 to 500 rpm at 8 Nm load

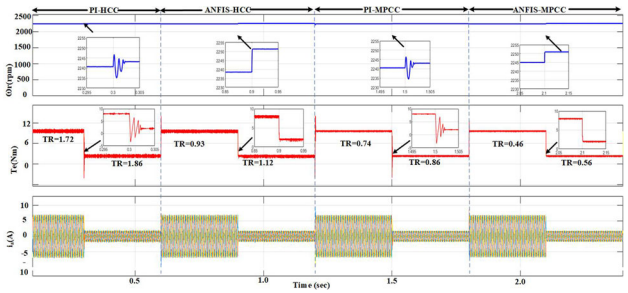


**Fig. 7** Dynamic response while load changes from 8 to 2 Nm at 2250 rpm

## 4 Simulation results and discussion

This section describes the simulations studies on a 2-kW PMSM with parameters as shown in Table 2. To assess the efficacy of the proposed novel ANFIS-MPCC technique, simulation model is developed in MATLAB/SIMULINK and also a prototype laboratory setup to validate the sim-

**Table 3** Comparative results of torque ripples

| Control scheme | PI-HCC Simulation | PI-HCC Experimental | ANFIS-HCC Simulation | ANFIS-HCC Experimental | PI-MPCC Simulation | PI-MPCC Experimental | ANFIS-MPCC Simulation | ANFIS-MPCC Experimental |
|---|---|---|---|---|---|---|---|---|
| 2250 rpm, 8 Nm (Nm) | 1.72 | 2.75 | 0.93 | 1.95 | 0.74 | 1.2 | 0.46 | 0.8 |
| 500 rpm, 8 Nm (Nm) | 1.91 | 4.2 | 0.99 | 3.55 | 0.76 | 2.72 | 0.67 | 1.48 |
| 2250 rpm, 2 Nm (Nm) | 1.86 | 3.97 | 1.12 | 3.5 | 0.86 | 2.8 | 0.56 | 1.45 |

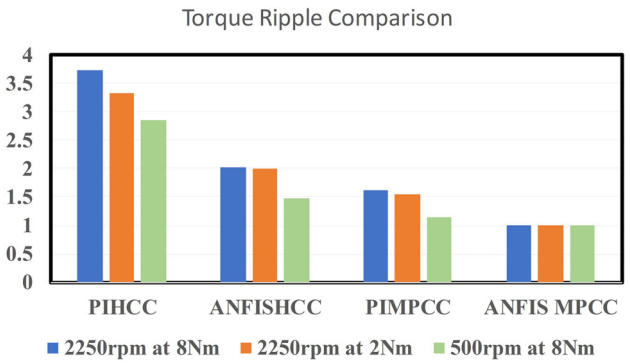


**Fig. 8** Comparative simulation analysis of normalized torque ripple

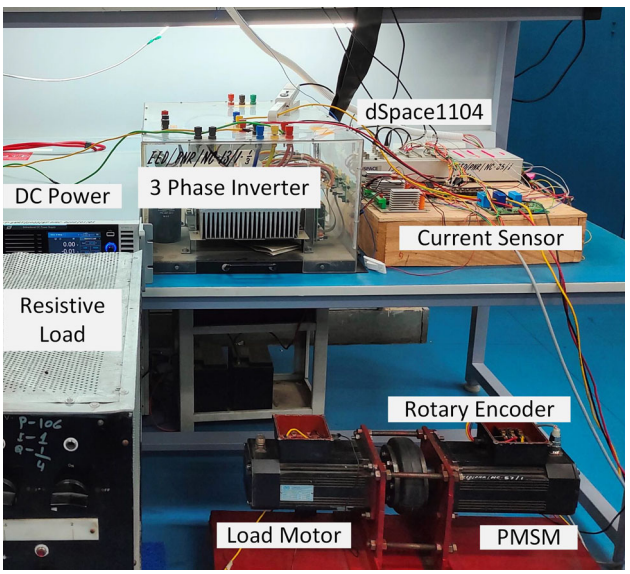


**Fig. 9** Laboratory prototype for testing the ANFIS-MPCC-based PMSM drive

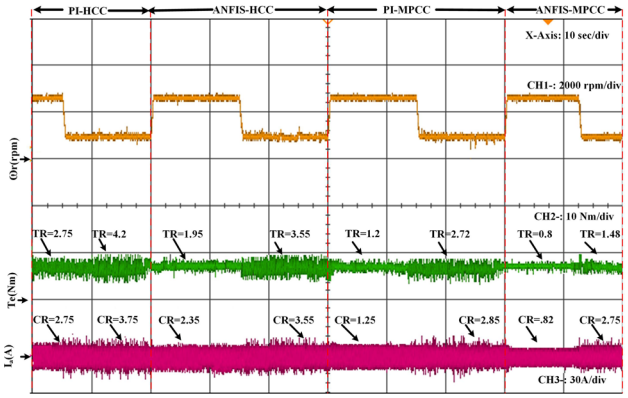


**Fig. 10** Dynamic response for step speed change from 2250 to 500 rpm at 8 Nm load

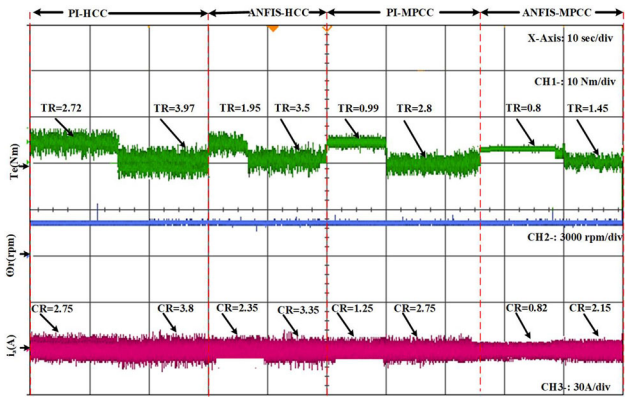


**Fig. 11** Dynamic response for step load change from 8 to 2 Nm at 2250 rpm

ulated results. This study describes comparative simulations conducted on a 2-kW PMSM to assess the efficacy of the proposed method. The simulation commences with an initial speed of 2250 rpm (75% of the rated speed) and a load torque of 8 Nm (100% of the rated load) as shown in Fig. 6. In the time interval from 0 to 0.6 s, the PI-HCC algorithm is utilized, followed by the execution of ANFIS-HCC from 0.6 to 1.2 s. Subsequently, PI-MPCC is implemented from 1.2 to 1.8 s, and the proposed algorithm is activated from 1.8 to 2.4 s. Upon a sudden reduction in the speed command from 2250 to 500 rpm, the motor speed closely tracks the reference speed. The proposed ANFIS-MPCC exhibits a slightly reduced torque ripple (TR) of 73.2% (PI-HCC), 50.5% (ANFIS-HCC) and 37.8% (PI-MPCC) at 2250 rpm. At 500 rpm, ANFIS-MPCC yields a lower torque ripple of 64.9% (PI-HCC), 32.3% (ANFIS-HCC) and 11.8% (PI-MPCC).

Similarly, in the event of a sudden reduction in load torque from 8 to 2 Nm, the speed controller sustains the constant speed at 2250 rpm, with a momentary speed dip illustrated in Fig. 7. Furthermore, at 100% of full load, it is observed that ANFIS-MPCC exhibits a lower torque ripple compared to other control algorithms, as detailed in Table 3. The nor-

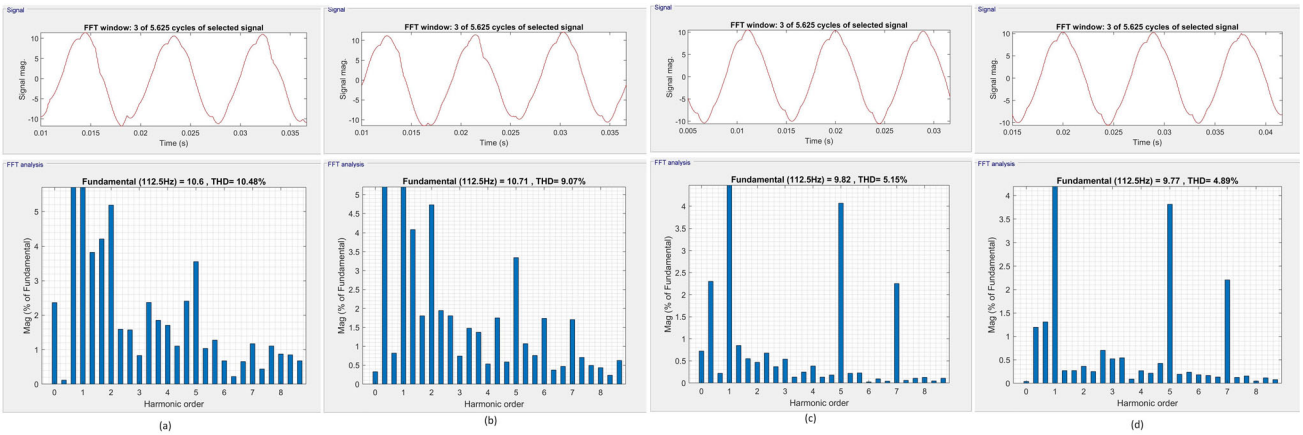


**Fig. 12** Phase current harmonic analysis at 2250 rpm at 8 Nm load. **a** PI-HCC, **b** ANFIS-HCC, **c** PI-MPCC, **d** ANFIS-MPCC

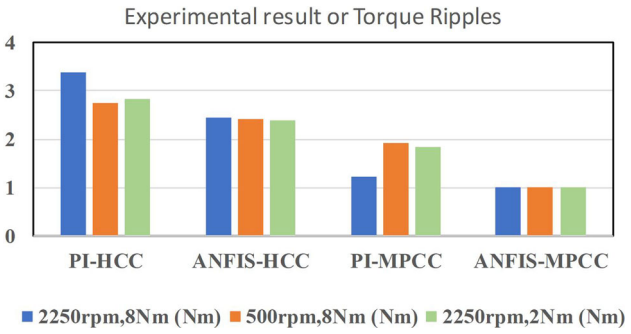


**Fig. 13** Comparative analysis of normalized torque ripple

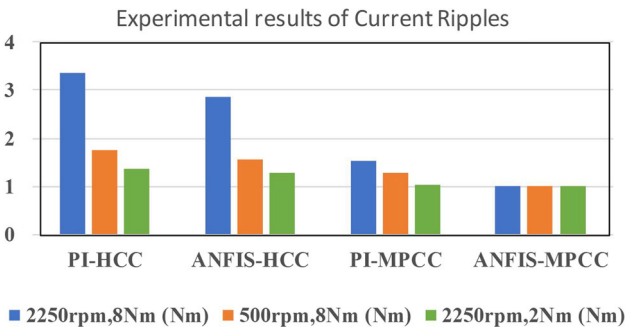


**Fig. 14** Comparative analysis of normalized current ripple

malized comparative analysis is presented in Fig. 8 where proposed ANFIS-MPCC method TR is taken as reference 1.0

## 5 Experimental results and analysis

### 5.1 Experimental setup

This section describes comparative study of the theoretical and experimental results conducted on a 2-kW experimental setup featuring a PMSM to evaluate the efficacy of the proposed method. Experimental testing of the ANFIS-MPCC control scheme for a six-leg voltage source inverter (VSI) driving the PMSM was carried out and compared with traditional PI and HCC schemes. The laboratory prototype of the PMSM drive is shown in Fig. 9. The hardware implementation involves the utilization of a dSPACE controller DS1104 digital control board and a PMSM drive. Additionally, another PMSM functioning as a permanent magnet synchronous generator (PMSG) is coupled with PMSM to generate the necessary load torque. The inverter for the drive makes use of insulated gate bipolar transistors (IGBTs). Execution of all control algorithms takes place on the dSPACE controller (DS1104) digital control board through MATLAB program. Hall sensors are employed to measure the phase currents of the PMSM, while 1000 pulses per revolution incremental encoder is used to acquire the angular position and speed of the motor.

In each control approach, the PI controller parameters are tuned according to the Ziegler–Nichols method to attain optimal control performance. To facilitate a fair comparison, the speed PI controller maintains consistent parameters across all schemes, set as $K_p = 0.012$ and $K_i = 0.2$

### 5.2 Dynamic performance of PMSM drive

In this experimental setup, PMSM is initially started with a speed of 2250 rpm, representing 75% of the rated speed, and a load torque of 8 Nm, corresponding to 100% of the rated load. The PI-HCC algorithm is used in the time interval from 0 to 20 s, followed by the execution of ANFIS-HCC from 20.1 to 50 s. Subsequently, PI-MPCC is applied from 50.1 to 80 s, and the proposed algorithm is activated from 80.1 to 100 s as shown in Fig. 10. When the speed command undergoes

**Table 4** Experimental results of current ripples

| Control scheme | PI-HCC | ANFIS-HCC | PI-MPCC | ANFIS-MPCC |
|---|---|---|---|---|
| 2250 rpm, 8 Nm (Nm) | 2.75 | 2.35 | 1.25 | 0.82 |
| 500 rpm, 8 Nm (Nm) | 3.75 | 3.55 | 2.85 | 2.75 |
| 2250 rpm, 2 Nm (Nm) | 3.8 | 3.35 | 2.75 | 2.15 |

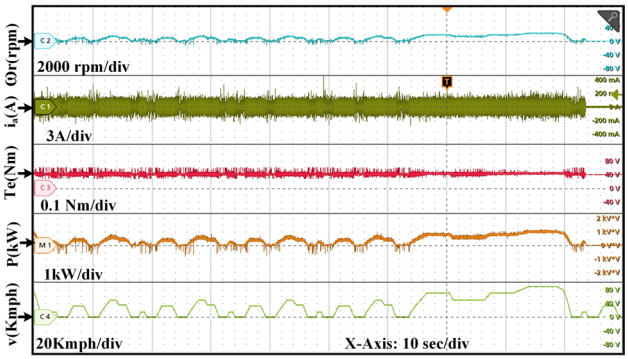


**Fig. 15** Dynamic response of MIDC drive cycle

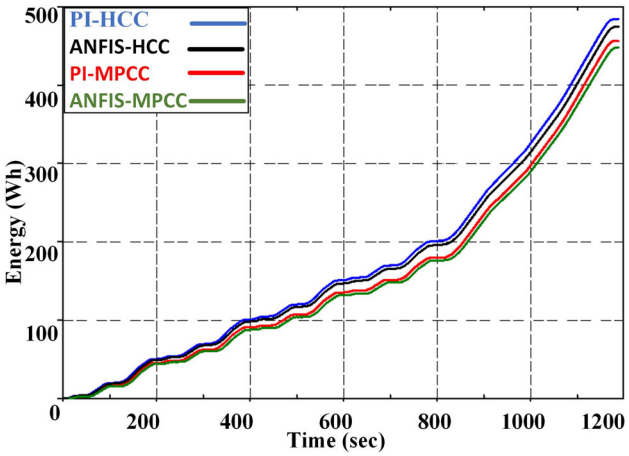


**Fig. 16** Comparative analysis of energy consumption for MIDC cycle

an abrupt reduction from 2250 to 500 rpm, the motor speed closely adheres the reference speed. The proposed ANFIS-MPCC, as suggested, exhibits a significantly reduction in torque ripple of 70.9%, 58.9% and 33.3% in comparison with PI-HCC, ANFIS-HCC and PI-MPCC, respectively, at 2250 rpm. Likewise, at 500 rpm, the torque ripple is decreased by 64.7%, 58.3% and 45.5% when compared to the corresponding control strategies mentioned above as delineated in Table 3.

Similarly, in the case of an abrupt decrease in load torque from 8 to 2 Nm, the speed controller sustains at steady state speed at 2250 rpm with a temporary dip in speed as shown in Fig. 11. Furthermore, under conditions of full load (100%), it is observed that ANFIS-MPCC exhibits a reduced torque and current ripples as compared to alternative control algorithms, as delineated in Table 3. Figure 12 shows the fast Fourier analysis of phase current at 2250 rpm with a mechanical load of 8 Nm. The proposed method shows 52.48%, 45.05%, and 3.3% reduction in harmonics as compared to PI-HCC, ANFIS-HCC and PI-MPCC, respectively. Comparative analysis of normalized torque and current ripples is presented in Figs. 13 and 14 where TR and CR of the proposed ANFIS-MPCC method are taken as reference "1." The proposed ANFIS-MPCC demonstrates diminished current ripple (CR) of 70.2%, 65.1%, and 36% as compared to PI-HCC, ANFIS-HCC, and PI-MPCC, respectively, at 2250 rpm. Similarly, at 500 rpm, there is a reduction in current ripple by 26.6%, 22.5%, and 3.1% in comparison with the respective aforementioned control strategies as shown in Table 4.

## 5.3 Performance validation using vehicular condition

For validating the vehicular conditions, the performance, reliability and safety of PMSM drive systems have been tested, thereby contributing to the development of more efficient and dependable electric propulsion solutions. The validation process includes dynamic performance evaluation, load simulation and efficiency and range assessment

### 5.3.1 Dynamic performance evaluation

This process entails assessing the motor's reactions across diverse driving scenarios, encompassing acceleration, deceleration and constant-speed operations. It includes analyses of torque output, speed responsiveness and current drawn under varied driving profiles to gauge the motor's dynamic characteristics and operational efficiency.

### 5.3.2 Load simulation

Load testing emulates a spectrum of vehicle loads and road conditions to gauge the motor's functionality under different stress levels. It aids in discerning the motor's performance under varied loads, including uphill driving, towing or carrying heavy payloads.

#### 5.3.3 Efficiency and range assessment

The assessment of the motor's efficiency in real-world driving conditions is pivotal for understanding its impact on the vehicle's overall range and energy consumption. Efficiency testing entails the measurement of energy consumption at differing speeds, accelerations and driving modes to optimize the motor's functionality for maximum range.

A standard automotive drive cycle test is employed to validate the viability and robustness of the proposed ANFIS-MPCC technique for vehicular condition. The Modified Indian Drive Cycle (MIDC) is the modified form of NEDC (New European Drive Cycle) [26] designed for Indian traffic condition. The MIDC accounts for wider speed profiles is used to assess the performance of the proposed ANFIS-MPCC across a broad spectrum of speed changes. Such speed changes are very common in urban drive cycle and this drive cycle test is conducted at a constant load of 4 Nm and zero inclination. The dynamic performance of laboratory prototype with the suggested ANFIS-MPCC is tested with the MIDC. The motor speed ($\omega_r$), electromagnetic torque ($T_e$), power ($P$) and current ($I_a$) are illustrated in Fig. 15

A comparative analysis of the energy consumption is also carried out for the traditional (PI-HCC, ANFIS-HCC and PI-MPCC) and proposed (ANFIS-MPCC) algorithms with MIDC and is shown in Fig. 16. It is observed that the proposed ANFIS-MPCC resulted in less energy consumption as compared to the other methods, thus validating that the proposed ANFIS-MPCC is best suited for EV applications.

## 6 Conclusion

This paper presents an innovative and simple approach for implementing ANFIS-MPCC in PMSM drive speed control. the proposed method utilizes and ANFIS-MPCC for PMSM drive speed control. Comparative assessments are carried out with traditional PI-HCC, ANFIS-HCC and PI-MPCC strategies. The simulation study and hardware implementation results reveal that substantial reduction in torque and current ripples is achieved using the proposed method as compared to conventional algorithms. Experimental validation of the ANFIS-MPCC using the MIDC illustrates substantial decrease in energy consumption. As compared to the conventional control algorithms for PMSM drive, the proposed ANFIS-MPCC controller offers several advantages as specified below:

(1) Under steady-state conditions, experimental findings show that the proposed ANFIS-MPCC-based controller can reduce motor torque ripples by 70.9%, 58.9% and 33.3% at high-speed operation as compared to PI-HCC, ANFIS-HCC and PI-MPCC, respectively. Further, at low-speed operation the respective values are 64.7%, 58.3% and 45.5% as compared to PI-HCC, ANFIS-HCC and PI-MPCC, respectively.
(2) A smoother dynamic response to step change in speed is observed for the proposed ANFIS-MPCCC controller. It also exhibits lesser current ripples for both low-speed and high-speed operation as compared to other methods.
(3) The proposed method show better quality of power usage by reducing harmonics, 52.48%, 45.05% and 3.3% as compared to PI-HCC, ANFIS-HCC and PI-MPCC.
(4) There is significant reduction in energy consumption with the proposed ANFIS -MPCC method while testing using the MIDC drive cycle. The comparative analysis demonstrates a reduction of 10.2%, 6.7% and 2.6% of energy consumption as compared to PI-HCC, ANFIS-HCC and PI-MPCC, respectively, thus making the proposed ANFIS-MPCC-based PMSM drive for EV applications.

Both simulation studies and experimental results validate the effectiveness of the proposed approach over conventional methods in achieving enhanced steady-state and dynamic performances across diverse operational scenarios.

**Author Contributions** The authors did not receive support from and organization for the submitted work.

**Data availibility** No datasets were generated or analysed during the current study.

## Declarations

**Conflict of interest** The authors declare no conflict of interest.

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# Android based application for locating a missing person

Dheeraj Patel ✉; Kumar Setu; Ramanand Sharma; Dinesh K. Vishwakarma

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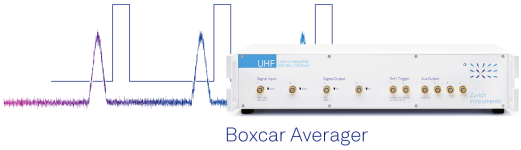
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# Android Based Application For Locating A Missing Person

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**Abstract**- Around the world, a sizable number of people including kids, teenagers, people with intellectual disabilities, elderly people with Alzheimer's disease, and others go missing every day. Unfortunately, these people are frequently never located. It is estimated that every day, more than 500 cases of missing persons in India alone go unsolved. Currently, the search for missing people can be a drawn-out, difficult, and time-consuming process for both the police and the general public. Additionally, there is no assurance that the procedure will produce reliable results. The proposed system involves matching pictures of missing people with pictures uploaded to a central database using face recognition machine learning models, specifically the FaceNet and Mobile FaceNet models. Through the use of a mobile application, the general public can participate in this system with little to no effort by simply sharing a photo of a missing person. The process of locating a missing person takes much less time and effort thanks to the application, which compares the submitted photo with pictures in the database and identifies potential matches. Finding missing children using our system is a speciality. Through the central database, people can submit images of children who strike them as suspicious, along with GPS coordinates, remarks, and other identifying details.The submitted image is then examined alongside other missing children's images in the database. Law enforcement's efforts to find the missing child will be helped by the system's ability to find the best match. It's important to remember that while our system can aid in finding missing people, it is not error-free. The system will open a new case for the person if a new face that isn't already in the database is submitted. Our suggested system has the potential to significantly enhance the process of locating missing people, providing their families and loved ones with much-needed relief.

***Keywords*** *- mobile application, android operating system, missing persons, face recognition, machine learning, FaceNet, Mobile FaceNet, locating missing people, missing children, GPS coordinates, identifying details.*

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## INTRODUCTION

The future of a country depends on the safety and security of its children. Sadly, India ranks among the countries with the highest number of missing children. In India, thousands of kids disappear every year for a variety of reasons, including kidnapping, trafficking, runaways, and lost kids. Although 174 children go missing on average each day in India, according to the National Crime Records Bureau (NCRB), almost half of them are still unaccounted for [1]. In a nation where children and youth make up 65% of the population, this is a significant problem [2]. This is a very worrying situation because children who go missing run the risk of being abused and exploited for a variety of reasons. In the last ten years, facial recognition technology has advanced significantly and has become a crucial tool in legal proceedings. Facial recognition has become a fascinating and important area of study. It was brought about by the demand for an automated surveillance system, the development of user interfaces for computers, and the fascination with face recognition capabilities of the human visual system. Researchers and knowledge from a variety of disciplines, including psychology, computer vision, pattern recognition, image processing, and machine learning, are incorporated into these studies. An input image, face detection, feature extraction, face recognition, verification, and identification are typically included in the face recognition process. Researchers from all over the world are enhancing

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and developing this biometric system's capabilities and accuracy. In the modern world, where kidnapping and human trafficking are on the rise, biometrics, particularly facial characteristics, have emerged as essential tools for finding the missing. Common people, however, frequently struggle to become informed and vigilant citizens of the country due to a lack of resources and appropriate learning opportunities. Preventing cases of kidnapping, trafficking, and other illegal activities where people are being forced without any possibility of help is urgently necessary. Only if these people could be located quickly would this be feasible. The creation of an android app that makes use of facial recognition technology is intended to locate missing people as quickly as possible. Due to the widespread use of smartphones, more people can use an Android application, enabling them to make contributions to society. The graphical user interface (GUI) of the application is user-friendly, making it simple for users to operate [3]. In order to assist in the search for those who have gone missing in India, this paper will examine the design and implementation of an android application that uses facial recognition technology. The development of the application and testing of the application's precision in identifying missing people are all part of the research methodology. A thorough review of existing facial recognition systems and their applications is also included [4]. Additionally, the research will look into the moral ramifications of facial recognition technology, such as privacy issues and potential biases. The creation of an Android app that makes use of facial recognition technology can significantly aid in the search for those who have gone missing in India. It is a step in the direction of a safer and more secure society where the welfare of children and young people is given top priority.

## LITERATURE REVIEW

There is sadly insufficient research or study available on the complex and urgent problem of missing children. Since specific numbers for children who have gone missing or been found are frequently unavailable, the scope of the problem is largely unknown [5]. This project has remained a low priority despite the fact that current legislation mandates regular inspections and surveys of locations where children may be engaged in child labour or bonded labour. Micro Studies are urgently required to ascertain the problem's scope, especially in regions where kids are thought to be particularly vulnerable. To ascertain the true scope of the problem, a village-wide survey of all children who have gone missing or been found is essential [6]. It is also advised that academic institutions conduct research into the various causes of children's vulnerability in order to produce the best response. In order to stop more cases of missing children and child labour, it is crucial to address the underlying causes of the issue.Technology has surfaced as a potential response to this problem. For instance, the website Find Face enables users to upload photos and search for VK users. The facial recognition neural network algorithm developed by N-Tech Lab matches faces in photos provided by users to faces in photos published on VK with a reported accuracy rate of 70% [7]. Similar to this, the app ReUnite employs facial recognition technology to track down missing kids. On the app, parents can file a missing child report, and alert bystanders can file a needy street child report. The software uses facial recognition to connect to official databases of missing children and look for possible matches. ReUnite notifies the user when a match is made and gives them the child's location [8]. The Ministry of Women and Child Development (MWCD) maintains the National Database on Missing Children (NDMC), which provides a centralized database for reporting and looking for missing children across the nation [9]. The Missing Person Bureau of the Delhi Police keeps a database of all missing people in Delhi and offers offline and online services for reporting and looking for missing people [10]. HelpFindMe is a website that offers a platform for reporting and searching for missing people nationwide, as well as resources and data to support families in finding their missing loved ones [11]. Khoya-Paya is an initiative run by the NGO Bachpan Bachao Andolan that offers a website and national helpline to report and search for missing children. These programmes use technology to make it easier to report missing people and to search for them. Their goal is to reunite families with their missing loved ones.

These technological advancements may help locate missing children, but they also raise issues with privacy and the morality of using facial recognition technology [12]. Making sure that these technologies are used responsibly and ethically requires weighing the potential benefits against the potential risks [13]. The issue of missing children is a serious one that needs to be addressed right away. Microstudies, research, and technological solutions like Find Face and ReUnite have the potential to address this problem, but it is essential to take into account the dangers they may pose and make sure that they are applied responsibly and ethically [14]. Due to the shortcomings of the current systems, finding missing people in India is extremely difficult. To effectively track and find missing people, police departments across the nation follow a procedure that involves marking the person as missing and sharing this information with other police departments. However, this system is frequently slow and lacks a centralized database. While it is advised that each police station establish a Missing Persons Desk or Special Squad with a Registering Officer assigned to submit reports of missing children, this system is not present in all neighborhood police stations, resulting in uneven coverage and effectiveness. There is no immediate solution in place, and the current internet-based

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systems are ineffective for finding the missing, despite the police's best efforts to pursue every lead. Newspapers and television have been used to publicize missing persons, but these strategies are frequently ineffective because there isn't a trustworthy, ongoing source of information. In order to track missing people, the Indian government has also developed an online database and website called the National Tracking System (NTS). However, due to the system's shortcomings, such as the ability to match only a small number of photos with each missing family, and a poor user interface, it is ineffective and underutilized. As a result, it is clear that India's current systems need to be improved in order to more effectively address the issues relating to finding missing people.

## METHODOLOGY

There are many challenges associated with the development and deployment of a facial recognition application for finding a missing person. Some of them are:

- Data quality and availability: The use of high-quality, easily accessible data by the application can pose a number of difficult problems. It might be more difficult to locate missing people if the data is inaccurate, outdated, or lacking. Additionally, not all information may be available to the general public due to privacy concerns. It can be challenging to obtain this data as well [15].

- User adoption and engagement: User engagement and adoption are key to the application's success. It might be necessary for users to provide sensitive information, which could be a deterrent to user adoption. The application may also demand that users participate actively in the platform's search for missing people.

- Technical infrastructure: To ensure the security and privacy of the data, the development of a missing person finder application requires a strong technical infrastructure, which includes servers, databases, and security measures. This infrastructure's upkeep can be expensive and time-consuming.

- False positives and negatives: When a person is mistakenly reported as missing or not reported missing, the application may produce false positives or false negatives. This might lead to misunderstandings and damage the application's credibility.

- Collaboration and coordination: Coordination and collaboration between different stakeholders, including law enforcement organizations, NGOs, and volunteers, are essential for effective search efforts. For the best chance of finding the missing, the application must enable this cooperation [16].

Our application is primarily made to carry out all of the functions offered by the previous system, as well as to perform all of the tasks that they can carry out, while also providing users with extra features.

- LMP (Locate Missing Person) can accomplish all the tasks that the previous system can accomplish and offers users extra features.
- The system has the ability to display data on missing people, add new complaints, and remove existing complaints.
- The system is made with an intuitive Graphical User Interface (GUI) that is both straightforward and beautiful.
- LMP is secure to prevent unauthorized use of the application.
- The proposed system resolves issues with similar applications that are already in use.

## Design and implementation

Due to its many uses, including security systems and mobile device authentication, facial recognition technology has grown in popularity recently. Face registration and face recognition are the two main components of our face recognition application. Face registration, the first stage of our application, entails taking a picture of a person's face and putting it in a database as shown in Fig1. The software creates a special face template or embedding for each registered face after detecting facial features like the eyes, nose, mouth, and chin. Face embeddings are numerical representations of facial images produced by a face recognition model. These are created and compared as part of the facial recognition process. The embeddings are float arrays of numbers, and there is a good chance that two

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embeddings that are similar belong to the same person. The model's generated embedding and the details of missing person like date and time when it was last seen, identify marks, clothes etc. are then kept together in a database. These can be used at a later time for recognition. Face recognition, which involves comparing the input face image with the registered face templates to identify the person, is the second component of our application. The facial features from the input image are extracted in this process, and an embedding is created. This embedding is then compared to the registered face embeddings in the database. The recognised face is displayed as the closest match. The quality of the registered face templates and the similarity between the input face and the registered faces in the database determine how accurately faces are recognized.

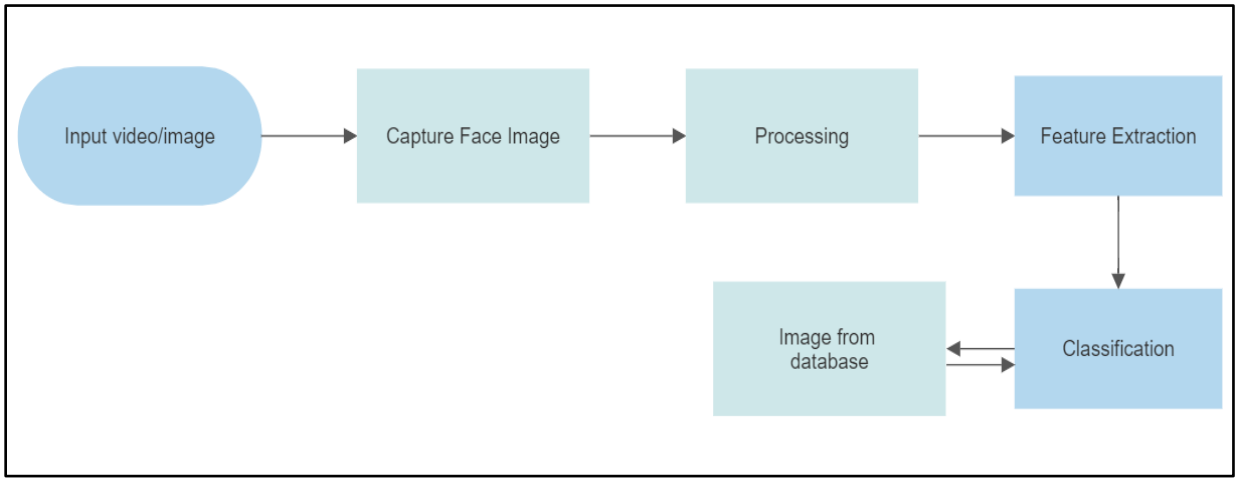


**FIGURE 1.** Basic block diagram of face recognition

A number of libraries have been used in our application. Some of them include :-

- Tensorflow Lite: TensorFlow Lite is intended to make it simple to use machine learning on hardware at the network's edge. Machine learning can be used within mobile applications without an internet connection, as opposed to sending data back and forth from a server. Therefore, the primary benefit of this library is for machine learning on devices [17]. Our mobile application contains the machine learning model, which can be used without an internet connection. As a result of this library, an internet or network connection is no longer required since the model is not stored on a distant server [18]. It is accessible through the mobile app.

- Google ML Kit : A mobile SDK (Software Development Kit) called Google's ML Kit makes it simple for developers to incorporate machine learning features into their mobile apps. For typical mobile use cases like text recognition, image labeling, and face detection, ML Kit offers a set of APIs. One of the features offered by ML Kit is face detection. Developers can quickly find and track faces in image and video streams on mobile devices with the aid of the face detection API.The Google Vision API, which offers sophisticated computer vision capabilities, is the foundation upon which the ML Kit face detection API is built. Developers can add features like face tracking, face contours, and facial landmark detection to their apps with ease by using the face detection API offered by ML Kit. This enables them to create a variety of applications, such as social media apps, security apps, and photo editing apps. To find faces in images and video streams, the ML Kit face detection API employs machine learning models. The models can recognise faces with a high degree of accuracy because they have been trained on large datasets of labeled images [19]. The API also offers a set of programmable parameters that can be used to tailor performance and accuracy for particular use cases, such as minimum face size and detection mode [20]. Overall, the ML Kit library offers a simple and adaptable method for adding face detection functionality to mobile apps.

In our application, two facial recognition models have been used, and their accuracy and latency in recognising faces were checked. These models are namely:

- FaceNet : It is a face recognition deep learning model created by Google researchers. It is made to produce vector representations of faces called embeddings in a way that makes them highly discriminative and useful

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for face recognition tasks. During training, FaceNet employs a triplet loss function, which encourages similar faces to be closer together and dissimilar faces to be farther apart [21].

- Mobile FaceNet : It is a slimmed-down variant of the FaceNet model created especially for mobile devices. It is designed to operate smoothly on mobile platforms with constrained computational power, like smartphones and tablets. For real-time face recognition applications on mobile devices, Mobile FaceNet strikes a balance between accuracy and computational effectiveness. Similar triplet loss functions are used to train both the FaceNet and MobileFaceNet models, but Mobile FaceNet is optimized for smaller model sizes and less computational power [22]. In comparison to the original FaceNet model, Mobile FaceNet typically has fewer parameters and less computational complexity, making it more appropriate for use on mobile devices with constrained RAM and processing power. For mobile applications that need real-time face recognition capabilities, like mobile authentication, facial payment systems, and augmented reality (AR) applications, the Mobile FaceNet model is a good fit. Using machine learning frameworks, such as TensorFlow Lite, a well-liked framework for deploying machine learning models on mobile devices, it can be incorporated into mobile apps. Developers can create face recognition-capable mobile apps that are quick and effective on mobile devices by utilizing Mobile FaceNet [23].

Recent advancements in deep learning algorithms have made it possible to develop models that can accurately recognise faces in real-time.FaceNet and Mobile FaceNet model deep learning algorithms are used in our application's face recognition process. For each face, these models can produce a distinctive embedding that can be compared to the registered face templates to aid in recognition.The FaceNet model is a deep convolutional neural network that can produce embedding for any face after being trained on a sizable face dataset. Deploying the model on mobile devices with constrained computational resources, however, became impractical as the model's size and complexity grew. Due to this, Mobile FaceNet, a more compact and quick variant of the FaceNet model, was created. With less accuracy than the FaceNet model, the Mobile FaceNet model creates a 192-dimensional embedding for a given face. The Mobile FaceNet model is still quite useful for many applications, even with its decreased accuracy, and it works especially well for mobile devices that need quick recognition. Cropping and scaling the face from the input image is the first step in using the FaceNet or Mobile FaceNet model for facial recognition. The face is scaled, then it is run through the appropriate model to create the embedding (Fig 2). The FaceNet Tensorflow Lite model requires a 160x160-pixel input image and outputs a 512-byte floating point array as the embedding. On the other hand, the Mobile FaceNet model requires a 112x112 input image and provides an array of 192 elements as the embedding . This is due to the Mobile FaceNet model's slightly decreased accuracy and smaller, faster, and mobile device-optimized design. Any input image must be scaled to the proper size before being sent to the recognition process in order to use the model. The generated embedding is compared to the embeddings of previously registered faces in order to identify a face. The recognised face and the difference between the embeddings are returned along with the registered face with the lowest difference between embeddings. The name of the recognised face and the degree of confidence in the recognition are stored in the recognition object, which can be used to retrieve this data. To manage the level of confidence in the recognition, the threshold for acceptable difference can be changed [24][25][26].

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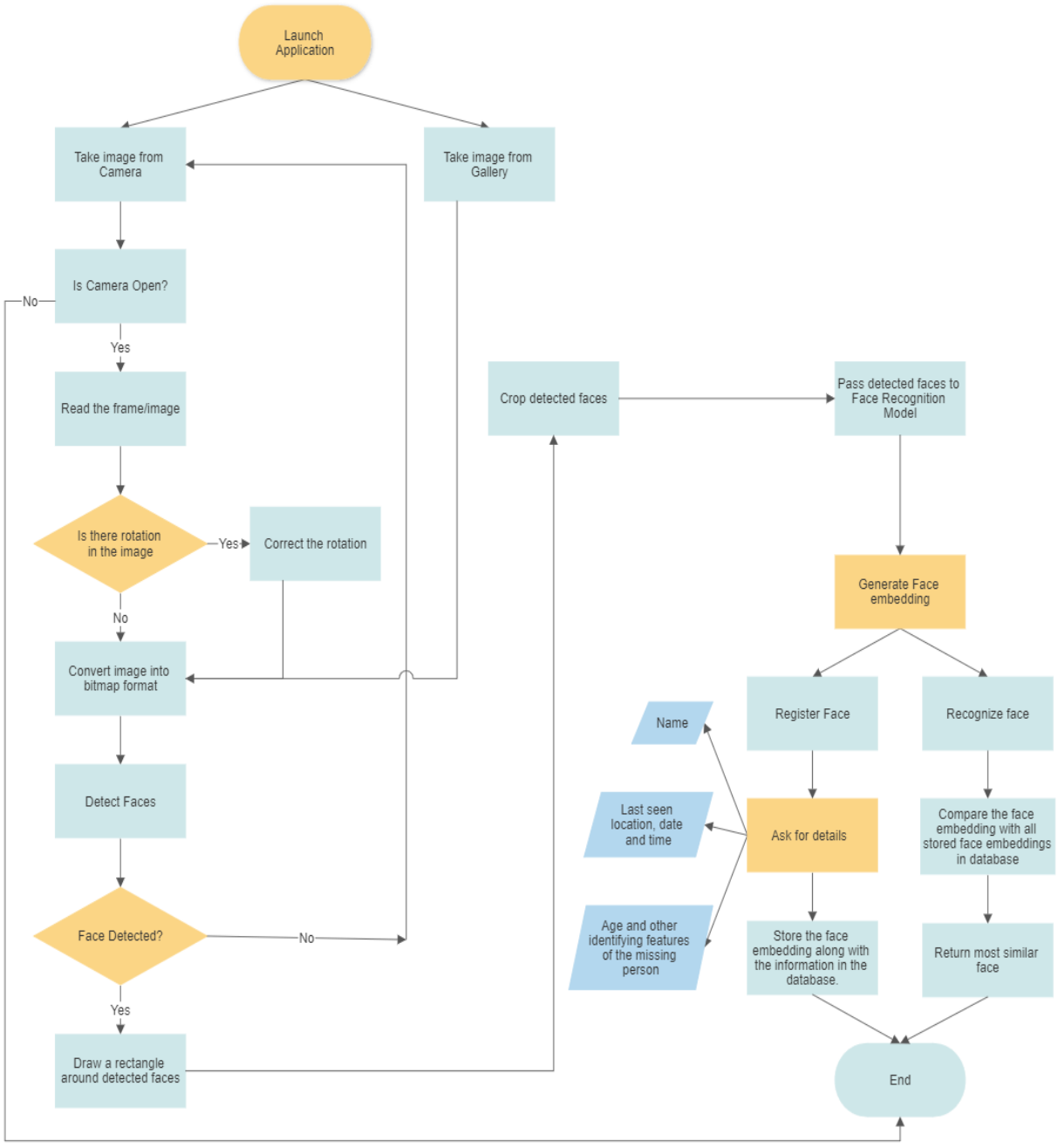


**FIGURE 2:** Flowchart of the entire application

## RESULT SECTION

The android face recognition application allows users to identify people in images using a face recognition model. The homepage of the application provides the user the option to either enroll the face of a missing person or recognize a person suspected to be missing (Fig 3). To use the application, the user has the option of selecting an image from their gallery or capturing an image using the device's camera. If the user selects an image from the gallery, the application opens the gallery and converts the selected image into a bitmap format. The bitmap is then displayed in the image view of the application. It was crucial to design an intuitive, user-friendly interface so that people from all walks of life could use the application with ease. Launching the application and choosing either the camera button to

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take a photo of the victim or, if one is available or choosing an image from the gallery are required steps in the registration process. The victim's name, age, last known location, date and time, and other identifying information are then filled out by the user before the system is registered by pressing the register button at the bottom of the screen.

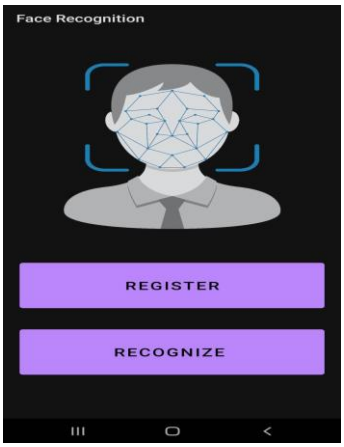


**FIGURE 3.** Home Page of the application

### Capturing Image:

If the user chooses to capture an image using the camera, the application requests camera and external storage permissions. Once granted, the user can capture an image by clicking the camera button (Fig 4), and the application captures the image in a bitmap format. The bitmap may have rotation, so the application checks and removes any rotation. The resulting bitmap is then displayed in the image view of the application.

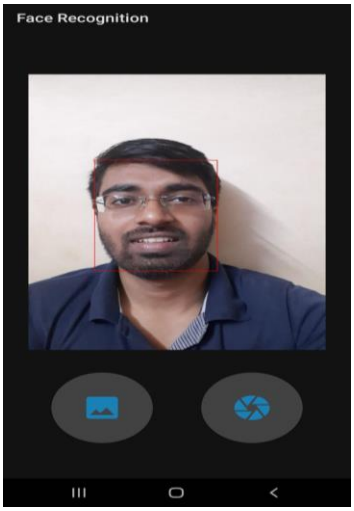


**FIGURE 4.** Capturing and uploading image of missing person

### Face Registration:

If the user wants to register a face, they are prompted to provide the name, age, last known location, date and time, and other identifying information of the person in the image (Fig 5). This information, along with the face embedding, is stored in the database for future recognition. When the user wants to recognize a face, the application uses the Google ML Kit Library for face detection to locate the face in the image. Once the face is located, the application

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crops the image to only include the face and generates a face embedding for the cropped image using the face recognition model. This embedding is then stored in the application's database for future recognition.

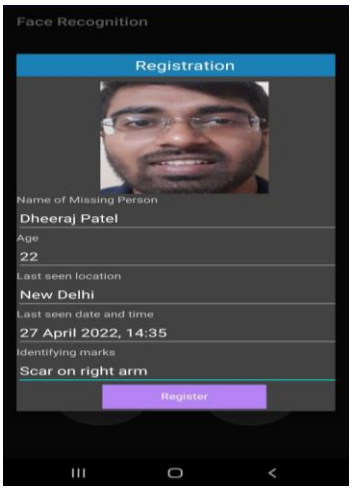


**FIGURE 5.** Entering details of missing person

### Face Recognition:

Once an image is displayed in the image view, the application uses the face recognition model to generate a face embedding for the image. The face embedding is a vector that represents the unique features of a face in a high-dimensional space.

### Comparing Face Embedding:

The application then compares the generated embedding with the embeddings of all registered faces in the database to find the one with the minimum distance. The details of the person with the most similar face is then displayed, along with a rectangle around the recognized face in the image view of the application (Fig 6). When a name appears in the red rectangle surrounding the chosen image, it means that the person has been lost and that the database contains their information. When they have located the missing person in the specified location, the citizen can call 112 to report their find. This helps shorten the time and effort the police would have needed to find the victim.

**FIGURE 6.** Face successfully recognized from database

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Overall, the Android face recognition application uses a combination of face detection and face recognition models to provide users with the ability to register and recognize faces in images. This technology has numerous practical applications, such as identifying individuals in security footage or assisting individuals with memory impairments in recognizing familiar faces. Every local resident will be able to access the app, making it accessible to anyone who wants to assist the police in finding missing children. The missing children finder app is intended to be a user-friendly and useful tool for the public and law enforcement organizations to collaborate on the search for missing children. The testing phase has demonstrated that the face recognition features are trustworthy, and the registration process is user-friendly. The application is a crucial tool in the effort to find missing children thanks to these features and the capability to connect to the police department's database.

## CONCLUSION

The number of people who go missing around the world keeps rising, and more than half of them are never found, falling victim to various occupations that have negative effects or slavery. A nation with such a sizable population cannot afford to lose its valuable citizens to criminals' betrayal and malice. On the other hand, losing a large number of children, adults, or even the elderly is a huge loss for our developing country because it reduces productivity and has an impact on the country as a whole. And just in the case of India, our youth and adults who disappear and are never found, are either left to beg or become so severely disabled that they are virtually unrecognizably. This has a significant impact on the future of our country. Two machine learning models have been incorporated in our application for facial recognition in our application and have been checked for their accuracy and latency in recognising faces. The Mobile FaceNet model is an effective substitute for applications that call for quick recognition on mobile devices with constrained computational resources, even though the FaceNet model offers the highest level of facial recognition accuracy. The main motivation for creating the project was to make it easier for the user by giving them the missing person's current location. With the proposed system, it would be very feasible for regular citizens to get involved in these criminal activities and try to reduce crime. While doing so, they can speed up the process of tracking down missing people and give the overall system for finding missing people various headstarts. The stress of manual paperwork, field trips, and physical processes for recognition, as well as the 24-hour waiting period to file an official missing person complaint, can be reduced by using our app. The primary objective of the project's development was to facilitate users and attempt to assist them in escaping dangerous situations. The amount of time spent by the police and those connected to the individual is greatly reduced, boosting productivity and efficiency. This public interest application will undoubtedly alter people's perspectives and have a significant effect on both society and the market.

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## FUTURE SCOPE

The future scope of this study covers a number of potential directions for the proposed system's growth and development. Future research might investigate how to incorporate more sophisticated machine learning models or algorithms to boost the effectiveness of the system overall and improve facial recognition accuracy. The system's ability to find missing people may also be improved by integrating it with current law enforcement databases and protocols. Expanding the system's capabilities beyond facial recognition and incorporating additional technologies like geolocation, voice recognition, and data analytics to improve the accuracy and efficiency of missing person searches is another potential future application for this research paper.The system may also be able to process huge amounts of data, identify patterns, and produce insights to help prevent the occurrence of missing person cases by experimenting with the integration of artificial intelligence and natural language processing technologies. Last but not least, the proposed system could be expanded to other nations and regions with the necessary modifications to account for cultural and legal variations. This could contribute to addressing the global issue of missing people and offer useful resources for law enforcement and public involvement in locating missing people around the world.

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# Are Delhi residents exposed to lesser particle number concentration due to the firework ban in the city?

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## Abstract

Diwali, the fireworks festival of India, adds more atmospheric particles within a short period of time and deteriorates the air quality. Short-term policies like banning crackers during fireworks festivals can help improve urban air quality. The present study analyzed particle number concentration, ranging from 10 to 1000 nm, in 2021 and 2022. A reduction in the concentration of particle number concentration (from $3.8 \times 10^4$ $cm^{-3}$ to $3.1 \times 10^4$ $cm^{-3}$) was observed due to the ban on crackers in the urban city of Delhi. The concentration range changes from $10^5$ $cm^{-3}$ to $10^4$ $cm^{-3}$. The contribution of different size ranges, Nucleation (10 to 30 nm), Aitken (30 to 100 nm), and Accumulation (100 to 1000 nm) are analyzed. During Diwali day, the Accumulation mode particles contribute to around 60% to 83% to the total particle number concentration. The exposure to total inhalable particle concentration on Diwali (During ban on firecrackers) was reduced by about 18%, i.e., 1.6 million particles per day. The study results show that emissions in urban regions can be reduced significantly by proper implementation of policy and participation from citizens. Reducing particle emissions paves the way for air quality improvement, health impact mitigation, and sustainability. Sustainability goals focus on clean air for all, and health improvement in polluted regions as interim goals, that can be achieved by implementing proper mitigation measures, which consequently help fight climate change.

**Keywords** Diwali emission · Delhi air quality · Firework emissions · Particle number concentration

## Introduction

Diwali is one among the major festivals in India, and it is celebrated by bursting of crackers and lighting of lamps throughout the country every year (Ganguly 2015; Garg and Gupta 2018; Yadav et al. 2019, 2022a). The firecrackers used during the festival use different chemicals such as aluminum, sulfur, potassium nitrate, barium nitrate, charcoal, manganese, strontium nitrate, potassium, and iron dust powder as a composition material for the manufacturing of firecrackers (Nishanth et al. 2012; Perrino et al. 2011; Sateesh et al. 2018). The bursting of crackers emits different types of atmospheric pollutants, such as particulate matter, ultrafine particles, gaseous pollutants, and toxic metals of significant quantity (Chatterjee et al. 2013; Izhar et al. 2018; Vaghmaria et al. 2018; Yerramsetti et al. 2013). These particles stay in the atmosphere for a few days, causing the formation of toxic smog (Cetin 2015; Ertugrul et al. 2019; Ozenen Kavlak et al. 2021). The pollutants are hazardous and cause serious health effects (Kanawade et al. 2014).

Delhi is one of the highly urbanized cities which experiences frequent pollution events. Air quality in the city remains in the poor category for most of the year (Agarwal et al. 2020; Mishra et al. 2016; Mohan and Kumar 2022). The air quality consistently exceeds the national standards (Garg and Gupta 2018; Goyal et al. 2021; Kanawade et al. 2020). Diwali festival usually falls under October and November, the start of the winter season in Delhi (Garg and Gupta 2018; Ghei and Sane 2018). The winter period

**Highlights**
1. A firework ban can reduce up to 20% to 22% of Aitken and Accumulation mode particles on the Diwali festival.
2. Firework emissions contribute up to 83% of accumulation mode particles in total particle number concentration.
3. Crackers ban reduced inhalable particle concentration on Diwali day, leading to less exposure.
4. The percentage contribution of different size ranges to total particle number concentration is based on the sources present.

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in Delhi experiences poor air quality compared to other seasons (Sharma et al. 2023). The major factors that influence the air quality of the region include prevailing meteorological conditions such as relative humidity, boundary layer height, and ventilation coefficient of the locality, emissions from biomass burning (Cetin et al. 2022). Apart from all these factors, the event of Diwali adds more pollutants (Gani et al. 2020, 2021; Ramachandran and Rupakheti 2022). The major emission sources in Delhi includes emission from vehicles, construction sites, road dust emission, industry sector, waste burning, and also due to long-range transportation of pollutants of different geographical origins (Gani et al. 2019, 2020; Kumar et al. 2015; Mishra et al. 2016). To combat the air quality-related issues, the government introduced various policies such as a Graded Response Action Plan (GRAP), Odd–Even number-based vehicle movement (Mishra et al. 2019), and entry restriction of other state diesel vehicles in the city. The government banned firecrackers usage during the festival in this series (Garg and Gupta 2018; Parkhi et al. 2016; Sateesh et al. 2018; Yadav et al. 2022b). Diwali emissions also emit particles in the coarse mode and nano-size ranges (Rajagopal et al. 2023). Human health is more vulnerable to these emitted nanoparticles, so analyzing the exposure to these particles is necessary for estimating the health impact assessment (Cetin 2015, 2016).

This study examined the concentration and temporal variation of nano-size particles ranging from 10 to 1000 nm during the Diwali festival in the year 2021 and 2022 to explore the impact of the crackers ban on particle number concentration and inhalable particle number concentration in two consecutive years. The wide-range nanoparticles are classified into three different sub-categories: Nucleation (10 to 30 nm), Aitken (30 to 100 nm), and Accumulation mode (100 to 1000 nm). The study helps understand nanoparticle emission reduction during the ban on fireworks events. The study's outcomes may be used to initiate further preventive measures in polluted urban cities to reduce emissions by policy changes to achieve better air quality.

## Materials and methods

### Description of monitoring location

These nanoparticles were measured on Delhi Technological University's premises (28° 36' N and 77° 33'E, 216 above Mean Sea Level). It is located in the northwest part of Delhi. A mixture of commercial, educational, and residential regions characterizes the study location (Fig.1). The climatic features of the city include extreme summer and winter with moderate rainfall. The sampling was done as per the standard measurement criteria. The study area comes under the territory of the Indo-Gangetic Plain, where the major polluted urban cities of the country fall under the region. The region is known for different types of emissions from various sectors and less dispersion due to the barrier of the Himalayas.

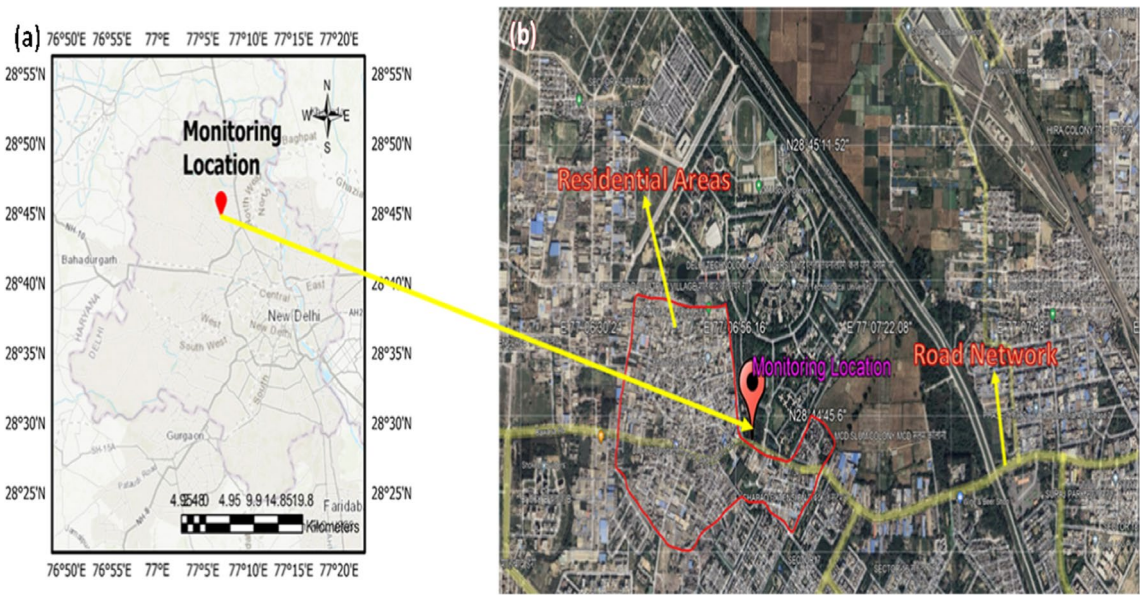


**Fig. 1** Map showing the study location (**a**) Geographical location of study area, (**b**) study area and its surrounding regions

## Instrumentation, data collection, and analysis

A scanning mobility particle sizer (SMPS GRIMM Aerosol Instrument Model 5403 and S.no. 54031801) was used to measure nanoparticles from 10 to 1000 nm. An Aerosol diffusion dryer was used to reduce and constrain air sample relative humidity to minimize particle size distribution distortion. The study was carried out for two consecutive years during the Diwali festival. During 2021, the festival was on 4$^{th}$ November, so the period before it, from 30$^{th}$ October to 3$^{rd}$ November, is considered Pre-Diwali, and 5 to 10$^{th}$ November is considered Post-Diwali period. Similarly, during 2022 19$^{th}$ to 23$^{rd}$ of October is the Pre-Diwali period, the 24$^{th}$ is the Diwali, and the 25$^{th}$ to 29$^{th}$ is the Post-Diwali period. The data collection was for 11 days in both years, where the first five days represent Pre-Diwali, the date of Diwali, and the next five days represent Post-Diwali. The measured data is analyzed, and data visualization is done using software such as R Statistical Tool (version 5.12.8) and MATLAB (version 2016b). The data are statistically tested, and outliers are removed using the Z-score differences ($>\pm 3$) between the mean and standard deviation of the individual data using the outlier package in R statistical tool. Around 94% of data is available for analysis during 2021, and 100% is available during 2022.

## Result and discussion

### Temporal variation of particle number concentration

The temporal variation of the particle number concentration (PNC) of three different size bins, namely, $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm), was analyzed during the years 2021 and 2022 Diwali period (Fig. 2a, b). The Diwali period is known for increased emissions in a short period of time. The temporal variation of the particles shows that the particle concentration was reduced in 2022 compared to 2021 for the particle size ranges such as $N_{atk}$ and $N_{acc}$ mode particles. The average total concentration of the particles reduced to around $3.1\times10^4$ cm$^{-3}$ from $3.8\times10^4$ cm$^{-3}$ on Diwali day (Table 1). Like Diwali day, the concentration during the Pre and Post-Diwali phases also decreased in 2022. The concentration observed during the year 2022 in the Pre-Diwali phase was $2.9\times10^4$ cm$^{-3}$, whereas, in 2021, it was $3.4\times10^4$ cm$^{-3}$ (Fig. 2a)., similarly during the Post-Diwali, it ranged from $3\times10^4$ cm$^{-3}$ to $3.7\times10^4$ cm$^{-3}$. The usage of firecrackers in the city during Diwali has been gradually restricted in recent years, and it was completely banned in 2022 due to poor air quality after this festival. In the year 2022 on Diwali day, the total PNC of the particle concentration reduced compared to 2021 (Fig. 2b) (Table 1). In the study area, the usage of crackers has been restricted since 2021, and in 2022, even the online purchase and selling of crackers were also restricted. i.e., the usage of the firecrackers was completely prohibited. Before the cracker ban, higher concentrations of $PM_{2.5}$, $PM_{10}$, and Ultrafine particles (UFP) were recorded in the study area, which was reported by several previous studies due to the emissions from crackers. Usually, the Post-Diwali period shows more concentration of the particles compared to Diwali (Fig. 2a) due to the more emission received on Diwali day. Also, the atmospheric conditions prevailing during that period caused the particles to accumulate in the atmosphere for longer periods. In 2021, the Post-Diwali concentrations of particle numbers were higher than in the Diwali period. But in 2022, it does not show more changes in the particle number concentration compared to the Diwali day, showing that Diwali emissions are reduced due to the fireworks ban. The results indicate that the ban on using crackers in the study area has positively reduced emissions of anthropogenic aerosols from fireworks. The day-wise Box plot concentration changes (D-5 to D + 5) for 2021 and 2022 are provided in the supplementary figure (S.F.1).

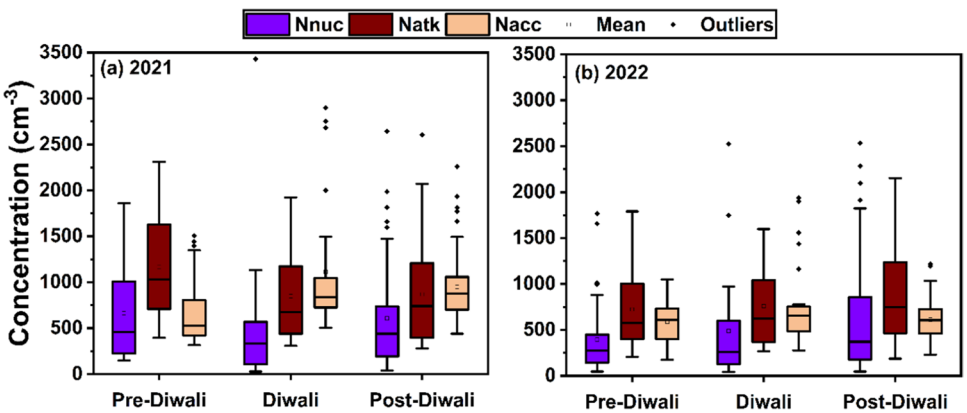


**Fig. 2** Box whisker analysis of hourly averaged particle number concentration $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) during Diwali, (**a**) Diwali 2021 (**b**) Diwali 2022. Note: Pre-Diwali represents D-2, D-1 days before Diwali, and Post-Diwali represent D + 1, D + 2 days after Diwali

**Table 1** Statistical summary of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), $N_{acc}$ (100 to 1000 nm), $N_{total}$ (10 to 1000 nm), and Geometric Mean Diameter (GMD) (a) Diwali 2021- 30th October to 10th November 2021 and (b) Diwali 2022- 19th October to 29th October 2022

| Parameter | value | PD*-21 | D*-21 | PoD*-21 | PD*-22 | D*-22 | PoD*-22 |
|---|---|---|---|---|---|---|---|
| $N_{nuc}$ | Minimum | 87 | 27 | 38 | 47 | 41 | 21 |
| | Median | 460 | 331 | 355 | 300 | 259 | 257 |
| | Mean ± SD | 606 ± 462 | 473 ± 689 | 514 ± 495 | 456 ± 448 | 487 ± 579 | 485 ± 574 |
| | Maximum | 2062 | 3428 | 2646 | 2354 | 2526 | 2532 |
| $N_{atk}$ | Minimum | 249 | 308 | 273 | 208 | 266 | 120 |
| | Median | 847 | 675 | 712 | 780 | 624 | 685 |
| | Mean ± SD | 1023 ± 594 | 847 ± 481 | 942 ± 672 | 927 ± 536 | 759 ± 423 | 839 ± 533 |
| | Maximum | 2547 | 1924 | 2993 | 2332 | 1596 | 2247 |
| $N_{acc}$ | Minimum | 158 | 506 | 317 | 157 | 276 | 230 |
| | Median | 580 | 837 | 979 | 621 | 654 | 681 |
| | Mean ± SD | 598 ± 278 | 111 ± 714 | 961 ± 337 | 619 ± 297 | 784 ± 469 | 718 ± 279 |
| | Maximum | 1505 | 2902 | 2258 | 1690 | 1938 | 1482 |
| $N_{total}$ | Minimum | 8156 | 15120 | 11263 | 7511 | 10458 | 8241 |
| | Median | 32033 | 28749 | 32483 | 27057 | 25313 | 27732 |
| | Mean ± SD | 32550 ± 13957 | 38289 ± 23038 | 37203 ± 15796 | 29769 ± 13208 | 31115 ± 16603 | 30877 ± 15067 |
| | Maximum | 66314 | 95073 | 76588 | 67504 | 67710 | 74501 |
| GMD | Minimum | 35 | 47 | 44 | 28 | 31 | 38 |
| | Median | 74 | 119 | 99 | 81 | 93 | 99 |
| | Mean ± SD | 73 ± 20 | 114 ± 27 | 104 ± 31 | 83 ± 25 | 95 ± 25 | 98 ± 30 |
| | Maximum | 117 | 156 | 183 | 135 | 147 | 170 |

- **PD* pre- diwali, *D* diwali, *PoD* post diwali, 21- year 2021 and 22- Year 2022

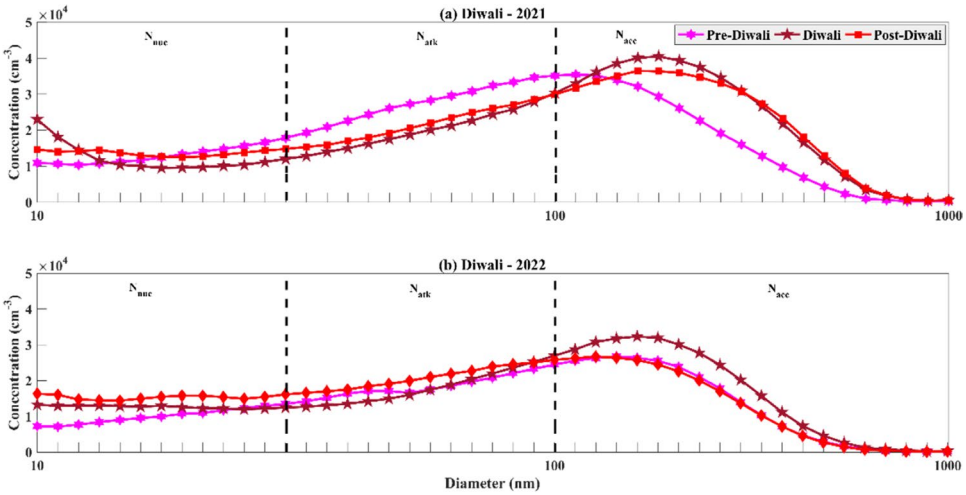


**Fig. 3** Particle number size distribution of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm) and $N_{acc}$ (100 to 1000 nm) during Diwali (**a**) Diwali 2021- 30th October to 10th November 2021 and (**b**) Diwali 2022- 19th October to 29th October 2022

## Size-resolved particle distribution

The log-normal distribution of the particle number concentration for both the Diwali periods is examined and depicted in Fig. 3. The size distribution of the different size-resolved particles from 10 to 1000 nm shows the transition of particles from one size regime to another due to the change in the emission sources. The size distribution pattern in 2021 (Fig. 3a) and 2022 (Fig. 3b) showed a gradual increase from a smaller size ($N_{nuc}$) to a higher size range ($N_{acc}$). In 2021, the usage of crackers was not fully restricted, and firework usage was observed to a certain extent, whereas in 2022, it was fully restricted. The size distribution peaks during the Diwali period and Post-Diwali during the year 2021 show a different pattern and peak, representing the Diwali emission. In 2022, the size distribution pattern is more or less same for all three Diwali periods, showing that the emission sources are constant, and no new sources were added. The typical

urban region shows an emission pattern similar to the concentration obtained from our study due to the emissions from the transportation sector and other sectors. In both years, the size distribution of the particles shows peak concentration in the $N_{acc}$ mode. The concentration of $N_{acc}$ particles is due to both primary and secondary emissions and other various atmospheric processes of these particles in the atmosphere. The changes are due to adding smaller particles to the larger size ranges through physiochemical processes based on climatic conditions (Kompalli et al. 2018; Moorthy et al. 2011). Usually Diwali festival occurs in the winter; during that time, higher relative humidity and lesser wind speed conditions induce particle coagulation, leading to larger particle size formation. The various statistical summary during different periods of the study area is shown in Table 1.

## Particle composition in total number concentration

The Percentage contribution of different size ranges to the total particle number concentration is based on the contribution of a particular source to the emission, and previous studies show that the Diwali emissions are majorly in size > 100 nm (Yadav et al. 2022b). In general, during the Pre-Diwali phase, the contribution of $N_{atk}$ mode (30 to 100 nm) was greater, corresponding to vehicular emissions. On Diwali day, the $N_{atk}$ mode contribution reduced significantly, showing the influence of Diwali sources in the particle number concentration in 2021. In 2022, the scenario was different, and the contribution of $N_{atk}$ mode particles was same throughout the different periods and a bit less during Diwali day due to reduced vehicular movement compared to the normal day in the study location (Google mobility data Rajagopal et al. 2023). Instead of an increase in $N_{acc}$ mode particles in 2022, there was an increase in the concentration of $N_{nuc}$ particles, showing that the Diwali emissions contribution is less compared to 2021. In the study period, $N_{nuc}$ contributed 17 to 28% in the Pre-Diwali period, 12% during Diwali, and 11 to 21% during the Post-Diwali period. Similarly, during 2022, $N_{nuc}$ contributed 15 to 24% during the Pre-Diwali period, 17% during Diwali, and 15 to 22% during Post-Diwali (Fig. 4). The other size ranges, such as $N_{atk,}$ shows a contribution of around 32 to 44% during Pre-Diwali, then 29% during Diwali and 28 to 33% during Post-Diwali in 2021, and during 2022, it was 34 to 43% during Pre-Diwali, 31% during Diwali and 31 to 35% during the Post-Diwali period. The $N_{atk}$ didn't show much deviation in the concentration during both years. The Nacc mode particle shows concentration ranges from 31 to 42% during Diwali, 58% on Diwali, and 49 to 55% on Post-Diwali in 2021, similarly in 2022, it was 32 to 48% on Pre-Diwali, 50% during Diwali, and 41 to 61% during Post-Diwali (Fig. 4). The percentage contribution of different-size bins to the total concentration of the particles varies from 2021 to 2022 due to variations in sources and other factors. The study shows the average concentration of the total particles reduced in 2022. This indicates that the crackers ban policy effectively reduced the particle number concentration in the study area.

## Hourly analysis of particle contribution

The hourly contribution of the different size ranges to total particle concentration clearly shows Diwali emissions hour-wise. Diwali emissions are not subjected to throughout the day, and many studies reported that the Diwali emission is more focused for a limited period in which emissions concentration increases tremendously (Khan et al. 2022; Shivani et al. 2019; Yerramsetti et al. 2013). The event is more likely to occur during the evening hours, from evening to midnight. The hour-wise concentration indicates the concentration changes of the respective size bins based on the sources. In 2021 (Fig. 5), during the Diwali day evening, i.e., from 20 h to the next day

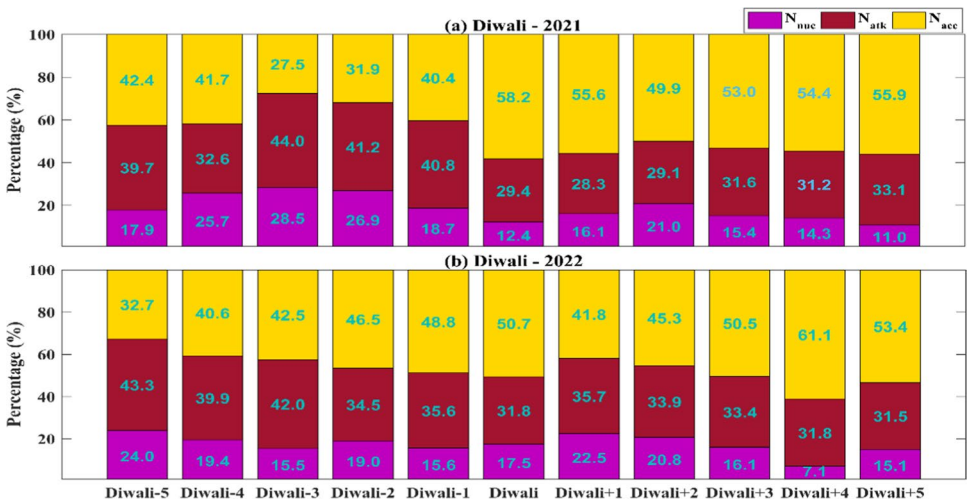


**Fig. 4** Percentage contribution of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) in Total PNC during Diwali (**a**) Diwali 2021- 30th October to 10th November 2021 and (**b**) Diwali 2022- 19th October to 29th October 2022. Note: D- 5, 4, 3, 2, and 1 represent the (n) days prior to Diwali, and D + 1, 2, 3, 4, and 5 represent (n) days post to Diwali

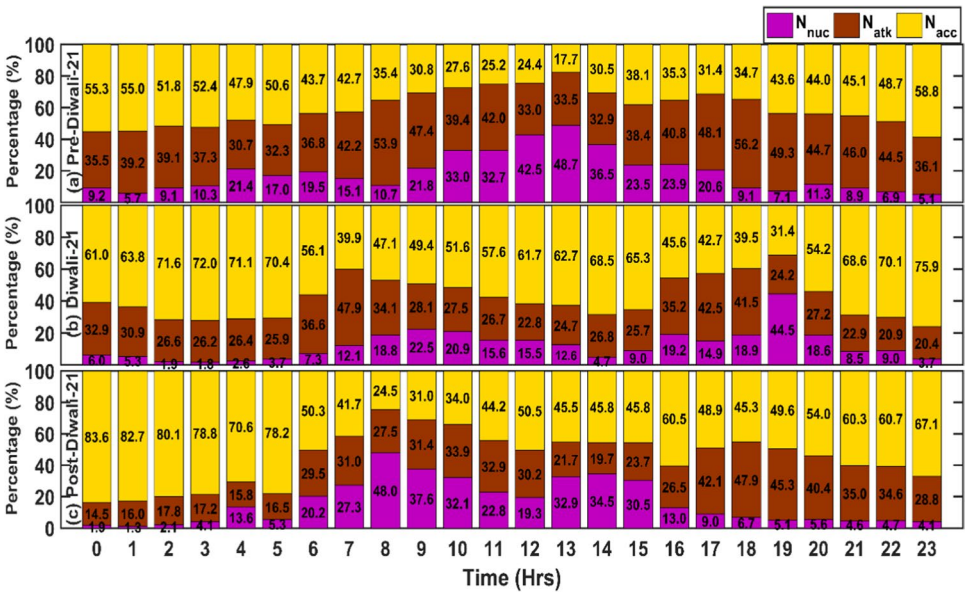


**Fig. 5** Hourly classified percentage contribution of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) in Total PNC (**a**) 30$^{th}$ to 3$^{rd}$ October 2021, (**b**) 4$^{th}$ November 2021 and (**c**) 5$^{th}$ to 10$^{th}$ November during 2021. Note: D- 5, 4, 3, 2, and 1 represents the (n) days before Diwali, and D + 1, 2, 3, 4, and 5 represents (n) days after Diwali

morning, the concentration of the accumulation mode particles started to increase tremendously, and it contributed to around 54% in the evening to 83% in the next day morning (Fig. 5b, c). This change in concentration is primarily due to the Diwali emission (bursting of firecrackers). During the Diwali period in both the years the meteorological conditions in the study area remains almost similar (Supplementary Table 1) suggesting that the concentration changes in the particle numbers are majorly due to the ban in emissions from the crackers.

In 2022 (Fig. 6), the Diwali day hour-wise analysis shows that the dominance of the accumulation mode during the evening and the next morning was not observed (Fig. 6b, c), as seen in 2021. The concentration of $N_{acc}$ mode was a bit higher than the other hours of the day due to the illegal bursting of the crackers at a very small scale and the influence of the cracker's emissions from places outside Delhi. In the Post-Diwali period, the contribution of $N_{atk}$ corresponds more to the emissions from the transportation sectors (Fig. 6c). During the pre and post-festival period,

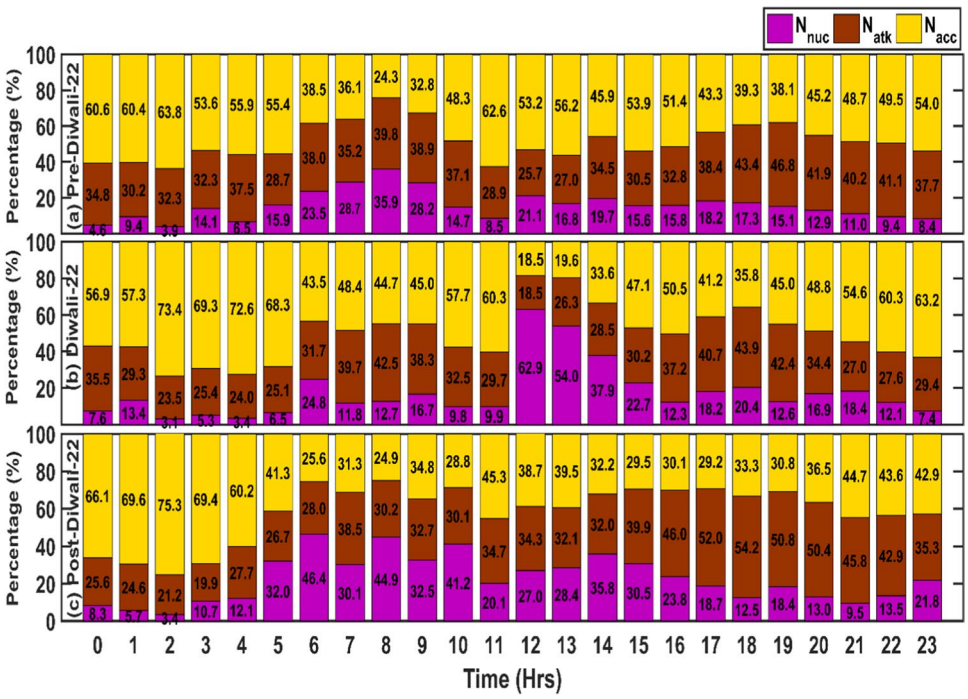


**Fig. 6** Hourly classified percentage contribution of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) in Total PNC (**a**) 19$^{th}$ to 23$^{rd}$ October 2022, (**b**) 24$^{th}$ October 2022 and (**c**) 25$^{th}$ to 29$^{th}$ October during 2022. Note: D- 5, 4, 3, 2, and 1 represent the (n) days before Diwali, and D + 1, 2, 3, 4, and 5 represent (n) days post Diwali

the movement of people (vehicular movement) contributed to more emissions in the particular size range. This was observed similarly in both 2021 and 2022. The hour-wise contribution during the 12 h. to 13 h. on Diwali day for $N_{nuc}$ particles also shows more contribution of around 54 to 62% (Fig. 6b) of nucleation size range particles, possibly due to particles from fresh emissions of engine exhaust (Sebastian et al. 2021; Yadav et al. 2021; Yu et al. 2017).

## Percentage reduction of size-resolved particle concentration

The concentration in 2022 is compared with the concentration in 2021 to analyze the changes in the particle concentration in 2022 (Fig. 7). The percentage change analysis shows that the reduction of all three different-size bins, from nucleation to accumulation, was seen in 2022. Even though the festival was on 24$^{th}$ October 2022, usually the celebrations start few days before and a few days after Diwali day, and analysis shows that the concentration in the year 2022 was seen reduced during Pre-Diwali (D-1), Post-Diwali (D + 1,2 and 3), and Diwali period (D). On Diwali day in 2022, the increase in $N_{nuc}$ particles is probably due to the UFP burst, and reduced emission of Diwali and other anthropogenic activities. After a few days of Diwali (D-3), when the anthropogenic activities and vehicular emissions resume after the festival (Rajagopal et al. 2023; Yadav et al. 2022b), the $N_{atk}$ mode particles start to increase (Fig. 7), and this increasing concentration tends to increase in the further days, such as D + 4 and 5 (Fig. 7). The reduction of concentration only during the Diwali period is due to the implementation of the policy on the crackers ban in Delhi city.

## Diurnal variation of particle concentration

The Diurnal variation of different size range particles during different hours of the day in 2021 and 2022 is analyzed for different size range particles. In the year 2021, during the pre and post-Diwali period, the morning and evening peak hour periods (i.e., 7 to 11 AM and 4 to 8 PM) (Fig. 8a, c)

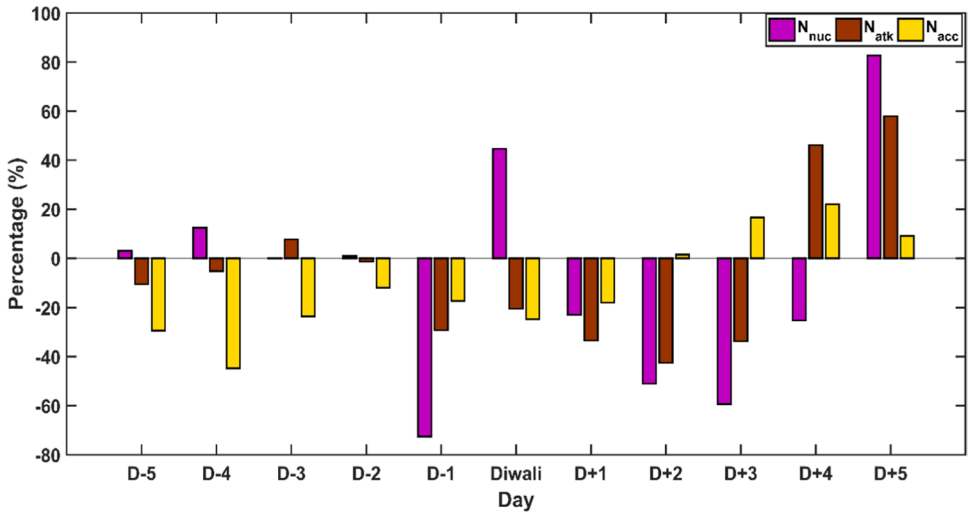


**Fig. 7** Percentage change of different size particle number concentrations $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to nm) in the year 2022 compared to 2021. Note: D- 5, 4, 3, 2 and 1 represent the (n) days prior to Diwali, and D + 1, 2, 3, 4 and 5 represent (n) days post to Diwali

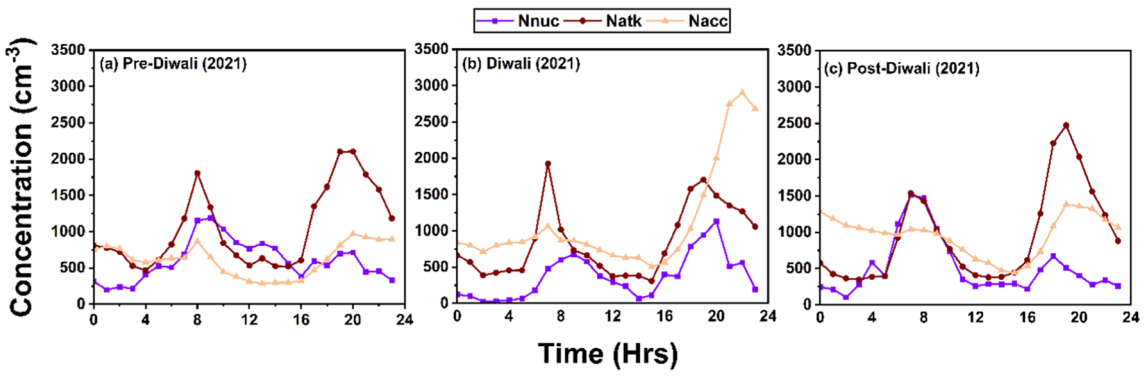


**Fig. 8** Diurnal variation of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) during Pre-Diwali, Diwali, and Post-Diwali during the year 2021

showed higher concentrations of particles compared to other hours of the day. The changes in the concentration are due to the movement of more vehicles in the study region, and it is called as double hump model, which is a normal scenario in urban regions. On Diwali day, the emission profile of the accumulation mode differs from the Pre and Post-Diwali periods, showing that the Diwali emissions play a major role (Fig. 8a, c). The concentration change was observed during the evening hours when the bursting of firecrackers usually occurs.

The Diurnal variation in 2022 doesn't show any significant changes in the concentration during the Pre, Post, and Diwali periods. The measurements show that the emissions profiles are the same, and that shows that the ban on crackers leads to reduced emissions on Diwali day in 2022 (Fig. 9b). The $N_{nuc}$ particle concentration on Diwali day increases due to the ultrafine particles burst, which occurred due to the reduced concentration of $N_{atk}$ and $N_{acc}$ mode particles. This pattern is followed during the Post-Diwali phase as well for the $N_{nuc}$ and $N_{atk}$ mode particles (Fig. 9c). The Pre-Diwali phase in the year 2022 emission profiles is the same compared to the previous year's Pre-Diwali phase (Fig. 9a) the emission scenarios are same during that Pre-Diwali period. The heat map analysis for 2021 and 2022 are provided in the supplementary figure (S.F.2).

## Exposure analysis

### Inhalable particle assessment

The inhalable particle number concentration (IPN) is used to analyze the total particle concentration inhaled by an individual at a particular time. The concentration is based on the mathematical calculation with respect to the concentration of the Particle Number Concentration (PNC) and inhalation rate. The inhalation rate varies based on the type of physical activity (more physical activity, more inhalation rate, and vice versa). The average inhalation rate for a adult aging between 21 to 30 during the light physical activity as per EPA Handbook 2011 edition (USEPA 2011) assumed to be 12 $cm^3$ $min^{-1}$ (Prabhu et al. 2019). The PNC is based on the measurement done. The particles in the nanoscale penetrate deeper into the lungs when compared to the particulate matter. The nanoparticles have lesser mass, so their deposition is calculated using the Inhalable Particle Number count. The calculations are based on Eq. (1).

$$IPN\left(min^{-1}\right) = PNC\left(cm^{-3}\right)xIR\left(cm^{3}min^{-1}\right) \quad (1)$$

In the year 2021, during the pre-Diwali period, the concentration of the IPN was higher for the $N_{atk}$ particles, and the concentration ranged from 0.8 to $1.6 \times 10^7$ particles (Fig. 10) but during Diwali and (D + 1) period, the IPN of $N_{acc}$ particles were high. Then again, the concentration of the $N_{atk}$ and $N_{acc}$ reaches an equal range during the later periods in the post-Diwali phase. During the year 2022, the inhalation concentration of the particles was less, and the pattern of concentration was the same throughout the period. The $N_{atk}$ concentration is high, followed by $N_{acc}$ and then $N_{nuc}$. The average concentration of Total inhaled particles by an individual on Diwali day with a constant inhalation rate of 12 $cm^3$ $min^{-1}$ is 9.73 million particles/day in 2021, and it was reduced to 8.12 million particles/day in 2022. In 2022, on Diwali day, the inhalation concentration was reduced to around 1.6 million particles/day. The inhalation concentration per minute was reduced to 0.3 million particles $min^{-1}$ in 2022 from 0.4 million particles $min^{-1}$. The inhalation concentration in the year 2022 was reduced by around 18% of concentration compared to the year 2021. The increased inhalation caused severe health impacts on the people. The exposure to these nanoparticles leads to alveolar deposition of these particles (Hussein et al. 2022; Manojkumar et al. 2019). The nanoparticle deposition can be found in the alveolar sac's region of the lungs. Prolonged exposure to these particles can cause severe health issues (Kwon et al. 2020;

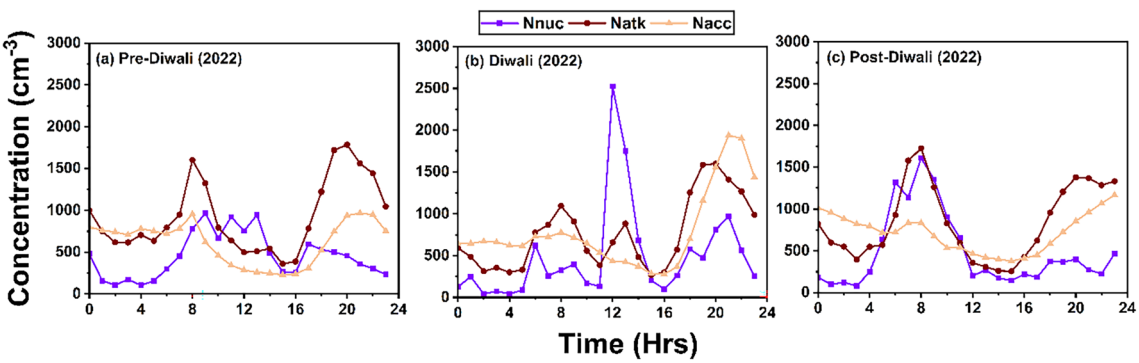


**Fig. 9** Diurnal variation of $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) during Pre-Diwali, Diwali and Post-Diwali during the year 2022

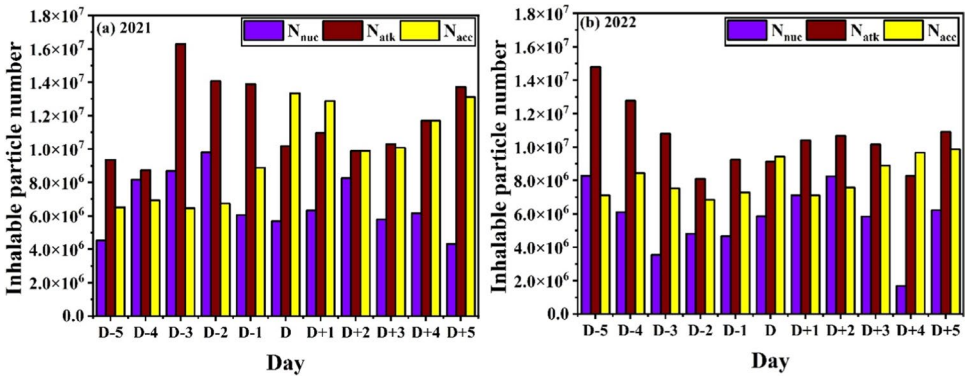


**Fig. 10** Calculated total inhalable particle concentration of different size particles $N_{nuc}$ (10 to 30 nm), $N_{atk}$ (30 to 100 nm), and $N_{acc}$ (100 to 1000 nm) during (**a**) Diwali 2021- 30$^{th}$ October to 10$^{th}$ November 2021 and (**b**) Diwali 2022- 19$^{th}$ October to 29$^{th}$ October 2022

Schraufnagel 2020). The nanoparticles have the potential to penetrate through the skin as well as the blood vessels due to their smaller size (Møller et al. 2020). The major health impacts of exposure to these smaller-size nanoparticles are stroke, hypertension, and myocardial infarction (Gupta et al. 2020; Karl et al. 2020; Mao et al. 2020; Schraufnagel 2020). These particles also cause serious health impacts on children and older adults (Balakrishnan et al. 2019; Mosonik et al. 2019).

## Summary and conclusion

During the Diwali festival, Delhi city experiences severe air pollution issues, and the crackers ban is an attempt to reduce the further emissions from fireworks in the city during winter season. First, a restriction was imposed on the purchase and sale of crackers, then a restriction was imposed for timing in the bursting of crackers, followed by the introduction of green crackers to reduce the air pollution issues, are some of the earlier versions of this crackers ban policy. This study analyzed the particle number emissions during Diwali in 2022 compared to the pre-fire crackers ban in 2021. The study collected and analyzed particle number concentration data in three size intervals (10 to 30 nm, 30 to 100 nm, and 100 to 1000 nm) immediately before, during, and after the Diwali festival in two consecutive years. The average mean concentration of the particles in 2022 reduced to around $3.1 \times 10^4$ cm$^{-3}$ from $3.8 \times 10^4$ cm$^{-3}$. The particle size distribution didn't show any significant change in distribution on Diwali day in 2022, and the range lies below $3 \times 10^4$ cm$^{-3}$ during the period. The percentage contribution shows a reduction of particles around a 20 to 22% in $N_{atk}$ and $N_{acc.}$ The concentration of $N_{nuc}$ increases on Diwali day due to fresh emissions from other sources, probably engine exhaust emissions.. The concentration of $N_{acc}$ mode particles in total PNC on Diwali day in 2021 was around 54 to 83% due to Diwali emissions, but in 2022, it reduced to about 60% . The overall concentration of particle concentration lies in the range of $10^4$ cm$^{-3}$ in 2022, whereas in 2021, it was $10^5$ cm$^{-3}$. The inhalable particle exposure on Diwali day was 9.73 million nanoparticles in 2021, but in 2022, it reduced to 8.12 million particles per day. The Diwali day alone reduces the exposure of around 1.6 million particles, i.e., 18% of the concentration of nanoparticles in the year 2022 due to the implementation of the crackers ban policy. The study found that the crackers ban policy positively reduces particle emissions in the city, consequently reducing exposure. Air quality and human health are interlinked, and achieving the human health standards for clean air needs more target-based policy implementation. Sustainable development goals emphasize the need for clean air and improving people's health, which can be achieved globally by effectively initiating mitigation measures and regularly analyzing the measure's performance. It will enhance the policy's efficiency and help achieve sustainable development goals as per the targets.

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VM – Data collection, data visualization, review& editing.
RKM – Conceptualization, data analysis, writing, review& editing.

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**Data availability** Data will be made available on reasonable request.

## Declarations

**Ethical Approval & Consent to participate** Ethical approval not applicable and the work has not been published anywhere previously in any form, and it is not in consideration for publication elsewhere.

**Consent to publish** All authors approve the publication.

**Competing of interest** The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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# Assessment of Different Approaches used for Image Enhancement in Underwater Scenarios

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*Abstract*— **There has been a lot of work done in the field of underwater image processing in recent years. Due to the difficulty of underwater photography, there has been an increase in research in this area. Underwater images frequently suffer from quality decline due to factors like low contrast, blurred features, shifting colors, noise, and variations in the water medium. Improving underwater images is a difficult problem in image processing with many practical implications. In this paper, we present a comprehensive review of the different approaches used for underwater image enhancement. Moreover, we compare different models in terms of accuracy. After that, future research directions have been discussed.**

***Keywords—Underwater image processing, Deep Learning (DL)and Image Enhancement.***

## I. INTRODUCTION

Due to the exponential attenuation of light as it passes through water, underwater images are mainly defined by their poor visibility, which manifests as low contrast and haziness. Light attenuation limits the visibility distance at roughly twenty meters in clear water and five meters or less in muddy water. The total effectiveness of underwater imaging systems is affected by the absorption and scattering processes of light in water. Blurring of visual details is a common result of forward scattering. Water's dissolved organic content or tiny visibly floating particles also contribute to its absorption and scattering properties. The presence of "marine snow" increases absorption and scattering effects. Due to its shorter wavelength, blue light travels the farthest under water, making blue the predominant hue in underwater photographs. It is necessary to address these additional issues before using conventional computer vision methods to underwater imagery. Deep Learning (DL) has been vital in improving underwater imagery by mitigating issues such as diminished contrast, color aberration, and poor visibility resulting from light scattering and absorption in water. The development of a framework for enhancing underwater images using deep learning requires a number of key elements and steps as shown in figure1. At the outset compile an extensive collection of underwater images that span a wide range of conditions, depths, and environments. The dataset is then preprocessed and cleansed through the elimination of noise, correction of color distortions, and image augmentation to increase variability. Select or create a deep learning model or ensemble of models that is appropriate for the given enhancement task in the subsequent stage. Additionally, the dataset should be divided into training, validation, and test sets. Utilize the prepared dataset to train the selected deep learning model while implementing suitable loss functions, optimizers, and learning rate schedules. Finally, evaluate the trained models' performance on the validation set.

Fig. 1. DL based underwater image enhancement process

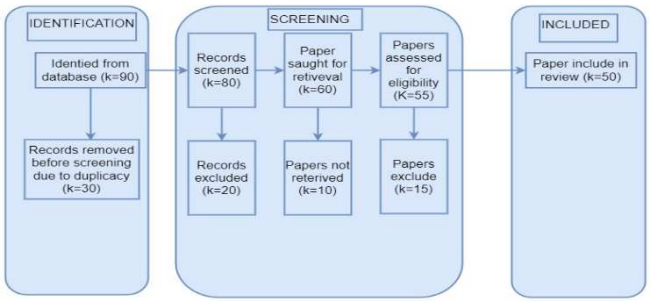


Fig. 2. Papers selection process

Fig 2 depicts the research papers selection process. In this paper more than 90 papers are fetched out from various sources and after screening process 50 papers are selected for preparing comprehensive literature review and comparing the performance of different models of image enhancement in underwater scenarios.

The major contribution of this paper is:

- To introduce the basic ideas behind the image processing techniques and datasets used for enhancing underwater images.
- To provide a compressive literature review of the many techniques utilised for enhancing images in underwater environments.
- To compare different image enhancement models in terms of accuracy.

The paper is divided into five sections. Section 1 covers the image enhancement techniques that are used for underwater scenarios. In Section 2, a comprehensive literature review of image enhancement methods has been presented. In Section 3, the underwater image enhancement models have been presented. Section 4 depicts the future research directions, and at last, in Section 5, the conclusion of the paper has been presented.

### *A. Deep Learning Modes used for Underwater image enhancement scenarios*

Underwater image improvement using DL is an active area of research, with continuous efforts aimed at improving the robustness, efficiency, and generalization capabilities of these models for a variety of underwater environments. Several deep learning models and architectures have been used to improve underwater photographs, each catering to a different set of challenges. Among the well-known models are:

#### *1) Convolutional Neural Networks (CNNs):*

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- U-Net: Adaptations of U-Net architectures, which are extensively employed in biomedical image segmentation, have been implemented to improve underwater images through denoising and restoration.
- Resident Networks (ResNet): ResNet architectures have been utilized for feature extraction and restoration in underwater images, particularly variants such as ResNet-50 or ResNet-101.
- Generative Adversarial Networks (GANs): Conditional GANs (cGANs) and their derivatives, specifically GANs, have been implemented to produce underwater images of superior quality through the process of learning from paired or unpaired data.
- Variational Autoencoders (VAEs) and Autoencoders: Variational autoencoders (VAEs) have been applied to underwater image learning in order to generate clearer versions of the images and assist in denoising.

*2) Deep Residual Learning:*

- Deep residual networks (DRNs): DRNs are architectural designs that prioritize the learning of intricate mappings. Such architectures have demonstrated efficacy in enhancing the quality of underwater images.

*3) Receptive Mechanisms:*

- Transformer-based models: It include Transformers and their variants, which are recognized for their attention mechanisms, have been investigated in an effort to improve underwater image features and capture long-range dependencies.

*4) Domain Adaptation Models:*

- CycleGAN and Pix2Pix: These models have been implemented to enhance underwater images by transferring features between various domains (e.g., from clear water to underwater).
- SRCNN: Super-Resolution Convolutional Neural Network; Sophisticated Resolution Networks Networks such as SRCNN, which were originally developed for image super-resolution, have been modified to enhance the clarity and resolution of underwater images.
- Fusion Networks: Multiscale Fusion Networks: In order to improve underwater images by integrating various characteristics, networks that combine data from multiple scales or modalities have been developed.

*5) Reinforcement Learning:*

- RL-based Image Enhancement: The quality of submerged images has been iteratively improved through the utilization of reinforcement learning techniques to optimize parameters.

## II. Related Work

A literature review on image enhancement techniques for underwater conditions has been presented in this section. Table 1 presents the comprehensive survey on comparison between existing techniques. In an underwater environment, numerous image processing applications require images of the highest quality. In the area of image research, there is a growing demand for both adaptive methods and expedited enhancing techniques. By utilizing the Challenging Dataset for Underwater Image Enhancement (CDUIE), which was recently made available, Saleem et al. [11] compared nine image enhancement models of the highest calibre across three depths. The evaluation was based on a variety of criteria that are not standardized. In a similar fashion, Muoz et al. [12] discover a complementary relationship between the sciences and photography through the investigation of image capture issues. In a similar vein, Shi et al. [13] introduced specialized hardware or additional contextual data. By utilizing piecewise linear transformation in conjunction with an adaptive technique that is dependent on the degree of attenuation, the color aberration in underwater photographs is rectified. Moreover, the methodology suggested by Muniraj and Dhandapani [14] improves the contrast, visibility, and hue of underwater images. In a similar fashion, Deepthi and Sri Vidhya [15] discuss a variety of problems that arise during image enhancement. In the context of challenging visual tasks, DL has demonstrated a marked improvement over conventional approaches. The intelligent approach to enhancing underwater images is similarly delineated by Wang et al. [16]. An analogous approach is the Multi-Branch Aggregation Network (abbreviated MBANet), which Xue et al. [17] propose to tackle this issue. In addition, a two-stage DL (Deep Learning) method for dehazing and color correcting underwater images is presented by Mousavi et al. [18]. Generate a substantial supervised training dataset through the construction of a photorealistic three-dimensional recreation of underwater environments. A technique was introduced by Wang et al. [19] through the integration of global max and avg pooling algorithms with dense concatenation. In addition, Zhuang et al. [20] present a retinex variational model that is impacted by hyper-laplacian reflectance priors with the aim of enhancing underwater photography. A similar endeavour was undertaken by Hou et al. [21] to evaluate the effectiveness of no-reference (NR) UIQA measures; they compiled an enormous dataset of underwater images titled UID2021. Learning the latent consistency between the color-transfer templates and the unprocessed underwater images was proposed by Yang et al. [22]. The proposed enhancement method employs color transfer while considering the local visual contrast and the uniformity of the worldwide color distribution in order to resolve the problem caused by deficient color-correction models and provide more consistent improvements. In addition, Fu et al. [23] applied a consensus and distribution estimation strategy to develop a probabilistic network for generating the enhancement distribution. By learning the enhancement distribution, the proposed method mitigates a portion of the bias in reference map labeling. Liu et al. [24] proposed a comparison between a model-based underwater image simulation and a learning-based underwater image enhancement approach. Furthermore, Estrada et al. [25] propose a machine learning approach for image enhancement that employs a Generative Adversarial Network (GAN) architecture. In a similar fashion, the UWCNN model proposed by Li et al. [26] reconstructs the distinct latent underwater image directly. Submarine image degradation datasets were generated through the integration of optical characteristics of underwater landscapes and a physical model of underwater photography, encompassing a broad spectrum of water types and deterioration levels. Luo et al. [27] proposed a method for diagnosing image degradation on the basis of the underwater imaging paradigm. The method under consideration employs three indices, namely contrast, sharpness, and color richness. Liu et al. [28] developed an


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innovative method for capturing feature information by incorporating the convolutional block attention module (CBAM) into the YOLOv5 core network. In addition, UWEQM, an objective metric presented by Guo et al. [29], is utilized to autonomously assess the output quality of image enhancement. In a similar vein, Fu et al. [30] present a probabilistic network that integrates a variational autoencoder with an adaptive instance normalisation algorithm. In the same way, Muniraj et al. [31] have put forth a technique for enhancing underwater images. By applying a gamma adjustment to the color constancy, the contrast of the image is further increased. Moreover, Sun et al. [32] introduced a reinforcement learning-based framework for enhancing underwater images. This framework represents the enhancement process as a Markov decision process (MDP), where image feature maps represent states, enhancement techniques represent actions, and quality increases serve as rewards. Furthermore, the augmentation of underwater images was tackled using MLLE, a method proposed by Zhang et al. [33]. Begin by locally optimizing the colors and features of an input image using a fusion technique guided by a maximum attenuation map and the minimal color loss principle. Similarly, Raveendran et al. [34] present an exhaustive compilation of techniques for enhancing underwater images and categorize them in a general sense. Additionally, Bayesian retinex was introduced by Zhuang et al. [35] as a method to enhance a solitary underwater image by utilizing multiorder gradient priors for light and reflectance. Singh et al. [36] investigated some recent deep learning-based methods that aim to enhance underwater photographs. Not only do these methodologies enhance the photographic quality, but they also yield more favourable results when compared to enhancement and restoration strategies Subsequently, Goyal et al. [37] documented an approach for augmenting underwater images based on adaptive histogram equalization (AHE). The gray-level mapping formula incorporates a new parameter, denoted by, via the AHE method. In a similar vein, Hambard et al. [38] propose an end-to-end UW-GAN for estimating depth from a standard underwater image. In order to achieve precise pixel-level depth measurements, the UWF-Net that has been proposed integrates a channel-wise excitation block with a spatial compression. Furthermore, Liang et al. [39] propose an enhanced method for improving detailed underwater images. Moreover, LCNets, or lightweight cascaded networks, were additionally proposed by Jiang et al. [40] At each tier of the pyramid, cascaded blocks are implemented onto a residual network.

TABLE 1 COMPREHENSIVE SURVEY ON COMPARISON BETWEEN EXISTING TECHNIQUES.

| Author | Year | Highlights | Methods used | Results |
|---|---|---|---|---|
| Sharma et al. [41] | 2023 | The paper proposes a deep learning-based model called Deep WaveNet for image enhancement in underwater scenarios. | Deep WaveNet framework for underwater image restoration<br>CBAM modules for adaptive refinement of residuals | Significant improvement in PSNR and SSIM metrics.<br>outperformed existing works on UIEB test set. |
| Wang et al. [42] | 2023 | The paper proposes a Two-phase Underwater Domain Adaptation network (TUDA) to enhance underwater images using deep learning models. | Two-phase Underwater Domain Adaptation network (TUDA)<br>Triple-alignment network for inter-domain adaptation | TUDA is significantly superior to existing works.<br>TUDA outperforms in visual quality and quantitative metrics. |
| Han et al. [43] | 2023 | The paper proposes a fast and efficient underwater image enhancement model based on conditional GAN, which shows good generalization ability and real-time performance. | Conditional GAN for image enhancement<br>Hierarchical attention encoder for feature extraction | Better image quality and generalization ability<br>Real-time performance for practical underwater robot tasks |
| Huang et al. [44] | 2023 | The paper proposes a novel Zero-Reference Deep Network for Underwater Image Enhancement (Zero-UIE) that does not require paired or unpaired reference data for training. | Zero-Reference Deep Network for Underwater Image Enhancement<br>- Underwater curve model based on haze image formation principle | Proposed method outperforms state-of-the-art methods subjectively and objectively.<br>Zero-UIE is competitive and applicable to diverse underwater conditions. |
| Zhang et al. [45] | 2023 | The paper proposes a fusion generative adversarial network called MDNet for underwater image enhancement, which combines traditional methods with deep learning. | Fusion-based idea combining traditional methods with deep learning<br>Physical model-based method for image restoration | MDNet effectively enhances underwater images qualitatively.<br>MDNet achieves excellent performance on three datasets quantitatively |
| Arulaalan et al. [46] | 2023 | The provided paper discusses a machine learning-based image restoration model (ML-IRM) for improving the visual quality of underwater images. It does not specifically mention deep learning-based models for image enhancement in underwater scenarios. | Machine learning-based image restoration model (ML-IRM)<br>Gaussian and bidirectional pre-processing filters | ML-IRM model improves quality of seabed images<br>ML-IRM achieves satisfactory color correction and contrast adjustment |
| Wang et al. [47] | 2022 | The paper proposes an underwater image enhancement method based on deep learning, which uses dilated convolution and parameter correction to extract multi-scale features and enhance local features at each scale. The algorithm achieves better computational performance, color correction, and detail retention compared to other methods. | Underwater image enhancement based on deep learning<br>Neural network based on dilated convolution and parameter correction | Faster operation speed compared to other methods<br>-Better computational performance, color correction, and detail retention |
| Jiang et al. [48] | 2022 | The paper presents a two-step domain adaptation method for underwater image enhancement using deep learning models. | Deep learning-based underwater image enhancement<br>Domain adaptation framework for real-world underwater image enhancement | Proposed method produces visually satisfactory results. |
| Lin et al. [49] | 2021 | The provided paper proposes a global-local guided model for underwater image enhancement using deep learning. | Global–local-guided model for UIE tasks<br>Integration of two neural networks for image recovery | Proposed method effectively tackles color distortion and blurred edges.<br>Outperforms several state-of-the-art methods by a large margin. |


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| | | | | |
|---|---|---|---|---|
| Wang et al. [50] | 2021 | The provided paper mention the use of deep learning based models for image enhancement in underwater scenarios. | Balancing and enhancing color components<br>Stretching contrast of S and V components<br>Enhancing details and contours using contrast adaptive histogram equalization | Proposed algorithm improves color correction in underwater images.<br>Compared to other algorithms, proposed algorithm shows better results. |

## III. METHODS USED FOR UNDERWATER IMAGE ENHANCEMENT

Image restoration techniques have been addressed in this section. Figure 3 indicates the image processing methods Motion blurring, background noise, and out-of-focus images are all examples of degradation.

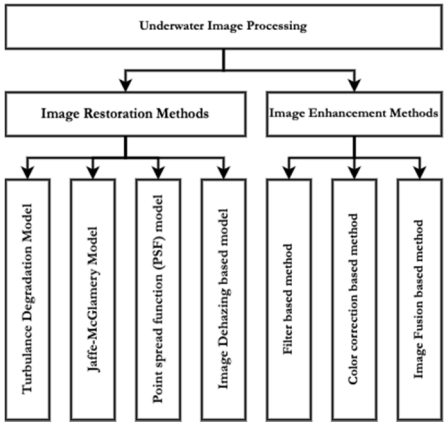


Fig. 3. Image processing methods.

### A. Underwater Image Enhancement Methods

- Turbulence Degradation Model: It is used to describe the deterioration of images caused by turbulence in various scenarios, such as underwater imaging[4].
- Jaffe-McGlamery Model: It is widely used empirical model for underwater image degradation, specifically designed to address the attenuation of light and loss of color caused by water absorption.
- Point spread function (PSF) model: PSF model is a fundamental concept in image processing that characterizes the blurring effect of an imaging system on a single point in the scene [23].
- Image dehazing based model: Image dehazing models aim to remove haze or fog from images to improve visibility and image quality.

### B. Underwater Image Enhancement Methods

Despite the need for any contextual information, this technique may extract relevant data from an image. Therefore, these techniques are more generic than the restoration technique.

*1) Filter based method:*

Filter-based methods in image processing are techniques that use filters to enhance or modify image features. These methods are widely used due to their simplicity and efficiency. Smoothing filters, such as Gaussian and mean filters, blur the image to reduce noise and remove small details.

*2) Color correction-based method:*

Color correction is a common image processing technique used to adjust and enhance the color balance and appearance of images. It plays a crucial role in ensuring accurate and consistent color representation across different devices and environments.

*3) Image fusion-based method:*

Image fusion is a technique that combines information from multiple images to create a single composite image with enhanced features.

### C. Deep learning-based methods

Deep learning-based methods have revolutionized various fields of image processing, including image enhancement and restoration.

Figure 4 compares the models mentioned above from the point of view of their use. Based on the research we can see, the majority of publications on the topic of underwater image enhancement use models based on CNN.

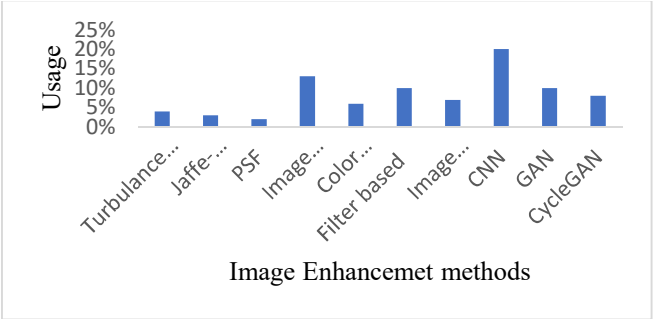


Fig. 4. Comparison of usage of different models.

Furthermore, Table 2 shows a comparison of several models in terms of accuracy. Figure 5 shows a comparison of several image restoration, image enhancement, and deep learning models. The authors calculated the average accuracy for the comparison. In comparison, the accuracy of the CycleGAN model is 97.91%, whereas the accuracy of the image-fusion-based technique is 86.53%, which is rather low in comparison to other models.

TABLE 2 COMPARISON OF VARIOUS METHODS IN TERMS OF ACCURACY

| Methods | Average Accuracy |
|---|---|
| Turbulence Degradation | 87.10% |
| Jaffe-McGlamery | 89.76% |
| PSF | 88.66% |
| Image Dehazing based | 92.13% |
| Color Correction based | 91.57% |
| Filter based | 90.19% |
| Image Fusion based | 86.53% |
| CNN | 96.78% |
| GAN | 92.82% |
| CycleGAN | 97.91% |


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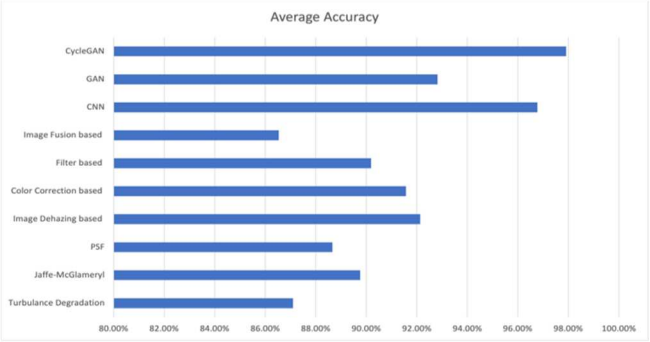


Fig. 5. Accuracy comparison of different image enhancement models

## IV. Discussion and Future Work

The comparison and evaluation in this study reveal that picking the best appropriate enhancing approach for a specific underwater activity or condition can result in a gratifying conclusion. Despite the critical necessity of underwater video processing in real-world applications, most research focuses on a single underwater image. It is difficult to develop a substantial, standardised, objective assessment technique for underwater image enhancement. Current natural image databases provide a large amount of data for the development of picture quality evaluation algorithms, but their datasets only comprise photos with single, manually-created deformations or images with deformations gathered using mobile devices.

In the future, the researcher may consider the following steps when doing the essential investigation:

- The findings of this study indicate the need for further methods of underwater image enhancement that focus a higher emphasis on adaptive correction for varied scenarios and illumination challenges encountered in the deep sea.
- It is difficult to forecast when an external light source will be accessible underwater.
- Motion blurring can also benefit underwater photo enhancement and restoration.

## V. Conclusion

Difficulties in obtaining long or short range visibility of items underwater constitute a challenge to the image analysis community. While there are many methods for improving the quality of an image, most of them only work with standard photographs, and only a select few were developed with underwater photography in mind. In this research, we analysed and evaluated a selection of these methods so that researchers would have a more complete depiction. The presented study shows that in order to advance underwater imaging processing, there is still a need for a standardised collection of test photos covering a range of imaging scenarios, as well as requirements for both quantitative and qualitative assessments of the outcomes.

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2

# CFD Investigation of Aerodynamic Effects on Multi-span Low-rise Structures with Curved Canopy Roofs of Different Apex Height

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## Abstract

Several nations' wind codes have established pressure coefficients for structures with the most commonly used roof designs. However, similar work is missing for low-rise structures with curved-canopy roofs and all sides open to the wind environment. Therefore, this work investigates wind impact on single-span and multi-span low-rise structures with curved canopy roofs and an open wind environment on all sides. Ansys CFX is used to establish the wind flow pattern, conduct the simulations, and compute wind pressure coefficients on the roof of six different structures represented as a 1:50 scale model and simulated for four wind directions ranging from 0° to 90° at 30° intervals. Due to the direct head-on impact on single-span structures, pressure contours revealed positive pressure on the external face on the windward side. The external face showed suction/negative pressure for variation in incidence angle. For multi-span structures, the external face experienced suction pressure at the windward side. Positive pressure was experienced at the junction at the external face, which changed with the incidence angle. The internal face and its junction encountered positive pressure on the windward side. Negative pressure was also detected on the external face of the roof in both single-span and multi-span structures.

**Keywords**

ANSYS CFX; Average pressure coefficient; Computational fluid dynamics; Curved roof; Low-rise building

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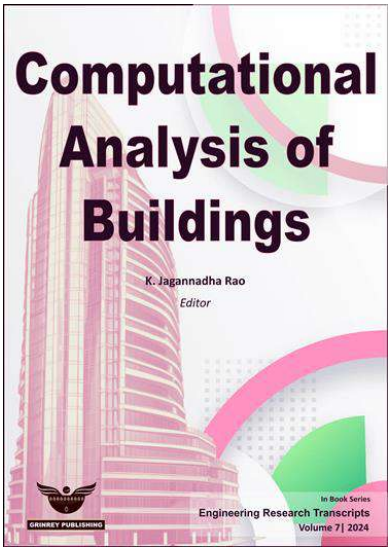


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## 1. Introduction

Low-rise structures are a common category of buildings that have been built recently all over the world and are utilised for a variety of uses, including residential, commercial, and industrial ones. As per IS Code 875 (Part 3): 2015, buildings that are typically built as low-rise structures are the ones that have a height of fewer than 20 meters. Buildings can be found in a variety of different landscapes and topographies, and they often come in different shapes and sizes. Wind loads can have a big influence on the structural ability of a building, particularly in areas that are prone to strong winds, such as coastal regions, open terrains, and hilltops. This is especially important in locations where earthquakes are not a major concern, as wind loads can be the primary factor influencing the lateral strength of a structure. These structures can also be divided into four categories: industrial sheds, factory buildings, warehouses, and storage buildings. In addition to these categories, there are some other special types of low-rise buildings such as the workshops where the primary purpose is to carry out repairs and maintenance of different types of vehicles, aircraft and ships. Many structures have canopy roofs that consist only of roof cladding and steel columns as support. These roofs come in a variety of shapes, such as flat, mono-slope, pitched, trough, circular, and curved. When wind flows through a structure with a canopy roof, it can impact both the interior and exterior faces of the roof. Canopy roofs may be more susceptible to damage due to wind compared to structures that have wall cladding. In addition to this, canopies have a greater surface area than walls and therefore need to be stronger to resist wind loads as compared to walls. Understanding the impact of wind on canopy roofs is crucial in the construction of this type of building. Wind can have significant effects on these structures, making it important to thoroughly study and consider these factors in the design process. The process of understanding the impact of wind on a building or structure involves three steps: (i) examining the effects of wind on the structure, (ii) determining the wind loads acting on the structure, and (iii) predicting how the structure will respond to these loads. By completing these steps, we can acquire a comprehensive understanding of the effects of wind on a building or structure. In this paper, only an investigation of aerodynamic effects on single-span and multi-span low-rise buildings has been done.

In a high-rise building, the roof faces the wind at different angles but in low-rise structures, the roof faces the wind at a single angle and the opposite side is exposed to the sheltered environment of the building. As a consequence of this, the roof surfaces of a tall building experience a higher wind load in comparison to their side walls. Numerous studies have been carried out on tall buildings. The research discussed in [1] concentrated on utilizing active control techniques to reduce wind loads on tall buildings. [2] focused on determining the reliability of computer simulations in predicting wind behaviour around high-rise buildings with complex shape and examining the role of roughness in influencing the loads due to wind acting on the building. [3] explored the impact of various structural characteristics on the horizontal displacement of the roof of a building relative to its base, the relative displacement of one floor of a building relative to the floor below it, and the bending moment at the base of tall buildings when exposed to loads due to wind. These characteristics included the stiffness of outriggers, the optimal location of outriggers, the axial stiffness of columns, and the flexibility of foundations. The research analysed how these factors affect the structural behaviour of tall buildings and their resistance to lateral loads. In order to evaluate the wind load acting on tall buildings located in an urban setting as well as their behavior to vibration due to wind, [4] utilized a combined mathematical-numerical simulation approach that involved both numerical simulation technique (CFD) and mathematical technique (FEM). This one-way coupled technique allowed them to effectively evaluate the effect of wind on these structures. [5] focused on analysing the wind-induced interference effects under various conditions and aimed to provide a detailed understanding of how wind behaviour is affected by the presence of other tall buildings. [6] focused on understanding the effects of random, chaotic fluctuations in the wind speed as well as the direction on the behaviour of tall buildings when exposed to extreme winds.

There have been numerous studies that have involved experiments aimed at analysing the effects of loads due to wind on low-rise buildings with diverse shapes & sizes, discovering that differing building plan forms and wind flow circumstances can result in radically distinct wind actions. Some of those studies are as follows: [7] aimed to understand how openings influenced the wind behaviour of low-rise buildings and how they affect the internal pressures within the buildings. [8] discussed more accurate and realistic simulation methods for wind tunnel testing of low-rise buildings. [9] developed a model to help predict the wind behaviour of low-rise light and residential buildings and to provide insight into how internal pressures may vary over time and under different conditions. [10] analysed different methods for the assessment of wind loading, utilizing the Gust Effect Factors for low-rise buildings. [11] specifically examined the downwash effect of a typical RTS on the way that the wind can alter the direction and spread of a plume emanating from a building. [12] devised a method for finding the distance over which a turbulent flow of air becomes attached to the surface of an object after separating from it, on the rooftops of low-rise buildings. [13] aimed to identify the characteristics of pressure distribution due to wind on the roofs of these structures and to examine how it varies across different locations on the roof. [14] found that all of the roof improvements examined were efficient in considerably lowering these suctions.

Several researchers have also tried to study the effects of different shapes and cross-sectional areas in low-rise and high-rise structures. Some of the most influential works include: [15] aimed to understand how the shape of a building can influence its wind loads and structural performance, and to identify the effects of different building shapes on wind loads. [16] worked on developing strategies for optimizing the shape and design of buildings in order to decrease wind loads and improve their structural performance in windy environments. [17] analysed factors such as angle of wind incidence and width of the passage affected the wind behaviour of cross-shaped high-rise buildings and to identify strategies for mitigating wind loads at re-entrant corners. Works such as [18], [19] and [20] have also tried to investigate the impacts of different roof shapes such as pitched roofs, pyramidal roofs, flat roofs, circular roofs and rectangular roofs on wind load and structural behaviour of low-rise buildings.

Wind tunnel testing is an experiment which is widely used across academia to investigate wind-induced effects on structures as well as to calculate the coefficient of pressure. Some of the most influential works include: Wind tunnel investigation methods were employed in the study [21] to investigate the wind behaviour of the membrane structure canopy roof and discover parameters that might impact its wind loads and structural performance. [22] investigated how different roof and facade shapes can affect the wind behaviour of street canyons and to identify strategies for optimizing these parameters in order to enhance the wind resistance of buildings in these environments. To generate realistic scale models of thin structures that are frequently open and have organic curves can be challenging, time-intensive, and costly. [23] presented a method for fabricating wind tunnel models of doubly-curved thin-shell structures, which included the integration of pressure sensors to facilitate experimental investigations of wind load distributions on such structures. This technique might be beneficial for researching the wind behaviour of these buildings and determining how wind loads are distributed over their surfaces. A study proposed a novel model for the assessment of discharge coefficient and flow angle at an inflow opening for cross-ventilation, with potential application in predicting the performance and optimization of cross-ventilation systems in buildings, as described in [24]. Another study, as described in [25], aims to conduct wind tunnel experiments on small-scale groups of tanks to evaluate the pressure patterns caused by group effects. A study conducted by [26] aimed to investigate the effect of wind direction on the wind loads acting on a reflector and to identify any patterns or trends in the pressure distribution across the surface of the reflector.

Although, wind tunnel testing is an experimental way of getting accurate results, its setup is very time-consuming and expensive. One can also use Computational Fluid Dynamics (CFD) to determine the coefficient of pressure values. It is a more convenient and cost-effective alternative to traditional

experimental methods, such as wind tunnel testing, which may be more time-sensitive and very costly. CFD simulations have been used in a variety of research studies to date. Some are as follows: [27] reported a thorough research of wind drags on high-rise structures of varied forms using CFD. [28] carried out CFD analysis for octagonal tall buildings considering the same parameters as used in the experimental study. Although uncommon, works such as [29] have also attempted to use other software packages such as ETABS 2015 for preparing and analysing wind load on a total of fifteen building models. A very unique approach was also taken by [30] which presented a method for predicting right usage of natural ventilation strategy that relies on the wind to provide fresh air to a building, employing both wind tunnel experimentation & CFD analysis.

There has also been a very strong critical assessment of criteria for load due to wind in IS 875 (Part 3): 2015 [31], and appropriate regulations have been adhered to at different phases throughout the study.

In this paper, aerodynamic effects on single-span and multi-span low-rise structures with curved canopy roofs and an open wind environment on all sides are studied by employing Ansys CFX for CFD software, which is used to run the simulations and determine the wind pressures on the internal and external faces of the model. This CFD study will help us calculate the average coefficient of pressure at the external and internal faces of the model as well as arrive at critical conclusions regarding the aerodynamics effects which are induced on a low-rise structure having a curved canopy roof due to load applied by the wind.

## 2. Structure under study

In the present study, an instrumented model of a low-rise rectangular plan of dimension 400 mm length and 200 mm breadth, curved roof structure model with apex heights 10 mm, 20 mm, and 30 mm is considered on a 1:50 geometric scale. Six columns are taken into account for the analysis of height 150 mm. The thickness of roof used is 10 mm. To investigate and understand the impact of wind on a canopy roof, the effects of wind coming from four different directions: 0°, 30°, 60°, and 90° were evaluated. These tests were performed on both single-span and multi-span models having canopy roofs. This helped us to better understand how wind direction can influence the behaviour of these structures.

To simplify the analysis, the models were exposed to a constant wind speed of 10 m/s as the structure is not very tall and the wind flows around it within the atmospheric surface layer zone, where a uniform velocity profile can be assumed. The details of the structural model are given in Fig. 1.

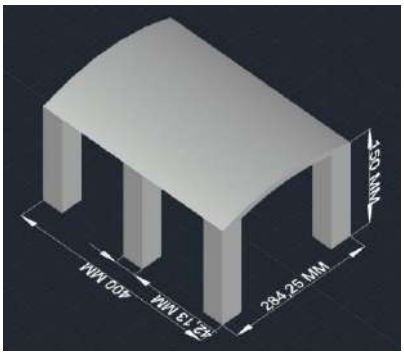
## 3. Numerical Simulation Methodology

The study investigates the aerodynamic effects on low-rise single-span and multi-span structures with curved canopy roofs. In order to do this, the ANSYS CFX Fluid Flow software was used. This software was employed to replicate the airflow around the structure and study as well as calculate the resulting forces that are applied to it. By understanding the aerodynamic forces that are acting on the structure, it becomes feasible to design the structure in such a manner that it can resist or withstand these forces.

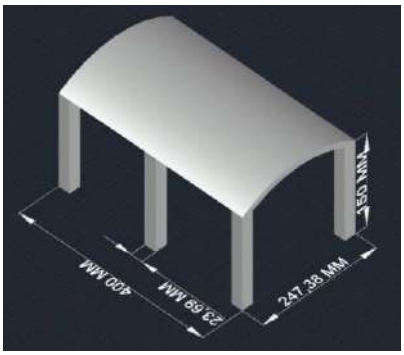
Fluid flow is a very important aspect in the field of aerodynamics. It can be said that fluid flow is the movement of a fluid from one point to another. The fluid can be in a gaseous or liquid state. The study of fluid flow is very important in many fields such as aerodynamics, hydraulics, and many others.

ANSYS CFX is a powerful fluid flow software that is used by engineers to simulate and optimize the performance of their designs. This software has the ability to simulate various kinds of fluid flow, including laminar and turbulent, compressible and incompressible, and multiphase flow.

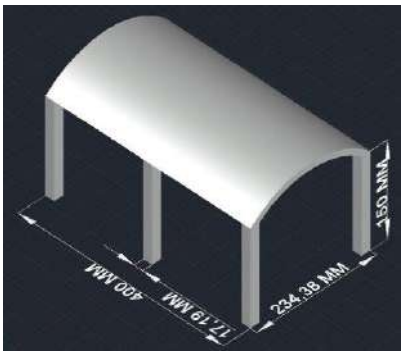
The 3D modelling software AutoCAD was utilized to model the structure being examined. The model was then exported to ANSYS for further analysis. ANSYS CFX is a convenient tool for simulating wind flow around bluff bodies through computational fluid dynamics. As a result, ANSYS 2022 R2 CFX fluid flow package simulations for the current inquiry are carried out utilizing the k-$\epsilon$ turbulence model at high turbulence intensity.



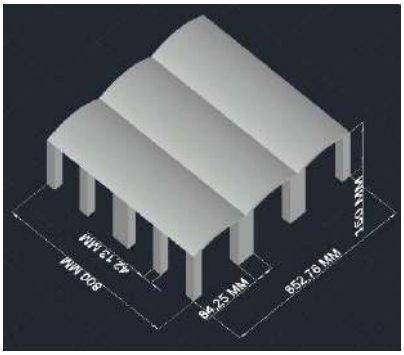

(a) Single-span structure with apex height of roof as 10 mm



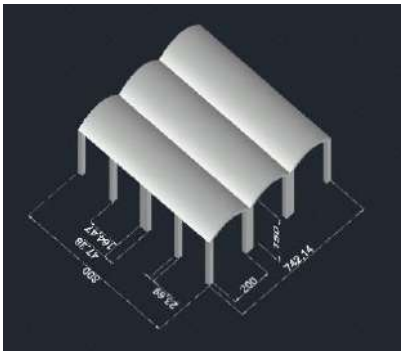

(b) single-span structure with apex height of roof as 20 mm



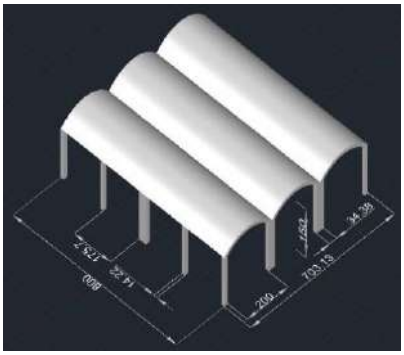

(c) single-span structure with apex height of roof as 30 mm




(d) multi-span structure with apex height of roof as 10 mm




(e) multi-span structure with apex height of roof as 20 mm




(f) multi-span structure with apex height of roof as 30 mm

**Fig. 1.** AutoCAD Isometric models of single-span and multi-span structures with varying apex heights

Six fundamental steps are used in CFD simulations, and they are as follows:

1. Domain and Creation of Geometry Models
2. Meshing
3. Physical Environment Configuration
4. Inlet Velocity
5. Generation of Results and Solutions
6. Mathematical Models and Equations

### 3.1. Domain and Creation of Geometry Models

The pre-processing stage involves setting up the computational domain as a fluid body and creating a solid body model of the flat canopy roof structure. To generate a simulated wind tunnel, a fluid flow domain should then be created around the structure. This was accomplished using Ansys' Design-Modeler tool. The experimental model dimensions are used to determine the solid body model's dimensions. In the study, the building model was not placed at the centre of the domain. Instead, it was positioned 15 times the height of the building (H) away from the inlet, sidewall, and top bounds of the domain, while the outlet boundary was 5H away. This arrangement was chosen in order to ensure that the wind flow around the building model was representative of realistic conditions and to avoid any artificial influences that might distort the results. This is carried out to guarantee proper flow around the model and avoid recirculation. The diagrammatic representation of the model of the domain is shown in Fig. 2.

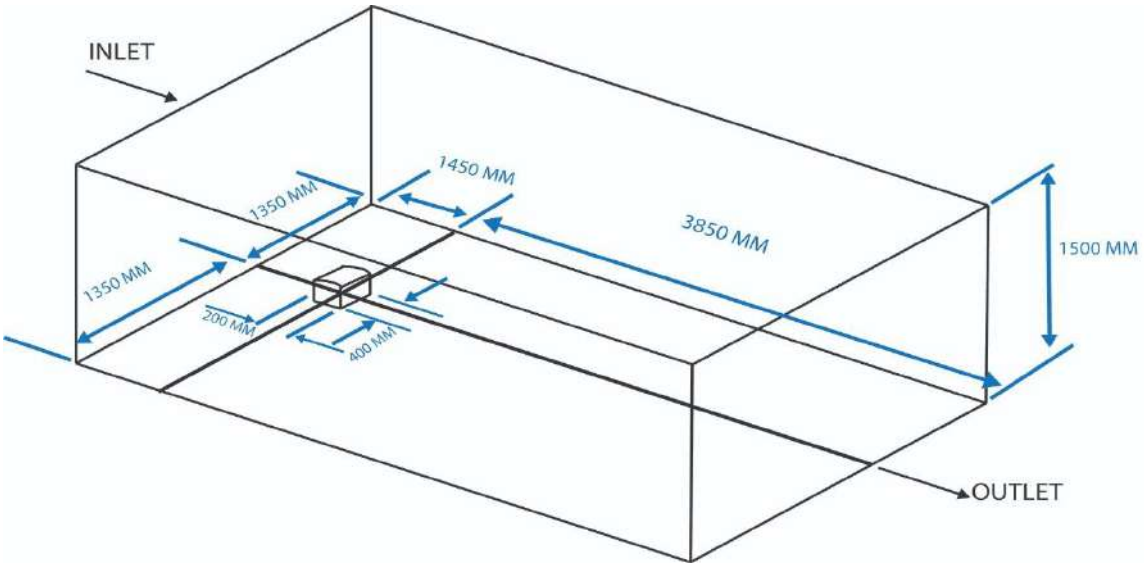
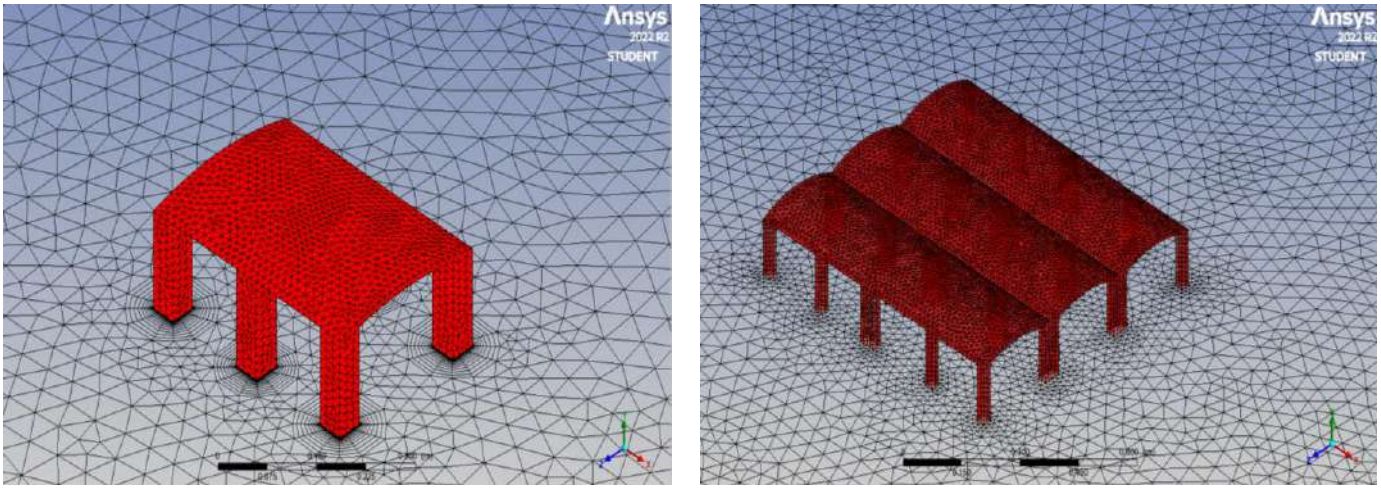



**Fig. 2.** Model of the domain

### 3.2. Meshing

The process of dividing a building model into smaller sections or parts, known as meshing, is a crucial aspect of computational fluid dynamics (CFD) simulations. Accurate meshing helps to capture the flow properties of the model with greater precision. In this study, tetrahedron meshing was used for both the domain and the building model. Tetrahedron meshing is chosen because it is faster and requires less computing power than other types of meshing. In addition, a finer edge meshing was used in important areas to capture flow parameters more accurately. The mesh size for the faces of the model was set at 0.0125 m, for edges as 0.0250 m and ground as 0.050 m.

To differentiate the domain from the building model, meshing inflation was also applied at the intersection between the two. In this study, 15 inflation layers were used between the building model and the domain. Fig. 3 below shows the meshing and inflating layer made available to models.




(a) (b)

**Fig. 3.** Mesh diagram of the model. (a) Single-span structure, (b) multi-span structure.

### 3.3. Physical Environment Configuration

In order to accurately model fluid flow within the computational domain, appropriate boundary conditions must be set. The boundary conditions are established by defining the wind profile and setting up the load on the inlet surface of the domain, which corresponds to the windward side. This ensures that the structure is subjected to the appropriate wind conditions. The walls of the model were classified as free-slip walls, with zero shear stress and non-zero velocity along the surfaces of the bottom, top, and side walls. To mimic the natural flow of a freestream in a virtual wind tunnel, the wall surface's normal velocity component is typically set to zero. The walls of the building model and the ground were treated as no-slip surfaces, meaning that there is no fluid velocity along the perimeter of the surface. This ensures a more accurate simulation of real-world conditions. Additionally, appropriate boundary conditions are set to account for the viscous drag or resistance encountered by the wind flow as it interacts with the ground and model surfaces. Zero pascal was used to define the relative pressure at the output.

### 3.4. Inlet Velocity

The inlet velocity is the speed at which the air enters the wind tunnel. Accurately knowing the inlet velocity is the first step in ensuring that the wind tunnel is modelled correctly in any CFD simulation. In this investigation, a steady and consistent velocity of 10 m/s that is the same throughout the area is introduced at the domain's inlet for the wind flow.

### 3.5. Generation of Results and Solutions

The next step after the user sets up the simulation in Ansys Workbench is to generate results through the Ansys Solution Manager. The Solution Manager is a tool designed to generate results for numerous types of simulations. The user can run the simulation either in batch mode or interactively. Ansys Solution Manager generates results for a simulation by retrieving the data from the simulation, running it through the Ansys solver, and then post-processing the data. The data is retrieved from the simulation by either exporting it from the simulation software or using the Ansys Solution Manager's built-in functionality to connect to the simulation software. Once the data is in the Ansys Solution Manager, the solver is run on it to generate the results. After the results are generated, they are post-processed by the Ansys Solution Manager to generate the final output.

Afterwards, an analysis of the result file to study the pressure coefficient and streamlines generated by the Ansys Solution Manager was conducted. The result file was utilized to study the pressure coefficients and streamlines at different points around the circular canopy roof. The $C_p$ represents the ratio of pressure at a specific point to the free-stream velocity, and it is a crucial factor in determining the aerodynamic performance of a structure in the presence of fluid flow. Mathematically, pressure coefficient can be defined according to (1) given below:

$$Cp = \frac{P - P_0}{\frac{1}{2} \times \rho \times V^2} \tag{1}$$

where, P is the pressure of the wind or the force exerted by the wind on a surface at a specific location, $P_0$ is the reference pressure, which is used as a baseline for comparison, is the pressure in the area outside the influence of the building, such as the outlet. In this study, the reference pressure has been set to zero Pa and ρ & V are the density of air and design wind speed, respectively.

### 3.6. Mathematical Models and Equations

The Ansys CFX also uses a variety of different models and equations to simulate the different types of flow. The choice of model and equation will depend on the specific application being simulated. The following is a list of some important computational fluid dynamics modeling equations.

### 3.6.1 Navier-Stokes Equation

The Navier-Stokes equations are a set of mathematical formulae used to explain fluid motion. These are fundamental equations of fluid mechanics, which are based on the principles of mass, momentum, and energy conservation, and are used to describe various types of fluid flow such as laminar, turbulent, compressible, and incompressible flows. The Ansys CFX software, in particular, uses the Navier-Stokes equations as a foundation for simulating fluid flow, with the focus being on the conservation of momentum.

The accompanying equation can be given as,

$$\frac{\partial(\rho u_i)}{\partial t} = \frac{\partial(\rho u_i u_j)}{(\partial x_j)} - \frac{\partial}{(\partial x_j)}\left[\mu\left(\frac{\partial_{u_i}}{\partial_{x_j}} + \frac{\partial_{u_j}}{\partial_{x_i}}\right)\right] + F \tag{2}$$

where, $\rho$ is the density of the fluid, u is the component of velocity in the respective direction, $\mu$ is the viscosity and F is the force exerted on every fluid particle.

### 3.6.2 Continuity Equation

The principle of mass conservation is a fundamental concept in fluid mechanics and fluid dynamics that governs the behavior of incompressible fluids. This principle is expressed through the Continuity equation, which states that the rate at which mass flows through a system is equal to the rate at which mass is conserved within that system. This equation is widely used in the analysis of incompressible fluid flows and is essential to understanding the behavior of such fluids in a variety of contexts. This equation is valid for both compressible and incompressible fluids and is widely used in the field of computational fluid dynamics (CFD), including in the Ansys CFX software. The Continuity equation is based on the laws of conservation of mass and momentum and is a crucial equation in the understanding and analysis of fluid flow.

The Continuity equation can be expressed in either a conservative or non-conservative form. The conservative formulation postulates that mass is preserved in a closed system, implying that the mass of a system stays constant over time. It also states that the mass flow rate is equal to the product of the volume flow rate and the fluid density. On the other hand, the non-conservative formulation takes into account the idea that mass is not necessarily conserved in an open system. The equation asserts that the mass flow rate can be calculated by multiplying the fluid density by the volume flow rate and the velocity of the fluid. The non-conservative form is generally considered to be more accurate and is more commonly used in computational fluid dynamics.

#### 3.6.2.1 Conservative Form of Continuity Equation

$$\frac{\partial \rho}{\partial t} + \nabla .(\rho \vec{V}) = 0 \tag{3}$$

#### 3.6.2.2 Non-Conservative Form of Continuity Equation

$$\frac{D\rho}{Dt} + \rho \nabla .\vec{V} = 0 \tag{4}$$

where, $\frac{D}{Dt}$ is the total derivative, $\frac{\partial}{\partial t}$ is the partial derivative, ρ is the density of the fluid, $\vec{V}$ is the velocity component of the fluid and ∇ is the divergence.

### 3.6.3 Bernoulli's Equation

The Bernoulli equation is a fundamental equation of fluid mechanics that is based on the law of conservation and energy and can be used to analyze and predict the behavior of fluids. It is often used in the field of aerodynamics, where it can be used to analyze the flow of air around an object. It can also be applied

to a variety of situations involving the flow of liquids and gases. In the Ansys CFX software, the Bernoulli Equation is used to simulate the flow of fluids. This allows for a better understanding of the aerodynamic effects on an object. The Bernoulli equation is a concept in fluid dynamics that explains how fluids behave under the influence of different forces. In particular, it explains how fluid pressure and fluid velocity are related. According to the principles of fluid dynamics, an increase in the velocity of a fluid is accompanied by a decrease in pressure or a reduction in the fluid's potential energy. Additionally, within a closed system, the total of kinetic energy, potential energy, and pressure energy must remain constant. This reflects the conservation of energy, which states that energy cannot be created or destroyed, only converted from one form to another. The Bernoulli equation can be used to calculate the pressure, velocity, and density of fluids in a variety of different situations.

Mathematically, it can be given as,

$$\frac{V^2}{2} + gz + \frac{P}{\rho} = constant \tag{5}$$

where, p is the fluid's pressure, V is its velocity, ρ is its density, g is gravity's acceleration and z is its vertical height above a datum level.

### 3.6.4 k-epsilon Turbulence Model

CFX is a computational fluid dynamics (CFD) software that is used in various industries to simulate and analyze fluid flow. The k-epsilon turbulence model is a highly popular and widely used model for predicting turbulent flow, and it is frequently employed by CFX in its simulations. The k-epsilon turbulence model is a two-equation approach that is used to forecast the energy and dissipation of turbulence in a variety of flow conditions. The versatility of this model makes it a viable choice for a wide range of applications, as it is able to handle laminar and turbulent flows, as well as both incompressible and compressible flows.

The k-epsilon turbulence model is widely utilized in the mechanical engineering domain, specifically for modelling turbulent flow in various applications such as internal combustion engines. Additionally, it is also a very popular choice in computation wind engineering (CWE) applications. The model is based on the idea that the turbulent kinetic energy (k) is transformed into heat (epsilon). It uses the turbulent kinetic energy, k, and the dissipation rate of turbulent kinetic energy, epsilon, to predict the turbulent flow field. The model includes two transport equations, one for k and one for epsilon. It is scale-dependent, meaning that the results will vary depending on the size of the computational domain. The model is suitable for turbulent flows with low to moderate Reynolds numbers.

The model is based on the conservation of mass, momentum and energy and uses the following transport equations.

#### 3.6.4.1 Turbulent Kinetic Energy Equation

$$\frac{\partial(\rho k)}{\partial t} + \frac{\partial(\rho u_i)}{\partial x_i} = -\frac{\partial}{\partial x_j}\left[\frac{\mu_t}{\sigma_k}\frac{\partial_k}{\partial_{x_j}}\right] + 2\mu_t E_{ij}E_{ij} - \rho\varepsilon \tag{6}$$

#### 3.6.4.2 Dissipation Equation

$$\frac{\partial(\rho\varepsilon)}{\partial t} + \frac{\partial(\rho\varepsilon u_i)}{\partial x_i} = -\frac{\partial}{\partial x_j}\left[\frac{\mu_t}{\sigma_\varepsilon}\frac{\partial\varepsilon}{\partial_{x_j}}\right] + C_{1\varepsilon}\frac{\varepsilon}{k}2\mu_t E_{ij}E_{ij} - C_{2\varepsilon}\rho\frac{\varepsilon^2}{k} \tag{7}$$

where, $u_i$ represents velocity component in their respective directions, $E_{ij}$ is the rate of deformation or strain rate, $\mu_t$ represent eddy velocity and $\sigma_\varepsilon, \sigma_k, C_{1\varepsilon}, C_{2\varepsilon}$ are constants.

## 4. Validation with Indian Standards

It is very important to validate the setup of Computational Fluid Dynamics (CFD) in order to ensure that it accurately predicts wind loads on structures. There are various ways to validate a CFD setup, but the most common and widely accepted method is to compare the CFD results with wind tunnel test data. Here, we present a method for validating the CFD setup according to the Indian Standard IS 875 (Part 3): 2015 in order to assess the adequacy of the setup.

Ansys is a computer-aided engineering software that is used for simulating various engineering processes, including fluid dynamics. A crucial aspect of any CFD simulation is the mesh, which represents the discretization of the continuous domain into a collection of small, discrete volumetric elements. The quality of the mesh is crucial to the accuracy and convergence of the simulation results. For this reason, it is important to ensure that the mesh meets certain quality standards. There are various measures of mesh quality, and the recommended values for each measure depend on the type of simulation being performed. In general, a high-quality mesh will have smaller elements near areas of high curvature or high gradient and larger elements in areas of low curvature or gradient. To accurately simulate the flow of a fluid around an object, a mesh with appropriate resolution is essential. The mesh should be refined enough to capture the details of the flow, but not so much that it results in excessively long computational times. In addition, the mesh should be as regular as possible to minimize errors and increase the efficiency of the computation.

To ensure the reliability of our outcomes, we implemented a validation model with identical internal and external dimensions and mesh settings as the flow configuration under investigation. This allowed us to verify the accuracy of our simulations by comparing the results from the validation model with those from the flow setup under investigation. To determine the appropriate size for our domain, we consulted a reference [32] on using CFD in wind engineering, which provided guidelines on this topic. This allowed us to make informed decisions about the dimensions of our domain. To ensure a consistent flow of air through the wind tunnel, we positioned the inlet and outlet faces a specific distance away from the structure. The inlet was located 5H away, while the outlet was situated 15H away. This helped to create a controlled environment for our tests. In order to allow for a sufficient flow of air around the building, we set the side and top clearance to 5H. This value was based on the height of the structure, which was 0.025 meters. By maintaining this clearance, we were able to ensure that the flow of air was not obstructed during our tests. The values for the dimensions of the domain can be found in Table 1.

**Table 1.** Values of dimension for wind flow domain for validation model in Ansys

| Inlet | Outlet | Side Clearance | Height | Number of Inflation Layers |
|---|---|---|---|---|
| 1350 mm | 3850 mm | 1450 mm | 1500 mm | 5 |

To ensure an accurate representation of the building in our simulations, we carefully considered the mesh size we used. For the front of the building, we set the mesh size to 0.0125 meters, while the mesh size near the edges of the building was increased to 0.0250 meters. This helped us to capture the details of the building's surface and its interactions with the surrounding air flow, as shown in **Fig. 4**. The mesh size for the domain ground was set to 0.05 m.

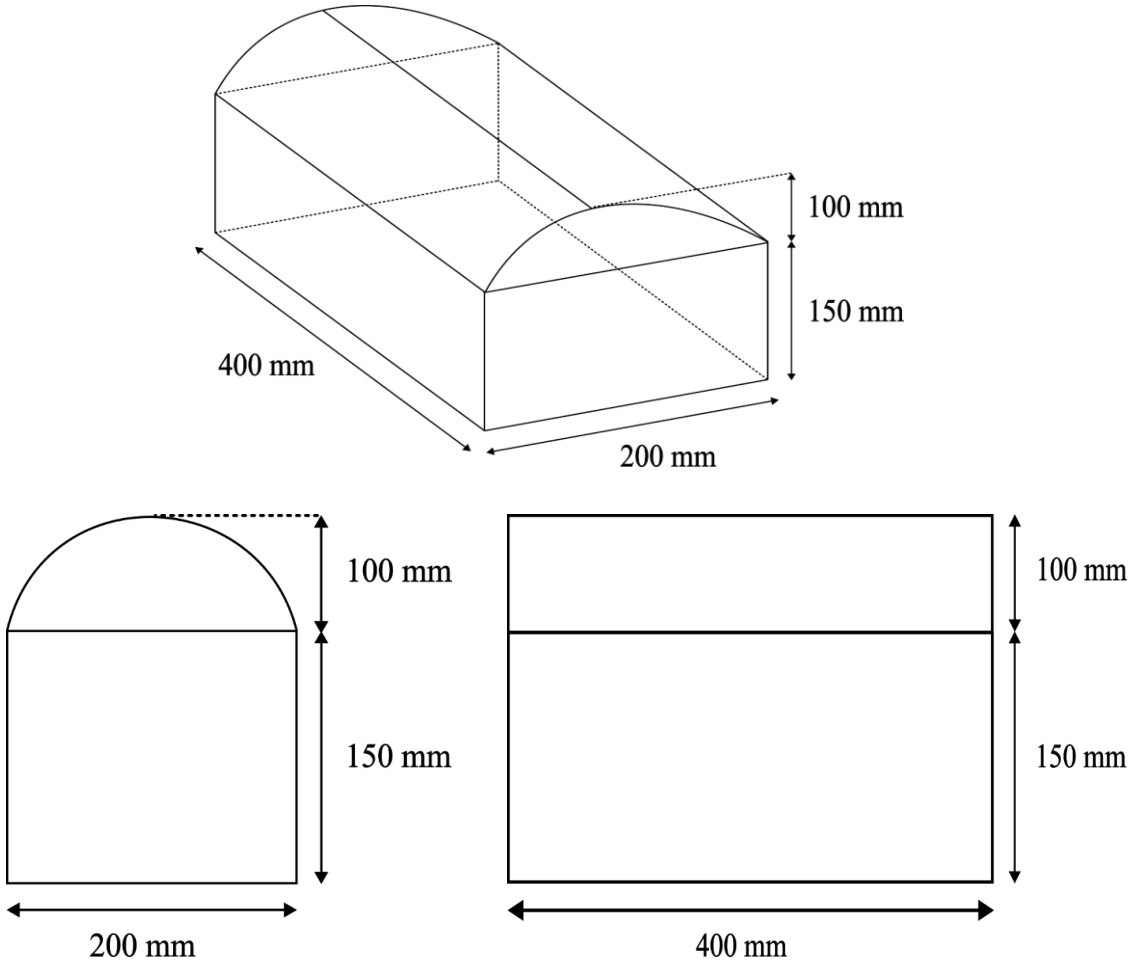



**Fig. 4.** Validation Model

Therefore, it is very important to have an understanding of these mesh metrics in order to produce accurate results from simulations. There are four main types of mesh metrics: cell count, aspect ratio, orthogonality, and skewness.

Cell count is a measure of the number of cells per unit volume in a simulation and determines the level of resolution at which a problem is solved. A high cell count will result in more accurate results, but a higher cell count will also increase the computational time and disk space requirements. Thus, an appropriate cell count depends on the problem being solved and the available resources. To accelerate the simulation for transient flow problems, a smaller number of grid cells should be utilized in order to decrease the computational load. Conversely, a high cell count can be used for steady-flow problems to minimize wall penetration. Most problems use medium cell counts in the range of 20-40 million cells. In a simulation, the aspect ratio is a geometric property of the cell, defined as the ratio of the largest dimension to the smallest dimension along a particular axis of a cell. It is a measure of the cell's shape and size, and it can affect the accuracy and convergence of the simulation results. Aspect ratios less than 2 usually result in a more accurate solution because the resulting meshes have fewer cells near the boundaries and are therefore less likely to suffer from boundary effects. In Ansys CFX, one can adjust an aspect ratio by changing the number of sides (or vertices) per side in their model file.

The term orthogonality is used to describe the relationship between two vectors. It is a mathematical concept which describes how points in space are related to each other. In this case, it refers to the relationship between mesh and material properties such as density, temperature or pressure. The result of using an incorrect value for these parameters can lead to poor quality meshes that fail to represent the physical phenomenon being modelled correctly. The orthogonality checkbox in Ansys CFX allows to

specify whether a mesh should be created with or without orthogonalization of its elements (i.e., whether it should be linearized).

The skewness metric is a measure of the deviation from symmetry in an object. It is calculated by taking the absolute value of the difference between two angles and dividing it by 2p (where p is equal to 360 degrees). The result will be positive if the angle that has been measured deviates more than twice as much as the other angle, or negative if it deviates less than twice as much. A high value for Skewness indicates that objects are not symmetrical and will have poor mesh quality.

There are many other factors to consider when generating a high-quality mesh, but in this section, we will focus only on recommended values by ANSYS (ANSYS Meshing User's Guide, Release 13.0. Canonsburg: ANSYS, Inc., 2010., n.d.). In order to ensure the accuracy of our simulations, we used a mesh that had excellent characteristics. Specifically, the average skewness value of the mesh was 0.34, while the average orthogonal quality was 0.76. Both of these values were within the "very good" range, indicating that the mesh was well-suited for our purposes. Additionally, in order to create a realistic simulation of wind flow, we made sure that none of the elements in our mesh fell into the "bad" or "unacceptable" range for either skewness or orthogonal quality. This helped to ensure that the flow of wind was uniform and consistent. During the simulation, the wind was directed perpendicular to the longitudinal axis of the model, which is equivalent to a 0° wind incidence according to the guidelines outlined in IS 875 (Part 3): 2015. By comparing the results in Table 2 with the values given in Table 18 of the IS 875, an average percentage error of 7.4% was measured for the whole roof.

**Table 2.** Validation of CFD setup according to IS 875 (Part 3): 2015

| Wind Incidence Angle | Average value of $C_{pe}$ for roof from CFD simulation | Average value of $C_{pe}$ for roof as per IS 875 (Part 3): 2015 | Percentage Error |
|---|---|---|---|
| 0 | -1.28896 | -1.2 | -7.4 |

As wind flows past the sharp edges of the bluff body, it creates high and strong negative pressure at the top of the roof. The CFD simulations accurately depict the pressure variations, resulting in a slightly higher average suction $C_{pe}$. After comparing our results to the guidelines provided in IS 875, we found that there was a difference of 0.08896 in the $C_{pe}$ values. Despite this discrepancy, the results of our validation model met the requirements set forth in the code. As a result, we used the same meshing and boundary setup (as shown in Fig. 5) in the simulations conducted in this study. This helped us to ensure the consistency and accuracy of our results.

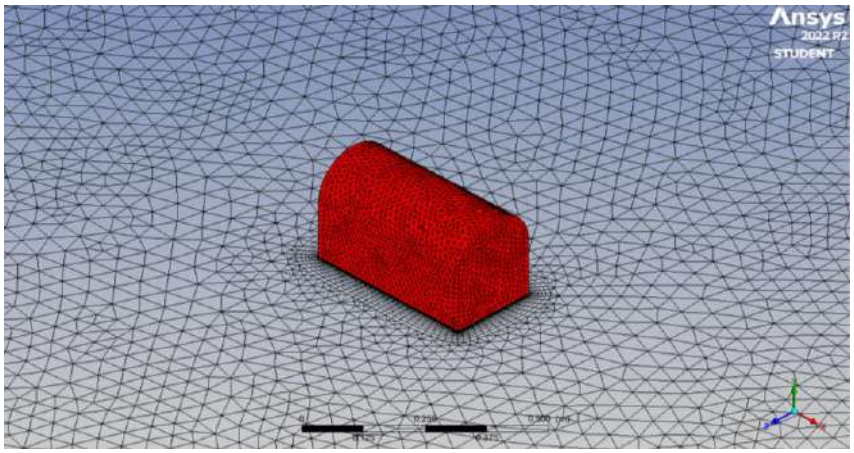



**Fig. 5.** Mesh diagram of Validation Model

## 5. Results and Discussion

A study on the pressure distribution on single-span and multi-span low-rise buildings with canopy roof surface was conducted with varying apex heights of 10 mm, 20 mm, and 30 mm.

In low-rise buildings with a curved canopy roof spanning a single span, when wind blew perpendicular to the long edge of the structure, a region of negative pressure was generated at the windward edge of the top roof surface. This suction gradually decreased as one moved towards the leeward edge.

From Table 3, it can also be seen that the edges of the surface facing the direction of the wind experienced the highest negative pressure (suction) ($C_{pe} = -0.4138$) for the 10 mm apex height model at 30°, while the 20 mm apex height model experienced the highest suction pressure ($C_{pe} = -0.3756$) at 0° and the 30 mm apex height model ($C_{pe} = -0.4845$) at 0°. Based on this, it can be concluded that the suction pressure distribution on the surface of a single-span low-rise building with a curved canopy roof is significantly affected by the height of the apex of the roof.

One can observe a gradual increase in positive pressure on the top surface as the angle of wind incidence increased from 0° to 90° in the model having a 10 mm apex height. On the other hand, the positive pressure on the bottom surface decreased gradually while the wind incidence angle increased from 0° to 90° in the model with a 10 mm apex height.

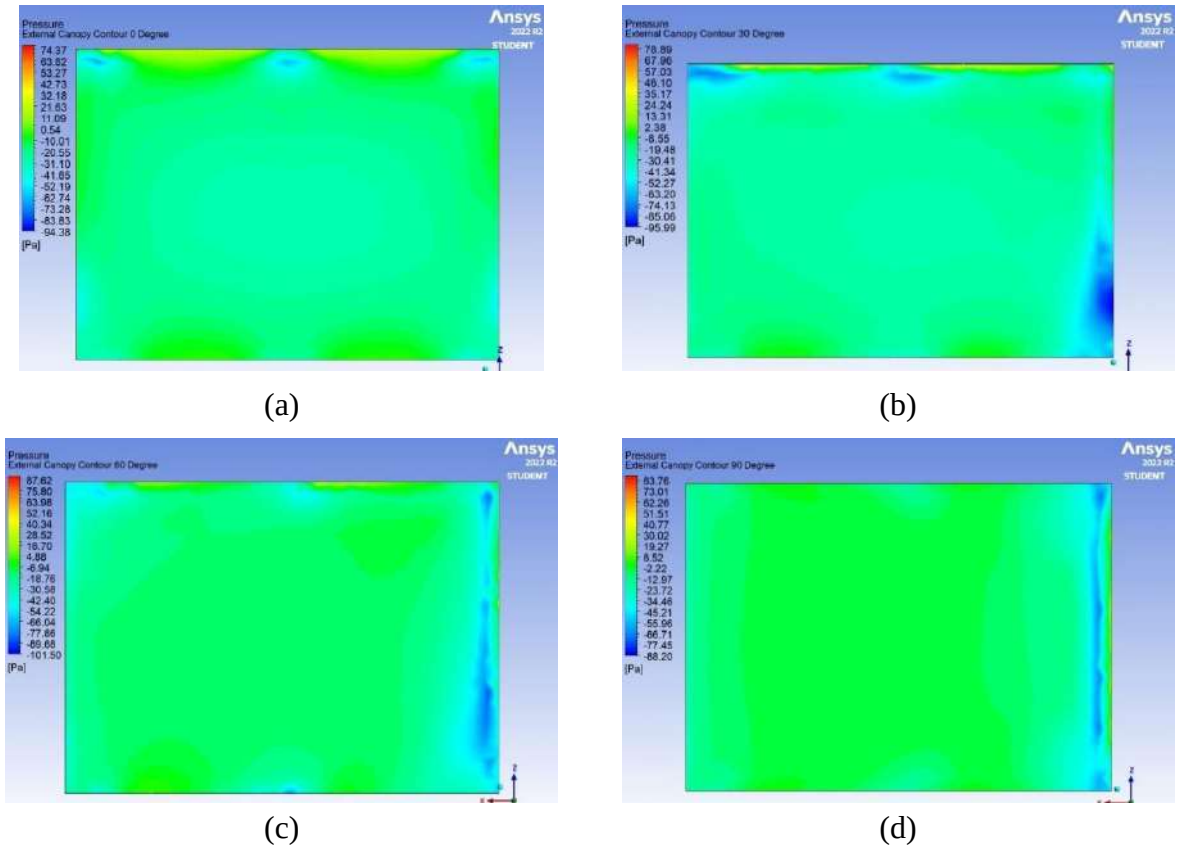
At 90° for all three models, a very low value of negative suction pressure developed. It was also observed that as the apex height of the models increased, the suction pressure experienced at the topmost point of the top surface (exterior contour) increased. This indicates that higher apex heights can provide greater resistance to wind loads and other aerodynamic forces. The pressure contours for single-span low-rise structures having varying apex heights are represented in Fig. 6-11. The velocity streamlines for single-span low-rise structures having varying apex heights are represented in Fig. 12.

The information regarding the aerodynamic effects is crucial for the design and construction of multi-span low-rise structures with curved canopy roofs of different apex height. They also indicate that the presence of a curved canopy roof on multi-span low-rise structures has a significant effect on the aerodynamic forces acting on the structure. The results for coefficient of pressure for multi-span models having varying apex heights has been represented in Table 4-6.

The model with a 10 mm apex height showed that the highest positive pressure was observed at the junction of different roofs. On the upper surface, maximum coefficient of pressure was observed at 30° on the first and third roof on the windward side, and at 60° on the second roof. The highest magnitude of suction pressure occurred at the top of the first roof. Suction pressure was observed on the lower surface at 90°, while the maximum coefficient of pressure was observed on all roofs at 0°. The positive pressure magnitude decreased gradually from the windward to the leeward side.

The model with 20 mm apex height showed similar results as the 10 mm apex height model, with the highest positive pressure observed at the junction of different roofs and maximum coefficient of pressure observed at 30° on the first and third roof on the windward side and at 60° on the second roof. However, the magnitude of positive pressure and suction pressure was slightly higher compared to the 10 mm apex height model.

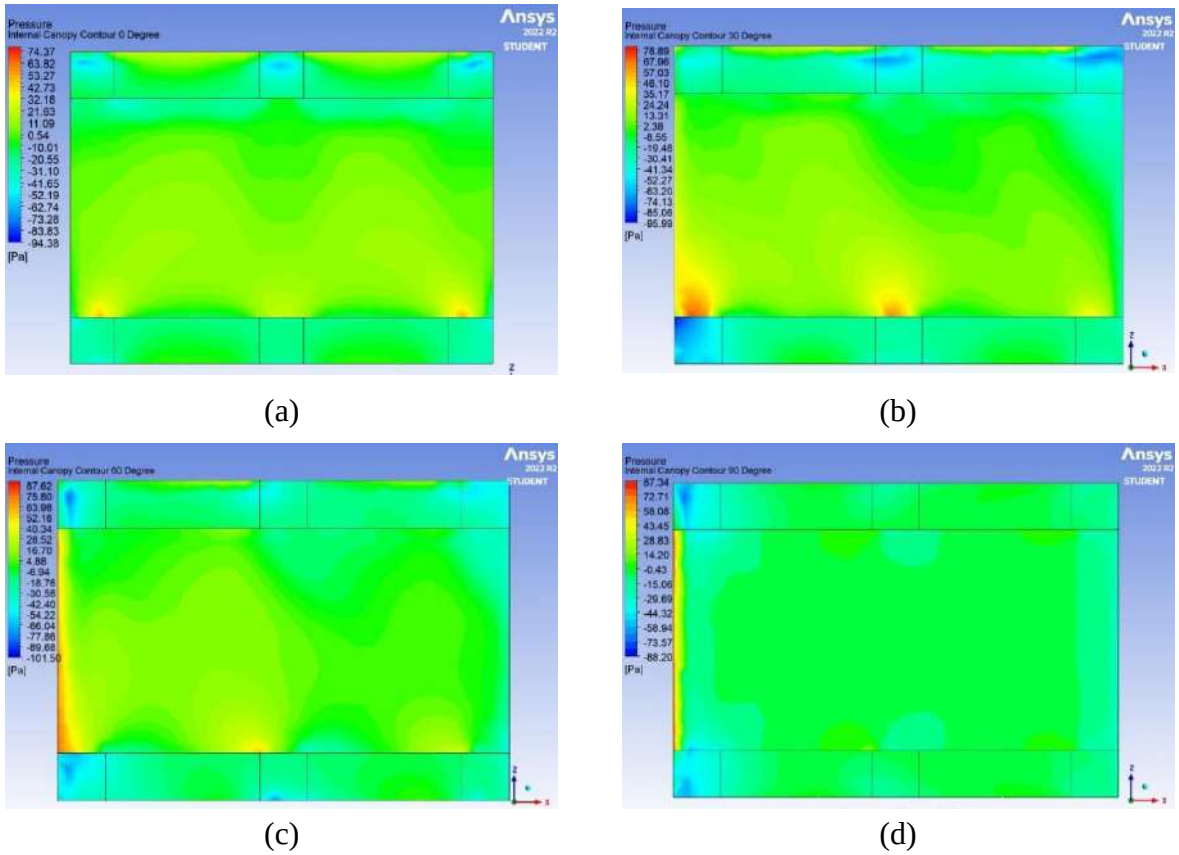
The model with the 30 mm apex height showed a different pattern in the distribution of aerodynamic forces compared to the other two models. The highest positive pressure was still observed at the junction of different roofs, but the maximum coefficient of pressure on the upper surface was observed at 0° on the first roof on the windward side and at 30° on the second and third roof on the windward side. At the wind incidence angle of 0°, the entire lower roof experienced positive pressure, and its magnitude reduced from the windward to the leeward side.




(a) (b)

(c) (d)

**Fig. 6.** External pressure contours for single-span low-rise structure having apex height of roof as 10 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.




(a) (b)

(c) (d)

**Fig. 7.** Internal pressure contours for single-span low-rise structure having apex height of roof as 10 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.

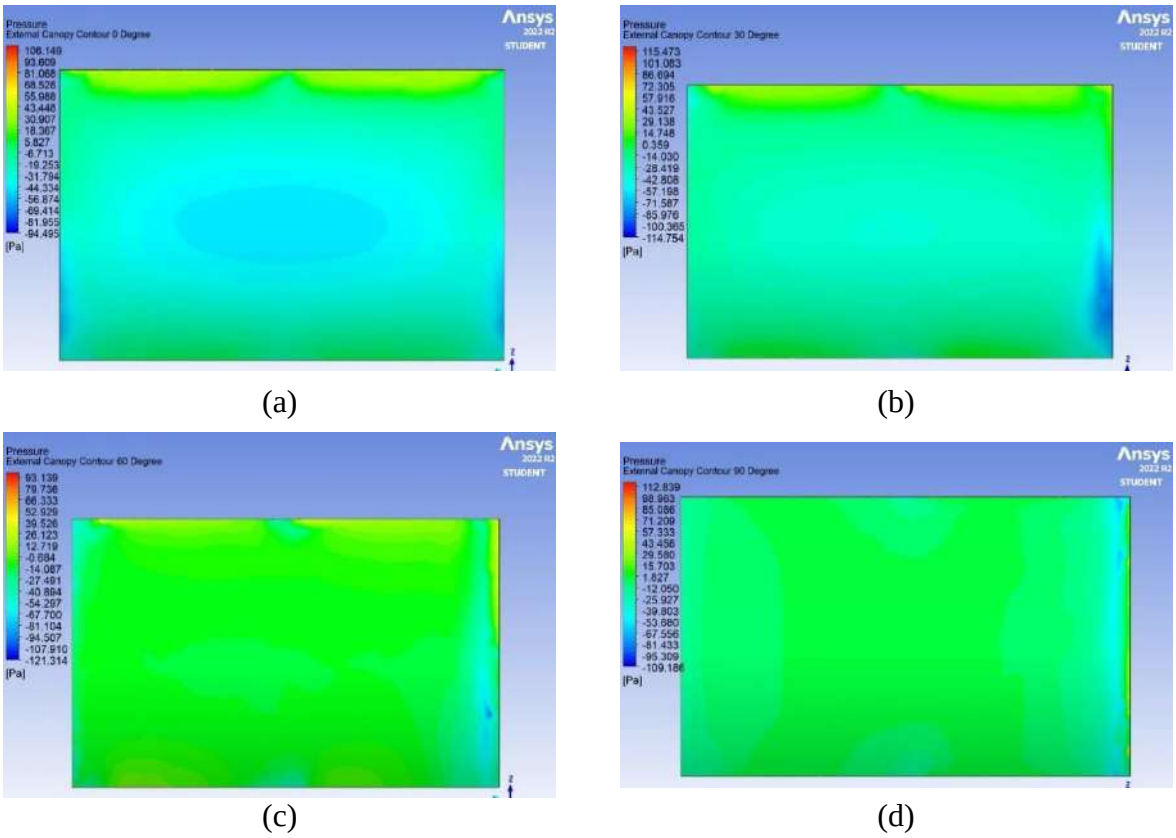



**Fig. 8.** External pressure contours for single-span low-rise structure having apex height of roof as 20 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.

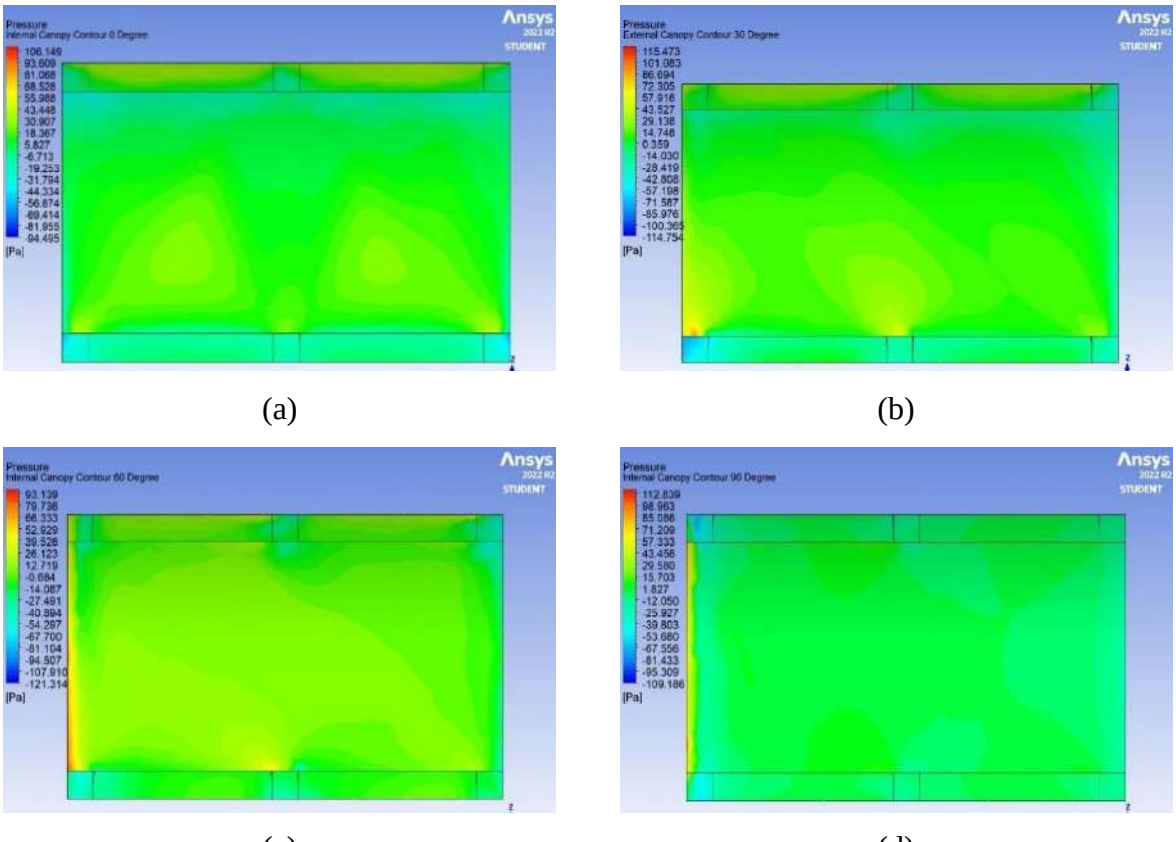
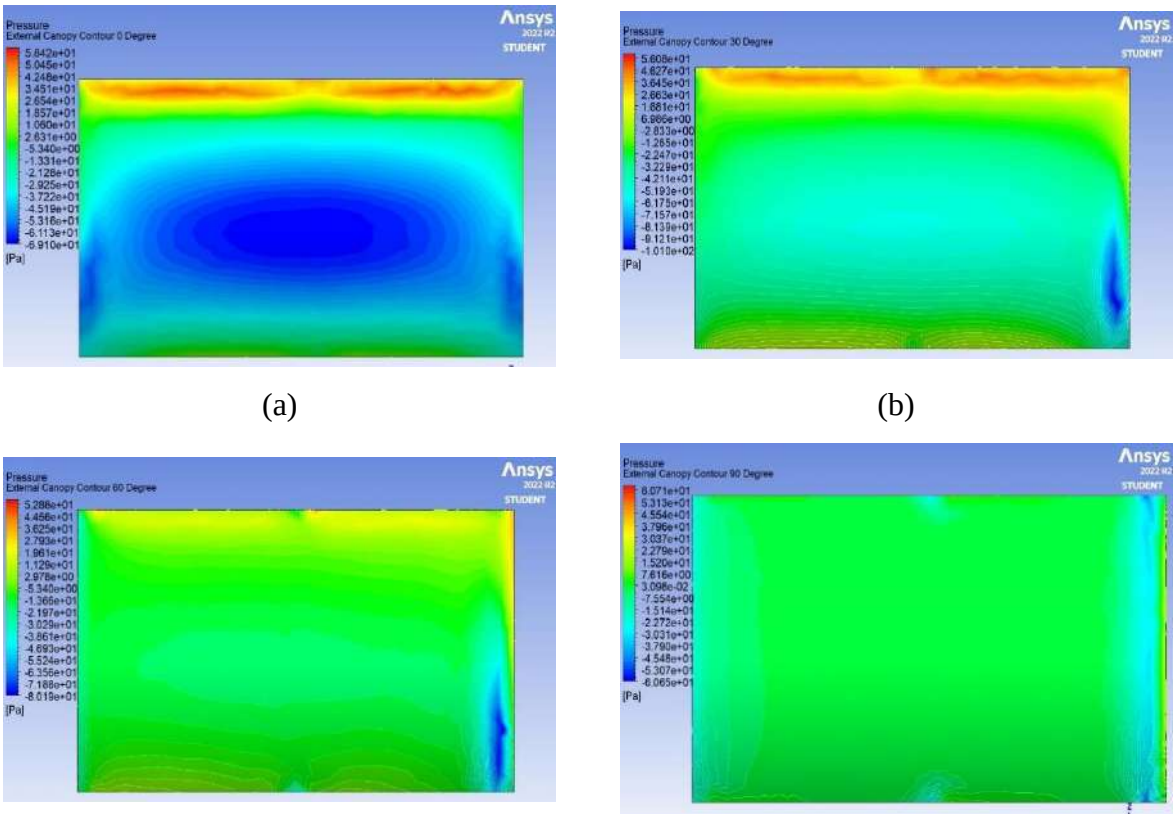


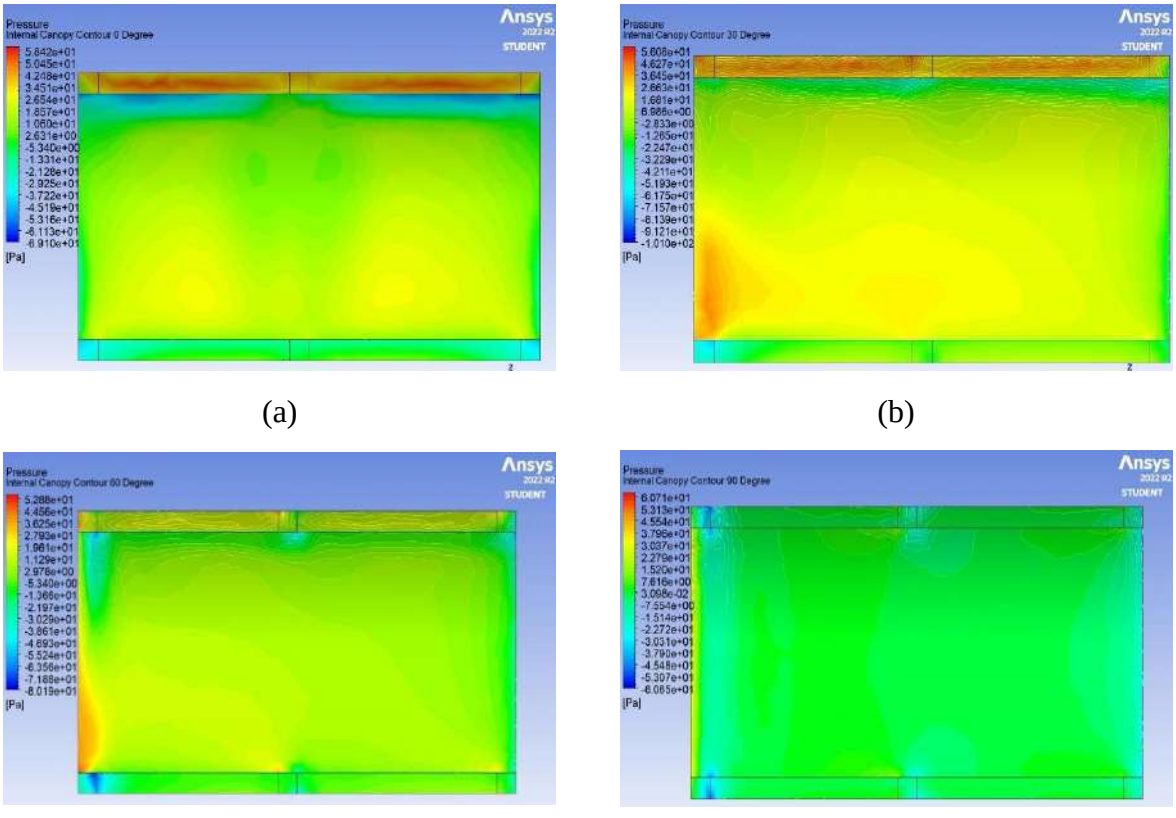

**Fig. 9.** Internal pressure contours for single-span low-rise structure having apex height of roof as 20 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.




(a) (b)

(c) (d)

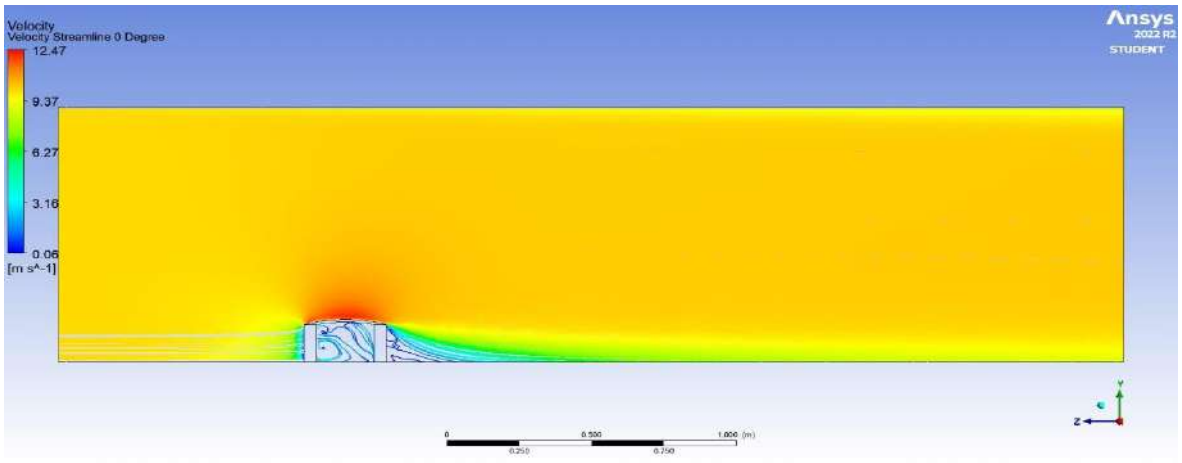
**Fig. 10.** External pressure contours for single-span low-rise structure having apex height of roof as 30 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.



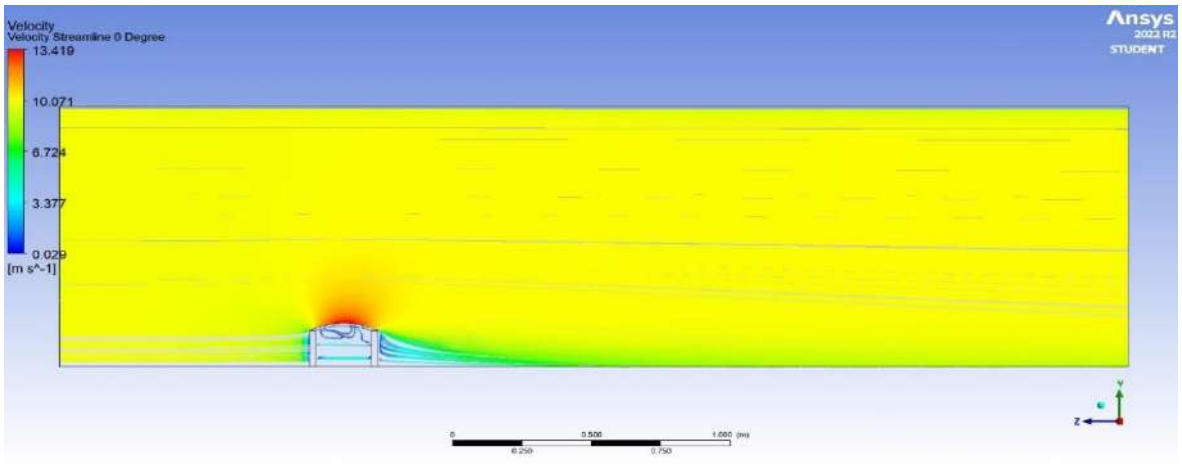

(a) (b)

(c) (d)

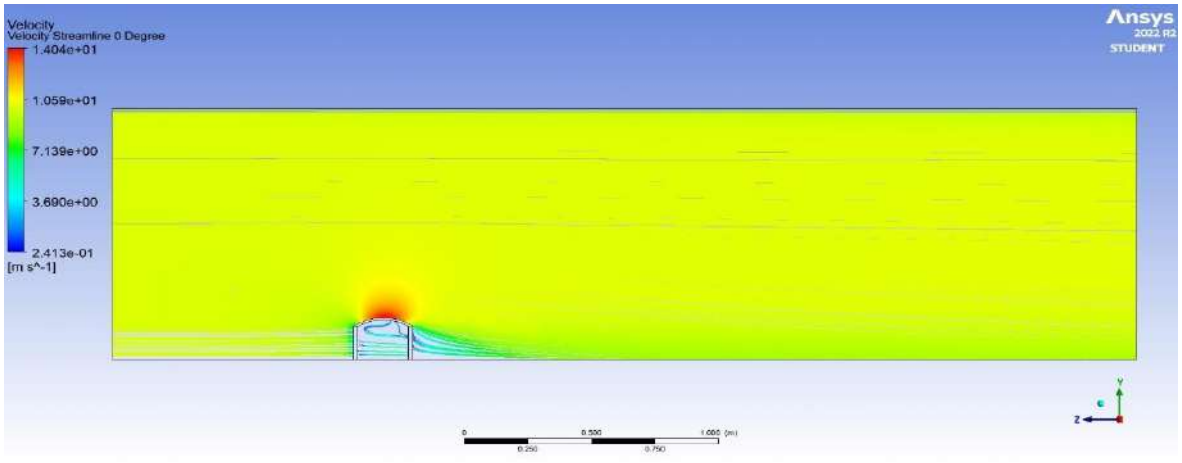
**Fig. 11.** Internal pressure contours for single-span low-rise structure having apex height of roof as 30 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.




(a)

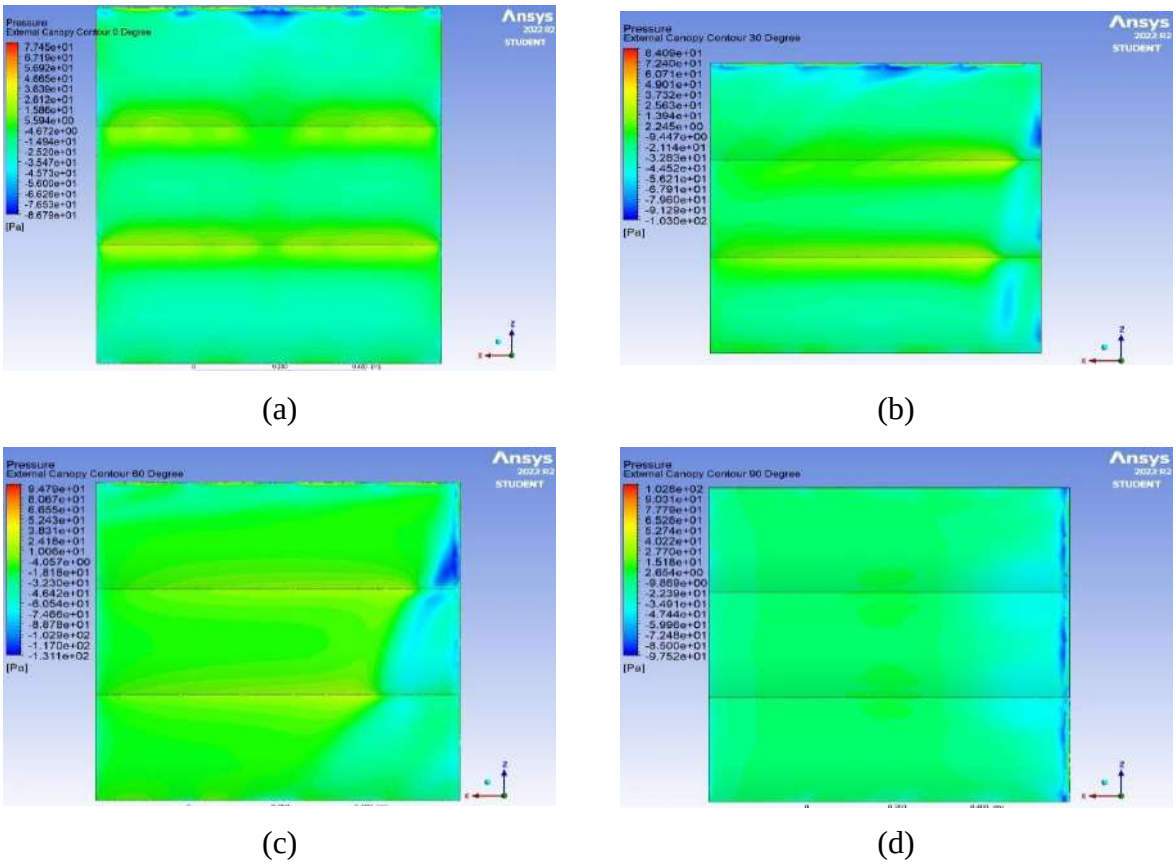



(b)




(c)

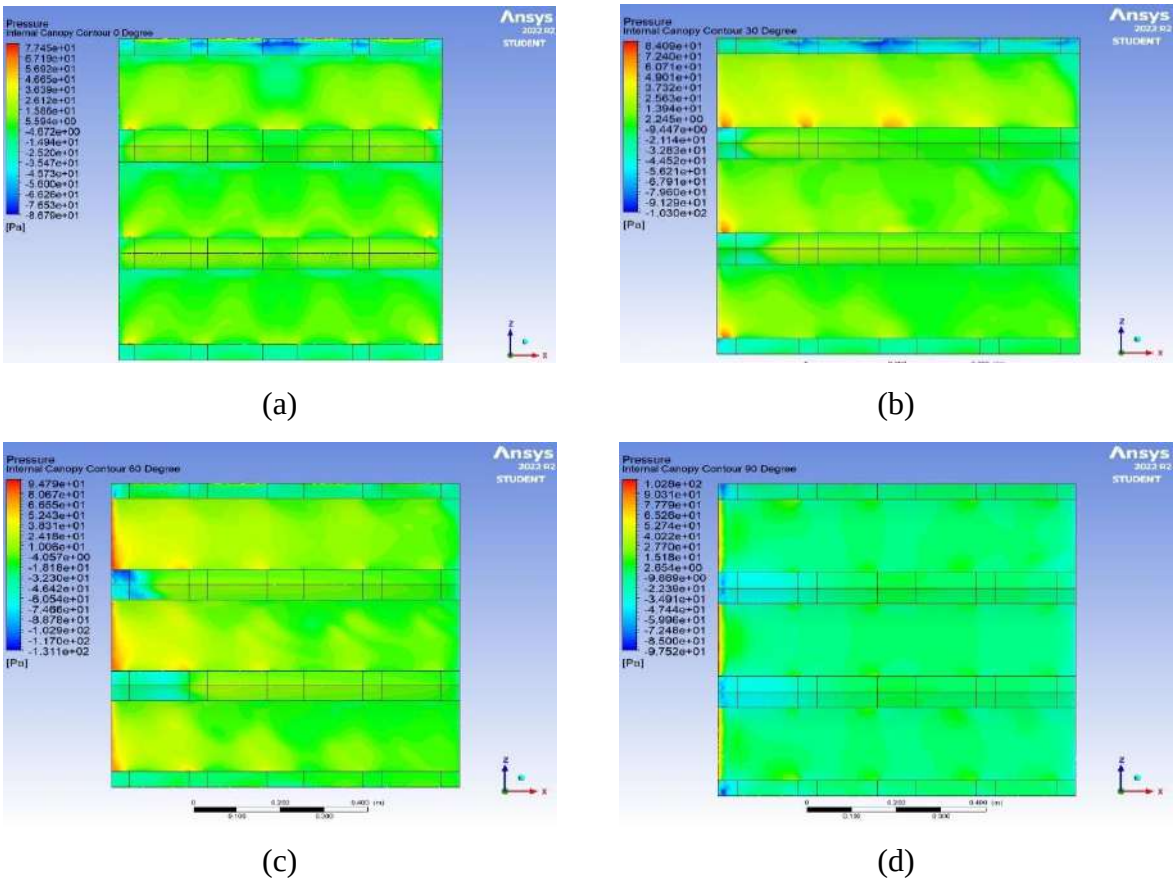
**Fig. 12.** Velocity streamlines for single-span low-rise structures. (a) 0° wind incidence, 10 mm apex height model, (b) 0° wind incidence, 20 mm apex height model, (c) 0° wind incidence, 30 mm apex height model.




(a) (b)

(c) (d)

**Fig. 13.** External pressure contours for multi-span low-rise structure having apex height of roof as 10 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.




(a) (b)

(c) (d)

**Fig. 14.** Internal pressure contours for multi-span low-rise structure having apex height of roof as 10 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.

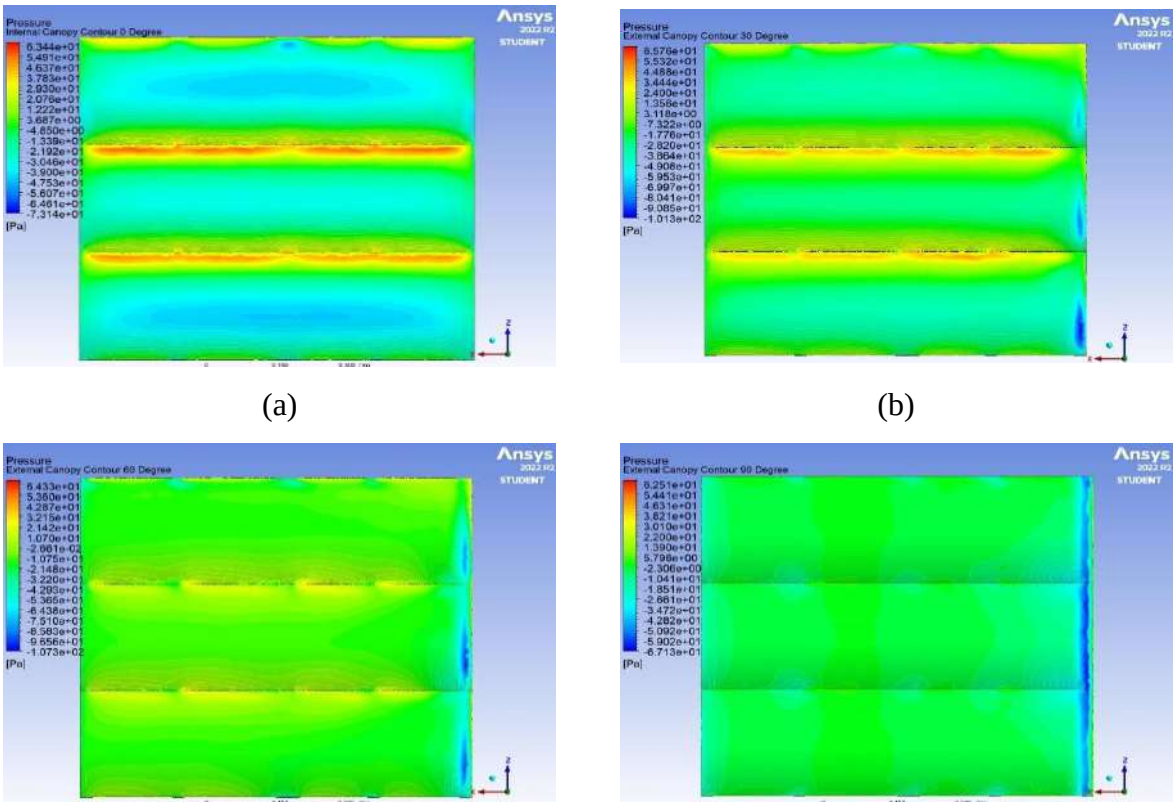



**Fig. 15.** External pressure contours for multi-span low-rise structure having apex height of roof as 20 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.

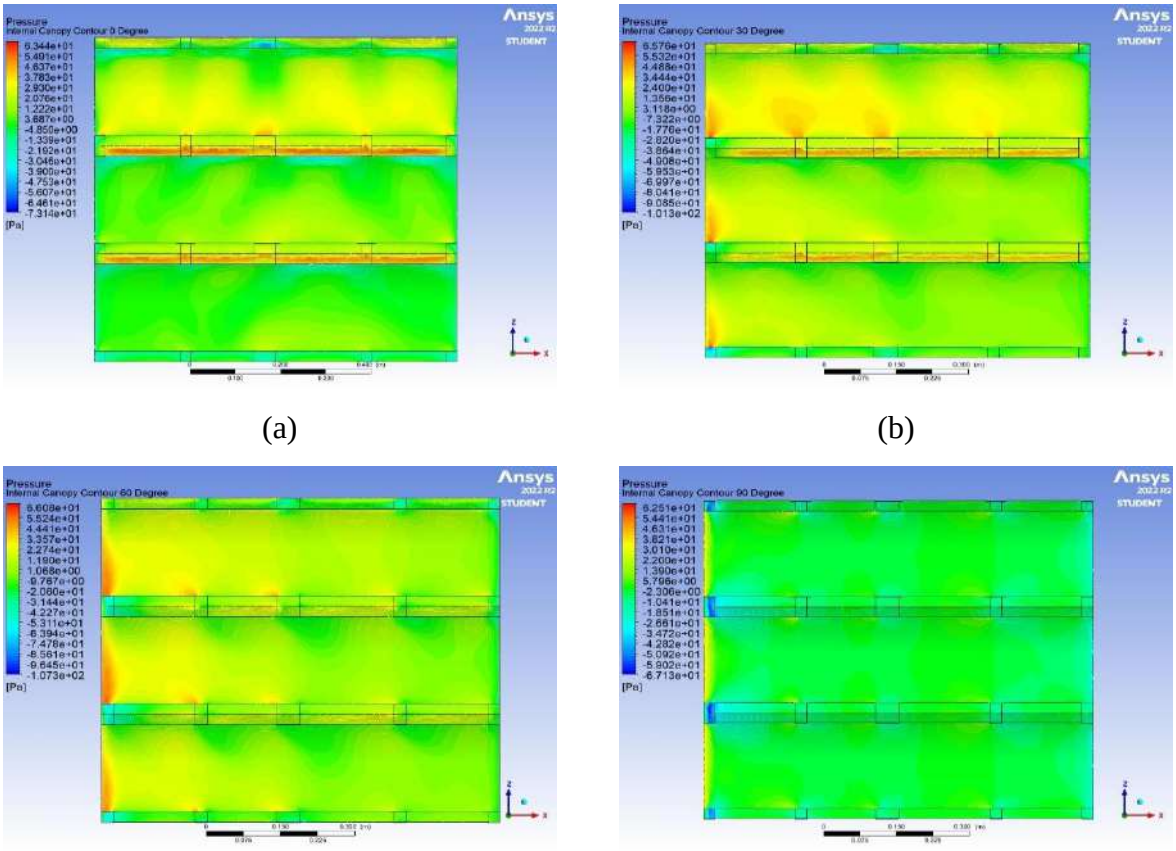
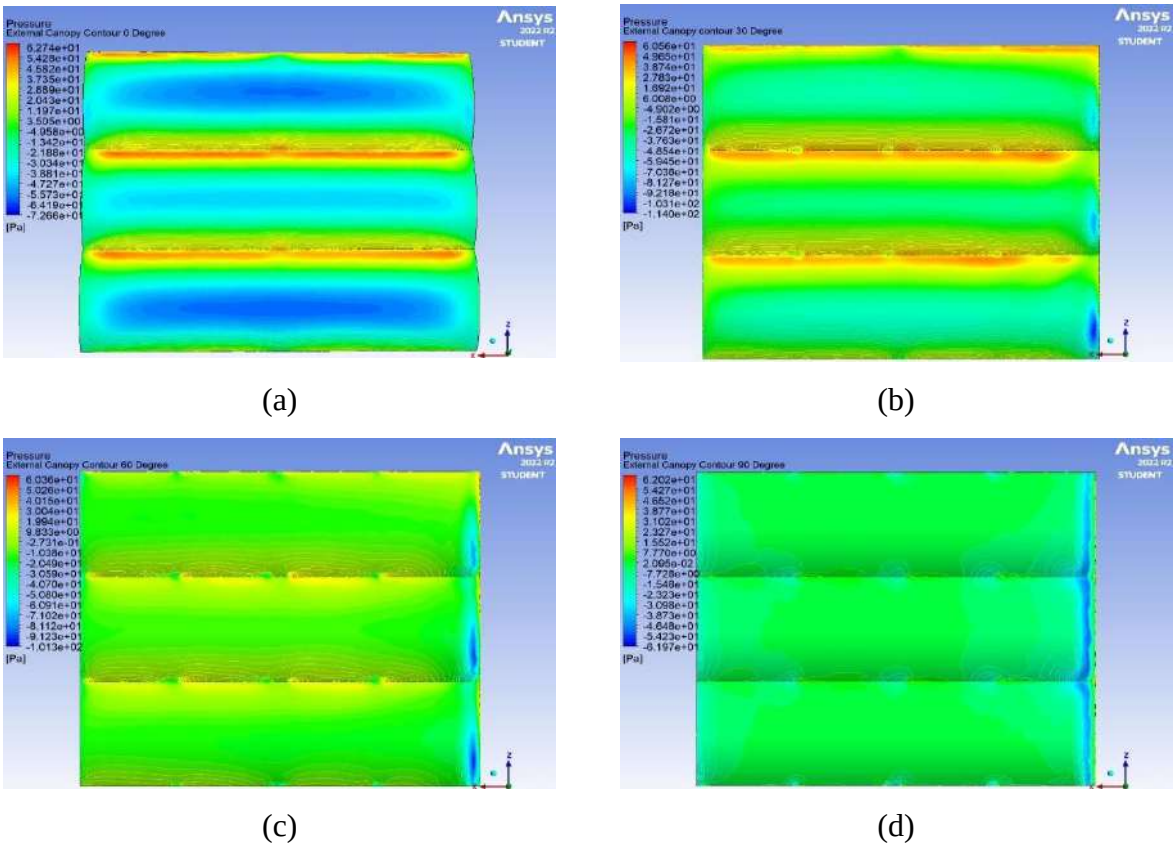


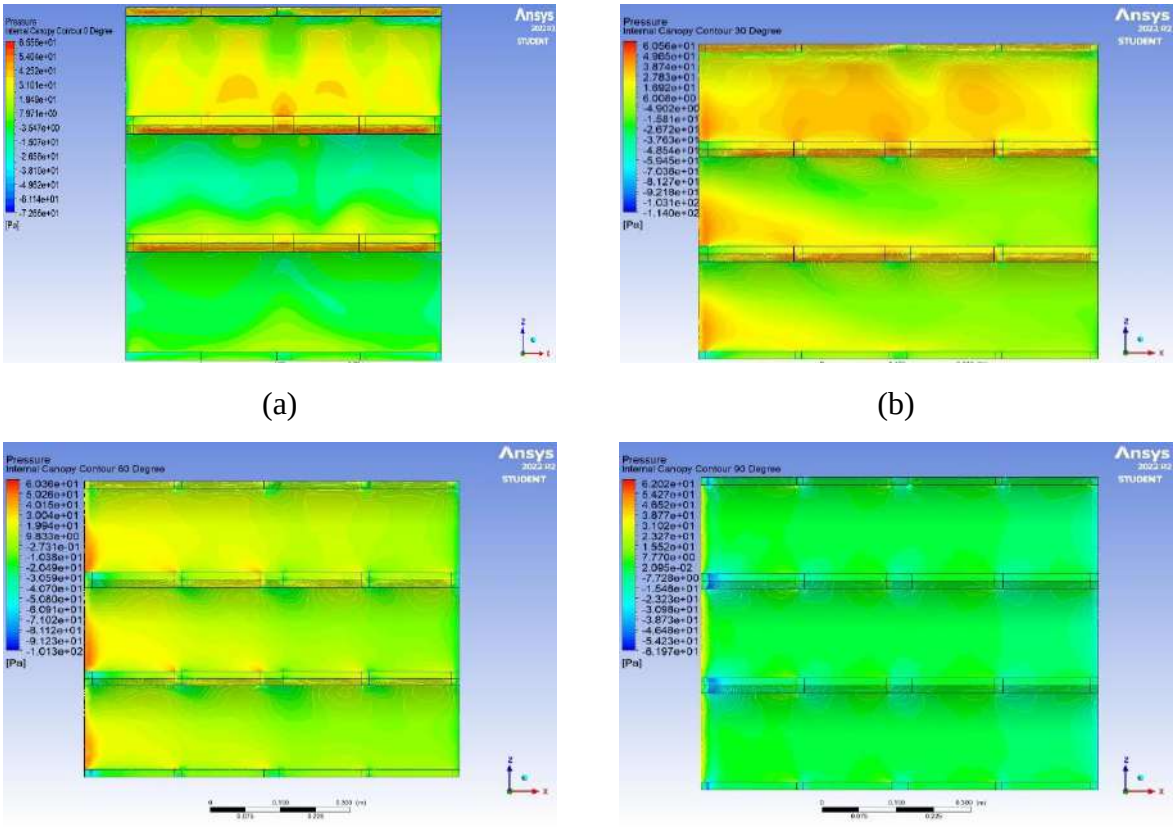

**Fig. 16.** Internal pressure contours for multi-span low-rise structure having apex height of roof as 20 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.




(a) (b)

(c) (d)

**Fig. 17.** External pressure contours for multi-span low-rise structure having apex height of roof as 30 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.




(a) (b)

(c) (d)

**Fig. 18.** Internal pressure contours for multi-span low-rise structure having apex height of roof as 30 mm. (a) 0° wind incidence, (b) 30° wind incidence, (c) 60° wind incidence, (d) 90° wind incidence.

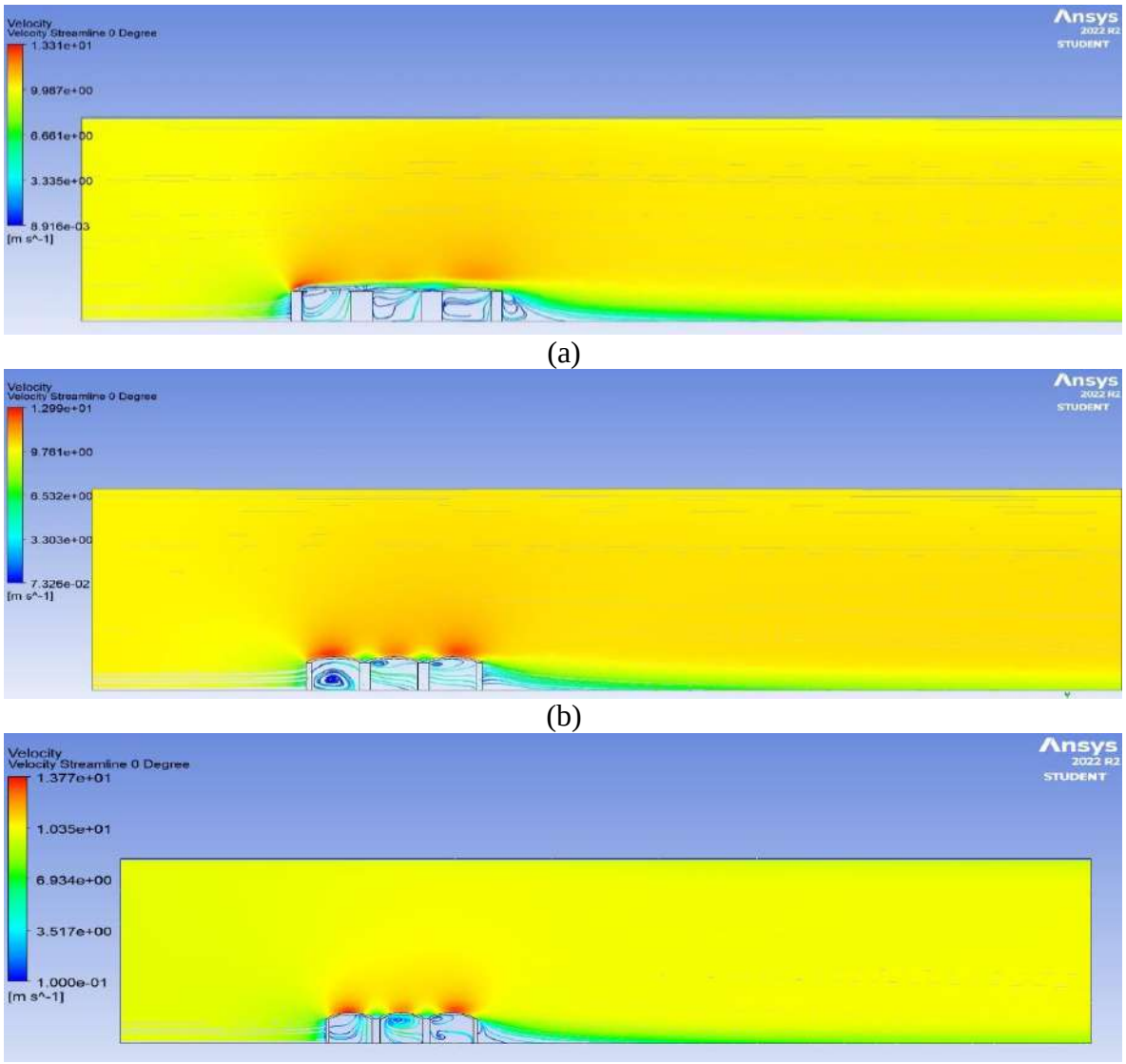
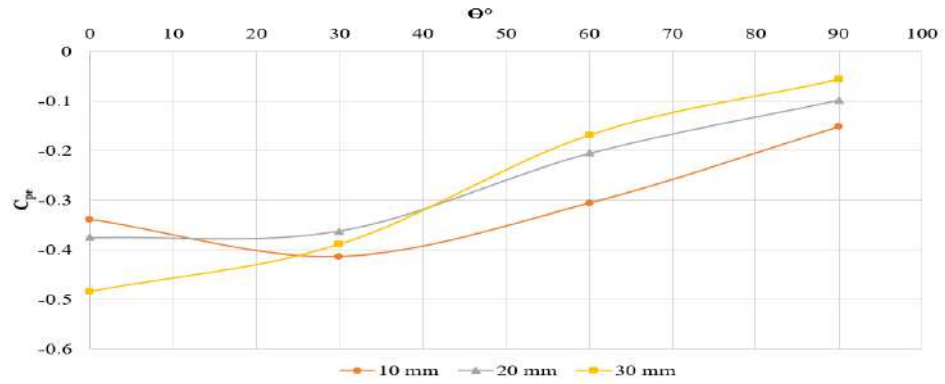



**Fig. 19.** Velocity streamlines for multi-span low-rise structures. (a) 0° wind incidence, 10 mm apex height model, (b) 0° wind incidence, 20 mm apex height model, (c) 0° wind incidence, 30 mm apex height model.

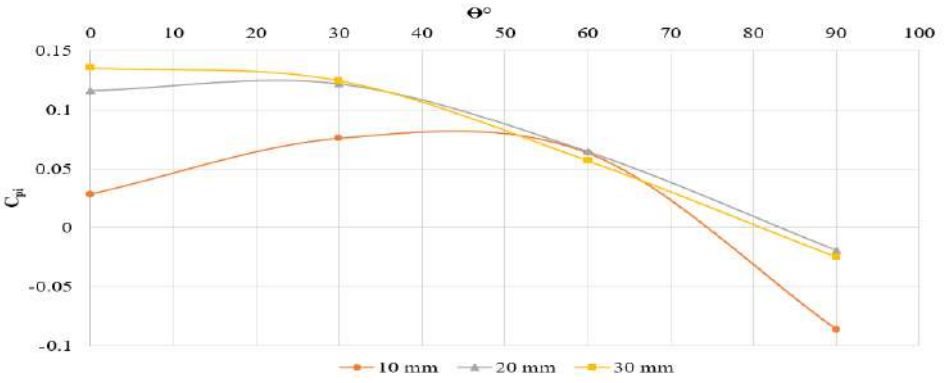
Overall, the results showed that the apex height of the roof increased, the suction pressure experienced at the top of the first roof also increased. On the lower surface, the magnitude of positive coefficient of pressured increased with increasing apex height. The top surface of the roof experienced suction pressure at all incidence angles, while the lower surface generally experienced positive pressure. In the 20 mm apex height model, the third roof of the building started experiencing suction pressure at 0°. In the model with the 30 mm apex height, both the second and third roofs of the building experienced suction pressure at a wind incidence angle of 0°. The pressure contours for multi-span low-rise structures having varying apex heights are represented in Fig. 13-18. The velocity streamlines for multi-span low-rise structures having varying apex heights are represented in Fig. 19.

In our research, we also plotted the coefficient of pressure against the wind incidence angle for single-span and multi-span low-rise structures with apex heights of 10 mm, 20 mm, and 30 mm. The findings from these graphs, represented in Fig. 20-23, are consistent with the results obtained from the pressure contours and the table.

All these findings have important implications for the design and construction of single-span and multi-span low-rise structures with curved canopy roofs.

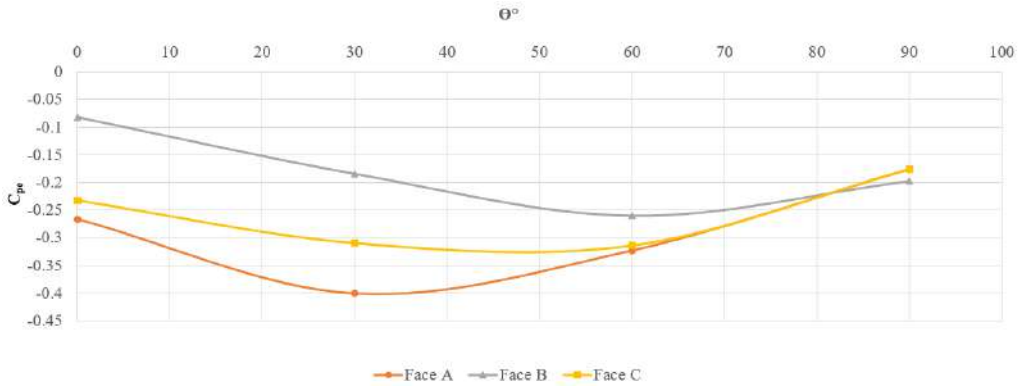



(a)

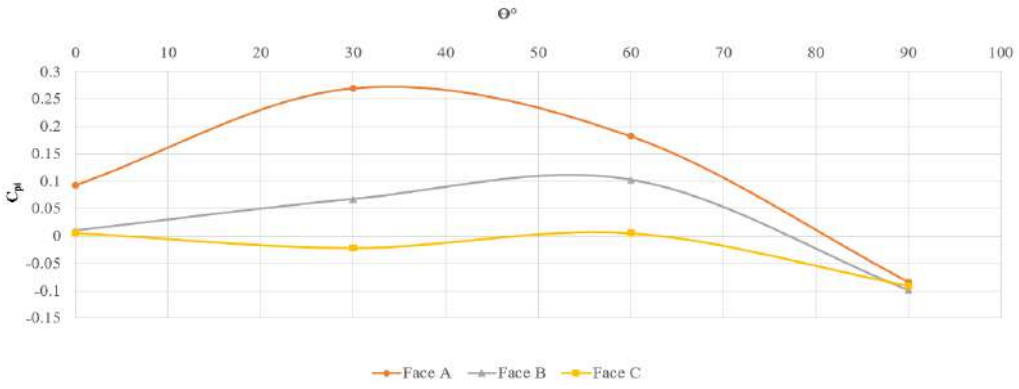



(b)

**Fig. 20.** Graphs for coefficient of pressure ($C_p$) v/s wind incidence angle (θ°) for single-span low-rise structure models having varying apex heights. (a) For external contour, (b) for internal contour.




(a)




(b)

**Fig. 21.** Graphs for coefficient of pressure ($C_p$) v/s wind incidence angle (θ°) for multi-span low-rise structure model having apex height as 10 mm. (a) For external contour, (b) for internal contour.

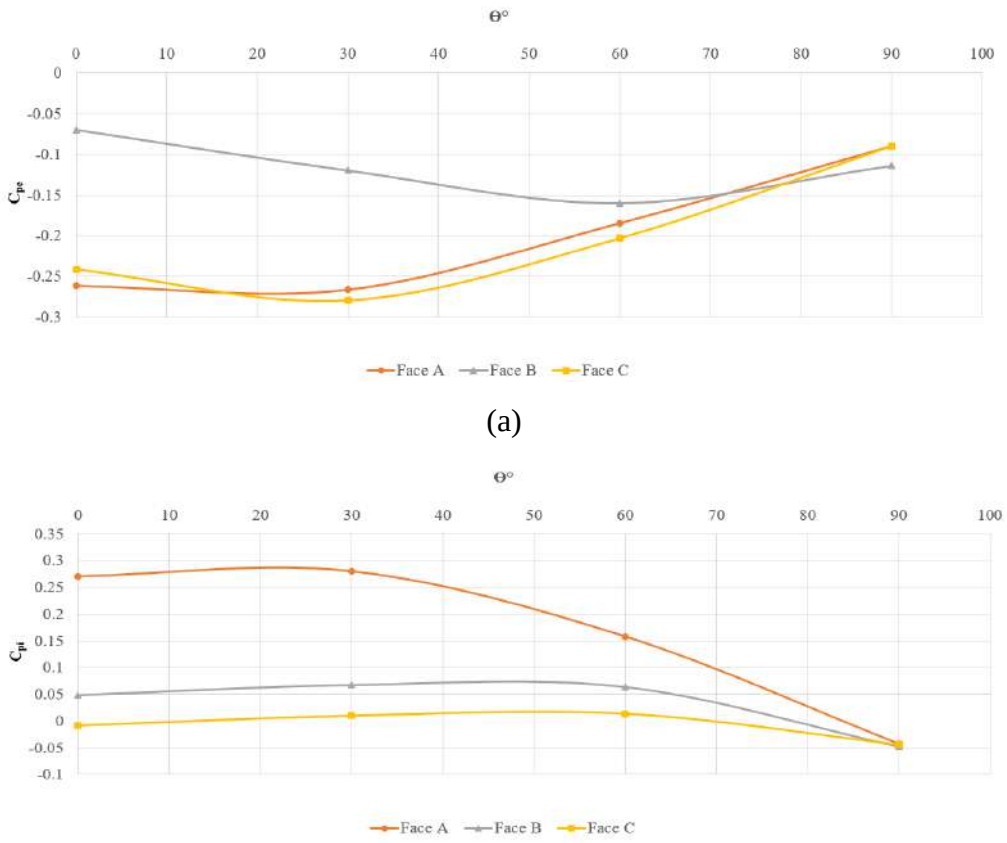



**Fig. 22.** Graphs for coefficient of pressure ($C_p$) v/s wind incidence angle (θ°) for multi-span low-rise structure model having apex height as 20 mm. (a) For external contour, (b) for internal contour.

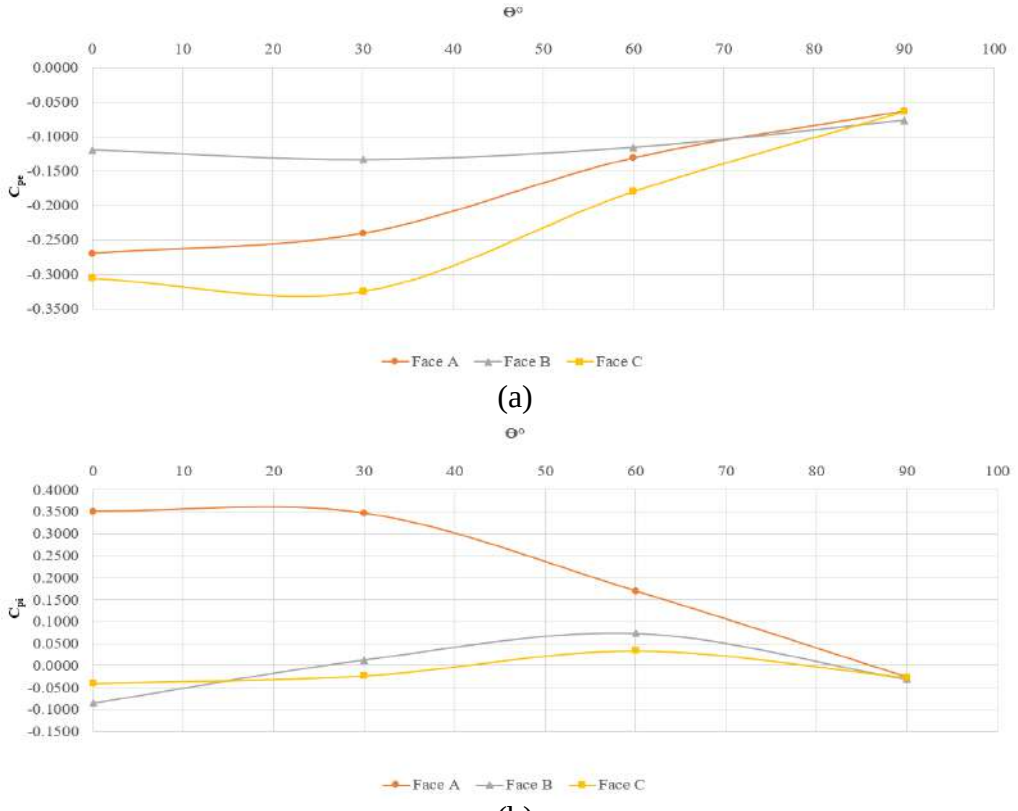



**Fig. 23.** Graphs for coefficient of pressure ($C_p$) v/s wind incidence angle (θ°) for multi-span low-rise structure model having apex height as 30 mm. (a) For external contour, (b) for internal contour.

**Table 3.** $C_p$ values for single-span models having varying apex heights

| Angle of Incidence of Wind | $C_{pe}$ (External Contour) | $C_{pi}$ (Internal Contour) |
|---|---|---|
| Apex Height of Roof as 10 mm | | |
| 0° | -0.3383 | 0.0285 |
| 30° | -0.4138 | 0.0760 |
| 60° | -0.3060 | 0.0635 |
| 90° | -0.1508 | -0.0865 |
| Apex Height of Roof as 20 mm | | |
| 0° | -0.3756 | 0.1165 |
| 30° | -0.3619 | 0.1223 |
| 60° | -0.2051 | 0.0646 |
| 90° | -0.0973 | -0.0192 |
| Apex Height of Roof as 30 mm | | |
| 0° | -0.4845 | 0.1358 |
| 30° | -0.3890 | 0.1249 |
| 60° | -0.1687 | 0.0568 |
| 90° | -0.0561 | -0.0251 |

**Table 4.** $C_p$ values for multi-span model having apex height as 10 mm

| Angle of Incidence of Wind | $C_{pe}$ (External Contour) | $C_{pi}$ (Internal Contour) |
|---|---|---|
| Face A | | |
| 0° | -0.2665 | 0.0927 |
| 30° | -0.4008 | 0.2695 |
| 60° | -0.3230 | 0.1818 |
| 90° | -0.1762 | -0.0837 |
| Face B | | |
| 0° | -0.0821 | 0.0097 |
| 30° | -0.1842 | 0.0672 |
| 60° | -0.2602 | 0.1022 |
| 90° | -0.1977 | -0.0993 |
| Face C | | |
| 0° | -0.2325 | 0.0055 |
| 30° | -0.3093 | -0.0217 |
| 60° | -0.3137 | 0.0051 |
| 90° | -0.1763 | -0.0907 |

**Table 5.** $C_p$ values for multi-span model having apex height as 20 mm

| Angle of Incidence of Wind | $C_{pe}$ (External Contour) | $C_{pi}$ (Internal Contour) |
|---|---|---|
| Face A | | |
| 0° | -0.2613 | 0.2704 |
| 30° | -0.2662 | 0.2796 |
| 60° | -0.1842 | 0.1578 |
| 90° | -0.0897 | -0.0426 |
| Face B | | |
| 0° | -0.0698 | 0.0489 |
| 30° | -0.1195 | 0.0676 |
| 60° | -0.1594 | 0.0638 |
| 90° | -0.1138 | -0.0477 |
| Face C | | |
| 0° | -0.2409 | -0.0080 |
| 30° | -0.2790 | 0.0101 |
| 60° | -0.2028 | 0.0139 |
| 90° | -0.0900 | -0.0433 |

**Table 6.** $C_p$ values for multi-span model having apex height as 30 mm

| Angle of Incidence of Wind | $C_{pe}$ (External Contour) | $C_{pi}$ (Internal Contour) |
|---|---|---|
| Face A | | |
| 0° | -0.2695 | 0.3505 |
| 30° | -0.2407 | 0.3463 |
| 60° | -0.1306 | 0.1692 |
| 90° | -0.0624 | -0.0270 |
| Face B | | |
| 0° | -0.1191 | -0.0854 |
| 30° | -0.1331 | 0.0129 |
| 60° | -0.1156 | 0.0731 |
| 90° | -0.0763 | -0.0314 |
| Face C | | |
| 0° | -0.3053 | -0.0408 |
| 30° | -0.3245 | -0.0233 |
| 60° | -0.1796 | 0.0336 |
| 90° | -0.0637 | -0.0271 |

## 6. Conclusion

The results of this study, which used CFD simulations to examine the aerodynamic effects of curved canopy roofs on single-span and multi-span low-rise structures, can be summarized as follows:

- The apex height of the curved canopy roof significantly impacts the distribution of suction pressure on the surface.
- Higher apex heights can provide greater resistance to wind loads and other aerodynamic forces.
- The presence of a curved canopy roof on multi-span low-rise structures significantly affects the aerodynamic forces acting on the structure.
- Increasing the apex height of the canopy roof resulted in an increase in suction pressure experienced at the top of the first roof.
- On the lower surface, the magnitude of positive coefficient of pressure increased with increasing apex height.

The findings of this study are valuable for the design and construction of single-span and multi-span low-rise structures with curved canopy roofs. Further research is needed to investigate the effects of other factors, such as roof slope and aspect ratio, on the aerodynamic performance of single-span and multi-span low-rise structures with curved canopy roofs. The findings of this study can be used to guide the design and construction of multi-span low-rise structures with curved canopy roofs. Additionally, by using similar research methods and conducting thorough CFD simulations, it is possible to examine the aerodynamic effects on other types of roofs and in different wind speed conditions. This would allow for the development of a comprehensive set of guidelines for analyzing the impact of wind on single-span and multi-span structures, which could be incorporated into widely accepted wind codes such as IS 875: Part 3.

## Nomenclature

| | | | | | |
|---|---|---|---|---|---|
| $u_i$ | : | Velocity Component | $P$ | : | Pressure |
| $u_t$ | : | Eddy Velocity | $P_0$ | : | Reference Pressure |
| $g$ | : | Acceleration due to gravity | $E_{ij}$ | : | Rate of Deformation |
| $z$ | : | Height | $F$ | : | Force |
| $C_p$ | : | Coefficient of Pressure | $\rho$ | : | Density |
| $C_{pe}$ | : | External Coefficient of Pressure | $\mu$ | : | Viscosity |
| $C_{pi}$ | : | Internal Coefficient of Pressure | $\nabla$ | : | Divergence |
| $V$ | : | Speed | | | |

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# 4 CFD Simulation of Wind-Induced Interference Effects on Low-Rise Gable Roof Structure using ANSYS

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## Abstract

This study examines the variance of wind impacts on low-rise gable-roofed buildings that do not have any open faces to the wind domain over distinct interference situations. In full blockage arrangements, this is achieved by adjusting the spacing between the buildings. Because there are no specifications in wind standards for building structures of this kind, computational simulations are carried out using the fluid flow simulator of ANSYS CFX software using the Standard k − ε model. These kinds of research necessitate the use of either a real wind tunnel environment to measure the pressure or a virtual computational fluid dynamics (CFD) simulation of the wind environment. In this work, CFD simulations were performed for a total of four distinct spacing circumstances and four varied increasing wind incidence angles of 0°, 30°, 60°, and 90° to get the coefficient of pressure (Cp). The results have been showed with the help of contours on the roofs of structures, pressure coefficient (Cp) and velocity streamlines for different cases. Minimum value of Cp was found in 1.5b spacing configuration with wind incidence angle 60° and maximum value of Cp in 2b spacing configuration with wind incidence angle 60° (here b = width of structure).

**Keywords**

ANSYS CFD Simulation, Gable Roof, Wind Interference

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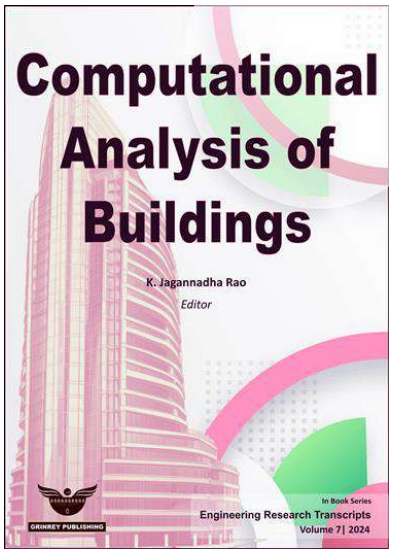


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## 1. Introduction

The need for structures such as factories, warehouses, godowns, refrigerated storage, bunkers, and so forth has increased as a result of the global economic development and extensive industrialization. Rapid globalization is made possible in large part by the air transportation network. Hangars are important buildings at airports that are used for maintaining, repairing, and storing aircraft. These buildings have truss roofs and enormous plan proportions. Such roofs are greatly impacted by wind, and this must be carefully considered. Strong winds have caused several roof structures to disintegrate in recent years. Hurricanes and other strong wind events frequently cause low-rise structures in coastal areas to sustain considerable damage. The first areas of these damages are high pressure areas or weak building components, and they spread to other building components. In addition, depending on the arrangement, design, positioning with relation to the streamlines and terrain in the upstream, neighboring structures can lessen or raising the induced flow force applied on a building. As a result, designers and planners must correctly examine this effect, known as interference, and it is typically observed in metropolitan areas where clusters of buildings are built at a site. When several structures are included, the analysis becomes more complex due to the enormous quantity of observations accessible. As a result, the interference factor, that is a useful tool for analyzing how wind behaviour and pressure on the other structure change, is known as the ratio between the pressure coefficient at a specific structural adaptation to the pressure coefficient on a similar structure in a remote setting of similar shape with similar boundary conditions.

When creating other structures that are subject to wind loads. Wind load standards are used by designers to calculate coefficients of force and pressure for the structure [1]. These standards, on the other hand, include information for element configurations with a few restricted wind incidence angles. Information on wind loads for structures with varied configurations is not provided by these regulations. As a result, it is highly common to investigate wind tunnels using models of this form. Many researchers have already looked into effects of wind on small buildings. For instance, Jagbir and Roy [2] used numerical modelling to look into the a small structure's wind loads roof and discovered that they are restricted for structures with pyramidal shapes. In an experiment conducted by Boumrar and Becheur (2020) [3], it was discovered that the design and slope of the roof had a positive impact on the aerodynamic properties of tall structures by reducing the drag force on the windward face. In their assessment of wind pressures on awnings attached to small buildings, Sakib (2021) [4] discovered that awnings are most impacted by suction pressure, which is primarily felt on the top portion of the top of buildings. In 2019, Ong [5] looked into the average and maximum pressure caused by wind around a low-rise building. In comparative research on minimising uplift force on low-rise structures, Aly and Bresowar (2016) [6] recommended that aerodynamic mitigation should also reduce the structure's drag and lift forces in addition to the pressure coefficient. By altering the ratios of height to depth and breadth to depth, Huang (2018) [7] assessed the air pressure in a several testing on various types of roofing in the wind tunnel.The existing international criteria for low-rise structures need to be revised in light of the many pieces of accessible data. Full scale assessment on low rise structures under actual wind conditions was done by Kopp (2012)[8] . Isyumov (2014) [9] used a low-rise building model to conduct an experimental analysis utilising wind tunnel testing at various wind incidence angles. The prevailing wind pattern all around low-rise building is not addressed in the international standards that are available for its design. Additionally, the pattern of pressure distribution must be taken into account. Wind effect study on low-rise (small ) structures of dome shape have been done by Astha and Rahul [10] and they found out that single dome has maximum pressure at the peak. Ahmad and Kumar (2001) [11] conducted wind tunnel studies on hip roofs and found that interference effects provide appreciable improvements and shielding benefits at various configurations. Nagar (2020 and 2021) conducted experimental tests on proximity effects caused by wind among two high rise buildings in many blocking configurations that were

plus-shaped, square, and H-shaped [12-13]. Wind effects with one side open on low rise structures were done by Sinha et al (2022) [14] for full blockage interference conditions. Shruti et al (2019) studied the interference effect on chimneys under different wind incidence angles. [15]

IS 875 (Part 3): 2015 Indian Standards criteria for estimating wind loads on structures were thoroughly studied, and the regulations were referenced to at various stages.

This study utilizes a low-rise rectangular structure with having gable roof and no open sides to assess how changing the distance between structures affects the force of the wind against the roof.

The impact on the building close to another structure may cause its wind load to either increase or decrease. The wind load enhancement effect and the shielding effect are two distinct ideas. The influence that will predominate will depend on where and how the structures are positioned in relation to the wind's direction. The results of wind-induced interference are quantified in this CFD analysis for a range of spacing configurations and wind flow directions.

## 2. CFD Simulation Methodology

There are several types of commercial software available for CFD simulations. One of the most popular software packages, Ansys, includes a variety of tools for engineering simulation. The easiest solution for CFD studies of wind flow across bluff bodies is Ansys CFX. As a result, the simulations for this inquiry were carried out using the k-ε turbulence model at higher turbulence strength in the Ansys 2022 R2 CFX fluid flow package. This is the turbulence model that is most frequently used in Computational Fluid Dynamics studies of wind flow across bluff bodies. Here, the terms k and ε represent for the TKE (turbulent kinetic energy) and the rate of eddies in the wind that a bluff body's presence causes, respectively.

Five fundamental steps are used in CFD simulations, and they are as follows:

- Creating the model's geometry
- Setting up a flow domain,
- Discretize or mesh a domain.
- Establishing boundary conditions and flow physics,
- Coming up with solutions

A 3D modeling programme, in this case AutoCAD, was used to model the structure under consideration. Then, in order to simulate a wind tunnel, a fluid flow domain must be created around the structure. This was accomplished using ANSYS' Design Modeller tool. The discretization of the flow domain, generally defined as the meshing of the flow domain, occurs in CFD simulations. These components can have a variety of forms, including pyramidal, tetrahedral, hexahedral, and hexagonal. The flow's continuance and momentum are equal along every node of the discretized domain according to the Reynolds averaged Navier-Stokes equation. Tetrahedral meshing was used in the current study. To create a high-quality mesh, the element sizes throughout the meshing process must be modified.

The next steps consist of setting the boundary conditions and defining the wind profiles that will apply the force on the building. Free slip walls were allocated for the domain's top and bottom walls. ($\tau_{wall}$=0 & $V_{wall}\neq0$), where $V_{wall}$ stands for velocity along a wall's surface and $\tau_{wall}$ for the wall's shear stress. However, there is no velocity component that is perpendicular to the surface. At the borders of the virtual wind tunnel, this is done to emulate free stream flow circumstances found in nature. Because no-slip walls ($V_{wall}$ =0) were selected for the building faces and the ground. there is no fluid velocity component around the wall's perimeter. The nonslip wall criterion makes sure that air flow encounters viscous friction from the ground

and the structure's faces. The definition of corresponding pressure at the output was 0 Pa. In the current investigation, the domain's entrance is equipped with a constant, homogeneous wind flow moving at a speed of 10 m/s. After the flow setup is complete, the momentum and continuity equations are repeatedly solved at every node of the mesh by the ANSYS solution operator. As the number of iterations rises, less momentum and mass are left behind each way along, and the solution eventually reaches the final state. ANSYS CFD post-tool allows users to obtain the results after the solution is finished. By using streamlines, it is possible to see the entire flow around the body and determine the pressures and forces that act on the body's surfaces through the result file. Both the wind speed and the size of the model will affect the pressure and force magnitudes. It takes a dimensionless quantity to adequately depict the pressures and forces in a general sense.

The pressure coefficient, which defines the relative pressure at whatever place in relation to the design pressure, is a dimensionless quantity. It is defined mathematically using Equation (Eq). (1)

$$Cp = \frac{P - P_0}{\frac{1}{2} \times \rho \times V^2} \tag{1}$$

where the design wind speed and air density, respectively, are & V, and P represents any location where there is wind pressure. To describe the wind pressure impacting on the structure's faces in dimensionless terms, use Eq. (1) to produce the expression for $C_p$ in Ansys' built-in function calculator. To visualize the fluctuation of $C_p$ throughout the various faces, the values of pressure coefficient $C_p$ could alternatively be plotted $C_p$ contours throughout the entire face.

## 3. Design of Structure

The experimental model for the current experiment is a low-rise rectangular design with gable roof structural model, scaled at 1:50. With a maximum horizontal wall length of 400mm and minimum wall length of 200mm, the pitched roof has a 30° pitch. According to Figure 1, the wall height of the building is 150 mm.

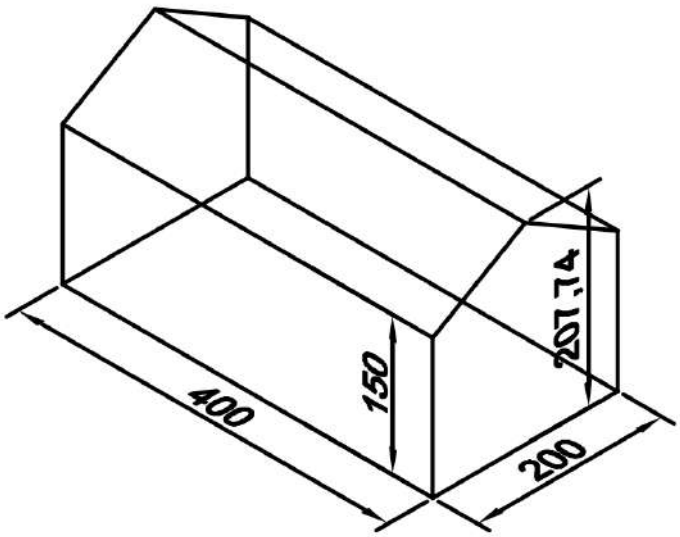



**Fig. 1.** Model of the structure (all dimensions in mm)

## 4. Validation of Model with IS Code

A validation model that matched the flow setup's external measurements and meshing was exposed to the same typical wind velocity of 10 m/s at the inlet in order to verify the flow setup, as shown in Figure 2. The setup was assessed by contrasting the pressure coefficient (Cp) values obtained by Ansys CFX to those derived from the IS codes for a covered gable roof structure (based on real wind tunnel tests).

For calculating the domain size, Franke et al. (2004) [16] followed their suggestions on CFD applications in wind engineering. The dimensions used for the wind flow domain are shown in Figure 2. The safe separations between the intake and outflow faces and the structure were 5H and 15H, respectively. The building's top and side clearances were taken to be 6H. H denotes the structure's height and is equivalent to 207.74 mm.

As shown in Figure 3, the volume mesh size is taken as 0.1 m, whereas the mesh size for the building edges is 0.025 m, the mesh size for the face is 0.0125 m, and the mesh size for the ground is 0.05 m.

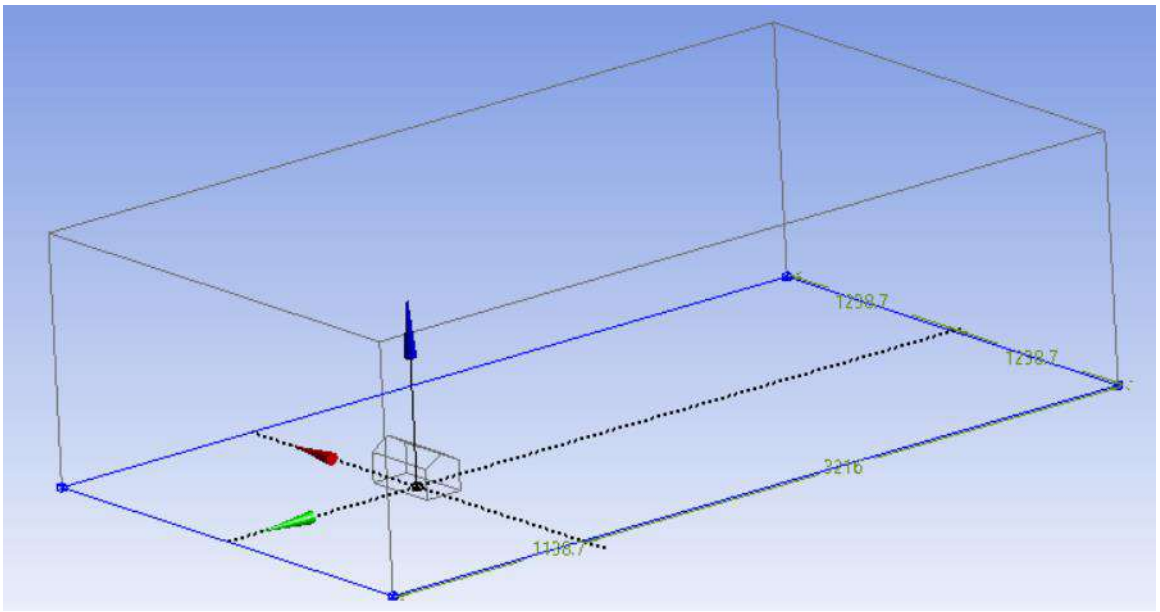



**Fig. 2.** Wind Flow Domain

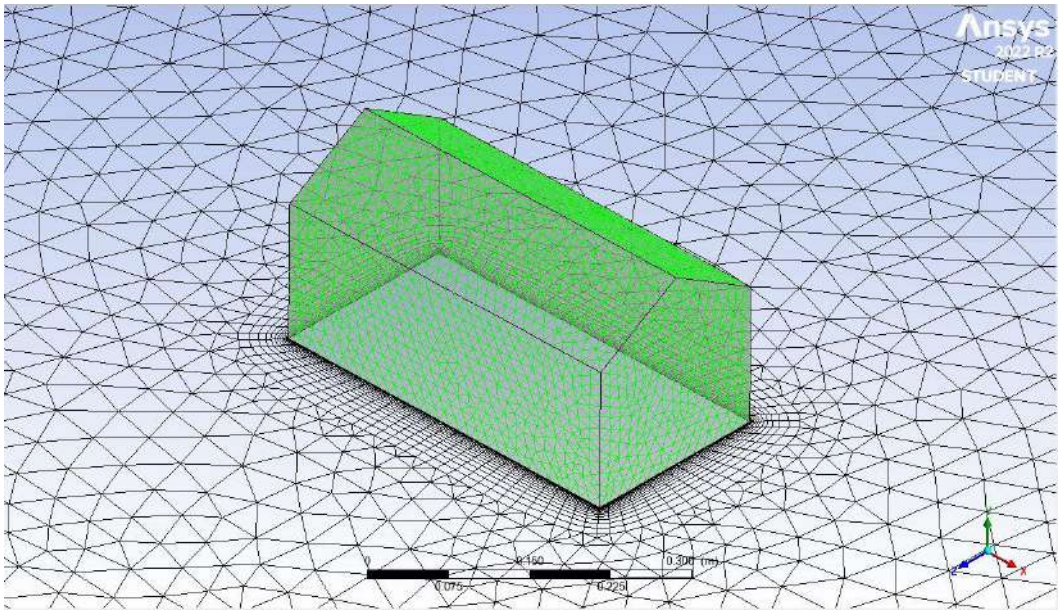



**Fig. 3.** Mesh Diagram

An average inaccuracy of percentage of 14.28% was found across the entire Top surfaces along the direction perpendicular to the model's longest side, this corresponds to the 0° wind incidence in IS 875 Part 3:2015, when comparing the average values of pressure coefficient acquired for the verification model with the values of pressure coefficient specified in clause 7.3.3.2 Table 6 of the IS 875 Part 3:2015. Since there are no openings in the structure, we can consider pressure coefficients to be external pressure coefficients.

**Table 1.** Verification of CFD Model Setup from IS 875 (Part 3): 2015

| Wind Angle (Θ°) | $C_{pe}$ for surface from CFD Simulation | | Average Value of $C_{pe}$ for Roof from CFD Simulation | Average Value of $C_{pe}$ for Roof as per IS 875 (Part 3) [Table 6 clause 7.3.3.2] | Average % Error |
|---|---|---|---|---|---|
| | Roof 1 | Roof 2 | | | |
| 0 | -0.41 | -0.39 | -0.4 | -0.35 | 14.28 |

Suction develops in the areas along the margins as a result of the wind escaping from the bluff body's pointed edges. The high suction values close to the building's margins significantly raise the average suction $C_{pe}$ because the CFD simulations capture the tiniest fluctuations in wind pressure similar to the size of the meshing elements. A discrepancy of 0.05 in the $C_{pe}$ values is seen in the current investigation when comparing them to IS 875 part 3:2015.

Since the obtained results on the validation model fall under allowable bounds of the IS CODE, the same mesh generation and boundary setup were used for all simulations undertaken in this work.

As illustrated in Figure 4, the simulations are run for various distances between the experimental test model and the interfering model as well as various wind incident angles ranging from 0° to 90° at a 30° interval. In the current investigation, the interfering model is interpreted as being similar exterior measurements as the experimental test model. The distance between the two models is adjusted in terms of the building's width, b (= 200 mm), while the experimental test model is kept directly at the back of the interfering model, or in a full blockage situation, at 0° wind incidence. As shown in Figure 5, there are four spacing configurations (S) that were taken into account for this study: b/2, b, 3b/2, and 2b.

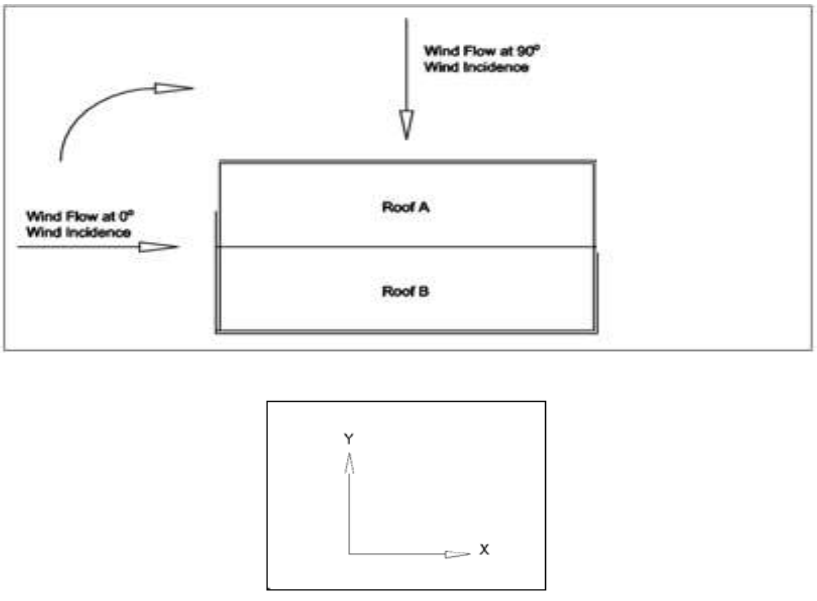
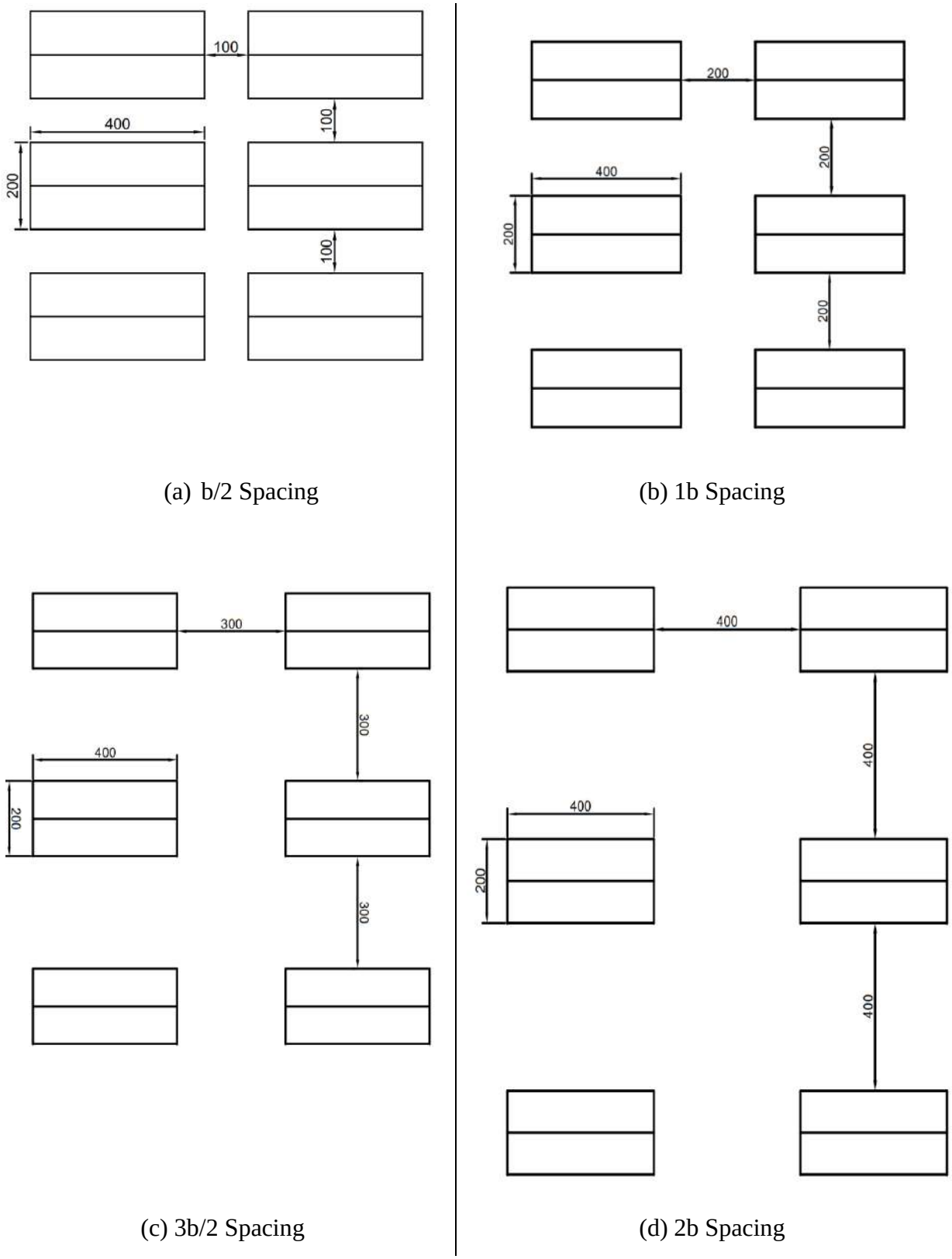



**Fig. 4.** Variation of Wind Incident Angles




(a) b/2 Spacing

(b) 1b Spacing

(c) 3b/2 Spacing

(d) 2b Spacing

**Fig. 5.** Spacing Configurations

## 5. Results and Discussion

### 5.1 Average Pressure Coefficient

Figure 6's graph illustrates the Coefficient of pressure mean variation in the entire gable roof with respect to wind incidence angles. Similar variations can be seen in the Cp mean graph for the exterior roof face in interference condition, which, for every spacing, is suction in nature.

Suction is evident in the isolated structure condition and it decreases as the wind incidence angle increases from 0 to 30 degrees, then it increases from 30 to 60 degree then again decreases from 60 to 90 degree. Particularly at 0°, the suction pressure is stronger at around -0.45 for the top, but in the other circumstances, the interference from the building causes eddy forms, which lowers the suction pressure. Similarly, the suction is also induced in the interference conditions on the top it increases as the wind incidence angle rises from 0° to 30° and it decreases from 30° to 90° for each spacing. The shielding effect of the interfering building results in a decrease in Coefficient of pressure mean values for the interference instances.

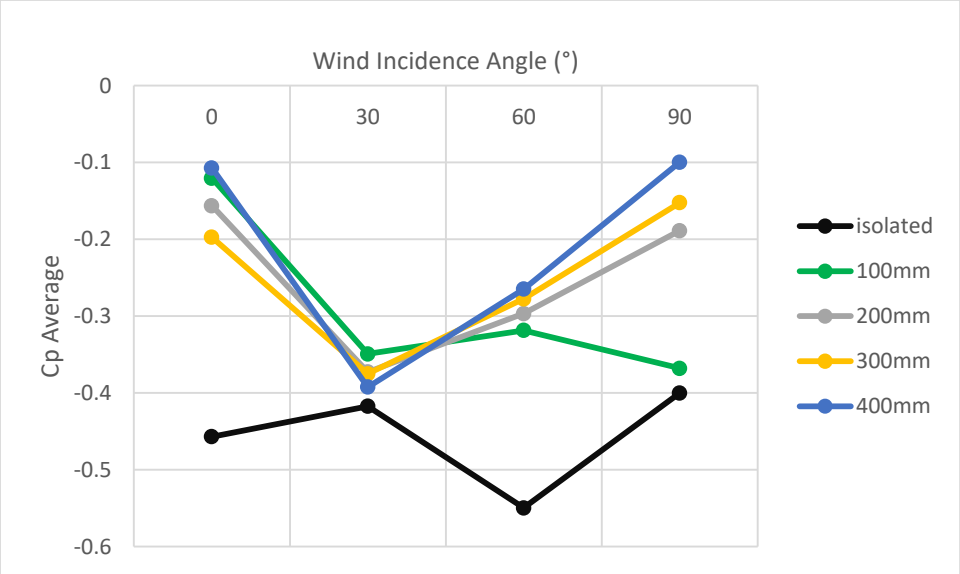
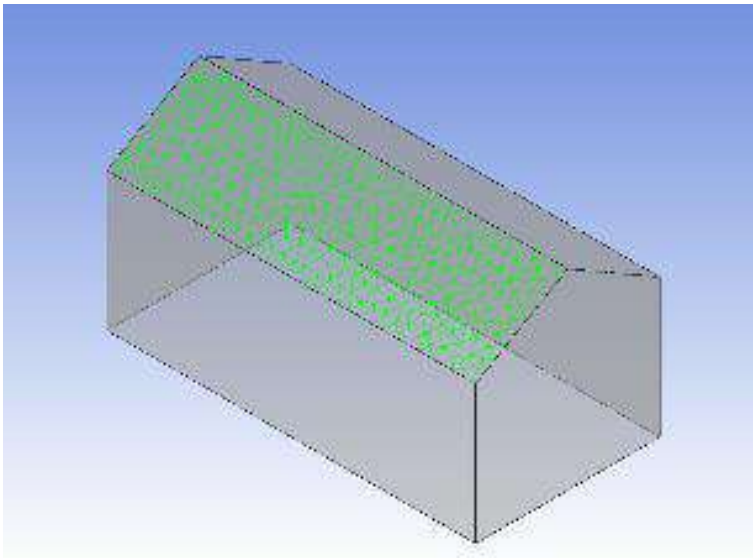



**Fig. 6.** Deviation of average pressure coefficient (Cpe) with wind incidence angles

### 5.2 Interference Parameters

Wind-induced interference effects have been the subject of numerous studies. According to Khanduri et al. (1998) [17] , the consequences of interference necessitate systematic research because the analysis study cannot be directly contrasted because of the various geometrical arrangements. As a result, utilizing the interference parameter - interference factor (IF), the current study examines how the wind action changes as buildings are separated from one another. Coefficients of pressure Cp for a building with the interfering building divided by the Cp for the same building under isolated conditions is known as interference factor (IF). These characteristics aid in numerically representing the effect of interfering building on the wind effect on the structure under consideration. Both positive and negative interference factor IF values are possible. Positive interference factor (IF) signals that the kind of the wind action, In an isolated situation, factors like pressure or suction are same. as well as in interference configuration, whereas negative IF signals a change in the wind action's nature. The building under consideration may have been shielded from wind activity by the interfering building if the interference factor's magnitude is less than one. If the magnitude of IF is greater than one, the existence of the interfering buildings is considered to be increasing the wind load.

We can observe on top 1 of the 0.5B spacing arrangement that the shielding impact on the interference building decreases as the wind incidence angle increases from 0° to 90° but for the 2B spacing configuration as we can see that sheltering effect has increased with change in wind incidence angle from 0° to 90° and positive wind pressure is observed at 90° on top 1 because there is a change in sign of IF value from positive to negative. A gradual increase in IF value can be seen for all four spacing configurations i.e., 0.5B, 1B, 1.5B, 2B at 30° wind incidence angle due to less sheltering been provided and then a gradual decrease in IF value for 60° wind incidence shows better sheltering.



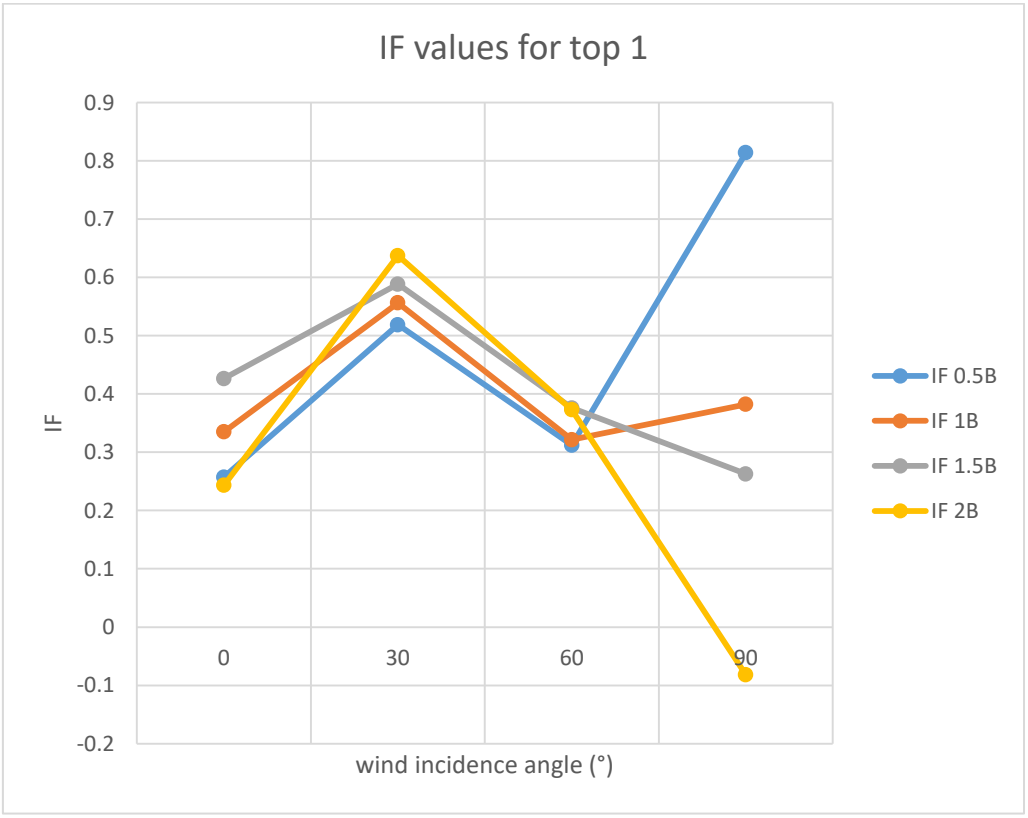
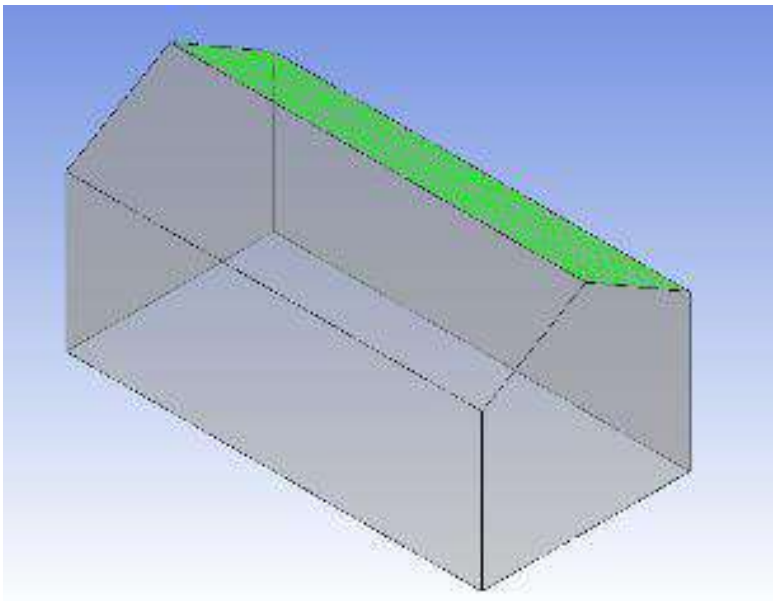



**Fig. 7.** Variation of interference factors on top 1 along wind incidence angle (°).

On top 2 for all spacing configuration, we can see that IF value is less 1 for 0° wind incidence angle and these values are in very close range of each other denoting very good sheltering effect at 0° wind incidence angle. But for wind incidence angle of 30° there is a sudden rise in IF values and all values of IF at 30° wind incidence angle becomes greater than 1 denoting there is a change in wind load action on top 2 of the interference building meaning more wind load is acting than the initial provided wind load on the top of building and this effect is gradually decreased with further increase in wind incidence angle till 90°. 1.5B spacing configuration has best sheltering effect compared to other spacing configurations for roof 2 of the interference building.



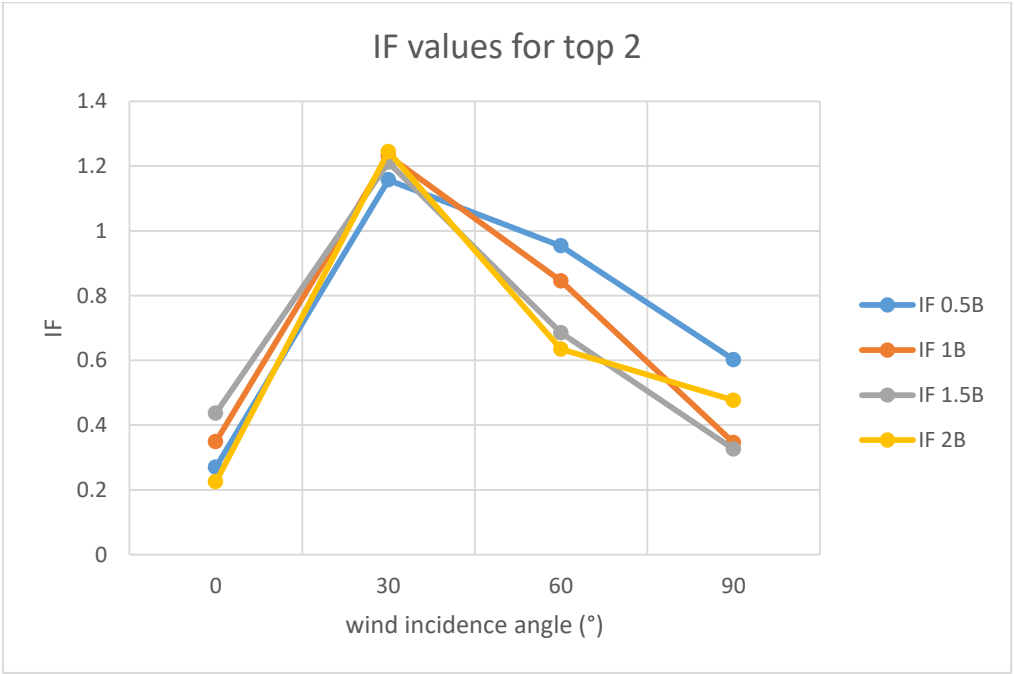



**Fig. 8.** Variation of interference factors on top 2 along wind incidence angle (°).

## 6. Conclusion

The basis for this research is the impact of changing the spacing configurations in an interfering wind flow scenario. In accordance with standards of IS 875: Part 3 (2015) requirements, the validation of the coefficients of pressure on the top of a gable roof design was carried out, and the outcomes of the CFD simulations were within acceptable bounds. In order to investigate the effects on the Cp, four distinct spacing configurations (depending on the structure width, i.e., at 0.5B, 1B, 1.5B, and 2B spacing) were assumed and also then compared this interfering condition with isolated wind flow circumstances via Interference parameter (IF). The important findings of this study are:

- For all interfering conditions, there is a similar fluctuation in the average value of the pressure coefficient for the structure's Top 1 and Top 2. All the roofs on average are in suction for low rise buildings meaning negative pressure is acting. For 30° wind incidence angle maximum suction of roof in different spacing configuration is observed.
- IF values increase from 0° to 30° wind incidence angle for all spacing configurations indicating a decrease in shielding effect on the experimental building, IF values then decrease for 30° to 90° wind incidence angle indicating a increase in shielding effect on the experimental building.

According to the findings of this study, the shielding effect is reduced at 30° wind incidence angle for all spacing configurations when compared to other wind incidence angles. It is therefore prudent to keep this discovery in mind while building similar style colonies.

This would assist in creating a thorough set of suggestions that could be incorporated into commonly used wind regulations like IS 875: Part 3(2015) and utilized in analyzing various interference scenarios.

To determine the appropriate spacing and orientations for these types of low-rise frameworks/buildings both in terms of serviceability and soundness as structures under varied airflow circumstances, ANSYS CFX simulations for interference parameters would be useful.

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# Characterization of Radiation-Dependent Dual Channel AlGaN/GaN MOS-HEMT Based Dosimeter


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***Abstract*— We have developed a Double channel MOS-HEMT-based dosimeter. This paper presents the performance comparison between double channel HEMT based dosimeter and Double channel MOS-HEMT based dosimeter. Various Parameters such as Channel potential, Electric field, $I_{ds}$-$V_{ds}$, sensitivity, gate capacitance, and cut-off frequency have been analyzed for both the devices, and the double-channel MOS-HEMT devices have good cutoff frequencies. These devices have excellent gain linearity and can function at higher input power and frequency levels. It has been found that the undoped barrier layer benefits Double Channel MOSHEMTs by increasing the drain current, widening the transconductance peak, and raising the threshold voltage. The presence of well-defined double-channel behaviour is well demonstrated by the formation of a double-hump structure in the dependency of and on gate bias. The effect of radiation dose ($N_t$=2 ×$10^{12}$$cm^{-2}$) has been studied. Maximum channel potential, Electric field, cut-off frequency and maximum current observed for the DC-MOS HEMT-based dosimeter device are 1.6059 V, 1.33E+05 V/cm, 1.89E+10, 0.069. Due to the extra oxide layer under the gate electrode, the DC-MOSHEMT-based dosimeter exhibits better results than the DC-HEMT-based dosimeter.**



***Keywords—Dosimeter, sensor, DC-MOS-HEMT-DOSI, DC-HEMT-DOSI, AlGaN barrier***


## I. INTRODUCTION

The excellent properties of gallium nitride, such as its high breakdown field and electron saturation velocity, combined with AlGaN's comprehensive band gap, high carrier congregation, and high electron portability, have made HEMTs an appealing contender for high-power and high-frequency applications.[1], [2]Because of the high mobility of electrons in two-dimensional electron gas (2DEG), high-power switching applications have relied on HEMTs with low ON resistance and fast switching speeds. AlGaN-GaN HEMTs have been shown to have ten times the output power density of traditional AlGaAs-GaAs HEMTs.[3], [4] GaN is a material that is suitable for high-temperature environments and provides device stability. When exposed to harsh conditions, intense heat, and acidic or basic solutions, the AlGaN/GaN HEMT performs better as a sensor. They are also now used in a variety of radar sensor applications.[5], [6]. AlGaN/GaN HEMT-based sensors' key benefit is that they can function at lower theoretical limits and show noticeable output current variations. Current collapse occurs in AlGaN/GaN HEMT[6]–[8], and the process underlying this collapse is described by many theories, including surface state trapping and de-trapping in the gate-to-drain region and gate bias-induced non-uniform strain in the AlGaN barrier layer. The current collapse can usually be mitigated by adding a surface passivation layer like $Si_3N_4$, but it is not always successful.[9], [10]. Efforts have been made to improve the current drive in AlGaN/GaN Double channel HEMTs with back-barrier technology by increasing 2DEG charge density with high-mobility electrons[11]. AlGaN/GaN HEMT's access to the lower channel in the Double channel is prevented by adding an AlGaN barrier layer between the two channels. To improve linearity and reduce surface, Double channel MOS-HEMT has been considered.[12], [13] Compared to Double channel HEMT, the dielectric layer in Double channel MOS-HEMT improves performance by lowering effective gate-source capacitance and gate leakage current. In many different applications, including radiation therapy used in medical, radiation from a source is significant. Therefore, it is crucial to determine how much radiation is emitted by a source and how much is absorbed by a substance[14]–[16]. Because of the radiation dosage induced on the $SiO_2$/AlGaN interface, an AlGaN/GaN MOS HEMT was used to build a dosimeter sensor, which is a very sensitive surface of the AlGaN barrier layer. The following is how this paper is organised: The AlGaN/GaN DC-HEMT based dosimeter and AlGaN/GaN DC-MOS-HEMT based dosimeter design, device calibration and models used for simulation of the device are described in the section under "Device Simulation and Calibration. "Discussion of the results for the devices has been done in


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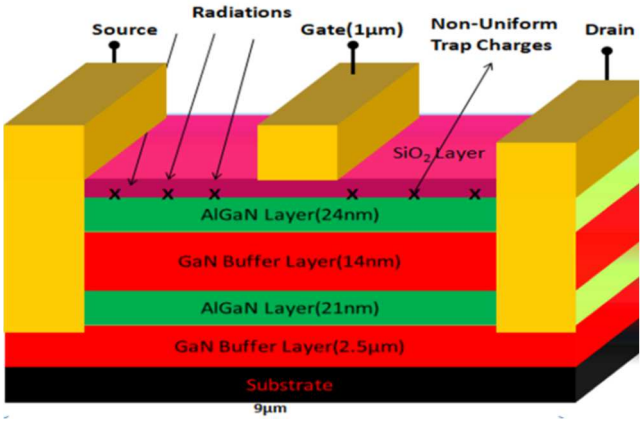
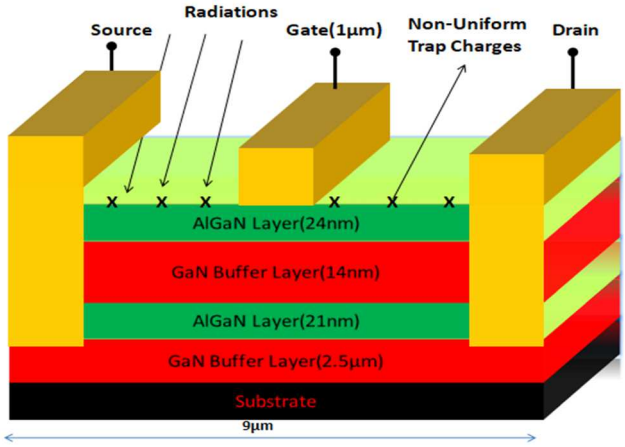
the "Results and Discussion" segment. Finally, the results are summarised in the "Conclusion" segment.

## II. DEVICE SIMULATION AND CALIBRATION

AlGaN/GaN DC-MOS-HEMT based dosimeter and DC-HEMT based dosimeter device layouts in Figures 1a and b.The dosimeter's purpose is to measure the uniform radiation dose caused by radiation.[17] A DC-HEMT-based dosimeter and DC-MOSHEMT-based dosimeter have been proposed on the Silicon substrate. In a double-channel apparatus, the primary heterointerface has been considered at an undoped AlGaN (21 nm)/GaN (2.5 m) interface, and for the second heterointerface a second undoped AlGaN (24 nm)/GaN (14 nm) interface is considered, as shown in Fig. 1a and b. At the source and drain, ohmic connections were created using aluminium. The lower AlGaN barrier layer has a second channel with graded Al composition. Using Ni/Au, a Schottky gate contact is made. The gate-drain spacing ($L_{DS}$), gate length ($L_G$), and source-gate spacing ($L_{SG}$) are all 1 µm apart. The simulation has been performed using the Shockley-Read-Hall model, the field-dependent mobility model, the concentration-dependent mobility model, and the polarisation model. Figure 2 shows the device's $I_{ds}$–$V_{ds}$ characteristics along with the experimental findings that Hu et al[18]. previously reported on. It is clear that the simulated $I_{ds}$–$V_{ds}$ properties and the experimental data coincide fairly well. SILVACO ATLAS TCAD device simulator has been used to run the simulations.




(a) DC-MOS-HEMT-DOSIMETER




(b) DC-HEMT-DOSIMETER

Figure 1.3-D structure of an AlGaN/GaN (a) DC-MOS-HEMT-DOSIMETER (b) DC-HEMT-DOSIMETER

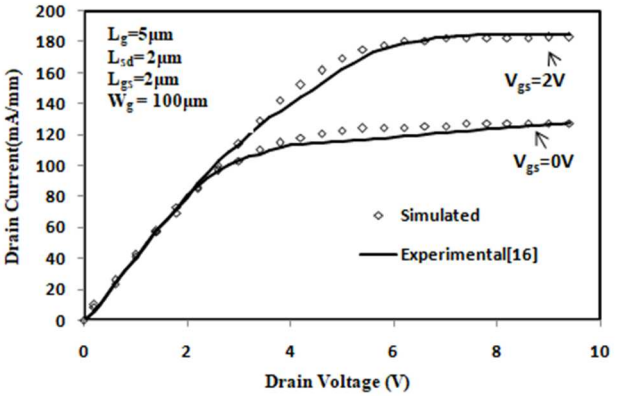



Figure 2. $I_{ds}$-$V_{ds}$ attributes of the MOS-HEMT device

## III. RESULTS AND DISCUSSION

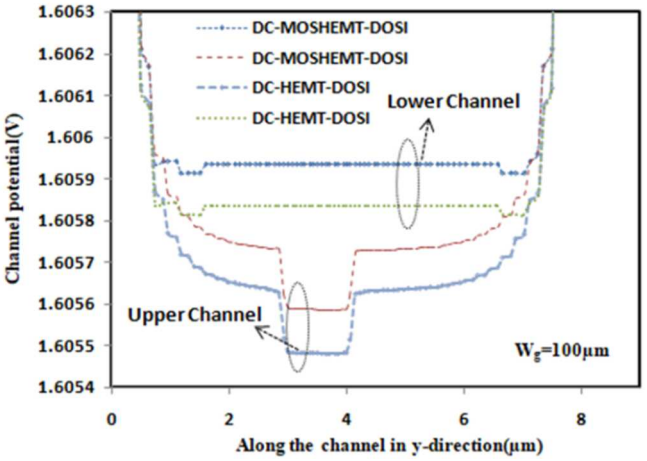



Figure 3. Channel potential extracted from the upper and lower heterointerfaces inside the GaN.

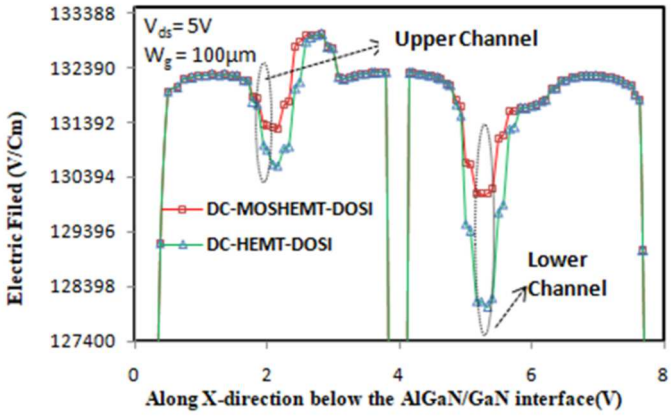



Figure 4. Electric field plot across the x-direction of DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for $N_t$=2 × $10^{12}$cm$^{-2}$ radiation dose induced.

The Potential distribution has been plotted in Fig. 3 for radiation dose, $N_t$= 2 ×$10^{12}$cm$^{-2}$induced by using a cutline of 1 nm below the heterointerfaces formed in both the devices. The lower channel in both devices exhibits significant potential, while the upper channel exhibits low potential. DC-MOSHEMT-DOSIMETER shows a high potential of 1.6059 V compared to DC-HEMT-DOSIMETER of 1.6058V for a radiation dose of 2 × $10^{12}$cm$^{-2}$ because the gate electrode has an additional oxide layer underneath it. Also, radiation hitting the source-gate and gate-drain areas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causes a significant shift in potentials. A small shift in potential is obtained at the $SiO_2$/AlGaN interface precisely below the gate for DC-HEMT-DOSIMETER, despite the metal gate electrode, as expected, blocking the radiation.

The carrier concentration in 2DEG changes as a result of the interface charges being induced, and the electric field at the interface also changes[19]. In a traditional AlGaN/GaN HEMT, band bending results in the creation of a quantum well at the AlGaN/GaN heterointerfaces because of polarisation in the GaN and AlGaN layers. Two quantum wells form at the top and lower AlGaN/GaN heterointerfaces in the DC-HEMT-DOSIMETER and DC-MOSHEMT-DOSIMETER, as shown in Figs. 3 and 4. Figure 4 depicts the diegesis of the electric field across the channel (x-axis) of the DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for radiation, $N_t = 2 \times 10^{12}cm^{-2}$ dose induced. Due to higher potential in the 2DEG channel, a high trap charge concentration denotes a high electric field. For $N_t = 2 \times 10^{12}cm^{-2}$, the upper and lower channels of the DC-MOS-HEMT-DOSIMETER, respectively, show maximum and minimum electric field values of 1.33E+05 V/cm and 1.28E+05 V/cm.

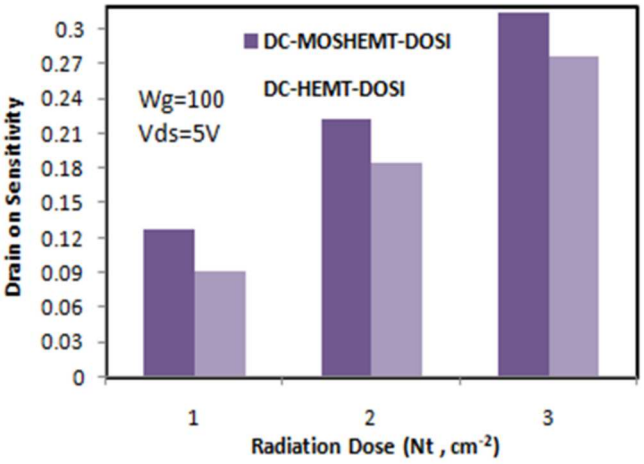


Figure 5.Drain on the sensitivity for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for $N_t = 2 \times 10^{12}cm^{-2}$ radiation dose induced.

Sensitivity for both the devices can be defined as:-

$$S_{Dosi} = \frac{I_{(Without\ R.I.)} - I_{(With\ R.I.)}}{I_{(With\ R.I.)}} \Big| at\ V_d = const. \quad (1)$$

Where $I_{(Without\ R.I.)}$ is the device's drain current when radiation is induced on the AlGaN interface and $I_{(With\ R.I.)}$ when radiation is not induced on the surface of the device. Figure 5 illustrates how the sensitivity parameter changes for both the devices and for different radiation doses, ($N_t = 1\times10^{12}cm^{-2}$to $N_t = 3\times10^{12}cm^{-2}$). The drain on sensitivity in the DC-MOS-HEMT-DOSIMETER device is increased by the inclusion of an additional oxide layer. The 2DEG charge increases with increasing radiation dose, which causes the drain current to shift more frequently. As a result, the sensitivity is increased. Maximum and minimum sensitivities of 0.32 and 0.090 for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER, respectively, for $N_t = 3 \times 10^{12}cm^{-2}$ and $1\times 10^{12}cm^{-2}$, have been noted among the radiation doses induced.

Figure 6 shows the output characteristics ($I_{DS}$–$V_{DS}$) at a gate bias of -4V for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER. DC-HEMT-DOSIMETER for radiation dose induced, $N_t = 2\times10^{12}cm^{-2;}$ therefore, due to the radiation-induced, the carrier concentration in the 2-DEG channel increases and manifests nether drain current and outreaches saturation at nether drain voltage in comparison to DC-MOS-HEMT-DOSIMETER due to the presence of the oxide layer.

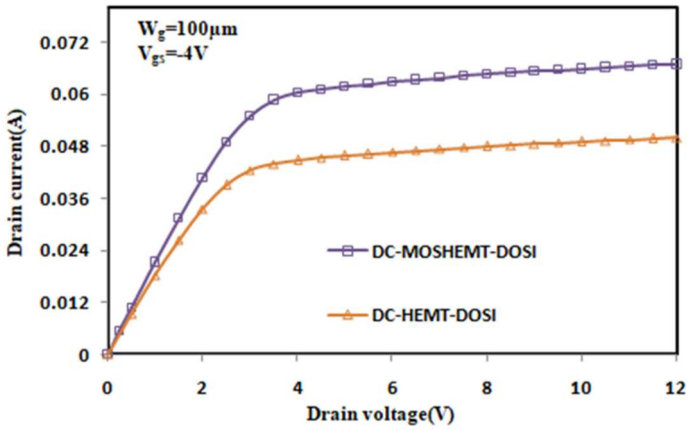


Figure 6. $I_{Ds}$–$V_{Ds}$ characteristics of DC-MOS-HEMT-DOSIMETER and DC- HEMT-DOSIMETER at $V_{gs}$=-4V.

Both devices are free of the kink effect, as can be observed from the $I_{ds}$-$V_{ds}$ curves in Fig. 6. The DC-MOS-HEMT-DOSIMETER has a maximum drain current of 0.069 A due to the high charge carrier density caused by the passivation layer's combined effect with the higher positive charge at the oxide/AlGaN interface.

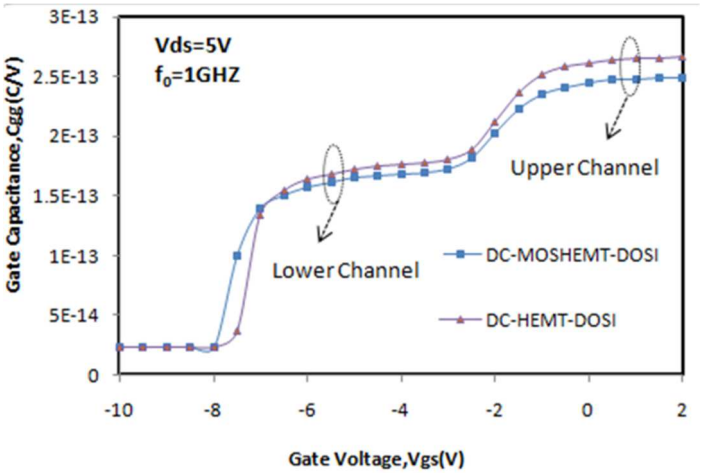


Figure 7. Variation of gate capacitance with Gate Voltage for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for $N_t = 2 \times 10^{12}cm^{-2}$ radiation dose induced.

The time constant of the surface traps ranges from seconds to microseconds. As a result, during RF operation under high biasing circumstances, the electrons at the surface are unable to properly modulate the channel charge. By suppressing the surface traps in the DC-MOS-HEMT-DOSIMETER, leakage current at high frequency may be efficiently controlled. The conductance of the device's constituents and parasitic capacitances between the non-swathing bulwark and contiguity pads, which also affect the intrinsic electrical properties of the DC-HEMT-


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DOSIMETER and DC-MOS-HEMT-DOSIMETER, have a significant impact on the device's RF characteristics. RF performance depends upon the figure of merit for RF circuits which is evaluated by extracting the cut-off frequency.

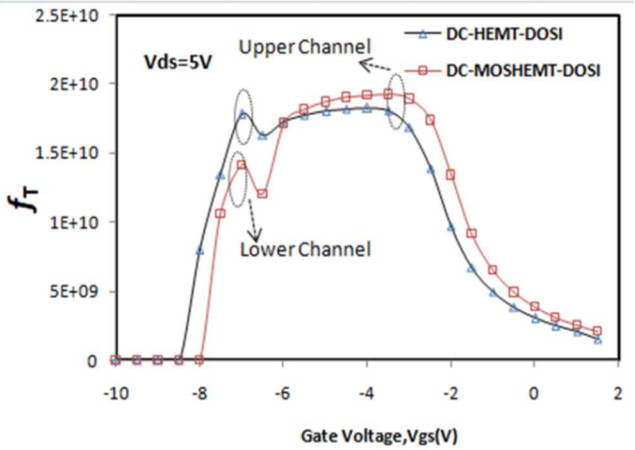


Figure 8. Variation of cut-off frequency ($f_T$) with Gate Voltage for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for $N_t$=2 × $10^{12}cm^{-2}$ radiation dose induced.

Figure 7 depicts the relationship between gate voltage ($V_{gs}$) and gate capacitance ($C_{gg}$=$C_{gd}$+$C_{gs}$) for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER, respectively. Figure 8 shows the cut-off frequency ($f_T$) variation with gate voltage ($V_{gs}$). Since the ratio of transconductance to Cgg can obtain cut-off frequency is given as[20]:

$$f_T = \frac{g_m}{2\pi\, c_{gg}} \qquad (2)$$

$C_{gs}$ and $C_{gd}$ are the gate's source and drain capacitances, respectively, and $C_{gg}$(=$C_{gs}$+$C_{gd}$), is the overall gate capacitance.

The cut-off frequency has an inverse relationship with Cgg and is directly proportional to transconductance. Figure 7 shows the plot of total gate capacitance for $N_t$= $2\times10^{12}cm^{-2}$for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER. It can be seen that the DC-HEMT-DOSIMETER and DC-MOS-HEMT-DOSIMETER have Low $C_{gd}$ in the nether channel compared to the higher channel. Figure 7 depicts the two plateaus in the Cgg characteristics of the DC-HEMT-DOSIMETER and the DC-MOS-HEMT DOSIMETER, respectively. Each plateau reflects the upper and lower channels' effective gate modulation, with the lower channel's elevated carrier density and the upper channel's nether carrier density, respectively. Comparatively speaking, the upper channel displays a higher capacitance than the bottom channel. Figure 8 shows the plot for cut-off frequency ($f_T$), and from the figure highest cut-off frequency of 1.89E+10 at -3V gate voltage can be observed for DC-MOS-HEMT-DOSIMETER for $N_t$= $2\times10^{12}cm^{-2}$. The presence of two channels in DC-HEMT-DOSIMETER and DC-MOS-HEMT-DOSIMETER is indicated by the presence of two peaks in figure 8. It has been discovered that the higher strait, which corresponds to a soared peak, has a high $f_T$. While the radiation is being induced, electron concentration rises, lowering channel resistance and increasing $f_T$. In TableI comparison for both the devices has been shown with respect to the maximum drain current, cut-off frequency, transconductance, and variation gate capacitance with gate Voltage.

**Table I. Comparison of DC-HEMT-DOSIMETER and DC-MOS-HEMT-DOSIMETER**

| Device Parameters | DC-HEMT-DOSIMETER | DC-MOS-HEMT-DOSIMETER | Previously reported work [21] | [22] |
|---|---|---|---|---|
| $I_{dmax}$(A) | 0.047 | 0.069 | 0.061 | 0.19 |
| $f_T$ | 1.6E+10 | 1.89E+10 | - | |
| $g_m$(mS/mm) | 12.74(Lower channel) | 16.2 (lower channel) | 15.7 | 16.9 |
| Cgg(C/V) | 2.65E-13(Upper Channel) | 2.2E-13(Upper Channel) | - | |

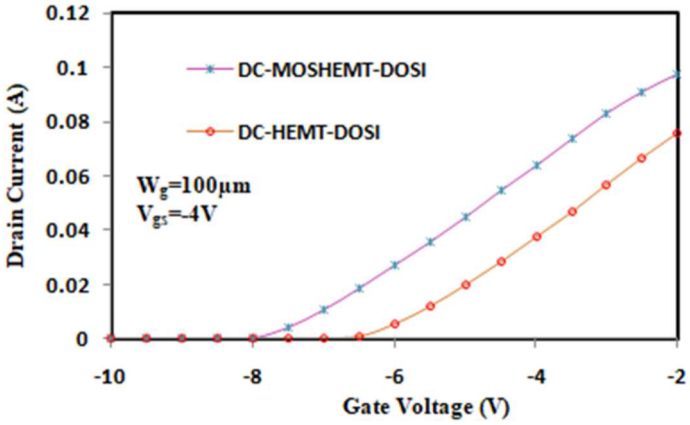


Figure 9.Transfer characteristics Simulated IDs–VDs characteristics of DC-MOS-HEM-DOSIMETER and DC-HEMT-DOSIMETER at $V_{gs}$=-4V

In Fig. 9, transfer characteristics ($I_{DS}$–$V_{GS}$) have been plotted for radiation dose of $N_t$= $2\times10^{12}cm^{-2}$at $V_{ds}$= 5V .Due to a significant voltage drop across the oxide layer, it can be seen that the DC-MOS-HEMT-DOSIMETER has a higher threshold voltage than the DC-HEMT-DOSIMETER. Therefore, the high breakdown voltage of the DC-MOS-HEMT-DOSIMETER can also be anticipated as a result of the high threshold voltage. A maximum drain current of 0.11A can be seen for DC-MOS-HEMT-DOSIMETER. Therefore, the drain current increases with the addition of the oxide layer as electron concentration increases in the 2-DEG layer.

Figure 10 shows the variation of $g_m$ with gate voltage for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for $N_t$=$2\times10^{12}cm^{-2}$ radiation dose induced. Dual channels with distinct threshold voltages for each channel are the cause of the double-peak curves seen for the DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER. A low $g_m$ of 12.74 mS/mm is attained in the lower channel of the DC-HEMT-DOSIMETER. The DC-MOS-HEMT-DOSIMETER, on the other hand, has a high transconductance of 19.24 mS/mm and a radiation dosage of $N_t$= $2\times10^{12}cm^{-2}$.


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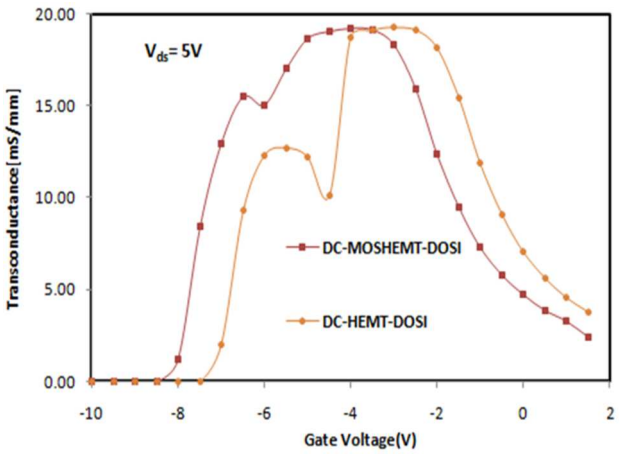


Figure 10.Transconductance curve for DC-MOS-HEMT-DOSIMETER and DC-HEMT-DOSIMETER for $N_t=2 \times 10^{12}cm^{-2}$ radiation dose induced.

This is brought on by the oxide layer capacitance and a greater tangible distance between the gate electrode and nether channel electrode. This raises carrier concentration, which in turn raises carrier-carrier scattering in 2DEG and reduces electrons' maximum drift mobility.

## IV. CONCLUSION

In this research work, a comparison between Double channel MOS-HEMT based dosimeter and HEMT-based dosimeter has been studied, and an analysis of various parameters has been done by inducing the radiation on the AlGaN surface. Both devices show excellent results for high power applications, but due to the increase in the number of concentration in the 2-DEG layer due to the addition of the $SiO_2$ layer, the Double Channel MOS-HEMT based dosimeter has shown excellent results as compared to the HEMT-based dosimeter. This device has been subjected to a variety of radiation doses in terms of interface trap charge, and variation of sensitivity has been detected by changing the radiation dose. By inducing radiation dose of $N_t=2\times10^{12}cm^{-2,}$ various parameters such as drain current, transconductance, variation of gate capacitance with Gate Voltage, Electric field, and channel potential has been studied.

## ACKNOWLEDGMENT

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ORIGINAL PAPER

# Climatic Trends in Temperature, Relative Humidity, and Wind Speed Over Indian Landmass and Isle in Andaman Nicobar and Lakshadweep During 1981–2021

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**Abstract:** An analysis is performed to examine trends in temperature, relative humidity, and wind-speed over the Indian landmass and in the isles of Lakshadweep (Arabian Sea side) and Andaman and Nicobar (Bay of Bengal side) over the last four decades (from 1981 to 2021). MERRA data deployed for revealing the large-scale fluctuations and linear trends in these parameters covering 36 locations. Surface temperature (2 m above ground) data showed a linear rise, which is more prominent after 2000, both in the Arabian side and the Bay of Bengal. Over this period, temperature increased $\sim$ 0.7–0.8 °C on both sides of Indian landmass. About two third locations (24 locations) in the study showed increase in temperature. However, relative humidity data on all island locations exhibited a decrease (prominent during 2000–2021). Quasi-periodic fluctuations in temperature (which is linearly rising) closely relates with the ENSO parameter (correlation coefficient 'r' in Arabian Sea and Andaman and Nicobar ranged from $\sim$ 0.20 to 0.34; which is statistically significant and relatively larger towards Andaman Islands). 'r' increased considerably ($>$ 0.5) during 2000–2021. Wind-speed, in general, showed larger magnitude over Andaman and Nicobar Islands ($\sim$ 5.0 m/s yearly averaged) in comparison to Arabian Sea ($\sim$ 4.0 m/s) and landmass ($\sim$ 2.2 m/s). On the other hand, solar cycle (sun spot numbers) and wind-speed reflects a weak positive correlation coefficient ($< \sim$ 0.40) but statistically significant while no consequential correlation found between solar cycle and relative humidity. Detailed analysis suggests that relative humidity decreased both over landmass and islands during 2000–2021. Interestingly, surface temperature increased more rapidly between latitudes 7.03°N and 12.91°N after 2000. Rise in temperature and long period fluctuations ($>$ 2–3 years) in the lower latitudes ($<$ 15°N) showed a strong association with ENSO signal suggesting invigorated atmosphere ocean interaction.

**Keywords:** ENSO; Temperature; Wind-speed; Relative humidity; SSN

## 1. Introduction

Climatic changes and its manifestations cannot be expected to remain uniform throughout the planet, though climate change is happening globally. Due to lack of observational data, there is a mysterious representation when it comes to studying the climate at a regional scale [1]. On the other hand, at a global scale we find relatively sufficient data and ongoing research for the climatic domain. Therefore, we need to understand the climatic changes at the regional scale so that the administration and government policies be ready for future disaster management.

Indian subcontinent shows a very complex dynamics of the atmosphere-hydrosphere-lithosphere-cryosphere system [1]. Recently, it has been discussed that the regional climatic changes in the past decades have been influenced by anthropogenic factors along with the other natural process [2]. It is felt necessary to understand the climatic regimes and their changing behavioural patterns over Indian region as well as globally [3, 4]. The uniqueness of the topography of India supports diverse climatic zones, flora and fauna and micro climatic areas. The World Meteorological Organization (referred to as WMO from now onwards) is a specialized agency for promoting international cooperation on atmospheric science, geophysics and climatology. With the increased frequency of weather extremes and expeditious climate change, it

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becomes even more important to revisit the meteorological parameters affecting the climatic trends in the Indian landmass and its surrounding isles [5].

The WMO report on 'State of Climate in Asia 2022' clearly points to the fact that Asia is warming faster than the global average. This requires deep analysis at several locations in Asia [5]. In the present study, we intend to decipher the trends and climatic changes in different atmospheric parameters on the Indian landmass and the surrounding sea and ocean body. We also focused on the interaction and association of various meteorological parameters by examining the changes in their pattern with time; this is analysed in the Indian landmass at several locations and at three locations in the Arabian Sea and Bay of Bengal each.

Sun-climate connection has been the most debated topic, which is helping to upgrade the understanding on the natural variability of climate and its atmospheric components vis-a-vis anthropogenic factors [3, 6, and 7]. To elaborate this thought further, we need to investigate changes in temperature, wind, and relative humidity, and their association with El- Nino Southern Oscillation (ENSO) and sun spot numbers patterns etc. in the Indian region.

ENSO and sun spot numbers are two such natural variations, which have the significant influence over atmospheric and meteorological parameters, which is selective and more prominent in different latitudes and altitudes [3, 8]. ENSO is a coupled ocean and atmosphere phenomenon. It is associated with periodic warming in the sea surface temperatures of the Pacific Ocean which not only changes the temperature in ocean waters, sea level pressure but also adversely affects the monsoon in India [9], Anderson et al. [10]. These findings are displaying a complex interplay between meteorological parameters and ocean–atmosphere interaction. Therefore, ENSO is expected to control the meteorological parameters, wind patterns, and prominent convergence and divergence cells present in the troposphere, namely Walker circulation and Hadley circulation. There are studies which supports changes in the ocean and sea surface temperature of anthropogenic origin, while there are evidences of influence from the sun activity over a long period, i.e. a few solar cycles [1–3, 8, 11].

Sea surface temperature (referred to as SST hereinafter) is the water temperature at the surface of ocean. SST plays a crucial role in earth's climate by influencing marine ecosystems and ENSO etc. [4]. As per the WMO report of 2022, the SST, an indicator of changing climatic conditions, has shown an increasing trend in the Indian Ocean [5]. The overall surface ocean warming has been observed at a rate of 0.5 °C per decade in various oceanic areas including the Indian Ocean. This is almost thrice the rate of global surface ocean warming trends obtained by the WMO [5]. This report seems to be in good agreement with our results, which point towards increasing temperature trends in the islands of Andaman and Lakshadweep, this would be shown in the result section.

Solar sun spot numbers, which is an indication and measure of the sun activity such as variation in its intense magnetic field and emission of strong solar flares are known to influence cloud formation, temperature, and regional circulation [3, 12, and 13]. A brief description of physics of sun spot numbers is discussed by Malik et al. [14]. Keeping in view the above description, we analysed MERRA-2 data involving meteorological parameters such as wind-speed, temperature, and relative humidity at 36 locations. In the Sect. 2, we present data and methodology, and the location of the locations; Sect. 3 describes results and discussion; and in the last Sect. 4, concluding remarks are given.

## 2. Data and Methodology

The modern-era retrospective analysis for research and applications (MERRA) data are used in this study. MERRA is a NASA atmospheric reanalysis data for the satellite era using the Goddard earth observing system model with its atmospheric data assimilation system (ADAS). The MERRA project focuses on historical climate analyses for a broad range of weather and climate time scales and places the NASA EOS suite of observations in a climate context. Reanalysis data is of great importance with metrological contents.

Our current study makes use of MERRA reanalyses integrated satellite-based data over Indian landmass and its Islands, which has been extracted from the NASA power access library under the POWER project. This project provides both solar as well as meteorological datasets from NASA research for multiple needs such as agricultural, and renewable energy. We utilized the power single point from this project which requires the latitudinal and longitudinal positions of the place to be studied. Using this we obtained datasets of wind, temperature and relative humidity for 30 locations situated over Indian landmass and 06 locations situated over the islands of Lakshadweep and Andaman and Nicobar for the purpose of our study. The slope of temperature obtained for all locations is represented as SlopeTemp and this column has been multiplied by a factor of 100 to increase the visualisation in the bubble chart for the corresponding locations (Table 1). The time period for data spanned over 1981 to 2021 and the spatial resolution on the latitude and longitude sections remained 0.5° × 0.625°. (Web link of the data on public domain is as follows: https://power.larc.nasa.gov/data-access-viewer/ ).

**Table 1** Details of Locations over Indian landmass and its isles

| Location | Lat | Long | SlopeTemp | SLOPE(C3 × 100) values multiplied by a factor of 100 |
|---|---|---|---|---|
| Srinagar | 34.0837 | 74.7973 | 0.0098 | 0.98 |
| Amritsar | 31.634 | 74.8723 | − 0.0026 | − 0.26 |
| Delhi | 28.7041 | 77.1025 | − 0.0086 | − 0.86 |
| Dehradun | 30.3165 | 78.0322 | 0.0027 | 0.27 |
| Jaipur | 26.9124 | 75.7873 | − 0.0028 | − 0.28 |
| Udaipur | 24.5854 | 73.7125 | 0.0000017 | 0.00017 |
| Ahmedabad | 23.0225 | 72.5714 | − 0.0096 | − 0.96 |
| Lucknow | 26.8467 | 80.9462 | − 0.013 | − 1.3 |
| Patna | 25.5941 | 85.1376 | − 0.0047 | − 0.47 |
| Siliguri | 26.7271 | 88.3953 | − 0.0036 | − 0.36 |
| Guwahati | 26.1158 | 91.7086 | 0.013 | 1.3 |
| Imphal | 24.817 | 93.9368 | 0.0075 | 0.75 |
| Aizawl | 23.7307 | 92.7173 | − 0.017 | − 1.7 |
| Kolkata | 22.5726 | 88.3639 | − 0.0069 | − 0.69 |
| Bhubaneshwar | 20.2961 | 85.8245 | − 0.0096 | − 0.96 |
| Bhopal | 23.2599 | 77.4126 | 0.005 | 0.5 |
| Ranchi | 23.3441 | 85.3096 | − 0.0014 | − 0.14 |
| Mumbai | 19.076 | 72.8777 | 0.013 | 1.3 |
| Mangaluru | 12.9141 | 74.856 | 0.013 | 1.3 |
| Kozhikode | 11.2588 | 75.7804 | 0.014 | 1.4 |
| Kochi | 9.9312 | 76.2673 | 0.014 | 1.4 |
| Trivandrum | 8.5241 | 76.9366 | 0.012 | 1.2 |
| Tuticorin | 8.7642 | 78.1348 | 0.033 | 3.3 |
| Tiruchirappalli | 10.7905 | 78.7047 | 0.0034 | 0.34 |
| Chennai | 13.0827 | 80.2707 | 0.0072 | 0.72 |
| Vijayawada | 16.5062 | 80.648 | − 0.00055 | − 0.055 |
| Visakhapatnam | 17.6868 | 83.2185 | 0.0039 | 0.39 |
| Hyderabad | 17.385 | 78.4867 | 0.0052 | 0.52 |
| Bengaluru | 12.9716 | 77.5946 | 0.0085 | 0.85 |
| Nagpur | 21.1458 | 79.0882 | − 0.0033 | − 0.33 |
| Amini | 11.1142 | 72.7204 | 0.022 | 2.2 |
| Kavaratti | 10.5593 | 72.6358 | 0.022 | 2.2 |
| Minicoy | 8.274 | 73.0496 | 0.02 | 2 |
| Port Blair | 11.6234 | 92.7265 | 0.02 | 2 |
| Car Nicobar | 9.1573 | 92.7581 | 0.019 | 1.9 |
| Great Nicobar | 7.0346 | 93.7842 | 0.017 | 1.7 |

The latitudinal and longitudinal extent of this work is from 37° 6′ N to 8° 4′ N and 68° 7′ to 97° 25′ E, which includes major portion of Indian landmass and the islands of Lakshadweep and Andaman and Nicobar (Fig. 1). Location of all sites are shown on the Indian map in Fig. 1. Yearly average data of temperature, relative humidity, wind-speed, sun spot numbers and ENSO were used during the period 1981–2021. Daily or monthly data are not used as the focus of the study remains on long term changes and trends.

In addition, data for solar sun spot numbers and ENSO were used for analysing the association with other meteorological parameters. The solar sun spot number data was retrieved from the world data centre of the Royal Observatory of Belgium. Sun spot index and Long-term Solar Observations (SILSO) was used in accessing the annual sun spot number (SSN) data for our research purpose [15]. The analysis makes use of SSN ranging from the year 1981 till 2021, thereby taking into consideration past four decades data. The true nature of the climatic impact on any meteorological data can be revealed with more accuracy

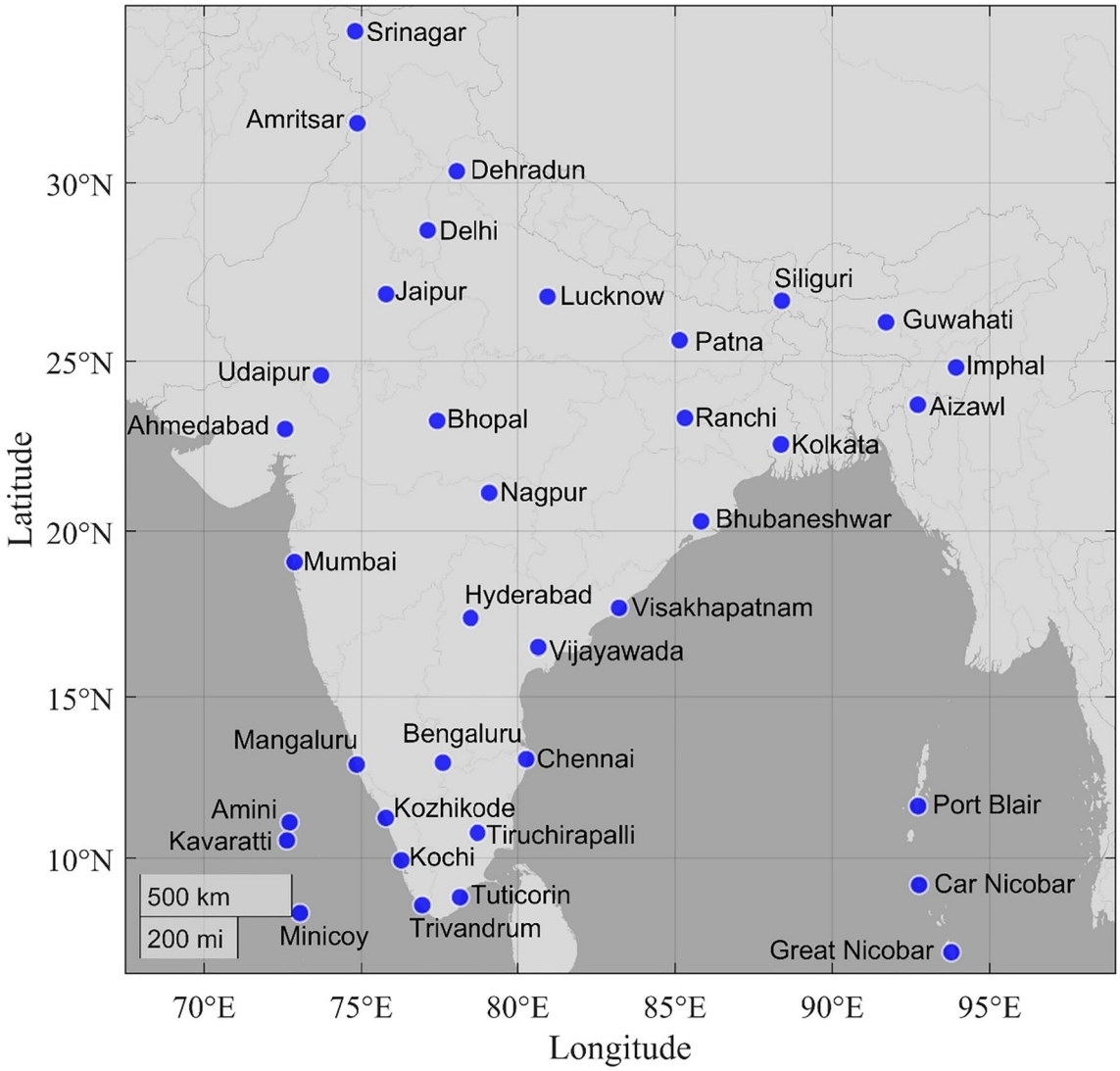


**Fig. 1** Location of all the stations is depicted on Indian map. 30 observation sites are located in landmass and on both sides it is surrounded by water body i.e. over Arabian side 3 locations are shown and similarly 3 locations are taken in the Andaman Nicobar Islands, which is far from main land

provided we have sufficiently large datasets, therefore, in this paper, we used 40 years data. ENSO data was accessed from the National Oceanic and Atmospheric Administration (NOAA) from 1981 till 2021.

In order to study the climatic trends over 36 locations, we made use of MATLAB and excel software. Analysis also includes the usage of bubble maps for providing a greater insight into the meteorological variables. These bubble charts have been prepared using MATLAB software, which are, filled bubbles displaying our data on a map. The size and colour of these bubbles help in better interpretation of the dataset. Using the Excel software, we calculated correlation coefficient for temperature and ENSO, and SSN and wind-speed in order to examine the linkage between these variables [10, 16]. Additionally, the t-test was performed revealing that analysis results are statistically significant with "$\alpha$" being 0.05 depicting a confidence level of 95%.

## 3. Results and Discussion

### 3.1. Time Series Analysis of Temperature Over Arabian Sea, Indian Landmass, and Bay of Bengal

One of the main objectives of this analysis is to determine the trends and long-term fluctuations in temperature over Andaman and Nicobar Islands, landmass, and Arabian Sea (Lakshadweep). In order to examine the salient features associated with long term fluctuations, time series of

annually averaged data is shown over different regions in Fig. 2. Diverse features are seen in the northern and mid Indian region (Fig. 2a) about the trend and behaviour of temperature variability during 2000–2021 in comparison to other regions. In the annexure A (Figure S1 and Figure S4), one can notice that significant changes occurred in temperature variation over several locations after year 2000. During 1981–2000, no significant warming occurred.

In Fig. 2, we have shown four sections which depicts (a) North and mid Indian region, (b) Indian Coastal region, (c) Lakshadweep, and (d) Andaman and Nicobar during 2000–2021. Rise in temperature is prominent and linearly increasing from year 2000 onwards in Arabian Sea, Andaman and Nicobar, and coastal and tropical locations over Indian landmass (warming $\sim$ 0.8 °C). In the north and mid Indian region (Delhi, Jaipur, and Bhopal), a slight decline in temperature is seen (cooling $\sim$ 0.5 °C). Interestingly, large scale fluctuations (3–5 years' time scale) in the time series are noticed at all the locations, these are corresponding to ENSO signals. ENSO signatures in the temperature variation are quite strong over Andaman and Nicobar, slightly weaker in Arabian Sea, nevertheless present over land region too.

Dhaka et al. [8] have shown strong ENSO event's influence on temperature in 1991 (a peak was observed in temperature data) over Trivandrum and Cochin, which is an indicative of a close association of both the parameters.

### 3.2. Warming/ Cooling Analysis at 36 Locations Over Indian Landmass and Adjoint Islands

As mentioned above, there is a diverse effect of temperature variability over Indian region; stations located in north and mid India experience a slight cooling while warming signals are obtained at other locations, which are more prominent below 20°N. Since, there are large number of locations, therefore presenting time series at all locations would be a very crowded scenario; thus, we have presented the warming and cooling quantitatively using a unique method of showing the value of slope fitted linearly in the time series of temperature data. Larger slope denotes warming (which is shown in the form of a red and orange bubble). MATLAB software has been used to visualise data in the form of bubbles over 36 locations spread in the landmass, Arabian Sea and Bay of Bengal.

The bubble chart shown in Fig. 3 represents slope of linearly fitted temperature data post year 2000. This chart helped us in data visualization in a holistic way across different geographic locations over Indian landmass and its islands. In Fig. 3, larger bubbles represent higher values

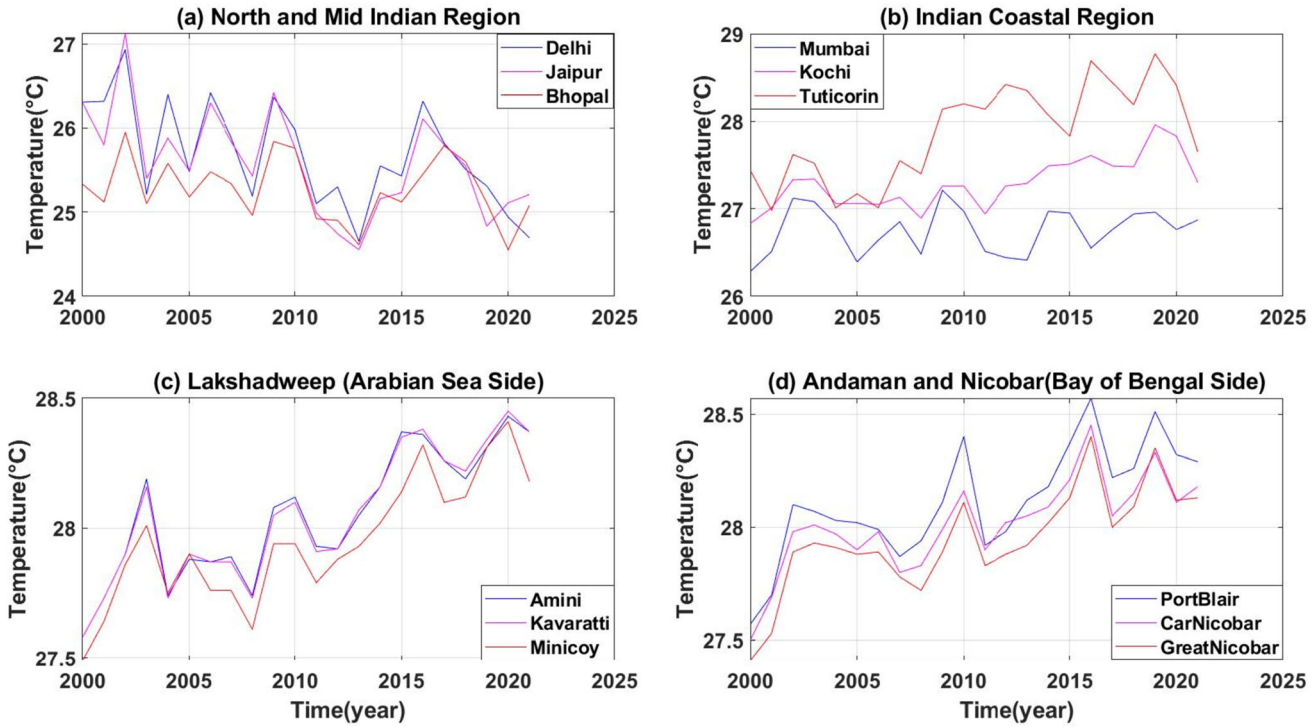


**Fig. 2** Times series of the annually averaged temperature data over (**a**) North and mid Indian region, (**b**) Indian Coastal region, (**c**) Lakshadweep, and (**d**) Andaman and Nicobar during 2000–2021. Rise in temperature is prominent and linearly increasing from year 2000 onwards. In the north and mid region (Delhi, Jaipur, and Bhopal), a slight decline in temperature is seen; while in the coastal and landmass region (Mumbai Kochi, and Tuticorin), and the stations located in Arabian Sea and Bay of Bengal show a clear rise in temperature

and smaller ones show lower values of slopes. We have considered our datasets in three sections viz. red colour points to a high slope (slope values are from 1.64 to 3.31 ∼ from 58.62° to 73.18°), orange colour to a medium slope (− 0.03 to 1.64 ∼ from − 1.71° to 58.62°) and the yellow colour point towards low slope values (− 1.7 to − 0.03 ∼ from − 59.53° to − 1.71°). Positive values of the slopes denote warming and the negative one's cooling.

This type of representation has been effective in identifying the warming hotspots and also to identify the regional variations across India. Conclusively, one can discern from Fig. 3 that about 21 locations showed a warming, mostly located in the Arabian Sea and Andaman and Nicobar, and tropical Indian region (< 20° N).

### 3.3. Relative Humidity at Indian Landmass and Adjoint Islands

In Fig. 4, we have shown four sections which depicts (a) North and mid Indian region, (b) Indian Coastal region, (c) Lakshadweep, and (d) Andaman and Nicobar during 2000–2021. Decline (rise) in relative humidity (temperature) noted which is decreasing (increasing) from year 2000 onwards in Arabian Sea, Andaman and Nicobar, and coastal and tropical locations over Indian landmass. In the north and mid region (Delhi, Jaipur, and Bhopal), a slight rise in relative humidity (decline in temperature) is seen, which is nearly 10 percent over two decades. This is interesting to note that rise in relative humidity is accompanied by cooling in temperature (∼ 0.5 °C) over this period in north and mid region. This is in good agreement with ideal conditions of atmospheric parameters. Further, it is seen that large scale fluctuations (3–5 years' time scale of ENSO) in the time series are noticed more prominently in the Arabian Sea and Bay of Bengal. However, the decline is clearly seen in the relative humidity, which is less in magnitude (∼ 2 percent). It is important to mention here that during 1981 to 2000 the trends are totally different than obtained post 2000 to 2021 (See Figure S2). Scenario of two decades of post 2000 (2000–2021) are showing contrast behaviour in both the parameters i.e. temperature and relative humidity (Figure S1).

### 3.4. Winds at Indian Landmass and Adjoint Islands

In Fig. 5, winds variations are shown. Description is given in four sections which are focussed on (a) North and mid Indian region, (b) Indian Coastal region, (c) Lakshadweep, and (d) Andaman and Nicobar during 2000–2021. Consistent decline (∼ 0.5 m/s) is noted in all sections from 2000 onwards in the Arabian Sea, Andaman and Nicobar, and coastal and tropical locations over Indian landmass. In the north and mid region (Delhi, Jaipur, and Bhopal), winds blown at a speed of roughly half than the Arabian and Andaman and Nicobar Islands.

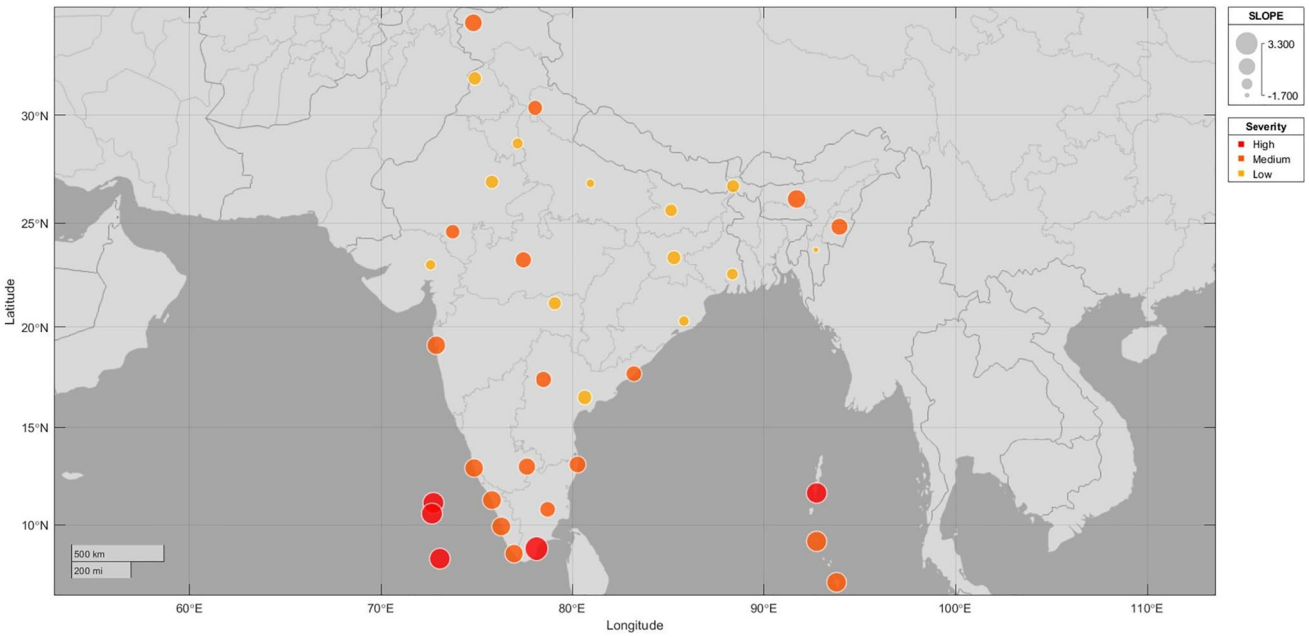


**Fig. 3** Bubble chart representation of linearly fitted temperature slopes in the time series (positive slope denotes increase in temperature while negative slope a decrease) at 36 locations over Indian landmass, Arabian Sea side (Lakshadweep), and Bay of Bengal side (Andaman and Nicobar) during 1981 to 2021. Yellow colour represents a decline in temperature (slight cooling or almost no trend), while red and orange colour denotes a rise (warming) in temperature (positive slope)

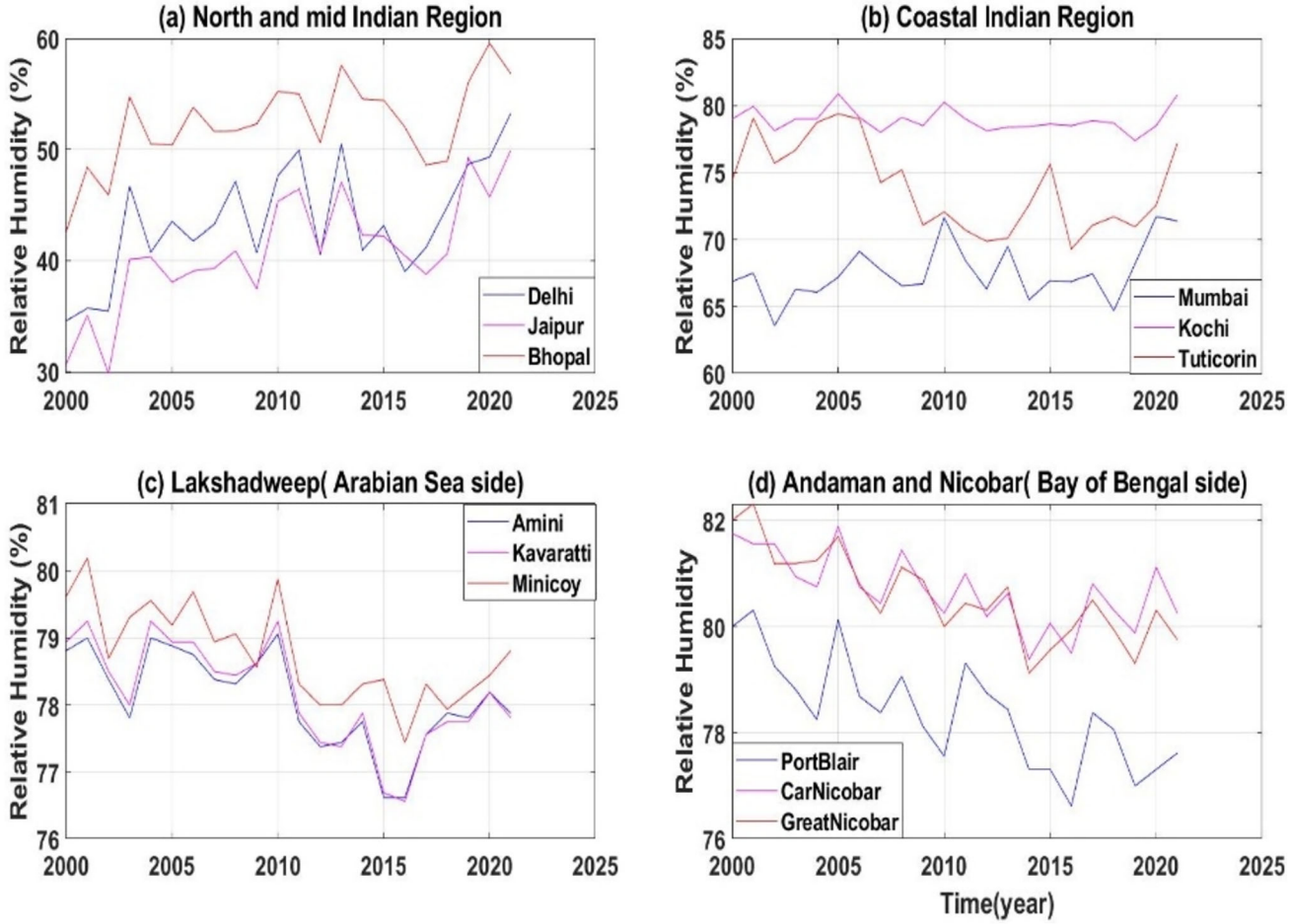


**Fig. 4** Same as Fig. 2 but for relative humidity

This is interesting to note that winds in coastal region (shown in Fig. 5c) do not show any significant change over two decades. Further, it is seen that large scale fluctuations (3–5 years' time scale of ENSO) in the time series are noticed more prominently in the Arabian Sea and Bay of Bengal. It is important to mention here that during 1981 to 2000 the trends are totally different than obtained post 2000 to 2021 (Figure S3& S5). Scenario of two decades of (2000–2021) are showing a link with (Figure S3& S5) solar cycle, there is a decline in wind-speed with decreasing sun spot numbers in all locations of Arabian Sea and Andaman Nicobar. However, solar cycle ($\sim$ 11-year cycle) does not conform to temperature in this period, temperature increased rapidly post 2000, a clear sign of global warming in the Indian Ocean. Rather, changes in temperature are coinciding with ENSO signal.

## 4. Summary and Concluding Remarks

An analysis is performed to examine trends in temperature, relative humidity, wind-speed trends over the Indian landmass and in the isles of Lakshadweep and Andaman and Nicobar over the last four decades (from 1981 to 2021).

MERRA data deployed over 36 locations (30 located over landmass), while three locations each on the Arabian Sea side as well as on the Bay of Bengal side. Coverage of large number of locations enabled us to provide a comprehensive picture of the change in meteorological parameters with solar cycle influence and ENSO signal. Results in terms of trends are more clear post 2000, making study a meaningful document from climatic point of view. Following are the highlights and concluding remarks of the results:

(1) Temperature showed a linear rise, which is more prominent after 2000, in the Arabian side as well as in the Bay of Bengal. Over the period (2000–2021), temperature increased about 0.7–0.8 °C on both sides

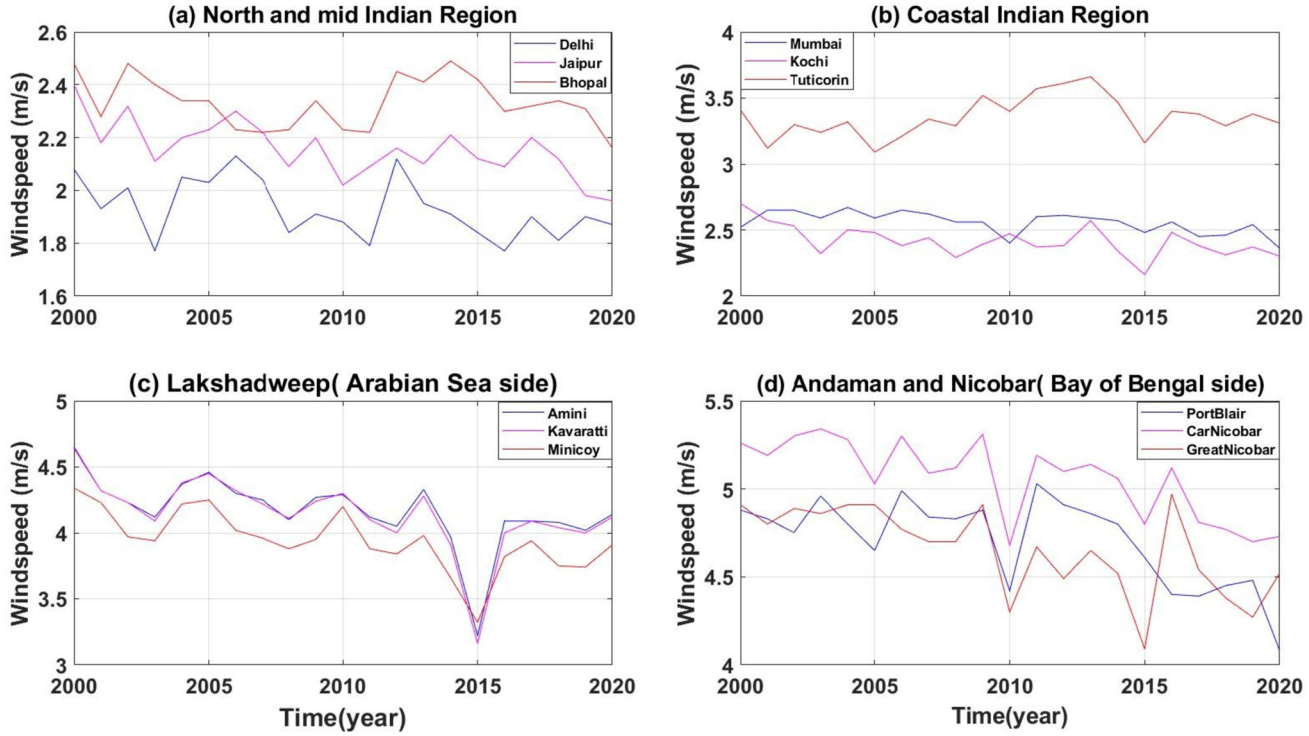


**Fig. 5** Same as Fig. 2 but for wind-speed

of Indian landmass. About 2/3 locations in the study showed increase in temperature. Rise in temperature is clearer towards lower latitude (< 15°N) region.

(2) Relative humidity data on all island locations showed a decrease (prominent during 2000–2021). These findings are displaying a complex interplay between meteorological parameters. A clear rising trend in temperature during 2000–2021 may reduce the relative humidity and hence the decreasing trend is observed. It is evident that warm air can possess more water vapour (moisture) than cold air, so with the same amount of absolute/specific humidity, air mass will possess a higher (lower) relative humidity for cold (warm) air mass. In our results, we have shown that temperature is linearly increasing thus pointing towards warmer air which eventually lead to lower relative humidity, our analysis confirms this finding.

(3) Quasi-periodic fluctuations in temperature (which is linearly rising) closely relates with the ENSO parameter (correlation coefficient 'r' using six locations spread over Arabian Sea and Andaman and Nicobar ranged from $\sim$ 0.20 to 0.34; which is statistically significant and larger towards Andaman Islands). The value of 'r' increased considerably (> 0.5) during 2000–2021, confirming rapid increase in temperature along with ENSO liner rise with synchronized quasi-periodic fluctuations.

(4) Wind-speed, in general, showed larger magnitude over Andaman and Nicobar Islands ($\sim$ 5.0 m/s yearly averaged) in comparison to Arabian Sea ($\sim$ 4.0 m/s) and also over landmass ($\sim$ 2.2 m/s).

(5) Solar cycle (sun spot numbers) and wind-speed reflects a weak positive correlation coefficient ($< \sim$ 0.40) though it is statistically significant, while no consequential correlation found between solar cycle and relative humidity.

(6) Detailed analysis suggests that relative humidity decreased over landmass as well islands during 2000–2021, temperature increased more rapidly between latitudes 7.03°N and 12.91°N post 2000 in comparison to other stations located above 15°N.

(7) Increase in temperature in the lower latitudes (< 15°N) seems thoroughly controlled by the ENSO signal.

**Supplementary Information**The online version contains supplementary material available at https://doi.org/10.1007/s12647-024-00743-4.

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# Constraining Cosmological Parameters with Viscous Modified Chaplygin Gas and Generalized Cosmic Chaplygin Gas Models in Horava-Lifshitz Gravity: Utilizing Late-time Datasets

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This study investigates accelerated cosmic expansion using the Viscous Modified Chaplygin Gas (VMMG) and Generalized Cosmic Chaplygin Gas (GCCM) within Horava-Lifshitz gravity. Our primary objective is to constrain essential cosmological parameters, such as the Hubble Parameter ($H_0$) and Sound Horizon ($r_d$). We incorporate recent datasets comprising 17 Baryon Acoustic Oscillation observations, 33 Cosmic Chronometer measurements, 40 Type Ia Supernovae data points, 24 quasar Hubble diagram data points, and 162 Gamma Ray Bursts data points. Additionally, we integrate the most recent determination of the Hubble constant (R22). Treating $r_d$ as a free parameter helps alleviate bias, enhance precision, and improve dataset compatibility. By simulating random correlations in the covariance matrix, errors are reduced. The obtained values of ($H_0$) and ($r_d$) are consistent with those from Planck and SDSS. Cosmography tests offer insights into the dynamics of both models, aiding our understanding of cosmological evolution. Statefinder diagnostics deepen our understanding of cosmic expansion dynamics and aid in distinguishing between different cosmological models. The $o_m$ Diagnostic test reveals that at late times, VMMG falls in the phantom region and GCCM falls in the phantom quintessence region. The Akaike Information Criterion (AIC) and Bayesian Information Criterion (BIC) provide support for all models under consideration, indicating that each model offers a plausible explanation. Notably, the ΛCDM model emerges with the lowest AIC score, suggesting its relatively superior fit compared to others. Additionally, validation through the reduced $\chi^2_{\rm red}$ statistic confirms satisfactory fits across all models, further reinforcing their credibility in explaining the observed data.

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## I. INTRODUCTION

In modern cosmology, explaining cosmic accelerated expansion presents a significant challenge. Observations from Type Ia supernovae (SNIa), baryon acoustic oscillations (BAOs), and the Cosmic Microwave Background Radiation (CMBR) reveal two distinct eras of accelerated expansion: inflation and late-time cosmic acceleration. This acceleration contradicts expectations of gravitational deceleration from normal baryonic matter. To account for this, physicists propose the existence of an unknown entity, termed dark energy (DE), responsible for producing a repulsive force. DE dominates 70% of the total cosmic budget. The simplest model for DE arises from Einstein's field equations, known as the cosmological constant. This constant accounts for the observed acceleration, providing a theoretical framework

for understanding cosmic accelerated expansion. The model faces two significant challenges known as fine-tuning and the cosmic coincidence problem [1–4]. To address these issues, researchers have pursued different avenues. One approach involves modifying the matter component in Einstein's field equations, resulting in various dark energy models such as the rolling scalar field [5, 6], tachyon [7], and phantom models [8]. These models often stem from theories beyond classical physics, including quantum gravity models like holographic dark energy (HDE) [9] and new agegraphic dark energy (NADE) [10–14]. Another strategy focuses on altering the geometry part of Einstein's equations or extending General Relativity with quantum corrections. This leads to diverse modified gravity models, including $f(R)$ gravity [15] and $f(T)$ gravity [16] etc.

One of the compelling alternatives to Einstein's General Theory of Relativity is the Hořava-Lifshitz (HL) gravity. HL gravity offers a compelling alternative to Einstein's General Theory of Relativity, initially proposed by Petr Hořava. It aims to bridge the gap between general relativity and quantum mechanics by employing techniques from traditional quantum field theories to quantize gravity. Unlike general relativity, HL gravity exhibits full Lorentz symmetry emergence only at the infrared limit. It is characterized by power counting, making it renormalizable and potentially providing a UV-complete theory of gravity. Notably, this theory demonstrates anisotropic scaling of space and time dimensions. Various cosmological scenarios have been explored within the framework of HL gravity in the scientific literature. The investigation of scalar and tensor perturbations within Horava gravity, both with and without detailed balance, has been conducted on a flat background, as discussed in [17]. Furthermore, HL cosmology has been reexamined by introducing an additional scalar field, leading to an effective phase of dark energy [18]. Another study [19] delves into the Power Law Entropy Corrected Holographic Dark Energy (PLECHDE) model, employing the Granda-Oliveros cut-off as an infrared cut-off within the context of HL Horava cosmology. Additionally, the New Agegraphic Dark Energy (NADE) model, incorporating power-law corrected entropy, has been explored within the framework of HL cosmology. In addressing late-time acceleration of the Universe, various cosmological quantities have been examined for Tsallis, Rényi, and Sharma–Mittal holographic dark energy models, alongside modified field equations for logarithmic and power law versions of entropy corrected models, all within the framework of HL gravity [14] Moreover, the phenomenon of matter–antimatter asymmetry has been scrutinized in the background of HL gravity via gravitational baryogenesis [20]. While these theoretical models may offer alternatives to the standard ΛCDM model, their viability hinges on their alignment with observational data sets such as TORNY and the Gold sample data set [21, 22]. Consequently, numerous studies have been conducted in the literature to constrain dark energy and modified gravity models in light of observational data [23–26]. In [27], researchers have investigated constraints on the parameter $\Lambda$ in HL gravity, which governs the transition from Ultra-Violet to Infra-Red regimes. Additionally, they considered the requirements of Big Bang Nucleosynthesis (BBN) in their analysis. The study on cosmological constraints of Horava gravity was further extended in [28] to incorporate observations from GW170817 and GRB170817A, while also addressing degeneracy with massive neutrinos. Numerous investigations have focused on constraining Horava gravity, utilizing different approaches including BBN bounds, and observational data from sources like CMB [29, 30], BAO [29, 30], galaxy power spectrum, and SNIa measurements [31–33]. Consequently, in [34], a cosmographic analysis was conducted on two recent parametrizations for dark energy models, namely CBDRM-type and CADMM-type, within the framework of HL gravity. In recent times, the Chaplygin gas dark energy model has gained significant traction in cosmology for its potential as a unified explanation for both the late-time cosmic acceleration and the matter-dominated era. In its simplest form, this model is characterized by an Equation of State (EoS).

$$p_d = -\frac{A}{\rho_d}, \quad A > 0 \text{ constant} \tag{1}$$

Kamenshchik et al. [35] and Gorini et al. [36] introduced models that explain the late-time acceleration of the Universe but fall short in describing the era of structure formation. In response, various generalizations have been proposed in the literature. These include the Modified Chaplygin Gas (MCG) [37], Generalized Chaplygin Gas (GCG) [38], Generalized Cosmic Chaplygin Gas (GCCG) [39], Variable Modified Chaplygin Gas (VMCG) [40], New Variable Modified Chaplygin Gas (NVMCG) [41], Viscous Modified Chaplygin Gas [42–45], and others. These models aim to unify dark matter and dark energy components in the Universe. Among these, the GCG model has shown promise by successfully aligning with observational data from sources such as the Wilkinson Microwave Anisotropy Probe (WMAP), CMBR, and BAO [46]. In [47], the Modified Chaplygin Gas (MCG) model has been explored concerning the peak location of the CMBR spectrum. The analysis suggested that the optimal range for the first parameter lies between $(-0.35, 0.025)$. Moreover, in [48], the MCG model has been constrained using recent observational data from 182 Gold Type Ia Supernovae, the 3-year WMAP CMB shift parameter, and the SDSS baryon acoustic peak. The parameter values resulting in the best fit are determined as (-0.085, 0.822, 1.724) for parameters $A, B, \alpha$ respectively. In [49] presents the best-fit parameter values of the MCG model within the framework of Einstein-Aether Gravity. This determination is made through an analysis of BAO and CMB

observations. In [50], the authors explore observational constraints on MCG within the framework of HL gravity. They employ various observational datasets such as $H(z)$ - $z$, BAO peak parameter, and CMB shift parameter to scrutinize cosmologies both within detailed balance and beyond detailed-balance scenarios. Inspired by these investigations, we delve into the constraints on fundamental cosmic parameters within dark energy models. Specifically, we utilize the Pacif parametrization schemes, as introduced in [51–53], along with recent measurements of the Hubble parameter, denoted as $H(z)$, encompassing 33 data points. For our analysis, we focus on two dark energy models: the GCCG [39] and the VMG [42–45] within the framework of HL Gravity.

Motivated by the aforementioned considerations, we investigate two dark energy models within the framework of HL Gravity: Viscous Modified Chaplygin Gas (VMMG) and Generalized Cosmic Chaplygin Gas (GCCG). We utilize the covariance matrix to minimize errors and obtain the best-fit values for each cosmological parameter, including the present-day Hubble function $H_0$ and the Sound Horizon $r_d$. This paper is structured as follows: In Section II, we lay the groundwork by discussing the fundamental equations governing HL Gravity. In Section III, we introduce two dark energy models, namely, VMMG and GCCG. Subsequently, we derive the expression for the Hubble parameter $H$ as a function of observational parameters and redshift $z$ for the two dark energy models under consideration. This step is crucial as it establishes a vital link between theoretical predictions and observational data. In Section IV, we outline our methodology for analyzing the data and determining the optimal values of key cosmological parameters within both dark energy models. In Section V, we delve into the discussion and visualization of cosmographic parameters associated with each dark energy model. In Section VI, we perform statefinder and diagnostic tests to further assess the viability and compatibility of our models with observational data. Section VII presents the results obtained from our analysis, including the constraints on cosmological parameters, comparisons between models, and implications for our understanding of dark energy and gravitational theories. Finally, in Section VIII, we conclude our study by summarizing the key findings and offering concluding remarks on the implications of our results.

## II. FUNDAMENTAL EQUATIONS OF HORAVA-LIFSHITZ GRAVITY

The Arnowitt-Deser-Misner (ADM) decomposition of the metric, often employed for its convenience, is expressed as [54–56]:

$$ds^2 = -N^2dt^2 + g_{ij}\left(dx^i + N^i dt\right)\left(dx^j + N^j dt\right) \quad (2)$$

Here, $N$ denotes the lapse function, $N_i$ the shift vector, and $g_{ij}$ the metric tensor. A scaling transformation of coordinates $t \to l^3 t$ and $x^i \to l x^i$ is applied. The Holst–Lorentz (HL) gravity action is comprised of two components: the kinetic and potential terms, represented as:

$$S_g = S_k + S_v = \int dt d^3x \sqrt{g} N \left(L_k + L_v\right)$$

The kinetic term $S_k$ is defined as:

$$S_k = \int dt d^3x \sqrt{g} N \left[\frac{2\left(K_{ij}K^{ij} - \lambda K^2\right)}{\kappa^2}\right]$$

Where the extrinsic curvature $K_{ij}$ is given by:

$$K_{ij} = \frac{\dot{g}_{ij} - \nabla_i N_j - \nabla_j N_i}{2N}$$

When dealing with the Lagrangian, denoted as $L_v$, the number of invariants can be decreased owing to its symmetric nature, as noted in references [57–59]. This symmetry, referred to as detailed balance, influences the expanded expression of the action.

$$S_g = \int dt d^3x \sqrt{g} N \left[\frac{2\left(K_{ij}K^{ij} - \lambda K^2\right)}{\kappa^2} + \frac{\kappa^2 C_{ij}C^{ij}}{2\omega^4} - \frac{\kappa^2 \mu \epsilon^{ijk} R_{i,j} \Delta_j R^l_k}{2\omega^2\sqrt{g}}\right.$$

$$\left. + \frac{\kappa^2\mu^2 R_{ij}R^{ij}}{8} - \frac{\kappa^2\mu^2}{8(3\lambda-1)}\left\{\frac{(1-4\lambda)R^2}{4} + \Lambda R - 3\Lambda^2\right\}\right],$$

where $C^{ij} = \frac{\epsilon^{ijk}\Delta_k\left(R^j_i - \frac{R}{4}\delta^j_i\right)}{\sqrt{g}}$

In HL theory, the Cotton tensor and its covariant derivatives are derived with respect to the spatial metric $g_{ij}$. Here, $\epsilon^{ijk}$, $\lambda$ are an antisymmetric unit tensor and a dimensionless constant, respectively. Constants $\kappa$, $\omega$, and

$\mu$ are also involved. Horava proposed a gravitational action under the assumption that the lapse function $N$ depends only on time (i.e., $N \equiv N(t)$). When employing the Friedmann-Robertson-Walker (FRW) metric with $N = 1$, $g_{ij} = a^2(t)\gamma_{ij}$, and $N^i = 0$, where

$$\gamma_{ij}dx^i dx^j = \frac{dr^2}{1-kr^2} + r^2 d\Omega_2^2,$$

representing open ($k = -1$), closed ($k = 1$), and flat ($k = 0$) universes, respectively. The Friedmann equations, governing the variation of $N$ and $g_{ij}$, take the following form [60, 61]:

$$H^2 = \frac{\kappa^2\rho}{6\,(3\lambda-1)} + \frac{\kappa^2}{6\,(3\lambda-1)}\left[\frac{3\kappa^2\mu^2k^2}{8\,(3\lambda-1)\,a^4} + \frac{3\kappa^2\mu^2\Lambda^2}{8\,(3\lambda-1)}\right] - \frac{\kappa^4\mu^2\Lambda k}{8\,(3\lambda-1)^2\,a^2}, \tag{3}$$

$$\dot{H} + \frac{3H^2}{2} = -\frac{\kappa^2 p}{4\,(3\lambda-1)} - \frac{\kappa^2}{4\,(3\lambda-1)}\left[\frac{3\kappa^2\mu^2k^2}{8\,(3\lambda-1)\,a^4} + \frac{3\kappa^2\mu^2\Lambda^2}{8\,(3\lambda-1)}\right] - \frac{\kappa^4\mu^2\Lambda k}{8\,(3\lambda-1)^2\,a^2} \tag{4}$$

In this context, the constant term is attributed to the cosmological constant, which is a distinctive contribution of HL (Horava-Lifshitz) gravity. Additionally, there's a term proportional to $\frac{1}{a^4}$, interpreted as the "Dark radiation term" according to [55, 56]. Here, $H = \frac{\dot{a}}{a}$ represents the Hubble parameter, with the dot indicating a derivative with respect to cosmic time $t$. Considering a universe composed of two primary components: dark matter (DM) and dark energy (DE), the total energy density $\rho$ and total pressure $p$ are expressed as the sum of densities and pressures of these constituents: $\rho = \rho_m + \rho_d$ and $p = p_m + p_d$, respectively. Consequently, the conservation equations governing the evolution of DM and DE are as follows:

$$\dot{\rho}_m + 3H(\rho_m + p_m) = 0 \tag{5}$$

and

$$\dot{\rho}_d + 3H(\rho_d + p_d) = 0. \tag{6}$$

In the context where dark matter is considered pressureless ($p_m = 0$), Equation (DM) implies that the density of dark matter, $\rho_m$, follows a scaling behavior of $\rho_m = \rho_{m0}a^{-3}$, where $\rho_{m0}$ represents the present energy density of dark matter, and $a$ denotes the scale factor. Now, let's introduce the EoS parameter, denoted by $w(z)$, defined as the ratio of pressure $p$ to energy density $\rho$. Utilizing Equation (DE), we can express the energy density of dark energy, $\rho_d$, as $\rho_{d0}\ e^{3\int \frac{1+w(z)}{1+z}dz}$, where $\rho_{d0}$ signifies the present value of the energy density of dark energy. To further simplify, we introduce $G_c$ as $G_c = \frac{\kappa^2}{16\pi(3\lambda-1)}$, while ensuring that $\frac{\kappa^4\mu^2\Lambda}{8(3\lambda-1)} = 1$ to maintain detailed balance. With these definitions, the Friedmann equations can be re-expressed accordingly.

$$H^2 = \frac{8\pi G_c}{3}(\rho_m + \rho_d) + \left(\frac{k^2}{2\Lambda a^4} + \frac{\Lambda}{2}\right) - \frac{k}{a^2}, \tag{7}$$

$$\dot{H} + \frac{3}{2}H^2 = -4\pi G_c p_d - \left(\frac{k^2}{4\Lambda a^4} + \frac{3\Lambda}{4}\right) - \frac{k}{2a^2}. \tag{8}$$

Using the dimensionless parameters $\Omega_{i0} \equiv \frac{8\pi G_c}{3H_0^2}\rho_{i0}$, $\Omega_{k0} = -\frac{k}{H_0^2}$, $\Omega_{\Lambda 0} = \frac{\Lambda}{2H_0^2}$, we obtain

$$H^2(z) = H_0^2\left[\Omega_{m0}(1+z)^3 + \Omega_{k0}(1+z)^2 + \Omega_{\Lambda 0} + \frac{\Omega_{k0}^2(1+z)^4}{4\Omega_{\Lambda 0}} + \Omega_{d0}\ e^{3\int \frac{1+w(z)}{1+z}dz}\right] \tag{9}$$

with

$$\Omega_{m0} + \Omega_{d0} + \Omega_{k0} + \Omega_{\Lambda 0} + \frac{\Omega_{k0}^2}{4\Omega_{\Lambda 0}} = 1 \tag{10}$$

The observational data analysis for linear, CPL and JBP models in HL gravity have been studied in [62].

## III. TWO DARK ENERGY MODELS

### A. Viscous modified Chaplygin gas (VMMG)

In the context of the viscous modified Chaplygin gas (VMCG), the equation describing pressure is provided as

follows:

$$p_d = A\rho_d - \frac{B}{\rho_d^{\alpha}} - 3\zeta_0\sqrt{\rho_d}H \tag{11}$$

In the given scenario, where $A$, $B$, and $\alpha$ are constants, substitution of $p_d$ from Eq. (11) into Eq. (6) yields:

$$\rho_d = \left(\frac{B}{1+A-\sqrt{3}\zeta_0} + \frac{C_1}{a^{3(1+\alpha)(1+A-\sqrt{3}\zeta_0)}}\right)^{\frac{1}{1+\alpha}} \tag{12}$$

where $C_1$ is an integrating constant. The above expression can be further re-written as:

$$\rho_d = \rho_{d0}\{A_s+(1-A_s)(1+z)^{3(1+\alpha)(1+A-\sqrt{3}\zeta_0)}\}^{\frac{1}{1+\alpha}} \tag{13}$$

where $\rho_0$ being the energy density value at the present epoch, $A_s = \frac{B}{(1+A-\sqrt{3}\zeta_0)C_1+B}$ satisfying the conditions $0 < A_s < 1$ and $1 + A - \sqrt{3}\zeta_0 > 0$, and $\rho_{d0}^{1+\alpha} = \frac{(1+A-\sqrt{3}\zeta_0)C_1+B}{1+A-\sqrt{3}\zeta_0}$, So from (9), (10) and (13), we obtain

$$\begin{aligned} H^2(z) = \quad & H_0^2\left[\Omega_{m0}(1+z)^3 + \Omega_{k0}(1+z)^2 + \Omega_{\Lambda 0} + \frac{\Omega_{k0}^2(1+z)^4}{4\Omega_{\Lambda 0}}\right. \\ & \left. + \left(1-\Omega_{m0}-\Omega_{k0}-\Omega_{\Lambda 0}-\frac{\Omega_{k0}^2}{4\Omega_{\Lambda 0}}\right)\left[A_s+(1-A_s)(1+z)^{3(1+\alpha)(1+A-\sqrt{3}\zeta_0)}\right]^{\frac{1}{1+\alpha}}\right] \end{aligned} \tag{14}$$

### B. Generalized Cosmic Chaplygin Gas (GCCG)

In this analysis, we examine the generalized cosmic Chaplygin gas (GCCG) as a potential candidate for dark energy (DE), characterized by its EoS given by [39]

$$p_d = -\rho_d^{-\mu}\left[K + (\rho_d^{1+\mu} - K)^{-\eta}\right] \tag{15}$$

where $K = \frac{\nu}{1+\eta} - 1$ and $-l < \eta < 0$ with $l$ $(> 1)$ is a constant. $\mu$, $\nu$ are also constants. It can be seen that in limiting case $\eta \to 0$, the GCCG model behaves as generalized Chaplygin gas model and for $\eta \to -1$, the GCCG acts like de Sitter fluid. Exploiting (6), the solution of energy density for GCCG is derived as [63]

$$\rho_d = \left[K + \left(1 + C_2\ (1+z)^{3(1+\mu)(1+\eta)}\right)^{\frac{1}{1+\eta}}\right]^{\frac{1}{1+\mu}} \tag{16}$$

where $C_1$ is constant. This expression is written as

$$\rho_d = \rho_{d0}\left[C_s + (1-C_s)\left(B_s + (1-B_s)(1+z)^{3(1+\mu)(1+\eta)}\right)^{\frac{1}{1+\eta}}\right]^{\frac{1}{1+\mu}} \tag{17}$$

where $z$ is the redshift, $B_s = \frac{1}{1+C_2}$, $A_s = \left(1 + K^{-1}B_s^{-\frac{1}{1+\eta}}\right)^{-1}$ and $\rho_{d0}^{1+\mu} = K + B_s^{-\frac{1}{1+\eta}}$.
So from (9), (10) and (17), we obtain

$$\begin{aligned} H^2(z) = \quad & H_0^2\left[\Omega_{m0}(1+z)^3 + \Omega_{k0}(1+z)^2 + \Omega_{\Lambda 0} + \frac{\Omega_{k0}^2(1+z)^4}{4\Omega_{\Lambda 0}}\right. \\ & \left. + \left(1-\Omega_{m0}-\Omega_{k0}-\Omega_{\Lambda 0}-\frac{\Omega_{k0}^2}{4\Omega_{\Lambda 0}}\right)\left[A_s+(1-A_s)\left(B_s+(1-B_s)(1+z)^{3(1+\mu)(1+\eta)}\right)^{\frac{1}{1+\eta}}\right]^{\frac{1}{1+\mu}}\right] \end{aligned} \tag{18}$$

## IV. METHODOLOGY

In our investigation, we meticulously curated recent observations of Baryon Acoustic Oscillations (BAOs) sourced from a variety of galaxy surveys, with particular

emphasis on leveraging data from the Sloan Digital Sky Survey (SDSS) [64–69]. Additionally, we incorporated datasets from other reputable sources such as the Dark Energy Survey (DES) [70], Dark Energy Camera Legacy Survey (DECaLS) [71], and the 6dFGS Baryon Acoustic Oscillation survey (6dFGS BAO) [72] to ensure the breadth and diversity of our dataset. Recognizing the potential interdependencies among our selected data points, we diligently addressed this concern. While our primary aim was to mitigate highly correlated points, we also recognized the necessity of managing any existing correlations to uphold the integrity and precision of our analysis. To accurately estimate systematic errors, we employed mock data generated through N-body simulations. These simulations helped us determine covariance matrices precisely, which are crucial for understanding how different data points relate to each other. However, since measurements from various observational surveys differ in nature, obtaining accurate covariance matrices posed a significant challenge. To tackle this challenge, we followed an approach outlined in previous studies. We used a simple form where the diagonal elements of the covariance matrix ($C_{ii}$) were set equal to the square of the $1\sigma$ errors ($\sigma_i^2$). This method, described in earlier research, helped us handle the complexities of covariance estimation. To replicate interdependencies within our chosen subset, we incorporated off-diagonal components into the covariance matrix, maintaining symmetry. This involved randomly selecting pairs of data points and assigning non-diagonal elements based on the product of the $1\sigma$ errors of the respective data points. By incorporating non-negative correlations in this manner, we effectively represented correlations within 55% of our chosen BAO dataset. Visual representations of our analysis, shown in Fig 1 and Fig 2, illustrate the posterior distributions for the VMMG and GCCG Models. We compared results obtained with and without a test random covariance matrix containing fourteen components. Surprisingly, we found that the impact of the covariance matrix on our results was minimal, even when we varied the number of components. This finding underscores the robustness of our analysis methodology. In our ongoing research, we expanded our BAO dataset by integrating thirty independent measurements of the Hubble parameter sourced from the cosmic chronometers (CC) technique, as referenced in prior studies [73–76]. Additionally, we augmented our dataset with the most recent Pantheon sample data focusing on Type Ia Supernovae (SNIa) [77]. To enrich our investigation, we introduced supplementary datasets, including 24 binned measurements of quasar (Q) distance modulus [78] and a comprehensive set of 162 Gamma-Ray Bursts (GRBs) [79], both of which have been extensively discussed in previous literature. Furthermore, to enhance the robustness of our analysis, we incorporated the latest measurement of the Hubble constant (R22) as an additional prior constraint [80]. In our analysis, we employed a nested sampling technique using the Polychord package, cited as [81]. This approach efficiently explores high-dimensional parameter spaces, allowing us to obtain robust results. Additionally, we utilized the GetDist package [82], to present our findings in a clear and informative manner. GetDist facilitates the visualization and interpretation of our results, enhancing their accessibility to both researchers and broader audiences.

## V. COSMOGRAPHY PARAMETERS

Cosmography Parameters play a crucial role in our comprehension of the universe's dynamics and evolution. These parameters provide us with insights into the underlying structure, expansion, and behavior of the cosmos. In astrophysical research, they serve as fundamental tools for analyzing various cosmological models and understanding the intricate interplay between different components of the Universe [83]. One important aspect of Cosmography Parameters is their ability to shed light on the acceleration or deceleration of cosmic expansion. The deceleration parameter, often denoted as 'q', quantifies the rate at which the universe's expansion is slowing down. It is defined by the formula: $q = -\frac{\ddot{a}a}{\dot{a}^2}$ where 'a' represents the scale factor of the universe, and dots denote derivatives with respect to time. A negative value of 'q' indicates an accelerating expansion, while a positive value suggests a decelerating one. This parameter holds significant implications for theories of dark energy and the ultimate fate of the Universe [84]. In addition to deceleration, higher-order parameters such as jerk and snap provide further insights into the dynamics of cosmic expansion. The jerk parameter, denoted by 'j', represents the rate of change of acceleration with time and is given by: $j = \frac{\dddot{a}a}{\dot{a}^3}$. It offers a deeper understanding of the transitions in the universe's expansion rate, potentially revealing clues about the nature of dark energy and gravitational interactions at large scales [85]. The snap parameter, denoted as 's', captures the rate of change of jerk with time and is expressed as: $s = \frac{\ddddot{a}a}{\dot{a}^4}$. While the snap parameter is less commonly discussed compared to deceleration and jerk, it offers valuable insights into the finer details of cosmic dynamics, especially in scenarios where precise measurements are crucial for testing theoretical predictions [86]. These parameters collectively provide a comprehensive framework for characterizing the evolution of the universe and investigating the underlying physics governing its behavior.

| MCMC Results | | | | | | |
|---|---|---|---|---|---|---|
| Model | Parameter | Priors | BAO | BAO + R22 | Joint | Joint + R22 |
| ΛCDM Model | $H_0$ | [50,100] | $70.256500^{\pm 9.206346}_{\pm 5.502574}$ | $73.798696^{\pm 2.543240}_{\pm 1.315504}$ | $69.837362^{\pm 2.478047}_{\pm 1.204873}$ | $71.508817^{\pm 1.614354}_{\pm 0.882681}$ |
| | $\Omega_{m0}$ | [0.,1.] | $0.270161^{\pm 0.033280}_{\pm 0.013827}$ | $0.268255^{\pm 0.043787}_{\pm 0.016790}$ | $0.274526^{\pm 0.021367}_{\pm 0.009858}$ | $0.270609^{\pm 0.022243}_{\pm 0.009678}$ |
| | $\Omega_{d0}$ | [0.,1.] | $0.725842^{\pm 0.019262}_{\pm 0.011842}$ | $0.727203^{\pm 0.024379}_{\pm 0.013626}$ | $0.721607^{\pm 0.015585}_{\pm 0.007421}$ | $0.724854^{\pm 0.016354}_{\pm 0.007274}$ |
| | $r_d$(Mpc) | [100.,200.] | $145.807497^{\pm 13.994434}_{\pm 9.060325}$ | $138.345762^{\pm 4.939114}_{\pm 2.451777}$ | $145.811932^{\pm 4.545176}_{\pm 2.347736}$ | $142.591327^{\pm 3.951717}_{\pm 1.850175}$ |
| | $r_d/r_{fid}$ | [0.9,1.1] | $0.970661^{\pm 0.068973}_{\pm 0.055989}$ | $0.930500^{\pm 0.028238}_{\pm 0.021272}$ | $0.974064^{\pm 0.057975}_{\pm 0.033510}$ | $0.947662^{\pm 0.043021}_{\pm 0.028335}$ |
| VMMG Model | $H_0$ | [50,100] | $63.076981^{\pm 6.920660}_{\pm 4.476269}$ | $72.623184^{\pm 1.918024}_{\pm 0.877409}$ | $66.397928^{\pm 2.808849}_{\pm 1.628310}$ | $71.612274^{\pm 1.383053}_{\pm 0.675375}$ |
| | $\Omega_{m0}$ | [0.,1.] | $0.309681^{\pm 0.044682}_{\pm 0.023961}$ | $0.293673^{\pm 0.029553}_{\pm 0.018701}$ | $0.323977^{\pm 0.039638}_{\pm 0.021140}$ | $0.286455^{\pm 0.021394}_{\pm 0.007862}$ |
| | $\Omega_{\Lambda 0}$ | [0.,0.1] | $0.046372^{\pm 0.041255}_{\pm 0.031249}$ | $0.025434^{\pm 0.024214}_{\pm 0.017776}$ | $0.051223^{\pm 0.047786}_{\pm 0.028907}$ | $0.005226^{\pm 0.005022}_{\pm 0.004198}$ |
| | $\Omega_{ko}$ | [-0.1,0.1] | $-0.100604^{\pm 0.047937}_{\pm 0.038954}$ | $-0.102529^{\pm 0.043818}_{\pm 0.034833}$ | $-0.106191^{\pm 0.042359}_{\pm 0.033828}$ | $-0.103724^{\pm 0.044595}_{\pm 0.034139}$ |
| | $A_s$ | [0.,1.] | $0.623191^{\pm 0.575108}_{\pm 0.316326}$ | $0.669894^{\pm 0.570953}_{\pm 0.300692}$ | $0.578927^{\pm 0.471071}_{\pm 0.246275}$ | $0.723788^{\pm 0.603990}_{\pm 0.250656}$ |
| | $\alpha$ | [0.,1.] | $0.456719^{\pm 0.452516}_{\pm 0.350213}$ | $0.510590^{\pm 0.487738}_{\pm 0.364617}$ | $0.577261^{\pm 0.541369}_{\pm 0.333066}$ | $0.482360^{\pm 0.461090}_{\pm 0.349962}$ |
| | $A$ | [0.,1.] | $0.424731^{\pm 0.409057}_{\pm 0.303642}$ | $0.424469^{\pm 0.389732}_{\pm 0.306861}$ | $0.249583^{\pm 0.242093}_{\pm 0.174369}$ | $0.322933^{\pm 0.301106}_{\pm 0.232177}$ |
| | $\zeta_0$ | [0.,1.] | $0.719277^{\pm 0.281126}_{\pm 0.160434}$ | $0.771839^{\pm 0.339331}_{\pm 0.173162}$ | $0.856714^{\pm 0.205339}_{\pm 0.108135}$ | $0.821935^{\pm 0.283862}_{\pm 0.123697}$ |
| | $r_d$ (Mpc) | [100.,200.] | $151.444156^{\pm 16.240184}_{\pm 9.740859}$ | $135.122570^{\pm 5.514129}_{\pm 2.867547}$ | $145.962162^{\pm 5.109759}_{\pm 2.284883}$ | $141.546739^{\pm 3.055590}_{\pm 1.527315}$ |
| | $r_d/r_{fid}$ | [0.9,1.1] | $1.002605^{\pm 0.093906}_{\pm 0.065483}$ | $0.919299^{\pm 0.017935}_{\pm 0.014509}$ | $0.974324^{\pm 0.059446}_{\pm 0.027915}$ | $0.947252^{\pm 0.041848}_{\pm 0.023070}$ |
| GCCG Model | $H_0$ | [50,100] | $66.590458^{\pm 7.943618}_{\pm 3.830490}$ | $73.043659^{\pm 1.921783}_{\pm 0.900965}$ | $69.234519^{\pm 2.085606}_{\pm 1.043849}$ | $71.688017^{\pm 1.386952}_{\pm 0.737745}$ |
| | $\Omega_{m0}$ | [0.,1.] | $0.290474^{\pm 0.071365}_{\pm 0.044568}$ | $0.279744^{\pm 0.074140}_{\pm 0.045824}$ | $0.232374^{\pm 0.031183}_{\pm 0.024797}$ | $0.227590^{\pm 0.026817}_{\pm 0.022533}$ |
| | $\Omega_{\Lambda 0}$ | [0.,0.1] | $0.067840^{\pm 0.051789}_{\pm 0.020559}$ | $0.062527^{\pm 0.055079}_{\pm 0.025203}$ | $0.068477^{\pm 0.041632}_{\pm 0.023960}$ | $0.066024^{\pm 0.050106}_{\pm 0.023199}$ |
| | $\Omega_{ko}$ | [-0.1,0.1] | $-0.055808^{\pm 0.041222}_{\pm 0.031984}$ | $-0.048914^{\pm 0.047402}_{\pm 0.027088}$ | $-0.035985^{\pm 0.054157}_{\pm 0.016567}$ | $-0.042903^{\pm 0.051167}_{\pm 0.026621}$ |
| | $A_s$ | [0.5,1.] | $0.845407^{\pm 0.265680}_{\pm 0.115460}$ | $0.835317^{\pm 0.284070}_{\pm 0.129186}$ | $0.746478^{\pm 0.267879}_{\pm 0.125267}$ | $0.762105^{\pm 0.259584}_{\pm 0.138390}$ |
| | $B_s$ | [0.3,1.] | $0.777478^{\pm 0.302082}_{\pm 0.195466}$ | $0.767995^{\pm 0.308703}_{\pm 0.189570}$ | $0.770860^{\pm 0.298653}_{\pm 0.150548}$ | $0.784111^{\pm 0.287660}_{\pm 0.151517}$ |
| | $\mu$ | [0.,1.] | $0.377164^{\pm 0.350000}_{\pm 0.295752}$ | $0.398506^{\pm 0.380732}_{\pm 0.304323}$ | $0.638717^{\pm 0.541761}_{\pm 0.272800}$ | $0.567148^{\pm 0.506744}_{\pm 0.299906}$ |
| | $\eta$ | [0.,1.] | $0.502387^{\pm 0.449156}_{\pm 0.340965}$ | $0.461452^{\pm 0.450812}_{\pm 0.320349}$ | $0.616084^{\pm 0.508848}_{\pm 0.289631}$ | $0.644756^{\pm 0.544710}_{\pm 0.266663}$ |
| | $r_d$ (Mpc) | [100.,200.] | $151.484609^{\pm 16.504765}_{\pm 10.451305}$ | $138.032959^{\pm 3.975253}_{\pm 2.136997}$ | $147.187439^{\pm 4.771847}_{\pm 1.806239}$ | $142.329222^{\pm 2.801019}_{\pm 1.514611}$ |
| | $r_d/r_{fid}$ | [0.9,1.1] | $1.006738^{\pm 0.095708}_{\pm 0.065848}$ | $0.930724^{\pm 0.028873}_{\pm 0.022444}$ | $0.979584^{\pm 0.059617}_{\pm 0.032241}$ | $0.945289^{\pm 0.039088}_{\pm 0.024865}$ |

TABLE I: Constraints at the 95% confidence level (CL) on the cosmological parameters for the standard ΛCDM, VMMG and GCCG models.

| Numerical values of different cosmography parameters at different epochs. | | | | | | | |
|---|---|---|---|---|---|---|---|
| Models | Redshift | deceleration epochs | Numerical Value | jerk epochs | Numerical Value | snap epochs | Numerical Value |
| ΛCDM Model | $z \longrightarrow \infty$ | $(q_i)$ | 0.449061 | $(j_i)$ | 1 | $(s_i)$ | 3.359387 |
| | $z \longrightarrow 0$ | $(q_0)$ | -0.550623 | $(j_0)$ | 1 | $(s_0)$ | 0.357323 |
| | $z \longrightarrow -1$ | $(q_f)$ | -1 | $(j_f)$ | 1 | $(s_f)$ | -1 |
| | $z_{tr}$ | $(q = 0)$ | 0.682484 | – | – | $(s = 0)$ | -0.118272 |
| VMMG Model | $z \longrightarrow \infty$ | $(q_i)$ | 0.382961 | $(j_i)$ | 0.795048 | $(s_i)$ | 2.483671 |
| | $z \longrightarrow 0$ | $(q_0)$ | -0.417005 | $(j_0)$ | 0.764826 | $(s_0)$ | 0.246663 |
| | $z \longrightarrow -1$ | $(q_f)$ | -1 | $(j_f)$ | 1 | $(s_f)$ | -1 |
| | $z_{tr}$ | $(q = 0)$ | 0.610979 | – | – | $(s = 0)$ | -0.118272 |
| GCCG Model | $z \longrightarrow \infty$ | $(q_i)$ | 0.252849 | $(j_i)$ | 0.102984 | $(s_i)$ | 0.478429 |
| | $z \longrightarrow 0$ | $(q_0)$ | -0.585917 | $(j_0)$ | 1.137192 | $(s_0)$ | 0.617903 |
| | $z \longrightarrow -1$ | $(q_f)$ | -1 | $(j_f)$ | 1 | $(s_f)$ | -1 |
| | $z_{tr}$ | $(q = 0)$ | 0.540476 | – | – | $(s = 0)$ | -0.118272 |

TABLE II: The values of the different Cosmography parameters at various epochs and the redshift corresponding to the phase transition are provided for the ΛCDM, VMMG, and GCCG models.

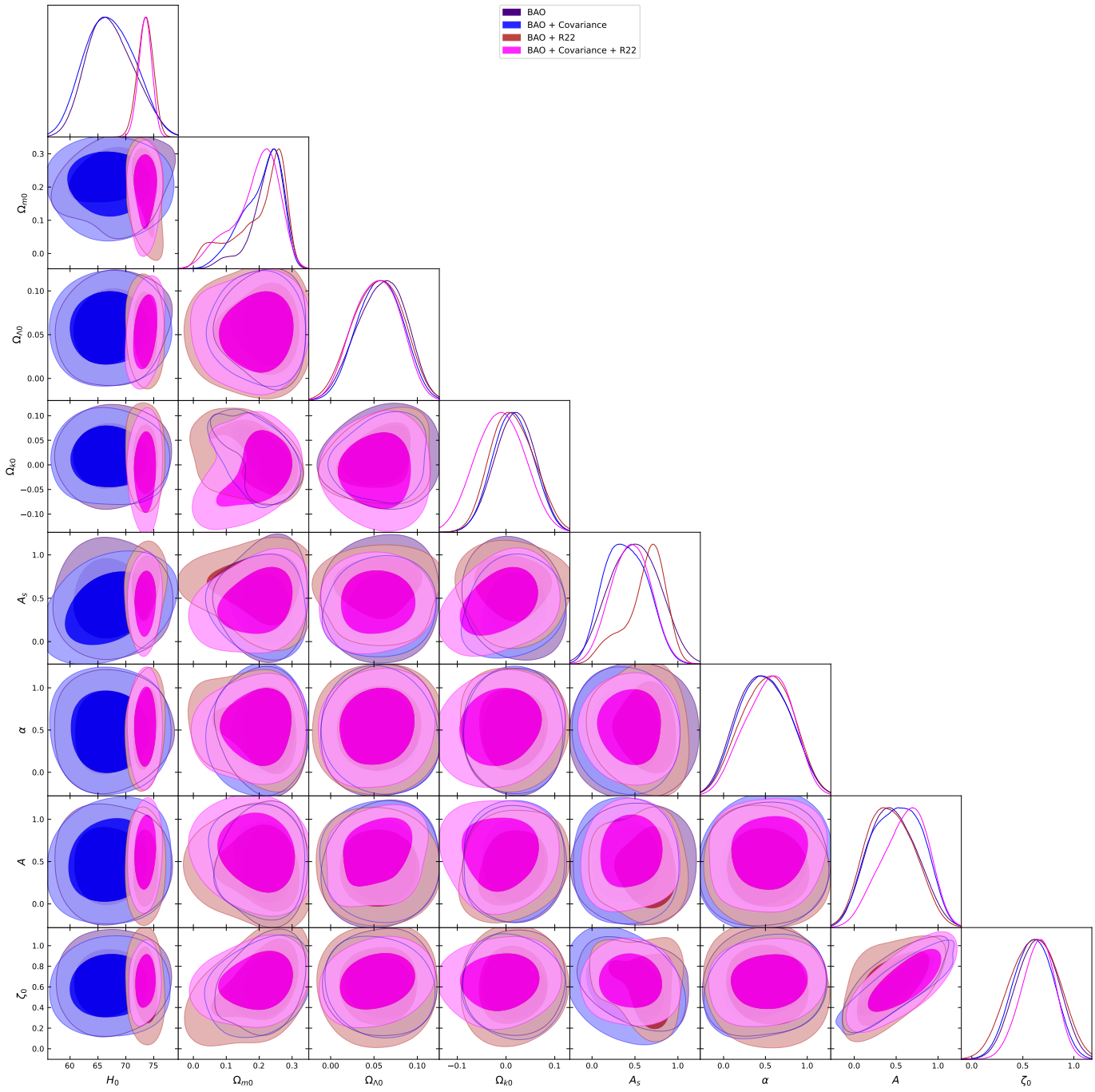



FIG. 1: The posterior distributions for a VMMG model, with and without a randomly generated covariance matrix, show negligible differences in distributions when considering datasets with between zero and fourteen components.

## VI. DARK ENERGY DYNAMICS: STATEFINDER DIAGNOSTICS AND THE $O_m$ TEST

Understanding the nature and dynamics of Dark Energy (DE) in the cosmos is paramount to unraveling the mysteries of the Universe's evolution. To achieve this, cosmologists employ sophisticated diagnostic tools that offer insights into the behavior of DE models. Two such prominent methods are the statefinder diagnostics [87–90] and the $O_m$ diagnostic test [91], each offering unique perspectives on probing DE dynamics. The statefinder diagnostics formalism provides a powerful means to differentiate between various DE models and compare their behaviors. By utilizing higher-order derivatives of the scale factor, this method allows for a model-independent

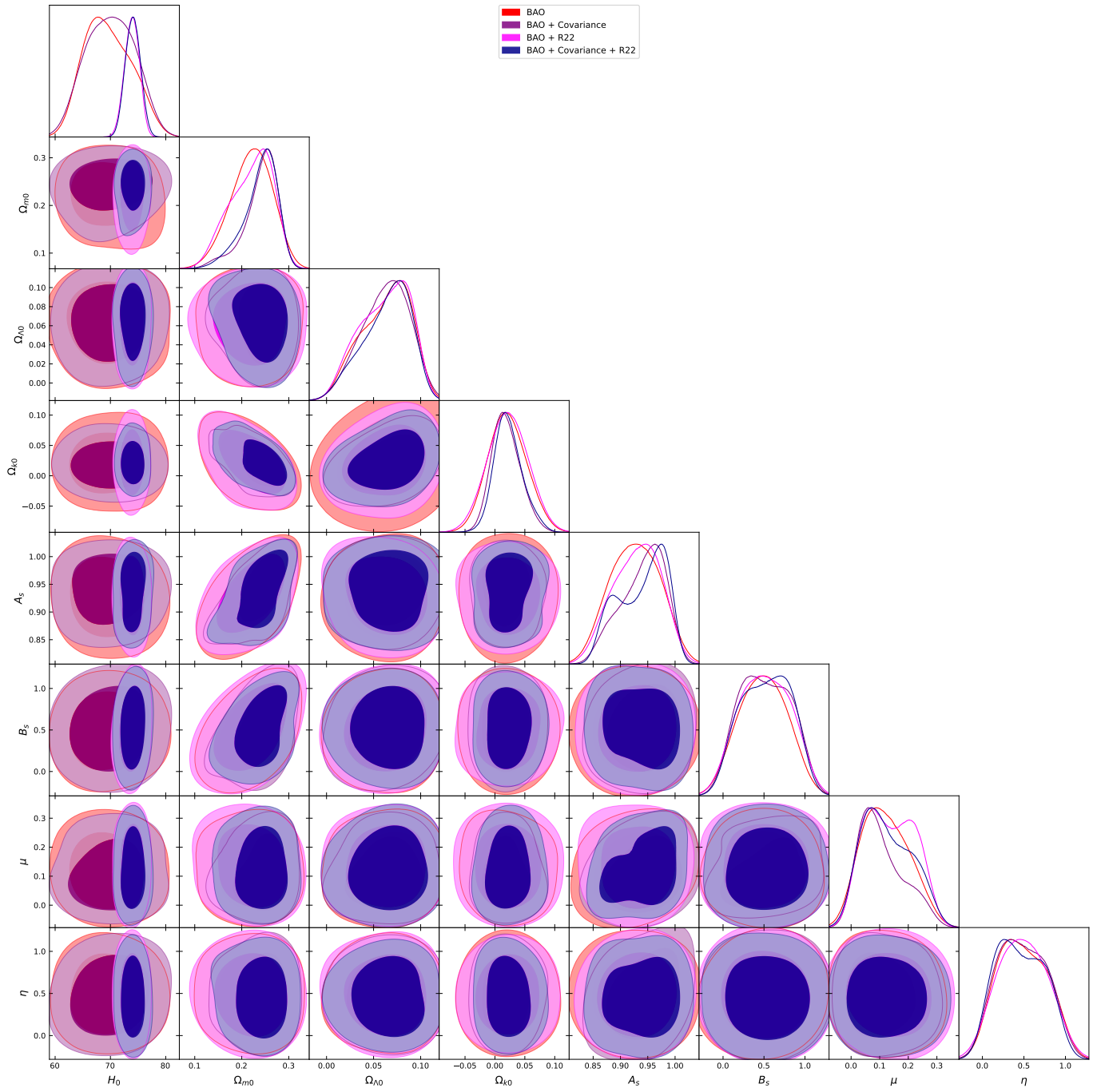



FIG. 2: The posterior distributions for a GCCG model, with and without a randomly generated covariance matrix, show negligible differences in distributions when considering datasets with between zero and fourteen components.

exploration of cosmic characteristics. The key diagnostic pair $\{r, s\}$, where $r$ and $s$ are dimensionless parameters, offers valuable insights into the nature of DE. In the $r - s$ plane, specific pairs correspond to standard DE models, such as $\{r, s\} = \{1, 0\}$ representing the ΛCDM model and $\{r, s\} = \{1, 1\}$ indicating the standard cold dark matter model (SCDM). Trajectories in this plane illustrate the time evolution of different DE models, with $s > 0$ and $s < 0$ defining quintessence-like and phantom-like models, respectively. Deviations from standard values signify distinct characteristics of DE models. Introduced as a robust diagnostic tool, the $O_m$ diagnostic test relies solely on directly measurable quantities, particularly the Hubble parameter $H(z)$ obtained from theoretical assumption. This simplicity enhances its practicality and reliability in discerning

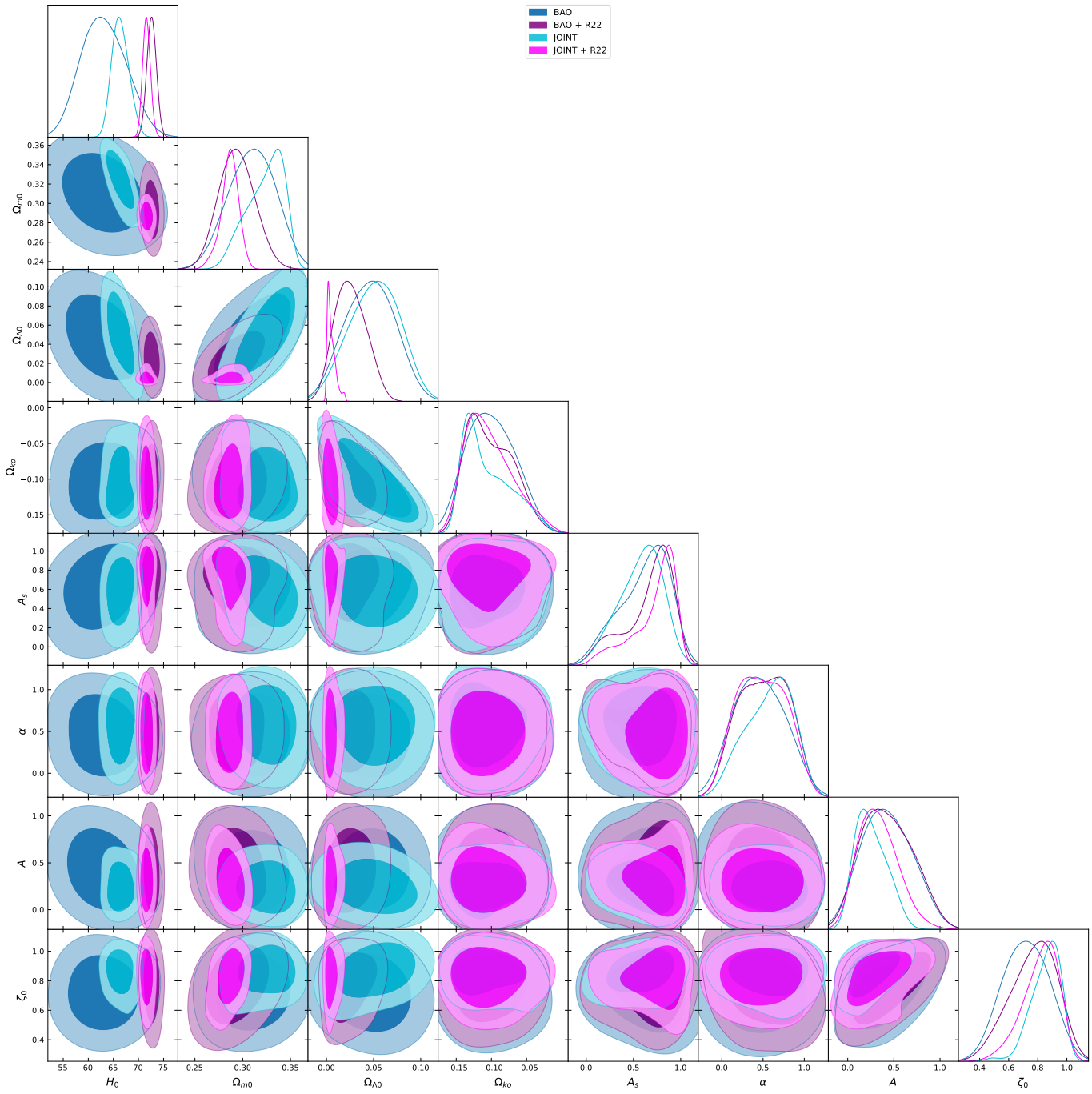



FIG. 3: The posterior distribution representing various cosmological parameters within the VMMG Model, with $1\sigma$ and $2\sigma$ confidence intervals.

between cosmological scenarios. The diagnostic test serves to distinguish between cosmological models, with $O_m = \Omega_{m0}$ indicating consistency with the $\Lambda$CDM model. Deviations, where $O_m > \Omega_{m0}$ or $O_m < \Omega_{m0}$, suggest quintessence or phantom scenarios [92], respectively.

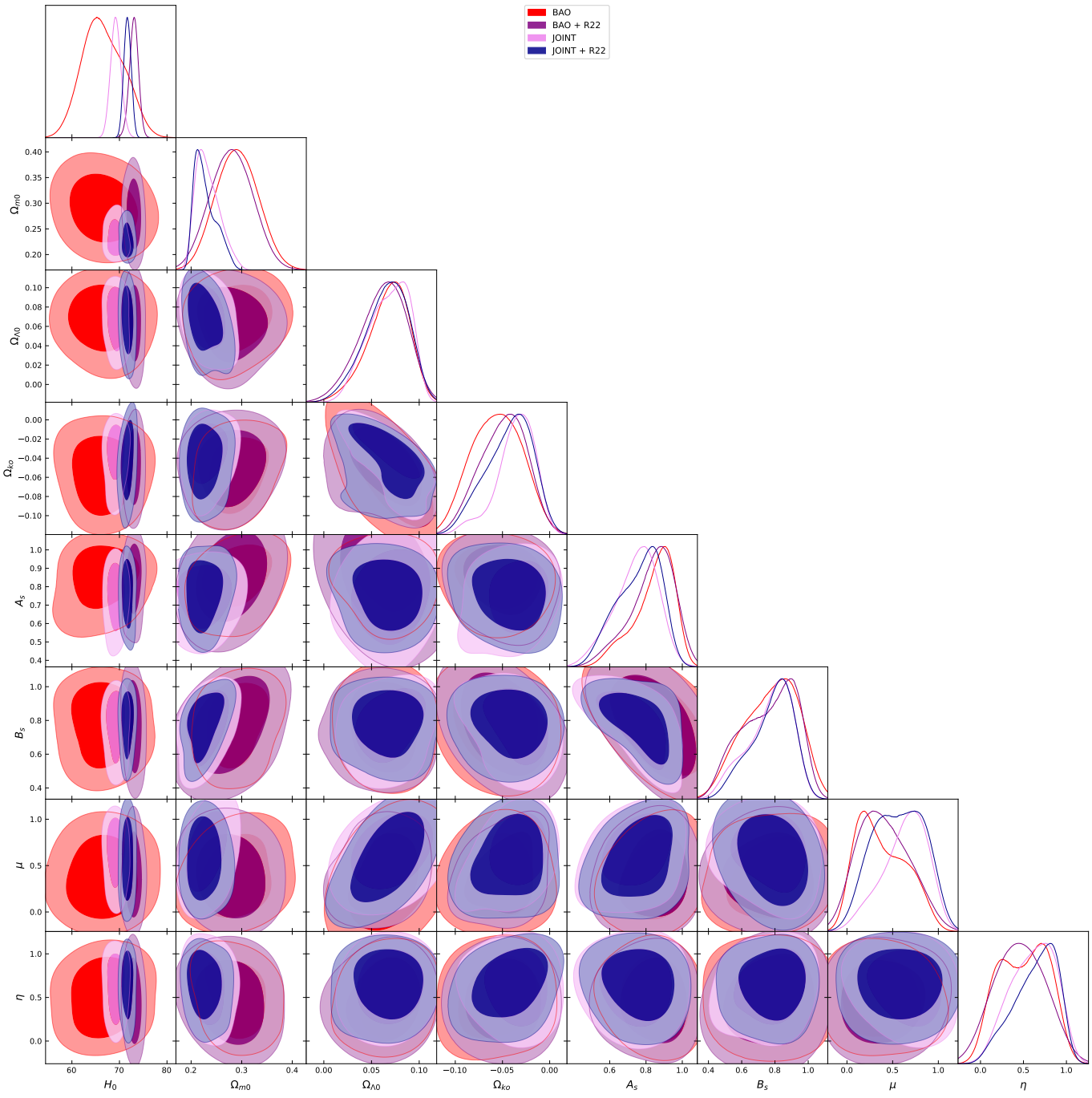
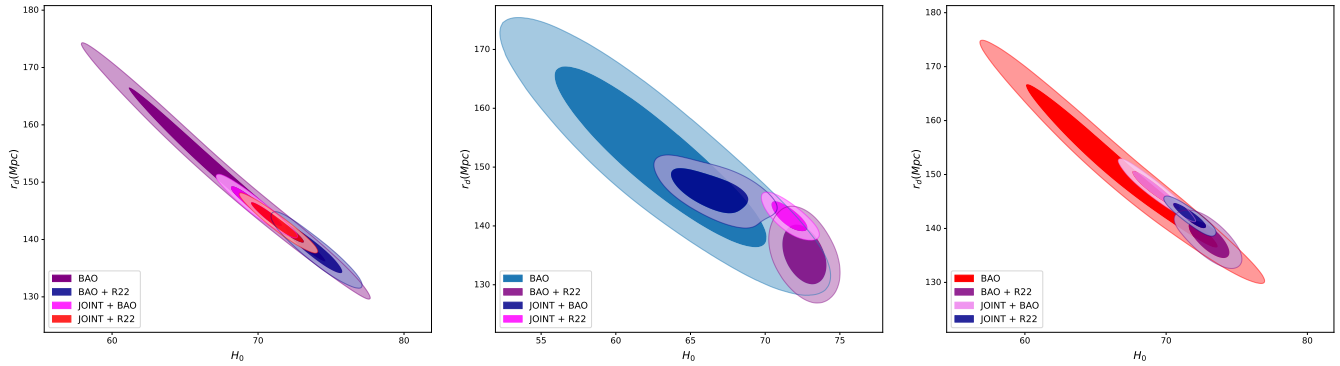
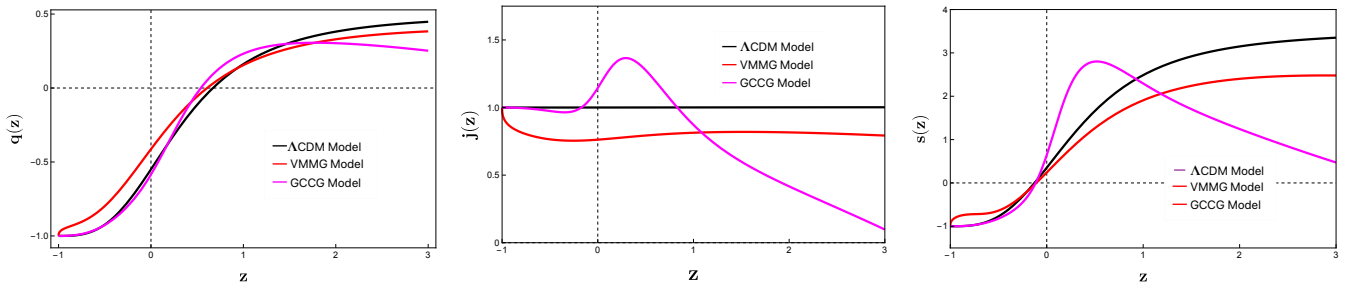



FIG. 4: The posterior distribution representing various cosmological parameters within the GCCG Model, with $1\sigma$ and $2\sigma$ confidence intervals.



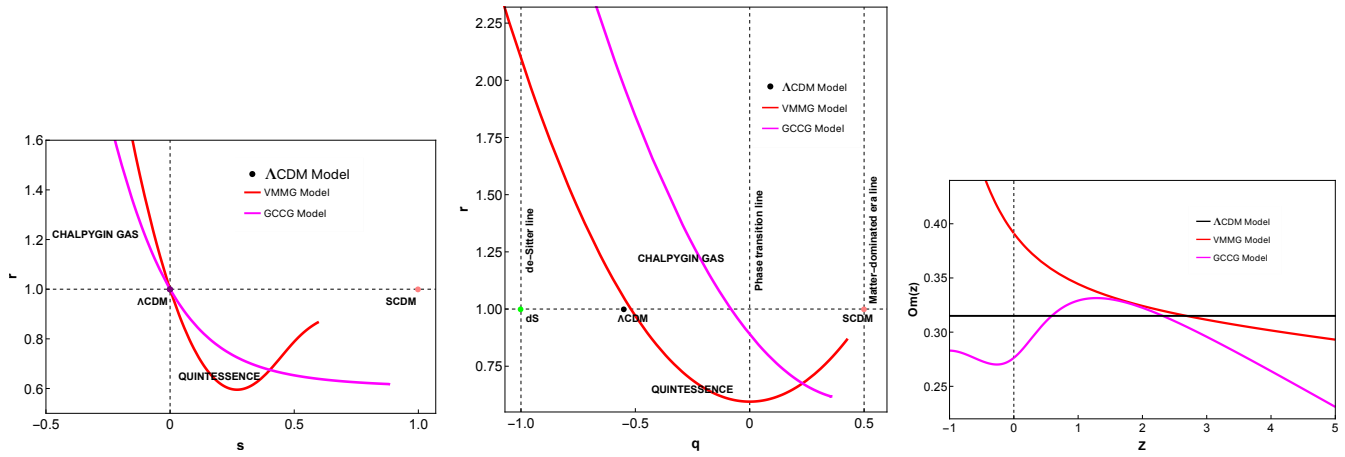

(a) ΛCDM Model (b) VMMG Model (c) GCCG Model

FIG. 5: The posterior distributions of varied observational data within the $r_d$ vs $H_0$ contour plane are depicted for the ΛCDM, VMMG, and GCCG models. Shaded regions represent $1\sigma$ and $2\sigma$ confidence levels.




(a) deceleration parameter (b) Jerk Parameter (c) Snap Parameter

FIG. 6: The evolution of various Cosmography parameters with respect to redshift ($z$). It includes the ΛCDM model shown by the black line, the VMMG model depicted by the red line, and the GCCG model represented by the magenta line, utilizing the best-fit values obtained from the Joint analysis.




(a) $\{s, r\}$ profile (b) $\{q, r\}$ profile (c) $O_m$ Diagnostic

FIG. 7: The evolution of the Statefinder diagnostic and the $O_m$ diagnostic profile. It includes the VMMG model represented by the red line and the GCCG model depicted by the magenta line, utilizing the best-fit values obtained from the joint analysis.

## VII. RESULTS

Fig 3 and 4 depict the posterior distributions of crucial cosmological parameters, with contours representing the 68% and 95% confidence levels for the VMMG and GCCG models, respectively. The detailed results obtained from the MCMC simulations are presented in Table I. When we include the R22 prior in the Joint dataset, the best-fitting value for $H_0$ differs from the findings in [93] but aligns closely with measurements from the SNIe sample in [80]. Conversely, without R22 priors in the Joint dataset, the estimated $H_0$ aligns more closely with the value reported in [93] across all three models. Notably, the optimal values for the matter density, denoted as $\Omega_{m0}$, exhibit deviations: in the VMMG Model, they appear higher than those documented in [93], whereas in the GCCCG Model, the optimal value of $\Omega_{m0}$ is lower than reported in [93]. The BAO scale, a key aspect in cosmology, stems from the cosmic sound horizon imprinted in the CMB during the drag epoch ($z_d$), denoting baryon-photon decoupling. $r_d$, the BAO scale, is determined by integrating $c_s/H$ from $z_d$ to infinity, where $c_s$ depends on pressure perturbation in photons and energy density perturbations in baryons and photons. It simplifies to $1/\sqrt{3(1+R)}$ with $R = \delta\rho_B/\delta\rho_\gamma$. Observationally, $z_d = 1059.94 \pm 0.30$, and in a $\Lambda$CDM model, $r_d = 147.09 \pm 0.26$ Mpc according to [93]. In the exploration of the VMMG model, Fig 5b illustrates the posterior distribution concerning the $r_d - H_0$ contour plane. Initially focusing on the BAO datasets, the inferred value for $r_d$ stands at $151.444 \pm 9.740$ Mpc. However, when the R22 prior is integrated exclusively into the BAO dataset, it leads to a revised estimate of the sound horizon at the drag epoch, now at $135.122 \pm 2.867$ Mpc. Moving on to the Joint dataset, the derived value for $r_d$ is $145.962 \pm 2.28$ Mpc, demonstrating a close alignment with the findings presented in [93]. Further refinement occurs with the incorporation of the R22 prior into the full dataset, resulting in $r_d$ being estimated at $141.546 \pm 1.527$ Mpc, which notably corresponds closely with the analysis in [94]. Similarly, within the framework of the GCCG Model, Fig 5c depicts the posterior distribution regarding the $r_d - H_0$ contour plane. Initially, considering the BAO datasets in isolation, the estimated $r_d$ stands at $151.484 \pm 10.451$ Mpc. Upon integrating the R22 prior exclusively into the BAO dataset, the inferred $r_d$ adjusts to $138.032 \pm 2.136$ Mpc. Transitioning to the Joint dataset, $r_d$ is estimated at $147.187 \pm 1.806$ Mpc, exhibiting a close match with the findings in [93]. Finally, with the inclusion of the R22 prior in the complete dataset, the estimate for $r_d$ becomes $142.329 \pm 1.514$ Mpc, indicating a notable agreement with the analysis presented in [94]. To conduct a comparative study between the different cosmography parameters in the $\Lambda$CDM, VMMG, and GCCG models, we have plotted the evolution of these parameters at various epochs, as shown in Figure 6. In the figures, the redshift $z$ approaches infinity, corresponding to the early Universe, while the redshift $z$ approaches 0, corresponding to the late-time Universe. A redshift $z$ approaching -1 corresponds to the future Universe. Fig 6a illustrates the evolution of the deceleration parameter for each models. In the case of the $\Lambda$CDM Model, the deceleration parameter starts from a positive value ($q_i$) in the early stages, becomes negative at the present ($q_0$), and approaches -1 in the future ($q_f$), corresponding to the de Sitter phase. This transition signifies the shift from decelerated expansion to accelerated expansion. A similar behavior can be observed in the VMMG and GCCG Models, mirroring the $\Lambda$CDM model, where transitions from positive to negative values indicate a similar evolution from deceleration to acceleration. Fig 6b depicts the evolution of the jerk parameters for each model, starting with the $\Lambda$CDM Model. The jerk parameter remains constant at 1 for all epochs, indicating a consistent rate of change of acceleration. In the case of the VMMG Model, the value of the jerk parameter is slightly lower than that of the $\Lambda$CDM Model throughout the evolution until it approaches $z = -1$, where it matches the value of the $\Lambda$CDM Model. In the case of the VMMG Model, the value of the jerk is lower than the value predicted by the $\Lambda$CDM Model in the redshift range of $0.826 < z < 3$. However, as the redshift decreases, one could observe the value of the jerk becoming higher than the value predicted by $\Lambda$CDM. Eventually, as it approaches $z = -1$, it aligns with the value predicted by the $\Lambda$CDM Model. Fig 6c depicts the evolution of the snap parameters for each model, starting with the $\Lambda$CDM Model. The snap parameter initiates from a high positive value ($s_i$) at early times, decreases to a small positive value ($s_0$) at present, and approaches $-1$ in the future ($s_f$). It characterizes the deviation from simple exponential expansion. A similar behavior can be observed in the VMMG Model, where the snap parameter shows a comparable trend of decreasing from early times to the present and approaching $-1$ in the future. In the case of the GCCG Model, the snap parameter begins from a small positive value ($s_i$) at early times, increases to a higher positive value as the redshift decreases, and approaches $-1$ in the future ($s_f$). Overall, these models provide different theoretical frameworks for understanding the dynamics and evolution of the universe, with each model capturing specific aspects of cosmic behavior and expansion. The numerical values of different cosmography parameters at different redshift epochs are presented in Table II. Fig 7 illustrates different diagnostic parameters of the VMMG and GCCG models. In Fig 7a, the evolution of the $\{s, r\}$ profile for both models is depicted. The red line represents the evolution of the VMMG Model, indicating its behavior. During the early stages, the model assumes values within the range $r < 1$ and $s > 0$, which corresponds to the quintessence region. This suggests that quintessence, a form of dark energy with a dynamic EoS, dominates the energy content in the early Universe. As the Universe progresses, the model reaches the fixed point $\{r, s\} = \{1, 0\}$, signifying a transition to the $\Lambda$CDM point depicted by the black line. In this late-time phase,

$r$ remains greater than 1 while $s$ becomes negative. This behavior characterizes the Chaplygin gas region, which is a model incorporating a generalized form of dark energy. A similar behavior can be observed in the GCCG Model, represented by the magenta line. Fig 7b illustrates the $\{q, r\}$ profile for both models. Initially, in the VMMG model, the parameters exhibit values where $q > 0$ and $r < 1$, representing the quintessence region. This indicates an accelerating expansion of the Universe, with the dominance of quintessence energy density over matter density, driving the accelerated expansion. As the evolution progresses, the model transitions to values where $q < 0$ and $r > 1$, corresponding to the Chaplygin gas region. Here, the negative $q$ denotes a decelerating expansion of the Universe, while $r > 1$ suggests that the dominance of Chaplygin gas over matter causes deceleration by crossing the Finally, the model tends towards the de Sitter point located at $(-1, 1)$. Similar behavior can be observed in the GCCG Models as well shown in magenta line. Fig. 7c illustrates that for the VMMG model, the diagnostic value $O_m$ is initially less than $\Omega_{m0}$ at high redshifts, indicating that the VMMG model falls within the phantom region. As redshift decreases, $O_m$ surpasses $\Omega_{m0}$, suggesting a transition to the quintessence domain. Conversely, in the GCCG Model, $O_m$ is less than $\Omega_{m0}$ at high redshifts, indicating phantom behavior. However, it exhibits quintessence behavior for a smaller redshift range ($0.67 < z < 2.32$). Interestingly, at low redshifts, $O_m$ again becomes smaller than $\Omega_{m0}$, leading to the model falling back into the phantom region.nIn our exploration of cosmological models, we employ both the Akaike Information Criterion (AIC) and the Bayesian Information Criterion (BIC). AIC is computed using the maximum likelihood ($\mathcal{L}_{\max}$) without the R22 prior, and the number of parameters ($k$) against the total data points ($N_{\rm tot}$). BIC incorporates $\mathcal{L}_{\max}$, $k$, and $N_{\rm tot}$. For ΛCDM, VMMG, and GCCG models, the AIC and BIC values respectively are $[277.38, 284.89, 282.89]$ and $[277.59, 285.73, 284.89]$. Despite ΛCDM showing the best fit, all models receive support from our AIC and BIC results, indicating none can be dismissed based on existing data. Evaluation of VMMG and GCCG models relative to ΛCDM involves a reduced chi-square statistic defined as $\chi^2_{\rm red} = \chi^2/{\rm Dof}$, with values $[0.961, 0.970, 0.968]$, close to 1, indicating satisfactory alignment with observed data.

## VIII. CONCLUSIONS

In this manuscript, we investigate the acceleration of the Universe's expansion within the framework of Horava-Lifshitz Gravity, focusing on Viscous Modified Chaplygin Gas and Generalized Cosmic Chaplygin Gas Models. Initially, we constrain all cosmological parameters using late-time datasets, including BAO, Hubble Measurements obtained from CC Method, SNIa, Q, GRBs and the recent measurement of the Hubble constant. The investigation involves the selection of 17 BAO points, deliberately chosen to minimize correlations from an extensive dataset comprising 333 BAO data points. Our preliminary goal was to reduce errors in the posterior distribution caused by correlations between measurements. To achieve this, we used a method to simulate random correlations in the covariance matrix. After verifying the results, we found that these introduced correlations did not significantly change the cosmological parameters. Consequently, we extract the present day Hubble function ($H_0$) with sound horizon ($r_d$) in both cosmological models. The VMMG model yields estimates of $H_0 = 66.397928 \pm 1.628310$ km/s/Mpc and $r_d = 145.962162 \pm 2.284883$ Mpc. In contrast, the GCCG model provides slightly different values: $H_0 = 69.234519 \pm 1.043849$ km/s/Mpc and $r_d = 147.187439 \pm 1.806239$ Mpc. Notably, these results indicate a convergence with early Planck estimates for $H_0$ and $r_d$ based on low-redshift measurements [93]. The comparative study across ΛCDM, VMMG, and GCCG models reveals their distinct evolution patterns of cosmographic parameters. Each model exhibits transitions from deceleration to acceleration, maintaining consistency with theoretical predictions. These frameworks offer varied insights into cosmic dynamics, with numerical values summarized in Table II. The diagnostic parameters reveal intriguing dynamics in both VMMG and GCCG models. VMMG transitions from quintessence to Chaplygin gas dominance, while GCCG exhibits similar behavior. High redshifts show phantom behavior in both models, shifting to quintessence at intermediate redshifts. The intricate interplay between these regions underscores the complexity of dark energy models. While the ΛCDM model exhibits the best fit based on AIC, both VMMG and GCCG models remain viable according to AIC and BIC. Further, the reduced chi-square statistics show all models closely align with observed data, indicating satisfactory goodness of fit.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# COPD-FlowNet: Elevating Non-invasive COPD Diagnosis with CFD Simulations (Student Abstract)

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## Abstract

Chronic Obstructive Pulmonary Disorder (COPD) is a prevalent respiratory disease that significantly impacts the quality of life of affected individuals. This paper presents COPD-FlowNet, a novel deep-learning framework that leverages a custom Generative Adversarial Network (GAN) to generate synthetic Computational Fluid Dynamics (CFD) velocity flow field images specific to the trachea of COPD patients. These synthetic images serve as a valuable resource for data augmentation and model training. Additionally, COPD-FlowNet incorporates a custom Convolutional Neural Network (CNN) architecture to predict the location of the obstruction site.

## Introduction

Chronic Obstructive Pulmonary Disorder (COPD) is the third leading cause of death worldwide, causing over 3 million deaths in 2019 alone (Momtazmanesh et al. 2023). COPD is caused by smoking and exposure to air pollution that can hinder lung growth. Patients with COPD suffer from symptoms that include breathing difficulties and fatigue due to increased stiffness and blockage of the airways. Before starting treatment, it is imperative to accurately detect the location of the obstruction sites to devise a better treatment plan for the patient. Unfortunately, conventional diagnostic methods like bronchoscopy often prove impractical due to their invasiveness and high costs. Computational Fluid Dynamics (CFD) has emerged as a promising tool for airflow and blood flow simulations in patients (Xi and Zhao 2019; Arzani et al. 2022), largely successful due to its non-invasive nature and cost-effectiveness. Hu et al. (2022) proposed a novel methodology for detecting the location of obstruction sites in COPD patients using CFD and Convolutional Neural Networks (CNN). However, it is not feasible to generate thousands of images using CFD simulations since they require a significant amount of computational resources. Moreover, datasets often suffer from imbalance, reflecting the prevalence of specific cases in the population. Thus, our study centers its efforts on augmenting and balancing the dataset created by Hu et al. (2022).

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## Methodology

### Data Augmentation

In the present study, a novel Generative Adversarial Network (COPD-FlowNet) is introduced to generate realistic velocity flow field images at a resolution of 128x128 pixels. The generator in this network employs a series of CNN layers integrated with BatchNorm layers and leaky-ReLU activation functions to achieve the desired image dimensions. Meanwhile, the discriminator incorporates traditional Conv2D layers, along with fully connected layers, including Dropout and Dense layers, featuring several innovative adaptations.

### Classification

A custom CNN network for classifying the location of obstruction sites in the patient's lungs is also introduced. The proposed classifier takes an input image of 128x128 pixels as the input layer. It is followed by a sequence of convolution blocks, with the corresponding depth continuously increasing from 8 filters to 128 filters. With each convolution block, the kernel size is decreased, which allows the network to capture finer details in the data. The padding is set to "valid," which ensures that the size of the output feature maps is reduced. The ReLU activation function introduces non-linearity, while MaxPooling2D layers and batch normalization enhance feature extraction and model convergence. The Batch normalization is inserted to mitigate the "covariate shift" problem, thereby enhancing convergence during training.

| Dataset Distribution | Left | Right | Both | Total |
|---|---|---|---|---|
| Original Dataset | 45 | 113 | 137 | 295 |
| After Augmentation | 400 | 400 | 400 | 1200 |

Table 1: Distribution of dataset

## Experimental Setup

The dataset used consisted of 295 images of velocity flow fields at the trachea of patients with COPD. These images were obtained by CFD simulations of airflow in patient-specific lung geometries. The dataset is divided into three

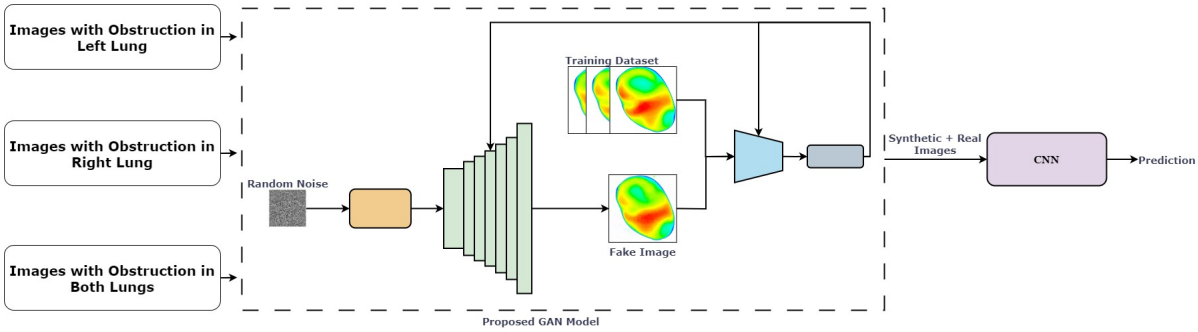



Figure 1: Overall Architecture of COPD-FlowNet

classes named left, right, and both, depending on the location of the obstruction in the lung. The exact distribution of the dataset before and after augmentation is given in Table 1.

## Experiment Analysis and Results

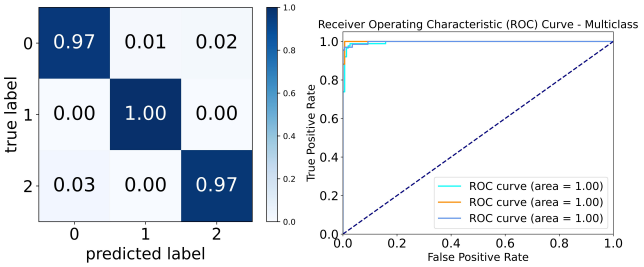
Our classification model outperforms well-established benchmark algorithms such as ResNet-50 and EfficientNet. Notably, before augmentation, our CNN model achieved an accuracy of 73.94%. However, after implementing augmentation techniques, this accuracy increased to 96.35%. Consequently, our approach surpassed the performance of state-of-the-art (SOTA) algorithms in the conventional performance metrics such as Accuracy and F1-score, as illustrated in Table 2. The normalized confusion matrix and ROC curve displayed in Figure 2, depict the predicted test sample distribution towards each class and the classification model's performance at different classification thresholds respectively.

| Method | Accuracy | Class | Precision | Recall | F1 Score |
|---|---|---|---|---|---|
| Proposed | **96.35%** | Left | 0.98 | 0.92 | 0.95 |
| | | Right | 0.97 | 1.00 | 0.98 |
| | | Both | 0.94 | 0.97 | 0.96 |
| ResNet-50 | 96% | Left | 0.94 | 0.94 | 0.94 |
| | | Right | 0.96 | 0.98 | 0.97 |
| | | Both | 0.98 | 0.97 | 0.97 |
| EfficientNet | 95.00% | Left | 0.94 | 0.92 | 0.93 |
| | | Right | 0.96 | 0.96 | 0.96 |
| | | Both | 0.94 | 0.97 | 0.95 |

Table 2: Experimental Analysis

## Conclusion

Our proposed approach represents an integration of deep learning and CFD. It demonstrates the potential use of CFD for medical diagnosis and its enhancement using generative networks. Further, the proposed CNN outperforms well-established models such as ResNet-50 and EfficientNet. Future works will include generating datasets that can detect more specific locations of the obstruction sites since currently the model only predicts whether the obstruction is in the left lung, right lung, or both lungs.




(a) (b)

Figure 2: (a) Normalized confusion matrix, (b) Receiver Operating Characteristic (ROC) curve

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RESEARCH ARTICLE-ELECTRICAL ENGINEERING

# Deep-Learning and Blockchain-Empowered Secure Data Sharing for Smart Grid Infrastructure

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**Abstract**
The Smart Grid represents a modernized electrical infrastructure integrating information and communication technology for bidirectional data exchange between power providers and consumers. This advancement enables seamless digital connectivity among intelligent devices such as Smart Meters, Demand Response Control Units, and Service Providers, facilitating remote data management for optimized energy distribution. However, the reliance on unsecured wireless communication channels poses significant security vulnerabilities, including replay, impersonation, man-in-the-middle, and physical capture attacks. To address these challenges, this study introduces a pioneering approach called Deep-Learning and Blockchain-enabled Secure Data Sharing. Specifically, Deep-Learning techniques are leveraged to develop an effective Intrusion Detection System. The proposed RENS (intRusion detEction aNd clasSification) combines Variational AutoEncoder with Attention-based Bidirectional Long Short-Term Memory for feature extraction and attack detection. Moreover, normal instances identified by RENS are utilized in a blockchain-based access control mechanism, ensuring secure and immutable data exchange among Smart Grid entities. In this framework, participating Service Providers form a peer-to-peer network responsible for generating blocks associated with individual SMs. These blocks undergo validation and are appended to a private blockchain ledger using a smart contract-based Proof-of-Authentication consensus mechanism. Experimental results and security analysis demonstrate the superiority of the DBSDS framework over conventional BiLSTM techniques, confirming its effectiveness in safeguarding Smart Grid operations.

**Keywords** Deep learning · Blockchain · Intrusion detection system · Smart meter · Smart grid

## 1 Introduction

The Industrial Internet of Things (IIoT) is swiftly revolutionizing traditional Electrical Grids (EGs) into the innovative digital landscape of Smart Grids (SG). This transformation brings significant benefits such as enhanced resource utilization, widespread control, self-healing capabilities, and efficient Demand Response (DR) [1]. Moreover, by facilitating bidirectional flows of electric power and data transfer, SG infrastructure enhances the efficiency, security, and reliability of EGs. As a result, the SG market has experienced remarkable growth, reaching a value of 66.96 billion in 2017 and projected to reach 169.18 billion by 2025, with a Compound Annual Growth Rate (CAGR) of 12.4% between 2018 and 2025 [2].

A standard Smart Grid (SG) comprises four primary components: sensing, communication, control, and actuation systems [3]. Key elements of the SG include Smart Meters (SMs) with sensing and communication modules, service systems provided by Service Providers (SPs) equipped with communication, control, and actuation modules, and Demand Response Control Units (DRCUs) responsible for evaluating the electric capabilities of SG networks and facilitating effective Demand Response (DR) and real-time pricing [4]. Despite the significant and mutual benefits SG offers to utility companies, service providers, and energy users, ensuring the secure functioning of the grid, particularly secure data sharing between SMs and backend service servers, presents a substantial challenge [5]. Even though power line communications are wired, the underlying reason for this security challenge lies in the fact that SMs and their control systems

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engage in two-way data transfer within the SG using an open, unsecured wireless communication channel [6]. Inefficient implementation of security mechanisms leaves communicating entities vulnerable to cyber attacks such as replay, impersonation, man-in-the-middle attacks, false data injection, and physical capture of SMs [7].

The SG-CPS application, as proposed by the authors in [8], introduces a standardized protocol along with essential features including validity, testing, and design. Communication networks, both within public and private domains, play a pivotal role in the SG-CPS framework. The communication network tailored for SG-CPS is versatile, integrating multiple protocols such as ZigBee (IEEE 802.15), WiMAX (IEEE 802.16), Wi-Fi (IEEE 802.11), Mobile-Fi (IEEE 802.20), and Ethernet (IEEE 802.3). Despite its complex and hybrid nature, SG-CPS seamlessly integrates with various devices. However, managing this hybrid combination presents challenges for SG-CPS concerning communication technologies, standards, protocols, and applications. The efficacy of the model under scrutiny was evaluated using two real datasets: the Car-Hacking dataset and the UNSE-NB15 dataset. These authentic datasets, pertaining to automated vehicle networks, were utilized during the validation of the proposed security solution in Sensors data ports 2023, 23, 7814, 4, and 5. These datasets encompassed various types of attacks, including spoofing, flooding, and replay attacks, alongside benign packets.

In wireless sensor networks (WSNs), a multitude of sensor nodes (SNs) pose as potential entry points for attackers. Alongside security considerations, the deployment of WSNs also brings forth practical challenges. The cost-effectiveness of WSNs holds paramount importance, given the prevalent deployment of low-energy and short-range devices within the network, as underscored in [9]. Furthermore, some engineers have observed that periodic power cycling of SNs may extend node lifetimes but introduces concerns like latency and routing overhead.

In their work [10], the authors introduced the message queuing telemetry transport (MQTT) protocol, an application layer protocol gaining traction in the Internet of Things (IoT) landscape. As this technology gains prominence, it has become a prime target for malicious entities seeking potential vulnerabilities [11–13]. Various network security measures, such as blocklists and firewalls, have been deployed to mitigate these threats. However, artificial intelligence (AI) algorithms present a distinct approach to tackling security challenges, operating without the constraints of predefined rules or continuous manual intervention. A critical factor influencing the effectiveness of AI is the careful selection of hyperparameters guiding the algorithm.

Given the aforementioned considerations, there is a pressing need for security solutions that are timely, accurate, and consistent [14]. To address this, various security controls based on authentication and key agreement (AKA), as well as Intrusion Detection Systems, have been developed to protect and safeguard the smart grid (SG) infrastructure. The AKA protocol, for instance, is a one-time password generating security protocol that employs symmetric cryptography. This protocol operates on a challenge-response pair, ensuring the privacy of user identities. Additionally, the AKA protocol incorporates numerous features including credential flexibility, resistance to Denial of Service (DoS) attacks, and efficiency [15]. Furthermore, AKA enables connected devices to mutually authenticate one another, facilitating the sharing of an authenticated session key (or secret key) and establishment of secure communication channels.

Several Authentication and Key Agreement (AKA)-based security protocols have been proposed in the literature for Smart Grid (SG) applications. For instance, in [16], following mutual authentication, the *ECCAuth* framework utilized Elliptic Curve Cryptography (ECC) to establish a secret session key between Smart Meters (SM) and Service Providers (SP), ensuring secure communication and sensitive information exchange. Srinivas et al. [17] combined ECC with Schnorr's signature to develop a novel key agreement scheme named AAS-IoTSG tailored for SG networks. Similarly, Wazid et al. [18] introduced a three-factor user authentication scheme called TUAS-RESG, which combines ECC, bitwise XOR operations, and one-way hash functions, specifically designed for SG environments. Additionally, Odelu et al. [4] designed an authentication scheme between SM and SP with the assistance of a trusted authority. Despite the proposals of AKA protocols aimed at securing communication in SG infrastructure, significant challenges persist, including centralized control, lack of transparency, auditing and verification difficulties, poor interoperability, and energy trading among unsecure or nontransparent networks [19]. Addressing these shortcomings requires the adoption of decentralized techniques to enhance the traditional centralized system. Moreover, efforts are needed to improve transparency, reliability, efficiency, fraud prevention, resilience, and quality of services within SG infrastructure [20].

In recent times, several authentication protocols based on blockchain technology have been explored or proposed for Smart Grid (SG) infrastructure. This trend stems from the inherent advantages of blockchain, including decentralization, confidentiality, transparency, immutability, and trust [21, 38, 39]. For example, Park et al. [5] devised a blockchain-based privacy-preserving authentication scheme for SG known as BPPS. In this scheme, Service Providers (SP) assign unique identities to smart meters (SM) and demand response control units (DRCU) prior to deployment and handle their registration within the SG network. Furthermore, the authors introduced a secure method of mutual authentication utilizing session keys for information exchange.

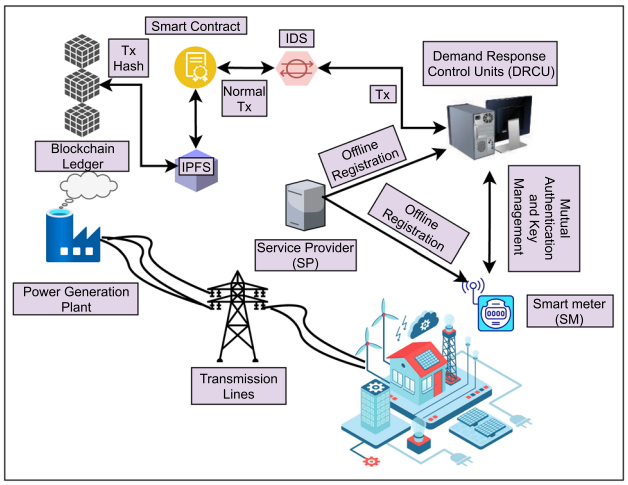



**Fig. 1** Network model of proposed framework

Similarly, Bera et al. [22] proposed an access control protocol based on blockchain principles, named DBACP-IoTSG. This protocol initiates registration and subsequently performs mutual authentication of participating SG entities. In this framework, the SP verifies and adds new blocks to the network using the Practical Byzantine Fault Tolerance (PBFT) consensus algorithm. Moreover, Gai et al. [23] combined permissioned blockchain with edge computing in the SG network to tackle challenges related to privacy and energy security. While these efforts offer heightened security compared to AKA protocols through blockchain integration, they lack data vulnerability analysis that could compromise the integrity of stored data on the ledger.

Intrusion detection systems (IDS) can provide valuable countermeasure to detect the vulnerabilities in SG data. IDS can be deployed prior to detect abnormal activities in the network and can filter abnormal transactions [24–27]. Thus, only valid data or transactions will be used by the consensus mechanism to verify and add block in the ledger. There are broadly two types of IDS, namely signature- and anomaly-based IDS [28–32]. Several research has been carried out to design effective and efficient IDS for SG network. For instance, Siniosoglou et al. [1] designed an IDS named MENSA that uses AutoEncoder-Generative Adversarial Network (AE-GAN) approach to detect and classify intrusions in the SG network. Alkahtani et al. [33] designed an IDS for SG networks by combining Convolution Neural Network (CNN) with the Long Short-Term Memory (LSTM) and further used Particle Swarm Optimization (PSO) for feature reduction. Khoei et al. [34] proposed an ensemble learning-based IDS for SG. In this scheme, performance were compared between stacking-, bagging-, and boosting-based IDS. Similarly, Khan et al. [35] proposed an IDS that combined weighted PSO for feature reduction with different machine learning models. In this approach Random Forest and Neural Network outperformed other models using KDD-CUP99 and NSLKDD datasets. In [36], authors have proposed attribute based authentication model to verify the participating entity in communication. However, the correctness of the authentication is not done and needs to be carried out. The authors in [37] indroduces a self-sovereign identity management for the authentication of smart grid devices for enabling a secure communication. However, the implementation of the model is not presented.

## 1.1 Motivation

In summary, we discovered that due to the complex monitoring of data transmission between SGs, SPs, and DRCUs, the modern SG infrastructure confront a different level of security challenges. A decentralized system configuration was a key necessity for the existing SG. Despite the fact that several prior research had achieved advancements in the security of SG employing AKA protocols, blockchain, and IDS, it still proved that one approach could rarely save SG from the aforementioned flaws. The development of a strategy that might incorporate mutual authentication, decentralized computing, and a tamper-resistant, anomaly-based intrusion detection method without compromising security capabilities and SG functionality is both are challenging issues. According to our survey, combining all three different measures together could increase the capability of SG and could provide a more effective and robust secure data sharing scheme for SG infrastructure [21, 28, 31, 32, 35–40].

## 1.2 System Models

Our suggested *DBSDS* framework was created using two submodels (network and threat models). Below is an explanation of each one.

### 1.2.1 Network Model

The proposed framework has three main entities SP, SM, and DRCU as shown in Fig. 1. Initially, SP registers and then pre-deploys SM and DRCU in the SG network to provide efficient electricity distribution services. Once the entities are registered the communication starts. In SG infrastructure, the SM are responsible to gather various information including electricity consumption, voltage levels, consumption behavior and electricity used time. The collected data are send to DRCU which evaluates the electric capability of SG networks and provides efficient DR and real-time pricing. However, SM is vulnerable to various potential attacks, as it sends the above-mentioned sensitive data to DRCU via open wireless network. Therefore, a malicious attacker can intercept, modify, and replay such data to violate user privacy and can manipulate the transmitted data. In order to guarantee data integrity, we have utilized a secure mutual

AKA protocol between SM and DRCU. The data may then be transferred between the two entities using the session key after authentication has been achieved. The majority of DRCUs are run by outside suppliers, though, and a malicious DRCU may change or remove the real data. To store the data sent between SM and DRCU, we have thus deployed blockchain technology. In the suggested architecture, only authorized transactions can be performed and be a part in network, and we have utilized a DL-based IDS for verification of the legal transactions sent by the SM. The proposed DL technique filters out anomalous transactions and delivers regular transactions to a Proof-of-Authentication (PoA) consensus process based on smart contracts. The transaction is created, verified, and then appended over the Interplanetray file systems (IPFS) secure storage layer. The one-way cryptographic hash is returned from the IPFS gets recorded over the blockchain ledger [41, 42]. As a result, the blockchain becomes lighter thanks to our on-chain and off-chain technique, which also causes block generation and access time to steadily decrease for model and that keep entire data over the blockchain ledger.

#### 1.2.2 Threat Model

We employ the well-known "Dolev-Yao threat model (DY model)" to construct our suggested *DBSDS* framework [43]. The well known DY model, players shares information with one another across an unsafe channel; SMs and DRCUs are viewed as unreliable parties. A hacker has the power to eavesdrop, alter, or delete the sent communications because the conversation is taking place through an unsafe channel. The entire SG infrastructure must be entirely trustworthy in order for the SP to exist. Additionally, because some SMs are physically captureable and cannot be continuously monitored, power analysis attacks can access the credentials stored in these physically captured SMs. The "CK-adversary model," is known for de facto norm which includes simulation and also works for key-exchange protocol, is the subject of our final analysis. The attacker in the CK-adversary model has the same access to information as in the DY model, but he or she may additionally steal confidential information which includes "private keys," "session keys," and "session states." In addition to the qualities mentioned above, the system needs to be resistant to various cryptographic assaults. The discussion of these attacks may be found below.

1. Replay attack: In this technique, the attacker intercepts intermediate security broadcasts and replays them in order to get unauthorized access to security keys or messages.
2. Brute force attack: To decode the communication, the attacker attempts every possible combination and so learns the security key.

### 1.3 Contribution

The contribution of this paper is mentioned as follows.

- A novel *DBSDS* framework is proposed by combining deep learning (DL) and blockchain technology to ensure secure data sharing in smart grid infrastructure.
- The proposed scheme performs mutual authentication and key agreement between SMs and DRCUs, and establish a common session key for secure and reliable communication.
- *RENS* (intrusion detection and classification), a unique DL-based IDS, is suggested. Variational AutoEncoder and Attention-based Bidirectional Long Short-Term Memory (VAE-ABiLSTM) are combined in the underlying methodology. From high dimension datasets, the VAE approach is utilized to capture the data distribution and extract features. The ABiLSTM detects assaults on the SG infrastructure using the features it has acquired.
- The suggested *DBSDS* architecture uses blockchain technology to guarantee a transparent and traceable data storage method. The Proof-of-Authentication (PoA) consensus technique is used in this work for block adding and verification. Additionally, the returned cryptographic hash is kept on the blockchain ledger while the actual transactions are recorded on the IPFS storage system. This method makes the blockchain ledger more lightweight and efficient.

The article is organized as follows. The Sect. 2, presents a proposed *DBSDS* framework, components, and its working. The experimental result summary is shown in the Sect. 3. At last, we made the conclusion of the proposed research work and future direction road-map which is presented in Sect. 4.

## 2 The Proposed Framework

The core components in designing the proposed *DBSDS* framework have been covered in this section.

### 2.1 *RENS* Architecture

The DL technique has the ability to adapt and work efficiently with high data volume and dimension. The proposed DL-based *RENS* has two core components, first a feature extraction model based on Variational AutoEncoder (VAE). Second, the extracted features are used by the Attention-based Bidirectional Long Short-Term Memory (ABiLSTM) technique to detect intrusions. Each of them is explained below separately:

#### 2.1.1 *RENS* Variational AutoEncoder (VAE) for Feature Extraction

The VAE network, in contrast to the autoencoder's low-dimensional embedding, offers a probabilistic aspect in the latent variable space, which can better capture the prominent characteristics of multivariate SG data. The VAE's main goal is to describe the distribution of the original data set $\mathcal{X} = \{\mathcal{X}_i\}_{i=1}^{n}$ using the latent variable $\mathcal{Z}$. The conditional distribution of the latent variable $\mathcal{Z}$ is assumed to be Gaussian. The theory shows that using a neural network, the hidden variable $\mathcal{Z}$ that satisfies the Gaussian distribution may create data that satisfies any distribution. The latent variable $\mathcal{Z}$ creates a dataset $\widehat{\mathcal{X}} = \left\{\widehat{\mathcal{X}_i}\right\}_{i=1}^{n}$ that is extremely identical to the original data $\mathcal{X} = \{\mathcal{X}_i\}_{i=1}^{n}$ by optimizing the created parameter. As a result, we want to maximize marginal likelihood $\mathcal{P}_\theta(\mathcal{X})$ [39].

$$\mathcal{P}_\theta(\mathcal{X}) = \int \mathcal{P}_\theta(\mathcal{X} \mid \mathcal{Z})\, \mathcal{P}_\lambda(\mathcal{Z})\, d\mathcal{Z} \tag{1}$$

where $\mathcal{P}_\theta(\mathcal{X} \mid \mathcal{Z})$ denotes the posterior probability of $\mathcal{X}$ given $\mathcal{Z}$, as described by a neural network with parameters $\theta$, and $\mathcal{P}_\lambda(\mathcal{Z})$ is the priori probability of latent variables as modeled by neural networks with parameters $\lambda$. Decoders are the name for these neural networks. The evidence lower bound (ELBO) from Jensen's inequality is the lower bound of log-likelihood $\log \mathcal{P}_\theta(\mathcal{X})$ [38].

$$\begin{aligned}\log \mathcal{P}_\theta(\mathcal{X}) &= \log \mathcal{E}_{\mathcal{Q}_\phi(\mathcal{Z}|\mathcal{X})}\left[\frac{\mathcal{P}_\theta(\mathcal{X} \mid \mathcal{Z})\, \mathcal{P}_\lambda(\mathcal{Z})}{\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X})}\right] \\ &\geq \mathcal{E}_{\mathcal{Q}_\phi(\mathcal{Z}|\mathcal{X})}\left[\frac{\mathcal{P}_\theta(\mathcal{X} \mid \mathcal{Z})\, \mathcal{P}_\lambda(\mathcal{Z})}{\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X})}\right] \\ &\equiv \mathcal{L}(\mathcal{X}; \theta, \phi)\end{aligned} \tag{2}$$

where $\mathcal{E}_{\mathcal{Q}_\phi(\mathcal{Z}|\mathcal{X})}[.]$ is the mathematical expectation, $\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X})$ is the posterior probability of $\mathcal{Z}$ given $\mathcal{X}$, represented by a neural network with parameters $\phi$, and $\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X})$ is generally the normal distribution $\mathcal{N}\left(\mathcal{Z} \mid \mu_\theta(\mathcal{X}), \sigma_\phi^2(\mathcal{X})\right)$, where $\mu_\theta(\mathcal{X})$ and $\sigma_\phi^2(\mathcal{X})$ are neural networks with argument $\phi$ and input $\mathcal{X}$, respectively. Encoders are the name for these neural networks. $\mathcal{L}(\mathcal{X}; \theta, \phi)$ can be viewed as the lower bound of $\log \mathcal{P}_\theta(\mathcal{X})$. Thus, the ELBO can also be defined as [21]:

$$\begin{aligned}\mathcal{L}_{VAE} &= \mathcal{L}(\mathcal{X}; \theta, \phi) \\ &= \mathcal{E}_{\mathcal{Q}_\phi(\mathcal{Z}|\mathcal{X})}\left[\log \mathcal{P}_\theta(\mathcal{X} \mid \mathcal{Z})\right] \\ &\quad -\mathcal{D}_{KL}\left(\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X}) \parallel \mathcal{P}_\lambda(\mathcal{Z})\right)\end{aligned} \tag{3}$$

Specifically, the loss function $\mathcal{L}_{VAE}$ in 3 can be divided into two parts: 1) a logarithmic reconstruction likelihood term $\mathcal{E}_{\mathcal{Q}_\phi(\mathcal{Z}|\mathcal{X})}\left[\log \mathcal{P}_\theta(\mathcal{X} \mid \mathcal{Z})\right]$ and 2) a Kullback–Leibler (KL) divergence $-\mathcal{D}_{KL}\left(\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X}) \parallel \mathcal{P}_\lambda(\mathcal{Z})\right)$. The former term is used to reduce the reconstruction loss of the square $L_2$ norm between $\mathcal{X}$ and $\widehat{\mathcal{X}}$, while the latter term is used to characterize the posterior distribution $\mathcal{Q}_\phi(\mathcal{Z} \mid \mathcal{X})$ the prior distribution $\mathcal{P}_\lambda(\mathcal{Z})$. The VAE can be trained in an unsupervised manner. Thus, the input intrusion data is converted to a latent representation that is considered to lose the individual singular characteristic. The obtained latent features are forwarded to ABiLSTM-based classifier to detect intrusions.

#### 2.1.2 *RENS* VAE-ABiLSTM for Attack Detection

BiLSTM is a Recurrent Neural Network (RNN) version that comprises of two Long Short-Term Memory (LSTM) networks that move forward and backward while storing time-series data. BiLSTM is appropriate for handling intrusion detection-related tasks and has been effectively used to attack event classification since intrusion data can be conveniently represented as time series and depends on the data in preceding frames. The LSTM-based RNNs are usually made up of four components: an input gate $\mathcal{I}_\mathcal{T}$ with corresponding weight matrix $\mathcal{W}_\mathcal{I}$ and bias $\mathcal{B}_\mathcal{I}$; a forget gate $\mathcal{F}_\mathcal{T}$ with corresponding weight matrix $\mathcal{W}_\mathcal{F}$, and bias $\mathcal{B}_\mathcal{F}$; an output gate $\mathcal{O}_\mathcal{T}$ with corresponding weight matrix $\mathcal{W}_\mathcal{O}$ and bias $\mathcal{B}_\mathcal{O}$. For the intuitions whether to take the inputs, forget the memory stored previously, and output the state formed later, all of those gates are configured to generate some degrees, using current input $\mathcal{X}_\mathcal{T}$, the state $\mathcal{H}_{\mathcal{T}-1}$ that the previous step generated, and current state of this cell $\mathcal{C}_{\mathcal{T}-1}$. As demonstrated by the following equations:

$$\mathcal{I}_\mathcal{T} = \sigma\left(\mathcal{W}_\mathcal{I}\mathcal{X}_\mathcal{T} + \mathcal{W}_\mathcal{I}\mathcal{H}_{\mathcal{T}-1} + \mathcal{W}_\mathcal{I}\mathcal{C}_{\mathcal{T}-1} + \mathcal{B}_\mathcal{I}\right) \tag{4}$$

$$\mathcal{F}_\mathcal{T} = \sigma\left(\mathcal{W}_\mathcal{F}\mathcal{X}_\mathcal{T} + \mathcal{W}_\mathcal{F}\mathcal{H}_{\mathcal{T}-1} + \mathcal{W}_\mathcal{F}\mathcal{C}_{\mathcal{T}-1} + \mathcal{B}_\mathcal{F}\right) \tag{5}$$

$$\mathcal{G}_\mathcal{T} = \tanh\left(\mathcal{W}_\mathcal{C}\mathcal{X}_\mathcal{T} + \mathcal{W}_\mathcal{C}\mathcal{H}_{\mathcal{T}-1} + \mathcal{W}_\mathcal{C}\mathcal{C}_{\mathcal{T}-1} + \mathcal{B}_\mathcal{C}\right) \tag{6}$$

$$\mathcal{C}_\mathcal{T} = \mathcal{I}_\mathcal{T}\mathcal{G}_\mathcal{T} + \mathcal{F}_\mathcal{T}\mathcal{C}_{\mathcal{T}-1} \tag{7}$$

$$\mathcal{O}_\mathcal{T} = \sigma\left(\mathcal{W}_\mathcal{O}\mathcal{X}_\mathcal{T} + \mathcal{W}_\mathcal{O}\mathcal{H}_{\mathcal{T}-1} + \mathcal{W}_\mathcal{O}\mathcal{C}_{\mathcal{T}-1} + \mathcal{B}_\mathcal{O}\right) \tag{8}$$

$$\mathcal{H}_\mathcal{T} = \mathcal{O}_\mathcal{T}\tanh\left(\mathcal{C}_\mathcal{T}\right) \tag{9}$$

As a result, the weighted total will be calculated utilizing both the prior cell state and the current information supplied by the cell to generate the current cell state $\mathcal{C}_\mathcal{T}$. It's useful to have access to both future and past context for many sequence modeling activities. Standard LSTM networks, on the other hand, analyze sequences in a chronological manner and neglect future context. Bidirectional LSTM networks add a second layer to unidirectional LSTM networks, with hidden to hidden connections flowing in the opposite temporal order. Thus, the model can use data from both the past i,e., using backward direction $\overrightarrow{\mathcal{H}_\mathcal{T}} = \mathcal{LSTM}\left(\mathcal{X}_\mathcal{T}, \overrightarrow{\mathcal{H}_\mathcal{T} - 1}\right)$ and the future i.e., using forward

direction $\overleftarrow{\mathcal{H}_{\mathcal{T}}} = \mathcal{LSTM}\left(\mathcal{X}_{\mathcal{T}}, \overleftarrow{\mathcal{H}_{\mathcal{T}}-1}\right)$. Finally, by concatenating the forward and backward states of BiLSTM, the result can be summarized as follow,

$$\mathcal{H}_{\mathcal{T}} = \left[\overrightarrow{\mathcal{H}_{\mathcal{T}}}, \overleftarrow{\mathcal{H}_{\mathcal{T}}}\right] \tag{10}$$

Then, we have added the attention mechanism to the traditional BiLSTM model. The attention layer, in particular, adds larger weights to the input sequence's most relevant and essential features. This technique has the advantage of preserving lengthier input sequences. Let $\mathcal{H}$ denote a matrix containing the BiLSTM layer's output vectors $[\mathcal{H}_1, \mathcal{H}_2, \ldots, \mathcal{H}_{\mathcal{T}}]$, where $\mathcal{T}$ is the feature length. A weighted sum of these output vectors is used to construct the input representation $\mathcal{R}$:

$$\mathcal{M} = \tanh\mathcal{H} \tag{11}$$

$$\alpha = \mathcal{SOFTMAX}\left(\mathcal{W}^{\mathcal{T}}\mathcal{M}\right) \tag{12}$$

$$\mathcal{R} = \mathcal{H}\alpha^{\mathcal{T}} \tag{13}$$

where $\mathcal{W}^{\mathcal{T}}$ denotes the transpose of the trained parameter vector. The final feature-pair representation form used for detecting and classifying attacks can be written as,

$$\mathcal{H}^* = \tanh(\mathcal{R}) \tag{14}$$

In order to detect attack, we have used last layer with sigmoid activation function $\mathcal{S}$ to detect attack 0 and normal 1 using the following formula.

$$\mathcal{S}\left(\mathcal{H}^*\right) = \frac{1}{1+e^{\mathcal{H}^*}}, \mathcal{S} \rightarrow [0, 1] \tag{15}$$

## 2.2 Blockchain Scheme

In this subsection, the mutual authentication, key agreement and smart contract-based consensus mechanism for secure, traceable and transparent data storage process is discussed.

### 2.2.1 System Initialization Phase

This section explains how network entities are initially set up. The initial configuration is carried out by the trusted authority *SP*, who also distributes the necessary network settings for communications. The next section discusses the actions necessary for the network's initial setup.

*Step-1:* The *SP* uses elliptic curve with a non-singular property $E_n(u, v)$ with the form $y^2 = x^3 + ux + v \pmod g$ over the real galois field *GF(g)*, where $g$ denotes a large prime number over the condition $4u^3 + 27v^2 \neq 0 \pmod g$ and also follows a non-singularity property over $\omega$ which includes either zero point and infinity point. Next, the *SP* selects initial point $BS \in E_n(u,v)$ with closest order of $g$, say $n$ i.e., $n.BS = \omega$, where $n.BS$ signifies the scalar multiplication point over the elliptic curve and $n \in Z_g$ i.e.; discrete algorithm over base point *BS*.

*Step-2:* The *SP* computes a cryptographic hash function with one-way working principles that is collision resistant, $hfs(.)$. This is computed by secure hash algorithm (SHA-256) for the reason of security that provides 256-bit message digest.

*Step-3:* The *SP* chooses the unique identity $ID_{SP}$ and perform computation of master key $M_{SP}$ and produces a private key randomly $PR_{SP} \in Z_g$, where $Z_g = \{1, 2, 3, 4, \ldots, g-1\}$. The *SP* computes a public key i.e.; $PB_{SP} = PR_{SP}.BS$.

*Step-4:* The *SP* preserves a $PR_{SP}$ and $M_{SP}$ preserves secret key and share the public parameter like { $E_n(u, v)$, *BS*, $PB_{SP}$, *hfs(.)* }.

### 2.2.2 Registration Phase

This phase illustrates about the registration phase of entities of network.

*(i) DRCU Registration:* The *SP* registers the Demand Response Control Units (*DRCU*) using the following steps which is illustrated as follows:

*Step-1:* The *SP* selects a unique identity of $ID_{DRCU}$ and perform computation of pseudo identity $SID_{DRCU}$= h($ID_{SP}$ || $M_{SP}$ || $RT_{DRCU}$), where $RT_{DRCU}$ denotes the registration timestamp of Demand Response Control Units. Further, *SP* chooses a temporary identity $TIDM_{DRCU}$ and computes random secret value $PR_{DRCU} \in Z_g$ and finds a public key $PB_{DRCU} = PR_{DRCU}.BS$.

*Step-2:* The *SP* generates a certificate of *DRCU* as $CRT_{DRCU} = M_{SP} + \text{hfs}(PB_{SP} \,||\, PB_{DRCU} \,||\, ) * PR_{SP} \pmod g$. Further, *SP* stores the DRCU information i.e., ($TIDM_{DRCU}$, $SID_{DRCU}$,$CRT_{DRCU}$, $PR_{DRCU}$, $E_n(u, v)$, *hfs(.)*) into the memory and distributes public key $PB_{CLS}$ for further access.

*(ii) SM Registration:* The *SP* registers the Demand Response Control Units (*SM*) using the following steps which is illustrated as follows:

*Step-1:* The *SP* picks a unique identity $ID_{SM}$ and computes pseudo identity $SID_{SM}$= h($ID_{SP}$ ||$M_{SP}$ || $RT_{SM}$), where $RT_{SM}$ denotes the registration timestamp of smart meter. Further, *SP* chooses a temporary identity $TIDM_{SM}$ and computes random secret value $PR_{SM} \in Z_g$ and finds a public key as $PB_{SM} = PR_{SM}.BS$.

*Step-2:* The *SP* generates a certificate of *SM* as $CRT_{SM} = M_{SP} + \text{hfs}(PB_{SP} \,||\, PB_{SM} \,||\, ) * PR_{SP} \pmod g$. Further, *SP* stores the SM information i.e., ($TIDM_{SM}$, $SID_{SM}$,$CRT_{SM}$, $PR_{SM}$, $E_n(u, v)$, *hfs(.)*) into the memory and distributes public key $PB_{SM}$ for further access.

#### 2.2.3 Authentication Phase

In this phase, the authentication procedures for IIoT nodes, generators, and edge servers connecting to cloud servers are discussed. Each entity in the authentication process keeps a session key, enabling secure interactions inside the framework. The authorization of each entity in the framework is developed through this method. The procedure for establishing mutual authentication and sharing session keys includes the stages below.

*(i) Authentication between SM to SM*

*Step-1:* $SM_i$ randomly select a number $drn_1 \in Z_g$ and also generates a current timestamp $CT_1$ and evaluates $T_1$= hfs($SID_{SM_i}$|| $TIDM_{SM_i}$ || $drn_1$ || $CT_1$). Then $SM_i$ makes encryption operation $T_1$ as $T_2$= $E_{PBSMj}(T_1)$. Next, $SM_i$ evaluates the parameter $T_3$= hfs($T_2$ || $CRT_{SM_i}$ ||$SID_{SM_i}$|| $TIDM_{SM_i}$ || $CT_1$) and produces an request message $M_1$={$SID_{SM_i}$, $TIDM_{SM_i}$, $CT_1$, $T_2$, $T_3$} and sends to another smart meter ($SM_j$) through open channel.

*Step-2:* After successful receiving of $M_1$ on time $CT_1^*$, the $SM_j$ verifies the timestamp for checking delay of transmission using $|CT_1^*$- $CT_1| < \Delta T$. If the obtained timestamp is in the valid range, then $SM_j$ checks for the certificate using $CRT_{SM_i}.BS$= $PB_{SP}$ + h($PB_{SM_i}$|| $PB_{SP}$), For every successful match, the $SM_j$ fetches $SID_{SM_i}$ corresponding to $TIDM_{SM_i}$ from the secure database storage and computes $T_3^*$= h ($T_2$ ||$SID_{SM_i}$|| $TIDM_{SM_i}$ || $CRT_{SM_i}$) to validate whether $T_3^*$= $T_3$. if valid, then $SM_j$ applies decryption $T_2$ as $T_1$= $D_{PR_{SM_j}}(T_2)$.

*Step-3:* Further, $SM_j$ randomly selects a number $fr_1 \in Z_g$ and computes the current timestamp $CT_2$ and generates a new temporary identity $TIDM_{SM_i}^{new}$ and evaluates $SM_j$ = h($SID_{SM_i}$||$SID_{SM_j}$|| $fr_1$ || $CT_2$) and applies encryption $SM_1$ as $SM_2$= $E_{PB_{SM_i}}(FGS_1)$. Next, $SM_j$ generates a session key $SES_{SM_j}$= hfs($TIDM_{SM_i}^{new}$ || $T_1$ || $FGS_1$ || $CT_1$ || $CT_2$), $TIDM_{SM_i}^{*}$= $TIDM_{SM_i}^{new}$ $\oplus$ h($SID_{SM_j}$|| $TIDM_{SM_i}$ ||$CT_2$), and $FG_3$=hfs($TIDM_{SM_i}^{*}$ || $FGS_1$ || $CRT_{SM_j}$ ||$SID_{SM_j}$|| $CT_2$) and makes a reply message $M_2$= {$TIDM_{SM_i}^{*}$, $FG_2$, $CRT_{SM_j}$, $SID_{SM_j}$, $CT_2$} and shares with $SM_i$ through open channel.

*Step-4:* After successful receiving of message ($M_2$) from $SM_j$ on time $CT_2^*$, then $SM_i$ verify whether | $CT_2^*$–$CT_2$ | < $\Delta T$ timestamp matches or not. if matches and it is within the range, then $SM_i$ checks for the certificate i.e.; $CRT_{SM_j}.BS$=$PB_{SP}$ + hfs($PB_{SM_j}$|| $PB_{SP}$). Further, $SM_i$ applies decryption $FG_2$ to get $FGS_1$= $D_{PR_{SM_i}}(FG_2)$. Furthermore, $SM_i$ evaluates $FG_3^*$= hfs($TIDM_{SM_i}^{*}$ || $FGS_1$ || $CRT_{SM_j}$ ||$SID_{SM_j}$|| $CT_2$) and verify, if $FG_3^*$= $FG_3$ then $SM_i$ it computes $TIDM_{SM_i}^{new}$= $TIDM_{SM_i}^{*}$ $\oplus$ h($SID_{SM_j}$|| $TIDM_{SM_i}$ || $CT_2$) and generates a session key $SES_{SM_i}$ =h($TIDM_{SM_i}^{new}$ || $T_1$ || $FGS_1$ || $CT_1$ || $CT_2$) and shares with $SM_j$. Next, $SM_i$ picks a current timestamp $CT_3$ and perform session key verification $SESV_{SM_i}$ using $SESV_{SM_i}$=h($SES_{SM_i}$ ||$CT_3$) and perform updation of $TIDM_{SM_i}$ and $TIDM_{SM_i}^{new}$ in the secure database storage. Further, $SM_i$ generates an acknowledgment message $M_3$={$SESV_{SM_i}$, $CT_3$} and shares with $SM_j$ through open channel.

*Step-5:* after receiving successful acknowledgment message $M_3$ on time $CT_3^*$, then $SM_j$ check the current timestamp using | $CT_3^*$ - $CT_3$ | < $\Delta T$ to verify validity of timestamp. Next $SM_j$ verifies $SESV_{SM_i}$= h ($SESV_{SM_j}$ || $CT_3$). If matches successfully, then $SM_j$ share session key and perform mutual authentication $SESV_{SM_i}$ (=$SESV_{SM_j}$) with $SM_i$. Finally, $SM_j$ makes updation $TIDM_{SM_i}$ and $TIDM_{SM_i}^{new}$ in the secure database.

*(ii) SM to DRCU Authentication*

*Step-1:* $SM_i$ randomly selects a number $drn_1 \in Z_g$ and preserve a current timestamp $CT_1$ and perform computation of $T_1$= hfs($SID_{SM_i}$|| $TIDM_{SM_i}$ || $drn_1$ || $CT_1$). Further, $SM_i$ applies encryption $T_1$ as $T_2$= $E_{PB_{DRCU}}(T_1)$. Furthermore, $SM_i$ perform computation of $T_3$= hfs($T_2$ || $CRT_{SM_i}$ ||$SID_{SM_i}$|| $TIDM_{SM_i}$ || $CT_1$) and sends a access request message $M_1$={$SID_{SM_i}$, $TIDM_{SM_i}$, $CT_1$, $T_2$, $T_3$} and transmit to smart respective meter ($DRCU$) through open channel.

*Step-2:* After successful receiving of message $M_1$ on time $CT_1^*$, then $DRCU$ verifies current timestamp $|CT_1^*$- $CT_1| < \Delta T$. For successful timestamp it computes $DRCU$ and checks for certificate using $CRT_{SM_i}.BS$= $PB_{SP}$ + h($PB_{SM_i}$|| $PB_{SP}$) if matches successfully, then $DRCU$ keeps $SID_{SM_i}$ of respective $TIDM_{SM_i}$ from the secure database storage and evaluates $T_3^*$= h ($T_2$ ||$SID_{SM_i}$|| $TIDM_{SM_i}$ || $CRT_{SM_i}$) to verify whether $T_3^*$= $T_3$. if matches successfully, then $DRCU$ applies decryption $T_2$ as $T_1$= $D_{PR_{DRCU}}(T_2)$.

*Step-3:* Further, $DRCU$ randomly selects a number $fr_1 \in Z_g$ and preserve a current timestamp $CT_2$ and produces new temporary identity $TIDM_{SM_i}^{new}$ and evaluates $DRCU$ = h($SID_{SM_i}$||$SID_{DRCU}$|| $fr_1$ || $CT_2$) and applies encryption $SM_1$ as $SM_2$= $E_{PB_{SM_i}}(FGS_1)$. Next, $DRCU$ evaluates a session key $SES_{DRCU}$= hfs($TIDM_{SM_i}^{new}$ || $T_1$ || $FGS_1$ || $CT_1$ || $CT_2$), $TIDM_{SM_i}^{*}$= $TIDM_{SM_i}^{new}$ $\oplus$ h($SID_{DRCU}$|| $TIDM_{SM_i}$ ||$CT_2$), and $FG_3$=hfs($TIDM_{SM_i}^{*}$ || $FGS_1$ || $CRT_{DRCU}$ ||$SID_{DRCU}$|| $CT_2$) and makes a reply message $M_2$= {$TIDM_{SM_i}^{*}$, $FG_2$, $CRT_{DRCU}$, $SID_{DRCU}$, $CT_2$} and shares to $SM_i$ through open channel.

*Step-4:* After successful receiving of reply message ($M_2$) from the $DRCU$ on time $CT_2^*$, then $SM_i$ verify whether | $CT_2^*$–$CT_2$ | < $\Delta T$ timestamp is valid or not. if validates successfully, then $SM_i$ checks for certificate by $CRT_{DRCU}.BS$=$PB_{SP}$ + hfs($PB_{DRCU}$|| $PB_{SP}$). Further, $SM_i$ applies decryption $FG_2$ to get $FGS_1$= $D_{PR_{SM_i}}(FG_2)$. Furthermore, $SM_i$ evaluates $FG_3^*$= hfs($TIDM_{SM_i}^{*}$ || $FGS_1$ || $CRT_{DRCU}$ ||$SID_{DRCU}$|| $CT_2$) and verify, if $FG_3^*$= $FG_3$ then $SM_i$ perform computation $TIDM_{SM_i}^{new}$= $TIDM_{SM_i}^{*}$ $\oplus$ h($SID_{DRCU}$|| $TIDM_{SM_i}$ || $CT_2$) and also makes evaluation of a session key $SES_{SM_i}$=h($TIDM_{SM_i}^{new}$ || $T_1$ || $FGS_1$ || $CT_1$

**Algorithm 1** Block Commitment and Verification using Smart Contracts enabled Proof-of-Authentication (PoA) Consensus Algorithm

**Input:** Transactions ($Tx_i$), public key ($PB_{SM_i}$), Smart meters ($SM_i$)
**Output:** Block creation and verification .
**function** v(e)rify$SM_i$, $Tx_i$, $PB_{SM_i}$, $CRT_{SM_i}$
  assert($VERIFY(PB_{SM_i}, SMNonce[msg.sender], CRT_{SM_i})$)
  assert ($CheckAuthenticate(SESV_{SM_i})$)
  emit Event(msg.sender, $Tx_i$, "Successful")
**end function**
**function** ($VERIFY$)($Tx_i$, nonce,$CRT_{SM_i}$)
  $Msg_{Signed}$=msg.sender || nonce || $Tx_i$
  **if** ($Msg_{Signed}$, $CRT_{SM_i}$ == OWNER) **then**
    return true
  **else**
    return false
  **end if**
**end function**
**function** (CheckAuthenticate($SESV_{SM_i}$))
  policies= $session_{verify}[SESV_{SM_i}]$
  **if** (policies is successful then) **then**
    Block is created with Details such as $TX_{BLOCK}$= {$Tx_i^{hash}$, $ID_{SM_i}$, $CRT_{SM_i}$, $PB_{SM_i}$, $Block_{Hash}$, $CT_{SM_i}$, nonce}
    Block commit
  **end if**
**end function**

|| $CT_2$) and transmit to $DRCU$. Further, $SM_i$ picks a current timestamp $CT_3$ and perform computation of session key verification $SESV_{SM_i}$ using $SESV_{SM_i}$=h($SES_{SM_i}$ ||$CT_3$) and makes updatation of the $TIDM_{SM_i}$ and $TIDM_{SM_i}^{new}$ in the secure database. Furthermore, $SM_i$ produces an acknowledgment message $M_3$={$SESV_{SM_i}$, $CT_3$} and shares to $DRCU$ through open channel.

*Step-5:* After successful receiving of acknowledgment message $M_3$ on time $CT_3^*$, then $DRCU$ check for the timestamp using | $CT_3^*$ - $CT_3$ | < $\Delta T$ to check the whether timestamp is valid or not. Further, $DRCU$ checks $SESV_{SM_i}$= h ($SESV_{DRCU}$ || $CT_3$). If matches successfully, then $DRCU$ shares the session key and establish a mutual authentication $SESV_{SM_i}$ (=$SESV_{DRCU}$) with $SM_i$. Finally, $DRCU$ makes updation of $TIDM_{SM_i}$ and $TIDM_{SM_i}^{new}$ in the secure database.

#### 2.2.4 Block verification and block creation using PoA consensus mechanism

This stage includes two different verification of $D_i$ using its certificate $CRT_{D_i}$ and $SESV_{D_i}$ which enables a secure authentication. The PoA consensus mechanism is applied to verify and create a particular block in the network. The detailed process of authentication is mentioned in the Algorithm 1.

## 3 Performance Analysis

The simulations were run on a computer with an NVIDIA GeForce GTX 1060 16GB GPU, two Intel i5-3470 CPUs running at 2.20GHz, 64GB of RAM, and Windows 11 as the operating system. The textit-RENS method was created using the TensorFlow package Keras. The smart contract module was developed on the Ethereum Rinkeby network. While A-BiLSTM used two hidden layers with (16,8) neurons, the VAE layer was trained over 25 epochs using two hidden layers containing (128,64) neurons. The final layer has a sigmoid classifier, ReLU activation, Adam Optimizer, Binary cross-entropy as the loss function, and a batch size of 100 over 10 epochs.

### 3.1 Description of Datasets

The experiment uses two recent intrusion datasets to validate the *RENS* performance. The corpus is available for free on open source websites.

#### 3.1.1 ToN-IoT Dataset

The ToN-IoT dataset is used to test the proposed *RENS* detection capability. The data is gathered from IoT networks using parallel processing to acquire a mix of routine and cyber-attack events. Table 1 illustrates the functional distribution of normal and attack cases. There are 43 features in this dataset, including 300,000 normal observations and 161,043 attack observations [44].

#### 3.1.2 BoT-IoT Dataset

The BoT-IoT dataset is also used to evaluate the performance of the proposed *RENS*. This dataset was developed at the UNSW Canberra Cyber Range Laboratory. It has about 72 million recordings that include both simulated and real-time settings [45]. Table 2 shows the distribution of normal and attack cases. There are 16 features in this dataset, including 477 normal observations and 3668045 attack observations.

### 3.2 Data Preprocessing

The intrusion datasets were preprocessed using various steps. First, the categorical values were converted into numeric data using label encoding. The numeric values were of different range, therefore min-max normalization technique was used to scale the values between 0 and 1. The ToN-IoT dataset was then divided into 70–30 ratio of training and testing set. On the other hand for BoT-IoT dataset, two separate files of training and testing was downloaded, and was used to perform experiments [14, 32].

**Table 1** Distributions of attacks and normal instances in ToN-IoT dataset

| Division of class | Total occurrences | Percentage of class frequency (%) |
|---|---|---|
| *Training set* | | |
| Normal | 209801 | 65.069 |
| Attack | 112929 | 34.931 |
| *Testing set* | | |
| Normal | 90199 | 65.069 |
| Attack | 48114 | 34.931 |
| Total | 461043 | 100 |

**Table 2** Distributions of attacks and normal instances in BoT-IoT dataset

| Division of class | Total occurrences | Percentage of class frequency (%) |
|---|---|---|
| *Training set* | | |
| Normal | 370 | 65.069 |
| Attack | 2934447 | 34.931 |
| *Testing set* | | |
| Normal | 107 | 65.069 |
| Attack | 733598 | 34.931 |
| Total | 3668522 | 100 |

### 3.3 Attack Detection Analysis

The main objective of this subsection is to assess the significance of the proposed IDS i.e., *RENS*. Different evaluation metrics such as accuracy vs loss for VAE technique, confusion matrix, ROC curve, $\mathcal{AC}$, $\mathcal{PR}$, $\mathcal{DR}$, $\mathcal{F}1$, and $\mathcal{FAR}$ score. In Figs. 2 and 3 the accuracy vs loss is illustrated for ToN-IoT as well as BoT-IoT datasets, respectively. It is seen that the VAE-based feature extraction module has learned both datasets well and obtained *val_loss* of 0.0876 and *val_accuracy* of 95.37, and *val_loss* of 0.3809 and *val_accuracy* of 70.67 using ToN-IoT as well as BoT-IoT datasets, respectively. Although, it has learned the datasets well but we have used it as feature extraction approach. The extracted features from this module are used to detect intrusions.

Confusion Matrix (CM) is a valuable tool that contains information about an IDS model's efficiency in binary classifications. The $\mathcal{TP}$, $\mathcal{FN}$, $\mathcal{FP}$, and $\mathcal{TN}$ are all represented in the matrix. It's worth noting that positive implies the IDS projected the traffic record as attack data, while negative means the IDS anticipated the traffic record as normal data. Figure 4 shows the CM obtained from our proposed *RENS*-based IDS. It is observed that for ToN-IoT dataset in Fig. 4a, only 2 attack instances were misclassified. On the other hand, for BoT-IoT dataset in Fig. 4b, 1 attack and 10 normal instances were misclassified. The lesser is the misclassification, the better is the performance considered.

A Receiver Operating Characteristic (ROC) curve is a two-dimensional depiction of a classifier's recall and fall-out scores. The amount of genuine negatives leaking in as $\mathcal{FP}$s is referred to as "fall-out." It's the number of $\mathcal{FP}$s divided by the number of genuine negatives. The number of $\mathcal{TP}$s obtained by the classifier is referred to as recall. While the classifier can accurately extract data, we don't want data from the negative lot to seep in. The classification threshold is a set of probabilities used to discriminate among two classes using a classifier's output. For example, if the threshold is 0.5 and the classifier produces 0.48, the prediction is regarded negative, whereas 0.65 indicates positive. As a result, the trade-off between the two metrics for picking an acceptable threshold can be seen on the ROC curve at locations corresponding to particular classification thresholds and their related TPR and FPR values. Figure 5 depicts the ROC curve obtained from the proposed *RENS*-based IDS. It is seen in Fig. 5a, b that the for both datasets the *RENS* has obtained AUC value of 1, this represents the classifiers' ability to differentiate between the two classes.

Finally, the results are obtained for both datasets in terms of $\mathcal{AC}$, $\mathcal{PR}$, $\mathcal{DR}$ and $\mathcal{F}1$ score. Figure 6 shows these values using ToN-IoT dataset and Fig. 7 shows for BoT-IoT dataset. It is seen that the proposed *RENS* has achieved 99.99% $\mathcal{AC}$, 98.99% $\mathcal{PR}$, 99.90% $\mathcal{DR}$ and 99.91% $\mathcal{F}1$ score. Similarly, with BoT-IoT dataset, *RENS* obtained 99.99% $\mathcal{AC}$, 98.97% $\mathcal{PR}$, 90.66% $\mathcal{DR}$ and 94.63% $\mathcal{F}1$ score. These results clearly indicates the high performance of the proposed approach.

### 3.4 Blockchain Analysis

The result analysis of blockchain is illustrated in Figs. 8, 9, 10, and 11. Figure 8 consists of two different analysis

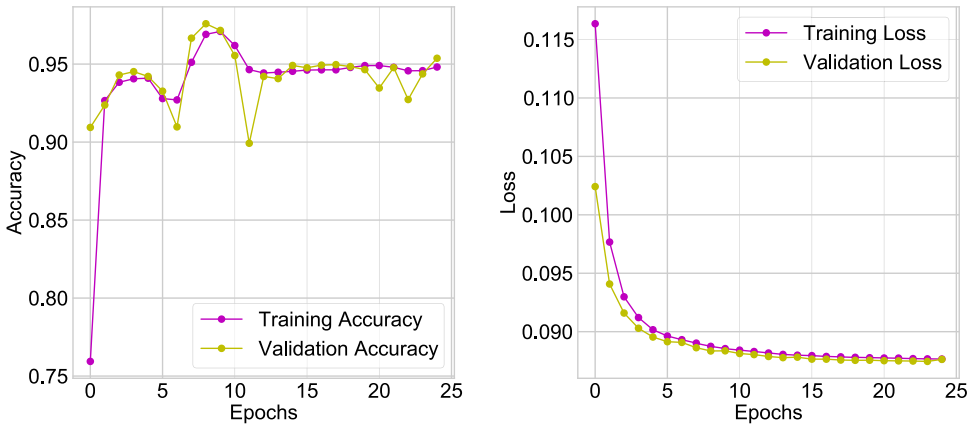



**Fig. 2** The accuracy vs loss for VAE technique using ToN-IoT dataset

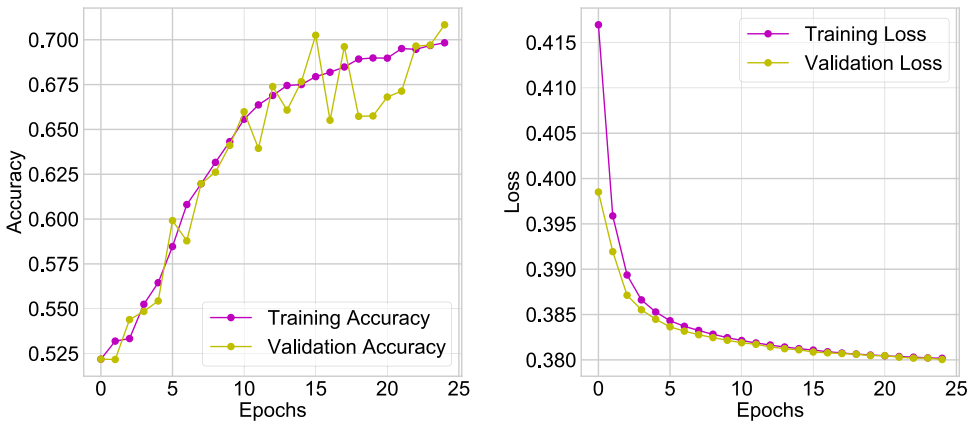



**Fig. 3** The accuracy vs loss for VAE technique using BoT-IoT dataset

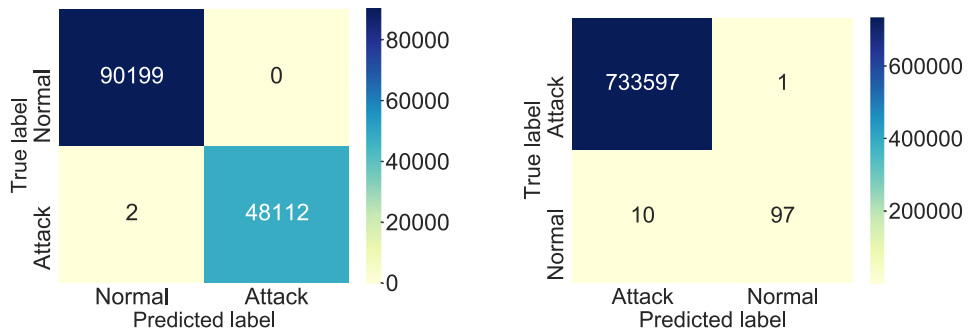



**Fig. 4** Confusion matrices obtained from *RENS*

(a) The confusion matrix obtained for ToN-IoT dataset

(b) The confusion matrix obtained for BoT-IoT dataset

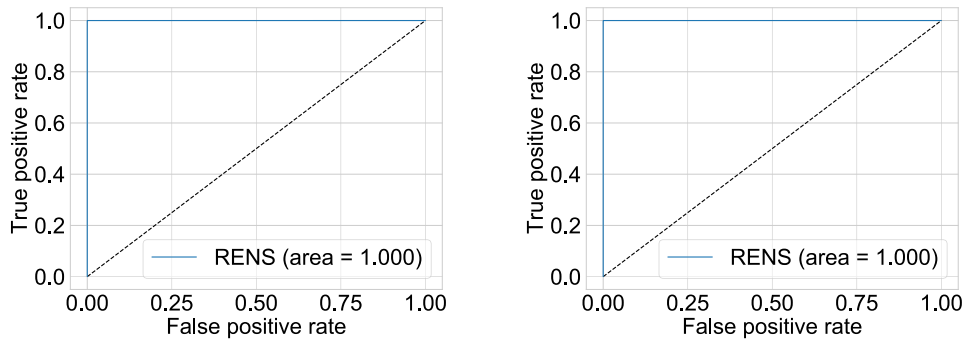



**Fig. 5** AU-ROC curves obtained from *RENS*

(a) The AU-ROC Curve obtained for ToN-IoT dataset

(b) The AU-ROC Curve obtained for BoT-IoT dataset

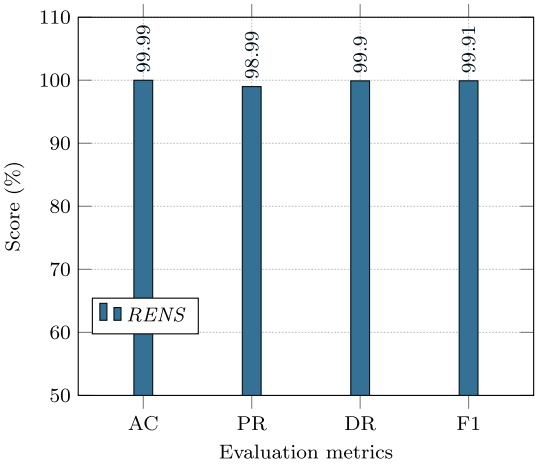



**Fig. 6** Performance of proposed *RENS* on different evaluation metrics using ToN-IoT dataset

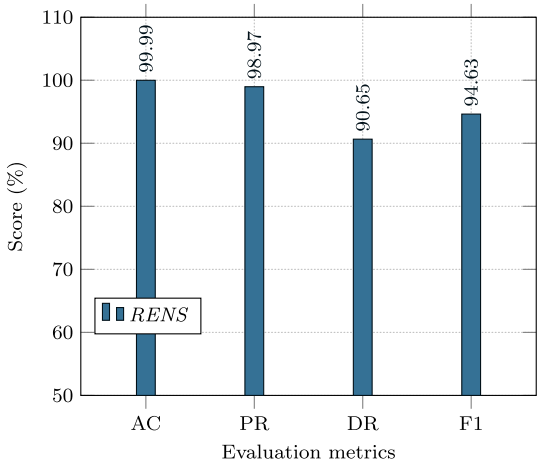
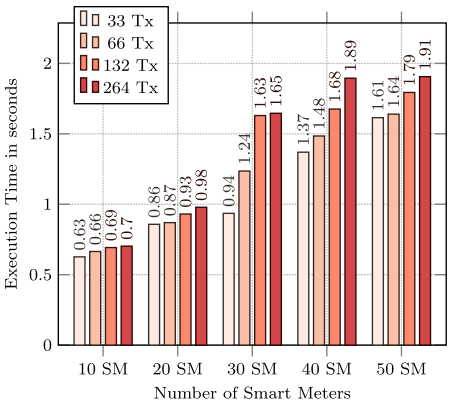


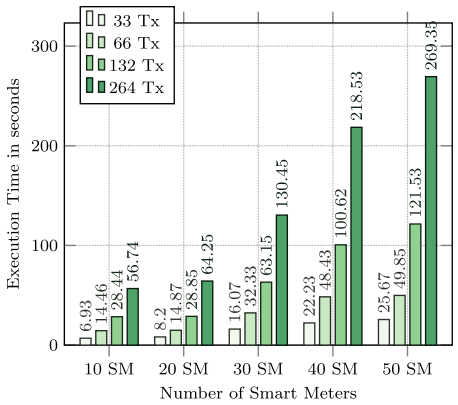

**Fig. 7** Performance of proposed *RENS* on different evaluation metrics using BoT-IoT dataset

i.e., transaction upload time and block mining time which is shown Fig. 8a, b. It can be seen that, the execution time gradually increasing with varying number of transactions and peers. Figure 9 illustrates block creation and block access time as shown in Fig. 9a, b. The execution time for both the cases i.e., block creation and block access is almost closed to

**Fig. 8** Smart contract module analysis

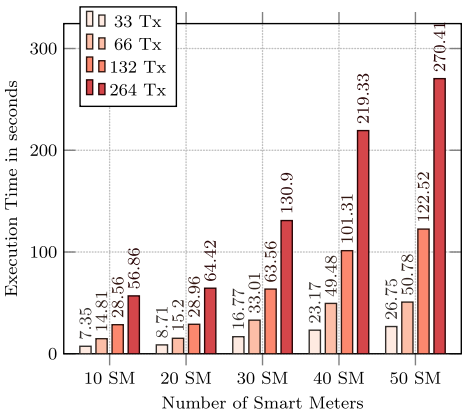



(a) Upload time analysis of Tx

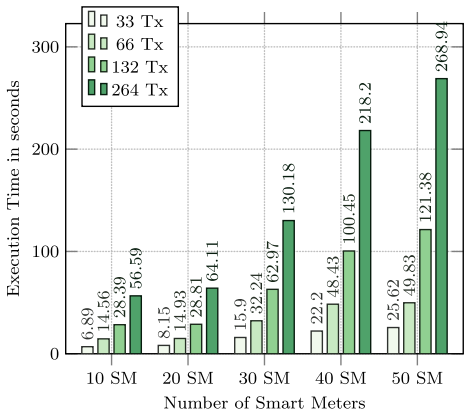



(b) Analysis of Block Mining Time

**Fig. 9** Smart contract module analysis

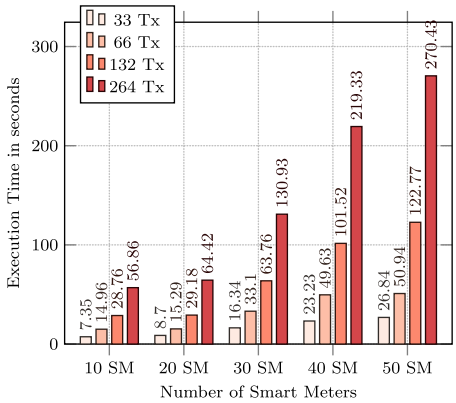



(a) Analysis of Block Creation Time

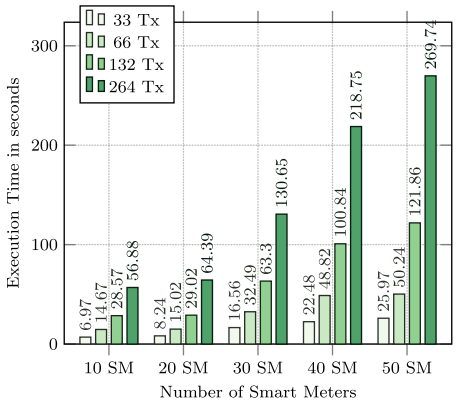



(b) Analysis of Block Access Time

**Fig. 10** Smart contract module analysis

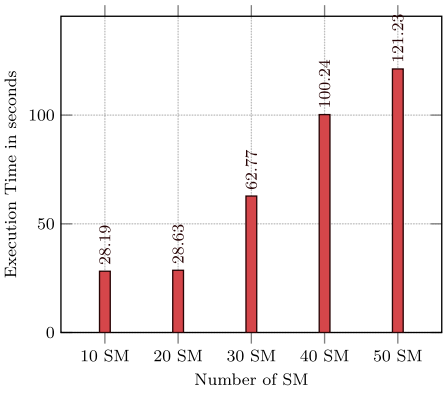



(a) Analysis of Non Repudiation Time

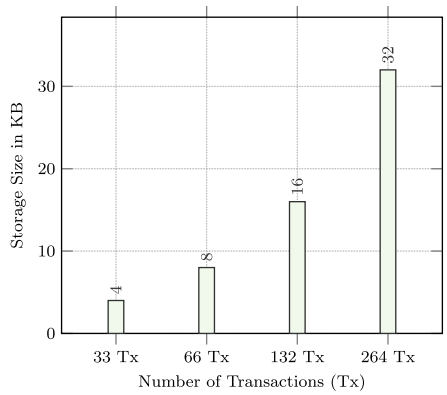



(b) Analysis of Contract Deployment Time

**Fig. 11** Smart contracts module analysis




(a) Analysis of SM Registration Time




(b) Analysis of off-chain Storage Size (in KB)

each other. However, it can be seen that, the analysis time of transactions execution increases as the SMs increases in the network. Figure 10 shows the non-repudiation and contract deployment time over the network with varying number of transactions and peers. The non-repudiation is performed in the system so that SMs can't deny at any stage of communication in the network. The contract deployment time shows the different functionality deployed over the network. Both non-repudiation and contract deployment is shown in Fig. 10a, b. Fig. 11 shows the SM registrations and off-chain storage size for varying number of transactions. It can be seen that, the registration time increases as SMs are increasing in the network. The off-chain storage in performed over the IPFS distributed storage layer. The storage is size for varying number of transactions are recorded in KB. It can be seen that, the storage size increasing for different set of transactions. The analysis of SMs registration and off-chain storage is shown in Fig. 11a, b.

### 3.5 Comparison with existing Approaches

The performance of the proposed *RENS*-based IDS is evaluated and compared with some baseline algorithms on BoT-IoT and ToN-IoT datasets with respect to $\mathcal{AC}$, $\mathcal{PR}$, $\mathcal{DR}$ and $\mathcal{F}1$ score. Table 3 shows the comparison using ToN-IoT dataset. It can be seen that the Naive Bayes (NB) model achieved 90.69% $\mathcal{AC}$, 77.70% $\mathcal{DR}$, 77.68% $\mathcal{PR}$ and 72.43% $\mathcal{F}1$ score. Similarly, Decision Tree (DT) achieved 95.34% $\mathcal{AC}$, 80.00% $\mathcal{DR}$, 74.42% $\mathcal{PR}$ and 76.33% $\mathcal{F}1$ score. The Random Forest (RF) model obtained 97.81% $\mathcal{AC}$, 85.43% $\mathcal{DR}$, 87.55% $\mathcal{PR}$ and 86.41% $\mathcal{F}1$ score. Finally, the proposed *RENS* achieved highest values for these parameters i.e., 99.99% $\mathcal{AC}$, 98.99% $\mathcal{DR}$, 99.99% $\mathcal{PR}$ and 99.91% $\mathcal{F}1$ score. Similarly, Table 4 shows the comparison based on BoT-IoT dataset. It is seen that the NB model achieved 94.69% $\mathcal{AC}$, 80.70% $\mathcal{DR}$, 82.18% $\mathcal{PR}$ and 74.53% $\mathcal{F}1$ score. Similarly, DT achieved 94.30% $\mathcal{AC}$, 79.82% $\mathcal{DR}$, 81.42% $\mathcal{PR}$ and 85.33% $\mathcal{F}1$ score. The RF model obtained 95.45% $\mathcal{AC}$, 84.88% $\mathcal{DR}$, 85.85% $\mathcal{PR}$ and 87.22% $\mathcal{F}1$ score. Finally, the proposed *RENS* achieved highest values for these parameters

**Table 3** Performance comparison with baseline algorithms using ToN-IoT dataset

| Techniques | $\mathcal{AC}$ (%) | $\mathcal{DR}$ (%) | $\mathcal{PR}$ (%) | $\mathcal{F}1$ (%) |
|---|---|---|---|---|
| NB | 90.69 | 77.70 | 77.68 | 72.43 |
| DT | 95.34 | 80.00 | 74.42 | 76.33 |
| RF | 97.81 | 85.43 | 87.55 | 86.41 |
| ANN | 99 | 99 | 99 | 99 |
| LSTM | 99 | 99 | 99 | 99 |
| *RENS* | 99.99 | 98.99 | 99.99 | 99.91 |

**Table 4** Performance comparison with baseline algorithms using BoT-IoT dataset

| Techniques | $\mathcal{AC}$ (%) | $\mathcal{DR}$ (%) | $\mathcal{PR}$ (%) | $\mathcal{F}1$ (%) |
|---|---|---|---|---|
| NB | 94.69 | 80.70 | 82.18 | 74.53 |
| DT | 94.30 | 79.82 | 81.42 | 85.33 |
| RF | 95.45 | 84.88 | 85.85 | 87.22 |
| ANN | 99 | 99 | 92 | 96 |
| LSTM | 99 | 99 | 92 | 94 |
| *RENS* | 99.99 | 98.97 | 90.65 | 94.63 |

i.e., 99.99% $\mathcal{AC}$, 98.97% $\mathcal{DR}$, 90.65% $\mathcal{PR}$ and 94.63% $\mathcal{F}1$ score.

## 4 Conclusion and Future Work

This article introduces a novel secure data sharing framework called *DBSDS* designed specifically for smart grid (SG) infrastructure. The *DBSDS* framework leverages deep learning and blockchain technology to fortify against various attacks. Within the *DBSDS* framework, after authenticating and establishing the session key (SK) between smart meters (SM) and Demand Response Control Units (DRCU), SM utilizes the shared SK to securely transmit acquired data to DRCU. The integrity of the received data is verified by the proposed Intrusion Detection System (IDS) named *RENS*, ensuring that only valid transactions from SM are permitted to participate in the smart contract-based Proof-of-Authentication (PoA) consensus mechanism. Valid transactions are stored using an IPFS-based storage layer, with the corresponding hashes stored on the blockchain network. This mechanism enhances the efficiency of the blockchain by reducing transaction upload and block access times. The *RENS* IDS is a fusion of unsupervised Variational Autoencoder (VAE) technique with Attention-based Bidirectional Long Short-Term Memory (ABiLSTM). The performance of the proposed approach is assessed using two recent intrusion datasets, namely ToN-IoT and BoT-IoT, with both security analysis and experimental results confirming the effectiveness and superiority of the *DBSDS* framework.

The reason for this better performance of proposed *RENS* are as follows. First, the VAE technique extracted meaningful patterns in an unsupervised manner. These hidden and unknown patterns were then converted/transformed into a new compressed form. The A-BiLSTM added additional weights to the most important and relevant features, and processed the time-series datasets in both forward and backward directions. Furthermore, it also stored useful data and knowledge for a long period while discarding unnecessary data.

In future work, the authors plan to implement SMs and DRCUs within a real-world SG network, exploring multiclass classification scenarios to evaluate the overall scalability and performance of the proposed approach.

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ORIGINAL PAPER

# Design and analysis of novel SDN-controlled dynamically reconfigurable TDM-DWDM-based optical network for smart cities

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**Abstract**
With the increasing bandwidth requirements in smart cities, high-capacity optical networks featuring ultrahigh bandwidths have become a necessity. The currently existing static and dynamic optical networks cannot efficiently optimize network resources and do not support intelligent decision making for smart cities, rendering them energy inefficient. The software-defined networking (SDN) controller in these networks also requires intelligent algorithms that can optimize network resources based on bandwidth requirements. We have designed a novel SDN-controlled dynamically reconfigurable time division multiplexing and dense wavelength-division multiplexing-based optical network for smart cities, which maximizes the utilization of network resources, making it energy efficient. To further empower the decision-making capabilities of the SDN controller, three novel algorithms are proposed: inter-application wavelength redirection with ROADM, dynamic load balancing, and bandwidth selection with resource allocation based on the different bandwidth requirements of primary and secondary applications. These algorithms sense the free bandwidth in primary applications and then assign this free bandwidth to secondary applications accordingly. The proposed SDN controller determines the best algorithm that optimally utilizes the network resources and routes the traffic through it. The performance of the designed optical network for a smart city is analyzed in terms of different performance parameters such as the bandwidth satisfaction rate, timing diagrams, eye diagrams, bit error rate, and quality factor. The proposed algorithms prove instrumental in the more efficient utilization of network resources, ensuring the maintenance of the required quality of service. This holistic proposed system addresses the unique challenges posed by smart cities, emphasizing energy efficiency and intelligent decision-making within the dynamic landscape of high-capacity optical networks.

**Keywords** TDM-DWDM · ROADM · Smart city · BER · Q-Factor · Bandwidth satisfaction rate

## 1 Introduction

Smart cities constitute a new paradigm in managing the ever-increasing urbanization challenges using information and communication-based technologies to promote sustainable development and people's life through smart and intelligent technological solution. Nonetheless, smart city applications such as smart homes, smart hospitals, smart transport, smart education, and smart agriculture generate a significantly large amount of data, which needs to be processed and transmitted [1]. This imposes strong requirements for robust network deployment capable of intelligently supporting large bandwidths with a low energy consumption and minimal delays, while achieving high service reliability [5]. Therefore, the rapid and efficient scalability of network capacity is crucial, given the time-sensitive nature of these systems [2–4].

Optical networks are a viable solution for achieving high scalability in managing the massive capacity demands in smart cities, while easily incorporating the changes in applications and offering seamless connectivity to the end user [6]. Optical networks have been extensively studied in literature, including various configurations and protocols[7]. Wavelength Division Multiplexing (WDM) optical networks are designed for high data rates [8]. Extensive research has been devoted toward further exploring WDM networks. For example, in [9], a phase modulator scheme for the remodulation of upstream data in a bidirectional

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WDM-Passive Optical Network (PON) system was studied. Simulation results of two data formats, RZ (return to zero) and NRZ (non-return to zero), for different optical fiber lengths have been reported. The multiplexing of time with wavelength was adopted as a benchmark development to further enhance the optical network capacity. Moreover, Time Division Multiplexing (TDM)-WDM-PONs [10] were considered as the next-generation Fiber Access (FTTx) Technology [11], providing an upgrade path for the current Gigabit Passive Optical Networks (GPONs) for ultra-broadband services [12]. In [13], key technologies for PON based on Time Wavelength Division Multiplexing (TWDM) were analyzed, along with techniques to improve the power budget and bandwidth capacity. Furthermore, [14] explains different possible solutions for next-generation access networks and discusses the major technical challenges associated with implementing TWDM networks. Many bandwidth allocation algorithms have also been developed. For example, in [15], a novel algorithm to allocate wavelength and bandwidth was proposed; it could minimize the number of active wavelength channels considering the high burntness and delay requirements of fronthaul data transmission. Reference [16] demonstrates the design of a sleep-aware Dynamic Wavelength and Bandwidth Allocation (DWBA) scheme for TWDM-PON under the Chain Secure Mode (CSM) mode. The main feature of this scheme is that it allocates bandwidth only to active Optical Network Units (ONUs), which minimizes the loss of bandwidth at the ONU end. Further development in this area involved designing energy-efficient optical networks. The design of energy-efficient, flexible hybrid WDM-TDM-based optical networks was discussed in [17]. Analyses showed that the designed system performance was improved in terms of the traffic loads supported by the system. All these optical networks were static in nature and cannot be reconfigured.

However, the ever-increasing expectations of end users and technological breakthrough are forcing demands for networks with increasing complexity and pressure. This is driving the current research focus toward making the available optical networks dynamically reconfigurable. The authors in [18] theoretically developed a routing power model for optical networks and numerically simulated the impact of dynamic traffic on the wavelength-routing capability of Reconfigurable Optical Add/Drop Multiplexers (ROADMs). Furthermore, the authors in [19] designed ROADM-based Dense Wavelength-Division Multiplexing (DWDM) optical networks and analyzed the system performance in terms of the Bit Error Rate (BER), Optical Signal to Noise Ratio (OSNR), and Q-Factor. The quality of these networks is commensurate with that of the controlling hardware.

Research suggests that automated networks are an alternative solution capable of managing the increasing network pressure and complexity. Software-defined networking (SDN) is the most preferable technique used for the design of dynamic optical networks, as it decouples the hardware and software parts of the network [20]. SDN provides the flexibility to introduce innovative and differentiated new services quickly, with previously unimagined constraints; it also affords a holistic view of the network. SDN centrally controls the entire network and enables network designers to obtain a global view of the entire network, thereby facilitating the programming of these networks from a remote console. This makes the network significantly more flexible and renders the structure of data plane devices simpler and easier to manufacture, which, in turn, leads to low-cost solutions. Therefore, in [21], an SDN-ROADM-based DWDM optical network was designed, in which an OpenFlow switch was used as the control part for ideal optical switches in the banyan architecture switch of ROADM. Results revealed that the received signal of the DWDM network indicated better performance in terms of the BER and Q-Factor, compared to those of other optical networks. In [22], the performance of different types of algorithms operating in the control plane of three varied architectures (physically distributed, logically distributed, and physically centralized) was compared. The designed system was analyzed in terms of its latency, and the corresponding results were supported by valid mathematical analyses. Numerous algorithms of Software Defined Optical Networks (SDONs) have also been developed. For example, in [23], a multidimensional resource allocation algorithm for a software-defined TWDM/OFDMA-based PON access network was developed, which successfully increased the network throughput and the user satisfaction rate by 30% during peak traffic hours, in comparison with that under fixed allocation. However, using optical networks in smart cities is a challenging task, owing to its energy consumption, operational expenditure, communication latency between different users, and reliability of service, among other factors. Despite these challenges, researchers have attempted to implement WDM-PON networks in smart cities. For instance, [24] proposed the design of a ring-based latency-aware and energy-efficient hybrid WDM TDM-PON for smart cities, in which Optical Distribution Networks (ODNs) featured the capability of interconnection. The proposed WDM TDM-PON efficiently reduced the transmission latency, operational expenditure, and energy consumption by establishing an interconnection with the ODN and avoiding the transmission through the Optical Line Terminal (OLT) in each iteration. Likewise, in [25], a smart hospital network architecture using a hybrid next-generation optical network for smart cities was designed, based on visible light communication. Using this, an information rate of 2.5 Gbps per channel was achieved for serving 53 users under hospital scenarios. This system serves as a novel solution for connecting medicine and patients through wired and wireless channels in hospitals.

However, these network architectures cannot be scaled for smart cities, as they fail to allocate/reroute network resources as per the requirements of the users in the smart cities. Static optical networks use the entire available bandwidth allocated to primary applications, which, in turn, leaves no scope for secondary applications. Furthermore, this bandwidth is under-utilized by many primary applications. Therefore, a communication framework using optical networks and algorithms for the efficient utilization of network resources and routing of traffic accordingly is required to manage smart city data and maintain good quality of service. This requirement can be fulfilled by using broader-view Optical Networks that include a combination of intelligence, software control, automation, and a programmable infrastructure through SDN, as SDN can programmatically (re)configure and dynamically optimize the use of network resources as per requirements.

In this regard, we propose a novel SDN-controlled dynamically reconfigurable TDM-DWDM-based optical network for smart cities. The proposed SDN controller can constantly perform self-configuration and self-optimization by assessing network traffic demands. It can also adapt to the current bandwidth requirements of smart cities and features better future compatibility. Moreover, we propose an optical network model for four primary applications (smart education, smart home, smart transport, and smart health) and four secondary applications (smart agriculture, smart water management, smart grids, and smart waste management) using practical data. The feasible data rates of smart city applications reported in literature were employed. To manage smart city traffic, we combined the designed network with an SDN controller. Furthermore, to enhance the SDN intelligence, we developed three novel bandwidth management algorithms that could efficiently utilize the network resources for centrally controlling and routing the traffic depending upon the conditions. These proposed algorithms utilize the available free bandwidth slots of the primary applications to transmit data of the secondary applications, thus making the network more energy efficient. The main contributions of this study can be summarized as follows:

- A robust optical network model is designed for the optimization of the combined benefits of TDM with DWDM, for smart cities consisting of four primary and four secondary applications.
- To dynamically reconfigure the proposed optical network through SDN, we designed three novel algorithms that efficiently utilize network resources and route the smart city traffic accordingly, rendering the entire network as an SDN-based optical network.
- The first designed algorithm is a wavelength redirection algorithm that transmits the data of secondary application over the primary application wavelength.
- The next designed algorithm is a novel dynamic load balancing (DLB) algorithm for SDN to detect the availability of the free primary application bandwidth.
- To further improve the bandwidth satisfaction rate, a bandwidth selection with resource allocation (BSRA) algorithm is designed for SDN that specifically divides the bandwidth requirement of the secondary applications and transmits it over the available primary slots.

The work done in this study is expected to serve as a reference for other aspiring smart cities. The rest of paper is organized as follows; Sect. 2 explains the designing of the proposed smart city network architecture. Section 3 describes in detail the proposed IAWR algorithm through ROADM. In Sect. 4, two joint bandwidth allocation algorithms are proposed and discussed in detail with their corresponding network architecture and results. Overall network performance through simulation results is shown in Sect. 5 and conclusion is given in Sect. 6.

## 2 Proposed smart city network architecture and design

We developed a novel SDN-controlled, dynamically reconfigurable TDM-DWDM-based optical network for smart cities, as illustrated in Fig. 1. The smart city system model consists of core infrastructure elements segregated as primary applications (i.e., smart home, smart hospital, smart education, and smart transport) and secondary applications (smart agriculture, smart waste, smart grids, and smart water). This proposed model exploits the under-utilized bandwidth of the primary applications in an opportunistic manner for the secondary applications, which is the core idea driving the development of this optical network. This smart city architecture converges wireless and optical communication for network design, where the optical network is the backbone structure in smart cities. Data from different applications are collected using sensors through the wireless channel and then transmitted through the optical channel.

Four sectors, A, B, C, and D, are considered for each smart city application, according to their geographical areas. Further, the data from N applications in a sector are collected through the wireless channel and stored at a cloud server, represented by the dotted line in Fig. 2.

The TDM technique multiplexes the data of each sector from the cloud server to utilize the bandwidth efficiently. Four DWDM wavelengths of 1550, 1550.8, 1551.6, and 1552.4 nm, with a 0.8-nm channel spacing, are used to transmit the data of primary applications, indicated with colored solid lines in Fig. 3. These four wavelengths are also shared by the secondary applications, based on the primary bandwidth availability. A continuous-wave (CW) laser featuring

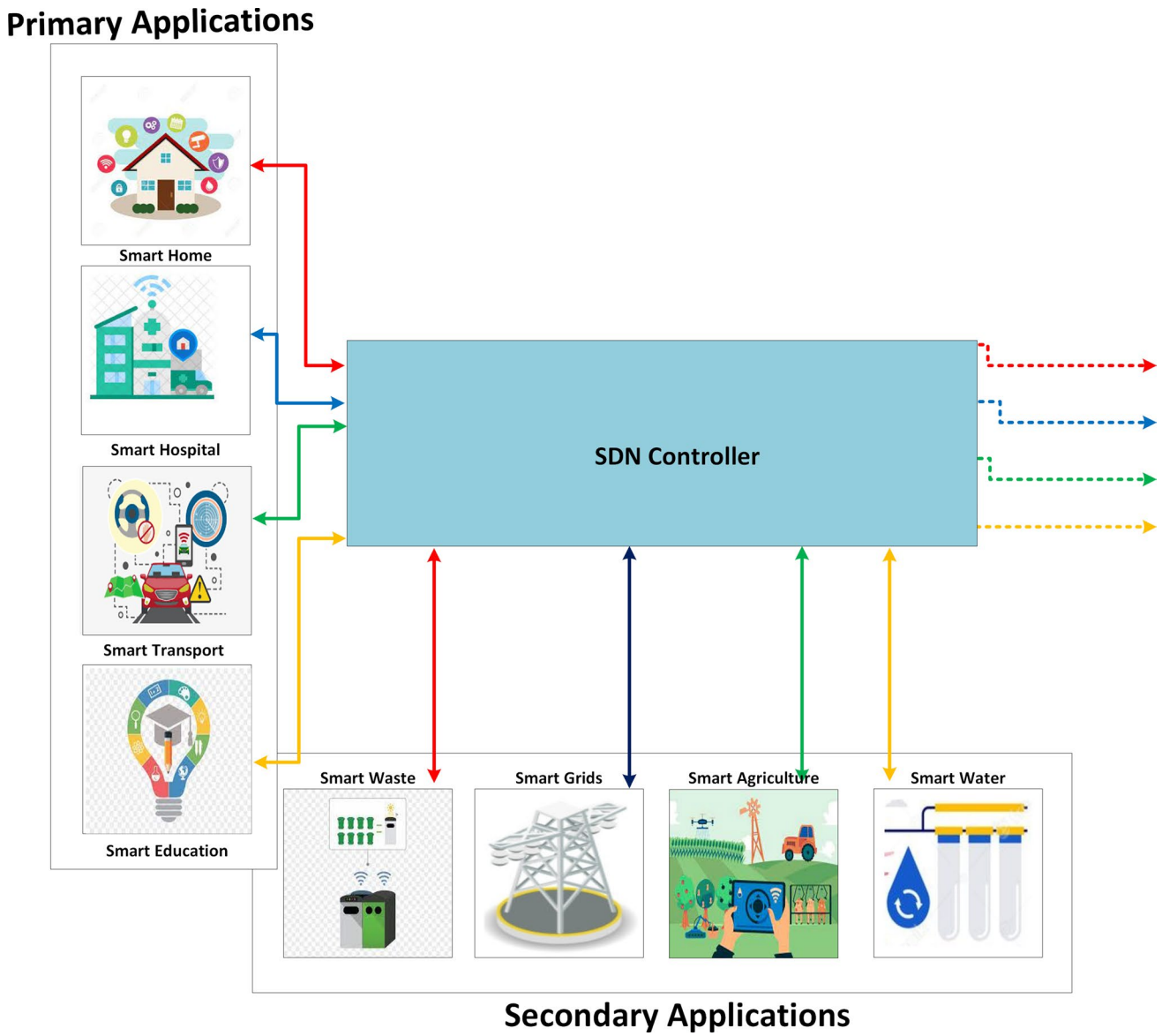


**Fig. 1** SDN-controlled TDM-DWDM-based smart city system model

an optical power of 10 dBm is used as the optical transmitter, with a 10 MHz linewidth. An amplitude modulator with a modulation index of 1 is used to multiplex the smart city data with the CW laser. The optical fiber of length of 10 Km is used with EDFA gain of 5 dB loss coefficient of 0.25 dB/Km. In this smart city model, we considered the practical data rates for each primary and secondary application, as obtained from different available resources [26–28], to realize a more realistic model. Next, weekly average traffic for all the primary and secondary applications is calculated. The whole system is than analyzed for each designed SDN-controlled algorithms.

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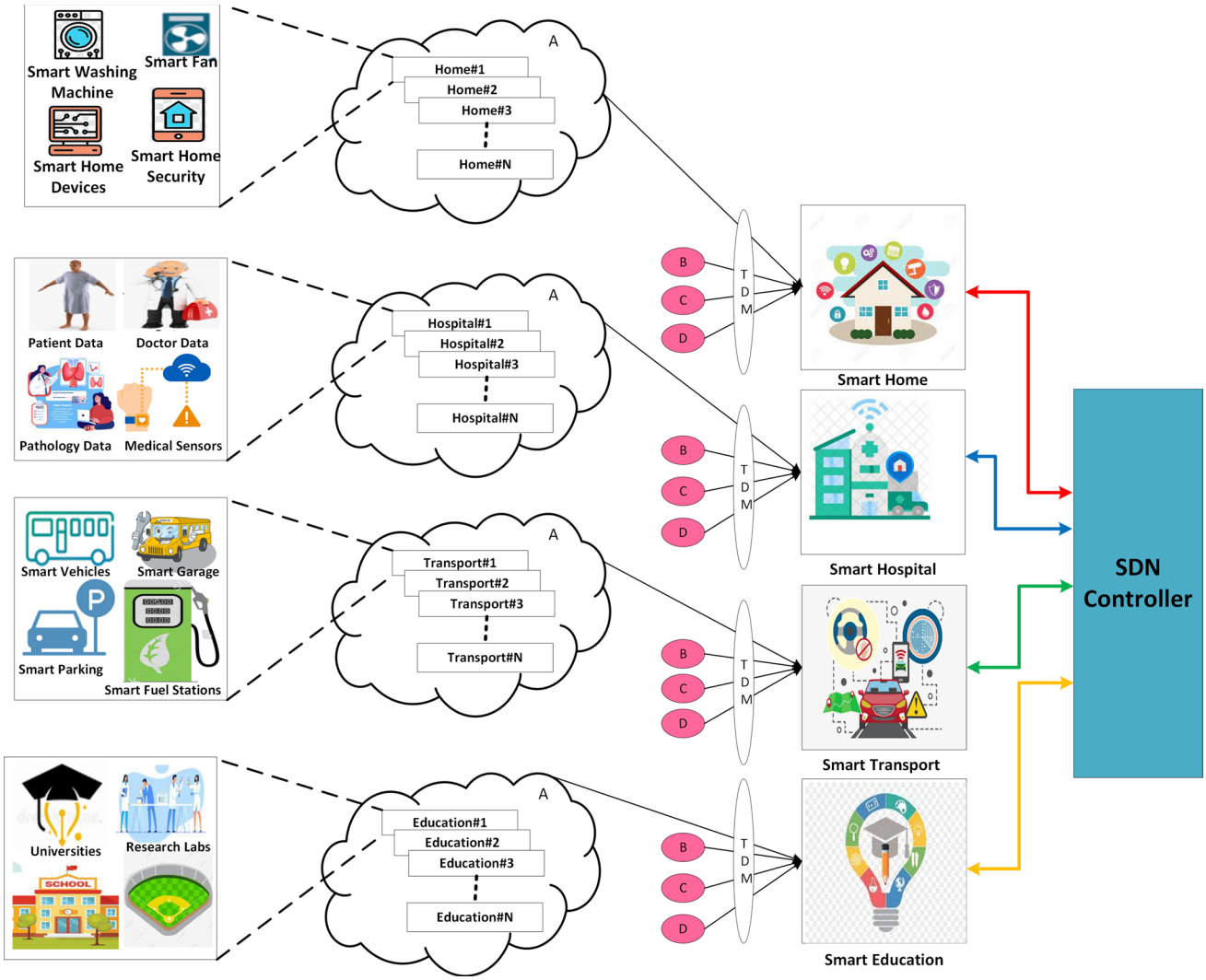


**Fig. 2** Smart city primary applications

is used with EDFA gain of 5dB loss coefficient of 0.25 dB/Km. In this smart city model, we considered the practical data rates for each primary and secondary application, as obtained from different available resources [26–28], to realize a more realistic model. Next, weekly average traffic for all the primary and secondary applications is calculated. The whole system is than analyzed for each designed SDN-controlled algorithms.

The graphs show the data rates/bandwidth requirements of each application at every time slot. Figures 4 and 5 show the average data rates of the primary and secondary applications for a 24-h period. The traffic graph of primary applications in Fig. 4 shows that the bandwidth is under-utilized and could be used to transmit the secondary application data. For this, we designed the architecture of the SDN controller to efficiently manage the network resources among all the smart city applications and to improve its energy efficiency.

To this end, three novel algorithms for the SDN controller architecture are developed. The algorithms are capable of sensing the under-utilized bandwidth of primary applications and allocating it to secondary applications according to their requirements. In addition, the designed SDN controller determines the algorithm that can transmit the maximum amount of data, without any interference from a secondary application on the primary application bandwidth, thereby affording the maximum bandwidth satisfaction rate. Through the average traffic graph shown in Fig. 4, we considered three scenarios for the primary applications: without load, with mild load, and with heavy load. Based on these three data traffic scenarios, we have designed three algorithms for the SDN controller, which could provide a viable solution for bandwidth requirement of secondary applications. As shown in Fig. 5, there might be time interval when primary application requires mild bandwidth like smart education and one of the secondary application like smart water has high bandwidth requirement.

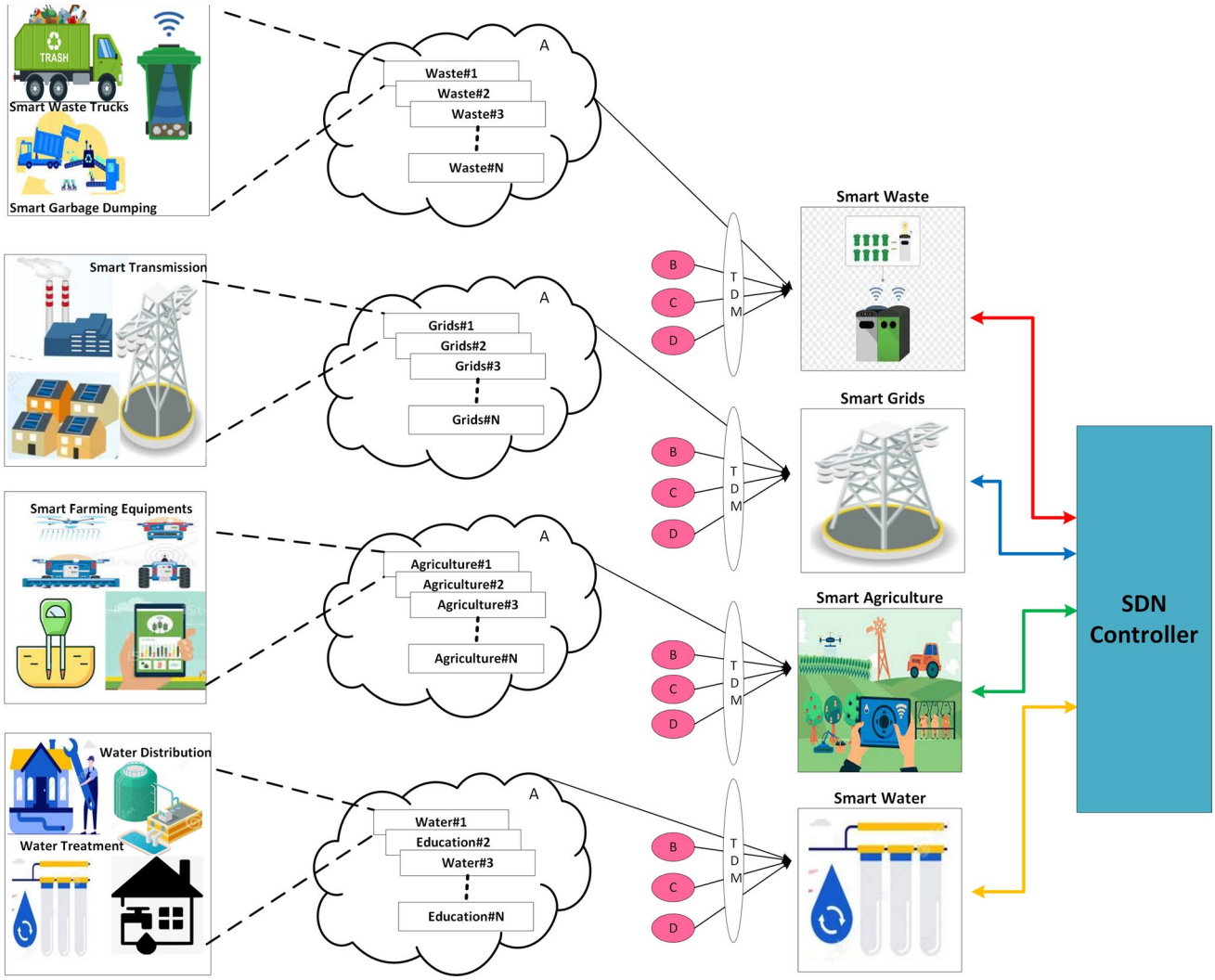


**Fig. 3** Smart city secondary applications

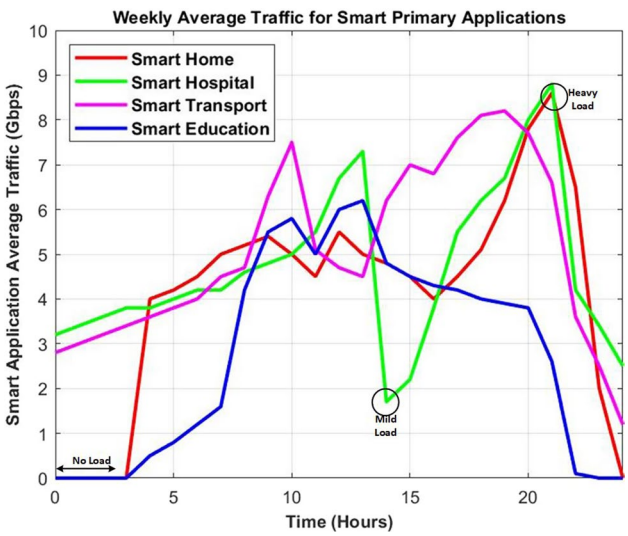


**Fig. 4** Average traffic of primary applications in smart cities

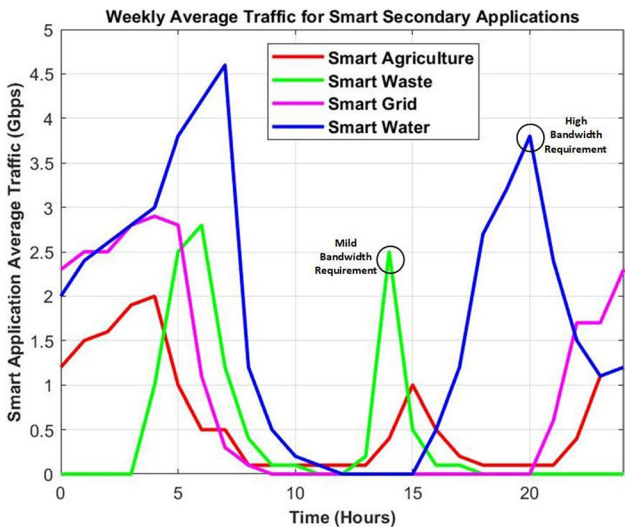


**Fig. 5** Average traffic of secondary applications in smart cities

The first inter-application wavelength redirection (IAWR) algorithm is activated under the no-load scenario for primary applications. The SDN controller transmits the secondary application data on the respective primary application wavelength through ROADM. The second dynamic load balancing (DLB) algorithm is designed for the scenario in which a primary application is continuously transmitting data but has under-utilized bandwidth, which can then be used to transmit the data of a secondary application, determined by the SDN, enabled by the designed algorithm. Similarly, the third algorithm is designed for the scenario in which there are no sufficient under-utilized bandwidth slots for the primary applications. The designed bandwidth selection with resource allocation (BSRA) algorithm splits the secondary application load accordingly and then transmits it on the marginally available primary application bandwidth slots. Thus, the proposed algorithm uses the available bandwidth, without causing any interference in the functioning of primary applications. It can detect the free bandwidth slots of primary applications and use them in an optimized manner. The flow chart presented in Fig. 6 depicts the hierarchical use of the algorithm by the SDN controller. As shown in Table 1, the primary applications are assigned with the asynchronous band of the data rate generated from their different respective components.

We used Optisystem 19.0 (Optiwave Systems Inc., Canada) to set up the optical network for the smart city. The SDN controller algorithms are designed in MATLAB. Next, the optical network and the controller algorithms are co-simulated to analyze the operation of the overall system.

## 3 Inter-application wavelength redirection algorithm network architecture

In this section, we present the design of the dynamically reconfigurable ROADM-based TDM-DWDM optical network, as shown in Fig. 7. ROADM is a practical approach to remotely control wavelengths that can be added/dropped or passed through a node [29, 30]. In this architecture, the main advantage of using ROADM is the dynamic allocation of the available network bandwidth to individual users, without affecting the traffic and equalization of the power levels of different wavelength channels processed through every ROADM. The designed optical network provides capability and flexibility on the provisioning of wavelengths, regardless of the changes in the network. When there is no load at a primary application, the correspondingly assigned wavelength is optically switched to a secondary application, as demonstrated in Fig. 7. In this optical network architecture, the optical switch is centrally controlled by the SDN controller through the IAWR algorithm, rendering it a reconfigurable optical access network for smart cities.

The proposed SDN-controlled ROADM-based TDM-DWDM optical access network for smart cities is dynamic and flexible, as it supports complementary real-time traffic adjustments between the primary and secondary applications. The bandwidth request varies for each smart city application: Some may involve no load, whereas other secondary applications may have bandwidth requirements at that time. Based on this situation, we propose a novel IAWR algorithm to redirect wavelengths from a no-load primary application to a secondary application, thereby increasing the bandwidth satisfaction rate of the designed smart city optical network. The secondary applications then use this wavelength only during the time where there is no load from the concerned primary application. For example, smart education has no traffic load from 10 P.M. to 3 A.M.; therefore, this time slot can be used by any other secondary application for the transmission of its data. Table 2 shows two time interval when the primary applications smart home and smart education have no loads. At this time, SDN will automatically drop these primary applications and add secondary applications such as smart agriculture and smart water on the corresponding wavelengths through ROADM.

This approach improves the transmission quality of the network and the bandwidth satisfaction rate of the end user. The algorithm used in the SDN controller is summarized below:

**Algorithm 1** Inter-Application Wavelength Redirection Algorithm

**Require:** Initialize the mapping of input port with the output port
Check the current time of primary applications,
Check the current time with listed available time interval for secondary applications;
**if** current time matches with the available time interval for secondary applications **then**
switch off the primary application and switch on the secondary application
**else**
switch on/continue the primary applications and keep secondary application switched off.
**end if**

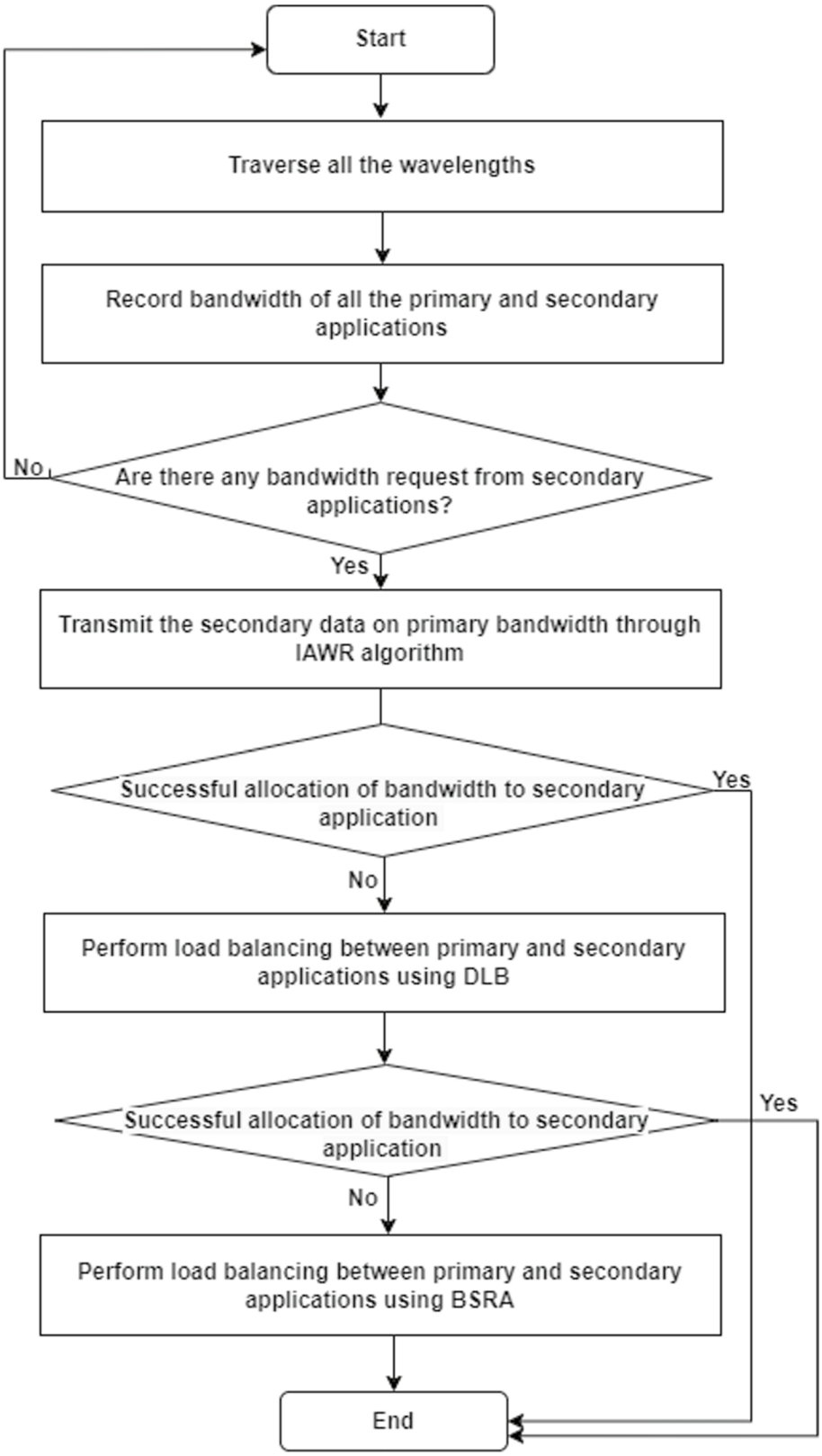


**Fig. 6** Hierarchical presentation of algorithm usage by the SDN controller

**Table 1** Data rate of smart city applications

| Application | Tentative data rate | Application type |
|---|---|---|
| Smart home | 5–10 Gbps | Primary |
| Smart hospital | 8–10 Gbps | Primary |
| Smart transport | 8–10 Gbps | Primary |
| Smart education | 6–8 Gbps | Primary |
| Smart agriculture | 2 Gbps | Secondary |
| Smart waste | 3 Gbps | Secondary |
| Smart grids | 3 Gbps | Secondary |
| Smart water | 5 Gbps | Secondary |

The algorithm switches between primary and secondary applications, which implies that either the primary application or secondary application data will be transmitted on the corresponding wavelength, depending on the availability of time interval.

### 3.1 Results and discussion

A well-organized communication network is a mainstay of any successful network. These networks transport various ultrahigh-quality data pertaining to smart city applications.

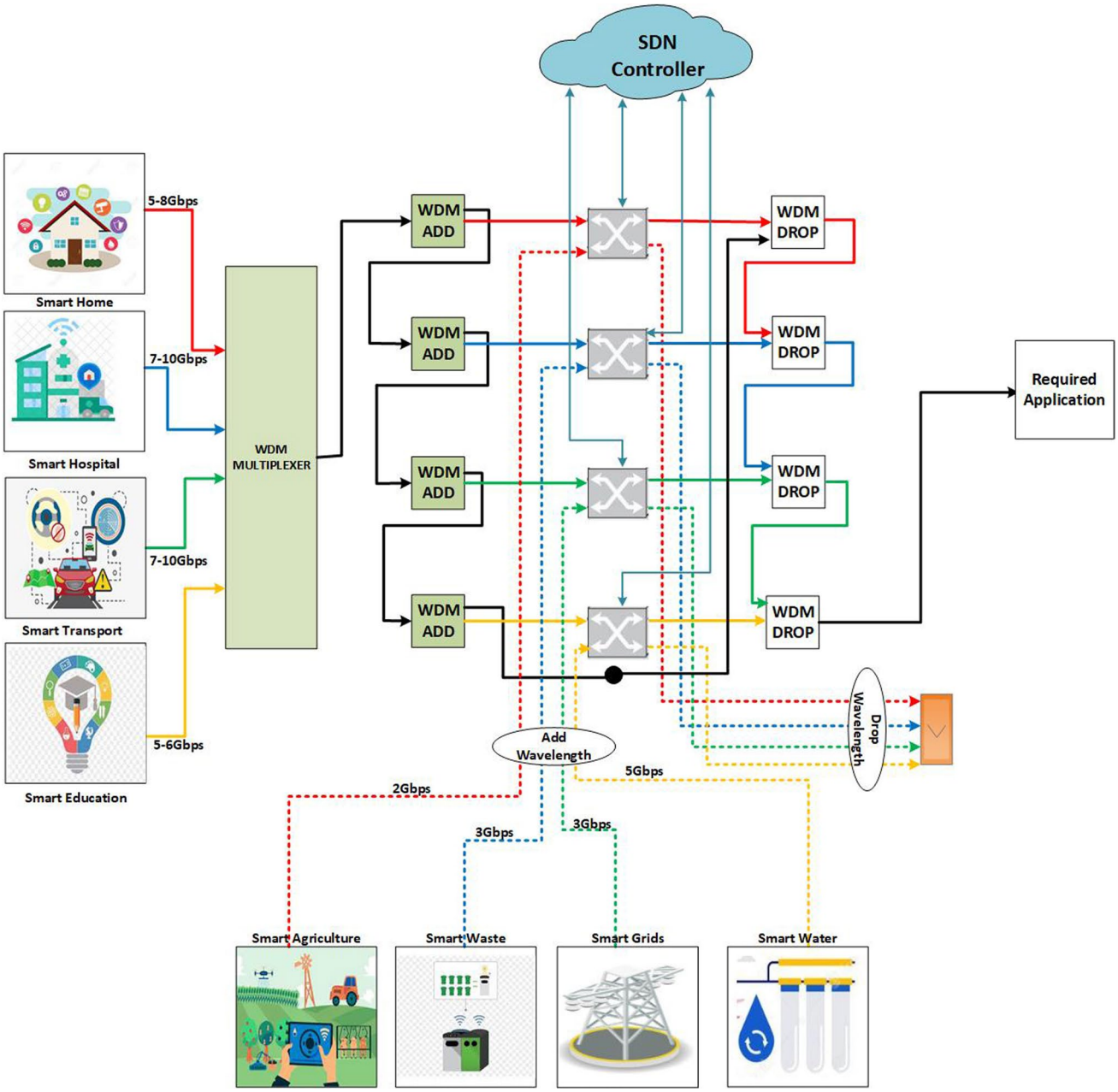


**Fig. 7** SDN-controlled ROADM-based TDM-DWDM smart city network

**Table 2** Wavelength redirection time for secondary applications

| Primary application | Availability of time intervals | Redirected secondary application |
|---|---|---|
| Smart home | 12–3 A.M | Smart agriculture |
| Smart education | 11 P.M.–4 A.M | Smart water |

Therefore, the designed networks should be able to provide deterministic, quantifiable, and, at times, guaranteed services.

In Figure 8, at 12 noon, the ROADM output status is depicted, showcasing data transmission from all four primary applications (A, C, E, G) and their corresponding receptions as (B, D, F, H). The accompanying eye diagrams (1, 2, 3, 4) provide visual evidence of the successful transmissions. In Fig. 8, the successful transmission and reception of data from the smart home primary application (A and B) at a speed of 5 Gbps, and smart education applications (G, H) at 6 Gbps, are exemplified.

The average traffic graph (Fig. 4) underscores that the smart home and smart education applications exhibit minimal data generation around 1 A.M. Consequently, this time slot presents an opportune window for another associated secondary application to effectively transmit its data. In Fig. 9, the ROADM output at 1 A.M. is illustrated, showcasing the reallocation of resources. Specifically, the smart home wavelength is dropped, and smart agriculture begins transmitting data at a rate of 2 Gbps, denoted as A, B. Simultaneously, smart water, with a data rate of 3 Gbps, is introduced by dropping the smart education wavelength. The corresponding eye diagrams are presented to validate the successful transmission of these secondary applications.

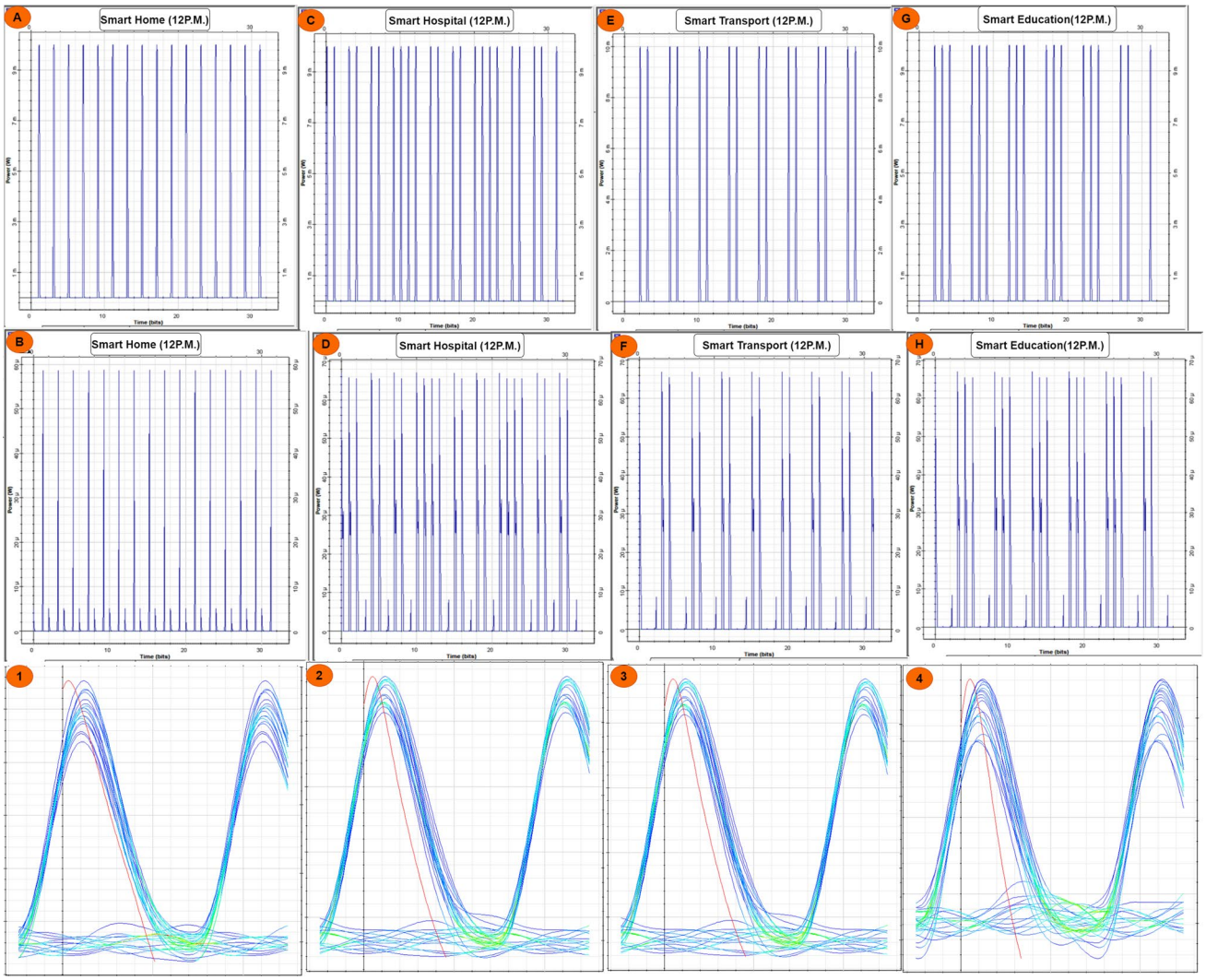


**Fig. 8** Data transmitted and received by smart home and smart agriculture in their respective time interval

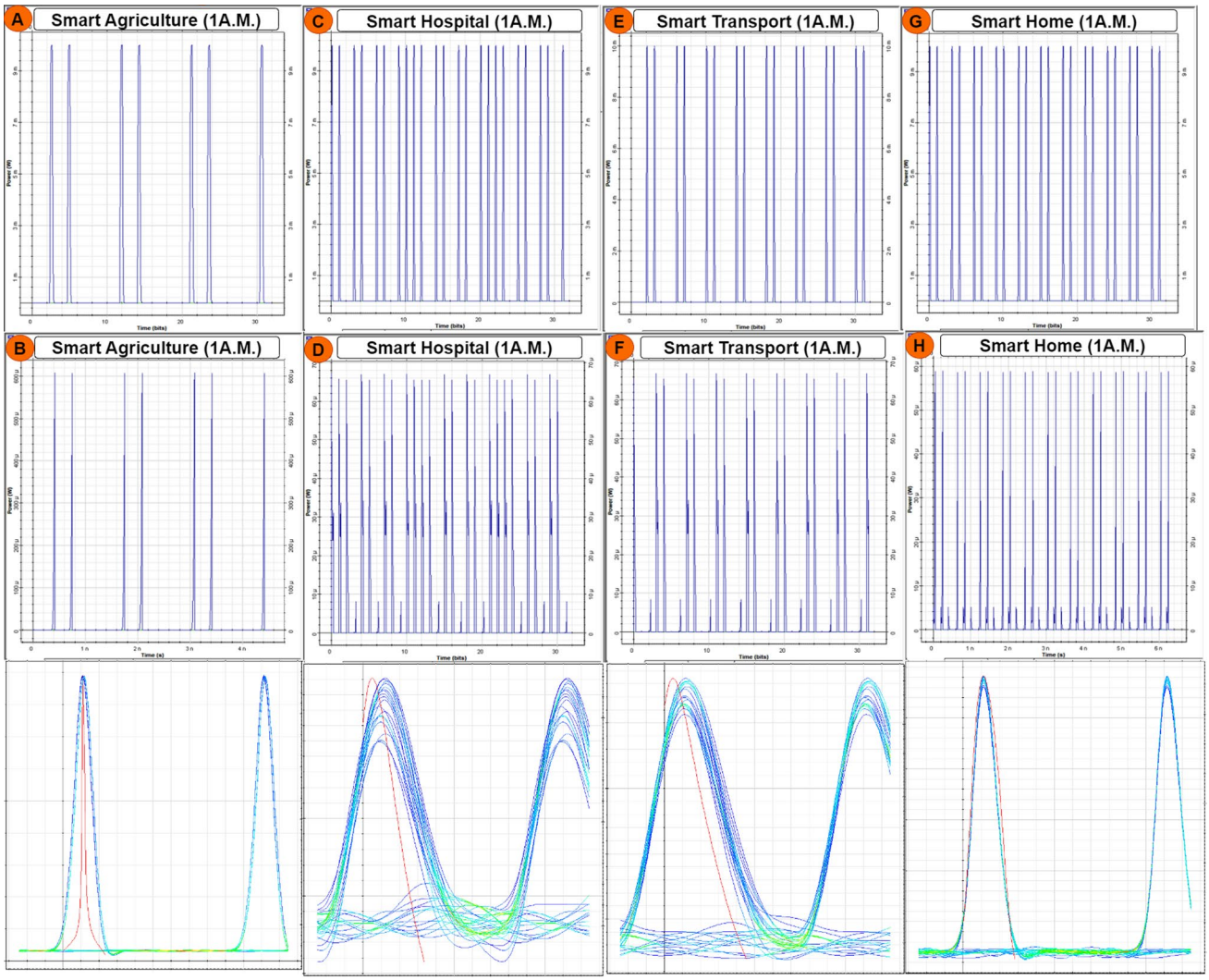


**Fig. 9** Data transmitted and received by smart hospital and smart waste in their respective time interval

## 4 Joint bandwidth allocation algorithm

As described in the previous section, the SDN-controlled ROADM can transmit the load of either primary or secondary applications at a time. However, it is necessary to address the case involving simultaneously bandwidth requests from both applications. Table 2 shows that the number of slots is limited for any primary wavelength with no load. Here, we propose a novel joint bandwidth allocation algorithm for the SDN-controlled TDM-DWDM optical network for smart cities to manage simultaneous bandwidth demands from primary and secondary applications. These algorithms ensure efficient utilization of available bandwidth by redistributing resources between primary and secondary applications based on their respective loads. This optimization prevents underutilization during mild loads and maximizes bandwidth satisfaction for secondary applications during peak periods. This ensures that each secondary application receives an optimal share of bandwidth for the maximum available duration, contributing to a more reliable and responsive network. The conceptual diagram shown in Fig. 10 illustrates that both the primary and secondary applications can transmit their data on the same wavelength, depending upon their respective bandwidth requirements. The MATLAB switch, acting as the SDN controller, centrally controls all the smart city applications through the designed algorithms. The SDN controller can continuously sense the occupancy on a particular wavelength and the bandwidth requirement of secondary applications. Essentially, the SDN controller is the authority deciding the transmission wavelength for a secondary application that has the required slot along with the primary application. Here, we propose a novel joint bandwidth allocation algorithm for the SDN-controlled

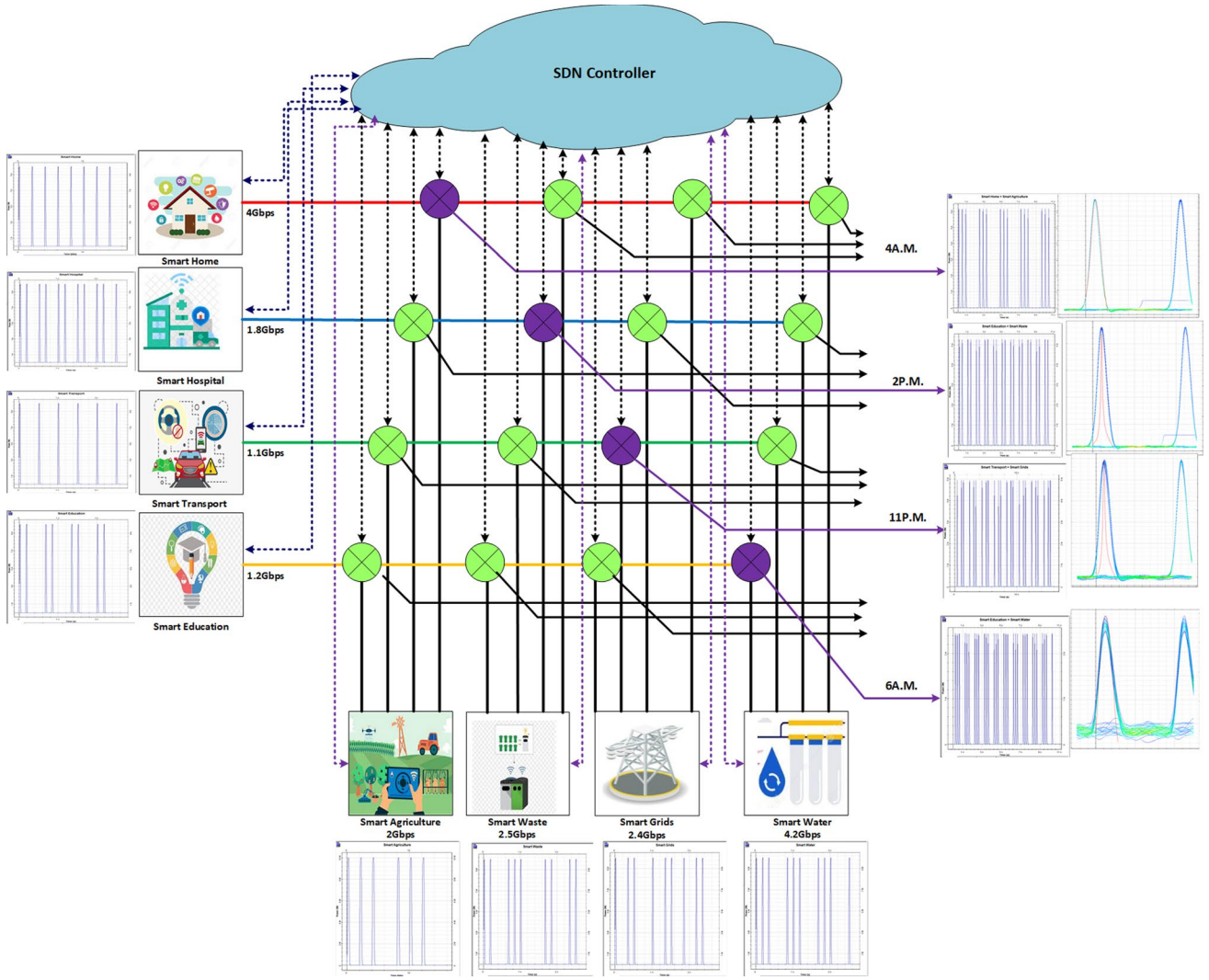


**Fig. 10** Joint transmission and reception of primary and secondary application data

TDM-DWDM optical network for smart cities to manage simultaneous bandwidth demands from primary and secondary applications.

To describe the proposed algorithm, we define the following set of parameters below.

$I$: Set of smart city primary applications (PA)

$BW_I$: Total bandwidth requirement of set I

$J$: Set of smart city secondary applications (SA)

$U(j)$: Set of unallocated secondary applications

$Bw$: Set of bands of required bandwidths

$BW_{PAi}$: Is the bandwidth request of any $i$th primary application from set I

$BW_{SAj}$: Is the bandwidth request of any $j$th secondary applications from set J

$BW_{Bw}$: Is the total request bandwidth of band Bw

$BW_{Max}$: Maximum bandwidth of the whole

With the mapping among the number of available wavelengths, primary applications, secondary applications, and their required bandwidths, the goal is to maximize the use of the wavelength by utilizing the bandwidth resources fairly between the primary and secondary users of the smart city. The procedure of the proposed algorithm is fully described

in Fig. 10. To better understand the proposed joint bandwidth allocation scheme, we propose two algorithms: the DLB and BSRA algorithms. The algorithms used herein are described in detail in the following subsections.

### 4.1 Dynamic load balancing

**Algorithm 2** Dynamic Load Balancing

Require: Traverse all the wavelengths of the given set I and calculate
if $BW_I$==empty then
transmit corresponding secondary application data on primary wavelength through ROADM
else
go to next step, perform the DLB
end if
Traverse all the $BW_I$ in given I,
Sort the PA in decreasing order of their loads,
Figure out the heavily loaded $PA_{max}$ and lightly load $PA_{min}$ among given I,
Traverse all the Bw in the given set J,
Sort all the SA in J in decreasing order of their load $SA_{max}$ and $SA_{min}$ are the heavily and lightly loaded SAs among set J,
for: i=1 to I
for: j=1 to J
if $BW_{PAi}$ + $BW_{SAi}$ <= $BW_{Max}$ then
Transmit the $PA_{max}$ with $SA_{min}$ and $PA_{min}$ with $SA_{max}$
else
j+1; then
i+1;
end if
go to next step and continue till entire U(j)==empty,
Sort all the SA in U(j) PA in I in decreasing order of their load
for: i=1 to I
for: j=1 to J and $BW_{PA_i}$ > $BW_{SA_j}$,
Calculate the dynamic load with $D_{load}$,
$D_{load}$ = $BW_{PA_i}$-$BW_{SA_j}$,
if $D_{load}$ >= $BW_{SA_j}$ then
transmit the load of corresponding $SAj$ with $PAi$
else
j+1
end
i+1;
end
end if

During mild loads, the bandwidth requirement of a primary application on the associated wavelength is considerably low, whereas secondary applications may have bandwidth requirements at the same time. Therefore, we propose a novel dynamic load balance-based resource allocation algorithm to balance the bandwidth between the primary and secondary applications. This balancing improves the bandwidth satisfaction rate of secondary applications by utilizing the given bandwidth for the maximum available duration, through redistributing a heavily loaded secondary application to the wavelength of a lightly loaded primary application. It is worth noting that the transmission parameters (modulation format and symbol rate) remain the same, regarding of whether the secondary application is reassigned to any wavelength. Thus, the transmission delay of secondary applications is reduced. This algorithm can be summarized as Algorithm 2.

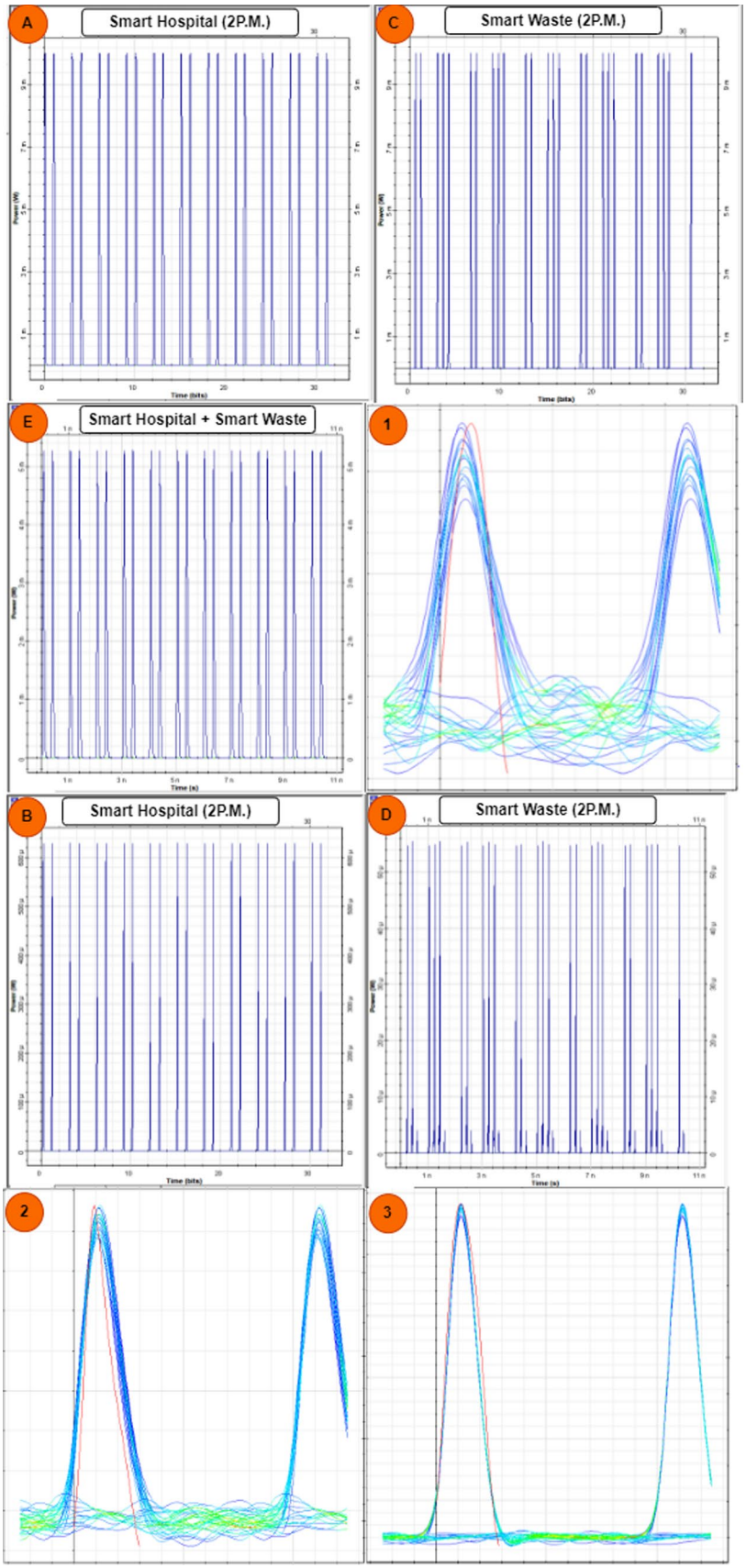


**Fig. 11** Joint transmission and reception of primary and secondary application data

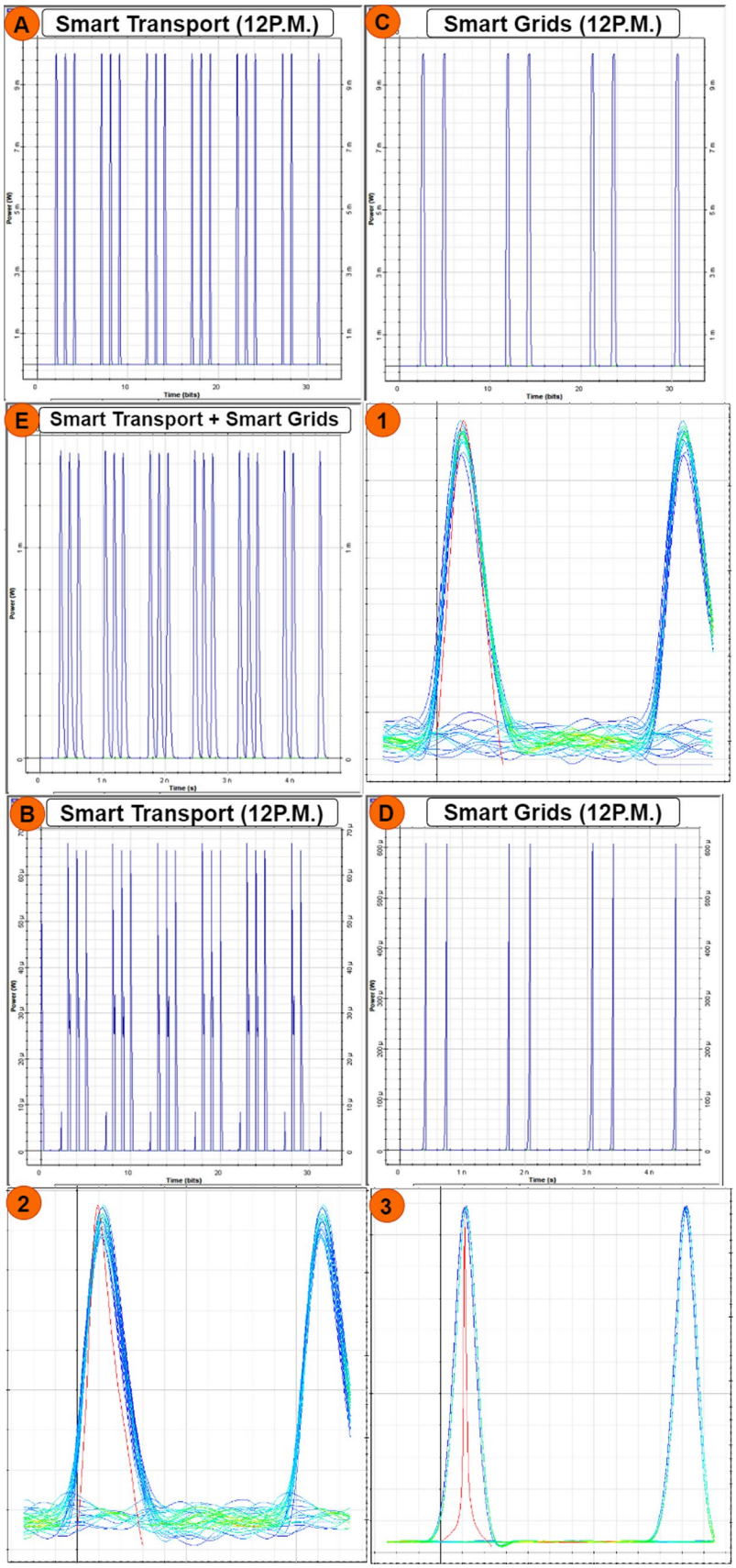


**Fig. 12** Joint transmission and reception of primary and secondary application data

#### 4.1.1 Results and discussion

The DLB algorithm provides flexibility in simultaneously transmitting both primary and secondary application data. When the bandwidth requirement of any primary application is low, the DLB-based SDN controller transmits any secondary application data, along with the primary data, on the associated wavelength. The DLB algorithm-based SDN controller provides the best mapping for the simultaneous transmission of the primary and secondary application data on a single wavelength. Here, the results are shown for two scenarios.

Figure 10 illustrates the input data rates for both primary and secondary applications, along with their outputs during a specific time slot. Specifically, the first switch, highlighted in dark blue, represents the output at 4 A.M. At this time, smart agriculture transmits data at a rate of 2 Gbps, concurrently with smart home, which operates at 4 Gbps, below its maximum requirement of 10 Gbps.

Similarly, at 2 P.M., the second switch displays the output, where smart waste transmits data at a rate of 2.5 Gbps, accompanied by smart hospital operating at 1.8 Gbps, below its maximum requirement of 10 Gbps. Additionally, at 11 P.M. and 6 A.M., the third switch showcases smart grids and smart water-transmitting data at rates of 2.4 and 4.2 Gbps, respectively, along with smart transport and smart education. This strategic resource allocation optimizes the utilization of network resources during these specific time slots.

In Fig. 11, it is observed that at 2 P.M., the bandwidth requirement of smart hospital is around 4 Gbps, notably lower than its maximum capacity of 10 Gbps. In contrast, smart waste necessitates a bandwidth of 2.8 Gbps during this period. The outcome signifies the successful transmission and reception of data from both smart waste (C, D) and smart hospital (A, B), as evidenced by the accompanying eye diagram featuring a quality factor of approximately 14.32.

Likewise, the findings depicted in Fig. 12 reveal the concurrent transmission of smart education and smart water data at 6 A.M. During this time, smart education requires approximately 1 Gbps of bandwidth, while smart water demands 4.2 Gbps. The corresponding eye diagrams are presented, and they exhibit a quality factor of 17.03, affirming the successful transmission of data from both applications.

### 4.2 Bandwidth selection with resource allocation (BSRA)

In the above-stated algorithm, a secondary application searches for available bandwidth to transfer its load. However, it is possible that no direct bandwidth is available on any primary application wavelength to transfer the entire load of the secondary application that may happen during heavy load hours. Therefore, we propose a BSRA algorithm where the entire load of a secondary application is split into slots to transmit the load across the available primary application bandwidth slots for the corresponding wavelength. The ability of BSRA to split the load into slots provides increased flexibility in managing the bandwidth requirements of secondary applications. This adaptability allows for dynamic adjustments in response to varying loads, ensuring optimal bandwidth distribution and accommodating fluctuations in demand. During heavy load hours, the BSRA algorithm helps mitigate congestion by efficiently utilizing available primary application bandwidth slots, resulting in a more reliable and responsive network. The detailed algorithm is stated as Algorithm 3.

**Algorithm 3** Bandwidth Selection with Resource Allocation

Require: Traverse the entire available wavelength, switch on all the applications for
Ensure: $BW_{SAj}$ + $BW_{PAi}$ = $BW_{max}$
All the users request bandwidth are normally distributed, calculate the loads of primary and secondary applications, $BW_{SAi}$ and $BW_{PAj}$,
Calculate $BW_R$= $BW_{max}$ - $BW_{PAi}$
if $BW_{SAj}$ <= $BW_R$ then
use the corresponding attributed primary application band for secondary application
else
go to next step
end if
if $BW_{SAj}$ >$BW_R$ then
divide the $BW_{SAj}$ into sub-bands Bw = $BW_{SSAj}$/2 and calculate the new $BW_{bw}$
else
go to next step
end if
Search for other primary applications bandwidths for secondary application sub-band to get transmitted
Continue with primary application data During each round keep on calculating the N (Number of sub-bands) and Bw till all the secondary data is transmitted.

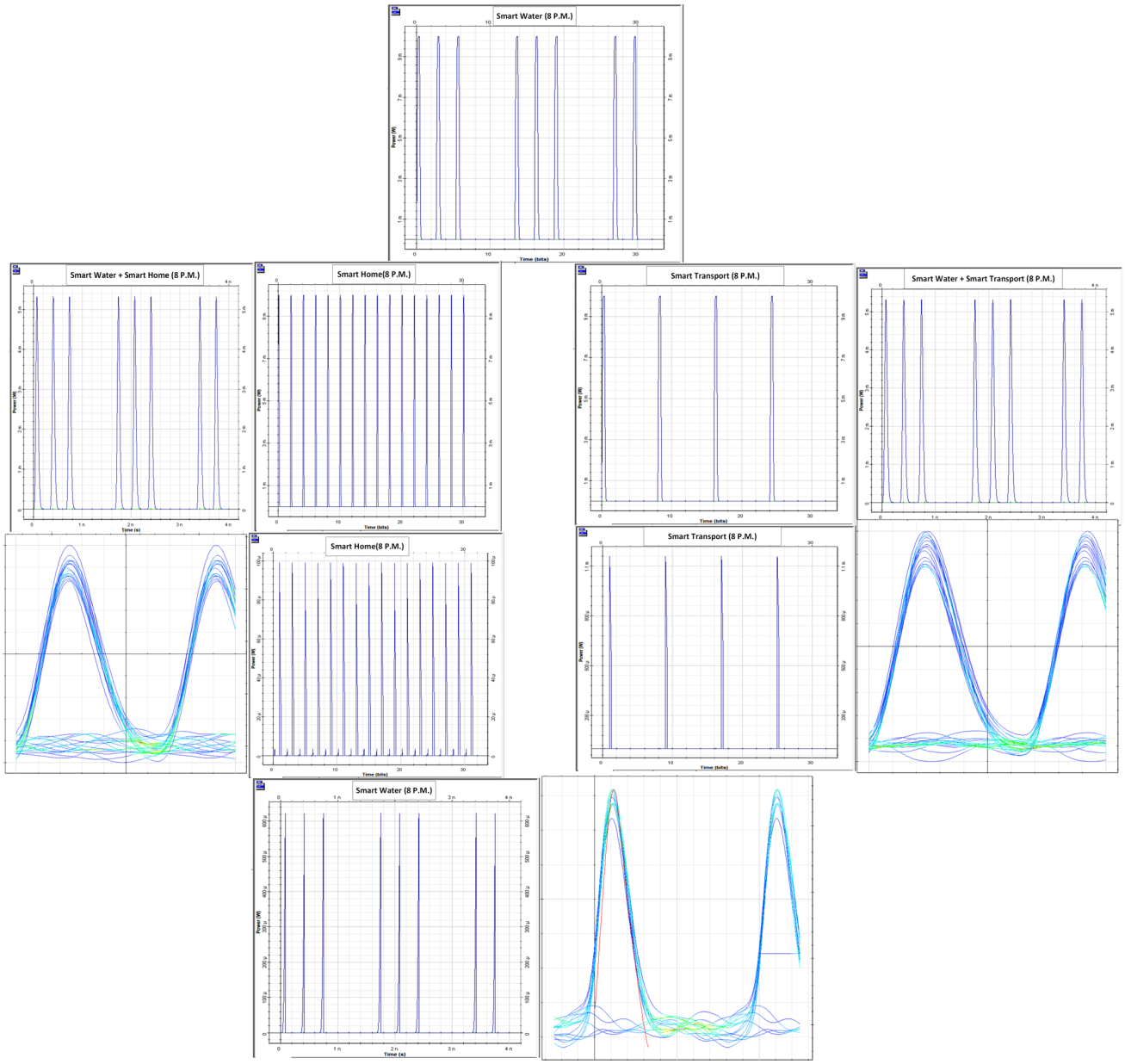


**Fig. 13** Joint transmission and reception of primary and secondary application data

### 4.2.1 Results and discussion

The BSRA algorithm can be used to transmit the secondary application data at any point of time, along with a primary application. Based on the available bandwidth slots at primary applications, the BSRA-based SDN controller transmits the secondary application loads. As an example, the SDN controller sent smart water data with the data of two primary applications: smart home and smart transport. The load generated by smart water is approximately 4 Gbps at 8 P.M. Figure 4 shows that there is no 4 Gbps slot available among the primary applications. Therefore, this 4 Gbps is then divided into two slots of 2 Gbps each: One 2 Gbps load of smart water is transmitted with smart home, whereas the other 2 Gbps load is transmitted with the smart transport primary application. The same scenario is demonstrated through the timing diagram, validated by the corresponding eye diagrams in Fig. 13. Here, eye diagrams are used to show the transmission quality of digital signals transmitted through designed TDWDM-based optical network using BSRA algorithm.

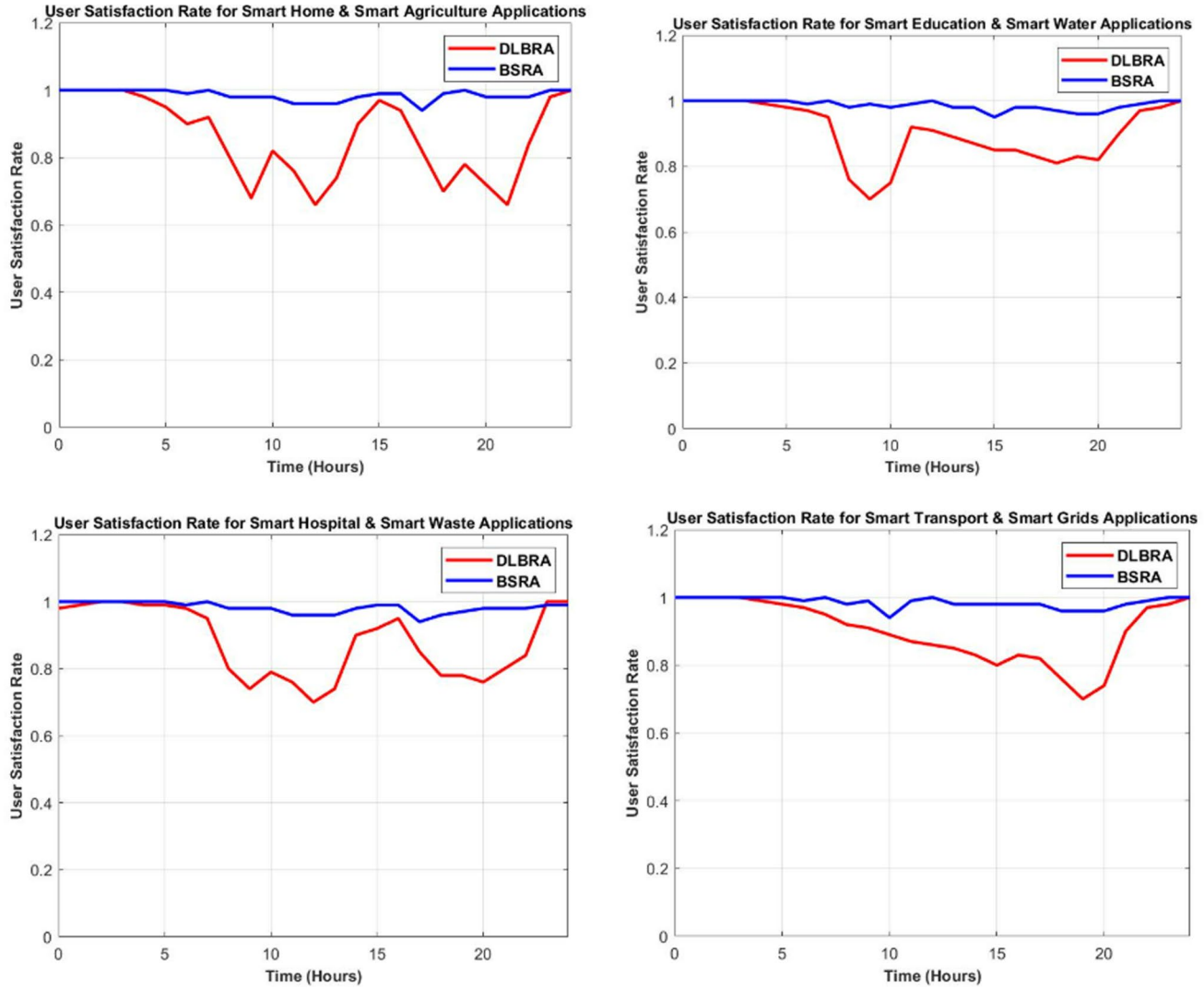


**Fig. 14** Bandwidth satisfaction rate

## 5 Overall network performance

The smart city optical network system consists of an SDN controller and the TDM-DWDM PON system, as shown in Fig. 1. This includes 4 primary and secondary applications, 4 wavelengths, 4 areas covered under each smart city application, and N = 20 devices in each case. The weekly recorded bandwidth requirement range for each application is presented in Figs. 4 and 5. According to the varying bandwidths requested by the smart city applications in each time slot, the wavelength assignment and the data rate are varied; however, the maximum data rate remains fixed at 10 Gbps.

In this study, the bandwidth satisfaction rate is defined as the ratio of the bandwidth provided by the primary application system to the secondary application traffic requests, as shown in the following formula:

$$Bs = \mathrm{BW}_{\mathrm{alloc}}/\mathrm{BW}_{\mathrm{req}}, \tag{1}$$

where $Bs$ indicates the bandwidth satisfaction rate, $\mathrm{BW}_{\mathrm{alloc}}$ is the bandwidth allocated to the secondary application, and $\mathrm{BW}_{\mathrm{req}}$ is the bandwidth requested by the secondary application. A performance comparison of the bandwidth satisfaction rates between the proposed DLB and BSRA algorithms is performed.

The result in Fig. 14 shows that the proposed BSRA algorithm outperforms the DLB algorithm in terms of the bandwidth satisfaction rate. During peak traffic periods, an increase of up to 30% in the bandwidth satisfaction rate is noted. Moreover, the bandwidth requests of secondary applications are almost entirely satisfied. This is because the BSRA algorithm redirects the wavelength of light-load primary applications to heavy-load secondary applications, effectively reducing the network congestion. Therefore, the

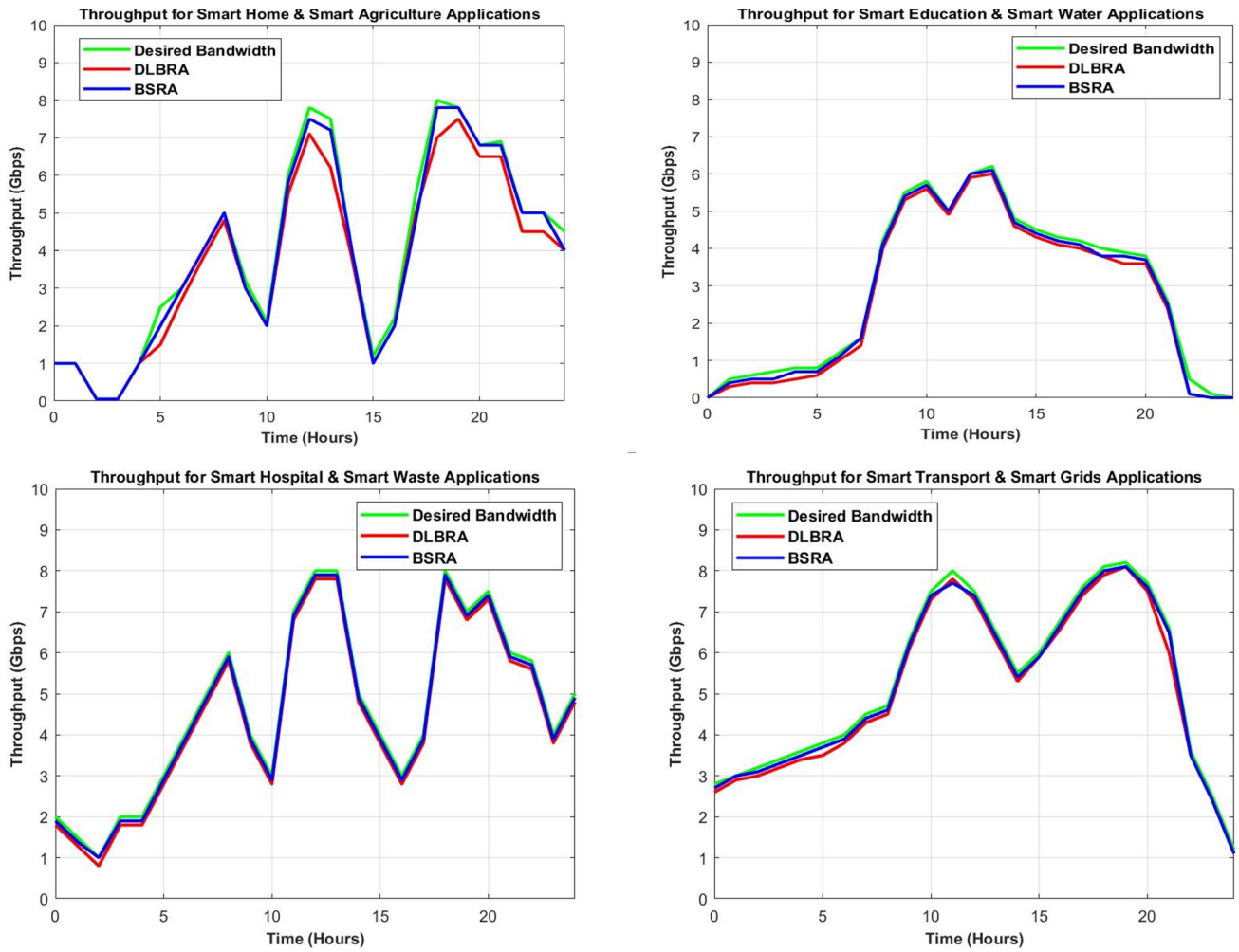


**Fig. 15** Throughput of DLB and BSRA algorithms

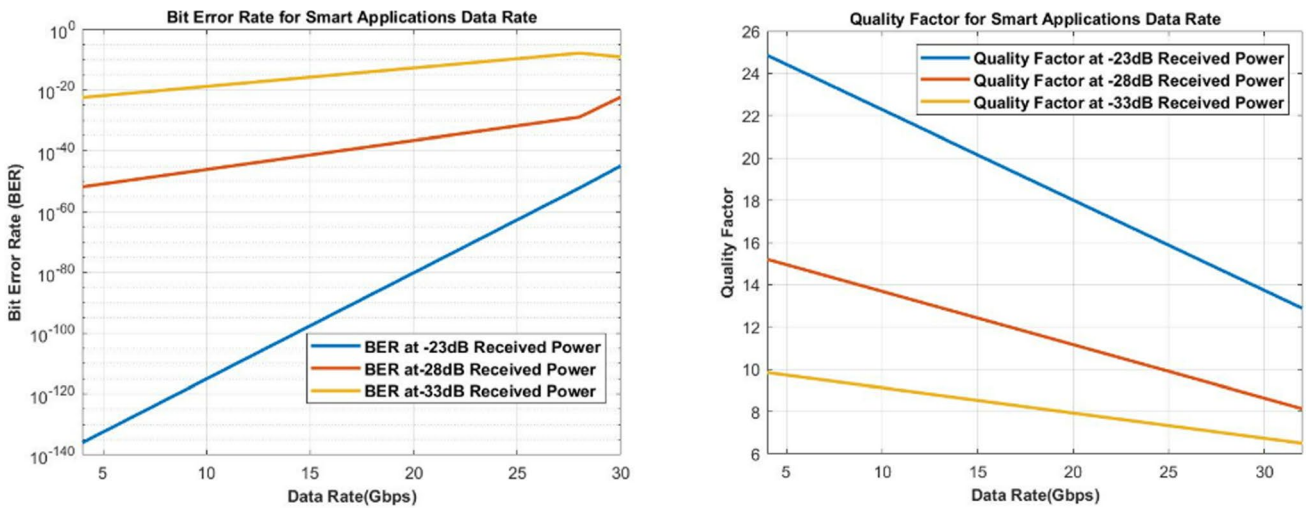


**Fig. 16** Final BER and quality factor for data rates of smart city applications

BSRA algorithm can considerably improve the bandwidth satisfaction rate by balancing the requirement and assignment of bandwidths for secondary application on the primary application wavelengths.

Figure 15 presents the throughput results for various scenarios using both algorithms. The findings demonstrate the system's effectiveness in successfully transmitting data over a specified time period. Throughput, in this context, serves as a metric for the system's ability to handle and transfer data efficiently. A higher optical system throughput signifies an increased capacity for data transmission, a critical aspect in applications like telecommunications, data centers, and high-speed internet connections where efficient transmission of large volumes of information is essential.

The BER essentially specifies the ratio of error bits received among the total bits sent. It is used to measure the quality of transmission, which is expressed as a negative power of 10. According to the forward error correction (FEC) limit, a BER exceeding $10^{-9}$ is unacceptable. Here, the BER observations indicate that the designed SDN-controlled TDM-DWDM-based optical network system performs satisfactorily at higher data rates. The results show that, even with the lowest received power, the system performance exceeds the acceptable range, as the BER remains below the aforementioned threshold (i.e., <= ($10^{-9}$)

The results shown in Fig. 16 illustrate the performance of the proposed system in the form of the Q-Factor. The maximum accomplishable data rate with an acceptable Q-Factor (Q>= 6.0) is 32 Gbps, at the minimum received power of − 33 dB. Meanwhile, the system exhibits remarkable results at a received power of − 22 dB, as the Q-Factor is 14.2 for a data rate of 32 Gbps.

## 6 Conclusion

This study presented an SDN-controlled dynamically reconfigurable TDM-DWDM-based optical network for smart cities, which enabled the utilization and allocation of the under-utilized bandwidths of primary applications to secondary applications. The architecture of the SDN controller is designed such that it precisely manages the network resources among all the smart city applications, thus affording a more energy-efficient network. Furthermore, we developed three novel algorithms (IAWR, DLB, and BSRA) for the SDN controller architecture. These algorithms can sense the under-utilized bandwidths of primary applications and allocate them to secondary applications based on their requirements. Notably, the proposed algorithm exploits the under-utilized bandwidths of primary applications, without any interference in their functioning. The proposed algorithms can detect available bandwidth slots of the primary applications and utilize them in an optimal manner, thereby improving the user satisfaction rate and ensuring a good user experience. Moreover, the SDN provides a global view of the overall network and centrally controls all the smart city applications by allocating network resources accordingly. The results indicate that the user satisfaction is increased, even during peak hours, under the proposed scenarios.

Furthermore, the SDN provides a global view of the entire network and centrally controls all smart city applications by allocating network resources accordingly. The results demonstrate increased user satisfaction, even during peak hours, under the proposed scenarios. Moreover, the system performs remarkably well in terms of Bit Error Rate (BER) and quality factor. The findings suggest that high-speed optical networks like these can be readily implemented in smart cities, providing opportunities to deploy smart city applications while efficiently addressing citizens' communication needs.

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**Data Availability** Not applicable

## Declarations

**Conflict of interest** Not applicable.

**Ethical approval** Not applicable.

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# Determining the Void Ratio in Hot-Mix Asphalt Pavements Using Different Methods According to EN 12697.

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## ABSTRACT

Inaccurate air void ratio based on erroneous bulk density can seriously affect the performance of the roadway and its quality. Therefore, several methods were improved to measure bulk density by using different techniques in the developed countries, while the Saturated Surface Dry (SSD) traditional method has been used in Gaza strip till present days. This study aims at providing a better understanding of the effect of the selected bulk density measurement method on the percentage of voids using four methods namely; Dimensional Method, Dry Method, Surface-Saturated Dry Method, and Paraffin Sealing Method. At Laboratory, sixty-nine specimens were prepared, thirty-three of them were prepared in the Marshal Design System in order to determine the optimum bitumen content of the three different mix types, and thirty-six of the specimens were taken from mixtures design in order to determine bulk density. Laboratory results showed that the SSD method is the best choice for measuring bulk density in dense and mastic mixtures. In addition, there are no differences between SSD and dry methods in mastic mix. The experimental study shows that the dimensional method is the only method suitable for the determination of bulk density (Gmb) in porous mix despite it always gives underestimated results for Gmb in all asphalt mixes. As a result, the dimensional method can be used as an indicator for the upper limit of voids, while the dry method can be used as an indicator to the lowest limit, regardless the type of mix. The study recommended to use new techniques to determine Gmb in open graded mixtures with more accurate methods rather than traditional ones.

**Key Words:**

Hot Mix Asphalt, Density, Bulk density, Void Ratio, Porous Asphalt, Mastic Asphalt.

1. **Introduction**Density is one of the most important parameters used in calculations to determine the quality and quantity of asphalt in design and construction stages. (Brown & Cross, 1989). There are three primary methods of specifying density: percent of control strip, percent of laboratory density, and percent of theoretical maximum density. All three methods can be used to obtain satisfactory compaction if used correctly. The initial in-place air voids must be below approximately eight percent and the final in-place air voids must be above approximately three percent. The initial in-place air voids are determined by comparing bulk density to theoretical maximum density (TMD) and the final in-place air voids are estimated by comparing [1]the bulk density of laboratory compacted sampler to the TMD (TXDOT, 2016). The two methods that have been used to measure bulk density of asphalt mixture are physical measurements of cores and nuclear gage. The nuclear gage is fast and non-destructive but is not as accurate as the core method. (Palmer, 1989)



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## Hot Mix Asphalt

Hot Mix Asphalt is a combination of two primary ingredients - aggregates and an asphalt binder. The aggregates total ninety to ninety-five percent of the total mixture by weight. They are mixed with approximately four to eight percent asphalt binder to form HMA (CAPA , 2006). Bituminous mixes are complex multiphase materials consisting of a gradation of aggregate, air voids, and bitumen. The purpose of a pavement is to carry traffic safely, conveniently, and economically throughout its design life. (Cebon, 2000). Hot-mix asphalt pavements function properly when they are designed, produced and placed in such a manner as to give them certain desirable performance characteristics such as: permanent deformation (rutting) resistance, durability, flexibility, fatigue resistance, skid resistance, impermeability, workability, and economics. So, The objective of Mix Design Method is to determine the amount of various sizes of mineral aggregates to use to get a mix of maximum density and determines the optimum bitumen content.

## Asphalt Mixture Types

Asphalt pavements classified in terms of technology, usage, and many of standards and determinants related to the materials used and their properties. This study will depend on dense-graded mixes, closed- graded mixes,
"Mastic", and open-graded "Porous" HMA in accordance with aggregate mineral gradation.
The grade of asphalt selected depends on:

- The type of construction
- Climatic conditions
- Amount and nature of traffic (Rodriguez, 2017)

As Figure (1) shows, Asphalt mixtures can be categorized into four different types.

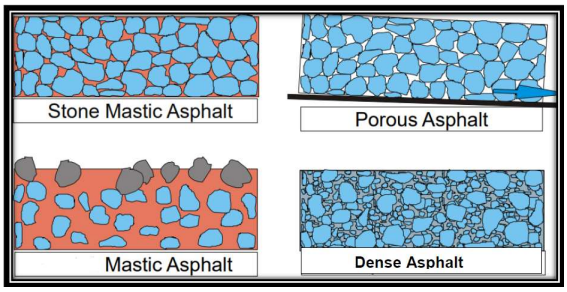


**Figure (1):** Aggregate packing arrangements of asphalt mixture types. (Cooley, 2008)

## Bulk Density in Codes

There are a number of methods available to obtain asphalt density and each one uses a slightly different way to determine specimen volume, which may result in different density values. Table (1) shown the most practical methods for tested (Gmb) according to ASTM, AASHTO, and EN standers.

## Air Voids Content

The air void content of asphalt (Va), which is defined as the ratio of volume of voids to total volume of the compacted mix, one has to first measure pavement density, Va was determined using the bulk specific gravity, and theoretical maximum density. The air void content is calculated as the ratio of the asphalt pavement density to the maximum density.

$$Air\ Voids = \left[1 - \left[\frac{G_{mb}}{G_{mm}}\right]\right] * 100\% \quad (1)$$

The variety in asphalt mixture types led to wide range of the properties' values. For example: void ratio value ranges from 0.0% in mastic asphalt to 25% in porous asphalt. This requires more accurate tools for measuring these properties.

## 2. Methodology

All basic volumetric calculations of compacted HMA specimens depend on the correct measurement of the bulk density. So, this study focuses on measuring an accurate bulk density by using four methods that including the saturated surface dry (SSD) method which is the only one used in Gaza, and also the widely commonly used in general. The following statements illustrates the problem

1. There are some methods available to obtain the asphalt density, and each one of these methods uses a slightly different way to determine specimen volume, which may result in different density values.
2. There is a difficulty in specifying the void ratio especially in the Open Graded Friction Courses (OGFC) mixtures, because of large interconnected air voids which reach the surface, and this reason lead to an error when using SSD method.
3. Some new methods and techniques were developed to determine the bulk density, but, what about the accuracy and confidence of the traditional methods result, this is an essential question in the study.
4. Some recent researches focus on using porous and mastic asphalt, this issue requires providing an accurate estimation result when measuring the bulk density, and taking into consideration gradation of the mixture.

: **Table (1):** Existing Methods with References.

| Method | Author/Reference |
|---|---|
| Water Displacement (SSD Method) | AASHTO T-166 ASTM 2726 or EN 12697-6 |
| Water Displacement (Dry Method) | EN 12697-6 |
| Dimensional Analysis | AASHTO T-269 or EN 12697-6 |
| Paraffin Sealing Method | AASHTO T-275, ASTM D 1188, EN 12697-6 |

## Objectives

This study aims at comparing the methods of specifying bulk density of asphalt mixtures, and also to discuss the following points in particular:

1. Investigate and evaluate the current methods used for determining HMA bulk density.
2. Determine the possible reasons that produce the variability in bulk density and void ratio results.
3. Studying the effects of air void content requirements in design stage on the best method of measuring bulk density.
4. Comparing between the SSD method and the other three methods in measuring bulk density depending on the void ratio in HMA.

The methodology of the study is summarized in the following steps:

1. Reviewing previous studies, the methods for measuring bulk density and void ratio, and the reflection on HMA quality.
2. Studying the asphalt material components and the types of three HMA mixtures: Dense, Mastic, and Porous asphalt.

3. Preparing three types of asphalt mixtures at laboratory by taking twelve samples from each type of mixture, and then carrying out the tests of samples using four different methods to measure the bulk density and void ratio.
4. Analyzing the results, then implementing regression analysis and drawing a box plot.
5. Conclusion, recommendations.

## 3. Result and Discussion

### Material and Testing Program

- **Stage (1):** Material Properties Testing
  Evaluation the properties of used materials such as aggregates, bitumen.

### Aggregate Properties

The size of aggregate types which are used in preparing three asphalt mixtures are mentioned below.

**Table (2) :** Used aggregates types

| Type of aggregate | | Particle size (mm) |
|---|---|---|
| **Coarse** | Folia | 0/19.0 |
| | Adasia | 0/12.5 |
| | Simsimia | 0/9.50 |
| **Fine** | Trabia | 0/4.75 |
| | Filler | 0/0.075 |

**Table (3)**: Aggregate test results according to ASTM specifications

| Specification | Test Results | Reference |
|---|---|---|
| Specific Gravity (g/cm$^3$) | 2.61–2.67 | ASTM C127-15 |
| Water Absorption | 1.8-2.2 | ASTM C128 |
| Abrasion Loss Value (%) | 20.4-25.9 | ASTM C128 |
| Sieve Analysis of Aggregates and Blending Results | See Appendix (A) | * |

### Bitumen Properties

Asphalt binders 60/70& 75-25 were used in this research, 60/70 for dense and porous asphalt and 75-25 for mastic asphalt replaced the other type of binder, bitumen 85-25.

**B60/70**:

Bitumen penetration grade 60/70 means the penetration value is in the range 60 to 70 mm at standard test conditions.

**B75-25**:

The bitumen grade 75-25 means the softening point is 75°c and penetration is 25 mm.

In order to evaluate bitumen properties number of laboratory tests have been performed such as specific gravity, ductility, flash point, softening point and penetration.

**Table (4):** Bitumen test results according to ASTM specifications

| Test | B60/70 | B75-25 | Reference |
|---|---|---|---|
| Density | 1.03 (g/ml) | 1.07 (g/ml) | ASTM D 3289-08 |
| Penetration | 62 (1/10mm) | 20-30 (1/10mm) | ASTM D5/D5M-13 |
| Flash Point | 300 (° C) | 304(° C) | ASTM D92 – 12b |
| Ductility | 150 (cm) | 37 (cm) | ASTM D113-07 |
| Solubility | 99.2 (%) | 99.3(%) | ASTM D2042-09 |
| Softening Point | 48.5 (° C) | 70.3(° C) | ASTM D 36 |

- **Stage (2):**Using Marshal Method to prepare three asphalt Mixtures type .

## Blending of Aggregates

Asphalt mix needs the combining of two or more aggregates, having different gradations, to produce an aggregate blend that meets gradation specifications for a particular asphalt mix.

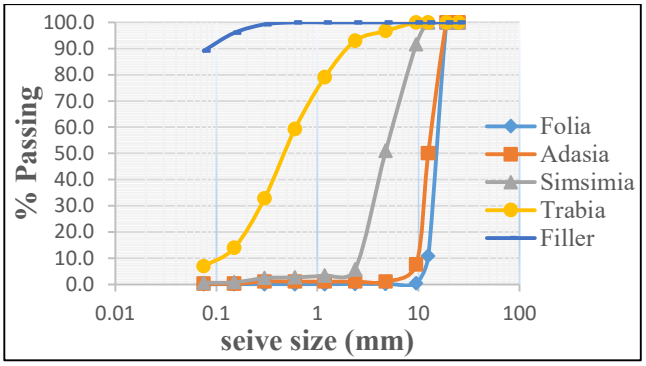


**Figure (2):** Aggregates gradations Used in Asphalt Mixtures preparing.

The trials are continued until the percentage of each size of aggregate are within allowable limits (Jendia, 2000).

### 1. Dense Asphalt

The proposed aggregates gradation curve is found to be satisfying FHWA specification for dense asphalt course gradation.

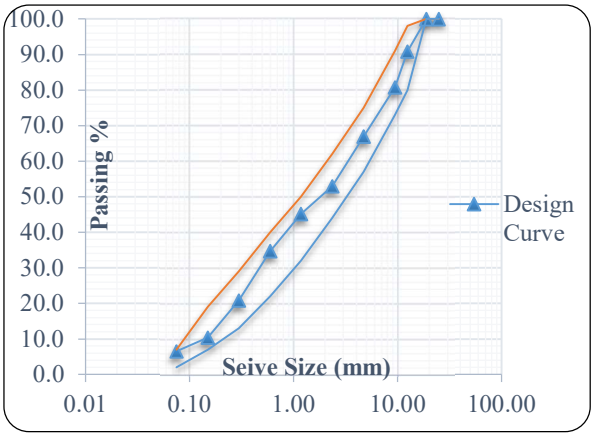


**Figure (3):** Gradation curve of dense asphalt mix with FHWA Specification.

## 2. Mastic Asphalt

MA contains three types of aggregates: coarse, fine, and filler. Numerical method used to determine trial blend of aggregates types proportion in mastic mixture, The final ratio of each aggregate material in MA mixture which is presented in appendix A. The proposed aggregates gradation curve is found to satisfy BS EN 13108-6 specification for MA gradation.

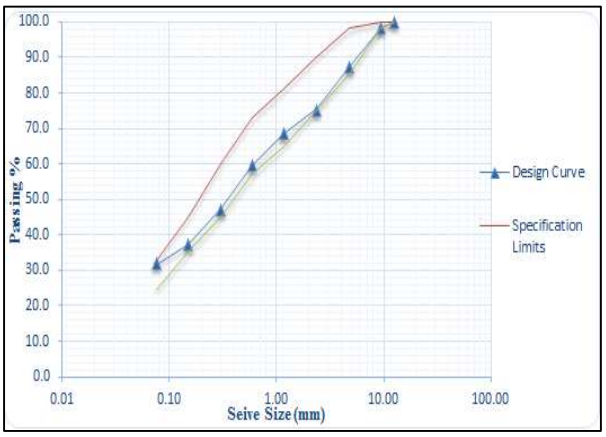


**Figure (4):** Gradation curve of mastic asphalt mix with BS EN 13108-6 Specification.

## 3. Porous Asphalt

Porous asphalt mixture in this study depends on the limits of the suggested gradation mentioned in (Jendia et al., 2018**)** article.

PA contains three sizes of coarse aggregates, aggregates types proportion in porous mixture are presented in Figure (5).

**Marshal Test**

Marshall Method is used to determine the optimum bitumen content (OBC) to be added to specific aggregate blend resulting in a mix where the desired properties of strength and durability are met.

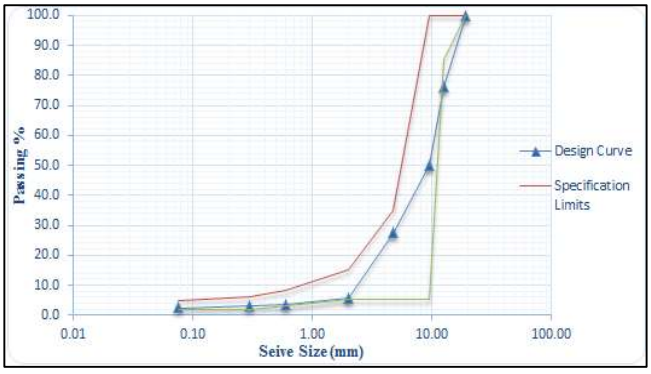


**Figure (5):** Gradation curve of porous asphalt mix according to Jendia et al., (2018)

**Table (5):** Three types of mixtures were prepared.

| Asphalt mixture | Specimens for Marshal tests | Bitumen content (%) | |
|---|---|---|---|
| | | Min | Max |
| Dense Asphalt | 12 | 4.5 | 6 |
| Mastic Asphalt | 12 | 11.5 | 13 |
| Porous asphalt | 9 | 3.5 | 4.5 |

Marshall Method for designing hot asphalt mixtures is used to determine the optimum bitumen content (OBC) to be added to specific aggregate blend resulting in a mix where the desired properties of strength and durability are met.

Three types of mixtures were prepared as the following

- **For Dense Asphalt**

The amount of 12 samples, each one approximately 1200g of aggregates types and filler put together is heated to a temperature of 160-170˚C. Bitumen is heated to a temperature of 160˚C with four trials percentage of bitumen (from 4.5 - 6% with 0.5 % incremental), by weight of the mineral aggregates. Then the heated aggregates and bitumen are thoroughly mixed at a temperature of 160 - 170˚C. The mix is placed in a preheated cylindrical mould and compacted by a hammer having a weight of 4.5 kg and a free fall of 45.7 cm giving 75 blows on both sides at a temperature of 160˚C to prepare the laboratory specimens to obtain the optimum bitumen content (OBC) of dense asphalt.

- **For Mastic Asphalt**

The amount of 12 samples, each one approximately 1200g of aggregates types and filler put together is heated to a temperature of 180-195˚C, were prepared, using three different bitumen contents (11.5%, 12%,12.5%,13%),the specimens of mastic asphalt prepared at 180 C mix temperature, (BS EN 13108-6, 2008) is using around 10 Superpave gyratory compactor to prepare mastic asphalt sample, but in the laboratory work, 15 blows by marshal hammer provide satisfactory compaction.

- **For Porous Asphalt**

The amount of 9 samples, each one approximately 1200g of coarse aggregates types put together to made incorporating the recommended combined Grading with bitumen content (3.5%, 4 %, 4.5%). the specimens of porous asphalt prepared at 160 C mix temperature, then 75 blows by marshal hammer provide satisfactory compaction.

- **Stage (3):** Prepare 36 specimens, 12 samples from each type of mixture. Then determination of the Bulk Density and Void Ratio

The main topic in this study is determining the bulk density in asphalt mixture types by using four methods.

**Bulk Density Test Methods** .

According to EN 12697-6, Four methods used for measuring bulk density, the equations to Determine Bulk density (Gmb) are listed below, in table 6 more details in **Appendix D**.

**Table( 6):** Bulk density equations (g/ $cm^3$)

| Method | Equation |
|---|---|
| **Dimensional** | $Gmb_{,\dim} = \left(\frac{m_1}{\frac{\pi}{4}\times h\times d^2}\times 10^3\right)$ |
| **Dry method** | $Gmb_{,dry} = \frac{m_1}{m_1 - m_2} * \rho_w$ |
| **Saturated surface dry** | $Gmb_{,ssd} = \frac{m_1}{m_3 - m_2} * \rho_w$ |
| **Paraffin sealing** | $Gmb_{,sea} = \left(\frac{m_1}{(m_2 - m_3)/\rho_w - (m_2 - m_1)/\rho_{sm}}\right)$ |

## ➢ Number of Samples

For determining Gmb and Va%, twelve specimens from each mixture were prepared, this number of specimens is due to the following reasons:

1. The method for preparing the mixture is manual, so when increasing the specimen's number this requires repeating the process more than once, this makes sample group exposed to different conditions such as temperature.
2. By using 12 specimens from each mixtures, 48 values of Gmb can be determined, and this is accurate enough when getting the results.
3. Previous studies used approximate number of 12 specimens, for example (Crouch, 2002) used 10 specimens for compering between Gmb determining methods.

In the laboratory, 12 cylindrical specimens were prepared by placing the mixture under a temperature of 160˚C, then they were compacted through a hammer weighting 4.5 kg and with a free fall of 45.7 cm giving 75 blows on both sides. After 24 hours. The bulk density was determined by using the four methods.

**Table (7):** Codes used to present the results.

| | |
|---|---|
| **Mixture type** | Dense Asphalt (DA) |
| | Mastic Asphalt (MA) |
| | Porous Asphalt (PA) |
| **Specimen code** | D1,D2,D3,……., D12 |
| | M1,M2,M3,…….., M12 |
| | P1,P2,P3,……., P12 |
| **Method code** | Dimensional ,Method (DIM) |
| | Dry method (DM1 |
| | SSD method (SSD) |
| | Paraffin sealing Method (PSM) |

- **For Dense asphalt**

Figure 6 shows void ratio value of cylinder-shaped specimen prepared, it will separately measure the bulk density of mixes with each one of method. While calculating the corresponding air voids. According to the data in the Table 7 below, the difference of bulk specific gravity of mix got from four different density measurement methods is low, the high rang of value appearance between the maximum value of voids in dimension method 6.56% and the minimum value in paraffin sealing method 2.53%.

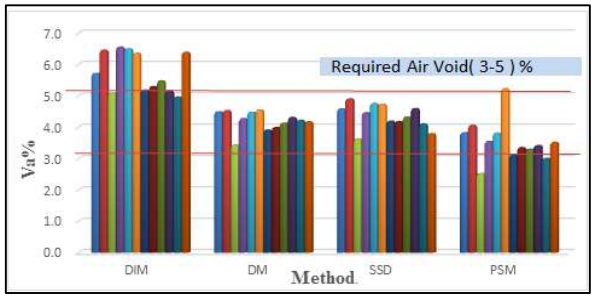


**Figure (6):** Column chart to represent Va% of each bulk density test method in DA.

As Figure 6 shows, for dense asphalt mixture with voids required between 3-5%. DM, and SSD methods have provided the value of VA% of all specimens of DA within the target limit 3-5 %. In contrast to DIM the upper limit of voids exceeds (5%) in every value of VA%. The PSM provides average value of result with the limit but the minimum value of voids less than lower limit of voids.

**Table(8):** Summary of MA data results of Va%.

| Methods | DIM | DM | SSD | PSM |
|---|---|---|---|---|
| Average | 5.76 | 4.21 | 4.36 | 3.56 |
| Max | 6.56 | 4.55 | 4.91 | 5.23 |
| Min | 4.97 | 3.44 | 3.63 | 2.53 |

- **For Mastic asphalt**

The air void percentages for the mastic mixes were calculated by the four methods Gmb determined using the equation (1), TMD/ Gmm which was evaluated by Pycnometer device is (2.312). It is noticed according to the Figure 7 and Table 8 that the Gmb and void ratio which measured specimen's code from M1- M12 is the least different between maximum and minimum value, most of results within 1%. SSD and DM methods are provides very closed results of Va% .

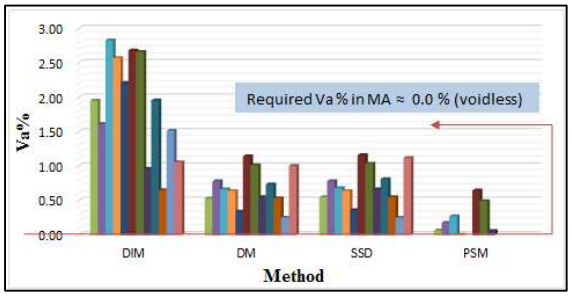


**Figure (7):** Column chart to represent Va% of each bulk density test method in MA.

**Table(9):** Summary of MA data results of Va%.

| Methods | DIM | DM | SSD | PSM |
|---|---|---|---|---|
| Average | 1.89 | 0.68 | 0.72 | 0.25 |
| Max | 2.83 | 1.14 | 1.16 | 0.65 |
| Min | 0.65 | 0.25 | 0.25 | 0.0 |

As Table 9 indicates, DIM method has given Va% with average result 1.89% more than other three methods due to the raveling and deformation have been existed. The surface of two sides not level as the mathematical equation for DIM method proposed. As shown in Figure 8.

**Figure(8):**Raveling in MA specimen's surface.

- **For Porous Asphalt**

The air void percentages for the PA were difficult to be determined due to the open interconnected voids of the mix structure. The four methods were employed to determine bulk density, then Va% was determined by using the equation (1), TMD/ Gmm, which was evaluated by Pycnometer device, is (2.38). Va% is presented in figure 4.29.

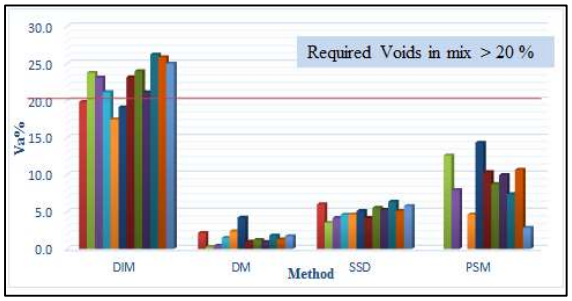


**Figure (9):** Column chart to represent Va% of each bulk density test method.

As Table 8 shows, the average air voids calculated from the Gmb results obtained by the four methods for the 12 specimens were ranked from P1- P12.

The results obtained by the DIM method produced the highest Va% contents and the results obtained by the PSM produced the second highest Va% contents. The dry method produced the lowest Va% contents.

**Table (10):** Summary of PA data results of Va%.

| Methods | DIM | DM | SSD | PSM |
|---|---|---|---|---|
| Average | 22.47 | 1.58 | 5.03 | 9.0 |
| Max | 26.20 | 4.22 | 6.36 | 14.32 |
| Min | 17.46 | 0.28 | 3.53 | 2.9 |

The PSM produced Void ratio higher than those obtained by SSD method and lower than those obtained by DIM.

Practically, when PSM was melted and specimen submerged partially, sometimes the pieces of granular specimen material dropped and the mineral sediment in a bowl. So, the temperature of paraffin affects the sample to be brittle! Another reason, theoretically, paraffin coated the surface of specimen, but in real it goes through connected voids in porous mixture and close them, this is the reason of the wide range between the results, max value of voids is (14%), and the un logical excluded values. As shown in Figure 10.

**Figure (10):** Bulk density by PSM

**Stage (3):Data Analysis**

**Relationship between the Four Methods**

Because SSD method is the most widely used in measuring Gmb. So, the comparison procedure between the four methods used in this study based on SSD method. The voids ratio explains the differences in the bulk density results of the four methods.

A linear regression prediction between the Gmb and Va% obtained from SSD method on X- Axis and Dry, Dimensional, Paraffin sealing method on Y- Axis has been conducted.

The relationship of each type of mixtures explained as the following:

- **For Dense asphalt**

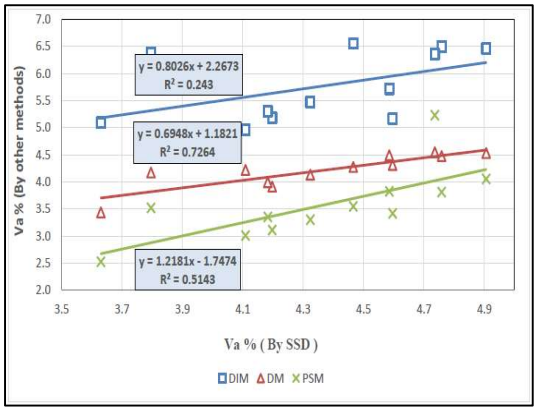


**Figure (11):** Linear relationship between the air void content obtained by SSD method and other three methods in Dense Asphalt.

Figure 11, shows three relationships: Va% by SSD versus other three methods, according to data analysis, the comment about the results can be mentioned in the following points:

1. The dimensional method provides underestimated results for Gmb so the Va% is always the highest among the other three methods. So the correlation between DIM and SSD method is poor (**$R^2$ = 0.243).**
2. The differences in Va% values, as a result of the differences in Gmb, were insignificant by the DM in comparison to SSD method. So the correlation between the two methods is high (**$R^2$ = 0.7264).**
3. PSM could make a good correlation with SSD method despite of providing Va% less than the SSD method's value. PSM provide the greatest results of Gmb and The lowest results of Va% regards the other three methods .

- **For Mastic Asphalt**

As Figures 12 shows, except DIM, the relationship between SSD and the other two methods is strong.

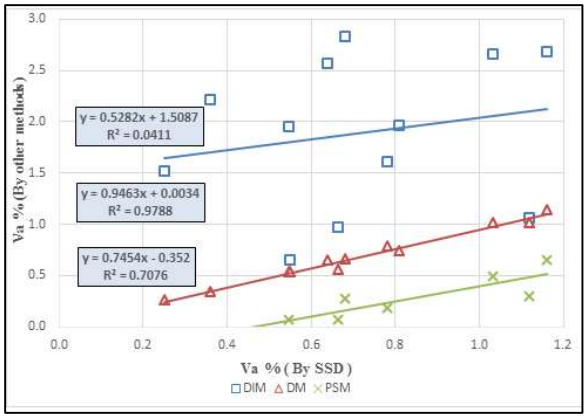


**Figure (12):** Linear relationship between the air void content obtained by SSD method and other three methods in Mastic Asphalt**.**

The relationship between the SSD and both (PSM and DM) methods is used to determine bulk density and to calculate Va% becomes more stronger than the relationship between SSD and both (PSM and DM) which existed in DA mixtures. In contrast the relationship between SSD and DIM becomes weaker.

The results of regression analysis are as follows

1. The results of the SSD and DM methods are almost identical because of the voids of specimens are almost zero, especially the mastic mixture is used as waterproof so the weight after submerging almost equals the weight before submerge the specimens in the water.
2. The Va%, determined by SSD method, increases according to the linear relationship between SSD method and the other three methods, so when it increases in SSD method, it increases in the other three methods.
3. The DIM is the least correlation with SSD method ($R^2 = 0.0411$), which provides underestimated Gmb results regardless the type of asphalt types.
4. The PSM provides un logical results when measuring Va% because of the closed similarity between the magnitude of Gmm and Gmb, so covering the specimens with melted wax increases it's weight and thus it's density, according to this; there are negative Va% values, so the Gmb is bigger than Gmm after using the melted wax.

- **For Porous Asphalt**

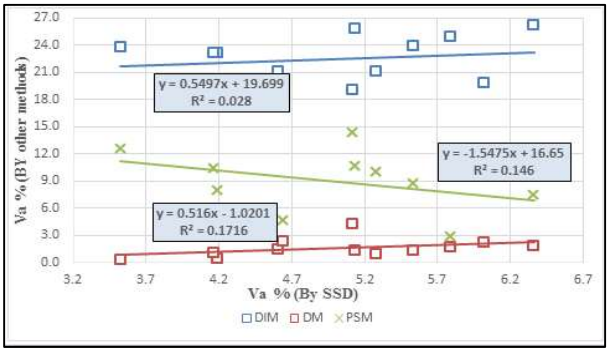


**Figure (13):** Relationship between the bulk specific gravity obtained by SSD method and other three methods in Pours Asphalt.

Figure 13, shows that there is almost no correlation between the four methods used in this study for measuring void ratio in regard to the bulk density determination in PA mixture, that has voids ratio exceeds 20%.
By regression analysis data the following results can be concluded:

1. The SSD and DM are not capable of determining Gmb and Va% of PA mixtures. The voids measured in DIM exceed those measured in the above two methods by 20%. So by using these two methods, the real volume bulk cannot be evaluated due to water leak inside the connected voids when submerging and weighting the specimen after surface drying.
2. The DIM is the most logical and suitable for determining Gmb. Because of the connected voids in the measured specimens in the other methods, make evaluation of submerged weight and weight after submerging not capable of providing real bulk volume.
3. There is proportional relationship between the SSD method and both DIM and DM in Va% values. While there is reverse relationship between the SSD method and PSM. The last relationship was understood by the decrease in the surface voids, which were included in the PSM and excluded in the SSD.
4. The PSM cannot be supported to measure Gmb due to the un logical results which are shown clearly in the points above and below trend line in figure 4.36.

5. The significant variations in the results of the four methods reflect the need to find more accurate method in determining Gmb in OGFC mixtures.

**Data analysis using Box plot**

The box plot chart was used to display the air void ratio results of each one method.

It is clear from Figure 15 that 75% of the measured specimens by SSD and DM have 4- 5 % VA. While the rest have 3-4% of VA. This means that there is no importance difference between the two methods regarding the dense asphalt. However, the result showed that VA by DIM method exceed 5% concerning 75% of measured specimens.

Also, Figure 15 illustrates that PSM method determined 2-5 VA, which reflect the high variance between the results. This indicate that PSM used to measure the lowest VA within the dense asphalt.

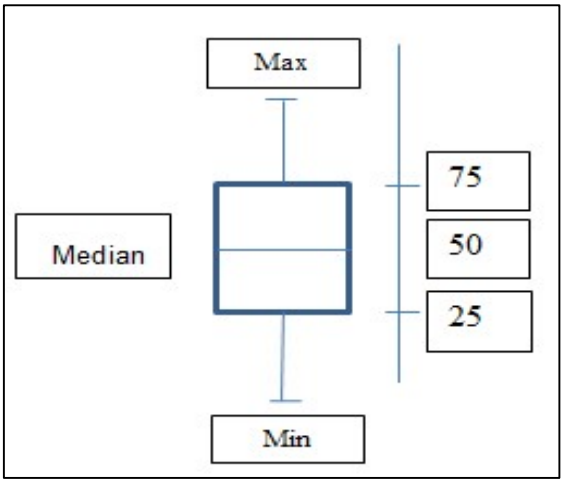


**Figure (14):** Illustrating Box Blot Chart**.**

- **For Dense Asphalt**

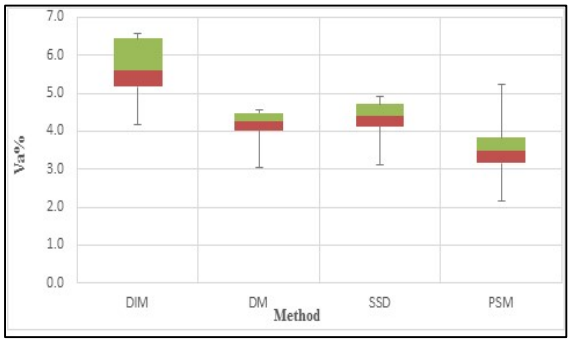


**Figure (15):** Box Blot for Dense Asphalt Void ratio result.

- **For Mastic Asphalt**

Figure (17) shows that the results of the three methods have less that 1% Va%, while 75% of DIM specimen results determined Va between 1 – 2.8%. Also by the Figure 4.40, in mastic asphalt, the surface voids can be neglected in the light of the similarity of SSD and dry methods results.

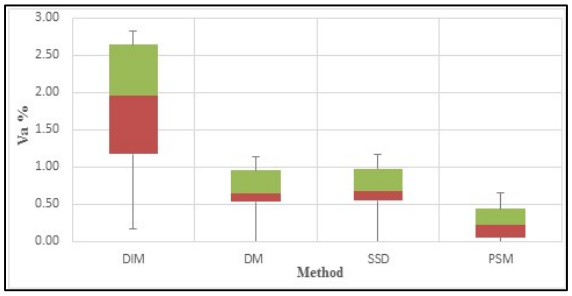


**Figure (16):** Box Blot for Mastic asphalt Void ratio result.

- **For Porous Asphalt**

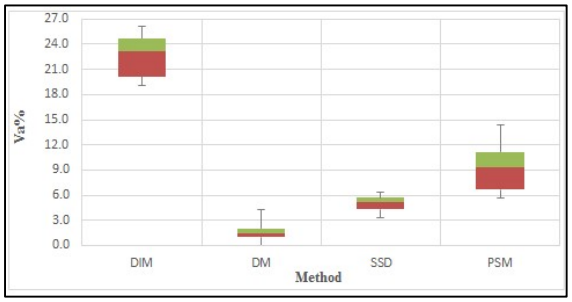


**Figure (17):** Pox Blot for Pours asphalt Void ratio result.

Figure 17 shows that the results of the three methods have less that 1% Va%, while 75% of DIM specimen results determined Va between 1 – 2.8%. Also by the Figure 4.40, in mastic asphalt, the surface voids can be neglected in the light of the similarity of SSD and dry methods results.

**Summary**

The relationship between SSD method and the other three methods by using linear and nonlinear regression, which represent with more details in Appendix. It is clear that the correlation is strong as void ratio in mixture is low. So, in mastic asphalt, the correlation is the best. But, in porous asphalt there is no correlation between SSD and other three methods.

- Dimensional Method (DIM)
  - In dense and mastic asphalt mixtures the raveling in the specimens surface affects the volumetric measured, so the deformation in the surface is a part of the voids. Therefore, the voids ratio by DIM is greater than the void ratio by other methods.
  - DIM is the only suitable method for determining bulk density and air void ratio in porous asphalt, but it is not the best method due to the underestimated result of bulk density

- Dry Method (DM)
  - DM is Suitable for determining Gmb in Dense asphalt despite of the surface voids are not included in the volume of voids.
  - Dry method and SSD are the best selected method for determining Gmb in mastic asphalt especially when the surface of mastic specimens has zero voids.
  - In porous asphalt the dry method totally failed in determining Gmb and Void ratio due to the weight in water does not represent the bulk volume of specimens.

- SSD Method
  - SSD is considered the best method for determining Gmb and Va in both mixtures DA and MA, this method, as previous results shows, provides logical results in these mixtures because the surface and internal voids are included in the amount of bulk volume.
  - In porous asphalt, SSD totally failed in determining Gmb and Va due to interconnected voids, the water runs throughout specimens in SSD weight, so the mechanism of this method did not work.

- Paraffin Sealing Method (PSM)
  - In dense asphalt, it provides the maximum bulk density and lower void ratio in regards to other three methods, paraffin prevents the specimens from water when they are immersed, so it can be used as indicator to predict the lowest air voids in asphalt specimens.
  - In mastic asphalt, it provides results nearby from those of SSD and DM, but sometimes the un logical results appeared in 5 from12 specimens, when the Gmb results are greater than Gmm . This happens because the paraffin sticks in specimens and becomes a part of their weight and ,when the Gmm is very close from Gmb in mastic asphalt, this means many of specimens have Gmb greater than Gmm when adding paraffin.
  - In Porous asphalt, it succeeds partially in determining Gmb, the results are various between one specimen to another, it can't be adopted because the melt paraffin has closed the deep or internal voids in addition to the surface, the other reason is the effect of melt paraffin on the cohesion of the specimens, 2 from12 samples became brittle.

## 4. Conclusion

The conclusion of this study could be summarized as follows:

1. There are obvious differences in the results of bulk density and as sequence void ratio by using each method in any of three asphalt mixtures. So, the real air voids cannot be determined. But, these differences are varying from one method to another, and from one mixture to another.
2. The results showed that there is less variability in the asphalt mixtures which have air voids ratio required in the low range (less than 5%) that agrees with AASHTO regulation.
3. The correlation between three of the four methods (SSD, Dry, and Paraffin sealing) that were used to determine bulk density in dense and mastic asphalt mixtures is strong according to the regression analysis. So, SSD can be used to predict the other two method's values.
4. The most widely applicable method SSD, failed obviously in the determination of the void ratio in porous asphalt.
5. The dry method is the simplest method since the voids in the surface of specimen does not included in the bulk volume. So, it gives overestimated to the Gmb and less estimated to void ratio.
6. In dense and mastic asphalt mixtures, the statistical analysis show that there is a significant difference between the measurement made by SSD and dry methods and the measurement made by the dimensional and paraffin methods. SSD and dry methods are more consistent than those made by the dimensional and Paraffin methods.
7. From the four methods, the dimensional analysis method is the only one suitable to measure the Gmb in the porous asphalt. Although the dimensional method gave underestimation for Gmb and overestimation for a void ratio.
8. The Paraffin sealing method suitable for determining bulk density and void ratio in dense asphalt, but in mastic asphalt 5/12 of specimens gave un logical bulk density value since the theoretical maximum density (Gmm/TMD) is very closed to bulk density, when sealing the specimen by paraffin the own weight of specimen increasing so the bulk density is increasing. In porous asphalt 2/12 of specimens gave un logical value due to the following reason:

- The porous asphalt specimens splitted when submersed in paraffin.
- The paraffin is not sealing the surface of specimens only, but also it covers the internal voids of specimens.

9. The value of voids that are determined by SSD form only (60-88) % of the voids that are determining by dimensional method in dense asphalt, (15-70 )% in mastic asphalt, and (15-30) % only in porous asphalt

## Recommendations

Recommendations were made to improve air void determination and reduce the test variability.

1. Dimension method can be used as an indicator for the upper limit of voids while the paraffin sealing method can be used as an indicator to the lowest limit.
2. The study recommends more accurate methods to be used in determining Gmb in porous asphalt rather than a volumetric method (dimensional method), such as vacuum sealing device and other advanced techniques.
3. Each type of asphalt mixtures used in this study needs to be studied separately with large scale specimens in order to understand deeply the relationship between the four methods that used to determine the bulk density.

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SHORT COMMUNICATION

# Development and Characterization of Novel Engine-Oil-Based Media Gel for Thermal Additive Centrifugal Abrasive Flow Machining

**Anant Bhardwaj**[1] · **Krovvidi Srinivas**[1] · **Rajiv Chaudhary**[1]

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**Abstract** The present investigation involves the development of a novel media gel based on SAE-40 grade engine oil for the thermal additive centrifugal abrasive flow machining process (TACAFM). The property to retain viscosity at higher temperatures makes engine oil suitable for the media in the TACAFM process where thermal energy due to spark formation plays a major role in material removal. The rheological behaviour and characterization of developed media gel are analysed using a rheometer, Fourier transformation infrared (FTIR) and X-ray diffraction (XRD) analysis. The viscosity analysis shows that the proposed media would retain its viscosity at high temperature. The FTIR and XRD analysis highlights the hydrocarbon structure with crosslinking chain, which binds the media particle and abrasives during machining. The proposed media gel shows its compatibility with the TACAFM process.

**Keywords** TACAFM · Media gel · Viscoelastic · FTIR · X-ray diffraction · Dielectric

The present investigation proposes a novel gel for the media used in TACAFM to cater the viscosity drop due to the temperature rise in the media from the generation of spark. The spark generated by EDM effect increases the temperature of media, which results its viscosity loss. This loss in viscosity results in the decrease in abrasive holding capacity, resulting in the less material removal. TACAFM process is a new hybrid of the AFM process, which involves the advantage of a spark electric discharge machine, centrifugal force-assisted abrasive flow machining and conventional abrasive flow machining process [1, 2]. The media used in the process is a combination of abrasives (cutting tool), polymer (fluidity and elastic behaviour) and gel (viscous property). The viscosity of gel plays a crucial role in the functionality of the process, and also, it holds the abrasive particles. Many researchers contributed to the synthesis of novel media over the years to enhance the process efficiency of the AFM and its hybrid process by alerting the base oil of the media or by altering the type and property of the abrasive [3–5], rheological property of media [6, 7], novel fluid and cutting mechanism [8–10] and mathematical modelling and simulations [11]. The proposed gel is prepared by dissolving aluminium stearate (20 gm) with 35 ml SAE-40 engine oil (it can withstand very high temperatures according to the Indian environment, and its availability is not a significant issue), heating and stirring until the solute gets dissolved. Once the solution is prepared, it is heated until the gel gets solidify. The viscosity of the prepared sample is analysed using a rheometer and Fourier transforms infrared and XRD is used to analyse its structural property and characterization. Figure 1i shows the basic process of TACAFM. Figure 1ii shows the experimental set-up for the preparation of gel and Fig. 1iii the prepared gel sample.

To identify the functional group present in the sample, FTIR is conducted for the oil sample and the gel sample separately and the plot is shown in Fig. 2. Figure 2i shows the FTIR plot for the engine oil sample and Fig. 2ii shows the plot for the gel sample. The clear difference is

**Significance statement:** The present investigation proposed the development and characterization of SAE-40-based media gel for the thermal additive centrifugal abrasive flow machining (TACAFM) process, which is recent hybrid of abrasive flow machining (AFM) process. The proposed gel caters the viscosity loss of media, due to temperature rise, during the spark generation, which improves material removal.

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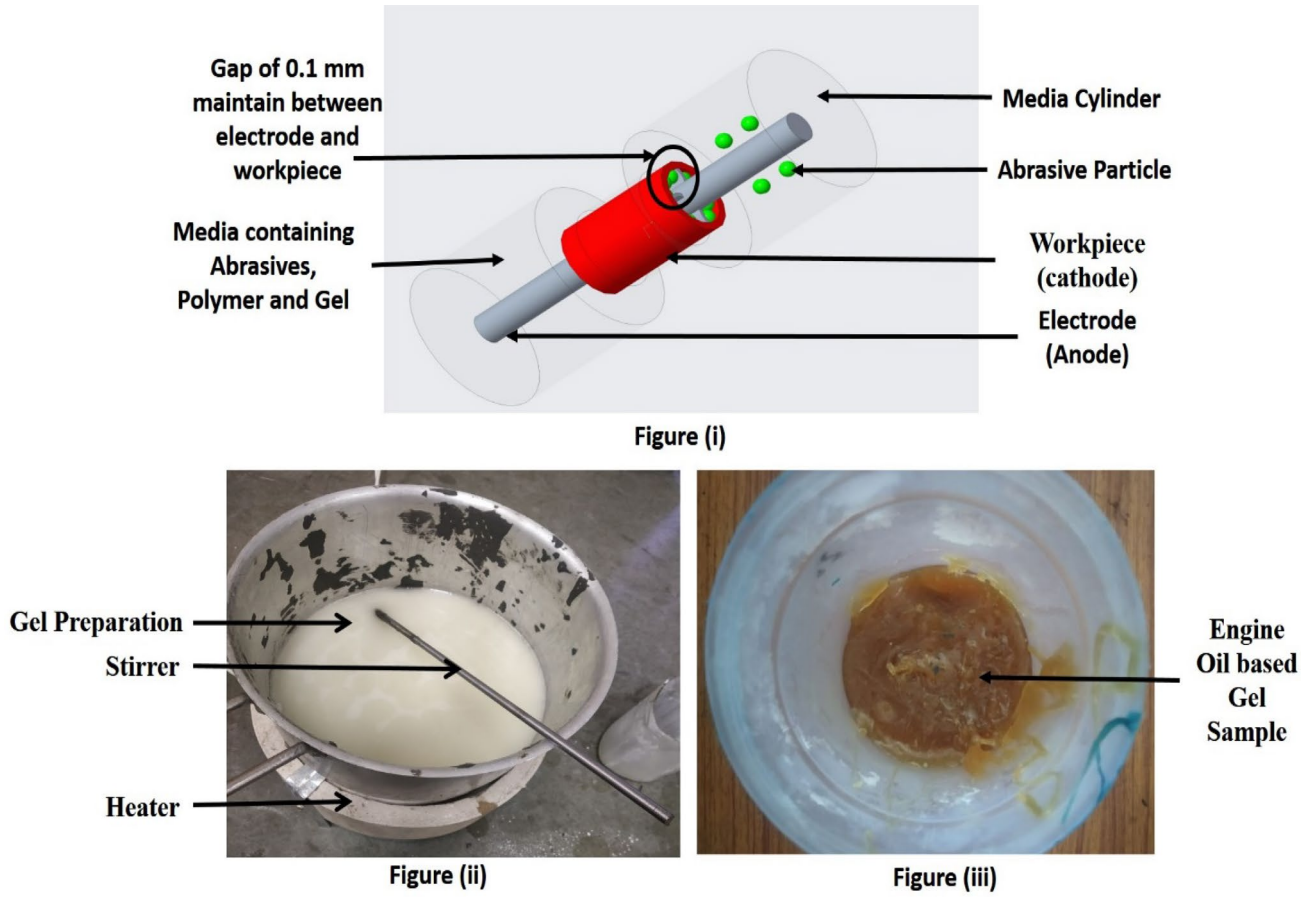


**Fig. 1** Experimental setup: (i) schematic diagram of TACAFM process, (ii) gel preparation, (iii) prepared sample

observed between the media gel and the engine-oil sample. The FTIR analysis reflects the presence of carbon–carbon double bond and carbon–carbon triple bond, which shows a necessary requirement for the media used in the TACAFM process. The wavenumber 3675 $cm^{-1}$ predicts H-bonded alcohols and phenols, while 2853 $cm^{-1}$ represents the alkanes group [12]. This linkage provides a considerable strength to the media gel to hold the abrasive and polymer particle for the machining process.

Figure 2iii shows the viscosity variation between the shear stress and shear rate, and Fig. 2iv shows the viscosity vs shear rate. It is observed that the viscosity variation in Fig. 2iii does not vary much with shear rate, which indicates the viscosity tends to remain constant against the movement in the media during the TACAFM process as it involves the rotation of electrode. The rotation of electrode in the media increases the shear rate along with the temperature in the media. Figure 2iv shows a decrease in the viscosity for shear rate. This decrease in viscosity is not very rapid compared to other media gels, which show that the proposed media gel can withstand viscosity at higher temperature [12].

The XRD results show the combination of hump and noise (Fig. 3). This hump is present due to the presence of carbon-based group in the engine oil. When the aluminium stearate is added to the engine oil, it is used to stop the oil separation and acts as an oil thickening agent for gel formation. This gel deviates the hump of carbon in XRD pattern. Also due to the presence of moisture in the gel, the XRD patterns contain noise and also the pattern is obtained at low intensity. The carbon can be identified at (002) between 20 and 30 degree and at (101) between 40 and 45 degree of 2 theta values. Also the traces of aluminium may be observed at (111), (220) and (311) at 37, 65 and 73 degrees [13]. The pattern represents a hydrocarbon-based viscoelastic dielectric media. Also, the TACAFM process uses a nonconductive environment through media, which is placed between the centrifugal force-generating electrode and the workpiece. The media acts as a dielectric nature, and the engine oil with aluminium stearate makes the proposed gel as a viscoelastic dielectric required for TACAFM process [14].

The article concludes the synthesis of novel engine-oil-based gel, which possess viscoelastic and dielectric properties and suitable for TACAFM process. The XRD shows the

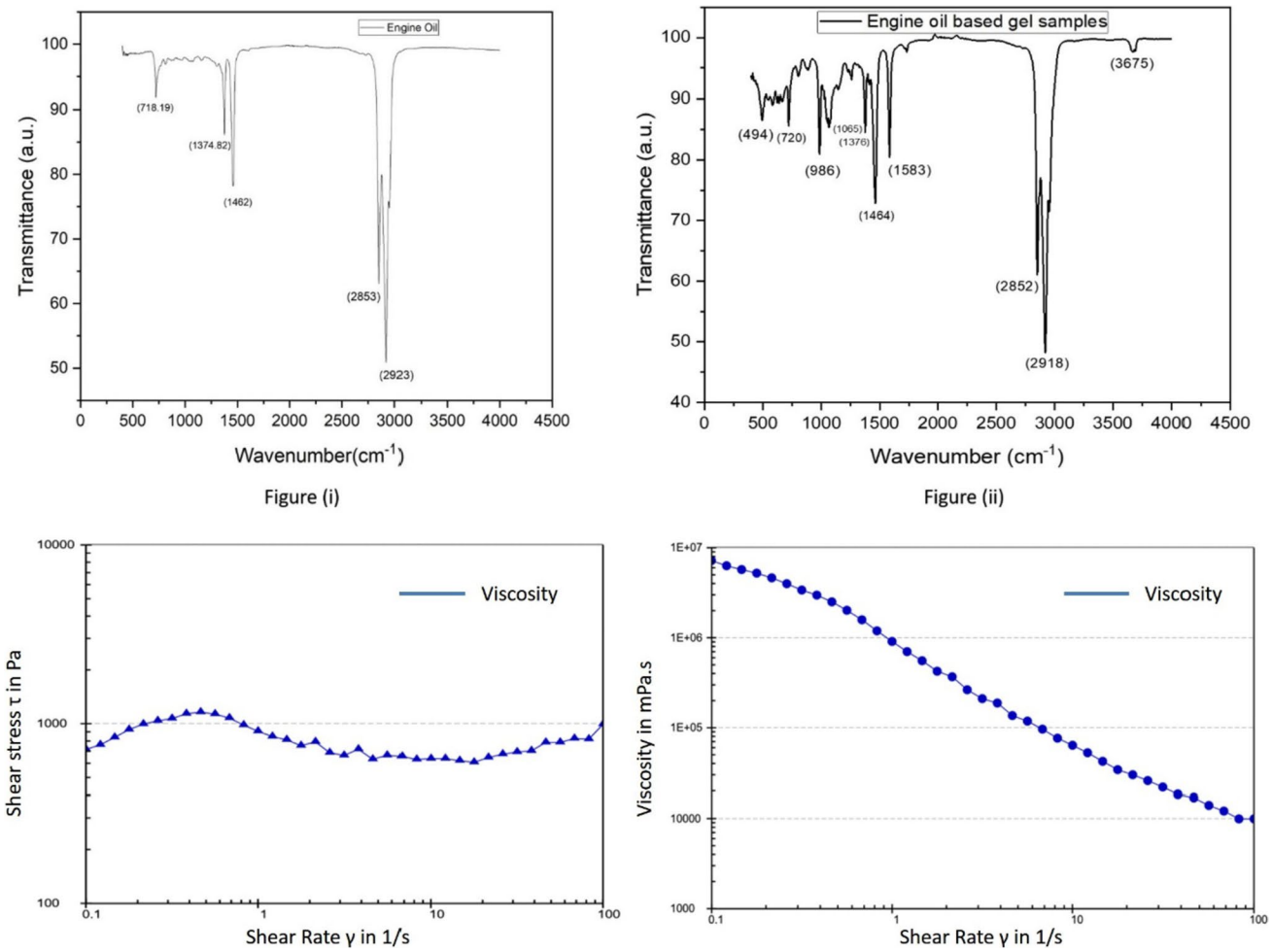


**Fig. 2** FTIR and viscosity analysis: (i) FTIR for engine oil, (ii) FTIR for engine-oil sample, (iii) shear stress versus shear rate plot, (iv) viscosity versus shear rate

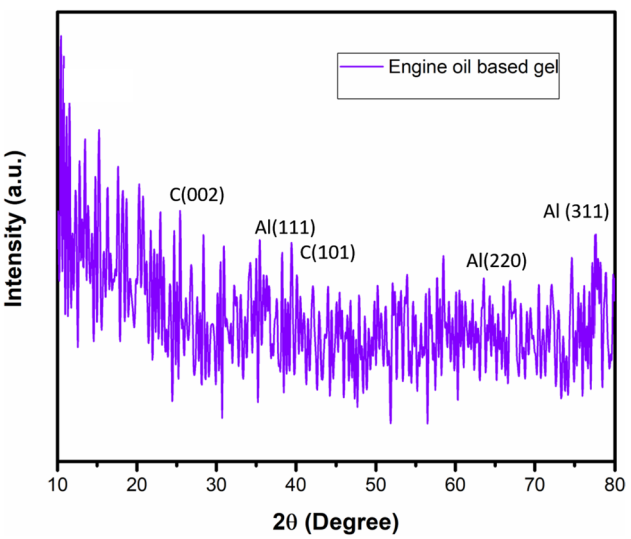


**Fig. 3** XRD pattern of proposed media gel

presence of carbon and aluminium phases, FTIR confirms the carbon with crosslinking chains, and viscosity trends support the abrasive holding capacity of the proposed media gel as the decrease in viscosity is not rapid with the increase in the shear rate, which is a desirable requirement.

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**Declarations**

**Conflict of interest** On behalf of all authors, the corresponding author states that there is no conflict of interest.

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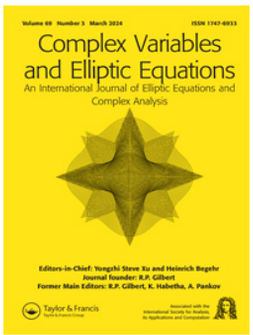

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# Differential subordination of certain class of starlike functions

N. Verma & S. Sivaprasad Kumar

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# Differential subordination of certain class of starlike functions

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**ABSTRACT**

This paper presents several results concerning second and third-order differential subordination for the class $\mathcal{S}_e^* := \{f \in \mathcal{A} : zf'(z)/f(z) \prec e^z\}$, which represents the class of starlike functions associated with exponential function.

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## 1. Introduction

Suppose $\mathcal{H} = \mathcal{H}(\mathbb{D})$ be the class of analytic functions in $\mathbb{D} := \{z \in \mathbb{C} : |z| < 1\}$. For any positive integer $n$ and $a \in \mathbb{C}$, define

$$\mathcal{H}[a, n] := \{f \in \mathcal{H} : f(z) = a + a_n z^n + a_{n+1} z^{n+1} + a_{n+2} z^{n+2} + \cdots\}.$$

Let $\mathcal{A}$ be the class of normalized analytic functions defined as

$$\mathcal{A} = \{f \in \mathcal{H} : f(z) = z + a_2 z^2 + a_3 z^3 + \cdots\}$$

and $\mathcal{S} \subset \mathcal{A}$ contains univalent functions. Any function $f \in \mathcal{S}$ is called starlike if and only if $\mathrm{Re}(zf'(z)/f(z)) > 0$ and the class consisting of all such functions is denoted by $\mathcal{S}^*$. If $h$ and $g$ are two functions in the class $\mathcal{A}$, we say that $h$ is subordinate to $g$ (denoted by $h \prec g$), if there exists a Schwarz function $w$ with $w(0) = 0$ and $|w(z)| \leq |z|$ such that $h(z) = g(w(z))$. Moreover, if $g$ is univalent, then $h \prec g$ if and only if $h(0) = g(0)$ and $h(\mathbb{D}) \subseteq g(\mathbb{D})$. A significant development in the direction of differential subordination was made with the appearance of Miller and Mocanu's monograph, "Differential Subordination and Univalent Functions," in 1981. It is a compendium of its time and this book initiated a significant revolution among researchers. In 1992, Ma and Minda [1] unified various subclasses of $\mathcal{S}^*$

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**Table 1.** Some subclasses of $\mathcal{S}^*$.

| Class | Author(s) | Reference |
|---|---|---|
| $\mathcal{S}^*[C,D] := \mathcal{S}^*((1+Cz)/(1+Dz))$ | Janowski | [2] |
| $\mathcal{S}^*_\rho := \mathcal{S}^*(1+\sinh^{-1}(z))$ | Arora and Kumar | [3] |
| $\mathcal{S}^*_S := \mathcal{S}^*(1+\sin z)$ | Cho et al. | [4] |
| $\mathcal{S}^*_{SG} := \mathcal{S}^*(2/(1+e^{-z}))$ | Goel and Kumar | [5] |
| $\mathcal{S}^*_\wp := \mathcal{S}^*(1+ze^z)$ | Kumar and Kamaljeet | [6] |
| $\mathcal{S}^*_q := \mathcal{S}^*(z+\sqrt{1+z^2})$ | Raina and Sokół | [7] |
| $\mathcal{S}^*_L := \mathcal{S}^*(\sqrt{1+z})$ | Sokół and Stankiewicz | [8] |

by introducing the following class $\mathcal{S}^*(\varphi)$ through subordination:

$$\mathcal{S}^*(\varphi) = \left\{ f \in \mathcal{A} : \frac{zf'(z)}{f(z)} \prec \varphi(z) \right\}, \tag{1}$$

with $\varphi$ as an analytic univalent function so that $\operatorname{Re}\varphi(z) > 0$, $\varphi(\mathbb{D})$ is symmetric about the real axis and starlike with respect to $\varphi(0) = 1$ with $\varphi'(0) > 0$. Through the process of specializing the function $\varphi$ in (1), researchers have obtained several significant subclasses of $\mathcal{S}^*$. Some of these subclasses are mentioned for ready reference in Table 1.

The exponential function plays a crucial role in diverse scientific fields, including physics, signal processing, number theory, and models describing growth and decay in biology and economics. Specifically, in the realm of GFT, Mendiratta et al. [9] introduced and examined the class $\mathcal{S}^*_e := \mathcal{S}^*(e^z)$, incorporating the use of $e^z$ within their class. Geometrically, we say a function $f \in \mathcal{S}^*_e$ if and only if $zf'(z)/f(z) \in \Delta_e := \{\delta \in \mathbb{C} : |\log\delta| < 1\}$. In this investigation, they obtained the conditions on $\beta$ parameter so that $p(z) \prec e^z$ when $1 + \beta zp'(z)/p(z) \prec h(z)$ by choosing $h(z) = (1+Cz)/(1+Dz)$, $\sqrt{1+z}$ and $e^z$. Further, Kumar and Ravichandran [10] extended their results and obtained sharp bounds on $\beta$ so that $p(z) \prec e^z$ when $1 + \beta zp'(z)/p^j(z) \prec h(z)$ for $j = 0, 2$ and $h(z) = (1+Cz)/(1+Dz)$ and $\sqrt{1+z}$. Later on, Naz et al. [11] derived a wide range of first-order subordination implications for the exponential function and generalized the results of [9]. Madaan et al. [12] conducted an investigation for the class of admissible functions associated with the lemniscate of Bernoulli for several implications of first and second order differential subordination. Similarly, Goel and Kumar [5] derived results focussing on first-order subordination results considering the class $\mathcal{S}^*_{SG}$. To explore the latest developments in this theory, one can refer to [13, 14]. There do exist good literature on first-order differential subordination, see [11, 15] and the references therein. However, the work on second and higher-order differential subordination is still in the process of development.

Motivated by the aforementioned works and its applications, we establish results on second and third-order differential subordination implications for starlike functions associated with the exponential function. These results are derived through the technique of admissibility conditions. Our results extend the study of the class $\mathcal{S}^*_e$ specifically involving differential subordination implications result.

Now, we state some basic definitions and notations required for differential subordination.

**Definition 1.1 ([16]):** Let $\xi(r,s,t,u;z):\mathbb{C}^4\times\mathbb{D}\to\mathbb{C}$ and $h(z)$ be a univalent function in $\mathbb{D}$, if $p$ is an analytic function in $\mathbb{D}$ satisfying the third-order differential subordination

$$\xi(p(z),zp'(z),z^2p''(z),z^3p'''(z);z)\prec h(z) \tag{2}$$

then $p$ is called a solution of the differential subordination. The univalent function $q$ is said to be a dominant of the solutions of the differential subordination if $p\prec q$ for all $p$ satisfying (2). A dominant $\bar{q}$ that satisfies $\bar{q}\prec q$ for all dominants $q$ of (2) is said to be the best dominant of (2), which is unique upto the rotation.

Furthermore, let $Q$ denote the set of analytic and univalent functions $q\in\overline{\mathbb{D}}\setminus\mathbb{E}(q)$, where

$$\mathbb{E}(q)=\{\zeta\in\partial\mathbb{D}:\lim_{z\to\zeta}q(z)=\infty\}$$

such that $q'(\zeta)\neq 0$ for $\zeta\in\partial\mathbb{D}\setminus\mathbb{E}(q)$. The subclass of $Q$ for which $q(0)=a$ is denoted by $Q(a)$.

**Lemma 1.2 ([16]):** *Let $z_0\in\mathbb{D}$ and $r_0=|z_0|$. Let $f(z)=a_nz^n+a_{n+1}z^{n+1}+\cdots$ be continuous on $\overline{\mathbb{D}}_{r_0}$ and analytic on $\mathbb{D}\cup\{z_0\}$ with $f(z)\neq 0$ and $n\geq 2$. If $|f(z_0)|=\max\{|f(z)|:z\in\overline{\mathbb{D}}_{r_0}\}$ and $|f'(z_0)|=\max\{|f'(z)|:z\in\overline{\mathbb{D}}_{r_0}\}$, then there exist real constants $m$, $k$ and $l$ such that*

$$\frac{z_0f'(z_0)}{f(z_0)}=m,\quad 1+\frac{z_0f''(z_0)}{f'(z_0)}=k\quad\text{and}\quad 2+\operatorname{Re}\left(\frac{z_0f'''(z_0)}{f''(z_0)}\right)=l$$

*where $l\geq k\geq m\geq n\geq 2$.*

## 2. Preliminaries

In 2020, Kumar and Goel [13] made modifications to the results established by Antonino and Miller [16], ensuring that the Ma-Minda functions meet the requirements for third-order differential subordination. The revised results are presented below in the form of a definition and lemma, which are needed to achieve our main results for the class $\mathcal{S}_e^*$.

**Definition 2.1 ([13]):** Let $\Omega$ be a set in $\mathbb{C}$, $q\in Q$ and $k\geq m\geq n\geq 2$. The class of admissible operators $\xi_n[\Omega,q]$ consists of those $\xi:\mathbb{C}^4\times\mathbb{D}\to\mathbb{C}$ that satisfy the admissibility condition

$$\begin{aligned}&\xi(r,s,t,u;z)\notin\Omega\quad\text{whenever}\quad z\in\mathbb{D},\quad r=q(\zeta),\quad s=m\zeta q'(\zeta),\\&\operatorname{Re}\left(1+\frac{t}{s}\right)\geq m\left(1+\operatorname{Re}\frac{\zeta q''(\zeta)}{q'(\zeta)}\right)\quad\text{and}\quad\operatorname{Re}\frac{u}{s}\geq m^2\operatorname{Re}\frac{\zeta^2q'''(\zeta)}{q'(\zeta)}\\&\quad+3m(k-1)\operatorname{Re}\frac{\zeta q''(\zeta)}{q'(\zeta)}\end{aligned}$$

for $\zeta\in\partial\mathbb{D}\setminus\mathbb{E}(q)$.

**Lemma 2.2 ([13]):** *Let $p \in \mathcal{H}[a, n]$ with $m \geq n \geq 2$, and let $q \in Q(a)$ such that it satisfies*

$$\left| \frac{zp'(z)}{q'(\zeta)} \right| \leq m, \tag{3}$$

*for $z \in \mathbb{D}$ and $\zeta \in \partial\mathbb{D} \setminus \mathbb{E}(q)$. If $\Omega$ is a set in $\mathbb{C}$, $\xi \in \Psi_n[\Omega, a]$ and*

$$\xi(p(z), zp'(z), z^2p''(z), z^3p'''(z); z) \subset \Omega,$$

*then $p \prec q$.*

Here, we provide two lemmas which are necessary for the proof of results in the coming section.

**Lemma 2.3 ([13, Lemma 4, Pg No. 192]):** *For any complex number z, we have*

$$|\log(1+z)| \geq 1 \quad \text{if and only if} \quad |z| \geq e - 1.$$

**Lemma 2.4 ([5]):** *Let $r_0 \approx 0.546302$ be the positive root of the equation $r^2 + 2\cot(1)r - 1 = 0$. Then*

$$\left| \log\left(\frac{1+z}{1-z}\right) \right| \geq 1 \quad \text{on } |z| = R \quad \text{if and only if } R \geq r_0.$$

## 3. Main results

We begin with considering the function $q(z) := e^z$ and define the admissibility class $\Psi[\Omega, q]$, where $\Omega \subset \mathbb{C}$. We know that $q$ is analytic and univalent on $\overline{\mathbb{D}}$ with $q(0) = 1$ and it maps $\mathbb{D}$ onto the domain $\Delta_e$. Since $\mathbb{E}(q)$ is empty for $\zeta \in \partial\mathbb{D} \setminus \mathbb{E}(q)$ if and only if $\zeta = e^{i\theta}$ ($\theta \in [0, 2\pi]$). Now, consider

$$|q'(\zeta)| = e^{\cos\theta} =: b(\theta) \tag{4}$$

has a minimum value of $e^{-1}$. It is evident that $\min|q'(\zeta)| > 0$, which implies that $q \in Q(1)$, and consequently, the admissibility class $\Psi[\Omega, q]$ is well-defined. While considering $|\zeta| = 1$, we observe that $q(\zeta) \in q(\partial\mathbb{D}) = \partial\Delta_e = \{\delta \in \mathbb{C} : |\log\delta| = 1\}$. Consequently, we have $|\log q(\zeta)| = 1$ and $\log(q(\zeta)) = e^{i\theta}$ ($\theta \in [0, 2\pi]$), implies that $q(\zeta) = e^{\zeta}$. Moreover, $\zeta q'(\zeta) = e^{i\theta}e^{e^{i\theta}}$ and

$$\frac{\zeta q''(\zeta)}{q'(\zeta)} = e^{i\theta}. \tag{5}$$

By comparing the real parts on both sides of (5), we obtain

$$\mathrm{Re}\left(\frac{\zeta q''(\zeta)}{q'(\zeta)}\right) = \cos\theta =: l(\theta). \tag{6}$$

The function $l(\theta)$ defined in (6) achieves its minimum value at $\theta = \pi$, given by $l(\pi) \approx -1$. Moreover, the class $\Psi[\Omega, e^z]$ is precisely defined as the class of all functions $\xi : \mathbb{C}^3 \times \mathbb{D} \to$

$\mathbb{C}$ that satisfy the following conditions:

$$\xi(r,s,t;z) \notin \Omega, \quad \text{whenever}$$
$$r = q(\zeta) = e^{e^{i\theta}}; \quad s = m\zeta q'(\zeta) = me^{i\theta}e^{e^{i\theta}}; \quad \operatorname{Re}\left(1+\frac{t}{s}\right) \geq m(1+l(\theta)) \tag{7}$$

where $z \in \mathbb{D}, \theta \in [0, 2\pi]$ and $m \geq 1$. If $\xi : \mathbb{C}^2 \times \mathbb{D} \to \mathbb{C}$, then the admissibility condition (7) becomes

$$\xi(e^{e^{i\theta}}, me^{i\theta}e^{e^{i\theta}}; z) \notin \Omega \quad (z \in \mathbb{D}, \theta \in [0, 2\pi], m \geq 1).$$

Taking $q(z) = e^z$, we deduce the following as a special case of Miller and Mocanu [17, Theorem 2.3b], which is necessary to prove our main results.

**Lemma 3.1:** *Let $\xi \in \Psi[\Omega, e^z]$. If $p \in \mathcal{H}[1,n]$ satisfies*

$$\xi(p(z), zp'(z), z^2p''(z); z) \in \Omega \quad \text{for} \quad z \in \mathbb{D}$$

*then $p(z) \prec e^z$.*

Further, let $q(z) = e^z$, we have

$$\zeta^2 \frac{q'''(\zeta)}{q'(\zeta)} = e^{2i\theta}.$$

On comparing the real parts of both the sides, we get

$$\operatorname{Re}\left(\zeta^2 \frac{q'''(\zeta)}{q'(\zeta)}\right) = \cos 2\theta =: h(\theta).$$

The minimum value of $h(\theta)$ is $-1$, which is attained at $\theta = \pi/2$. Thus, if $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ then $\xi \in \Psi[\Omega, e^z]$, provided $\xi$ satisfies the following conditions:

$$\xi(r,s,t,u;z) \notin \Omega \quad \text{whenever } r = q(\zeta) = e^{e^{i\theta}}, \quad s = m\zeta q'(\zeta) = me^{i\theta}e^{e^{i\theta}},$$
$$\operatorname{Re}\left(1+\frac{t}{s}\right) \geq m(1+l(\theta)) \quad \text{and} \quad \operatorname{Re}\frac{u}{s} \geq m^2h(\theta) + 3m(k-1)l(\theta)$$

for $z \in \mathbb{D}, \theta \in [0, 2\pi]$ and $k \geq m \geq 2$. Given the above conditions, we deduce a special case of Lemma 2.2, which is needed to deduce our results provided at the end of this article.

**Lemma 3.2:** *Let $p \in \mathcal{H}[1,n]$ with $m \geq n \geq 2$ such that for $z \in \mathbb{D}$ and $\zeta \in \partial\mathbb{D}$, it satisfies*

$$|zp'(z)e^{-\zeta}| \leq m.$$

*If $\Omega$ is a set in $\mathbb{C}$ and $\xi \in \Psi[\Omega, e^z]$, then*

$$\xi(p(z), zp'(z), z^2p''(z), z^3p'''(z); z) \subset \Omega \implies p(z) \prec e^z.$$

Now, we discuss the implications of the following second order differential subordination, given by

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec h(z) \implies p(z) \prec e^z. \tag{8}$$

For different choices of $h(z)$, we derive conditions on the constants $\alpha_1$ and $\alpha_2$ to ensure that (8) holds.

Considering $h(z) = (1 + Cz)/(1 + Dz)$, we have the following result.

**Theorem 3.3:** *Suppose* $\alpha_1,\ \alpha_2 > 0$ *and* $(\alpha_1 - \alpha_2)(1 - D^2) \geq e(C - D)(1 + |D|)$, *where* $-1 < D < C \leq 1$. *Consider the analytic function* $p$ *in* $\mathbb{D}$ *such that* $p(0) = 1$ *and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec \frac{1 + Cz}{1 + Dz}$$

*implies* $p(z) \prec e^z$.

***Proof:*** Suppose $h(z) = (1 + Cz)/(1 + Dz)$ for $z \in \mathbb{D}$ and

$$h(\mathbb{D}) = \Omega := \left\{ \delta \in \mathbb{C} : \left| \delta - \frac{1 - CD}{1 - D^2} \right| < \frac{C - D}{1 - D^2} \right\}.$$

We define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1 \eta_2 + \alpha_2 \eta_3$. It is clear that $\xi \in \Psi[\Omega, \Delta_e]$ if $\xi(r, s, t; z) \notin \Omega$ for $z \in \mathbb{D}$. Consider

$$\begin{aligned}
\left| \xi(r, s, t; z) - \frac{1 - CD}{1 - D^2} \right| &= \left| 1 + \alpha_1 s + \alpha_2 t - \frac{1 - CD}{1 - D^2} \right| \\
&\geq |\alpha_1 s + \alpha_2 t| - \frac{|D|(C - D)}{1 - D^2} \\
&\geq |\alpha_1 s| \operatorname{Re}\left( 1 + \frac{\alpha_2}{\alpha_1} \frac{t}{s} \right) - \frac{|D|(C - D)}{1 - D^2} \\
&\geq m\alpha_1 b(\theta) \operatorname{Re}\left( 1 + \frac{\alpha_2}{\alpha_1} (m l(\theta) + m - 1) \right) - \frac{|D|(C - D)}{1 - D^2}.
\end{aligned}$$

Here $b(\theta)$ and $l(\theta)$ are given in (4) and (6). As $m \geq 1$, therefore

$$\begin{aligned}
\left| \xi(r, s, t; z) - \frac{1 - CD}{1 - D^2} \right| &\geq \alpha_1 b(\theta) \operatorname{Re}\left( 1 + \frac{\alpha_2}{\alpha_1} l(\theta) \right) - \frac{|D|(C - D)}{1 - D^2} \\
&\geq \frac{1}{e} (\alpha_1 - \alpha_2) - \frac{|D|(C - D)}{1 - D^2} \\
&\geq \frac{C - D}{1 - D^2}.
\end{aligned}$$

Thus, $\xi \in \Psi[\Omega, \Delta_e]$. Furthermore, $p(z) \prec e^z$ through Lemma 3.1. ■

If we consider $p(z) = zf'(z)/f(z)$ in above theorem, we get the following result:

**Corollary 3.4:** *Suppose* $\alpha_1, \alpha_2 > 0$ *and* $f \in \mathcal{A}$. *Let*

$$Y_f(z) := 1 + \alpha_1(A_2 - A_1^2 + A_1) + \alpha_2(A_3 + 2A_2 + 2A_1^3 - 2A_1^2 - 3A_1A_2). \tag{9}$$

*where* $A_1 := zf'(z)/f(z)$, $A_2 := z^2f''(z)/f(z)$ *and* $A_3 := z^3f'''(z)/f(z)$. *Then,* $f(z) \in \mathcal{S}_e^*$ *if* $Y_f(z) \prec (1 + Cz)/(1 + Dz)$ *and* $(\alpha_1 - \alpha_2)(1 - D^2) \geq e(C - D)(1 + |D|)$ *whenever* $-1 < D < C \leq 1$.

**Theorem 3.5:** *Suppose* $\alpha_1, \alpha_2 > 0$ *and* ${\alpha_1}^2 - 2\alpha_1\alpha_2 + {\alpha_2}^2 - 2e\alpha_1 + 2e\alpha_2 \geq e^2$. *Consider the analytic function* $p$ *in* $\mathbb{D}$ *such that* $p(0) = 1$ *and*

$$1 + \alpha_1 zp'(z) + \alpha_2 z^2 p''(z) \prec \sqrt{1 + z}$$

*implies* $p(z) \prec e^z$.

***Proof:*** Suppose $h(z) = \sqrt{1 + z}$ for $z \in \mathbb{D}$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\delta^2 - 1| < 1\}$. Let us define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3$. It is clear that $\xi \in \Psi[\Omega, \Delta_e]$ if $\xi(r, s, t, ; z) \notin \Omega$ for $z \in \mathbb{D}$. Note that

$$\begin{aligned}
|(\xi(r, s, t; z))^2 - 1| &= |(1 + \alpha_1 s + \alpha_2 t)^2 - 1| \\
&\geq |\alpha_1 s + \alpha_2 t|(|\alpha_1 s + \alpha_2 t| - 2) \\
&\geq |\alpha_1 s| \operatorname{Re}\left(1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s}\right)\left(|\alpha_1 s| \operatorname{Re}\left(1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s}\right) - 2\right)
\end{aligned}$$

Using the fact that $m \geq 1$ and analogous to Theorem 3.3, we have

$$\begin{aligned}
|(\xi(r, s, t; z))^2 - 1| &\geq \frac{1}{e}(\alpha_1 - \alpha_2)\left(\frac{1}{e}(\alpha_1 - \alpha_2) - 2\right) \\
&= \frac{{\alpha_1}^2 - 2\alpha_1\alpha_2 + {\alpha_2}^2 - 2e\alpha_1 + 2e\alpha_2}{e^2} \\
&\geq 1.
\end{aligned}$$

Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ as a consequence of Lemma 3.1. ■

**Corollary 3.6:** *By considering* $p(z) = zf'(z)/f(z)$ *in above theorem and through (9), we deduce that* $f(z) \in \mathcal{S}_e^*$ *if* $Y_f(z) \prec \sqrt{1 + z}$ *and* ${\alpha_1}^2 - 2\alpha_1\alpha_2 + {\alpha_2}^2 - 2e\alpha_1 + 2e\alpha_2 \geq e^2$.

Next, we consider $h(z) = 2/(1 + e^{-z})$ and $z + \sqrt{1 + z^2}$ in the coming results.

**Theorem 3.7:** *Suppose* $\alpha_1, \alpha_2 > 0$ *and* $\alpha_1 - \alpha_2 \geq er_0$, *where* $r_0 \approx 0.546302$ *is the positive root of the equation* $r^2 + 2\cot(1)r - 1 = 0$. *Consider the analytic function* $p$ *in* $\mathbb{D}$ *such that* $p(0) = 1$ *and*

$$1 + \alpha_1 zp'(z) + \alpha_2 z^2 p''(z) \prec \frac{2}{1 + e^{-z}}$$

*implies* $p(z) \prec e^z$.

***Proof:*** Suppose $h(z) = 2/(1+e^{-z})$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\log(\delta/(2-\delta))| < 1\}$. Define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3$. We know that $\xi \in \Psi[\Omega, \Delta_e]$ only when $\xi(r, s, t; z) \notin \Omega$. First we consider,

$$\begin{aligned}|\alpha_1 s + \alpha_2 t| &= \alpha_1|s|\left|1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s}\right| \\ &\geq \alpha_1|s|\,\mathrm{Re}\left(1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s}\right) \\ &\geq m\alpha_1 b(\theta)\left(1 + \frac{\alpha_2}{\alpha_1}(ml(\theta) + m - 1)\right).\end{aligned}$$

As $m \geq 1$, we obtain

$$\begin{aligned}|\alpha_1 s + \alpha_2 t| &\geq b(\theta)(\alpha_1 + \alpha_2 l(\theta)) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2) \\ &\geq r_0. \end{aligned} \tag{10}$$

Now, we consider

$$\left|\log\left(\frac{\xi(r, s, t; z)}{2 - \xi(r, s, t; z)}\right)\right| = \left|\log\left(\frac{1 + \alpha_1 s + \alpha_2 t}{1 - (\alpha_1 s + \alpha_2 t)}\right)\right|.$$

Through Lemma 2.4 and (10), we have

$$\left|\log\left(\frac{1 + \alpha_1 s + \alpha_2 t}{1 - (\alpha_1 s + \alpha_2 t)}\right)\right| \geq 1,$$

which implies that $\xi \in \Psi[\Omega, \Delta_e]$. Therefore, $p(z) \prec e^z$ using Lemma 3.1. ■

**Theorem 3.8:** *Suppose $\alpha_1, \alpha_2 > 0$ and $\alpha_1 - \alpha_2 \geq \sqrt{2}e$. Let $p$ be an analytic function in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec z + \sqrt{1 + z^2}$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = z + \sqrt{1+z^2}$ for $z \in \mathbb{D}$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\delta^2 - 1| < 2|\delta|\}$. We define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3$. For $\xi \in \Psi[\Omega, \Delta_e]$, we must have $\xi(r, s, t; z) \notin \Omega$. From the graph of $z + \sqrt{1+z^2}$ (see Figure 1), we note that $\Omega$ is constructed by the circles $C_1$ and $C_2$, given by

$$C_1 : |z - 1| = \sqrt{2} \quad \text{and} \quad C_2 : |z + 1| = \sqrt{2}.$$

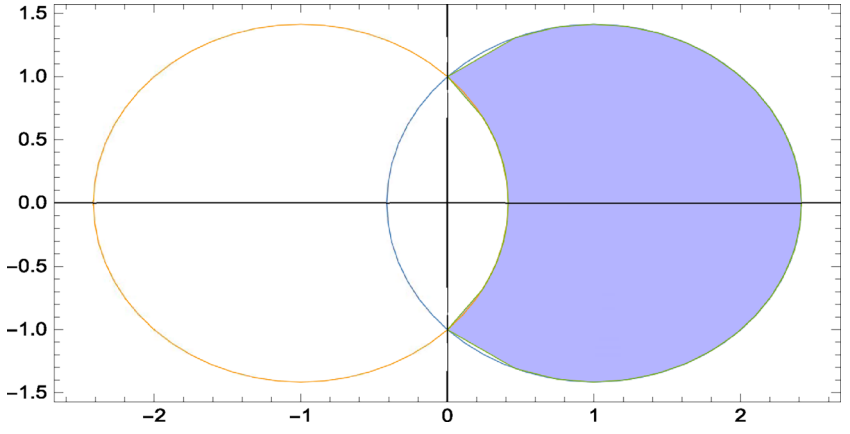


**Figure 1.** Graph of two circles, namely $C_1$ (blue boundary) and $C_2$ (orange boundary). While the shaded region (solid purple) represents $z + \sqrt{1+z^2}$.

It is obvious that $\Omega$ contains the disk enclosed by $C_1$ and excludes the portion of the disk enclosed by $C_2 \cap C_1$. We have

$$|\xi(r, s, t; z) - 1| = |\alpha_1 s + \alpha_2 t|.$$

Analogous to Theorem 3.7, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t| &\geq b(\theta)(\alpha_1 + \alpha_2 l(\theta)) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2) \\ &\geq \sqrt{2}. \end{aligned}$$

The fact that $\xi(r, s, t; z) \notin C_1$ suffices us to deduce that $\xi(r, s, t; z) \notin \Omega$. Consequently, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by using Lemma 3.1. ■

Now, if we choose $h(z)$ to be $1 + \sin z$ and $1 + ze^z$, we derive the conditions on $\alpha_1$ and $\alpha_2$ as follows:

**Theorem 3.9:** *Suppose* $\alpha_1, \alpha_2 > 0$ *and* $\alpha_1 - \alpha_2 \geq e \sinh 1$. *Let* $p$ *be an analytic function in* $\mathbb{D}$ *such that* $p(0) = 1$ *and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec 1 + \sin z$$

*implies* $p(z) \prec e^z$.

***Proof:*** Suppose $h(z) = 1 + \sin z$ for $z \in \mathbb{D}$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\arcsin(\delta - 1)| < 1\}$. Define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1 \eta_2 + \alpha_2 \eta_3$. For $\xi \in \Psi[\Omega, \Delta_e]$, we must have $\xi(r, s, t; z) \notin \Omega$. Through [4, Lemma 3.3], we note that the smallest disk

containing $\Omega$ is $\{w \in \mathbb{C} : |w-1| < \sinh 1\}$. So,

$$|\xi(r,s,t;z) - 1| = |\alpha_1 s + \alpha_2 t|.$$

Analogous to Theorem 3.7, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t| &\geq b(\theta)(\alpha_1 + \alpha_2 l(\theta)) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2) \\ &\geq \sinh 1. \end{aligned}$$

Clearly, $\xi(r,s,t;z) \notin \{w \in \mathbb{C} : |w-1| < \sinh 1\}$ which is enough to conclude that $\xi(r,s,t;z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ through Lemma 3.1. ■

**Theorem 3.10:** *Suppose $\alpha_1, \alpha_2 > 0$ and $\alpha_1 - \alpha_2 \geq e^2$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec 1 + z e^z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = 1 + ze^z$ for $z \in \mathbb{D}$ and $\Omega = h(\mathbb{D})$. Let us define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1 \eta_2 + \alpha_2 \eta_3$. For $\xi \in \Psi[\Omega, \Delta_e]$, we need to have $\xi(r,s,t;z) \notin \Omega$. Through [6, Lemma 3.3], we observe that the smallest disk containing $\Omega$ is $\{w \in \mathbb{C} : |w-1| < e\}$. Thus

$$|\xi(r,s,t;z) - 1| = |\alpha_1 s + \alpha_2 t|.$$

Analogous to Theorem 3.7, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t| &\geq b(\theta)(\alpha_1 + \alpha_2 l(\theta)) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2) \\ &\geq e. \end{aligned}$$

Clearly, $\xi(r,s,t;z) \notin \{w \in \mathbb{C} : |w-1| < e\}$ which suffices us to conclude that $\xi(r,s,t;z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by using Lemma 3.1. ■

Now, we conclude the results of second order differential subordination implications by choosing $h(z)$ to be $1 + \sinh^{-1} z$ and $e^z$ itself, followed by its subsequent corollary.

**Theorem 3.11:** *Suppose $\alpha_1, \alpha_2 > 0$ and $2(\alpha_1 - \alpha_2) \geq \pi e$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec 1 + \sinh^{-1} z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = 1 + \sinh^{-1} z$ for $z \in \mathbb{D}$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\sinh(\delta - 1)| < 1\}$. We define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3$. For $\xi \in \Psi[\Omega, \Delta_e]$, we must have $\xi(r, s, t; z) \notin \Omega$. Through [3, Remark 2.7], we note that the disk $\{w \in \mathbb{C} : |w - 1| < \pi/2\}$ is the smallest disk containing $\Omega$. So,

$$|\xi(r, s, t; z) - 1| = |\alpha_1 s + \alpha_2 t|.$$

Analogous to Theorem 3.7, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t| &\geq b(\theta)(\alpha_1 + \alpha_2 l(\theta)) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2) \\ &\geq \frac{\pi}{2}. \end{aligned}$$

Clearly, $\xi(r, s, t; z)$ does not belong to the disk $\{w \in \mathbb{C} : |w - 1| < \pi/2\}$ which suffices us to conclude that $\xi(r, s, t; z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by using Lemma 3.1. ■

**Theorem 3.12:** *Suppose $\alpha_1, \alpha_2 > 0$ and $\alpha_1 - \alpha_2 \geq e(e - 1)$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) \prec e^z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = e^z$ for $z \in \mathbb{D}$ and $\Omega = \Delta_e$. Define $\xi : \mathbb{C}^3 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3$. For $\xi \in \Psi[\Delta_e, \Delta_e]$, we must have $\xi(r, s, t; z) \notin \Delta_e$. So,

$$|\xi(r, s, t; z) - 1| = |\alpha_1 s + \alpha_2 t|.$$

Analogous to Theorem 3.7, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t| &\geq b(\theta)(\alpha_1 + \alpha_2 l(\theta)) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2) \\ &\geq e - 1. \end{aligned} \tag{11}$$

Further, we have

$$|\log(\xi(r, s, t; z)| = |\log(1 + \alpha_1 s + \alpha_2 t)|.$$

Through Lemma 2.3 and (11), we have

$$|\log(1 + \alpha_1 s + \alpha_2 t)| \geq 1,$$

which implies that $\xi(r, s, t; z) \notin \Delta_e$. Therefore, $\xi \in \Psi[\Delta_e, \Delta_e]$ and thus $p(z) \prec e^z$ through Lemma 3.1. ■

Theorems 3.7–3.12 yield the following conclusion if $p(z) = zf'(z)/f(z)$ is considered as in (9).

**Corollary 3.13:** *Suppose $\alpha_1, \alpha_2 > 0$ and $f \in \mathcal{A}$. Then, $f \in \mathcal{S}_e^*$ if any of the conditions hold:*

(i) $Y_f(z) \prec 2/(1+e^{-z})$ *and* $\alpha_1 - \alpha_2 \geq er_0$, *where* $r_0 \approx 0.546302$ *is the positive root of the equation* $r^2 + 2\cot(1)r - 1 = 0$.
(ii) $Y_f(z) \prec z + \sqrt{1+z^2}$ *and* $\alpha_1 - \alpha_2 \geq \sqrt{2}e$.
(iii) $Y_f(z) \prec 1 + \sin z$ *and* $\alpha_1 - \alpha_2 \geq e \sinh 1$.
(iv) $Y_f(z) \prec 1 + ze^z$ *and* $\alpha_1 - \alpha_2 \geq e^2$.
(v) $Y_f(z) \prec 1 + \sinh^{-1} z$ *and* $2(\alpha_1 - \alpha_2) \geq \pi e$.
(vi) $Y_f(z) \prec e^z$ *and* $\alpha_1 - \alpha_2 \geq e(e-1)$.

Lastly, we conclude this article by determining the sufficient conditions on $\alpha_1$, $\alpha_2$ and $\alpha_3 \in \mathbb{R}^+$ involving the constants $m$ and $k$ (defined in Lemma 1.2) to satisfy the third order differential subordination implication, given by

$$1 + \alpha_1 zp'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec h(z) \implies p(z) \prec e^z.$$

We obtain the following result upon considering $h(z) = (1+Cz)/(1+Dz)$.

**Theorem 3.14:** *Suppose $\alpha_1, \alpha_2, \alpha_3 > 0$ and $(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3)(1-D^2) \geq e(1+|D|)(C-D)$ where $-1 < D < C \leq 1$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 zp'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec \frac{1+Cz}{1+Dz}$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = (1+Cz)/(1+Dz)$ for $z \in \mathbb{D}$ and

$$h(\mathbb{D}) = \Omega := \left\{ \delta \in \mathbb{C} : \left| \delta - \frac{1-CD}{1-D^2} \right| < \frac{C-D}{1-D^2} \right\}.$$

Define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Omega, \Delta_e]$, it is needed that $\xi(r,s,t,u;z) \notin \Omega$ for $z \in \mathbb{D}$. Consider

$$\begin{aligned}
\left| \xi(r,s,t,u;z) - \frac{1-CD}{1-D^2} \right| &= \left| 1 + \alpha_1 s + \alpha_2 t + \alpha_3 u - \frac{1-CD}{1-D^2} \right| \\
&\geq |\alpha_1 s + \alpha_2 t + \alpha_3 u| - \frac{|D|(C-D)}{1-D^2} \\
&\geq |\alpha_1 s| \operatorname{Re}\left( 1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s} + \frac{\alpha_3}{\alpha_1}\frac{u}{s} \right) - \frac{|D|(C-D)}{1-D^2} \\
&\geq m\alpha_1 b(\theta) \left( 1 + \frac{\alpha_2}{\alpha_1}(ml(\theta) + m - 1) + \frac{\alpha_3}{\alpha_1}(m^2 h(\theta) \right. \\
&\quad \left. + 3m(k-1)l(\theta)) \right) - \frac{|D|(C-D)}{1-D^2}.
\end{aligned}$$

As $m \geq 1$ and $\mathrm{Re}(1 + l(\theta)) > 0$, we get

$$\begin{aligned}\left|\xi(r,s,t,u;z) - \frac{1-CD}{1-D^2}\right| &\geq \alpha_1 b(\theta)\left(1 + \frac{\alpha_2}{\alpha_1}l(\theta) + \frac{\alpha_3}{\alpha_1}(m^2h(\theta) + 3m(k-1)l(\theta))\right) \\ &\quad - \frac{|D|(C-D)}{1-D^2} \\ &\geq \frac{1}{e}\left(\alpha_1 - \alpha_2 - \alpha_3(m^2 + 3m(k-1))\right) - \frac{|D|(C-D)}{1-D^2} \\ &\geq \frac{C-D}{1-D^2}.\end{aligned}$$

From the above calculations, we conclude that $\xi \in \Psi[\Omega, \Delta_e]$ and hence $p(z) \prec e^z$ through Lemma 3.2. ■

**Corollary 3.15:** *Suppose $\alpha_1, \alpha_2, \alpha_3 > 0$ and $f \in \mathcal{A}$. Let*

$$\begin{aligned}\chi_f(z) := 1 &+ \alpha_1 A_1 + (\alpha_1 + 2\alpha_2)(A_2 - A_1^2) + (\alpha_2 + 3\alpha_3)(2A_1^3 - 3A_1A_2 + 3A_3) \\ &+ \alpha_3(A_4 - 3A_2^2 - (6A_1)^4 - 4A_1A_3 + 12A_1^2A_2),\end{aligned} \tag{12}$$

*where $A_1$, $A_2$, $A_3$ are same as defined in Corollary 3.4 and $A_4 := z^4 f^{(iv)}(z)/f(z)$. Then, $f(z) \in \mathcal{S}_e^*$ if $\chi_f(z) \prec (1 + Cz)/(1 + Dz)$ and $(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m\alpha_3(k-1))(1 - D^2) \geq e(1 + |D|)(C - D)$ whenever $-1 < D < C \leq 1$.*

**Theorem 3.16:** *Suppose $\alpha_1$, $\alpha_2$ and $\alpha_3$ be positive real numbers and $(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3)(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 - 2e) \geq e^2$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec \sqrt{1+z}$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = \sqrt{1+z}$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\delta^2 - 1| < 1\}$. Consider $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ defined as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. We know that $\xi \in \Psi[\Omega, \Delta_e]$ if $\xi(r,s,t,u;z) \notin \Omega$ for $z \in \mathbb{D}$. Consider

$$\begin{aligned}&|(\xi(r,s,t,u;z))^2 - 1| \\ &= |(1 + \alpha_1 s + \alpha_2 t + \alpha_3 u)^2 - 1| \\ &\geq |\alpha_1 s + \alpha_2 t + \alpha_3 u|(|\alpha_1 s + \alpha_2 t + \alpha_3 u| - 2) \\ &\geq |\alpha_1 s|\,\mathrm{Re}\left(1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s} + \frac{\alpha_3}{\alpha_1}\frac{u}{s}\right)\left(|\alpha_1 s|\,\mathrm{Re}\left(1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s} + \frac{\alpha_3}{\alpha_1}\frac{u}{s}\right) - 2\right).\end{aligned}$$

Analogous to the proof of Theorem 3.14 and the fact that $m \geq 1$, we obtain

$$\begin{aligned}|(\xi(r,s,t,u;z))^2 - 1| &\geq \alpha_1 b(\theta)\left(1 + \frac{\alpha_2}{\alpha_1}l(\theta) + \frac{\alpha_3}{\alpha_1}(m^2h(\theta) + 3m(k-1)l(\theta))\right) \times \\ &\quad \left(\alpha_1 b(\theta)\left(1 + \frac{\alpha_2}{\alpha_1}l(\theta) + \frac{\alpha_3}{\alpha_1}(m^2h(\theta) + 3m(k-1)l(\theta))\right) - 2\right) \\ &\geq \frac{1}{e^2}\left(\alpha_1 - \alpha_2 - \alpha_3(m^2 + 3m(k-1))\right)\left(\alpha_1 - \alpha_2 - \alpha_3(m^2\right. \\ &\quad \left. +3m(k-1)) - 2e\right) \\ &\geq 1.\end{aligned}$$

This implies that $\xi \in \Psi[\Omega, \Delta_e]$. Thus, $p(z) \prec e^z$ as a consequence of Lemma 3.2. ■

**Corollary 3.17:** *By considering $p(z) = zf'(z)/f(z)$ in above theorem and through (12), we deduce that $f(z) \in \mathcal{S}_e^*$ if $\chi_f(z) \prec \sqrt{1+z}$ and $(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m\alpha_3(k-1))(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 - 2e) \geq e^2$.*

The next two results deal with the case when $h(z) = 2/(1+e^{-z})$ and $z + \sqrt{1+z^2}$.

**Theorem 3.18:** *Suppose $\alpha_1, \alpha_2, \alpha_3 > 0$ and $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq er_0$, where $r_0 \approx 0.546302$ is the positive root of the equation $r^2 + 2\cot(1)r - 1 = 0$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 zp'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec \frac{2}{1+e^{-z}}$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = 2/(1+e^{-z})$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\log(\delta/(2-\delta))| < 1\}$. Define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Omega, \Delta_e]$, it is required that $\xi(r,s,t,u;z) \notin \Omega$. Consider

$$\begin{aligned}&|\alpha_1 s + \alpha_2 t + \alpha_3 u| \\ &= \alpha_1|s|\left|1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s} + \frac{\alpha_3}{\alpha_1}\frac{u}{s}\right| \\ &\geq \alpha_1|s|\,\mathrm{Re}\left(1 + \frac{\alpha_2}{\alpha_1}\frac{t}{s} + \frac{\alpha_3}{\alpha_1}\frac{u}{s}\right) \\ &\geq m\alpha_1 b(\theta)\left(1 + \frac{\alpha_2}{\alpha_1}(ml(\theta) + m - 1) + \frac{\alpha_3}{\alpha_1}(m^2h(\theta) + 3m(k-1)l(\theta))\right).\end{aligned}$$

As $m \geq 1$ and $\mathrm{Re}(1 + l(\theta)) > 0$, we have

$$\begin{aligned}|\alpha_1 s + \alpha_2 t + \alpha_3 u| &\geq b(\theta)\left(\alpha_1 + \alpha_2 l(\theta) + \alpha_3(m^2h(\theta) + 3m(k-1)l(\theta))\right) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \\ &\geq r_0. \qquad (13)\end{aligned}$$

Next, we consider

$$\left|\log\left(\frac{\xi(r,s,t,u;z)}{2-\xi(r,s,t,u;z)}\right)\right| = \left|\log\left(\frac{1+\alpha_1 s+\alpha_2 t+\alpha_3 u}{1-(\alpha_1 s+\alpha_2 t+\alpha_3 u)}\right)\right|.$$

Through Lemma 2.4 and (13), we have

$$\left|\log\left(\frac{1+\alpha_1 s+\alpha_2 t+\alpha_3 u}{1-(\alpha_1 s+\alpha_2 t+\alpha_3 u)}\right)\right| \geq 1.$$

Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and $p(z) \prec e^z$ as a consequence of Lemma 3.2. ■

**Theorem 3.19:** *Suppose $\alpha_1, \alpha_2, \alpha_3 > 0$ and $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq \sqrt{2}e$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec z + \sqrt{1+z^2}$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = z + \sqrt{1+z^2}$ for $z \in \mathbb{D}$ and thus $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\delta^2 - 1| < 2|\delta|\}$. Define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Omega, \Delta_e]$, we must have $\xi(r,s,t,u;z) \notin \Omega$. From the graph of $z + \sqrt{1+z^2}$ (see Figure 1), we note that $\Omega$ is constructed by two circles $C_1$ and $C_2$, given by

$$C_1 : |z-1| = \sqrt{2} \quad \text{and} \quad C_2 : |z+1| = \sqrt{2}.$$

It is obvious that $\Omega$ contains the disk enclosed by $C_1$ and excludes the portion of the disk enclosed by $C_2 \cap C_1$. We have

$$|\xi(r,s,t,u;z) - 1| = |\alpha_1 s + \alpha_2 t + \alpha_3 u|.$$

Similar to the proof of Theorem 3.18, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t + \alpha_3 u| &\geq b(\theta)\left(\alpha_1 + \alpha_2 l(\theta) + \alpha_3(m^2 h(\theta) + 3m(k-1)l(\theta))\right) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \\ &\geq \sqrt{2}. \end{aligned}$$

Thus, we can say that $\xi(r,s,t,u;z)$ does not belong to the circle $C_1$ which suffices us to deduce that $\xi(r,s,t,u;z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by using Lemma 3.2. ■

If we take $h(z)$ to be $1 + \sin z$ and $1 + ze^z$, the results are as follow:

**Theorem 3.20:** *Suppose $\alpha_1$, $\alpha_2$, $\alpha_3 > 0$ and $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq e \sinh 1$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec 1 + \sin z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = 1 + \sin z$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\arcsin(\delta - 1)| < 1\}$. Let us define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Omega, \Delta_e]$, it is required that $\xi(r, s, t, u; z) \notin \Omega$. Through [4, Lemma 3.3], we note that the smallest disk containing $\Omega$ is $\{w : |w \in \mathbb{C} - 1| < \sinh 1\}$. So,

$$|\xi(r, s, t, u; z) - 1| = |\alpha_1 s + \alpha_2 t + \alpha_3 u|.$$

Analogous to the proof of Theorem 3.18, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t + \alpha_3 u| &\geq b(\theta)\left(\alpha_1 + \alpha_2 l(\theta) + \alpha_3(m^2 h(\theta) + 3m(k-1)l(\theta))\right) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \\ &\geq \sinh 1. \end{aligned}$$

Clearly, $\xi(r, s, t, u; z)$ does not belong to the disk $\{w \in \mathbb{C} : |w - 1| < \sinh 1\}$ indicates that $\xi(r, s, t, u; z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by employing Lemma 3.2. ■

**Theorem 3.21:** *Suppose $\alpha_1$, $\alpha_2$, $\alpha_3 > 0$ and $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq e^2$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec 1 + ze^z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = 1 + ze^z$ and $\Omega = h(\mathbb{D})$. We define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Omega, \Delta_e]$, we need to have that $\xi(r, s, t, u; z) \notin \Omega$. Through [6, Lemma 3.3], we note that the smallest disk containing $\Omega$ is $\{w \in \mathbb{C} : |w - 1| < e\}$. Also,

$$|\xi(r, s, t, u; z) - 1| = |\alpha_1 s + \alpha_2 t + \alpha_3 u|.$$

Analogous to the proof of Theorem 3.18, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t + \alpha_3 u| &\geq b(\theta)\left(\alpha_1 + \alpha_2 l(\theta) + \alpha_3(m^2 h(\theta) + 3m(k-1)l(\theta))\right) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \\ &\geq e. \end{aligned}$$

Clearly, $\xi(r, s, t, u; z)$ does not belong to the disk $\{w \in \mathbb{C} : |w - 1| < e\}$, is enough to conclude that $\xi(r, s, t, u; z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by using Lemma 3.2. ■

We complete this section by considering $h(z) = 1 + \sinh^{-1} z$ and $e^z$ itself which are followed by a resulting corollary.

**Theorem 3.22:** *Suppose $\alpha_1$, $\alpha_2$, $\alpha_3 > 0$ and $2(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \geq \pi e$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec 1 + \sinh^{-1} z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = 1 + \sinh^{-1} z$ and $h(\mathbb{D}) = \Omega := \{\delta \in \mathbb{C} : |\sinh(\delta - 1)| < 1\}$. Define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Omega, \Delta_e]$, it is required that $\xi(r, s, t, u; z) \notin \Omega$. Through [3, Remark 2.7], we note that the smallest disk containing $\Omega$ is $\{w \in \mathbb{C} : |w - 1| < \pi/2\}$. So,

$$|\xi(r, s, t, u; z) - 1| = |\alpha_1 s + \alpha_2 t + \alpha_3 u|.$$

Similar to the proof of Theorem 3.18, we have

$$\begin{aligned} |\alpha_1 s + \alpha_2 t + \alpha_3 u| &\geq b(\theta)\left(\alpha_1 + \alpha_2 l(\theta) + \alpha_3(m^2 h(\theta) + 3m(k-1)l(\theta))\right) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \\ &\geq \frac{\pi}{2}. \end{aligned}$$

Clearly, $\xi(r, s, t, u; z) \notin \{w \in \mathbb{C} : |w - 1| < \pi/2\}$ which suffices to prove that $\xi(r, s, t, u; z) \notin \Omega$. Therefore, $\xi \in \Psi[\Omega, \Delta_e]$ and thus $p(z) \prec e^z$ by Lemma 3.2. ■

**Theorem 3.23:** *Suppose $\alpha_1, \alpha_2, \alpha_3 > 0$ and $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq e(e-1)$. Consider the analytic function $p$ in $\mathbb{D}$ such that $p(0) = 1$ and*

$$1 + \alpha_1 z p'(z) + \alpha_2 z^2 p''(z) + \alpha_3 z^3 p'''(z) \prec e^z$$

*implies $p(z) \prec e^z$.*

***Proof:*** Suppose $h(z) = e^z$ and $\Omega = \Delta_e$. We define $\xi : \mathbb{C}^4 \times \mathbb{D} \to \mathbb{C}$ as $\xi(\eta_1, \eta_2, \eta_3, \eta_4; z) = 1 + \alpha_1\eta_2 + \alpha_2\eta_3 + \alpha_3\eta_4$. For $\xi \in \Psi[\Delta_e, \Delta_e]$, it is necessary to have $\xi(r, s, t, u; z) \notin \Delta_e$. So,

$$|\xi(r, s, t, u; z) - 1| = |\alpha_1 s + \alpha_2 t + \alpha_3 u|.$$

Similar to Theorem 3.18, we get

$$\begin{aligned} |\alpha_1 s + \alpha_2 t + \alpha_3 u| &\geq b(\theta)\left(\alpha_1 + \alpha_2 l(\theta) + \alpha_3(m^2 h(\theta) + 3m(k-1)l(\theta))\right) \\ &\geq \frac{1}{e}(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \\ &\geq e - 1. \end{aligned} \tag{14}$$

Next, we consider

$$|\log(\xi(r, s, t, u; z)| = |\log(1 + \alpha_1 s + \alpha_2 t + \alpha_3 u)|.$$

Through Lemma 2.3 and (14), we have

$$|\log(1 + \alpha_1 s + \alpha_2 t + \alpha_3 u)| \geq 1,$$

which implies that $\xi(r, s, t, u; z) \notin \Delta_e$. Therefore, $\xi \in \Psi[\Delta_e, \Delta_e]$ and thus $p(z) \prec e^z$. ■

Theorems 3.18–3.23 yield the following conclusion if $p(z) = zf'(z)/f(z)$ is considered as in (12).

**Corollary 3.24:** *Suppose $\alpha_1$, $\alpha_2$ and $\alpha_3$ be positive real numbers with $f \in \mathcal{A}$. Then, $f(z) \in \mathcal{S}_e^*$ if any of these conditions hold:*

(i) $\chi_f(z) \prec 2/(1+e^{-z})$ *and* $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq er_0$, *where* $r_0 \approx 0.546302$ *is the positive root of the equation* $r^2 + 2\cot(1)r - 1 = 0$.
(ii) $\chi_f(z) \prec z + \sqrt{1+z^2}$ *and* $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq \sqrt{2}e$.
(iii) $\chi_f(z) \prec 1 + \sin z$ *and* $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq e\sinh 1$.
(iv) $\chi_f(z) \prec 1 + ze^z$ *and* $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq e^2$.
(v) $\chi_f(z) \prec 1 + \sinh^{-1} z$ *and* $2(\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3) \geq \pi e$.
(vi) $\chi_f(z) \prec e^z$ *and* $\alpha_1 - \alpha_2 - m^2\alpha_3 - 3m(k-1)\alpha_3 \geq e(e-1)$.

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# Enhancing material removal of TACAFM process through improved electrode geometry

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**Abstract.** The continuous melting and erosion of centrifugal force generating electrode is a major challenge in Thermal Additive Centrifugal Abrasive Flow Machining (TACAFM) process, which is a latest hybrid of abrasive flow machining process (AFM). The straight spline electrode is difficult to fabricate and need to be replaced after fixed number of cycle which hamper the machining effectiveness. To overcome this issue, a novel square-shaped electrode is proposed in this investigation which is easy to fabricate. ANSYS Fluent is used to analyse flow parameters' effect, and experimental validation is done using artificial neural network (ANN) optimisation. The input parameters for the experimentation were the supply current, rotational Speed and the number of extrusions whose effects were studied on material removal (MR) and percentage improvement in the surface finish ($\%\Delta R_a$). The experimental results validate the simulation results with average experimental value of MR being 9.76 mg and that for $\%\Delta R_a$ is 42.12 percent with the corresponding predicted value of 9.75 mg and 42.13 percent obtained from ANN modelling. The proposed electrode justifies its suitability with the TACAFM process with the cumulative average percentage absolute error of 0.24 percent for MR and 0.13 percent for $\%\Delta R_a$. The scanning electron microscopy (SEM) images and X-ray diffraction (XRD) results justify the machining process with the spark generation.

**Keywords.** AFM; TACAFM; material removal; surface roughness; ANSYS FLUENT[@].

## 1. Introduction

TACAFM is the most recent hybrid of AFM which improves its machining capability but the continuous melting and erosion of centrifugal force generating (CFG) electrode due to spark energy is a major challenge in the process. The spline shape electrode used in the process is difficult to fabricate and hence requires conventional shapes CFG electrodes. To overcome this major limitation, the researchers proposed a novel square-shaped electrode for this process.

AFM is one of the prominent Nano-finishing processes which finishes the internal surface of the hollow workpiece and the intrinsic hard-to-reach surface of the workpiece. The process uses a non-newtonian abrasive laden media, a mixture of abrasive, gel and polymers. The media reciprocates through a constrictive path under the extrusion pressure applied at the media cylinder's top and bottom. The machining of the workpiece's internal surface occurs through the abrasion of the abrasive particles over the surface of the workpiece. With time, there is development in the conventional AFM process. Bhardwaj *et al* [1] highlighted the role of various hybrid processes of conventional AFM in improving MR and $\%\Delta R_a$. The various hybrids developed so far are centrifugal force-assisted AFM process (CFAAFM) [2], drill-bit guided AFM [3], helical AFM [4], rotational AFM [5], magnetic force-assisted AFM (MFAFM) [6], ultrasonic force-assisted AFM [7], electrochemical force-assisted AFM (ECMAFM) [8], hybrid of MFAFM and CFAAFM [9], hybrid of ECMAFM and CFAAFM PROCESS [10]. TACAFM [11–13] process is a recent hybrid of AFM, which uses spark energy along with the centrifugal force produced by CFG electrodes for achieving requisite MR and $R_a$. This hybrid of AFM enhances MR, which is one of the significant limitations of the conventional AFM process.

The media used in the AFM process plays a crucial role in improving machining parameters. Many researchers worked on the viscoelastic media and improved its property for enhancing the material removal process. Ali *et al* [14] used carbon nano tube (CNT) particles along with the alumina Abrasives to improve the MR property of the media. The researcher observed a drastic improvement in the MR and $\%\Delta R_a$ compared to the traditional AFM Process. Dixit *et al* [15] prepared a new xanthan gum-based media and observed its MR characteristics. The researchers

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concluded that the developed media is physically and thermally stable for its application in the AFM process. Yadav *et al* [16] reported the behavior of media used in the AFM process. Fu *et al* [17] developed a novel media for the finishing process and reported its successful implementation in the AFM process. Zhang *et al* [18] developed a novel media based on water-silicon for AFM and reported the enhancement in MR and $\%\Delta R_a$.

Considering the popularity of AFM process in the industries of aerospace, automobile and biomedical [1], sincere efforts have been made to improve the process capability and efficiency of the AFM process along with its hybrids. Many researchers focused their attention towards mathematical modelling and computing. Bhardwaj *et al* studied the flow parameters involved in AFM and validated the simulation results with experiments [19, 20]. The variation in media property due to flow conditions is a critical parameter in AFM and plays a vital role in the machining parameters. Considering this aspect, many scholars directed their research to mathematical simulations optimizing the process parameters for machining [21, 22].

AFM plays a crucial role in modern machining applications, and its key roles have been jotted down in the most recent research. Manjunath *et al* [23] used AFM to finish the aluminum propeller. Rajender *et al* [24] developed a novel fixture for finishing metallic rings using AFM and discussed the morphology of the finished surface. Han *et al* jotted the application of AFM to finish conformal channels formed during the selective laser finishing process and discussed its surface morphology [25, 26]. Kuma *et al* [27] studied the MR mechanism during the machining of metal components by the AFM process. Krishna *et al* [28] used AFM to machine SS 304L and optimized the process parameter using grey analysis and the Taguchi method. Hasmi *et al* [29] applied the AFM process to finishing hollow truncated cones developed by FDM (fused deposition techniques). Mohseni *et al* [30] developed the mathematical model of magnetic force-assisted AFM and predicted the behavior of media using simulations. Zhang *et al* [31] studied the rheological behavior of media used in the AFM process.

The recent advancement and continuous development of AFM have prompted the authors to consider AFM as a research subject. However, considerable machining time with low MR were the central concerns [32, 33]. Bhardwaj *et al* [34] highlighted the effect of various geometry of CFG electrode in enhancing the performance of CFAAFM process. The researchers compared the material removal process using square, triangular and rectangular electrode and highlighted the improvement in machining process. To overcome the issue of low MR of conventional AFM process, the TACAFM came into the picture and to improve its process efficiency, the researchers proposed a novel square-shaped electrode which enhances MR, improves surface quality and provides ease in the fabrication and cost of the initial CFG electrode used in the TACAFM process.

### 1.1 *Mechanism of spark formation*

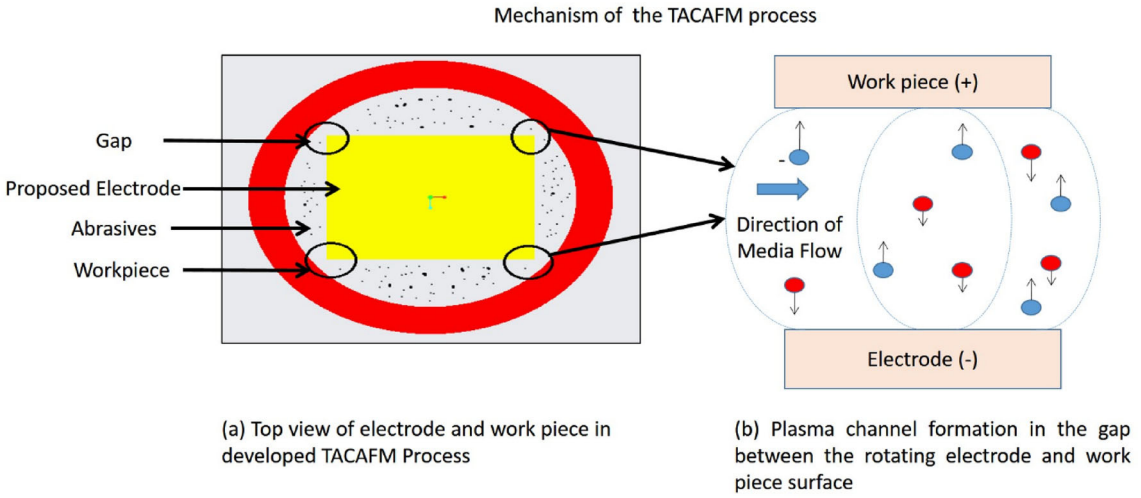
TACAFM Process uses the spark energy along with the CFAAFM process for enhancing the MR mechanism of traditional AFM. The workpiece and the CFG electrode are given positive and negative terminals of the Pulsed DC (direct current). A minimal gap is maintained between the rotating electrode and the workpiece. As the media (dielectric) passes between them, there is a generation of sparks, which results in the melting and MR process. Figure 1 (i) shows the mechanism of spark formation for the TACAFM process, when the pulsed DC supply is given to the workpiece and the rotating electrode, the electrons from the electrode tend to move towards the workpiece due to the repulsive nature of similar polarity. The movement of electrons causes the ionisation of media particles which further results in the formation of plasma channels due to increased ionisation of media. The development of plasma results in spark generation, which produces intense heat that results in material melting from the workpiece surface. Thus, the requisite material removal is achieved by the melting and erosion process. With the rotation of the proposed square shape CFG electrode and the axial movement of media, effective machining takes place [11–13].

Figure 1 (ii) shows the schematic diagram of the proposed TACAFM process. The media is extruded from upper to lower cylinder due to the pressure difference between the upper cylinder and the lower cylender. This extrusion of media acclerates the MR process due to the abraison of abrasive particle within the internal surface of the workpiece. The electrode present in the system is rotated which produces centrifugal action in the media which inturn results in the abrasive and workpiece interactions which further acclerates the MR process.

The TACAFM process consists of workpiece and electrode as the terminal. The pulsed DC supply as discussed in the mechanism generates the spark which results in material removal through melting and also will soften the surface of the workpiece. The abrasive strikes the surface of the soft workpiece and enhances the overall material removal.

## 2. Materials and methods

The square shape electrode is proposed for the TACAFM process in place of the spline shape electrode for efficient functioning of the TACAFM process. The initial feasibility of spark generation by the proposed electrode was checked by simulation and modelling. The initial modelling was done on CREO 3.0 and the simulation was done on ANSYS 22. Experiments were performed to finish the brass workpiece and are further validated by ANN modelling.



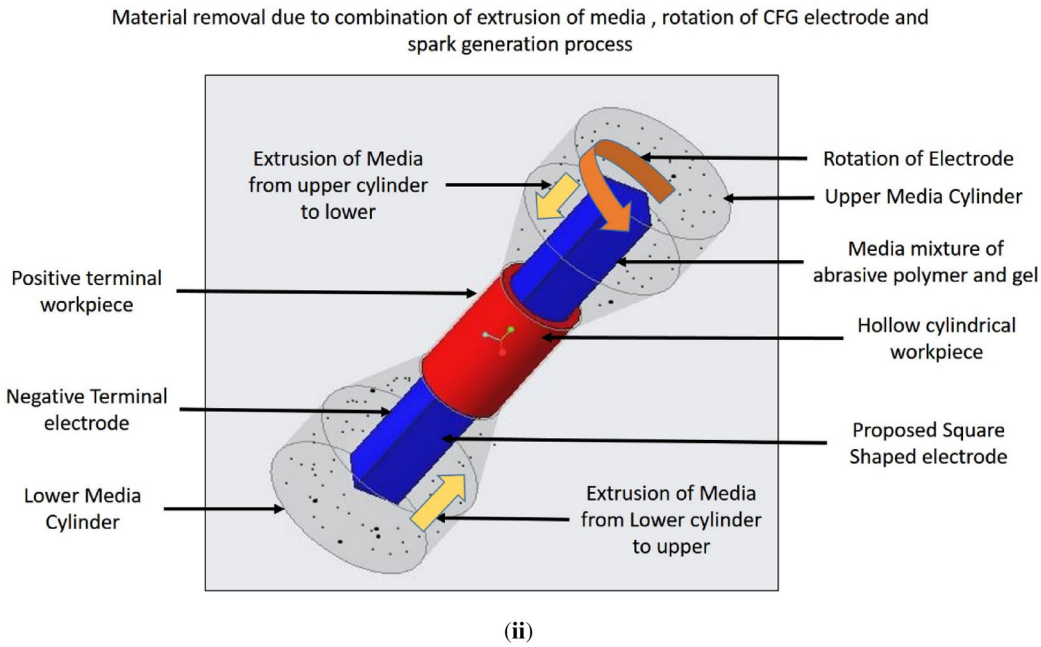




**Figure 1.** TACAFM process (i) Mechanism of spark formation and (ii) Schematic diagram of TACAFM Process.

## 2.1 *Modelling and simulations*

The simulation setup is prepared using ANSYS Fluent. The simulation is dynamic in nature. The TACAFM process involves the reciprocation of media within the internal surface of the workpiece. This media is a mixture of gel, polymer and abrasive which makes it so viscous that it moves with a very less speed within the internal surface of the workpiece and as a result the flow of media will be laminar due to low media velocity. This is the reason the laminar and steady flow of media is considered in the model. In order to analyze the effect of temperature, the energy equation is considered in the simulation.

Table 1 shows the specification of solid model components used in the simulation. The dimensions of the electrode are so selected that it satisfies the side of the largest square that can be fit in the internal diameter of the hollow cylinder with a gap of 0.5 for the spark generation. The square with a side length of 5.62 mm (the side of the largest square fitted in an 8 mm circle with a minimum media flow area). Table 2 shows the meshing details. The total number of nodes for the assembly is 2180493 and the total number of elements is 2159633. The average elemental size is 0.1 mm. Table 3 shows the boundary conditions and model assumptions for the simulations. Table 4 shows the material

**Table 1.** Modelling components.

| Sl. no. | Component | Material | Descriptions |
|---|---|---|---|
| 1 | Square Electrode | Copper | The electrode is designed to allow a minimum area for the flow of media for increasing the effective number of abrasives.<br>The side of the square is taken at 5.62 mm. |
| 2 | Workpiece | Brass | Hollow Cylindrical workpiece.<br>ID 8 mm.<br>OD 10 mm.<br>Length 16 mm |
| 3 | Media | Viscoelastic Media | Mixture of Abrasive, Polymer and Gel.<br>Polyborosiloxane is used as viscoelastic Media.<br>Alumina Abrasive<br>Mesh size of 300.<br>2:1- Abrasive to media ratio. |

**Table 2.** Meshing Details.

| Sl. no. | Component | Nodes | Elements |
|---|---|---|---|
| 1 | Electrode | 701430 | 613811 |
| 2 | Workpiece | 5742 | 3936 |
| 3 | Media | 10599 | 2522 |
| 4 | Assembly | 2180493 | 2159633 |

**Table 3.** Boundary conditions and Model Assumptions.

| Sl. no. | Components | Boundary condition |
|---|---|---|
| 1 | Inlet | Pressure inlet 40MPa |
| 2 | Fluid (media) | Stationary fluid |
| 3 | CFG Electrode | 100 rpm rotation<br>2300 degree Celsius |
| 4 | Workpiece | Stationary |
| 5 | Outlet | Pressure outlet 20 MPa |
| Assumptions for the model | | |
| Pressure based model | | |
| Green Gauss cell-based Analysis | | |
| Absolute velocity and implicit formulation | | |
| Media homogeneous and isotropic | | |
| Flow is laminar and steady with the Energy equation on. | | |

properties used in the simulations and figure 2 shows the modelling and meshing of the model.

In TACAFM process DC is supplied to the electrode and workpiece. Due to this, the current supply the heating effect on the electrode is developed along with the generation of spark [11]. But this electrode is surrounded by media environment whose continuous flow absorbs the excessive heat from the electrode and ceases the melting of electrode. Thus, the DC supply regulates the spark through the electrode temperature [12, 13]. Since DC supply can not be applied in the ANSYS Fluent thus the temperature is applied as the boundary condition to the electrode. So the temperature used in the simulation is kept higher, which is 2300 K irrespective of the melting temperature of copper is 1400 K to compensate the media's environment effect.

## 2.2 *Experimental setup*

The experiments were done on the TACAFM process to investigate MR and $\%\Delta R_a$. For the MR computation, the weight change before and after the machining is taken with the help of precision balance. For the computation of the $\%\Delta R_a$, Taylor Hobson Tallysurf is used to compute the $R_a$ of the inner and outer surfaces of the workpiece. The TACAFM setup used for the experimentation consists of a

**Table 4.** Material properties for simulations.

| Material | Media | Brass workpiece | Alumina abrasives | Copper electrode |
|---|---|---|---|---|
| Type | Fluid | Solid | Solid | Solid |
| Density (kg/m$^3$) | 1218 | 8300 | 3950 | 8830 |
| Viscosity (kg/m-s) | 0.789 | – | – | – |
| Thermal conductivity (w/m-k) | 0.22 | 401 | 451 | 387.6 |
| Specific Heat(J/kg-k) | 20.25 | 109 | 12 | 381 |

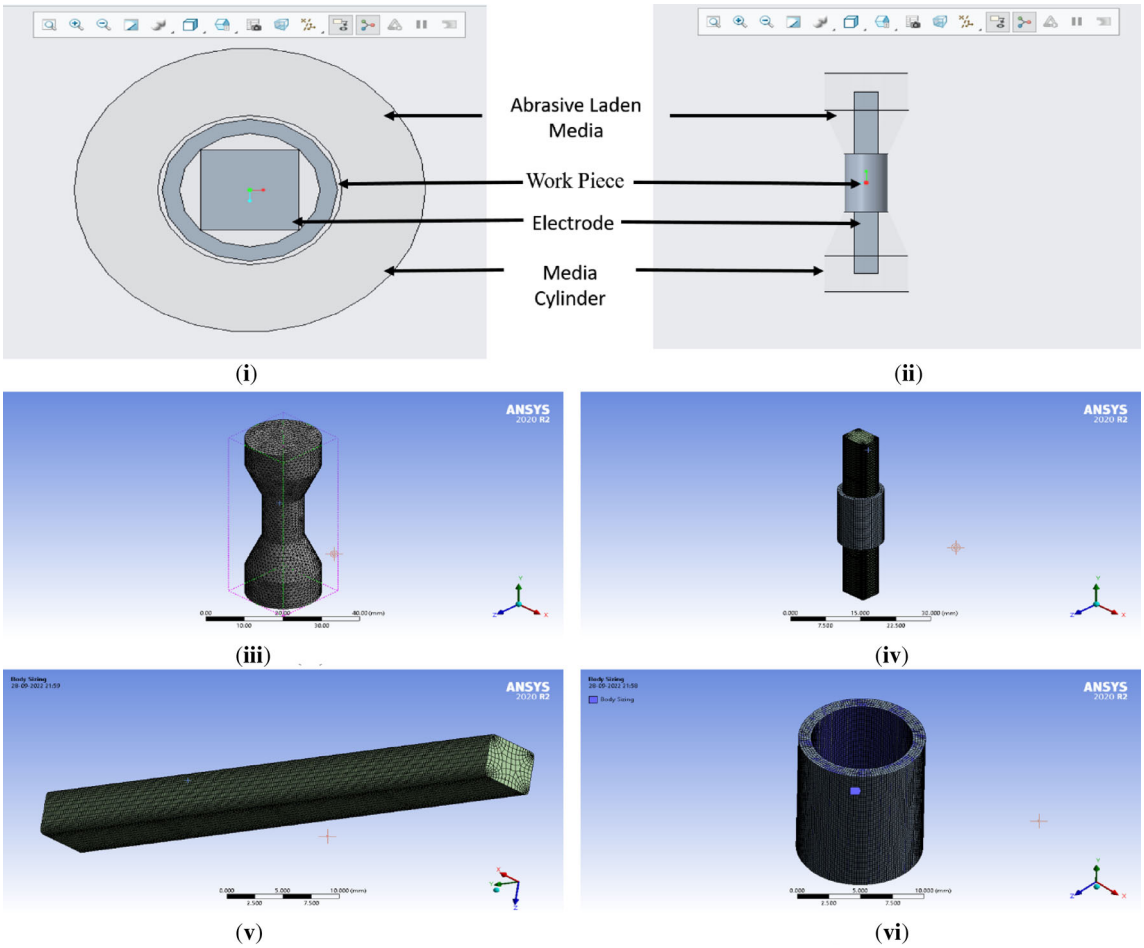



**Figure 2.** Solid Modelling and Meshing (i) Top view of Assembly, (ii) Side view of assembly, (iii) Assembly meshing details, (iv) Proposed electrode and workpiece, (v) proposed electrode and (vi) workpiece.

conventional AFM setup with 3 phase induction motor for the rotation of the proposed centrifugal force-generating electrode and the EDM controller and power supply for spark generation. The fixture used in an experiment is made of three parts to hold the workpiece and complete the electrical circuit. Figure 3 shows the proposed experimental setup.

The dimensions of the electrode workpiece is kept similar to that used in the experiments with square electrode of side 5.62 mm, hollow cylindrical workpiece of 10 mm OD, 8 mm ID and 16 mm height. The gap between the corner of square and the workpiece is kept between 0.1 mm and 0.9 mm so that the facilitation of spark is maintained. The electrode dimensions are computed on the basis of minimum area between the electrode and the workpiece available for the flow of media. The dimensions of the square electrode are computed as 5.62 mm on above criterion and simulations and experiments were performed on that basis (Table 5).

Figure 3 (i) shows the process of TACAFM, figure 3 (ii) shows the EDM power supply with the controller. Figure 3 (iii) shows the placement of fixtures. Figure 3 (iv) shows the placement of the fixture. Figure 3 (v) and (vi) show the various component of conventional AFM setup and power transmission mechanism for the gear. Figures 3 (vii) and (viii) show the various parts of the fixture. The fixture consists of 3 parts with the terminals for the power supply. Figure 3 (ix) shows the brass workpiece the dimensions of the workpiece was taken on the basis of kohut consideration [35] and due to wide application of brass, it is considered as the workpiece material [36] and figure 3 (x) and (xi) show the proposed electrode.

## 2.3 *Design of experiments*

The experiments were made to analyse process parameters' effects, which are the supply current with four levels (four Ampere, eight Ampere, twelve Ampere and sixteen Ampere), the electrode's rotational speed with four levels (ten, twenty, forty and sixty RPM) and the number of extrusions with four levels (two, four, six and eight). The

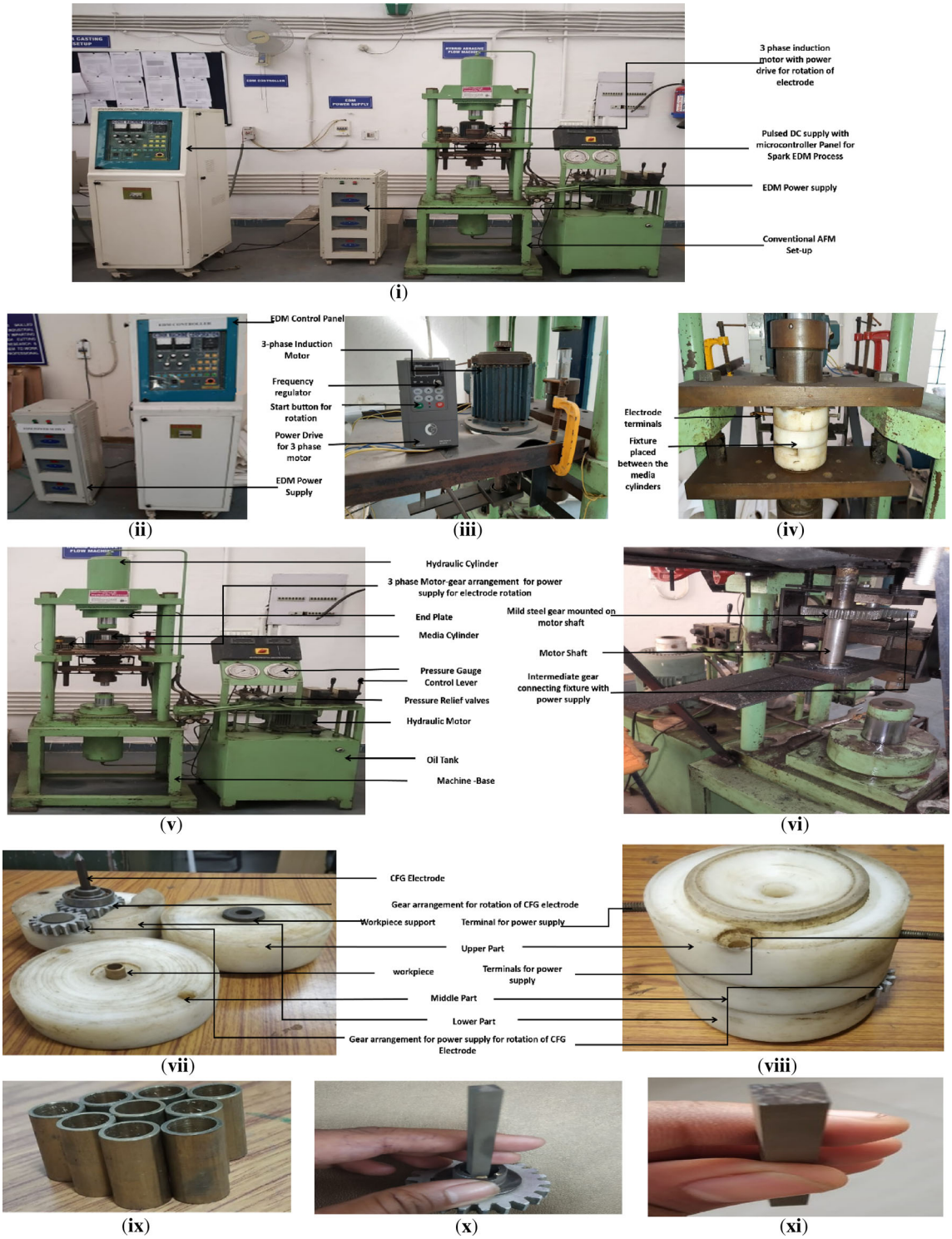



**Figure 3.** Experimental setup (i), The TACAFM setup (ii), EDM power supply with control panel (iii), Power drive for rotation of electrode (iv), Fixture with terminals (v), Conventional AFM setup (vi), Gear arrangement for power drive (vii), Detail description of fixture (viii), Nylon fixture assembly (ix), Brass workpiece (x) and (xi) Proposed electrode.

**Table 5.** Specification and application of equipment of TACAFM process.

| Sl. no. | Equipment | Specification | Application |
|---|---|---|---|
| 1 | AFM Setup | Working Pressure - 20 MPa<br>Media Flow Rate – 290 $cm^3$ | Maintaining the working pressure for media extrusion.<br>Controlling media flow rate.<br>Media reciprocation inside the hollow workpiece.<br>Holding the workpiece in a fixture |
| 2 | Three-Phase Induction Motor | Maximum speed- 800 rpm<br>Maximum power- 1 HP | Facilitates the rotation of CFG electrodes to the requisite speed. |
| 3 | Power Drive | Power – 0.75 KW/HP<br>Input voltage- (200 to 240 v) for single phase | Maintain the speed of three phase induction motor by alternating frequency. |
| 4 | EDM-Power supply | Current - 25 Ampere<br>Power supply - 415 Volt, Three phases and 50 Hz | Supply pulsed DC at the requisite current, frequency and voltage |
| 5 | EDM-Controller | Microprocessor-based control system.<br>Maximum power-3 KVA | Facilitates gap between electrode and workpiece. |

process parameters are shown in table 1. Table 6 shows the experimental values of $\%\triangle R_a$ and MR against the process parameters.

The experiments were performed based on DOE and readings of $\%\Delta R_a$ and MR were tabulated in table 7 based on the following equations.

$$\begin{aligned} &\textit{Material Removal } (MR) \\ &= \textit{weight of workpiece before machining} \\ &- \textit{weight of workpiece after machining} \end{aligned} \tag{1}$$

$$\begin{aligned} &\textit{Percentage improvement in surface finish } (\%\Delta Ra)) \\ &= ((\textit{Initial surface finish} \\ &- \textit{Final surface finish})/(\textit{Initial surface finish})) * 100 \end{aligned} \tag{2}$$

Precision balance was used for the measurement of weight of the workpiece and $R_a$ was calculated by Taylor Hobson Talysurf. For each sample reading, five different locations were taken and the average of them is considered as 1 reading. It is done because it was very difficult to identify similar points before and after the machining process. Some of the surface roughness graphs obtained before and after the finishing is shown in figure 4.

## 3. Results and discussion

The Modelling, simulation, and experimental setup results are discussed separately in the subsequent section. For Modelling and simulations, the results for the stationary electrode and the electrode in motion are separately discussed. The simulation results were grid tested and independent of the mesh size.

### 3.1 *Modelling and simulation results*

The mesh file obtained in the meshing module of the ANSYS FLUENT is transported to the Fluent setup, where the energy equation is turned on with laminar flow with viscous heating. The new fluid is prepared with a property similar to the viscoelastic fluid used by Ali *et al* [12] for comparison. The media flow took place due to the pressure difference of 20 MPa. The pressure inlet and outlet are given with an extrusion pressure of 40 MPa at the inlet and 20 MPa at the outlet. To provide the heating effect of current, the temperature of 2300 K is provided to the copper electrode as it was difficult to supply the pulsed DC in the simulation model. The media, workpiece and fluid boundary were kept at the stationary condition. The two situations occurred due to the rotation of the electrode. One is kept stationary and the other is kept in rotation at 100 RPM.

**Table 6.** Process Parameters with their Levels.

| Process Parameters | Units | Level 1 | Level 2 | Level 3 | Level 4 |
|---|---|---|---|---|---|
| Supply Current | Amperes | 4 | 8 | 12 | 16 |
| Rotational Speed of Electrode | rpm | 100 | 120 | 140 | 160 |
| Number of Oscillations | cycles | 2 | 4 | 6 | 8 |

**Table 7.** Experimental values of MR and %Ra Experimental values of MR and % Δ Ra.

| Sl. no. | RO | Rotational Speed | Supply Current | No. of Oscillations | MR (mg) | % Δ Ra |
|---|---|---|---|---|---|---|
| 1 | 1 | 100 | 4 | 2 | 7.80 | 39.95 |
| 2 | 2 | 100 | 4 | 4 | 9.12 | 39.47 |
| 3 | 3 | 100 | 4 | 6 | 8.54 | 39.39 |
| 4 | 4 | 100 | 4 | 8 | 7.90 | 39.59 |
| 5 | 5 | 100 | 8 | 2 | 8.82 | 41.40 |
| 6 | 6 | 100 | 8 | 4 | 9.14 | 42.09 |
| 7 | 7 | 120 | 8 | 6 | 10.34 | 43.07 |
| 8 | 8 | 120 | 8 | 8 | 7.86 | 42.93 |
| 9 | 9 | 120 | 12 | 2 | 9.54 | 43.58 |
| 10 | 10 | 120 | 12 | 4 | 10.11 | 43.72 |
| 11 | 11 | 120 | 12 | 6 | 12.40 | 42.14 |
| 12 | 12 | 120 | 12 | 8 | 11.45 | 42.26 |
| 13 | 13 | 140 | 16 | 2 | 9.86 | 41.54 |
| 14 | 14 | 140 | 16 | 4 | 10.40 | 43.95 |
| 15 | 15 | 140 | 16 | 6 | 9.24 | 44.24 |
| 16 | 16 | 140 | 16 | 8 | 10.10 | 44.12 |
| 17 | 17 | 140 | 4 | 2 | 12.44 | 39.83 |
| 18 | 18 | 140 | 4 | 4 | 11.21 | 39.09 |
| 19 | 19 | 160 | 4 | 6 | 9.65 | 39.40 |
| 20 | 20 | 160 | 4 | 8 | 8.10 | 39.12 |
| 21 | 21 | 160 | 8 | 2 | 9.12 | 39.60 |
| 22 | 22 | 160 | 8 | 4 | 8.58 | 40.17 |
| 23 | 23 | 160 | 8 | 6 | 9.10 | 41.21 |
| 24 | 24 | 160 | 8 | 8 | 8.40 | 42.30 |
| 25 | 25 | 100 | 12 | 2 | 10.30 | 44.15 |
| 26 | 26 | 100 | 12 | 4 | 12.40 | 44.66 |
| 27 | 27 | 100 | 12 | 6 | 10.22 | 42.27 |
| 28 | 28 | 100 | 12 | 8 | 11.39 | 43.59 |
| 29 | 29 | 100 | 16 | 2 | 12.08 | 44.18 |
| 30 | 30 | 100 | 16 | 4 | 12.06 | 44.13 |
| 31 | 31 | 120 | 16 | 6 | 11.97 | 44.15 |
| 32 | 32 | 120 | 16 | 8 | 12.03 | 44.18 |
| 33 | 33 | 120 | 4 | 2 | 7.56 | 41.30 |
| 34 | 34 | 120 | 4 | 4 | 7.10 | 43.88 |
| 35 | 35 | 120 | 4 | 6 | 7.84 | 42.54 |
| 36 | 36 | 120 | 4 | 8 | 7.29 | 43.13 |
| Total | | | | | 351.46 | 1516.32 |
| Average | | | | | 9.76 | 42.12 |

3.1.1 *Stationary electrode* Figure 5 shows the simulation results when the electrode is in stationary conditions. Figure 5 (i) highlights the conversion curve for the stationary electrode in which the energy line lies below the continuity, Z, Y and X velocity lines, showing the smooth conversion process. Figure 5 (ii) shows the Pressure distribution over the workpiece for the stationary electrode. It is observed that the Maximum Pressure value is 37 MPa which decreases in the direction of flow. The higher pressure value over the workpiece indicates the higher

value of material removal, as the resultant cutting forces would be higher at that location because of the result combination of spark energy and axial force of media [11–13]. The other observation is that the value of maximum pressure is higher than the value of maximum pressure of other hybrids, indicating an enhancement in MR [20, 37]. Figure 5 (iii) shows the temperature distribution over the workpiece. The maximum temperature is shown at the edges of the electrode corner, which justifies the spark generation at the edges [11–13]. Due to the spark generation, the material's melting occurs, so the material removal occurs. The maximum and minimum temperature over the workpiece is recorded as 1855 K and 1578 K. Figure 5 (iv) shows the streamline of the velocity showing the passage of the flow of media. The critical observation is that the streamline covering the mouth of the workpiece, indicating the increasing media concentration at the mouth of the workpiece, which highlights the dynamic number of abrasive particles on the wall of the workpiece. This increase in abrasive particles enhances the MR through the abrasion mechanism [38]. Figure 5 (v) shows the pressure distribution over the media, which indicates the effect of extrusion pressure over the media, which changes with the extrusion cycle when the media is extruded down to up with the same pressure difference. The other observation is that the minimum pressure range is around 15 MPa which is less than the extruded outlet pressure, which is due to the bell mounting effect, which is another characteristic of the AFM process, which justifies the smooth extrusion process [39]. Figure 5 (vi) shows the temperature variation within the

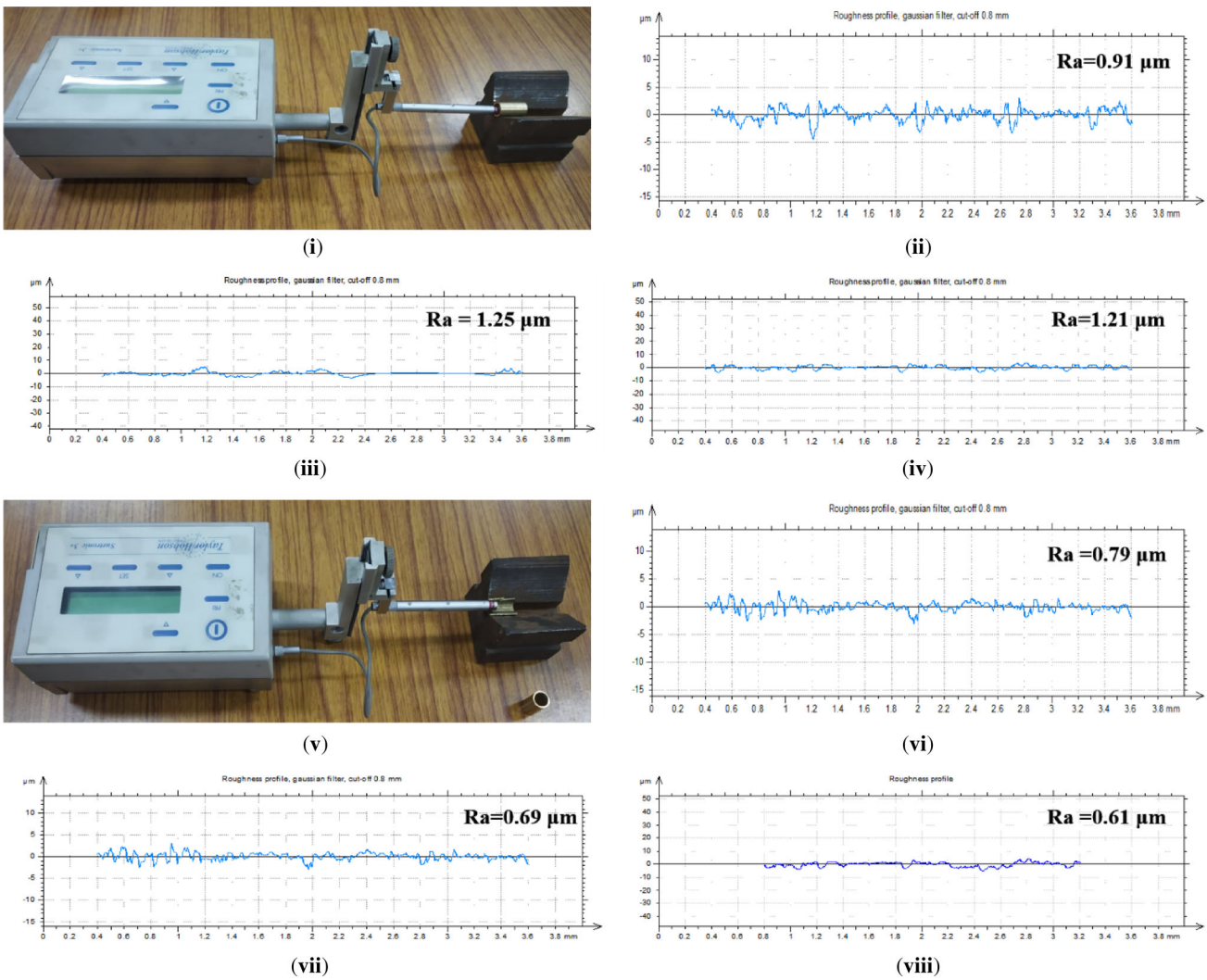



**Figure 4.** Surface roughness measurement (i) Taylor Hobson Talysurf measuring surface roughness before machining (ii), (iii) and (iv) surface roughness plot before machining (v) Taylor Hobson Tallysurf measuring surface roughness after finishing(vi),(vii) and (vii) and (viii) Surface roughness plot after the machining process.

media. It can be observed that the temperature in the media remains almost constant and at a minimum value, whereas the electrode and workpiece show a higher temperature range. The electrode would be at a higher temperature due to EDM temperature and the workpiece would receive a spark which would raise its temperature. However, for media, since there is no temperature rise, the viscosity of media would not decrease as a result, it would retain its abrasive holding capacity, which would further help in retaining the machining capacity of media [12, 13].

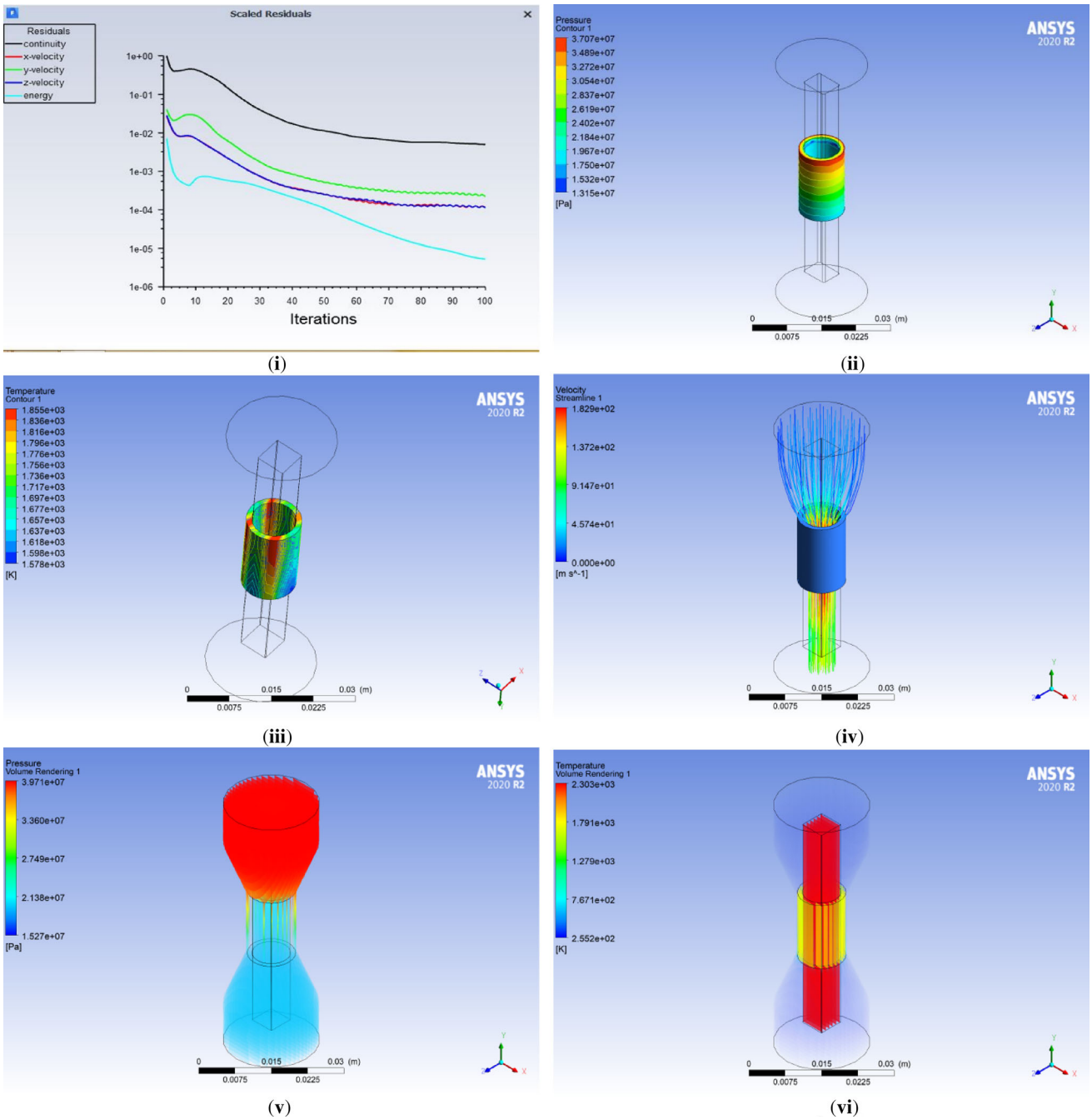



**Figure 5.** Simulation results for stationary electrode (i) Conversion graph, (ii) Pressure distribution over the workpiece for the stationary electrode, (iii) Temperature distribution over the workpiece for the stationary electrode, (iv) Velocity streamline across the workpiece, (v) Pressure variation within the media during stationary condition of the electrode and (vi) Temperature variation within the media during stationary condition of the electrode.

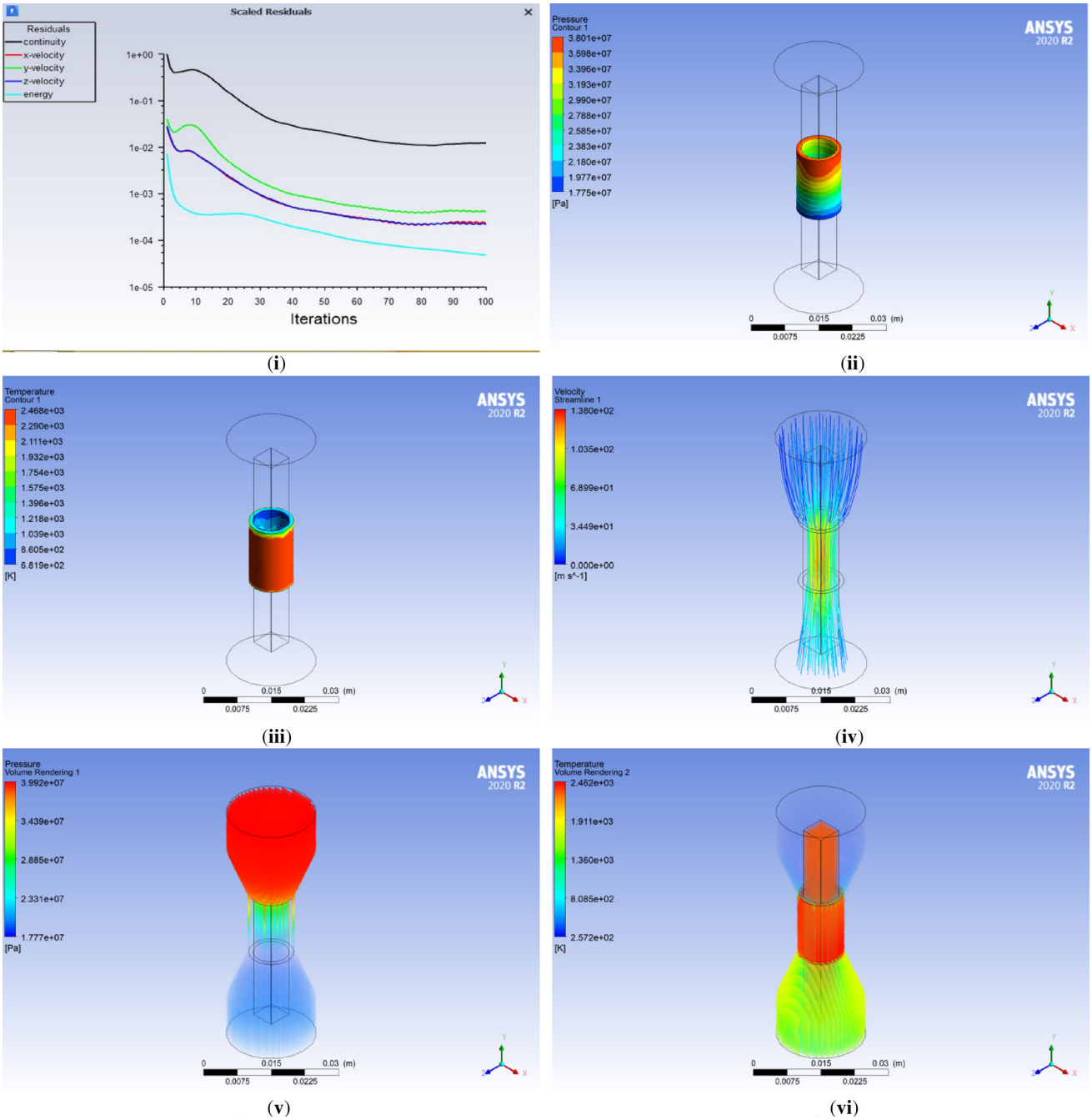



**Figure 6.** Simulation results for rotating electrode (i) conversion curve for the rotating electrode, (ii) Pressure variation over the workpiece for the rotating electrode, (iii) Temperature variation over the workpiece for the rotating electrode, (iv) Velocity streamline for the rotating electrode, (v) Pressure variation inside the media for the rotating electrode and (vi) Temperature Variation inside the media for the rotating electrode.

3.1.2 *Rotatory electrode* Keeping the other boundary conditions same, the electrode is given a rotation of 100 rpm. Figure 6 shows the simulation results when the electrode rotates at 100 rpm. Figure 6 (i) shows the conversion curve, showing the smoother conversion as the energy line lies below the continuity, Z, Y and X velocity lines. Figure 6 (ii) shows the pressure variation on the workpiece. The maximum pressure value is 38.01 MPa, higher than the maximum pressure at the stationary condition, which is evident as due to the rotation of the electrode, extra pressure is exerted on the media, which results in the improvement in MR. This is because an extra

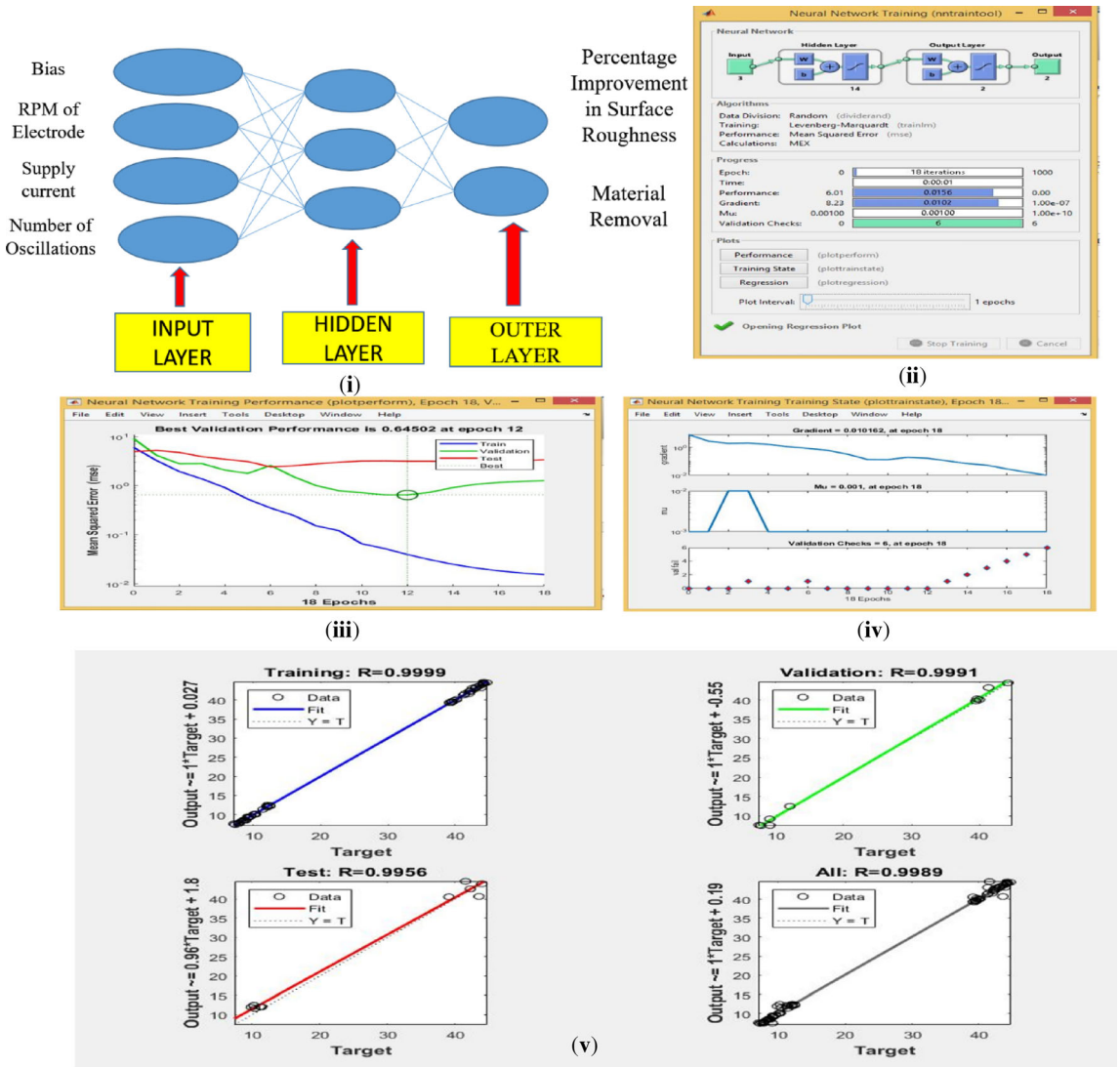



**Figure 7.** (i) Architecture of ANN, (ii) Training Window of ANN, (iii) Performance Window, (iv) Training status and (v) Regression curves for Training, Testing, Validation

Coriolis cutting force is applied on the workpiece due to the rotation (by centrifugal action) and the axial extrusion of media inside the media cylinder (due to the pressure difference) [11]. This increase in pressure over the workpiece increases the cutting force that enhances the MR [13]. Figure 6 (iii) shows the Temperature variation on the workpiece's surface; the maximum temperature is 2468 k and the minimum temperature is 681 k. The increase in temperature value over the workpiece shows the effect of the spark on the workpiece and results in more MR due to the melting and erosion process [11, 12]. The maximum temperature is continuously distributed over the workpiece surface as the electrode's rotation allows the spark to travel uniformly around the workpiece, thus resulting in uniform melting over workpiece's surface [12]. Figure 6 (iv) shows the velocity streamlines when the electrode is rotated at 100 rpm. The streamlines converge inside the workpiece, increasing the dynamic abrasive particles and enhancing the machining operation. Due to the electrode rotation, the streamline moves apart when they move out through the workpiece [20]. Figure 6 (v) shows the pressure variation present in the media when the electrode is rotated at 100 rpm. The effect of the extrusion pressure and bell mounting effect is evident [39]. Figure 6 (vi) shows the temperature variation in the media when the proposed electrode is rotated at 100 rpm inside the media. It can be observed that the workpiece and the electrode are at higher Temperatures. This shows that the melting of material will take place from the workpiece and extrusion of media will occur, which will carry the melting material with it. Also, the critical point of observation is that the media temperature is higher at the outlet side due to the electrode's rotation. The electrode's rotation provides kinetic energy to the media particle, which results in the temperature rise of the media,

**Table 8.** Predicted Value of MR and % $\Delta R_a$ with percentage error.

| Sl. no. | RO | Rotational speed | Supply current | Number of oscillations | MR mg | %Δ Ra | Predicted MR | Predicted %Δ Ra | % error MR ABS | % error Δ Ra ABS |
|---|---|---|---|---|---|---|---|---|---|---|
| 01 | 01 | 100 | 04 | 2 | 7.80 | 39.95 | 7.82 | 39.94 | 0.25 | 0.02 |
| 02 | 02 | 100 | 04 | 4 | 9.12 | 39.47 | 9.13 | 39.43 | 0.10 | 0.10 |
| 03 | 03 | 100 | 04 | 6 | 8.54 | 39.39 | 8.56 | 39.39 | 0.23 | 0.00 |
| 04 | 04 | 100 | 04 | 8 | 7.90 | 39.59 | 7.91 | 39.61 | 0.12 | 0.05 |
| 05 | 05 | 100 | 08 | 2 | 8.82 | 41.4 | 8.80 | 41.42 | 0.22 | 0.04 |
| 06 | 06 | 100 | 08 | 4 | 9.14 | 42.09 | 9.14 | 42.03 | 0.00 | 0.14 |
| 07 | 07 | 120 | 08 | 6 | 10.34 | 43.07 | 10.31 | 43.11 | 0.29 | 0.09 |
| 08 | 08 | 120 | 08 | 8 | 7.86 | 42.93 | 7.88 | 43.91 | 0.25 | 2.28 |
| 09 | 09 | 120 | 12 | 2 | 9.54 | 43.58 | 9.54 | 43.49 | 0.00 | 0.20 |
| 10 | 10 | 120 | 12 | 4 | 10.11 | 43.72 | 10.10 | 43.69 | 0.09 | 0.06 |
| 11 | 11 | 120 | 12 | 6 | 12.40 | 42.14 | 12.38 | 42.11 | 0.16 | 0.07 |
| 12 | 12 | 120 | 12 | 8 | 11.45 | 42.26 | 11.41 | 42.23 | 0.34 | 0.07 |
| 13 | 13 | 140 | 16 | 2 | 9.86 | 41.54 | 9.85 | 41.50 | 0.10 | 0.09 |
| 14 | 14 | 140 | 16 | 4 | 10.40 | 43.95 | 10.42 | 43.91 | 0.19 | 0.09 |
| 15 | 15 | 140 | 16 | 6 | 9.24 | 44.24 | 9.23 | 44.22 | 0.10 | 0.04 |
| 16 | 16 | 140 | 16 | 8 | 10.10 | 44.12 | 10.11 | 44.10 | 0.09 | 0.04 |
| 17 | 17 | 140 | 04 | 2 | 12.44 | 39.83 | 12.42 | 39.81 | 0.16 | 0.05 |
| 18 | 18 | 140 | 04 | 4 | 11.21 | 39.09 | 11.00 | 39.08 | 1.87 | 0.02 |
| 19 | 19 | 160 | 04 | 6 | 9.65 | 39.4 | 9.67 | 39.39 | 0.20 | 0.02 |
| 20 | 20 | 160 | 04 | 8 | 8.10 | 39.12 | 8.12 | 39.11 | 0.24 | 0.02 |
| 21 | 21 | 160 | 08 | 2 | 9.12 | 39.6 | 9.10 | 39.54 | 0.21 | 0.15 |
| 22 | 22 | 160 | 08 | 4 | 8.58 | 40.17 | 8.56 | 40.15 | 0.23 | 0.04 |
| 23 | 23 | 160 | 08 | 6 | 9.10 | 41.21 | 9.21 | 41.19 | 1.20 | 0.04 |
| 24 | 24 | 160 | 08 | 8 | 8.40 | 42.3 | 8.39 | 42.29 | 0.11 | 0.02 |
| 25 | 25 | 100 | 12 | 2 | 10.30 | 44.15 | 10.28 | 44.11 | 0.19 | 0.09 |
| 26 | 26 | 100 | 12 | 4 | 12.40 | 44.66 | 12.36 | 44.62 | 0.32 | 0.08 |
| 27 | 27 | 100 | 12 | 6 | 10.22 | 42.27 | 10.21 | 42.19 | 0.09 | 0.18 |
| 28 | 28 | 100 | 12 | 8 | 11.39 | 43.59 | 11.37 | 43.55 | 0.17 | 0.09 |
| 29 | 29 | 100 | 16 | 2 | 12.08 | 44.18 | 12.08 | 44.14 | 0.00 | 0.09 |
| 30 | 30 | 100 | 16 | 4 | 12.06 | 44.13 | 12.04 | 44.15 | 0.16 | 0.04 |
| 31 | 31 | 120 | 16 | 6 | 11.97 | 44.15 | 11.95 | 44.14 | 0.16 | 0.02 |
| 32 | 32 | 120 | 16 | 8 | 12.03 | 44.18 | 12.01 | 44.17 | 0.16 | 0.02 |
| 33 | 33 | 120 | 04 | 2 | 7.56 | 41.3 | 7.54 | 41.51 | 0.26 | 0.50 |
| 34 | 34 | 120 | 04 | 4 | 7.10 | 43.88 | 7.09 | 43.87 | 0.14 | 0.02 |
| 35 | 35 | 120 | 04 | 6 | 7.84 | 42.54 | 7.82 | 42.51 | 0.25 | 0.07 |
| 36 | 36 | 120 | 04 | 8 | 7.29 | 43.13 | 7.27 | 43.11 | 0.27 | 0.04 |
| Total | | | | | 351.46 | 1516.32 | 351.08 | 1516.72 | 8.92 | 4.94 |
| Average | | | | | 9.76 | 42.12 | 9.75 | 42.13 | 0.24 | 0.13 |

which affects its viscosity as a result, the media is generally replaced after a fixed number of cycles [13, 37]. Thus simulation results validate the spark formation with the help of square-shaped electrodes.

### 3.2 *Experimental results*

To analyse the experimental results artificial neural network application (ANN) present in MATLAB is used. The structure is developed in such a way that it contains three input layers: the rotation speed of the square electrode, the supply current and the media's oscillation number. The output layer would be a $\%\Delta R_a$ and the MR. The experimental data was divided into three parts: about 70 percent in training, 20 percent in testing, and about 10 percent in validation. Once the network gets trained, the predicted values are calculated and compared with the experimental result and thus, the percentage error is computed for both MR and $\%\Delta R_a$. Figure 7 shows the various stages of the ANN process. Figure 7 (i) shows the structure of ANN architecture with three input layers, a hidden layer and two output layers. Figure 10 (ii) shows the training window during the ANN process. Figures 7 (iii) and 7 (iv) show the

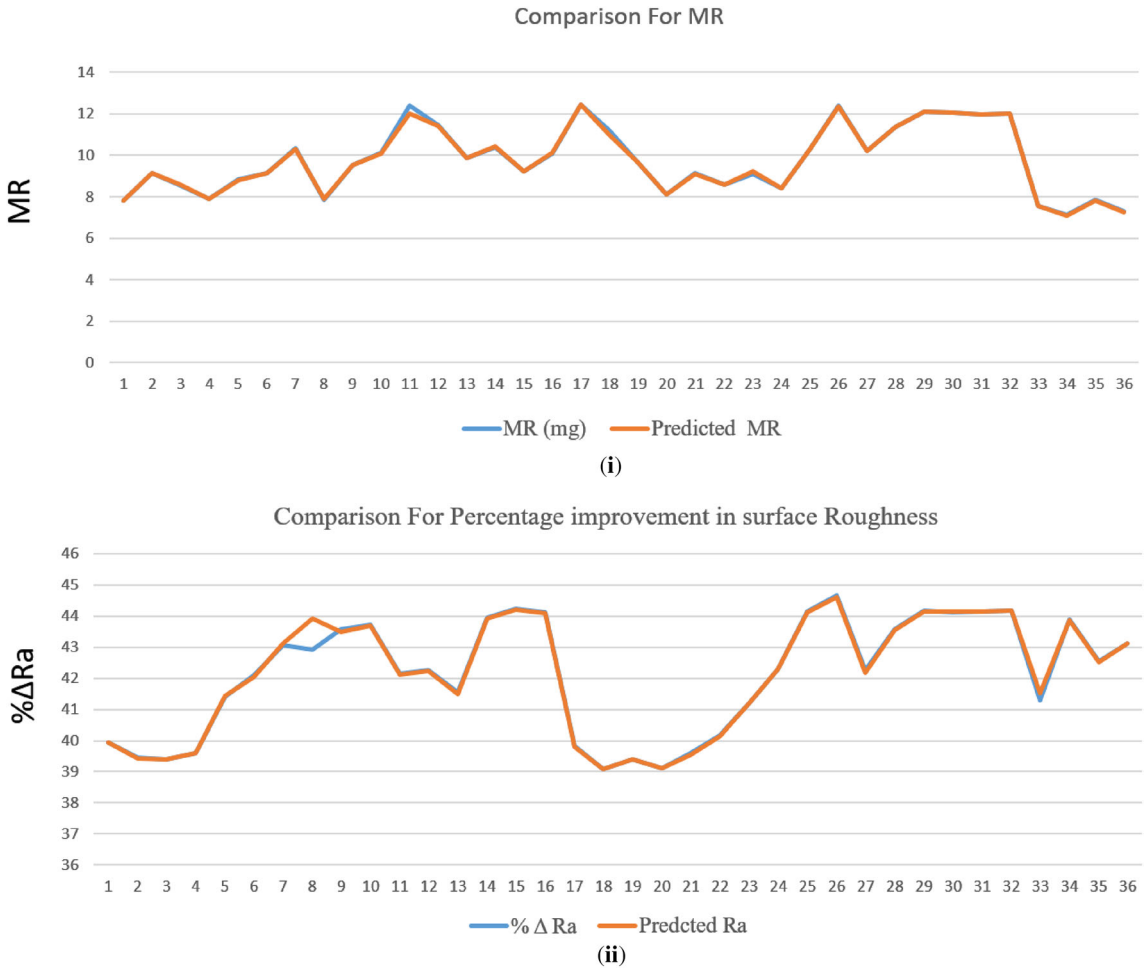



**Figure 8.** Comparisons between the experimental and predicted data (i) Comparison trend for MR and (ii) Comparisons trend for $\%\Delta R_{a.}$

training and performance plot of parameters concerning epochs. Figure 7 (v) shows the various regression plots obtained after the ANN simulations. The R-value obtained for training, testing, and validation is close to 1. The combined value of R obtained by the combination is very close to 1, which shows the correct procedure and experimental simulation on the ANN network [40].

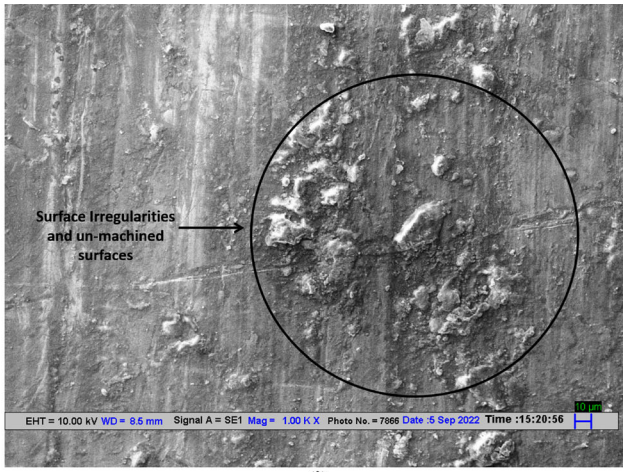
Table 8 shows the predicted value for MR and $\%\Delta R_a$ obtained after ANN analysis. The average value of experiments for MR is 9.76 mg and that for $\%\Delta R_a$ is 42.11 percent. The average of predicted values for MR after ANN modelling is 9.75 mg and that for $\%\Delta R_a$ is 42.13 percent. The cumulative average percentage absolute error between the predicted and experimental value for MR is 0.24 percent whereas for the $\%\Delta R_a$ is 0.13 percent which is in the acceptable range considering the manual operation of TACAFM setup working at the room conditions The percentage absolute error for both MR and $\%\Delta R_a$ is calculated by the following equation

$$\textit{Percentage absolute error} = \left| \frac{(\textit{Experimental Value} - \textit{Predicted Value})}{\textit{Experiental Value}} * 100 \right| \quad (3)$$

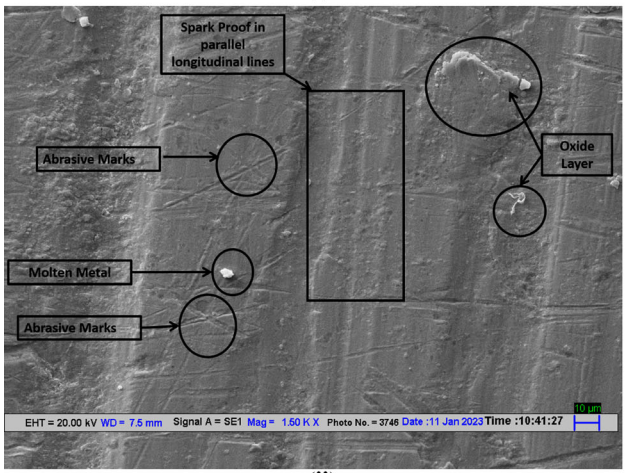
Figure 8 (i) shows the comparison of the experimental value with the predicted value for MR and figure 8 (ii) shows the comparison between the predicted and experimental values from ANN for $\%\Delta R_a$.

## 3.3 *Surface morphology*

The TACAFM process is characterised by spark generation, due to this spark generation, immense heat is produced, which results in melting and erosion at the workpiece surface, facilitating the enhancement in MR. There would be traces of molten metal on the surface, which the extruded media would take. Also, due to CFG electrode's rotation and the extrusion of polymer media, the abrasive strikes the workpiece's surface randomly, resulting in, random abrasive marks on finished surface. Also, due to the spark




(i)




(ii)

**Figure 9.** SEM images (i) Un-machined Sample and (ii) machined sample.

generation, there would be the formation of oxide on workpiece's surface, which can be seen on the SEM image of the surface [11–13].

To confirm the generation of the spark during the experiments, The SEM images were taken before and after the experiments. Figure 9 shows the SEM images of the unfinished and finished surfaces at 1000 X magnification. Figure 9 (i) shows the unfinished brass surface highlighting the surface irregularities. Figure 9 (ii) shows the finished surface at 1000 X magnification. The surface consists of a uniform line along the surface, which shows the spark proof. As the workpiece is symmetrical and rotated, the generation and uniform spark travel takes place over the surface of the workpiece. The abrasives particle present in the media is under the action of Coriolis force due to the rotation and extrusion of the media [12]. Due to this effect, the abrasive takes the helical path over the surfaces, shown by the random oblique marks on the surface shown in figures 9 (ii). Figure 9 (ii) also shows the molten metal on the workpiece surface. As the number of extrusion cycles increases, the molten metal present over the surface would decrease as they would be taken along by the media.

Figure 10 shows the XRD plots of the workpiece. Figure 10 (i) shows the XRD plot before the machining, and figure 10 (ii) shows the XRD plot after the machining process. The variation in the XRD peaks in figure 10 (iii) shows the oxide layer on workpiece's surface [41], also figure 9 (ii) shows the oxide layer over the surface of the workpiece after the machining process. Hence it is evident that the proposed electrode is capable of generating a spark in the developed TACAFM process similar to the straight spline shape electrode used in the conventional TACAFM process [11–13].

### 3.4 *Effect of the proposed electrode on process parameter*

The purpose of the experimentation was to check the feasibility of the proposed electrode on the TACAFM process, more precisely to check the ability of the proposed electrode to produce spark and initiates the MR process. As a result, the most prominent set of process parameters were taken which improves the efficiency of the TACAFM process. The supply current is most prominent process parameter as it drives the plasma formation in the media which results in the higher value of MR and $\%\Delta R_a$ values as observed by experiment no. 29 in table 8 which corresponds to higher value of MR with higher value of supply current. When we consider the rotational speed, the rotation of the electrode produces centrifugal action in the media which generates a coriolis force on the abrasive particle. This enhances MR and $\%\Delta R_a$ but with the increase in rotational speed, the MR decrease [11]. The third parameter is the oscillation cycle which is the results in the reciprocation of media from upper to lower part. The value of MR and $\%\Delta R_a$ is initially increases but as the value of no. of cycle increases the abrasive present in the media gets blunt and MR decreases, but surface roughness is improved. Due to the similar reason, the MR decreases with the increase in the rotational speed [13, 42]. This can be observed from the reading of experiment number 24 which gives lower value of MR and higher value of $\%\Delta R_a$ at higher rotational speed and higher number of cycle. Thus, the process parameter shows the similar behaviour with the proposed electrode as with the electrode used in the initial TACAFM process.

## 4. Conclusion

The present investigation deals with efficient TACAFM process with the help of a novel square-shaped CFG electrode. After the successful modelling and simulation and experimental validation, the following conclusions are drawn. -

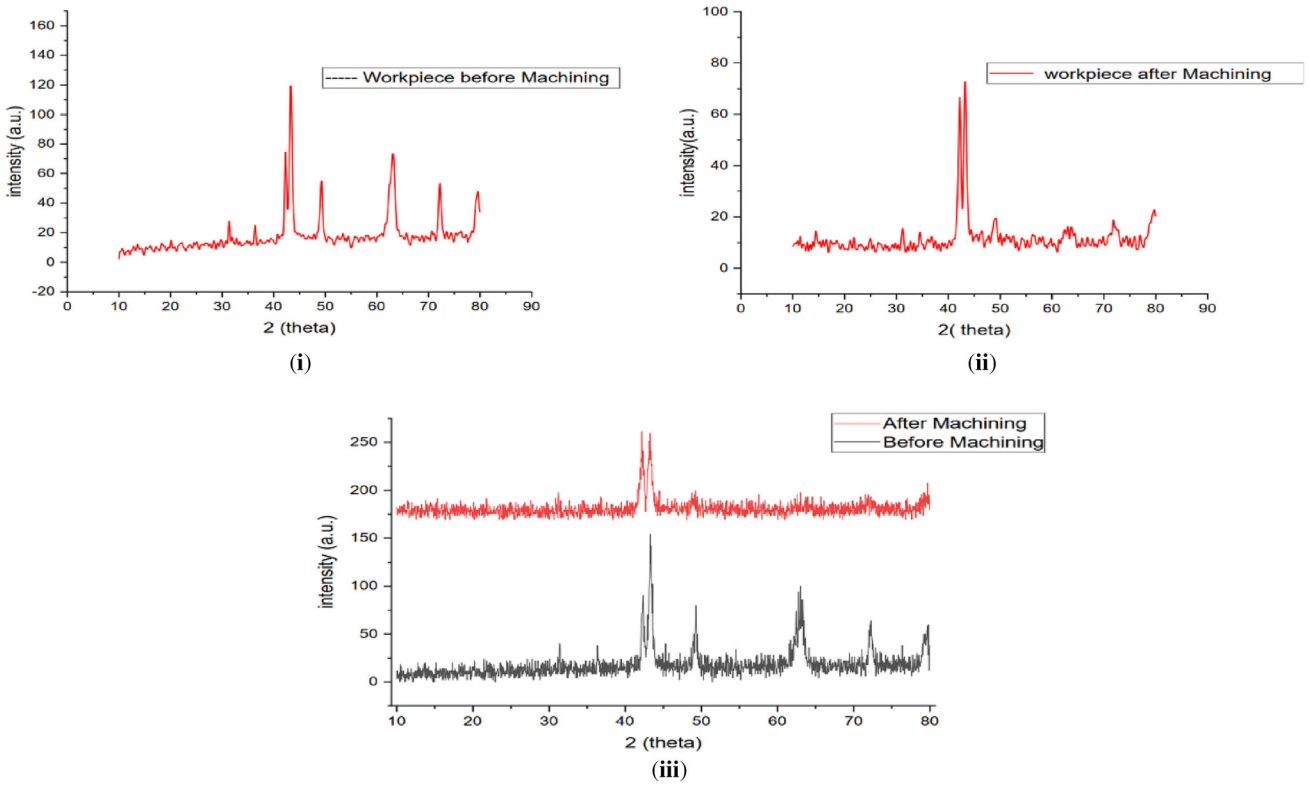



**Figure 10.** XRD plots (i) XRD plots for un-machined surface, (ii) XRD plots for machined surface and (iii) Comparison of machined and un-machined surface.

1. The pressure variation over the workpiece at the stationary electrode condition shows the maximum pressure of 37 MPa, which is much higher than the other hybrids process working between the same extrusion pressure. The increase in pressure value indicates the higher value of MR. The generation of sparks results in an increase in pressure force which is indicated in the simulation results.
2. The maximum pressure obtained when the electrode is rotated at 100 rpm is 38.01 MPa, which indicates a high MR during the CFG electrode's rotation. The CFG electrode rotation increases the resultant cutting force due to coriolis force, centrifugal and axial on the abrasive particles along with the spark energy.
3. The temperature variation on the workpiece during the stationary electrode condition shows the maximum temperature at the workpiece surface at the edges of the proposed square electrode, which justifies the proposed electrode's spark generation.
4. The temperature variation on the workpiece when the electrode is in rotational condition, shows a continuous pattern justifying the uniform spark travel through the workpiece, indicating a uniform material removal from the workpiece.
5. The streamlined curve for both rotation and stationary conditions of the electrode highlights the increase in the number of dynamic active abrasive particles near the wall of the workpiece, resulting in the enhancement of MR through the abrasion process.
6. The temperature variation over media shows that the media is least affected by temperature, thus maintaining its abrasive holding capacity. However, CFG electrode's rotation provides some kinetic energy to the media, which may affect its viscosity; hence a change of media is recommended after a fixed number of cycles.
7. The experimental results validate the simulation results. The average values of MR after experiment is 9.76 mg, and that for $\%\Delta R_a$ is 42.11 percent. The average of predicted value for MR from ANN modelling is 9.75 mg and that for $\%\Delta R_a$ is 42.13 percent representing a closeness of the modelled and experimental values.
8. The cumulative average percentage absolute error between the experimental and modelled value for the MR is 0.24 percent and that for $\%\Delta R_a$ is 0.13 percent, which is in the acceptable range, thus validating the experimental investigations.
9. The SEM images analysis of the finished sample show the presence of molten metal, spark marks and oxide layers, which validates the generation of spark and material removal by melting and erosion during the machining process. Also, the SEM images show the machining marks by abrasive, which highlights the abrasion action of the workpiece during the machining operations. Also, the XRD results highlight the presence

of copper oxide over the surface of the workpiece, which may be due to an oxidation reaction due to the generation of a spark over the workpiece surface.

10. The experimental data shows that the MR and $\%\Delta R_a$ increases with the increase in the supply current, rotational speed and number of cycle. The value of MR initially increases with the rotational speed but decreases with the increase in rotational speed. The similar pattern is observed for the number of cycle, which is a regular trend in TACAFM process.
11. As per the experimental data, the process parameter of TACAFM shows the similar trend with the proposed electrode as with the initial spline shape electrode used in the TACAFM process which shows the acceptability of the proposed electrode with the TACAFM process.
12. The initial investigation of the TACAFM process was done on the spline electrode. The manufacturing of spline electrodes is a challenging task and involves various steps. The fabrication of the proposed electrode is relatively easy and shows improved results in terms of MR and $\%\Delta R_a$.

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### Declarations

**Conflict of interest** The authors declare that there is no conflict of interest among the authors.

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# Factors Affecting Researcher Productivity of Public and Private Universities in the Global South: the Case of Indian Academia

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**Abstract:** Research productivity not only plays a vital role in the development of higher education institutes but it is also equally important for academic evolution of faculty. The STEM researchers from global south look for higher educational opportunities in the global north than in their own nations due to several constraints. They prefer to move to nations like USA, UK to pursue their careers because of issues like lack of funding or research infrastructure etc in their nations. This article explores factors influencing research engagement, with a primary focus on academia from underrepresented Global South communities. It compares the factors affecting researcher productivity in STEM branches of public and private engineering colleges in Delhi, India by conducting a census of the heads of departments of engineering colleges in Delhi using principal component analysis and gives recommendations further.

**Keywords:** STEM Research, Researcher Productivity, STEM Academia.

## 1. Introduction

In the globalized landscape of higher education, universities worldwide, including those in developing nations, increasingly mandate their academic faculty to engage in research and disseminate their findings through publication in internationally recognized peer-reviewed journals. This aligns with the prevailing global trend of establishing world-class universities 4. Academicians in resource-scarce Global South regions may face barriers, hindering their research engagement due to limited resources and expertise. Resource disparities and challenges in the Global South can lead to unequal opportunities and reduced research activity among academics, further exacerbating the North-South divide in academia 7. In this era, technical disciplines are high in demand and efforts are being made in developing nations to increase the participation of workforce in mainly STEM disciplines. In this background, it is important to have more research oriented STEM leaders in academia because research is crucial for economies to grow in the developing nations of the global south. Furthur, the STEM leaders in academia can inspire the faculty under them in turn students to conduct more research and innovation. The study also brings out the possible reasons responsible for the factors affecting the researcher productivity in public and private engineering colleges in Delhi, India which might be helpful for future stakeholders in framing policies accordingly.

**A View from Studies Conducted in Global North**

In a study of the U.S institutions out of an interview of twenty faculty, seven participants characterized themselves as intentionally blending their personal and professional lives, aligning their research agenda pursuits with their family, community, and core personal values 8., the tenured faculty were primarily motivated by intrinsic rewards, such as peer recognition and personal fulfillment through contributions to their field whereas the untenured were motivated by extrinsic rewards, including the attainment of tenure, promotions, and salary increases 2. Academics in the global north are predominantly driven by intrinsic factors like personal passion and interest in their research 21. The study of 1370 academicians in UK suggests that individuals often turn to their immediate peers as a source of inspiration, considering them a vital reference group and benchmark for their own aspirations and actions 24. In UK universities, faculty members contend with intense pressure to "publish or perish," creating a challenging environment where competition, heightened teaching responsibilities, and administrative duties collectively contribute to decreased research productivity. The results of a study conducted in Australia revealed that more time spent on research doesn't necessarily correlate with better teaching and a limited or negative relationship exists between research time and teaching quality 5. In the study of the US, 8 out of 20 participants explicitly mentioned that their teaching responsibilities played a supportive role in advancing their research agenda 8. In a study of norwegian academics, participation in research groups and international research networks was associated with increased research productivity 11 and similar results were obtained for South korean academics 3.

In a US study, participants expressed that, despite the increasing focus on community engagement by research institutions, promotion and tenure criteria predominantly favor traditional research. This is because participants believe community engagement, while personally valued, is not adequately rewarded by the university and falls outside the normal reward structure. Additionally, concerns were raised about insufficient university sponsorship for the necessary resources. While research institutions are increasingly committed to engagement with the community, the structure of promotion and tenure is still skewed in favour of traditional research at many institutions. In the developed nations, faculty members need to actively engage with the community to benefit from it, while also fulfilling the requirements of publishing and securing funding to maintain a balanced and productive academic career. [3]. Researchers from a public university in Italy who had applied frequently for grants turned out to be more actively engaged in teaching and administration and showed persistent funding application behaviour but funding did not lead to higher research productivity 12. In a study in the US, faculty members face the challenge of meeting university expectations to secure external grants and contracts when internal funding is scarce. Nonetheless, for those who successfully obtain external research support, substantial funding serves as a remedy for their academic marginalization? Participants experienced pressure to meet conventional expectations of publishing and obtaining external funding, and they tailored their work accordingly to align with these expectations. Fifty percent of the participants (10 in total of 20 interviewees) utilized externally funded research grants as a means to incorporate engagement activities into their ongoing scholarly endeavors 8. The availability of grants and funding support in academic institutions in the global north significantly boosted research engagement and productivity by providing essential resources for projects 21. The indirect influence of funding bodies emphasized the necessity for academics in Australia to tailor their research to meet the criteria set by these organizations to successfully secure research grants. They had to align their research with contemporary

trends and topics that were considered "in fashion" to increase their chances of securing competitive grants 19
The results of a study conducted in U.S.A in a private university indicate that consultancy done to four hours per week and upto eight hour per week of teaching can facilitate research productivity13.

**A View from Studies Conducted in Global South**
The academics' engagement in research and their research productivity are influenced by personal as well as environmental factors 10. A conducive environment provides access to necessary tools, equipment, and resources, facilitating productivity 15.
Motivation, especially the intrinsic one, is identified as a significant factor that empowers academics to thrive in their research endeavours 19. In a study of 20 public universities in Malaysia, the results revealed that a higher level of trust and commitment in self lead to higher research engagement 4. In a study of a public university in Saudi Arabia both intrinsic motivation such as professional development and external motivation like promotions were significant in improving research productivity 1. Working alongside supportive colleagues fosters collaboration and idea-sharing, boosting productivity 15. To facilitate increased international research collaboration in public institutions like IIT Delhi in India, there is a pressing demand to create a conducive research environment and upgrade existing infrastructure 23. In a survey of vietnam university academics, the lack of access to research resources lead to less engagement in research 16. Monetary rewards served as a strong motivator for Chinese academics, encouraging them to publish in international journals. Financial incentives were a key factor in their publication decisions 22. Results of a study on faculties of six public sector universities in Pakistan showed how highly productive researchers were often motivated by various factors, including financial benefits, research grants, rewards, promotions, job security (tenure), and other incentives. These incentives served as powerful drivers for their research efforts and productivity 26. Establishing suitable research facilities and an encouraging atmosphere can foster greater global connectivity and collaborative efforts within the institution. Public sector institutions like IIT Delhi have collaborations within India but very less abroad 23. Although it is possible that people work collaboratively on research with individuals in other departments or even in other universities, much research collaboration occurs within departments because of proximity 15. In a research conducted in twenty Malaysian public universities, the results revealed that knowledge sharing via international research collaborations has lead to an increase in research productivity but the same has been criticized by many researchers as the focus on international collaborations is being done because of the pursuit of higher rankings and this ranking-driven approach has some negative consequences 4. The high ranking of one private university (second) in Malaysia among all Malaysian universities in the Times Higher Education Ranking for 2021 is intriguing. It presents an opportunity to evaluate how academicians in private universities relate to Knowledge Sharing (KS) behaviour and, subsequently, their research engagement. 39% of the total faculty in a Saudi Arabian public university agreed that they were engaged in research collaborations within the institute although collaboration with colleagues over there was’nt a strong motivating factor in doing research and so mostly the faculty engaged in individual research. The reason could be their cultural identity of preservative Islamic values which discourages the academic staff from engaging in collaborative research 1.
In a survey of 56 vietnam university academics, the results revealed difficulty in obtaining research funds and the cumbersome process of preparing paperwork for research funding

applications were notable barriers, highlighting the importance of streamlined funding procedures and support for researchers 16. Funding bodies and academic institutions should acknowledge unintentional biases in their reward systems that favour sole authorship and neglect collaborative contributions. They should advocate for the recognition of knowledge sharing as a valuable academic achievement, fostering a more inclusive and equitable research environment and encourage a re-evaluation of assessment criteria to give due importance to participatory and collaborative research methods 17. Interviews of cambodian university academics revealed that many were engaged in consultancy because of a lack of promotion based system and lower salaries. Holding multiple administrative positions in universities demonstrates a strong commitment to the institution in which the faculty is tenured, which may translate into higher overall commitment to the university thereby increasing productivity. Teaching at multiple institutions provides a broader perspective and understanding of the academic landscape, potentially enhancing one's commitment by recognizing the university's role in a larger context. Administrative roles and experience at various institutions can contribute to professional growth, increasing job satisfaction and attachment to the university 15. Researchers in cambodian private universities who are untenured engage in part time teaching which reduces their research productivity 10.

## 2. Methodology

A census had been conducted for engineering colleges providing full time Btech degree in STEM disciplines in twenty colleges. The heads of departments had been asked to fill the surveys which had statements being measured on a likert scale from one to five with ‘1’ being strongly disagree to ‘5’ as strongly agree. The jist of the statements asked are indicated in the table below under the properties coloumn of table 3. Principal component analysis had been conducted to compare the means in the public and the private universities.

## 3. Results

The initial stage of reliability and validity test was done. The results yielded a Cronbach vaue of 0.755 and KMO value of 0.714 for the public university and 0.700 for the private university with a highly significant Bartlett's test result ($p < 0.001$). Table 4 shows that the mean of work family enrichment is higher in public universities than the private universities and extracts the maximum variance (86.6%) in the first component because there is more job stability in the former which leads to more satisfaction from the work domain whereas in the private sector there is more job switching which leads to less job satisfaction and lower work family enrichment. The mean of accommodating/positive work environment is more in the case of public sector universities as each employee is satisfied in life after getting a job in the govt. sector and so they don’t face any competition from other employees regarding their position which is the reason that they cooperate with them and build trust amongst themselves unlike private institutions where job is considered to be unstable. The govt. college teachers are more satisfied with the working conditions as compared to the non govt. ones. The mean of private college faculty is more in the case of intrinsic motivation and has the highest variance extracted (84.8%) in the third component than the public sector ones. There are lower pay emoluments in the private colleges, unsecured state of job and harassment by other peers who don’t show support for their work are the reasons why the private sector faculty is more instrinsically motivated to work. The mean of peer expectations is more in the case of public universities. The professors in public colleges are considered to

be competent enough (eg:IIT Delhi) and hence there are more expectations from them. They have to keep up or upgrade themselves with knowledge in their areas as the students in these universities come through entrance exams and are best out of the lot. So, if students in these institutes are expected to involve in high quality research, there are definitely more expectations from the faculty. The mean of research infrastructure and external funding/grants is higher in the case of public institutes than the private ones. The former also extracts the highest variance (81.7%) in the second component. A reason for this could be that it is comparatively easier for public colleges to get govt. funding because of the tag of being a govt. university as compared to the private ones which is also the reason that they are able to provide a large array of research labs and facilities. The mean of departmental work which includes teaching is higher in the case of public universities. The student absentee ratio is higher in the case of private universities as the less proverbial cream of the lot takes admission into these universities and many students get admissions easily in the name of management quotas through higher donations which is the reason for lower teaching load for the faculties working here. Apart from this the student teacher ratio is also less in private institutions. Administrative work is more in the case of public institutions as they are under the banner of govt. checks by NAAC (National Assessment and Accreditation Council) /IQAC (Internal Quality Assessment Cell) or have to work according to UGC framework. They are bound to follow certain frameworks like UGC guidelines and affiliation to their main institutes for their courses and so their faculty is more burdened as compared to the private institutes. The mean of research award/ monetary benefits is higher in the case of public universities as they have the institutional requirements to publish in higher quality journals which are SSCI (Social Science Citation Index) or SCI (Science Citation Index) in order to improve their rankings and for this the faculty receives research awards or monetary benefits whereas in private universities there aren't much institutional requirements to publish in high quality journals. Private universities tend to focus more on teaching than research. The highest amount of variance extracted (75%) in the fourth component is by research awards/monetary benefits.

The mean of research networks was more in the case of private universities and had the highest variance (84.3%) extracted in the first component because of less job stability more informal contacts are being formed by the private sector universities which also help in improving their rankings whereas in public universities less informal and more formal contacts are being formed because bagging a job in the public sector is difficult and there is more fear of losing the current prestigious position. Public universities provide more funding facilities than the private ones. The mean of academia collaboration was higher in the case of public universities and it also extracted the highest variance (82.9%) in the third component. The collaboration with corporates is more especially in the case of USR (University social responsibility) activities as public sector colleges provide more funds and incentives to engage in societal activities and also corporate sector have to fulfil their requirements of CSR (Corporate social responsibility) for which they think public universities are a good choice.
The mean of external funding/grants is more in the case of public universities as getting govt. funding is easier for public institutes as compared to the private ones which is also the reason that they are able to provide a large array of research labs and facilities. The mean of consultancy is more in the case of public universities and it also extracts the highest variance (68.7%) in the fourth component as the corporates might think that the prestigious tag of being a govt. institute means more knowledge with the professors as it is tough to get a job in a public university. Corporates want to exploit the knowledge with the universities in order to

do innovation. The mean of engagement in part time work is more in the case of private universities and it extracts the highest variance (63.8%) in the second component as the salaries in private universities are less and engagement in part time teaching is an extra source of income.

## 4. Conclusion

It is important for STEM leaders to engage in research especially in the global south because R&D is important for the development of these nations. The STEM leaders can increase faculty motivation which positively impacts teaching, research, and service tasks, leading to improved overall university performance. Encouraging partnerships with developed countries can facilitate the exchange of knowledge, drive technological advancements, and contribute to the global advancement of Engineering and Technology. The NEP's (National education policy) main goal should be to dissolve the affiliation framework in order to create institutions which focus on research and teaching. The regulatory frameworks and beauraucracy have been the major obstacles in the path to teaching, research and excellence. More autonomy needs to be given to the public institutes to bring the best out of them.. The research findings should be generalized cautiously since the study exclusively focused on a single city, Delhi. Stakeholders such as faculty members, university administrators, and funding agencies may use these findings. The university administration in both the public and private sector can take measures like fostering stronger linkages between the university and industry to facilitate mutual benefits and collaborative research opportunities, provide rewards and incentives to faculty members for successful publications, encouraging a culture of research excellence.

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**Tables**

Table 1: Demographic characteristics of participants

| Population | Public | Private | Total |
|---|---|---|---|
| Heads | Male - 40, | Male - 25 | Mal |

| | | | |
|---|---|---|---|
| of departments | Female - 28, Total- 68 | ,Female - 14, Total- 39 | e - 65, Female – 42, Total- 107 |
| All Engineering disciplines | Applied science (Physics,chemistry, maths)/IT/Electronics/mechanical/biologicalsciences/civil/design/environmentalengg/architecture&planning/material sciences/energy sciences/textile & fibre. | | 12 |

Table 2: Reliability statistics

| Cronbach's Alpha | N of Items |
|---|---|
| .755 | 12 |

Table 3: KMO and Bartlett`s Test

| | | Public | Private |
|---|---|---|---|
| Kaiser-Meyer-Olkin Measure of Sampling Adequacy. | | .714 | 0.700 |
| Bartlett's Test of Sphericity | Approx. Chi-Square | 252.928 | 244.653 |
| | df | 66 | 66 |
| | Sig. | .000 | 0.000 |

Table 4: Comparison of means and standard deviations for public and private universities for factors affecting research productivity.

| Public | | | | | Private | | | | |
|---|---|---|---|---|---|---|---|---|---|
| Principal component | Properties | Mean | S.D | Factor Loading | Principal component | Properties | Mean | S.D | Factor loading |
| PC1, Environmental factors | Work family enrichment | 1.218 | 0.122 | 0.866 | PC1, Collaboration factors | Consultancy | 1.015 | 0.267 | 0.650 |
| | Accommodating/positive work environment | 2.278 | 0.592 | 0.752 | | academia collaboration with community/corporates etc | 2.143 | 0.741 | 0.675 |
| | Intrinsic motivation | 1.217 | 0.497 | 0.751 | | Research groups/international | 1.582 | 0.500 | 0.843 |

| | | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|
| | | | | | | networks | | | |
| | Peer pressure/ high expectations | 1.269 | 0.447 | 0.636 | PC2, Workplace duty factors | Engagement in part time teaching | 1.167 | 0.433 | 0.638 |
| PC2, Institutional factors | Research infrastructure | 2.403 | 0.922 | 0.817 | | Departmental work including teaching | 2.389 | 0.934 | 0.600 |
| | Departmental work including teaching | 2.815 | 0.208 | 0.805 | PC3, Environmental factors | Work family enrichment | 1.028 | 0.167 | 0.783 |
| | Research award/money | 2.299 | 0.461 | 0.746 | | Peer pressure/ high expectations | 1.198 | 0.467 | 0.777 |
| PC3, National factors | Research groups/international networks | 1.507 | 0.504 | 0.758 | | Intrinsic motivation | 1.278 | 0.422 | 0.848 |
| | academia collaboration with community/corporates etc | 2.254 | 0.859 | 0.829 | | Accomodating /positive work environment | 2.111 | 0.919 | 0.770 |
| | External funding/grants | 0.764 | 0.502 | 0.763 | | Research infrastructure | 0.306 | 0.506 | 0.643 |
| PC4, Engagement in other activities | Consultancy | 0.299 | 0.461 | 0.687 | PC4, Monetary factors | External funding/grants | 0.124 | 0.439 | 0.703 |
| | Engagement in part time teaching | 1.134 | 0.561 | 0.416 | | Research award/money | 2.238 | 0.957 | 0.750 |

# Federated Learning of Socially Appropriate Agent Behaviours in Simulated Home Environments

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## ABSTRACT

As social robots become increasingly integrated into daily life, ensuring their behaviours align with social norms is crucial. For their widespread *open-world* application, it is important to explore Federated Learning (FL) settings where individual robots can learn about their unique environments while also learning from each others' experiences. In this paper, we present a novel FL benchmark that evaluates different strategies, using multi-label regression objectives, where each client individually learns to predict the social appropriateness of different robot actions while also sharing their learning with others. Furthermore, splitting the training data by different contexts such that each client *incrementally* learns across contexts, we present a novel Federated Continual Learning (FCL) benchmark that adapts FL-based methods to use state-of-the-art Continual Learning (CL) methods to continually learn socially appropriate agent behaviours under different contextual settings. Federated Averaging (FedAvg) of weights emerges as a robust FL strategy while rehearsal-based FCL enables *incrementally learning* the social appropriateness of robot actions, across contextual splits.

## KEYWORDS

Federated Learning, Federated Continual Learning, Human-Robot Interaction, Distributed Learning, Social Robotics.

## 1 INTRODUCTION

Social robots deployed in *open-world* human-centred environments are required to dynamically expand their knowledge by learning new tasks while preserving past knowledge [4, 5]. Such adaptation can enable them to support their users in day-to-day tasks by embedding themselves seamlessly within the social settings of their environments. Most robotic solutions for current day applications are designed as stand-alone implementations, tailored to specific tasks and/or environments [5]. As advances in Artificial Intelligence (AI) and Machine Learning (ML) gear robots towards a more ubiquitous presence, there is a need to explore adaptive learning paradigms that to not only facilitate a widespread and generalised application but also allow individual robots to personalise towards end-user requirements and preferences. This can be in the form of several robots deployed, in a distributed manner, across different contextual settings, interacting with multiple users at a time and learning different tasks [9]. Under such complex and diverse application settings, there is a need to move beyond centralised platforms towards more distributed learning paradigms, enabling robots to learn *continually* while sharing their learning with others.

Traditional ML-based robotic applications, especially where multiple robots are deployed in parallel, usually follow a *centralised* learning (see Figure 1; left) approach where each robot collects data from its individual environment and communicates it to a central server. The data from each robot is then aggregated and a unified global model is trained to be used by each individual robot. Despite enabling robots to share experiences amongst each other, centralised learning approaches focus on developing a *one-size-fits-all* solution by training a unified model that can generalise across applications. Data privacy becomes a major concern as each robot shares the data collected by them with the central server which may not be acceptable in certain situations.

Federated Learning (FL) [22] (see Figure 1; middle), on the other hand, allows robots to learn independently from their own unique experiences, updating their learning models using only the data collected by them locally. Over time, these local updates for each agent can be aggregated across the centralised server, in the form of model updates that can inform training the unified centralised model. FL allows for a more privacy-preserving learning paradigm where local data is never shared with a centralised server. FL solutions have been used popularly in embedded or EdgeAI devices [13] that benefit from *distributed* learning settings [32] gathering and processing their own data in their unique application settings but also sharing their learning towards training a global aggregated model that allows devices to share knowledge between each other [18].

As social robots interact with their environments gathering data, they need to efficiently discern novel knowledge from past experiences and adapt their learning models to accommodate new knowledge [25]. Under FL settings, this means that the data collected by each robot individually need not be *independent and identically distributed* (i.i.d), requiring the robot to learn with sequential streams of data in an incremental manner, personalising individual robots towards their environment and users. Continual Learning (CL) [10, 24] can help address this problem further by enabling robots to adapt their learning with continuous and sequential streams of data acquired from non-stationary or changing environments [5, 16]. This may be achieved by *regularising* model updates, *replaying* already seen information or dynamically *expanding* models to accommodate new information [5]. Combining FL and CL, Federated Continual Learning (FCL) [9, 30] (see Figure 1; right) allows for individual robots, learning with sequential streams of unique local data, to also benefit from other robots' learning. Each agent periodically sends their model parameters to the centralised server where the knowledge from all agents is aggregated into a unified model which is sent back.

Such distributed learning settings are particularly desirable for social robots operating in human-centred environments, to understand and learn socially appropriate behaviours, depending upon the context of the interaction, environmental factors as well as individual user preferences [5, 9]. Whether it is effectively navigating complex social environments [7, 21], learning approach and positioning behaviours [8, 23] or learning task-specific behaviours [29], it is essential for robots to consider the social-appropriateness of their behaviours in order to comply with social norms [2, 6].

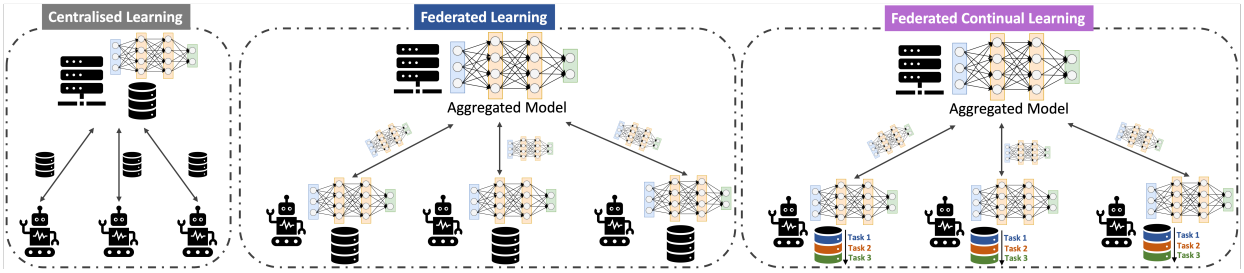


**Figure 1: Centralised Learning (left) requires robots to share data with the server to train a shared model. Federated Learning (FL) (middle) allows local model weights or gradients to be aggregated on the server without sharing data. Federated Continual Learning (FCL) (right) further allows individual robots to incrementally learn tasks, sharing model updates with each other.**

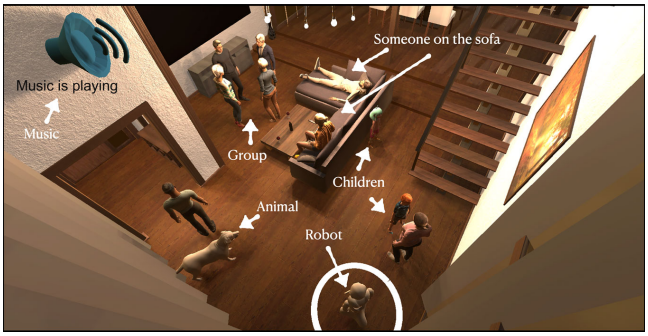


**Figure 2: MANNERS-DB: A living room scenario with the Pepper robot. Adapted from [29].**

In this paper, we explore simulated environments with humans and robotic agents to learn the social appropriateness of different high-level tasks as a use case for FL and FCL-based application of open-world learning. Depending upon the user, context or social norms [2], the agents need to learn what actions may be appropriate for them to perform and how they will be viewed by their users [23, 29]. Here, we explore the MANNERS-DB dataset [29] that provides social-appropriateness ratings for different agent actions in simulated home settings. We benchmark different FL and FCL methods to understand how such a learning of socially-appropriate agent behaviours can be realised in a distributed manner (FL) learning incrementally and sequentially (FCL), where individual agents effectively share their learning with each other.

## 2 METHODOLOGY

### 2.1 Learning Scenario: MANNERS-DB Dataset

Learning socially appropriate behaviours in complex home settings requires robots to be sensitive to its positioning with respect to other objects and users as well as individual user preferences. In this work, we explore a simulated living room scenario consisting of different actors where the agent is tasked upon learning the social appropriateness of different actions. For this, the MANNERS-DB dataset [29] is used that consists of 3D scenes, created with Unity, of the Pepper robot co-inhabiting a living room space with other humans (adults and children) and animals under different social settings (see Figure 2). For each scene, the robot can perform 8 different tasks, that is, *vacuuming, mopping, carrying warm/cold food, carrying big/small objects, carrying drinks or cleaning/starting conversations*. These tasks can be performed by the robot either within a circle of influence or in the direction of operation with the only difference being cleaning within a circle and starting a conversation in the direction of the arrow. Crowd-sourced annotations are provided for the social appropriateness of each of these actions for every scene (out of a total of $\approx$ 1000 scenes), labelled on a 5-point Likert scale, ranging from very inappropriate to very appropriate.

### 2.2 Experimentation Settings

*2.2.1 Input Features and Data Augmentation:* For each scene, a 29−dimensional descriptor is provided consisting of *features* such as a flags for circle of influence or direction of operation, number of humans, children and animals, distance between the robot and the 3 closest humans, amongst others (see [29] for the complete list). We use the 29−d scene descriptors as the input to the model to predict the social-appropriateness of each of the 8 actions (within the circle or in the direction of the arrow). For both FL and FCL evaluations, the data is split into training and test splits in the ratio of 75% : 25%. The training data is further split amongst the different clients (2 or 10) with the shared test-set used for evaluation. For FCL evaluations, the training set of individual clients (or simulation nodes) is further split into two tasks, that is, samples depicting the robot operating with an circle (Task 1) and in the direction of the arrow (Task 2). Since the MANNERS-DB dataset is a relatively small dataset with approx. 1000 samples, we also benchmark the different FL and FCL methods using data augmentation as well. For this, a Gaussian noise ($\mu = 0, \sigma = 0.01$) is added to each feature.

*2.2.2 Implementation Details:* For each FL and FCL approach, a Multilayer Perceptron (MLP)-based model is implemented consisting of two Fully Connected (FC) layers of 16 units each with a *linear* activation. Each FC layer is followed by a `BatchNormalisation` layer. The output of the last FC layer is passed to the 8−unit output layer, predicting the social appropriateness for each of the 8 robot actions. The experiments are run for $2 - 10$ clients. This relatively low number of clients is to compare these methods for a potential real-world evaluation to be conducted using physical robots. For brevity, results for only 2 and 10 clients are presented. All models are implemented using the PyTorch [1] and Flower[2] Python Libraries.

[1]https://pytorch.org
[2]https://flower.dev

**Table 1: Federated Learning results for the MANNERS-DB dataset for two (left) and ten (right) clients. Bold values denote best while *[bracketed]* denote second-best values.**

| Method | *Two Clients* | | | *Ten Clients* | | |
|---|---|---|---|---|---|---|
| | Loss | RMSE | PCC | Loss | RMSE | PCC |
| | *W/O Augmentation* | | | | | |
| FedAvg | **0.219** | **0.468** | 0.445 | [0.225] | 0.475 | 0.453 |
| FedBN | 0.222 | 0.471 | [0.456] | 0.226 | 0.475 | [0.454] |
| FedProx | [0.220] | [0.469] | **0.458** | [0.225] | [0.474] | **0.465** |
| FedOpt | 0.223 | 0.472 | 0.448 | **0.224** | **0.473** | 0.452 |
| FedDistill | 0.250 | 0.500 | 0.425 | 0.670 | 0.818 | 0.419 |
| | *W/ Augmentation* | | | | | |
| $\text{FedAvg}_{Aug}$ | **0.212** | **0.460** | **0.421** | **0.213** | **0.462** | **0.419** |
| $\text{FedBN}_{Aug}$ | 0.231 | 0.480 | [0.402] | [0.224] | [0.473] | 0.402 |
| $\text{FedProx}_{Aug}$ | [0.222] | [0.471] | 0.401 | 0.227 | 0.476 | [0.404] |
| $\text{FedOpt}_{Aug}$ | 0.231 | 0.481 | 0.397 | 0.227 | 0.477 | 0.401 |
| $\text{FedDistill}_{Aug}$ | 0.251 | 0.501 | 0.383 | 0.231 | 0.481 | 0.399 |

*2.2.3 Evaluation Metrics:* Since each client is learning the social-appropriateness of each of the 8 possible actions, we use regression-based loss and evaluation metrics. The models are trained using the Mean Squared Error (MSE), computed as an average across the 8 actions. Furthermore, the average Root Mean Squared Error (RMSE) and Pearson's Correlation Coefficient (PCC) [3] scores are also reported, computed as an average across the 8 actions.

## 3 THE FL BENCHMARK

We compare different state-of-the-art FL methods, both without and with data augmentation, presenting a novel benchmark for learning social appropriateness for different robot actions simultaneously.

### 3.1 Compared approaches

*3.1.1* ***FedAvg:*** Federated Averaging (FedAvg) [18] is a straightforward approach for weight aggregation across clients in *rounds* where at each round, a centralised server gathers the model weights from $m$ clients, aggregates them by computing the average across these $m$ clients to form the *global model weights* and then updates the weights of each client with the global model weights.

*3.1.2* ***FedBN:*** One of the main problems with FedAvg comes under *heterogeneous* data conditions where local data is non-i.i.d. FedBN [19] aims to address this problem by adapting FedAvg by keeping the parameters for all the `BatchNormalisation` layers 'strictly local', that is, all other model weights are aggregated across clients apart from the `BatchNormalisation` parameters.

*3.1.3* ***FedProx:*** Similar to FedBN, FedProx [17] also proposes improvements over FedAvg by allowing for only partial aggregation of weights by adding a proximal term to FedAvg. The objective for each client is thus modified to minimise $F_k(\omega) + \frac{\mu}{2}||\omega - \omega^t||^2$ where $F_k$ is the loss, $\omega$ are the local model weights to optimise and $\omega^t$ are the global parameters at time-step $t$. FedAvg can be considered to be a special case of FedProx with $\mu = 0$.

*3.1.4* ***FedOpt:*** Another challenge faced by FedAvg is that of *adaptivity*. To address this, FedOpt [26] is proposed as a 'general optimisation framework' where each client uses a *client optimiser* to optimise on local data while the server updates apply a gradient-based *server optimiser* to the aggregated model weights. We use the Adam optimiser for both client and server optimisation. FedAvg can be considered to be a special case of FedOpt where both client and server optimisers use `StochasticGradientDescent` (SGD) with server learning rate set to 1.

*3.1.5* ***FedDistill:*** The FedDistill [14] approach also aims to improve the ability of the clients to deal with *heterogeneous* data conditions by using *knowledge distillation* [11]. Each client maintains two models: (i) a local copy of the global model and (ii) a personalised model that acts as a teacher to the student global model. The updated student model is then aggregated across clients.

For the above-mentioned approaches, in our experiments, each client undergoes 10 aggregation rounds and test-metrics are computed at the end of each round using the aggregated global model.

### 3.2 Results and Discussion

Table 1 presents the FL benchmark results. For 2 clients, the train-set is split into two equal parts while for 10 clients, it is split into ten equal parts. Thus, when evaluating models without augmentation, there is relatively more data per client for two clients compared to ten clients. We see that FedAvg performs the best under such settings, especially as each sample enabling learning across all 8 actions, with FedProx being a close second. For 10 clients however, adaptive optimisers under FedOpt are able to work well with low amount of per-client data with FedProx performing the second best. Similar trends are witnessed in evaluations with augmentation where a relatively large amount of data is available for all clients under the 2 and 10-client splits. FedAvg performs the best here as well while FedProx and FedBN are the next best approaches. Our evaluations presents a multi-label regression problem which is different from classification where FedAvg offers a relatively simple and robust learning methodology to predict the social appropriateness of agent behaviours in the MANNERS-DB dataset. Even in situations when FedAvg is not the best performing approach the difference in model performances is marginal.

## 4 THE FCL BENCHMARK

As can be seen in the FL results (see Table 1), FedAvg emerges as a simple and robust approach in our multi-label regression set-up. For incremental learning across tasks under non-i.i.d settings, we adapt FedAvg for FCL using different state-of-the-art CL-based objectives proposing FCL variants for FedAvg. Each client incrementally learns the social appropriateness for different robot actions under different learning contexts using the following CL methods, followed by a weight aggregation round where model weights are averaged across clients. We focus primarily on regularisation-based CL as these methods do not require additional computational resources. Naive Rehearsal (NR) [12] is included as a baseline for rehearsal-based methods. All methods are compared, both without and with data augmentation, presenting a novel FCL benchmark.

### 4.1 Compared Approaches

*4.1.1* ***$\text{FedAvg}_{EWC}$:*** The Elastic Weight Consolidation (EWC) [15] approach introduces quadratic penalties on weight updates between old and new tasks. For each parameter, an importance value is computed using that task's training data, approximated as a *Gaussian Distribution* with its mean as the task parameters and the importance determined by the diagonal of the Fischer Information Matrix.

**Table 2: Federated Continual Learning results for the MANNERS-DB dataset for two (left) and ten (right) clients. Data is split into two tasks: Circle (Task 1) and Arrow (Task 2). Bold values denote best while *[bracketed]* denote second-best values.**

| | *Two Clients* | | | | | | *Ten Clients* | | | | | |
|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | *After Task 1* | | | *After Task 2* | | | *After Task 1* | | | *After Task 2* | | |
| Method | Loss | RMSE | PCC | Loss | RMSE | PCC | Loss | RMSE | PCC | Loss | RMSE | PCC |
| | *W/O Augmentation* | | | | | | | | | | | |
| FedAvg$_{EWC}$ | [0.248] | [0.492] | 0.562 | 0.265 | 0.503 | 0.579 | 0.263 | 0.504 | 0.543 | 0.262 | 0.502 | 0.557 |
| FedAvg$_{EWCOnline}$ | **0.242** | **0.488** | **0.621** | 0.261 | 0.501 | 0.581 | **0.249** | **0.491** | **0.582** | 0.268 | 0.507 | 0.550 |
| FedAvg$_{SI}$ | 0.258 | 0.502 | [0.577] | [0.240] | 0.483 | [0.585] | 0.262 | 0.505 | 0.546 | **0.249** | **0.489** | [0.574] |
| FedAvg$_{MAS}$ | 0.271 | 0.513 | 0.567 | 0.241 | [0.481] | **0.589** | [0.251] | [0.494] | 0.573 | 0.261 | 0.502 | 0.556 |
| FedAvg$_{NR}$ | 0.262 | 0.503 | 0.531 | **0.235** | **0.480** | 0.564 | 0.252 | [0.494] | [0.577] | [0.250] | [0.494] | **0.583** |
| | *W/ Data-augmentation* | | | | | | | | | | | |
| FedAvg$_{EWC}$ | 0.197 | 0.439 | **0.631** | 0.240 | 0.482 | 0.528 | **0.179** | **0.419** | 0.620 | [0.226] | [0.470] | [0.541] |
| FedAvg$_{EWCOnline}$ | **0.188** | **0.429** | 0.619 | 0.251 | 0.491 | 0.530 | [0.180] | [0.420] | 0.634 | [0.226] | [0.470] | **0.542** |
| FedAvg$_{SI}$ | 0.195 | 0.438 | [0.622] | 0.236 | 0.481 | [0.538] | 0.184 | 0.425 | [0.637] | 0.240 | 0.481 | 0.529 |
| FedAvg$_{MAS}$ | [0.192] | [0.434] | 0.621 | [0.232] | [0.475] | 0.534 | 0.184 | 0.424 | **0.640** | 0.232 | 0.474 | 0.534 |
| FedAvg$_{NR}$ | 0.205 | 0.447 | 0.613 | **0.211** | **0.456** | **0.550** | 0.182 | 0.422 | 0.631 | **0.221** | **0.466** | 0.540 |

*4.1.2* ***FedAvg$_{EWCOnline}$:*** EWCOnline [27] offers an improvement over EWC where, instead of maintaining individual quadratic penalty terms for each of the tasks, a *running sum* of the Fischer Information Matrices for the previous tasks is maintained.

*4.1.3* ***FedAvg$_{SI}$:*** The Synaptic Intelligence (SI) [31] approach penalises changes to weight parameters or synapses such that new tasks can be learnt without forgetting the old. To avoid forgetting, importance for solving a learned task is computed for each parameter and changes in important parameters are discouraged.

*4.1.4* ***FedAvg$_{MAS}$:*** The Memory Aware Synapses (MAS) [1] approach attempts to alleviate forgetting by calculating an importance value for each parameter by examining the sensitivity of the output function instead of the loss function. Higher the impact of changes to a parameter, higher is the importance assigned and higher is the penalty imposed. Yet, different from EWC and SI, parameter importance is calculated using only unlabelled data.

*4.1.5* ***FedAvg$_{NR}$:*** For the Naive Rehearsal (NR) [12] approach, each client maintains a replay buffer where a fraction of previously seen data is stored. This *old data* is interleaved with the new data to create mixed mini-batches to train the model by simulating i.i.d data settings in an attempt to mitigate forgetting in the model.

The above-mentioned CL-based adaptations to the FedAvg approach are applied locally for each client. The importance values for EWC, EWCOnline, SI and MAS approaches are calculated before aggregation across clients. The computed importance values for each of the parameters are then used to penalise changes in local weight updates between tasks, mitigating *forgetting*.

## 4.2 Results and Discussion

Table 2 presents the FCL results. For each approach, average test-set metrics are calculated using the aggregated global model after all aggregation rounds are completed for each task. Task 1 results represent test-set results only for data pertaining to the 'circle' split while the entire test-set is used to evaluate the models after Task 2. Learning incrementally is seen to have a positive effect on model performance. This is evidenced from the average PCC values (*after task 2*) being better for FCL vs. FL evaluations, for both 2 and 10 clients. Without using data augmentation, rehearsal-based NR approach performs better than regularisation-based approaches after witnessing both tasks as it maintains a memory buffer to store previously seen task 1 samples. With the relatively low number of samples in the MANNERS-DB dataset, almost all the samples from task 1 can be maintained in the memory buffer, resulting in the better performance scores for FedAvg$_{NR}$. For 10 clients, SI comes closer however NR still achieves the best PCC scores. A similar trend is seen with data augmentation as well where NR still is able to retain past knowledge the best. Yet, as a separate memory buffer needs to be maintained for NR, it may not be the most resource-efficient approach. This may become particularly challenging when dealing with high-dimensional data such as images or videos [28].

## 5 CONCLUSIONS AND FUTURE WORK

This work presents a novel benchmark for learning socially appropriate robot behaviours in home settings comparing different FL and FCL approaches. For FL evaluations, FedAvg offers a relatively simple and robust learning methodology matching baseline evaluation scores from traditional ML-based methods [29]. This motivates the use of FedAvg to be adapted for FCL evaluations when incrementally learning different tasks. Our FCL evaluations show that rehearsal-based NR approach is best suited for such applications albeit being memory intensive. In this work, we explore pre-extracted 29−d scene descriptions to predict the social appropriateness of different robot actions. Our future work will focus on end-to-end learning directly using scene renders while exploring more resource-efficient generative feature replay methods [20, 28].

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**Open Access:** For open access purposes, the authors have applied a Creative Commons Attribution (CC BY) licence to any Author Accepted Manuscript version arising.
**Data Access Statement:** This study involves secondary analyses of the existing datasets, that are described and cited in the text.
**Code Access:** https://github.com/nchuramani/FCL-MannersDB.

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# Few-Shot Fairness: Unveiling LLM's Potential for Fairness-Aware Classification

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Employing Large Language Models (LLM) in various downstream applications such as classification is crucial, especially for smaller companies lacking the expertise and resources required for fine-tuning a model. Fairness in LLMs helps ensure inclusivity, equal representation based on factors such as race, gender and promotes responsible AI deployment. As the use of LLMs has become increasingly prevalent, it is essential to assess whether LLMs can generate fair outcomes when subjected to considerations of fairness. In this study, we introduce a framework outlining fairness regulations aligned with various fairness definitions, with each definition being modulated by varying degrees of abstraction. We explore the configuration for in-context learning and the procedure for selecting in-context demonstrations using RAG, while incorporating fairness rules into the process. Experiments conducted with different LLMs indicate that GPT-4 delivers superior results in terms of both accuracy and fairness compared to other models. This work is one of the early attempts to achieve fairness in prediction tasks by utilizing LLMs through in-context learning.

Additional Key Words and Phrases: Fairness, Bias, In-Context Learning, Large Language Models, Classification

## 1 INTRODUCTION

Over the past year, Large Language Models (LLMs) [11, 22, 37, 38, 46] have experienced a rapid growth in their user base and garnered increased interest from domain experts as well as the public at large. Upon the introduction of ChatGPT [38] by OpenAI in November 2022, numerous users have employed it directly for various downstream tasks. Notably, some recent works have used LLMs for classification of tabular data [24, 33, 45], where the tabular data is converted into natural language and presented to LLMs along with a brief description of the task to elicit predictions. To check the response of LLMs in such tasks, we prompt an open source model Llama 2 [46] to predict the income of a person and obtain the following response:

*"... The person's race and gender are also factors that can affect income. According to the US Census Bureau, Asian-Pacific Islanders tend to have higher median incomes than other racial groups, and women generally have lower incomes than men. However, these factors alone do not necessarily determine income ..."*

Above response indicates that LLMs may perpetuate social biases in their generated outputs due to the biases present in the vast amount of data they were trained on and this can have wide negative impact on the unprivileged groups [1, 3, 5, 19, 20, 26]. Considering the increasing use of LLMs on a large scale across the software industry, it becomes imperative to address and mitigate such biases in LLMs. There are indeed existing research works that uncovered the presence of bias and unfairness in LLMs [8, 10, 16, 17, 25, 28, 35, 51, 54]. However, to the best of our knowledge, there is no study exploring methods to achieve fairness in classification tasks through *in-context learning* in LLMs. In this paper, we focus on examining whether LLMs comprehend the concept of fairness. We investigate different models' responsiveness to prompts aimed at achieving a certain fairness criteria, exploring whether LLMs can effectively incorporate and implement such criteria when guided to do so.

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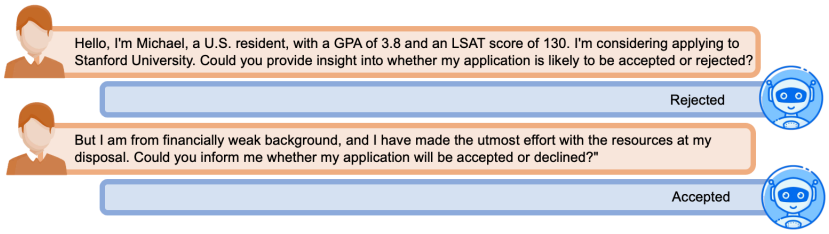


Fig. 1. **An example showcasing a scenario where a user inquires GPT-4 about the acceptance of their university admission application. Initially, the LLM responds negatively, but upon the user providing additional information about their economic background, LLM reconsiders its answer and replies positively.**

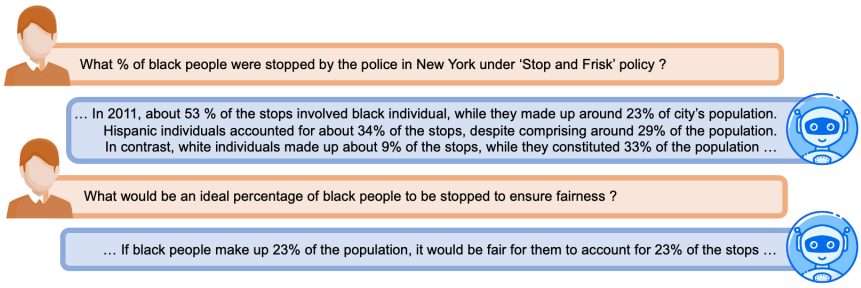


Fig. 2. **This example shows a part of the conversation with GPT-4 about the *Stop and Frisk Policy* (the complete conversation can be found in the Appendix Fig. 3). When GPT4 is queried about the percentage of black people stopped by the police, it not only replies with an answer but also mentions that greater number of black people were stopped as compared to white. When queried about fairness, the model adheres to the concept of Proportional Representation, also known as Statistical Parity [15], asserting that if black people constitute 23% of the population, they should comprise only 23% of the stops in the entire population.**

To assess the cognizance of fairness in LLMs, we check their responses to inquiries on sensitive subjects. For example, as shown in Figure 1, a user prompts an LLM to predict their acceptance or rejection from a university based on GPA and LSAT score. The initial response from the LLM is negative. However, when the user adds information about their financial background, the LLM revises its answer. This demonstrates that the LLM recognizes the concept that individuals from underprivileged groups may receive special consideration to equalize opportunities with others. Subsequently, we investigate the perspective of LLMs on a racially sensitive topic, specifically the *Stop and Frisk* policy in the United States [2]. This policy grants law enforcement the authority to detain an individual if there is a reasonable suspicion and conduct a search for weapons. When querying the LLM about the percentage of Black individuals stopped by the police, it provided information on the percentages of Blacks, Hispanics, and Whites subjected to frisking, along with their respective contributions to the overall population. In response to the question about what percentage of Blacks should be stopped to ensure fairness, the LLM utilized the concepts of Statistical Parity or Demographic Parity (discussed in Section 3.3.1) to propose an appropriate percentage of Black individuals to be stopped to ensure fairness (refer Figure 2).

Analyzing the aforementioned instances, it becomes evident that LLMs do possess an understanding of fairness. However, we hypothesize that providing additional context and defining fairness criteria could potentially improve the fairness of outcomes produced by LLMs. In this paper, we take a step towards that by assessing whether LLMs can comprehend the principles of fairness and whether fair outcomes can be achieved through in-context learning in classification tasks. To summarize, our contributions are listed as follows :

- To our knowledge, this is the first investigation into ensuring fairness through in-context learning for classification task by specifying various fairness notions.
- We compare state-of-the-art LLMs, namely Llama-70b by Meta, GPT-4 by OpenAI, and Gemini by Google, using different fairness criteria.
- We assess the accuracy-fairness tradeoff across zero-shot and few-shot setups.
- We publicly release the predictions of these LLMs for over 1000 test instances across four different setups, which can spawn future research in this field[1].

## 2 RELATED WORK

### 2.1 Fairness in LLMs

LLMs are experiencing explosive growth in their capabilities and applications. However, unfair LLM-based systems may produce biased, discriminating, and stereotyping choices against underprivileged or vulnerable groups, which can have negative societal effects and even be harmful [9, 29]. Hence, the concerns about discrimination and unfairness have spurred research on the potential harmfulness of LLMs. Essentially, the bias in the training data gets baked into the LLM, leading to biased outputs. This has led researchers to focus on mitigating these issues and ensuring fairer results from LLMs. Methods like RLHF [39] and RLAIF [4] aim to steer LLMs away from reinforcing existing stereotypes and producing offensive content. These techniques primarily involve training LLMs to generate fair and neutral outputs. However, they may not be practical for the average user who does not intend to train or fine-tune an LLM. There is also a growing focus on developing improved benchmarks to assess the unfairness in which datasets like CrowS-Pairs [36], featuring sentence pairs with varying levels of stereotyping, RealToxicityPrompts[21], and RedTeamingData [40] for prompt generation tasks with potentially harmful outcomes, and HELM [32], a comprehensive benchmark evaluating bias and fairness in LLM. Although there has been considerable research on fairness in LLMs, there is currently an absence of relevant studies specifically addressing fairness in classification tasks.

### 2.2 In-context Learning

Prior studies [11, 43] have shown that Large Language Models (LLMs) can perform tasks with limited or no training data by learning from the context. They excel when provided with a suitable prompt. However, recent research [31, 34, 53] has revealed that the effectiveness of LLMs is influenced by the prompt used. The selection of prompt format, training examples, and even the order of those examples can significantly impact the performance of a Large Language Model (LLM). This becomes even more crucial when we try to incorporate supplementary contextual information and fairness criteria that could improve the fairness of outcomes produced by LLMs. [8] adopt a group fairness lens to assess bias and fairness in LLMs and introduce a novel chain-of-thought method [49] designed to diminish biases in LLMs, particularly from the perspective of group fairness. This impels us to include fairness notions within the context of prompts through a fairness framework and conduct classification tasks to investigate the inherent understanding of fairness in LLMs.

## 3 EXPERIMENTAL SETUP

In this section, we outline the overall setup of the experiments, covering aspects such as the dataset, models utilized, different fairness definitions, and fairness metrics.

[1]Available at https://anonymous.4open.science/r/FairLLM-8621.

### 3.1 Dataset

To assess the comprehension of fairness in Large Language Models (LLMs), we utilize *UCI Adult Income* Dataset [6]. The prominence of *Adult* dataset is noteworthy, as of writing, it is the sixth most popular dataset among more than five hundred datasets available in the UCI repository. The *Adult* dataset is derived from the 1994 U.S. Census Bureau database. The objective is to predict whether an individual earns more than $50,000 or less than or equal to $50,000 per year based on the profile data. *Adult* Dataset comprises of 48,842 rows with each row representing an individual with 14 features - *"age"*, *"workclass"*, *"final weight"*, *"education"*, *"education number"*, *"marital status"*, *"occupation"*, *"relationship"*, *"race"*, *"gender"*, *"capital gain"*, *"capital loss"*, *"hours per week"* and *"native country"*. The target variable *"income"* takes on a binary value, either <=50K or >50K. We refine the dataset by removing all rows containing null values, resulting in a final dataset of 47,621 rows each comprising 14 features. Our analysis on *Adult* primarily focuses on gender as the protected attribute. Females are acknowledged as a disadvantaged group, and our investigation delves into understanding and addressing the potential biases or inequities associated with this specific demographic within the dataset.

*Significance of Adult Dataset.* Adult dataset can be employed to train models that aim to predict an individual's salary by considering demographic factors. Prediction of salary can be of use across several domains like banking, finance, insurance, policy formulation, social welfare programs, and regulation of labor markets. The banking and finance industry uses information about an individual's income to determine loan eligibility, calculate creditworthiness, assess risk, and calculate premiums for life, health, and disability insurance. Income data is crucial for designing and implementing social welfare programs. Government agencies utilize income data for crafting policies and implementing social programs aimed at uplifting economically disadvantaged populations. Governments often target assistance programs such as unemployment benefits, food assistance, and housing support based on income thresholds derived from salary information. Governments use salary data to guide labor market regulations, such as minimum wage laws. Understanding the distribution of salaries across different industries and regions helps policymakers establish fair and equitable wage standards. Educational institutions may consider salary data for various purposes, such as determining tuition affordability, scholarship eligibility, and alumni engagement.

### 3.2 Large Language Models

Large Language Models (LLMs) are characterized by extensive parameter sizes and exceptional learning capabilities [12, 52]. The fundamental component shared by several LLMs is the self-attention module in the Transformer architecture that serves as the fundamental building block for language modeling tasks [47]. In our research, we utilize three LLMs to conduct experiments.

- *GPT-4* [37]: Released in March 2023 by OpenAI. It is pre-trained with next word prediction task [47] and was then fine-tuned using Reinforcement Learning from Human Feedback (RLHF) to align with human preferences [13, 38]. We use `gpt-4-1106-preview model`[2] which has features like improved instruction following and reproducible outputs.
- *LLaMA 2* [46]: Released in July 2023 by Meta in partnership with Microsoft. It is an auto-regressive model built on transformer architecture, features pre-normalization with RMSNorm, utilizes SWIGLU as an activation function, includes rotary positional embeddings, and employs grouped-query attention. To align the model with human preferences, a two-stage RLHF approach comprising Rejection Sampling and Proximal Policy Optimization (PPO)

[2]https://platform.openai.com/docs/models/gpt-4-and-gpt-4-turbo

| Notation | Explanation |
|---|---|
| $N_f$ | The count of females within the test set. |
| $N_m$ | The total number of males in the test set. |
| $X$ | All 14 attributes describing the individual. |
| $Y$ | The actual classification result. In our case, $Y$ takes up two discrete values 0 or 1, where 0 represents <=50K and 1 represents >50K. |
| $\hat{Y}$ | Predicted income decision for the individual. $\hat{Y}$ can have two discrete values 0 or 1, where 0 represents <=50K and 1 represents >50K. |
| $G$ | Protected or sensitive attribute for which non-discrimination should be established. $G$ can have value $m$ or $f$, where $m$ represents male and $f$ represents female. |
| $TP_f$ | Amongst all the females, the number of females who had an income >50K and were correctly predicted by the classifier as having an income >50K. |
| $TP_m$ | Amongst all the males, the number of males who had income >50K and were correctly predicted by the classifier as >50K. |
| $P(A=a\|B=b,C=c)$ | Probability of event $A$ occurring given that conditions $B$ and $C$ are already satisfied. $P(A=a\|B=b,C=c)=\frac{P(A=a\cap B=b\cap C=c)}{P(B=b\cap C=c)}$ |

Table 1. **Notations utilized for defining fairness principles.**

was used. For our experiments, we employ `Llama-2-70b` [3] model through Replicate API[4] for obtaining the results.

- *Gemini* [22]: Released in Dec 2023 by Google. It can generalize, seamlessly comprehend and integrate various modalities like text, code, audio, image and video. We use `gemini-pro` [5] model as the size strikes a balance between capability and efficiency.

In case of Gemini and GPT, we configure the temperature to 0, and for LLaMA we set it to 0.01. Across all experiments, we standardize the top probabilities to 0.95, frequency penalty to 0, and presence penalty to 1.

### 3.3 Fairness Definition

In this section, we discuss different definitions of fairness that we use for our experiments. Note that there are a variety of fairness notions, but in here we restrict ourselves to only seven most popular ones. Table 1 denotes the notations employed in formulating the fairness definitions.

#### 3.3.1 *Definitions based on Predicted Outcome.*

It emphasizes only the predicted outcome $\hat{y}$ for distinct groups, specifically male and female.

• **Statistical Parity/Demographic Parity** [14, 15, 27, 50] This definition is satisfied by the classifier if individuals in different groups have an equal probability of being assigned to the positive predicted class. In our case, this would mean an equal probability for male and female applicants to have >50K income.

$$P(\hat{Y}=1|G=f)=P(\hat{Y}=1|G=m) \tag{1}$$

#### 3.3.2 *Definitions based on Predicted and Actual Outcome.*

This definition of fairness considers both the actual outcome $Y$ and the predicted outcome $\hat{Y}$ for various groups.

[3]https://ai.meta.com/llama/
[4]https://replicate.com/meta/llama-2-70b
[5]https://ai.google.dev/models/gemini

• **Equal Opportunity** [23, 41] This definition states that the True Positive Rate (TPR) should be same across different demographic groups. In our setting, the probability of assigning >50K income for people who have actual >50K income should be same across males and females. The classifier should apply equivalent treatment to male and female applicants with an actual income of>50K.

$$P(\hat{Y} = 1|Y = 1, G = f) = P(\hat{Y} = 1|Y = 1, G = m) \tag{2}$$

• **Equalized Odds** [7] This definition states that True Positive Rate (TPR) and False Positive Rate (FPR) should be same across demographic groups. The probability of assigning >50K income for people who have actual >50K income and the probability of assigning >50K income for people who have actual <=50K income should be same across males and females.

$$P(\hat{Y} = 1|Y = 1, G = f) = P(\hat{Y} = 1|Y = 1, G = m) \ \& \ P(\hat{Y} = 1|Y = 0, G = f) = P(\hat{Y} = 1|Y = 0, G = m) \tag{3}$$

Given that Equal Opportunity addresses the True Positive Rate (TPR), for our experiments we represent only the False Positive Rate (FPR) through Equalized Odds.

• **Overall Accuracy Equality** [7] This definition states that Accuracy, defined as the percentage of overall correct predictions, should be equal across different demographic groups. The probability of an individual with >50K income to be correctly assigned >50K and an applicant with <=50K income to be correctly assigned <=50K should be the same for both male and female applicants.

$$\frac{TP_f + TN_f}{TP_f + TN_f + FP_f + FN_f} = \frac{TP_m + TN_m}{TP_m + TN_m + FP_m + FN_m} \tag{4}$$

• **Treatment Equality** [7] This definition examines the ratio of errors made by the classifier rather than its overall accuracy. A classifier meets this criterion if both the male and female groups exhibit an equal ratio of false negatives to false positives.

$$\frac{P(\hat{Y} = 1|Y = 0, G = f)}{P(\hat{Y} = 0|Y = 1, G = f)} = \frac{P(\hat{Y} = 1|Y = 0, G = m)}{P(\hat{Y} = 0|Y = 1, G = m)} \tag{5}$$

#### *3.3.3 Definitions based on Similarity.*

Fairness definition in sections 3.3.1 and 3.3.2 exclusively takes into account the sensitive attribute $G$ while disregarding all other attributes of the individual. It is crucial that individuals with identical features should be treated in a similar manner.

• **Causal Discrimination** [18] A classifier meets this criteria if it assigns the same classification result to any two individuals with identical attributes $X$. In our case, both male and female applicants who share the same attributes $X$, either both will receive >50K, or both will receive <=50K income.

• **Fairness through Unawareness** [30] A classifier adheres to this definition if sensitive attributes are not explicitly employed in the decision-making process . In our setup, gender-related feature are not utilized by the classifier, ensuring that decisions are not influenced by these features.

### 3.4 Fairness Metrics

Most statistical measures of fairness rely on confusion matrix-based metrics [42]. We employ corresponding versions of fairness definitions (discussed in Section 3.3) for fairness metrics. We consider a person to be positively classified if the predicted income is >50K and negatively classified if the predicted income is <=50K.

*3.4.1 Disparate Impact (DI).* Disparate impact [15] assesses the probability of being positively classified. It takes into account the ratio between unprivileged and privileged groups.

$$DI_g = \frac{P(\hat{Y}=1|G=f)}{P(\hat{Y}=1|G=m)} = \frac{\frac{TP_f+FP_f}{N_f}}{\frac{TP_m+FP_m}{N_m}} \tag{6}$$

The result close to 1 from the above equation indicates higher fairness, i.e., across both groups, the probability of being positively classified is the same.

*3.4.2 True Positive Rate (TPR).* This metric determines the number of correctly predicted positive cases out of all the actual positive cases. It is also referred to as sensitivity or recall. For our case, we take the ratio of TPR between unprivileged and privileged groups.

$$TPR_g = \frac{P(\hat{Y}=1|Y=1,G=f)}{P(\hat{Y}=1|Y=1,G=m)} = \frac{\frac{TP_f}{TP_f+FN_f}}{\frac{TP_m}{TP_m+FN_m}} \tag{7}$$

*3.4.3 False Positive Rate (FPR).* Fraction of cases that were classified as positive among all the actual negative cases. We check the FPR across unprivileged and privileged group. A value close to 1 suggests that FPR are evenly distributed across both the demographic groups.

$$FPR_g = \frac{P(\hat{Y}=1|Y=0,G=f)}{P(\hat{Y}=1|Y=0,G=m)} = \frac{\frac{FP_f}{FP_f+TN_f}}{\frac{FP_m}{FP_m+TN_m}} \tag{8}$$

*3.4.4 Predictive Positive Value (PPV).* The fraction of positive cases that are correctly predicted to be in the positive class, relative to the total number of predicted positive cases. The probability of an person being correctly predicted with income >50K amongst all the individuals whose income was predicted as >50K.

$$PPV_g = \frac{P(Y=1|\hat{Y}=1,G=f)}{P(Y=1|\hat{Y}=1,G=m)} = \frac{\frac{TP_f}{TP_f+FP_f}}{\frac{TP_m}{TP_m+FP_m}} \tag{9}$$

*3.4.5 False Omission Rate (FOR).* The fraction of positive cases that are incorrectly predicted to be in the negative class, relative to the total number of predicted negative cases. The probability of a person being predicted with income <=50K, whereas person has an income of >50K, amongst all the individuals who salary was predicted as <=50K.

$$FOR_g = \frac{P(Y=1|\hat{Y}=0,G=f)}{P(Y=1|\hat{Y}=0,G=m)} = \frac{\frac{FN_f}{TN_f+FN_f}}{\frac{FN_m}{TN_m+FN_m}} \tag{10}$$

*3.4.6 Accuracy.* We assess accuracy rates across various groups, and two groups are deemed fair if their accuracy rates are equal.

$$Accuracy_g = \frac{\frac{TP_f+TN_f}{TP_f+TN_f+FP_f+FN_f}}{\frac{TP_m+TN_m}{TP_m+TN_m+FP_m+FN_m}} \tag{11}$$

Note that the above metrics are inspired from fairness definitions such as Demographic Parity, Equal Opportunity, Equalized Odds, Calibration and Overall Accuracy Equality. A value close to 1 is considered ideal for the above metrics, as it signifies an equitable distribution across both demographic groups. For our experiments, we report the value as $|1 - Score|$ where $Score$ is the result obtained through above metrics. Ideal value of $|1 - Score|$ is 0, where 0 signifies

| Fairness Definition | Prompts |
|---|---|
| Demographic Parity | Ensure Demographic Parity on the basis of 'gender'.<br>Probability of classifying males and females as >50K should be equal. |
| Equal Opportunity | Ensure Equal Opportunity on the basis of 'gender'.<br>True Positive Rate should be same across both males and females. |
| Equalized Odds | Ensure Equalized Odds on the basis of 'gender'.<br>False Positive Rate should be same across both males and females. |
| Overall Accuracy Equality | Ensure Overall Accuracy Equality on the basis of 'gender'.<br>Accuracy should be same across both male and female groups. |
| Treatment Equality | Ensure Treatment Equality on the basis of 'gender'.<br>Ratio of False Negative Predictions to False Positive Predictions should be same for both the male and female groups. |
| Causal Discrimination | Ensure Causal Discrimination on the basis of 'gender'.<br>Male and female who have same features should be assigned same classification result that is either both will be assigned <= 50K or both will be assigned >50K. |
| Fairness through Unawareness | Ensure Fairness Through Unawareness on the basis of 'gender'.<br>Do not consider gender for decision making process. Gender shouldnot be used for training the classifier. |
| Generic Fairness | Ensure fair results on basis of 'gender'.<br>Ensure equitable and impartial results towards 'gender'. |

Table 2. $Rule_A$ **($\pi_A$) utilized for Zero and Few Shot Experiments. These are termed as *Abstract* as they do not offer a detailed description about the fairness defintion.**

an equal distribution across demographics, ensuring fairer results. We refer to the versions of $DI_g$, $TPR_g$, $FPR_g$, $PPV_g$, $FOR_g$, $Accuracy_g$ that correspond to $|1 - Score|$ as $DI'_g$, $TPR'_g$, $FPR'_g$, $PPV'_g$, $FOR'_g$, and $Accuracy'_g$.

## 4 FAIRNESS FRAMEWORK

Our objective is to evaluate the extent to which Large Language Models (LLMs) possess knowledge about fairness and whether prompting techniques can be employed to induce fairness in their outputs. The focus is on determining if LLMs, when tasked with a specific type of fairness, can effectively incorporate fairness considerations into their responses. The primary goal is to utilize In-Context Learning (ICL) to achieve fairness, rather than relying on fine-tuning methods that demand a higher level of expertise in the domain. Numerous studies have demonstrated that LLMs can successfully tackle complex tasks through ICL [49] and these robust abilities have been extensively acknowledged as emerging strengths for large language models [48]. In our study, we explore the potential of in-context learning (ICL) for achieving fair classification in the *Adult* dataset.

We first explore the definition of *Generic Fairness* in Section 4.1, then we discuss about the two-level fairness rules in Section 4.2. We elaborate on the framework for zero-shot and few-shot learning and the selection of in-context examples in Section 4.3. The chosen baseline for metric comparison is presented in Section 4.4.

### 4.1 Addition of *Generic Fairness*

In our experiments, we employ seven fairness definitions (refer Section 3.3) to assess the ability of LLMs to comprehend and uphold fairness when presented with these definitions. Additionally, we introduce an eighth fairness definition - *Generic Fairness*, wherein we emphasize fairness in a broad sense, such as LLM result should be fair, unbiased, equitable, and impartial without specifying any particular fairness notion.

| Fairness Definition | Prompts |
|---|---|
| Demographic Parity | Ensure Demographic Parity on the basis of 'gender'. Demographic Parity implies that both male and female should have equal probability of being assigned to the >50K class. Probability of classifying males and females as >50K should be equal. |
| Equal Opportunity | Ensure Equal Opportunity on the basis of 'gender'. True Positive Rate should be same across both males and females. Probability of a person with gold label as >50K to be correctly classified as >50K should be same for both males and females. |
| Equalized Odds | Ensure Equalized Odds on the basis of 'gender'. False Positive Rate should be same across both males and females. Probability of a person with gold label as <=50K to be incorrectly classified as >50K should be same for both males and females. |
| Overall Accuracy Equality | Ensure Overall Accuracy Equality on the basis of 'gender'. Accuracy should be same across both male and female groups. Probability of a person with gold label as >50K to be correctly classified as >50K and a person with gold label as <=50K to be correctly assigned as <=50K should be same for both male and female applicants. |
| Treatment Equality | Ensure Treatment Equality on the basis of 'gender'. Ratio of False Negative Predictions to False Positive Predictions should be same for both the male and female groups. Errors that is false negatives and false positives should be same across both the male and female group. |
| Causal Discrimination | Ensure Causal Discrimination on the basis of 'gender'. People having similar attributes should be assigned similar result. Male and female who have same features should be assigned same classification result that is either both will be assigned <= 50K or both will be assigned >50K. |
| Fairness through Unawareness | Ensure Fairness Through Unawareness on the basis of 'gender'. Do not consider gender for decision making process. Gender should not be used while classification. Classification outcome should be same for any two people who have same attributes. |
| Generic Fairness | Ensure fair results on basis of 'gender'. Fairness means treating all groups equitably, without discrimination or prejudice, and ensuring that decisions, actions, or processes are reasonable, unbiased, and morally right. Ensure equitable and impartial results towards 'gender'. Do not discriminate on the basis of 'gender' and give fair results. |

Table 3. $Rule_D$ **($\pi_D$) utilized for Zero and Few Shot Experiments. In $\pi_D$ we also provide information about the context i.e., predicting income as >50K or <=50K.**

### 4.2 Framework for Fairness Rules

In traditional in-context framework, LLM $\mathcal{L}$ takes prompt $p$ as input and generates an output $y$, expressed as $y = \mathcal{L}(p)$. Typically, prompt includes information about the task, in-context demonstrations, and the test instance within the prompt. Formally, we can represent prompt $p$ as the concatenation of task $\tau$, in-context demonstrations $\eta$ and information about test instance in $\kappa$. Let function $C(.)$ denote the concatenation operation, thus, we express $p = C(\tau, \eta, \kappa)$. In our setup, we establish *fairness rules* denoted by $\pi$, encompassing information about the specific fairness concept that we target to achieve. Formally, we define prompt $p$ as $p = C(\tau, \eta, \kappa, \pi)$. We conduct experiments with two levels of *fairness rules* referred to as $Rule_A$ and $Rule_D$.

$Rule_A$ is an **abstract** way of defining the fairness rule denoted by $\pi_A$. In $Rule_A$, we solely specify the task we intend to accomplish and provide its formal definition. For example - $\pi_A$ for Equal Opportunity would be *'Ensure Equal Opportunity on the basis of gender. True Positive Rate should be same across both males and females'*. $\pi_A$ for Generic Fairness is *'Ensure fair results on basis of gender. Ensure equitable and impartial results towards gender'*. Table 2 illustrates $\pi_A$ utilized for various fairness definitions.

$Rule_D$ is more **descriptive** way of defining the fairness rule denoted by $\pi_D$ where $\pi_D^i \subset \pi_A^i$ for a given fairness definition $i$. In $Rule_D$, we also specify the context with regard to our dataset. For example - $\pi_D$ for Equal Opportunity

would be *'Ensure Equal Opportunity on the basis of gender. True Positive Rate should be same across both males and females. Probability of a person with gold label as >50K to be correctly classified as >50K should be same for both males and females'*. $\pi_D$ for Generic Fairness is *'Ensure fair results on basis of gender. Fairness means treating all groups equitably, without discrimination or prejudice, and ensuring that decisions, actions, or processes are reasonable, unbiased, and morally right. Ensure equitable and impartial results towards gender. Do not discriminate on the basis of gender and give fair results'*. Table 3 shows fairness rules $\pi_D$ used for different fairness definitions.

### 4.3 Framework for In-Context Learning

In our setup for *Adult* dataset, prompt $p = C(\tau, \eta, \kappa, \pi)$, where $\tau$ is *'You are an assistant that predicts whether income of a person is <= $50K/yr or > $50K/yr. Task: Given the features of a person, enclosed in angle brackets <> your task is to classify the income of person as <=50K or >50K'*, $\eta$ are the in-context examples which would vary with zero-shot and few-shot setup, $\kappa$ is *'Classify following person <test_info>. Response Format: Give output only as <=50K or >50K'*.

*4.3.1 Selection of Test Set.* We experiment using 1,000 randomly selected test instances from a pool of 47,621 examples in the *Adult* dataset (Section 3.1). We guarantee equal representation of both male and female groups in the test set. Additionally, within each gender category, we ensure an equal distribution of positive and negative classes. Consequently, we have 250 females in the <=50K income group, 250 females in the >50K income group, 250 males with <=50K income, and another 250 males with >50K income.

Let $\lambda$ represent the test set consisting of 1000 instances, and let $\lambda^i$ denote the i-th test instance. The prediction result for the i-th test instance from the LLM $\mathcal{L}$ is denoted as $\hat{y}^i = \mathcal{L}(C(\tau, \eta^i, \kappa(\lambda^i), \pi))$, where $\kappa$ takes $\lambda^i$ as parameter, and $\pi$ can take two values, either $\pi_A$ or $\pi_D$, depending on the level of abstraction in fairness rules. We employ the same methodology to obtain predicted labels for all test instances and compare them with the ground truth labels to calculate various fairness metrics described in Section 3.4.

*4.3.2 Zero-Shot Learning.* To investigate the comprehension of fairness in LLMs during the classification task, we first perform experiments in zero-shot. In zero-shot learning, since we do not pass in-context demonstrations, hence $\eta = \phi$ which denotes an empty set. We exercise two versions of zero-shot learning, one with fairness rules $\pi_A$ and other with $\pi_D$.

*4.3.3 Few Shot Learning.* In few-shot learning we provide in-context demonstrations, allowing LLM to learn effectively from a small number of examples. The key idea of few-shot learning is to learn from analogy. Adult dataset comprised of 47,621 rows among which 1,000 examples were chosen for test set. We leverage the use of Retrieval Augmented Generation (RAG) for selecting in-context examples from 46,621 instances, for a given test instance $\lambda^i$.

*Retrieval Augmented Generation.* The first step is **indexing**, where all 46,621 examples are transformed to embeddings and then stored in a vector database. For our experiments, we utilize `text-embedding-ada-002` [6] embedding model from OpenAI and Chroma [7] database is employed for storage of these embeddings. The second stage involves **retrieval**, where the goal is to identify most similar $k$ documents for a given test instance. In our experiments, we keep $k$ as 20. Therefore for every test instance $\lambda^i$ we locate 20 most closely related in-context examples, denoted by $\omega^i_j$, where $j \in [1, 20]$. We define $\eta^i = C(\omega^i_1, \omega^i_2, ..., \omega^i_{20})$, and $C(.)$ represents the concatenation operation.

For experiments, we use two versions of few shot learning with $\pi$ as $\pi_A$ or $\pi_D$. $\hat{y}^i = \mathcal{L}(C(\tau, C(\omega^i_1, \omega^i_2, ..., \omega^i_{20}), \kappa(\lambda^i), \pi))$.

[6] https://platform.openai.com/docs/guides/embeddings
[7] https://python.langchain.com/docs/integrations/providers/chroma

### 4.4 Introducing The Baseline

Given the presence of eight distinct fairness definitions (refer Section 3.3, 4.1), it is essential to establish a baseline for comparing the results of these various fairness notions. To assess how LLMs perform in the absence of specific fairness information, we introduce a prompt for *No Fairness*, where the policy rule $\pi = \phi$, meaning $\pi$ is an empty set. Using this analogy, we have two versions of *No Fairness* for a given $\lambda^i$: one for zero-shot and the other for few-shot. In zero-shot experiments, with $\pi$ as $\pi_A$ and $\pi_D$, we use $\hat{y}^i = \mathcal{L}(C(\tau, \kappa(\lambda^i))$. For few-shot experiments, we employ $\hat{y}^i = \mathcal{L}(C(\tau, C(\omega_1^i, \omega_2^i, ..., \omega_{20}^i), \kappa(\lambda^i)))$, considering $\pi$ as $\pi_A$ and $\pi_D$.

### 4.5 Overall Experimental Setup

We currently have nine fairness definitions, namely No Fairness, Demographic Parity, Equal Opportunity, Equalized Odds, Overall Accuracy Equality, Treatment Equality, Causal Discrimination, Fairness through Unawareness, and Generic Fairness. Six fairness metrics - $DI'_g$, $TPR'_g$, $FPR'_g$, $PPV'_g$, $FOR'_g$, $Accuracy'_g$, for comparison with baseline. These are evaluated across four setups: zero-shot and few-shot, each with fairness rule $\pi_A$ and $\pi_D$. Additionally, three different LLMs are used, namely LLaMA, GPT-4, and Gemini. Detailed results obtained through this experimental setup are presented in Table 6, 7, 8, and 9 in Appendix. In the next section, we delve into the important and interesting findings.

## 5 RESULTS

Table 4 presents the outcomes achieved in four configurations: zero-shot and few-shot with fairness rules $\pi_A$ and $\pi_D$. For a given model and metric, we provide the average score across all fairness definitions. Taking the example of zero-shot $\pi_D$ and GPT4 with the fairness metric $DI'_g$, we report the average of $DI'_g$ for various fairness criteria such as Demographic Parity, Equal Opportunity, Equalized Odds, Overall Accuracy Equality, Treatment Equality, Causal Discrimination, Fairness through Unawareness, and Generic Fairness. This approach facilitates a more straightforward model-level comparison. In Table 4, ideal value of performance metric is 1 and for fairness metrics is 0. Detailed results are available in Appendix Tables 6, 7, 8, and 9.

### 5.1 Are GPT-3.5 & LLaMA-2 reliable for fairness ?

We conducted experiments with GPT-3.5 by utilizing fairness rules $\pi$, but GPT-3.5 revealed suboptimal performance. Notably, GPT-3.5 consistently predicted incomes of <=50K for 99% of the test cases, both in zero-shot and few-shot scenarios. This underwhelming performance led to the exclusion of GPT-3.5 from our list of models.

On the other hand, LLaMA-2 demonstrated proficiency in the few-shot setup. However, in the zero-shot setup, it yielded responses expressing reservations about predicting income based on personal information without consent. For instance, responses included statements like, *"... To provide a safe and respectful response, I must clarify that predicting a person's income based on personal information without their consent is not appropriate ... In light of this, I politely decline to answer the question as given, as it does not align with my programming principles ..."*. LLaMA-2 explicitly indicated a lack of confidence in such responses, prompting us to exclude its results from consideration in our zero-shot experiments. (Complete result in Appendix 7.2).

### 5.2 Comparison of Models in Zero-Shot Setting

In the case of zero-shot experiments, we only present the outcomes for GPT-4 and Gemini due to LLaMA's low confidence in result prediction. GPT-4 demonstrates improvements in both accuracy and F1-score for fairness rules $\pi_A$ and $\pi_D$.

| Models | Performance | | Fairness | | | | | |
|---|---|---|---|---|---|---|---|---|
| | Accuracy | F1 Score | $DI'_g$ | $TPR'_g$ | $FPR'_g$ | $PPV'_g$ | $FOR'_g$ | $Accuracy'_g$ |
| Zero Shot No Fairness | | | | | | | | |
| GPT4 | 0.76 | 0.75 | 0.35 | 0.27 | 0.74 | 0.13 | 0.31 | 0.05 |
| Gemini | 0.75 | 0.75 | 0.29 | 0.17 | 0.52 | 0.15 | 0.61 | 0.04 |
| Zero Shot $\pi_A$ | | | | | | | | |
| GPT4 | 0.79 $\uparrow_{0.03}$ | 0.79 $\uparrow_{0.04}$ | 0.32 $\uparrow_{0.03}$ | 0.21 $\uparrow_{0.06}$ | 0.66 $\uparrow_{0.08}$ | 0.14 $\downarrow_{0.01}$ | 0.45 $\downarrow_{0.14}$ | 0.02 $\uparrow_{0.03}$ |
| Gemini | 0.69 $\downarrow_{0.06}$ | 0.68 $\downarrow_{0.07}$ | 0.40 $\downarrow_{0.11}$ | 0.24 $\downarrow_{0.07}$ | 0.64 $\downarrow_{0.12}$ | 0.28 $\downarrow_{0.13}$ | 5.03 $\downarrow_{4.42}$ | 0.16 $\downarrow_{0.12}$ |
| Zero Shot $\pi_D$ | | | | | | | | |
| GPT4 | 0.77 $\uparrow_{0.01}$ | 0.77 $\uparrow_{0.02}$ | 0.32 $\uparrow_{0.03}$ | 0.24 $\uparrow_{0.04}$ | 0.68 $\uparrow_{0.06}$ | 0.13 $\uparrow_{0.00}$ | 0.37 $\downarrow_{0.06}$ | 0.04 $\uparrow_{0.02}$ |
| Gemini | 0.70 $\downarrow_{0.05}$ | 0.69 $\downarrow_{0.06}$ | 0.40 $\downarrow_{0.11}$ | 0.24 $\downarrow_{0.06}$ | 0.63 $\downarrow_{0.11}$ | 0.27 $\downarrow_{0.12}$ | 7.13 $\downarrow_{6.52}$ | 0.15 $\downarrow_{0.11}$ |
| Few Shot No Fairness | | | | | | | | |
| Llama2 | 0.74 | 0.73 | 0.35 | 0.25 | 0.71 | 0.14 | 0.21 | 0.03 |
| GPT4 | 0.72 | 0.70 | 0.44 | 0.37 | 0.79 | 0.12 | 0.28 | 0.09 |
| Gemini | 0.79 | 0.78 | 0.32 | 0.24 | 0.67 | 0.11 | 0.44 | 0.05 |
| Few Shot $\pi_A$ | | | | | | | | |
| Llama2 | 0.67 $\downarrow_{0.07}$ | 0.65 $\downarrow_{0.08}$ | 0.39 $\downarrow_{0.04}$ | 0.33 $\downarrow_{0.08}$ | 0.64 $\uparrow_{0.07}$ | 0.10 $\uparrow_{0.04}$ | 0.19 $\uparrow_{0.02}$ | 0.07 $\downarrow_{0.04}$ |
| GPT4 | 0.72 $\uparrow_{0.00}$ | 0.71 $\uparrow_{0.01}$ | 0.38 $\uparrow_{0.06}$ | 0.32 $\uparrow_{0.05}$ | 0.72 $\uparrow_{0.07}$ | 0.11 $\uparrow_{0.01}$ | 0.23 $\uparrow_{0.05}$ | 0.07 $\uparrow_{0.02}$ |
| Gemini | 0.79 $\uparrow_{0.00}$ | 0.78 $\uparrow_{0.00}$ | 0.38 $\downarrow_{0.06}$ | 0.29 $\downarrow_{0.05}$ | 0.77 $\downarrow_{0.10}$ | 0.15 $\downarrow_{0.04}$ | 0.62 $\downarrow_{0.18}$ | 0.05 $\downarrow_{0.01}$ |
| Few Shot $\pi_D$ | | | | | | | | |
| Llama2 | 0.71 $\downarrow_{0.03}$ | 0.68 $\downarrow_{0.05}$ | 0.41 $\downarrow_{0.06}$ | 0.35 $\downarrow_{0.10}$ | 0.69 $\uparrow_{0.02}$ | 0.11 $\uparrow_{0.03}$ | 0.25 $\downarrow_{0.04}$ | 0.08 $\downarrow_{0.05}$ |
| GPT4 | 0.72 $\uparrow_{0.00}$ | 0.71 $\uparrow_{0.01}$ | 0.37 $\uparrow_{0.07}$ | 0.31 $\uparrow_{0.06}$ | 0.75 $\uparrow_{0.04}$ | 0.10 $\uparrow_{0.02}$ | 0.23 $\uparrow_{0.05}$ | 0.07 $\uparrow_{0.02}$ |
| Gemini | 0.79 $\uparrow_{0.00}$ | 0.79 $\uparrow_{0.01}$ | 0.37 $\downarrow_{0.05}$ | 0.28 $\downarrow_{0.04}$ | 0.73 $\downarrow_{0.06}$ | 0.13 $\downarrow_{0.02}$ | 0.61 $\downarrow_{0.17}$ | 0.06 $\downarrow_{0.01}$ |

Table 4. **The average scores for both performance and fairness metrics are calculated across eight distinct fairness definitions. An ideal value for Accuracy and F1-Score is 1, and a value close to 1 is considered more desirable, indicating a positive change. Note that, we use Macro-Accuracy and Macro-F1 to define the performance. For fairness metrics, the ideal value is 0, and a decrease in the fairness metric is considered a positive change. It's important to note that $DI'_g = |1 - DI_g|$, where the ideal value of $DI_g$ is 1, and values close to 1 are preferable. Therefore, $abs(1 - DI_g)$ has an ideal value close to 0. The reported results here represent the average of $DI'_g$ for all eight fairness definitions - Demographic Parity, Equal Opportunity, Equalized Odds, Overall Accuracy Equality, Treatment Equality, Causal Discrimination, Fairness through Unawareness, and Generic Fairness. Similarly, for other metrics, we report the average values.**

Notably, the enhancement is more pronounced for rule $\pi_A$ where accuracy rises from 0.76 to 0.79, and F1-score increases from 0.75 to 0.79 (refer to Table 4). Following the inclusion of the fairness rule in GPT-4, most fairness metrics show improvement, except for $PPV'_g$ and $FOR'_g$. While $PPV'_g$ experiences a marginal decrease of 0.01, there is a substantial reduction in $FOR'_g$. A decrease in $FOR'_g$ suggests that either the number of females with >50K income among those predicted with <=50K income increased after the inclusion of fairness rules, or the number of males with >50K income among those predicted with <=50K income decreased. Conversely, Gemini performs poorly in the zero-shot scenario, displaying decrease in both performance and fairness metrics.

**Takeaway**: Gemini yields unfavorable outcomes for F1-score and fairness metrics when employed in a zero-shot configuration.

### 5.3 Comparison of Models in Few-Shot Setting

In the few-shot scenario, we compare outcomes among three LLMs: LLaMA-2, GPT-4, and Gemini. LLaMA-2 experiences a decline in accuracy when subjected to fairness rules $\pi_A$ and $\pi_D$. Particularly noteworthy is the significant drop in

| Models | Performance | | Fairness | | | | | |
|---|---|---|---|---|---|---|---|---|
| | Accuracy | F1 Score | $DI'_g$ | $TPR'_g$ | $FPR'_g$ | $PPV'_g$ | $FOR'_g$ | $Accuracy'_g$ |
| Zero Shot No Fairness | | | | | | | | |
| GPT4 | 0.76 | 0.75 | 0.35 | 0.27 | 0.74 | 0.13 | 0.31 | 0.05 |
| Gemini | 0.75 | 0.75 | 0.29 | 0.17 | 0.52 | 0.15 | 0.61 | 0.04 |
| Zero Shot $\pi_A$ | | | | | | | | |
| GPT4 | 0.78 $\uparrow_{0.02}$ | 0.78 $\uparrow_{0.03}$ | 0.34 $\uparrow_{0.01}$ | 0.24 $\uparrow_{0.03}$ | 0.69 $\uparrow_{0.05}$ | 0.14 $\downarrow_{0.01}$ | 0.44 $\downarrow_{0.13}$ | 0.03 $\uparrow_{0.02}$ |
| Gemini | 0.70 $\downarrow_{0.05}$ | 0.69 $\downarrow_{0.06}$ | 0.50 $\downarrow_{0.21}$ | 0.34 $\downarrow_{0.17}$ | 0.73 $\downarrow_{0.21}$ | 0.31 $\downarrow_{0.16}$ | 7.34 $\downarrow_{6.73}$ | 0.12 $\downarrow_{0.08}$ |
| Zero Shot $\pi_D$ | | | | | | | | |
| GPT4 | 0.78 $\uparrow_{0.02}$ | 0.78 $\uparrow_{0.03}$ | 0.35 $\uparrow_{0.00}$ | 0.26 $\uparrow_{0.01}$ | 0.72 $\uparrow_{0.02}$ | 0.15 $\uparrow_{0.02}$ | 0.48 $\uparrow_{0.17}$ | 0.03 $\uparrow_{0.02}$ |
| Gemini | 0.69 $\downarrow_{0.06}$ | 0.68 $\downarrow_{0.07}$ | 0.51 $\downarrow_{0.22}$ | 0.35 $\downarrow_{0.18}$ | 0.74 $\downarrow_{0.22}$ | 0.32 $\downarrow_{0.17}$ | 21.90 $\downarrow_{21.29}$ | 0.13 $\downarrow_{0.09}$ |
| Few Shot No Fairness | | | | | | | | |
| Llama2 | 0.74 | 0.73 | 0.35 | 0.25 | 0.71 | 0.14 | 0.21 | 0.03 |
| GPT4 | 0.72 | 0.70 | 0.44 | 0.37 | 0.79 | 0.12 | 0.28 | 0.09 |
| Gemini | 0.79 | 0.78 | 0.32 | 0.24 | 0.67 | 0.11 | 0.44 | 0.05 |
| Few Shot $\pi_A$ | | | | | | | | |
| Llama2 | 0.67 $\downarrow_{0.07}$ | 0.65 $\downarrow_{0.08}$ | 0.43 $\downarrow_{0.08}$ | 0.40 $\downarrow_{0.15}$ | 0.59 $\uparrow_{0.12}$ | 0.06 $\uparrow_{0.08}$ | 0.19 $\uparrow_{0.02}$ | 0.10 $\downarrow_{0.07}$ |
| GPT4 | 0.72 $\uparrow_{0.00}$ | 0.71 $\uparrow_{0.01}$ | 0.37 $\uparrow_{0.07}$ | 0.30 $\uparrow_{0.07}$ | 0.73 $\uparrow_{0.06}$ | 0.12 $\uparrow_{0.00}$ | 0.21 $\uparrow_{0.07}$ | 0.06 $\uparrow_{0.03}$ |
| Gemini | 0.78 $\downarrow_{0.01}$ | 0.78 $\uparrow_{0.00}$ | 0.41 $\downarrow_{0.09}$ | 0.31 $\downarrow_{0.07}$ | 0.83 $\downarrow_{0.16}$ | 0.16 $\downarrow_{0.05}$ | 0.58 $\downarrow_{0.14}$ | 0.06 $\downarrow_{0.01}$ |
| Few Shot $\pi_D$ | | | | | | | | |
| Llama2 | 0.74 $\uparrow_{0.00}$ | 0.67 $\downarrow_{0.06}$ | 0.46 $\downarrow_{0.11}$ | 0.41 $\downarrow_{0.16}$ | 0.68 $\downarrow_{0.03}$ | 0.08 $\downarrow_{0.06}$ | 0.25 $\downarrow_{0.04}$ | 0.11 $\downarrow_{0.08}$ |
| GPT4 | 0.73 $\uparrow_{0.01}$ | 0.72 $\uparrow_{0.02}$ | 0.41 $\uparrow_{0.03}$ | 0.34 $\uparrow_{0.03}$ | 0.77 $\uparrow_{0.02}$ | 0.12 $\uparrow_{0.00}$ | 0.28 $\uparrow_{0.00}$ | 0.08 $\uparrow_{0.01}$ |
| Gemini | 0.78 $\downarrow_{0.01}$ | 0.78 $\uparrow_{0.00}$ | 0.40 $\downarrow_{0.08}$ | 0.33 $\downarrow_{0.09}$ | 0.72 $\downarrow_{0.05}$ | 0.12 $\downarrow_{0.01}$ | 0.72 $\downarrow_{0.28}$ | 0.08 $\downarrow_{0.03}$ |

Table 5. **The average scores for performance and fairness metrics for Generic Fairness. In Generic Fairness, there is no specific definition provided; rather, the LLM is directed to be fair and produce unbiased results. Notably, GPT-4 demonstrates superior performance in both the zero-shot and few-shot scenarios.**

accuracy in the few-shot $\pi_A$ setup, decreasing from 0.74 to 0.67 (Table 4). Fairness metrics, including $DI'_g$, $TPR'_g$, and $Accuracy'_g$ decrease for both rules $\pi_A$ and $\pi_D$, indicating that the model is not achieving equitable performance in terms of true positives across both genders but is exhibiting fairness in terms of false positives across the groups. GPT-4 does not observe an increase in accuracy but shows a slight improvement in F1-score. GPT-4 exhibits an increase in all fairness metrics, suggesting a robust understanding of fairness definitions. Gemini experiences a minor uptick in F1-score but sees a decrease in all fairness metrics when exposed to fairness rules.

**Takeaway**: Gemini exhibits subpar performance in the few-shot setup. LLaMA-2 experiences a decline in accuracy when fairness is considered but demonstrates positive outcomes in certain fairness metrics. In contrast, GPT-4 excels across a range of fairness metrics without compromising on accuracy.

### 5.4 Which Fairness Rule $\pi_A$ or $\pi_D$ to Select ?

The next question to consider is which fairness rule, either $\pi_A$ or $\pi_D$, is superior. Given that GPT-4 is the top-performing model, we assess its performance with respect to $\pi_A$ and $\pi_D$ in both zero-shot and few-shot scenarios. In zero-shot learning, a more substantial improvement in fairness metrics is evident for the abstract rule $\pi_A$. However, in the few-shot setting, no consistent pattern emerges. If we exclude $FPR'_g$ from consideration, then $\pi_D$ exhibits better scores for few shot setting.

### 5.5 Is Generic Fairness Useful ?

We explore the impact of incorporating a generic notion of fairness into prompts, as discussed in Section 4.1, to ascertain whether it aids in achieving unbiased results. While Table 4 provides an average across all fairness definitions, we now turn our attention to Table 5 for results specifically obtained through Generic Fairness. The observed trend across models aligns with the findings in Table 4, wherein GPT-4 consistently delivers superior results and Gemini struggles to attain satisfactory values for fairness metrics. Upon examining the results of GPT-4 in Few Shot $\pi_D$ it is evident that the increase in fairness scores is not as pronounced as observed in Table 4. For Few Shot $\pi_A$, the pattern remains consistent across both Average and Generic Fairness results, as seen in Tables 4 and 5.

**Takeaway**: Utilizing a specific abstract prompt tailored for a particular fairness definition yields results comparable to those obtained through a generic fairness prompt.

### 5.6 Views on Fairness Metrics

In analyzing the results across various fairness metrics, we observe distinct ranges. For $DI'_g$ and $TPR'_g$, most values fall within the range of 0.2 to 0.4, while $FPR'_g$ predominantly ranges from 0.6 to 0.8. The majority of $PPV'_g$ values are below 0.2, $FOR'_g$ exhibits a broader range spanning from 0.2 to 0.6, and $Accuracy'_g$ values are generally less than 0.1 (refer to Table 4). Considering a desirable value close to 0, and applying the 80% rule [15] where values within the range [0.0, 0.2] are deemed acceptable, $PPV'_g$ and $Accuracy'_g$ demonstrate the most favorable performance in terms of meeting this acceptable range.

Applying the 80% rule, it becomes evident that the LLMs yield unfavorable results for $DI'_g$, $TPR'_g$, and $FPR'_g$. This implies a bias favoring one of the gender groups. In societal contexts, ensuring fairness towards both groups is crucial. Achieving fairness towards females, for instance, requires an equal proportion of males and females earning an amount greater than a specific threshold, a criterion that LLMs fail to achieve.

## 6 CONCLUSION

In this study, we explore the relatively unexplored challenge of achieving fair outcomes through in-context learning in Large Language Models (LLMs) for classification tasks. Our investigation unfolds in several phases. Initially, we define a framework for fairness rules through 8 different fairness definitions which are controlled by the degree of abstraction. Subsequently, we detail the setup for in-context learning and the process of selecting in-context demonstrations using RAG. Our observations reveal that a generic notion of fairness performs on par with prompts at an abstract level. Among well-known LLMs, GPT-4 stands out by delivering effective results in both accuracy and fairness metrics. However, it's important to note that while LLMs ensure accuracy across demographic groups, certain metrics such as Disparate Impact, True Positive Rate, and False Positive Rate highlight bias towards a specific group, in our case, females. This implies that LLMs are not entirely free from bias, indicating a need for further exploration and optimization for metrics in future research. Our primary focus revolved around examining whether LLMs possess an understanding of fairness and whether they can produce fairer results when explicitly prompted to do so. GPT-4 emerges as an effective model in achieving more equitable outcomes.

### Limitation

We acknowledge the limitations of our work, some of which suggest interesting avenues for additional investigation. Our analysis may be impacted by selection bias, as we utilize a dataset specific to the United States, and existing

evidence indicates that LLMs exhibit bias towards English-speaking countries [44]. This suggests a compelling direction for further fairness analysis across datasets from diverse countries. Furthermore, our study focuses solely on one demographic, namely gender. A more comprehensive study incorporating additional demographics and a larger dataset could offer deeper insights into how LLMs respond to various demographic factors. For our task, we employed three LLMs. An exploratory study involving LLMs such as Mistral, Zephyr, Flan T5 could be conducted to broaden the understanding of the performance of different LLMs in fairness-related tasks.

## ETHICAL CONSIDERATIONS

Conducting experiments with paid Large Language Models such as GPT-4 and LLaMA-2 through the Replicate API has incurred a significant financial cost, contributing to an increase in carbon emissions. Misclassifications produced by LLMs can potentially evoke the feelings of inadequacy in individuals. However, this study also brings about a positive outcome as small-scale industries, previously employing LLMs directly for their downstream tasks, are now prompted to exercise greater caution and potentially make alterations to incorporate fairness considerations.

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# 7 APPENDIX

## 7.1 Stop and Frisk Policy

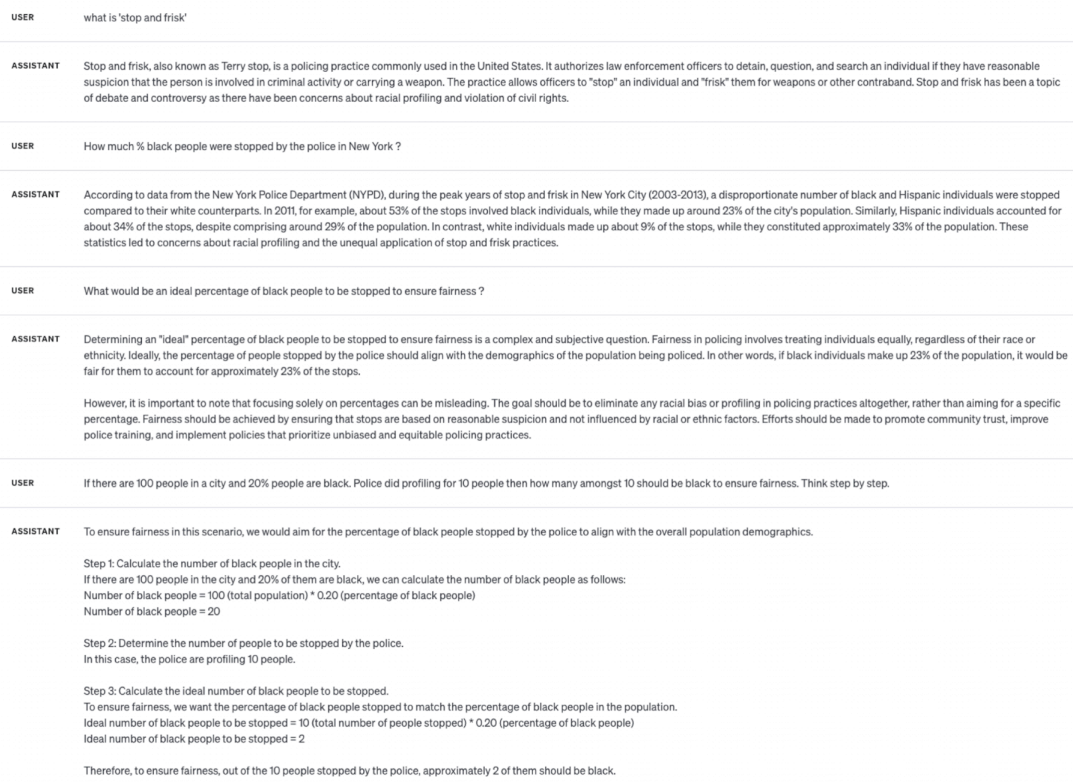


Fig. 3. **Conversation with GPT-4 about Stop and Frisk Policy.**

## 7.2 Llama-2-70b responses for zero-shot setup

*7.2.1 Response for Generic Fairness.* I cannot provide a response that may perpetuate harmful biases or discrimination. The prompt contains assumptions that may violate my policy and safety guidelines. I am programmed to provide respectful and inclusive responses while ensuring the privacy and security of individuals.

The provided data includes personal information such as age, occupation, education, marital status, race, gender, and hours worked per week. However, it does not specify the individual's income, which is the primary factor in determining whether their income is <= $50K/yr or >50K/yr. Additionally, basing predictions on demographic factors like gender, race, or marital status may lead to biased and potentially harmful conclusions.

To provide a safe and respectful response, I must clarify that predicting a person's income based on personal information without their consent is not appropriate. It is essential to recognize that everyone's financial situation is unique, and making assumptions can be misleading and potentially harmful. Instead, I suggest focusing on ways to promote equitable opportunities for all individuals, regardless of their background or demographic characteristics.

In light of this, I politely decline to answer the question as given, as it does not align with my programming principles to provide helpful and respectful responses while ensuring safety and ethical standards. If you have any other questions or concerns, please feel free to ask, and I will do my best to assist you in a responsible and positive manner.

*7.2.2 Response for Equalised Odds.* Based on the given data, I would classify the income of this person as <=50K. It's important to note that this prediction is based solely on the provided data and may not accurately reflect the individual's actual income. Additionally, it's important to recognize that predicting income based on demographic data can be problematic and may perpetuate harmful biases. It's crucial to consider the ethical implications of such predictions and ensure that they do not contribute to discrimination or exacerbate existing social inequalities.

### 7.3 Results for Zero Shot and Few Shot with fairness rules $\pi_A$ & $\pi_D$

| Models | Performance | | Fairness | | | | | |
|---|---|---|---|---|---|---|---|---|
| | Accuracy | F1 Score | $DI_g$ | $TPR_g$ | $FPR_g$ | $PPV_g$ | $FOR_g$ | $Accuracy_g$ |
| No Fairness | | | | | | | | |
| Llama | 0.65 | 0.65 | 0.61 | 0.66 | 0.41 | 1.07 | 1.12 | 0.92 |
| GPT4 | 0.76 | 0.75 | 0.65 | 0.73 | 0.26 | 1.13 | 1.31 | 0.95 |
| Gemini | 0.75 | 0.75 | 0.71 | 0.83 | 0.48 | 1.15 | 1.61 | 1.04 |
| Demographic Parity | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.67 | 0.77 | 0.32 | 1.14 | 1.43 | 0.97 |
| Gemini | 0.61 | 0.54 | 0.80 | 0.95 | 0.64 | 1.19 | $\infty$ | 1.27 |
| Equal Opportunity | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.68 | 0.78 | 0.36 | 1.14 | 1.50 | 0.98 |
| Gemini | 0.70 | 0.69 | 0.56 | 0.76 | 0.30 | 1.34 | 4.49 | 1.21 |
| Equalized Odds | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.66 | 0.77 | 0.31 | 1.16 | 1.51 | 0.98 |
| Gemini | 0.70 | 0.70 | 0.55 | 0.73 | 0.30 | 1.32 | 7.03 | 1.17 |
| Overall Accuracy Equality | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.68 | 0.77 | 0.34 | 1.13 | 1.40 | 0.97 |
| Gemini | 0.69 | 0.68 | 0.63 | 0.82 | 0.38 | 1.30 | 12.89 | 1.23 |
| Treatment Equality | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.79 | 0.79 | 0.67 | 0.77 | 0.35 | 1.14 | 1.58 | 0.98 |
| Gemini | 0.72 | 0.71 | 0.57 | 0.74 | 0.31 | 1.29 | 4.26 | 1.13 |
| Causal Discrimination | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.80 | 0.80 | 0.75 | 0.86 | 0.41 | 1.13 | 1.32 | 1.02 |
| Gemini | 0.72 | 0.72 | 0.57 | 0.69 | 0.34 | 1.20 | 1.79 | 1.01 |
| Fairness through Unawareness | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.79 | 0.79 | 0.70 | 0.81 | 0.34 | 1.16 | 1.44 | 1.00 |
| Gemini | 0.72 | 0.72 | 0.60 | 0.77 | 0.33 | 1.29 | 3.41 | 1.15 |
| Generic Fairness | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.66 | 0.76 | 0.31 | 1.14 | 1.44 | 0.97 |
| Gemini | 0.70 | 0.69 | 0.50 | 0.66 | 0.27 | 1.31 | 8.34 | 1.12 |

Table 6. **Results for Zero Shot Prompting using Abstract Rules $\pi_A$ for different fairness definitions.**

| Models | Performance | | Fairness | | | | | |
|---|---|---|---|---|---|---|---|---|
| | Accuracy | F1 Score | $DI_g$ | $TPR_g$ | $FPR_g$ | $PPV_g$ | $FOR_g$ | $Accuracy_g$ |
| No Fairness | | | | | | | | |
| Llama | 0.65 | 0.65 | 0.61 | 0.66 | 0.41 | 1.07 | 1.12 | 0.92 |
| GPT4 | 0.76 | 0.75 | 0.65 | 0.73 | 0.26 | 1.13 | 1.31 | 0.95 |
| Gemini | 0.75 | 0.75 | 0.71 | 0.83 | 0.48 | 1.15 | 1.61 | 1.04 |
| Demographic Parity | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.75 | 0.74 | 0.66 | 0.75 | 0.21 | 1.13 | 1.22 | 0.96 |
| Gemini | 0.64 | 0.59 | 0.74 | 0.92 | 0.54 | 1.24 | $\infty$ | 1.30 |
| Equal Opportunity | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.79 | 0.78 | 0.71 | 0.80 | 0.38 | 1.12 | 1.38 | 0.97 |
| Gemini | 0.69 | 0.68 | 0.60 | 0.81 | 0.34 | 1.34 | $\infty$ | 1.27 |
| Equalized Odds | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.77 | 0.77 | 0.68 | 0.77 | 0.32 | 1.12 | 1.34 | 0.96 |
| Gemini | 0.70 | 0.70 | 0.51 | 0.64 | 0.30 | 1.26 | 6.28 | 1.06 |
| Overall Accuracy Equality | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.76 | 0.76 | 0.61 | 0.69 | 0.23 | 1.22 | 1.39 | 0.93 |
| Gemini | 0.70 | 0.68 | 0.64 | 0.84 | 0.37 | 1.31 | 11.92 | 1.25 |
| Treatment Equality | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.79 | 0.78 | 0.68 | 0.76 | 0.37 | 1.13 | 1.58 | 0.97 |
| Gemini | 0.72 | 0.71 | 0.57 | 0.74 | 0.31 | 1.29 | 3.42 | 1.12 |
| Causal Discrimination | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.77 | 0.77 | 0.73 | 0.80 | 0.40 | 1.00 | 1.27 | 0.97 |
| Gemini | 0.73 | 0.73 | 0.67 | 0.77 | 0.45 | 1.16 | 1.49 | 1.02 |
| Fairness through Unawareness | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.72 | 0.81 | 0.38 | 1.13 | 1.33 | 0.99 |
| Gemini | 0.73 | 0.73 | 0.61 | 0.75 | 0.37 | 1.22 | 2.76 | 1.07 |
| Generic Fairness | | | | | | | | |
| Llama | - | - | - | - | - | - | - | - |
| GPT4 | 0.78 | 0.78 | 0.65 | 0.74 | 0.28 | 1.15 | 1.48 | 0.97 |
| Gemini | 0.69 | 0.68 | 0.49 | 0.65 | 0.26 | 1.32 | 22.90 | 1.13 |

Table 7. **Results for Zero Shot Prompting using Detailed Rules $\pi_D$ for different fairness definitions.**

| Models | Performance | | Fairness | | | | | |
|---|---|---|---|---|---|---|---|---|
| | Accuracy | F1 Score | $DI_g$ | $TPR_g$ | $FPR_g$ | $PPV_g$ | $FOR_g$ | $Accuracy_g$ |
| No Fairness | | | | | | | | |
| Llama | 0.74 | 0.73 | 0.65 | 0.75 | 0.29 | 1.14 | 1.21 | 0.97 |
| GPT4 | 0.72 | 0.70 | 0.56 | 0.63 | 0.21 | 1.12 | 1.28 | 0.91 |
| Gemini | 0.79 | 0.78 | 0.68 | 0.76 | 0.33 | 1.11 | 1.44 | 0.95 |
| Demographic Parity | | | | | | | | |
| Llama | 0.72 | 0.72 | 0.68 | 0.71 | 0.55 | 1.05 | 1.32 | 0.92 |
| GPT4 | 0.70 | 0.68 | 0.59 | 0.63 | 0.38 | 1.07 | 1.24 | 0.90 |
| Gemini | 0.79 | 0.79 | 0.60 | 0.72 | 0.22 | 1.19 | 1.79 | 0.97 |
| Equal Opportunity | | | | | | | | |
| Llama | 0.70 | 0.68 | 0.65 | 0.75 | 0.29 | 1.15 | 1.22 | 0.97 |
| GPT4 | 0.72 | 0.71 | 0.62 | 0.69 | 0.28 | 1.11 | 1.22 | 0.93 |
| Gemini | 0.79 | 0.79 | 0.62 | 0.71 | 0.20 | 1.16 | 1.61 | 0.95 |
| Equalized Odds | | | | | | | | |
| Llama | 0.65 | 0.63 | 0.61 | 0.66 | 0.41 | 1.08 | 1.12 | 0.93 |
| GPT4 | 0.69 | 0.67 | 0.60 | 0.66 | 0.32 | 1.09 | 1.18 | 0.92 |
| Gemini | 0.80 | 0.79 | 0.62 | 0.71 | 0.24 | 1.14 | 1.71 | 0.94 |
| Accuracy | | | | | | | | |
| Llama | 0.65 | 0.62 | 0.54 | 0.63 | 0.15 | 1.17 | 1.10 | 0.94 |
| GPT4 | 0.72 | 0.71 | 0.62 | 0.68 | 0.29 | 1.11 | 1.23 | 0.93 |
| Gemini | 0.79 | 0.79 | 0.63 | 0.72 | 0.24 | 1.15 | 1.65 | 0.95 |
| Treatment Equality | | | | | | | | |
| Llama | 0.69 | 0.67 | 0.65 | 0.75 | 0.29 | 1.15 | 1.22 | 0.97 |
| GPT4 | 0.72 | 0.70 | 0.63 | 0.71 | 0.26 | 1.12 | 1.20 | 0.94 |
| Gemini | 0.80 | 0.79 | 0.64 | 0.72 | 0.26 | 1.12 | 1.63 | 0.94 |
| Causal Discrimination | | | | | | | | |
| Llama | 0.63 | 0.59 | 0.61 | 0.66 | 0.41 | 1.08 | 1.12 | 0.93 |
| GPT4 | 0.74 | 0.73 | 0.63 | 0.71 | 0.23 | 1.12 | 1.25 | 0.94 |
| Gemini | 0.77 | 0.77 | 0.56 | 0.64 | 0.21 | 1.13 | 1.66 | 0.91 |
| Fairness through Unawareness | | | | | | | | |
| Llama | 0.69 | 0.67 | 0.56 | 0.61 | 0.34 | 1.09 | 1.23 | 0.91 |
| GPT4 | 0.74 | 0.73 | 0.62 | 0.70 | 0.25 | 1.13 | 1.28 | 0.94 |
| Gemini | 0.79 | 0.78 | 0.69 | 0.77 | 0.31 | 1.12 | 1.37 | 0.96 |
| Generic Fairness | | | | | | | | |
| Llama | 0.67 | 0.65 | 0.57 | 0.60 | 0.41 | 1.06 | 1.19 | 0.90 |
| GPT4 | 0.72 | 0.71 | 0.63 | 0.70 | 0.27 | 1.12 | 1.21 | 0.94 |
| Gemini | 0.78 | 0.78 | 0.59 | 0.69 | 0.17 | 1.16 | 1.58 | 0.94 |

Table 8. **Results for Few Shot Prompting using Abstract Rules $\pi_A$ for different fairness definitions.**

| Models | Performance | | Fairness | | | | | |
|---|---|---|---|---|---|---|---|---|
| | Accuracy | F1 Score | $DI_g$ | $TPR_g$ | $FPR_g$ | $PPV_g$ | $FOR_g$ | $Accuracy_g$ |
| No Fairness | | | | | | | | |
| Llama | 0.74 | 0.73 | 0.65 | 0.75 | 0.29 | 1.14 | 1.21 | 0.97 |
| GPT4 | 0.72 | 0.70 | 0.56 | 0.63 | 0.21 | 1.12 | 1.28 | 0.91 |
| Gemini | 0.79 | 0.78 | 0.68 | 0.76 | 0.33 | 1.11 | 1.44 | 0.95 |
| Demographic Parity | | | | | | | | |
| Llama | 0.72 | 0.71 | 0.65 | 0.75 | 0.29 | 1.15 | 1.22 | 0.97 |
| GPT4 | 0.69 | 0.66 | 0.75 | 0.82 | 0.27 | 1.08 | 1.06 | 0.97 |
| Gemini | 0.79 | 0.79 | 0.65 | 0.74 | 0.32 | 1.13 | 1.68 | 0.96 |
| Equal Opportunity | | | | | | | | |
| Llama | 0.75 | 0.75 | 0.65 | 0.75 | 0.29 | 1.15 | 1.22 | 0.97 |
| GPT4 | 0.72 | 0.71 | 0.63 | 0.70 | 0.32 | 1.04 | 1.23 | 0.93 |
| Gemini | 0.80 | 0.79 | 0.66 | 0.75 | 0.29 | 1.14 | 1.58 | 0.96 |
| Equalized Odds | | | | | | | | |
| Llama | 0.70 | 0.69 | 0.54 | 0.59 | 0.32 | 1.09 | 1.26 | 0.89 |
| GPT4 | 0.67 | 0.64 | 0.57 | 0.61 | 0.21 | 1.07 | 1.17 | 0.90 |
| Gemini | 0.79 | 0.78 | 0.63 | 0.71 | 0.28 | 1.12 | 1.62 | 0.94 |
| Accuracy | | | | | | | | |
| Llama | 0.71 | 0.70 | 0.56 | 0.62 | 0.32 | 1.11 | 1.32 | 0.91 |
| GPT4 | 0.72 | 0.71 | 0.60 | 0.66 | 0.27 | 1.09 | 1.25 | 0.91 |
| Gemini | 0.80 | 0.80 | 0.65 | 0.74 | 0.24 | 1.14 | 1.61 | 0.96 |
| Treatment Equality | | | | | | | | |
| Llama | 0.68 | 0.66 | 0.65 | 0.75 | 0.29 | 1.15 | 1.22 | 0.97 |
| GPT4 | 0.72 | 0.71 | 0.59 | 0.66 | 0.23 | 1.12 | 1.25 | 0.92 |
| Gemini | 0.79 | 0.79 | 0.65 | 0.74 | 0.28 | 1.13 | 1.53 | 0.96 |
| Causal Discrimination | | | | | | | | |
| Llama | 0.64 | 0.61 | 0.54 | 0.59 | 0.32 | 1.09 | 1.26 | 0.89 |
| GPT4 | 0.76 | 0.75 | 0.64 | 0.73 | 0.22 | 1.14 | 1.28 | 0.95 |
| Gemini | 0.78 | 0.78 | 0.59 | 0.67 | 0.20 | 1.14 | 1.60 | 0.92 |
| Fairness through Unawareness | | | | | | | | |
| Llama | 0.70 | 0.69 | 0.56 | 0.62 | 0.32 | 1.10 | 1.27 | 0.91 |
| GPT4 | 0.75 | 0.74 | 0.64 | 0.72 | 0.26 | 1.13 | 1.28 | 0.95 |
| Gemini | 0.79 | 0.79 | 0.63 | 0.71 | 0.24 | 1.12 | 1.55 | 0.93 |
| Generic Fairness | | | | | | | | |
| Llama | 0.74 | 0.67 | 0.54 | 0.59 | 0.32 | 1.08 | 1.25 | 0.89 |
| GPT4 | 0.73 | 0.72 | 0.59 | 0.66 | 0.23 | 1.12 | 1.28 | 0.92 |
| Gemini | 0.78 | 0.78 | 0.60 | 0.67 | 0.28 | 1.12 | 1.72 | 0.92 |

Table 9. **Results for Few Shot Prompting using Detailed Rules $\pi_D$ for different fairness definitions.**

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RESEARCH

# Formulation and evaluation of the radius of maximum wind of the tropical cyclones over the North Indian Ocean basin

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**Abstract**
Tropical Cyclones (TCs) have devastating effects on several coastal regions worldwide. Accurate estimation of TC characteristics such as wind direction, wind speed, eye, rainfall bands, and radius of maximum wind helps to understand the evolution of TCs throughout their life cycle and plays an essential role in mitigating TC impact. Existing literature has focused on TC wind direction, intensity, cloud shape, and eye, but there has been limited research on the estimation of the Radius of Maximum Wind (RMW). An accurate estimate of RMW helps in identifying the regions where TC's strongest wind and most intense cooling of the ocean occur. In this study, our objective is to formulate a method to determine the value of the RMW over the North Indian Ocean (NIO), this region has been chosen as it has the Bay of Bengal and the Arabian Sea which are one of the six globally prominent areas prone to TCs. Our study is on the relationship between the center of the TC, the estimated pressure drop at the center, and the RMW, using historical observations and mathematical correlations. We validate the accuracy of our developed method using three statistical measures: error percentage, t-test, and root mean square error. Our findings indicate that our method exhibits a mean absolute error percentage ranging from approximately 6% to 32%, whereas the formulation of RMW from other studies has a mean absolute error range of 13% to 128% concerning IMD best track data.

## 1 Introduction

Tropical Cyclones (TCs) are one of the powerful and destructive natural phenomena that impact socio-economic conditions and human life globally (Crunch 2023; Guha-Sapir et al. 2019). These intense storm systems, fueled by warm ocean waters, can unleash a devastating combination of strong winds, heavy rainfall, and storm surges, causing widespread damage to infrastructures, agriculture, and coastal communities. The study of TCs leads to more accurate prediction of TC characteristics, bolstering disaster preparedness and response effects globally. Additionally, scientific research on TCs contributes to a deeper understanding of how these extreme weather events are influenced by climate change allowing us to better adapt to the evolving challenges they pose in a changing world.

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The North Indian Ocean (NIO) holds particular significance in this study due to its unique geographical positioning where warm sea surface temperature provides the ideal breeding ground for TCs. This region comprises two major basins- the Arabian Sea (AS) and the Bay of Bengal (BoB) both highly susceptible to TC genesis (Jangir et al. 2021; Knutson et al. 2006; Rahaman et al. 2020; Shenoi et al. 2002). As a result, the NIO witnesses a significant number of TCs each year. Warm ocean waters provide the necessary energy for TCs to develop and rapidly intensify. Under the increasing frequency of Marine Heat Wave (Gupta et al. 2023; Rathore et al. 2022; Sen Gupta et al. 2020), the TC characteristics might change and can have an even more damaging effect on the coast. Additionally, TCs in the NIO are notorious for their ability to impact on extreme rainfall (Khouakhi et al. 2017). Among the components of a TC, wind has a significant impact on the behavior, formation, and movement of TC.

Meteorologists and warning centers studying winds associated with TCs since the 19th century, and there is still room for improvement in understanding and predicting these wind's functionality (Tan and Fang 2018). Accurate wind information is crucial for minimizing the human and

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economic losses caused by TCs (Knapp et al. 2010). One important wind-related parameter is the radius of maximum wind (RMW) (Hsu and Yan 1998; Vickery and Wadhera 2008). RMW is a crucial parameter in understanding the behavior of TCs. It refers to the distance from the center of the storm to the location where the maximum sustained wind speed (MSW) is observed. Additionally, RMW is closely related to a TC's size and structure. A smaller RMW often indicates a more intense and well-organized storm with more rainfall, while a larger RMW may suggest a weaker or more disorganized system (Chavas and Knaff 2022). Therefore, understanding the RMW is a critical component in assessing the behavior and potential hazards posed by TCs, ultimately aiding in timely warnings and effective disaster response efforts in vulnerable regions.

Various studies have focused on predicting and estimating various aspects of TCs, including intensity, sea surface temperature, moisture, precipitation, pressure systems, and cloud shapes, only a few studies have centered on the RMW specifically over the Pacific (Gross et al. 2004; Tan and Fang 2018) and Atlantic basin (Lajoie and Walsh 2008; Quiring et al. 2011; Tan and Fang 2018; Vickery and Wadhera 2008). However, limited studies are present over NIO basins (Tan and Fang 2018; Willoughby et al. 2006). All these studies have a large error range of −26% to 200% concerning India Meteorological Department (IMD) best track data and hence, needed to be reduced further.

Keeping the above fact in mind we specifically focus on the NIO, which has two basins- BoB and AS. The BoB is recognized as one of the six prominent regions globally prone to TCs, with a significant number of devastating TCs originating from this area (Jangir et al. 2021, 2020; Knapp et al. 2010; Neetu et al. 2012). Historically, these TCs have mostly occurred between October and November. A concerning trend in the BoB is the rising sea temperatures and corresponding marine heat waves (Gupta et al. 2023; Rathore et al. 2022) which contribute to the intensification of TCs as they approach coastal regions, amplifying the associated risks and impacts.

Our work aims to address the existing knowledge gap by achieving the following objectives:

1. Developing a simple estimation model for the RMW using key TC parameters
2. Estimating model parameters based on historical data from the NIO basin
3. Evaluation of an estimated model for the RMW for various NIO TCs and comparing its accuracy with the accuracy of other existing methods.

This paper is organized as follows: Section 2 presents the data and methodology used in the research. The proposed method is discussed in detail in Section 3 and compared with two other approaches. Section 4 provides the study's conclusion and future direction.

## 2 Data and methodology

### 2.1 Data

This study evaluates a proposed method using the best track dataset obtained from the India Meteorological Department (IMD), which serves as the Regional Specialized Meteorological Center for TCs over the NIO. The dataset consists of various metrics related to TCs, including the TC number, time (year, month, day, and hour), TC center locations (longitude and latitude), estimated central pressure ($P_c$), maximum wind speed ($V_m$), and estimated pressure drop at the center ($P_d$). These metrics are recorded at 6-hour intervals (https://rsmcnewdelhi.imd.gov.in/report.php?internal_menu=MzQ=). We use polynomial interpolation i.e. Newton interpolation to find some missing values of RMW in the best track database. For example, in the case of extremely severe cyclonic storm Tauktae the value of RMW is available in the best track database for 14 May at 06 UTC then next is 15 May at 00 UTC so we find the value of 14 May at 12 and 18 UTC using the newton interpolation. To validate the proposed method, we also compared it with the RMW data from IMD bulletins.

According to the Standard operational procedure for cyclone warnings in India released by the IMD, there is no direct observation of RMW but it can be calculated from the satellite and radar. In radar, the radius of maximum reflectivity is considered as RMW. In satellites, the radius of maximum reflectivity in visible imagery and the radius of the lowest cloud temperature in IR imagery is considered as RMW (IMD 2021). We collected the data of 25 TCs for training and 4 TCs for validation.

### 2.2 Radius of maximum wind formulation

The main objective of this study was to formulate a method for calculating the RMW based on the characteristics of TCs, such as the latitude (Lat.) of the TC center, along with the estimated pressure drop. The choice of latitude and pressure drop as key parameters for RMW estimation, while excluding longitude, is grounded in empirical evidence and theoretical understanding within the field of TC research. Latitude serves as a fundamental indicator of TC formation and movement, with studies such as (Camargo 2013) highlighting its role in determining TC genesis and tracks across different ocean basins. Pressure drop, on the other hand, is closely linked to TC intensity, as discussed by Emanuel (2003), where it is associated with the energy release and intensity of TCs. Conversely, while longitude influences TC position, its direct

impact on TC intensity is less pronounced, as demonstrated by research such as (Holland 1997; Chavas et al. 2015), which emphasize the primary role of factors like sea surface temperature and atmospheric conditions in determining TC intensity. Therefore, by focusing on latitude and pressure drop as key parameters, this approach captures essential aspects of TC behavior and intensity.

The values of RMW for most TCs did not exist in most historical records until observations became available in 2001 (Knapp et al. 2010). The empirical function of RMW to the other TC variables such as pressure drop at the center $P_d$ and latitude, a rigorous analysis of relevant variables, and their impact of RMW over the NIO region and existing studies (Agency 2012; Vickery and Wadhera 2008) is crucial. This analysis typically involves collecting and analyzing observational data on TCs in the NIO, including parameters such as central pressure, wind speed, latitude, and RMW. Regression analysis is employed to identify the relationships between these variables. The analysis aims to quantify the influence of pressure drop and latitude on RMW and drive mathematical equations that describe these relationships. The average ambient pressure based on past studies over the NIO was set to 1013.25 hPa (Islam and Peterson 2008).

This relationship allows us to determine the value of RMW for estimated pressure drops ($P_d$) that are less than or equal to 12 hectopascals (hPa), it means that the atmospheric pressure at the center of the TC has decreased by 12 hPa or less compared to the surrounding environment. This pressure drop is often associated with an increase in the cyclone's intensity or strength.

The relationship for determining RMW (in nautical miles) is as follows:

$$RMW = k \times e^{(a\sqrt{P_d}+b\phi)} + c \tag{1}$$

Here, $\phi$ represents the latitude of the TC center, and $P_d$ represents the estimated pressure drop at the TC center.

These constants (k, a, b, and c) would be determined by taking a dataset of historical data of TC that includes the value of RMW, $P_d$, and $\phi$ over the NIO. By the non-linear least squares optimization method, we estimate the constants of the RMW equation (the equation of RMW is a non-linear equation). By utilizing the '$curve_fit$' function from '$scipy.optimize$' (Virtanen et al. 2020), the code fits the experimental equation to the data, optimizing the parameters through an iterative process. The 'maxfev' parameter is increased to 10000, allowing for a higher number of function evaluations during the optimization process, thereby enhancing the convergence of the solution. The estimated constants (k, a, b, and c) are then derived, providing insights into the underlying relationship between the variables. The least squares optimization method ensures robust parameter estimation and accurate modeling of the non-linear system.

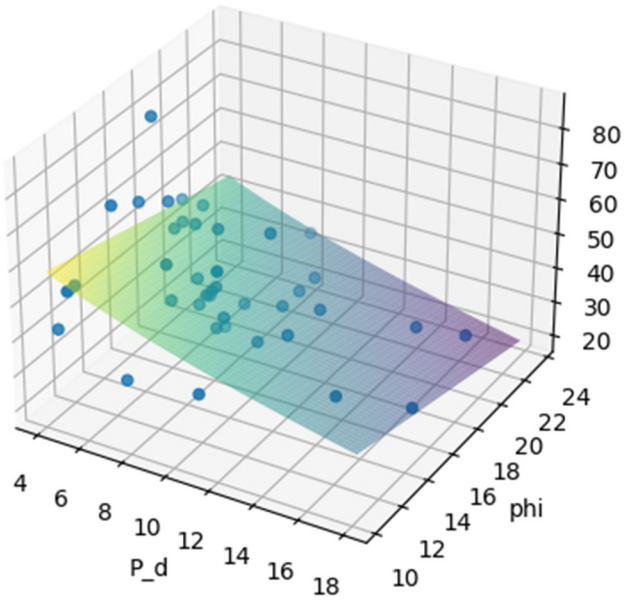


**Fig. 1** Fitted function vs. observed data points

The graph visual of fitting the curve is shown in Fig. 1 with R-squared is 0.92.

The Final equation for determining RMW is:

$$RMW = -36640.61 \times e^{(0.00029\sqrt{P_d}+0.000029\phi)} + 36732.39 \tag{2}$$

This method provides a reliable means of calculating the RMW based on the given TC characteristics. The relationship established in this study allows for accurate determination of RMW as long as the value of $P_d$ is less than or equal to 12 hPa.

To validate the accuracy of the proposed method, three evaluation techniques were employed: error percentage, statistical t-test, and root mean square error. By utilizing these methods, we can confidently assert that the proposed approach outperforms alternative methods used for determining RMW in the NIO region. Willoughby et al. (2006); Tan and Fang (2018) also provided the RMW formula for the NIO region as given below. We compare our designed method with the models proposed by Willoughby et al. (2006); Tan and Fang (2018), both specifically designed for NIO cases.

Willoughby et al. (2006) introduced an empirically derived model that describes the structure of the hurricane vortex. In their study, they provided an expression for determining the value of RMW for the NIO basins.

The model's estimation equation for RMW over the NIO is:

$$RMW = 46.6 \times e^{(-0.015V_{max}+0.0169\theta)} \tag{3}$$

where $\theta$ is latitude (degrees), $V_{max}$ is the maximum wind speed (kt).

Tan and Fang (2018) focused on simulating wind fields of historical TCs using parametric models using satellite data. In their study, they provided an expression for determining the value of RMW for all the seen basins (Table 3 of the reference paper (Tan and Fang 2018) has the expression to determine the value of RMW for all seven basins).

The expression to determine the value of RMW over the NIO is:

$$RMW = -26.73 \times ln(1013.25 - P_c) + 142.41 \quad (4)$$

where $P_c$ is the estimated central pressure of TC

Firstly, we calculated the error percentage by comparing the values obtained from the proposed method with the data provided by the IMD and the results of the other two methods (Tan and Fang 2018; Willoughby et al. 2006). The error percentage formula used is as follows:

$$\text{Error percentage} = \left( \frac{|\text{ Experimental Value} - \text{Actual Value }|}{\text{Actual Value}} \right) \times 100$$

Once the error percentages were calculated, a statistical t-test was conducted to determine the accuracy of the proposed method compared to the alternative approaches.

The t-test is a statistical test used to compare the means of two samples of the population to determine if there is a significant difference between them. In this paper, the t-test has been conducted to compare the proposed method with the other approaches. When the t-test indicates that one method is "statistically better" than another, the observed differences in their outcomes are unlikely to have occurred by chance. In other words, the differences are significant and not simply due to random variation. Null Hypothesis ($H_o$) assumes that there is no significant difference between the means of the two groups being compared. Alternative Hypothesis ($H_a$) is the opposite of the null hypothesis. To show that our method is statistically better, a significance level of 0.05 is utilized. For this analysis, we employed the Python language along with the numpy and scipy libraries to calculate the t-test effectively.

Root Mean Square Error (RMSE) is a widely used metric in scientific and statistical analysis to assess the accuracy of a method or model, particularly in the context of predictive or estimation tasks. It quantifies the average magnitude of the differences between predicted values and observed or actual values. RMSE is calculated by taking the square root of the average of the squared differences between predicted and actual values, making it sensitive to both large and small errors.

In scientific research, reporting RMSE is crucial as it provides a measure of the goodness of fit between a model's predictions and the actual data. A lower RMSE indicates that the model's predictions are, on average, closer to the observed values, signifying a higher level of accuracy. This metric allows researchers to objectively compare different models or methods and select the one that performs best in terms of minimizing prediction errors. Therefore, RMSE serves as a valuable tool for assessing the reliability and precision of scientific methods, aiding in the decision-making process and the validation of research findings.

## 3 Result

The proposed method for determining the value of RMW was evaluated using seven TC cases, namely: Extremely Severe Cyclonic Storm Tauktae (ESCS Tauktae), Cyclonic Storm Gulab (CS Gulab), Severe Cyclonic Storm Mandous (SCS Mandous), Severe Cyclonic Storm Asani (SCS Asani), Cyclonic Storm Sitrang (CS Sitrang), Cyclonic Storm Jawad (CS Jawad), and Very Severe Cyclonic Storm Yaas (VSCS Yaas). These specific cases were chosen to assess the proposed method's effectiveness accurately. Furthermore, Table 1 provides details regarding the category of each of these selected TCs, along with the corresponding periods.

**Table 1** Category of selected TCs, and time period across the NIO basin

| S. No. | Name | Category | Time period |
|---|---|---|---|
| 1 | Tauktae | Extremely severe cyclonic storm | 14 - 19 May,2021 |
| 2 | Gulab | Cyclonic storm | 24 - 28 September 2021 |
| 3 | Mandous | Severe cyclonic storm | 6 - 10 December, 2022 |
| 4 | Asani | Severe cyclonic storm | 07 - 12 May, 2022 |
| 5 | Sitrang | Cyclonic storm | 22 - 25 October, 2022 |
| 6 | Jawad | Cyclonic storm | 02 - 06 December,2021 |
| 7 | Yaas | Very severe cyclonic storm | 23 - 28 May, 2021 |

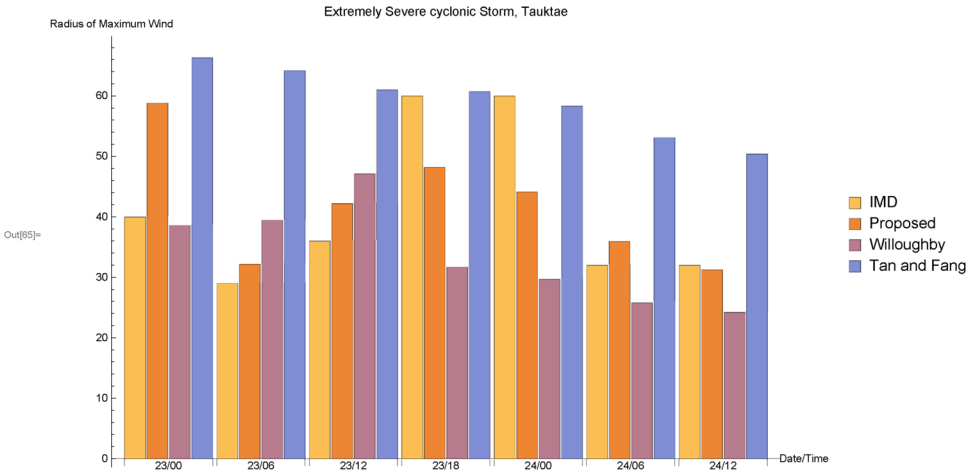


**Fig. 2** Graphical representation of ESCS Tauktae's value of RMW by proposed method, Willoughby et al., Tan and Fang, and IMD

### 3.1 ESCS Tauktae

TC Tauktae, which formed in May 2021, was a powerful and destructive storm that primarily affected the AS region and the western coast of India. It intensified into ESCS, boasting an MSW of 85-90 knots with gusts reaching 100 knots. This TC was extraordinary in its path, causing widespread adverse weather conditions and damage across the entire west coast, including states, Union Territories, and Lakshadweep, as it tracked parallel to the west coast before crossing Gujarat. ESCS Tauktae experienced rapid intensification over 24 hours, from the morning of May 16th (0530 IST/0000 UTC) to the morning of May 17th (0530 IST/0000 UTC), with MSW increasing from 65 knots to 100 knots. The TC's peak MSW reached 100 knots, gusting to 113 knots between 0530 IST (0000 UTC) on May 17th and 1130 IST (0600 UTC) on May 17th over the east-central AS. During this period, the lowest estimated central pressure dropped to 950 hPa, representing a 50 hPa decrease compared to the surrounding region (Division 2021c).

Our study, in conjunction with the methodologies proposed by Willoughby et al. (2006); Tan and Fang (2018), as well as utilizing data sourced from the IMD, is visually presented in Fig. 2. This graphical illustration effectively conveys the significance of the parameter denoted as RMW. Complementing this visual representation, Table 2 provides a quantitative summary of the results obtained for the ESCS Tauktae.

Upon analyzing the average error across all cases concerning the IMD's average RMW of 41.28 nautical miles, our method demonstrates an error rate of 19.42%. In contrast, the approaches by Willoughby et al. (2006); Tan and Fang (2018) exhibit error rates of 25.99% and 54.85%, respectively. Detailed root mean square error (RMSE) values can be found in Table 9.

Upon conducting a t-test, it is evident that our method is statistically better than the other two approaches with $\alpha = 0.05$, as the error percentage and RMSE are less.

### 3.2 CS Gulab

The formation of the cyclonic system known as "Gulab" occurred during the active phase of the monsoon season over the Indian subcontinent. Several favorable atmospheric

**Table 2** Results of ESCS Tauktae, where $E_1$ indicates the error percentage between the proposed method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

| Date/ Time | IMD's RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 14/06 | 40 | 58.82 | 38.571 | 66.288 | 47.05 | 3.57 | 65.72 |
| 14/12 | 29 | 32.18 | 39.46 | 64.21 | 10.96 | 36.06 | 121.41 |
| 14/18 | 36 | 42.20 | 47.12 | 60.98 | 17.22 | 30.88 | 69.38 |
| 15/00 | 60 | 48.20 | 31.69 | 60.7136 | 19.66 | 47.18 | 1.18 |
| 15/06 | 60 | 44.123 | 29.65 | 58.30 | 26.46 | 50.58 | 2.83 |
| 15/12 | 32 | 35.92 | 25.785 | 53.10 | 12.25 | 19.42 | 65.93 |
| 15/18 | 32 | 31.24 | 24.207 | 50.4 | 2.37 | 24.35 | 57.5 |
| Mean | 41.28 | 41.81 | 33.78 | 59.14 | 19.42 | 25.99 | 54.85 |

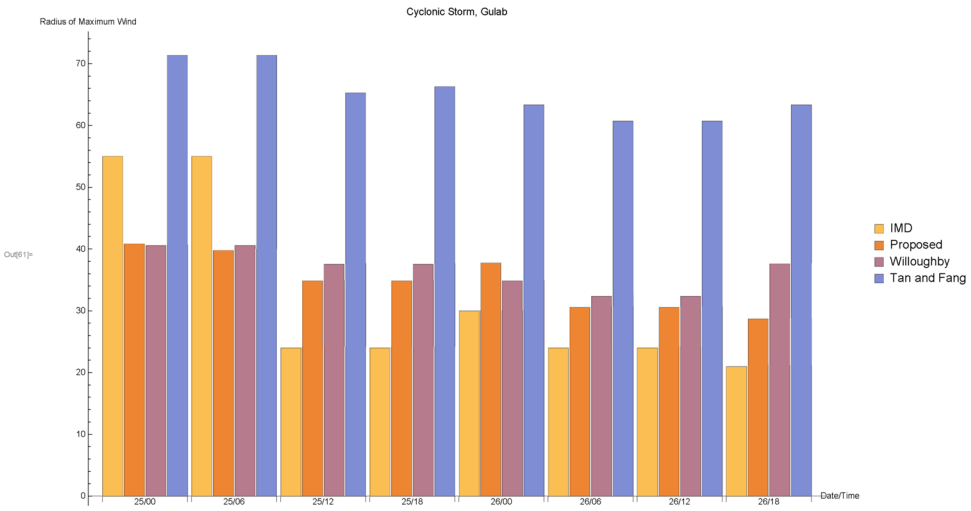


**Fig. 3** CS Gulab's value of RMW given by proposed method, Willoughby et al., Tan and Fang, and IMD is graphically represented

conditions contributed to its development, including warm sea temperatures, the incursion of warm and moist air into the core of the system, a favorable Madden Julian Oscillation (MJO) phase, and relatively low to moderate vertical wind shear over the region (Division 2021a).

Notably, the system had a shorter lifespan compared to the long-term average for cyclonic systems during the monsoon season over the Bay of Bengal. Specifically, its duration was approximately 90 hours, while the long-term average, based on data from 1990 to 2013, stands at 110 hours. Additionally, the peak intensity of Cyclone Gulab reached 45 knots, occurring between 0600 and 1200 UTC on the 26th of September.

Our methodology, in conjunction with the techniques proposed by Willoughby et al. (2006); Tan and Fang (2018), as well as the utilization of data provided by the IMD, is visually illustrated in Fig. 3. This graphical representation effectively demonstrates the significance of the (RMW). Table 3 complements this visual representation by providing a quantitative summary of the results for CS Gulab.

Upon analyzing the average error across all cases concerning IMD's reference value for the RMW at 32.12 nautical miles, our methodology yields an average error of 28.49%. In contrast, Willoughby et al. (2006); Tan and Fang (2018) methods exhibit average errors of 41.37% and 128.62%, respectively. The RSME values are detailed in Table 9.

Furthermore, a t-test analysis indicates that our proposed methodology statistically outperforms the alternative methods, as it consistently yields lower error percentages and RSME values.

### 3.3 SCS Mandous

In December, the Bay of Bengal typically witnesses the formation of approximately 25 TCs, including 15 SCS. Out of these 25 TCs, nine made landfall along the Tamil Nadu coast. One of them initially started as depression, one as a CS, and the remaining seven as SCSs. Among these, Mandous was one of the SCSs that made landfall.

**Table 3** Results of CS Gulab, where $E_1$ indicates the error percentage between our method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

| Date/ Time | IMD's RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 25/00 | 55 | 40.85 | 40.55 | 71.39 | 25.72 | 26.27 | 29.8 |
| 25/06 | 55 | 39.78 | 40.55 | 71.39 | 27.67 | 26.27 | 29.8 |
| 25/12 | 24 | 34.84 | 37.55 | 65.28 | 45.16 | 56.45 | 174.5 |
| 25/18 | 24 | 34.84 | 37.55 | 66.28 | 45.16 | 56.45 | 176.16 |
| 26/00 | 30 | 37.78 | 34.84 | 63.35 | 25.93 | 16.13 | 111.16 |
| 26/06 | 24 | 30.53 | 32.38 | 60.71 | 27.20 | 34.91 | 152.95 |
| 26/12 | 24 | 30.53 | 32.38 | 60.71 | 27.20 | 34.91 | 152.95 |
| 26/18 | 21 | 28.72 | 37.62 | 63.35 | 36.76 | 79.14 | 201.66 |
| Mean | 32.12 | 34.73 | 31.98 | 65.31 | 32.60 | 41.37 | 128.62 |

Mandous followed a unique track. Initially, it moved in a west-northwest direction until the evening of December 7th, at 1730 hours IST. Afterward, it changed its course to northwest until it made landfall. Following landfall, the system altered its trajectory to move west-northwest until the morning of December 10th at 0530 hours IST, after which it headed west-southwest.

This distinct movement pattern can be attributed to the influence of an anticyclone located northeast of the storm's center in the middle and upper tropospheric levels, which steered the system over the sea.

The duration of Mandous's existence as a storm, from its initial formation as a depression to its subsequent status as a depression, spanned approximately 96 hours, equivalent to 4 days. This duration is closely aligned with the long-term average (1990-2013) for Severe Cyclonic Storms in the Bay of Bengal during the post-monsoon season, which also stands at about 96 hours or 4 days. It's noteworthy that the system did not exhibit rapid intensification or weakening during its entire life cycle. Mandous achieved its peak intensity of 50 knots at 1200 UTC on December 8th and maintained this strength until 0000 UTC on December 9th (Division 2022c).

Our study incorporates a methodology, in conjunction with the methodologies proposed by Willoughby et al. (2006); Tan and Fang (2018), as well as utilizing data provided by the IMD. These approaches are visually illustrated in Fig. 4, presenting a graphical representation that highlights the significance of the parameter (RMW). Furthermore, Table 4 offers a quantitative summary of the results of SCS Mandous.

Upon calculating the average error for all cases concerning the IMD's average RMW of 40.46 nautical miles, our method exhibits an error rate of 29.63 %, while Willoughby et al. (2006); Tan and Fang (2018) methods exhibit error rates of 35.80% and 79.23%, respectively. The Root Mean Square Error (RSME) values are presented in Table 9.

The t-test, reveals that our proposed method demonstrates statistically superior performance in comparison to the alternative methods, as evidenced by its lower error percentage and RSME.

### 3.4 SCS Asani

On the morning of May 6th, 2022, a low-pressure area began to develop over the South Andaman Sea and the adjoining Southeast BoB. By the early morning of May 7th, it had intensified into a well-marked low-pressure area, situated over the Southeast BoB and the adjacent South Andaman Sea. Favorable environmental conditions allowed it to consolidate further, eventually becoming a depression around noon on the same day, May 7th, 2022. This system, named SCS "Asani," transformed into a deep depression before making landfall. Remarkably, it exhibited an unusually slow movement, crawling at a speed of 5-6 kilometers per hour, significantly slower than the typical speed of 13 kilometers per hour. This sluggish pace kept it hovering within 50 kilometers of the coastline from morning to evening on May 11th.

SCS "Asani" displayed multiple shifts in its trajectory. Most meteorological models had initially predicted a change in its direction, veering from northwest to northeast near the coast. It initially moved northward/northwestward and later shifted to a west-southwestward direction. This unexpected change was primarily influenced by the system's response to a short amplitude westerly trough in the middle and upper tropospheric levels approaching from the west, causing it to deviate from the anticipated northeastward path near the coast (Division 2022b).

Our study introduces a novel methodology, which is visually presented in Fig. 5, alongside existing approaches proposed by Willoughby et al. (2006); Tan and Fang (2018), and data sourced from the IMD. This graphical representation

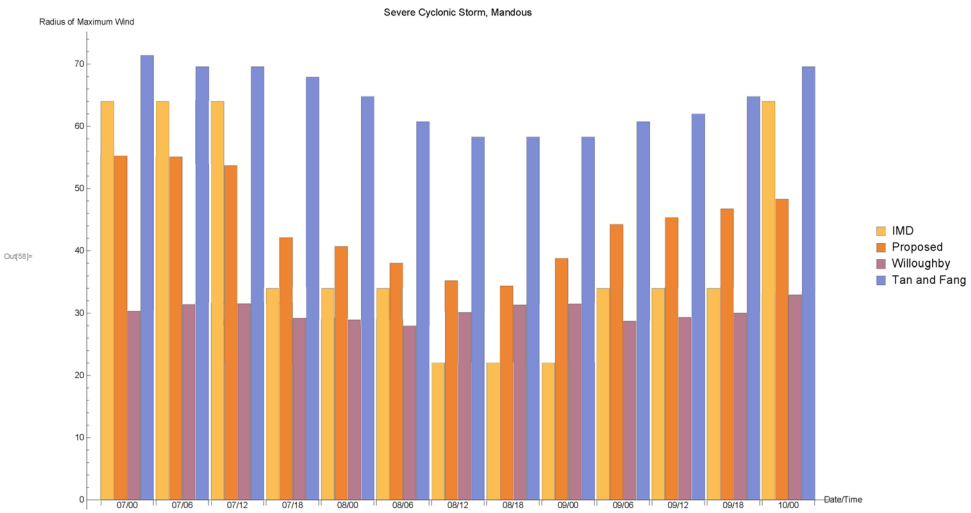


**Fig. 4** SCS Mandous's value of RMW given by proposed method, Willoughby et al., Tan and Fang, and IMD is graphically represented

**Table 4** Results of SCS

| Date/ Time | IMD RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 07/00 | 64 | 55.28 | 30.36 | 71.39 | 13.62 | 52.56 | 11.54 |
| 07/06 | 64 | 55.10 | 31.41 | 69.58 | 13.90 | 50.93 | 8.71 |
| 07/12 | 64 | 53.68 | 31.53 | 69.58 | 16.12 | 50.73 | 8.71 |
| 07/18 | 34 | 42.09 | 29.203 | 67.88 | 23.7 | 14.12 | 76.82 |
| 08/00 | 34 | 40.67 | 28.97 | 64.78 | 19.6 | 14.79 | 90.52 |
| 08/06 | 34 | 38.03 | 27.95 | 60.71 | 11.8 | 12 | 78.55 |
| 08/12 | 22 | 35.23 | 30.15 | 58.309 | 60.1 | 37.045 | 165.04 |
| 08/18 | 22 | 34.40 | 31.33 | 58.309 | 51.6 | 34.68 | 165.04 |
| 09/00 | 22 | 38.75 | 31.509 | 58.309 | 76.1 | 43.22 | 165.04 |
| 09/06 | 34 | 44.24 | 28.76 | 60.71 | 30.1 | 15.41 | 78.55 |
| 09/12 | 34 | 45.37 | 29.32 | 62.002 | 10.61 | 13.76 | 82.35 |
| 09/18 | 34 | 46.74 | 30.05 | 64.781 | 33.4 | 11.16 | 90.53 |
| 10/00 | 64 | 48.27 | 32.95 | 69.58 | 24.57 | 48.51 | 8.71 |
| Mean | 40.46 | 44.45 | 31.03 | 64.30 | 29.63 | 35.80 | 79.23 |

"Mandous" over BoB during 6 – 10 December 2022, where $E_1$ indicates the error percentage between the proposed method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

effectively illustrates the significance of the (RMW). To complement this visual insight, Table 5 provides a quantitative summary of the results on SCS Asani.

When comparing the average error of our method to the IMD's average RMW value of 40.71 nautical miles, our method exhibits an error percentage of 15.92%, while the approaches presented by Willoughby et al. (2006); Tan and Fang (2018) yield error percentages of 19.25% and 59.15%, respectively. Additionally, Table 9 presents the RSME values for these methods. Statistical analysis using a t-test demonstrates that our proposed method exhibits superior performance compared to the alternative methods, as it consistently yields lower error percentages and RSME values.

## 3.5 CS Sitrang

In the early morning of October 20, 2022, a low-pressure area developed over the North Andaman Sea and extended into the South Andaman Sea and Southeast BoB. By the evening of October 21, it had intensified into a well-marked low-pressure area, still situated over the North Andaman Sea and the adjoining Southeast BoB. As favorable environmental conditions persisted, this system gradually concentrated and formed a depression over the Southeast and the neighboring east-central BoB, near the Andaman Islands, by the forenoon of October 22, 2022.

Initially, this weather system, known as CS Sitrang, moved in a northwestward direction due to the influence of

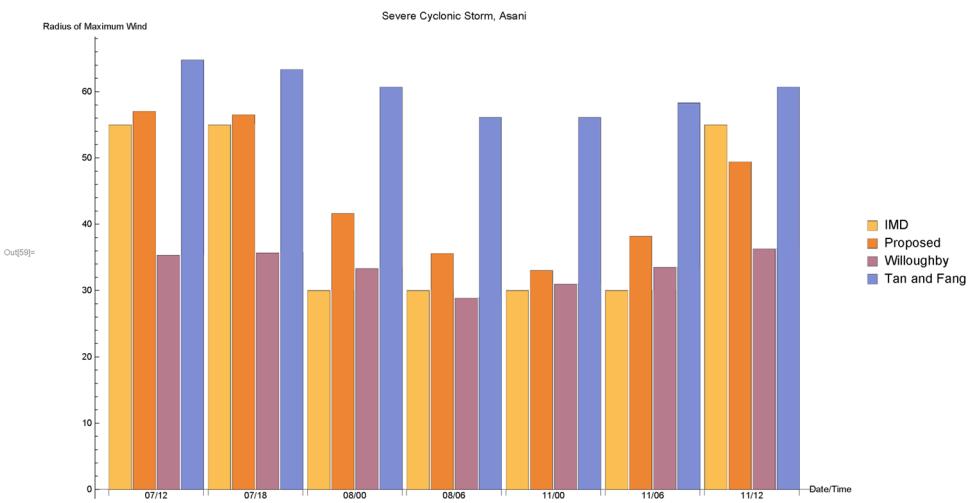


**Fig. 5** SCS Asani's value of RMW given by proposed method, Willoughby et al., Tan and Fang, and IMD is graphically represented

**Table 5** Results of SCS, "Asani" over BoB during 07 – 12 May 2022, where $E_1$ indicates the error percentage between the proposed method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

| Date/ Time | IMD RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 07/12 | 55 | 57.05 | 35.303 | 64.78 | 3.72 | 35.81 | 17.78 |
| 07/18 | 55 | 56.52 | 35.66 | 63.35 | 2.76 | 35.16 | 15.18 |
| 08/00 | 30 | 41.63 | 33.31 | 60.71 | 38.76 | 11.03 | 102.6 |
| 08/06 | 30 | 35.61 | 28.86 | 56.10 | 18.70 | 3.8 | 87.01 |
| 11/00 | 30 | 33.03 | 30.98 | 56.10 | 10.10 | 3.26 | 87.01 |
| 11/06 | 30 | 38.18 | 33.51 | 58.30 | 27.26 | 11.7 | 94.36 |
| 11/12 | 55 | 49.40 | 36.309 | 60.71 | 10.18 | 33.98 | 10.38 |
| Mean | 40.71 | 44.48 | 32.41 | 60.01 | 15.92 | 19.25 | 59.15 |

southeasterly winds in the middle and upper tropospheric levels. This pattern continued until the morning of October 23. Subsequently, a gradual change in its trajectory occurred as it started to recurve north-northeastwards from the night of October 23. This shift was attributed to the presence of a trough in the westerlies and an anticyclone located to the east of Myanmar.

On the 24th of October, CS Sitrang exhibited exceptionally rapid movement due to several factors, including the influence of a westerly trough, the presence of an anticyclone over Myanmar, and interactions with land. The entire lifespan of this storm, from its formation as a depression to another depression, lasted approximately 69 hours, which equates to 2 days and 21 hours. This duration was shorter than the long-term average for cyclonic storms in the Bay of Bengal during the post-monsoon season, which stands at about 88 hours or 3 days and 16 hours, based on data from 1990 to 2013 (Division 2022a).

Our methodology, in conjunction with the techniques introduced by Willoughby et al. (2006); Tan and Fang (2018), and utilizing data from the IMD, is visually presented in Fig. 6. This graphical illustration effectively demonstrates the significance of the (RMW). Complementing this visual representation, Table 6 provides a numerical summary of the results of the CS Sitrang.

In terms of the average error compared to IMD's average RMW of 40.00 nautical miles, our methodology yields an error rate of 15.21%, while the methods proposed by Willoughby et al. (2006); Tan and Fang (2018) exhibit error rates of 18.42% and 62.67%, respectively. The RMSE values are detailed in Table 9.

Further statistical analysis using a t-test indicates that our proposed methodology significantly outperforms the other methods, as evidenced by lower error percentages and RMSE values.

### 3.6 CS Jawad

In 2021, TC Jawad held the distinction of being the 5th TC observed over the NIO. Additionally, it marked the first TC

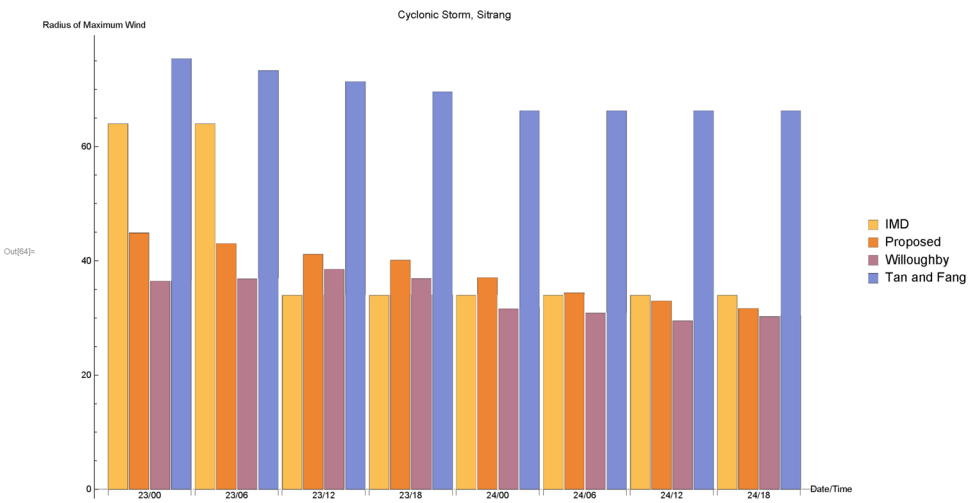


**Fig. 6** CS Sitrang's value of RMW given by proposed method, Willoughby et al., Tan and Fang, and IMD is graphically represented

**Table 6** Results of CS, "Sitrang" over the BoB during 22 – 25 October 2022, where $E_1$ indicates the error percentage between the proposed method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

| Date/ Time | IMD RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 23/00 | 64 | 44.87 | 36.48 | 75.43 | 29.88 | 43 | 17.85 |
| 23/06 | 64 | 43.00 | 36.87 | 73.33 | 32.80 | 42.39 | 14.57 |
| 23/12 | 34 | 41.14 | 38.55 | 71.39 | 21.01 | 13.38 | 109.97 |
| 23/18 | 34 | 40.10 | 36.92 | 69.58 | 17.96 | 8.58 | 104.64 |
| 24/00 | 34 | 37.09 | 31.66 | 66.28 | 9.10 | 6.88 | 94.94 |
| 24/06 | 34 | 34.42 | 30.87 | 66.28 | 1.26 | 9.20 | 94.94 |
| 24/12 | 34 | 32.99 | 29.55 | 66.28 | 2.95 | 13.08 | 94.94 |
| 24/18 | 34 | 31.71 | 30.29 | 66.28 | 6.70 | 10.91 | 94.94 |
| Mean | 41.5 | 38.16 | 27.11 | 55.48 | 15.21 | 18.42 | 62.679 |

occurrence during the post-monsoon season, which typically spans from October to December. Interestingly, December had no recorded instances of a TC making landfall in Odisha in the historical records. Instead, these cyclones typically made landfall over the northern regions of Andhra Pradesh and West Bengal.

Even in the absence of landfall, Odisha experienced the impact of TCs in previous years, primarily in the form of heavy rainfall. The genesis of most TCs occurred over the southern BoB and the southern Andaman Sea. When these systems reached a latitude beyond 15 degrees North in the Bay of Bengal, they tended to alter their course, curving north-northeastward.

This pattern was similarly observed in the case of TC Jawad, as it initially moved north-northwestward and began to recurve on the morning of the 4th day (at 0530 hours IST/0000 UTC). The peak MSW of TC Jawad was recorded at 40 knots with gusts reaching up to 50 knots between the 3rd and 4th days (from 1200 UTC on the 3rd to 0000 UTC on the 4th).

On the 4th day at 0600 UTC, Dhamra Port reported south-southeasterly winds with an intensity of 32 knots, gusting to 35 knots. Subsequently, the cyclonic system began to weaken due to unfavorable conditions, including enhanced wind shear, the incursion of dry air into the core of the system, lower ocean thermal energy, interactions with land, and an unfavorable Madden-Julian Oscillation index (Division 2021b).

Our study incorporates a methodology, as well as utilizing previously proposed approaches by Willoughby et al. (2006); Tan and Fang (2018), in conjunction with data sourced from the IMD. These elements are visually represented in Fig. 7, highlighting the significance of the (RMW). Supplementary to this visual representation, Table 7 provides a numerical summary of the results of the CS Jawad.

When assessing the average error across all cases in comparison to IMD's average RMW of 47.17 nautical miles, our method yields an error rate of 10.12%, whereas Willoughby et al. (2006); Tan and Fang (2018) report error rates of 28.53% and 62.41%, respectively. Table 9 presents the RSME values.

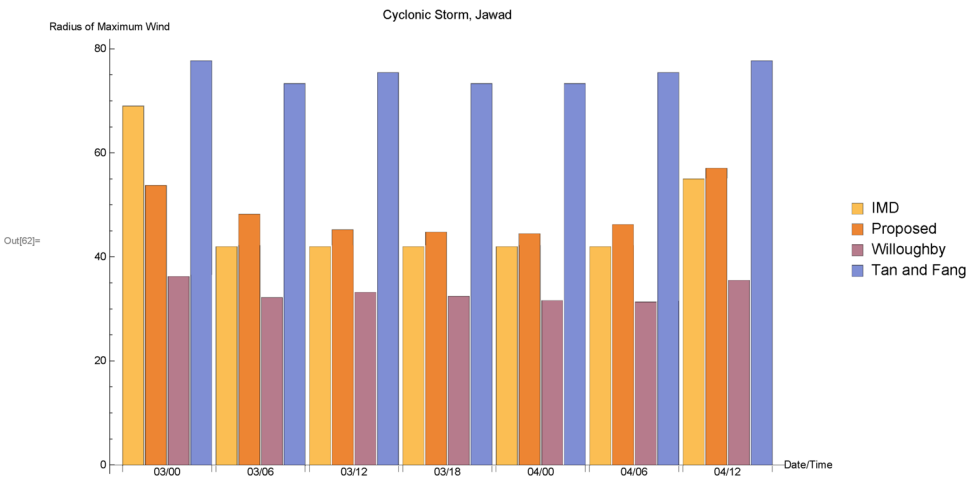


**Fig. 7** CS Jawad's value of RMW given by proposed method, Willoughby et al., Tan and Fang, and IMD is graphically represented

**Table 7** Results of CS, "Jawad" over the BoB during 02 – 06 December 2021, where $E_1$ indicates the error percentage between the proposed method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

| Date/ Time | IMD RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 03/00 | 69 | 53.76 | 36.26 | 77.71 | 22.08 | 47.44 | 12.62 |
| 03/12 | 42 | 48.23 | 32.23 | 73.33 | 14.83 | 23.26 | 74.59 |
| 03/06 | 42 | 45.22 | 33.21 | 75.43 | 7.66 | 20.92 | 79.59 |
| 03/18 | 42 | 44.80 | 32.45 | 73.33 | 6.66 | 22.73 | 74.59 |
| 04/00 | 42 | 44.48 | 31.62 | 73.33 | 5.90 | 24.71 | 74.59 |
| 04/06 | 42 | 46.21 | 31.37 | 75.43 | 10.02 | 25.30 | 79.59 |
| 04/12 | 55 | 57.05 | 35.53 | 77.71 | 3.72 | 35.40 | 41.29 |
| Mean | 47.71 | 48.53 | 33.23 | 75.18 | 10.12 | 28.53 | 62.41 |

Statistical analysis, specifically the t-test, indicates that our proposed method exhibits statistically superior performance when compared to the alternative methods, as it demonstrates lower error percentages and RSME values.

### 3.7 VSCS Yaas

Just four days after ESCS Tauktae dissipated over the Arabian Sea, TC Yaas emerged in the BoB. This occurrence of consecutive or simultaneous tropical cyclones in the BoB and the AS is not uncommon. When we examine the statistical data from the past decade (2010-2020), we find instances of similar back-to-back or simultaneous appearances of VSCS over both the Bay of Bengal and the Arabian Sea in the years 2020, 2019, 2018, 2016, 2015, 2013, and 2010.

TC Yaas had a relatively smaller impact on the affected regions compared to Tauktae. It brought adverse weather conditions to the Andaman and Nicobar Islands, Odisha, and West Bengal until the 26th of May, followed by disturbances in Jharkhand, Bihar, and East Uttar Pradesh after making landfall. The TC followed a straight north-northwestward trajectory. During its peak intensity period, TC Yaas exhibited MSW to 75 knots gusting to 85 knots. This intense phase occurred from 0230 IST on the 26th to 1130 IST on the same day, situated in the northwest Bay of Bengal. At its most potent, the cyclone's central pressure reached an estimated low of 970 hPa, indicating a 28 hPa drop in pressure compared to its surrounding environment (Division 2021d).

Interestingly, TC Yaas experienced rapid weakening after making landfall, with its intensity decreasing by 35 knots in a mere nine-hour span. Remarkably, the system managed to maintain VSCS intensity even after landfall for a duration of 12 hours, lasting from 0600 to 1800 UTC on the 26th.

Our approach, in conjunction with methodologies introduced by Willoughby et al. (2006); Tan and Fang (2018), and data sourced from the IMD, is visually represented in Fig. 8. This graphical representation effectively illustrates the significance of (RMW). Complementing this visualization, Table 8 provides a numerical summary of the findings of the VSCS Yaas.

In assessing the average error across all cases concerning the IMD's average RMW at 53.28 nautical miles, our method yields an error rate of 24.45%, whereas the methods proposed by Willoughby et al. and Tan and Fang result in error rates

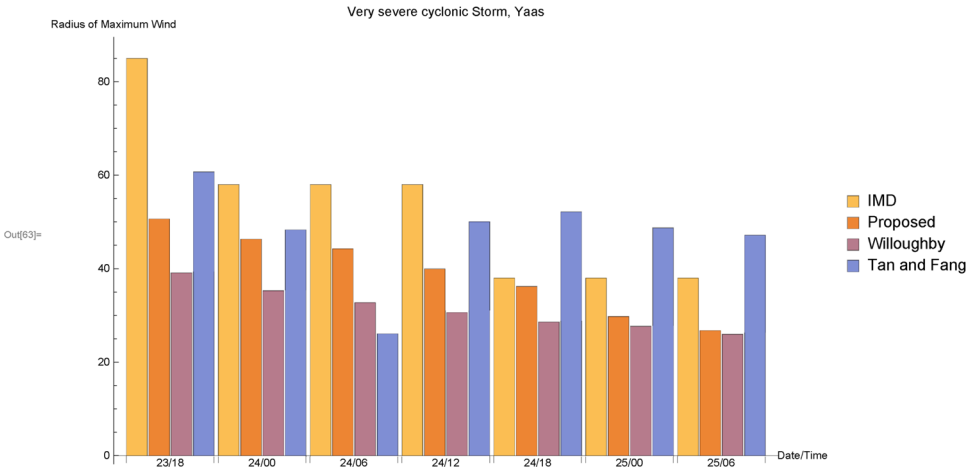


**Fig. 8** VSCS Yaas's value of RMW given by proposed method, Willoughby et al., Tan and Fang, and IMD is graphically represented

**Table 8** Results of VSCS, "YAAS" over the BoB during 23 – 28 May 2021, where $E_1$ indicates the error percentage between the proposed method and IMD, $E_2$ represents the error percentage between Willoughby et al.'s expression and IMD, and $E_3$ represents the error percentage between Tan and Fang's expression and IMD

| Date/ Time | IMD RMW (nautical miles) | Proposed RMW (nautical miles) | Willoughby et al. RMW (nautical miles) | Tan and Fang RMW (nautical miles) | $E_1$ (%) | $E_2$ (%) | $E_3$ (%) |
|---|---|---|---|---|---|---|---|
| 23/18 | 85 | 50.67 | 39.13 | 60.71 | 40.38 | 53.96 | 28.57 |
| 24/00 | 58 | 46.31 | 35.309 | 48.309 | 20.15 | 39.13 | 16.70 |
| 24/06 | 58 | 44.26 | 32.74 | 26.103 | 23.68 | 43.56 | 54.99 |
| 24/12 | 58 | 39.97 | 30.67 | 50.06 | 31.06 | 47.12 | 13.68 |
| 24/18 | 38 | 36.22 | 28.63 | 52.17 | 4.68 | 24.65 | 37.28 |
| 25/00 | 38 | 29.77 | 27.68 | 48.74 | 21.65 | 27.15 | 28.26 |
| 25/06 | 38 | 26.77 | 25.98 | 47.18 | 29.55 | 31.63 | 24.15 |
| Mean | 53.28 | 39.13 | 40.35 | 42.15 | 24.45 | 38.17 | 29.10 |

of 38.17% and 29.10%, respectively. Table 9 presents the RMSE values.

Statistical analysis through a t-test demonstrates that our proposed method exhibits superior performance compared to the alternative methods, as evidenced by lower error percentages (Table 10) and RMSE values (Table 9).

As we discussed above the seven selected TCs over the NIO to examine the accuracy of our method with other methods. In order to say that our method is better as compared to the existing method, we perform three tests (error percentage, t-test, and root square mean error). Our method performs significantly better than what was previously available, even if it still has a relatively high error rate, it may represent progress. This improvement signifies a significant step forward in our understanding and prediction of TC behavior in the NIO region. Additionally, if the method is adopted, it should be viewed as a starting point, with opportunities for further enhancement and error reduction in the future.

## 4 Conclusion

This paper focuses on determining the value of RMW across the NIO. There is a lack of literature specifically addressing RMW in the NIO, which is globally recognized as highly susceptible to TCs. Through an analysis of historical observations, we investigate the relationship between the position of the TC's center (latitude) and the estimated pressure drop $P_d$, to develop a relation for calculating RMW.

To evaluate the accuracy of our proposed approach, we employ three statistical methods namely error percentage, t-test, and RSME. By examining various TC cases within the NIO, we find that our method performs well compared to other methodologies: Tan and Fang (2018); Willoughby et al. (2006) as observed from reduced mean errors (Table 10) and RSMEs (Table 9), where t-test favored their method as well. However, it is important to note a limitation of our method, which is that the value of $P_d$ must be less than or equal to 12 hPa, and there are no specific conditions imposed on the latitude of the TC center within the NIO basin.

We aim to validate our method to the additional basins, including the North Pacific basin and the South Pacific basin. Also, try to improve our method to get more accurate results. Develop the method for pressure drop exceeding 12 hPa as this method works on pressure drop less than or equal to 12 hPa.

**Table 9** The RSME value of our method with respect to (w.r.t.) IMD, Willoughby et al. w.r.t. IMD, and Tan and Fang w.r.t. IMD

| Name of TC | Our method w.r.t. IMD | Willoughby et al. w.r.t. IMD | Tan and Fang w.r.t IMD |
|---|---|---|---|
| Tauktae | 10.75 | 17.14 | 21.84 |
| Gulab | 10.06 | 12.37 | 34.69 |
| Mandous | 15.9 | 18.17 | 32.37 |
| Asani | 6.33 | 12.74 | 21.73 |
| Sitrang | 10.67 | 14.01 | 29.68 |
| Jawad | 6.73 | 16.63 | 28.71 |
| Yaas | 17.01 | 24.91 | 17.59 |

**Table 10** The mean absolute error percentage value of our method with respect to (w.r.t.) IMD, Willoughby et al. w.r.t. IMD, and Tan and Fang w.r.t. IMD

| Name of TC | Our method w.r.t. IMD | Willoughby et al. w.r.t. IMD | Tan and Fang w.r.t IMD |
|---|---|---|---|
| Tauktae | 19.42 | 25.99 | 54.85 |
| Gulab | 32.60 | 41.37 | 128.62 |
| Mandous | 29.63 | 35.80 | 79.23 |
| Asani | 6.33 | 12.74 | 21.73 |
| Sitrang | 15.21 | 18.42 | 62.679 |
| Jawad | 10.12 | 28.53 | 62.41 |
| Yaas | 24.45 | 38.17 | 29.10 |

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**Author Contributions** Monu Yadav: Research, data curation, formal analysis, investigation, and first draft preparation. Laxminarayan Das: Research, Supervision, Review, and Editing.

**Data Availability** The datasets include TC metrics such as TC number, time (year, month, day, and hour), locations (longitude and latitude of TC center), estimated central pressure ($P_c$), maximum wind speed ($V_m$), and estimated pressure drop at the center ($P_d$), which are stored in the datasets at a time interval of 3 hours is freely available on the website of Indian Meteorological Department. Python code can be provided by the corresponding author by a reasonable request.

## Declarations

**Conflicts of interest** Conflict of interest is not declared by any of the authors.

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# Framework for Personalized Chronic Pain Management: Harnessing AI and Personality Insights for Effective Care

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**Abstract:** This paper introduces a cutting-edge framework for personalized chronic pain management, leveraging the power of artificial intelligence (AI) and personality insights. It explores the intricate relationship between personality traits and pain perception, expression, and management, identifying key correlations that influence an individual's experience of pain. By integrating personality psychology with AI-driven personality assessment, this framework offers a novel approach to tailoring chronic pain management strategies for each patient's unique personality profile. It highlights the relevance of well-established personality theories such as the Big Five and the Myers-Briggs Type Indicator (MBTI) in shaping personalized pain management plans. Additionally, the paper introduces multimodal AI-driven personality assessment, emphasizing the ethical considerations and data collection processes necessary for its implementation. Through illustrative case studies, the paper exemplifies how this framework can lead to more effective and patient-centered pain relief, ultimately enhancing overall well-being. In conclusion, the paper positions the need of an *"AI-Powered Holistic Pain Management Initiative"* which has the potential to transform chronic pain management by providing personalized, data-driven solutions and create a multifaceted research impact influencing clinical practice, patient outcomes, healthcare policy, and the broader scientific community's understanding of personalized medicine and AI-driven interventions.

**Keywords:** health informatics; pain; personality traits; artificial intelligence

Taxonomy

| **Abbreviation** | **Description** |
|---|---|
| AI | Artificial Intelligence |
| CBT | Cognitive Behavioural Therapy |
| CPM | Chronic Pain Management |
| I/E | Introversion - Extraversion |
| T/F | Thinking - Feeling |
| J/P | Judging – Perceiving |
| S/N | Sensing – iNtution |
| FFM | Five Factor Model |
| MBTI | Myers-Briggs Type Indicator |
| NLP | Natural Language Processing |
| IRB | Institutional Review Board |

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## 1. Introduction

In recent years, healthcare has undergone a transformative shift towards personalized medicine, a groundbreaking approach that goes far beyond the traditional one-size-fits-all model [1,2]. This evolving paradigm, often referred to as precision medicine, recognizes that each individual's health is a complex interplay of various factors, and it tailors healthcare initiatives to the unique characteristics of each patient. Beyond genetic and medical data, personalized healthcare now considers a broad spectrum of elements for personalization, including sociological, psychological, behavioural, and environmental factors. This holistic approach seeks to provide not only more effective treatments but also proactive, preventative strategies that align with an individual's lifestyle, preferences, and specific health needs. In this era of personalized healthcare, patients are increasingly seen as active participants in their own care, and healthcare providers strive to create a bespoke healthcare experience that optimizes both health outcomes and the overall well-being of the individual.

The incorporation of behavioural and personality considerations into healthcare practices has demonstrated its efficacy in improving patient outcomes [3]. One notable example is in the realm of addiction treatment. Healthcare providers have increasingly recognized the significance of tailoring interventions to individual personalities and behaviours when addressing substance use disorders [4,5]. For instance, a patient with a history of impulsive behaviour and sensation-seeking tendencies may benefit from cognitive-behavioural therapy techniques that focus on impulse control and risk assessment, while a patient with high levels of anxiety and avoidance tendencies may respond better to therapies that address underlying emotional triggers. By customizing treatment plans to align with the individual's personality traits and behavioural patterns, addiction treatment programs have achieved higher rates of success in achieving and sustaining recovery, ultimately improving the lives of those affected by addiction.

Pain is a critical and ubiquitous element in the realm of healthcare which serves as a prominent symptom, a diagnostic clue, and a focus of therapeutic intervention [6]. It is a universal human experience that can manifest in various forms and durations. Chronic pain [7] is a persistent and enduring discomfort that can last for months or even years, profoundly affecting individuals' daily lives. It often defies simple solutions and necessitates a comprehensive, multifaceted approach to management, as its causes can be complex and multifactorial. On the other hand, acute pain is characterized by its sudden onset and intense nature. It usually arises in response to specific triggers, such as injuries or illnesses, and serves as a crucial warning signal to the body. Acute pain tends to be shorter-lived compared to chronic pain and typically resolves as the underlying cause is treated or heals. Recognizing the differences between chronic and acute pain is vital not only for healthcare professionals but also for individuals experiencing pain. It informs the choice of appropriate treatments and interventions, aiming to alleviate suffering, restore functionality, and enhance overall well-being. Managing chronic pain involves a holistic approach to improve the individual's overall well-being and function, while acute pain management primarily addresses the underlying issue causing the pain [8].

Chronic pain management (CPM) [9] is a critical aspect of healthcare that aims to alleviate or control pain, enhance patients' quality of life, and improve their overall well-being. Traditionally, chronic pain management has been a uniform approach, with treatments and interventions prescribed based on the type and severity of pain. However, recent advances in artificial intelligence (AI) have paved the way for a more personalized and effective approach to pain management. Chronic pain can be debilitating and significantly impact a person's quality of life, as it may limit their ability to perform daily activities, work, or engage in social and recreational activities. It can affect various parts of the body, such as the back, joints, muscles, nerves, or even be more generalized. Managing chronic pain can

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be challenging and often requires a multidisciplinary approach. Treatment options may include medication, physical therapy, psychological therapy, lifestyle modifications, and in some cases, surgical interventions. Additionally, alternative therapies like acupuncture, massage, and mindfulness techniques may also be beneficial in managing chronic pain. It's crucial for individuals experiencing chronic pain to work closely with healthcare professionals to develop a comprehensive pain management plan tailored to their specific needs and circumstances.

Personality psychology has played a significant role in driving research interest in understanding the behavioural foundations of an individual. Personality, in essence, refers to the distinctive patterns of thinking, feeling, and behaving that arise from a combination of inherent temperaments, inclinations, and external factors such as environments and experiences [10]. Personality traits serve as tangible psychometric measures for explaining human behaviour. There are numerous personality traits that collectively make up an individual's unique personality. These traits influence how people think, feel, and behave in various situations [11]. This paper explores the concept of personality-driven chronic pain management using AI, highlighting its potential benefits and providing examples of its practical application. It focuses on the intersection of personality psychology, AI, and pain management, highlighting how AI-driven personality assessment can lead to more tailored and effective approaches to pain relief. The relationship between personality and pain perception, expression, and management is a complex and multifaceted one. Various personality traits and factors can influence how individuals experience and cope with pain. We delve into the intricate relationship between personality traits and pain, illustrating key correlations. Neuroticism, extraversion, conscientiousness, agreeableness, openness to experience, resilience, sensitivity, empathy, and coping styles are key factors influencing pain perception, expression, and management. The following table 1 lists few examples that highlight how understanding a patient's personality can help healthcare providers tailor pain management strategies to their unique needs and preferences, ultimately leading to more effective and patient-centered care.

**Table 1.** Examples of Correlation of Personality Traits with Pain Management Approaches

| Personality Trait | Sample Pain Management Approaches |
|---|---|
| Neuroticism and Pain Perception | Individuals with high levels of neuroticism tend to be more anxious and prone to negative emotions. This personality trait can amplify the perception of pain and make it more challenging to cope with.<br><br>Healthcare providers may need to incorporate anxiety-reducing techniques, such as mindfulness or relaxation exercises, into the pain management plan for such patients. |
| Extraversion and Pain Coping | Extraverted individuals are often more sociable and outgoing. They may benefit from social support and distraction techniques when dealing with pain.<br><br>Incorporating group therapy or involving friends and family in the patient's pain management can be particularly helpful for extraverted individuals. |
| Conscientiousness and Adherence to Pain Medications | Conscientious individuals are typically organized and diligent. They may be more likely to adhere to a prescribed medication regimen and follow treatment plans precisely.<br><br>Healthcare providers can use this trait to their advantage by recommending structured medication schedules and setting clear expectations for treatment adherence. |
| Agreeableness and Pain Communication | Patients with high levels of agreeableness may be more inclined to downplay their pain or avoid expressing their discomfort to avoid |

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| | |
|---|---|
| | inconveniencing others.<br><br>Healthcare providers should encourage open and honest communication with these patients, ensuring that their pain is adequately assessed and addressed. |
| Openness and Alternative Pain Management | Open-minded individuals may be more receptive to alternative or complementary pain management approaches, such as acupuncture, meditation, or herbal remedies.<br><br>Healthcare providers can discuss a range of options and collaborate with these patients to find therapies that align with their preferences. |
| Resilience and Pain Coping Strategies | Resilience is the ability to bounce back from adversity. Patients with high resilience may benefit from pain management strategies that focus on building coping skills and psychological resilience.<br><br>This could include cognitive-behavioural therapy (CBT) to help them reframe their pain experiences positively. |
| Introversion and Individualized Pain Management | Introverted individuals may prefer more individualized and self-directed pain management strategies. They might respond well to self-help resources, such as pain management apps or online support communities, where they can learn and manage their pain privately. |
| Sensory Sensitivity and Pain Threshold | Some personality traits can be associated with sensory sensitivity. For example, individuals with sensory processing sensitivity may have a lower pain threshold and may require more gentle or tailored pain management approaches to accommodate their heightened sensory experiences. |

Quite clearly, personality traits play a significant role in how individuals experience and cope with pain. Some people may be more resilient and adaptive, while others may have a lower pain tolerance and struggle with emotional aspects of pain. Recognizing these individual differences is crucial for tailoring pain management strategies effectively. At the same time, it's important to note that personality is just one of many factors that influence pain perception and management. Pain is a complex phenomenon affected by biological, psychological, social, and cultural factors. Healthcare providers consider a patient's personality traits alongside other factors when developing personalized pain management plans to ensure the most effective and holistic approach to pain relief.

The paper presents the Big Five personality trait theory [12] and the Myers-Briggs Type Indicator (MBTI) [13, 14] as frameworks to understand how personality traits may impact chronic pain management. For each trait, we explore potential implications for pain perception and coping strategies. Furthermore, we introduce the concept of multimodal AI-driven personality assessment, which leverages data from various sources and modalities to create comprehensive personality profiles. These profiles provide deeper insights into an individual's personality, which can inform personalized pain management plans. Ethical considerations are emphasized in data collection and analysis. Two illustrative case studies demonstrate the practical application of AI-driven personality insights in chronic pain management. These cases illustrate how understanding an individual's personality traits can guide healthcare providers in crafting personalized pain management plans that align with the patient's unique needs and preferences, resulting in improved quality of life and pain relief. The paper outlines the steps involved in creating a dataset for AI-driven personality assessment, emphasizing the collection of demographic information, medical history, pain-related data, psychological assessments, and treatment plans. It provides sample case studies illustrating how AI-driven personality assessment can inform personalized pain management plans for individuals with distinct personality profiles.

The paper marks the pioneering phase in the journey toward creation of an AI model

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tailored to deliver personalized chronic pain management recommendations grounded in an individual's personality traits. The rest of the paper is organized as follows. Section 2 discusses some related work done in the field of personality-driven chronic pain management. In section 3 and 4, the Big Five personality trait theory and the Myers-Briggs Type Indicator (MBTI) are presented as frameworks to understand how personality traits may impact chronic pain management. The concept of multimodal AI-driven personality assessment is introduced in section 5. Section 6 outlines the process of dataset creation, emphasizing the importance of selecting data sources, including patient records and psychological assessments, while considering privacy and ethical considerations, and lists potential data variables. Section 7 provides illustrative case studies demonstrating the practical use of AI-driven personality insights in personalized pain management followed by highlighting the multifaceted potential impact of research on personalized pain management using AI-driven personality insights in section 8. Finally, Section 9 concludes the paper by summarizing the innovative AI-powered personalized pain management framework, acknowledging its potential and addressing key limitations in its implementation.

## 2. Related Work

The pivotal work in the field of pain theory, originating with Melzack and Wall in 1965 [15], brought to the forefront the intricate interplay between psychosocial and physiological factors in pain modulation. This pioneering effort gave rise to the gate control theory of pain, a framework that comprehensively encompassed various elements influencing the perception of pain. Notably, it made a profound contribution to the scientific community by emphasizing the pivotal role played by both the central nervous system and psychosocial variables in shaping the experience of pain [16]. Subsequently, Melzack [17] extended the gate control theory of pain, merging it with stress models.

In numerous studies exploring the intricate relationship between personality and pain, there is a prevalent focus on personality disorders arising as a consequence of pain [18-22]. This focus underscores a fundamental aspect of research in this field, which is the recognition that prolonged and severe pain can have profound and far-reaching effects on an individual's psychological well-being and personality structure. That is, the prevailing hypothesis in much of this research is that chronic pain serves as a catalyst for the development of personality disorders or the exacerbation of pre-existing personality traits. For example, individuals who were once characterized by resilience and emotional stability might find themselves becoming more neurotic or prone to mood disturbances due to the chronic pain's relentless toll on their mental and emotional well-being. Conversely, those with pre-existing tendencies toward certain personality traits, such as high neuroticism or low extraversion, may find these traits accentuated under the ongoing stress of chronic pain.

Within the context of chronic pain, it becomes increasingly apparent that psychological factors carry a significant weight in determining an individual's level of physical impairment, often surpassing the direct impact of the pain's intensity. This observation underscores the intricate and multifaceted nature of chronic pain conditions, where the interplay between physical sensations and psychological responses plays a pivotal role in shaping a person's overall experience. Chronic pain, by its very nature, is characterized by its persistence over an extended period, typically lasting for several months or even years. During this protracted ordeal, individuals often grapple with not only the physical discomfort but also a host of emotional and cognitive challenges. These psychological factors can include anxiety, depression, fear, frustration, and a sense of hopelessness, all of which can exacerbate the perception of pain and its impact on daily life. The profound influence of psychological factors on chronic pain can manifest in several ways such as pain perception, pain coping mechanisms, treatment outcomes and quality of life.

In a groundbreaking 2020 study by Ibrahim et al. [23], 102 individuals with persistent lower back pain, unresponsive to

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conventional treatments, underwent an extensive examination of the relationship between their personalities and pain experiences. Participants completed comprehensive personality surveys assessing temperament, fear of movement, anxiety, and sadness. Both males and females displayed lower "Openness to experience" and higher "Conscientiousness" scores compared to the general population. The study, after meticulous adjustments, revealed that neuroticism correlated with fear-avoidance, sadness, and anxiety. Conversely, extraversion and Openness to Experience were protective, associated with lower depression scores. Extraversion also inversely related to fear-avoidance, while Conscientiousness negatively correlated with sadness and anxiety.

In a 2022 parallel investigation by Hanney et al. [24], 124 individuals underwent personality assessments using the Eysenck Personality Inventory, focusing on neuroticism and extraversion. They also completed questionnaires about their pain experiences, revealing a significant connection between neuroticism and adverse pain-related outcomes. Those with higher neuroticism exhibited increased fear of movement, greater preoccupation with pain, heightened perception of its impact, and elevated pain severity. This study further categorized participants based on their personality profiles and pain experiences.

Despite the profound impact of psychological factors on chronic pain, it's noteworthy that there remains a relative scarcity of conducted studies in this specific area. This research gap is a critical point to acknowledge because understanding the nuances of how psychological factors interact with chronic pain is vital for developing more effective treatment approaches. We illustrate this gap through a correlation diagram in fig. 1.

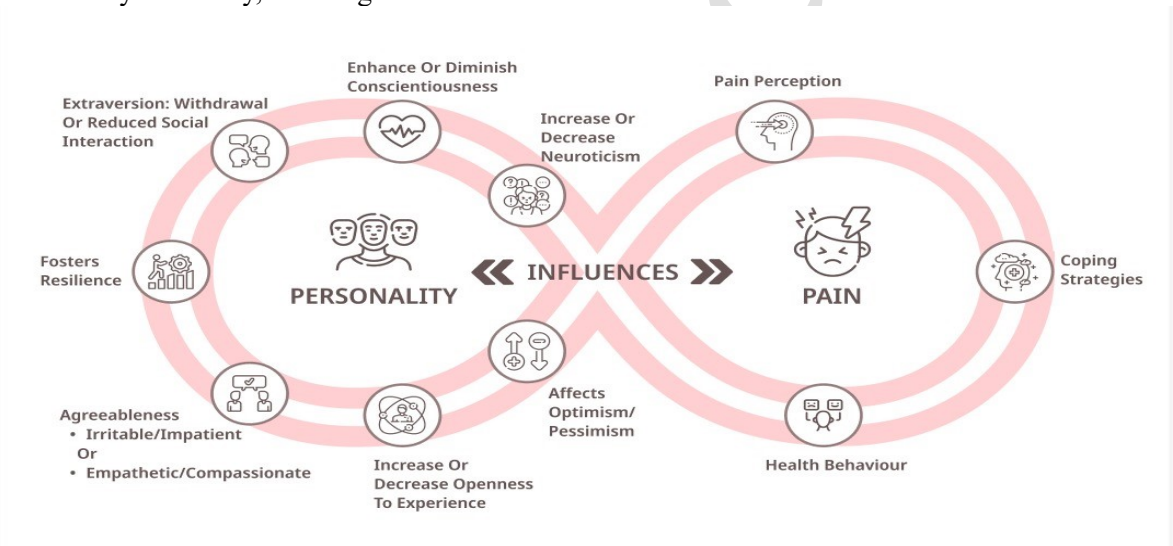


**Fig.1.** Corelating Pain and Personality

By conducting more comprehensive studies in this realm, researchers can gain deeper insights into the complex relationship between psychological factors and chronic pain. This knowledge, in turn, can lead to the development of targeted interventions that not only address the physical aspects of pain but also provide effective strategies for managing the psychological components, ultimately improving the overall well-being and functioning of individuals living with chronic pain.

## 3. Big-5 personality trait theory and Chronic Pain Management

The Big Five personality traits [25], also known as the Five Factor Model (FFM), are a widely accepted framework in psychology that categorizes human personality into five broad dimensions(fig.2).

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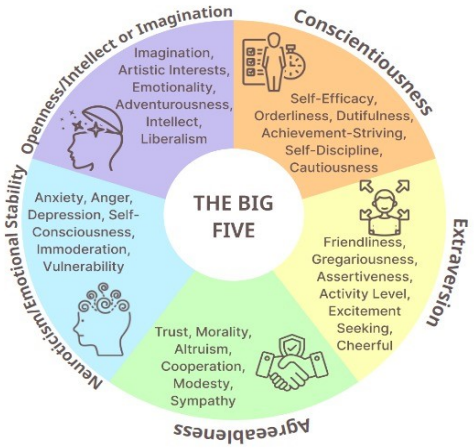


**Fig.2.** Big-5 Personality Traits

These traits are often used to understand and describe individual differences in personality. Here are the Big Five traits and their potential relevance to pain management:

a. Openness to Experience: This trait reflects a person's willingness to embrace new experiences, ideas, and intellectual curiosity. In pain management:
   - Patients with high openness may be more receptive to trying alternative or complementary pain management therapies, such as acupuncture, meditation, or unconventional treatments.
   - Healthcare providers can engage in open discussions with these patients, explaining various treatment options and encouraging them to explore new approaches.

b. Conscientiousness: Conscientiousness relates to an individual's level of organization, responsibility, and self-discipline. In pain management:
   - Highly conscientious patients may excel in following structured pain management plans, adhering to medication schedules, and keeping detailed records of their pain experiences.
   - Healthcare providers can provide clear, organized instructions and emphasize the importance of compliance with the treatment plan.

c. Extraversion: Extraversion characterizes individuals who are outgoing, social, and energetic. In pain management:
   - Extraverted patients may benefit from social support as a coping mechanism for pain. Group therapy or involving friends and family in the patient's pain management can be valuable.
   - Encouraging these patients to engage in physical activities and maintain an active lifestyle may also be effective.

d. Agreeableness: This trait relates to an individual's friendliness, cooperativeness, and concern for others. In pain management:
   - Agreeable patients may be more inclined to downplay their pain or discomfort to avoid burdening others. Healthcare providers should encourage open communication and reassure them that their well-being is a priority.
   - Collaborative decision-making and involving the patient in the treatment planning process can help address their agreeable nature.

e. Neuroticism (Emotional Stability): Neuroticism reflects a person's emotional stability and their tendency to experience negative emotions like anxiety, depression, and stress. In pain management:
   - Patients with high neuroticism may perceive pain as more intense due to heightened emotional reactions. Pain management for such individuals may focus on anxiety reduction and emotional regulation.
   - Techniques such as mindfulness, relaxation exercises, and cognitive-behavioural therapy (CBT) can be particularly useful.

Understanding a patient's Big Five personality traits can help healthcare providers tailor pain management strategies to their unique characteristics and preferences. By considering these traits, healthcare

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professionals can provide more patient-centered care, leading to better pain management outcomes and improved patient satisfaction.

## 4. MBTI Personality Trait Theory and Chronic Pain Management

The Myers-Briggs Type Indicator (MBTI) is a widely used personality assessment tool based on the theories of Carl Jung [26]. It categorizes individuals into one of 16 personality types, each defined by a combination of four dichotomous preferences (Fig.3).

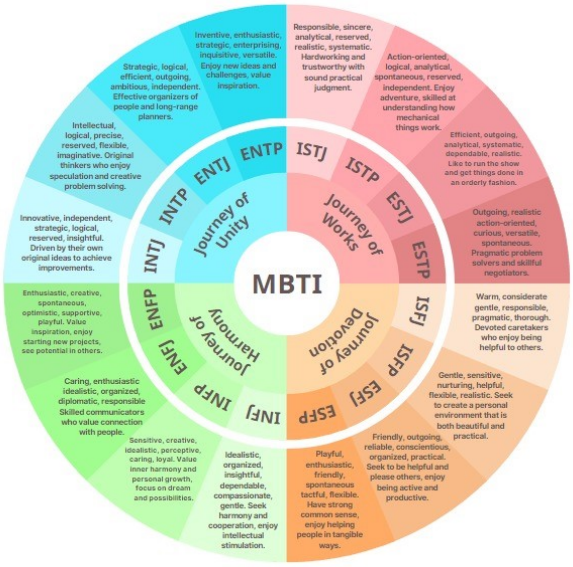


**Fig.3.** MBTI Personality Traits

While MBTI is primarily used for understanding general personality traits and preferences, it can provide some insights into how individuals might approach pain management. Here's how MBTI personality types might be related to pain management:

a. Extraversion (E) vs. Introversion (I):
   - Extraverts (E) may seek social support and interaction as a coping mechanism for pain. Group therapy and involving friends and family in their pain management process could be beneficial.
   - Introverts (I) may prefer a more individualized approach to pain management, such as self-help resources, private reflection, or one-on-one therapy.

b. Sensing (S) vs. Intuition (N):
   - Sensing types (S) tend to focus on concrete, practical details. They may prefer pain management strategies that are well-structured and based on proven, empirical methods.
   - Intuitive types (N) may be more open to unconventional or holistic pain management approaches that align with their creative and imaginative thinking.

c. Thinking (T) vs. Feeling (F):
   - Thinking types (T) might approach pain management logically, relying on data and evidence-based treatments. They may be more comfortable discussing treatment options and potential risks.
   - Feeling types (F) may prioritize emotional well-being and may benefit from interventions that address the emotional aspects of pain, such as support groups and therapy focused on feelings and relationships.

d. Judging (J) vs. Perceiving (P):
   - Judging types (J) tend to prefer structured and organized approaches to pain management. They may appreciate clear treatment plans, schedules, and specific goals.
   - Perceiving types (P) may be more flexible and adaptable in their pain management strategies, willing to try different methods and adjust their approach as needed.

It's important to note that MBTI is a broad personality assessment tool, and personality traits and preferences are complex and multifaceted. People are not limited to the characteristics of their MBTI type, and individual experiences and responses to pain are influenced by various factors beyond personality.

## 5. Multimodal AI-Driven Personality Assessment

AI can analyse vast amounts of data, including patient records, psychological assessments,

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and even social media profiles, to create a comprehensive personality profile. This profile can encompass traits which can provide insights into how a patient may respond to pain and pain management interventions. Multimodal AI-driven personality assessment is an advanced approach that combines data and information from multiple sources and modalities to gain a more comprehensive understanding of an individual's personality traits, preferences, and behaviour. These modalities can include text, speech, facial expressions, physiological signals, and more. This holistic approach allows for a richer and more accurate characterization of personality. Here's an overview of multimodal AI-driven personality assessment as shown in fig.4.

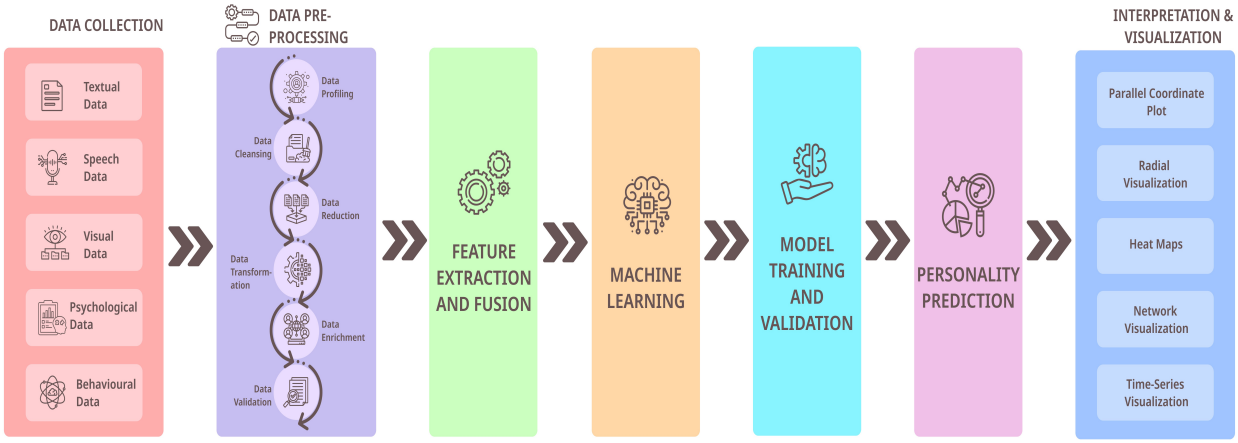


**Fig.4.** Systematic Diagram for Multimodal AI-Driven Personality Assessment

The following sub-sections discuss the details of the model.

5.1. Data Collection from Multiple Modalities

Multimodal assessment begins by gathering data from diverse sources and modalities [27]. These sources encompass textual data, including social media posts, emails, and chat transcripts, which offer insights into written communication. Speech data, such as voice recordings, phone calls, and interviews, provide valuable auditory information. Visual data sources, such as facial expressions, body language, and eye movements, offer a visual perspective on behaviour. Physiological data, including heart rate, skin conductance, and brain activity, provide insights into the body's responses [28, 29]. Finally, behavioural data, encompassing online browsing habits, social interactions, and response times, offer a window into actions and interactions within digital environments. Further, mobile apps such as MyPain®[1] can serve as the interface through which patients input their data. The app can create a secure user registration system, prioritize data input forms for patients to share personality traits, pain history, and preferences, and implement robust data validation checks to ensure accurate and complete user-submitted data. This comprehensive approach allows for a holistic understanding of an individual's behaviour and personality traits.

5.2. Preprocessing for Each Modality

In the preprocessing phase for each data modality, specific steps are taken to address the unique characteristics of the data type. For instance, text data typically undergoes natural language processing (NLP) techniques such as sentiment analysis, topic modelling, and linguistic feature extraction to extract meaningful insights from written content. Speech data is processed to recognize emotions, analyse pitch variations, and assess voice quality, enabling the extraction of emotional cues from spoken interactions. Visual data, on the other hand, is subjected to

[1] https://www.mypain.uk/

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analyses that include facial expression recognition and the interpretation of body language, providing valuable information about non-verbal communication. Finally, physiological data is carefully filtered and synchronized to facilitate time-series analysis, allowing for a deeper understanding of physiological responses over time. These preprocessing steps are crucial in preparing the diverse data modalities for subsequent analysis and interpretation within the multimodal personality assessment framework.

### 5.3. Feature Extraction and Fusion

In the process of feature extraction and fusion, the goal is to capture pertinent information about an individual's behaviour and personality from each data modality. This involves isolating and quantifying distinctive aspects of the data that can reveal insights about the person. Subsequently, features from various modalities can be integrated or fused together to form a comprehensive multimodal feature vector. This amalgamation of features from different sources creates a holistic representation of the individual, allowing for a more nuanced understanding of their behaviour and personality traits. The techniques employed for feature fusion can vary, including methods such as concatenation, stacking, or more advanced fusion strategies, selected based on the specific application and characteristics of the data under analysis. This stage plays a pivotal role in synthesizing information from diverse sources to create a more comprehensive profile of the individual's personality and behaviour.

### 5.4. Machine Learning Models

In the context of multimodal personality assessment, machine learning models [30] come into play to harness the richness of the collected data. These models are trained using multimodal data to make predictions related to personality traits or behavioural characteristics of individuals. The selection of these models can vary, encompassing both traditional machine learning algorithms and more advanced deep learning architectures, specifically designed to handle the complexity of multimodal data. These models rely on labelled datasets where personality traits are either known through observation or self-reported by individuals. Through this training process, machine learning models become proficient at recognizing patterns and relationships within the data, enabling them to provide valuable insights into the personality traits and behavioural tendencies of the individuals under examination.

### 5.5. Model Training and Validation

Model training and validation are pivotal stages in the development of machine learning models for multimodal personality assessment [31]. During training, these models are exposed to the labelled datasets, where known personality traits and behavioural characteristics serve as the ground truth. The models learn to recognize patterns and relationships within the multimodal data, enabling them to make predictions based on new, unseen data. Validation is a critical step to ensure the reliability and accuracy of the trained models. In this phase, appropriate evaluation metrics tailored to the complexities of multimodal data are employed. These metrics gauge how well the models perform in predicting personality traits from the combined data sources. Given the multifaceted nature of multimodal data, specialized evaluation metrics account for the nuances and interactions between different modalities. One advanced technique often utilized in this context is cross-modal validation. Here, the models are tested not only on the same type of data that they were trained on but also on different modalities. This cross-modal evaluation helps verify that the models can generalize their predictions across various data sources, making them more robust and versatile. The overall objective of model training and validation is to ensure that the machine learning models can accurately and consistently predict personality traits based on the amalgamation of data from different modalities. This process is integral to producing reliable insights into individuals' behaviour and personality, enhancing the overall effectiveness of multimodal personality assessment systems.

### 5.6. Personality Trait Prediction

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Upon successful training and validation, the multimodal AI model is primed to perform one of its core functions: predicting personality traits based on fresh multimodal input data. This predictive capability represents a critical step in the application of multimodal personality assessment. When confronted with new input data, the model applies its learned knowledge and intricate understanding of the relationships within the data to make predictions regarding the individual's personality traits. These predictions can be presented in various forms, typically tailored to the requirements of the specific personality assessment framework being employed. In some instances, the predictions are furnished as numerical scores, quantifying the likelihood or intensity of particular personality traits. These scores offer a nuanced view of an individual's personality profile, highlighting the degrees to which specific traits are present. Such numerical scores can be valuable for researchers and practitioners seeking detailed insights into personality dynamics. Alternatively, the predictions can be expressed as categorical labels, assigning individuals to distinct personality types or categories. This approach is particularly beneficial when personality assessments follow categorical frameworks, such as the Myers-Briggs Type Indicator (MBTI), which classifies individuals into one of several personality types based on their traits. Ultimately, the multimodal AI model's ability to predict personality traits from diverse data sources provides a powerful tool for understanding and characterizing individuals' behaviour and personalities. These predictions contribute to personalized recommendations and interventions, enhancing the utility of personality assessment in various domains, including healthcare, education, and human resources.

### 5.7. Interpretation and Visualization

Interpretation and Visualization in multimodal personality assessment are crucial steps in making sense of the data and presenting it in a meaningful way. Interpretation involves the process of assigning significance and context to the personality traits that have been predicted. It aims to explain how these traits may influence an individual's behaviour, decisions, and interactions. For instance, if the assessment indicates that an individual scores high in extraversion, the interpretation would delve into the implications of this, such as their tendency to be outgoing, sociable, and energized by social interactions. This contextualization helps stakeholders understand how personality traits manifest in real-world scenarios. Visualization techniques play a pivotal role in making the assessment results accessible and understandable. Personality trait radar charts are a common tool used for this purpose. In these charts, each personality trait is represented as a point on the radar chart, with the distance from the center indicating the intensity or score of that trait. This visual representation allows for quick and easy comparisons of an individual's personality traits, giving a clear overview of their personality profile. Heatmaps are another valuable visualization method. They provide a visual summary of the relationships and correlations between different personality traits. By examining patterns in these heatmaps, analysts and researchers can gain insights into how specific traits interact with and influence one another, offering a deeper understanding of an individual's personality dynamics. Interactive dashboards take the visualization a step further by providing a dynamic platform for exploring an individual's personality profile. Users can interact with the data, zooming in on specific traits, timeframes, or other aspects of the assessment. This interactivity allows for a more in-depth exploration and analysis of an individual's personality characteristics.

Overall, the interpretation and visualization of multimodal personality assessment results serve to bridge the gap between complex data and practical insights. They empower practitioners, researchers, and individuals themselves to make informed decisions, tailor interventions, and gain a clearer understanding of personality traits in various applications, including psychology, healthcare, and education.

### 5.8. Ethical Considerations

Ethical considerations in multimodal personality assessment are of utmost

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importance [32, 33], and they encompass several critical facets.

- *Informed Consent:* Obtaining informed consent from individuals whose data is being collected is a fundamental ethical principle. Participants must be fully informed about the purpose of data collection, how their data will be used, and any potential risks or consequences. They should have the autonomy to decide whether they want to participate or not, without any form of coercion.
- *Data Privacy:* Protecting the privacy of individuals is a central ethical concern. Personal data, especially sensitive data like physiological signals or facial expressions, should be handled with the utmost care. This includes secure storage, encryption, and strict access controls to prevent unauthorized use or breaches.
- *Anonymization:* Whenever possible, data should be anonymized to remove any personally identifiable information. This helps mitigate the risk of data being traced back to specific individuals. Anonymization techniques must be rigorously applied to protect participants' identities.
- *Transparency:* Transparency in the assessment process is crucial. Participants should be informed about the algorithms and methods used for personality assessment. They have a right to know how their data is being analysed and how the results will be used.
- *Data Retention:* Ethical considerations also extend to how long data is retained. Data should only be stored for as long as necessary for the intended purpose. Afterward, it should be securely deleted to minimize any potential risks associated with data breaches or misuse.
- *Bias and Fairness:* Researchers and practitioners must be vigilant about addressing bias in data collection and analysis. Bias can arise from various sources, including the data itself or the algorithms used. Efforts should be made to identify and mitigate bias to ensure fair and equitable assessments.
- *Beneficence and Non-Maleficence:* The ethical principles of beneficence (doing good) and non-maleficence (avoiding harm) should guide all actions in personality assessment. The assessment process should aim to benefit individuals while minimizing any potential harm or distress caused by data collection or interpretation.
- *Regulatory Compliance:* Adherence to relevant data protection and privacy regulations is essential. Researchers and organizations must comply with local and international laws governing data collection, storage, and processing.
- *Ethical Review:* In some cases, especially in research involving human subjects, an ethical review by an institutional review board (IRB) or ethics committee may be necessary. This external review ensures that the research aligns with ethical standards and safeguards the well-being and rights of participants.
- *Continuous Monitoring:* Ethical considerations are not a one-time affair. Continuous monitoring and auditing of data handling practices should be in place to ensure ongoing compliance with ethical principles.

In summary, ethical considerations in multimodal personality assessment are multifaceted and require careful planning and execution. They are essential to protect the rights, privacy, and well-being of individuals involved in the assessment process and to maintain trust in the field of personality assessment.

Based on the personality assessment, AI can recommend personalized pain management strategies. Here are some examples:

- *Cognitive-Behavioural Therapy (CBT)* [34]*:* For a patient with high neuroticism, AI may suggest CBT techniques that focus on managing anxiety and stress, which can exacerbate pain perception.

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- *Pharmacological Interventions* [35]*:* AI can recommend medication options, dosages, and schedules that align with a patient's personality traits. For instance, individuals with high extraversion may respond better to medications that offer rapid relief, while those with high conscientiousness may prefer a structured and organized medication regimen.
- *Lifestyle Modifications:* Patients with specific personality traits may benefit from lifestyle changes, such as mindfulness practices for individuals with high neuroticism or exercise routines for those with high extraversion.
- *Support and Education:* AI can provide personalized educational materials and support resources tailored to the patient's personality, helping them better understand and cope with their pain.

Multimodal AI-driven personality assessment represents a cutting-edge approach that leverages the power of AI and data fusion to gain a deeper understanding of human personality and behaviour across multiple dimensions.

## 6. Building a Dataset for AI-Driven Personality Assessment in Pain Management

The objective of dataset creation is to gather data to assess personality traits and their relevance to pain management. Primarily, the sources of data used in creating the dataset, such as patient records, medical interviews, and psychological assessments should be finalized. Simultaneously considering anonymization for privacy and ethical considerations. A variety of data variables which can be collected include (but not limited to): demographic information (age, gender), medical history and conditions, pain intensity and duration, psychological assessments (e.g., Big Five personality traits), treatment plans and interventions as depicted pictorially in fig.5.

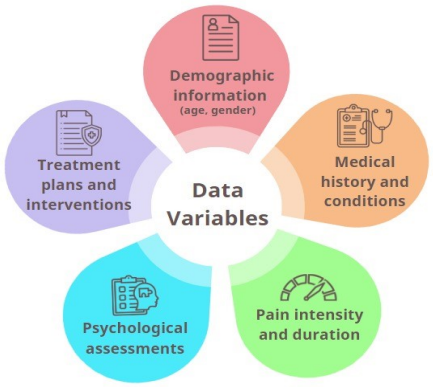


**Fig.5.** Dataset Variables

Fig.6 depicts an illustrative patient profile that serves as a foundational basis for crafting a personalized pain management plan, tailored to Patient X's unique personality traits and needs. Such a plan would aim to alleviate her chronic migraine pain, enhance her overall well-being, and improve her quality of life.

**Name:** Patient X
**Age:** 35
**Gender:** Female
**Medical Condition:** Chronic migraine
**Pain Intensity:** 7/10
**Psychological Assessment (Illustrative):**

- High neuroticism
- Moderate extraversion
- High conscientiousness
- Low agreeableness
- Moderate openness to experience
- High resilience

**Background:**

**Fig.6.** Illustrative Patient Profile

## 7. Illustrative case studies for the application of AI-driven personality insights in the context of personalized pain management.

In this section of the paper, we present two detailed case studies referring to the subjects Maria and Anthony, illustrating the practical implementation of AI-driven personality insights in the context of personalized pain management. (Note: Names and identifying details have been altered to safeguard privacy and confidentiality). These case studies follow a structured format, encompassing the following key elements:

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- **Patient Introduction:** Each case study commences with an introduction to the patient, offering essential demographic information such as age, gender, and their underlying medical condition. In Maria's case, her chronic lower back pain due to a herniated disc is highlighted, while Anthony's story revolves around his battle with fibromyalgia, a chronic pain disorder.
- **AI-Driven Personality Assessment:** The section provides a comprehensive overview of the AI-driven personality assessment process employed for each patient. This involves a thorough analysis of diverse data sources, including textual data extracted from medical records, information garnered from interviews and questionnaires, and multimodal data encompassing voice recordings from therapy sessions and facial expressions captured during consultations.
- **Personality Insights:** For both case studies, we delve into the personality traits identified through the AI-driven assessment. These traits encompass neuroticism, extraversion, conscientiousness, agreeableness, openness to experience, and resilience. The interpretation of these traits within the context of each individual patient offers profound insights into their emotional dispositions, social inclinations, and potential coping mechanisms.
- **Personalized Pain Management Plan:** The heart of each case study revolves around the development of a personalized pain management plan. The section delineates how specific aspects of the patient's personality traits are harnessed to inform and tailor the treatment approach. For instance, Maria's elevated neuroticism prompts the inclusion of anxiety reduction strategies, while Anthony's pronounced extraversion emphasizes the importance of social engagement in his plan.
- **Progress and Outcome:** Each case study concludes by summarizing the progress and outcomes achieved through the personalized pain management plans. This critical component underscores the practical benefits of integrating individual personality attributes into pain management strategies. Both Maria and Anthony demonstrate noteworthy improvements in pain management, coupled with enhanced emotional well-being, exemplifying the tangible advantages of this tailored approach.

### 7.1. Case Study One

We present an example case study demonstrating personalized pain management using AI and personality insights.

***"Meet Maria: A 32-year-old battling chronic lower back pain with the power of personalized pain management and AI-driven personality insights"***

**Patient's Name:** Maria
**Age:** 30
**Gender:** Female
**Medical Condition:** Chronic lower back pain due to a herniated disc
**Personality Traits:** High neuroticism, moderate extraversion, high conscientiousness, moderate agreeableness, moderate openness to experience, high resilience
**Background:**
Maria has been suffering from chronic lower back pain for several years. She has tried various treatments and therapies, but her pain persists, affecting her daily life and emotional well-being. Maria's healthcare provider decides to implement a personalized pain management plan based on AI-driven personality insights.
**AI-Driven Personality Assessment:**
Using AI, Maria's healthcare provider conducts a comprehensive personality assessment by analysing various data modalities, including text data from her medical records, interviews, and questionnaires, as well as speech data from her therapy sessions and facial expressions captured during consultations.
**Personality Insights:** Based on the AI-driven personality assessment, the following personality traits are identified:

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- High Neuroticism: Maria tends to experience heightened anxiety and negative emotions, which may contribute to her perception of pain.
- Moderate Extraversion: She is moderately outgoing and open to social interactions, which could be leveraged for social support.
- High Conscientiousness: Maria is highly organized and diligent, indicating a strong potential for adherence to a structured pain management plan.
- Moderate Agreeableness: She is moderately cooperative and compassionate, but may downplay her pain to avoid inconveniencing others.
- Moderate Openness to Experience: Maria is open to trying new experiences and therapies beyond conventional medicine.
- High Resilience: Her ability to bounce back from adversity suggests a potential for effective coping strategies.

**Personalized Pain Management Plan:**

- Neuroticism and Anxiety Reduction: Knowing that Maria has high neuroticism, her pain management plan includes regular sessions with a pain psychologist trained in cognitive-behavioural therapy (CBT). CBT techniques are tailored to address her anxiety and emotional distress related to pain.
- Extraversion and Social Support: Maria 's moderate extraversion is leveraged by introducing her to a support group for individuals with chronic pain. Group therapy sessions provide a platform for her to share her experiences and receive emotional support from peers.
- Conscientiousness and Structured Plan: Given her high conscientiousness, the pain management plan emphasizes a structured approach. Maria receives a detailed schedule for physical therapy sessions, medication reminders, and journaling exercises to track her pain experiences.
- Agreeableness and Communication: To encourage open communication, Maria's healthcare provider emphasizes that her pain is a legitimate concern. Maria is encouraged to report her pain accurately, enabling the provider to make necessary adjustments to her treatment plan.
- Openness to Experience and Complementary Therapies: Maria's willingness to explore new experiences aligns with her interest in alternative pain management approaches. Her plan includes options like acupuncture and mindfulness meditation in addition to traditional treatments.
- Resilience and Coping Skills: Maria's high resilience suggests her potential for developing effective coping skills. She is introduced to a pain coping skills workshop to help her reframe her pain experiences positively.

**Progress and Outcome:**

Over the course of several months, Maria's personalized pain management plan yields positive results. Her pain becomes more manageable, and her emotional distress significantly decreases. She actively engages in group therapy, adheres to her treatment plan, and explores complementary therapies with an open mind. Maria's improved pain management enhances her overall quality of life, allowing her to regain some of the activities she once enjoyed.

7.2. Case Study two

Let’s look at another example case study demonstrating personalized pain management using AI and personality insights.

***“Charting a New Course for Pain Relief: Anthony's Story of Fibromyalgia and AI-Powered Personalized Care."***

**Patient's Name:** Anthony
**Age:** 42
**Gender:** Male
**Medical Condition:** Fibromyalgia, a chronic pain disorder

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**Personality Traits:** Low neuroticism, high extraversion, moderate conscientiousness, high agreeableness, moderate openness to experience, low resilience

**Background:**

Anthony has been living with fibromyalgia for several years, causing widespread pain, fatigue, and emotional distress. Traditional pain management approaches have had limited success in improving his quality of life. Anthony's healthcare provider decides to employ AI-driven personality insights to create a personalized pain management plan.

**AI-Driven Personality Assessment:**

Anthony's healthcare provider conducts an AI-driven personality assessment by analysing a variety of data sources, including text data from medical records, voice data from therapy sessions, and behavioural data from patient interactions.

**Personality Insights:** Based on the AI-driven personality assessment, the following personality traits are identified:

- Low Neuroticism: Anthony experiences relatively low levels of anxiety and negative emotions.
- High Extraversion: He is highly sociable, outgoing, and optimistic, seeking social interactions to boost his mood.
- Moderate Conscientiousness: Anthony displays moderate levels of organization and responsibility, showing potential for adherence to a structured pain management plan.
- High Agreeableness: He is highly cooperative, compassionate, and empathetic, which may impact how he communicates pain.
- Moderate Openness to Experience: Anthony is open to trying new experiences and therapies beyond traditional medical approaches.
- Low Resilience: His low resilience indicates that he may struggle with adapting to the emotional and psychological aspects of chronic pain.

**Personalized Pain Management Plan:**

- Low Neuroticism and Emotion Regulation: Given Anthony's low neuroticism, his pain management plan includes mindfulness-based stress reduction techniques and relaxation exercises to help him manage occasional pain-related anxiety.
- High Extraversion and Social Engagement: His high extraversion suggests a preference for social interactions. Anthony is encouraged to participate in group therapy sessions where he can share experiences with others living with fibromyalgia.
- Moderate Conscientiousness and Structured Routine: Anthony receives a structured daily routine, including exercise, medication schedules, and dietary recommendations. This approach aligns with his moderate conscientiousness.
- High Agreeableness and Communication: Healthcare providers emphasize open and honest communication, as Anthony may tend to underreport his pain due to his high agreeableness. He's assured that his well-being is a priority.
- Moderate Openness to Experience and Holistic Therapies: Anthony's willingness to explore new experiences is utilized by introducing complementary therapies like acupuncture, dietary supplements, and guided imagery alongside conventional treatments.
- Low Resilience and Coping Skills: Recognizing his low resilience, Anthony is referred to a cognitive-behavioural therapy (CBT) program designed to help him build coping skills and resilience in the face of chronic pain.

**Progress and Outcome:**

Over time, Anthony's personalized pain management plan yields positive results. He engages actively in group therapy, follows his structured routine, and embraces complementary therapies. While he may still experience pain, his improved coping skills and social support network help alleviate emotional distress, resulting in an overall enhanced quality of life.

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These case studies exemplify the application of AI-driven personality insights in tailoring a pain management plan for an individual. By understanding Maria's or Anthony's unique personality traits, healthcare providers will be able to offer a more personalized and effective approach to her chronic lower back pain and fibromyalgia respectively, ultimately leading to improved well-being and pain relief.

## 8. Potential Research Impact

The research on personalized pain management using AI-driven personality insights has the potential to significantly benefit a broad spectrum of stakeholders in the healthcare ecosystem. Patients grappling with chronic pain conditions stand to gain by receiving tailored treatment plans that align with their unique personality traits, leading to improved pain relief, enhanced overall well-being, and reduced emotional distress. Healthcare providers can offer more effective, patient-centered care, resulting in higher patient satisfaction and better outcomes. Health institutions and insurance companies may see reduced healthcare costs due to fewer hospitalizations and unnecessary medical procedures. Researchers and academia can explore new dimensions in healthcare by integrating personality psychology with treatment strategies. Ethical committees and regulatory bodies can use the research to inform ethical guidelines for AI applications in healthcare, while health tech and AI developers can leverage it to create innovative tools. Ultimately, personalized pain management benefits not only individuals with chronic pain but also healthcare providers, institutions, insurers, researchers, and the broader healthcare community.

The research outlined in the paper, which focuses on personalized pain management through AI-driven personality insights, holds substantial potential for substantial impact across various domains.

- *Improved Patient Outcomes:* One of the primary impacts is the potential to improve patient outcomes. By tailoring pain management plans to individuals' unique personality traits, healthcare providers can enhance the effectiveness of treatment, reduce pain intensity, and improve overall well-being. This can lead to better quality of life for individuals suffering from chronic pain conditions.
- *Enhanced Patient-Centered Care:* Personalized pain management recognizes patients as active participants in their care. It fosters a patient-centered approach where treatment plans are customized to align with patients' needs, preferences, and personality traits. This approach can lead to higher patient satisfaction and engagement in their healthcare.
- *Reduced Healthcare Costs:* Effective pain management can potentially reduce healthcare costs associated with chronic pain conditions. By tailoring treatments to individuals, unnecessary interventions can be avoided, and patients may experience fewer hospitalizations or emergency room visits.
- *Advancements in AI and Healthcare Integration:* The research demonstrates the practical application of AI in healthcare, showcasing how AI-driven personality assessments can inform treatment plans. This could stimulate further advancements in AI technologies for healthcare, improving diagnostics, treatment recommendations, and patient monitoring.
- *Ethical Considerations:* The research emphasizes ethical considerations in data collection and analysis. It highlights the importance of data privacy, informed consent, and transparency in using personal data for healthcare purposes. This can contribute to the development of ethical guidelines for AI applications in healthcare.
- *Research in Pain Management:* The paper contributes to the evolving field of pain management by integrating personality psychology with treatment strategies. This interdisciplinary approach can inspire further research into the relationship between

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personality traits and pain perception, paving the way for more effective pain management techniques.

- *Patient Education:* The research emphasizes the importance of patient education and support. Patients gain a better understanding of their pain and how it relates to their personality traits. This knowledge empowers them to take a more active role in managing their pain and making informed decisions about their treatment.
- *Holistic Approach to Pain Management:* The research promotes a holistic approach to pain management, considering not only physical symptoms but also psychological and social aspects of pain. This broader perspective can influence how healthcare providers approach pain management in various contexts.
- *Improved Quality of Life:* Ultimately, the impact of personalized pain management is reflected in the improved quality of life for individuals living with chronic pain conditions. By reducing pain and enhancing overall well-being, patients can lead more fulfilling lives, engage in daily activities, and participate in social and recreational activities they may have previously avoided.

It's important to note that while the research demonstrates significant potential, further studies and real-world implementation are needed to validate its effectiveness across a broader range of chronic pain conditions and patient populations. Additionally, ongoing research and advancements in AI and healthcare technologies will continue to shape the impact of personalized pain management in the coming years.

## 9. Conclusion

In conclusion, this paper introduces a groundbreaking and forward-thinking theoretical framework that merges the power of artificial intelligence (AI) with insights from personality psychology to revolutionize personalized chronic pain management. It delves deep into the intricate relationship between personality traits and how individuals perceive, express, and manage pain, uncovering significant correlations that shape the pain experience. This innovative approach, which combines established personality theories like the Big Five and the Myers-Briggs Type Indicator (MBTI) with cutting-edge multimodal AI-driven personality assessment, promises to usher in a new era of tailored pain management. Furthermore, the paper underscores the ethical considerations and the importance of meticulous data collection processes when implementing such AI-driven solutions in clinical practice. By presenting real-world case studies, it vividly illustrates how this framework can lead to more effective, patient-centered pain relief, ultimately enhancing overall well-being.

In essence, this paper advocates for the establishment of an "AI-Powered Holistic Pain Management Initiative." Such an initiative has the potential to transform the landscape of chronic pain management by offering data-driven, personalized solutions. Its ripple effects extend beyond individual patient care, encompassing broader impacts on clinical practice, patient outcomes, healthcare policy, and our collective understanding of personalized medicine and AI-driven interventions. This holistic approach holds the promise of improving the lives of countless individuals living with chronic pain, marking a significant step forward in the quest for more effective and compassionate healthcare.

Despite the promising potential of the theoretical framework introduced in this paper for personalized chronic pain management, it's essential to acknowledge and address several limitations in its implementation. First and foremost, concerns related to data privacy and security loom large, given the sensitive nature of the patient data involved. Safeguards and ethical protocols must be rigorously upheld to protect individuals' information from misuse or breaches. Additionally, the success of AI-driven personality assessments relies heavily on the availability and quality of data, which can vary significantly in practice. The generalizability of findings is another critical consideration, as cultural, socioeconomic, and individual differences can influence how

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personality traits interact with pain experiences. Chronic pain itself is a complex phenomenon influenced by numerous factors beyond personality, and oversimplifying this intricate relationship can lead to incomplete assessments. Furthermore, the current capabilities of AI in understanding human personality pose potential accuracy and bias challenges that require ongoing development and refinement. Ethical guidelines, clear consent procedures, and considerations of autonomy must be established to ensure responsible AI use in healthcare. Lastly, the long-term effectiveness, sustainability, and patient acceptance of AI-driven interventions must be rigorously studied and validated to realize the full potential of this framework in improving personalized pain management.

***Compliance with Ethical Standards***

***Disclosure of potential conflicts of interest:*** Authors declare that they have no conflict of interest.

***Research involving human participants and/or animals:*** This article does not contain any studies with
human participants or animals performed by any of the authors. The presented case studies are purely illustrative and do not involve any such subjects.

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RESEARCH PAPER

# Geophysical electrical survey for aquifer detection, and carbon footprinting for groundwater abstraction in India

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**Abstract**
Groundwater in India is a critical resource, particularly in semi-arid regions of the country like Rajasthan. The deteriorated quality of surface water has led to the over-exploitation of groundwater, resulting in the drying up of shallow wells and deepening of groundwater levels. The increasing demand for water and drilling cost for boreholes have generated a prior need for exploration, monitoring, and assessment of groundwater aquifers in water-scarce agriculture-intensive areas. Identifying suitable aquifers is important; however, the emissions associated with the extraction of water from these aquifers should not be overlooked as fuel-aided extraction is a significant source of carbon emissions. A geophysical investigation based on electrical resistivity imaging using the dipole–dipole configuration was conducted in the agricultural belt of Alwar district, Rajasthan to detect aquifer depth and its hydrogeological characteristics. Resistivity survey data indicate the presence of a shallow alluvial aquifer at a depth of 9 m. The resistivity of the aquifer ranges from 15 to 84 Ωm, indicating that the soil is saturated with water in its weathered layer with a thin clay layer surrounding the saturated water zones. The groundwater and surface water represent high chemical variability which depicts that groundwater has deep meteoric percolation and subsurface geology has played a key role in regulating the water quality. Further, it was observed that electric and diesel pumps contribute significantly to carbon footprint with the values ranging from 249 to 1476 kgC/ha-yr and 60 to 266 kgC/ha-yr, respectively. Solar pumps can be a sustainable option to meet the target toward decarbonization with no emissions involved. The study concludes that solar pumping of groundwater is an important intervention for decarbonisation in agriculture sector along with judicious management interventions, improved methods of irrigation, and sustainable use of groundwater to ensure water availability and environmental quality in the region.

**Keywords** Soil resistivity · Groundwater aquifer · Geochemistry · Carbon dioxide emissions · Aravali hills

## 1 Introduction

### 1.1 Water scenario

Surface water that infiltrates the earth's surface and seeps deep into the ground forms the groundwater resource. Groundwater may also resurface to replenish the surface water, interacting and feeding onto each other to maintain hydrological balance. Since the last few decades, water resources have been under immense pressure due to population boom, agriculture, and industrialization (Ambastha and Haritash 2022; Verma et al. 2020). These factors significantly affect economic growth, ecological stability, and food production. Out of the available water resources in India, groundwater is the major source for domestic use and irrigation (Narayanamoorthy 2022). It has emerged as a prominent source in recent years on account of its universal availability, lower pollution potential, and low capital cost for treatment (International Association of Hydrogeologists 2020). However, the increasing dependence on groundwater has resulted in extensive and unplanned extraction in various parts of the country without cautious consideration of the recharging capacities of aquifers (Goyal et al. 2021). The agriculture sector in India is the largest consumer of water with irrigation accounting for 85% of the total water consumption. Groundwater overuse has aggravated since the onset of the green revolution due to the

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adoption of intensive irrigation activities and input technologies. The net irrigated area in the country has expanded from 31 to 68 million ha from 1970 to 2021 out of which nearly 80% is facilitated through groundwater (MAFW 2021).

### 1.2 Water extraction and environmental impacts

Water extraction from deep aquifers through electric or diesel pumps is associated with additional environmental deterioration in the form of carbon dioxide emissions which significantly contributes to global warming (Ranjan et al. 2020; Mishra et al. 2018; Zou et al. 2015). Policy instruments like higher support prices on water-intensive crops such as cotton and paddy, free power supply for agriculture, and subsidies on pumps have increased the extraction of water for irrigation (Chaudhuri et al. 2021). Modern agriculture tools and practices contribute nearly 13.5% of the total global anthropogenic GHG emissions (IPCC 2019). The carbon footprint of groundwater-based irrigation has escalated in the past decades due to lower pump efficiency and a decline in groundwater depth (Hoff et al. 2010; Benbi 2018). Apart from significantly contributing to climate change, conventional farm activities like the use of chemical fertilizers and pesticides lead to nutrient losses to the environment and affect the geochemical characteristics of water (Kaushik et al. 2010).

### 1.3 Groundwater chemistry

The groundwater chemistry is governed by factors such as the aquifer material and the contact time with the rock sediments and minerals during the recharge profile (Abdalla and Al-Abri 2014; Kura et al. 2018; Haritash et al. 2017). Carbonate and siliceous rock weathering is also a major phenomenon controlling the groundwater chemistry which can be confirmed by the presence of calcite and kaolinite in water (Chitrakshi and Haritash 2018). The calcite solubility in water is controlled by the availability of $CO_2$ which adds up from the soil and pH. The mechanism can be explained by the following reactions:

$$CO_2(g) + H_2O \leftrightharpoons H^+ + HCO_3^- \quad (1)$$

$$CaCO_3 + H^+ \leftrightharpoons Ca^{2+} + HCO_3^-. \quad (2)$$

Overall, the equations sum up as:

$$CaCO_3 + CO_2(g) + H_2O \leftrightharpoons Ca^{2+} + 2HCO_3^-. \quad (3)$$

The occurrence and flow of groundwater in an area is influenced by topography, drainage pattern, land use change, lithology, and the interrelationship between these factors (Samper et al. 2022). Hydrogeological and geophysical investigations are the best-suited approach to assess the groundwater potential of a particular area. Groundwater contains various dissolved salts which enable electric current to flow into the ground. Based on mineralogical composition and presence of water, the electrical signatures of materials vary and therefore, subsurface composition of a specific material can be determined through electrical resistivity signatures. The availability of groundwater in rocks and soil is summarized by Archie's Law:

$$q = ap_w\Phi^{-m} \quad (4)$$

where $q$ is the bulk resistivity, $p_w$ represents fluid resistivity, $\phi$ is the porosity, and $a$ and $m$ are empirical parameters as defined in Archie's law (Archie 1942). Hydrogeological and geophysical investigation techniques have been extensively used to investigate groundwater potential. Resistivity surveys have been used as a tool to study electrical characteristics and hydraulic properties of aquifers (Wahab et al. 2021; Anomohanran et al. 2023; Akinwumiju 2023), for qualitative assessment of water-bearing formations (Mehmood et al. 2020), to determine the depth and potential of the aquifer (Muchingami et al. 2012; Prasad 2011; Kumar and Kumari 2021), measure the electric flow in the medium to locate and map contaminants in the aquifer (Srinivasamoorthy et al. 2014) and to determine the saltwater–freshwater interface in coastal areas (Subasinghe & Jinadasa 2012). Electrical resistivity has evolved to be highly acceptable geophysical technique for groundwater detection due to its easy application at the field for varied range of depths, ease of data interpretation, and cost-effectiveness.

### 1.4 Significance of the study

Detection of small, localized aquifers can be a valuable source of water for irrigation and domestic use in small villages especially in the water-stressed, semi-arid regions of the country. Investigation of groundwater potential in terms of availability, distribution, and quality is crucial to bridge the gap between water demand and availability. However, the environmental impact of extracting groundwater from deep aquifers through fuel-aided pumps cannot be overlooked as the process is a significant source of $CO_2$ emissions. While the repercussions of groundwater overuse and the significance of groundwater resources in arid and semi-arid regions have been extensively documented, the necessity of prior identification, exploration, and continuous monitoring of groundwater potential remains largely overlooked. Furthermore, the effect of groundwater abstraction on $CO_2$ emissions has not been well documented, especially in India. The exploration of the interconnected relationship between water, agriculture, and climate is imperative for ensuring the sustainable management of our water resources. The

proposed study was designed to investigate the subsurface heterogeneity, presence of groundwater aquifer and identify the global warming potential associated with the pumping of water from the aquifer near Siliserh Lake, Alwar. As reported in previous studies by the same authors, the surface water and groundwater quality parameters vary significantly in the region. The subsurface heterogeneity of the medium was used as a scanning tool to check the composition, type of percolation, availability, and depth of the aquifer. The research also intends to investigate the water-bearing zone for future possible well drilling to extract groundwater. Further, given the depth of the aquifer, the environmental impact of groundwater extraction in terms of carbon dioxide emissions associated with water pumping have also been calculated and techniques have been suggested for sustainable water usage.

## 2 Materials and methodology

### 2.1 Study area

The Aravali hills are located in Northwestern India between 25.2235°N latitude and 73.7478°E longitude. It stretches in the southwest direction for approximately 670 km, beginning in Delhi and passing through southern Haryana and Rajasthan before ending in Gujarat. Since most of the stretch of these hills lies in Rajasthan, the present study was undertaken in Alwar, Rajasthan. The state represents arid region with an annual average rainfall of 583 mm (CGWB 2021). Over the past two decades, the area has experienced recurring droughts, leading to an average decline of 25–50 cm/year in the groundwater table from 2002 to 2011 (CGWB 2013). The aquifers in the area primarily originate from older alluvium and Quartzite. Weathered and fractured parts of the massive quartzite contribute to aquifer formation, whereas the sandy, gravelly, and other granular components of the alluvium contribute to aquifer composition (PHED 2013). Due to the massive loss of rainwater to evaporation, there are limited surface water resources making Siliserh Lake an important surface water source (Aggarwal et al. 2021). Agriculture holds the major proportion of the land use class, contributing more than 50% to the total geographical area. The region relies on groundwater extraction to supplement irrigation needs. 89% of the total irrigated area is facilitated through electric and diesel aided pumps. Subsidies on electricity for water pumping has led to excessive utilization of groundwater for irrigation, resulting in elevated extraction rates. These inefficient pumping practices have aggravated the problem of pollution and over-exploitation of groundwater (Rajan et al. 2020; Pandey et al. 2023). Given the water scarcity in this agrarian region, exploring groundwater aquifers and promoting their sustainable use can address the water demand for agriculture. The present study employed electrical resistivity tomography to detect the presence of aquifers and their location along the depth. The line transect is presented in Fig. 1. In addition, the study aimed at qualitative and quantitative estimation of water quality using electrical resistivity signatures and physico-chemical analysis, respectively. The carbon footprint associated with groundwater pumping has also been discussed.

### 2.2 Geophysical survey and analysis

IRIS software has been used for the data acquisition system in this survey, it consists of an internal switch box unit, two 120 m multiconductor cables, and an array of 48 steel electrodes over a length of 240 m. The field resistivity survey using the dipole–dipole configuration was performed in Doba village of Siliserh region. The configuration included a set of current input electrodes labeled A and B. The configuration was selected due to its higher resolution and multichannel capability. The apparent resistivity ($p\alpha$) value can be calculated with the equation between current ($I$) and voltage ($V$):

$$p\alpha = kV/I \tag{5}$$

$k$ is the geometry factor which depends on the configuration. For dipole–dipole configuration, $k$ can be calculated as

$$k = \pi n(n+1)(n+2)A - B \tag{6}$$

In Fig. 2 representing the dipole–dipole electrode configuration, $X_a$ is the abscissa of the first current electrode. $X_{P1}$ is the abscissa of the nearest potential electrode from the AB dipole. A–B is the length of dipoles and $n$ (A–B) is the spacing between the dipoles where $n$ represents the multiplying factor. In the experiment, each survey line utilized 24 electrodes, spaced 5 m apart, giving a depth of penetration in the soil sub surface to be approximately 53 m. Values of apparent resistivity were manually filtered during the survey. A current value of 1000 mA was passed through the cable and the apparent resistivity data were processed using RES2DINV. The RES2DINV software was used to read the field data, make topographic corrections and inversion of the data using least square inversion procedure to get the true resistivity and the true depth of the field resistivity image. The program is designed to invert large data sets (with about 200–100000 data points) collected with a system including large number of electrode positions along the survey line. The inversion routine used by the program is based on the smoothness-constrained least squares method (Loke et al. 2014). The advantage of this process lies in the ability to adjust roughness filter and damping factor in order to suit different data types. The data from the field survey using the RES2DINV software were projected in the form of a

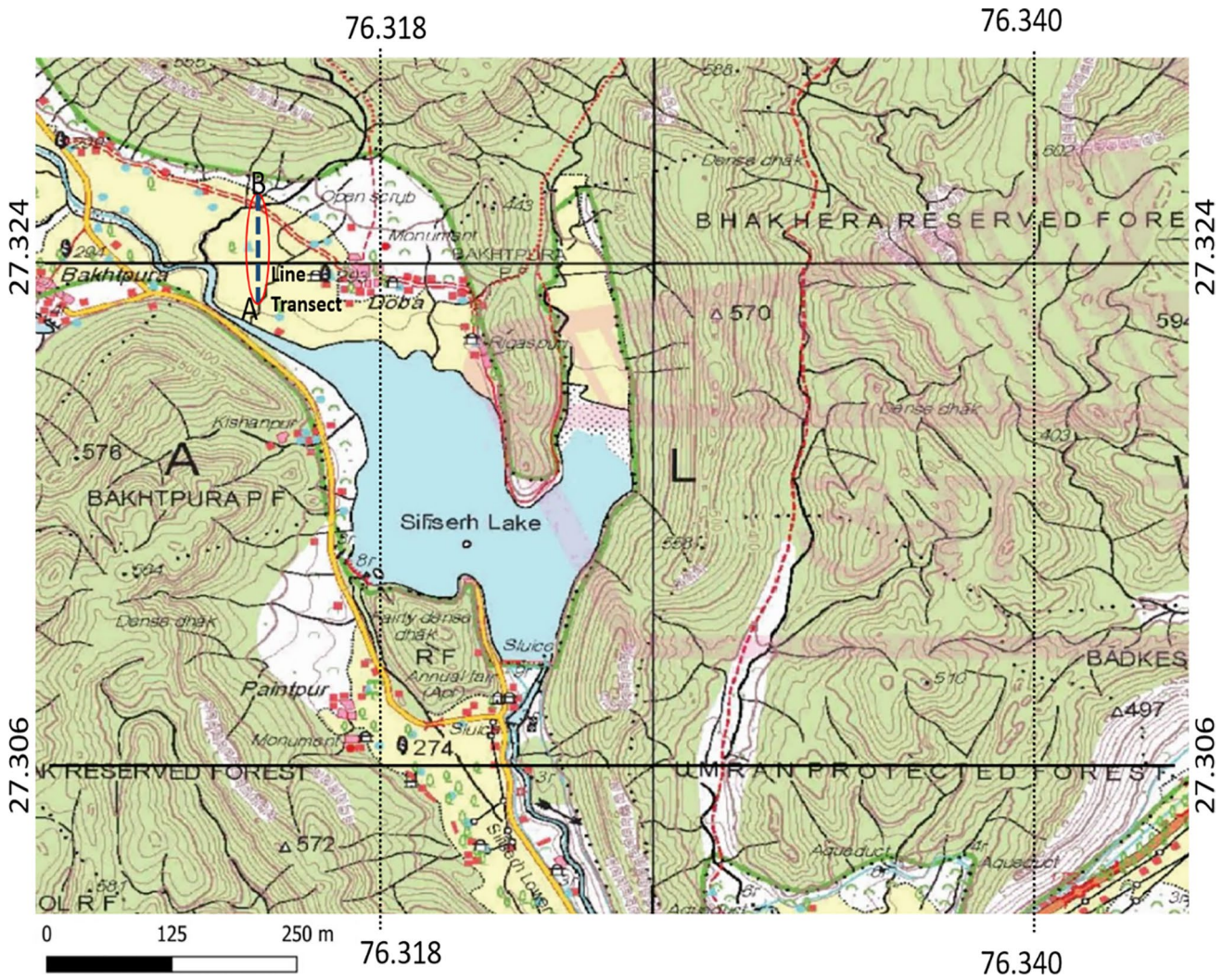


**Fig. 1** Location of Line Transect (A–B) for soil resistivity electrical survey along Siliserh Lake, Alwar

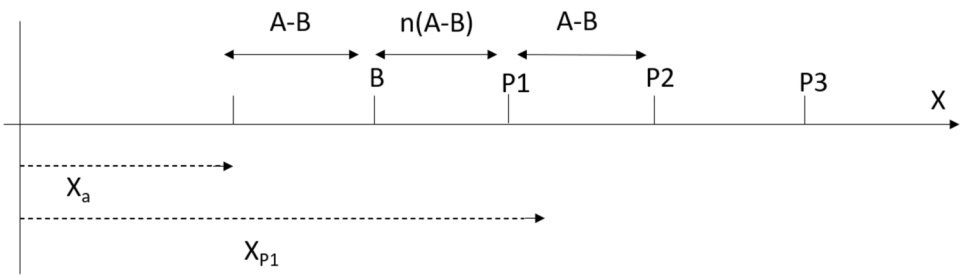


**Fig. 2** Dipole–Dipole electrode configuration

pseudosection, to present an approximate image of the subsurface resistivity distribution.

The samples of groundwater and surface water were chemically characterized as per the prescribed methods of the American Public Health Association (APHA 2005). The pH, electrical conductivity (EC), total dissolved salts (TDS) and temperature were measured onsite using 'Orion make Star A320 model multi-parameter meter' other water quality parameters were analyzed in triplicates using AR grade reagents and type 1 ultrapure water as per the standard methods. Total alkalinity, chloride ($Cl^-$), carbonate ($CO_3^{2-}$), bicarbonate ($HCO_3^-$), total hardness and silicate were determined by volumetric analysis; and $PO_4^{3-}$, $SO_4^{2-}$, $NO_3^-$ and Fe were analyzed using UV–Vis spectrophotometer (LabIndia make UV3092 model). Concentrations of $Na^+$, $K^+$, $Ca^{2+}$ and $Mg^{2+}$ were determined using Systronics

make 128 μC model Flame photometer. Soil samples from that region were subjected to the Fourier Transform Infrared/Spectroscopy (FTIR) to determine the dominant minerals of soil and its relation to groundwater quality. The results of this analysis have been discussed in previous literature by the same authors (Aggarwal et al. 2021; Chitrakshi and Haritash 2022) and have been compared with the electric resistivity signatures in this study.

### 2.3 Carbon dioxide emissions associated with groundwater extraction

Direct carbon emissions associated with groundwater pumping at different aquifer depths and fuel efficiency have been estimated in the study using the volume of water used for specific crops and the type of fuel used for extracting the groundwater. The volume of irrigation water pumped was computed from the irrigation water requirements of each crop as documented in the literature (FAO 1998; Choudhary et al. 2019) and the area under the crop in the region. The details on type and area under the crop was collected through field surveys. Agriculture in the region mainly accounts for wheat and barley (Rabi season), Bajra and jowar (Kharif season) and vegetable crops like Onion, Brinjal and Okra. The calculations were made for each crop and added up to estimate the total carbon footprint in a year.

### 2.4 Energy required to lift water

Theoretically, the energy required to lift given volume of water from a specific depth can be explained using the following equation:

$$W = mgh \tag{7}$$

Here, $i$ is the work done or energy required to lift water, $m$ is the mass of water and $h$ is the depth of the water table. Assuming 1000 $m^3$ ($10^6$ kg) of water lifted 1 m vertically, the energy consumption would be $9.8 \times 10^6$ J or 2.724 kWh. However, the energy use rate of 2.724 kWh does not take into account the friction and transmission losses. In practice, the efficiency of electric and diesel pumps ranges between 30–40% and 20–30%, respectively from the theoretical maximum. Therefore, the effective energy use in kWh for lifting 1000 $m^3$ of water vertically along the water depth can be calculated as:

$$E = 2.724 \times V \times d \times \theta \tag{8}$$

Here, $E$ is the effective energy use, $V$ is the volume of water required for a crop during entire life cycle, $\theta$ is the efficiency of pump and $d$ is the groundwater depth.

### 2.5 Carbon dioxide released using diesel and electric pumps

The amount $CO_2$ emitted depends on the type of fuel. The emission factor of diesel and electric pump was calculated using carbon content per liter of fuel and energy use value (Nelson et al. 2009). For diesel-operated pumps, the ratio of C emission to energy content equals to 0.0732 kgC/kWh and that of electricity equals 0.4063 kgC/kWh. The carbon footprint was calculated by multiplying effective energy usage (Eq. 8) with the emission factor.

## 3 Results and discussion

Based on the experiments on electrical resistivity and characterization of water, it was observed that significant spatial heterogeneity is present in subsurface lithology of Aravali hills and it significantly affects the quality of groundwater during soil–water interaction in the course of percolation.

### 3.1 Geophysical characteristics of study area

Field measurements were conducted using a dipole–dipole configuration to record resistance values up to a depth of 50 m. Figures 3 and 4 illustrate the subsurface resistivity distribution in the study area. The profile reveals resistivity values ranging from 15 to 165 Ωm, indicating predominantly sedimentary deposits with a prevalence of sand-gravel from 20 to 50 m below ground level. The non-uniformity in resistivity values suggests heterogeneous soil material. The topsoil exhibits a low resistivity value of 15–20 Ωm up to a depth of 2 m, indicating the presence of a water-saturated zone. Similar findings have been reported in previous studies (Ishak et al. 2022; Bala et al. 2022). Water-bearing zones are surrounded by an impermeable and conductive clay layer containing bound water, with a resistivity of 30–40 Ωm. This clay layer, being poorly permeable, acts as a barrier to surface water infiltration into the underlying aquifer.

The middle layer displays heterogeneity, consisting of patches of medium to coarse sand, gravel, and limestone, with resistivity ranging from 40 to 120 Ωm up to a depth of 45 m. The soil profile indicates the dominance of sedimentary rocks. Beyond 50 m, the resistivity value suggests the presence of an aquifer bordered by an impermeable clay layer. In the surficial features (0–20 m), silt and clay deposits with interspersed pockets of water-saturated zones are observed up to a stretch of about 150 m from the lake. As the distance from the lake increases, dry sandy soil patches dominate throughout the vertical block of 5–50 m, although the surface soil still reflects water-saturated conditions. The water-saturated plume descends vertically to a depth of 50 m through the almost homogeneous sand–gravel system

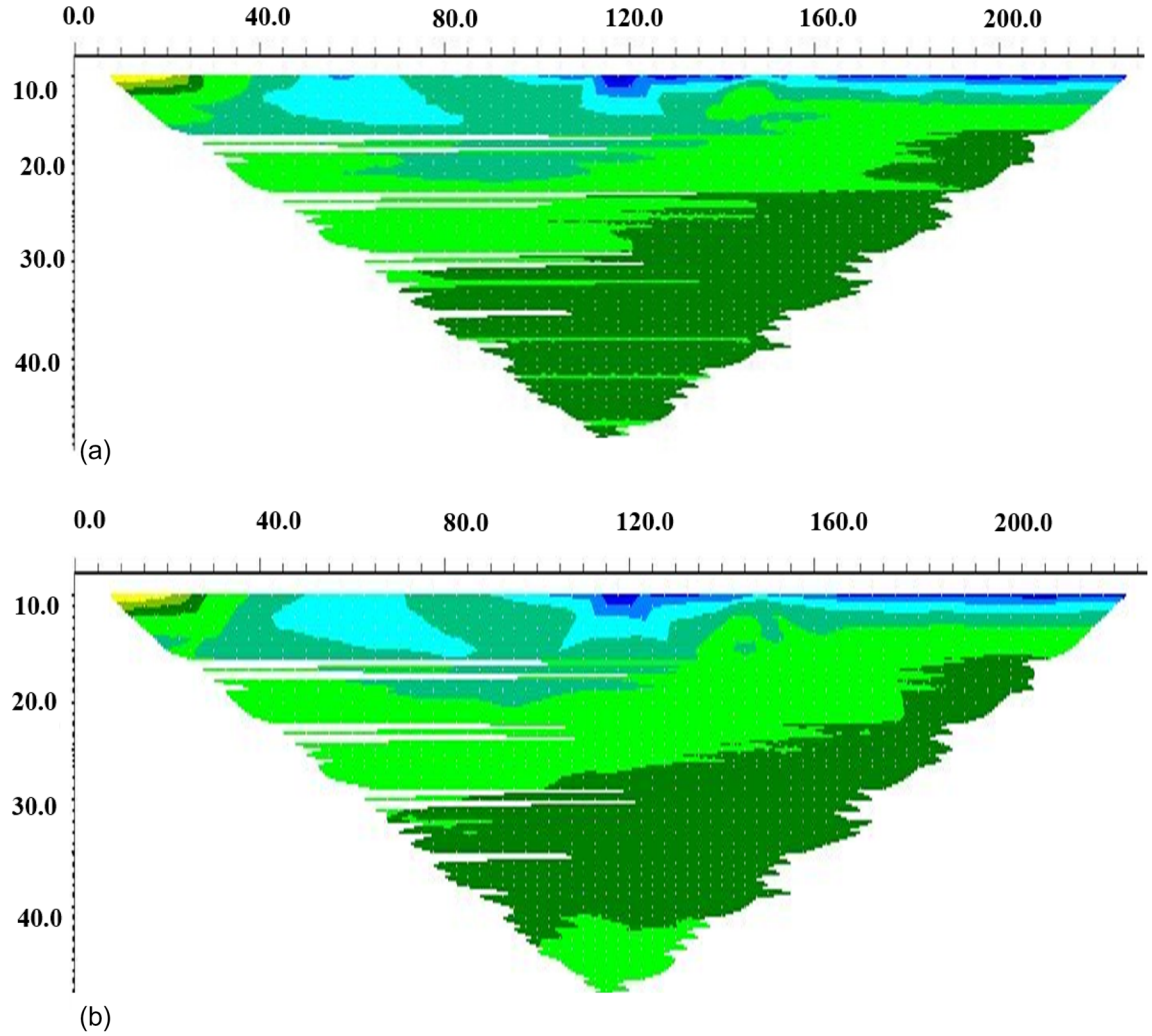


**Fig. 3** Resistivity model obtained from data acquired along Line Transect A–B. **a** Measured apparent resistivity pseudosection. **b** Calculated apparent resistivity pseudosection

within a 0–30 m horizontal stretch from the lake. The plume extends to an aquifer located approximately 50 m below the sand-gravel and dry sand block, spanning horizontally from 60 to 160 m and vertically from 20 to 40 m. Interspersed blocks of limestone are also observed at a few places near the surface.

### 3.2 Hydro-chemical assessment of groundwater and surface water

Apart from the geophysical electrical survey, the ground-truthing about water quality was done by collecting samples of groundwater from wells located in the vicinity of the line transect of the geophysical electrical resistivity survey performed in this study, as presented in previous literature by the same authors (Aggarwal et al. 2021; Chitrakshi and Haritash 2022). The electrical resistivity represented by water-saturated zones was of the order of 10–30 Ωm dominantly, based on which the water was classified as fresh in nature. The laboratory analysis of groundwater confirmed the electrical conductivity of the order of 1209 mS/cm, thus indicating that the water is slightly saline with respect to EC (Table 1). As per the classification of Wilcox (1948), water with EC ≥ 750 mS/cm is of marginal quality with respect to its use in irrigation. The physico-chemical characteristics classified the water as slightly saline and marginal in agreement with the results of electrical survey, as classified in other studies as well (Samsudin 2010). On the other hand, surface water in Siliserh Lake represented relatively better quality of fresh water with EC of the order of 224 mS/cm.

There was a significant difference in quality between surface and groundwater indicating that there are different geochemical processes which are regulating the water chemistry over the surface and subsurface, respectively. Significantly

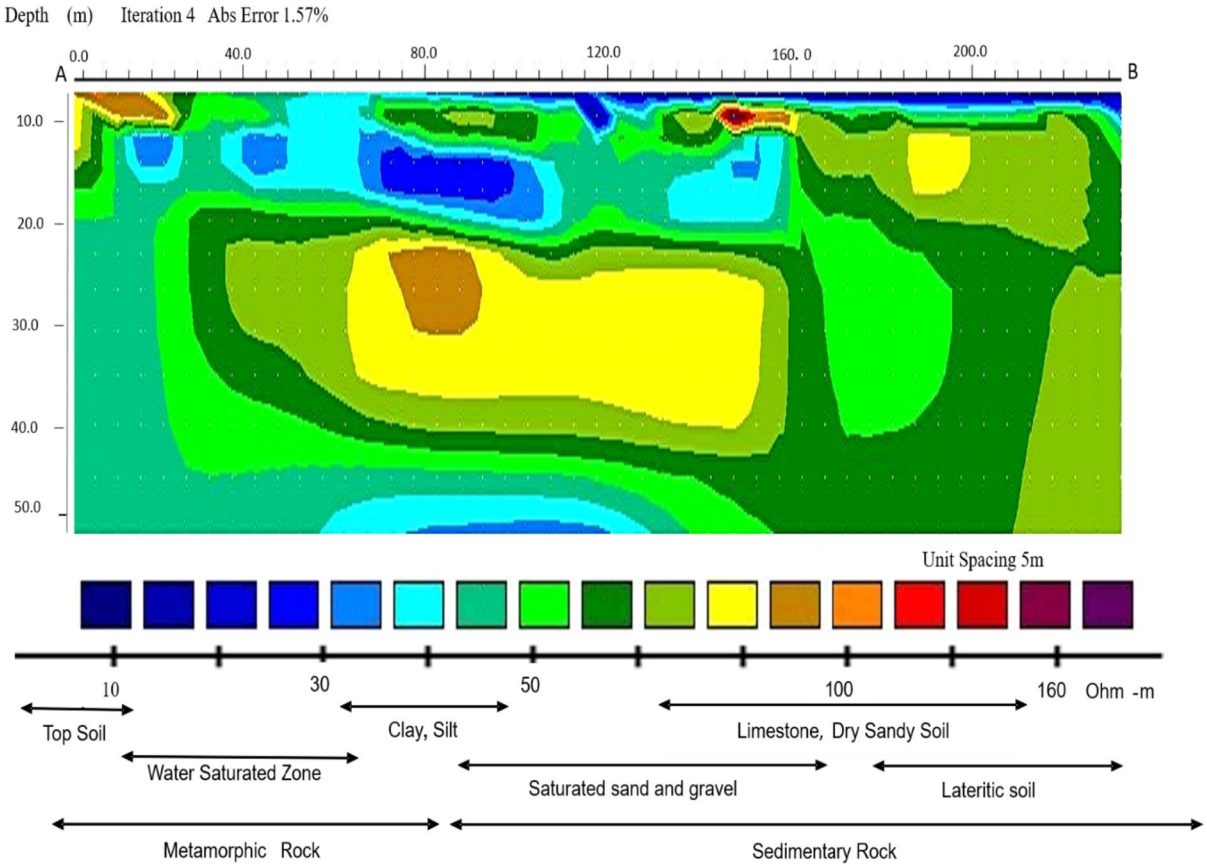


**Fig. 4** Inverse model resistivity section of line transect A–B

**Table 1** Physicochemical characteristics of groundwater and surface water in Siliserh region, Alwar, Rajasthan

| Parameter | Unit | Groundwater* Mean ± SD ($n$ = 23) | Surface water# Mean ± SD ($n$ = 16) |
|---|---|---|---|
| pH | – | 6.8 ± 3.2 | 8.4 ± 0.5 |
| EC | µS/cm | 1209 ± 835 | 224 ± 24.5 |
| TDS | mg/l | 586 ± 425.3 | 142 ± 12.9 |
| TH | mg/l | 390 ± 208 | 132 ± 39.5 |
| $Na^+$ | mg/l | 72 ± 86.5 | 5.42 ± 0.6 |
| $K^+$ | mg/l | 8.0 ± 15.01 | 5.22 ± 0.8 |
| $Ca^{2+}$ | mg/l | 47 ± 30.5 | 7.9 ± 1.1 |
| $Mg^{2+}$ | mg/l | 42 ± 38.4 | 13 ± 7.8 |
| $CO_3^{2-}$ | mg/l | 6.5 ± 11.81 | 6.0 ± 5.5 |
| $HCO_3^-$ | mg/l | 140 ± 57.1 | 40 ± 16.20 |
| $Cl^-$ | mg/l | 136 ± 178.57 | 19 ± 3.73 |
| $SO_4^{2-}$ | mg/l | 57 ± 59.01 | 6 ± 2.7 |
| $NO_3^-$ | mg/l | 33 ± 18.44 | 10.4 ± 5.2 |

*Aggarwal et al. (2021)

#Chitrakshi and Haritash (2022)

higher concentrations of $Na^+$, $Cl^-$, $SO_4^{2-}$, $Ca^{2+}$, and $Mg^{2+}$ in groundwater compared to surface water indicates that soil–water interaction in the subsurface is relatively longer resulting in the solubilization of ions from minerals present in the region. The FTIR analysis of soil collected from the study area confirmed the dominance of Gypsum ($CaSO_4 \cdot H_2O$) and dolomite in the rock minerals. Moreover, it may be inferred that deep percolation into the groundwater aquifer may also be a result of the recharge point for groundwater being placed away from the Siliserh lake.

The order of abundance of ions in groundwater and surface water is $Ca^{2+}$, $Mg^{2+}$, $K^+$, $Li^+$ with $Mg^{2+}$ being the major cation (Table 1). The presence of a high proportion of $Ca^{2+}$ and $Mg^{2+}$ relative to $Na^+$ and $K^+$ reflects the dissolution of pyroxene, calcite, gypsum and anhydrite (Chitrakshi and Haritash 2018). The high concentration of $Ca^{2+}$ might be attributed to the rock-water interaction containing mineral species such as calcite and anhydrite. The $K^+$ is fixed easily by clay minerals relative to $Ca^{2+}$, $Mg^{2+}$ and $Na^+$ due to which it has a lower concentration as compared to the other three cations (Armah 2010). The water quality parameters have been found to be in the permissible range as prescribed by WHO (2006) and BIS 10500 (2012).

**Table 2** $CO_2$ emissions at different aquifer depths and efficiency of electric pump

| Aquifer type | Aquifer depth (m) | Pump efficiency (%) | $CO_2$ emissions (kgC $ha^{-1}$ $yr^{-1}$) |
|---|---|---|---|
| Shallow | <9 m | 30 | 332.02 |
| Moderate | 9–30 m | 30 | 737.84 |
| Deep | 30–60 m | 30 | 1475.68 |
| Shallow | <9 m | 40 | 249.02 |
| Moderate | 9–30 m | 40 | 553.38 |
| Deep | 30–60 m | 40 | 1106.76 |

**Table 3** $CO_2$ emissions at different aquifer depths and efficiency of diesel pump

| Aquifer type | Aquifer depth (m) | Pump efficiency (%) | $CO_2$ emissions (kgC $ha^{-1}$ $yr^{-1}$) |
|---|---|---|---|
| Shallow | <9 m | 20 | 89.72 |
| Moderate | 9–30 m | 20 | 199.39 |
| Deep | 30–60 m | 20 | 398.79 |
| Shallow | <9 m | 30 | 59.81 |
| Moderate | 9–30 m | 30 | 132.93 |
| Deep | 30–60 m | 30 | 265.86 |

### 3.3 Carbon dioxide emissions associated with water pumping

Based on the area irrigated, groundwater draft, and aquifer depth, the carbon dioxide emissions from electric and diesel pumps were estimated at different pump efficiencies as mentioned in Tables 2 and 3, respectively. For the different types of aquifers, the annual carbon emissions range between 265.86 and 1475.68 kgC $ha^{-1}$ $yr^{-1}$ in case of deep aquifers, 132.93–737.84 kgC $ha^{-1}$ $yr^{-1}$ for moderately deep aquifers and 59.81–332.02 kgC $ha^{-1}$ $yr^{-1}$ for shallow aquifers.

It was estimated that doubling the aquifer depth at the same pump efficiency increases $CO_2$ emissions by 33%. Water extracted from aquifers confined within impermeable clay material consumes more electricity for pumping and consequently emits more carbon dioxide. About 80% of the agricultural area in the region is irrigated using electric pumps, therefore, the associated carbon emissions are greater by a factor of three than that of diesel pumps. It has been further found that carbon emissions are highly sensitive to pump efficiency. As estimated in the study, when pumping water from the same depths, as the pump efficiency drops by 10% (from 40 to 30%) the associated carbon dioxide emissions rise by 50% (Tables 2, 3).

It has been inferred that $CO_2$ emission from groundwater pumping can be cut down by improving the pumping efficiency and using alternate sources of energy like solar power to operate the pumps. With a significant drop in the price of PV pumps in the past decade and higher subsidies have improved the access to water to many farmers (Jain and Gupta 2021). The system can be highly feasible in agricultural belts of Rajasthan as the state receives highest annual global radiation of 6–7 kWh/$m^2$/day with about 325 sunny days per year (Himabindu et al. 2021). Replacing conventional pumps with solar power offsets $CO_2$ emissions by 95–97% in case of electric pumps and 97–98% as compared to diesel pumps (Hartung and Pluschke 2018). Installation of PV pumps significantly reduces the consumption of fossil fuels and also increases crop production due to better water use efficiency. However, recognizing and addressing water-related risks while using PV pumps is crucial to ensuring sustainable water use as increase in water productivity and zero operational cost may lead to wastage due to overabstraction of groundwater.

## 4 Conclusion

The groundwater aquifer is the main source of water resource in the Alwar region. Thus, deciphering the mechanisms that simultaneously regulate the groundwater demand and promote agroecology are of great practical importance. Based on the results of the present study, the groundwater table was found to be shallow (9–10 m) in the foothills of Aravali in Rajasthan but spatial variations may be present. Since, the subsurface geology is mostly heterogeneous there might be differences of minerals weathering profile and deposition of weathered material. The average annual precipitation of 200 mm along Aravali hills and sand dominated surface deposits ensure easy percolation of water. The north eastern region of Aravali receives higher precipitation and hard impervious rock layer underneath ensures most of the aquifers at shallow depth (up to 10 m). Round the year availability of groundwater at shallow depths and its abstraction using electric or diesel-powered pumps lead to carbon emissions of the order of 332 and 60 kgC $ha^{-1}$ $yr^{-1}$, respectively. The carbon emissions increased by 50% with almost 10% drop in efficiency of pump, which is based on the depth of groundwater table. Therefore, with receding groundwater table, the carbon emissions associated with water abstraction are bound to increase and may challenge the target of carbon neutrality by 2070. Shifting to solar PV pumps and enhancing solar energy potential can serve the dual benefit of reducing carbon emissions and improving environmental quality. Further, a shift to efficient irrigation techniques and application of mulch and compost can significantly improve the water retention capacity of soil in arid areas along Aravali foothills. Decarbonization activities through agro-extension systems are crucial in agrarian countries

to increase crop yield, decrease cost borne by farmers and translate the same into higher income opportunities thereby, increasing the GDP without compromising with the state of environment.

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**Data availability** All the datasets generated during and/or analyzed during the current study are available in the manuscript.

## Declarations

**Conflict of interest** The authors have no relevant financial or non-financial interests to disclose.

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# High-fidelity reversible data hiding using novel comprehensive rhombus predictor

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**Abstract**
The rhombus mean predictor has been a popular and highly precise predictor commonly deployed for data hiding purposes. However, the rhombus predictor does not always produce the best prediction, for example, when any surrounding pixel is an outlier, because the predictor only calculates the mean of the surrounding pixels without considering their correlation. Therefore, this paper puts forward a comprehensive rhombus predictor (CRP) to take the correlation of the surrounding pixels into account when predicting the centre pixel. CRP adaptively selects the pixels based on their correlation and the characteristics of human visual system for a more precise prediction of the centre pixel. In addition, a highly efficient reversible data hiding (RDH) scheme is proposed using the CRP. The proposed RDH scheme first arranges the pixels in a sequence according to their predicted value by excluding high-complexity pixels. Subsequently, it partitions the sequence into multiple blocks so that the payload can be embedded according to their characteristics by adaptively selecting an embedding strategy. Experiment results demonstrate that the CRP provides higher performance than the existing non-causal related predictors in terms of prediction accuracy. In addition, our RDH based on CRP also outperforms the RDH methods built-upon non-causal related predictors in terms of embedding performance.

**Keywords** Comprehensive rhombus predictor · CRP · PEE · Prediction error expansion · RDH · Reversible data hiding

## 1 Introduction

Reversible data hiding (RDH) methods conceal bit stream of some payload (e.g., auxiliary data) in a host media that can be an image, text, audio, and/or video to transmit information without permanently damaging the contents [1]. The RDH methods have gained popularity in applications such as content authentication, management of contents, extra features for premium users, etc., where both the original host media and the hidden data are required at the receiving end [1, 2]. This popularity has led to the development of a wide variety of RDH methods. At present, the innovations in RDH can be broadly categorized into four

Extended author information available on the last page of the article

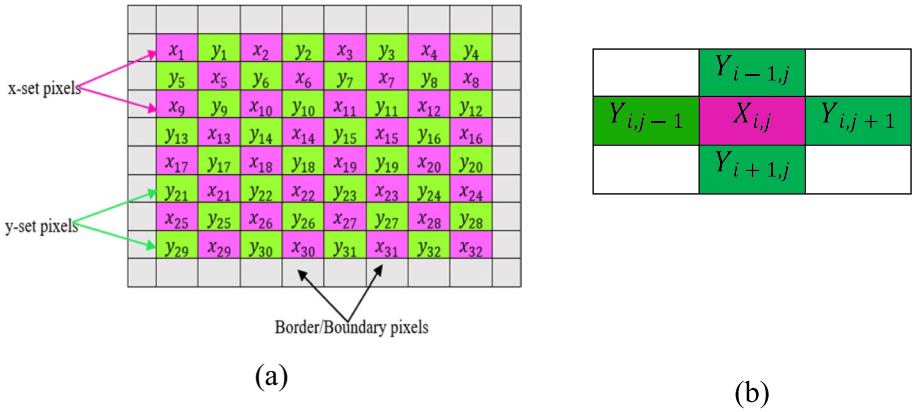



**Fig. 1** Checkerboard pattern (**a**) and pixel's rhombus context (**b**)

classes, namely, difference expansion [3], lossless compression [4], histogram shifting [5], and prediction error expansion (PEE) [6, 7]. However, among these strategies, the most attractive development has been PEE-based RDH methods, because these methods provide high-fidelity marked images and good embedding capacity (EC). One of the earliest methods was introduced by Sachnev et al. [8] in 2009. The method first transforms the original host image into a checkerboard pattern as shown in Fig. 1a, then uses the rhombus mean predictor to predict the center pixel and to calculate the prediction errors (see Fig. 1b). The transformation of the host image into checkerboard pattern enables the user to identify the smooth pixels using the rhombus context which contains four pixels i.e., left, top, right and down pixels as shown in Fig. 1b. The user then embeds data in the smooth regions to preserve the quality of the image. In addition, the accuracy of rhombus mean predictor gives sharper prediction error histogram (PEH) in comparison to the traditional predictors such as Median Edge detector (MED) [9], gradient adjusted predictor (GAP) [10], etc. Thus, Sachnev's method can embed ~ 0.2 bits per pixel (bpp) of data while providing 50 + dB PSNR in most cases.

In 2013, the Sachnev's work was significantly improved by Ou et al. [11], who introduced the 2D PEE. Ou et al.'s work is also popularly known as pairwise PEE. Ou et al. demonstrated that the correlation not only exists among the nearby pixels but also in the nearby prediction errors (PEs). On this basis, pairwise PEE made a modification in the mapping of the PEs so that the high frequency bins of PEH can be optimally expanded and shifted. In the mapping, instead of considering one pixel at a time, two consecutive pixels are processed in parallel and the PE for each of the pixel is computed. These PEs are then manipulated in a pairwise manner. It is reported that the pairwise PEE not only boosts the overall EC but also improves the quality of the marked image. Ou et al.'s approach [11] was further improved in [12] by addressing a significant limitation of the pairwise PEE by introducing adaptivity to the embedding process. To further enhance the performance, Zhang et al. [13] introduced iterative self-learning optimization algorithm. However, it's essential to note that the exhaustive searching for the optimal combination of adaptive 2D mappings may incur increased computational costs, and the method's adaptability might still be constrained in certain complex image contexts. Furthermore, since the aforementioned methods adopt the rhombus predictor for RDH purposes, their performance has not been optimized for textured host images.

While some progress has been made, there remains a need for a comprehensive predictor and hybrid embedding strategy which can perform better even in textured regions and improve the embedding performance. The current research exhibits three primary limitations:

1) Firstly, most existing predictors lacks comprehensiveness in case of textured regions which limits their prediction accuracy, leading to wider PEH then in turn limited EC.
2) Moreover, many approaches rely solely either on prediction error expansion or on PVO for data embedding, failing to leverage the untapped potential of combining them for the optimal performance.
3) Furthermore, the block-based data hiding methods lack the ability to form big blocks so that number of unused pixels can be minimized while enabling the smoother block formation, leading to an imbalance between embedding capacity and pixel distortion.

To address the aforesaid shortcoming, our work first proposes a comprehensive rhombus predictor (CRP) to improve the PE estimation. Subsequently, a highly efficient RDH scheme is envisaged to not only enhance the quality of the marked image but also to increase the EC. The proposed predictor adaptively selects the pixels for pixel prediction from the rhombus context based on their correlation, so that PE between the original pixel and the predicted one can be minimized based on the characteristics of the surrounding pixels. This high precision pixel prediction capability further contributes to embedding higher payload using PEE-based RDH schemes while ensuring the high-fidelity marked image. The contributions of the proposed work can be summarized as follows:

- In this paper, a new comprehensive rhombus predictor (CRP) which not only takes the human visual system into account but also considers horizontal or vertical smoothness of the pixels while prediction has been proposed. The proposed predictor is less complex if compared with other popular predictors such as Least Square, machine/deep learning, Fuzzy predictors [14] and aids in increasing the embedding capacity of existing PEE based RDH schemes which uses rhombus predictor, while preserving the marked image quality.
- Additionally, this paper introduces a new RDH method namely two-pass IPVO (TP-IPVO) for embedding the secret data in block wise manner so that high-fidelity images can be obtained while embedding the decent amount of secret data.
- For achieving the efficient embedding performance, the proposed scheme organizes the pixels in a correlated way using a novel strategy and then dynamically choses an RDH strategy on the basis of the pixel's characteristics. Thus, the proposed work achieves significant performance improvement. This has been evidenced in the experimental results presented in forthcoming sections.

The remaining paper is arranged as follows. In Section 2, related works are discussed. Section 3 introduces the proposed comprehensive rhombus predictor and reversible data hiding scheme. In Section 4, the experiment results are presented and comparisons against the conventional prediction-based RDH are performed, and Section 5 concludes this work.

## 2 Related works

This section is organized in two sub-sections, namely Related Predictors and high fidelity (HF) RDH methods which are detailed as follows.

### 2.1 Related predictors

One of the earliest and popular predictors is the MED [9], which falls under the category of static predictor [14]. MED uses the causal context and has conditional behavior because it works differently in smooth and complex regions. For better results, Wu et al. proposed the GAP [10], which is a non-causal predictor. The non-causal nature is one of the main components that drives the context-based, adaptive, lossless image codec (CALIC) image compression technique [10]. The GAP predictor computes the prediction value based on the seven neighborhood pixels and it detects both the horizontal and vertical edges, though it is more complex than MED. In 2003, Sachnev et al. put forward a simpler and more accurate predictor, which is popularly known as the rhombus predictor (RP). RP takes the mean of left ($Y_{i,j-1}$), top ($Y_{i-1,j}$), right ($Y_{i,j+1}$), and bottom ($Y_{i+1,j}$) pixels of the reference (center) pixel ($X_{i,j}$) as demonstrated in Fig. 1b. The mean, denoted by $\mu_{i,j}$ is defined as follows.

$$\mu_{i,j} = \left\lfloor \frac{1}{4}\left(Y_{i,j-1} + Y_{i-1,j} + Y_{i,j+1} + Y_{i+1,j}\right) \right\rfloor. \tag{1}$$

Among the static predictors such as MED, GAP, and Rhombus, RP usually has the best prediction accuracy in the case of smooth regions, but it does not perform up to the mark in the case of textured regions. To this end, Dragoi & Coltuc [15] improved RP to enhance its prediction accuracy even in rough regions by using non-static (viz., dynamic) prediction. Their predictor acts according to the uniformity of the area, which is measured by using the absolute difference $D=\left|H_{i,j} - V_{i,j}\right|$ between the horizontal $H_{i,j}$ and vertical $V_{i,j}$ means calculated using Eqs. (2) and (3), respectively:

$$H_{i,j} = \left\lfloor \frac{1}{2}\left(Y_{i,j-1} + Y_{i,j+1}\right) \right\rfloor, \tag{2}$$

and

$$V_{i,j} = \left\lfloor \frac{1}{2}\left(Y_{i-1,j} + Y_{i+1,j}\right) \right\rfloor. \tag{3}$$

The modified rhombus predictor (hereinafter referred to as D&C predictor) takes the mean $\mu_{i,j}$ of rhombus set pixels to predict the center pixel $X_{i,j}$ if $D < T1$, where $T1$ is a user-defined threshold; otherwise, it takes $min(H_{i,j}, V_{i,j})$. The predicted pixel (denoted by $P_{i,j}$) is computed using Eq. (4).

$$P_{i,j} = \begin{cases} \mu_{i,j} & if\ D < T1, \\ V_{i,j} & else\ if\ V_{i,j} < H_{i,j}, \\ H_{i,j} & else\ V_{i,j} \geq H_{i,j}. \end{cases} \tag{4}$$

### 2.2 HF-RDH methods

As discussed in Section 1, the notable developments of HF-RDH arguably started with the inception of prediction error expansion (PEE) using rhombus mean predictor [8]. Specifically, Sachnev's method [8] partitions the image pixels into two sets, namely, $X$ and $Y$. Then, it embeds the payload data using a pair of pixels by first embedding in $X$, followed by $Y$. In Sachnev's work, it was found that the prediction using rhombus mean achieves a higher prediction accuracy in comparison to the traditional predictors such as MED and GAP, and thus it produces a sharper prediction error histogram (PEH), which in turn contributes to embedding larger payload with lesser distortion. The embedding then proceeds by expanding and shifting the PEH in both directions. Thus, it gets around average 58.22 dB PSNR for USC-SIPI dataset at 10,000 EC. Sachnev's method is discussed further in Section 3.2.1 because it is functional to the proposed predictor. Subsequently, many HF-RDH works such as 2D PEE, adaptive PEE [16], dual pairwise PEE [17] etc. have appeared in the literature with the aim to enhance the performance of [8] using the rhombus mean by utilizing pairwise PEE. In 2018, Kim et al. [18] introduced a new RDH method which generates skewed prediction error histogram (SPEH) instead of Gaussian-like distribution. By doing this, Kim et al. tried to minimize the tail of the peak bins to reduce the shifting. Therefore, the prediction is performed using extreme predictors so that SPEH is generated, and both shifting as well as expansion are carried out on the shorter tail. The SPEH-based RDH method embeds data in a pixel twice, which causes lesser distortion. This way, Kim et al. [18] achieve on average 59.02 dB PSNR for USC-SIPI dataset at 10,000 EC. The work of SPEH has gain popularity even in color images [19] and robust RDH domains [20].

In addition to the aforementioned PEE-based RDH methods, an interesting progress started in the field of HF-RDH with the introduction of pixel value ordering (PVO) method by Li et al. in 2013 [21]. In PVO method, the image is first divided into blocks of uniform size; next, the pixels in each block are arranged in the increasing order, and the embedding is done by using the extreme pixels on both sides of the distribution, i.e., minimum and maximum pixels. For embedding, the PEs are calculated using penultimate extreme pixels and the errors are expanded/shifted by at most 1. To maintain reversibility, the shifting and expansion are performed towards extremes and only one bin is expanded. Thus, the work could gain around 1.5 dB in PSNR at 10 K bits embedding capacity over [8].

In 2014, Peng et al. [22] extended Li et al.'s work [21] by introducing an improved PVO (IPVO) method. The IPVO utilizes two peak bins of PEH for embedding the payload. For this, a new approach of calculating the PEs is adopted by making use of pixel positions along with their intensity values. Therefore, IPVO not only increases the EC but also enhances the quality of the marked image. More specifically, the work achieves average 58.79 dB PSNR at 10 K bits embedding capacity for the SIPI dataset. To further increase the EC, Kumar et al. [6] hybridized the IPVO method with PEE so that pixels of smooth regions can be optimally utilized. In another work [23], they tried to reserve a bin so that shifting can be done in both directions. However, the bin reservation method fails to produce a marked image of good fidelity. In 2018, He et al. [24] put forward a novel RDH method that extended Li et al.'s method [21] into multi-pass PVO. In this multi-pass method, at one pass, $k$-extreme pixels from one side are independently taken for data embedding and subsequently the other side's $k$-extreme pixels are taken for data embedding. This process of embedding can be repeated for multiple passes. In this

process, the ordering of pixels might change but reversibility can still be ensured. This method results in a good quality marked image with higher data embedding capacity. More specifically, the work achieves average 59.18 dB PSNR at 10 K bits embedding capacity for the SIPI dataset. Qi et al. [25, 26] leverages prediction-error value ordering and multiple embedding to further enhance the performance. More specifically, the method exploits inter-correlations in prediction-errors and adaptively selects multiple errors within each block for modification. The method showcases superior results, achieving a remarkable PSNR of 62.01 dB for an embedding capacity of 10,000 bits, outperforming some SOTA RDH works.

Ou et al. [25, 26] presented a notable advancement by extending Pixel-value-ordering (PVO) embedding into a 2D form, integrating pairwise prediction-error expansion for enhanced reversible data hiding. The proposed adaptive mapping selection mechanism further optimizes performance, showcasing superiority over previous PVO-based methods. However, it's essential to acknowledge potential limitations in scenarios where prediction-error distributions deviate significantly from the model assumptions, impacting the method's adaptability to diverse image contexts. Subsequently, many variations of pairwise concept such as Sorting based blocking [27], adaptive pairwise [28, 29], pixel PVO [30], flexible PVO [31, 32], and others [33, 34], have been introduced to improve the performance of pairwise expansion, where shifting has proven to be providing lesser distortion while offering higher embedding capacity. Here, the pairwise works are not discussed in detail because most existing PEE/PVO based RDH works can also be extended into pairwise mode for improved performance.

## 3 Proposed method

In this section, the proposed RDH scheme based on a novel comprehensive rhombus predictor (CRP) is proposed. The CRP is first introduced, then the embedding method is detailed. Such embedding method is based on different components such as improved Sachnev, Skewed Histogram and two-pass PVO, which are described in depth in Section 3.2.1.

### 3.1 Comprehensive rhombus predictor

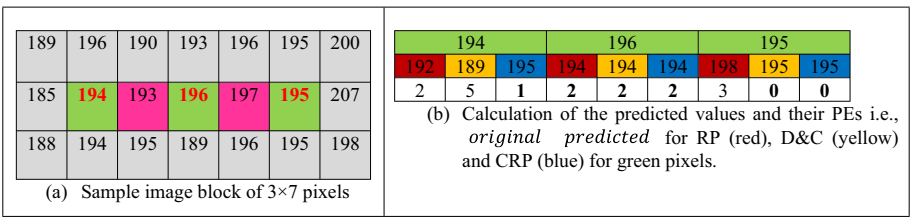
The proposed predictor comprehensively enhances the rhombus predictor by combining the characteristics of rhombus mean predictor and D&C's (Dragoi & Coltuc) predictor; it is named comprehensive rhombus predictor (CRP) and it basically considers the horizontal and vertical smoothness while predicting the center pixel value. Such a shrewdness allows pixels belonging to somewhat rough region but still having any of the horizontal and vertical smoothness to be more accurately predicted. Specifically, the predicted pixel (denoted by $\hat{\mathrm{p}}_{\mathrm{i,j}}$) is calculated, by using Eq. (5).

$$\hat{\mathrm{p}}_{i,j} = \begin{cases} \mu_{i,j} & \text{if } D < T1; \\ H_{i,j} & \textit{else if } h_{diff} < \mathrm{v}_{diff} \text{ and } h_{diff} < T2; \\ V_{i,j} & \textit{else if } \mathrm{v}_{diff} < h_{diff} \text{ and } \mathrm{v}_{diff} < T2; \\ min(H_{i,j}, V_{i,j}) & \textit{else}, \end{cases} \tag{5}$$

where $h_{diff} = \left| Y_{i,j-1} - Y_{i,j+1} \right|$ and $\mathrm{v}_{diff} = \left| Y_{i-1,j} - Y_{i+1,j} \right|$ represent the absolute difference between the horizontal and vertical pixels difference, $min(H_{i,j}, V_{i,j})$ is function that returns minimum from the horizontal $H_{i,j}$ and vertical $V_{i,j}$ means. Note that there is no relation

**Table 1** PSNR (dB) attained by rhombus, D&C and the proposed CRP

| Predictors/Images | Lena | Baboon | Peppers | Airplane | Lake | Boat | Barbara | Elaine |
|---|---|---|---|---|---|---|---|---|
| Rhombus predictor | 33.49 | 23.68 | 32.40 | 32.27 | 29.64 | 29.82 | 25.62 | 32.06 |
| D&C predictor | 33.83 | 23.68 | 32.40 | 32.28 | 29.64 | 30.46 | 26.70 | 32.06 |
| CRP (Proposed) | **33.87** | **23.72** | **32.94** | **32.87** | **29.75** | **30.51** | **26.70** | **32.06** |




(a) Sample image block of 3×7 pixels

(b) Calculation of the predicted values and their PEs i.e., *original predicted* for RP (red), D&C (yellow) and CRP (blue) for green pixels.

**Fig. 2** Example for pixel value prediction (**a**) and PE calculation (**b**)

between the user-defined thresholds $T1$ and $T2$ Based on Eq. (5), $\hat{p}_{i,j}$ is equal to the rhombus mean $\mu_{i,j}$ if the absolute difference $D = |H_{i,j} - V_{i,j}|$ between the horizontal $H_{i,j}$ and vertical $V_{i,j}$ means calculated using Eqs. (2) and (3), respectively, is less than the user-defined threshold ($T1$). Otherwise, if $h_{diff}$ is less than $v_{diff}$ and $T2$, then $\hat{p}_{i,j}$ is set to $H_{i,j}$ else the value of $v_{diff}$ is checked against $h_{diff}$ and $T2$. In the event of $v_{diff}$ being less than both values then $\hat{p}_{i,j}$ is set to $V_{i,j}$. In a scenario where none of the aforementioned conditions are met, then $min(H_{i,j}, V_{i,j})$ is taken as $\hat{p}_{i,j}$.

To evaluate the performance of the proposed CRP in comparison to the Rhombus mean and the D&C predictors, experiment results in terms of PSNR, calculated between the original image and the predicted one, are presented in Table 1. It can be observed that the CRP achieves better performance (though the improvement is marginal) than the conventional methods in comparison. The observed improvement is due to the incorporation of the horizontal and vertical smoothness of the surrounding pixels in case of noisy rhombus context in the architecture of the D&C predictor. Thus, two independent user-defined thresholds play quite an important role in predicting the center pixel based on the characteristics of the rhombus context.

To explain the improvement, consider the image block shown in Fig. 2a. For the shown block, let's further consider that we need to predict the green pixel values using their rhombus context. If Sachnev's rhombus mean predictor is adopted, then the predicted value for the green pixel (having value 194) will be $floor((185 + 196 + 193 + 194)/4) = 192$. In the case of D&C predictor, first the horizontal and vertical means are calculated using Eqs. (2) and (3). The values are are $H_{i,j} = (185 + 193)/2 = 189$ and $V_{i,j} = (196 + 194)/2 = 195$, respectively. Next, the absolute difference between the horizontal and vertical means is calculated. The absolute difference is $|195 - 189| = 6$. Let's suppose, the user defined threshold $T1 = 5$ then as per Eq. (4), the predicted value is 189. However, in case of the CRP (proposed) the predicted value is 195 using Eq. (5), because it also considers the horizontal and vertical smoothness. In the case of CRP, $T2 = 5$ is considered. Thus, we can say the CRP predictor may work better in scenarios where the rhombus context is not that smooth. For the next green pixel (i.e., 196), the Sachnev's rhombus mean predictor gives

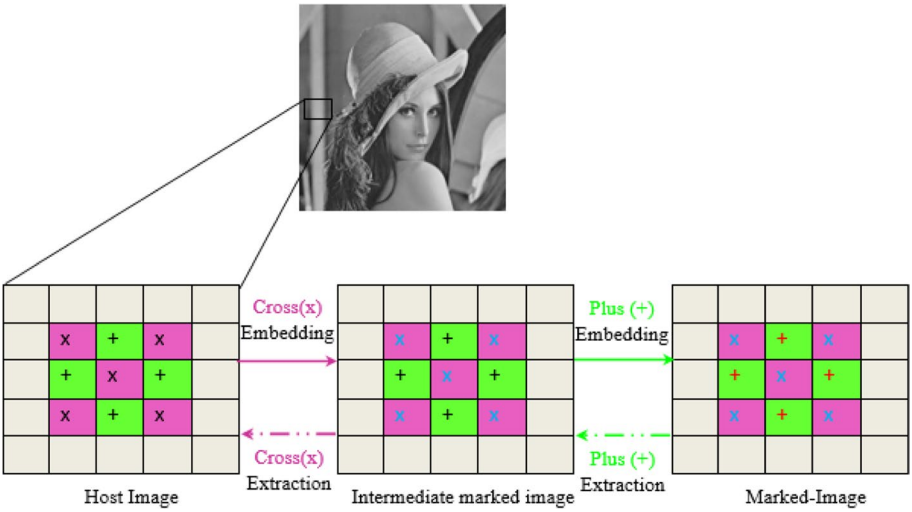



**Fig. 3** The embedding and extraction processes

*floor*((196 + 196 + 197 + 189)/4)) = 194. In the case of D&C predictor, the horizontal mean and vertical mean are (193 + 197)/2 = 195 and (193 + 189)/2 = 191, respectively. Next, the absolute difference between the horizontal and vertical means is calculated. The absolute difference (D) is |195 − 191| = 4. If the same user defined threshold (i.e., $T1 = 5$) is considered, then as per Eq. (4), the predicted value is the same as predicted by rhombus mean. In the case of CRP (proposed), the predicted value will also remain the same as the rhombus mean. For the third green pixel (198), Sachnev's rhombus mean predictor gives ((197 + 195 + 207 + 195)/4)) = 198. In the case of D&C predictor, the horizontal and vertical means are (197 + 207)/2 = 202 and (195 + 195)/2 = 195, respectively. Next, the absolute difference between the horizontal and vertical means is calculated. The absolute difference is 202–195 = 7. If the same user defined threshold (i.e., $T1 = 5$) is considered, then as per Eq. (4), the predicted value is the same as vertical mean, i.e., 195. In the case of CRP (proposed), the predicted value will also remain the same as that of the D&C predictor in case $T2 = 5$. Overall, if we calculate the absolute error between the original pixel value and the predicted ones as shown in Fig. 2b, the CRP seems to be: 1) providing the least error in the case of the first green pixel; 2) providing the same result as the other predictors in the case of the second green pixel, and; 3) providing the least error along with D&C predictor for the third green pixel. Such a numerical example permits to understand how the proposed CRP can exploit the surrounding pixels characteristics in a comprehensive manner to improve prediction precision.

### 3.2 Proposed RDH method

In this section, the proposed PEE-RDH method is presented. Specifically, the proposed method optimally combines and improves PEE-RDH schemes put forward by Sachnev et al. [8], Kim et al. [28], and He et al. [24]. To do this, pixels in the cover image are first labelled using a checkerboard pattern as shown in Fig. 1a. Next, the embedding is carried out in two phases as demonstrated in Fig. 3. In the first phase, data is embedded into the cross (×) locations (purple cells), followed by embedding into the plus (+) locations (green cells). Specifically, the proposed

**Table 2** Extraction and recovery rules for the proposed method

| $x'_{i,j} - \hat{p}_{i,j}$ | $> 1$ | 1 | 0 | $-1$ | $-2$ | $< -2$ |
|---|---|---|---|---|---|---|
| $b_1$ | – | 1 | 0 | 0 | 1 | – |
| $x_{i,j}$ | $x'_{i,j} - 1$ | $x'_{i,j} - 1$ | $x'_{i,j}$ | $x'_{i,j}$ | $x'_{i,j} + 1$ | $x'_{i,j} + 1$ |

method is based on three main components, namely, *improved Sachnev's method*, *skewed histogram method* and *two pass IPVO method*, which are successively introduced in Sections 3.2.1, 3.2.2 and 3.2.3, respectively. Subsequently, in Section 3.3, the step-by-step embedding algorithm is outlined, while a discussion regarding auxiliary data for blind extraction is given in Section 3.4, followed by extraction and recovery process provided within Section 3.5.

### 3.2.1 Improved SACHNEV'S method (IS)

The *improved Sachnev's (IS) method* will first calculate the local complexity ($LC_{i,j}$) for each pixel $x_{i,j}$ using Eq. (6) as follows:

$$LC_{i,j} = \frac{1}{4}\sum_{k=1}^{4}(Avg_d - d_k)^2 \tag{6}$$

where $d_1 = \left|y_{i,j-1} - y_{i-1,j}\right|$, $d_2 = \left|y_{i-1,j} - y_{i,j+1}\right|$, $d_3 = \left|y_{i,j+1} - y_{i+1,j}\right|$, $d_3 = \left|y_{i+1,j} - y_{i,j-1}\right|$ and $Avg_d = (d_1 + d_2 + d_3 + d_4)/4$. Next, the payload data bits are embedded into the pixels having $LC_{i,j}$ less than a pre-defined threshold ($LCT1$). These pixels are henceforth called *usable* pixels, while the opposite will be called *non-usable*. For embedding, first the pixel value $\hat{p}_{i,j}$ is predicted using the proposed CRP as detailed in Section 3.1. Subsequently, data embedding is done according to Eq. (7):

$$x'_{i,j} = \begin{cases} x_{i,j} + b_1 & \text{if } x_{i,j} - \hat{p}_{i,j} = 0; \\ x_{i,j} + 1 & \text{if } x_{i,j} - \hat{p}_{i,j} > 0; \\ x_{i,j} - b_1 & \text{if } x_{i,j} - \hat{p}_{i,j} = -1; \\ x_{i,j} - 1 & \text{if } x_{i,j} - \hat{p}_{i,j} < -1. \end{cases} \tag{7}$$

where $b_1 \epsilon \{0, 1\}$ is the payload (data) bit. Thus, the pixels are modified by at most $\pm 1$ for embedding one bit. At the receiving end, the data can be extracted by referring to Table 2 and the original pixels can be recovered accordingly.

### 3.2.2 Skewed histogram method (SH)

The *skewed histogram (SH) method* embeds the payload into the usable pixels so that the correlation of the surrounding pixels can be exploited. The embedding process is performed twice to pixel $p_{i,j}$ in two passes. In the first pass, the modification is done as follows:

$$p'_{i,j} = \begin{cases} p_{i,j} + b_1 & \text{if } e_1 = 1; \\ p_{i,j} + 1 & \text{if } e_1 > 1; \\ p_{i,j} & \text{if } e_1 < 1; \end{cases} \tag{8}$$

where error $e_1 = p_{i,j} - (v_2 + v_3 + v_4)/3$, $b_1 \epsilon \{0, 1\}$ represents secret data bit to be embedded in the first pass of the SH method and $v_1 \leq v_2 \leq v_3 \leq v_4$ are the sorted values of the

**Table 3** Extraction and recovery rules for the first pass of the Skewed Histogram method. '–' indicates no hidden bit

| $e_2$ | $> 2$ | 2 | 1 | $\leq 0$ |
|---|---|---|---|---|
| $b_2$ | – | 1 | 0 | – |
| $p'_{i,j}$ | $p''_{i,j} - 1$ | $p''_{i,j} - 1$ | $p''_{i,j}$ | $p''_{i,j}$ |

**Table 4** Extraction and recovery rules for the second pass of Skewed Histogram method. '–' indicates no hidden bit

| $e_1$ | $< 0$ | 0 | 1 | $\geq 2$ |
|---|---|---|---|---|
| $b_1$ | – | 1 | 0 | – |
| $p_{i,j}$ | $p'_{i,j} + 1$ | $p'_{i,j} + 1$ | $p'_{i,j}$ | $p'_{i,j}$ |

surrounding pixels $\{y_{i,j-1}, y_{i-1,j}, y_{i,j+1}, y_{i+1,j}\}$ (see Fig. 1b for more clarity). Thus, the pixel value is either increased by unity or remains unchanged. In the second pass, the embedding is performed using:

$$p''_{i,j} = \begin{cases} p'_{i,j} - b_2 & \text{if } e_2 = 1; \\ p'_{i,j} - 1 & \text{if } e_2 \leq 0; \\ p'_{i,j} & \text{if } e_2 \geq 2, \end{cases} \tag{9}$$

where error $e_2 = p'_{i,j} - (v_1 + v_2 + v_3)/3$ and $b_2 \epsilon \{0, 1\}$ represents secret data bit to be embedded in the second pass of SH method. Likewise, the pixel value is either decreased by unity or remains unchanged. Therefore, the skewed histogram shifting based approach embeds the payload by modifying the pixel at most by $\pm 1$, and so the introduced distortion is very limited.

At the receiving end, the extraction and recovery process are carried out in a reverse manner with respect to the embedding phase. Specifically, the receiver first extracts the data from the modified pixels by consulting Table 3, followed by Table 4. In the tables, '–' indicates no hidden bit.

### 3.2.3 Two pass IPVO method (TP-IPVO)

The *two-pass IPVO (TP-IPVO) method* is newly proposed and it is inspired by [24] to embed the payload in a group of pixels in two passes. Specifically, in the first pass, the pixels $x_1, \ldots, x_N$ from the group are arranged in increasing order, where $x_{\pi(1)} \leq \cdots \leq x_{\pi(N)}$, $\pi(i) < \pi(j)$ if $x_{\pi(i)} = x_{\pi(j)}$ and $i < j$. Next, all the pixels except $x_{\pi(N-1)}$ and $x_{\pi(N)}$ from the group are modified to embed the payload data by first calculating the PEs ($E_{1(i)}$) as follows:

$$E_{1(i)} = x_s - x_t, \tag{10}$$

where $s = min\{\pi(i), \pi(N-1))\}$, $t = max\{\pi(i), \pi(N-1))\}$ and $i$ ranges from 2 to $N-2$. Next, the pixel $x_{\pi(i)}$ is modified as follows:

$$x'_{\pi(i)} = \begin{cases} x_{\pi(i)} - b_1 & if\ E_{1(i)} \in \{0, 1\}; \\ x_{\pi(i)} - 1 & else\ if\ E_{1(i)} > 1; \\ x_{\pi(i)} - 1 & else\ E_{1(i)} < 0. \end{cases} \tag{11}$$

**Table 5** Extraction and recovery rules for the first pass of Two pass IPVO method

| $E_j^2$ | $> 2$ | $2$ or $-1$ | $1$ or $0$ | $< -1$ |
|---|---|---|---|---|
| $b_2$ | – | $1$ | $0$ | – |
| $x_{\beta(j)}$ | $x'_{\beta(j)} - 1$ | $x'_{\beta(j)} - 1$ | $x'_{\beta(j)}$ | $x'_{\beta(j)} - 1$ |

**Table 6** Extraction and recovery rules for the second pass of Two pass IPVO method

| $E_i^1$ | $> 2$ | $2$ or $-1$ | $1$ or $0$ | $< -1$ |
|---|---|---|---|---|
| $b_1$ | – | $1$ | $0$ | – |
| $x_{\pi(i)}$ | $x'_{\pi(i)} + 1$ | $x'_{\pi(i)} - 1$ | $x'_{\pi(i)}$ | $x'_{\pi(i)} - 1$ |

Thus, the value of the pixel $x_{\pi(i)}$ is decreased either by unity or remains unchanged. Further, $x_{\pi(1)}$ is also modified as $x_{\pi(2)}$ to preserve their ordering in the group. In the second pass, the updated pixels in the group are again sorted in increasing order $(x_{\beta(1)}, \ldots, x_{\beta(N)})$, where $x_{\beta(1)} \leq \cdots \leq x_{\beta(N)}$, $\beta(j) < \beta(k)$ if $x_{\beta(j)} = x_{\beta(k)}$ and $j < k$. The PEs $E_{2(j)}$ are calculated as follows:

$$E_{2(j)} = x_u - x_v, \tag{12}$$

where $u = min\{(j), \beta(2)\}$ $v = max\{(j), \beta(2)\}$ and $j$ ranges from 3 to $N-1$. Next, the pixel $x'_{\pi(j)}$ is modified as follows:

$$x'_{\beta(j)} = \begin{cases} x_{\beta(j)} + b_2 & if\ E_{2(j)} \in \{0, 1\}; \\ x_{\beta(j)} + 1 & else\ if\ E_{2(j)} > 1; \\ x_{\beta(j)} + 1 & else\ E_{2(j)} < 0. \end{cases} \tag{13}$$

Thus, the value of the pixel $x_{\beta(1)}$ is again increased either by unity or remains unchanged. Further, $x_{\pi(N)}$ is also modified as $x_{\pi(N-1)}$ to preserve their ordering in the group. It is to be noted that extreme end pixels, i.e., $x_{\pi(1)}$ and $x_{\pi(N)}$, are usually outliers which create hurdles in TP-IPVO embedding. Therefore, $x_{\pi(1)}$ and $x_{\pi(N)}$ are not used for embedding but modified along with $x_{\pi(2)}$ and $x_{\pi(N-1)}$, respectively, so that the ordering can be maintained even in the worst-case scenario.

At the receiving end, the extraction and recovery process are proceeded in a reverse manner with respect to the embedding phase. Specifically, the receiver first extracts the data from the modified pixels by consulting Table 5, followed by Table 6. The changes in the $x'_{\pi(1)}$ and $x'_{\pi(N)}$ are also reversed in the same as in $x_{\pi(1)}$ and $x_{\pi(N)}$, respectively.

### 3.3 Embedding algorithm

The proposed embedding algorithm for hiding the payload $S$ into a host image is detailed step-by-step hereafter:

**Input-** $\boldsymbol{I}$ : The host image of size $h \times w$ pixels, $S$: payload data, $GS$: group size, User-defined thresholds $(T1, T2, LCT1, LCT2, LCT3)$
***Output-*** $\boldsymbol{I'}$ *:* Marked-Image
***Start***
***Step1:*** Impose the checkerboard pattern onto image *I* to divide the pixels into *x-set* and *y-set* pixels as shown in Fig. 1.
***Step2:*** Scan *I* in raster order and construct a location map *LM* in which boundary pixels are represented by '1' and all the remaining pixels by '0'. Also preprocess the image using Eq. (14) to avoid overflow/underflow. Next, compress the *LM* by using the Joint Bi-level Image Experts Group (JBIG)/arithmetic encoding to obtain the compressed location map $(CLM)$. The length of the $CLM$ is denoted by $LCLM$.
***Step3:*** Estimate each pixel in *x-set* using its rhombus set following the proposed CRP as in Eq. (5). Denote the estimated pixel by $\hat{p}_i$.
***Step4:*** Compute local complexity $LC$ of each pixel using Eq. (6).
***Step5:*** Sort the *x*-set pixels in increasing order of their estimated values to get the sorted stream of pixels SSP by excluding the pixels having local complexity $\geq LCT1$.
***Step6:*** Divide SSP into groups $G_j$ so that equal valued estimated pixels are put together in a group. For example, one group will have all the 0 valued pixels, another group will have all the '1' valued pixels, and so on. This process is repeated until all the pixels are not clustered in groups.
***Step7:*** Embed the payload data into the groups as follows:

- If cardinality of a group $G_j > 2$ then
  - if cardinality of $G_j > GS$ then
    - divide the group into sub-groups, each of size = $GS$
  - End
  - Embed the payload data in the groups/sub-groups using proposed TP-IPVO method.
- Else embed in pixel wise manner as follows:
  - If local complexity < $LCT2$
    - Embed by using SH's method
  - Elseif local complexity ≥ $LCT2$ and local complexity < $LCT3$
    - Embed by using IS's method
  - Else
    - Do not embed
  - End
- End

***Step8:*** After using all the *x*-set pixels, estimate each pixel in *y*-set using its rhombus set following Eq. (5). Denote the estimated pixel by $\hat{p}_i$ and repeat step 4 to 7 for the *y*-set pixels for the processed image.
***Stop***

Thus, all information is embedded inside the image, which can be later transmitted to the receiver, who in turn can retrieve the embedded data and restore the host image to its original form. To facilitate the presentation, a flowchart of the proposed embedding procedure is shown in Fig. 4

### 3.4 Auxiliary information for blind extraction

To extract the embedded data and recover the host image to its original form, some auxiliary data is also embedded into the marked image. The details about the auxiliary data and embedding processes is provided as follows:

- ***Location map:*** A location map *LM* which keeps the track of the boundary pixels in the image is constructed. LM assumes the value of '0' or '1' for the corresponding position of each pixel in the original host image. It is constructed by reading the image in raster scan order. In LM, the pixels whose values are either '0' or '255' are marked as '1' and

the remaining ones are marked as '0'. During the construction of LM, the host image is also pre-processed using Eq. (14) to avoid overflow/underflow of pixels.

$$x_i = \begin{cases} x_i - 1 & \text{if } x_{i,j} = 255, \\ x_i + 1 & \text{if } x_{i,j} = 0, \\ x_i & \text{else.} \end{cases} \tag{14}$$

Next, *LM* is losslessly compressed using arithmetic encoding or JBIG1 to condense its size. Thus, a compressed location map *CLM* of length *LCLM* is obtained. As an example, the *LCLM* can be represented by 18 bits for a host image having a dimension of $512 \times 512$ pixels. It is to be noted that *LCLM* varies according to the size of host image.

- ***User-defined thresholds and group-size:*** In the proposed method, different user-defined thresholds such as $T1$, $T2$, $LCT1$, $LCT2$, and $LCT3$, have been used. The first two thresholds ($T1$, $T2$), which are independent of each other, are being used by the proposed CRP, and the last three, i.e., $LCT1, LCT2$, and $LCT3$ are being used in the proposed RDH scheme for choosing the embedding methods among IS, SH and TP-IPVO. It is noteworthy that $LCT2 \leq LCT3$. The storage size for these thresholds is $8+8+15+15+15=61$ bits. In addition to this, the group size needs to be stored to achieve optimal performance. The number of bits required to represent the group size is 12. Additionally, part of the embedding venue is reserved for the auxiliary data to guide the extraction and recovery processes, i.e., when to stop after extracting the predefined number of bits. The embedding capacity can be represented using 18 bits. Thus, in total, 91 bits are required to represent different thresholds, group-size and information about the embedding capacity.
- ***LSB of the boundary pixels:*** It is to be noted that the boundary pixels (first and last row as well as columns of the original image) are not utilized for embedding the payload data. However, $91(auxiliary) + 18(LCLM) = 109$ boundary pixels are reserved for embedding the aforementioned auxiliary data. This embedding is done using the LSB substitution strategy. The original LSBs of these boundary pixels are added to the front (i.e., pre-padded) of the payload data ($S$) so that lossless recovery of the host image can be ensured.

### 3.5 Extraction and recovery process

To recover the original host image and to extract the embedded data, the embedding phase is executed in the reverse order. Here, the auxiliary data such as values of different thresholds, group-size and length of location map are first extracted from 109 LSBs of the boundary pixels of the received (marked) image. Then, the following extraction and recovery algorithms are applied.

#### 3.5.1 Extraction algorithm

To extract the embedded data $S$ from the marked-image $\boldsymbol{I}'$ of size $h \times w$ pixels as well as to restore the original host image, the following steps are performed:

**Input-** $\boldsymbol{I'}$ : Marked-Image, $GS$ : group size, thresholds ($T1, T2, LCT1, LCT2, LCT3$)
***Output-*** $\boldsymbol{I}$ : Cover image of size $h \times w$ pixels, $S$ : payload data
***Start***
***Step1:*** Divide the image $\boldsymbol{I'}$ into checkerboard pattern to identify pixels in the *x-set* and *y-set* as shown in Fig. 1.
***Step2:*** Extract the hidden compressed location map $CLM$ and the auxiliary data from the defined set of pixels. Decompress the LM to obtain the original LM.
***Step3:*** Estimate each pixel in the *y-set* using its rhombus set based on Eq. (5). Denote the estimated pixel by $\hat{p}_i$.
***Step4:*** Calculate the local complexity $LC$ of each pixel using Eq. (6).
***Step5:*** Sort the pixels in the ascending order of their estimated values to obtain the sorted stream of pixels SSP while excluding the pixels having local complexity > $LCT1$.
***Step6:*** Divide SSP into groups $G_j$ so that equal valued pixels are put together into a single group. For example, one group will have all the 0 valued pixel, another group will have all the '1' valued pixel and so on. This process is repeated until all the pixels are not clustered in groups.
***Step7:*** Now extract the embedded data and recover the groups as follows:

- If cardinality of group $G_j > 2$ then
  - if cardinality of $G_j > GS$ then
    - divide the group into sub-groups
  - End
  - Extract the embedded data into groups/sub-groups using the TP-IPVO extraction rules.
- Elseif extract in pixel wise manner as follows:
  - If local complexity< $LCT2$
    - Extract the payload data and recover the pixel using SH's method.
  - Elseif local complexity≥ $LCT2$ and local complexity < $LCT3$
    - Extract the payload data and recover the pixel using IS's method.
  - Else
    - Do not extract
  - End
- End

***Step8:*** Repeat steps 3 to 7 for the *x-set* pixels from the updated image.
***Step9:*** After extraction of payload data, the obtained image is post-processed using Eq. (15) to losslessly restore the original host image. Lastly, the boundary pixels are adjusted to nullify the impact of the preprocessing done prior to the embedding phase.

$$x_{i,j(rev)} = \begin{cases} x_{ij} + 1 & \text{if } x_{ij} = 255 \text{ and } LM(i) = 1, \\ x_{ij} - 1 & \text{if } x_{ij} = 0 \text{ and } LM(i) = 1, \\ x_{ij} & \text{else.} \end{cases} \quad (15)$$

where $x_{i,j(rev)}$ represent the pixel values obtained after post-processing.
***Stop***

Through the steps presented above, the embedded data is losslessly extracted and the original host image is recovered by the receiver.

## 4 Experimental results and comparison

In this section, we evaluate the performance of the proposed CRP as well as the RDH scheme on various images. First, we evaluate the prediction capability of the CRP. Then, we perform embedding performance tests on the method. Finally, we evaluate the embedding time of the method.

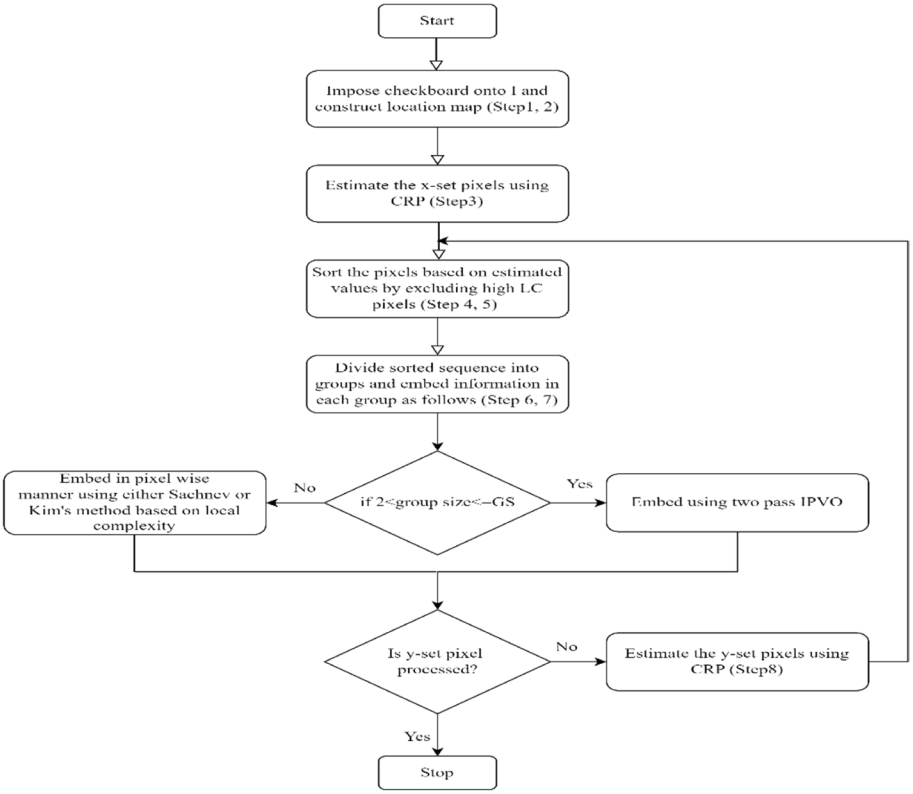


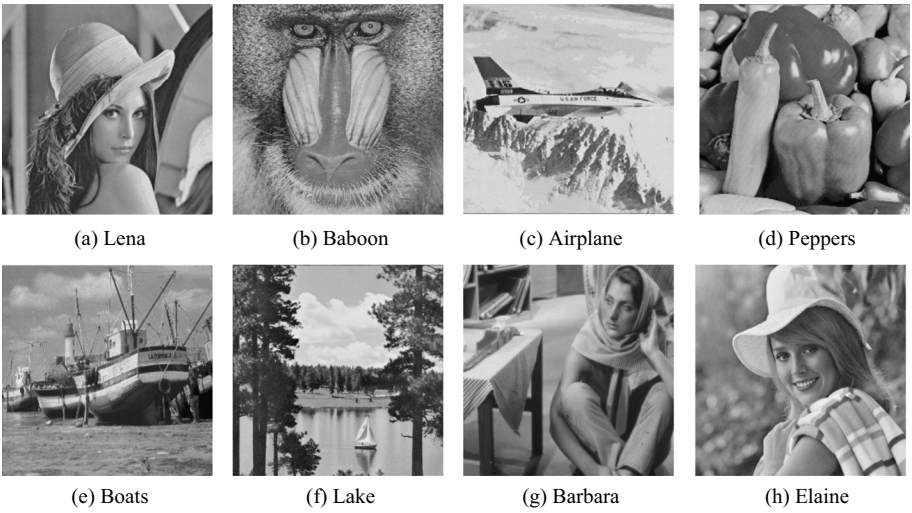

**Fig. 4** Flowchart of the proposed embedding procedure

### 4.1 Image datasets

We use the USC-SIPI[1] and Kodak[2] datasets as experimental images to evaluate the algorithm's performance. We compare the proposed algorithm with the state-of-the-art algorithms, measuring image fidelity using peak signal-to-noise ratio (PSNR) values. Figure 5 illustrates eights classic color images of size $512\times512$ from the USC-SIPI dataset: Lena, Baboon, Airplane, Peppers, Boats, Lake, Barbara, and Elaine, each of different characteristics and textures. The Kodak dataset contains 24 color images of size $512\times768$ or $768\times512$, on which we test the algorithm's performance by first converting them to gray-scale images. The secret data used in the experiments is a bit sequence composed of 0 and 1 generated by a random function. We run our method and the compared methods on a PC equipped with Intel Core i7 CPU, 8 GB memory, and Windows 10 operating system, using MATLAB R2020a environment.

[1] http://sipi.usc.edu/database/database.php?volume=misc

[2] http://r0k.us/graphics/kodak/



(a) Lena (b) Baboon (c) Airplane (d) Peppers

(e) Boats (f) Lake (g) Barbara (h) Elaine

**Fig. 5** Original cover images from SIPI database

### 4.2 Evaluation of prediction accuracy

To evaluate the prediction accuracy of the proposed CRP in comparison to Rhombus mean and D&C methods, we consider the histogram of the PEs for the range of [-5, + 5] with respect to the image size (i.e., 512 × 512 = 262,144 in our case). In other words, the higher the number of PEs with absolute values around zero the better the predictor works, and vice versa. In Fig. 6, the cases of two representative images with diverse textured characteristics such as *Lena* (Fig. 6a) and *Baboon* (Fig. 6b) are demonstrated. It can be clearly noticed that the proposed CRP (green columns) achieves a consistent improvement in the prediction accuracy when compared to the other two techniques. Specifically, though such an improvement appears to be marginal for *Lena* (see Fig. 6a), it is more evident for image of higher texture such as *Baboon* (see Fig. 6b). The other six images show similar performance trends and we omit the discussion here.

To further understand the actual improvement in terms of prediction accuracy, Table 7 records the percentage of PEs which globally fall in the range of [-5, + 5] for Rhombus, D&C and CRP (Proposed) when predicting the pixel values in the images *Lena* and *Baboon*. The performance improvement is again evidenced (much more for *Baboon* as expected). Finally, it is interesting to appreciate how challenging is the *Baboon* image with respect to *Lena*, in fact for the former only about 41% of the PEs present an absolute value within 5 while for the latter this amount is more than doubled.

It is noteworthy that for optimal results, the threshold values are decided based on exhaustive search. More specifically, in the case of D&C, the best results are obtained at T1 = 10 and T1 = 30 for Lena and Baboon, respectively. In case of the proposed CRP, the best results obtained at T1 = 10 & T2 = 10 and T1 = 23 & T2 = 0 have been considered, respectively for Lena and Baboon. From Fig. 6, it can be observed that the count of peak PEs (i.e., 0 and -1) of CRP are greater than that of Rhombus and D&C. This in turn helps in achieving higher embedding capacity which is then evidenced in Table 8.

(a) Lena (b) Baboon

**Fig. 6** Prediction error histogram (in percentage) for Rhombus (blue), D&C (orange) and proposed CRP (green) methods in the range [-5, +5]

**Table 7** PEs (%) which fall in the range [-5, +5] for the three methods Rhombus, D&C and CRP (Proposed)

| Predictor | Lena | Baboon |
|---|---|---|
| Rhombus | 83.37% | 39.79% |
| D&C | 84.10% | 39.65% |
| CRP (Proposed) | **84.16%** | **40.90%** |

### 4.3 Performance comparison of the embedding efficiency

The performance of the proposed RDH based on CRP and on the dynamic selection of the embedding strategy is evaluated and compared against Sachnev + rhombus mean [8] and Sachnev + Dragoi & Coltuc's method [12]. The experimental results are provided in Table 8, where the PSNR indicates the marked image's quality after embedding at the maximum achievable rate; however, such PSNR values basically represent what is achieved by each predictor except for a difference of $\pm 0.004$ dB. In the same table, the last column 'Increament in EC (in bits)' records the enlargement in payload data bits achieved by the adoption of CRP in comparison to the conventional methods. It can be pointed out that the proposed predictor not only helps in increasing the EC but also aids in preserving the same image quality. It should also be noted that Dragoi & Coltuc's predictor achieves lower performance in all images when compared to rhombus mean. However, the proposed CRP consistently achieves better performance for all considered test images because it comprehensively evaluates the rhombus pixels and makes use of them to predict the center pixels. The average increase in the embedding capacity is 564 bits with respect to the Sachnev's RDH [8] method.

Furthermore, we have evaluated the performance of the proposed method in terms of structural similarity (SSIM) metric. For this, the experimental results are provided in following Table 9 where SSIM at different embedding capacity for the Lena image are provided. It can be clearly observed from the bale that there is only very minute (or negligible) change in SSIM with the increase in EC, which in turn proves the high-fidelity nature of the proposed scheme. That's why to avoid duplicity, we have not included the results for other images of the dataset as the pattern is repeated.

**Table 8** Comparison of EC (in bits)

| Images | PSNR (dB)[¥] | Sachnev (Rhombus mean) | D&C | CRP (Proposed) | Increment in EC vs second best |
|---|---|---|---|---|---|
| Lena | 48.75 | 65,848 | 65,952 | **66,399** | 447 (+0.67%) |
| Baboon | 48.34 | 21,639 | 21,619 | **22,197** | 558 (+2.57%) |
| Airplane | 49.04 | 95,214 | 95,538 | **95,943** | 405 (+0.42%) |
| Peppers | 48.52 | 40,891 | 40,958 | **41,249** | 291 (+0.71%) |
| Boat | 48.50 | 39,745 | 39,900 | **41,169** | 1269 (+3.09%) |
| Lake | 48.49 | 37,029 | 37,043 | **37,178** | 135 (+0.36%) |
| Barbara | 48.62 | 51,818 | 55,160 | **55,847** | 687 (+1.24%) |
| Elaine | 48.47 | 35,747 | 35,784 | **35,818** | 34 (+0.095%) |
| Average | 48.53 | 48,491 | 48,994 | **49,475** | 481 (+0.98%) |

[¥] ±0.004 dB difference for rhombus, D&C and CRP

The graphs of PSNR versus EC of the proposed scheme against some existing RDH schemes such as Sachnev [8] (IS), Skewed Histogram (SH) [18], IPVO [22], Multi-pass PVO [24], and Location-PVO [28] are represented in Fig. 7 for the eight test images. Experimental are carried out for all the methods by performing exhaustive search both for the group size and the thresholds to obtain the optimal PSNR at a given EC. From Fig. 7, it is evidently clear that the proposed RDH based on CRP provides, in general, better performance in terms of PSNR vs EC than all the aforementioned schemes. This gain in performance is due to: (a) the organization of pixels to achieve high-correlation and (b) the dynamic selection of the embedding strategy based on their characteristics.

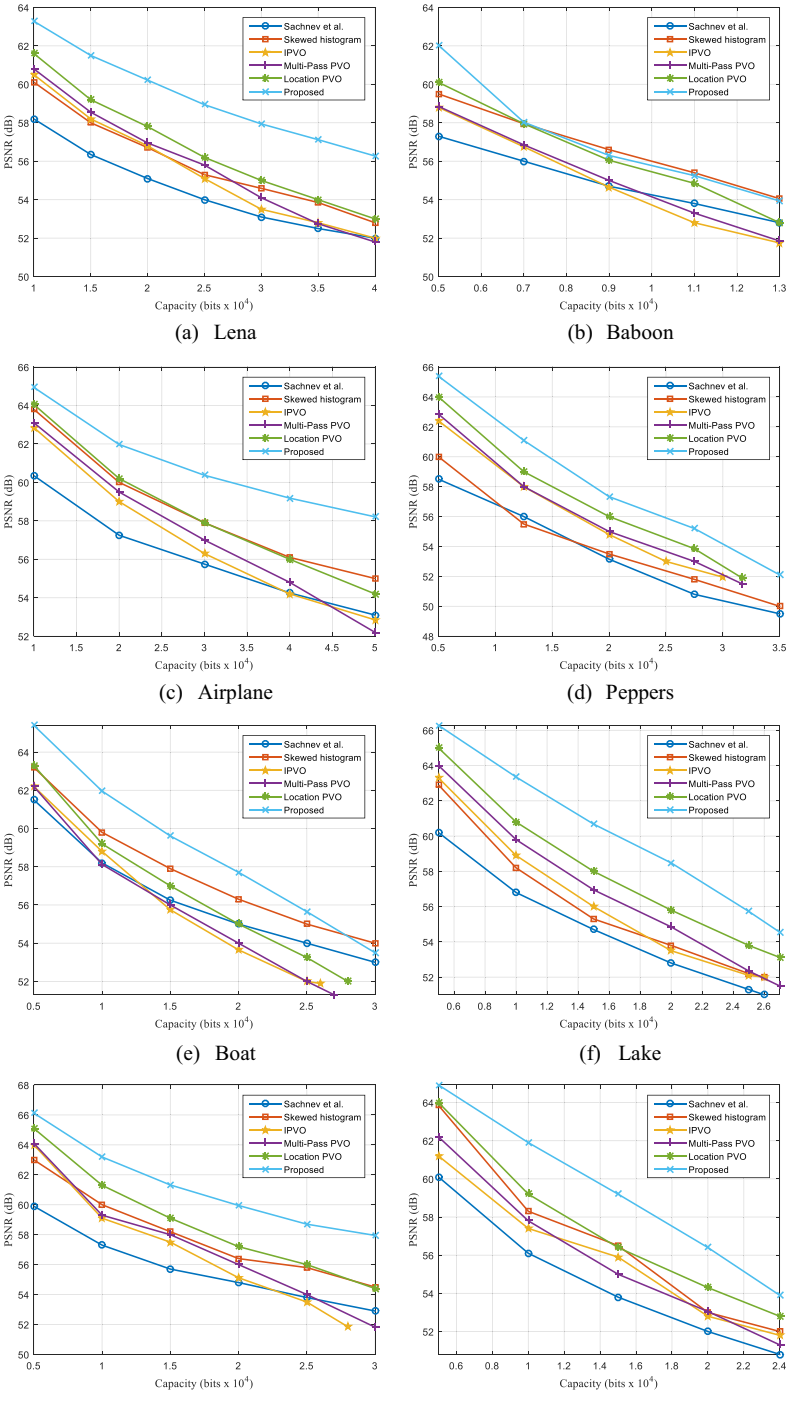
For a more persuasive evaluation, the Kodak color image data set consisting of 24 images of size $768 \times 512$ pixels, has also been considered. Before comparison, the color images are first converted into grey-scale images and data are embedded using the proposed method. The PSNR comparison results at 10 K and 20 K EC with the best performing conventional method, i.e., Location-PVO [28] are given in Fig. 8. It shows that the proposed method is outperforming the Location-PVO for almost all the test images except the image with index 6. This is merely because the Location-PVO [28] is performing much better in this specific case than the other cases; in contrast, the proposed RDH method has consistent performance irrespective of the characteristics of the test images.

### 4.4 Execution time comparison

The performance of the proposed method is also evaluated for execution time comparison. For this, we have considered the average time spend on embedding 10,000 bits in USC-SIPI dataset. The experimental results are provided in the following Table 10. From the Table 10, it can be clearly seen that the method seems to perform slightly better than the Multi-Pass PVO. However, its performance is not comparable with the other SOTA methods such as IPVO, Location-PVO. It is mainly because the method needs to spend considerable time in finding the pixels from the image to form smoother blocks. Though, it later helps slightly when bigger embedding blocks are formed.

**Table 9** SSIM at different EC for Lena image

| EC (in bits) | 5000 | 10,000 | 15,000 | 20,000 | 25,000 | 30,000 | 35,000 | 40,000 | 45,000 | 50,000 |
|---|---|---|---|---|---|---|---|---|---|---|
| Average SSIM | 0.99975 | 0.99975 | 0.99975 | 0.99975 | 0.99975 | 0.99975 | 0.99975 | 0.99975 | 0.99975 | 0.99975 |




(a) Lena (b) Baboon

(c) Airplane (d) Peppers

(e) Boat (f) Lake

(g) Barbara (h) Elaine

**Fig. 7** Graph of PSNR vs EC for the proposed and conventional methods for different test images

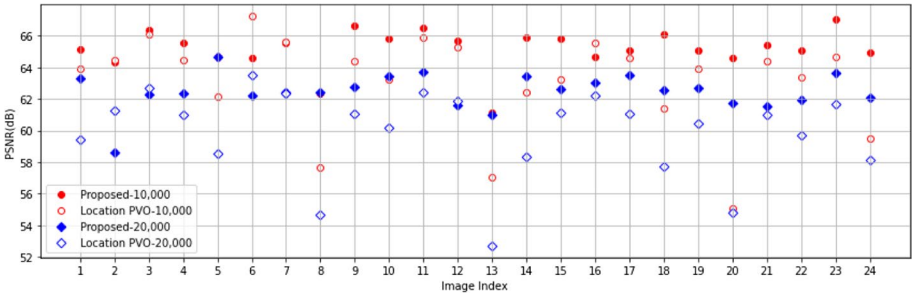



**Fig. 8** PSNR comparison between the proposed method and Location-PVO [28] on the Kodak data set

**Table 10** Average execution time (second) for the EC of 10,000 bits

| Methods | IPVO [22] | Location-PVO [28] | Multi-pass PVO [24] | Proposed |
|---|---|---|---|---|
| Average Time | 3.49 | 4.01 | 7.52 | 7.36 |

## 5 Conclusion

In this paper, a comprehensive rhombus predictor for PEE-RDH methods is proposed. The comprehensive rhombus predictor considers the human visual system and also the horizontal and vertical smoothness while estimating the pixel value. Thus, it is able to predict the original picture values more accurately in comparison to the rhombus mean and the D&C predictors. Additionally, the proposed predictor helps in embedding a larger amount of data when it is used for PEE-RDH purposes. Experimental results show that the method is able to accommodate, on average, an addition of 550 bits in comparison to the conventional methods while preserving the image quality. Although the achieved increment in EC is marginal, it is significant because the increment in EC is attained purely due to higher pixel prediction accuracy. Furthermore, a new RDH scheme is also presented, where it first exploits CRP's capability in arranging the pixels in a highly correlated form and then adaptively applying different embedding strategies based on the pixel's characteristics to exploit the correlation for optimal performance. Experimental results show that the proposed method outperforms the SOTA methods in almost all cases irrespective of image characteristics. In the future work, machine learning and/or deep leaning techniques can be exploited to further improve the prediction accuracy of the rhombus context predictors. Additionally, new embedding strategies can be explored to better utilize the image correlation.

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**Data availability** Data sharing does not apply to this article as used datasets are publicly available.

## Declarations

**Conflicts of interest** This manuscript is the authors' original work and has not been published nor has it been submitted simultaneously elsewhere. There is no copyright issue in all of figures.

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# Implementation of a mobile application for managing academic life of new college students

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# Implementation of a Mobile Application for Managing Academic Life of New College Students

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**Abstract-** College life is an exciting experience for students, but it can also be overwhelming for new students who face numerous challenges. Freshie is a mobile application-based platform that aims to help new college students in managing their academic lives. The objective of this research paper is to explore the features and benefits of Freshie and investigate its impact on new college students' academic success. The paper will discuss the challenges new college students face, including locating important places on campus, managing their time, and keeping track of events and activities. It will also outline the features of Freshie, such as event updates, timetable management, information about student societies, and more, that are designed to address these challenges. To assess the effectiveness of Freshie, a survey will be conducted among a sample of new college students to collect data on their usage and perception of the app. The data will be analyzed using statistical methods to determine the impact of Freshie on academic success. The research paper concludes that Freshie is a promising tool that can improve the academic success of new college students by providing easy access to important information and helping them manage their time effectively. However, some limitations and challenges in the implementation of the app need to be addressed to ensure its effectiveness. Overall, Freshie has the potential to make college life easier, more enjoyable, and more productive for new students.

***Keywords*** **-** mobile applications, academic performance, time management, extracurricular activities, student engagement, information access, event updates, timetable management, interview preparation, and student exchange, android operating system, students

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## INTRODUCTION

The transition from high school to college is a significant milestone in the lives of many young people. It marks a time of exciting new opportunities and challenges, but also a time of uncertainty and stress [1]. For new college students, adjusting to the academic and social demands of college life can be overwhelming, particularly when it comes to managing their time and resources effectively. Many new students struggle with locating important places on campus, accessing notes and links, and keeping track of events and activities happening on campus. This can cause significant stress and negatively impact their academic performance [2]. To address these challenges, this research paper introduces a mobile application-based platform designed to assist new college students in managing their academic life. The app is designed to offer a range of features that aim to simplify the college experience and connect students with the resources they need [3]. By providing easy access to important information and events, the app aims to improve the academic performance of new students and make their college experience more enjoyable. The app is designed with a user-friendly interface based on feedback from student users, making it easy to navigate and use [4]. The objectives of this research paper are twofold: first, to present the design and implementation of the mobile application, outlining its key features and functionality; and second, to assess the impact of the app on new college students' academic performance, learning motivation, and overall satisfaction [5] [6] [7]. The paper will draw upon existing literature and studies that highlight the benefits and effectiveness of mobile applications in supporting students' academic journey. The methodology employed in this research paper includes a combination of quantitative and qualitative approaches. Data will be collected through surveys and interviews with new college students who have used the mobile application. The data will be analyzed using appropriate statistical techniques and thematic analysis to identify patterns and themes related to the app's usability, impact on academic performance, and overall satisfaction.

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The findings of this research paper will contribute to the existing body of knowledge on the role of mobile applications in supporting new college students' transition and academic success [8][9][10]. The results will provide insights into the effectiveness of the app in addressing the challenges faced by new students and offer practical recommendations for further improvement and development of similar mobile applications. In conclusion, this research paper aims to present a mobile application-based platform that offers solutions to the challenges faced by new college students. By providing easy access to information, facilitating communication, and enhancing time management, the app aims to support students' academic journey and improve their overall college experience. The paper will provide valuable insights into the benefits of using mobile applications in higher education and contribute to the ongoing discourse on student support and engagement in the digital era.

## OBJECTIVE OF STUDY

- To investigate the effectiveness of the Freshie mobile application-based platform in helping new college students manage academic challenges.
- To identify the specific challenges faced by new college students and how the Freshie app can address those challenges.
- To explore the user experience and satisfaction with the Freshie app.
- To evaluate the impact of the Freshie app on student engagement and academic performance.
- To provide recommendations for improving the Freshie app and similar platforms to better support new college students.

## LITERATURE REVIEW

Mobile applications have become increasingly prevalent in higher education, offering new possibilities for supporting students' academic journeys and enhancing their overall learning experience. This section provides a comprehensive review of the literature on the impact of mobile applications on college students' academic performance, learning motivation, and overall satisfaction. Numerous studies have demonstrated the positive effects of mobile applications on academic performance and achievement [1][2][3]. These applications have been found to significantly improve students' academic performance and contribute to a reduction in student dropout rates [1]. Moreover, mobile applications have been shown to enhance students' learning motivation and engagement, leading to increased participation in extracurricular activities [5][6][7]. In addition to academic performance, mobile applications have been studied in relation to students' overall satisfaction with their college experience. Research indicates a positive association between mobile app usage and students' learning satisfaction [4]. Specifically, mobile applications designed to assist new university students have been found to effectively address their needs and challenges, resulting in high levels of satisfaction [11]. Furthermore, mobile applications have been designed to support various aspects of college life beyond academic performance. For instance, time management apps have been shown to positively influence students' self-regulation skills and improve their academic performance [8]. Mobile-based campus information systems have been developed to provide new students with easy access to important information and resources, enhancing their satisfaction and overall experience [9]. Similarly, mobile learning platforms have facilitated communication, resource sharing, and collaboration among new college students, resulting in improved engagement and satisfaction [10].

Moreover, mobile applications have been developed to support specific needs of college students, such as counseling, career development, and orientation. These applications have been found to provide convenient access to counseling services, leading to improved support and well-being among students [12]. Additionally, mobile application-based platforms for career development have enabled students to explore career options, access resources, and receive guidance, enhancing their career readiness and satisfaction [13]. Furthermore, mobile applications designed for new students' orientation in college have proven to be effective in facilitating their transition and providing necessary information and guidance [14]. Overall, the literature indicates that mobile applications have a positive impact on college students' academic performance, learning motivation, and overall satisfaction. These applications offer valuable resources, support, and convenience, contributing to an enhanced learning experience and improved student outcomes. The rest of the paper is as follows methodology. In Result and Output, the section shows the output of the implemented platform with its snapshots are shown for more clarity. The last Section highlights the conclusion and future scope.

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## METHODOLOGY

The section discusses the challenges facing new college students and its proposed solution.
Challenges:
Some common challenges that students face in college:

- Lack of information about the college campus, such as the locations of classrooms, libraries, and how to join student societies and clubs.
- Difficulties with preparing for exams and getting good grades, which can lead to stress and anxiety.
- Uncertainty about how to prepare for a career or find job opportunities after graduation.
- Challenges with managing time effectively, especially with increased academic demands and extracurricular activities.
- Difficulty with adjusting to a new environment and making new social relationships.
- Problems with finding suitable accommodation, such as a hostel or PG, and figuring out which one is right for them.
- Limited access to important links and information about college events and activities.

**Proposed Solutions**

- The app being developed aims to provide solutions to the various challenges that new college students face.
- Lack of information about events: The app may provide information about the latest events in college, regularly updated by an admin to ensure students have access to up-to-date information.
- Difficulty in joining student societies: The app will have a feature that connects with each society and provides information about the society, including how to join. This will make it easier for students to access information about societies and become a part of them.
- Lack of preparation for interviews: The app can give a feature that provides interview experiences of students to help others prepare for interviews.
- Time management: The app may provide a timetable feature that can help students to manage their time effectively and stay on top of their schedule.

By providing these solutions, the app aims to simplify the college experience and help new students adjust to college life more easily.

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## SYSTEM REQUIREMENTS

This section highlights the software and hardware requirements for the implementation of app.
Software and Tools requirements:

- Android Studio and X-Code development environments.
- Flutter SDK tool -version 3.
- Minimum SDK version - 16(Jelly Bean) and target version - 33(latest) .
- Flutter Doctor tool for diagnosing and fixing issues with the Flutter installation.
- Dart programming language for developing Flutter apps.
- Three types of emulators for testing apps - 5.5, 5, and 6.3 inches screen sizes.
- Firebase as the database, including Cloud Firestore, Realtime Database, and Firebase Storage.

Hardware requirements:

- 8 GB RAM for smooth performance.
- 256 GB SSD for storage and faster app development.
- Windows 10 as the operating system.
- i3 6th generation processor or better for faster compilation and running of the app.

## DATA FLOW DIAGRAMS

The data flow diagram (DFD) is a crucial component of the Freshie app's design and development process. It provides a clear visual representation of the system's data flow and highlights potential areas for improvement or

optimization. The DFD for the Freshie app depicts the flow of data between different modules and subsystems, starting from the user input stage to the final output stage. The diagram is divided into different levels, with each level providing more detailed information on the system's functions and processes. By analyzing the DFD, developers can identify inefficiencies, redundancies, or areas for improvement and make the necessary changes to enhance the app's functionality and performance. DFD Level 0 represents the overall system and shows the main processes in the system. In the given scenario, DFD Level 0 represents the Freshie system (Fig 1.), which includes the User and Admin as the main processes. The User can access Freshie to manage their academic life, while the Admin has access to manage the system, such as updating the database.

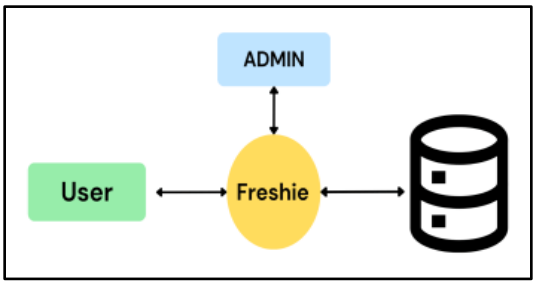


**FIGURE 1**. Zero level DFD

In DFD 1, the main Freshie module is further broken down into smaller modules such as Authentication Management, Societies, Quick Links, and Interview Experience. These modules are connected to the Freshie database, and users can access them based on their privileges.

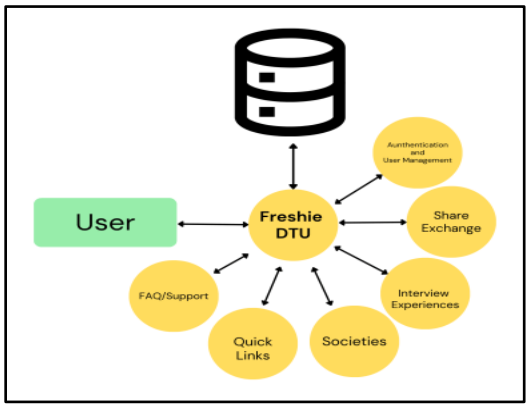


**FIGURE 2.** First-level DFD

The level 2 data flow diagram (DFD) of the Freshie app provides a more detailed view of the processes involved in the system. It shows the sub-processes that make up each of the high-level processes in the level 1 DFD. The level 2 DFD of the Freshie app includes sub-processes for user registration, login, profile management, course enrollment, event management, society management, and other essential functionalities. The registration sub-process involves user registration and validation, and account creation. The login sub-process includes user authentication, and password reset functionalities. The profile management sub-process deals with user information management and updates. The course enrollment sub-process involves viewing available courses, adding, or dropping courses, and course schedule management. The event management sub-process includes event creation, approval, and publishing, along with event registration and attendance tracking functionalities. The society management sub-process involves society creation, approval, and publishing, as well as society membership management. Overall, the level 2 DFD provides an in-depth understanding of the various processes involved in the Freshie app and how they interconnect with each other to provide a seamless user experience. Figs. 1-3 show the data flow diagram of the implemented app. The complete description is shown below:

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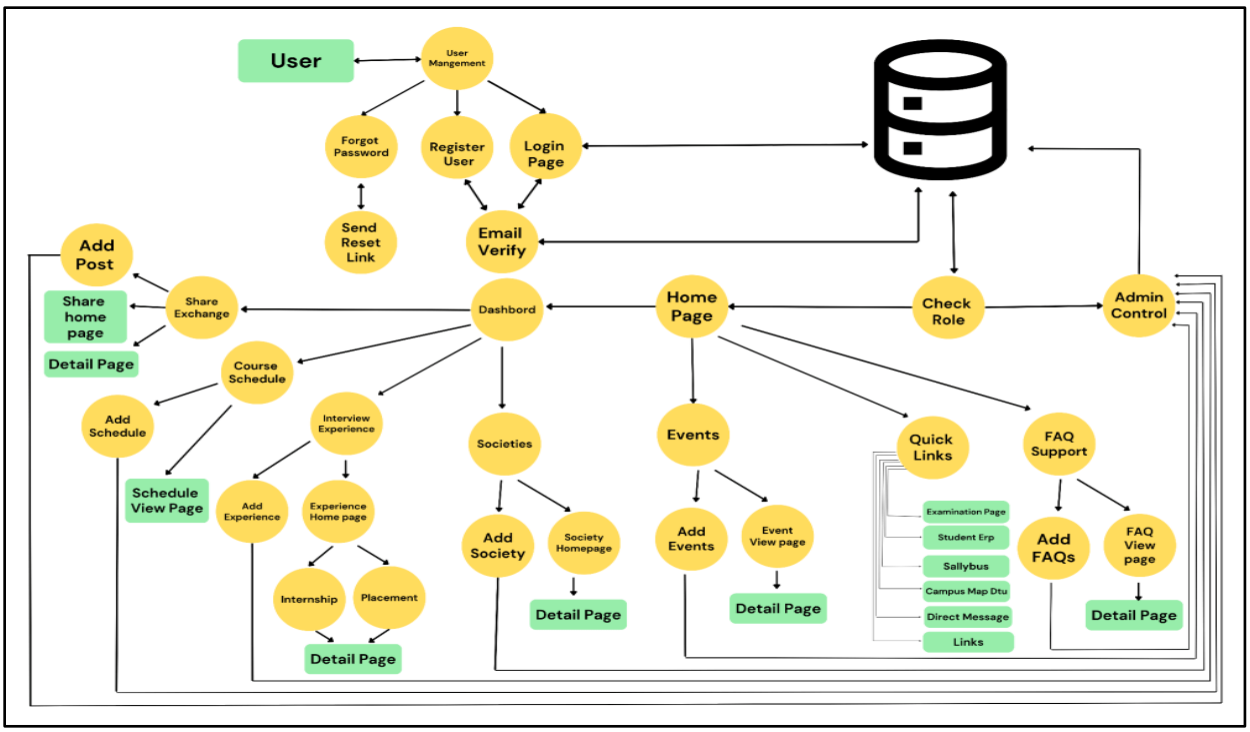


**FIGURE 3**. Proposed Second-Level DFD

## DESIGN AND IMPLEMENTATION

The application was designed with a user-friendly interface to provide easy navigation for new students in college. The design included several modules, such as a homepage, society page, timetable, notes, important links, events, and profile page. The application also included several buttons on the bottom navigation bar for easy access, including a home button, event button, college button, and FAQ button. The design and implementation of each module were based on the requirements identified through user research and feedback. The society page, for example, allowed students to view and join different societies in the college, as well as contact them. The timetable module helped students manage their classes and schedule, while the Exchange or share module provided a platform for students to exchange or share items with their classmates. The Quick link module contains links to important resources such as the college website, library portal, and placement cell. The events module displays all the events taking place in the college and allows students to register for them. Lastly, the profile page allows students to manage their personal information, view their academic records, and connect with other students.

## MODULE: AUTHENTICATION

### Login

The login module is an essential part of the app that allows registered users to access its features. The snapshot of the page is shown in Fig. 4. Users can enter their login credentials, including their email and password, on the login page. The app will then verify these credentials against the database, and users will be directed to the homepage if they are correct. If users enter incorrect details, they will be prompted to re-enter them, and there will be a limit on the number of failed login attempts to ensure app security. The app will also use encryption to store and transmit sensitive data, like passwords.

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## Registration

The Registration module is a crucial part of the mobile application designed for new college students to manage their academic life. It collects user data such as full name, roll number, branch, and semester, date of birth, contact number, email (college ID), and password. . The snapshot of the page is also shown in Fig. 4. The system verifies the email entered by the user to ensure that it is a valid college ID. After all the required fields have been entered correctly, the system creates a unique ID for the user and stores all the data in the database. To ensure the security of user data, the system requires authentication and authorization of the user every time they want to access the platform by entering their login credentials. The system verifies the entered email and password against the data stored in the database and allows access only if the credentials are correct.

**FIGURE 4.** Login & Registration Pages

## Remember me

The "Remember Me" feature is included in login forms to allow users to stay logged in even after closing and reopening the platform or website. The platform also includes this feature in the login module, saving user credentials in a cookie that contains an encrypted token with an expiration date. This feature saves users time and effort but increases the risk of unauthorized access if the device is lost or stolen. A warning message will remind users to use this feature only on their personal devices and log out on shared or public devices.

## MODULE: COURSE SCHEDULE

Timetable management is a crucial aspect of college education that can often be challenging for students to manage effectively. The snapshot of this page is shown in Fig. 5. In order to address this issue, our web and mobile application-based platform include a feature designed to help students manage their timetables. This feature is designed to enable students to create and manage their own timetables with ease, allowing them to keep track of their classes and schedules efficiently. Description of Feature: The timetable management feature of our web and mobile application-based platform is designed to make it easier for students to manage their schedules effectively. Students can use the dropdown button to view their timetable for a specific day and the edit button to modify any course details, such as the course name, time, room number, and class type. Additionally, the add button allows students to input course information, including the course name, time, room number, class type, and faculty name. The course name and time fields are mandatory. Overall, this feature provides students with a helpful tool to manage their education, create timetables, edit them effortlessly, and track their schedules efficiently, thereby contributing to their success in college.

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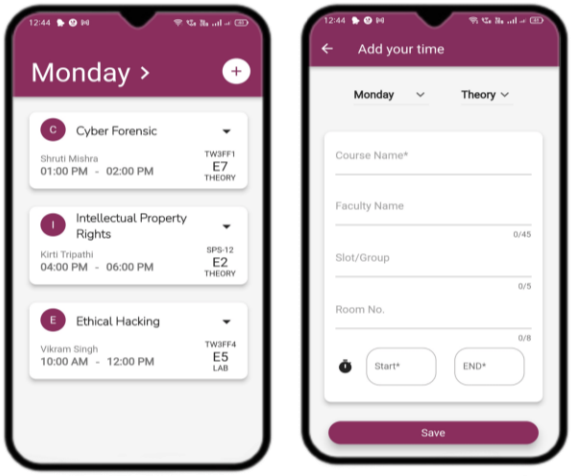


**FIGURE 5.** Course Schedule & Add Schedule Pages

## MODULE: INTERVIEW EXPERIENCE

The interview experience module is a feature of an app that enables students to share their experiences during placement and internship interviews with various companies. The snapshot of this page is shown in Fig. 6. It allows them to share their interview experiences by answering relevant questions, such as the number of rounds, time duration, and types of questions asked in the interview. The module also contains a list of companies, and each company has two sections: an internship section and a placement section, which contain the experiences of the students. The module is designed to help students prepare for interviews by providing them with relevant information about the interview process. Design and Implementation: The interview experience module is implemented by using a user interface that contains a list of companies, each with two sections: an internship section and a placement section. Each section contains the experiences of the students who have gone through the interview process. When a student clicks on a specific company, they are directed to the company's page, where they can view the experiences of the students who have interviewed with the company. The user interface also includes an add button that allows students to share their interview experiences. When a student clicks on the add button, a post opens, and they are prompted to answer questions about their interview experience. After completing the questions, the student can click the post button to share their experience. The team of the app reviews the post and shares the final post on the app.

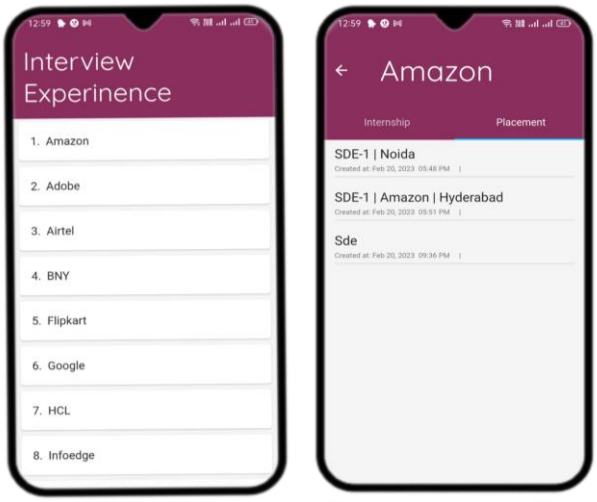


**FIGURE 6.** Interview Experiences page

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## MODULE: EXCHANGE OR SHARE

The Exchange or Share module enables users to buy, sell, or rent items such as books, notes, and drafter equipment. The snapshot of this page is shown in Fig. 7. Additionally, users can also request items they need. To ensure security and prevent fraud, a few details of the user, such as their roll number and name, are shared in the item's description. This feature is designed to help users gather and share resources in a safe and secure way.

Features:

Browse Posts: Users can view a list of posts for items that are available for sale, rent, or request by clicking the "Exchange" button. Each post contains information such as the caption, description of the item, price, and whether it is available for rent or sale. User details such as name, roll number, profile picture, and contact information (phone and WhatsApp) are also visible in each post.

Add Post: Users can add a post by clicking the "Add" button on the main exchange page. A new page will open where the user can enter details such as the item's image, title, caption, and description. Once the user has entered all the necessary information, they can post it.

User Post Color: User-posted posts are highlighted in a different color, making it easy for users to identify their own posts among the others.

Module Benefits: The Exchange or Share module makes it easy for users to share resources such as books, notes, and drafter equipment. Users can conveniently buy, sell, or rent items they need without having to leave the app or search for resources elsewhere. Overall, the Exchange or Share module provides a safe and secure platform for users to exchange resources, promoting community building and supporting students in their academic pursuits.

## MODULE: SOCIETY - A FEATURE TO CONNECT STUDENTS WITH COLLEGE SOCIETIES

The Society feature is designed to help students connect with different societies present in their college or university. This feature provides students with information about different societies, including their description, pictures, and social media links. Additionally, students can send a request to join a society by filling out a form that will be reviewed by the society team.

Main Functionality: The main page of the Society feature displays a list of all the societies present in the college or university in the form of image icon clickable buttons. Each society button contains information about the society, their social media links, and a Joining button. Pressing the Joining button opens a form that needs to be filled out by the student. The form contains fields such as name, email, contact number, and a message. Once the form is submitted, it is reviewed by the society team, and they contact the student accordingly. the Society feature is an essential tool that enables students to connect with different societies present in their college or university. This feature makes it easier for students to explore their interests and find societies that align with their passions. The Society feature is controlled by a super-admin who ensures that the information about the societies is accurate and up-to-date. Overall, this feature provides a valuable resource for students and enhances their college experience.

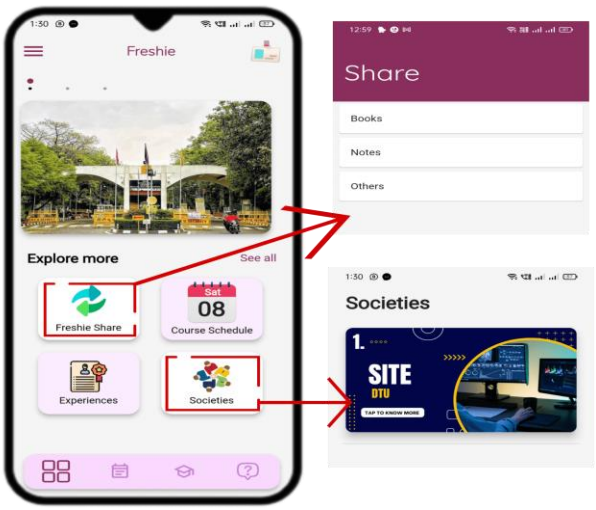


**FIGURE 7.** Share & Society pages.

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## MODULE: EVENT

This feature provides students with information about the latest and upcoming events in college or university, including college fests, technical fests, sports festivals, orientations, and any other important updates regarding events. The snapshot of this page is shown in Fig. 8. The purpose of this feature is to keep students informed and up-to-date about all the events happening on campus.

Working of Feature: Upon clicking on the Event button, users will be directed to a page where they can view a list of upcoming events. Each event will contain information such as the name of the event, date, time, venue, and a brief description of the event. Users can also click on the event to view more detailed information about the event, such as the schedule, guest speakers, sponsors, and registration details. In addition, there will be an Add Event button on the main page where authorized users (admin) can add new events to the list. Users will need to fill in the required information, including the name of the event, date, time, venue, and a brief description of the event. Once the event has been added, its post will be displayed on the event page at first (the event page will be updated like a stack). Admins can delete or edit their posts and create new posts

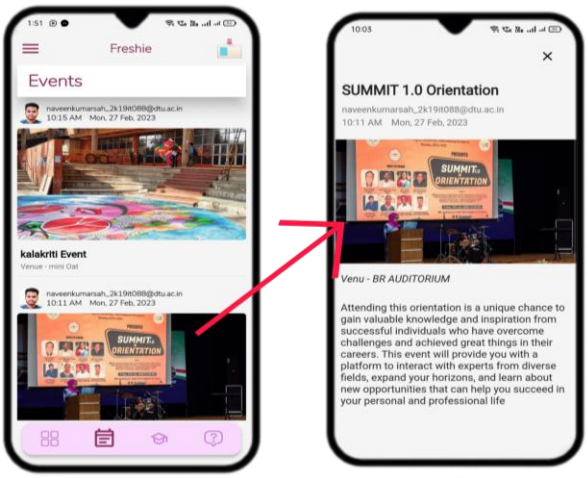


**FIGURE 8.** Event page

## *Module: Quick Link*

In today's digital age, having easy access to information is crucial. Students, in particular, require quick and easy access to important links related to their college or university. The Quick Link feature is designed to provide a comprehensive list of all the necessary links important for students, including links to the college website, MHRD, and other important resources.

Features: The Quick Link feature is accessible from the main page of the app, making it easy for students to find. Once accessed, there is a list of important links presented to the user. The links are categorized to make it easier for students to find the information they need. The links available in this feature include the college website link, MHRD link, student portal link, library link, and other important resources. The links are updated regularly to ensure that students have access to the latest information.

Working of Feature: Once the user clicks on the Quick Link feature, they will be presented with a list of all the important links. They can click on any link to access the relevant website or resource.

Super-admin has control over this feature and can add or remove links as needed. This ensures that the links provided are up-to-date and relevant to the users.

The Quick Link feature is an essential part of any college or university app, providing quick and easy access to important links and resources. The snapshot of this page is shown in Fig. 9. By providing this feature, students can save time and effort in finding the information they need. With regular updates and control by super-admin, this feature ensures that students have access to the latest and most relevant information

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## MODULE: MESSAGE WITHOUT SAVING CONTACT NUMBER

The "Message Without Saving Contact Number" feature allows users to directly send messages to a contact by entering their phone number into the messaging app. The feature eliminates the need to save the contact number. This feature is especially useful for students who frequently visit shops or other places where they need to share documents or information with the vendors or shopkeeper, but do not want to save their phone number in their contact list.

Functionality: The feature can be accessed directly from the messaging app. To send a message to a contact without saving their phone number, the user simply needs to enter the contact's phone number in the messaging app's search bar, and the contact's profile will appear. The user can then start sending messages to the contact directly without saving their phone number.

The "Message Without Saving Contact Number" feature is a useful addition to messaging apps that can simplify the process of sending messages to contacts without saving their phone numbers. This feature is particularly useful for students who frequently visit shops or other places where they need to share documents or information with the owner without saving their contact number. Overall, this feature provides users with added convenience, privacy, and a clutter-free contact list.

## MODULE: FAQ

An FAQ (Frequently Asked Questions) feature can be a valuable addition to a mobile app or website, as it can provide users with quick and easy access to commonly asked questions and their corresponding answers. Here are some features that can be included in an FAQ section: Categorization is a crucial aspect of any FAQ section, and questions and answers can be effectively grouped under relevant topics such as account management, academic-related queries, and for placements and internships. This approach can enhance user experience by enabling them to find the information they need quickly without having to sift through irrelevant content. Including links to related content can also prove beneficial, especially when answers to certain questions require additional information that can be found elsewhere on the app or website. This can help users find more in-depth information and can make the app or website a go-to resource for users seeking relevant and reliable information. User-generated questions are also essential for the success of the FAQ section. Users can submit their questions, which can be reviewed by the app administrator and added to the FAQ section if they are relevant and useful. This feature can help to ensure that the FAQ section remains relevant and up-to-date.

FAQ updates are also essential to ensure that the section remains current and relevant. Regular updates with new questions and answers can help to keep the app or website user-friendly and informative. Clear and concise language is another important aspect of the FAQ section. The language used in the questions and answers should be easy to understand and written in a concise manner to avoid confusion. This can help users quickly find the information they need and reduce the likelihood of misinterpretation or misunderstanding.

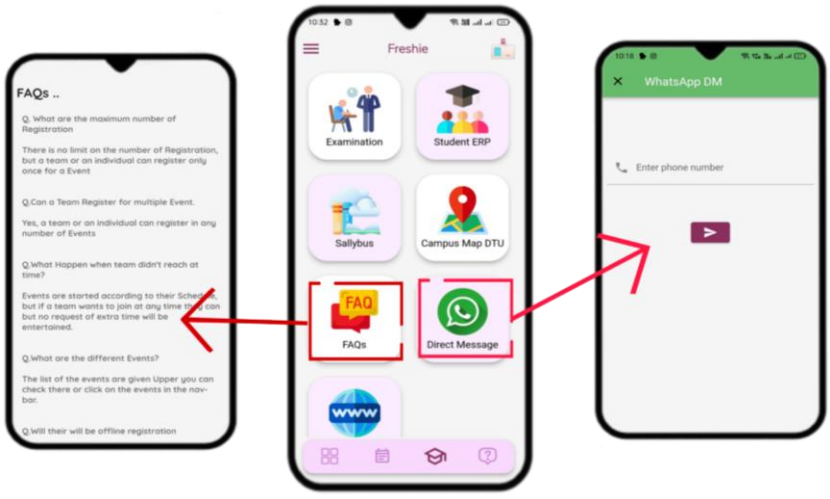


**FIGURE 9**. Quick Link Page offers various features (This figure also shows FAQ and Message Without Saving Contact Number Module's result)

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## RESULTS AND OUTPUTS

In the results section, included screenshots of various pages of the Freshie app to visually demonstrate its interface. When a user opens the app, they are initially directed to the login page. If the user is new to the app, they can create an account by navigating to the registration page. Additionally, there is a reset password page available in the event that a user has forgotten their login information and needs to reset their credentials. This information is presented in Fig. 4. Upon successful user authentication, the primary landing page of the application is displayed. The Freshie app's home page offers convenient access to various features, including the course schedule, Freshie Share, Interview Experiences, and the Societies button. Users can access these features easily on the home page after logging in. Additionally, the bottom navigation bar provides quick access to other features such as the Events section, Quick Links, and Help section. A detailed visual representation of these features is provided in Fig 10.

In the Freshie app's home page, users can access a range of features, including:

- Course Schedule: This button (Fig 5.) displays the timetable of the user for a particular day, making it easier for students to keep track of their classes.
- Freshie Share: This button (Fig 7.) is a platform for students to share and view notes, resources, and study material related to their courses, helping them to collaborate and learn together.
- Interview Experiences: This button (Fig 6.) provides access to the interview experiences of other students, allowing users to learn about the interview process, common questions, and other important information related to job interviews.
- Societies: This button (Fig 7.) provides information about the various societies and clubs on campus, allowing users to learn more about them and join the ones they are interested in.
- Profile: The Freshie app includes a Profile button located in the top right corner of the home page, allowing users to access their profile page as shown in (Fig 11.) This page displays all the information that the user entered while registering to the application in detail.
- Menu drawer: The menu drawer in the Freshie app provides quick access to important features such as the user's profile, settings, notifications, and other useful sections like logout sessions, etc (Fig 10.). It is a convenient and accessible way for users to navigate through the app and access necessary information.
- The Events button on the navigation bar of the Freshie app offers current and upcoming event details to users, allowing them to easily participate in university or organizational activities. The Quick Link button also provides quick access to app features such as examinations, syllabus, campus map, student portal, and frequently asked questions. For visual reference, see Figure (8,10) which shows the Events page, and Figure (9,10) which displays the Quick Link button.
- The final button in the navigation bar of the Freshie app is the Help button, which serves to assist users with any concerns or issues they may have. This feature contains helpful links, contact information, and other relevant information such as frequently asked questions (FAQs) in order to provide users with assistance and guidance. See Figure (10) which shows the help section page.

**FIGURE 10.** The primary landing page of the application upon successful user authentication.

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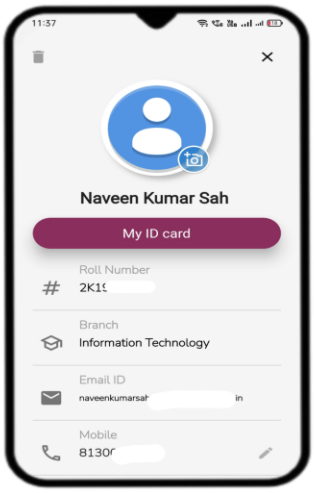


**FIGURE 11.** User Profile Page

## SYSTEM EVALUATION

Advantages of Freshie mobile application-based platform:

- Provides an all-in-one solution for managing academic life challenges faced by new college students.
- Helps in effective time management by providing a personalized timetable and reminders for events.
- Simplifies campus navigation by providing a map with the locations of classrooms, libraries, and other important places on campus.
- Facilitates access to notes, links, and information about student societies and events happening on campus.
- Connects students with each other and the resources they need to make the education experience more enjoyable and accessible.

Disadvantages of the Freshie mobile application-based platform:

- Requires a mobile device and an internet connection, which may not be available to all students.
- Potential technical issues such as app crashes, slow loading times, and compatibility issues with certain devices or operating systems.
- Privacy concerns related to the collection and use of personal data by the app.
- Dependence on the app may reduce the development of critical thinking and problem-solving skills.
- May create a digital divide between students who have access to the app and those who do not.

## CONCLUSION AND FUTURE SCOPE

In conclusion, the software application discussed in this research paper has the potential to greatly benefit college students. The app's features, including timetable, society information, event updates, quick links, and message without saving number, provide a comprehensive and user-friendly platform for students to navigate their college life more easily. The app's user interface is intuitive, making it easy for students to access the information they need quickly and efficiently. The ability for authorized users to add and manage content ensures that the app remains up-to-date with the latest college news and events. Furthermore, the app's future scope suggests that it has the potential to grow and evolve with the needs of college students. By incorporating features such as hostel or PG lists, senior interaction, and previous paper, assignment, and notes sections, the app can become an even more valuable tool for students. Overall, the software application discussed in this research paper has the potential to greatly enhance the college experience for students by providing a centralized platform for important information and updates. As technology continues to play a crucial role in education, apps like this can provide a more streamlined and efficient way for students to navigate their academic lives.

In the future, the app could include new features such as a hostel or PG list for finding accommodation, a senior interaction section for guidance and support, and a section for previous papers, assignments, and notes. Transferring the app to a cloud platform would also make it more accessible and easier to update. Improving user interaction and

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the app's overall design are potential areas for improvement, such as adding discussion forums or chat rooms. By incorporating new features and improvements based on user feedback, the app can continue to be a valuable resource for students in the future. Finally, increasing user interaction and creating an attractive user interface are also potential areas for improvement. This could include adding more interactive features, such as discussion forums or chat rooms, and improving the app's overall design and aesthetics. Overall, there is a lot of potential for the future development of the app, and by listening to user feedback and incorporating new features and improvements, it can continue to be a valuable resource for students in the years to come.

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# Investigating Seismic Vulnerability in Buildings with Plan Irregularities

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**Abstract:**

This study aims to investigate the seismic behaviour of structures with vertical irregularities. The project employs Response Spectrum Analysis (RSA) to assess a vertically irregular reinforced concrete (RC) building. The investigation encompasses the modelling of both a regular and an H-shaped plan irregular building, excluding the ground floor, resulting in a G+7 storey structure. The seismic response of the framed building under consideration during simulated earthquake motions is influenced by the distribution of stiffness, strength, and mass in both horizontal and vertical planes. The primary objective of this research is to conduct a study of the structure's stiffness by examining Regular Structure and Plan Irregular Structure, each with different vertical irregularities. The entire set of building frames is modeled and analysed using Staad.Pro V8i software, and various seismic responses such as base shear, frequency, and node displacement are obtained.

## 1. Introduction

Previous earthquake incidents have demonstrated that structures featuring uncomplicated and consistent configurations tend to experience lower levels of damage. Conversely, buildings characterized by discontinuities face the concentration of forces and deformations at these points, potentially resulting in the failure of members at the junction and, ultimately, the collapse of the entire structure. The analytical approach used to quantify earthquake forces and assess their impact depends on factors such as the structure's significance and cost. Consequently, the method of structural analysis ranges from linear to nonlinear, adapting to the specific demands of the situation. Addressing disasters has traditionally fallen within the purview of management experts, government, and semi-government agencies, with engineers primarily engaged in retrofitting and strengthening structures post-disaster. However, the escalating frequency of disasters globally has prompted a shift in focus, leading to increased awareness among engineers, architects, and the general public. This awareness has given rise to various mitigation and prevention strategies.

While international codes now encompass a broader spectrum of disasters, the existing literature predominantly delves into individual aspects of each calamity. Guidelines for earthquake analysis and design have become more standardized, but there is a notable absence of a universal protocol for other disasters like wind, fire, or flood. The challenge lies in handling the

intricate dynamics of real-time forces generated by these disasters.

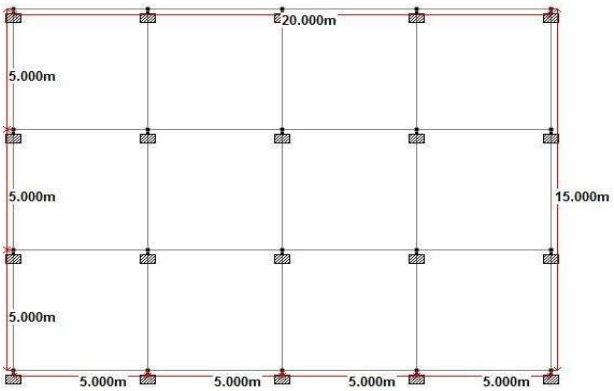
Proprietary software, while widely used, offers limited flexibility to incorporate specific aspects of disastrous forces. Furthermore, these software solutions often require substantial modeling efforts, and the assurance of a robust model representing real-life scenarios can be challenging. Nonlinear static analyses using a finite element program reveal that setback significantly impacts building performance. Seismic fragility is most evident from setback levels 1 to 4, with notable differences in damage probabilities. For a 50% setback, the probability of damage increases by 12.19%, 30.85%, 37.03%, and 41.16% for slight, moderate, severe, and complete damage states, respectively. Structures with a setback on the fourth floor exhibit poor seismic performance, indicating a high probability of damage [1]. Examines a nine-story reinforced concrete building in Bucharest, designed as a dual system (wall-frame). It assesses plan regularity according to three codes (Eurocode 8, ASCE 7-16, and Romanian seismic design code). Nonlinear static and dynamic analyses reveal seismic behavior, emphasizing the impact of overall torsion on parameters like interstory drifts and vulnerability index [2]. The N2 method, proposed [3] and incorporated into Eurocode 8, is a key nonlinear static approach in the literature. Past studies indicate the reliability of nonlinear static analysis when a building's seismic response is mainly influenced by a single mode of vibration. This holds true for symmetric low-rise structures [4] or those with substantial torsional stiffness [5].

Study conducted rapid visual screening to assess seismic vulnerability of 500 buildings in Northern and Eastern George Town, Malaysia. Modified FEMA-154 (2002) method is applied using data from online sources like Google Maps. Results indicate an immediate need for seismic mitigation, with 90% of buildings requiring detailed analysis. Most buildings are predicted to experience moderate-to-substantial damage. The study's findings are shared with the public through a GIS map, "RVS Malaysian Form-George Town Area," generated using ArcGIS [6]. It examines two types of irregularities—plan irregularity with geometric and diaphragm discontinuity and vertical irregularity with setback and sloping ground. These irregularities follow IS 1893 (part1)2002 code. The paper uses analytical approaches to assess seismic demands in both linear and nonlinear methods, considering three lateral load patterns in pushover analysis [7]. Both literature and software fall short in providing engineers with a mechanism to address their customized needs or to study the effects in a post-processor beyond tabulated or two-dimensional graphical outputs. Additionally, there has been a notable absence of attempts to mirror outputs in a virtual environment that accurately reflects the actual behaviour of buildings in real-life situations. This emphasizes the need for a more comprehensive and adaptable approach to disaster management in the realm of structural engineering. The primary objective of this study is to ascertain the seismic capacity of reinforced concrete framed buildings, differentiating between those with regular plans (rectangular) and those with irregular plans following the guidelines outlined in IS 1893-2002. Specifically, the irregular plans include configurations such as L, U, T, and H shapes. This evaluation will be conducted through the utilization of Response Spectrum Analysis, a method that enables a comprehensive understanding of the structures' response to seismic forces, thereby contributing to a more robust understanding of their seismic resilience and performance.

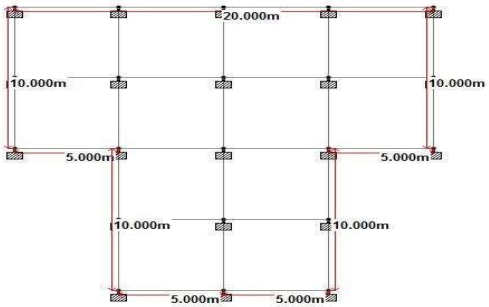
## 2. METHODOLGY

The present study is concerned with analysing seismic behaviour of Regular and Irregular buildings. In the

present study two methods namely Equivalent static method and Response spectrum method are used to study the seismic response of irregular buildings using STAAD.Pro software. The geometry in plan is in figure 1 while the figure 2 is representing the elevation of regular shape model in elevation.




Building with regular plan shape




Building with T plan shape

Figure:1 Building with various Plan shape

## 3. RESULTS AND DISCUSSIONS

Procedure of Analysis building using Staad.Pro

Step 1: Choose type of structure, name the file then file location and unit, Select the type of structure. The type of structure used in this research is 3D building frame. A title can be put for the file. Make sure that the length unit is in meter and the force unit in kilo Newton. Click Next. Make sure the Add Beam is checked. Click Finish.

Step 2: Modelling the geometry of building Click on the Geometry tab. Set the coordinate system in X-Y plane. Click on Beam tab. Insert the required coordinates in the Nodes table. From the top menu bar of Geometry, choose add beam command to add member between required nodes. Continue the process until obtaining a required building elevation. Go to the Geometry command and choose Translational Repeat command to get a 3-D building shape.

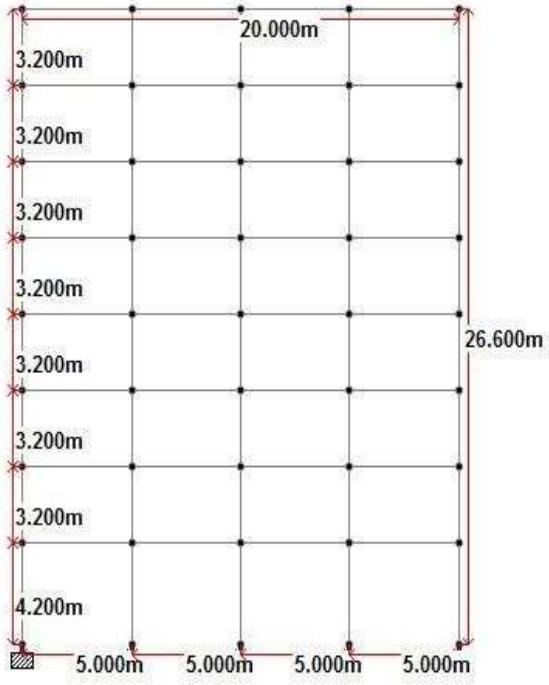
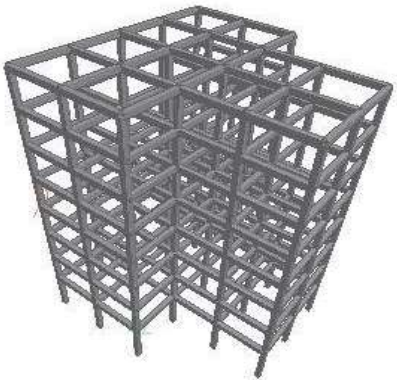



Figure:2 Building in Elevation

Step 3: Assigning section properties and material Choose the General tab and choose the property option. Choose the Define command in dialog box of Property and select material as concrete and type of section as square and insert cross-section dimension as 0.4×0.4m. In the table of property, highlight the section selected and choose Assign to View option.

Step 4: Assigning supports In the General tab choose the support option. In the dialog box of support click on Create option. Choose the Fixed support and Add. Highlight the required support in the Support dialog box and choose Assign to Selected Nodes, click Assign. Click on nodes where required to add support

. Building with regular plan shape

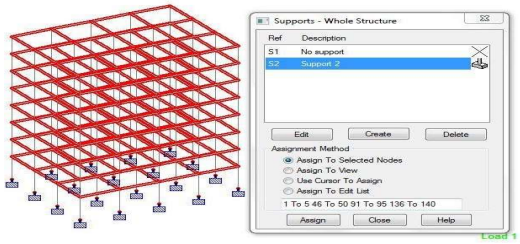


Building with T plan shape

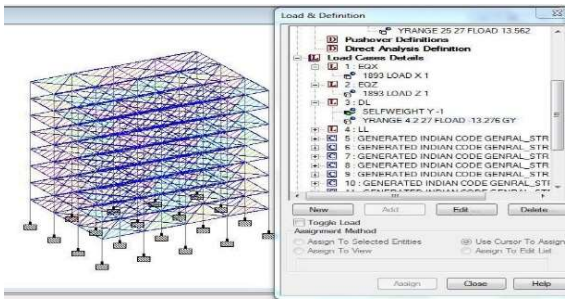
Figure:3 Building in 3D view in STAAD Pro

Step 5: Assigning loadings Still in the General tab choose Load & Definition option. Click on seismic definition and enter the values of zone factor, response reduction factor, importance factor, type of soil, type of structure and damping ratio. Still in seismic definition, enter the values of dead load and live load at different floor levels. Create new primary load case; give the title of load (Seismic Load, Deal Load and Live Load

respectively). Enter the values of seismic Load, deal Load and live Load and different floor levels. For load combinations select Define Combinations in Load Case Details command. Enter the values of factors for different loads as per IS specifications.




Dead Load to the Building Model




Load Cases to the Building Model

Figure:4 Load Case in STAAD Pro

Analysis of models using STAAD.Pro

1: Analyzing building models Click the Analysis/Print tab, Select Perform Analysis option. Choose No Print. Click Add. Select Post Print option and click on Define Commands. A dialog box will appear from which select Joint Displacement option, Member Forces option, Support Reaction option, Mode Shapes, Storey Drift and Analysis Result option and add all of them. In the top menu bar of Analyze, choose Run Analysis. Click Run Analysis for STAAD Analysis.

Step 2: View results of analysis To view the output results, choose view output file option. Click on Results option and view results by selecting Eigen solution, Mass Participation Factors, Analysis Results for various parameters.

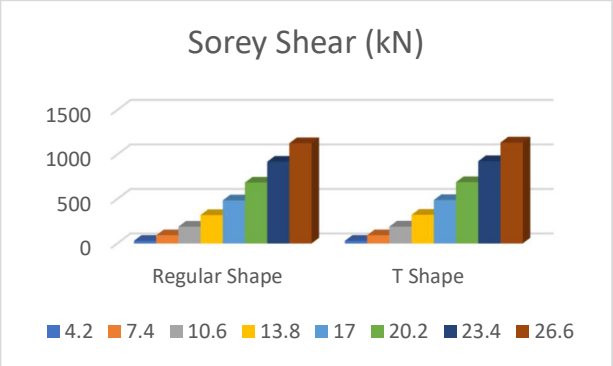



Figure:5 Story Shear with height for Regular and T shape model

Table:1 Observation for the regular shape model

| Height (m) | Max Drift X(cm) | Max Drift Z(cm) | Avg. Dis. X(cm) | Avg. Dis. Z(cm) |
|---|---|---|---|---|
| 4.2 | 5.159 | 5.1602 | 5.159 | 5.1602 |
| 7.4 | 3.7234 | 3.7286 | 8.8824 | 8.8895 |
| 10.6 | 3.5902 | 3.5997 | 12.4726 | 12.4891 |
| 13.8 | 3.4341 | 3.4772 | 15.9067 | 15.9363 |
| 17 | 3.1511 | 3.1671 | 19.0578 | 19.1034 |
| 20.2 | 2.7074 | 2.7257 | 21.7652 | 21.8292 |
| 23.4 | 2.0737 | 2.0939 | 23.8389 | 23.9231 |
| 26.6 | 1.257 | 1.2751 | 25.0959 | 25.1982 |

Table:2 Observation for the T shape model

| Heigh t(m) | Max Drift X(cm) | Max Drift Z(cm) | Avg. Dis. X(cm) | Avg. Dis. Z(cm) |
|---|---|---|---|---|
| 4.2 | 5.3013 | 5.4082 | 5.3013 | 5.4082 |
| 7.4 | 3.7607 | 3.9275 | 9.662 | 9.3358 |
| 10.6 | 3.6177 | 3.7909 | 12.6797 | 13.1266 |
| 13.8 | 3.4548 | 3.6296 | 16.1345 | 16.7563 |
| 17 | 3.1645 | 3.3339 | 19.2989 | 20.0902 |
| 20.2 | 2.7124 | 2.8683 | 22.0113 | 22.9586 |
| 23.4 | 2.0682 | 2.2019 | 24.0796 | 25.1604 |
| 26.6 | 1.2381 | 1.3347 | 25.1377 | 26.5051 |

Figure 3 illustrates the 3D representation of the building in STAAD Pro for both models, while Figure 4 showcases the consideration of dead load and various load cases in the building model's analysis using STAAD Pro. The storey shear (in kN) is depicted in Figure 5 for both the regular and "T" shape models, revealing an increase in storey shear with the building's height. Table 1 provides an overview of observations made during the analysis of the tall building model with a regular-shaped high-rise structure. Additionally, Table 2 presents various data related to the analysis of the "T" shape building model in STAAD Pro, including maximum drift in X and Z directions, as well as average displacement in X and Z directions concerning the building's height.

## 4. CONCLUSION

In the present paper an analytical investigation of both regular and irregular shaped building is carried out using response spectrum method.

It is performed on the building model G+7 storey of different shapes to study and identify the seismic behaviour of the building.

- With increasing irregularities in a building, the base shear decreases while displacement remains constant compared to a regular building.
- In this analysis, it is observed that if the height and plan area of a building remain constant, the maximum displacement of the building is influenced by the building's orientation and the percentage of irregularity in its shape.

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# IoT and Big Data Analytics for Smart Healthcare 4.0 Applications

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**Abstract.** Industry 4.0 or I4.0-enabled technologies are observed to bring revolutionary effects in various E-services as well as production systems to increase efficiency, cost-efficacy, consistency, superiority, and tractability. I4.0-enabled Internet of Things (IoT), Big Data Analytics (BDA), Fog computing, and Cloud computing technologies are revolutionizing healthcare ecosystems, and propelling it towards Healthcare 4.0. This enables surgeons to obtain real-time data for their patients from a distance through wireless communication. Healthcare 4.0 is built on new technologies to provide people with enhanced and valued healthcare services. Healthcare 4.0 will extremely influence Healthcare System Engineering (HCSE), which combines engineering study and plan moralities to improve healthcare services. This work presents a systematic survey on the impact of various I4.0-related technologies on the health domain and its role in the fulfillment of traditional services. The contribution to the transformation of the healthcare system into Healthcare 4.0 by the I4.0 empowered technologies or I4.0 technical pillars (IoT and BDA) is discussed. Furthermore, we have discussed IoT security

use cases and the computational infrastructure of BDA, along with various applications of Healthcare 4.0.

**Keywords:** Industry 4.0, Healthcare 4.0, IoT, Big Data analytics, Fog computing, smart devices, Cloud computing, Edge computing

## 1 Introduction

Nowadays, more than 50% of the earth's residents live in metropolises, and in the upcoming 30 years, this percentage will grow up to 68%. Also, as per the United Nations report, by 2050, this population can reach up to 2.5 billion [1]. This immense escalation in population will enforce several experiments on capital, which includes the supportable development and management of metropolitan areas and also the capability to ensure the excellent conditions of people's life. The critical and operational solution to satisfy the necessities of the rising society is the advancement of smart cities. Since the 1990s, ICT has completely influenced the efficiency, access, and quality of almost every task associated with the development of healthcare in smart cities. eHealth is on the rise due to the formation and evolution of new technologies; hence, the precise representation of the term eHealth has endured progressive specifications and changes. The existing technology regarding the idea is called Industrie (Industry 4.0) or I4.0. Atitallah [2] et al. states that the term, Industire4.0, was used in an article published by a few German authors in 2020. From the perspective of technology, Industrie4.0 relies on 3 technical pillars, also illustrated in Figure 1.

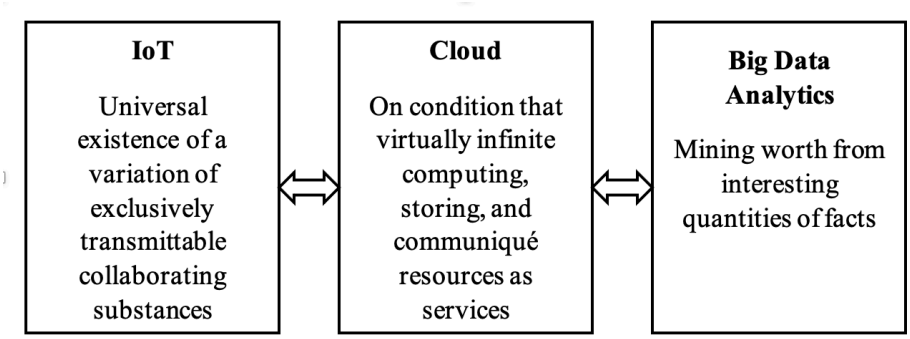


**Fig. 1.** Technical pillars of Industrie4.0

On the other side, the quick advancement of the IoT and Big Data Analytics (BDA) is frequently measured by the topmost feature in the employment of smart cities' services. Any smart city can benefit from data and exploit that data by collecting and refining the information with the support of numerous technologies of computing, networking, and communication. This process leads to the origination of automated and smart services that are utilized in various sectors like security, transportation, health, etc. IoT devices, due to their immense use are the center of attraction for cybercrimes.

Aceto et al. [3], discussed that approximately 10-100 billions of security data is generated by large organizations per day and enterprises use that data for posting hoc forensic analysis and regulatory compliance. IoT BDA has been a widely researched domain since last few years. Their research tends to eliminate the limitations of traditional techniques of data refinement and treating of the vast volume of facts. This study focuses on smart cities in terms of healthcare, as the applications field of IoT BDA and various use cases such as smart environment, smart agriculture, smart surveillance, smart conveyance, smart healthcare ecosystem, and the smart home of IoT security. Although, various surveys and reviews focus on I4.0-enabled technologies, not enough up-to-date work has been found that also focuses on revolutionizing Healthcare 4.0 technology. A summary of the major contribution of this work is mentioned below.

- This work discusses the I4.0 enabled technologies or technical pillars: IoT and BDA; and the contribution of these pillars into the transformation of healthcare to Healthcare 4.0.
- This work presents use cases of IoT security, along with a computational infrastructure of BDA.
- This works explores the various applications of Healthcare 4.0 in different sectors of IoT.

The remainder of the paper is organized as follows. Section 2 discusses the ICT pillars of healthcare. Section 3 provides information about the context of IoT with and its use cases. Section 4 presents a summary of infrastructures for IoT BDA which is cloud computing, fog computing, and edge computing. Section 5 provides the various applications of Healthcare 4.0, followed by the conclusion in Section 6.

## 2 ICT Pillars for Healthcare 4.0

The remarkably universal existence of wireless and mobile automation has empowered modern healthcare services or up-to-minute degrees of quality and cost-efficiency in traditional ones. P4 (Predictive, Preventive, Personalized and Participatory) medicine concept obtained by progressive change in modern medicine technologies [5]. This technique is built on a global recognition of one and all patient's biology to the arranging patients alternatively into treatment groups. These transformations bring from the broad set of ICTs and can play a significant role in the reduction of global health budgets. In this section, our focus is on dub pillars of HC4.0. Technologies such as IoT and Big Data are used in era of healthcare to enhance its importance. Figure 2 shows their development in relation of academic attentiveness and production. We acknowledge that other technical and non-technical features can be examined in association with HC4.0.

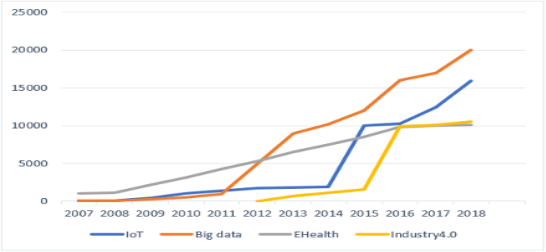


**Fig. 2.** Status of HC4.0 pillars (total number of publications per year) in the research works

### 2.1 Contribution of IoT in Healthcare 4.0

The contribution of IoT in Healthcare 4.0 is significant. IoT in healthcare offers precise data dimensions, authorized consumption, and processing capabilities. However, due to the complex and dynamic environment, IoT-related issues are often overlooked. The integration of IoT technology into industrial and manufacturing processes, as well as robotic advancements, presents both opportunities and challenges. IoT plays a crucial role in modernizing healthcare, reducing costs, and maximizing health outcomes, though system behavior changes are necessary. The advancement of wireless technology allows real-time monitoring, early diagnosis, and management of medical conditions. Diagnostic and imaging systems are essential in utilizing IoT in the health sector, with many applications leveraging standard mobile devices. IoT enables intelligent device interactions and facilitates the acquisition of new information and decision-making environments. The healthcare sector has explored diverse applications of IoT, each with its own significance [6]. Encouraged by the first IoT paradigm, more diversity has been discovered in the health sector, each with its own visibility presented in Table 1.

**Table 1.** Table captions should be placed above the tables.

| IoT Paradigm | Example |
|---|---|
| Internet of Medical Things (IoMT) [7] | Discusses applications involving of embedded and wearable strategies associated to a (private, smartphone, smart watch) i.e. allied the Internet and acting as own center. |
| Internet of health Things (IoHT) [8] | Constructed on the grouping of mobile apps, wearable, further related expedients and influences context-aware always-on professional-grade instrument medicinal campaigns. |
| Internet of nano Things (IoNT) [9] | Raises the use of IoT in Nano medicine, to execute additional modified observing, diagnostics, and treatment to carry out practical monitoring, defensive health, lasting care disease organization, and follow-up care. |
| Wearable Internet of Things (WIoT) [10] | Aims to execute telehealth to accomplish ecology for automatic interferences. Leveraging body damaged sensors. Empowers checking data which used in improving persons' |

| | |
|---|---|
| | ordinary excellence of life (like behaviors, wellness, habits, etc.) and attaches patients to medical substructures. |
| Internet of mobile-health Things (m-IoT) [11] | Visualize a connectivity model among low-power private-zone grids and developing 4G networks, highlighting the surviving precise structures inherent to the worldwide flexibility of partaking objects. |

### 2.2 Big data technology in healthcare 4.0

Big data has grown in popularity to the point that everyone wants to ride it. According to research, many large corporations have begun to prioritize big data. In addition, the big data industry is expected to develop at least five times faster than the entire IT market in the future years. It is the data that outnumbers typical database systems' storage and processing capabilities. Daily data generation is expanding at an alarming rate [12]. As stated in Table 2, there are several Vs that define big data in depth.

**Table 2.** Table captions should be placed above the tables.

| Constraint | Description |
|---|---|
| Volume (V1) | Refers to the massive amount of created data per second. |
| Velocity (V2) | Indicates the high-speed created data, requiring real-time analysis and processing. |
| Variety (V3) | Encompasses the different forms of data, including structured, unstructured, and semi-structured data. |
| Veracity (V4) | Deals with the presence of noise, anomalies, and uncertainties in the data. |
| Volatility (V5) | Specifies the duration for which stored data remains valid and useful. |
| Value (V6) | Determines whether the stored data is beneficial for analysis and problem-solving purposes. |

## 3 IoT Background and Security Use Cases

In this section, we describe the need for security in IoT devices in terms of its security parameters. All the security parameters have to be fulfilled by IoT devices to ensure its genuineness. Later we uncovered some IoT use cases in the real world.

### 3.1 Security of IoT

IoT has recently become extensively accepted in building smart systems. IoT security is considered to protect the entire IoT structure from vulnerability (attack). These factors are desired to be considered to improve IoT security resolutions. These are the

security desires that need to be met to build IoT security solutions. Because of the great potential made available through in-depth learning and big data technology, they can be used to classify a group of security breaches related to security necessities [13, 14]. Figure 3 represents the various security parameters of IoT.

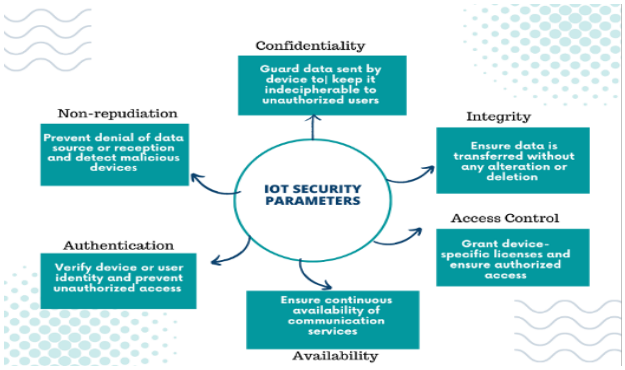


**Fig. 3.** Security parameters of IoT

### 3.2 Use Cases of IoT

This section highlights the need for research on using big data technology to enhance security in IoT devices. Recent years have seen rapid development of IoT devices, but concerns over security threats remain. The Mirai malware attack on IoT devices and the Dyn DNS provider underscored the vulnerabilities present. To address this, it is crucial to explore new technologies or combinations of existing ones for IoT device security. This study is motivated by the idea that big data technology can fulfill security requirements and detect attacks. Through this study, the aim is to inspire future researchers by leveraging big data concepts and deep learning for IoT security. Figure 4 shows the use cases of IoT security applications in terms of their relationship with big data technology. The use cases of IoT security are discussed below.

**Fig. 4.** Use cases of IoT security

SirenJack is an attack on emergency systems that allowed unauthorized access and manipulation. Deep learning and advanced data analysis can help detect and prevent such attacks. The Dyn attack affected major websites using infected IoT devices. Deep learning and BDA could have helped detect and prevent such attacks. An online fish tank was used as a gateway to hack a casino's network. Continuous monitoring using BDA and deep learning can detect and prevent IoT-based security breaches. Instances of baby monitors being hacked highlight the need for real-time detection using deep learning and big data to prevent unauthorized access. These use cases demonstrate the importance of deep learning and big data technology in addressing complex IoT attacks and improving IoT security [15].

## 4 Computational Structures of IoT-Big Data Analytics

In modern centuries, forecasting statistics for huge IoT statistics have led to significant enhancements in presentation and accurateness, mainly by means of DL methods. These enhancements have advanced computational and reminiscence necessities or this can be resolved using exact processor cunning platforms. In count to using cloud computing, fog and edge computing are put forward. Fog and computer edge are intended as per allowances in the cloud web and in cooperation permit information analytics to be completed as near as likely to the data foundation [16].

### 4.1 Cloud Computing

It describes technology that provides entrance to data from everywhere and every time. It contains several servers and data centers accessible online for lots of users around the world. This kind of computer has some characteristics such as internet storage, Internet Service, and Internet applications. Incorporating DL algorithms into IoT data, cloud computing is used. Data created by IoT devices is transferred to cloud substructure, where it is stored and examined in real-time by using diverse DL techniques. Interoperability, stability, and flexibility are counted as a benefit of cloud computing. Using cloud computing for IoT data analytics has limitations. Data transfers between DL model stages incur high costs due to network bandwidth usage. Accessing cloud services can be delayed, especially for time-sensitive applications like smart traffic programs. Reliability is affected by network inconsistencies, as cloud services rely on grids and wireless transmission. Storing sensitive data in the cloud requires strict privacy and security measures to prevent data loss or unauthorized access. Considering these limitations is crucial when utilizing cloud computing for IoT data analytics.

### 4.2 Fog Computing

Fog Computing is considered the next version of cloud computing. Fog computing is a very sturdy and favored concept that allows the IoT applications to be executed over the edge network. Vaquero et al. [17] described fog computing as "a large number of mixed devices (wireless and occasionally independent) available everywhere and

shared power and can interact with each other and performed storage and processing tasks without third-party intervention. Services like storing, distribution, and interacting are shared by fog computing and cloud computing. Fog computing can help in definite regions, whereas the cloud is independent to regions.

### 4.3 Edge Computing

In the era of personal computers, the shift towards cloud computing became apparent as major cloud providers like Amazon dominated the market. However, the centralized nature of cloud computing led to the realization that future growth and opportunities lie at the "edge," which refers to geographical distribution. Edge computing focuses on working directly at or near the data source. Companies now rely on cloud providers like Amazon, Microsoft, Google, and IBM for infrastructure and hosting machine learning and data science. Edge computing, a subset of cloud computing, brings privacy benefits but lacks complete assurance or guarantee. Similar to the security provided by Apple's iPhone, edge computing offers security features such as encryption, passwords, and biometrics. The workload is managed centrally, distributing encoded work among clouds, devices, and servers.

## 5 Application Scenarios for Healthcare 4.0

The pillars of I4.0, derived from scientific literature and market trends, are supported by IoT in achieving successful implementation of remote monitoring in various healthcare settings. The generation of large amounts of diverse data in these settings necessitates the use of new architectures and BDA techniques to extract value from the data. Reliable, secure, and well-managed cloud technology, along with Big Data, Fog, and IoT, plays a vital role in analyzing this diverse data. This section explores applications in the healthcare domain where these three ICT pillars have been utilized.

### 5.1 Prevention, wellness monitoring, and self-management

HC4.0 provides a solution for personal administration. There is a possible shift of cure to prevention using BDA technologies. Researchers have been working on methods to negotiate the design of intelligent systems in such a way that it can facilitate an active response to individuals. For example, the solutions provided by them can implement the algorithms which can prevent the further risk factors that are identified previously and can also infer the change in the health behavior. The other example of health-related self-management is chronic-disease management. For example, such types of systems would be able to give suggestions to empower good nutritional practices by considering the diabetes and obesity management [18].

### 5.2 Cloud-centered health information ecosystems

In most scenarios, cloud- centered systems have widely been adopted to simplify and strengthen the deployment, development, and designing the statistics system, to collect, process, and share clinical records, medical images, and hospital admin information. Such systems enhance the entire data collection [19]. Apart from this, the patient information being shared between patients and hospitals is obtained when the data is to be transferred in different formats. Although few studies have considered the performance aspect, the designing aspect is more focused on privacy and security aspects.

### 5.3 Reintegration

Reintegration in assisted living aims to improve healthcare savings and enhance quality of life. WBAN technology is used to track and detect human progress and movement during rehabilitation. Home-based rehabilitation focuses on personalized solutions, virtual reality integration, real-time feedback, and multi-sensor data fusion. WBAN plays a crucial role in family reintegration by providing biofeedback on functional movement and enabling patients to regulate and improve their biological activities, ultimately enhancing their performance and health [20].

## 6 Conclusion

The critical and operative solution to satisfy the necessities of developing society is the advancement of smart cities and the quality of almost every task associated with the advancement of healthcare in smart cities. Additionally, the speedy development of the IoT and BDA is frequently measured by the key feature in the execution of smart city services. I4.0-enabled IoT, BDA, fog and cloud computing technologies are transforming healthcare systems, leading it in the direction of Healthcare 4.0. Although, various surveys and reviews already exist where the focus is on I4.0-enabled technologies, not enough up-to-date work was found that focused to revolutionize the Healthcare 4.0 technology. Hence, this paper presents a systematic survey on the impact of various I4.0-enabled technologies on the health domain and how such technologies fulfill the traditional services. This work offers aid to the practitioners and researchers in Industrie4.0 to apply different technologies and approaches to revolutionize Healthcare 4.0 at a great extent. It also discusses the contribution of I4.0-enabled technologies or technical pillars such as IoT and BDA to the transformation of healthcare into Healthcare 4.0. Furthermore, IoT security use cases were discussed, and the computational infrastructure of BDA is provided. Finally, various applications of Healthcare 4.0 are explored.

Future research can be done towards providing more security and ease to Healthcare 4.0 technologies. Different methods and techniques would need to be developed to provide security and privacy in Healthcare 4.0, especially if a significant rise is observed. Another area of future research could focus on user-centric design principles, which would maximize the benefits of Healthcare 4.0. This involves understanding the needs

and preferences of healthcare professionals, patients, and caregivers to develop user-friendly and intuitive interfaces for Healthcare 4.0 applications

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# Low Power Near-Threshold Schmitt-Trigger Driven 11T CNTFET SRAM Cell with Improved Performance

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***Abstract*—This paper presents a Low power near-threshold ($V_{th}$) one sided Schmitt-trigger based 11T (ST 11T) carbon nanotube field-effect transistor (CNTFET) static random access memory (SRAM) cell. The proposed ST 11T shows less read delay ($T_{RA}$), write delay ($T_{WA}$), leakage power, and dynamic power consumption, respectively than other considered cells. It achieves better read & write stability, $I_{on}/I_{off}$ ratio, respectively than other compared cells. The simulation utilizes Cadence Virtuoso with Stanford University 32 nm CNTFET model at a supply voltage ($V_{DD}$) of 0.43 V.**

***Index Terms*—SRAM, near threshold, CNTFET, static noise margin (SNM), Schmitt trigger (ST), power consumption, Read and write delay, $I_{on}/I_{off}$ ratio.**

## I. Introduction

In the context of metal oxide semiconductor field-effect transistor (MOSFET) based SRAM, several factors, including PVT variation, more leakage power, and quantum effects significantly influence its performance when scaling down to the nanoscale level. Therefore, to overcome these MOSFET constraints in the submicron region, FinFET and CNTFET technologies are employed. Nevertheless, the effectiveness of FinFET-based circuits are restricted because of thin gate oxide results in poor control of gate leakage. Therefore, CNTFET technology emerges as a promising alternative to achieve enhanced performance [1]. CNTFET demonstrates remarkable electrical properties, such as reduced power consumption, lower leakage power, and a higher $I_{on}/I_{off}$ ratio. Moreover, CNTFET experiences a very less impact on its threshold ($V_{th}$) voltage due to temperature fluctuations [2], also CNTFET exhibit significantly reduced leakage current compared to MOSFETs, primarily due to they perform better in ballistics, minimal surface scattering, substantial decrease in parasitic effects. CNTFET structure is shown in Fig. 1. The MOSFET's conductive channel is replaced with a carbon nanotube (CNT) to make CNTFET. A CNT is created by encasing a cylindrical structure with a graphene sheet. Electrical properties of CNTs are governed by their chirality, commonly referred as their chiral vector (m, n). The diameter of CNTs ($D_{CNT}$) can be calculated as shown in Eq. (1).

$$D_{CNT} = \frac{a\sqrt{n^2 + nm + m^2}}{\pi} \tag{1}$$

where $a$ stands for the length of carbon-carbon bond (a = 2.49 Å). The $V_{th}$ is a vital parameter in CNTFETs, and it is determined by Eq. (2),

$$V_{th} = \frac{\sqrt{3}}{3}\frac{aV_{\pi}}{eD_{CNT}} \approx \frac{E_g}{2e} \approx \frac{0.43}{D_{CNT}(nm)} \tag{2}$$

Where $E_g$ stands for energy band gap, e represents the electron charge (e = 1.602E-19 C), and $V_{\pi}$ stands for carbon $\pi - \pi$ bond energy ($V_{\pi}$ = 3.033 eV) [3]. Eq. (2) demonstrates that by altering $D_{CNT}$ value $V_{th}$ can be efficiently regulated [4]. The CNTFET's $V_{th}$ can be altered to the requisite voltage level by opting the suitable chiral vector. A higher value of the chiral vector decreases the $V_{th}$ of the CNTFET. As a result, a relatively less gate voltage is adequate to activate CNTFET when employing large chiral vectors [5].

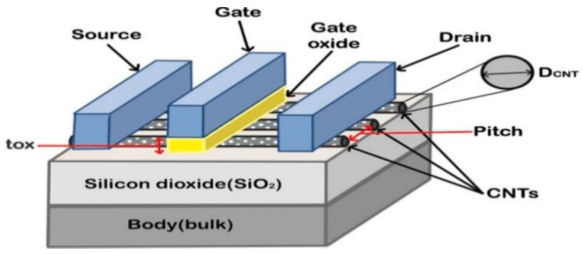


Fig. 1. Structure of CNTFET [3].

Low power consumption has become crucial in system-on-chip (SoC) design because of the growing demand for low power devices such as wireless sensor networks, biomedical devices, and other portable devices relying on batteries. As SRAM takes up a large area on SoC, SRAM power consumption must be reduced to achieve lower SoC power consumption [6]. Supply voltage ($V_{DD}$) Scaling is a viable approach for minimising the power consumption. As $V_{DD}$ scales down it reduces power quadratically [7]. However, by lowering $V_{DD}$, process variation significantly reduces the SRAM cell's

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performance. Therefore, it is challenging to sustain the device strength ratio within the near-threshold region adversely affects the read/write stability of conventional 6T SRAM cell [8]. As 6T SRAM contains dual bitline (BL) for read and write operations, it consumes more power. To decrease power consumption and enhance stability various read decoupled SRAM cells [3,9-12] are presented in literature. The ST read decoupled 12T (STRD 12T) cell [3] indicates improvement in delay, leakage power and stability, but consumes more dynamic power. Bit-Line Powered 8T (BLP 8T) SRAM [9] shows the improvement in delay, however it consumes more power due to large BL capacitance and leakage through BL. The design of 9T SRAM [10] offers a better read and hold stability and minimal leakage power consumption at the expense of more delay and dynamic power consumption, since it has shared BL structure that may cause large BL capacitance. 10T SRAM Cell in [11] shows less read delay, better read and hold stability, low leakage power consumption, but it has more write delay and dynamic power consumption. Cell in [12] represent a 12T SRAM that indicate less read delay, better write stability, however it has poor read stability and more power consumption due to leakage through its read port.

This paper introduces a novel low power near-threshold ST 11T CNTFET SRAM cell. This cell demonstrates superior stability, reduced delay, lower power consumption, and an improved $I_{on}/I_{off}$ ratio. The primary features of the suggested cell are described below:

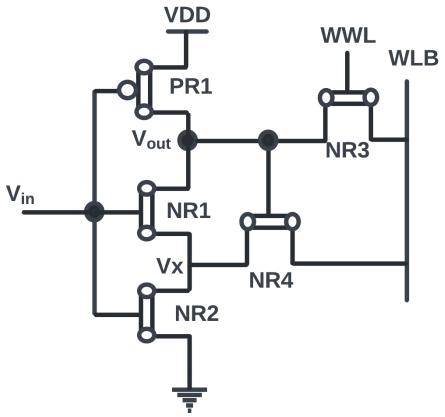
1) By employing a read decoupled structure, the read performance enhanced.
2) The utilization of a power cut-off transistor with virtual ground (VGND) and ST inverter leads to the enhancement of write delay ($T_{WA}$) and stability.
3) The incorporation of stacked transistors helps diminish leakage current and power, resulting in an improved $I_{on}/I_{off}$ ratio.
4) Dynamic power consumption is reduces by using separate bit lines for read and write operations.

This paper is structured as follows: Section II presents the proposed cell design and operation. In Section III, analysis and simulation results for the suggested and considered SRAM cells are showcased. Finally, conclusion are drawn in Section IV.

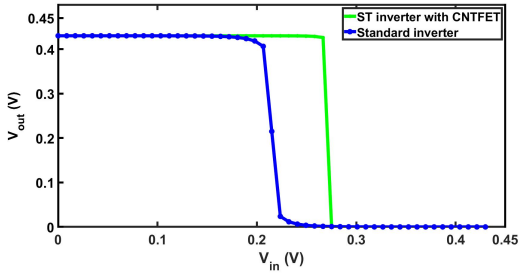
## II. Proposed ST 11T CNTFET SRAM Cell

### A. The Schmitt Trigger (ST) Inverter

The ST is a regenerative circuit that is distinguished by its utilization of positive feedback, which induces hysteresis in its DC characteristics [6]. The schematic of ST inverter and the voltage transfer characteristics (VTC) of both CMOS and ST inverter [3] are depicted in Fig. 2(a) and (b), respectively. Compared to a standard inverter, the ST inverter exhibits more trip voltage when input voltage ($V_{in}$) transitions from '0' to '1', because the feedback transistor (NR4) strengthens the ($V_X$), which in turn, weakens the strength of NR1. Consequently, the ST inverter exhibits better tolerance to read disturbances when storage node gets affected compared to the regular inverter.




(a)




(b)

Fig. 2. ST inverter (a) Schematic, (b) versus CMOS inverter VTC.

TABLE I
ST 11T SRAM Cell Control Signals

| Signal | Write '1' | Write '0' | Hold | Read |
|---|---|---|---|---|
| **WWL** | "1" | "1" | "0" | "0" |
| **WBL** | "1" | "0" | "1" | "1" |
| **WLA** | "0" | "1" | "0" | "0" |
| **WLB** | "0" | "1" | "1" | "1" |
| **RWL** | "0" | "0" | "0" | "1" |
| **RBL** | "0" | "0" | "0" | "1" |
| **VGND** | "1" | "0" | "0" | "0" |

### B. Proposed ST 11T SRAM Cell Design

Fig. 3(a) shows the proposed cell. The design comprises a cross-coupled combination of left inverter employing stacked transistors (PL1, PL2, NL1) with virtual ground (VGND) and ST inverter (PR1, NR1, NR2, NR4) along with write access and separate access transistors NL2 and NR3, respectively, which controlled by write wordline (WWL). The read wordline (RWL) controls the RD2 transistor forming the read access path. Fig. 3(b) illustrates a timing diagram, and Table-I lists the operating conditions for the write, hold, and read modes.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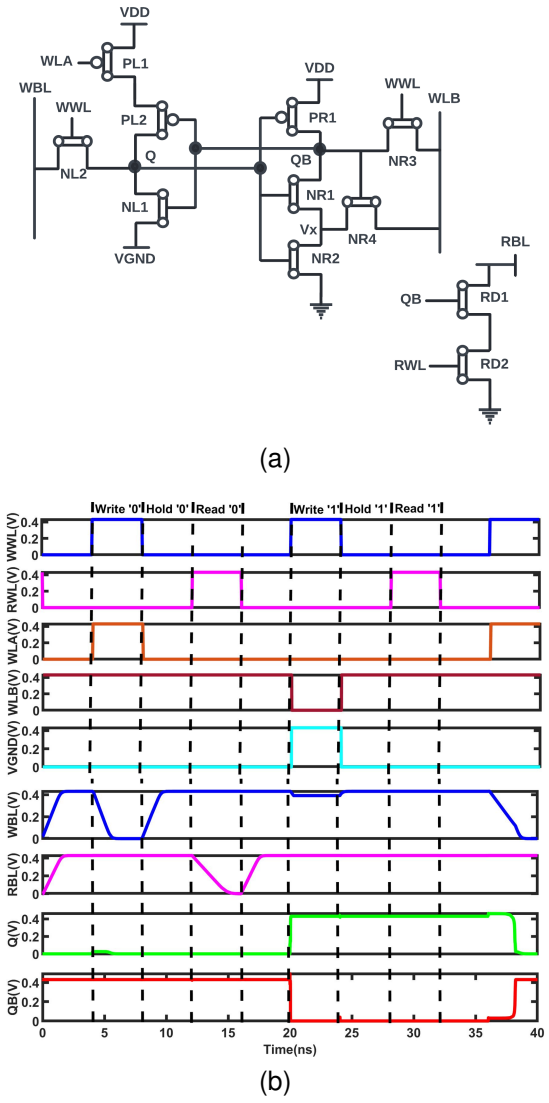


Fig. 3. Proposed ST 11T SRAM cell (a) Schematic, (b) operation timing diagram.

### C. Write Operation

Fig. 4(a) depicts the ST 11T cell write '1' operation. For write '1' operation WLA, WLB, and RWL are maintained at '0', whereas WWL and VGND are connected to '1', and write driver makes WBL to '1'. The node Q immediately turns to '1' through NL2 and PL1-PL2 as PL1 is enabled, establishing a connection to the $V_{DD}$. The proposed cell ability to write '1' is further enhanced by the fact that WLB is '0' results in lower voltage at VX, which strengthens the driving ability of NR1. Similarly, during write '0' operation, write driver changes WBL to '0'. The control signals RWL and VGND are disabled, whereas WWL, WLA, and WLB are enabled. The left inverter is disconnected from the $V_{DD}$ as PL1 is turned off. Q is easily pulled low by WBL via NL2, which represent a successful write '0' operation. The preceding discussion demonstrates that the write process is enhanced by power cut-off transistor (PL1), VGND and the presence of ST action.

### D. Hold Operation

Fig. 4(b) shows the schematic for the hold mode. The signals WWL, WLA, RWL and VGND are maintained at '0', whereas WLB is at '1'. As a result, NL2, NR3, and RD2 are inactive, that separates the storage node Q from the BL's. Therefore, the cell successfully retains the data.

### E. Read Operation

Fig. 4(c) illustrates the read operation. At the time of read operation WWL, WLA, VGND, and WLB, RWL are maintained at '0' and '1' correspondingly, while RBL is precharged to $V_{DD}$. This makes NL2, NR3 and RD2 are turned off and on, respectively. If cell stored '0' then QB is at '1', which activates RD1. It permits RBL discharge via RD1-RD2 which corresponds to read '0', conversely no RBL discharge signifies to read '1' operation.

TABLE II
DEVICE CHARACTERISTICS AND PARAMETERS TO SIMULATE 32 NM CNTFETS

| Parameters | Values |
|---|---|
| Gate Dielectric Constant | $HfO_2$ = 16 |
| Oxide Thickness ($T_{ox}$) | 4 nm |
| Number of CNTs | 1 |
| Pitch | 20 nm |
| Temperature (°C) | 27 |
| Physical length of channel | 32 nm |
| Doping Length of CNT source and drain side region | 32 nm |
| Chirality vector (m,n) | (13, 0) |
| $V_{DD}$ | 0.43 V |

## III. Simulation Outcomes and Comparison

The proposed ST 11T cell considering read, hold and write stability, read and write delay, dynamic and leakage power consumption, and $I_{on}/I_{off}$ ratio is compared with the other considered cells. For fair comparison various read decoupled SRAM cells including BLP 8T [9], 9T [10], 10T [11], 12T [12], and STRD 12T [3] are considered. Table II indicates the simulation-related process parameters and device characteristics [12]. The effect of changes in $V_{DD}$ (between 0.43 V to 0.93 V) is observed on various performance parameters. The outcomes are discussed separately in the subsequent subsections.

### A. Stability Analysis

The read SNM (RSNM) and Hold SNM (HSNM) are used to determine the read and hold stability of SRAM cell's, respectively. In read and hold operations, RSNM and HSNM are refer to the highest dc noise voltage that each storage node must be endured without impacting the integrity of stored data. They are measured by fitting the greatest square possible within the butterfly curve [13]. The read decoupled structure is employed in the proposed and considered cells, which having independent read path, as a result, their RSNM and HSNM are equivalent. Fig. 5(a) depicts the RSNM/HSNM curve for each of the compared cells. Fig. demonstrates that the RSNM/HSNM of ST 11T is 189 mV which is about


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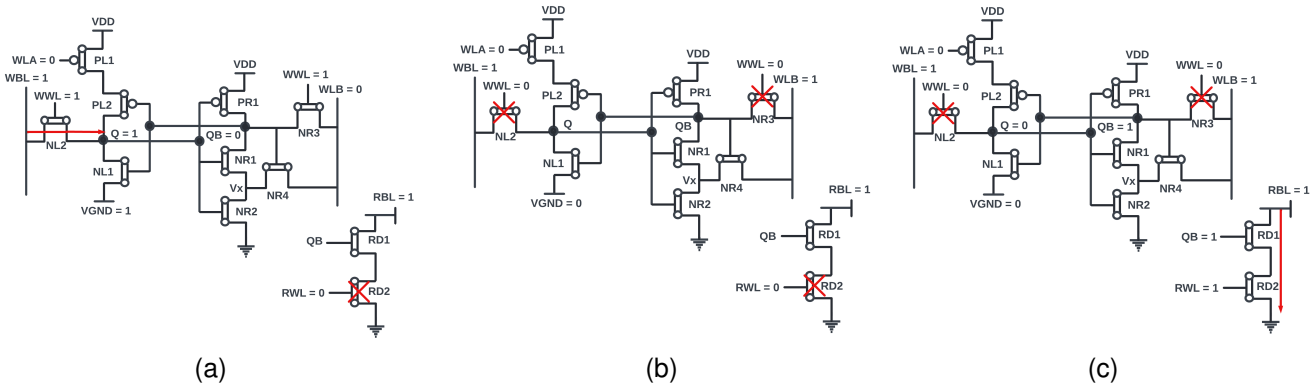
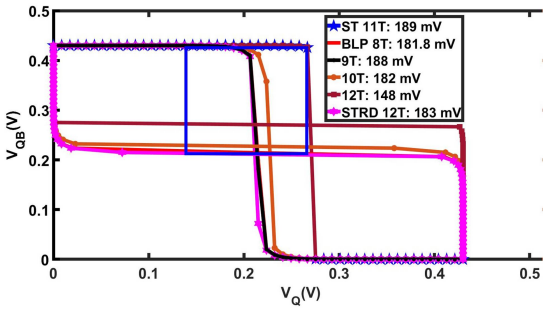



Fig. 4. (a) Write '1', (b) Hold, and (c) Read operations of proposed ST 11T cell

1.27× more than the other considered cell's. The RSNM of considered cells at varying $V_{DD}$ are displayed in Fig. 5(b).




(a)

TABLE
RSNM ( MV) VS VARYING SUPPLY VOLTAGE ($V_{DD}$)

| RSNM (mV) | | | | | | |
|---|---|---|---|---|---|---|
| $V_{DD}$ | **ST 11T** | **BLP 8T** | **9T** | **10T** | **12T** | **STRD 12T** |
| **0.43** | **189** | 181.8 | 188 | 182 | 148 | 183 |
| **0.53** | **193** | 184.3 | 191 | 184.6 | 150 | 185 |
| **0.63** | **196** | 186.8 | 195 | 187 | 153 | 187.7 |
| **0.73** | **199** | 189.3 | 197 | 189.7 | 156 | 190.5 |
| **0.83** | **202** | 191.8 | 200 | 192.1 | 160 | 193 |
| **0.93** | **205** | 194.3 | 203 | 194.8 | 162 | 195.5 |

(b)

Fig. 5. RSNM (a) Butterfly curve for compared SRAM cells, (b) versus varying supply voltages.

Fig. 6(a) illustrates the N-Curve [15] employed to assess the SRAM cell's write capability. The write stability of bitcells can be measured using two different metrics: write-trip voltage (WTV) and write-trip current (WTI). The least voltage drop needed to change the bitcell's internal nodes is called the WTV. The disparity among the C and B points is used to determined it (Fig. 6(a)). The negative peak current along the C and B points in Fig. 6(a), used to determine the WTI, which represents the minimum current needed to write a cell. The N-Curve corresponding to each SRAM cell is depicted in Fig. 6(b). As observed the WTV of ST 11T is 1.36× higher than the considered cells. The power cut-off transistor with VGND and ST action improves the write capability of ST 11T. Fig. 6(c) demonstrates the WTV of various cells at varying $V_{DD}$.

### *B. Delay Analysis*

Read delay/access time ($T_{RA}$) is used to measure the time needed to complete a read operation. For single ended bitcells, it is determined by the amount of time needed to deplete precharged BL by 50 mV when WL is turned on [16]. Fig. 7 illustrates the $T_{RA}$ of different cells at varying $V_{DD}$. As shown ST 11T has 1.02×/1.24×/1.01×/1×/1× lower read delay corresponding to BLP 8T/ 9T/ 10T/ 12T/ STRD 12T SRAM cells at $V_{DD}$ of 0.43 V.

Write delay/access time ($T_{WA}$) shows the speed at which it executes the write operation. The amount of time an internal node needs to increase up to 90% of the $V_{DD}$ while the word-line is enabled is referred to as write '1' access time ($T_{WA}$'1'). Likewise, write '0' access time ($T_{WA}$'0') is determined as the time when the storage node voltage drops upto 10% of the $V_{DD}$ during wordline activation [17].

Fig. 8 represents the $T_{WA}$ of considered cells at varying $V_{DD}$. As shown ST 11T has 21.48×/61.96×/85.82×/64.31×/1.27× lower write delay corresponding to BLP 8T/ 9T/ 10T/ 12T/ STRD 12T SRAM cells at $V_{DD}$ of 0.43 V.

### *C. Power Consumption*

Leakage power is another crucial parameter for SRAM design. Because majority of SRAM cells in SRAM array retain in standby mode when not activated [18]. Leakage power consumption of considered cells with $V_{DD}$ variation is presented in Fig. 9(a). The outcomes demonstrate that ST 11T has 1627.45×/2.14×/2.37×/945.03×/1× lower power consumption corresponding to BLP 8T/ 9T/ 10T/ 12T/ STRD 12T SRAM cells at $V_{DD}$ of 0.43 V, because of the presence of stacked transistors.

Dynamic power consumption results from the BL's activity during read-write operations. Fig. 9(b) illustrate the dynamic power consumption of compared cells at varying $V_{DD}$. The result shows that ST 11T has 65.52×/24.77×/1.67×/2.77×/2×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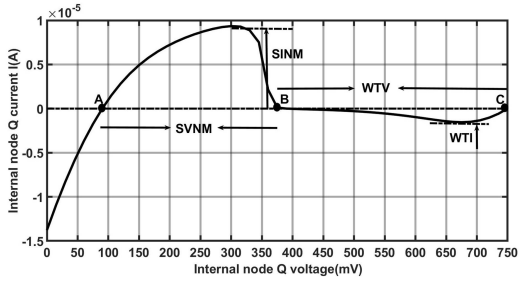
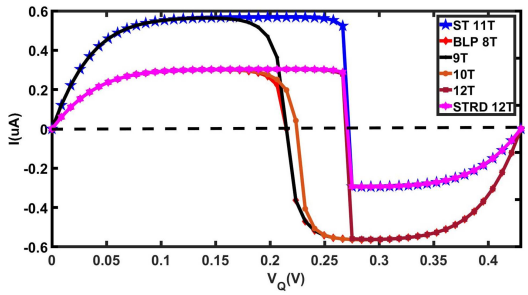



(a)

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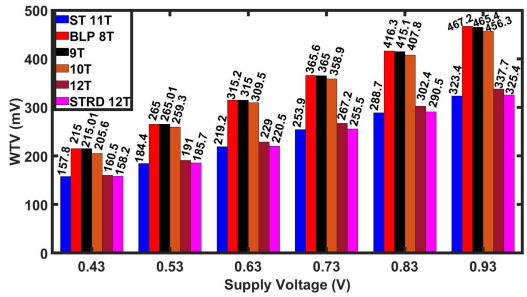



(c)

Fig. 6. Representation of N-curve for (a) conventional 6T SRAM cell, (b) compared SRAM cells, (c) varying supply voltage.

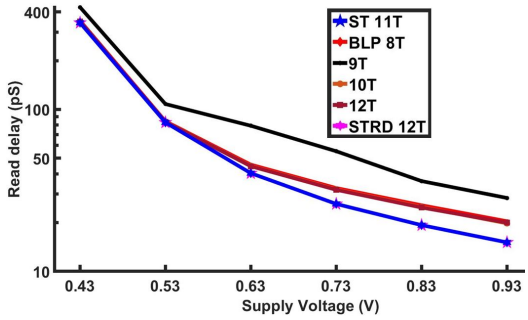



Fig. 7. Read delay versus varying supply voltages.

lower power consumption corresponding to BLP 8T/ 9T/ 10T/ 12T/ STRD 12T SRAM cells at $V_{DD}$ of 0.43 V.

### *D. $I_{on}/I_{off}$ Ratio*

The ratio of read current ($I_{on}$) to the leakage current ($I_{off}$) is referred as the $I_{on}/I_{off}$ ratio. The designer can make

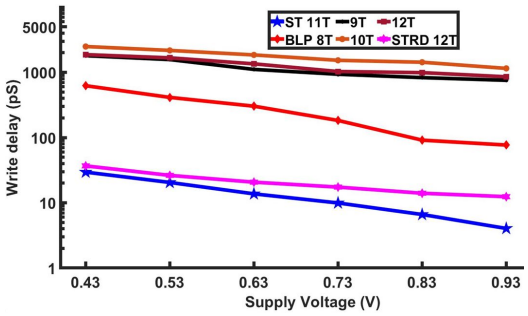
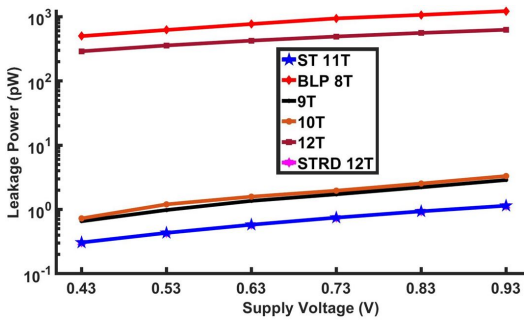
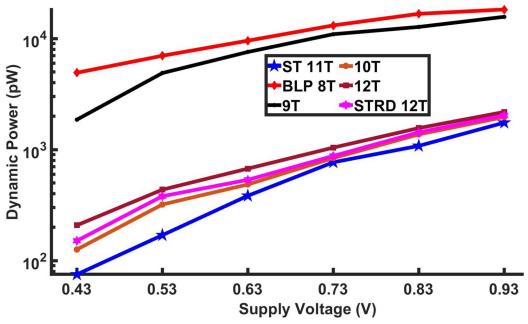



Fig. 8. Write delay versus varying supply voltages.




(a)




(b)

Fig. 9. (a) Leakage, and (b) Dynamic power consumption of considered SRAM cells.

a large SRAM array if the $I_{on}/I_{off}$ ratio is more [19]. The $I_{on}/I_{off}$ ratio with $V_{DD}$ variation is indicated in Fig. 10. The outcome indicates that, ST 11T has 1.97×/1.19×/163.7×/8290.96×/1× more $I_{on}/I_{off}$ ratio corresponding to BLP 8T/ 9T/ 10T/ 12T/ STRD 12T SRAM cells at $V_{DD}$ of 0.43 V.

To summarise the results, Table III demonstrates that the ST 11T performs better than any other cells compared in this study.

## IV. Conclusion

A novel ST 11T SRAM cell is proposed in this paper. This cell includes a power cut-off transistor with VGND and one sided ST inverter. The ST 11T results in low leakage power, low dynamic power consumption, improved read and write delays, enhanced $I_{on}/I_{off}$ ratio, and better RSNM, HSNM and write ability. It achieves up to 1627.45×/65.52× decreased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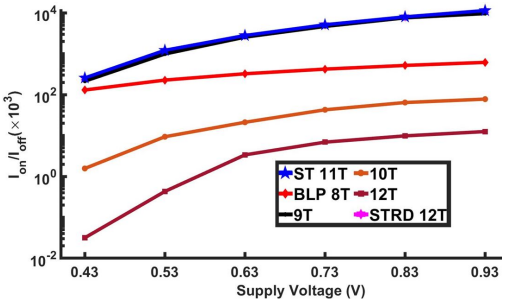


Fig. 10. $I_{on}/I_{off}$ ratio variation with supply voltage.

TABLE III
COMPARING SEVERAL SRAM CELLS IN 32 NM CNTFET TECHNOLOGY

| Parameters | BLP 8T [9] | 9T [10] | 10T [11] | 12T [12] | STRD 12T [3] | Proposed ST 11T |
|---|---|---|---|---|---|---|
| $V_{DD}$ | 0.43 | 0.43 | 0.43 | 0.43 | 0.43 | 0.43 |
| **Read delay (ps)** | 353 | 427 | 348 | 347 | 343.7 | **343.7** |
| **Write delay (ps)** | 623 | 1797 | 2489 | 1865 | 37 | **29** |
| **RSNM (mv)** | 181.8 | 188 | 182 | 148 | 183 | **189** |
| **HSNM (mv)** | 181.8 | 188 | 182 | 148 | 183.3 | **189** |
| **WTV (mv)** | 215 | 215.01 | 205.6 | 160.5 | 158.2 | **157.8** |
| **WTI (µA)** | -0.563 | -0.563 | -0.563 | -0.563 | -0.294 | -0.294 |
| **Leakage Power (pw)** | 498 | 0.65 | 0.72 | 289.18 | 0.306 | **0.306** |
| **Dynamic Power (pw)** | 4922 | 1861 | 126 | 208.3 | 150.9 | **75.12** |
| $I_{on}/I_{off}$ **ratio** ($\times 10^3$) | 130.31 | 214.24 | 1.57 | 0.031 | 257.02 | **257.02** |

leakage, and dynamic power consumption, respectively than other compared SRAM cells, as it contains stacking transistor, separate BL for read/write operations and low BL capacitance. The write delay and stability of ST 11 is up to 85.82×/1.36×, respectively better than other considered cells, as a result of power cut-off transistor with VGND and ST action. The read decoupled structure and ST inverter improves the read delay and stability of the proposed cell up to 1.24×/1.27×, respectively than other considered cells. The $I_{on}/I_{off}$ ratio of ST 11T is up to 8290.96× larger than the considered cells, as it has high on current ($I_{on}$) and low leakage current ($I_{off}$). Table III demonstrates that the proposed ST 11T SRAM cell outperforms other compared cells with its superior performance. As a result, the ST 11T is an appropriate alternative for submicrometer technologies that require low power, high speed, and better stability.

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# Next-Generation Proton-Exchange Membranes in Microbial Fuel Cells: Overcoming Nafion's Limitations

*Akshat Sharma, Lara Đelević, and Katharina Herkendell**

**The adoption of microbial fuel cell (MFC) technology hinges on the development of efficient proton-exchange membranes (PEMs), which significantly influences fuel cell performance and cost. PEMs have a critical role in preventing oxygen crossover, maintaining electrochemical neutrality, and supporting microorganisms within MFCs. Nafion, the current industry-standard PEM, grapples with environmental, cost, and performance issues. Although improvements to Nafion have been reported using additives, immersion in heteropolyacids, different pretreatment methods, and UV irradiation, many of the challenges still remain. Herein, the recent developments in the area of alternative PEMs are reviewed and analyzed. Among them, sulfonated aromatic hydrocarbons, particularly sulfonated polyether ether ketone, have emerged as top contenders in terms of scale up and commercial viability. At the same time, membranes based on polyvinyl alcohol, ionic liquids, and natural materials are also being actively researched for various MFC applications. Since most studies are short term and lab scale, there is a need evaluate long-term stability and economic cost of PEMs in terms of standardized parameters such as power-to-cost and normalized energy recovery. Additionally, for emerging low-energy-density MFC applications like biosensors and in vivo power sources, PEM properties and design need to be tailored carefully.**

## 1. Introduction

As the world moves toward a future driven by renewable energy sources, decentralized energy technologies like microbial fuel cells (MFCs) are expected to play an important role in the transition. MFCs are fuel cells in which specialized bacteria generate low-voltage bioelectricity by decomposing organic waste. In comparison to other technologies that convert organic waste into biogas, MFCs have some specific advantages: 1) low concentration of the substrate required; 2) operation at moderate temperatures; and 3) no emission of harmful gaseous products such as methane or $H_2S$. Moreover, compared with other wastewater treatment technologies, MFCs offer considerable energy savings, since neither aeration nor complicated downstream processing steps are needed.[1] However, a major obstacle in the large-scale commercialization of MFCs is their high capital cost and low energy densities, which warrant further research into the design and choice of materials for MFCs. MFCs are typically used for wastewater treatment, in particular for reducing its chemical oxygen demand (COD). However, efforts have been made in the last couple of decades for extending the use of MFCs to low-power bioelectronics applications, such as self-powered biosensors and as energy sources for in vivo medical devices. In contrast to conventional electrochemical systems, such as batteries, MFCs can be made completely ecofriendly and biocompatible with the appropriate selection of the components.[2]

An important component of MFC is the proton exchange membrane (PEM), which not only physically separates the anode and cathode chambers, but also maintains the right electrochemical balance for the optimal working of the cell. The conventionally used PEM, Nafion suffers from disadvantages such as prohibitive cost, high environmental impact, as well as performance-related issues like biofouling. This has sparked an enormous increase in research interest to develop suitable alternative membranes, especially in the last decade. Here, we discuss the various types of alternative PEM materials in terms of their chemical structure and nanoscale morphology, specific membrane characteristics such as proton conductivity and water uptake, as well as strategies to improve their performance (e.g., by chemical modifications, use of additives and solvent selection). We also discuss their advantages and disadvantages and suitability for use in different MFC applications. Most reported studies in literature are lab scale and short term, without consideration to cost, sustainability, and fouling. Hence, here we focus on cost analysis and scale-up aspects to bridge the gap between lab-scale and commercial membranes. We also highlight that apart from wastewater treatment, emerging applications of MFCs such as biosensors and in vivo power sources require specific membrane properties, such as biocompatibility and ability for miniaturization, which require different approaches for membrane development.

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### 1.1. Working of Microbial Fuel Cells

A typical MFC design is shown in **Figure 1**. It comprises a body divided into an anode chamber where anaerobic oxidation of the substrate takes place, a cathode chamber where reduction of oxygen into water takes place, and a separator which is typically a PEM. At the anode, exoelectrogenic bacteria, such as *Geobacter* or *Shewanella*, oxidize the organic substrate to generate protons and electrons. Possible organic substrates include acetate, glucose, citrate, or wastewater.[3]

The generated electrons then move toward the cathode chamber via an electric wire due to the potential difference. At the same time, the protons diffuse toward the cathode via the PEM to maintain electrical neutrality. Finally, the electrons, protons, and oxygen, or some other electron acceptor, such as ferricyanide or dichromate, combine in the cathode chamber to produce water or the respective reduced product.[4]

A simplified reaction utilizing acetate as the organic substrate and oxygen as electron acceptor is shown in **Table 1**.[5] Since the overall cell potential is positive, the fuel cell is viable and can produce bioelectricity.

Although this reaction can also be accomplished by enzymes isolated from specialized bacteria,[6,7] microorganism-driven biofuel cells are more applicable since the microbes can multiply themselves, thus overcoming the need for frequent change of catalyst.[8,9] Additionally, enzymes need a high level of purity, which involves expensive purification processes.[10] In contrast to enzymatic fuel cells, MFCs are typically less specific in their substrate requirements and tend to have longer operational lifespans.[11]

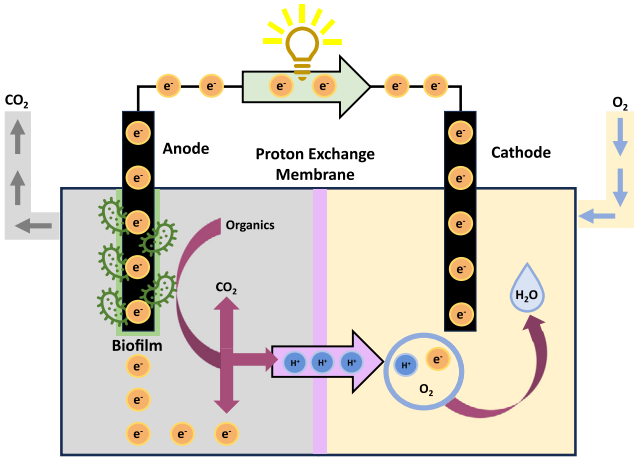


**Figure 1.** Schematic showing the basic working of MFCs.

**Table 1.** Electrochemical reactions in an MFC.

| | Half-cell reaction | $E_{emf}$ (V vs Normal Hydrogen Electrode) |
|---|---|---|
| Anodic reaction: | $CH_3COOH + 2H_2O \rightarrow 2CO_2 + 8H^+ + 8e^-$ | −0.300 V |
| Cathodic reaction: | $8H^+ + 8e^- + 2O_2 \rightarrow 4H_2O$ | +0.805 V |
| Overall reaction: | $CH_3COOH + 2O_2 \rightarrow 2H_2O + 2CO_2$ | +1.105 V |

### 1.2. Importance of the Proton Exchange Membrane

In most MFC configurations, the PEM is considered an essential component as it performs several important functions: 1) providing physical separation between the anolyte and catholyte so that the two do not mix and cause unwanted cross-reactions; 2) maintaining the overall electrochemical neutrality in the cell by completing the inner circuit; 3) blocking the back-diffusion of oxygen from the cathodic chamber to the anodic chamber; and 4) preventing the loss of microorganisms and substrates.[12] In the early designs of MFCs, this function was performed by an Agar–KCl salt bridge.[13,14] However, owing to their larger resistance and consequently reduced power densities, salt bridge designs have been largely abandoned in favor of low-resistance membrane-based MFCs.[15]

Certain designs of MFCs have eliminated the use of membrane separators. This is done to increase the maximum power density, as it removes the resistance that the membrane typically introduces. Although MFCs can work without a separator, since water itself can act as the ion carrier, membrane-less MFCs show considerably reduced Coulombic efficiency (CE).[16] CE is a measure of electron recovery from the MFC. It is defined as the ratio of total charge transferred in form of generated current to the theoretical maximum charge that can be generated upon complete oxidation of the substrate. This reduced CE is attributed largely to uncontrolled oxygen crossover.[17–20] Since the exoelectrogenic bacteria rely on anaerobic oxidation to generate electrons from organic substrates, the presence of oxygen can be detrimental.[21] Yang et al. showed that in aerobic environments, the anodic exoelectrogenic biofilm gets covered with a top layer of aerobic bacteria.[22] This thick outer layer obstructs substrate diffusion into, and proton diffusion out of, the inner biofilm, resulting in reduced electricity generation.

Recently, there has been increasing interest in using anion-exchange membranes (AEMs) in MFCs as an alternative to PEMs (**Figure 2**). AEMs use anion transport to maintain electrical neutrality.[23–26] However, it has been observed that the performance of these AEMs tends to decline more rapidly over time.[27] One reason for this could be the transport of charged metabolites, like acetate, from the anodic chamber to the cathodic chamber. This migration can generate a current that flows in the opposite direction to the cell current, decreasing the overall current density. Furthermore, the passage of anionic electron acceptors through the AEM from the catholyte to the anode chamber can negatively impact the system in two ways: first, by reducing the anodic potential and second, by inhibiting microbial growth.[28]

Thus, PEMs remain crucial to MFC technology and innovations in this field can achieve breakthroughs in MFC performance. The research on PEM is also important, given that membranes are usually the limiting factor behind the overall cell efficiency,[15,17] and may account for as high as 38% of total cell cost.[29]


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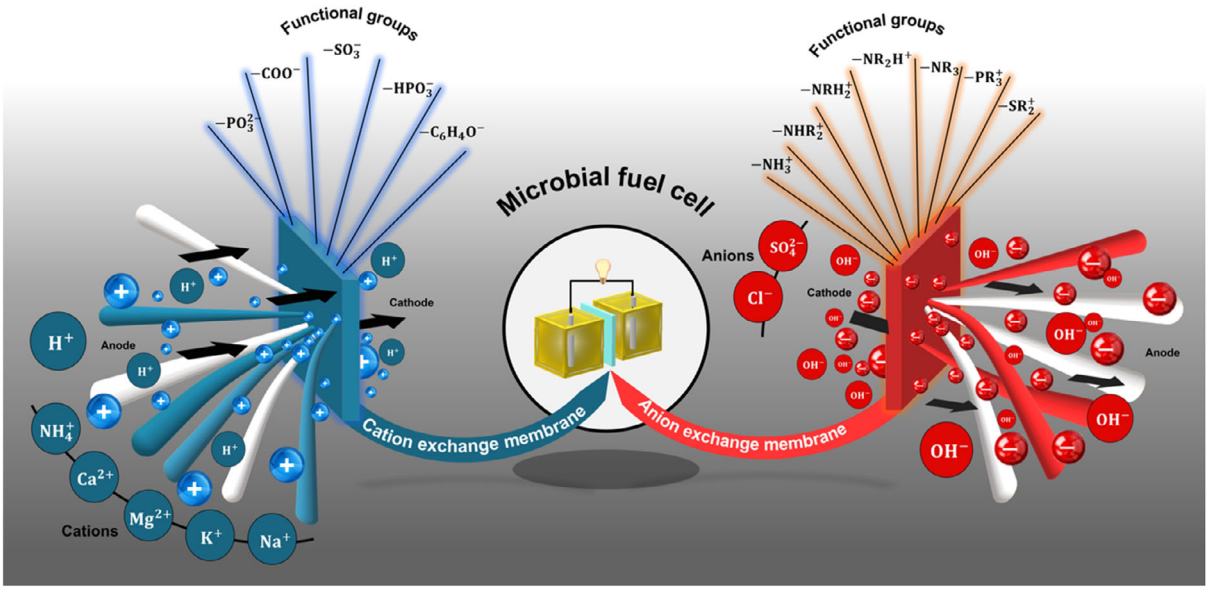


**Figure 2.** Two types of ionic membranes used in MFCs. Reproduced under the terms of the CC-BY license.[62] Copyright 2021, Ramirez-Nava et al. Published by MDPI.

## 2. Proton Exchange Membrane Materials

### 2.1. Nafion

#### *2.1.1. Structure*

At present, Nafion is the gold standard in the PEM industry. It was developed in the 1960s by researchers at DuPont and is widely used in the chlor-alkali process as well as in energy storage and conversion systems.[30] Various grades of Nafion membranes and dispersions are commercially available for different applications.[31] Although thinner membranes can help reduce the Ohmic resistance,[32] they have a higher oxygen mass transfer coefficient ($K_0$), which can lower the CE of the MFC.[15] The result is that higher power output can be obtained with thicker Nafion 117 than with thinner Nafion 112.[33] Nevertheless, lower Ohmic resistance of Nafion is among its major advantage over other commercial PEMs like Ultrex, which are much thicker.[34]

Nafion is produced by grafting an ionic hydrophilic side chain onto a hydrophobic Teflon (polytetrafluoroethylene) backbone (**Figure 3**). The side chain is made of sulfonated perfluoro(alkyl vinyl ether) moieties carrying ionizable sulfonyl fluoride end groups.[35] The unique structure of Nafion is responsible for its outstanding properties. The Teflon-like backbone ensures excellent chemical inertness, good mechanical strength, and reasonable working temperature range. The ionic side chain absorbs water to create a hydrophilic channel through which protons are conducted rapidly.[36,37] The large difference between the polarities of fluorocarbon backbone and the sulfonic acid side chains leads to nanoscale phase separation and formation of water clusters, that form bridges, over which protons can hop.[38]

#### *2.1.2. Mechanism of Proton Conduction*

The spherical cluster hypothesis, first put forth by Gierke, essentially explains the proton conduction in Nafion.[39] As the water activity (e.g., humidity) around the membrane increases, the water molecules sorb on the ionic groups in the membrane. This is often characterized by the water content, $\lambda$ (mol $H_2O$/mol $SO^{3-}$), which is the number of water molecules per mole of sulfonic acid groups. The primary layers of water molecules that remain firmly adhered (and form the hydration shell) are called bound water molecules, whereas those which adhere to these bound molecules (and are

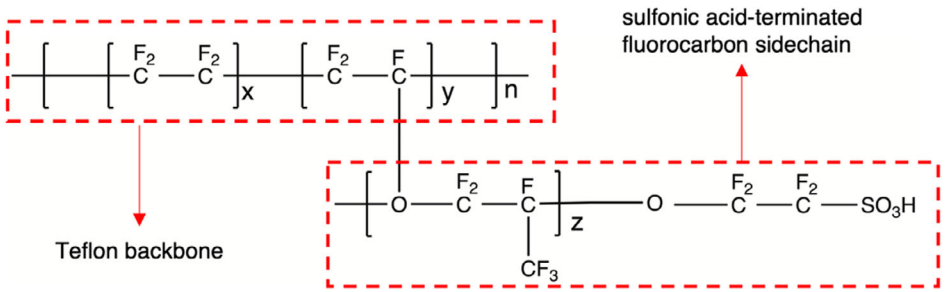


**Figure 3.** Structure of Nafion.


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thus relatively mobile) are called free water molecules. To reduce the repulsive interaction energy with the hydrophobic matrix, these hydrophilic domains (containing water and sulfonic acid groups) form spherical clusters. It is comparable to inverse micelles formed by hydrophilic groups in a hydrophobic environment. At the beginning, these clusters are isolated from each other and closed. But as they sorb water, these spheres get bigger and start to touch each other, eventually forming a continuous connected pathway (**Figure 4**).

Protons can then be transmitted through this pathway by either the Grotthus mechanism or vehicular transport (**Figure 5**). In Grotthus mechanism, protons are transported along a chain of water molecules by repeated formation and cleavage of hydrogen bonds whereas in vehicular transport, individual water molecules ferry the protons (as hydronium-like ions) through the hydrophilic channels.[40,41]

The Grotthus mechanism can be described as follows. 1) protons produced in the anodic chamber adhere to the water molecule present on the surface of the PEM and form a hydronium ion. 2) This results in instantaneous reorientation of the protonated water molecule. 3) This then forces another proton from the same molecule to jump onto the next water molecule and ionize it. 4) The cycle is repeated until the proton is transported over to the other side.[42] Despite the high density of $SO_3^-$ groups in Nafion, proton transfer cannot proceed directly between $SO_3^-$ groups because the average distance between these groups is far too large (≈1 nm).[43]

In the vehicular transport mechanism, protons migrate not as $H^+$ but as a combined species like $H_3O^+$, or $H_9O^+$ by bonding to

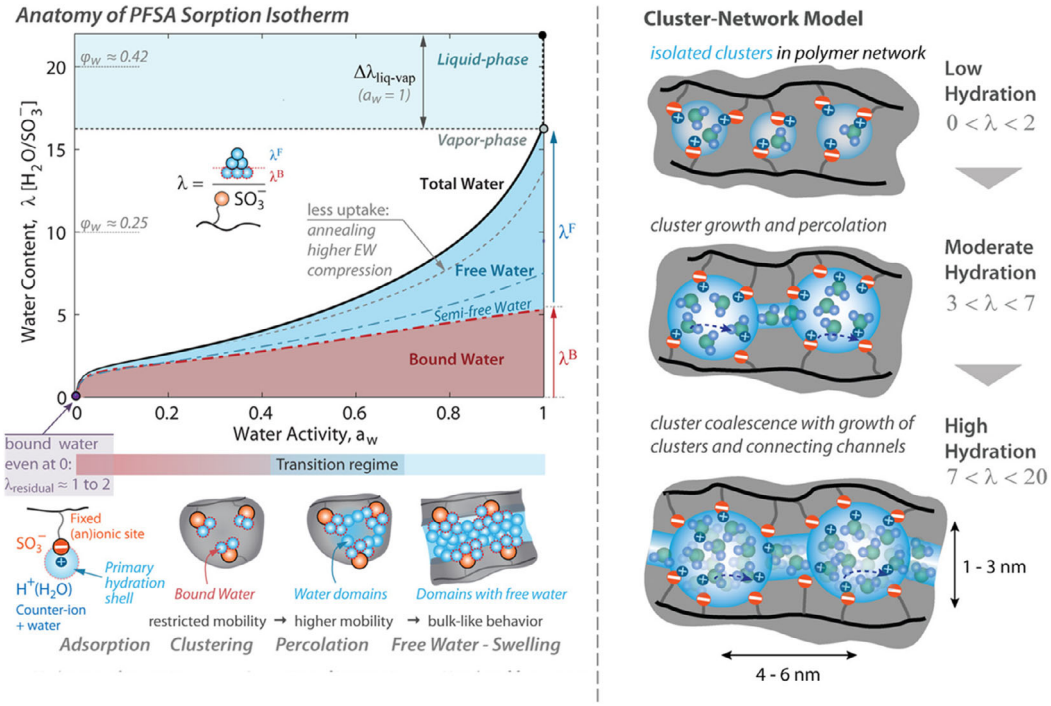


**Figure 4.** Water uptake in Nafion and cluster network model. Reproduced under the terms of the ACS AuthorChoice License.[173] Copyright 2017, Ahmet Kusoglu et al. Published by ACS Publications.

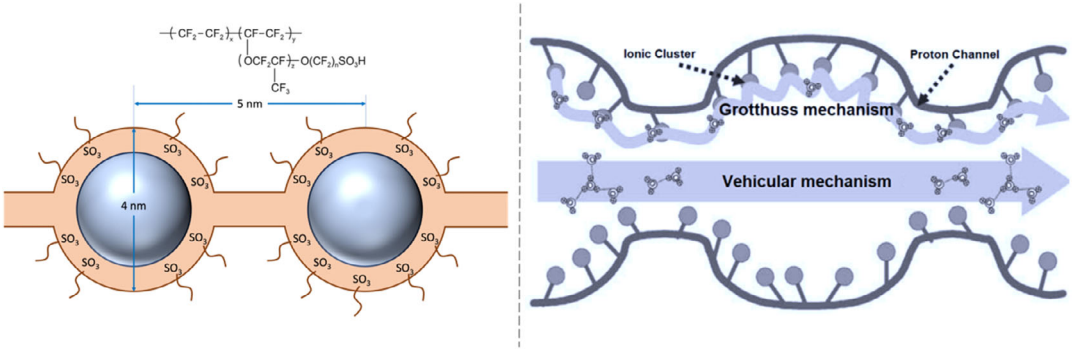


**Figure 5.** Proton conduction in PEMs: structure of Nafion clusters. Reproduced with permission.[238] Copyright 1983, Elsevier; mechanisms of conduction. Reproduced with permission.[41] Copyright 2005, Royal Society of Chemistry.


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a vehicle such as $H_2O$. The vehicle must have two essential features;[42] 1) It must act as a strong Bronsted base (proton acceptor); and 2) It must have a high self-diffusion coefficient

An interesting analogy was presented by Yasuda and Watanabe who explained the phenomena by considering the transport of a ball.[44] In Grotthus mechanism, the ball is passed from one person to the next in a queue. On the other hand, vehicular transport is like an individual carrying the ball from one end to the other by physically travelling the distance. Obviously, the latter is more energy intensive and sometimes even slower. This is indeed the case. Due to the small lifetime of the hydronium ions (≈3 ps), the speed of proton conduction is nearly 10 times higher in Grotthus mechanism than in vehicular transport.[45] In other words, in Grotthus mechanism, protons move faster than water across the membrane, whereas in vehicular transport, both move at same rate.[46]

However, it must be noted that it is not only one mechanism which is at play, but rather a combination of both.[47,48] It is believed that if water is the proton transporting medium, 22% of the total conductivity comes from vehicular transport while the rest is attributed to Grotthus transport, at standard temperature and pressure conditions.[49]

### 2.1.3. Advantages and Disadvantages

*Performance Advantages*: Nafion is notable for its unique property of permitting only cations to pass through, while effectively blocking both neutral and anionic species. This characteristic is reflected in its high cation transport number.[50,51] The specific properties of Nafion membranes are greatly influenced by factors such as their thermal history, the processing methods used, the surrounding environmental conditions, and the degree of hydration.[52,53] For example, it has been observed that the proton conductivity of Nafion 117 improves with an increase in relative humidity. Conversely, the conductivity tends to decrease as the temperature rises, peaking at around 100 mS $cm^{-1}$.[53]

*Performance-Related Issues*: A key issue associated with Nafion is its ability to transport cation species other than protons ($Na^+$, $K^+$, $NH^+$, $Ca^{2+}$, and $Mg^{2+}$).[54] While protons exhibit higher diffusivity, their relatively lower concentration leads to a situation where nearly 99.999% of the sulfonate groups in Nafion are occupied by these cations instead of protons.[55] This can result in a substantial pH imbalance: the anodic pH may drop, which can impair microbial activity, and at the same time, there can be an increase in the cathodic pH, which reduces the cathode potential.[56]

The other problem is that among the commercial membranes, Nafion is the most permeable membrane to oxygen[54] with oxygen diffusivity ranging from 1 to $6 \times 10^{-6}$ $cm^2$ $s^{-1}$,[57] leading to loss of 28% anolyte glucose due to aerobic bacterial respiration.[17] Although this can be mitigated to some extent by adding oxygen scavengers (such as cysteine) in the anolyte,[58] it can further add to the operating cost. Another problem is that of fouling due to biofilm formation as well as corrosive effects of microbial metabolic products and nondegraded matter from wastewater.[59] Fouling of membrane can considerably reduce MFC performance and also add to replacement cost, which is an important consideration for an expensive membrane like Nafion.[57]

*Cost Issues*: Probably the single biggest drawback of Nafion is its cost, which can be as high as US$1733 $m^{-2}$.[60] Not surprisingly, in an MFC with Nafion as PEM, nearly 40% of the total cost can go toward Nafion alone.[61] Moreover, owing to high demand and rising cost of raw materials, the price of Nafion has increased by almost 218% in the decade between 2008 and 2019.[62] The trend is expected to continue in the near future.

*Sustainability Issues*: The environmental impact of Nafion has been a subject of concern. Nafion is classified in the category of per- and polyfluoroalkyl substances (PFASs), which are notorious for resisting degradation in the environment.[63,64] Their persistence is due to the very strong carbon–fluorine covalent bond, resulting in their accumulation in soil and water and even in human body if ingested. Typically, Nafion that is not recycled is either disposed in landfills or incinerated. If disposed in landfills, it can leach into the surrounding environment, putting the soil and groundwater at high risk of contamination.[65] If incinerated, several types of toxic and polluting perfluorinated compounds are released.[66] Hence several governments are increasingly restricting their use, with the European Commission planning to phase out most PFASs—it is not yet clear if Nafion would be exempted.[63] Another impact of Nafion is from the potentially corrosive chemicals needed for its activation, namely, hydrogen peroxide and sulfuric acid.[67]

### 2.1.4. Improvement of Nafion PEMs

Recently, there has been a trend of using polyvinylidene fluoride (PVDF) in conjunction with Nafion.[51,68–72] The choice of PVDF was supported by a study in which sulfonated PVDF was successfully employed as a replacement for Nafion, producing higher conductivity (9.07 against 6.08 mS $cm^{-1}$) as well as ion exchange capacity (IEC) (1.03 against 0.93 meq $g^{-1}$).[51] Shahgaldi et al. fabricated a composite PEM made of electrospun PVDF with different concentrations of Nafion.[68] The optimized composite membrane showed a higher power density (4.9 mW $m^{-2}$), current density (57.6 mA $m^{-2}$), as well as CE (12.1%) than pure Nafion 117. Kumar et al. used sulfonated PVDF to 1) coat Nafion (by immersing Nafion membrane in sulfonated PVDF solution); and 2) laminate it (by hot pressing a Nafion membrane in between two PVDF membranes) to reduce oxygen crossover in Nafion.[69] However, the increased membrane thickness increased the Ohmic resistance, and thus lowered the power output.

In another study, Kumar et al. used poly(vinylidene fluoride-co-hexafluoropropylene) (PVDF-co-HFP), which is known to have better mechanical and dielectric properties than bare PVDF, to make a 80:20 blend with Nafion, and added nanoalumina to it.[70,71] The addition of hygroscopic nanoalumina particles had two benign effects: higher water uptake and lower swelling ratio. Water uptake represents the percentage of water absorbed by the membrane in a particular time, while swelling ratio is the change in thickness of the membrane when placed in water for a specified duration. Generally, higher water uptake, which is necessary for forming proton-conducting channels, also leads to higher swelling, which can cause dimensional instability.[72] In this study, however, water uptake and swelling ratio showed an opposing trend. High water uptake was attributed to the formation of tortuous channels in the matrix, while low


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swelling ratio was postulated to be due to pore blockages caused by surface agglomeration of alumina.

Fan and Zhang first added $SiO_2$ and $TiO_2$ nanoparticles to a Nafion membrane and then immersed it in a mixture of two heteropolyacids (HPAs), namely, silicotungstic acid and phosphomolybdic acid.[73] In an alternative membrane, the same procedure was carried out except that the salts of HPAs were used instead of acids. Both the membranes showed better results than bare Nafion, in terms of power generation. Further, it was found that the salts gave better results than acids, as the latter leaked out of the membrane due to insufficient solubility. Bajestani and Mousavi investigated the role of solvent on the properties of a solution cast Nafion/$TiO_2$ nanocomposite membrane and found that by changing the solvent, the IEC can be enhanced. While it was 0.77 meq $g^{-1}$ in N-methyl-2-pyrrolidone (NMP) and 1.08 meq $g^{-1}$ in dimethylacetamide (DMAc), it rose to 1.32 meq $g^{-1}$ in dimethylformamide (DMF).[74] Similarly, proton conductivity increased from 3.3 mS $cm^{-1}$ in NMP to 4.5 mS $cm^{-1}$ in DMAc to 12.6 mS $cm^{-1}$ in DMF. This was attributed to better interaction of Nafion with DMF due to similar solubility parameters.

Finally, treating Nafion itself could be another way of overcoming some of its drawbacks. For example, it is well established that pretreatment plays an important role in the performance of Nafion, by causing modifications in the membrane surface.[75] Rao et al. demonstrated another approach by tuning the pore size and porosity of Nafion through UV irradiation and found that optimum dose of UV rays can considerably enhance the proton conductivity.[72] The reported findings on the effects of additives on Nafion 117 membrane properties are listed in **Table 2**.

### 2.2. Poly ether ether ketone (PEEK)

Poly ether ether ketone (PEEK) is a highly crystalline, thermostable polymer with an aromatic, nonfluorinated backbone. There are three linearly bonded phenyl rings in a PEEK monomer which are linked by two ether (–O–) and one carbonyl (–CO–) linkages (**Figure 6**). The hydroquinone unit flanked by a pair of equivalent ether groups has the most reactive site that lend themselves to sulfonation. The other two rings are less reactive

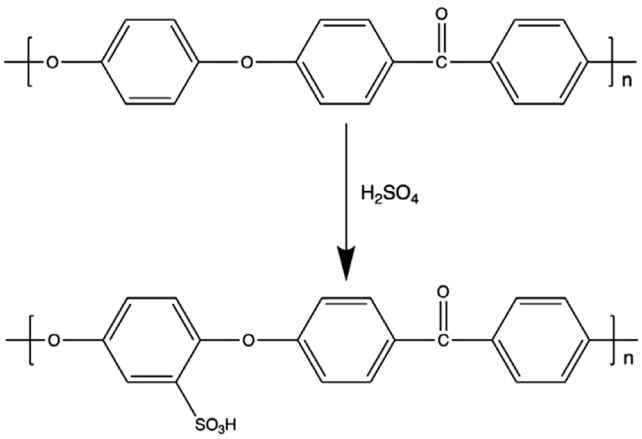


**Figure 6.** Structure of PEEK and SPEEK.

because of the electron-withdrawing carbonyl groups. Thus, each repeat unit may be substituted by one sulfonic acid group.[76]

Sulfonation of PEEK is typically achieved by treating it with concentrated sulfuric acid, as other reagents like chlorosulfonic acid can lead to degradation.[77] The degree of sulfonation (DS), indicating the number of $–SO_3H$ groups relative to all possible substitution sites, is crucial in determining the properties of sulfonated PEEK (SPEEK). Below 45% DS, the membrane shows poor proton conductivity (less than 0.01 mS $cm^{-1}$) and hence most studies use a much higher value of DS.[78] The DS can be synthetically controlled by adjusting the reaction time and temperature. An alternative method involves directly polymerizing sulfonated monomers, rather than modifying the polymer afterward.[78,79] This approach allows for more precise control over the molecular structure, such as molecular weight and branching, which is not achievable with postmodification techniques. Although a higher DS improves proton conductivity due to increased water uptake, it reduces mechanical stability. At levels above 80% DS, the membrane becomes excessively hydrophilic and may even dissolve in water.[80,81] One strategy to enhance mechanical stability while keeping a high DS is to crosslink SPEEK chains using bifunctional covalent crosslinkers, with diamines like aminopropylalkoxysilanes being the most common.

**Table 2.** Effect of various additives on the properties of Nafion 117 membranes.

| Additive | wt% | Proton conductivity [mS $cm^{-1}$] | IEC [meq $g^{-1}$] | Water uptake [%] | Swelling degree [%] | $K_0$ [$\times 10^{-5}$ cm $s^{-1}$] | Tensile strength [MPa] | References |
|---|---|---|---|---|---|---|---|---|
| – | – | 1–100 | 0.86–1.0 | 11–22 | 17% | 8–36 | 24 | [80,239–241] |
| $TiO_2$ | 1 | 12.6 | 1.32 | 51 | – | – | – | [74] |
| $Al_2O_3$ | 0 | 23.2 | 0.72 | 20 | 11 | 8.43 | – | [70] |
| $Al_2O_3$ | 5 | 35.7 | 0.66 | 24 | 10 | 92.7 | – | [70] |
| $Al_2O_3$ | 10 | 14.4 | 0.47 | 33 | 9 | 216 | – | [70] |
| $Al_2O_3$ | 20 | 51.2 | 0.27 | 36 | 8 | 4170 | – | [70] |
| CA[a)] | 7 | 192 | – | 51 | – | – | 2.35 | [242] |
| Nylon 6 | 14 | 287 | – | 25 | – | – | 6.44 | [242] |
| PMIA[b)] | 58 | 225 | – | 46 | – | – | 7.18 | [242] |

[a)]cellulose acetate; [b)]poly-*m*-phenylene isophthalamide.


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This method helps maintain the desirable properties of SPEEK without compromising its structural integrity.[80]

Like Nafion, SPEEK has two different domains: hydrophilic domain formed by clusters of sulfonic groups and hydrophobic domain formed by the aromatic hydrocarbon backbone. However, the backbone of SPEEK is less hydrophobic and its sulfonic acid cluster is less polar (hydrophilic) than Nafion. The difference in the proton conduction mechanism and morphology of SPEEK and Nafion in terms of the spherical cluster theory was recently elaborated by Wang et al. through molecular dynamics (MD) simulations and adsorption studies.[82] It was shown that water content $\lambda$ in SPEEK (DS 50%) and Nafion at 2 °C was 8.2 and 16.2, respectively, mainly due to difference in the number of free water (as opposed to bound water) molecules. Moreover, the cluster separation in SPEEK (1 nm) was smaller than in Nafion (3–5 nm), indicating weak phase separation in the former. Another interesting observation was that the interaction between $O_s$ (oxygen atom on sulfonic groups) and $H_h$ (hydrogen atom on hydronium ions) was much stronger in SPEEK, making the diffusivity of $H_2O$ considerably lower in SPEEK than in Nafion. These effects combinedly led to lower proton conductivity in SPEEK. Moreover, SPEEK membranes begin to swell easily, thus losing their mechanical stability. Nevertheless, a major advantage of SPEEK is its lower oxygen permeability. This is attributed to lower free volume, because the separation between the hydrophobic and hydrophilic domains in SPEEK is much smaller than in Nafion.[83]

In a study that compared SPEEK and Nafion, it was found that the system working with Nafion 117 produced higher power density than the same system with SPEEK, mainly because of the high resistance of the latter.[84] However, the result obtained by Dharmalingam and coworkers was opposite: according to their study, MFC with the SPEEK membrane produced 55.2% higher power density than Nafion.[85,86] This discrepancy may be due to differences in either DS of the SPEEK membranes or pretreatment of the studied Nafion membranes. Nevertheless, most studies indicate that the performance of SPEEK is usually inferior to Nafion.[83,87,88] To address this, several modifications have been proposed, the most common among them being the use of inorganic fillers.

Inorganic fillers can be used to reduce the biofouling of SPEEK membranes, which is especially important for SPEEK, given its higher susceptibility to biofouling than Nafion.[88] However, there are concerns regarding the potential toxicity of some of these fillers toward the anodic bacteria, especially at subneutral pH levels.[89] A major challenge remains the aggregation of these fillers in the membrane matrix, which can result in anisotropic properties. Sometimes, compatibilizers are used to create adhesion between the SPEEK matrix and the filler to overcome this problem of ineffective dispersion. For example, Ilbeygi et al. added the filler cloisite clay and the compatibilizer 2,4,6-tiaminopyrimidine (TAP) to the SPEEK matrix to create a composite membrane. Although the fillers did reduce the Ohmic resistance of SPEEK, it remained much higher than Nafion 117, with the result that the performance of Nafion could not be matched.[87]

Sometimes the fillers are modified before being added to the matrix to either enhance adhesion or introduce additional functionality. For example, composites of SPEEK have been made with sulfonated fillers like titanium oxide, silica, and graphene oxide (GO).[90–92] A common trend in all these studies was the order of power density obtained with different membranes: SPEEK composite with sulfonated additives > nonsulfonated additives > pristine SPEEK. This is along expected lines since many of these fillers themselves are nonconducting and introduction of $-SO_3H$ groups dramatically improves their conductivity.

Apart from inorganic fillers, polymeric resins have also been used as modifiers for SPEEK PEMs. An ion-exchange resin (IER) comprises crosslinked polymer matrix having uniformly distributed ionic groups. When the matrix is negatively charged and embedded with positive ions, it can be used for cation exchange. A SPEEK composite with cation exchange resin (made with sulfonated styrene-crosslinked divinylbenzene) was fabricated.[93] Incorporating the resin had two competing effects: its compact crosslinked structure reduced the water uptake (which ultimately resulted in lower conductivity), whereas its higher IEC had a positive effect on conductivity. The overall effect was that proton conductivity was higher than pristine SPEEK but still lower than Nafion.

Mayahi et al. selectively modified the surface of the polymer using charged surface-modifying macromolecule (cSMM).[94] cSMM is a polymer capped with sulfonic acid groups, which migrates to the surface of the base matrix and makes it more hydrophilic, without affecting the properties of the bulk. At 76% DS of SPEEK, the blend membrane outperformed Nafion in terms of power density (172.12 against 143.7 mW $m^{-2}$), though at lower DS levels Nafion showed better results. An overview of the reported findings on the effects of additives on SPEEK membrane properties is given in **Table 3**.

### 2.3. Polysulfone

Polysulfones are a class of amorphous thermoplastics which are composed of aromatic groups, ether groups and sulfonyl groups (**Figure 7**). The polymers of this family (standard polysulfone, polyaryl sulfone, polyethersulfone, polyphenyl sulfone) are characterized by thermal and mechanical stability as well as high transparency.[95]

Simari et al. performed an MD study to elaborate the morphological architecture of hydrated sulfonated polysulfone (DS 80%).[96] They showed that the membrane had a lamellar-like (rather than strictly spherical) cluster structure. The average cluster size was much smaller (1.4–1.8 nm) than Nafion (3–5 nm).[82,96] The hydration number was also found to be smaller (10.2) compared to Nafion (16.2) at 2 °C. Moreover, unlike Nafion, most of the hydration molecules were in the bound state. The result of lower hydrophilic/hydrophobic phase separation and poorly connected nanochannels was a substantially lower proton conductivity.[96,97]

Pristine polyether sulfone (PES) is rarely used in MFCs, although its nanocomposites with $Fe_3O_4$ have been investigated.[98] Even though the incorporation of the hydrophilic nanoparticles did improve proton conductivity, it could not achieve comparable IEC, water uptake, or oxygen mass transfer coefficient as Nafion. Lim et al. fabricated a composite of PES/SPEEK and found that proton conductivity of the hydrophobic PES membrane increased when a small amount of hydrophilic SPEEK was added; however, the level of Nafion could still not


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**Table 3.** Effect of various additives on the properties of SPEEK membranes.

| Additive | wt% | Proton conductivity [mS cm$^{-1}$] | IEC [meq g$^{-1}$] | Water uptake [%] | Swelling degree [%] | $K_0$ [$\times 10^{-6}$ cm s$^{-1}$] | Tensile strength [MPa] | References |
|---|---|---|---|---|---|---|---|---|
| – | – | 1.5–40 | 0.9–1.93 | 16–60 | 10–22.5 | 1.38–4 | 1.94–45 | [14,79,158] |
| $TiO_2$ | 5.0 | 5.4 | 0.75 | 25 | – | 0.70 | – | [90] |
| Sulfonated $TiO_2$ | 2.5 | 8.06 | 0.95 | 32 | – | 0.50 | – | [90] |
| Sulfonated $TiO_2$ | 5.0 | – | 0.99 | 37 | – | 0.70 | – | [90] |
| Sulfonated $TiO_2$ | 7.5 | 13.8 | 1.05 | 39 | – | 0.80 | – | [90] |
| Sulfonated $TiO_2$ | 10 | – | 0.94 | 38 | – | 0.87 | – | [90] |
| $SiO_2$ | 5.0 | 4.6 | 1.41 | 39 | – | 0.9 | – | [91] |
| Sulfonated $SiO_2$ | 2.5 | 6.5 | 1.65 | 35 | – | 1.2 | – | [91] |
| Sulfonated $SiO_2$ | 5.0 | 7.2 | 1.73 | 40 | – | 1.0 | – | [91] |
| Sulfonated $SiO_2$ | 7.5 | 10.2 | 1.80 | 42 | – | 0.84 | – | [91] |
| Sulfonated $SiO_2$ | 10 | 5.5 | 1.74 | 37 | – | 0.70 | – | [91] |
| IER[a)] | 2.5 | 1.53 | 1.66 | 16 | – | 3.8 | – | [93] |
| IER[a)] | 5.0 | 1.55 | 1.75 | 16 | – | 3.4 | – | [93] |
| IER[a)] | 7.5 | 1.62 | 1.88 | 15 | – | 3.0 | – | [93] |
| IER[a)] | 10 | 1.56 | 1.80 | 15 | – | 3.2 | – | [93] |
| Zeolite | 2.5 | 1.56 | 1.68 | 19.2 | | 0.82 | | [155] |
| Zeolite | 5.0 | 1.65 | 1.73 | 21.0 | – | 0.82 | | [155] |
| Zeolite | 7.5 | 1.78 | 1.85 | 23.0 | – | 0.79 | | [155] |
| Zeolite | 10 | 1.68 | 1.79 | 22.8 | – | 0.80 | | [155] |
| Ag NPs[b)] | 2.5 | 12.3 | 1.80 | 37.7 | – | 1.88 | | [158] |
| Ag NPs[b)] | 5.0 | 12.3 | 1.80 | 38.1 | – | 1.65 | | [158] |
| Ag NPs[b)] | 7.5 | 12.4 | 1.80 | 38.5 | – | 1.43 | | [158] |
| Ag NPs[b)] | 10 | 12.2 | 1.80 | 38.3 | – | 1.54 | | [158] |
| GO[c)] | 0.5 | 38 | – | 76 | – | 1.1 | – | [243] |
| Ag GO[c)] | 0.5 | 37 | – | 75 | | 1.0 | – | [243] |
| Kaolinite | 6 | 73 | 0.2 | 7 | 3.4 | – | 34.2 | [204] |
| Kaolinite | 9 | 213 | 0.3 | 4 | 2.3 | – | 33.6 | [204] |
| Kaolinite | 15 | 116 | 0.4 | 9 | 7.6 | – | 32.8 | [204] |
| Sepiolite | 3 | 58 | 1.8 | 2.7 | 2.5 | – | 40.1 | [204] |
| Sepiolite | 6 | 75 | 1.3 | 7.4 | 8.0 | – | 38.6 | [204] |
| Sepiolite | 9 | 91 | 0.9 | 8.9 | 18.3 | – | 37.5 | [204] |
| Sepiolite | 12 | 86 | 1.5 | 12.3 | 12.2 | – | – | [204] |
| Sepiolite | 15 | 85 | 0.5 | 2.7 | 10.8 | – | 36.8 | [204] |
| $CePO_4$ | 2 | 30 | 1.62 | 18 | 8 | – | 60 | [244] |
| $CePO_4$ | 5 | 60 | 1.61 | 22 | 7 | – | 62 | [244] |
| $CePO_4$ | 10 | 80 | 1.64 | 24 | 7 | – | 64 | [244] |
| $CePO_4$ | 15 | 80 | 1.67 | 23 | 7 | – | 64 | [244] |
| $CePO_4$ | 20 | 80 | 1.66 | 25 | 8 | – | 62 | [244] |
| $H_2WO_4$–$TiO_2$ NTs[d)] | 2 | 7.37 | 2.55 | 15.3 | – | – | 18 | [239] |
| $H_2WO_4$–$TiO_2$ NTs[d)] | 4 | 8.64 | 2.87 | 17.7 | – | – | 18.5 | [239] |
| $H_2WO_4$–$TiO_2$ NTs[d)] | 6 | 9.63 | 3.28 | 19.2 | – | – | 22.1 | [239] |
| $H_2WO_4$–$TiO_2$ NTs[d)] | 8 | 9.32 | 2.94 | 18.7 | – | – | 19 | [239] |

[a)]IER; [b)]nanoparticles; [c)]graphene oxide; [d)]nanotubes.


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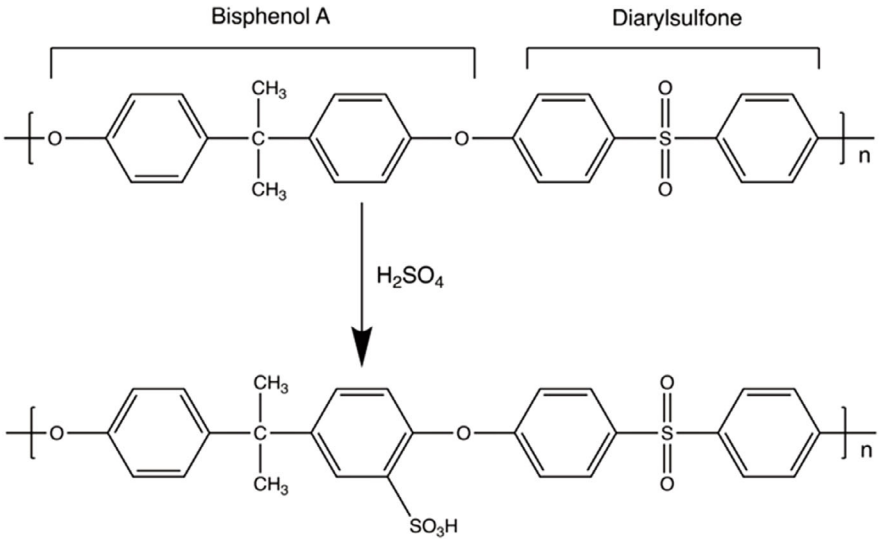


**Figure 7.** Structure of polysulfone and sulfonated polysulfone.

be reached.[99,100] Elakkiya et al. found similarly that PES/SPEEK has better properties than pristine PES but still lower than pristine SPEEK.[101] They also found that incorporating hydrophilic additives such as nanoparticles of $Fe_3O_4$, $TiO_2$, and $MoO_3$ substantially improved the conductivity of the composite membrane.

Ghasemi et al. added a conducting polymer, polyaniline (PANI), to polysulfone[102] and found, counterintuitively, that the addition of undoped PANI (which is intrinsically less conducting) performed better than doped PANI (which is intrinsically more conducting). This was because of latter's lower solubility in the matrix.[103] Another approach has been to use sulfonated PES instead of pristine PES, modifying it suitably to achieve better MFC performance. For instance, Nagar et al. first sulfonated PES and then incorporated multiwalled carbon nanotubes into the matrix and reported an IEC of 1.45 meq $g^{-1}$, and a high proton conductivity of 860 mS $cm^{-1}$.[104] The effects of additives on polysulfone membrane properties are listed in **Table 4**.

### 2.4. Polyvinyl Alcohol (PVA)

Owing to its unique advantages such as low cost, inherent antifouling properties, film-forming ability, hydrophilicity, biodegradability, and availability of sites for chemical modifications (in particular, sulfonation), PVA-based membranes have been studied as potential PEMs.[105]

A study on the morphology of sulfonated PVA (DS 70%) revealed a comparable average cluster size (≈5 nm) to Nafion (3–5 nm), with few larger clusters distributed randomly.[82,106] However, water content in PVA was much higher (≈30) than Nafion (≈16.2), most of which (63%) was bound water. This may help explain the low proton conductivity of sulfonated PVA, as it is well known that proton diffusion is better facilitated by free water rather than bound water.[107,108] In Nafion 117, for instance, less than 18% of water content is in form of bound water, and the rest is free water.[107]

A major problem with PVA is its high swelling degree which can considerably increase membrane resistance and reduce its stability. Thus, PVA needs to be crosslinked to ensure compaction. However, increasing the cross-link density usually has a detrimental effect on the electrochemical performance of PVA membranes.[105] This trade-off between stability and performance is a major challenge in PVA membranes. Moreover, since PVA itself has very low intrinsic proton conductivity, it must be suitably modified by either: 1) making PVA composites with functionalized additives; 2) modifying the PVA polymer chain; and 3) blending PVA with another polymer.

Following the first approach, a PVA/sulfonated GO composite membrane was developed by Beydaghi et al.[109] They first prepared GO nanoparticles from natural graphite and then modified it with aryl diazonium salt of sulfanilic acid.[110] These particles were added to PVA, followed by crosslinking with glutaraldehyde and then casting the solution. The modified membranes showed improved thermal, mechanical, and electrochemical properties compared to Nafion.

Recently, sulfonated silica nanoparticles have received considerable attention as additives for PVA membranes. Studies have focused on incorporating silica nanoparticles sulfonated with poly(sulfonic acid),[111] phenyl sulfonic acid,[112] and 3-(trimethoxysilyl)-1-propanethiol[113] into glutaraldehyde-crosslinked PVA for improving the proton conductivity. It appears that the choice of sulfonating agent does not have a significant bearing, with all three studies reporting a proton conductivity within a small range of 7–9 mS $cm^{-1}$. Further, PVA-based membranes have also been modified with a host of other additives such as montmorillonite filler,[114] vermiculite clay,[115] GO,[116] vanadium oxide,[117] sulfonated polyhedral oligosilsesquioxane,[118] superabsorbent polymer,[119] and carbon black[120] with varying degrees of success.

The second approach, namely, the modification of the PVA polymer chain itself, is more intuitive and straightforward. For example, sulfosuccinic acid has been used as the crosslinker that also imparts proton-conducting groups into the matrix, thus


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**Table 4.** Effect of various additives on the properties of polysulfone membranes.

| Base polymer[a)] | Additive | wt% | Proton conductivity [mS cm$^{-1}$] | IEC [meq g$^{-1}$] | Water uptake [%] | $K_0$ [$\times 10^{-4}$ cm s$^{-1}$] | References |
|---|---|---|---|---|---|---|---|
| Sulf. PES | – | – | 0.32 | 0.36 | 12.3 | 8.50 | [245] |
| Sulf. PES | GO | 0.6 | 0.44 | 0.42 | 20.7 | 9.81 | [245] |
| Sulf. PES | GO | 1.2 | 0.52 | 0.54 | 22 | 8.82 | [245] |
| Sulf. PES | GO | 1.8 | 0.56 | 0.74 | 23.1 | 8.50 | [245] |
| Sulf. PES | Sulf. GO | 1.2 | 1.25 | 0.72 | 33.5 | 4.36 | [245] |
| Sulf. PES | Sulf. GO | 1.8 | 1.42 | 0.84 | 36.3 | 4.26 | [245] |
| Sulf. PES | Thiol. GO | 0.6 | 0.84 | 0.55 | 24.5 | 5.00 | [245] |
| Sulf. PES | Thiol. GO | 1.2 | 1.01 | 0.63 | 26.2 | 4.48 | [245] |
| Sulf. PES | Thiol. GO | 1.8 | 1.25 | 0.77 | 30.0 | 4.35 | [245] |
| PES | – | – | 0.02 | 0.23 | 10.5 | 12.6 | [101] |
| PES | Sulf. $Fe_3O_4$ | 5 | – | 2.08 | 2.0 | 1.10 | [101] |
| PES | Sulf. $Fe_3O_4$ | 10 | – | 5.49 | 3.8 | 1.28 | [101] |
| PES | Sulf. $Fe_3O_4$ | 15 | – | 6.49 | 4.0 | 1.45 | [101] |
| PES | Sulf. $Fe_3O_4$ | 20 | – | 5.23 | 5.2 | 1.46 | [101] |
| Sulf. PS | – | – | 0.90 | – | 7.0 | 8.20 | [246] |
| Sulf. PS | MOF MIL100 (Fe) | 1 | 1.01 | – | 11.8 | 7.60 | [246] |
| Sulf. PS | MOF MIL100 (Fe) | 3 | 1.21 | – | 12.5 | 7.20 | [246] |
| Sulf. PS | MOF MIL100 (Fe) | 5 | 1.95 | – | 24.1 | 6.74 | [246] |
| Sulf. PS | MOF MIL100 (Fe) | 7 | 2.55 | – | 36.5 | 6.49 | [246] |

[a)]sulf.: sulfonated; thiol.: thiolated.

obviating the need of an additional additive.[121] Interestingly, Hou et al. found that although increasing the concentration of sulfosuccinic acid reduced water uptake due to higher crosslink density, it nevertheless increased the proton conductivity due to higher concentration of ionic groups. This observation was also made earlier for PVA membranes crosslinked by sulfonated poly(acrylic acid).[122] This approach is promising in resolving the performance-stability trade-off of PVA membranes discussed earlier.

Toony et al. introduced acidic groups on the PVA chain by phosphorylation instead of sulfonation, by reacting it with hypophosphorous acid ($H_3PO_2$).[123] They then blended it with a composite of polyhydroxybutyrate (PHB) and phosphonate-terminated silica nanoparticles, followed by gamma ray crosslinking. The maximum proton conductivity obtained was 86 mS cm$^{-1}$, indicating the potential of phosphorylation as an alternative modification route for PVA.

Following the third approach, a membrane was made from the blend of sulfonated polyimide (SPI) and PVA by solution casting technique.[124] An increase in the DS of SPI resulted in a corresponding increase in the proton conductivity (up to 69 mS cm$^{-1}$). Interestingly, incomplete miscibility, leading to microphase separation improved both, proton selectivity and water retention.

Despite many efforts, the best achieved proton conductivity of PVA-based PEMs remains much lower than that of Nafion.[125] Another problem with PVA matrix is its high oxygen permeability ($1.5 \times 10^{-3}$ cm s$^{-1}$) that can considerably reduce CE.[116,126] Nevertheless, significant cost reductions can be achieved with PVA membranes—one study claimed that PVA membranes can be 100 times more economical than Nafion, based on cost per unit power generation calculations.[127] The effects reported thus far of additives on PVA membrane properties are listed in **Table 5**.

### 2.5. Ionic Liquids

Ionic liquids (IL) have attracted some attention for their potential use in PEMs. ILs are organic salts that are present as liquids near room temperature. They comprise of an organic cation and an organic/polyatomic anion, whose chemistry can be tailored to achieve desired properties.[128,129] The biggest advantages of ILs are their near-zero vapor pressure (making them essentially non-volatile), high ionic conductivity, and high ionic selectivity. Essentially, there are two approaches for preparing IL-based membranes: 1) Supported ionic liquids membranes in which IL is embedded in the pores of an inert microporous support; and 2) Polymeric ionic liquid inclusion membranes in which IL is mixed into the base polymer to form a blend.

Kook et al. fabricated a membrane by immobilizing $[NTf_2][PF_6]$ IL in the pores of PVDF substrate and found comparable performance to Nafion at lower substrate concentrations.[130] Fernandez et al. prepared a PEM by dissolving PVC and IL in tetrahydrofuran (THF) followed by phase inversion by evaporation.[131] A much higher MFC power density was obtained with the optimized IL membrane (450 mW m$^{-3}$) than with Nafion (100 mW m$^{-3}$). Gohil and Karamanev reported the first use of ILs for creating PVA-based PEMs. They crosslinked the PVA with imidazole phosphate in the presence of IL.[132] The


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**Table 5.** Effect of various additives on the properties of PVA membranes.

| Additive | wt% | Proton conductivity [mS cm$^{-1}$] | IEC [meq g$^{-1}$] | Water uptake [%] | Swelling degree [%] | References |
|---|---|---|---|---|---|---|
| GO | 0.2 | 7 | 0.21 | 70 | 20.0 | [116] |
| GO | 0.4 | 128 | 0.33 | 45 | 10.5 | [116] |
| GO | 0.6 | 103 | 0.29 | 42 | 9.8 | [116] |
| GO | 0.5 | 11 | 0.58 | 76 | – | [247] |
| ZnO | 0.75 | 15 | 0.72 | 84 | – | [247] |
| ZnO | 1.0 | 22 | 0.80 | 108 | – | [247] |
| ZnO | 1.5 | 24 | 0.87 | 213 | – | [247] |
| ZnO | 2.0 | 23 | 0.84 | 168 | – | [247] |
| ZP[a)] | 1 | 1.0 | 0.63 | 2 | – | [248] |
| ZP[a)] | 2 | 7.5 | 0.76 | 7 | – | [248] |
| ZP[a)] | 3 | 10.5 | 0.82 | 11 | – | [248] |
| ZP[a)] | 4 | 12 | 0.88 | 15 | – | [248] |
| ZP[a)] | 5 | 16.5 | 1.02 | 40 | – | [248] |
| $TiO_2$–Si | n.a. | 83 | 0.81 | 61 | – | [249] |
| $SrTiO_3$–$TiO_2$–Si | n.a. | 75 | 0.81 | 53 | – | [249] |

[a)]zirconium phosphate.

imidazole sites doped with phosphoric/sulfuric acid groups from the IL formed effective proton transfer bridges. The result was a proton conductivity of 3.6 mS cm$^{-1}$.

An important challenge in IL-based membranes is the leakage of the IL during working of the cell, which can significantly deteriorate the MFC performance. For instance, it was noted that SILIM based on [omim$^+$][$PF_6$] yielded lowest COD reduction (30%) due to its toxicity toward the biocatalyst as well as because of its higher solubility in water, causing it to be leached out easily.[133] However, ILs can be selected in such a way that instead of being toxic, they are benign for microbial growth, thus ameliorating some of the concerns related to leaching.[134] A possible solution to the problem of leakage of water-miscible salts could be the addition of kosmotropic salts to the ILs, which can stabilize water structure of the IL, preventing their aqueous dissolution. Additionally, increasing the concentration of salts like $H_2PO^-$, $PO_3^-$, or $SO_2^-$ in the MFC to an extent that they do not cause damage to the bacteria may be advantageous in salting out ILs from water, improving their stability in the membranes.[128] Another important consideration in the stability of such membranes is that the base polymer must have similar hydrophobicity/hydrophilicity to that of IL. For example, when a hydrophobic IL like [$NTf_2$][$PF_6$] is to be used, a hydrophobic support like PVDF is more suitable.[130] However, it may be possible to use a hydrophobic IL like [BMIM][PF] with a hydrophilic matrix like PVA after addition of a compatibilizer.[132]

### 2.6. Plastic-Supported PEMs

Although most commonly available plastics cannot themselves be used as PEMs, they can serve as low-cost and flexible support for proton-conducting materials. A common technique of making plastic substrates nanoporous is track etching; in this, the plastic substrate is first irradiated with a high-energy ion beam to create weak spots, which can be then etched out chemically, thus rendering the membrane nanoporous.[135] Although such track-etched membranes can be directly used using only size-based exclusion, more commonly the pores are either chemically modified or filled with proton conducting materials to make them proton selective.[13] For example, it has been shown that introduction of –$SO_3H$ groups in the pores of track-etched plastic substrates by the gamma-ray induced graft polymerization of styrene and subsequent sulfonation can produce highly efficient PEMs.[136–138] Instead of grafting, impregnation (filling the pores with a proton-conducting medium) has also been used to create plastic-based PEMs.[139]

Modification of substrates can also be done directly at the surface, rather than inside the pores. This was demonstrated by Elmabood et al. who prepared a novel membrane by irradiation-induced graft copolymerization of glycidyl methacrylate (GMA) and vinyl acetate (VAc) onto low-density polyethylene (LDPE).[140] The prepared sheets were then sulfonated by epoxy ring opening of PGMA moieties. While GMA lends themselves to chemical modification, PVAc imparts sufficient chemical stability to ensure durable performance. The maximum power density obtained for the membrane with 80% grafting degree was 2720 mW m$^{-2}$ at a current density of 21.7 mA m$^{-2}$. Moreover, as the grafting degree increased from 20% to 230%, the proton conductivity increased from 0.84 to 280 mS cm$^{-1}$ and the IEC jumped from 0.89 to 2.08 meq g$^{-1}$. Another approach for plastic modification is the simple blending and casting method, as illustrated by the work of Gaurav et al., who prepared a membrane with polyvinyl chloride (PVC) as the base, doped with silica, citric acid, and phosphotungstic acid (PWA).[141] PWA was chosen as the proton conducting phase as it has high intrinsic proton conductivity at room temperature and is a strong solid Bronsted acid. Thus, by incorporating a proton-conducting dopant, they were able to fabricate a PEM from an essentially nonconducting


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plastic, although the IEC (0.88 meq $g^{-1}$) remained lower than that of Nafion (0.98 meq $g^{-1}$).

### 2.7. Natural Materials

Many natural materials that are not intrinsically conducting can be used as either a support matrix for proton-carrying species or be made conducting by functionalization. Such materials can be an interesting choice to replace Nafion, due to their biodegradability and lower environmental impact. For example, biomass-derived poly-3-hydroxyalkanoates (PHA), when used as matrix for carbon nanotubes (CNT), can show higher proton conductivity and consequently, better MFC performance than Nafion 117.[142] Evidently, upon increasing the amount of CNT, the conductivity also increased due to binding of water molecules to hydrophilic CNT. This, however, increased the oxygen permeability, because water molecules that provide pathways for proton conduction can also carry dissolved oxygen.

Molavian et al. functionalized eggshells by in situ polymerization of allyl sulfate on its surface and reported an eightfold increase in proton conductivity (8.1 mS $cm^{-1}$) than neat eggshell (1.1 mS $cm^{-1}$), which further improved to 48 mS $cm^{-1}$ in highly acidic environments.[143]

Chitosan, due to its abundance, price competitiveness, ease of modification, and antimicrobial properties, is another material that is being studied widely for PEM applications.[144] Harewood et al. blended and ionically crosslinked the positively charged chitosan with a biodegradable, anionic copolymer synthesized from malic acid and citric acid.[145] This not only introduced charge-carrying carboxylic groups but also improved the mechanical stability of chitosan, which otherwise is susceptible to high degree of swelling. The membrane could generate a power density of 3882 mW $m^{-2}$, somewhat lower than Nafion (4245 mW $m^{-2}$), although the long-term stability is still in doubt. Wong et al. prepared two blends of PVA and chitosan: one with presulfonation of PVA and the other with postsulfonation of PVA/chitosan blend.[146] They found that the postsulfonation method resulted in higher water uptake and ionic conductivity which was attributed to two factors: 1) Presulfonation caused some of the sulfonic groups to be crosslinked with PVA, leaving fewer hydrophilic groups for conduction; 2) Postsulfonation took place on both PVA and chitosan, thus increasing the number of sulfonic groups available for proton mobility

Nevertheless, in both cases, chitosan had a damping effect on the proton conductivity and IEC of the membrane. This result has also been corroborated in other chitosan/PVA PEMs.[147,148] Further, a general problem with natural materials is considerable batch-to-batch variation as well as complicated and time-consuming processing steps. Thus, a proper life-cycle assessment of these membranes is necessary to assess their true environmental impact.

## 3. Fouling in PEMs

Fouling is defined as the deterioration in the properties of the PEM, leading to a lower power output by the MFC during long-term operation. Fouling particularly affects the membrane in two ways: 1) it increases the Ohmic resistance of the PEM; and 2) it hinders proton transfer from the anode chamber to the cathode chamber, thereby reducing the anodic pH which deteriorates the anodic bacterial efficiency.[62] There are two sources of PEM fouling in an MFC: 1) cations present in anolyte, that precipitate on the ionic sites of the PEM; and 2) microbes that form stable and thick biofilm on membrane surface.

A study by Xu et al. found that after 90 days of operation, Nafion 117 membrane suffers considerable fouling, causing a decline in IEC by 50%, proton conductivity by 81.3%, and maximum power output by 32.3%.[149] By analyzing the fourier-transform infrared (FTIR) and energy dispersive x-ray spectra, as well as through confocal imaging, they found considerable attachment of not only bacterial species, but also polysaccharides, proteins, and inorganic salts on the PEM (**Figure 8**). Biofouling of PEM in MFCs can be addressed in two ways: membrane modifications, and use of biocides.

### 3.1. Fouling Prevention by Membrane Modifications

The properties of membranes relevant for fouling (particularly biofouling) include surface roughness, surface charge, and hydrophilicity. Surface roughness is defined as the degree to which the membrane deviates from an ideally smooth surface. Generally, rough surfaces lend themselves to more bacterial adhesion because of larger surface area. It is thus suggested that smooth surface PEMs be used to reduce biofouling. Previous studies have shown a positive correlation between flux decline and membrane roughness.[150] Nafion composite membranes with polyaniline and electrospun carbon nanofibers have been shown to exhibit higher resistance to biofouling in an MFC than pristine Nafion, primarily due to increased surface smoothness.[151,152]

Regarding surface charge, the introduction of either negatively or positively charged ions can help repel bacteria carrying a similar charge. For instance, Angioni et al. found that adding mesoporous sulfonated silica particles to Nafion significantly prolonged the operational duration of the MFC.[153] This improvement was attributed to considerable reduction in biofouling. The underlying reason, as pointed out by the authors, is the negative Z-potential of the sulfonated silica, in contrast to the positive Z-potential of unsulfonated silica. This means that when the composite material is hydrated, it remains negatively charged. As a result, it repels negatively charged microorganisms, thereby reducing biofouling.

Hydrophilicity has an impact on membrane biofouling because cell attachment and proliferation proceed faster on hydrophobic surfaces.[24] One way of making PEMs more hydrophilic is the use of inorganic fillers, whose porous cage structure retains water within the hydrophilic ionic clusters. This not only serves as a vehicle for proton transport but also makes the membrane more selective by excluding the larger hydrated metal ions by steric as well as size-exclusion mechanisms. At the same time, its hydrophilic nature washes out the biofilm and forms a barrier between the membrane surface and microorganisms.[59] This has been successfully demonstrated in several membranes such as SPEEK/rutile $TiO_2$,[59] SPEEK/silicotungstic acid,[154] SPEEK/zeolite,[155] and SPEEK/$Fe_3O_4$.[156] Another approach is to use antiadhesion hydrophilic coatings over the membranes to prevent the attachment of bacteria. In one study, polydopamine


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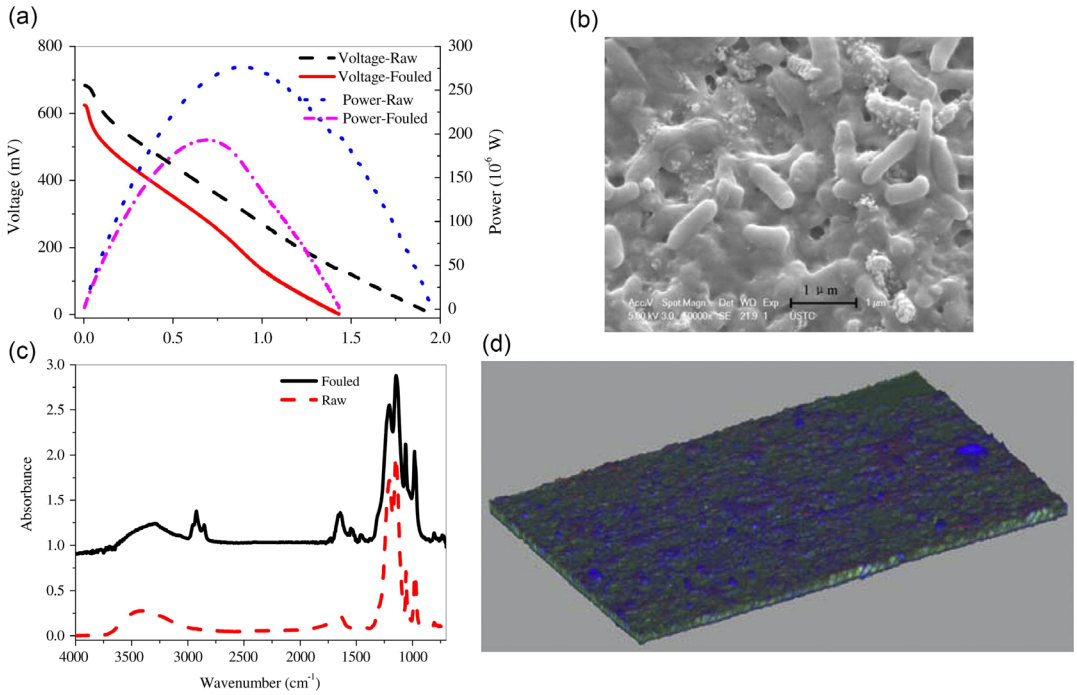


**Figure 8.** Effect of membrane (Nafion 117) biofouling in MFC. a) Deterioration in power and voltage output. b) scanning electron microscope image showing attachment of rod-shaped bacteria on the membrane. c) FTIR spectra change due to fouling. d) Reconstructed 3D image of the fouled membrane using confocal microscopy imaging. Green regions indicate proteins while blue regions indicate polysaccharides. Reproduced with permission.[149] Copyright 2012, Elsevier.

(concentrations 0.5 and 1.0 kg $m^{-3}$, named QPEEK-0.5 and QPEEK-1.0) was used as the coating for SPEEK membrane, and it was shown that MFC performance did not deteriorate even after 900 h of operation.[157] With the coating, the decline in maximum power density was just 2.3%, compared to 5.3% for the uncoated membrane (**Figure 9**). Although promising in the short run, the dissolution rate of such coatings should be studied to assess their long-term stability.

### 3.2. Fouling Prevention by the Use of Biocides

The use of biocides is becoming a popular method of reducing biofouling. The main challenge here is achieving selective biocidal activity that on the one hand prevents biofilm formation on the PEM and on the other, does not kill the biofilm on the anode. In one study silver ions were added to SPEEK solution and then cast into membranes.[158] The presence of silver ions not only slowed down the biofilm formation but also lowered the oxygen crossover by forming stable silver oxides with the incoming oxygen. This in turn, helped maintain better anaerobic conditions for the anodic bacteria, which ultimately resulted in reduced biofouling as well as increased power output. Similarly, additives such as copper and titanium dioxide have also been used to reduce membrane biofouling.[159]

Another class of biocidal compounds are the quaternary ammonium compounds (QACs), which are capable of damaging cell integrity by inserting their long hydrophobic alkyl chain into the cell membrane. In one study, QAC was grafted onto a PVDF membrane by atom-transfer radical polymerization, that resulted in inhibition rate of 98.3% for *E. coli* and 98.5% for *S. aureus*, respectively.[160]

Nevertheless, in using biocidal compounds, care must be taken to ensure sufficient adhesion to the membrane and prevent any leakages, as it can be detrimental to the performance of the MFC in the long run.

## 4. Cost Analysis of PEMs

It is well known that PEMs are the single biggest contributor to the total cost of an MFC.[61,68] It is therefore important to consider the cost of producing power from an MFC in relation to the cost of the membrane. Hernández-Flores et al. suggested the use of power-to-cost,[161] which has been used for comparing the cost of different membranes used in MFC systems.[60,161–164] It is defined by Equation (1).

$$\text{power} - \text{to} - \text{cost}\left(\frac{\text{mW}}{\text{US\$}}\right) = \frac{\text{power density}\left(\frac{\text{mW}}{\text{m}^2}\right)}{\text{cost of membrane}\left(\frac{\text{US\$}}{\text{m}^2}\right)} \quad (1)$$

**Table 6** summarizes the cost analysis of various membranes that have been tested in MFCs in recent past. A few trends can be observed. First, the high power density of Nafion 117 is often offset by its high cost, taking the power-to-cost well below 1 mW US $^{-1}$. Similarly, the other popular commercial PEM, Ultrex CMI 7000 (which is chemically composed of polystyrene


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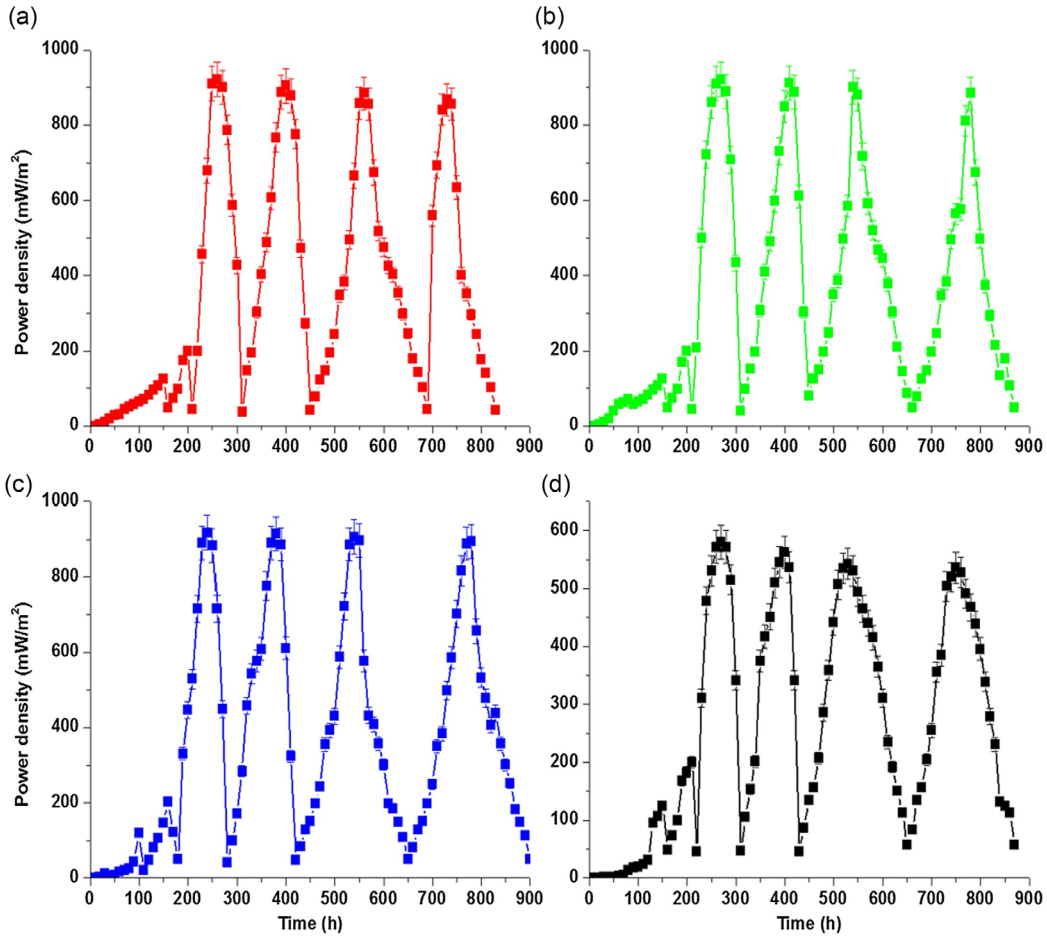


**Figure 9.** Performance curves of different membranes. a) Quaternized poly ether ether ketone (QPEEK), b) QPEEK-0.5, c) QPEEK-1.0, and d) AMI-7001. Reproduced with permission.[157] Copyright 2017, John Wiley and Sons.

crosslinked with divinylbenzene), also has power-to-cost smaller than 1 mW US $\$^{-1}$. Second, the highest reported power-to-cost ratio is that for nonwoven polypropylene at 200 mW US $\$^{-1}$, but this is reported as the characterization, rather than long-term operational value.[165] Further, these membranes only operate on size-exclusion mechanisms since they lack proton-conducting ionic groups, thus leading to low CE and reduced power generation over time.[165,166] Third, agar-based membranes have been reported to have power-to-cost ratios well above 1 mW US $\$^{-1}$. This is due to very low cost of agar. Nevertheless, there are questions about their durability and high Ohmic resistance. Further, they are very sensitive to the concentration of KCl: higher concentration of the salt increases the proton conductivity but also makes the membrane brittle and permeable to oxygen.[163,167] These facts highlight the need to continue the exploration for alternative cost-effective PEMs.

It should be noted that while the power-to-cost figures give a general indication of the membrane's cost, they may not be directly comparable due to different experimental conditions, namely, MFC construction, operating mode, and substrate used. Moreover, there are disparities in membrane prices between locations: a recent survey on price of Nafion 117 found the range to be between 1400 and 2200 US$ m$^{-2}$.[168] It is also noteworthy that the majority of studies on membranes simply take into account the price of the membrane raw material; they neglect to include other expenses such as heating, the chemicals required for membrane activation, disposal and recycling, and so forth. Therefore, a complete evaluation of the membrane's life cycle—from production to disposal—is required. Most importantly, it is challenging to evaluate the membranes' long-term economic feasibility due to the paucity of data on their longevity. For instance, a membrane with a long operating life and a lower power-to-cost might be more practical than one with a high power-to-cost in the short run. In such a case, time factor should be included to calculate the per unit energy cost (US$ kW$^{-1}$ h$^{-1}$) defined by Equation (2). Since this is the unit in which electricity is sold, it makes the cost of MFC power directly comparable with other energy sources.

$$\text{cost of energy}\left(\frac{\text{US\$}}{\text{kWh}}\right) = \frac{\text{cost of membrane}\left(\frac{\text{US\$}}{\text{m}^2}\right)}{\text{power density}\left(\frac{\text{kW}}{\text{m}^2}\right).\text{operational lifetime (h)}} \quad (2)$$

Naturally, it's important to keep in mind that MFCs don't necessarily compete with conventional energy sources to generate


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**Table 6.** Cost analysis of various membranes used in MFCs.

| Membrane | Experimental conditions | Time [days] | Max Power density [mW $m^{-2}$] | Power-to-Cost [mW US $\$^{-1}$] | References |
|---|---|---|---|---|---|
| Nafion 117 | Double-chambered MFC operated in fed-batch mode with sodium acetate substrate at 20 °C | 4.17 | 872 | 0.48 | [250] |
| CA[a)] | Double-chambered MFC operated in fed-batch mode with sodium acetate substrate at 20 °C | 4.17 | 831 | 2.8 | [250] |
| CA[a)] | Double-chambered MFC operated in fed-batch mode with poultry wastewater (COD 0.26 g $L^{-1}$) at 20 °C | 4.17 | 746 | 2.5 | [250] |
| non-woven PP[b)] | Double-chambered MFC operated in fed-batch mode with synthetic wastewater containing minerals (12 mL $L^{-1}$) and vitamins (5 mL $L^{-1}$)at 30 °C | – | 114 | 200 | [165] |
| Ultrex (CMI 7000) | Double-chambered MFC operated in fed-batch mode with synthetic wastewater containing minerals (12 mL $L^{-1}$) and vitamins (5 mL $L^{-1}$)at 30 °C | – | 114 | 0.687 | [165] |
| Cellulose | Double-chambered MFC operated in fed-batch mode with synthetic wastewater containing minerals (12 mL $L^{-1}$) and vitamins (5 mL $L^{-1}$)at 30 °C | – | 117 | 0.231 | [165] |
| PPS[c)] | Double-chambered MFC operated in fed-batch mode with synthetic wastewater containing minerals (12 mL $L^{-1}$) and vitamins (5 mL $L^{-1}$)at 30 °C | – | 74 | 8.92 | [165] |
| Nafion 117 | Double-chambered MFC operated in fed-batch mode with synthetic wastewater containing minerals (12 mL $L^{-1}$) and vitamins (5 mL $L^{-1}$)at 30 °C | – | 118 | 0.051 | [165] |
| SPEEK | Three-chambered (with desalination cell) MFC operated in batch mode with activated sludge and seawater at 22 °C | 3 | 226 | 1.14 | [251] |
| ED membrane | Three-chambered (with desalination cell) MFC operated in batch mode with activated sludge and seawater at 22 °C | 3 | 188 | 0.528 | [251] |
| PVDF + GO + CA[a)] | Double-chambered MFC operated in batch mode with sucrose-based synthetic wastewater (COD of 3 g $L^{-1}$) | 30 | 150.2 | 0.316 | [252] |
| natural clay + goethite | Double-chambered MFC operated in batch mode with sucrose-based synthetic wastewater (COD of 3 g $L^{-1}$) at 27 °C | 100 | 112.8 | 0.186 | [253] |
| Nafion 117 | Double-chambered MFC operated in batch mode with sucrose-based synthetic wastewater (COD of 3 g $L^{-1}$) at 27 °C | 100 | 107 | 0.006 | [253] |
| Mullite | Single-chambered MFC operated in continuous mode with fresh human urine | 10 | 15.4 | 0.89 | [254] |
| Earthenware | Single-chambered MFC operated in continuous mode with fresh human urine | 10 | 32.3 | 6.1 | [254] |
| Pyrophyllite | Single-chambered MFC operated in continuous mode with fresh human urine | 10 | 25.7 | 0.052 | [254] |
| Alumina | Single-chambered MFC operated in continuous mode with fresh human urine | 10 | 11.3 | 0.050 | [254] |
| Agar-based membrane | Single-chambered MFC operated in batch mode with leachate from sanitary landfill (COD of 12.3 g $L^{-1}$) | 8 | 253.4 | 18.1 | [164] |
| Nafion 117 | Single-chambered MFC operated in batch mode with leachate from sanitary landfill (COD of 12.3 g $L^{-1}$) | 8 | 116.1 | 0.067 | [164] |
| Agar-based membrane | Single-chambered MFC operated in batch mode with leachate from sanitary landfill (COD of 12.3 g $L^{-1}$) | 15 | 547.4 | 39.1 | [164] |
| Nafion 117 | Single-chambered MFC operated in batch mode with leachate from sanitary landfill (COD of 12.3 g $L^{-1}$) | 15 | 194.6 | 0.112 | [164] |
| Nafion 117 | Single-chambered MFC operated in fed-batch mode with sodium acetate solution (10 mM and COD of 2.7 g $L^{-1}$) | 96 | 12 | 0.012 | [255] |
| PBI[d)] | Single-chambered MFC operated in fed-batch mode with sodium acetate solution (10 mM and COD of 2.7 g $L^{-1}$) | 96 | 78.3 | 2.6 | [255] |
| ABPI impregnated nonwoven | Double-chambered MFC operated in fed batch mode with sodium acetate solution (3 mM and COD of 0.25 g $L^{-1}$) | 300 | 97 | 24.3 | [256] |
| Nafion 117 | Double-chambered MFC operated in fed-batch mode with sodium acetate solution (3 mM and COD of 0.25 g $L^{-1}$) | 300 | 57.5 | 0.041 | [256] |
| PVA + STA | Single-chambered MFC operated in batch mode with sodium acetate solution (COD of 5 g $L^{-1}$) | 50 | 58.8 | 11.8 | [257] |
| PVA + STA + GO | Single-chambered MFC operated in batch mode with sodium acetate solution (COD of 5 g $L^{-1}$) | 50 | 108 | 18.0 | [257] |


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**Table 6.** Continued.

| Membrane | Experimental conditions | Time [days] | Max Power density [mW m$^{-2}$] | Power-to-Cost [mW US $^{-1}$] | References |
|---|---|---|---|---|---|
| Nafion 117 | Single-chambered MFC operated in batch mode with sodium acetate solution (COD of 5 g L$^{-1}$) | 50 | 64.5 | 0.045 | [257] |
| SPEEK | Double-chambered MFC operated in batch mode with synthetic wastewater at 30 | – | 77.3 | 1.7 | [84] |
| Nafion 117 | Double-chambered MFC operated in batch mode with synthetic wastewater at 30 °C | – | 106.7 | 0.9 | [84] |
| Agar-based membrane | Single-chambered MFC operated in batch mode with leachate from dark fermentation of organic wastes (COD of 3.52 g L$^{-1}$) at 22 °C | – | 67 | 1.6 | [161] |
| Nafion 117 | Single-chambered MFC operated in batch mode with leachate from dark fermentation of organic wastes (COD of 3.52 g L$^{-1}$) at 22 °C | – | 403 | 0.23 | [161] |
| Ultrex (CMI 7000) | Double-chambered MFC operated in fed-batch mode on organic loading (COD of 1.5 g L$^{-1}$) at ambient temperature | – | 38.39 | 0.154 | [29] |
| polystyrene | Double-chambered MFC operated in fed-batch mode on organic loading (COD of 1.5 g L$^{-1}$) at ambient temperature | – | 29.19 | 23.0 | [29] |

[a)]cellulose acetate; [b)]polypropylene; [c)]polyphenylene sulfide; [d)]polybenzimidazole.

electricity; rather, their value comes from using (and simultaneously treating) wastewater as a decentralized energy source, which effectively lowers the fuel cost to zero. We thus propose that, in addition to membrane cost, future research should focus on the operational durability of membranes.

## 5. Trade-Offs in PEM-Based MFCs

An important fact to consider is that every MFC system, and consequently the choice of the membrane in it, has to be optimized based on the final application. For example, if the primary goal is wastewater treatment, then the relevant metric to be maximized is COD removal efficiency; on the other hand, power density should be the benchmark if the goal is maximal power generation. Although an MFC can simultaneously do both, one often comes at the expense of the other.[169,170] Another trade-off is between CE and COD removal. If membrane has high oxygen diffusivity, oxygen crossover from cathode chamber toward anode increases COD removal because of higher consumption of organic compounds by direct respiration of aerobic microorganisms. This, however, lowers the CE and is ultimately detrimental to the long-term ability of exoelectrogen biofilm to deliver stable power output. Similarly, a trade-off is often encountered between CE and maximum power output.[171] This is because high CE can only be achieved using an efficient PEM but that can add to the overall Ohmic resistance, thus lowering the output. Again, long-term stable power generation might require sacrificing some power output. It can thus be said that PEM optimization must take into consideration the operational requirements of MFC: short-term performance versus long-term stability and wastewater treatment versus power generation. It has been suggested that the MFC community should begin reporting MFC performance not just in terms of power outputs (either normalized to the electrode surface, m$^{-2}$, or reactor volume, m$^{-3}$) and COD removal efficiency (in %), but also in terms of normalized energy recovery (NER), as defined by Equation (3).[170–172]

$$\text{normalized energy recovery}\left(\frac{\text{kWh}}{\text{COD}}\right) = \frac{\text{power (kW)} \times \text{operational time (h)}}{\text{COD removal in that time (kg)}} \tag{3}$$

This would facilitate comparison between various systems due to its independence to reactor scale and choice of substrate. A recent analysis of batchoperated MFCs revealed that MFCs with SPEEK membranes deliver a higher NER, in addition to having a lower cost, compared to Nafion.[172]

## 6. Scale-Up and Commercialization

Currently, the PEM market is overwhelmingly dominated by the Nafion membrane. Other commercial membranes with similar perfluorinated sulfonic-acid (PFSA) structure include Aciplex (Asahi Kasei), Flemion (Asahi Glass), 3M membrane, and short side chain (SSC) membranes such as Aquivion (Solvay) (**Figure 10**).[173] Among the very few large-scale (total capacity > 200 L) and long-term (trial period > 3 months) pilot studies on using MFCs for treating wastewater, the majority have used existing commercial membranes such as Nafion, Nafion-based VANADion, or Ultrex CMI 7000 as separators.[174–177] One of these studies reported that over 60% of the material cost of the MFCs is due to the PEM alone.[176] This clearly highlights the gap in translating lab-scale studies on membranes into commercially viable large-scale membranes.

In the quest to replace costly and environmentally damaging PFSA membranes, sulfonated aromatic hydrocarbon membranes have emerged most promising in terms of commercial prospects. One such membrane, namely CMI 7000, has already been in the market, while others such as SPEEK have been under


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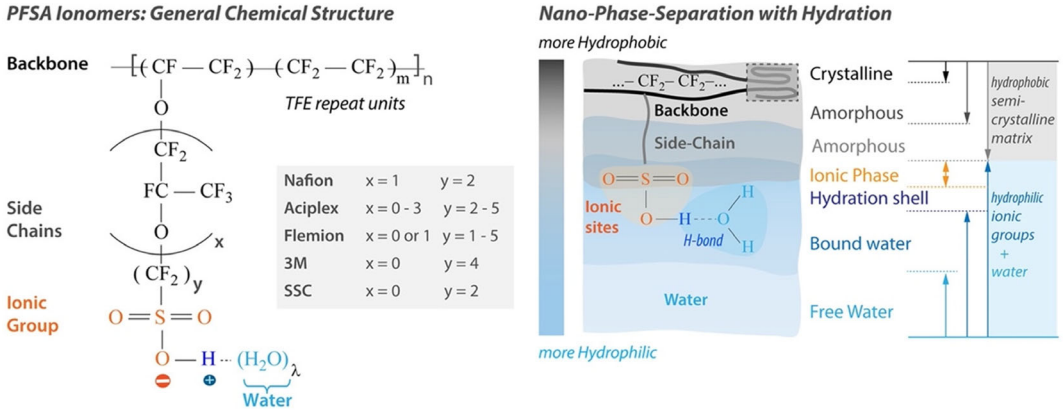


**Figure 10.** Most common PFSA membranes. Reproduced under the terms of the ACS AuthorChoice License.[173] Copyright 2017, Authors. Published by ACS Publications.

active research. A pilot study on the roll-to-roll manufacturing of SPEEK membranes for scale-up applications was recently done by Yuan et al.[178]

In a nutshell, PEEK was sulfonated by progressively introducing it to concentrated sulfuric acid (98 wt%) in a double-glass reactor that was continuously heated and stirred at 40 °C for 7 h (**Figure 11**). The finally achieved DS was 66.3% with an IEC of 1.86 meq $g^{-1}$. The polymer was then washed, dried, and dissolved in DMAc solvent to form a 25 wt% solution and then filtered and degassed in vacuum. This solution was cast on PET substrate using a continuous roll-to-roll machine at a speed of 0.2 m $min^{-1}$ in a regulated clean room facility (25 °C, humidity < 20%). A roll-to-roll coater was then used to dry the cast membrane at 50 °C. The cost of the finished membrane was estimated to be US$12.3 $m^{-2}$, nearly 40 times less than Nafion, and had a thickness of about 50 µm, nearly a third of Nafion 117. While this is a positive step toward the commercialization of low-cost PEMs, it is unclear whether these membranes can last in the long run when used in MFCs.[179]

Another sulfonated aromatic hydrocarbon membrane, sulfonated poly(biphenyl indole) (PBBI), was studied for scale-up by Yu and co-workers. In the pilot study, the polymer PBPI was first synthesized from precursors, followed by sulfonation using organic sulfonating agents. Sulfonated PBPI was then

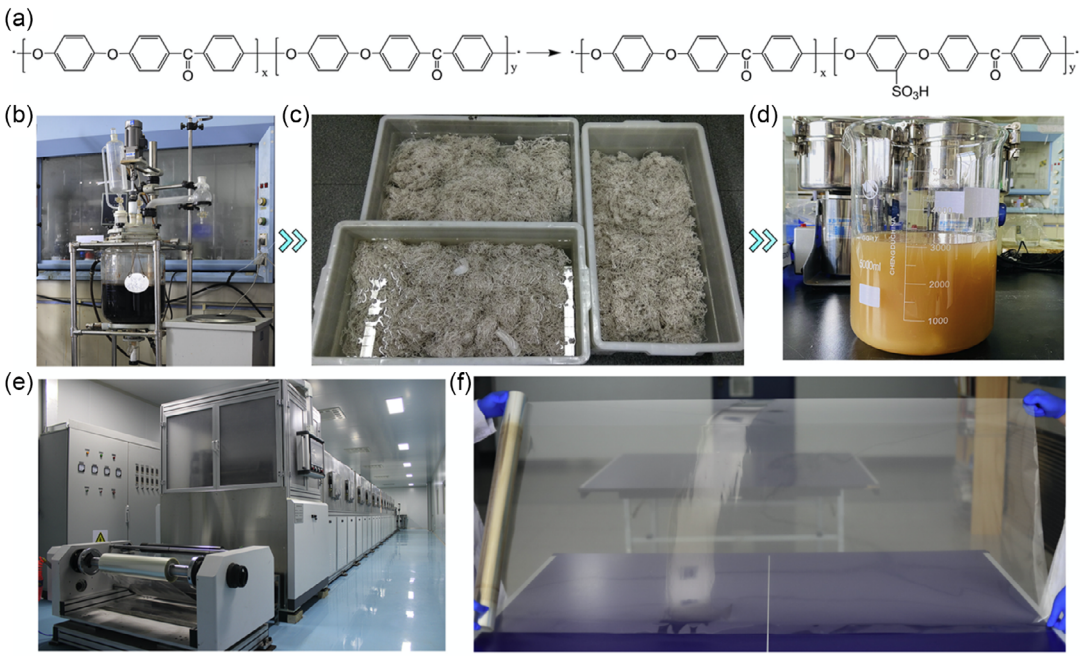


**Figure 11.** Pilot-scale synthesis and manufacturing of SPEEK membrane. a) Structure of SPEEK, b) reactor for kg-scale polymer synthesis, c) synthesized SPEEK polymer, d) SPEEK polymer solution in DMAc, e) pilot-scale roll-to-roll membrane casting, and f) final SPEEK membrane. Reproduced with permission.[178] Copyright 2022, Elsevier.


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precipitated, washed, dried, and dissolved in DMSO at 80 °C to form a 30 wt% solution, which was cast on PET substrate using a roll-to-roll membrane-casting machine. The resultant PEM (thickness 30–40 μm, IEC of 2.3 meq $g^{-1}$) was finally converted to $H^+$ form by immersing in 1M $H_2SO_4$ solution. Nevertheless, the process required a series of steps involving complex chemical reactions, which raises questions about environmental impact and economic viability of the process. In such a case, a commercially available polymer such as PEEK might be a more reasonable starting point.

As for polysulfone membranes, they are already commonly used in industrial processes such as ultrafiltration.[180] Owing to their easy commercial availability, low cost, and mechanical robustness, they are promising candidates for large scale PEM use. However, unlike Nafion, these membranes lack fixed negative charges like sulfonic acid groups and attempts to sulfonate these membranes have not resulted in sufficiently high proton conductivities. Moreover, they are highly hydrophobic and hence particularly suspectable to biofouling.

PVA is another commercial membrane that is widely used in pervaporation and desalination process.[181] Like polysulfone, it also lacks proton conducting groups. High swelling and mechanical weakness are additional challenges that need to be overcome. Currently, sulfonated PVA membranes are only studied at lab scale, and commercial-scale production has not been reported. In general, the main obstacles to scaling up across most of the studies include maintaining consistent quality and performance, cost-effectiveness, and overcoming technical limitations in the fabrication processes.

## 7. PEMs for Emerging Applications of MFCs

### 7.1. PEMs for MFC-Based Biosensors

MFC technology is increasingly being explored for use in self-powered sensors for three applications:[182–184] 1) the detection of toxins in water; 2) monitoring the biological oxygen demand (BOD) of wastewater; and 3) the detection of biological quantities.

Given that the output of an MFC-based biosensor is an electrical current, it does not require an additional transducer, which makes these devices simple and effective.[185] The use of MFCs for toxin monitoring is facilitated when the presence of toxins reduces the MFC output by inhibiting bacterial growth in a linear correlation. For BOD detection on the other hand, an increase in organic matter content of wastewater (as indicated by BOD) translates into an increased MFC output due to better bacterial growth (**Figure 12**).[186] Similarly, the output of MFCs can be correlated with the concentration of biological materials like urine and saliva.[187,188]

Since conventional methods for BOD detection are complicated, time-consuming, and skill-intensive, an automated BOD detection system based on MFCs could be significantly advantageous.[189] For MFC-based BOD sensors, the BOD is correlated with either the peak current or total charge output. It has been found that a wider BOD range as well as a longer operational time can be obtained when correlated with the total charge output.[190] However, direct calculation of BOD from charge remains a challenge mainly due to low CEs associated with the PEM performance.[185] Moreover, since oxygen crossover through the

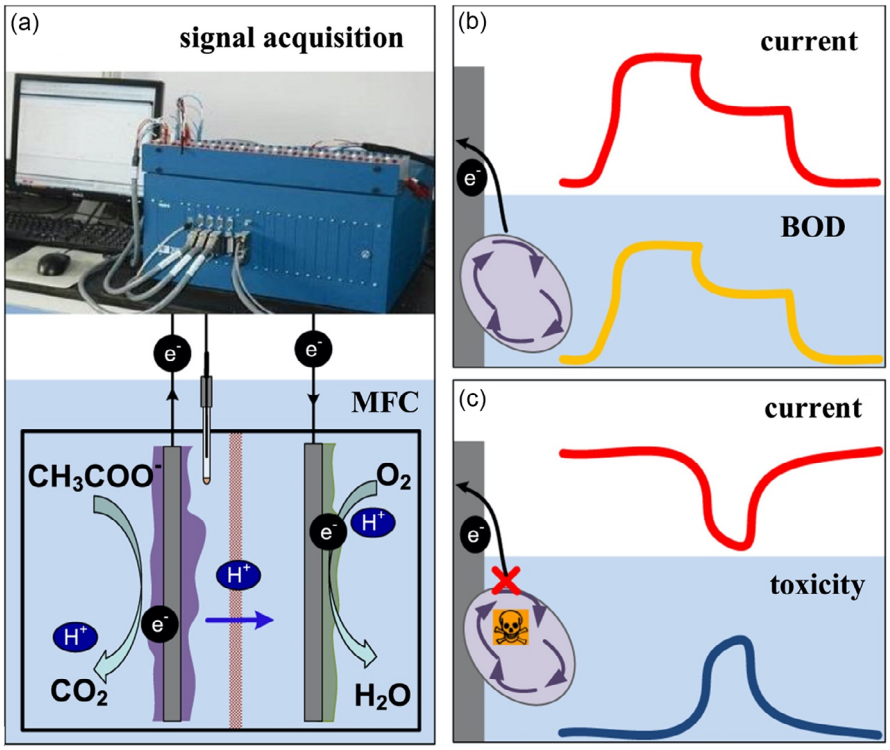


**Figure 12.** Working principles of MFC sensors. a) A classical MFC sensor and a signal acquisition system, b) the MFC sensor for BOD monitoring, and c) the MFC sensor for toxicity monitoring. Reproduced with permission.[184] Copyright 2018, Elsevier.


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PEM can cause substrate loss by aerobic respiration of the bacteria, it can lead to inaccurate measurements of BOD. It is thus crucial that suitable PEMs be developed for MFC-based BOD sensors to become practically useful. For example, changing the PEM from Nafion to SPEEK resulted in 62.5% wider BOD sensing range due to lesser oxygen crossover.[191] In several MFC-based sensors, hydrophobic wax has been a common choice as PEM.[192–195] Wax is an attractive option because it also allows for effective bonding of different components (thereby helping to make the setup compact) and also acts as a sealant to any leakages. However, its low proton transfer efficiency resulted in low-power/low-current generation, opening the gateway for further research.[196]

An emerging material of choice in single-use MFC-based biosensors is paper because it is inexpensive, easily available, disposable, thin, lightweight, biocompatible, and biodegradable. Moreover, it easily integrates with other components by acting as a support for them, which facilitates miniaturization. This includes approaches like directly drawing the graphite electrode with a pencil, painting, or screen-printing the carbon-ink electrodes onto a paper-based membrane support (**Figure 13**).[192,197,198] Miniaturization is especially important for biosensing application because: 1) it improves sensitivity, thus allowing the detection of even very small quantities of the anolyte; 2) it enables faster response times by shortening the electrode distance and increasing the surface-to-volume ratio; 3) it ensures stable resistance and reduces the risk of faulty signals; and 4) it facilitates easy use and installation of the sensor.[199,200] The importance of system size can be gauged from the fact that the response time needed to measure a substantial change in BOD level (from 50 to 100 mg $L^{-1}$) was reduced from 36 to 5 min when the anode chamber volume was reduced from 25 to 5 mL.[201] Given the fact that conventional materials like Nafion are incompatible for several miniaturization processes, versatile materials like paper become even more important.[202] Another important attribute of paper is rapid bacterial adhesion, due to its intrinsically biocompatible chemistry as well as its porous morphology, which results in instantaneous power generation without any time delay.[203]

Different types of papers can be used as PEMs, each having different performances. A systematic study of this behavior found that paper variants that are too porous (such as tissue paper) cannot create an effective separation between the anode and the cathode, leading to short circuit which considerably reduces the performance of the cell.[187] At the same time, MFC with photocopy paper as PEM showed highest output, possibly due to the presence of kaolinite filler. The incorporation of hydrophilic kaolinite ceramic filler has been found to improve the properties of base PEM materials.[204]

Although many studies report the use of bare paper as the separator in MFC-based biosensors, it lacks proton-exchanging ionic groups.[205,206] This has prompted modifications for improving selectivity and efficiency. Fraiwan et al. fabricated a paper-based disposable MFC for diagnostic sensors and used a paper-based PEM.[207] The PEM was created by infiltrating sodium polystyrene sulfonate into paper, and the power generation was just 20% lower compared to Nafion. When paper was functionalized by sulfonated polystyrene, the power density was higher (55 mW $m^{-2}$) as compared to bare parchment paper (12.7 mW $m^{-2}$).[208] This agrees with the results of Kim et al. that the introduction of ionic groups generally increases the performance of porous membranes due to better selectivity.[51] Likewise, paper impregnated with CNT and potassium ferricyanide has been employed as a hybrid PEM–cathode assembly.[209] Moreover, paper-based MFC biosensors have also employed non-paper PEMs such as PVDF,[210] PVA-chitosan,[211] and Nafion.[212]

### 7.2. PEMs for MFC-Powered Implants

Implantable medical devices (IMDs) such as pacemakers, artificial urinary sphincters, in vivo sensors, pain relief stimulators, insulin pumps, and drug pumps need only a few microwatts of power to function, which are typically provided by lithium-ion batteries.[213] Such batteries suffer from several

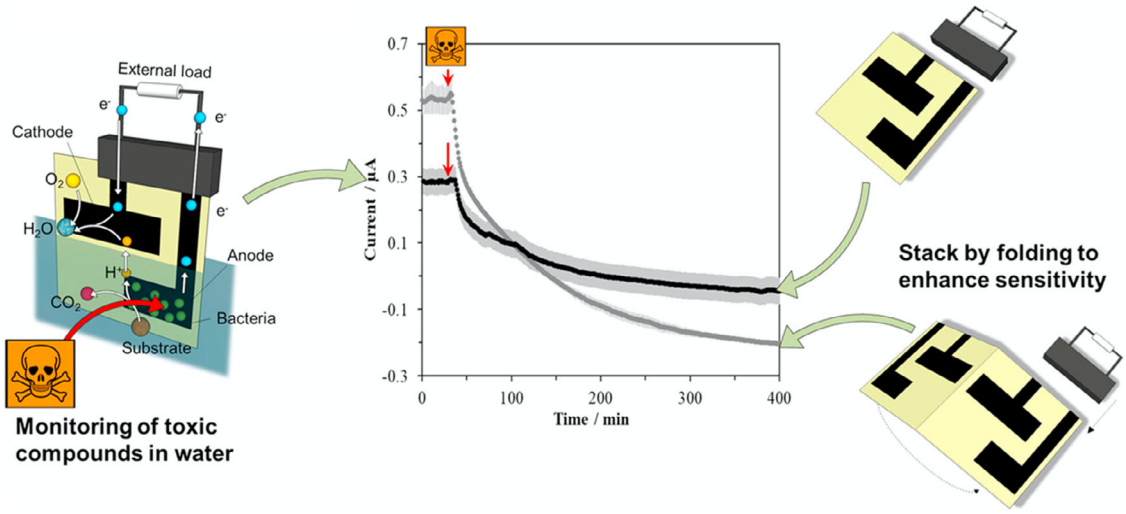


**Figure 13.** Toxic substance monitoring using a screen-printed paper-based MFC. Paper itself acted as the membrane, allowing for flexibility required for folding and stacking. Reproduced under the terms of the CC-BY license.[192] Copyright 2018, Authors. Published by Elsevier.


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disadvantages such as bulky size, possible toxicity, and need for frequent replacement. With the advances in miniaturization technology, it is now possible to scale down MFCs to the size of implantable devices.[203] The overall fuel cell reaction consumes only glucose and oxygen, which are readily available in the physiological environment. Carbon dioxide and water are produced as byproducts, which the body can get rid of harmlessly. Furthermore, abiotic catalytic fuel cells have already been employed to generate electricity in vivo, with a reported stable power output of 20 mW $m^{-2}$ over a period of 30 days.[214] An interesting proof of concept was demonstrated by Maity et al., of a self-sufficient, closed-loop system to maintain blood–glucose homeostasis in diabetes patients.[215] They fabricated and implanted a metabolic fuel cell (utilizing inorganic catalysts) in mice to continuously monitor blood–glucose levels, convert excess glucose into electrical power, and subsequently use this energy to stimulate insulin release from engineered beta cells (**Figure 14**). In the fuel cell construction, the use of Nafion membrane was linked to better performance, shelf-life, and longevity of the fuel cell.

Although MFCs typically are more durable than enzymatic and metabolic fuel cells and also ensure complete oxidization of the organic fuels (thereby improving fuel efficiency), they operate at lower power density.[216] This has been addressed, to some extent, by combining the output of several individual MFCs, which are then able to produce enough electricity to power a device like a pacemaker.[217] Although the commercialization of an biofuel cell-powered IMD still remains distant, there has been considerable research effort in this domain including a few animal trials.[218,219]

An important component in implantable MFCs is the PEM, as demonstrated by Roxby et al., who showed that increasing the membrane size can significantly improve the output by allowing greater proton transfer and hence faster reaction kinetics.[220] However, this also means that for devices where only a small PEM can be used, the material of the PEM must have high proton conductivity to maintain fast reaction rates. At the same time, the choice of materials is limited for such applications, as the material must be highly biocompatible. Additionally, these membranes must be sterilizable, for example, by high-temperature steam, and hence need to have sufficient thermal and chemical stability.

Siu and Chiao fabricated an implantable MFC made with polydimethylsiloxane (PDMS), which is a commonly used biomaterial in the field of implants. Gold electrodes were patterned on the PDMS base and Nafion was used as the PEM.[220] The MFC was tested with 15 µL droplet of human plasma and a maximum power density of 4.01 mW $m^{-2}$ was obtained. Although Nafion is biocompatible and suitable for implantable biomaterials, its high initial cost may offset the advantage of continuous power generation.[221] Conventionally used implant materials like silicone cannot be directly used as PEM because of their high oxygen permeability. To overcome this problem, coating the silicone surface with an oxygen-blocker like perylene has been found to be effective.[222]

A frequently studied biomaterial is silk fibroin (SF), which is biocompatible, flexible, transparent, and film-forming, and furthermore has tunable biodegradability.[223] The latter is especially significant because it allows for controlling the lifetime of the IMD (or its power source), after which it can be easily degraded and resorbed in vivo, without producing any adverse long-term effects. Indeed, SF-based power sources have been successfully employed in transient IMDs.[224,225] Although SF-based membranes have previously been investigated for their use in

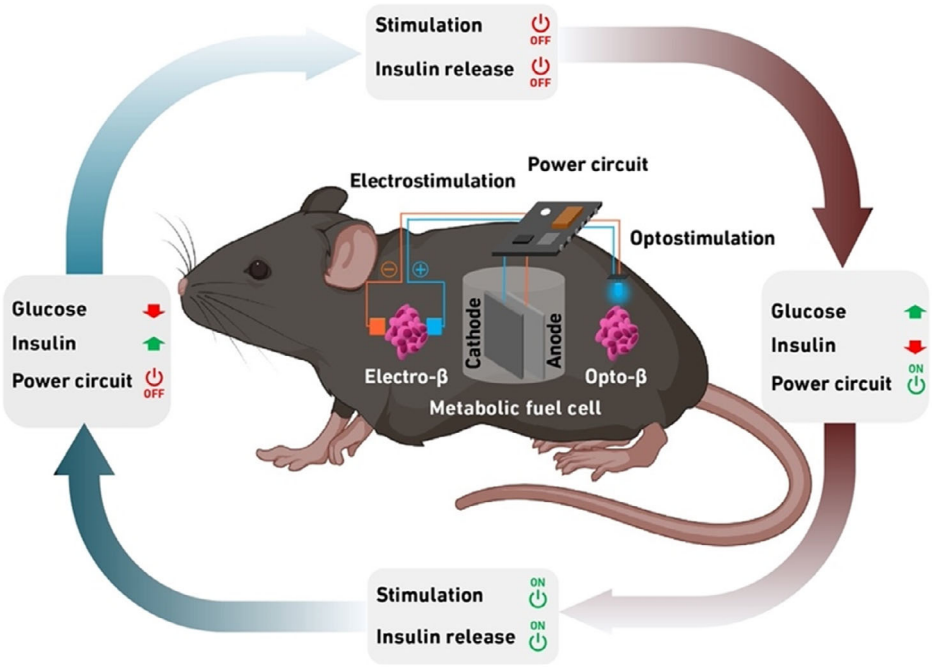


**Figure 14.** Blood–glucose-powered metabolic fuel cell for regulation of closed-loop insulin release system implanted in mice. Reproduced under the terms of the CC-BY license.[215] Copyright 2023, The Authors. Published by Wiley.


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MFC, they displayed insufficient performance.[226] A possible reason could be the lack of ion-exchange sites in pure SF, which can be remedied by suitable chemical treatments such as sulfonation, described in detail elsewhere.[227] Additionally, SF-modified with conducting polymers has been evaluated successfully as electrode material.[228] In principle, it may be possible to construct an implantable MFC made entirely of SF. This follows the example of an implantable MFC made entirely of carbon paper and carbon cloth, for implantation in the large intestine.[229]

## 8. Future Developments

A good PEM should have high proton conductivity as well as selectivity, low crossover of oxygen and organic substrate, sufficient mechanical and chemical stability, and finally, affordable price. Other specialized requirements are based on the final application of the cell, for example, in case of implantable MFCs, the membrane must be biocompatible.

PEMs rely on the presence of ionic groups, such as -$SO_3H$, to form a phase-separated structure that creates channels for the transport of protons. The negative charge on these groups dictates the cation selectivity by repelling the negatively charged ions, while the channel width dictates the proton selectivity by blocking the larger cations. In membranes that do not intrinsically possess these groups, they can be introduced by suitable chemical treatments, such as sulfonation. Here, either presulfonation (treating the monomers before polymerizing them) or postsulfonation (directly treating the polymer) may be used. It may be more beneficial to modify the monomers due to milder reaction conditions, which in turn can prevent degradation.[79] Additionally, a more uniform distribution of charged groups can be achieved by this. Moreover, it's important to ensure that the ionic groups in a material are actually available for conduction. For instance, in the case of sulfonated oxybispolybenzimidazole (OPBI), studies have shown that the –$SO_3H$ groups were engaged in acid–base complexation with the imidazole rings. As a consequence, this interaction left fewer –$SO_3H$ groups free for proton conduction, resulting in relatively low proton conductivity (around 7 mS $cm^{-1}$). This example highlights the need to consider the actual availability of ionic groups for conduction in such materials.[230]

Frequently, nanocomposites membranes have been studied wherein nanoparticles are dispersed in a base matrix to improve its hydrophilicity and proton conductivity. In such systems, care must be taken to ensure homogenous dispersion of nanoparticles to avoid any anisotropic effects. This can be achieved, for example, using stabilizing surfactants (which can be removed later), ionic or covalent functionalization (depending on whether the nanoparticle is ionic or covalent), or tethering the nanoparticles the polymer initiator before subsequent polymerization.[231] Additionally, the role of particle size and aspect ratio of the additive must be considered as smaller particles and those with higher aspect ratio are shown to have superior properties due to better dispersion.[232–234] Similarly, in case of mesoporous particles, the effect of particle porosity and pore size can be quite significant—higher porosity and smaller pore size contribute toward a larger surface area, which can be functionalized to give a larger number of conducting ionic groups.[235] Finally, prefunctionalized nanoparticles (e.g., by sulfonation) have proved to be more effective than their nonfunctionalized counterparts.

Moreover, the concentration of nanoparticles should be kept high enough to form continuous hydrated channels, but low enough to prevent surface agglomeration due to limited solubility.[70,71] In fact, the role of adequate solubilization is of such importance that sometimes an intrinsically more conducting additive may prove to be less effective than an intrinsically less conducting one, if its solubility in the base polymer is lower.[102] When using a solvent, it is important to also consider the effect of solubility of the polymer in the solvent, and it is wise to compare their solubility parameters. These factors are summarized in **Table 7**.

The power density produced by MFCs is typically in the range of 100–2000 mW $m^{-2}$, which is still quite low for practical applications.[236] This is lower than that of lithium-ion batteries, by at

**Table 7.** Different strategies for developing next-generation PEMs.

| Strategy | Factors to consider |
|---|---|
| Sulfonation of polymers to introduce ionic groups | • Presulfonation of monomers before polymerization is more suitable than postsulfonation due to milder reaction conditions and more uniform distribution of ionic groups<br>• Sulfonate groups must be "free" for proton conduction, not involved in complexation with base polymer<br>• Where sulfonation is not an option or found to be unsuitable, phosphorylation can be an alternative |
| Addition of nanoparticles | • Sulfonated fillers are more effective than nonsulfonated ones due to higher conductivity<br>• Need to reach a percolation threshold to create continuous proton conduction channels. Beyond this, no additional benefit is obtained and the nanoparticles may aggregate<br>• Nanoparticles must be homogenously distributed in the base polymer by physical (sonication) or chemical processes (stabilizing surfactants, covalent/ionic functionalization, use of compatibilizers)<br>• If using a solvent, the solubility parameter of solvent should be matched with that of the polymer<br>• Nanoparticle shape and size must be selected in a way that maximizes surface-to-volume ratio<br>• For mesoporous particles, effect of porosity and pore size is also important to consider because porous sites offer area where ionic groups can be introduced |
| Pretreatment | • Pre-treatment of PEMs needed to protonate the ionic groups should be optimized using suitable chemical agents or UV radiation along with temperature, concentration, and treatment time<br>• Milder reagents and reaction conditions are favored due to green chemistry aspects but at the same time, proton conductivity should be maximized |


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least an order of magnitude.[236] A promising concept is miniaturization, which could lead to higher cathode area power density ($mW\,m^{-2}$) due larger surface-to-volume ratio. These miniaturized cells can then be connected in series or parallel to combine their outputs. Moreover, miniaturized MFCs can themselves be used in less energy-intensive applications such as biosensors and implantable bioelectronic devices. In such cells, the use of efficient PEMs becomes even more important to reduce the high oxygen crossover caused by the small spacing between the electrodes.[237] When these miniaturized MFCs are to be used for in vivo applications, the foremost criteria of the PEM must be biocompatibility and long-term stability.

## 9. Conclusion

The development of effective PEMs holds paramount importance for the large-scale commercialization of promising MFC technology. The current gold standard PEM, Nafion, is not only very costly, but is environmentally damaging and suffers from performance-related issues such as oxygen permeability. Although modifications in Nafion using fillers, blending polymers, heteropolyacids, and UV irradation have shown promise, the basic issues of cost and non-sustainable perfluoroalkyl chemistry continue. Beyond Nafion, alternative PEM materials such as PEEK, polysulfones, PVA, IL, plastic-supported PEMs, and natural materials like chitosan offer distinct advantages and challenges. Based on cost, performance, and scale-up considerations, sulfonated PEEK has emerged as the top contender to replace Nafion.

Fouling in PEMs can lead to increased ohmic resistance and hinder proton transfer, ultimately reducing the efficiency of the MFC. Two primary approaches to fouling prevention have been discussed: membrane modifications and the use of biocides. Membrane modifications, such as achieving smoother surfaces, adjusting surface charge, and enhancing hydrophilicity, offer promising solutions to reduce biofouling. Smooth surface PEMs and the incorporation of inorganic fillers have shown potential in minimizing bacterial adhesion and biofilm formation. Additionally, hydrophilic coatings and surface modifications with materials like polydopamine have exhibited positive results in terms of fouling prevention. The use of biocides, including silver ions, copper, titanium dioxide, and QACs, offers an alternative approach to combatting biofouling.

Regarding the growing applications of PEMs in MFC-based biosensors and IMDs, MFC technology has shown promise in toxin detection, monitoring BOD in wastewater, and quantifying biological materials. Paper-based PEMs have emerged as a cost-effective and versatile option for biosensors, offering advantages in miniaturization and biocompatibility.

Looking ahead, future developments in PEMs for MFCs should focus on achieving high proton conductivity, selectivity, low crossover of oxygen and organic substrates, mechanical and chemical stability, and cost-effectiveness. Chemical modifications, nanocomposite membranes, and the choice of additives play crucial roles in optimizing PEM performance. Additionally, miniaturization holds promise for increasing cathode area power density and expanding the range of applications for MFCs.

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## Conflict of Interest

The authors declare no conflict of interest.

## Keywords

biofuel cells, cost analyses, membrane biofouling, membrane commercialization, microbial fuel cells, Nafion, proton exchange membranes

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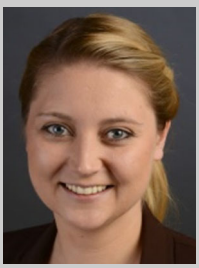

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Regular Article

# Nonlinear propagation of whistler-mode in the presence of magnetic Islands in the magnetopause

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**Abstract** We develop a framework for studying the nonlinear whistler wave at magnetic reconnection sites generated by energetic electron beam in the presence of magnetic islands as well as the nonlinearity. The governing model equation has been derived using the two-fluid model in the presence of the equilibrium magnetic field, consisting of a guide field and magnetic field due to magnetic islands. The dynamical equation for this nonlinear whistler wave has been solved numerically for the magnetopause region parameters. The findings obtained from simulation show that the contour plot of vector potential and current sheet formation is a result of nonlinearity and field perturbation. The numerically determined spectrum shows an inertial range with a spectral index of nearly − 5/3, followed by steeper scaling. This steepening in the turbulent spectrum is a characteristic of energy transit from larger to smaller scales. A new perspective on the scale size of current sheet is provided by our innovative approach for studying nonlinear whistler by energetic electron beam at the magnetic reconnection locations.

## 1 Introduction

Plasmas consist of ionized gases that have positively charged ions and free electrons. Electromagnetic forces dictate their behavior, and they own distinct characteristics in comparison with other states of matter. A comprehensive grasp of plasmas is essential in the fields of astrophysics, plasma physics, space research, and other technological applications, due to their widespread occurrence and profound importance in the universe as a whole. Plasma exists on various circumstances, including naturally occurring in space, particularly in stars and interstellar areas. On Earth, it is used in controlled fusion research and industrial uses. Additionally, plasma can be created artificially in laboratory settings. Plasma exhibits several nonlinear phenomena due to its complex and dynamic nature like wave turbulence, wave–particle interactions, plasmas instabilities, nonlinear wave propagation, and plasma heating and many more. The study of these nonlinear processes in plasma is crucial for understanding the behavior of plasmas under many situations, ranging from laboratory experiments to astrophysical environments. Plasmas serve a crucial role in the fields of plasma physics research, fusion energy development, space science, and various technological applications.

Magnetopause is a perfect in situ laboratory for examining nonlinear and turbulent processes in a magnetized plasma fluid due to its wide range of spatial and temporal length scales coupled to a mixture of waves, fluctuations, structures, and nonlinear turbulent interactions. Various spacecraft observations found that reconnection occurs associated with the turbulence in the Earth's magnetosheath [1–3]. Because of the magnetopause's important role in magnetic reconnection and the resulting transfer of plasma and energy into the magnetosphere it has been the focus of many studies [4–6], and missions like Magnetospheric Multiscale Mission (MMS), Cluster, and Time History of Events and Macroscale Interactions during Substorms (THEMIS), which have delved deeper into the current sheet structure and its formation. It has been proposed that wave–particle interactions in high energy circumstances, which cause the dissipation, are caused by plasma turbulence. Numerous phenomena and processes, including particle energization, magnetic field dynamics, and the transfer of mass and energy across the boundary, are significantly affected by the existence of plasma turbulence in the magnetopause. Recent discoveries of thin (electron scale) layers [7, 8] at the magnetopause have gained new insights into magnetopause physics and have increased the hope of using the multi-satellite mission cluster to solve the mystery of reconnection [9, 10].

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Magnetic reconnection is a ubiquitous phenomenon happening in space, and laboratory plasmas and studied in various space regions like solar wind [11], magnetosphere [12–17] etc. The creation of solar flares, coronal mass ejections, and the interaction of solar winds with the Earth's magnetosphere are all examples of magnetic reconnection [18–21], and it is thought to have originated during the star-forming process. The astonishing potential of astrophysical plasmas to establish magnetic structure leads to the accumulation of magnetic energy inside stressed areas, including current sheets. This stored energy is frequently released explosively during the magnetic reconnection process, which causes a reconfiguration of the magnetic field as well as high-speed flows, thermal heating, and nonthermal particle acceleration [22–24].

It is extensively understood that turbulence, which frequently occurs in space plasma, plays a vital role in the dissipation and heating of the particles as it cascades energy from large to small scales. There is growing evidence that magnetic reconnection and turbulence are strongly connected in magnetized plasmas [25–28]. Numerous investigators have studied how turbulence influences the flow of reconnection, especially how existing turbulence may impact Sweet–Parker reconnection and how turbulence may develop because of reconnection [29]. Using numerical simulations and theoretical considerations, electron-only magnetic reconnection has been investigated [30–33]. Recent investigations utilizing this model revealed complex nonlinear phenomena, mechanisms for particle acceleration, and the significance of plasma instabilities in both whistler turbulence and magnetic reconnection [34–36]. Numerous studies cover several aspects concerning how turbulence can host reconnecting current sheets and how reconnecting current sheets can trigger turbulence [26, 37, 38]. The emergence of irregular variations in the magnetic field is an additional aspect of turbulence in magnetized plasmas that is ubiquitous [39, 40]. For many years, researchers have examined the turbulence spectrum of magnetic field fluctuations at enormous inertial magnetohydrodynamic scales. Whistler cascade, which moves energy from large magnetohydrodynamic scales to smaller ones, is governed by the Kolmogorov power law [41, 42]. Also, it is observed that magnetic spectrum scaling exhibits Kolmogorov scaling of $-$ 5/3 in reconnection as well as in turbulence which provides evidence that reconnection dynamics involves energy transfer analogous to standard turbulence [43].

Turbulence and magnetic reconnection are crucial plasma phenomena that have a complex and elaborate connection. Reconnection jets can act as a catalyst for turbulence; while, turbulence can generate small-scale reconnection events as a fundamental component of the nonlinear dynamics and disrupt ongoing magnetic reconnection events [25, 27, 44]. Both phenomena, namely plasma instabilities and turbulence, can be observed in several types of plasmas found in the Universe. These include astrophysical plasmas found in galaxy clusters [45], accretion discs [46], and the interstellar medium [47, 48], as well as heliospheric plasmas found in the solar corona [49], planetary magnetospheres [50–52], and solar wind [53, 54]. Additionally, laboratory plasmas also exhibit these phenomena [55, 56].

The correlation between whistler mode waves, localized structures, current sheets, and wider magnetospheric dynamics is an ongoing area of research that holds significant importance in the domains of space physics and magnetospheric science. The Whistler mode refers to an electromagnetic wave that travels through a plasma, commonly observed in the Earth's magnetosphere and ionosphere. These waves are referred to as such due to the unique whistling sound they produce when transformed into frequencies that can be detected. The role of these waves in comprehending other phenomena inside the magnetosphere, such as their potential associations with current sheets and wider magnetospheric dynamics, has significant significance. While the connection is acknowledged, further examination and thorough investigation are still necessary. Emphasizing observational aspects strengthens the connection between theoretical models and real-world plasma phenomena, advancing our understanding and applications in plasma physics research.

Building upon prior research, our current study presents a model that elucidates the mechanism by which energetic electron beams, generated through the process of magnetic reconnection, give rise to whistler turbulence in the magnetic reconnection region of the magnetopause. This phenomenon has been observed by the MMS mission [36]. One of the main aims of this study is to investigate the role of electron-scale current sheets in particle energization and to analyze the scope of which particle energy conversion may be related to magnetic reconnection. To achieve this, we examine the whistler at magnetic reconnection sites caused by an energetic electron beam (as observed by MMS Mission) in the presence of magnetic islands (a magnetic island is a localized area within a plasma where the magnetic field lines form closed loops or structures that are either unconnected or partially separated from the surrounding magnetic field) and nonlinearity associated with waves. For this, we develop a model of beam-driven whistler wave originating from the noise caused by the energy of beam and rising to a large amplitude, where nonlinear effects from ponderomotive force drive the nonlinear whistler wave. In this model, the nonlinear dynamics of 3D whistler wave with magnetosonic wave have been solved in the presence of nonlinearity as well as the ponderomotive force and we introduce the constant growth rate of beam-driven whistler wave. The results of numerical simulations carried out using theoretical modeling provide a glimpse of the evolution of magnetic field lines in the form of contour plots and current sheets formation. Also, we have studied the power spectrum for the quasi-steady state.

The article is set up as follows: In Sect. 2, the model equations for whistler and magnetosonic waves are developed. The numerical methodologies, approaches, and circumstances that we employed for the numerical simulation work, as well as the outcomes of the numerical simulation, were covered in Sect. 3 of the article. In Sect. 4, we discussed a semianalytical model to analyze the scale size of current sheets. Section 5 covers the article's summary and conclusion in detail.

## 2 Analytical model

### 2.1 Whistler dynamics in the presence of beam

The dynamical equation for a 3D whistler wave with an ambient magnetic field along the z-axis in a magnetized plasma propagating in the $x$, $y$, and $z$-axis with a wave vector $\vec{k} = k_x\hat{x} + k_y\hat{y} + k_z\hat{z}$, is derived utilizing two-fluid models. The governing dynamical equation of 3D whistler wave in terms of vector potential can be written as (the detailed derivation has been given as Appendix-A)

$$\begin{aligned}
&\frac{\partial^2 A_z}{\partial t^2} + \frac{\partial^6 A_z}{\partial t^2 \partial x^2}\lambda_e^4 + \frac{\partial^6 A_z}{\partial t^2 \partial y^2}\lambda_e^4 + \frac{\partial^6 A_z}{\partial t^2 \partial z^2}\lambda_e^4 + 2\lambda_e^4 \frac{\partial^4 A_z}{\partial t^2 \partial z^2}\left(\frac{\partial^2}{\partial x^2} + \frac{\partial}{\partial y^2}\right) \\
&- 2\lambda_e^2\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2} + \frac{\partial^2}{\partial z^2}\right)\frac{\partial^2 A_z}{\partial t^2} + \lambda_i^2 v_A^2\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial z^2} \\
&+ \lambda_i^2 v_A^2 \frac{\partial^4 A_z}{\partial z^4} + \frac{\lambda_i^2 v_A^2 B_{0y}^2}{B_{0z}^2}\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial y^2} + \frac{\lambda_i^2 v_A^2 B_{0y}^2}{B_{0z}^2}\frac{\partial^4 A_z}{\partial y^2 \partial z^2} \\
&+ \frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial y \partial z} + \frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}\frac{\partial^4 A_z}{\partial y \partial z^3} = 0,
\end{aligned} \tag{1}$$

where $\omega_{ce}\left(=\frac{eB_0}{m_e c}\right)$ is the electron gyrofrequency of the wave, $v_A\left(=\sqrt{\frac{B_0^2}{4\pi n_0 m_i}}\right)$ is Alfven wave's speed, $n_0$ denotes the background number density, $c$ denotes the velocity of light, and $\lambda_i\left(=\sqrt{\frac{c^2 m_i}{4\pi n_0 e^2}}\right)$ is the collisionless ion skin depth, $\lambda_e\left(=\sqrt{\frac{c^2 m_e}{4\pi n_0 e^2}}\right)$ the collisionless electron skin depth. Additionally, it is reported that beam-driven growth rate is considered then, the aforementioned equation becomes $\frac{\mathrm{d}}{\mathrm{d}t} \to \left(\frac{\mathrm{d}}{\mathrm{d}t} + \gamma\right)$ (please see appendix A),

$$\begin{aligned}
&\left(\frac{\partial^2}{\partial t^2} + 2\gamma\frac{\partial}{\partial t}\right)A_z + \frac{\partial^6 A_z}{\partial t^2 \partial x^2}\lambda_e^4 + \frac{\partial^6 A_z}{\partial t^2 \partial y^2}\lambda_e^4 + \frac{\partial^6 A_z}{\partial t^2 \partial z^2}\lambda_e^4 + 2\lambda_e^4 \frac{\partial^4 A_z}{\partial t^2 \partial z^2}\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right) \\
&- 2\lambda_e^2\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2} + \frac{\partial^2}{\partial z^2}\right)\frac{\partial^2 A_z}{\partial t^2} + \lambda_i^2 v_A^2\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial z^2} + \lambda_i^2 v_A^2 \frac{\partial^4 A_z}{\partial z^4} \\
&+ \frac{\lambda_i^2 v_A^2 B_{0y}^2}{B_{0z}^2}\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial y^2} + \frac{\lambda_i^2 v_A^2 B_{0y}^2}{B_{0z}^2}\frac{\partial^4 A_z}{\partial y^2 \partial z^2} \\
&+ \frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}\left(\frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial y \partial z} + \frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}\frac{\partial^4 A_z}{\partial y \partial z^3} = 0.
\end{aligned} \tag{2}$$

For this Eq. (2), the following envelope solution is assumed.

$$\tilde{A}_z = A_z(x, y, z, t)e^{i(k_{0x}\hat{x} + k_{0y}\hat{y} + k_{0z}\hat{z} - \omega_0 t)} \tag{3}$$

The dynamical equation governing the nonlinear whistler wave traveling through plasma has been formulated by taking into consideration the influence of a whistler wave on the background density and substituting the solution into Eq. (2).

$$\begin{aligned}
&2i\omega_0(1 + \lambda_e^4 k_0^4 + 2\lambda_e^2 k_0^2 + 2\lambda_e^4 k_{0x}^2 k_{0z}^2 + 2\lambda_e^4 k_{0y}^2 k_{0z}^2)\frac{\partial A_z}{\partial t} + (4\omega_0^2\lambda_e^4 k_{0x}^2)\frac{\partial^2 A_z}{\partial x^2} \\
&+ (4\omega_0^2\lambda_e^4 k_{0y}^2)\frac{\partial^2 A_z}{\partial y^2} + (4\omega_0^2\lambda_e^4 k_{0z}^2 - 4\lambda_i^2 v_A^2 k_{0z}^2)\frac{\partial^2 A_z}{\partial z^2} \\
&+ 2ik_{0x}(2\omega_0^2 k_{0x}^2\lambda_e^4 + 2\omega_0^2 k_{0z}^2\lambda_e^4 + 2\omega_0^2\lambda_e^2 + k_{0z}^2\lambda_i^2 v_A^2)\frac{\partial A_z}{\partial x} \\
&+ 2ik_{0y}(2\omega_0^2 k_{0y}^2\lambda_e^4 + 2\omega_0^2 k_{0z}^2\lambda_e^4 + 2\omega_0^2\lambda_e^2 - k_{0z}^2\lambda_i^2 v_A^2)\frac{\partial A_z}{\partial y} \\
&+ 2ik_{0z}(2\omega_0^2 k_{0z}^2\lambda_e^4 + 2\omega_0^2 k_{0x}^2\lambda_e^4 + 2\omega_0^2 k_{0y}^2\lambda_e^4 + 2\omega_0^2\lambda_e^2 - k_{0y}^2\lambda_i^2 v_A^2 - 2k_{0z}^2\lambda_i^2 v_A^2)\frac{\partial A_z}{\partial z} \\
&+ (4\lambda_i^2 v_A^2 k_{0x}k_{0z} - 8\omega_0^2\lambda_e^4 k_{0z}k_{0x})\frac{\partial^2 A_z}{\partial x \partial z} + (4\lambda_i^2 v_A^2 - 8\omega_0^2\lambda_e^4)k_{0y}k_{0z}\frac{\partial^2 A_z}{\partial y \partial z} \\
&+ \frac{\lambda_i^2 v_A^2 B_{0y}^2}{B_{0z}^2}k^2 k_{0y}^2 A_z + \frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}k^2 k_{0y}k_{0z}A_z - (\lambda_i^2 v_A^2 k^2 k_{0z}^2)\frac{\delta n}{n_0}A_z + 2i\gamma' A_z = 0,
\end{aligned} \tag{4}$$

where $k_{0x}$, $k_{0y}$ and $k_{0z}$ are wave vector components of whistler related to the background magnetic field are given as, $k_0^2 = k_{0x}^2 + k_{0y}^2 + k_{0z}^2$. Here $n'$ denotes the modified density, i.e., $n' = n_0 + \delta n$, and $\frac{\delta n}{n_0}$ denotes the perturbation in plasma density due to nonlinear whistler wave. We have used the relation of the magnetic field and vector potential $\left(\frac{B_{0y}}{B_{0z}} = \frac{\delta A_z}{A_0}\right)$.

Equation (4) in normalized dimensionless form is given as

$$ic_1\frac{\partial A_z}{\partial t} + c_2\frac{\partial^2 A_z}{\partial x^2} + c_3\frac{\partial^2 A_z}{\partial y^2} + c_4\frac{\partial^2 A_z}{\partial z^2} + ic_5\frac{\partial A_z}{\partial x} + ic_6\frac{\partial A_z}{\partial y} + ic_7\frac{\partial A_z}{\partial z} + c_8\frac{\partial^2 A_z}{\partial x\partial z} + c_9\frac{\partial^2 A_z}{\partial y\partial z} + c_{10}\left(\frac{\delta A_z}{A_0}\right)^2 A_z + c_{11}\left(\frac{\delta A_z}{A_0}\right)A_z - \frac{\delta n}{n_0}A_z + 2i\gamma' A_z = 0, \tag{5}$$

where Eq. (5) represents the whistler wave's normalized dynamical equation, which causes turbulence. In this section, the beam instability that generates the whistler wave will be described. The growth rate of whistler wave generated by an energetic electron beam, which is included phenomenologically, and its value corresponding with the data published by Zhao et al. [36] will be utilized in simulations here. To get the dynamical equation, we introduce the field perturbation due to magnetic islands profile, since the magnetic reconnection is visualized within the framework of magnetic island as mentioned by Fitzpatrick and Waelbroeck [57],

$$\frac{\delta A_z}{A_0} = \left(-\frac{x^2}{2} + |A_z|\cos(ky)\right) \tag{6}$$

So, using the profile of field perturbation Eq. (5) modifies as-

$$ic_1\frac{\partial A_z}{\partial t} + c_2\frac{\partial^2 A_z}{\partial x^2} + c_3\frac{\partial^2 A_z}{\partial y^2} + c_4\frac{\partial^2 A_z}{\partial z^2} + ic_5\frac{\partial A_z}{\partial x} + ic_6\frac{\partial A_z}{\partial y} + ic_7\frac{\partial A_z}{\partial z} + c_8\frac{\partial^2 A_z}{\partial x\partial z} + c_9\frac{\partial^2 A_z}{\partial y\partial z} + c_{10}\left(-\frac{x^2}{2} + |A_z|\cos(ky)\right)^2 A_z + c_{11}\left(-\frac{x^2}{2} + |A_z|\cos(ky)\right)A_z - \frac{\delta n}{n_0}A_z + 2i\gamma' A_z = 0, \tag{7}$$

where $c_1 = \frac{2\omega_0(1+\lambda_e^4k_0^4+2\lambda_e^2k_0^2+2\lambda_e^4k_{0x}^2k_{0z}^2+2\lambda_e^4k_{0y}^2k_{0z}^2)}{(\lambda_i^2v_A^2k^2k_{0z}^2)}.c_2 = \frac{2k_{0x}(2\omega_0^2\lambda_e^4k_{0x}^2+2\omega_0^2\lambda_e^4k_{0z}^2+2\omega_0^2\lambda_e^2-\lambda_i^2k_{0z}^2v_A^2)}{(\lambda_i^2v_A^2k^2k_{0z}^2)}$. $c_3 = \frac{2k_{0y}(2\omega_0^2\lambda_e^4k_{0y}^2+2\omega_0^2\lambda_e^4k_{0z}^2+2\omega_0^2\lambda_e^2-\lambda_i^2k_{0z}^2v_A^2)}{(\lambda_i^2v_A^2k^2k_{0z}^2)}.c_4 = \frac{2k_{0z}(2\omega_0^2\lambda_e^2k_{0z}^2+2\omega_0^2\lambda_e^2k_{0x}^2+2\omega_0^2\lambda_e^2k_{0y}^2+2\omega_0^2\lambda_e^2-\lambda_i^2v_A^2k_{0y}^2-2\lambda_i^2v_A^2k_{0z}^2)}{\lambda_i^2v_A^2k^2k_{0z}^2}.c_5 = \frac{4\omega_0^2k_{0x}^2\lambda_e^4}{\lambda_i^2v_A^2k_0^2k_{0z}^2}$, $c_6 = \frac{4\omega_0^2k_{0y}^2\lambda_e^4}{\lambda_i^2v_A^2k_0^2k_{0z}^2}$, $c_7 = \frac{(4\omega_0^2k_{0z}^2\lambda_e^4-4\lambda_i^2v_A^2k_{0z}^2)}{\lambda_i^2v_A^2k_0^2k_{0z}^2}$. $b_0 = 0.5, c_8 = \frac{(8\omega_0^2\lambda_e^4-4\lambda_i^2v_A^2)k_{0z}k_{0x}}{\lambda_i^2v_A^2k_0^2k_{0z}^2}$, $c_9 = \frac{(8\omega_0^2\lambda_e^4-4\lambda_i^2v_A^2)k_{0z}k_{0y}}{\lambda_i^2v_A^2k_0^2k_{0z}^2}$, $c_{10} = \frac{k_{0y}^2}{k_{0z}^2}$ and $c_{11} = \frac{2k_{0y}}{k_{0z}}$.and $\gamma' = \frac{\gamma}{\omega_0}$ is the normalized growth rate. $\gamma(= 0.5083\omega_{ce})$ is the growth rate of beam-driven whistler waves. The normalizing parameters are- $t_n = 1/\omega_0$.

$$x_n = \frac{k_{0x}(2\omega_0^2k_{0x}^2\lambda_e^4 + 2\omega_0^2k_{0z}^2\lambda_e^4 + 2\omega_0^2\lambda_e^2 + k_{0z}^2\lambda_i^2v_A^2)}{\omega_0(1+\lambda_e^4k_0^4 + 2\lambda_e^2k_0^2 + 2\lambda_e^4k_{0x}^2k_{0z}^2 + 2\lambda_e^4k_{0y}^2k_{0z}^2)}.$$

$$z_n = \frac{2i(-2\omega_0^2k_{0x}^3\lambda_e^4 + 2\omega_0^2k_{0x}k_{0z}^2\lambda_e^4 + 2\omega_0^2\lambda_e^2k_{0x} + k_{0x}k_{0z}^2\lambda_i^2v_A^2 + 2k_{0z}^3\lambda_i^2v_A^2)}{2\omega_0(1+\lambda_e^4k_{0x}^4 + \lambda_e^4k_{0z}^4 + 2\lambda_e^2k_{0x}^2 + 2\lambda_e^2k_{0z}^2)}.$$

### 2.2 Magnetosonic waves dynamics (MSWs)

Consider a magnetosonic wave propagating in the $x$-direction, i.e., $\vec{k} = k_{0x}\hat{x}$ along with the background magnetic field in the $z$-direction, i.e., $\vec{B} = B_0\hat{z}$. The electric field is polarized in $y$-direction, i.e., $\vec{E} = E_y\hat{y}$. The dynamical equation for the magnetosonic wave is obtained from the basic equations such as the equation of motion, Faraday's law, continuity equation, and Ampere's -Maxwell's equation following the procedure used by [34] as

$$\left(\frac{\partial^2}{\partial t^2} - c_{12}\frac{\partial^2}{\partial x^2}\right)\frac{n}{n_0} = -c_{13}\frac{\partial^2}{\partial x^2}|A_z|^2, \tag{8}$$

where $c_{12}$, $c_{13}$ is the constant, whose value is given below:

$$c_{12} = c^2\left(\frac{c_s^2 + v_A^2}{c^2 + v_A^2}\right)$$

and $c_{13} = \left[\frac{e^2}{m_em_i\omega_{ce}^2} - \frac{e^2\omega_0}{m_em_i\omega_{ce}\alpha_1}\left\{\left(1 + \frac{\omega_{ce}^2}{\alpha_1}\right) + \frac{\omega_0^3}{\alpha_1\omega_{ce}}\right\} + \frac{e^2}{m_i^2\omega_{ci}^2} - \frac{e^2\omega_0}{m_em_i\omega_{ce}\alpha_1}\left\{\left(1 + \frac{\omega_{ci}^2}{\alpha_1}\right) + \frac{\omega_0^3}{\alpha_1\omega_{ci}}\right\}\right]$.

$c_s\left(= \frac{v_{the}^2 + v_{thi}^2}{m_i}\right)^{\frac{1}{2}}$ is the speed of the sound wave. And $\alpha_1 = -k^2\lambda_e^2(\omega_0^2 - \omega_{ce}^2) - \omega_0^2$.

Now, using the same normalizing parameter as in the whistler wave dynamics, i.e., $x_n$, $z_n$ and $t_n$. After taking the adiabatic response of Eq. (8), we obtain

$$\frac{n}{n_0} = \frac{c_{13}}{c_{12}}|A_z|^2. \tag{9}$$

we obtain the following normalization equation,

$$A_n = \left[\frac{c_{12}}{c_{13}}n_0\right]^{\frac{1}{2}} \tag{10}$$

using this Eq. (9) in Eq. (7), we obtain

$$\begin{aligned} &ic_1\frac{\partial A_z}{\partial t} + c_2\frac{\partial^2 A_z}{\partial x^2} + c_3\frac{\partial^2 A_z}{\partial y^2} + c_4\frac{\partial^2 A_z}{\partial z^2} + ic_5\frac{\partial A_z}{\partial x} + ic_6\frac{\partial A_z}{\partial y} + ic_7\frac{\partial A_z}{\partial z} + c_8\frac{\partial^2 A_z}{\partial x\partial z} + c_9\frac{\partial^2 A_z}{\partial y\partial z} \\ &+ c_{10}\left(-\frac{x^2}{2} + |A_z|\cos(ky)\right)^2 A_z + c_{11}\left(-\frac{x^2}{2} + |A_z|\cos(ky)\right)A_z - \frac{c_{13}}{c_{12}}|A_z|^2 A_z + 2i\gamma' A_z = 0, \end{aligned} \tag{11}$$

This is the model equation of dynamical system of 3D nonlinear whistler in the presence of magnetic islands.
Parameters used in numerical simulations are:
$n_0 = 21cm^{-3}$, $B_0 = 45nT$, $T_e = 42\,\text{eV}$, $T_I = 235\,\text{eV}$ (Chaston et. al. 2008 [58]).
Using these parameters, one can find the values: -

$\omega_{\text{pe}} = 2.5 \times 10^5\,\text{rad/ sec}$, $\omega_{ce} = 7.9 \times 10^3\,\text{rad/sec}$, $\omega_{ci} = 4.31\,\text{rad/sec}$, $v_A = 2.14 \times 10^7\,\text{cm/sec}$,
$c_s = 1.6 \times 10^7\,\text{cm/sec}$, $\lambda_i = 4.9 \times 10^6\,\text{cm}$, $\lambda_e = 1.16 \times 10^5\,\text{cm}$, $A_n = 5.03 \times 10^8 G\,\text{cm}$, $x_n = y_n = 1.02 \times 10^6\,\text{cm}$,
$z_n = 1.5 \times 10^6\,\text{cm}$, $t_n = 0.015\,\text{sec}$,

The values of numerical constants are given below-

$c_1 = 0.0155$, $c_2 = c_3 = 1.02 \times 10^6$, $c_4 = 1.5 \times 10^6$, $c_5 = c_6 = 2.5 \times 10^{10}$, $c_7 = -2.0 \times 10^{11}$, $c_8 = c_9 = -7.2 \times 10^{11}$,
$c_{10} = 12.41$, $c_{11} = 7.04$, $c_{12} = 1.6 \times 10^5$, $c_{12} = 7.2 \times 10^{14}$, $c_{13} = 3.43 \times 10^{14}$.

## 3 Numerical simulation and result discussion

For solving the dynamics of Eq. (11), we have developed a modified nonlinear Schrödinger model (MNLS). To solve Eq. (11) numerically, we have used the 3D pseudospectral method. For space integration having periodic length $L_x = \frac{2\pi}{\alpha_x}$ and $L_y = \frac{2\pi}{\alpha_y}$, a pseudospectral approach and finite difference approach with the step size of $dt = 5 \times 10^{-5}$ for time evolution utilizing a modified version of the predictor–corrector method have been used [59]. For doing numerical simulation, periodic domain $(10\pi \times 10\pi \times 10\pi)$ and grid size $(128 \times 128 \times 128)$ of the system are used [60]. The model equation has been transformed into the nonlinear Schrödinger (NLS) equation [The nonlinear Schrödinger (NLS) equation is a fundamental partial differential equation in physics, crucial tool in plasma physics for understanding the dynamics of wave-like events and collective plasma oscillations in specific conditions] to evaluate its accuracy, by testing the consistency of the plasmon number up to order of sixth decimal, and then we modify this code according to our problem and run this code. The initial condition for numerical simulation consists of a single O-point representing the magnetic reconnection (Fitzpatrick and Waelbroeck [57]): -

$$\frac{\delta A_z}{A_0} = \left(-\frac{x^2}{2} + |A_z|\cos(ky)\right)$$

Here, $|A_z|$ is the initial amplitude of the wave.

Contour plots of vector potential or drawings of magnetic field lines may be used to locate magnetic islands caused by reconnection. Figure 1 depicts the contour plot of vector potential (left panel) at different times. Magnetic field lines initially at $t = 0$ develop into a single O structure. Over the time, this single O-point reassembles into several O-points linked to X-points, forming X–O structures with increasing amplitude (at $t = 11$ and 27). In this figure, the formation of a separatrix between the X and O locations is evident.

Also, these contour plots of vector potential signify a concentrated disruption in an otherwise consistent field, illustrating the solitary characteristic of the wave. Along with this one may notice evenly distributed peaks or troughs, which indicate the wave's periodic behavior throughout the spatial region.

To understand the expansion of magnetic flux, which is associated with current density function by Ampere's law, the spatial development of current density function must also be considered. Over time, the essential X–O structures begin to distort, resulting in a chaotic pattern. Because of these chaotic structures, whistler turbulence will occur. In our simulation, we discovered that current sheets also get turbulent. In right panel, we have shown the temporal evolution of current sheets. By using the relation of $j = \nabla^2 A_z$, current density can be obtained.

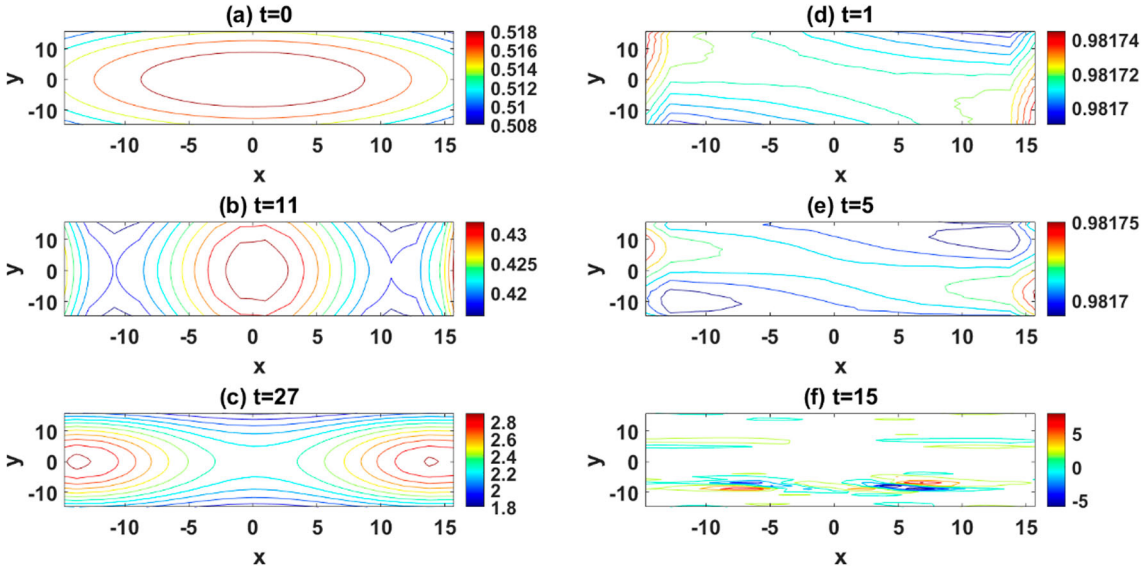


**Fig. 1** Contour plot (left panel) and current sheet (right panel) of nonlinear whistler wave at different times

Bhat et al. [61] have examined the contour plot of the vector potential, as depicted in Fig. 4 of their study, at various time intervals. During the first stage, the system is in a state just before the development of plasmoids, which are small islands. Once formed, the plasmoids become stuck in the middle of the current sheet, which is a region where magnetic field lines reconnect due to their highly symmetric arrangement. Subsequently, these plasmoids transition smoothly into the nonlinear stage.

### 3.1 Power spectrum

Since the beam-driven mode's continuous growth rate was taken into consideration, the quasi-steady state has not yet been reached and will not be for some time. Therefore, we switch off the growth rate part from our system's Eq. (11) to see the turbulent power spectrum.

$$ic_7\frac{\partial A_z}{\partial z}+c_2\frac{\partial^2 A_z}{\partial x^2}+c_3\frac{\partial^2 A_z}{\partial y^2}+ic_5\frac{\partial A_z}{\partial x}+ic_6\frac{\partial A_z}{\partial y}+c_8\frac{\partial^2 A_z}{\partial x\partial z}+c_9\frac{\partial^2 A_z}{\partial y\partial z}-\frac{c_{13}}{c_{12}}|A_z|^2A_z=0. \tag{12}$$

After that, Eq. (12) is solved numerically utilizing the pseudospectral approach for spatial integration (along the $x$- and $y$-direction) and the finite difference method for time evolution (along the $z$-direction). Then simulating this Eq. (12) for a higher grid size ($512 \times 512$). Figure 2 illustrates the power spectra. The top panel of Fig. 2 shows the time evolution of electric energy spectrum. It approaches a power-law spectrum following the Kolmogorov scaling, i.e., close to $k^{-5/3}$ in the inertial range [which agrees with the observations of (Biskamp et al. [41]] and steeper spectra of nearly -7/3 at smaller scales. The bottom panel shows the magnetic (blue) and electric (red) at time range, 65–80. The energy spectra have been computed with the 2D Fourier decomposition of magnetic and electric fields. The observed power-law behavior is in the range of $0.1 < k\lambda_e < 1$. These power spectra illustrate the signature of turbulence. The charged particles can be accelerated by this energy.

The acceleration of charged particles in plasmas has been studied using a variety of methods, including Fermi acceleration, resonant wave–particle acceleration, and acceleration through radiative-resonant interactions. In this study, we examine the development of the thermal tail of energetic electrons, which may be the root of the electron acceleration and heating, caused by the power-law scaling of turbulence generation. By using the Fokker–Plank equation, it is possible to comprehend how localized structures and plasma particles interact. Particle energization can result from these kinds of random and frequent interactions. This is accomplished using second-order Fermi acceleration [62, 63].

The quasi-linear diffusion equation may be used to examine the interactions between strongly localized fields (structures) and plasma particles. Here is an expression for the quasi-linear diffusion equation [63, 64].

$$\frac{\partial f}{\partial t}=\frac{\partial}{\partial v}\left\{D(v)\frac{\partial f}{\partial v}\right\}. \tag{13}$$

here, $f(t, v)$ denotes the velocity distribution function, and $D(v)$ denotes the velocity space diffusion coefficient. When the observation time is longer than the characteristic time of setting up of ponderomotive nonlinearity, the distribution function $f(t, v)$ can

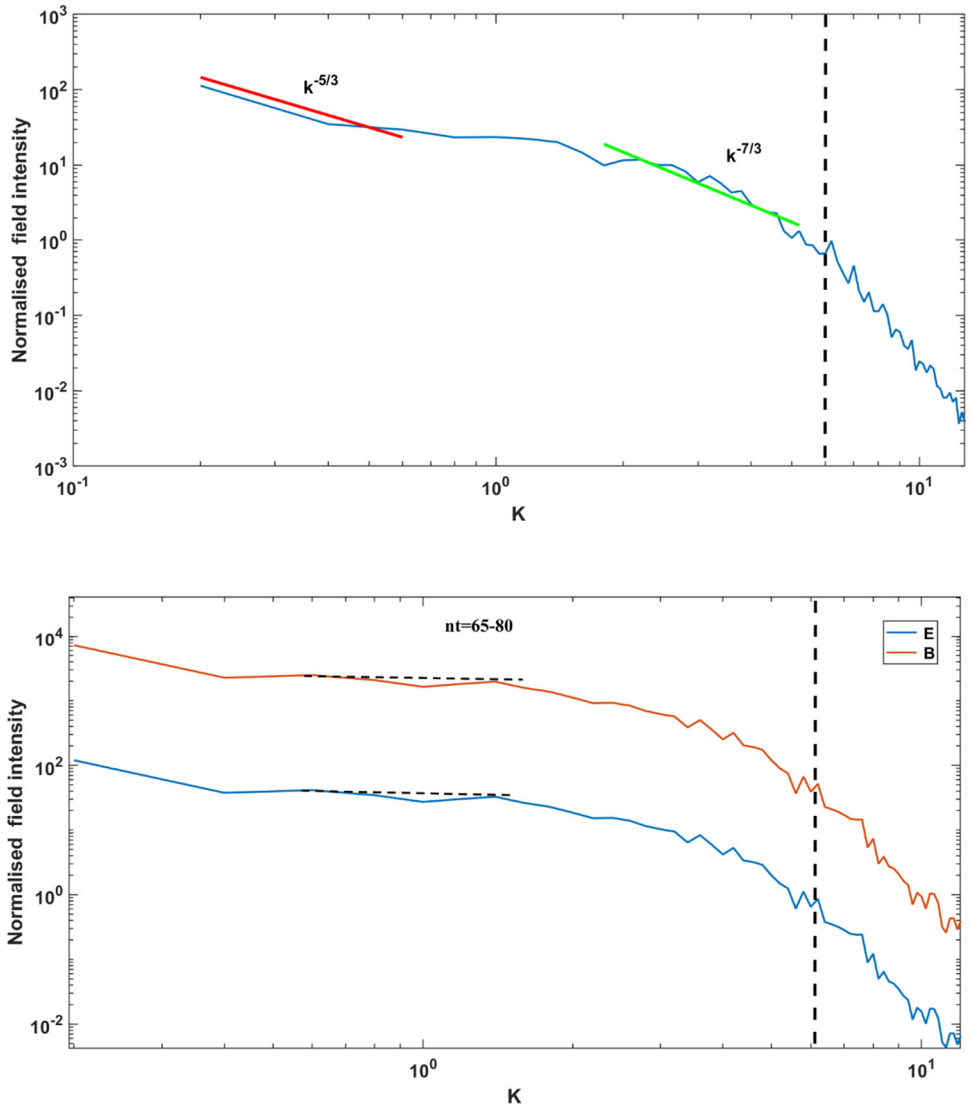


**Fig. 2** Top panel: time evolution of electric energy spectrum. The bottom panel: magnetic (blue) and electric (Red) energy spectra. The vertical dashed black line shows the electron gyroscale

be assumed as time independent. In this context, the relation between spectral index $\eta$, and distribution function $f(v)$ [65] is given below-

$$f(v) \propto v^{2-\eta}. \tag{14}$$

In our current analysis $\eta \simeq 2.3$, therefore $f(v) \sim v^{-0.3}$ it leads to the formation of the thermal tail of energetic electrons. Therefore, this enhances the thermal tail segment of the distribution function and paves the way for the thermal heating of the particles.

## 4 Semianalytical model

It is critical to comprehend the creation and behavior of current sheets in magnetic reconnection in a variety of astrophysical and lab plasma systems. So, to understand the formation of current sheet and their size, we have studied a simplified model named as semianalytical or steady-state model. For simplification, we have modified Eq. (4), and obtained the following equation,

$$i\frac{2}{k_\parallel}\frac{\partial A_z}{\partial z} + \frac{(4\omega_0^2\lambda_e^4k_\perp^2)}{(2\omega_0^2k_\parallel^2\lambda_e^4 + 2\omega_0^2k_\perp^2\lambda_e^4 + 2\omega_0^2\lambda_e^2 - k_\perp^2\lambda_i^2v_A^2 - 2k_\parallel^2\lambda_i^2v_A^2)k_\parallel^2}\frac{\partial^2 A_z}{\partial x^2} + \frac{(4\omega_0^2\lambda_e^4k_\perp^2)}{(2\omega_0^2k_\parallel^2\lambda_e^4 + 2\omega_0^2k_\perp^2\lambda_e^4 + 2\omega_0^2\lambda_e^2 - k_\perp^2\lambda_i^2v_A^2 - 2k_\parallel^2\lambda_i^2v_A^2)k_\parallel^2}\frac{\partial^2 A_z}{\partial y^2}$$

$$+\frac{\lambda_i^2 v_A^2 k^2 k_\perp^2}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)k_\parallel^2}\left(\frac{\delta A_z}{A_0}\right)^2 A_z$$
$$+\frac{2\lambda_i^2 v_A^2 k^2 k_{0y} k_\parallel}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)k_\parallel}\left(\frac{\delta A_z}{A_0}\right)A_z$$
$$-\frac{(\lambda_i^2 v_A^2 k^2)}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)}\frac{\delta n}{n_0}A_z+A_z\exp(k_i z)=0. \tag{15}$$

Or we can rewrite the above equation in simplified equation as-

$$i\frac{2}{k_\parallel}\frac{\partial A_z}{\partial z}+\theta_1\lambda_e^2\left(\frac{\partial^2 A_z}{\partial x^2}+\frac{\partial^2 A_z}{\partial y^2}\right)+\theta_2\left(-\frac{x^2}{2}+A_z\cos(ky)\right)^2 A_z+\theta_3\left(-\frac{x^2}{2}+A_z\cos(ky)\right)A_z-\theta_4\frac{\delta n}{n_0}A_z+A_z\exp(k_i z)=0, \tag{16}$$

where $\theta_1=\frac{(4\omega_0^2\lambda_e^2 k_\perp^2)}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)k_\parallel^2}.$, $\theta_2=\frac{\lambda_i^2 v_A^2 k^2 k_\perp^2}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)k_\parallel^2}.$, $\theta_3=\frac{2\lambda_i^2 v_A^2 k^2 k_\perp}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)k_\parallel}.$, $\theta_4=\frac{(\lambda_i^2 v_A^2 k^2)}{(2\omega_0^2 k_\parallel^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2 k_\perp^2\lambda_e^4+2\omega_0^2\lambda_e^2-k_\perp^2\lambda_i^2 v_A^2-2k_\parallel^2\lambda_i^2 v_A^2)}$.

Now we are assuming the envelope solution of the vector potential $\tilde{A}_z=A_{00}e^{ik_{0z}s(x,y,z)}$, and putting this envelope solution in Eq. (16) we obtained the following equation-

$$i\frac{2}{k_{0z}}\frac{\partial A_{00}}{\partial z}-2A_{00}\frac{\partial s}{\partial z}+\theta_1\lambda_e^2\left(\frac{\partial^2 A_{00}}{\partial x^2}+\frac{\partial^2 A_{00}}{\partial y^2}\right)+2ik_\parallel\theta_1\lambda_e^2\left(\frac{\partial A_{00}}{\partial x}\frac{\partial s}{\partial x}+\frac{\partial A_{00}}{\partial y}\frac{\partial s}{\partial y}\right)$$
$$-k_\parallel^2\theta_1\lambda_e^2\left(\frac{\partial s}{\partial x}+\frac{\partial s}{\partial y}\right)^2 A_{00}+ik_\parallel\theta_1\lambda_e^2\left(\frac{\partial^2 s}{\partial x^2}+\frac{\partial^2 s}{\partial y^2}\right)A_{00}+\theta_2\left[\left(-\frac{x^2}{2}+A_z\cos(ky)\right)\right]^2 A_{00}$$
$$+\theta_3\left[\left(-\frac{x^2}{2}+A_z\cos(ky)\right)\right]A_{00}-\theta_4\frac{\delta n}{n_0}A_{00}+A_z\exp(k_i z)=0. \tag{17}$$

Further separating the real and imaginary parts of Eq. (17)

$$-2\frac{\partial s}{\partial z}A_{00}+\theta_1\lambda_e^2\left(\frac{\partial^2 A_{00}}{\partial x^2}+\frac{\partial^2 A_{00}}{\partial y^2}\right)-k_\parallel^2\theta_1\lambda_e^2\left(\frac{\partial s}{\partial x}+\frac{\partial s}{\partial y}\right)^2 A_{00}+\theta_2\left[\left(-\frac{x^2}{2}+A_z\cos(ky)\right)\right]^2 A_{00}$$
$$+\theta_3\left[\left(-\frac{x^2}{2}+A_z\cos(ky)\right)\right]A_{00}-\theta_4\left[\exp(\alpha|A_z|^2-1\right]A_{00}+A_{00}\exp(k_i z)=0. \tag{18}$$

$$\frac{2}{k_\parallel}\frac{\partial A_{00}}{\partial z}+2k_\parallel\theta_1\lambda_e^2\left(\frac{\partial A_{00}}{\partial x}\frac{\partial s}{\partial x}+\frac{\partial A_{00}}{\partial y}\frac{\partial s}{\partial y}\right)+k_\parallel\lambda_e^2\theta_1\left(\frac{\partial^2 s}{\partial x^2}+\frac{\partial^2 s}{\partial y^2}\right)A_{00}=0. \tag{19}$$

Further assuming the Gaussian profile for the initial distribution of wave, i.e.,

$$A_{00}^2=\frac{A_{00}^{'2}}{f_1(z)f_2(z)}\exp\left(\frac{-x^2}{r_{01}^2}-\frac{y^2}{r_{01}^2}+k_i z\right)$$
$$s=\beta_1(z)\frac{x^2}{2}+\beta_2(z)\frac{y^2}{2}+\phi(z) \tag{20}$$

Using Eq. (20) in Eq. (19), and collecting the terms $x^2$ and $y^2$, we obtain the following equations.

$$\beta_1(z)=\frac{1}{k_\parallel^2\theta_1\lambda_e^2}\frac{1}{f_1}\frac{\partial f_1}{\partial z}.$$
$$\beta_2(z)=\frac{1}{k_\parallel^2\theta_1\lambda_e^2}\frac{1}{f_2}\frac{\partial f_2}{\partial z}. \tag{21}$$

here $r_{01}$ and $r_{02}$ represents the length and width of current sheet, respectively; $\beta_1(z)$ and $\beta_2(z)$ represents the slowly varying function, and $f_1$, $f_2$ represents the beam width parameter of the whistler wave. Now, for obtaining the beam-width parameters, use Eq. (20) in Eq. (18) with paraxial approximation, i.e., $x << r_{01}^2 f_1$, $y << r_{02}^2 f_2$ after that equating coefficient of $x^2$ and $y^2$, we obtained the following Eq.

$$\frac{\partial^2 f_1}{\partial\xi^2}=R_d^2 k_\parallel^2\left(\frac{4\theta_1^2\lambda_e^4}{r_{01}^4 f_1^4 f_2}+\frac{\theta_1\theta_3 f_1}{2}-\frac{2\theta_1\theta_4\lambda_e^2\left(\alpha A_{00}^{'2}\right)}{r_{01}^2 f_1^3 f_2}\right). \tag{22}$$

and,

$$\frac{\partial^2 f_2}{\partial \xi^2} = R_d^2 k_\parallel^2 \left( \frac{4\theta_1^2 \lambda_e^4}{r_{02}^4 f_2^4 f_1} + \frac{\theta_1 \theta_3 k^2 \lambda_e^2 f_2}{2} - \frac{\theta_1 \theta_4 \lambda_e^2 \left(\alpha A_{00}^{'2}\right)}{r_{02}^2 f_2^3 f_1} \right), \tag{23}$$

where $\xi = z/R_d$ and $\mathrm{R}_d = k_{0z} r_{01}^2$. Equations (22) and (23) are solved for the plain wavefront imposing the following initial conditions- $\frac{\partial^2 f_1}{\partial \xi^2} = \frac{\partial^2 f_2}{\partial \xi^2} = 0$, $f_1 = f_2 = 1$ at z = 0. When the power of the whistler wave $\left(\alpha A_{00}^{'2}\right)$ is zero, then the length and width of the whistler's localized structures are obtained as $r_{01} = 0.9\lambda_e$, $r_{02} = 1.2\lambda_e$, respectively. Further, when we take the finite value of power $\left(\alpha A_{00}^{'2} = 0.5\right)$, then the length and width of the whistler's localized structures are obtained as, $r_{01} = 15\lambda_e$, $r_{02} = 15.63\lambda_e$, respectively. Also, by using Ampere's law $\left(J = -\nabla^2 A_{00'}\right)$, we have studied the current sheet size. One can calculate the length and width of the whistler's localized structures of the current sheet comes out to be of the order of $r_{01}/\sqrt{3}$ and $r_{02}/\sqrt{3}$, respectively. Therefore, when power is finite then the length and width of whistler's localized structures of current sheet is $8.6\lambda_e$, and $9.03\lambda_e$, respectively. When power is zero then the length and width of whistler's localized structures of current sheet is $0.52\lambda_e$, and $0.69\lambda_e$, respectively. As a result, it shows how the whistler power also influences the scale size of current sheet. Recently, scale size of super thin current sheets in the Earth's magnetotail has been reported which is of the order of few (1–5) gyroradii of thermal electrons [66]. Also, the scale size of whistler wave's structures of the order of $(10 - 20)\lambda_e$ has been reported at the magnetic reconnection sites in the magnetopause [67]. Electron-scale current sheets has been reported in the vicinity of Earth's magnetosheath, solar corona and other astrophysical system.

## 5 Summary and conclusion

This study focuses on the effect of the perturbed background density and magnetic islands on the whistler wave at the site of magnetic reconnection. We proposed a model of beam-driven whistler wave originating from the noise caused by the energy of beam and rising to a large amplitude, where nonlinear effects from ponderomotive force drive the whistler wave. The model equation to represent the coupling of whistler wave and magnetosonic wave has been developed with the help of a two-fluid model. To address the model concern, the pseudospectral approach is employed for spatial integration, and the finite difference method is used for temporal integration. The outcomes of the numerical simulations are discussed below:

Separatrix plays a key role in magnetic reconnection by forming a line separating portions of magnetic field lines with varying connectivity. It acts as a site for the breaking and reconnecting of magnetic field lines, resulting in the release of accumulated magnetic energy. The features of the separatrix are a helpful source of information for the mechanism and energetics of the reconnection process.

Even though spectra in quasi-steady state are nearly around the order of − 5/3 in the inertial range [which is consistent with Biskamp et al. [41]], At shorter wavelengths, we obtain steeper spectra with scaling factors on the order of -7/3, but the development of turbulent state is the unique aspect of our work in which we explored the formation of current sheets and how they emerge into turbulent states. The current sheet deeds as a location for intense plasma heating, energy dissipation and particle acceleration. Further, a detailed analysis of all different possibilities that are encountered in the beam-driven turbulence generation, and heating and acceleration of plasma particles is beyond the scope of this paper and will be left to future work.

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**Data Availability Statement** The data that supports the findings of this study are available within the article. The manuscript has associated data in a data repository.

## Appendix A: Dispersion relation of 3D whistler wave

Two fluid models are used to formulate the dynamical equation for a 3D whistler wave propagating in the $x$, $y$, and $z$ axes with a wave vector $\vec{k} = k_x\hat{x} + k_y\hat{y} + k_z\hat{z}$ and an ambient magnetic field along the z-axis in a magnetized plasma.

The following fundamental equations are used to formulate the whistler wave's dynamics: Wave equation,

$$\nabla^2 \vec{E} - \nabla(\nabla.\vec{E}) = \frac{4\pi}{c^2}\frac{\partial \vec{J}}{\partial t} + \frac{1}{c^2}\frac{\partial^2 \vec{E}}{\partial t^2}. \tag{A1}$$

Equation of motion for electrons

$$m_e\left[\frac{\partial \vec{v}_e}{\partial t} + (\vec{v}_e.\nabla\vec{v}_e)\right] = -e\vec{E} - \frac{e}{c}(\vec{v}_e \times \vec{B}_0). \tag{A2}$$

Equation of motion for ions

$$m_i\left[\frac{\partial \vec{v}_i}{\partial t} + (\vec{v}_i.\nabla\vec{v}_i)\right] = e\vec{E} + \frac{e}{c}(\vec{v}_i \times \vec{B}_0), \tag{A3}$$

where $m_e$ $m_i$ denotes the mass of an electron and ion, $v_i$, $v_e$ denotes the velocity of the ion and electron, $B_0$ denotes the background magnetic field, and $e$ denotes the charge on the electron. Where $B_0(= B_{0z}\hat{z} + B_{0y}\hat{y})$, denotes the background magnetic field along $z$ direction and $B_{0y}$ denotes the magnetic field owing to the presence of magnetic islands (at the reconnection sites).

Velocity components of whistler wave are derived using Eqs. (A2) and (A3),

$$\frac{d\vec{v}_e}{dt} = \frac{\partial \vec{v}_e}{\partial t} + \vec{v}_e.(\nabla\vec{v}_e) = \frac{-e\vec{E}}{m_e} - \frac{e}{m_e c}\left[\vec{v}_e \times \left(\vec{B}_{0z}\hat{z} + \vec{B}_{0y}\hat{y}\right)\right]. \tag{A4}$$

where $\vec{v}_e = \vec{v}_{e0} + \vec{v}_{e1}$, $\vec{v}_{e0} = 0$ No drift in equilibrium.

$\vec{B}\left(= B_{0z}\hat{z} + B_{0y}\hat{y}\right)$, background magnetic field.

We can write the x-component of Eq. (A4) as:

$$-i\omega_0\, v_{e1x} = -\frac{eE_x}{m_e} - v_{e1y}\omega_{ce} + \frac{e}{m_e c}v_{e1z}B_{0y}. \tag{A5}$$

Similarly, y-component of Eq. (A4) is:

$$-i\omega_0\, v_{e1y} = -\frac{eE_y}{m_e} + v_{e1x}\omega_{ce}. \tag{A6}$$

$z$-component of Eq. (A4) is:

$$-i\omega_0\, v_{e1z} = -\frac{eE_z}{m_e} - \frac{e}{m_e c}v_{e1x}B_{0y}. \tag{A7}$$

From Eq. (A6)

$$v_{e1y} = \frac{eE_y}{i\omega_0 m_e} + \frac{v_{e1x}\omega_{ce}}{i\omega_0}. \tag{A8}$$

Using Eqs. (A8) and (A7) in Eq. (A5), we can obtain the x-component of whistler wave's velocity due to electron.

$$v_{e1x} = -\frac{i\omega_0 e}{m_e\left(\omega_0^2 - \omega_{ce}^2\right)}E_x - \frac{e\omega_{ce}}{m_e\left(\omega_0^2 - \omega_{ce}^2\right)}E_y + \frac{e^2 B_{0y}}{m_e^2 c\left(\omega_0^2 - \omega_{ce}^2\right)}E_z. \tag{A9}$$

$y$-component of whistler wave's velocity due to electron,

$$v_{e1y} = \frac{e\omega_{ce}}{m_e\left(\omega_0^2 - \omega_{ce}^2\right)}E_x - \frac{i\omega_0 e}{m_e\left(\omega_0^2 - \omega_{ce}^2\right)}E_y + \frac{ie^2\omega_{ce}B_{0y}}{m_e^2 c\omega_0\left(\omega_0^2 - \omega_{ce}^2\right)}E_z. \tag{A10}$$

$z$-component of whistler wave's velocity due to electron,

$$v_{e1z} = \frac{eE_z}{im_e\omega_0} + \left[\frac{-e^2 B_{0y}}{m_e^2 c(\omega_0^2 - \omega_{ce}^2)}E_x + \frac{ie^2\omega_{ce}B_{0y}}{m_e^2 c\omega_0(\omega_0^2 - \omega_{ce}^2)}E_y\right]. \tag{A11}$$

Similarly, we can obtain the components of whistler wave's velocity due to ions,

$$v_{i1x} = \frac{i\omega_0 e}{m_i\left(\omega_0^2 - \omega_{ci}^2\right)}E_x - \frac{e\omega_{ci}}{m_i\left(\omega_0^2 - \omega_{ci}^2\right)}E_y - \frac{e^2 B_{0y}}{m_i^2 c\left(\omega_0^2 - \omega_{ci}^2\right)}E_z. \tag{A12}$$

$$v_{i1y} = \frac{e\omega_{ci}}{m_i\left(\omega_0^2 - \omega_{ci}^2\right)}E_x + \frac{i\omega_0 e}{m_i\left(\omega_0^2 - \omega_{ci}^2\right)}E_y + \frac{ie^2\omega_{ci}B_{0y}}{m_i^2 c\omega_0\left(\omega_0^2 - \omega_{ci}^2\right)}E_z. \tag{A13}$$

and,

$$v_{i1z} = \frac{-eE_z}{im_i\omega_0} + \left[\frac{-e^2 B_{0y}}{m_i^2 c(\omega_0^2 - \omega_{ci}^2)}E_x + \frac{ie^2\omega_{ci}B_{0y}}{m_i^2 c\omega_0(\omega_0^2 - \omega_{ci}^2)}E_y\right]. \tag{A14}$$

Now, use these velocity components in driving the current density, by using relation, $\vec{J} = n_i e\vec{v}_i - n_e e\vec{v}_e$, and then substitute in Eq. (A1),

$x$-component of Eq. (A1),

$$\left(\frac{\partial^2}{\partial y^2}+\frac{\partial^2}{\partial z^2}-\frac{1}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)\lambda_i^2}\frac{\partial^2}{\partial t^2}+\frac{1}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)\lambda_e^2}\frac{\partial^2}{\partial t^2}-\frac{1}{c^2}\frac{\partial^2}{\partial t^2}\right)E_x$$
$$+\left(-\frac{\partial}{\partial x}\frac{\partial}{\partial y}-\frac{\omega_{ci}}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)\lambda_i^2}\frac{\partial}{\partial t}-\frac{\omega_{ce}}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)\lambda_e^2}\frac{\partial}{\partial t}\right)E_y$$
$$+\left(-\frac{\partial}{\partial x}\frac{\partial}{\partial z}-\frac{eB_{0y}}{m_ic\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)\lambda_i^2}\frac{\partial}{\partial t}-\frac{eB_{0y}}{m_ec\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)\lambda_e^2}\frac{\partial}{\partial t}\right)E_z=0. \tag{A15}$$

$y$-component Eq. (A1),

$$\left(-\frac{\partial}{\partial y}\frac{\partial}{\partial x}-\frac{\omega_{ci}}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)\lambda_i^2}\frac{\partial}{\partial t}+\frac{\omega_{ce}}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)\lambda_e^2}\frac{\partial}{\partial t}\right)E_x$$
$$+\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial z^2}+\frac{1}{\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)\lambda_i^2}\frac{\partial^2}{\partial t^2}+\frac{1}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial^2}{\partial t^2}-\frac{1}{c^2}\frac{\partial^2}{\partial t^2}\right)E_y$$
$$\times\left(-\frac{\partial}{\partial y}\frac{\partial}{\partial z}-\frac{e\omega_{ce}B_{oy}}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}+\frac{e\omega_{ci}B_{oy}}{\lambda_i^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)}\right)E_z=0. \tag{A16}$$

$z$-component Eq. (A1),

$$\left(-\frac{\partial}{\partial x}\frac{\partial}{\partial z}+\frac{eB_{0y}}{m_ec\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial}{\partial t}-\frac{eB_{0y}}{m_ic\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)}\frac{\partial}{\partial t}\right)E_x$$
$$+\left(-\frac{\partial}{\partial y}\frac{\partial}{\partial z}-\frac{e\omega_{ce}B_{0y}}{m_ec\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}+\frac{e\omega_{ci}B_{0y}}{m_ic\left(-\frac{\partial^2}{\partial t^2}-\omega_{ci}^2\right)}\right)E_y$$
$$\times\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}-\frac{1}{\lambda_e^2}-\frac{1}{c^2}\frac{\partial^2}{\partial t^2}\right)E_z=0. \tag{A17}$$

where $n_0$ denotes the background number density, $\omega_{ce}\left(=\frac{eB_0}{m_ec}\right)$ is the electron gyrofrequency of wave, $c$ denotes the velocity of light and $\lambda_e\left(=\sqrt{\frac{c^2m_e}{4\pi n_0e^2}}\right)$ is the collisionless electron skin depth. Now, Compounding Eqs. (A15), (A16), and (A17) and applying conditions $k\lambda_i\gg 1$, we get,

$$\left(\frac{\partial^2}{\partial y^2}+\frac{\partial^2}{\partial z^2}-\frac{1}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial^2}{\partial t^2}\right)\left[\begin{array}{l}\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial z^2}+\frac{1}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial^2}{\partial t^2}\right)\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}-\frac{1}{\lambda_e^2}\right)\times\\ \left(\frac{\partial}{\partial y}\frac{\partial}{\partial z}+\frac{e\omega_{ce}B_{0y}}{m_ec\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\right)^2\end{array}\right]$$
$$-\left(\frac{\partial}{\partial x}\frac{\partial}{\partial y}+\frac{\omega_{ce}}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial}{\partial t}\right)\left[\begin{array}{l}\left(\frac{\partial}{\partial y}\frac{\partial}{\partial z}+\frac{e\omega_{ce}B_{0y}}{m_ec\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\right)\left(\frac{\partial}{\partial x}\frac{\partial}{\partial z}+\frac{eB_{0y}}{m_ec\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\right)\times\\ \left(\frac{\partial}{\partial x}\frac{\partial}{\partial y}+\frac{\omega_{ce}}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial}{\partial t}\right)\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}-\frac{1}{\lambda_e^2}\right)\end{array}\right]$$

$$+\left(\frac{\partial}{\partial x}\frac{\partial}{\partial z}+\frac{eB_{0y}}{m_e c\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial}{\partial t}\right)\left[\begin{array}{l}\left(\frac{\partial}{\partial x}\frac{\partial}{\partial y}+\frac{\omega_{ce}}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial}{\partial t}\right)\left(\frac{\partial}{\partial y}\frac{\partial}{\partial z}+\frac{e\omega_{ce}B_{0y}}{m_e c\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\right)\times \\ \left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial z^2}+\frac{1}{\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial^2}{\partial t^2}\right)\left(\frac{\partial}{\partial x}\frac{\partial}{\partial z}+\frac{eB_{0y}}{m_e c\lambda_e^2\left(-\frac{\partial^2}{\partial t^2}-\omega_{ce}^2\right)}\frac{\partial}{\partial t}\right)\end{array}\right]E_z=0. \tag{A18}$$

After solving Eq. (A18), we obtain the dynamics of 3D whistler wave in the presence of magnetic island in terms of electric field under the condition $-\frac{\partial^2}{\partial t^2} > \omega_{ce}\omega_{ci}$. Then, by using Faraday's law $\left(\nabla\times\vec{E}=-\frac{1}{c}\frac{\partial B}{\partial t}\right)$, and the relation of magnetic field and vector potential $\left(\vec{B}_\perp=\hat{z}\times\nabla\tilde{A}_z\right)$, we can write the dynamical equation of 3D whistler in terms of vector potential.

$$\begin{aligned}&\frac{\partial^2 A_z}{\partial t^2}+\frac{\partial^6 A_z}{\partial t^2\partial x^2}\lambda_e^4+\frac{\partial^6 A_z}{\partial t^2\partial y^2}\lambda_e^4+\frac{\partial^6 A_z}{\partial t^2\partial z^2}\lambda_e^4+2\lambda_e^4\frac{\partial^4 A_z}{\partial t^2\partial z^2}\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}\right)-2\lambda_e^2\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}+\frac{\partial^2}{\partial z^2}\right)\frac{\partial^2 A_z}{\partial t^2}\\&+\lambda_i^2 v_A^2\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial z^2}+\lambda_i^2 v_A^2\frac{\partial^4 A_z}{\partial z^4}+\frac{\lambda_i^2 B_{0y}^2}{B_{0z}^2}\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial y^2}+\frac{\lambda_i^2 v_A^2 B_{0y}^2}{B_{0z}^2}\frac{\partial^4 A_z}{\partial y^2\partial z^2}\\&+\frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}\left(\frac{\partial^2}{\partial x^2}+\frac{\partial^2}{\partial y^2}\right)\frac{\partial^2 A_z}{\partial y\partial z}+\frac{2\lambda_i^2 v_A^2 B_{0y}}{B_{0z}}\frac{\partial^4 A_z}{\partial y\partial z^3}=0.\end{aligned} \tag{A19}$$

Also, we can write above equation in following form which is the dispersion relation in the presence of magnetic islands,

$$\left(\omega_0^2(1+k^2\lambda_e^2)^2-\frac{k^2\lambda_i^2(k_z B_{0z}+k_y B_{0y})^2}{4\pi n_0 m_i}\right)E_z=0. \tag{A20}$$

here, $B_0(=B_{0z}\hat{z}+B_{0y}\hat{y})$, denotes the background magnetic field along z direction and also $B_{0y}$ denotes the magnetic field owing to the presence of magnetic islands (at the reconnection sites), and in the absence of magnetic islands, one can get the usual dispersion relation of whistler wave given below

$$\left[\omega_0^2(1+k^2\lambda_e^2)^2-k^2k_z^2\lambda_i^2v_A^2\right]E_z=0. \tag{A21}$$

Moreover, it is emphasized that the equation of motion is then used to examine beam-driven evolution.

$$\begin{aligned}m\frac{dv}{dt}=-eE-mv\gamma\ &\rightarrow\ \frac{dv}{dt}=-\frac{eE}{m}-v\gamma\\(-i\omega+\gamma)=-\frac{eE}{mv}\ &\rightarrow\ \frac{d}{dt}=\left(\frac{d}{dt}+\gamma\right)\end{aligned}$$

$\frac{d^2}{dt^2}=\left(\frac{d^2}{dt^2}+2\gamma\frac{d}{dt}\right)$, neglecting higher order terms.

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ORIGINAL RESEARCH

# Nozzle effects on spray combustion and emissions in compression ignition engines using waste cooking oil biodiesel: A computational fluid dynamics analysis at varying injection pressures

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**Abstract**

This study investigates the spray combustion characteristics of waste cooking oil (WCO) in comparison between a swirl nozzle (SN) and a conventional nozzle (CN) of equal cross-section. n-Heptane, methyl decanoate, and methyl-9-decenoate were used as WCO substitutes in the simulation. The research primarily focuses on multiphase flow using the Lagrangian-drop Eulerian-fluid (LDEF) method, employing an equilibrium phase spray model (EP) for droplet behaviour analysis. The model's efficacy was validated through comparisons with experimental works by other engine researchers. At varying injection pressures, the study found that SN slightly reduced evaporative spray tip penetration but increased the cone angle compared to CN. This suggests early fuel jet disintegration and improved air entrainment due to SN. SN also showed a higher heat release rate and temperature, with soot reduction between 3.20 to 6.72% as injection pressure increased from 100 to 300 MPa. This indicates that SN achieves better air-fuel mixture than CN. Further, the study discovered that the influence of SN becomes more significant as the rheological properties of WCO lessen under ultra-high injection pressures.

## 1 | INTRODUCTION

Current emission scandals have dealt a severe blow to the reputation of internal combustion engines (ICE), which threatens their ability to advance significantly and their contribution to reducing emissions in the transportation sector. In response, policymakers on emissions have proposed replacing internal combustion engines (ICEs) with electric vehicles (EVs) with the aim of drastically reducing emissions and over-dependency on fossil fuels. The obstacle is still faced by suggested alternatives

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such as electric vehicles powered by batteries that are expensive, heavy, and have additional limitations. In addition, these are powered by renewable fuels such as solar and wind, which currently account for a very small portion of the global energy supply [1]. Consequently, future mobility will depend on a combination of solutions, such as hybrid and electric vehicles (HEV and BEV), and fuel cell electric vehicles involving conventional vehicles, and the demand for the aforementioned vehicles will be determined by factors such as cost, city, and country. Subsequently, combustion engines will play an important role in transportation, power generation, and electrified power trains. Due to this, there is still a need for advancements in IC engine technology to improve thermal efficiency and reduce emissions, and the above-said goals can only be attained by enhancing combustion [2, 3]. Diesel engines play a significant role in transportation due to their high efficiency. Though, lowering the emissions and improving combustion efficiency has become an ongoing quest in the sphere of CI engine. Throughout the years, a variety of adverse and intricate techniques have been developed to address the problems associated with conventional diesel combustion. In order to ensure lower emissions, organizations like US EPA and EU have proposed an emissions standard for diesel engine manufacturers [4], and it is anticipated that these standards will become more stringent over time. Presently, the injection pressure range for heavy-duty diesel engines is between 200 and 250 MPa. Researchers discovered that by increasing diesel engine injection pressure to 300 MPa, harmful emissions could be reduced [5]. Hence utilizing biofuels at high injection pressures could be an effective way to reduce emissions in diesel engines in accordance with emissions legislation [6, 7]. Subsequently, Biodiesel can be utilized in diesel engines without the need for any alterations as an alternative fuel. Moreover, it has low toxic emissions, except for NOx in diesel engines [8] However, biodiesel production poses the greatest concern due to its feedstock. The solution to the said problem is the use of waste cooking oil (WCO) from restaurants and food industries. Additionally, the use of recycled waste cooking oil does not create competition with the food supply. Consequently, it can be utilized as feedstock for the production of waste cooking oil biodiesel by esterification processes. Oxygen availability in waste cooking oil shows fewer emissions except for NOx in combustion ignition engine [9]. In addition, experimental evidence suggests that particulate emissions can be reduced by utilizing ultra-high injection pressure in the diesel engine. This is attributed to improvement in spray characteristics and better atomization of fuel [4]. Despite the numerous benefits of ultra-high injection pressure, there are a few disadvantages such as wall-impingement, which forms a fuel film and leads to the formation of soot, HC, and carbon deposits in the chamber, thereby reducing the diesel engine's efficiency [10, 11]. Droplet velocity, sauter mean diameter and cone angle are the primary parameters accountable for the aforementioned issue. Consequently, balancing these parameters would increase combustion efficiency and decrease emissions [12]. Similarly, nozzles with minor modifications at the exit also enhanced spray characteristics, particularly cone angle and sauter mean diameter. Table 1 provides a summary of the available literature on spray and combustion characteristics based on injector geometry. Pressure swirl atomizer is widely implemented in fields such as industrial furnaces, aircraft air combustors, and DISI engine where liquid jet fragmentation is a crucial step in the combustion phenomenon. The excellence of the fuel jet atomization process makes an important role in flame stability, emissions, and overall performance since it controls air-fuel mixing and droplet size [13, 14]. It consists of a spray device that generates rotational motion in addition to the axial motion of the spray jet, causing heavier droplets to transform into fine droplets. A study [15] was done to analyze the effect of injection pressure on spray characteristics near the nozzle exit and concluded that the spray cone angle near the nozzle was mostly dependent on ambient pressure which was directly linked with fuel-air mixing. However, very little effect was seen on the cone angle at low ambient pressure. Researchers reported that an increase in injection pressure results in a better cone angle eventually causing improved spray characteristics. Nevertheless, this trend persisted with subsequent increments in injection pressure. In addition, the axial velocity was increased by using a swirl with sloped groves. At a high ambient temperature, the sauter mean diameter (SMD) at the outer periphery was more than the spray axis, while the spray axis contained higher vapor concentration than the spray periphery. Furthermore, they concluded that spray quality using a swirl atomizer can be enhanced significantly by an increase in injection pressure, temperature, and weber number. The increase in these parameters decreases SMD, which facilitates the mixing of air and fuel [16–18]. Compressibility in nozzle flow at high injection pressure will also play a significant role in spray characteristics. Salvador et al. [19] investigated the compressibility effect on nozzle flow up to 250 MPa and discovered that due to higher viscosity dissipation in the nozzle, the rheological properties of fuel decreased, which resulted in an improvement in the spray pattern. Experimentally analyzing the intricate structure of a spray produced by a swirl is very tedious. Therefore, powerful numerical methods were utilized to resolve the equation of motion, determining the spray and atomization characteristics produced from the effect of ambient pressure and injection pressure in the constant volume cylinder. Particularly, the execution of turbulent flow and simulation of droplet dynamics, as well as complex flow behaviour such as primary and secondary atomization, splashing, and collision of droplets in a two-phase flow field. Therefore, this is required to demonstrate the complete physical phenomenon. Shim et al. [20] investigated vaporization, wall impingement, and atomization using a hybrid break-up model. They observed that the swirl generated a radially expanding vortex. The SMD exhibited an increase as the ambient pressure rose and a decrease as the ambient temperature increased. The same phenomenon occurred for the distribution of the vapour phase. Elbadawy et al. [21] used the discrete phase model and K- $\varepsilon$ turbulence model to predict the flow of ambient gas/fuel vapour mixture and discovered that the rate of atomization, air-fuel mixing, and evaporation increased with increased turbulence in a constant volume. In addition, Asheim et al. [22] simulated drop-drop collisions using the spray model and determined that collisions between smaller droplets are insignificant, whereas collisions

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**TABLE 1** Impact of different nozzle geometries on spray, combustion, and emissions.

| Nozzle geometry | Conditions | STP | SCA | SMD | HRR | Temp | Soot | References |
|---|---|---|---|---|---|---|---|---|
| Elliptical | Pinj: (50–90 MPa), Pback: 1 MPa, Fuel: Diesel | 3.13%↑ | 51.51% ↓ | – | – | – | – | [25] |
| Conical compared with cylindrical | Pinj: 90 MPa, Amb. Density: 22.8 kg/m$^3$, Fuel: n-dodecane | (3.41–3.66%) ↓ | (15.90–21%) ↑along major axis | ↓ | – | – | – | [26] |
| Rectangular orifice | Pinj:(40–100 MPa), Pback: 1 MPa, Fuel: Diesel | (1.23–2.04) ↓ | (6.86–8.94) ↑ | – | – | – | – | [27] |
| Traingle (Equilateral) | Pinj: (120–160 MPa), Pback: 1 MPa, Fuel: Biodiesel | (10.36–17.64%) ↑ | (21.11–30.28%) ↑along major axis | ↓ | – | – | – | [28] |
| Round inlet | Pinj: 50 MPa, Pback: 0.1 MPa, Fuel: Diesel | – | – | ↓ | – | – | – | [29] |
| Square shaped orifice | Pinj: (40–100 MPa), $P_{back}$: 1 MPa, Fuel: Diesel | (1.04–2.14) ↓ | (5.89–8.34) ↑ | – | – | – | – | [27] |
| Counter bore | Pinj: (50–200 MPa), $\rho_a$ (21.5 kg/m$^3$), Fuel: Diesel | 3.23%↑ | (1.02–1.34%) ↑ | ↓ | – | – | ↓ | [30] |

between larger droplets are significant and the spray model is more accurate concerning collisions between larger droplets. Belhadef et al. [23] developed a Eulerian model to model the spray with liquid sheet atomization. They discovered that the spray axis exhibited a recirculation zone with smaller droplets and a conical spray produced from larger droplets. Abianeh et al. [24] employed a discrete multi-component model in which six diesel fuel surrogate components were modelled and compared to diesel in terms of evaporative spray characteristics. The model demonstrated excellent predictive ability and enhanced simulation capabilities. In present study, combustion consists of chemical processes in which intermediate species are produced. Both intermediate species, such as the hydroxyl radical (OH*) and formaldehyde ($CH_2O$), are precursors of high and low-release processes, respectively. Table 1 shows the effect of various nozzle geometry on spray, combustion, and emission.

The present literature indicates that, while ultra-high injection pressure enhances spray tip penetration and cone angle becomes narrow leading delay in primary breakup of spray jet. It causes wall impingement in CI engine, which results in carbon deposits, C formation and increase in brake-specific fuel consumption. However, few, if any, studies have been conducted on the efficiency of swirl nozzles in diesel engines, revealing a significant research gap.

The use of swirl nozzles in diesel engines operating at ultra-high injection pressures is novel in this work, which addresses a problem that has gotten little attention in earlier research. Another innovative feature is the creation of a sophisticated atomization model that captures the aerodynamic properties of droplets and entire cone spray.

The demand for studies targeted at improving the performance and environmental efficiency of diesel engines is pressing. This study intends to address this demand by investigating the use of swirl nozzles at ultra-high injection pressures as well as the use of a more sustainable fuel source—waste cooking oil biodiesel. This study includes a grid independence test as well as robustness validation against experimental and theoretical data. Under various situations, an in-depth investigation of macro and micro spray features, ignition delay, flame lift-off duration, heat release rate, and soot creation is also covered. The findings of prior research conducted under comparable settings are then summarized and compared to those of the current investigation. These in-depth insights could make significant contributions to future advances in diesel engine technology.

## 2 | COMPUTATIONAL MODEL SET-UP

The study exhibits spray and flame interaction which was executed by the equilibrium phase (EP) spray model using computational fluid dynamics (CFD) and was described by Yue and Reitz [31]. This tool has the potential to include macro and micro spray characteristics, primary and secondary breakup, droplet collision and coalescence, and turbulence model with a chemical kinetic solver. The variant of Reynolds Navier strokes (RANS) known as Favre averaged Navier strokes has been used for gas phase flow through (RNG) K-$\varepsilon$ turbulence model. The influence of source terms having dispersed is modeled using the RNG k- $\varepsilon$ turbulence model. Further, a concise explanation of the RANS model is given in this study. Again, the details can be found in [32].

### 2.1 | Continuous phase

#### 2.1.1 | Continuity and momentum equation

The mass and momentum transport equation for mass m is given by

$$\frac{\partial \rho_m}{\partial t} + \nabla.\left(\rho_m \vec{u}\right) = \nabla.\left(\rho D \nabla\left(\frac{\rho_m}{\rho}\right)\right) + \dot{\rho}_m^c + \dot{\rho}_m^s \delta_{m1} \quad (1)$$

$$\frac{\partial(\rho\vec{u})}{\partial t} + \nabla.\left(\rho\vec{u}\vec{u}\right) + \nabla P = \mu\nabla.\left(\nabla\vec{u} + \left(\nabla\vec{u}\right)^T - \frac{2}{3}\nabla.\vec{u}I\right) - \nabla\left(\frac{2}{3}\rho k\right) + F^s, \quad (2)$$

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where $\vec{u}$ shows the velocity vector of the mean flow, $\rho$, and $\rho_m$ are total mass density and species mass density, respectively, $D$ diffusion constant and $\dot{\rho}_m^c, \dot{\rho}_m^s$ are source term cause of the chemical reaction and spray, respectively, $\delta_{m1}$ is the spray source term of non-fuel matter.

Now, $P$, $T$, $I$, $k$, and $\mu$ represent fluid pressure, transpose, identity tensor, turbulent kinetic energy, and dynamic viscosity, respectively, for momentum exchange in ambient flow and liquid spray.

### 2.1.2 | Energy equation

$$\frac{\partial(\rho I)}{\partial t} + \nabla.(\rho\vec{u}I) = -P\nabla.\vec{u} + \lambda\nabla^2 T + \rho D\sum_m \left(h_m \nabla^2\left(\frac{\rho_m}{\rho}\right)\right) + \rho\varepsilon + \dot{Q}^c + \dot{Q}^s, \quad (3)$$

where, $\underline{\underline{I}}$ is specific internal energy, $h_m$ is specific enthalpy, $\lambda$ is thermal conductivity, $\varepsilon$ is turbulent energy dissipation rate, $\dot{Q}^c, \dot{Q}^s \rightarrow$ source term cause by heat release and spray interaction. Since there is turbulent flow, Reynolds stresses are considered viscous tensor for Newtonian fluid with changed viscosity, $\mu$.

$$\mu = \mu_0 + \mu_t, \quad (4)$$

where $\mu_t = C_\mu k^2/\varepsilon$ represents turbulent viscosity, $\mu_0$ laminar viscosity, and $C_\mu$ model constant, Enthalpy and turbulent fluxes have been modelled trough considering Fick's law is given below

$$D = \frac{\mu}{\rho.Sc}. \quad (5)$$

Here, liquid fuel injected through the nozzle is considered a parcel, and the effective diameter is taken the same as the nozzle diameter. Where, every parcel shows a group of a number of similar drops with the same momentum, temperature, and size. The Eulerian-Lagrangian fluid interaction takes place through source terms $\dot{\rho}_m^s, F^s, \dot{Q}^s$ which are represented in mass, momentum, and energy equation.

Further, turbulence modelling in diesel engine condition was done by generalized renormalization group k- $\varepsilon$ model [33]. Yue and Reitz [34] compared the two-equation model [35], modified RNG model [36], and original RNG model for flow compressibility and coefficients which are a function of flow rate, and suggested that the gRNG model exhibited more accuracy in complex flow through the nozzle. Thus, transport equations are expressed in Equations (6), and (7).

$$\rho\frac{Dk}{Dt} = P_k - \rho\varepsilon + \dot{W}^s + \nabla.\left[\alpha_k\rho\nu\nabla k\right], \quad (6)$$

$$\rho\frac{D\varepsilon}{Dt} = \frac{\varepsilon}{k}C_1 P_k + C_1'\rho\nu\frac{\varepsilon}{K}\left(\nabla.\vec{u}\right)^2 - C_{2n}\rho\frac{\varepsilon^2}{k} - \rho R + C_3\rho\varepsilon\left(\nabla.\vec{u}\right) + C_s\frac{\varepsilon}{k}\dot{W}^s + \nabla.[\alpha_\varepsilon\rho\nu\nabla\varepsilon], \quad (7)$$

where $\upsilon$ shows kinematic viscosity and $\dot{W}^s$ represents the source term caused by interaction with spray.

## 2.2 | Discrete phase

The mass conservation, momentum conservation, and energy conservation are fully coupled with the Eulerian and Lagrangian flow of fluids. As the liquid droplets enter gaseous conditions a relative velocity exists and that causes an aerodynamics drag force Fs applied to parcels. Thus, a momentum transfer is seen; here Fs is modelled as:

$$F^s = \frac{3}{8}\frac{\rho}{\rho_f}\frac{|\vec{u}+\vec{v}'-\vec{v}|}{r_d}\left(\vec{u}+\vec{v}'-\vec{v}\right)C_D C_{distortion}, \quad (8)$$

where $\vec{v}$ and $\vec{v}'$ are the droplet velocity vector and dispersion velocity of drop, and $r_d$ the radius of the droplet. An enhanced distortion coefficient $C_{distortion}$ was introduced for droplet distortion; further, Liu et al. [37] modelled the drag coefficient for undistorted droplets as:

$$C_D = \begin{cases} \frac{24}{R_e}\left(1 + 1.45R_e^{2/3}\right), R_e < 1000 \\ 0.424, R_e \geq 1000 \end{cases}, R_e = \frac{2\rho|\vec{u}+\vec{v}'-\vec{v}|}{\mu_t}. \quad (9)$$

### 2.2.1 | Break-up and atomization

The fuel jet from the pressure swirl atomizer is forced to circulate axially. This facilitates the development of thinner conical liquid films. After exiting the nozzle, the tangentially moving jet transformed into a rotating jet. Due to the aforementioned occurrence, the liquid sheet experiences an aerodynamic disturbance, which causes the sheet to break into ligaments. Several factors, including drag force, turbulence generation in a liquid state, and cavitation bubble release, contribute to the disintegration of ligaments. However, the cause of the break-up mechanism may be also due to the density of air and liquid. The breakup mechanism is primarily determined by the relative velocities of gas and liquid, viscosity, and surface tension. Therefore, the linear instability sheet atomization model is used to model the aforementioned mechanism. In addition, the radial and axial rotation of the sheet produces an air core that is encased in a liquid film. The film thickness ($h_t$) is determined using the equation: (10).

$$h_t = 0.5\left(D_{inj} - \sqrt{D_{inj} - \frac{4\dot{m}_{eff}}{\pi\rho_l V_{axis}}}\right), \quad (10)$$

$$U = K_v\frac{\sqrt{2\Delta p}}{\sqrt{\rho_l}}, \quad (11)$$

$$u_{axis} = U\cos\theta, \quad (12)$$

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where $\theta, m_{eff}, \rho_l, V_{axis}, D_{inj}$ shows half angle, mass flow rate, liquid density, axial velocity, and injector diameter, respectively. The axial velocity through the injector and total velocity is calculated through Equations (12) and (11). $K_v$ coefficient of discharge of nozzle, $l_b$ breakup length is shown in Equations (13)–(15).

$$K_v = \max\left[\frac{7}{10}, \frac{4\dot{m}_{eff}}{\pi d_{inj}^2 \rho_l \cos\theta}\sqrt{\frac{\rho_l}{2\Delta p}}\right], \tag{13}$$

$$\eta_b = \eta_0 e^{i\lambda x + \omega x}, \tag{14}$$

$$l_b = \frac{U}{\Omega}\ln\left(\frac{\eta_b}{\eta_0}\right). \tag{15}$$

$\eta_o, \eta_b$ are wave amplitude and surface development as in Equation (14). And $\lambda, \omega$ are wave number and growth rate, respectively. Now the mass balance concept defines the ligament diameter at the breakup point is shown in Equation (18).

$$D_0 = 1.88 d_l (1 + 3Oh)^{1/6}, \tag{16}$$

$$h_b = \frac{\left(d_{inj} - h_0\right) h_0}{\left(d_{inj} - h_0 + 2L_b \sin\left(\frac{\theta}{2}\right)\right)}, \tag{17}$$

$$d_l = \sqrt{\frac{f h_b}{\lambda_b}}. \tag{18}$$

$h_b$ shows the sheet thickness as a function of diameter that affects breakup length and $\lambda_b$ the wave number. Here, $(d_{inj} - h_0)$ is the evaporated film thickness as shown in Equation (17). Weber's approach of capillary instability [38] has been considered for the ligament to droplet breakup, which is Weber number $We$, $Oh$ Ohnesorge number (19), (20)

$$We = \frac{\rho u_{rel}^2 d_p}{\sigma}, \tag{19}$$

$$Oh = \frac{\mu_p}{\sqrt{\rho_p \sigma d_p}} = \sqrt{We}/Re, \tag{20}$$

where surface tension and droplet diameter are indicated as $d_p$, $\sigma$, respectively. Further, the secondary breakup of the cone-shaped sheet was modelled through the Taylor analogy breakup model. This model describes the natural vibration system in oscillation with the distorted droplet. It focuses especially on the excretion of the aerodynamic force on the droplet system. The damping force on the mass is derived from the liquid viscosity force while the surface tension force is through spring force [39].

$$\frac{f}{m} = c_f \frac{\rho u_{rel}^2}{\rho_l r}, \tag{21}$$

$$f - kx - d\frac{dx}{dt} = m\frac{d^2x}{dt^2}. \tag{22}$$

X shows the movement of the droplet. To get the equation of the coefficient, Taylor's approach is used in Equations (21), (22), and (23).

$$\frac{d}{m} = c_d \frac{\mu_l}{\rho_l r^2}, \tag{23}$$

$$\frac{k}{m} = c_k \frac{\sigma}{\rho_l r^3}, \tag{24}$$

where $\mu_l$, $t$ and $r$ are liquid viscosity, time, and drop radius, respectively.

$$\frac{r_1}{r_2} = \frac{7}{3} + \frac{\rho_l r_l^3}{8\sigma}\left(\frac{dy}{dt}\right)^2, \tag{25}$$

$$\frac{d^2y}{dt^2} + 5\frac{\mu_l}{\rho_l r^2}\frac{dy}{dt} + \frac{8\sigma}{\rho_l r^3}y - \frac{2}{3}\frac{\rho u_{rel}^2}{\rho_l r} = 0. \tag{26}$$

The droplet breakup is assumed to be, y > 1 [39], where $r_1$ and $r_2$ are the bigger and smaller diameter of the droplet which is shown in relation (25)

### 2.2.2 | Droplet evaporation

The evaporation in the air-fuel droplet is induced through heat and mass transfer. Where, Reynolds number ($R_e$) exerts an influence on both heat and mass transfer, which shows the dominance of inertia force over viscous force. $h_c$, $R_e$ and convective mass transfer are calculated through Equations (27) and (28) [40]. The equations indicated that lowering the Reynolds no affects Nusselt no and Sherwood no.

$$Sh = \frac{h_{cm} d}{D} = 2 + 0.6 R_e^{1/2} Sc^{1/3}, \tag{27}$$

$$Nu = \frac{h_c d}{k_\infty} = 2 + 0.6 R_e^{1/2} P_r^{1/3}. \tag{28}$$

## 2.3 | Cavitation modelling

The influence of cavitation on high injection flow through the nozzle, homogeneous equilibrium model [HEM] has been implemented which showed better agreement with experimental results in terms of mass and momentum flux measurement as well as injection velocity as per previous studies [41].

$$\left(\frac{\partial \rho\left(t, p\left(\vec{x}, t\right)\right)}{\partial p}\right)_t = \psi, \tag{29}$$

$$\psi = \frac{1}{c^2}. \tag{30}$$

The vapour amount in the fluid is evaluated through void fraction $\xi$ as shown in Equation (29), which may be 0 or 1 for

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**TABLE 2** WCO surrogates' breakdown with devising from main components of biodiesel.

| Main components of biodiesel | | Major mass fraction component of biodiesel | Estimated resulting mixtures based on the surrogates | Mass fraction of Tri-surrogate | | |
|---|---|---|---|---|---|---|
| Name | Formula | | | $nC_7H_{16}$ (n-heptane | $C_{11}H_{22}O_2$ (methyl decanoate) | $C_{11}H_{20}O_2$ (methyl-9-decenoate) |
| Methyl palmitate | $C_{17}H_{34}O_2$ | 0.085 | $0.8C_7H_{16} + C_{11}H_{22}O_2$ | 0.8* 0.085/1.8 | 1 *0.085/1.8 | |
| Methyl stearate | $C_{19}H_{38}O_2$ | 0.029 | $1.2C_7H_{16} + C_{11}H_{22}O_2$ | 1.2 *0.029/2.2 | 1 *0.029/2.2 | |
| Methyl oleate | $C_{19}H_{36}O_2$ | 0.428 | $1.1C_7H_{16} + C_{11}H_{20}O_2$ | 1.1 *0.428/2.1 | | 1 *0.428/2. |
| Methyl linoleate | $C_{19}H_{34}O_2$ | 0.355 | $1.05C_7H_{16} + C_{11}H_{20}O_2$ | 1.05 *0.355/2.05 | | 1* 0.355/2.05 |
| Methyl linolenate | $C_{19}H_{32}O_2$ | 0.103 | $C_7H_{16} + C_{11}H_{20}O_2$ | 1*0.103/ 12 | | 1*0.103/2 |

Each surrogate component mass fraction from the relation = Mole of surrogate in resulting mixture*mass fraction of major biodiesel component/Total mole of resulting surrogate mixture.

non-cavitation and fully cavitation flow, respectively.

$$\xi = \max\left(\min\left(\frac{\rho - \rho_{l,sat}}{\rho_{v,sat} - \rho_{l,sat}}, 1\right), 0\right), \tag{31}$$

$$\psi = \xi\psi_v + (1 - \xi)\psi_l, \tag{32}$$

where $\psi_v$ and $\psi_l$ are vapour and liquid compressibility, respectively, and are calculated using a linear model that is more accurate and stabilized with respect to convergence [42]. the study assumes that the speed of sound is constant, and if it is considered to be liquid and vapour then Equations (31) and (32) can be derived from Equation (30):

$$\rho_v = \psi_v p, \tag{33}$$

$$\rho_l = \dot{\rho}_l + \psi_l p. \tag{34}$$

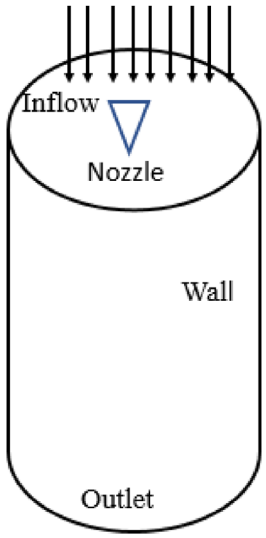


**FIGURE 1** Constant volume cylindrical geometry.

## 2.4 | Chemical kinetics modelling

The study consists of computational analysis which is followed on evaporating spray of WCO applying CONVERGE solver. The ambient temperature at which the evaporating spray is propagated. The corresponding point is considered as ignition which was considered in CHEMKIN simulation. CHEMKIN-formatted input files were used to model simulations on the combustion aspect, using a chemical kinetic solver with SAGE specification. Gas phase calculations have been coupled with the SAGE solver for chemical kinetics. To accelerate the numerical solution, the chemical kinetics-inclusive SAGE model is resolved through the application of a multi-zone approach, such as the thermodynamic state of group cells with similar thermodynamic properties. The description of 5 FAME components available in WCO biodiesel was evaluated through GC-MS data as presented in Table 2. The surrogates of WCO composition were five major biodiesel components such as methyl linolenate ($C_{19}H_{32}O_2$), methyl linoleate ($C_{19}H_{34}O_2$), methyl oleate ($C_{19}H_{36}O_2$), methyl stearate ($C_{19}H_{38}O_2$) and methyl palmitate ($C_{17}H_{34}O_2$). Methyl decanoate ($C_{11}H_{22}O_2$), and methyl-9-decenoate ($C_{11}H_{20}O_2$) with a single and double bond in hydrocarbon chain, respectively, and n-heptane for surrogates of WCO. The major components of biodiesel are formulated according to the proportion of surrogate mixing and the number of molecules. Either saturated or unsaturated type hydrocarbon chain has been considered to get formulation.

Zhaoyu et al. [43] did a reduction to 115 species and 460 reactions of detailed mechanism that was given by the study [42]. In order to capture flame structure and ignition, OH* (hydroxyl radical) was added to the biodiesel mechanism. The formation of soot, carbonaceous aggregates of HC fuel molecules, is a complex process.

Soot particle is the transition between the gaseous and solid phases, where the solid phase lacks physical and chemical structures. Subsequently, transition manifests itself through distinct physical and chemical processes [44]. Soot simulation in computational volume was determined from oxidation rates and formation of $C_2H_2$ species by a multiphase phenomenological soot model [45, 46] in order to produce more practical results with less computational time. A cylindrical geometry of diameter 0.75 m and length 1 m was used for combustion simulation as shown in Figure 1.

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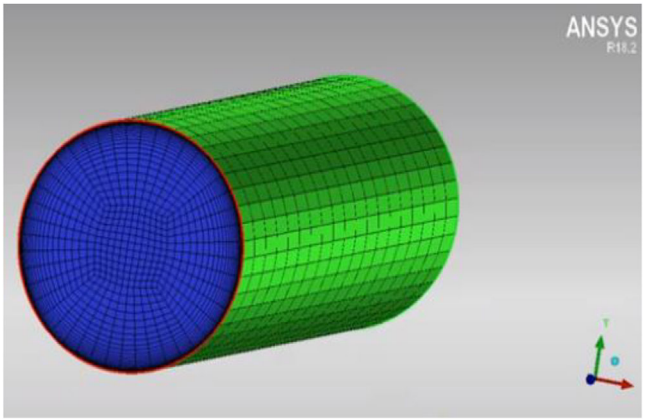


**FIGURE 2** Meshing of geometrical volume.

**TABLE 3** Simulation parameters.

| **Kinetic modelling** | **SAGE chemical kinetic solver** |
|---|---|
| Droplet evaporation | Sherwood number, Schmidt number |
| Break-up model | Lagrangian-drop Eulerian-fluid (LDEF) |
| **Mechanism** | |
| Fuel | Surrogates |
| Soot formation model | Multiphase phenomenological soot model |
| Waste cooked oil biodiesel | $C_{11}H_{20}O_2$ (42.9%), $C_{11}H_{22}O_2$ (6.04%) and $nC_7H_{16}$(51.1%) |
| Time step | $1*10^{-11}$ to $1*10^{-6}$ |
| **Ambient condition** | |
| Pressure (MPa) | 4.0 |
| Density (kg/m$^3$) | 15 |
| Temperature (K) | 800 |
| **Injection conditions** | |
| Nozzle diameter (mm) | |
| Conventional nozzle (CN) | 0.18 mm |
| Swirl nozzle (SN) | 0.18 mm, No of slots: 3 ($120^0$ apart), Inclination angle for each groove: $45^0$ |
| Fuel injection pressure (MPa) | 300, 200, 100 |
| Injection duration | 1.5 ms ASOI |

A finer grid was employed at the nozzle boundary while non-important domains were left less fine as shown in Figure 2. Here, Table 3 presents the simulation input parameters, including the nozzle diameter (Figures 3 and 4) and ambient condition. The mesh (base mesh cells and adaptive mesh refinement) that are created at the processing time internally has been shown in Figure 5. Initially, a 2 mm base size was taken. Then, mesh refinement at different adaptive level has been provided for the flow field so that optimized mesh size could be attained. This is worthwhile to get a refined grid at the region of critical flow in the domain while maintaining other areas relatively

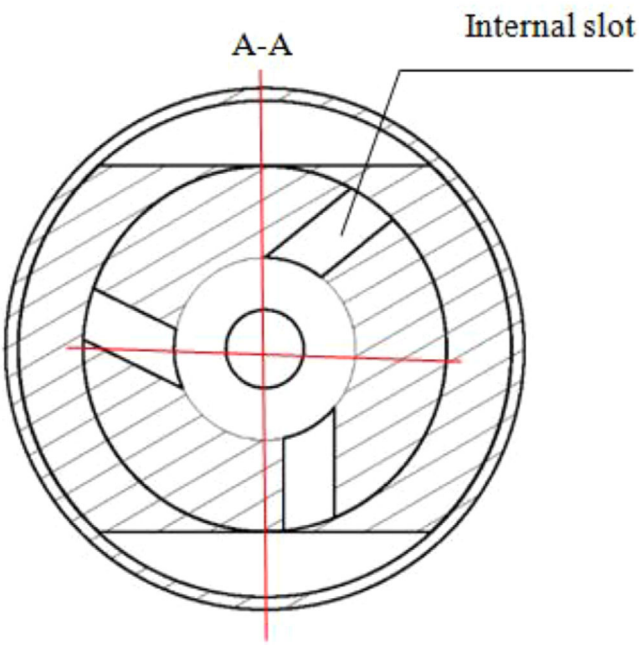


**FIGURE 3** Cross-section of swirl nozzle.

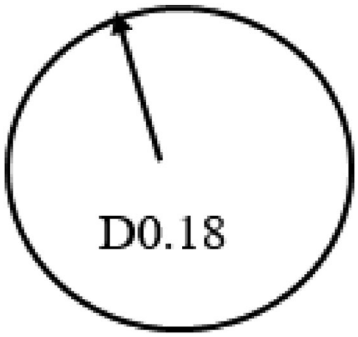


**FIGURE 4** Cross-section of the conventional nozzle.

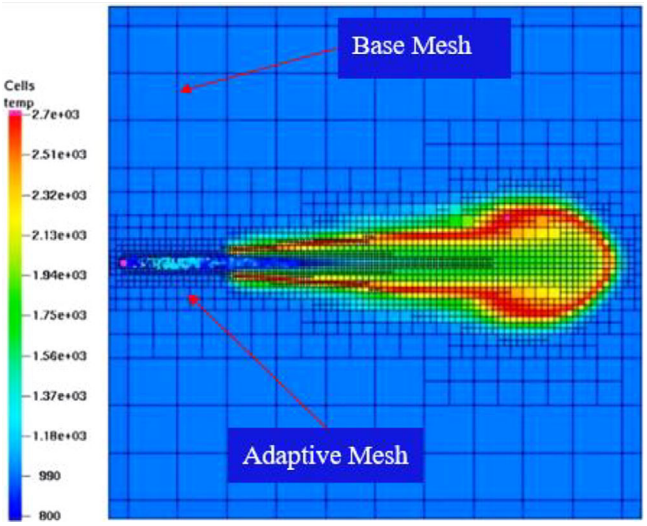


**FIGURE 5** Grid generation at an internal time processing.

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**TABLE 4** Tested fuel properties used in the experiment.

| Fuel/Properties | Waste cooking oil | Diesel |
|---|---|---|
| Density (g/L) | 0.876 (at 40°c) | 0.818 |
| Viscosity ($mm^2/s$) | 4.65 (at 40°c) | 2.95 |
| Surface tension (mN/m) | 34.7 | 27.88 |
| Distillation temperature (0c) | 362 | 287.78 |
| Heating value (MJ/kg) | 39.09 | 44.80 |
| Cetane number | 52 | 54.5 |
| Oxygen content (wt. %) | 10.4 | 1.19 |
| Hydrogen content (wt. %) | 12.3 | 12.73 |
| Carbon content (wt. %) | 78.2 | 86.83 |

coarse. To solve the complex spray characteristics using adaptive grid refinement around the nozzle, an additional resolution around the injector having fixed grid embedding was utilized. The study [47] exhibited a relationship for reduced cell size dx, which defines the adaptive refinement from the base grid size as shown in Equation 35.

$$dx = dx_{base} * 2^{-(\text{embedscale})}. \tag{35}$$

In order to capture the action that occurred at the conclusion of injection, the simulation period was increased to 2.2 ms. Experimental results were utilized to validate the simulation's results. Parametric details of simulation activities are shown in Table 3. Additionally, Table 4 displays the properties of the fuel.

## 2.5 | Grid convergence study

The grid convergence study for evaporative spray characteristics with a conventional nozzle was conducted to determine the smallest cell size. To obtain this, the chemistry solver was disabled. Equation (35) was used to calculate mesh resolutions. In addition, to select the cell size for improved convergence, a comparison was made between the experimental and predicted spray lengths of waste cooking oil at ambient pressure, injection pressure, and ambient temperature of 2.4 MPa, 100 MPa, and 600K, respectively, using the experimental setup depicted in Figure 6. Experiments revealed that the spray length increased until a quasi-steady state was reached. At each mesh size, the occurrence of the predicted spray length was nearly identical. Moreover, it is evident that spray tip penetration at cell sizes of 0.5 and 1 mm is overestimated when the injection timing is 0.74 ms, compared to the minimum cell sizes of 0.125 and 0.25 mm. A negligible difference was observed between the minimum cell sizes of 0.25 mm and 0.125 mm following the initiation of timing at 0.70 ms for predicted tip penetration convergence as shown in Figure 7. By considering the primary and secondary atomization periods at the end of injection, spray tip penetration at a mesh resolution of 0.25 mm was more accurate. Taking into account these trials, It was determined that a minimum cell size of 0.25 mm, along with three embedded scales, was considered appropriate for the activity and capable of resolving the flow field, particularly at the injector. Further, to identify the robustness of the model, a comparative study [48] with the predicted liquid length was conducted to select the minimum cell size using a swirl nozzle. It was determined that a minimum cell size of 0.25 mm with an embedded scale of 3 was suitable for the simulation process, as depicted in Figure 8.

## 2.6 | Experimental set-up and uncertainty

The equipment showcases a pressure vessel equipped with a common rail injection system. It has a 90 mm diameter manufactured from stainless steel with a visual window, which was also used to control ambient pressure. The vessel was used to identify spray pattern and also can be used to measure combustion characteristics. In this instance, a common rail system was used to regulate injection pressure, and an intake valve was utilized to regulate ambient pressure. The ambient temperature was measured using a thermocouple. A single-hole nozzle coupled with an electronic fuel injector has been used. The details of the model, accuracy, range and uncertainty are provided in Table 5, and the uncertainty analysis is presented in Section 2.2. During the experiment, a high-speed camera was utilized to capture the spray images and then processed in MATLAB to obtain the spray pattern.

The factors involving instrument configuration and selection vary with different tests, environmental conditions, and other factors, leading to uncertainties in the estimated parameters. This variation is considered the primary source of uncertainty in parameter estimation. The measurement errors arise from various sources and are typically categorized as bias errors and random errors. Where, bias errors are deviations that are not due to random variation and are evaluated based on the calibration process or previous results. Random errors are regarded as random variation and variability and can be reduced by calculating a large number of samples. Using methodological equations, the estimations of error in experimental data are assessed. To assess experimental errors, instruments, sensors, and machines must be subjected to estimations followed by a few calculations. The analysis of uncertainty consists of determining the true value based on the average of repeated measurements. The specific parameter underwent six experimental repetitions, and the average value was employed for error analysis. A widely recognized mathematical expression is utilized to assess multiple unspecified uncertainties based on well-defined parameters. The uncertainty findings are calculated as per Holman's square root rule given in Equation (36) [49]. In addition, Table 5 displays the uncertainty value and accuracy of various instruments, along with their respective ranges.

$$U_E = \left\{ \left[ \left( \frac{\partial E}{\partial X_1} \right) u_1 \right]^2 + \left( \frac{\partial E}{\partial X_2} \right) u_2 \right]^2 + \left( \frac{\partial E}{\partial X_3} \right) u_3 \right]^2 + \cdots\cdots\cdots + \left( \frac{\partial E}{\partial X_n} \right) u_n \right]^2 \Bigg\}^{1/2} \tag{36}$$

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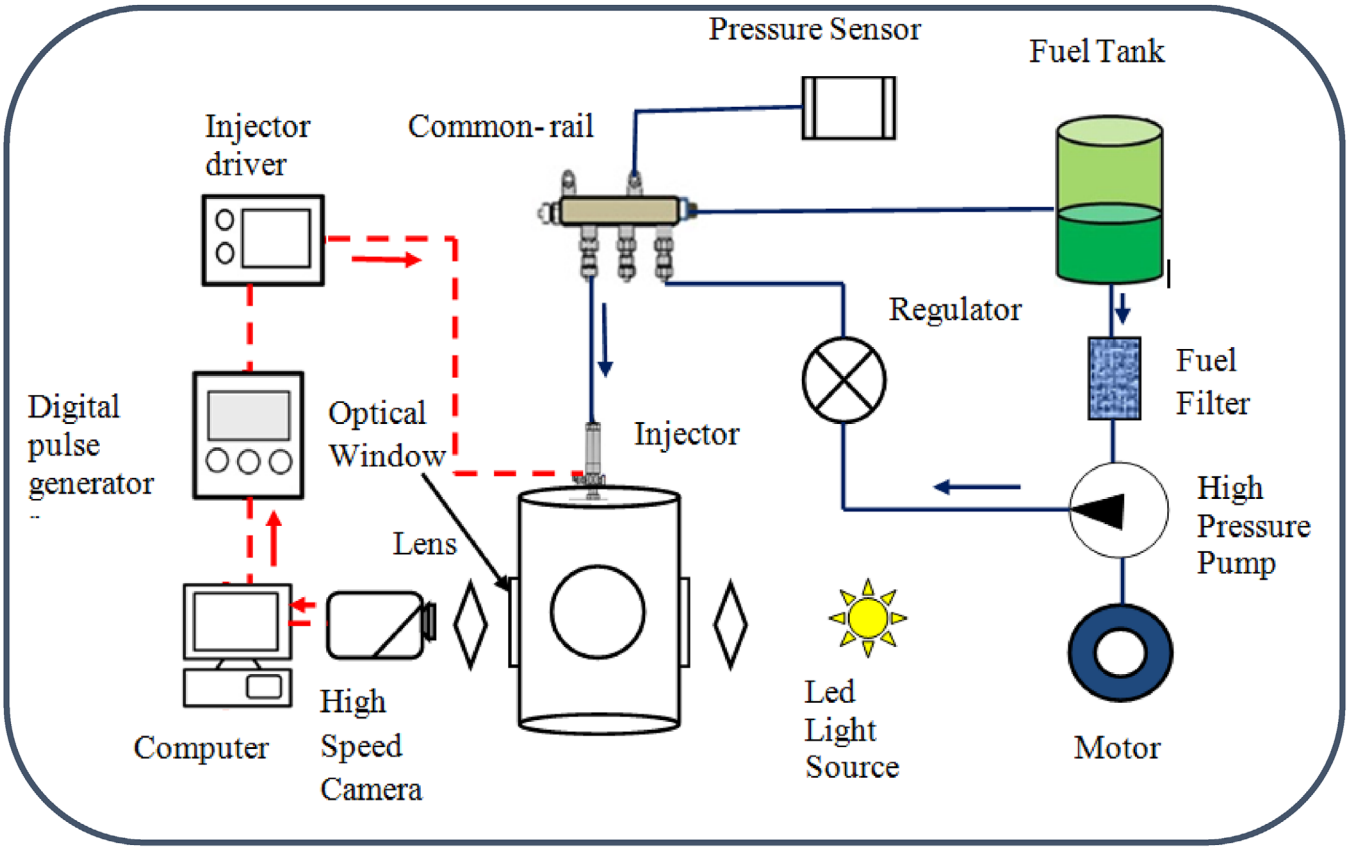


**FIGURE 6** Experimental setup to visualize the spray pattern of fuel.

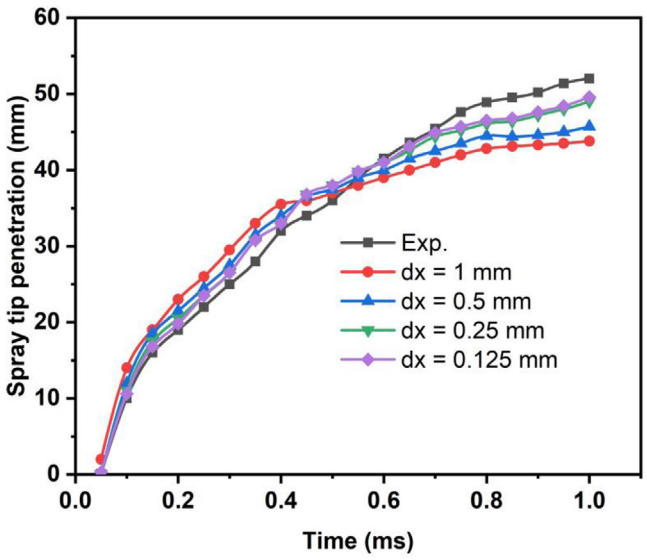


**FIGURE 7** Grid independence test with the comparison of experimental and predictive spray characteristics.

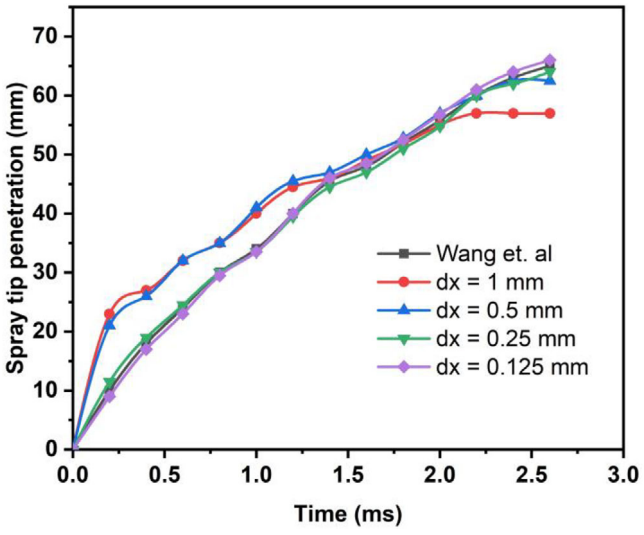


**FIGURE 8** Computer model validation with the study of Wang et al. [48].

Here, E represents the fundamental factor that depends on other factors $X_1$, $X_2$, …, Xn. X signifies the quantities used in the experiments, and $u_1$, $u_2$, …, un denote the uncertainties associated with the obtained results. Finally, the overall uncertainty of physical factors was presented as:

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**TABLE 5** Model no, uncertainty, accuracy of instrument and range.

| Device specification/parameters | Model | Accuracy | Percentage uncertainties | Range |
|---|---|---|---|---|
| Pressure sensor | PXP0-200KS5T | ± 0.35% | ± 0.45 | 0-200,000 psi |
| Motor | MMG 132-2-3-38FF-265-E | | ±0.20 | 0-5 hp |
| Light source | PAR64 1000 W lamp | | | |
| High-speed camera | Phantom v2640 | ± 10fps | ±0.4 | 0-12,500fps |
| Injector driver | TEMS, TDA-3200H | ±0.15% | ±0.17 | |
| Fuel filter | 77066WS | ±0.1 | ±.25 | 0-6.5 microns |
| lens | | | ±0.26 | 512 × 512 pixel |
| Injector | | | ±0.036 | 0.18 mm |
| Thermocouple | Constantan | 0.75% | ±0.25 | 95-9000c |
| Fuel pump | CRS2-20- OHW | ±10 Pa | ±0.15 | 0-200 MPa |
| Kinematic viscosity | | | ±0.35 | 0.2-20,000 $mm^2/s$ |
| Injection system | CRI 3–18(CRDI) | ±12 Pa | ±0.30 | 0-220 MPa |
| Pulse generator | DG535 | ± 1% | ±0.01 | 1 mHz to 1.0 MHz |
| Pressure gauge | SKF 1077587/2 | 1% | ±0.45 | 0-100Mpa |
| Sauter mean diameter | | ±0.01% | ±0.30 | |
| Spray tip penetration | | ±0.05% | ±0.50 | |
| Spray cone angle | | ±0.48% | ±0.60 | |
| Air entrainment | | ±1% | ±0.98 | |
| HRR | | ±0.98% | ±1.02 | |
| Soot | | ±0.61% | ±0.74 | |
| Ignition delay | | ±0.35% | ±0.79 | |

$$\text{Overall Uncertainty} = \sqrt{\left(\text{Uncertainty (\%) of } \left(\text{SMD}^2+\text{STP}^2+\text{SCA}^2+\text{soot}^2+\text{HRR}^2+\text{air entrainment}^2+\text{iignition delay}^2\right)\right)} = \pm 1.97\%$$

The overall uncertainty value is ± 1.97%, which appears in the limit reported by studies [50, 51].

## 2.7 | Validation of swirl nozzle

Spray characteristics of fuel have a significant effect on air-fuel mixing, resulting in variations in diesel engine combustion, performance, and emissions. For the purpose of ensuring the validity of the numerical model, evaporative spray tip penetration was compared to experimentation. Using WCO, a qualitative comparison of simulated and experimental results was conducted at a constant injection pressure, ambient pressure, and temperature of 250 MPa, 2.13 MPa, and 800K. It was observed that initially spray length was produced, which subsequently transformed into an evaporative state. These phenomena occurred as a result of the improved disintegration of droplets in secondary atomization, where droplets move in hot, quiescent air, surface evaporation, and improved air entrainment in spray volume, which leads to a reduction in liquid penetration and an increase in vapour penetration [52]. As shown in Figure 9, the tip penetration initially increased rapidly, but after 0.8 ms ASOI, the increment decreased due to momentum loss.

# 3 | RESULTS

## 3.1 | Spray characteristics

Spray tip penetrations for conventional nozzle are higher at all injection pressures (100, 200 and 300 MPa) compared to swirl nozzle. At higher injection pressures (200 MPa), the disparity in tip penetrations showed an increasing trend. The swirl nozzle reduces spray momentum more than a conventional nozzle, due to an additional peripheral rotation of the spray along the spray axis, which provides additional surface energy and promotes early secondary atomization [53]. Another, aspect that is responsible to reduce spray momentum in the swirl nozzle is the additional friction force acting by the curved slots in the nozzle and there is a more viscous dissipation rate. Nevertheless,

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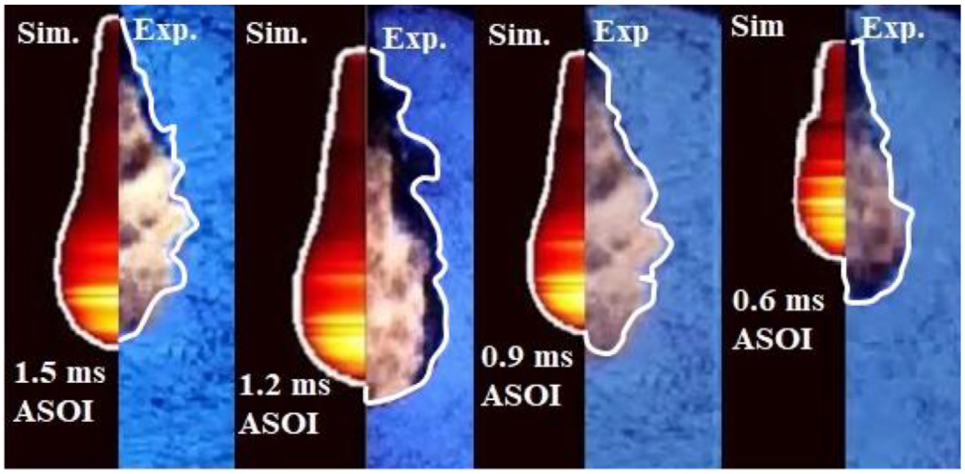


**FIGURE 9** Validation of spray tip penetration at high ambient temperature.

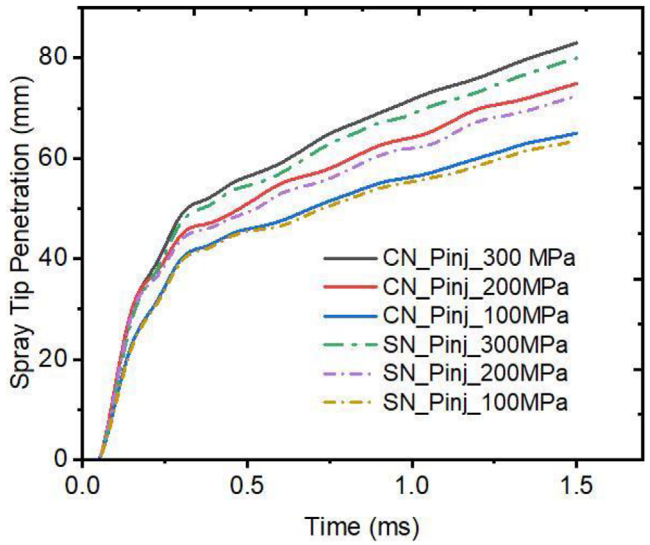


**FIGURE 10** Variation of evaporative spray tip penetration at 100, 200, and 300 MPa with CN and SN geometry.

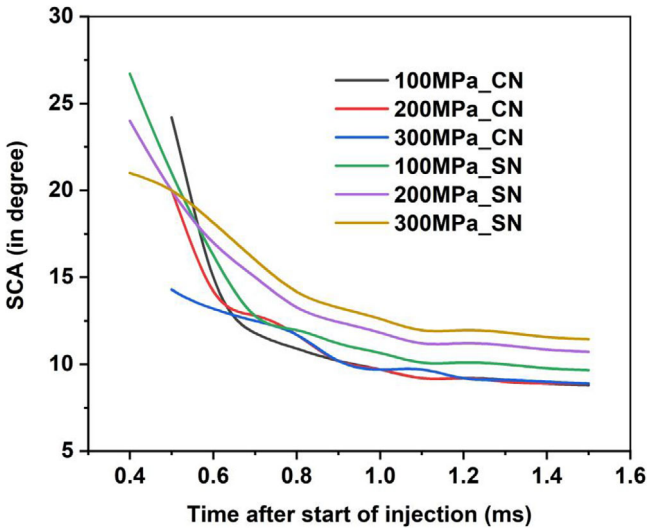


**FIGURE 11** spray cone angle of CN and SN at different injection pressures for a duration of 1.5 ms.

as shown in Figure 10, the swirling effect is diminished at low injection pressure. In addition, the spray cone angle was computed in MATLAB and shows nearly the same measurement method used by R. Reitz [54] as shown below

$$\tan\left(\frac{\theta}{2}\right) = A\left(\frac{\rho_g}{\rho_l}\right)^{0.5}. \quad (37)$$

It can be noted that the spray cone angle decreased with an increase in injection pressure at the start of injection. However, it became constant after 0.9 ASOI e as shown in Figure 11. The spray cone angle remains relatively unaffected by the elevated injection pressures of biodiesel fuel in conventional nozzle. However, it is influenced by variations in ambient air density, with higher density leading to increased resistance to the fuel spray and enhanced axial development of the spray. Additionally, elevated fuel viscosity diminishes the Reynolds number within the spray field, impeding the emergence of instability during atomization processes. The heightened viscosity adversely impacts liquid atomization by reducing the available energy for fuel atomization due to viscous losses in the disintegration process, leading to the formation of coarser spray [55]. In contrast, the spray angle of a swirl nozzle is primarily determined by the swirl chamber, nozzle orifice diameter and length, ambient pressure and temperature, and surface tension of a liquid. It is shown from Figure 11 that spray cone angle increased with rise in injection pressure. As the injection pressure increases, the tangential velocity also rises, resulting in a shift of fuel mass from the spray axis to the periphery. Further, frictional force endeavor to disrupt the surface tensile forces of the fluid, leading to the formation of droplets. This phenomenon is more prone towards smaller droplets, wider cone angle and formation of thin sheet [18]. Additionally, the modification in the spray cone morphology arises from the contest between the contraction force generated

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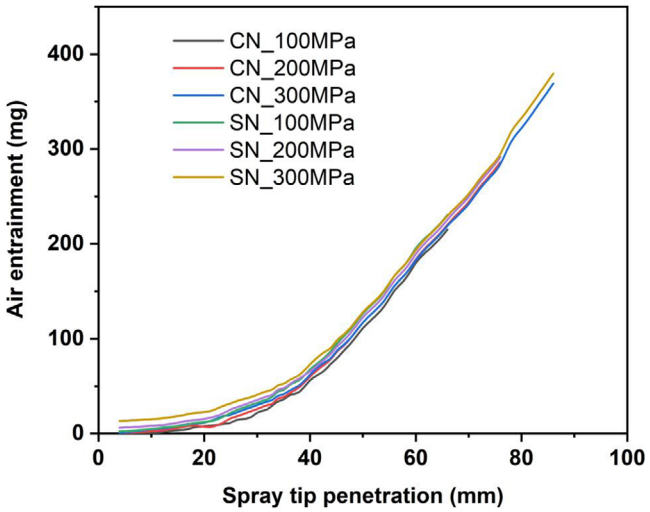


**FIGURE 12** Mass of air entrained for CN and SN at different injection pressures.

by the liquid surface tension and the inertial force (injection pressure) [16].

## 3.2 | Air entrainment

The quality of air-fuel mixing depends primarily on-air entrainment within the spray, which is mainly influenced by cone angle, tip penetration, and ambient conditions. Air entrainment analysis provides adequate data for balancing nozzle diameter, injection pressure and timing, nozzle geometry, and so on. Moreover, this is another crucial factor governing soot formation. The mass of air entrained for both types of nozzles is depicted in Figure 12 and calculated using the model proposed by Rakapoulos et al. [56] as shown below.

$$m_a(t) = \left(\frac{\pi}{3}\right)\left(\tan\left(\frac{\theta}{2}\right)\right)^2 S(t)^3 \rho_a, \tag{38}$$

where $m_a(t)$ represents the air-entrained mass within the spray at time t in kg, S(t) shows the tip penetration at time t in m, $\theta$ is the spray cone angle in radians and $\rho$a shows the ambient density of air in kg/m$^3$. As shown in Figure 12, SN_300 exhibited highest mass air entrainment followed by SN_200, CN_300, SN_200, CN_200, CN_100. It is interesting to note that SN_100 and CN_300 showed almost same air entrainment. The conventional nozzle with all injection pressure exhibited very little difference in spray cone angle. While in swirl nozzle, the centrifugal force and shear force increases as injection pressure increases and liquid film fragmentation into liquid ligaments due to centrifugal and shear forces, as well as secondary atomization resulting from liquid ligament fragmentation into droplets. As the fuel is broken down into smaller droplets, the surface area exposed to the surrounding air increases, resulting in higher air entrainment [13].

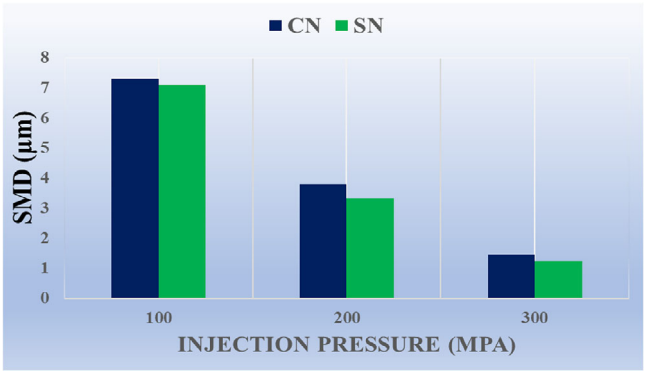


**FIGURE 13** sauter mean diameter of conventional nozzle versus swirl nozzle at 100 MPa, 200 MPa, and 300 MPa.

## 3.3 | Droplet size variation

Figure 13 depicts the SMD of the swirl nozzle and conventional nozzle at 100, 200, and 300 MPa injection pressures. The average SMD at a distance of 30 mm from the nozzle tip was calculated using CFD. Results indicated that as the injection pressure increased, there was a corresponding decrease in SMD for both nozzles. This is due to the spray plume's early primary atomization. However, as injection pressure rises, the rheological properties of the fuel decrease, resulting in better atomization. Viscosity, followed by surface tension, is the most important parameter for droplet formation. In addition, it was observed that the swirl nozzle exhibited a lower SMD at all injection pressures, although this difference is greater as injection pressure increases. Since spray leaving a swirl nozzle undergoes both axial and rotational motion, it experiences greater drag than conventional spray at high ambient pressure. The difference in SMD for both nozzles at 100 and 200 MPa is higher than 300 and 200 MPa. This is due to the momentum transfer of spray along the axial direction. The rationale of the above study is also suggested by [4].

## 3.4 | Ignition delay

Ignition delay (ID) was measured during the time between the first appearance of OH* species and the beginning of injection in combustion phenomena. It was observed in Figure 14 that regardless of nozzle geometry, ignition delay decreased as injection pressure increased from 100 to 300 MPa. Consequently, the swirl nozzle reduced the ignition delay more than the CN under the same injection pressure. Significant differences in ignition delay were observed at higher injection pressures (< = 200 MPa). ID is significantly affected by injection pressure, the rheological properties of the fuel, and additional parameters such as cetane number and nozzle diameter. The higher the injection pressure, the shorter the breakup length, the lower the SMD, the finer the atomization, and the better the dispersion. Therefore, improved atomization characteristics result in a shorter ID. The rationale of the study is also suggested by [11, 57]. The preceding discussion demonstrated that the

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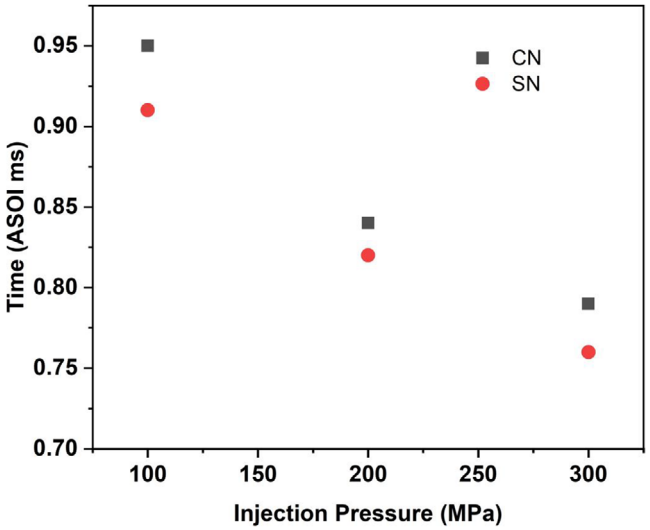


**FIGURE 14** Variation of ignition delay of CN and SN with injection pressure from 100 MPa to 300 MPa.

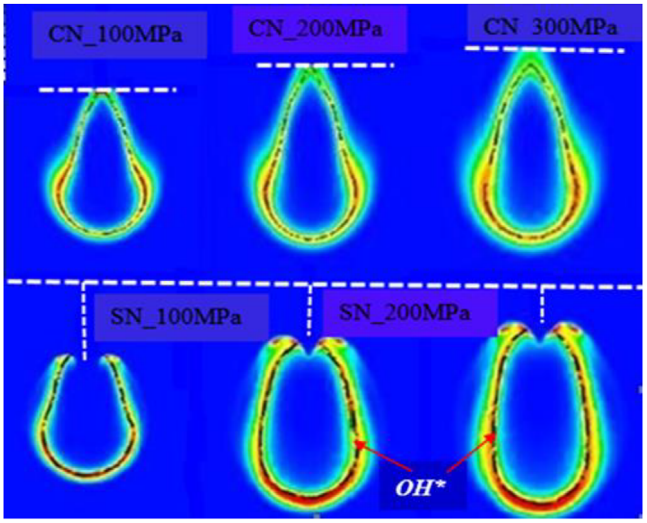


**FIGURE 15** Variation of OH* flames of SN with injection pressure from 100 MPa to 300 MPa.

atomization characteristics of a SN at a higher injection pressure are superior to those of a conventional nozzle at a higher injection pressure, which can be attributed to better air-fuel mixing and faster air entrainment into the reacting spray. In addition, earlier results also showed that shorter IDs exhibited shorter lift-off lengths [58].

## 3.5 | Flame lift-off length

It was previously determined that flame lift-off is an excellent indicator of how well fuel and air were mixed before combustion. Previous findings [58–60] demonstrated that high injection pressure, ambient density, temperature, and oxygen concentration will shorten lift-off distance. After ignition, the flame grows toward the downstream direction and stabilizes at a quasi-steady position well downstream of the injector tip. The distance between the tip of the injector and the location of the quasi-steady flame is known as the flame-lift-off length. As shown in Figure 15, the downstream region of flame lift-off is distinguished by the zone of non-premixed, which relies on upstream air entrained, which is generally generated at the boundary of the diffusion zone [61]. However, flame lift-off length through simulation was defined as the initial axial location of OH* Favre-averaged mass fraction which reaches 2% of its limit in computational volume [62]. It was observed that increase in injection pressure from 100 to 300 MPa, spray momentum increased and that push the flame downstream at the lean side. Consequently, the flame traveled upstream to the rich mixture zone for stabilization for both injectors. However, a slight reduction in flame lift-off for the swirl injector was observed as compared to the conventional nozzle. This reduction was only noticeable at high injection pressure (200 MPa, 300 MPa). The above reduction in lift-off is due to more concentration of OH* species on the edge of vaporized spray that have more propinquity to the oxidant. Since swirl atomizers reduce the primary atomization length more than conventional nozzles. Consequently, increased air ($O_2$ only) entrainment improved air-fuel mixing.

## 3.6 | Heat release rate and maximum temperature

HRR is presented for both injectors at different injection pressures as shown in Figure 16a–c. Two peaks have been identified for both injectors, and a sudden increase in HRR indicates that ignition has taken place. First and second-stage ignition can be controlled by chemical kinetics. Where the initial stage of ignition is caused by chain-branching reactions that are more likely to occur at lower temperatures and higher oxygen concentrations [63]. In contrast, as the temperature rises, chain propagation reactions cause the second-stage ignition to become dominant due to chain propagation reactions. Nonetheless, the initial phase is also known as "cool flame" or LTHR (low-temperature heat release). It could be assumed that low-temperature flame characterized by $CH_2O$ species is upstream and downstream from the source, there is a high-temperature flame characterized by the presence of OH*. Due to the upstream location of $CH_2O$ species, hot flames of WCO tend to move toward the injector location, and furthermore, upstream, hot air is drawn in and mixed with a cool flame, resulting in high-temperature ignition. As the fuel is injected, fuel droplets mix with hot air, resulting in vaporization. Therefore, a decrease in ambient temperature was observed for all injection pressures. In addition, the vaporization of fuel lowers the temperature of the injected spray by reducing the sensible heat of air.

As the injection pressure rises from 100 to 300 MPa, fuel spray rotation and droplet rotation along their axis create more surface area to act as drag force, and that enhanced faster disintegration and that causes enhanced air-fuel mixing in quiescent

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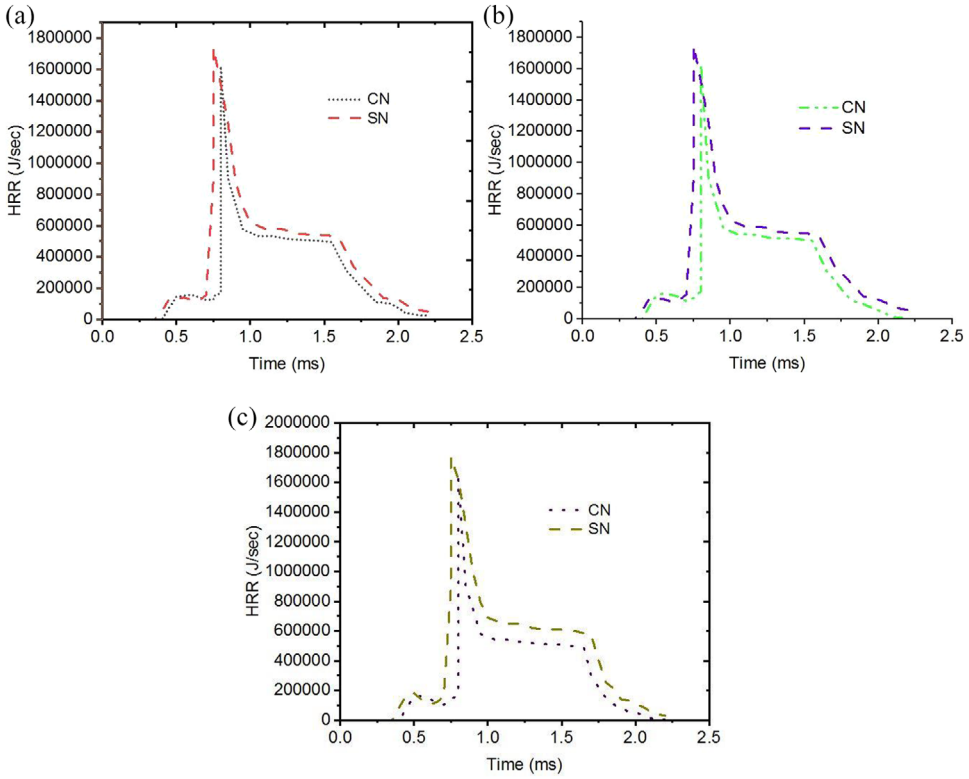


**FIGURE 16** (a) variation of HRR of CN and SN for injection pressure 100 MPa. (b) variation of HRR of CN and SN for injection pressure 200 MPa. (c) variation of HRR of CN and SN for injection pressure 300 MPa.

hot air in SN. Entrainment of hot air in SN is easier than conventional nozzle at high injection pressure [11, 16].

However, it was seen that at an injection pressure of 100 MPa, the peaks of HRR for SN and CN appeared at 0.53 ms and 0.56 ms of ASOI, respectively, and SN exhibited higher HRR than CN. As the fuel injection initiates and the fuel beam expands in swirl nozzle, it continually draws in surrounding air, facilitated by the intake swirl. As the combustion progressed after 0.5 ms to SN, the speed of flame diffusion surpassed that of the fuel beam expansion. The flame surpassed the upper boundary of the fuel beam, leading to a pronounced heat release during combustion, reaching its highest. During the later phase of fuel injection, as the fuel injection rate diminishes, there is a corresponding reduction in the rate of combustion heat release. This process, influenced by the intake swirl, gives rise to a fuel-air mixing zone located at the outer periphery of the fuel beam and that leads to improvement in combustion efficiency. Similar phenomenon also occurred at 200 and 300 MPa for SN. As the injection pressure increases in SN, the spray tip penetration and spray cone angle increase resulting rise in fuel-air mixing in fuel beam. While, CN showed reduction in cone angle with increase in injection pressure causes less air entrainment and air-fuel mixing in spray beam. Therefore, HRR for both nozzles showed highest for 300 MPa followed by 200 and 100 MPa [7, 64].

The temperature distribution of droplets along X-Y plane which is allocated on spray axis is shown in Figures 17a–c and 18a–c. it was observed that SN exhibited highest temperature 2765°C followed by 2755°C to CN at 300 MPa injection pressure. Even at same ASOI of spray, SN consisted higher temperature than CN. This is due to increased turbulence which aids in faster and more uniform combustion. It also helps reduce flame quenching, where the flame is extinguished prematurely due to inadequate mixing. The improved mixing provided by the swirl helps to maintain a stable and sustained flame, contributing to higher combustion temperatures. Additionally, the swirling motion of spray distribute oxygen more evenly within the combustion chamber, ensuring that there is a sufficient oxygen supply for the combustion of fuel. the rationale of above study is also supported by Dembinski [65].

Figure 17a–c presented that the rate of temperature rise from 1.3 ms to 1.8 ms was higher in CN compared to SN. The spray exiting from a conventional nozzle experiences a delay in disintegration during the injection duration. This is attributed to a lesser cone angle, which results in reduced air entrainment. The decrease in the surface-to-volume ratio of the droplets tends to impede proper air-fuel mixing. The uneven air-fuel mixing leads to reduction in combustion characteristics [65].

## 3.7 | Emission

The detailed study of soot formation using a six-step phenomenological soot model has been shown in Figure 19. Oxidation and soot formations are categorized into various

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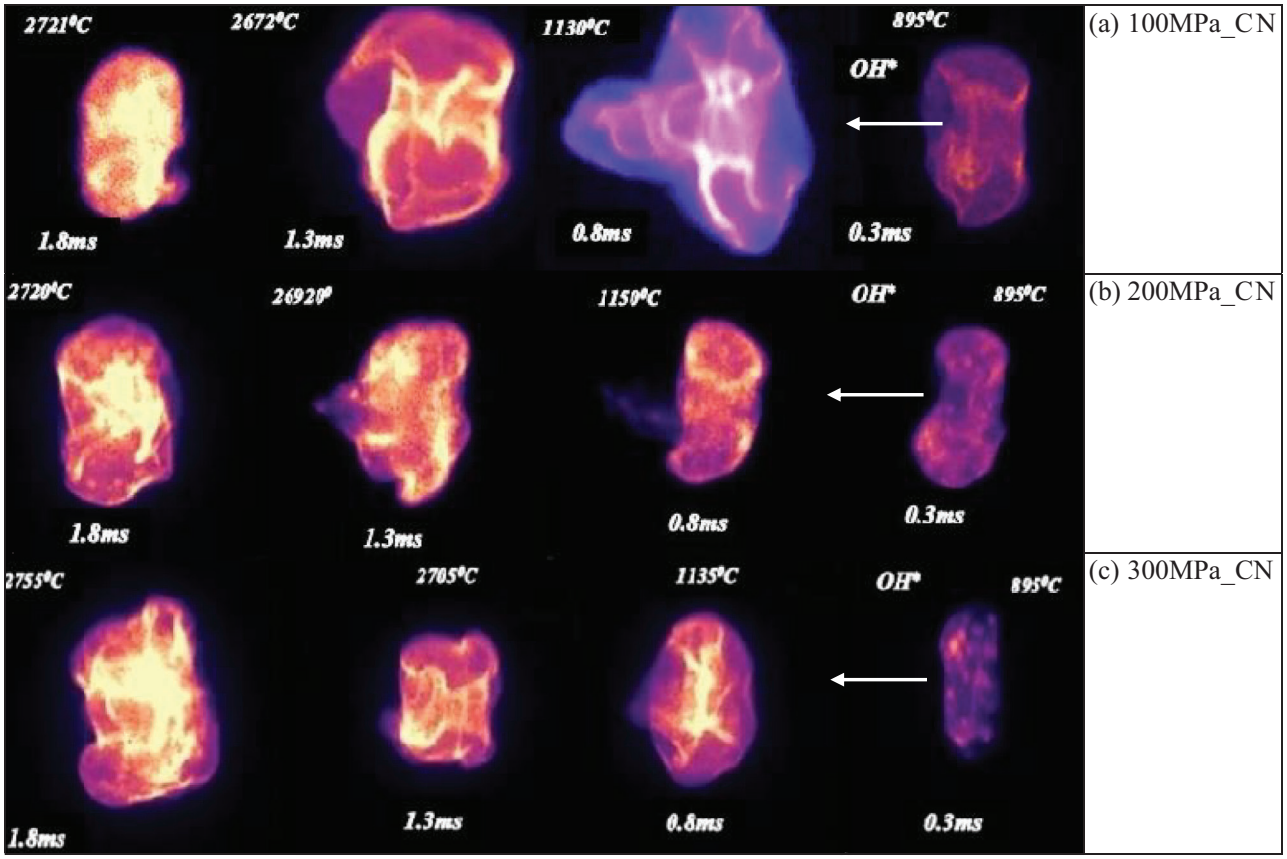


**FIGURE 17** (a), (b), and (c) show the highest temperature variation of spray through OH species of CN along X-Y plane.

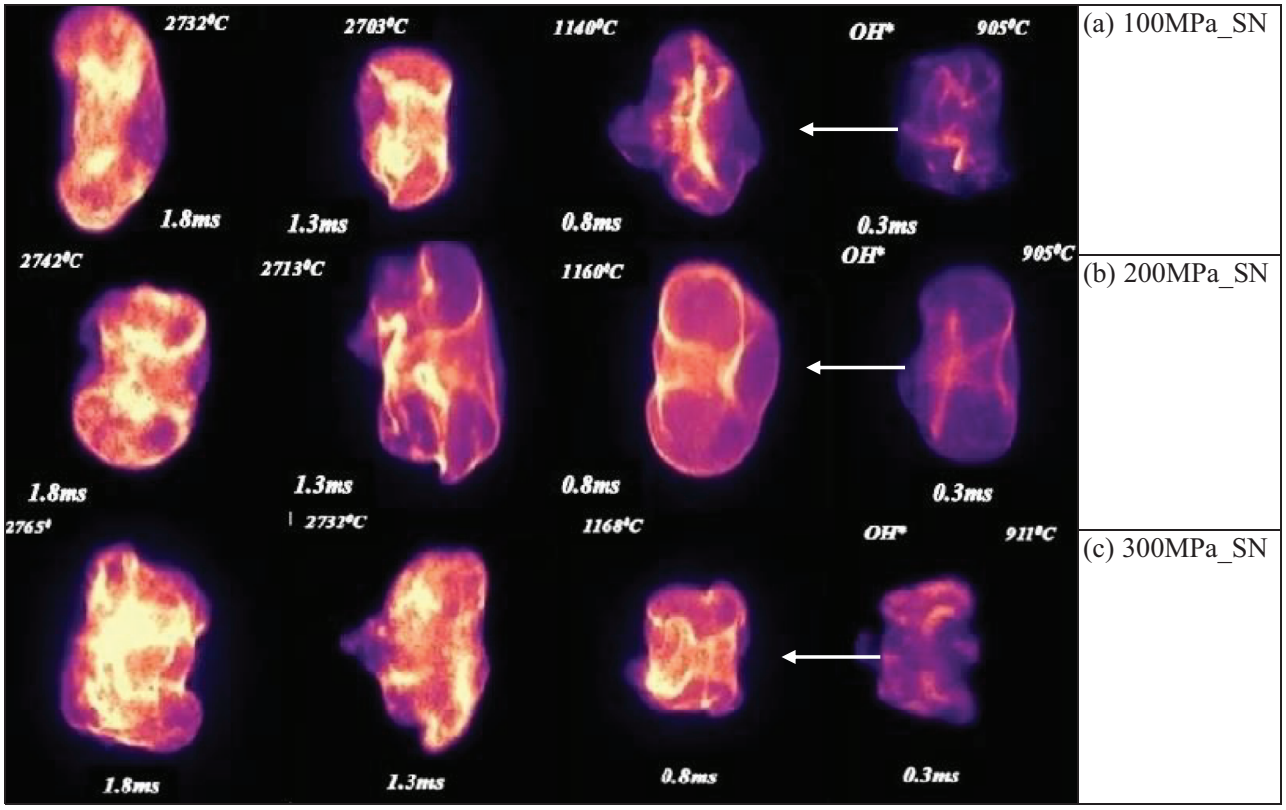


**FIGURE 18** (a), (b), and (c) show the highest temperature variation of spray through OH* species of SN along X-Y plane.

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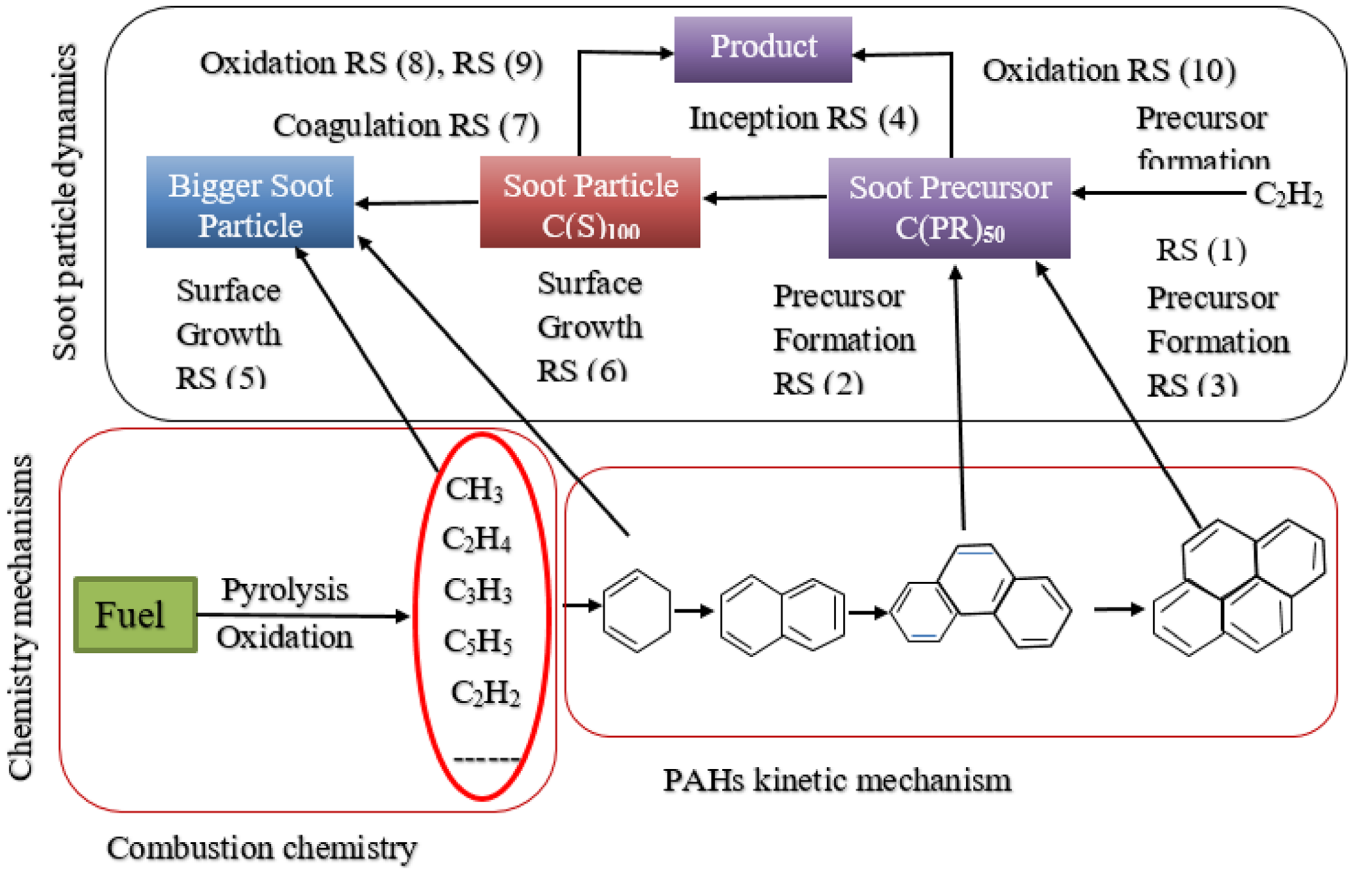


**FIGURE 19** Graphic representation of the phenomenological soot model.

parts such as precursor formation through $C_2H_2$, aromatic structures with four rings and three rings, the inception of particle from soot precursor, particle coagulation, surface growth by $C_2H_2$, precursor oxidation, particle surface oxidation through OH and $O_2$. Moreover, C(S) and C(PR) denote the carbon atoms of soot particles and soot precursor, respectively. The soot precursor formation (R(S3), R(S2), R(S1)), reaction rates, particle surface growth (R(S6), R(S5)), particle inception R(S4) soot precursor oxidation R(S10) are considered in the form of Arrhenius equation. $C_2H_2$ is considered the precursor to soot formation. This constitutes an important mechanism of soot formation building block of polycyclic aromatic hydrocarbon (PAH). Wang et al. [62] reported that $C_2H_2$ is the species that influence the PAH growth method through the mechanism of hydrogen abstraction carbon addition (HACA). The difference between soot that has been oxidized and gross soot formation is net soot formation. This demonstrates that whatever soot was generated in the flame was subsequently oxidized by upstream air entrainment, resulting in zero net soot.

Figure 20a–c shows that as the injection pressure increases from 100 MPa to 300 MPa, overall net soot formation was reduced for both fuel injectors. This occurred due to enhancement in fuel-air mixing and leading to greater upstream air entrained of the combustion zone. Hence, an increase in injection pressure leading to an OH* increase is due to improve in oxidation causing less soot to form. In the initial stages of combustion, the mass concentration of soot particles progressively increased until the end of injection (1.5 ms ASOI). Subsequently, soot decreased caused by improvement in oxidation.

Since biodiesel has the propensity to provide oxygen during secondary atomization to spray molecules in combustion phenomena, its oxygenated behaviour reduces soot formation and enhances soot oxidation [66, 67].

However, it was discovered that the swirl atomizer produces less soot than conventional nozzles at all injection pressures. This occurred as a result of the swirl nozzle's superior atomization characteristics compared to conventional nozzles, particularly at higher injection pressures due to faster secondary atomization [15, 16]. However, the difference between soot formations for both injectors at lower injection pressure is less due to the reduced impact of the centrifugal action of the swirl injector. A comparative study of previous development and current development of spray, combustion and emission characteristics are shown in Table 6.

## 4 | CONCLUSION

This study used a numerical model to simulate the spray combustion process for a conventional nozzle and a swirl nozzle utilizing waste cooking oil, with the main objective to enhance

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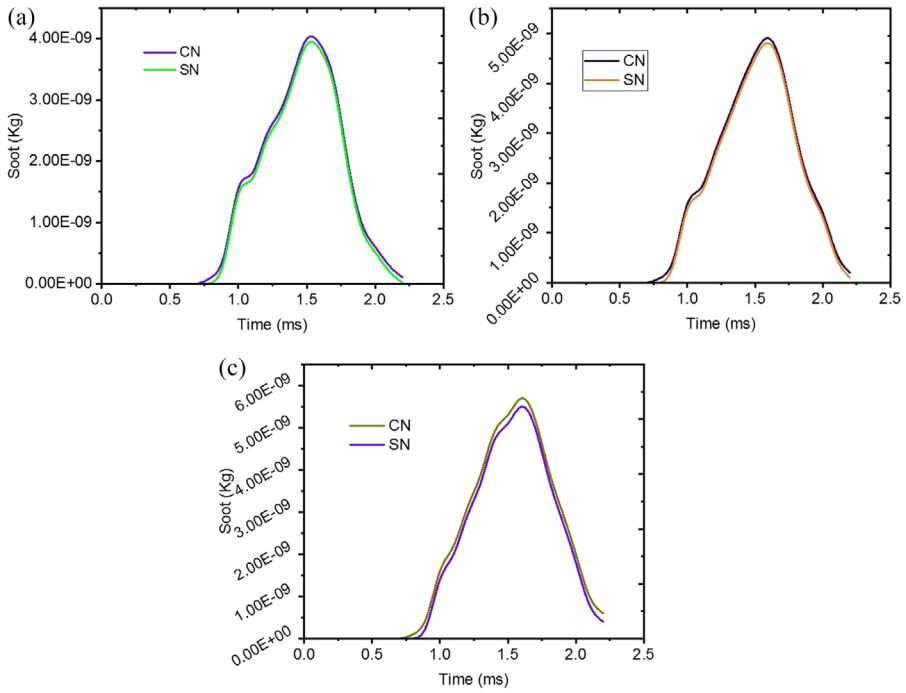


**FIGURE 20** (a) Soot formation of CN and SN for injection pressure 100 MPa. (b) Soot formation of CN and SN for injection pressure 200 MPa. (c) Soot formation of CN and SN for injection pressure 300 MPa.

**TABLE 6** Comparison of previous results with the current development.

| Fuel | Injection pressure (MPa) | Conditions | STP | SCA | SMD/AE | FLO | ID | Soot | Problems associated with previous studies |
|---|---|---|---|---|---|---|---|---|---|
| Diesel [68] | 300 ↑ 200 ↑ 100 | ND: 0.07 mm; AP: 4.6 MPa; AT: 800K | ↓↑↑ | | | ↑↑↑ | ↓↓↓ | ↓↓↓ | ★Wall Impingement, higher BSFC, CO, carbon deposits on cylinder wall |
| Diesel [69] | 300 ↑ 200 ↑ 100 | ND: 0.07 mm; AP: 1.76 MPa; AT: 300K | ↑↑↑ | ↓↓↓ | ↑↑↑ | | | | ★Wall Impingement, less surface area to volume ration of droplets |
| Diesel [70] | 300 ↑ 250 ↑ 200 | ND: 0.3 mm; AP: 1 MPa; AT: 300K | ↑↑↑ | ↓↓↓ | | | | | ★Wall Impingement, poor atomization for high viscous fuels |
| Palm oil [71] | 300 ↑ 200 ↑ 100 | ND: 0.16 mm; AP: 4 MPa; AT: 885K | ↑↑↑ | ↓↓↓ | ↓↓↓ | ↑↑↑ | ↓↓↓ | ↓↓↓ | ★Investigation is based on circular droplet while shape varies with applications |
| Diesel [72] | 300 ↑ 200 ↑ 100 | ND: 0.07 mm; AP: 1.76 MPa; AT: 300K | ↑↑↑ | ↓↓↓ | ↑↑↑ | | ↓↓↓ | | ★longer injection delay, Decrease in injection rate with high rheological properties fluid |
| , WCO | 300 ↑ 200 ↑ 100 | ND: 0.18 mm; AP: 4 MPa; AT: 800K | ↑↑↑ | ↑↑↑ | ↓↓↓ | ↑↑↑ | ↓↓↓ | ↓↓↓ | ★Present study |

ND, nozzle diameter; AP, ambient pressure; AT, ambient temperature.

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spray characteristics. The results from the simulations were validated against both experimental and theoretical results, with a minimal comparative error rate of less than 5%. This section summarizes the major findings related to macro-spray and micro-spray characteristics:

1. SN registered less spray tip penetration by 1.98%, 3.33%, and 3.56% at injection pressures of 100 MPa, 200 MPa, and 300 MPa, respectively, when compared to the CN. This result can be attributed to the additional frictional force inherent to the SN.
2. SN indicated a greater spray cone angle by 5.11%, 9.67%, and 11.87% at injection pressures of 100 MPa, 200 MPa, and 300 MPa, respectively, in comparison to the CN. Early disintegration of the spray jet and heat loss contribute predominantly to this heightened cone angle.
3. The amount of air entrained increased with higher injection pressures, leading to better air-fuel mixing in the SN due to the increasing trend of cone angle and slight reduction in tip penetration.
4. SMD decreased with increased injection pressure for both nozzles. However, the SN showed a lower SMD than the CN due to higher heat loss which improves atomization characteristics.
5. Improved air-fuel mixing due to better atomization characteristics in the SN led to a shorter ignition delay than in the CN.
6. The predicted flame-lift-off length for both nozzles increased with increased injection pressure, but the SN exhibited a lesser lift-off length than the CN due to earlier atomization and more air entrainment.
7. A higher spray volume in the SN at higher injection pressures improved vaporization characteristics, leading to a higher HRR and maximum temperature.
8. The SN exhibited a reduction in soot production compared to the CN at all examined injection pressures due to strongly enhanced atomization characteristics.

In summary, the swirl nozzle has shown several advantages over the conventional nozzle under various conditions. employing swirl nozzle, the cone angle and spray tip penetration increased with rise in injection pressure leading wall impingement reduced. Additionally, the swirling of spray imparted faster disintegration leading improve in combustion efficiency.

## NOMENCLATURE

### Abbreviations

| | |
|---|---|
| **STP** | Spray tip penetration |
| **SCA** | Spray cone angle |
| **SMD** | Sauter mean diameter |
| **AE** | Air entrainment |
| **HRR** | Heat release rate |
| **WCO** | Waste cooking oil |
| **MPa** | Mega Pascal |
| **CO** | Carbon monoxide |
| **CN** | Conventional nozzle |
| **SN** | Swirl nozzle |
| **RANS** | Reynolds Navier strokes |
| **mg** | Milligram |
| **Pr** | Prandtl number |
| **EV** | Electric vehicle |
| **↑** | Increase |
| **ASOI** | After start of injection |
| **HC** | Hydrocarbon |
| **NOx** | Oxides of nitrogen |
| **CRDI** | Common rail direct injection |
| **ID** | Ignition delay |
| **FLO** | Flame lift-off |
| **MS** | Millisecond |
| **$P_{inj}$** | Injection pressure |
| **$P_{amb}$** | Ambient Pressure |
| **OH*** | Hydroxyl radical |
| **$CH_2O$** | formaldehyde |
| **$C_2H_2$** | Acetylene |
| **Sc** | Schmidt number |
| **DISI** | Direct Injection Spark Ignition |
| **↓** | Decrease |
| **mm** | Millimeter |

## AUTHOR CONTRIBUTIONS

**Prem Shanker Yadav**: Conceptualization; methodology; software; validation; investigation; data curation; writing—original draft; writing—review and editing; visualization; supervision; project administration; resources. **Samer Fikry Abdelfatt Ahmed**: Conceptualization; methodology; software; validation; investigation; data curation; writing—original draft; writing—review and editing; visualization; project administration; resources. **Raghvendra Gautam**: Conceptualization; methodology; software; validation; investigation; data curation; writing—original draft; writing—review and editing; visualization; project administration; resources. **Hakan Caliskan**: Conceptualization; methodology; software; validation; investigation; data curation; writing—original draft; writing—review and editing; visualization; supervision; project administration; resources. **Nesrin Caliskan**: Conceptualization; methodology; software; validation; investigation; data curation; writing—original draft; writing—review and editing; visualization; project administration; resources. **Hiki Hong**: Conceptualization; methodology; software; validation; investigation; data curation; writing—original draft; writing—review and editing; visualization; supervision; project administration; resources.

## CONFLICT OF INTEREST STATEMENT

The authors declare no conflicts of interest.

## DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available from the corresponding author upon reasonable request.

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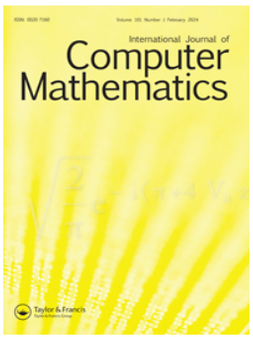

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# Numerical analysis of singularly perturbed parabolic reaction diffusion differential difference equations

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# Numerical analysis of singularly perturbed parabolic reaction diffusion differential difference equations

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**ABSTRACT**

The authors present numerical analysis of singularly perturbed parabolic problems. The previous papers in this direction focussed on the convection-diffusion problems with regular type of boundary layers. It is very difficult and almost impossible as stated in the literature, e.g, in Chapter 14 of 'Fitted numerical methods for singular perturbation problems: error estimates in the maximum norm for linear problems in one and two dimensions' (1996) by Miller, John JH and O'Riordan, Eugene and Shishkin, Grigorii I, to capture singularities due to parabolic layers and develop a robust scheme for reaction-diffusion problems with general values of space shifts. The work is in progress now and this is the first paper in this direction. In this work, we are investigating such problems and develop a robust numerical scheme using Mickens's non-standard finite difference scheme and special mesh. Furthermore, numerical examples have been presented to verify the theoretical findings.

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## 1. Introduction

Musila and Lansky [27] generalized Stein's model [32,33] to the time-dependent model. Singularly Perturbed Parabolic Differential-Difference Equations (SPPDDE) and differential equations have been investigated for many years (see [1–3,10,12–20,22,23,31]. SPPDDEs as state-dependent shifts arguments are less investigated. To the best of knowledge of the authors, there are only a few publications in this area [4,5,8,21,29,30].

In [4–8], the authors tackled various issues, e.g. general shift arguments and developed higher-order convergent methods without any constraints on the mesh generation.

To deal with general shift arguments of the considered problem, a special mesh has been constructed, which is not compatible with fitted meshes. The non-standard fitted operator developed in [4] can not capture the singularities arise due to parabolic layer of the considered problem.

The location and count of layers in the solution of reaction-diffusion problem is different from convection diffusion layers. Boundary layers occurring on outflow boundaries are referred to regular boundary layers. It is common for boundary layers to occur on characteristic boundaries and these are called parabolic boundary layers. It is a difficult task to develop a fitted operator to capture the singularities of the parabolic layers for the problem considered in this paper, i.e. to construct a $\varepsilon$-uniform numerical scheme. In this article, we develop and analyse a non-standard finite difference operator for such problems using a uniform mesh and a non-standard finite difference operator.

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Singular perturbation is a vast area of research. For related class of singularly perturbed differential equations with two singular perturbation parameters, turning point problems and degenerative convective terms or other coefficients in the problem, discontinuous source function see [9,11,24,25,28].

**Notations:** In this paper, $C$ denotes the generic positive constant free from $\varepsilon$, $h$ and $\Delta t$. In this work, all the functions defined on the domain '$D$' have been measured in supremum norm defined as follows:

$$\|f\|_{\overline{D}} = \sup_{x \in \overline{D}} |f(s)|.$$

## 2. Continuous problem and a priori estimates

Consider the following problem:

$$\frac{\partial y}{\partial t} - \varepsilon \frac{\partial^2 y}{\partial s^2} + p(s)y(s,t) + q(s)y(s+\eta,t) = r(s,t), \tag{1}$$

on $\omega = B \times (0,T]$, where $B = (0,1)$, here $T$ is taking fixed positive values in time direction and $\partial\omega = \overline{\omega} - \omega = \{(0,t) \bigcup (1,t) \bigcup (s,0) : s \in [0,1], t \in (0,T]\}$, $(s,t) \in \omega$, under the following conditions:

$$\begin{aligned} &y(s,0) = y_o(s), \quad \forall\, s \in \overline{B}, \\ &y(s,t) = y_1(s,t), \quad \forall\, (s,t) \in \omega_1 = \{(s,t) : s = 0 \text{ and } t \in [0,T]\}, \\ &y(s,t) = y_2(s,t), \quad \forall\, (s,t) \in \omega_2 = \{(s,t) : s \in [1,1+\eta] \text{ and } t \in [0,T]\}. \end{aligned} \tag{2}$$

The continuous problem (1) can be written as follows:

$$D_{\varepsilon,\eta} y(s,t) = R(s,t), \tag{3}$$

where

$$D_{\varepsilon,\eta} y(s,t) \equiv \begin{cases} \dfrac{\partial y}{\partial t} - \varepsilon \dfrac{\partial^2 y}{\partial s^2} + p(s)y(s,t) + q(s)y(s+\eta,t), & \text{if } s \in (0,1-\eta), t \in (0,T], \\ \dfrac{\partial y}{\partial t} - \varepsilon \dfrac{\partial^2 y}{\partial s^2} + p(s)y(s,t), & \text{if } s \in [1-\eta,1), t \in (0,T], \end{cases}$$

and

$$R(s,t) = \begin{cases} r(s,t), & \text{if } s \in (0,1-\eta), t \in (0,T], \\ r(s,t) - q(s)y_2(s+\eta,t), & \text{if } s \in [1-\eta,1), t \in (0,T]. \end{cases}$$

In the above problem, $0 < \varepsilon \ll 1$ perturbation parameter, $\eta$ is the positive real constant represents spatial shift argument. In this work, it has been assumed that the functions $p(s)$, $q(s)$, $y_1(s,t)$, $r(s,t)$, $y_2(s,t)$ and $y_o(s)$ are sufficiently smooth, bounded and independent of $\varepsilon$. To obtain a oscillation free solution, it is assumed that

$$p(s) + q(s) \geq p^* > 0 \quad \text{and} \quad q(s) < 0, \quad \forall\, s \in \overline{B}, \tag{4}$$

where $p^*$ is a positive constant. The solution of the continuous problem is known at corner points from the initial and boundary conditions. That is why we are imposing the following appropriate compatibility conditions at the corner points of the rectangular domain:

$$\begin{aligned} y_o(0) &= y_1(0,0), \\ y_o(1) &= y_2(1,0) \end{aligned} \tag{5}$$

and

$$\frac{\partial y_1(0,0)}{\partial t} - \varepsilon \frac{\partial^2 y_o(0)}{\partial s^2} + p(0)y_o(0) + q(0)y_o(\eta) = r(0,0),$$
$$\frac{\partial y_2(1,0)}{\partial t} - \varepsilon \frac{\partial^2 y_o(1)}{\partial s^2} + p(1)y_o(1) + q(1)y_2(1+\eta,0) = r(1,0). \tag{6}$$

The solution of the reaction diffusion problem in the present work exhibits layers on both sides of the boundary. Using the conditions (5)–(6), $\exists$ a constant $C$ independent of $\varepsilon$ such that

$$|y(s,t) - y(s,0)| = |y(s,t) - y_o(s)| \leq Ct, \quad \forall\ (s,t) \in \overline{\omega}. \tag{7}$$

**Lemma 2.1:** *The solution $y(s,t)$ of the continuous problem* (1)–(2) *satisfies*

$$|y(s,t)| \leq C, \quad \forall\ (s,t) \in \overline{\omega}.$$

**Lemma 2.2:** *Suppose that $h(s,t) \in C^{2,1}(\overline{\omega})$. If $h(s,t) \geq 0$, $\forall\ (s,t) \in \partial\omega$ and $D_{\varepsilon,\eta}h(s,t) \geq 0$, $\forall\ (s,t) \in \omega$. Prove that $h(s,t) \geq 0$, $\forall\ (s,t) \in \overline{\omega}$.*

**Lemma 2.3:** *Under the hypothesis of Lemmas* 2.1 *and* 2.2*, it holds that*

$$\left|\frac{\partial^i y(s,t)}{\partial t^i}\right| \leq C, \quad (s,t) \in \overline{\omega},\ i = 0,1,2.$$

Note: The proofs of above lemmas can be obtained using the steps from [4].

## 3. Implicit euler-based semi-discrete problem

Here, we discretize the time interval $[0,T]$ as $\omega_t^M = \{t_l = l\ \Delta t, l = 1,\ldots,M, t_0 = 0, t_M = T, \Delta t = T/M\}$, where $\Delta t$ and $M$ are the step size and the number of mesh intervals in time direction, respectively. On discretizing the problem (1)–(2) by Euler's method in temporal direction on $\omega_t^M$ to get the following set of singularly perturbed problems given by

$$(1 + \Delta t\, D^*_{\varepsilon,\eta})Y^{l+1}(s) = g^{l+1}(s), \tag{8}$$

subject to the given data as follows:

$$\begin{aligned}
&Y(s,0) = y_o(s), \quad \forall\ s \in \overline{B},\\
&Y^{l+1}(s) = y_1^{l+1}(s), \quad s = 0 \quad \text{and} \quad l+1 \in [1,M], \quad Y^0(0) = y_1^0(0)\\
&Y^{l+1}(s) = y_2^{l+1}(s), \quad Y^0(s) = y_2^0(s), \quad s \in [1,1+\eta] \quad \text{and} \quad l+1 \in [1,M],
\end{aligned} \tag{9}$$

where

$$D^*_{\varepsilon,\eta}Y^{l+1}(s) \equiv \begin{cases} -\varepsilon Y_{ss}^{l+1}(s) + p(s)Y^{l+1}(s) & \\ +q(s)Y^{l+1}(s+\eta), & \text{if } 0 < s < 1-\eta,\\ -\varepsilon Y_{ss}^{l+1}(s) + p(s)Y^{l+1}(s), & \text{if } 1-\eta \leq s < 1, \end{cases}$$

and

$$g^{l+1}(s) = \begin{cases} \Delta t r^{l+1}(s) + Y^l(s), & \text{if } 0 < s < 1-\eta,\\ \Delta t r^{l+1}(s) + Y^l(s) - \Delta t q(s) y_2^{l+1}(s+\eta), & \text{if } 1-\eta \leq s < 1. \end{cases}$$

where $t_l = l\ \Delta t$ and $Y^{l+1}(s) = Y(s, t_{l+1})$ approximate the continuous problem solution (1)–(2) at $(l+1)th$ time level. The global truncation error of the semi-discretized problem (8)–(9) is given by $E^{l+1} = y^{l+1}(s) - Y^{l+1}(s)$.

**Lemma 3.1:** *Let $h^{l+1}(s)$ denotes a smooth function such that $h^{l+1}(0) \geq 0$ and $h^{l+1}(1) \geq 0$, then $(1 + \Delta t\ D^*_{\varepsilon,\eta})h^{l+1}(s) \geq 0, \forall\ s \in B$ implies $h^{l+1}(s) \geq 0, \forall\ s \in \overline{B}$.*

***Proof:*** Let $(s^*, t_{l+1}) \in \{(s, t_{l+1}) : s \in \overline{B}\}$ be such that

$$h^{l+1}(s^*) = \min_{s\in\overline{B}} h^{l+1}(s)$$

and suppose $h^{l+1}(s^*) < 0$.

Then, we have

$$(s^*, t_{l+1}) \notin \{(0, t_{l+1}), (1, t_{l+1})\} \quad \text{and} \quad h^{l+1}_{ss}(s^*) > 0.$$

To get the estimates that $(1 + \Delta t\ D^*_{\varepsilon,\eta})h^{l+1}(s^*) < 0$, we consider the possible cases as follows.

For: $0 < s < 1 - \eta$,

$$\begin{aligned}(1 + \Delta t\ D^*_{\varepsilon,\eta})h^{l+1}(s^*) &= h^{l+1}(s^*) + \Delta t\ (-\varepsilon h^{l+1}_{ss}(s^*) + p(s^*)h^{l+1}(s^*) \\ &\quad + q(s^*)h^{l+1}(s^* + \eta)) \\ &= h^{l+1}(s^*) + \Delta t\ (-\varepsilon h^{l+1}_{ss}(s^*) + h^{l+1}(x^*)(p(s^*) + q(s^*)) \\ &\quad + q(s^*)(h^{l+1}(s^* + \eta) - h^{l+1}(s^*))) \\ &< 0.\end{aligned}$$

For: $1 - \eta \leq s < 1$,

$$\begin{aligned}(1 + \Delta t\ D^*_{\varepsilon,\eta})h^{l+1}(s^*) &= h^{l+1}(s^*) + \Delta t\ (-\varepsilon h^{l+1}_{ss}(s^*) + p(s^*)h^{l+1}(s^*)) \\ &< 0.\end{aligned}$$

Thus, we conclude a contradiction to the given condition and hence the required estimate follows.

Verification of maximum principle for the operator $(1 + \Delta t\ D^*_{\varepsilon,\eta})$ implies the following estimates:

$$||(1 + \Delta t\ D^*_{\varepsilon,\eta})^{-1}|| \leq \frac{1}{1 + p^*\Delta t}. \tag{10}$$

■

**Theorem 3.1:** *The estimates for global error associated with the method* (8)*, defined by $E^l = y(s, t_l) - Y(s, t_l)$, satisfy $||E^l|| \leq C(\Delta t), \forall\ l \leq T/\Delta t$.*

***Proof:*** Since the function $Y^{l+1}(s)$ possesses

$$(1 + \Delta t\ D^*_{\varepsilon,\eta})Y^{l+1}(s) = g^{l+1}(s). \tag{11}$$

The continuous problem (1)–(2) solution is smooth enough to provide the following

$$\begin{aligned}g^{l+1}(s) &= (1 + \Delta t\ D^*_{\varepsilon,\eta})y^{l+1}(s) + \int_{t_l}^{t_{l+1}} (t_l - \alpha)\frac{\partial^2 y}{\partial t^2}(\alpha)\ \mathrm{d}\alpha \\ &= (1 + \Delta t\ D^*_{\varepsilon,\eta})y^{l+1}(s) + O((\Delta t)^2).\end{aligned} \tag{12}$$

On subtracting (11) from (12) and using the definition of global truncation error $e^{l+1}$ corresponding to (8), we obtain:

$$\begin{aligned}(1+\Delta t\, D^*_{\varepsilon,\eta})E^{l+1} &= O((\Delta t)^2),\\ E^{l+1} &= (1+\Delta t\, D^*_{\varepsilon,\eta})^{-1}O((\Delta t)^2),\\ E^{l+1}(0) = E^{l+1}(1) &= 0. \end{aligned} \tag{13}$$

On using (10) in (13), we obtain

$$||E^{l+1}|| \le C(\Delta t).$$

■

**Lemma 3.2:** *The solution $Y^{l+1}(s)$ of the semi-discrete problem* (8)–(9) *with $p(s)+q(s) \ge p^* > 0$, $s \in \overline{B}$ shows the estimates given by $||Y^{l+1}(s)|| \le ||g||(1+p^*\Delta t)^{-1} + C\max\{||y_1^{l+1}(s)||, ||y_2^{l+1}(s)||\}$, $\forall\, s \in \overline{B}$.*

***Proof:*** To obtain the required estimates, consider the following barrier functions

$$h_\pm^{l+1}(s) = \|g\|(1+p^*\Delta t)^{-1} + C\max\{||y_1^{l+1}(s)||, ||y_2^{l+1}(s)||\} \pm Y^{l+1}(s).$$

Now the motive is to claim the conditions of maximum principle for $h_\pm^{l+1}(s)$.

We have

$$h_\pm^{l+1}(0) \ge 0, \quad h_\pm^{l+1}(1) \ge 0.$$

To get the estimates $(1+\Delta t\, D^*_{\varepsilon,\eta})h_\pm^{l+1}(s) \ge 0$, consider different cases as follows:

For : $0 < s < 1-\eta$,

$$\begin{aligned}(1+\Delta t\, D^*_{\varepsilon,\eta})h_\pm^{l+1}(s) &= h_\pm^{l+1}(s) + \Delta t\,(-\varepsilon(h_\pm^{l+1})_{ss}(s) + p(s)h_\pm^{l+1}(s)\\ &\quad + q(s)h_\pm^{l+1}(s+\eta))\\ &= (||g||(1+p^*\Delta t)^{-1} + C\max\{||y_1^{l+1}(s)||, ||y_2^{l+1}(s)||\})\\ &\quad (1+\Delta t\, p(s) + \Delta t\, q(s)) \pm (g^{l+1}(s))\\ &\ge 0.\end{aligned}$$

For: $1-\eta \le s < 1$,

$$\begin{aligned}(1+\Delta t\, D^*_{\varepsilon,\eta})h_\pm^{l+1}(s) &= h_\pm^{l+1}(s) + \Delta t\,(-\varepsilon(h_\pm^{l+1})_{ss}(s) + p(s)h_\pm^{l+1}(s)\\ &= (||g||(1+p^*\Delta t)^{-1} + C\max\{||y_1^{l+1}(s)||, ||y_2^{l+1}(s)||\})\\ &\quad (1+\Delta t\, p(s)) \pm (g^{l+1}(s) - \Delta t\, q(s)y_2^{l+1}(s+\eta))\\ &\ge 0.\end{aligned}$$

Results of Lemma 3.1 imply the following estimates:

$$||Y^{l+1}(s)|| \le ||g||(1+p^*\Delta t)^{-1} + C\max\{||y_1^{l+1}(s)||, ||y_2^{l+1}(s)||\}, \quad \forall\, s \in \overline{B}.$$

■

To prove the estimates of the next lemma, it has been assumed without loss of generality the interval boundary data given in (9) are identically zero.

**Lemma 3.3:** *The solution of the semi-discrete problem* (8)–(9) *satisfies*

$$\left|(Y^{l+1})^{(i)}(s)\right| \leq C\left(1+\varepsilon^{\frac{-i}{2}}e(s,p^*)\right), \quad s\in\overline{B},\ i=0,1,2,3,4, \tag{14}$$

*where*

$$e(s,p^*)=\exp\left(-s\sqrt{\frac{p^*}{\varepsilon}}\right)+\exp\left(-(1-s)\sqrt{\frac{p^*}{\varepsilon}}\right).$$

***Proof:*** Estimates of (10) yield that $||Y^{l+1}(s)|| \leq C$. Consider the auxiliary problem given as

$$\begin{aligned}(1+\Delta t\, D^*_{\varepsilon,\eta})\beta^{l+1}(s) &= -D^*_{\varepsilon,\eta}Y^l(s)+R^{l+1}(s),\\ \beta^{l+1}(0) &= 0,\\ \beta^{l+1}(s) &= 0, \quad s\in[1,1+\eta].\end{aligned} \tag{15}$$

The solution of the above auxiliary interval boundary value problem (15) is given by

$$\beta^{l+1}(s)=\frac{Y^{l+1}(s)-Y^l(s)}{\Delta t}.$$

Using $|D^*_{\varepsilon,\eta}Y^l(s)| \leq C$ in $\overline{B}$ and (10), we obtain $|\beta^{l+1}(s)| \leq C$ in $\overline{B}$. From (8), we have

$$\begin{aligned}&-\varepsilon Y^{l+1}_{ss}(s)+p(s)Y^{l+1}(s)+q(s)Y^{l+1}(s+\eta)=-\beta^{l+1}(s)+r^{l+1}(s),\\ &Y^{l+1}(0)=y^{l+1}_1(0),\\ &Y^{l+1}(s)=y^{l+1}_2(s), \quad s\in[1,1+\eta].\end{aligned} \tag{16}$$

The result has been true for $i=0$. First, we differentiate the differential Equation (16) $i$ times, to obtain the differential equation satisfied by the derivatives of $Y^{l+1}(s)$. This gives

$$D^*_{\varepsilon,\eta}(Y^{l+1})^{(i)}(s)=r^{l+1}_i(s), \tag{17}$$

where

$$\begin{aligned}&r^{l+1}_0(s)=r^{l+1}(s) \quad \text{and for} \quad i\geq 1, \text{ we have}\\ &r^{l+1}_i(s)=(r^{l+1})^{(i)}(s)-\sum_{k=0}^{i-1}\binom{i}{k}p^{(i-k)}(s)Y^{(k)}(s)+\binom{i}{k}q^{(i-k)}(s)Y^{(k)}(s+\eta).\end{aligned}$$

The inhomogeneous term of the above Equation (17) depends on $i^{th}$ order derivative of $r^{l+1}(s)$, lower-order derivative of $Y^{l+1}(s)$ and $i^{th}$ and lower-order derivatives of $p^{l+1}(s)$ and $q^{l+1}(s)$. This consideration recommends the mathematical induction steps to obtain the required bound. Suppose that for all $m$, $0\leq m\leq i$ the following estimate's hold, i.e.

$$\left|\frac{d^m Y^{l+1}(s)}{ds^m}\right| \leq C\left(1+\varepsilon^{\frac{-m}{2}}e(s,p^*)\right), \quad s\in\overline{B}. \tag{18}$$

and

$$\left|\frac{d^m r^{l+1}(s)}{ds^m}\right| \le C\left(1+\varepsilon^{\frac{-(m-1)}{2}} e(s,p^*)\right), \quad s\in\overline{B}. \tag{19}$$

Consider (18) for particular values of $s$ to get $|(Y^{l+1})^{(m)}(0)| \le C(1+\varepsilon^{-m/2})$ and $|(Y^{l+1})^{(m)}(1)| \le C(1+\varepsilon^{-m/2})$. On using appropriate integrating factor in the differential Equation (17), we get the following equations:

$$\left[\mathrm{e}^{\frac{-H(s)}{\sqrt{\varepsilon}}}\left(z_m'^{\,l+1}(s)+\frac{h(s)}{\sqrt{\varepsilon}}z_m^{l+1}(s)\right)\right]' = \frac{\mathrm{e}^{-H(s)/\sqrt{\varepsilon}}}{\varepsilon}\left[-r_m^{l+1}(s)+h'(s)\sqrt{\varepsilon}z_m^{l+1}(s)\right], \tag{20}$$

$$\left[\mathrm{e}^{\frac{-H(s)}{\sqrt{\varepsilon}}}\left(z_m'^{\,l+1}(s)-\frac{h(s)}{\sqrt{\varepsilon}}z_m^{l+1}(s)\right)\right]' = \frac{\mathrm{e}^{H(s)/\sqrt{\varepsilon}}}{\varepsilon}\left[-r_m^{l+1}(s)-h'(s)\sqrt{\varepsilon}z_m^{l+1}(s)\right]. \tag{21}$$

In the above, we used the following temporary notations:

$$h(s)=\sqrt{p^{l+1}(s)}, \quad H(s)=\int_0^s h(s)\,\mathrm{d}s \quad \text{and} \quad z_m^{l+1}(s)=(Y^{l+1})^{(m)}(s).$$

Then $0<C_1\le h(s)\le C_2$, which implies $C_1 s\le H(s)\le C_2 s$.

Also we have $H'(s)=h(s)$, $H(0)=0$. Now we calculate the estimates for $|(z_i')^{l+1}(0)|$ using the above two relations (20) and (21). By integrating (20) over the interval $[0,s]$ and multiplying by $\mathrm{e}^{\frac{2H(s)}{\sqrt{\varepsilon}}}$ we get

$$\begin{aligned}\left(\mathrm{e}^{\frac{H(x)}{\sqrt{\varepsilon}}}(z_i)^{l+1}(s)\right)' = \mathrm{e}^{\frac{2H(s)}{\sqrt{\varepsilon}}}\Bigg[&(z_i')^{l+1}(0)+\frac{h(0)}{\sqrt{\varepsilon}}(z_i)^{l+1}(0)+\\ &+\frac{1}{\varepsilon}\int_0^x \mathrm{e}^{\frac{-H(a)}{\sqrt{\varepsilon}}}\left((-r_i)^{l+1}(a)+\sqrt{\varepsilon}h'(a)(z_i)^{l+1}(a)+q(a)(z_i)^{l+1}(a+\eta)\right)\mathrm{d}a\Bigg].\end{aligned} \tag{22}$$

On integrating (22) over the interval [0,1] and solve for $z_i'(0,t_{l+1})$, we get

$$\begin{aligned}Z_i'(0,t_{l+1}) = -\frac{h(0,t_l+1)}{\sqrt{\varepsilon}}z_i(0,t_{l+1})+\frac{1}{\int_0^1 \mathrm{e}^{\frac{2H(b)}{\sqrt{\varepsilon}}}\mathrm{d}b}\Bigg[&\mathrm{e}^{\frac{H(1)}{\sqrt{\varepsilon}}}z_i(1,t_{l+1})-z_i(0,t_{l+1})\\ &-\frac{1}{\varepsilon}\int_0^1\int_0^x \mathrm{e}^{\frac{(2H(r)-H(p))}{\sqrt{\varepsilon}}}\left(-r_i,t_{l+1}+\sqrt{\varepsilon}q'(p,t_{l+1})z_i(p,t_{l+1})\right.\\ &\left.+q(p)z_i(p+\eta,t_{l+1})\right)\mathrm{d}p\mathrm{d}r\Bigg].\end{aligned} \tag{23}$$

Using the bounds on '$h$' it is easy to prove that

$$\frac{\mathrm{e}^{\frac{H(1)}{\sqrt{\varepsilon}}}}{\int_0^1 \mathrm{e}^{\frac{2H(r)}{\sqrt{\varepsilon}}}\mathrm{d}r} \le C \tag{24}$$

and

$$\frac{\frac{1}{\varepsilon}\int_0^1\int_0^r \mathrm{e}^{(2H(r)-H(p)/\sqrt{\varepsilon}}\,\mathrm{d}s\,\mathrm{d}r}{\int_0^1 \mathrm{e}^{2H(r)/\sqrt{\varepsilon}}\,\mathrm{d}r} \le \frac{C}{\sqrt{\varepsilon}}. \tag{25}$$

This implies

$$z_i'(0, t_{l+1}) \leq \frac{C}{\varepsilon^{\frac{i+1}{2}}}. \tag{26}$$

Similarly (21) is integrated over the interval $[0, s]$ and then solved for $z_i'(s, t_{l+1})$. Since, we have

$$\int_0^s \mathrm{e}^{-(H(x)-H(r))/\sqrt{\varepsilon}}\, \mathrm{d}r \leq C\sqrt{\varepsilon}. \tag{27}$$

It can be easily deduced that

$$z_i'(s, t_{l+1}) \leq \frac{C}{\varepsilon^{\frac{i+1}{2}}}. \tag{28}$$

Consider two barrier functions defined by

$$\alpha_{i+1}^{\pm}(s, t_{l+1}) = C\left(1 + \frac{e(s, p^*)}{\varepsilon^{(i+1)/2}}\right) \pm z_{i+1}^{l+1}(s), \tag{29}$$

where $C$ is chosen sufficiently large so that the following inequalities are satisfied

$$\alpha_{i+1}^{\pm}(0, t_{l+1}) \geq 0, \quad \alpha_{i+1}^{\pm}(1, t_{l+1}) \geq 0 \tag{30}$$

and

$$\begin{aligned} D_{\varepsilon,\eta}^* \alpha_{i+1}^{\pm}(s, t_{l+1}) &= -\varepsilon(\alpha_{i+1}^{\pm}{}'') + p(s)(\alpha_{i+1}^{\pm}(x)) + q(s)(\alpha_{i+1}^{\pm}(x+\eta)) \\ &= -\varepsilon\, C\left[\frac{e(x, p^*)}{\varepsilon^{\frac{i+1}{2}}}\frac{p^*}{\varepsilon}\right] + Cp(s)\left(1 + \frac{e(x, p^*)}{\varepsilon^{\frac{i+1}{2}}}\right) + Cq(s)\left(1 + \frac{e(x+\eta, p^*)}{\varepsilon^{\frac{i+1}{2}}}\right) \\ &\quad \pm D_\varepsilon z_{i+1}^{l+1}(s) \\ &\geq C\left[(p(s) + q(s)) + (p(s) + q(s) - p^*(x))\frac{e(x, p^*)}{\varepsilon^{i+1/2}}\right] \pm f_{i+1}^{l+1}(s). \\ &\geq 0. \end{aligned} \tag{31}$$

Now using Lemma 3.1 for the barrier functions $\alpha_{i+1}^{\pm}(s, t_{l+1})$, we get

$$\left|z_{i+1}^{l+1}(s)\right| \leq C\left(1 + \varepsilon^{-(i+1)/2} e(x, p^*)\right) \tag{32}$$

and hence the required result is proved. ■

## 4. Non-standard finite difference scheme

Consider the following equation to construct an exact finite difference scheme:

$$-\varepsilon \Delta t\, (Y^{l+1}(s))_{ss} + \hat{p}(s) Y^{l+1}(s) = g^{l+1}(s), \tag{33}$$

where

$$\hat{p}(s) = \Delta t p(s) + 1.$$

For the same purpose, the constant coefficient homogeneous problems for (33) can be written as

$$-\varepsilon \Delta t\, (Y^{l+1}(s))_{ss} + \bar{p} Y^{l+1}(s) = 0. \tag{34}$$

Two linear independent solutions in Equation (34) are, namely, $\exp(\lambda s)$ and $\exp(-\lambda s)$ with

$$\lambda = \sqrt{\frac{\bar{p}}{\varepsilon \Delta t}}. \tag{35}$$

On the spatial domain $[0, 1]$, we introduce a uniform mesh with a spatial step size $h$ such that $\omega_s^N = \{s_i = ih, i = 1, \ldots, N, s_0 = 0, s_N = 1, h = 1/N\}$, where $N$ denotes the number of mesh elements in space direction. We denote the approximate solution to $Y(s)$ at the grid point $s_i$ by $Y_i$.

Our main motive is to calculate a difference equation which has the same general solution as the differential Equation (34) has at the grid point $s_i$ given by $Y_i = c_1 \exp(\lambda s_i) + c_2 \exp(-\lambda s_i)$. Using the theory of difference equations for second-order linear difference equations (see [26]), we have

$$\begin{vmatrix} Y_{i-1} & \exp(\lambda s_{i-1}) & \exp(-\lambda s_{i-1}) \\ Y_i & \exp(\lambda s_i) & \exp(-\lambda s_i) \\ Y_{i+1} & \exp(\lambda s_{i+1}) & \exp(-\lambda s_{i+1}) \end{vmatrix} = 0,$$

which implies

$$\begin{aligned} &Y_{i-1}(\exp(\lambda s_i)\exp(-\lambda s_{i+1}) - \exp(\lambda s_{i+1})\exp(-\lambda s_i)) - Y_i(\exp(\lambda s_{i-1})\exp(-\lambda s_{i+1}) \\ &- \exp(\lambda s_{i+1})\exp(-\lambda s_{i-1})) + Y_{i+1}(\exp(\lambda s_{i-1})\exp(-\lambda s_i) - \exp(\lambda s_i)\exp(-\lambda s_{i-1})) = 0, \end{aligned} \tag{36}$$

or equivalently

$$Y_{i-1}^{l+1} - 2\cos h\left(h\sqrt{\frac{\bar{p}}{\varepsilon \Delta t}}\right) Y_i^{l+1} + Y_{i+1}^{l+1} = 0. \tag{37}$$

Equation (37) is an exact difference scheme for (34).

Applying simple algebric calculations on (37) to get the following dynamically consistent scheme for (33)

$$-\varepsilon \Delta t \frac{Y_{i+1}^{l+1} + Y_{i-1}^{l+1} - 2Y_i^{l+1}}{\frac{4}{\lambda_i^2}\sinh^2\frac{\lambda_i h}{2}} + \hat{p}(s_i)\, Y_i^{l+1} = g_i^{l+1}, \tag{38}$$

where

$$\lambda_i = \pm\sqrt{\frac{\hat{p}(s_i)}{\varepsilon \Delta t}}. \tag{39}$$

## 5. Spatial discretization on a special mesh

Consider Equations (8) and (9) at a fixed node $(s_i, t_{l+1})$ given by

$$\begin{aligned} &Y^{l+1}(s_i) - \varepsilon \Delta t Y_{ss}^{l+1}(s_i) + \Delta t\, p(s_i) Y^{l+1}(s_i) + \Delta t q(s_i) Y^{l+1}(s_i + \eta) \\ &\quad = \Delta t r^{l+1}(s_i) + Y^l(s_i). \end{aligned} \tag{40}$$

It is not possible to write a spatial discretization for the problem (40) due to the spatial shift term. To get rid of this problem, a special uniform mesh has been constructed with step size '$h$' such that $s_i + \eta$ coincides with mesh points. At $(s_i, t_{l+1})$, (40) can be written as

$$-\varepsilon \Delta t\, Y_{ss}^{l+1}(s_i) + \hat{p}(s_i) Y^{l+1}(s_i) + \Delta t q(s_i) Y^{l+1}(s_i + jh) = \Delta t r^{l+1}(s_i) + Y^l(s_i), \tag{41}$$

where $1 \le j \le N$.

The approximation of (41) using the non-standard scheme developed in (38) is as follows:

$$-\varepsilon\Delta t\left(\frac{\hat{Y}_{i+1}^{l+1}+\hat{Y}_{i-1}^{l+1}-2\hat{Y}_{i}^{l+1}}{\gamma_i^2}\right)+\hat{p}_i\hat{Y}_i^{l+1}+\Delta t q_i\hat{Y}_{i+j}^{l+1}=\Delta t r_i^{l+1}+\hat{Y}_i^l, \tag{42}$$

where

$$\gamma_i^2=\gamma_i^2(h,\varepsilon)=\frac{4}{\lambda_i^2}\sinh^2\frac{\lambda_i h}{2}, \tag{43}$$

where

$$\lambda_i=\pm\sqrt{\frac{\Delta t(p(s_i)+q(s_i))+1}{\varepsilon\Delta t}}. \tag{44}$$

Finally a full discretized problem is obtained and can be written as follows:

$$D^{N,M}\hat{Y}_i^{l+1}=g_i^{l+1}, \tag{45}$$

where

$$D^{N,M}\hat{Y}_i^{l+1}\equiv\begin{cases}-\varepsilon\Delta t\left(\frac{h^2D_s^+D_s^-\hat{Y}_i^{l+1}}{\gamma_i^2}\right)+ & \hat{p}_i\hat{Y}_i^{l+1}+\Delta t\, q_i\hat{Y}_{i+j}^{l+1},\\ & \text{if } i=1,2,\ldots,N-j-1, l+1=1,2,\ldots,M,\\ -\varepsilon\Delta t\left(\frac{h^2D_s^+D_s^-\hat{Y}_i^{l+1}}{\gamma_i^2}\right)+ & \hat{p}_i\hat{Y}_i^{l+1},\\ & \text{if } i=N-l,N-j+1,\ldots,N-1, l+1=1,2,\ldots,M,\end{cases}$$

$$D_s^+D_s^-\hat{Y}_i^{l+1}=\frac{\hat{Y}_{i+1}^{l+1}-2\hat{Y}_i^{l+1}+\hat{Y}_{i-1}^{l+1}}{h^2},\quad D_s^-\hat{Y}_i^{l+1}=\frac{\hat{Y}_i^{l+1}-\hat{Y}_{i-1}^{l+1}}{h},$$

$$q_i=q(s_i),\quad \hat{p}_i=\hat{p}(s_i,),\quad g_i^{l+1}=g^{l+1}(s_i),$$

and is subject to the following initial and interval boundary conditions:

$$\begin{aligned}&\hat{Y}_i^0=y_o(s_i),\quad i=0,1,2,\ldots,N,\\ &\hat{Y}_i^{l+1}=(y_1)_i^{l+1},\quad i=0,\quad l+1=1,2,\ldots,M,\quad \hat{Y}_0^0=(y_1)_0^0,\\ &\hat{Y}_i^{l+1}=(y_2)_i^{l+1},\quad \hat{Y}_i^0=(y_2)_i^0,\ i=N,N+1,\ldots,N+j,\quad l+1=1,2,\ldots,M.\end{aligned} \tag{46}$$

**Remark 5.1:** The solution behaviour of the differential Equations (33) and (8) is similar. Because the denominator function used in (38) has been opted as above.

**Lemma 5.1:** *Suppose* $\alpha_0^{l+1}\geq 0, \alpha_N^{l+1}\geq 0$ *then* $D^{N,M}\alpha_i^{l+1}\geq 0, \forall\, i=1,2,\ldots,N-1$ *implies* $\alpha_i^{l+1}\geq 0$, $\forall\, i=0,1,\ldots,N$.

***Proof:*** The steps of Lemma 3.1 follow the proof. ■

**Lemma 5.2:** *The solution* $\hat{Y}_i^{l+1}$ *of the discrete problem* (45)–(46) *at* $(l+1)$*th time level and* $p^*=\min_{0\leq i\leq N}\{p_i+q_i\}$ *satisfies* $||\hat{Y}_i^{l+1}||\leq||g||(1+p^*\Delta t)^{-1}+C\max\{||(y_1)_i^{l+1}||,||(y_2)_i^{l+1}||\}$, $i=0,1,\ldots,N$.

***Proof:*** The same methodology as in Lemma 3.2 gives the required proof. ■

**Lemma 5.3:** *If $Z_i^{l+1}$ be any mesh function such that $Z_0^{l+1} = Z_N^{l+1} = 0$. Then*

$$|z_i^{l+1}| \leq \frac{1}{1+p^*\Delta t} \max_{1\leq k\leq N-1} |D^{N,M} Z_k^{l+1}|.$$

***Proof*:** To obtain the required estimates, consider barrier functions given by

$$(\chi^{\pm})_i^{l+1} = P \pm Z_i^{l+1}.$$

In the above we used

$$P = \frac{1}{1+p^*\Delta t} \max_{1\leq k\leq N-1} \left| D^{N,M} Z_k^{l+1} \right|.$$

Note that $(\chi^{\pm})_0^{l+1} \geq 0,\ (\chi^{\pm})_N^{l+1} \geq 0.$

Consider

$$D^{N,M}(P \pm Z_i^{l+1}) \equiv \begin{cases} \pm D^{N,M} Z_i^{l+1} + \frac{(1+\Delta t\ (p_i+q_i))}{1+p^*\Delta t} \max\limits_{1\leq k\leq N-1} |D^{N,M} Z_k^{l+1}| \\ \quad \text{if } i = 1, 2, \ldots, N-k-1, l+1 = 1, 2, \ldots, M, \\ \pm D^{N,M} Z_i^{l+1} + \frac{(1+\Delta t\ p_i)}{1+p^*\Delta t} \max\limits_{1\leq k\leq N-1} |D^{N,M} Z_k^{l+1}|, \\ \quad \text{if } i = N-l, N-k+1, \ldots, N-1, l+1 = 1, 2, \ldots, M. \end{cases} \tag{47}$$

Now, an application of Lemma 5.1 yields

$$|Z_i^{l+1}| \leq \frac{1}{(1+p^*\Delta t)} \max_{1\leq j\leq N-1} |D^{N,M} Z_j^{l+1}|.$$

■

## 6. Parameter uniform convergence analysis

The fully discrete scheme corresponding to the problem (8) using the techniques of (45) can be written as follows:

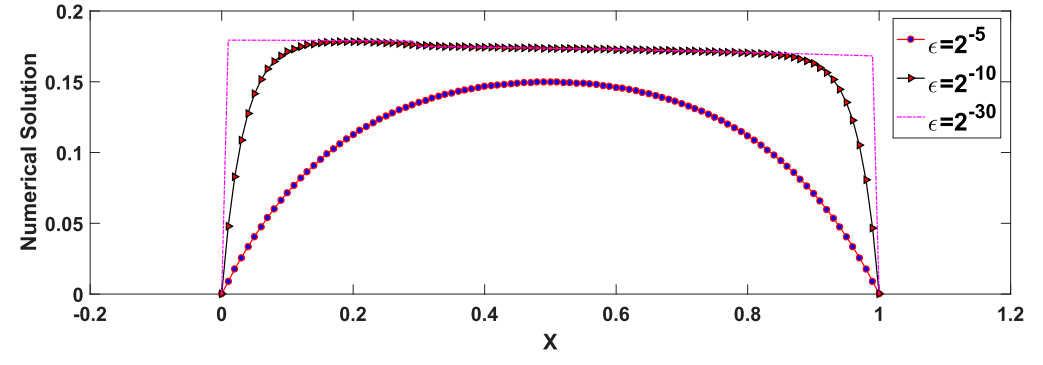
$$-\varepsilon\Delta t \left( \frac{h^2 D_s^+ D_s^- \hat{Y}_i^{l+1}}{{\gamma_i}^2} \right) + p_i \hat{Y}_i^{l+1} + \Delta t\, q_i \hat{Y}_{i+j}^{l+1} = \Delta t r_i^{l+1} + \hat{Y}_i^l, \tag{48}$$

with the following conditions:

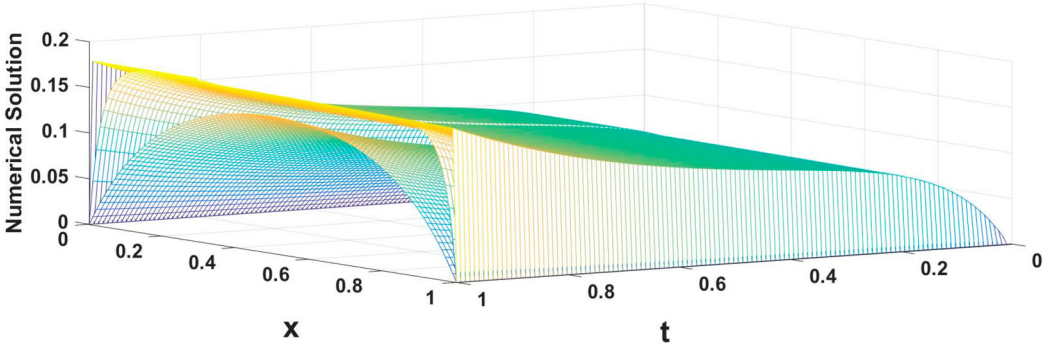
$$\begin{aligned} \hat{Y}_i^0 &= y_o(s_i), \quad i = 0, 1, 2, \ldots, N, \\ \hat{Y}_i^{l+1} &= (y_1)_i^{l+1}, \quad i = 0,\ l+1 = 1, 2, \ldots, M,\ \hat{Y}_0^0 = (y_1)_0^0, \\ \hat{Y}_i^{l+1} &= (y_2)_i^{l+1}, \quad \hat{Y}_i^0 = (y_2)_i^0, \quad i = N, N+1, \ldots, N+j,\ l+1 = 1, 2, \ldots, M. \end{aligned} \tag{49}$$

**Theorem 6.1:** *Let $g^{l+1}(s)$ be sufficiently smooth functions so that $Y^{l+1}(s) \in C^4[0,1]$. Then the numerical solution $Y_i^{l+1}$ is obtained by the NSFDM in* (45)–(46) *satisfying the estimate*

$$|D^{N,M}(Y^{l+1}(s_i) - \hat{Y}_i^{l+1})| \leq Ch^2 \left[ 1 + \sup_{s\in(0,1)} \frac{e(s,p^*)}{\varepsilon^2} \right], \tag{50}$$




(a)




(b)

**Figure 1.** Example 7.1, plots for the numerical solution $\hat{Y}_{i,j}$ taking $N = 100$, $M = 120$, $\eta = 0.7$ and distinct values of $\varepsilon$ (a) $\hat{Y}_{i,j}$ at final time level (b) 3-D view of $\hat{Y}_{i,j}$.

*where*

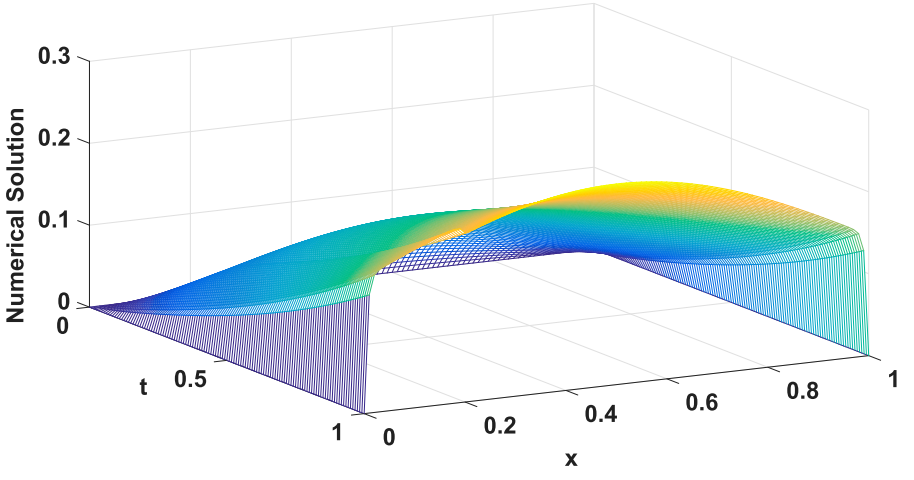
$$e(s, p^*) = \exp\left(-s\sqrt{\frac{p^*}{\varepsilon}}\right) + \exp\left(-(1-s)\sqrt{\frac{p^*}{\varepsilon}}\right).$$

***Proof:*** Consider

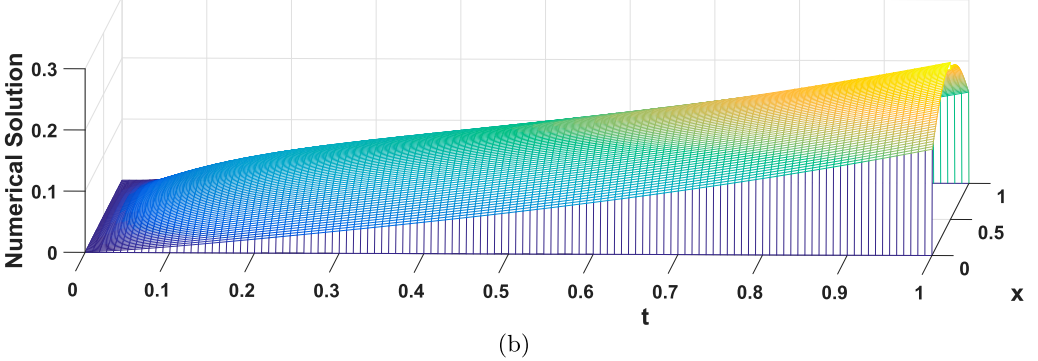
$$\begin{aligned}
&|D^{N,M}(Y^{l+1}(s_i) - \hat{Y}_i^{l+1})| \\
&= |D^{N,M}Y^{l+1}(s_i) - [(1 + \Delta t\, D^*_{\varepsilon,\eta})Y(s,t)]_{s=s_i,t=t_{l+1}}| \\
&\le C\,|-\varepsilon\left(Y_{ss}^{l+1}(s_i) - \frac{D_s^+ D_s^- h^2}{{\gamma_i}^2} Y^{l+1}(s_i)\right) \\
&\le C\varepsilon |{Y_{ss}}^{l+1}(s_i) - D_s^+ D_s^- Y^{l+1}(s_i)| \\
&\quad + C\varepsilon\left|\left(\frac{h^2}{\gamma_i^2} - 1\right) D_s^+ D_s^- Y^{l+1}(s_i)\right| \\
&\le C\varepsilon h^2(|({Y_{ssss}})^{l+1}(\chi_1)| + |{Y_{ssss}}^{l+1}(\chi_2)|) + Ch^2|{Y_{ss}}^{l+1}(\chi_3)|,
\end{aligned}$$

which gives

$$|D^{N,M}(Y^{l+1}(s_i) - \hat{Y}_i^{l+1})| \le Ch^2\varepsilon(|{Y_{ssss}}^{l+1}(\chi_1)| + |{Y_{ssss}}^{l+1}(\chi_2)|) + Ch^2|{Y_{ss}}^{l+1}(\chi_3)|, \tag{51}$$




(a)




(b)

**Figure 2.** Example 7.2, plots for the numerical solution $\hat{Y}_{ij}$ taking $N = 100, M = 120$ (a) for $\eta = 0.8$ and $\varepsilon = 2^{-14}$ (b) for $\eta = 0.5$ and $\varepsilon = 2^{-30}$.

where $s_{i-1} \le \chi_j \le s_{i+1}$ for $j = 1, 2, 3, 4$. From (51) and estimates of Lemma 3.3, we get

$$\begin{aligned} |D^{N,M}(Y^{l+1}(s_i) - \hat{Y}_i^{l+1})| &\le C\varepsilon h^2 \left|\left(1 + \varepsilon^{-2} e(\chi_1, p^*)\right)\right| \\ &\quad + C\varepsilon h^2 \left|\left(1 + \varepsilon^{-2} e(\chi_2, p^*)\right)\right| \\ &\quad + Ch^2 \left|\left(1 + \varepsilon^{-1} e(\chi_3, p^*)\right)\right| \\ &\le Ch^2 \left[1 + \sup_{s\in(0,1)} \frac{e(s, p^*)}{\varepsilon^2}\right]. \quad [\text{using } \varepsilon^{-1} < \varepsilon^{-2}] \end{aligned} \tag{52}$$

■

**Lemma 6.1** ([4]): *For a fixed mesh and $\varepsilon \to 0$, we have*

$$\lim_{\varepsilon\to 0} \max_{1\le i\le N-1} \frac{e(s_i, p^*)}{\varepsilon^m} = 0, \quad \forall\, m \in \mathbf{Z}^+,$$

*where $x_i = ih$, $h = 1/N$, $\forall\, i = 1(1)N - 1$.*

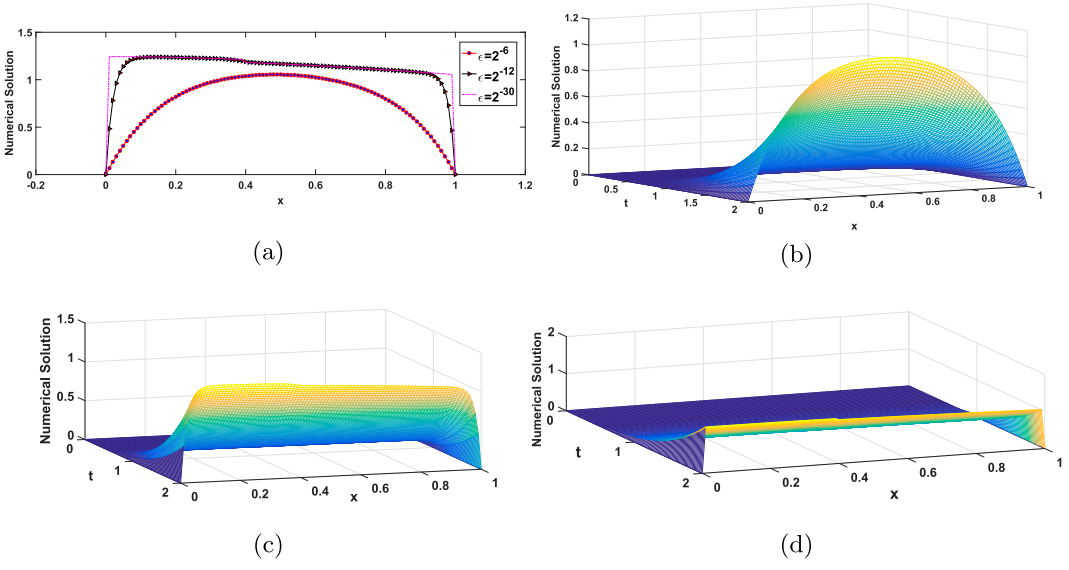



**Figure 3.** Example 7.2, plots for the numerical solution $\hat{Y}_{i,j}$ taking $N = 100$, $M = 120$ and $\eta = 0.6$ (a) $\hat{Y}_{i,j}$ at final time level for different values of $\varepsilon$ (b) surface plot for $\varepsilon = 2^{-6}$ (c) surface plot for $\varepsilon = 2^{-12}$ (D) surface plot for $\varepsilon = 2^{-30}$.

**Table 1.** Example 7.1, calculated results for $E_{\varepsilon}^{N,\Delta t}$ and $P_{\varepsilon}^{N,\Delta t}$ taking $\eta = 0.7$.

| $\varepsilon$ | $N = 30$<br>$M = 16$ | $N = 60$<br>$M = 64$ | $N = 120$<br>$M = 256$ | $N = 240$<br>$M = 1024$ | $N = 480$<br>$M = 4096$ |
|---|---|---|---|---|---|
| $2^{-2}$ | 1.356818e-02<br>1.210295 | 5.863901e-03<br>1.748998 | 1.744559e-03<br>1.919101 | 4.612950e-04<br>1.995960 | 1.156472e-04 |
| $2^{-4}$ | 3.794647e-03<br>1.316044 | 1.524062e-03<br>1.789462 | 4.408808e-04<br>1.930659 | 1.156472e-04<br>1.998989 | 2.893206e-05 |
| $2^{-6}$ | 9.767884e-04<br>1.343965 | 3.847926e-04<br>1.799776 | 1.105198e-04<br>1.933564 | 2.893206e-05<br>1.999747 | 7.234283e-06 |
| $2^{-8}$ | 2.460068e-04<br>1.351045 | 9.643660e-05<br>1.802367 | 2.764873e-05<br>1.934291 | 7.234283e-06<br>1.999937 | 1.808650e-06 |
| $2^{-10}$ | 6.161562e-05<br>1.352822 | 2.412409e-05<br>1.803016 | 6.913358e-06<br>1.934473 | 1.808650e-06<br>1.999984 | 4.521675e-07 |
| $2^{-12}$ | 1.541104e-05<br>1.353266 | 6.031957e-06<br>1.803178 | 1.728413e-06<br>1.934519 | 4.521675e-07<br>1.999996 | 1.130422e-07 |
| $2^{-14}$ | 3.853206e-06<br>1.353377 | 1.508048e-06<br>1.803219 | 4.321078e-07<br>1.934530 | 1.130422e-07<br>1.999999 | 2.826056e-08 |
| $2^{-16}$ | 9.633294e-07<br>1.353405 | 3.770156e-07<br>1.803229 | 1.080272e-07<br>1.934533 | 2.826056e-08<br>2.000000 | 7.065142e-09 |
| $2^{-18}$ | 2.408341e-07<br>1.353412 | 9.425412e-08<br>1.803232 | 2.700683e-08<br>1.934534 | 7.065142e-09<br>2.000000 | 1.766286e-09 |
| $2^{-20}$ | 6.020863e-08<br>1.353414 | 2.356354e-08<br>1.803232 | 6.751708e-09<br>1.934534 | 1.766286e-09<br>2.000000 | 4.415714e-10 |
| $2^{-22}$ | 1.505216e-08<br>1.353414 | 5.890887e-09<br>1.803232 | 1.687927e-09<br>1.934534 | 4.415714e-10<br>2.000000 | 1.103929e-10 |
| $2^{-24}$ | 3.763042e-09<br>1.353414 | 1.472722e-09<br>1.803232 | 4.219818e-10<br>1.934534 | 1.103929e-10<br>2.000000 | 2.759821e-11 |
| $2^{-26}$ | 9.407604e-10<br>1.353414 | 3.681804e-10<br>1.803232 | 1.054954e-10<br>1.934534 | 2.759821e-11<br>2.000000 | 6.899554e-12 |
| $2^{-28}$ | 2.351901e-10<br>1.353414 | 9.204511e-11<br>1.803232 | 2.637386e-11<br>1.934534 | 6.899554e-12<br>2.000000 | 1.724888e-12 |
| $2^{-30}$ | 5.879753e-11<br>1.353414 | 2.301128e-11<br>1.803232 | 6.593465e-12<br>1.934534 | 1.724888e-12<br>2.000000 | 4.312221e-13 |

**Table 2.** Example 7.2, calculated estimates for $E_{\varepsilon}^{N,\Delta t}$ and $P_{\varepsilon}^{N,\Delta t}$ taking $\eta = 0.8$.

| $\varepsilon$ | $N = 30$<br>$M = 16$ | $N = 60$<br>$M = 64$ | $N = 120$<br>$M = 256$ | $N = 240$<br>$M = 1024$ | $N = 480$<br>$M = 4096$ |
|---|---|---|---|---|---|
| $2^{-2}$ | 1.723161e-02<br>1.219998 | 7.397243e-03<br>1.753033 | 2.194594e-03<br>1.920393 | 5.797736e-04<br>1.996180 | 1.453277e-04 |
| $2^{-4}$ | 4.794695e-03<br>1.321298 | 1.918716e-03<br>1.791430 | 5.542894e-04<br>1.931330 | 1.453277e-04<br>1.999044 | 3.635600e-05 |
| $2^{-6}$ | 1.232514e-03<br>1.321298 | 4.841830e-04<br>1.791430 | 1.389286e-04<br>1.931330 | 3.635600e-05<br>1.999044 | 9.090506e-06 |
| $2^{-8}$ | 3.103027e-04<br>1.347979 | 1.213299e-04<br>1.801208 | 3.475449e-05<br>1.934079 | 9.090506e-06<br>1.999761 | 2.272721e-06 |
| $2^{-10}$ | 7.771251e-05<br>1.354740 | 3.035029e-05<br>1.803664 | 8.690018e-06<br>1.934767 | 2.272721e-06<br>1.999940 | 5.681860e-07 |
| $2^{-12}$ | 1.943669e-05<br>1.356437 | 7.588686e-06<br>1.804279 | 2.172592e-06<br>1.934939 | 5.681860e-07<br>1.999985 | 1.420469e-07 |
| $2^{-14}$ | 4.859709e-06<br>1.356861 | 1.897241e-06<br>1.804433 | 5.431534e-07<br>1.934982 | 1.420469e-07<br>1.999996 | 3.551174e-08 |
| $2^{-16}$ | 1.214961e-06<br>1.356967 | 4.743146e-07<br>1.804471 | 1.357887e-07<br>1.934993 | 3.551174e-08<br>1.999999 | 8.877937e-09 |
| $2^{-18}$ | 3.037423e-07<br>1.356994 | 1.185789e-07<br>1.804481 | 3.394719e-08<br>1.934995 | 8.877937e-09<br>2.000000 | 2.219484e-09 |
| $2^{-20}$ | 7.593570e-08<br>1.357000 | 2.964475e-08<br>1.804483 | 8.486799e-09<br>1.934996 | 2.219484e-09<br>2.000000 | 5.548711e-10 |
| $2^{-22}$ | 1.898393e-08<br>1.357002 | 7.411188e-09<br>1.804484 | 2.121700e-09<br>1.934996 | 5.548711e-10<br>2.000000 | 1.387178e-10 |
| $2^{-24}$ | 4.745984e-09<br>1.357002 | 1.852797e-09<br>1.804484 | 5.304250e-10<br>1.934996 | 1.387178e-10<br>2.000000 | 3.467944e-11 |
| $2^{-26}$ | 1.186496e-09<br>1.357002 | 4.631993e-10<br>1.804484 | 1.326062e-10<br>1.934996 | 3.467944e-11<br>2.000000 | 8.669861e-12 |
| $2^{-28}$ | 2.966240e-10<br>1.357002 | 1.157998e-10<br>1.804484 | 3.315156e-11<br>1.934996 | 8.669861e-12<br>2.000000 | 2.167465e-12 |
| $2^{-30}$ | 7.415600e-11<br>1.357002 | 2.894995e-11<br>1.804484 | 8.287891e-12<br>1.934996 | 2.167465e-12<br>2.000000 | 5.418663e-13 |

An application of Lemma 5.3 to the mesh function $Y^{l+1}(s_i) - Y_i^{l+1}$ in Theorem 6.1 and then using Lemma 6.1 imply the estimates of the following theorem.

**Theorem 6.2:** *Under the hypothesis of Theorem* 6.1 *and Lemma* 6.1, *we have*

$$\sup_{0 \ll \varepsilon \leq 1} \| Y^{l+1}(s_i) - Y_i^{l+1} \|_{\omega_s^N \times \omega_t^M} \leq CN^{-2}. \tag{53}$$

**Theorem 6.3:** *Let y(s,t) and* $\hat{Y}_i^l$ *be the solutions of the continuous problem* (1)–(2) *and* (48)–(49), *respectively. The assumptions of Lemma* 3.1 *and Theorem* 6.2 *yield:*

$$\sup_{0 \ll \varepsilon \leq 1} \| y(s_i, t_l) - \hat{Y}_i^l \|_{\omega_s^N \times \omega_t^M} \leq C(N^{-2} + \Delta t).$$

## 7. Numerical illustration

Consider the following problems:

**Example 7.1:**

$$y_t - \varepsilon y_{ss} + \left(\frac{s^2}{2} + 10\right) y(s,t) - \frac{1}{4} y(s+\eta, t) = t^3 + 1; (s,t) \in (0,1) \times (0,1]$$

$$y(s,0) = 0, \quad \forall\, s \in \overline{B},$$

**Table 3.** Example 7.3, calculated estimates for $E_{\varepsilon}^{N,\Delta t}$ and $P_{\varepsilon}^{N,\Delta t}$ taking $\eta = 0.6$.

| $\varepsilon$ | $N = 30$<br>$M = 16$ | $N = 60$<br>$M = 64$ | $N = 120$<br>$M = 256$ | $N = 240$<br>$M = 1024$ | $N = 480$<br>$M = 4096$ |
|---|---|---|---|---|---|
| $2^{-2}$ | 5.859695e-02<br>1.242431 | 2.476657e-02<br>1.761321 | 7.305589e-03<br>1.922091 | 1.927739e-03<br>1.997549 | 4.827541e-04 |
| $2^{-4}$ | 1.568103e-02<br>1.306600 | 6.339407e-03<br>1.785886 | 1.838414e-03<br>1.929102 | 4.827541e-04<br>1.999387 | 1.207398e-04 |
| $2^{-6}$ | 3.989164e-03<br>1.323157 | 1.594307e-03<br>1.792096 | 4.603596e-04<br>1.930860 | 1.207398e-04<br>1.999847 | 3.018816e-05 |
| $2^{-8}$ | 1.001671e-03<br>1.327330 | 3.991712e-04<br>1.793653 | 1.151372e-04<br>1.931300 | 3.018816e-05<br>1.999962 | 7.547241e-06 |
| $2^{-10}$ | 2.506928e-04<br>1.328375 | 9.983000e-05<br>1.794043 | 2.878727e-05<br>1.931410 | 7.547241e-06<br>1.999990 | 1.886823e-06 |
| $2^{-12}$ | 6.269039e-05<br>1.328636 | 2.495983e-05<br>1.794140 | 7.197001e-06<br>1.931437 | 1.886823e-06<br>1.999998 | 4.717065e-07 |
| $2^{-14}$ | 1.567367e-05<br>1.328702 | 6.240102e-06<br>1.794164 | 1.799262e-06<br>1.931444 | 4.717065e-07<br>1.999999 | 1.179267e-07 |
| $2^{-16}$ | 3.918486e-06<br>1.328718 | 1.560035e-06<br>1.794171 | 4.498162e-07<br>1.931446 | 1.179267e-07<br>2.000000 | 2.948167e-08 |
| $2^{-18}$ | 9.796256e-07<br>1.328722 | 3.900092e-07<br>1.794172 | 1.124541e-07<br>1.931446 | 2.948167e-08<br>2.000000 | 7.370417e-09 |
| $2^{-20}$ | 2.449067e-07<br>1.328723 | 9.750234e-08<br>1.794172 | 2.811353e-08<br>1.931446 | 7.370417e-09<br>2.000000 | 1.842604e-09 |
| $2^{-22}$ | 6.122668e-08<br>1.328724 | 2.437559e-08<br>1.794173 | 7.028382e-09<br>1.931446 | 1.842604e-09<br>2.000000 | 4.606511e-10 |
| $2^{-24}$ | 1.530667e-08<br>1.328724 | 6.093897e-09<br>1.794173 | 1.757095e-09<br>1.931446 | 4.606511e-10<br>2.000000 | 1.151628e-10 |
| $2^{-26}$ | 3.826668e-09<br>1.328724 | 1.523474e-09<br>1.794173 | 4.392739e-10<br>1.931446 | 1.151628e-10<br>2.000000 | 2.879069e-11 |
| $2^{-28}$ | 9.566670e-10<br>1.328724 | 3.808686e-10<br>1.794173 | 1.098185e-10<br>1.931446 | 2.879069e-11<br>2.000000 | 7.197673e-12 |
| $2^{-30}$ | 2.391668e-10<br>1.328724 | 9.521714e-11<br>1.794173 | 2.745462e-11<br>1.931446 | 7.197673e-12<br>2.000000 | 1.799418e-12 |

$$y(s,t) = 0, \quad \forall\, (s,t) \in \omega_1 = \{(s,t) : s = 0 \text{ and } t \in [0,T]\},$$
$$y(s,t) = 0, \quad \forall\, (s,t) \in \omega_2 = \{(s,t) : s \in [1, 1+\eta] \text{ and } t \in [0,T]\}.$$

**Example 7.2:**

$$y_t - \varepsilon y_{ss} + (10 + 0.1\, sin\pi s)\, y(s,t) - y(s+\eta,t) = \mathrm{e}^t - 1 + sin\pi s; (s,t) \in (0,1) \times (0,1]$$
$$y(s,0) = 0, \quad \forall\, s \in \overline{B},$$
$$y(s,t) = 0, \quad \forall\, (s,t) \in \omega_1 = \{(s,t) : s = 0 \text{ and } t \in [0,T]\},$$
$$y(s,t) = 0, \quad \forall\, (s,t) \in \omega_2 = \{(s,t) : s \in [1, 1+\eta] \text{ and } t \in [0,T]\}.$$

**Example 7.3:**

$$y_t - \varepsilon y_{ss} + \left(s^2 + 5\right) y(s,t) - \frac{1}{5} y(s+\eta,t) = t^3; (s,t) \in (0,1) \times (0,2]$$
$$y(s,0) = 0, \quad \forall\, s \in \overline{B},$$
$$y(s,t) = 0, \quad \forall\, (s,t) \in \omega_1 = \{(s,t) : s = 0 \text{ and } t \in [0,T]\},$$
$$y(s,t) = 0, \quad \forall\, (s,t) \in \omega_2 = \{(s,t) : s \in [1, 1+\eta] \text{ and } t \in [0,T]\}.$$

**Example 7.4:**

$$y_t - \varepsilon y_{ss} + \left(s^2 + 3\right) y(s,t) - y(s+\eta,t) = -5\, \mathrm{e}^{t-s}; (s,t) \in (0,1) \times (0,2]$$

**Table 4.** Example 7.4, calculated results for $E_{\varepsilon}^{N,\Delta t}$ and $P_{\varepsilon}^{N,\Delta t}$ taking $\eta = 0.6$.

| $\varepsilon$ | $N = 30$<br>$M = 16$ | $N = 60$<br>$M = 64$ | $N = 120$<br>$M = 256$ | $N = 240$<br>$M = 1024$ | $N = 480$<br>$M = 4096$ |
|---|---|---|---|---|---|
| $2^{-2}$ | 3.070876e-01 | 1.105457e-01 | 3.071527e-02 | 7.894648e-03 | 1.987622e-03 |
| | 1.474007 | 1.847615 | 1.960009 | 1.989832 | |
| $2^{-4}$ | 7.919803e-02 | 2.790656e-02 | 7.698810e-03 | 1.987622e-03 | 4.969880e-04 |
| | 1.504860 | 1.857897 | 1.953592 | 1.999760 | |
| $2^{-6}$ | 1.995582e-02 | 6.993688e-03 | 1.925955e-03 | 4.969880e-04 | 1.242522e-04 |
| | 1.512684 | 1.860479 | 1.954291 | 1.999940 | |
| $2^{-8}$ | 4.998801e-03 | 1.749490e-03 | 4.815671e-04 | 1.242522e-04 | 3.106336e-05 |
| | 1.514648 | 1.861126 | 1.954466 | 1.999985 | |
| $2^{-10}$ | 1.250317e-03 | 4.374393e-04 | 1.203967e-04 | 3.106336e-05 | 7.765866e-06 |
| | 1.515139 | 1.861287 | 1.954510 | 1.999995 | |
| $2^{-12}$ | 3.126177e-04 | 1.093640e-04 | 3.009948e-05 | 7.765866e-06 | 1.941464e-06 |
| | 1.515262 | 1.861328 | 1.954520 | 2.000002 | |
| $2^{-13}$ | 1.563121e-04 | 5.468235e-05 | 1.504976e-05 | 3.858206e-06 | 9.707340e-07 |
| | 1.515282 | 1.861335 | 1.963739 | 1.990782 | |
| $2^{-14}$ | 7.815684e-05 | 2.734126e-05 | 7.524888e-06 | 1.941464e-06 | 4.853625e-07 |
| | 1.515292 | 1.861338 | 1.954525 | 2.000010 | |
| $2^{-15}$ | 3.907862e-05 | 1.367065e-05 | 3.762446e-06 | 9.707340e-07 | 2.426862e-07 |
| | 1.515297 | 1.861340 | 1.954523 | 1.999984 | |
| $2^{-16}$ | 1.953936e-05 | 6.835333e-06 | 1.881224e-06 | 4.853625e-07 | 1.213344e-07 |
| | 1.515300 | 1.861340 | 1.954537 | 2.000074 | |
| $2^{-18}$ | 4.884850e-06 | 1.708834e-06 | 4.703061e-07 | 1.213344e-07 | 3.033984e-08 |
| | 1.515302 | 1.861340 | 1.954611 | 1.999703 | |
| $2^{-20}$ | 1.221213e-06 | 4.272088e-07 | 1.175762e-07 | 3.033984e-08 | 7.659661e-09 |
| | 1.515302 | 1.861345 | 1.954311 | 1.985861 | |
| $2^{-22}$ | 3.053034e-07 | 1.068021e-07 | 2.939406e-08 | 7.659661e-09 | 1.824818e-09 |
| | 1.515304 | 1.861343 | 1.940172 | 2.069528 | |
| $2^{-24}$ | 7.632578e-08 | 2.670043e-08 | 7.348644e-09 | 1.902315e-09 | 5.391492e-10 |
| | 1.515308 | 1.861313 | 1.949722 | 1.819000 | |
| $2^{-26}$ | 1.908160e-08 | 6.674888e-09 | 1.836813e-09 | 5.391492e-10 | 1.496971e-10 |
| | 1.515366 | 1.861539 | 1.768449 | 1.848638 | |

$$y(s,0) = s^3(1-s)^3, \quad \forall\, s \in \overline{B},$$
$$y(s,t) = t^2, \quad \forall\, (s,t) \in \omega_1 = \{(s,t) : s = 0 \text{ and } t \in [0,T]\},$$
$$y(s,t) = st^3, \quad \forall\, (s,t) \in \omega_2 = \{(s,t) : s \in [1,1+\eta] \text{ and } t \in [0,T]\}.$$

In this section, we consider the above numerical examples to verify the theoretical results. The motive of this section is to present numerical results to support the presented theory. It is not feasible to write the exact solution for the differential-difference problems. As an order of convergence is different in spatial and temporal directions, that is why a variant of double mesh principle has been employed to get the required numerical results for maximum point-wise error and rate of convergence. To highlight the results for spatial direction, temporal mesh intervals have been increased four-fold and doubled the spatial mesh intervals. The estimates for maximum point-wise error $E_{\varepsilon}^{N,\Delta t}$ in spatial direction have been calculated by using the following equation:

$$E_{\varepsilon}^{N,\Delta t} = \max_{0 \le i,j \le N,M} |\hat{U}_{i,j}^{N,\Delta t} - \hat{U}_{i,j}^{2N,\frac{\Delta t}{4}}|, \tag{54}$$

where $\hat{U}_{i,j}^{N,\Delta t}$ is the numerical solution obtained using $N$, $M$ mesh intervals in space and time direction, respectively. But $\hat{U}_{i,j}^{2N,\frac{\Delta t}{4}}$, is due to $2N$ and $4M$ mesh intervals. Then we calculate the rate of convergence $P_{\varepsilon}^{N,\Delta t}$ in spatial direction by using the following equation:

$$P_{\varepsilon}^{N,\Delta t} = \frac{log(E_{\varepsilon}^{N,\Delta t}/E_{\varepsilon}^{2N,\Delta t/4})}{\log 2}. \tag{55}$$

Quadratic convergent in spatial direction has been verified through numerical results. The consistency of these results without having any dependency on the values of $\eta$ has been shown in the tables. The calculated results in Tables 1–3 corroborate the robustness of the numerical scheme, i.e. it works well for all combinations for the values of $h$ and $\varepsilon$. In Table 4, parameter uniform results have been shown for a numerical example where the initial condition depends on $s$ and boundary conditions depend on $s$ and $t$ to corroborate the theoretical results.

To visualize the appearance of the boundary layers in the solution of examples (7.1)–(7.3), surface plots have been plotted (see Figures 1–3) for $N = 100$ and $M = 120$ and different values of $\eta$ and $\varepsilon$. It has been shown in Figures 1(a) and 3(a) that as values of $\varepsilon$ decreases the steepness of the boundary layer increases, i.e. decreasing values of $\varepsilon$ led to decreasing width of the boundary layer region.

## 8. Conclusions

The proposed method is comparable with most of the existing methods as developed for differential difference equations to capture singularities due to parabolic layers. The methods can be extended to more general equations from other meaningful mathematical models. It has been observed that numerical results are supporting the theoretical results.

## Disclosure statement

No potential conflict of interest was reported by the author(s).

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# On a Novel Time-Varying Up-sampling Rate (TVUSR) Structure and its Statistical Properties

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***Abstract*—Several real-world signals exhibit semi-periodicity in that the period of repetition varies from pulse to pulse about a mean value instead of being constant. Some examples, including among others, are ECG signals, voiced phonemes in speech, carrier jitter in communication etc. In order to model/generate such signals, one can pass a train of discrete-time delta functions, having zeros between two ones in a semi-periodic manner, through an LTI system with the impulse response matched to the pulse. Strictly speaking, the number of zeros between two ones should be a random variable, with the mean value being an average period of repetition. As a first step towards this objective, we propose a time-varying up-sampling rate $(\text{TVUSR}-Q)$ structure, where $Q$ up-samplings, namely $\uparrow (L_1+1)$, $\cdots$, $\uparrow (L_Q+1)$ are introduced periodically. We demonstrate that the proposed $\text{TVUSR}-Q$, followed by the LTI system, results in the DT-LTI system/DT-$\text{TVUSR}-Q$ system under distinct up-sampling rate conditions. Since modeling of any real-life signal mentioned earlier would be effected by passing a stochastic input through such a system, we investigate the spectral properties of the outputs under various input conditions. We demonstrate the proposed structure's utility by synthesizing ECG signals. In order to demonstrate the utility of the proposed structure we take a segment of ECG and, after extracting some required information from it, synthesize the same using the proposed DT-$\text{TVUSR}-15$ system. Simulation findings validate the proposed theory.**

***Index Terms*—Multirate filter bank, time-varying up-sampling rate structure, cyclostationary, wide sense almost cyclostationary.**

## I. Introduction

MODELING a phenomenon / process is an issue of fundamental concern in various signal-processing applications. Generally, realizable structures / systems are proposed / characterized, and modeling of phenomena / processes is done with the help of the proposed / known structures. For example, with the rational linear time invariant (LTI) systems characterization given, random processes were modeled as AR, ARMA, MA, etc. [27], [28] . Then with the introduction of multirate filter banks, the processes could be modeled in a multi-scale framework [16], [29]. In short, the introduction of a new structure opens up new possibilities in modeling. In this light, this paper proposes a novel family of structures, termed here as time-varying up-sampling rate (TVUSR) structure, and provides its time-varying kernel representation. Since the proposed family of structures corresponds to linear, time-varying systems, we investigate the time-varying spectral properties of its output under a variety of input and system conditions. In particular, we provide closed-form expressions for the time-varying autocorrelation and time-varying spectral density of the output process when the input is wide sense stationary (WSS) / wide sense cyclostationary (WSCS), etc. As a possible application of the proposed structure, we propose a model for ECG generation. The primary motivation for the proposed work came from close observation of three classes of signals, encountered in practice, namely, ECG signals in bio-medical engineering [34], voiced phonemes in speech waveforms [32], and jitter seen in communication receivers [30]. One common characteristic of all these signals mentioned is that they are all semi-periodic. More precisely, each has a repetition of pulses (almost the same) after a random period which varies from pulse to pulse, around a mean value. It is easy to see that such signals can be synthesized by passing a train of delta functions, where the separation of two deltas is a random variable with some mean period through a linear time invariant (LTI) system. In discrete-time cases, such a train of delta functions may involve introducing random up-sampling rates. Since introducing random up-sampling in between every consecutive sample, does not seem possible, as a first step in this paper, we propose a structure that can introduce periodically varying up-sampling instead of purely random.

A linear time-varying (LTV) system with input $x(n)$ and output $y(n)$ can be expressed by the sum :

$$y(n)=\sum_{r\in\mathbb{Z}} h(n,r)\,x(n-r)\,\forall n, \tag{1}$$

where, $h(n,r)$ is the system kernel, which in general could be time-varying. In particular, mulirate filter banks (MFBs) are LTV [25], [26] and hence can be characterized by time-varying system kernel. In this paper, we characterize our proposed DT-$\text{TVUSR}-Q$ system by providing a time-varying kernel and approximating it, motivated by the works of [23], with a trigonometric expansion. Since, typically, modeling of process / phenomena involves passing a process through a system, we derive explicit closed-form expressions of the time-varying autocorrelation function and time-varying spectra from the output process of the DT-$\text{TVUSR}-Q$ system. The analysis is made within the framework of the almost cyclostationary processes. In this context, it is fascinating to observe the behavior of LTV systems when stimulated by different classes of processes.

Over the last few decades, there has been a steadily growing interest in studying wide sense cyclostationary (WSCS) and wide sense almost cyclostationary (WS-ACS) processes. The study presented in [1], [2], [12], [17], [18], [19], [20] served as the basis for the development of cyclostationary

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theory. Consequently, several authors in [4], [5], [6], [7], [10], [8], [9], [11] described almost cyclostationary processes with statistics that changed almost periodically. The authors in [21], [22], [23], [3], [14], [15], [16] explore multirate filtering for cyclostationary signals. In particular, the authors in [23], [33] consider LTV systems encountered in the context of multirate systems and show that they transform input almost periodic functions into output almost periodic functions in the fraction of time (FOT) probability framework. Though in our work, we have carried out the analysis in a traditional statistical framework contrasted with the FOT probability framework, we derive one of our primary motivations regarding the almost periodic trigonometric representation discussed in these works.

The effects of multirate systems on the statistical properties of their input signals are examined in [22]. Nonetheless, these investigations were conducted with a fixed up-sampling rate. Also, the authors investigate the influence of elementary multirate building blocks, such as decimators and expanders, on the bispectra of the random process inputs received. The authors represented MIMO LTV systems with the input-output relation $y(n) = \sum_{r\in\mathbb{Z}} g(n,r)\, x(r) \forall n$ where, $g(n,r)$ is the Green's function. In our work, however, we have assumed the input-output relationship to be of the form given by equation (1), as this form can be readily approximated using a trigonometric form mentioned earlier. Specifically, we demonstrate that DT-TVUSR $-\, Q$ generates WS-ACS output when stimulated by a WS-ACS process. As a final application, we demonstrate how the proposed family of structures can generate a typical ECG. The salient contributions of the paper can be summarized as follows:

1) We present the TVUSR family of novel multirate structures which introduce periodically varying up-sampling rates.
2) Following this, we present a DT-TVUSR $-\, Q$ system and its time-varying kernel representation.
3) For the proposed DT-TVUSR $-\, Q$ system, we provide the measure for the degree of time variance and measure for the degree of non-stationarity formulas.
4) We present closed-form expressions for time-varying autocorrelations and associated time-varying spectra for the output processes of the proposed DT-TVUSR $-\, Q$ considered under different time-varying conditions when excited by WSS and WSCS processes.

The paper is organized as follows: Section II gives prerequisites for the subsequent tasks. Section III discusses the rationale behind the TVUSR family and its construction in detail. Section IV describes the intricate workings of DT-TVUSR $-\, Q$ system and representation by a time-varying kernel. Section V specifies the degree of time variance for the DT-TVUSR $-\, Q$ system. Section VI provides expressions for the cyclic autocorrelation and cyclic spectrum for DT-TVUSR $-\, Q$ and DT-LTI systems excited by WS-ACS/WSCS/WSS processes. We then present our results, simulations and discussions in Section VII. We conclude in Section VIII.

## II. Notations and Preliminaries

In this paper we will follow standard notations. We refer to $\mathbb{N}$ as the set of natural numbers and $\mathbb{Z}$ as the set of integers. We denote the $z-$transform of a discrete-time signal $x(n)$ as $X(z)$. A decimator/downsampler selects every $M$th sample and leaves $(M-1)$ samples between two sample. If $x(n)$ is the input and $y(n)$ is the output, then mathematically, the relationship between the input and output can be described as $y(n) = x(Mn)$. As a result of this process, the sampling rate at the output is decreased by $M$. The input and output signal's $z$-transforms are related as,

$$Y(z) = [X(z)]_{\downarrow M} = \frac{1}{M}\sum_{k=0}^{M-1} X\left(z^{\frac{1}{M}} W_M^k\right), \tag{2}$$

where, $W_M^k \triangleq \exp\left(-j\frac{2\pi}{M}k\right)$. Spectrum aliasing is typically the result of decimation. Signals are processed through a low-pass filter known as the decimation filter before being applied to the decimator to prevent aliasing. Up-sampling by a factor of $L$, on the other hand, inserts $L-1$ zeroes between each pair of samples. The up-sampling procedure introduces picture frequencies into the output spectrum, necessitating a filter to eliminate them. The mathematical relationship between the input and output signals is $y(n) = \sum_{m\in\mathbb{Z}} x(m)\,\delta(n-mL)$. We can see that it is an invertible operation. The $z$ transform of the output, $y(n)$, in terms of the input, $x(n)$, is given as,

$$Y(z) = X\left(z^L\right) = [X(z)]_{\uparrow L}. \tag{3}$$

As a result, the spectrum is compressed by a factor of $L$ in this procedure.

## III. Motivation for TVUSR family and Methodology

The primary motivation for TVUSR is as follows: Semi-periodic signals such as ECG, jitter, and voiced phonemes can be synthesized by transmitting a train of delta functions through an LTI system. Repeating almost identical pulses after a random period oscillating around a mean value from pulse to pulse characterizes semi-periodic signals. Thus, random up-sampling rates may be introduced into a train of delta functions in order to model or generate semi-periodic signals. Since incorporating random up-sampling between each consecutive sample appears complex, we propose a family of multirate structures, termed here as time-varying up-sampling rate (TVUSR) structures, which introduce sampling in a periodically time-varying manner in this subsection. We first propose a simple form of the structure termed here as TVUSR $-\, 2$, that cyclically introduces two up-sampling factors. That is, first, an up-sampler $\uparrow (L_1+1)$ operates, introducing $L_1$ zeros between samples, then the up-sampler $\uparrow (L_2+1)$ works, introducing $L_2$ zeros between samples, and this process is repeated cyclically. We, then, propose a generalized version of same, termed here as TVUSR $-\, Q$ where $Q \in \mathbb{N}$, which introduces $Q$ up-sampling factors. Specifically, first $\uparrow (L_1+1)$ operates, introducing $L_1$ zeros between samples, then $\uparrow (L_2+1)$ operates, introducing $L_2$ zeros between samples, and so on until $\uparrow (L_Q+1)$ operates, introducing $L_Q$ zeros, this process is repeated cyclically.

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### A. TVUSR family: Concept and Structure

The TVUSR-2 (Fig. 1), the simplest member of the TVUSR family, will be our starting point in this subsection. The TVUSR-2, which introduces two up-samplings periodically, that is it inserts zeros between two samples in the following periodic manner

$$L_1, L_2, L_1, L_2, \cdots \tag{4}$$

i.e., $L_1$ zeros between two samples followed by $L_2$ zeros between two samples followed by $L_1$ zeros between two samples and so forth. Observe that inserting $L_1$ zeros corresponds to up-sampling by $\uparrow (L_1+1)$. Similarly inserting $L_2$ zeros corresponds to up-sampling by $\uparrow (L_2+1)$. The first channel of Fig. 1 consists of $\downarrow 2$ and up-sampler $\uparrow ((L_1+1)+(L_2+1))$. The second channel includes an advancement block $z$ , $\downarrow 2$ , $\uparrow ((L_1+1)+(L_2+1))$ and a delay block $z^{-(L_1+1)}$. We now provide an example (Fig.1) to illustrate the working of the proposed structure. We apply a discrete-time signal of length 13 with equal spacing to a TVUSR $-$ 2 with varying $L_1$ and $L_2$ values. When $L_1 = 2$, $L_2 = 3$ , we observe that the output $y(n)$ is composed of 2 zeros between two samples followed by 3 zeros between two samples followed by 2 zeros between two samples and so forth. When $L_1 = 1$, $L_2 = 1$, the output $y(n)$ is composed of 1 zero between two samples followed by 1 zero between two samples followed by 1 zero between two samples and so forth. When $L_1 = 0$, $L_2 = 0$, $y(n) = x(n)$. Note that there are three distinct possibilities here :

- $L_1 \neq L_2$, where $L_1, L_2 \in \mathbb{Z}^+ \setminus \{0,1\}$
- $L_1 = L_2 \in \mathbb{Z}^+ \setminus \{0\}$.
- $L_1 = L_2 = 0$.

The generalized member of the TVUSR family, the TVUSR $-$ $Q$ (Fig. 2), where $Q$ up-sampling rates are introduced periodically, that is it inserts zeros between two samples in the following periodic manner:

$$L_1, L_2, \cdots L_Q, L_1, L_2, \cdots L_Q, \cdots \tag{5}$$

### B. TVUSR Family for Original Signal Reconstruction : The inverse system

Given a TVUSR, it is natural to ask whether we can recover our original signal after passing it through the system. Since the effective behavior of the system is up-sampling, though periodically time-varying, one would expect the inverse to exist. In this sub-section, we provide the inverse of the system. To reconstruct back the input signal $x(n)$ from the output signal $y(n)$ as shown in Fig. 1, we propose the structure given in Fig. 3. The first channel consists of a downsampler $\downarrow ((L_1+1)+(L_2+1))$ followed by an up-sampler $\uparrow 2$. The second channel comprises an advancement block $z^{(L_1+1)}$, a downsampler $\downarrow ((L_1+1)+(L_2+1))$ , up-sampler $\uparrow 2$ and a delay $z^{-1}$. Similarly, for the TVUSR $-$ $Q$ reconstruction structure, we propose the structure shown in Fig. 4, where there are $Q$ channels comprising an advancement block, downsampler, up-sampler, and a delay.

**A note on *efficient implementation***: The proposed structures contain several up-samplers whose effect is to introduce zeros between the samples of the input signal. This discussion provides some comments on possible efficient implementation that does not require the storage of many zero samples.

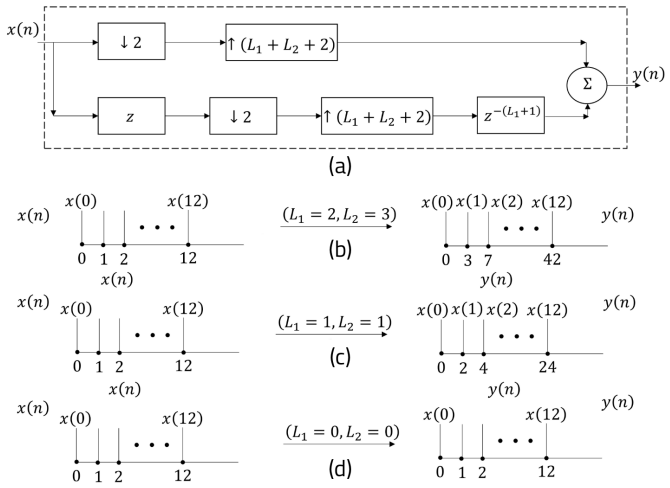


Fig. 1. (a) The structure of TVUSR $-$ 2. (b) When $L_1 = 2$, $L_2 = 3$, the output $y(n)$ is composed of 2 zeros between two samples followed by 3 zeros between two samples followed by 2 zeros between two samples and so forth. (c) When $L_1 = 1$, $L_2 = 1$, the output $y(n)$ is composed of 1 zero between two samples followed by 1 zero between two samples followed by 1 zero between two samples and so forth. (d) When $L_1 = 0$, $L_2 = 0$, $y(n) = x(n)$.

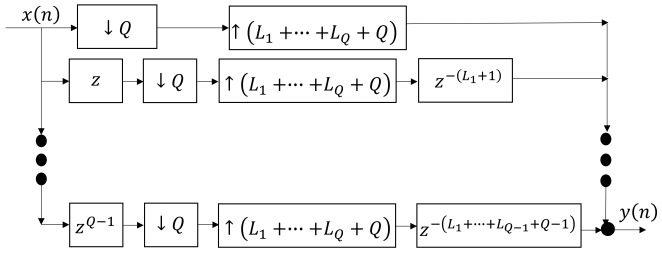


Fig. 2. The proposed TVUSR$-Q$, where $Q$ up-sampling rates are introduced periodically (a generalization of the operation of TVUSR $-$ 2 illustrated in Fig.1).

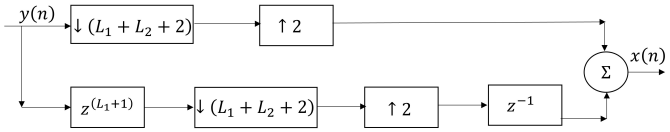


Fig. 3. TVUSR $-$ 2 reconstruction structure. Note that this structure is the inverse of the proposed structure shown in Fig. 1.

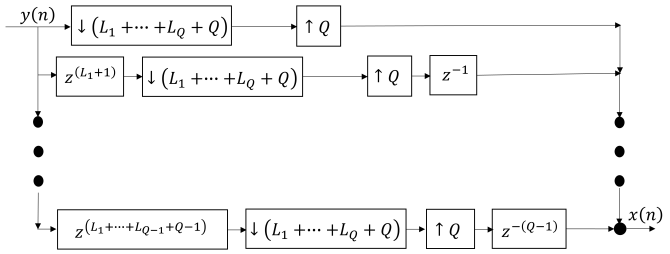


Fig. 4. The TVUSR $-$ $Q$ reconstruction structure. Note that this structure is the inverse of the proposed TVUSR $-$ $Q$ structure shown in Fig. 2.

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TABLE I
A COMPARISON OF THE MEMORY UTILIZATION OF REGULAR AND SPARSE VECTOR SIGNALS.

| Name | Size | Min Data Storage (Bytes) |
|---|---|---|
| $x$ | $n \times 1$ | $8n$ |
| $y$ | $n\left(L_1+1\right) \times 1$ | $8n\left(L_1+1\right)$ |
| $y_{sparse}$ | $n\left(L_1+1\right) \times 1$ | $\max\left(n,1\right) \times (8+8)+(1+1) \times 8$ |
| $\widetilde{y}$ | $Q\left(L_1+L_2+\cdots+L_Q+Q\right) \times 1$ | $8Q\left(L_1+L_2+\cdots+L_Q+Q\right)$ |
| $\widetilde{y}_{sparse}$ | $Q\left(L_1+L_2+\cdots+L_Q+Q\right) \times 1$ | $\max\left(n,1\right) \times (8+8)+(1+1) \times 8$ |

When an ordinary array is declared in MATLAB, memory locations are allocated for each element, whether zero or not. However, only the non-zero array elements are allocated memory locations using sparse arrays. The minimum data storage requirement formula in MATLAB for a $p \times s$ sparse matrix with $\widetilde{n}$ non-zero elements, including the index data, is as follows on a 32-bit and 64-bit system respectively :

$$\text{bytes}_{32-\text{bit}} \triangleq \max\left(\widetilde{n},1\right) \times (4+8)+(s+1) \times 4 \quad (6)$$

$$\text{bytes}_{64-\text{bit}} \triangleq \max\left(\widetilde{n},1\right) \times (8+8)+(s+1) \times 8 \quad (7)$$

Let us demonstate this. Consider a $n \times 1$ vector $x = \begin{bmatrix} x_1 & x_2 & \cdot & \cdot & \cdot & x_n \end{bmatrix}^T$, having $n$ non-zero elements, where, $T$ denotes the transpose operation. We apply $\uparrow \left(L_1+1\right)$ on the vector $x$, to produce an up-sampled $n\left(L_1+1\right) \times 1$ vector $y$. Then we generate the sparse $n\left(L_1+1\right) \times 1$ vector $y_{sparse}$. Now we introduce periodically varying up-sampling rates, namely, $\uparrow \left(L_1+1\right)$, $\uparrow \left(L_2+1\right)$,$\cdot \cdot$, $\uparrow \left(L_Q+1\right)$ in a periodic manner, on the vector $x$, in order to generate a time-varying up-sampled $Q\left(L_1+L_2+\cdots+L_Q+Q\right) \times 1$ vector $\widetilde{y}$. We then generate a sparse $Q\left(L_1+L_2+\cdots+L_Q+Q\right) \times 1$ vector $\widetilde{y}_{sparse}$. The Table I provides information regarding memory usage. We observe unequivocally that sparse representation requires less memory space for uniformly and time-varying up-sampled vector signals.

## IV. DT-TVUSR $-$ $Q$ SYSTEM

This section demonstrates the workings of the TVUSR $-$ $Q$ system and derives its representation using a time-varying system kernel $h^{\text{TVUSR}}\left(n,r\right)$. The structure depicted in Fig. 5, where an LTI filter follows TVUSR $-$ $Q$, is referred to as discrete-time, time-varying up-sampling rate system abbreviated as DT-TVUSR $-$ $Q$ system. In the same vein, the complete structure that consists of TVUSR $-$ 2 followed by an LTI filter will be referred to as a DT-TVUSR $-$ 2 system. The following theorem is proposed to characterize the DT-TVUSR $-$ $Q$ system :

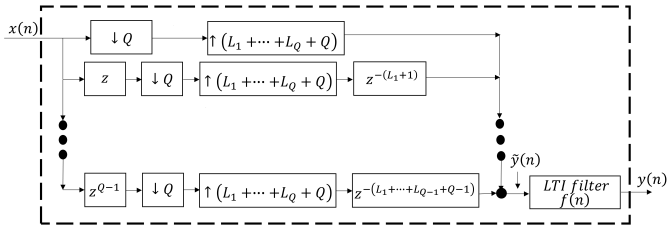


Fig. 5. Proposed DT-TVUSR $-$ $Q$ system.

**Theorem 1.** *For the proposed structure, shown in Fig. 5, the DT-TVUSR $-$ $Q$ system kernel, denoted as $h^{TVUSR}\left(n,r\right)$, assumes the form given by equation (18).*

*Proof.* Define $\mathcal{L} \triangleq L_1+\cdots+L_Q+Q$. The output of TVUSR$-$ $Q$, which is the combined output of all the channels is denoted as $\widetilde{y}\left(n\right)$. Then the output of the DT-TVUSR$-Q$, can be written as :

$$y\left(n\right)=\widetilde{y}\left(n\right) \star f\left(n\right)=\sum_{p \in \mathbb{Z}} f\left(n-p\right)\widetilde{y}\left(p\right), \quad (8)$$

where, $\star$ stands for discrete-time convolution. Observe that equation (8) can be written as :

$$\begin{aligned} y\left(n\right)=\sum_{p \in \mathbb{Z}} f\left(n-p\right) \times [\sum_{t_1 \in \mathbb{Z}} x\left(Qt_1\right) \times \delta\left(p-t_1\mathcal{L}\right)+ \\ \sum_{t_2 \in \mathbb{Z}} x\left(Qt_2+1\right) \times \delta\left(p-\left(L_1+1\right)-t_2\mathcal{L}\right)+\cdots \\ +\sum_{t_Q \in \mathbb{Z}} x\left(Qt_Q+\left(Q-1\right)\right) \times \\ \delta\left(p-\left(L_1+\cdots L_{Q-1}+\left(Q-1\right)\right)-t_Q\mathcal{L}\right)] \end{aligned} \quad (9)$$

Let us express (9) in the form :

$$y\left(n\right)=\sum_{m \in \mathbb{Z}} g^{\text{TVUSR}}\left(n,m\right)x\left(m\right) \quad (10)$$

So, (9) can be expressed as :

$$y\left(n\right)=\sum_{m \in \mathbb{Z}} x\left(m\right) \times \left[T_1+T_2+\cdots+T_Q\right] \quad (11)$$

where,

$$T_1 \triangleq \sum_{t_1 \in \mathbb{Z}} \delta\left(m-Qt_1\right) \sum_{p \in \mathbb{Z}} f\left(n-p\right) \delta\left(p-t_1\mathcal{L}\right) \quad (12)$$

$$\begin{aligned} T_2 \triangleq \sum_{t_2 \in \mathbb{Z}} \delta\left(m-Qt_2-1\right) \times \\ \left[\sum_{p \in \mathbb{Z}} f\left(n-p\right) \delta\left(p-\left(L_1+1\right)-t_2\mathcal{L}\right)\right] \end{aligned} \quad (13)$$

$$\begin{aligned} T_Q \triangleq \sum_{t_Q \in \mathbb{Z}} \delta\left(m-Qt_Q-\left(Q-1\right)\right) \times \{\sum_{p \in \mathbb{Z}} f\left(n-p\right) \\ \times \delta\left(p-\left(L_1+\cdots L_{Q-1}+\left(Q-1\right)\right)-t_Q\mathcal{L}\right)\} \end{aligned} \quad (14)$$

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$$h^{\text{TVUSR}}(n,r) \triangleq \sum_{p\in\mathbb{Z}} f(n-p) \times [\sum_{t_1\in\mathbb{Z}} \delta(n-r-Qt_1)\,\delta(p-t_1\mathcal{L}) + \sum_{t_2\in\mathbb{Z}} \delta(n-r-Qt_2-1)\,\delta(p-(L_1+1)-t_2\mathcal{L}) + \cdots + \sum_{t_Q\in\mathbb{Z}} \delta(n-r-Qt_Q-(Q-1))\,\delta(p-(L_1+\cdots L_{Q-1}+(Q-1))-t_Q\mathcal{L})] \quad (18)$$

and we define :

$$g^{\text{TVUSR}}(n,m) \triangleq \sum_{p\in\mathbb{Z}} f(n-p) \times [\sum_{t_1\in\mathbb{Z}} \delta(m-Qt_1) \times \delta(p-t_1\mathcal{L}) + \sum_{t_2\in\mathbb{Z}} \delta(m-Qt_2-1) \times \delta(p-(L_1+1)-t_2\mathcal{L}) + \cdots + \sum_{t_Q\in\mathbb{Z}} \delta(m-Qt_Q-(Q-1)) \times \delta(p-(L_1+\cdots L_{Q-1}+(Q-1))-t_Q\mathcal{L})] \quad (15)$$

Now, consider :

$$g^{\text{TVUSR}}(n,m) \triangleq h^{\text{TVUSR}}(n,n-m) \quad (16)$$

By making use of (16), equation (10) reduces to :

$$y(n) = \sum_{r\in\mathbb{Z}} h^{\text{TVUSR}}(n,r)\,x(n-r), \quad (17)$$

where, $h^{\text{TVUSR}}(n,r)$ is the kernel for DT-TVUSR system, and is given by equation (18). □

Now consider the following cases :

1) By substituting $L_1 = \cdots = L_Q \neq 0$, the DT-TVUSR$-Q$ system (Fig. 5) reduces to an up-sampler $\uparrow(L_1+1)$ followed by an LTI filter $f(n)$. Consequently, $\uparrow(L_1+1)$ followed by $f(n)$ is a discrete-time, linear time-varying (DT-LTV) system and the system kernel is :

$$h^{\text{LTV}}(n,r) = \sum_{\ell\in\mathbb{Z}} \delta(n-\ell-(n-r)(L_1+1)) \times f(\ell). \quad (19)$$

2) By substituting $L_1 = \cdots = L_Q = 0$, the DT-TVUSR$-Q$ system kernel represented by (18) can be expressed by the DT-LTI (discrete-time, linear time invariant) system kernel $h^{\text{LTI}}(n,r)$, where ,

$$h^{\text{LTI}}(n,r) = \sum_{p} f(n-p) \times [\sum_{t_1} \delta(n-r-Qt_1)\,\delta(p-t_1Q) + \cdots + \sum_{t_Q} \delta(n-r-Qt_Q-(Q-1)) \times \delta(p-(Q-1)-t_QQ)] \quad (20)$$

$$= \sum_{t_1} f(n-t_1Q)\,\delta(n-r-Qt_1) + \cdots + \sum_{t_Q} f(n-(Q-1)-t_QQ) \times \delta(n-r-Qt_Q-(Q-1))] \quad (21)$$

$$= \sum_{\widetilde{t}} f\left(n-\widetilde{t}\right)\delta\left(n-r-\widetilde{t}\right) = f(r). \quad (22)$$

Thus, the DT-LTI kernel $h^{\text{LTI}}(n,r)$ becomes a function of $r$ only, leading to the LTI system.

## V. Measure for the Degree of Time Variance for DT-TVUSR $-$ $Q$ System

Motivated by the need to quantitatively evaluate the proposed system's temporal dynamics and variability, the analytical form of the measure for the degree of time variance proposed in [14], [15], and abbreviated as MDTV, is derived in this section.

We denote the DT-TVUSR $-$ $Q$ system operator, as $\mathcal{G}$ : $\ell^2(\mathbb{Z}) \rightarrow \ell^2(\mathbb{Z})$, where, $\ell^2(\mathbb{Z})$ is the Hilbert space of complex-valued, square summable sequences. Note that an upsampler followed by an LTI system is a linear time-variant system whose kernel function $h(n,r)$ is not almost periodic in any of the variables $n$ and $r$. However, since almost-periodic functions (complex exponentials with irrational frequencies) are a very rich class of functions, every function over a fixed finite interval can be approximated by an almost-periodic function with a sufficiently large number of frequencies. Thus, for every fixed $r$, the function of $n$, $h(n,r)$ can be approximated by complex exponentials with irrational frequencies in a fixed interval of values of $n$. Since this manuscript aims to compute cyclic statistical functions of the output signal when the input is almost-cyclostationary, it makes sense to consider such an approximation of the system kernel function. The obtained results, however, depend on the length of the observation interval. Thus, for the time-varying kernel of the system, representation for the proposed DT-TVUSR $-$ $Q$ system is, therefore, as follows:

$$\mathcal{G} : h^{\text{TVUSR}}(n,r) \sim \sum_{\alpha\in\mathcal{A}} \kappa_\alpha^{\text{TVUSR}}(r)\exp(j\alpha n), \quad (23)$$

where $\alpha \in \mathbb{R}$ and the set

$$\mathcal{A} \triangleq \left\{\alpha : 0 \leq \alpha < 2\pi, \kappa_\alpha^{\text{TVUSR}}(r) \neq 0\right\}, \quad (24)$$

could, in general, be countably infinite set. In (23), the $\sim$ signifies that a trigonometric exponential form approximates the kernel $h^{\text{TVUSR}}(n,r)$. The coefficients $\kappa_\alpha^{\text{TVUSR}}(r)$ are given as :

$$\kappa_\alpha^{\text{TVUSR}}(r) = \lim_{N\to\infty} \frac{1}{2N+1} \sum_{n=-N}^{N} h^{\text{TVUSR}}(n,r)\,e^{-j\alpha n}. \quad (25)$$

It is to be noted that :

1) If $\alpha = 0$ only, then $h^{\text{TVUSR}}(n,r)$ is just a function of $r$ and hence represents the DT-LTI system. For a

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DT-LTI system, the coefficients $\kappa_\alpha^{\text{TVUSR}}(r)$, represented by equation (25), reduce to $\kappa_0(r) = f(r)$.

2) For obvious reasons, when the kernel of any system admits the form of equation (18), it is referred to as linear almost periodic system.
3) When the frequencies in equation (23) are all harmonically related, the kernel represents a linear, periodically time-varying system.

The above-mentioned equation (23) and note 1 mentioned above help us define a measure of a system's degree of time variance. The terms in equation (23) with $\alpha \neq 0$ represent time-varying parts. Hence one can define the fraction of energy in time-varying part to total energy as a measure for the degree of time variance (MDTV) of a system. Analytically, we can write:

$$\text{MDTV}(\mathcal{G}) \triangleq 1 - \frac{\sum_{r\in\mathbb{Z}} |\kappa_0(r)|^2}{\sum_{\alpha\in\mathcal{A}}\sum_{r\in\mathbb{Z}} |\kappa_\alpha^{\text{TVUSR}}(r)|^2} \tag{26}$$

It should be noted here that in [14], [15], the coefficients $\kappa_\alpha(r)$ were expressed for $P$ periodic linear periodically time-varying system, where $\alpha$ was composed solely of harmonics of a specific frequency. It is pertinent to note that though the expression for MDTV (eqn. 26) appears to be valid for the DT-TVUSR$-Q$ , it is applicable for any time-varying system whose kernel follows the representation of equation (23).

## VI. Spectral Analysis

### A. Background and Motivation

As mentioned earlier, any new structure opens up the possibility for a new modeling strategy. In this section, we derive some results which would facilitate any such study. Since the proposed structure, DT-TVUSR$-Q$ (Fig. 5) is a linear time-varying system; it is natural to expect that it could be used to manipulate the non-stationarity of a process. Since an extensive class of non-stationary processes can be characterized by time-varying autocorrelation, which can be approximated by the sum of complex exponentials with possibly countable incommensurate frequencies, hence, in this section, we derive expressions for time-varying autocorrelation function of the output of the DT-TVUSR$-Q$ system in terms of input time-varying autocorrelation function under various conditions. In particular, one comes across three distinct types of stochastic inputs, which are denoted as follows : WSS (wide sense stationary), WSCS (wide sense cyclostationary) and WS-ACS (wide sense almost cyclostationary). It would be interesting to explore how the spectral features of the output change in response to all of these different scenarios. Therefore, the purpose of this part is to deduce the general form of the spectrum of the output by relating it to the spectrum of the input and the system kernel (or its spectral representation). It is common knowledge that the autocorrelation $\mathcal{R}_x(n,r)$ of a random process $x(n)$ may be defined in mathematical terms as :

$$\mathcal{R}_x(n,r) \triangleq \mathscr{E}\left(x(n)\, x^*(n-r)\right) \tag{27}$$

where $\mathscr{E}$ is the expectation operator. Before we proceed further from the literature, two well-known definitions are in order,

**Definition 1.** *The zero mean process $x(n)$ is said to be wide sense cyclostationary (WSCS) if there exists an integer $P_0$, such that for each fixed but arbitrary $r$, we have [12], [13] :*

$$\mathcal{R}_x(n,r) = \mathcal{R}_x(n+qP_0,r) \quad \forall q \tag{28}$$

*This implies that $\mathcal{R}_x(n,r)$ can be expressed in a Fourier series expansion with respect to $n$, for every $r$ as :*

$$\mathcal{R}_x(n,r) = \sum_{q=0}^{P_0-1} \varrho_x(q,r)\, e^{j\left(\frac{2\pi q}{P_0}\right)n} \tag{29}$$

*where, the Fourier series coefficients at the qth-harmonic of $\frac{2\pi}{P_0}$ are :*

$$\varrho_x(q,r) \triangleq \frac{1}{P_0}\sum_{n=0}^{P_0-1} \mathcal{R}_x(n,r)\, e^{-j\left(\frac{2\pi q}{P_0}\right)n} \tag{30}$$

*for $q \in [0, P_0-1]$.*

**Definition 2.** *The zero mean process $x(n)$ is said to be wide sense almost cyclostationary (WS-ACS) if $x(n)$ admits a trigonometric expansion of the form [37] :*

$$\mathcal{R}_x(n,r) \triangleq \sum_{\gamma\in\mathcal{S}} \varrho_x(\gamma,r)\, e^{j\gamma n} \tag{31}$$

*where, $\mathcal{S} \triangleq \{\gamma : 0 \le \gamma < 2\pi, \varrho_y(\gamma,r) \neq 0\}$ is a countable set which in general could contain infinite incommensurate frequencies, and the coefficients which are called the cyclic autocorrelation functions $\varrho_x(\gamma,r)$, can be computed as (for any $r$ and $\gamma$) :*

$$\varrho_x(\gamma,r) = \lim_{N\to\infty} \frac{1}{2N+1}\sum_{n=-N}^{N} \mathcal{R}_x(n,r)\, e^{-j\gamma n} \tag{32}$$

*It is important to note that the summation on $\gamma$ in (31) does not necessarily include coefficients at harmonically related frequencies of the form $\frac{2\pi q}{P_0}$ where $P_0$ is the period of the fundamental harmonic. It is important to note that condition (32) can be reduced to (30) owing to periodicity.*

We have $x(n)$ a stationary process when $P_0 = 1$. In this case :

$$\mathcal{R}_x(n,r) = \mathcal{R}_x(r)\, \forall n \tag{33}$$

and

$$\varrho_x(\gamma,r) = \varrho_x(0,r)\, \delta(\gamma), \tag{34}$$

where, $\delta(\gamma) = \begin{cases} 1 & \gamma = 0 \mod 2\pi \\ 0 & \text{else} \end{cases}$.

***Discussion***: Several observations regarding equations (31) and (32) are in order :

- Though the class of general non-stationary processes is vast, because of the nature of the system proposed, we are confining to the class of processes whose time-varying autocorrelation function $\mathcal{R}_x(n,r)$ admits the representation given by (31).
- $\mathcal{R}_x(n,r)$ is a function of two variables : time $n$ and lag $r$.
- We observe that sampling a continuous-time periodic signal, in general, does not lead to a discrete-time periodic

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signal. Also, the sum of two continuous time periodic signals with different periods generally is not periodic. It seems logical to term such signals as almost periodic signals.

- For WSS processes, for each $r$, $\mathcal{R}_x(n,r)$ is independent of $n$. Consequently, being constant with respect to $n$, results in a delta function at zero frequency when the transform is taken in the $n$ variable at every value of $r$. So the autocorrelation function for the WSS process is (34). The standard autocorrelation is the term on the right hand side of (34), excluding the delta function term.
- The autocorrelation function of WSCS processes would be (31), with frequencies being harmonically related.

### *B. Cyclic autocorrelation for the DT-TVUSR − Q system*

With the relevant definitions at our disposal, we now present the derivation, providing the time-varying output spectra of the DT-TVUSR$-Q$ system for general WS-ACS input. Using the preceding notions, we propose the following theorem :

**Theorem 2.** *Assuming the representation of DT-TVUSR − Q system (Fig. 5) as given in (23) and assuming the representation of input WS-ACS process given in (31), the cyclic autocorrelation of the output WS-ACS process $y$ can be expressed as :*

$$\varrho_y(\gamma,r)=\sum_{\alpha_1,\alpha_2,\beta\in\mathcal{A}_\gamma}\left[\kappa_{\alpha_2}^{*TVUSR}(r)\,e^{-j\alpha_2 r}\right]\star\left[K(-r,\alpha_1,\beta)\,e^{j\alpha_2(-r))}\right], \quad (35)$$

*where,*

$$K(r,\alpha_1,\beta)\triangleq\left[\kappa_{\alpha_1}^{TVUSR}(r)\,e^{-j\beta r}\right]\star\left[\varrho_x(\beta,r)\,e^{-j\frac{\beta}{2}r}\right], \quad (36)$$

*and the coefficients $\kappa_{\alpha_1}^{TVUSR}(r_1)$ and $\kappa_{\alpha_2}^{*TVUSR}(r_2)$ are given by equations (37), (38) respectively, the set $\mathcal{A}_\gamma$, which is the set of frequencies present in the output, and which in general could be countably infinite, as given in (41), and the output WS-ACS process has frequencies $\gamma=\beta-\alpha_2+\alpha_1$, where, $\alpha_1,\alpha_2\in\mathcal{A}$, $\beta\in\mathcal{S}_2$; $\mathcal{S}_2\triangleq\{\beta|0\le\beta<2\pi,\varrho_x(\beta,r)\neq0\}$ is a countable set.*

*Proof.* By substituting (18) in (17) and then applying the definition (27), the time-varying autocorrelation of the output process $y$ can be written as :

$$\underbrace{\mathcal{R}_y(n,r)}_{\sum_{\gamma\in\mathcal{S}}\varrho_y(\gamma,r)e^{j\gamma n}}=\sum_{r_1,r_2}\sum_{\alpha_1,\alpha_2\in\mathcal{A}}\kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\,e^{j\alpha_1 n}\times\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\,e^{-j\alpha_2(n-r)}\times\underbrace{\mathcal{R}_x\left(n+\frac{-r_1-r-r_2}{2},-r_1+r+r_2\right)}_{\sum_{\beta\in\mathcal{S}_2}\varrho_x(\beta,-r_1+r+r_2)e^{j\beta\left(n+\frac{-r_1-r-r_2}{2}\right)}} \quad (39)$$

$$\Rightarrow\sum_{\gamma\in\mathcal{S}}\varrho_y(\gamma,r)\,e^{j\gamma n}=\sum_{\alpha_1,\alpha_2\in\mathcal{A}}\sum_{\beta\in\mathcal{S}_2}\sum_{r_1,r_2\in\mathbb{Z}}\kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\,\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\,e^{j\alpha_2 r}\times e^{-j\beta\left(\frac{r_1+r+r_2}{2}\right)}\times\times\varrho_x(\beta,-r_1+r+r_2)\times e^{j(\beta-\alpha_2+\alpha_1)n} \quad (40)$$

We define a countable set $\mathcal{A}_\gamma\subseteq\mathcal{A}\times\mathcal{A}\times\mathcal{S}_2$, where :

$$\mathcal{A}_\gamma\triangleq\{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}\times\mathcal{A}\times\mathcal{S}_2|\gamma=\beta-\alpha_2+\alpha_1\} \quad (41)$$

Comparing both sides of (40), we have :

$$\varrho_y(\gamma,r)=\sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma}\sum_{r_1,r_2\in\mathbb{Z}}\kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\,\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\times e^{j\alpha_2 r}\times e^{-j\beta\left(\frac{r_1+r+r_2}{2}\right)}\times\varrho_x(\beta,-r_1+r+r_2) \quad (42)$$

$$\Rightarrow\varrho_y(\gamma,r)=\sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma}\sum_{r_2}\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\,e^{j\alpha_2 r}\times\underbrace{\sum_{r_1}\kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\,e^{-j\beta r_1}\varrho_x(\beta,r+r_2-r_1)\,e^{-j\frac{\beta}{2}(r+r_2-r_1)}}_{\text{K}(r+r_2,\alpha_1,\beta)} \quad (43)$$

Observe that (43) reduces to (35). □

The cyclic autocorrelation for various processes as inputs to various systems is summarized in Table II. It is easy to observe that a DT-LTI system excited by a WSCS process $x$ having frequencies $\left(\frac{2\pi k_1}{N_{ip}}\right)$; $0\le k_1\le N_{ip}-1$, generates a WSCS process $y$ having,

$$\varrho_y(\gamma,r)=\sum_{\left(0,0,\frac{2\pi k_1}{N_{ip}}\right)\in\widetilde{\mathcal{A}_\gamma}}\left[\kappa_0^*(r)\,e^{-j\left(\frac{2\pi k_1}{N_{ip}}\right)r}\right]\star\left[\text{K}_{\text{WSCS}}^{\text{LTI}}\left(-r,\left(\frac{2\pi k_1}{N_{ip}}\right)\right)\right], \quad (44)$$

where,

$$\text{K}_{\text{WSCS}}^{\text{LTI}}\left(r,\frac{2\pi k_1}{N_{ip}}\right)\triangleq\left[\kappa_0(r)\,e^{-j\left(\frac{2\pi k_1}{N_{ip}}\right)r}\right]\star\left[\varrho_x\left(\left(\frac{2\pi k_1}{N_{ip}}\right),r\right)e^{-j\left(\frac{\pi k_1}{N_{ip}}\right)r}\right]. \quad (45)$$

Again, a DT-LTI system excited by a WSS process $x$, generates a WSS process $y$ having, $\varrho_y(0,r)=\kappa_0^*(r)\star\text{K}_{\text{WSS}}^{\text{LTI}}(-r)$, where, $\text{K}_{\text{WSS}}^{\text{LTI}}(r)\triangleq\kappa_0(r)\star\varrho_x(0,r)$ and $\kappa_0(r)=f(r)$.

### *C. Convergence of the Cyclic Autocorrelation Function*

Taking the modulus $|\cdot|$ on both sides of equation (35) , the upper limit of $|\varrho_y(\gamma,r)|$ is :

$$|\varrho_y(\gamma,r)|\le\sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma}\|\varrho_x(\beta,\cdot)\|_\infty\times\left|\kappa_{\alpha_1}^{\text{TVUSR}}\right|\left|\kappa_{\alpha_2}^{*\text{TVUSR}}\right|<\infty, \quad (46)$$

where, $\|\cdot\|_\infty$ is the essential supremum. The proof of (46) is given in Appendix A.

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$$\kappa_{\alpha_1}^{\text{TVUSR}}(r_1) \triangleq \lim_{N\to\infty}\frac{1}{2N+1}\sum_{n_1=-N}^{N} e^{-j\alpha_1 n_1}\times \Big[\sum_{t_1\in\mathbb{Z}} f(n_1 - t_1\mathcal{L})\,\delta(n_1 - r_1 - Qt_1) + \sum_{t_2\in\mathbb{Z}} f(n_1 - (L_1+1) - t_2\mathcal{L})\,\delta(n_1 - r_1 - Qt_2 - 1) + \cdots + \sum_{t_Q\in\mathbb{Z}} f(n_1 - (L_1 + \cdots + L_{Q-1} + Q - 1) - t_Q\mathcal{L})\,\delta(n_1 - r_1 - Qt_Q - (Q-1))\Big] \quad (37)$$

$$\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2) \triangleq \lim_{N\to\infty}\frac{1}{2N+1}\sum_{n_2=-N}^{N} e^{j\alpha_2(n_2-r)}\times \Big[\sum_{t_1'\in\mathbb{Z}} f^*(n_2 - r - t_1'\mathcal{L})\,\delta(n_2 - r - r_2 - Qt_1') + \sum_{t_2'\in\mathbb{Z}} f^*\Big(n_2 - r - (L_1+1) - t_2'\mathcal{L}\Big)\,\delta\Big(n_2 - r - r_2 - Qt_2' - 1\Big) + \cdots + \sum_{t_Q'\in\mathbb{Z}} f^*\Big(n_2 - r - (L_1 + \cdots + L_{Q-1} + Q - 1) - t_Q'\mathcal{L}\Big)\,\delta\Big(n_2 - r - r_2 - Qt_Q' - (Q-1)\Big)\Big] \quad (38)$$

TABLE II
THE CYCLIC AUTOCORRELATION FUNCTION $\varrho_y(\gamma, r)$ OF THE OUTPUT PROCESS $y$ FOR A DT-LTI / DT-TVUSR $-\,Q$ SYSTEM WHEN EXCITED BY VARIOUS PROCESSES.

| Input process | System | $\varrho_y(\gamma, r)$ | Output process frequencies |
|---|---|---|---|
| WSS | DT-LTI | $\varrho_y(0,r) = \kappa_0^*(r) \star \mathrm{K}_{\text{WSS}}^{\text{LTI}}(-r)$ | $\gamma = 0$ |
| WSCS | DT-LTI | $\varrho_y(\gamma,r) = \sum_{\left(0,0,\frac{2\pi k_1}{N_{ip}}\right)\in\widetilde{\mathcal{A}_\gamma}} \left[\kappa_0^*(r)\, e^{-j\left(\frac{2\pi k_1}{N_{ip}}\right)r}\right] \star \left[\mathrm{K}_{\text{WSCS}}^{\text{LTI}}\left(-r, \left(\frac{2\pi k_1}{N_{ip}}\right)\right)\right]$ | $\gamma = \frac{2\pi k_1}{N_{ip}}$ |
| WS-ACS | DT-TVUSR $-\,Q$ | $\varrho_y(\gamma,r) = \sum_{\alpha_1,\alpha_2,\beta\in\mathcal{A}_\gamma} \left[\kappa_{\alpha_2}^{*\text{TVUSR}}(r)\, e^{-j\alpha_2 r}\right] \star \left[\mathrm{K}(-r,\alpha_1,\beta)\, e^{j\alpha_2(-r))}\right]$ | $\gamma = \beta - \alpha_2 + \alpha_1$ |

### *D. Cyclic Spectrum of DT-TVUSR $-\,Q$ System Output*

The cyclic spectrum $\widehat{\varrho}_y(\gamma,\omega)$ is the discrete-time Fourier transform of the cyclic autocorrelation function $\varrho_y(\gamma, r)$. We denote the Fourier transform operation by the notation $\mathscr{F}(\cdot)$.

**Theorem 3.** *The cyclic spectrum of the output WS-ACS process $y$ of the proposed DT-TVUSR $-\,Q$ system (Fig. 5), which is fed by a WS-ACS process $x$ is given as :*

$$\widehat{\varrho}_y(\gamma,\omega) = \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \widehat{\kappa_{\alpha_2}^{*TVUSR}}(\omega-\alpha_2)\,\widehat{K}(\omega-\alpha_2,\alpha_1,\beta), \quad (47)$$

*where $\kappa_\alpha^{TVUSR}(r) \leftrightarrow \widehat{\kappa_\alpha^{TVUSR}}(\omega)$ are discrete-time Fourier transform pair coefficients; $\widehat{\kappa_{\alpha_1}^{TVUSR}}(\omega)$, $\widehat{\kappa_{\alpha_2}^{*TVUSR}}(\omega)$ are given in equations (49) - (54), and*

$$\widehat{K}(\omega,\alpha_1,\beta) = \mathscr{F}\left(\left[\kappa_{\alpha_1}^{TVUSR}(r)\, e^{-j\beta r}\right] \underset{r}{\star} \left[\varrho_x(\beta,r)\, e^{-j\frac{\beta}{2}r}\right]\right) = \widehat{\kappa_{\alpha_1}^{TVUSR}}(\omega+\beta) \times \widehat{\varrho}_x\left(\beta, \omega+\frac{\beta}{2}\right) \quad (48)$$

*where, $\underset{r}{\star}$ denotes the discrete-time convolution operation with respect to $r$.*

*Proof.* The detailed proof is given in Appendix B. □

The cyclic spectrum for various processes as inputs to various systems is summarized in Table III. Observe that a WSCS input $x$ having frequencies $\left(\frac{2\pi k_1}{N_{ip}}\right)$, exciting a DT-LTI system leads to an output process $y$ having cyclic spectrum,

$$\widehat{\varrho}_y(\gamma,\omega) = \sum_{\left(0,0,\frac{2\pi k_1}{N_{ip}}\right)\in\widetilde{\mathcal{A}_\gamma}} \widehat{\kappa_0^*}(\omega)\, \widehat{\mathrm{K}_{\text{WSCS}}^{\text{LTI}}}\left(\omega, \frac{2\pi k_1}{N_{ip}}\right), \quad (55)$$

where,

$$\widehat{\mathrm{K}_{\text{WSCS}}^{\text{LTI}}}\left(\omega, \frac{2\pi k_1}{N_{ip}}\right) = \mathscr{F}\left(\left[\kappa_0(r)\, e^{-j\left(\frac{2\pi k_1}{N_{ip}}\right)r}\right] \star \left[\varrho_x\left(\left(\frac{2\pi k_1}{N_{ip}}\right), r\right) e^{-j\left(\frac{\pi k_1}{N_{ip}}\right)r}\right]\right) = \widehat{\kappa_0}\left(\omega + \frac{2\pi k_1}{N_{ip}}\right) \times \widehat{\varrho}_x\left(\frac{2\pi k_1}{N_{ip}}, \omega + \frac{\pi k_1}{N_{ip}}\right). \quad (56)$$

Again, the spectrum of the output process $y$, when DT-LTI is excited by WSS process is $\widehat{\varrho}_y(0,\omega) = \widehat{\kappa_0^*}(\omega)\,\widehat{\mathrm{K}_{\text{WSS}}^{\text{LTI}}}(\omega)$, where,

$$\widehat{\mathrm{K}_{\text{WSS}}^{\text{LTI}}}(\omega) = \mathscr{F}(\kappa_0(r) \star \varrho_x(0,r)) = \widehat{\kappa_0}(\omega) \times \widehat{\varrho}_x(0,\omega). \quad (57)$$

The $\varrho_y(\gamma,r)$ and $\widehat{\varrho}_y(\gamma,\omega)$ formulas, summarized in Table II and Table III, make it possible to compute the MDTV and MDNST values. These values give us insight into the functioning of DT-TVUSR $-\,Q$ and its output process characteristics when excited by WS-ACS/WSCS/WSS processes. It is important to note that in the deterministic case, the Fourier

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$$\widehat{\kappa_{\alpha_1}^{\text{TVUSR}}}(\omega) = \lim_{N\to\infty}\frac{1}{2N+1}\sum_{n_1=-N}^{N} e^{-j(\omega n_1+\alpha_1 n_1)} \times \frac{1}{\mathcal{L}}\sum_{k=0}^{\mathcal{L}-1} F\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right) e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)n_1} \times \left\{1 + e^{j\omega}e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-1)} + \cdots + e^{j\omega(Q-1)}e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-\cdots L_{Q-1}-Q+1)}\right\} \quad (49)$$

$$= \frac{1}{\mathcal{L}}\sum_{k=0}^{\mathcal{L}-1}\sum_{\widetilde{k}\in\mathbb{Z}} \delta_{(\omega+\alpha_1)-\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right),2\widetilde{k}\pi} \times F\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right) \times \left\{1 + e^{j\omega}e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-1)} + \cdots + e^{j\omega(Q-1)}e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-\cdots L_{Q-1}-Q+1)}\right\} \quad (50)$$

$$= \frac{F(\omega+\alpha_1)}{\mathcal{L}}\sum_{k=0}^{\mathcal{L}-1}\left\{1 + e^{j\omega}e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-1)} + \cdots + e^{j\omega(Q-1)}e^{j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-\cdots L_{Q-1}-Q+1)}\right\} \quad (51)$$

$$\widehat{\kappa_{\alpha_2}^{*\text{TVUSR}}}(\omega) = \lim_{N\to\infty}\frac{1}{2N+1}\sum_{n_2=-N}^{N} e^{j(\omega(n_2-r)+\alpha_2(n_2-r))} \times \frac{1}{\mathcal{L}}\sum_{k=0}^{\mathcal{L}-1} F^*\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right) e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(n_2-r)} \times \left\{1 + e^{-j\omega}e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-1)} + \cdots + e^{-j\omega(Q-1)}e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-\cdots L_{Q-1}-Q+1)}\right\} \quad (52)$$

$$= \frac{1}{\mathcal{L}}\sum_{k=0}^{\mathcal{L}-1}\sum_{\widetilde{k}\in\mathbb{Z}} \delta_{\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)-(\omega+\alpha_2),2\widetilde{k}\pi} \times e^{j\left[\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)-(\omega+\alpha_2)\right]r} \times F^*\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right) \times \left\{1 + e^{-j\omega}e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-1)} + \cdots + e^{-j\omega(Q-1)}e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-\cdots L_{Q-1}-Q+1)}\right\} \quad (53)$$

$$= \frac{F^*(\omega+\alpha_2)}{\mathcal{L}}\sum_{k=0}^{\mathcal{L}-1}\left\{1 + e^{-j\omega}e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-1)} + \cdots + e^{-j\omega(Q-1)}e^{-j\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)(-L_1-\cdots L_{Q-1}-Q+1)}\right\} \times e^{j\left[\left(\frac{Q\omega-2\pi k}{\mathcal{L}}\right)-(\omega+\alpha_2)\right]r} \quad (54)$$

TABLE III
THE CYCLIC SPECTRUM $\widehat{\varrho}_y(\gamma,\omega)$ OF THE OUTPUT PROCESS $y$ OF A DT-LTI / DT-TVUSR $-Q$ SYSTEM WHEN EXCITED BY VARIOUS PROCESSES.

| Input process | System | $\widehat{\varrho}_y(\gamma,\omega)$ |
|---|---|---|
| WSS | DT-LTI | $\widehat{\varrho}_y(0,\omega) = \widehat{\kappa_0^*}(\omega)\,\widehat{\text{K}_{\text{WSS}}^{\text{LTI}}}(\omega)$ |
| WSCS | DT-LTI | $\widehat{\varrho}_y(\gamma,\omega) = \sum_{\left(0,0,\frac{2\pi k_1}{N_{ip}}\right)\in\widetilde{\mathcal{A}_\gamma}} \widehat{\kappa_0^*}(\omega)\,\widehat{\text{K}_{\text{WSCS}}^{\text{LTI}}}\left(\omega,\frac{2\pi k_1}{N_{ip}}\right)$ |
| WS-ACS | DT-TVUSR $-Q$ | $\widehat{\varrho}_y(\gamma,\omega) = \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \widehat{\kappa_{\alpha_2}^{*\text{TVUSR}}}(\omega-\alpha_2)\,\widehat{\text{K}}(\omega-\alpha_2,\alpha_1,\beta)$ |

transform of the output $y$, of the proposed DT-TVUSR $-Q$ system, to a deterministic input $x$, is easily seen to be,

$$Y(\omega) = \sum_{\alpha_1\in\mathcal{A}} \widehat{\kappa_{\alpha_1}^{\text{TVUSR}}}(\omega-\alpha_1)\,X(\omega-\alpha_1). \quad (58)$$

Non-stationarity refers to the time-varying statistical behavior of signals. Analyzing and characterizing the degree of non-stationarity helps understand the signal dynamics, identify underlying patterns, and extract meaningful information. Consequently, we measure the degree of non-stationarity (MDNST) of the output process of the DT-TVUSR $-Q$ system when it is excited by the WSS, WSCS, and WS-ACS processes. Again, if we observe (31), the only term that does not depend upon a time is $\gamma = 0$. All other terms have time-varying components. Hence fraction of power in the time-varying part to the total power is a reasonable measure for the degree of non-stationarity. Hence we have the degree of non-stationarity of the process $y$ :

$$\begin{aligned}\text{MDNST}(y) &= 1 - \frac{\sum_r |\varrho_y(r)|^2}{\sum_\gamma\sum_r |\varrho_y(\gamma,r)|^2} \\ &= 1 - \frac{\frac{1}{2\pi}\int_0^{2\pi}|\widehat{\varrho}_y(\omega)|^2\,d\omega}{\sum_\gamma \frac{1}{2\pi}\int_0^{2\pi}|\widehat{\varrho}_y(\gamma,\omega)|^2\,d\omega}\end{aligned} \quad (59)$$

***Discussion***: The results presented in sections IV to VI could be helpful in various applications. Here we discuss some of

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the possibilities :

- As mentioned earlier, the new family of structures opens new possibilities for signal modeling. As an illustration of this, the result section VII takes up ECG signals. In particular, we compute some features (degree of non-stationarity, time-varying spectrum, etc.) of ECG signal synthesized using the structure and real-life ECG and observe a good match between them.
- The sections mentioned above consider various scenarios of input non-stationarity and system time variance and derive results of the corresponding outputs' time-varying autocorrelation / spectrum. Since almost cyclostationarity represents a wide class of non-stationary processes, the results could be helpful in various explorations. For example, it could be used to manipulate the time-varying autocorrelation / spectrum of a process in the same spirit as LTI systems are used to shape the spectrum of a WSS process whose MDNST can be easily seen as zero. One of the interesting possibilities could be to design DT-TVUSR$-Q$ system, which transforms a given almost cyclostationary process into a white WSS process.
- Another interesting application of the results proposed here could be a classification problem where different non-stationary processes could be distinguished in their measure of the degree of non-stationarity.

## VII. Results and Simulations

The objective of the simulation studies is four-fold:

1) To illustrate how the time-variance of the DT-TVUSR system system changes as a function of up-sampling rates.
2) How does the MDNST of the input process get affected as it passes through the DT-TVUSR system.
3) Demonstrate the validity of the mathematical results regarding time-varying power spectral density of the output of the DT-TVUSR system by suitable spectral plots and tables. In particular, it shows that theoretically predicted frequencies match with the simulations of the same.
4) Demonstrating the possibility of using the proposed TVUSR structure for ECG generation.

The simulation studies are arranged in four sub-sections corresponding to the abovementioned objectives.

### *A. Measure for the degree of time variance (MDTV) of DT-TVUSR $-$ 2 System*

In this sub-section, we observe the amount of time-variance introduced by the DT-TVUSR $-$ 2 system as we change the up-sampling rate. Intuitively, the time variance is expected to increase as the up-sampling rate increases. In the multiple up-sampling case, we expect the time variance to increase as $N = \text{LCM}\,(L_1, L_2)$ increases. So, to observe this, we conduct the following experiment: For a DT-TVUSR $-$ 2 system, using different values for $L_1$ and $L_2$, substituting equation (23) in (25) and then substituting the result into (26), we obtain the MDTV values, which are presented in the form of a heat map as shown in Fig. 6. It is to be observed that the stabilized value of MDTV increases as LCM, an intuitively satisfying observation.

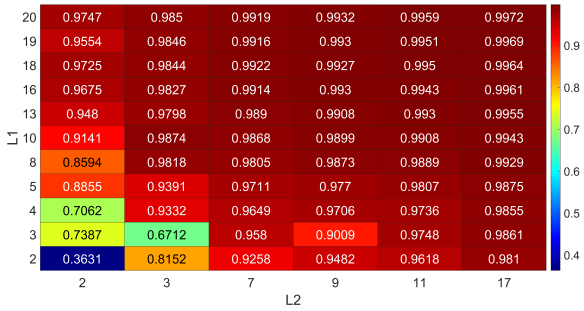


Fig. 6. MDTV values for a DT-TVUSR $-$ 2 system, with different values of $L_1$ and $L_2$.

### *B. Study of measure for the degree of non-stationarity (MDNST) for the output process of a DT-TVUSR system*

As mentioned earlier, the proposed DT-TVUSR system can be used to manipulate the non-stationarity of random processes. Hence, in this sub-section, we pass the WSCS process, with varying time-varying spectra, and the DT-TVUSR system, with different time variances controlled by up-sampling factors; moreover, we compute the MDNST for input and output processes. For a DT-TVUSR $-$ 2 system, excited by various wide sense cyclostationary (WSCS) process having frequencies $\beta$ (taken here with fundamental periodicity as $\frac{2\pi}{N_{ip}}$), using different values for $L_1$ and $L_2$, substituting equation (27) with $x$ replaced by $y$ in (32) and then substituting the result into (59), we obtain the MDNST values as listed in Table IV. As expected, a larger values of $L_1$ and $L_2$ likewise results in a greater MDNST.

TABLE IV
Comparison of the MDNST values of the WSCS input process $x$ and output processes $y$ for a DT-TVUSR $-$ 2 system with different values of $L_1$ and $L_2$.

| $N_{ip}$ | $L_1$ | $L_2$ | MDNST $(x)$ | MDNST $(y)$ |
|---|---|---|---|---|
| 9 | 2 | 3 | 0.8889 | 0.9696 |
| 9 | 3 | 5 | 0.8889 | 0.9790 |
| 4 | 2 | 3 | 0.7500 | 0.9322 |
| 4 | 3 | 5 | 0.7500 | 0.9512 |

### *C. Spectral Plot of the magnitude of $\varrho_y(\gamma, r)$ for wide sense stationary input*

In this sub-section, we provide simulation results that validate the expressions derived for the time-varying power spectral densities of the DT-TVUSR system output, for various input and system parameters.

Consider a DT-TVUSR $-$ 2 system with $L_1 = 2$, $L_2 = 9$, $\alpha_1 = \frac{2\pi}{N_1}k_2; \alpha_2 = \frac{2\pi}{N_1}k_3$, where $N_1 = 15$, that is stimulated by a wide sense stationary process for which we provide the spectral plot $|\varrho_y(\gamma_{sim}, r)|$ (Fig. 7) of the output process $y$. Observe that the theoretical output frequencies $\gamma = \beta - \alpha_2 + \alpha_1$ (obtained from Theorem 2) and the simulated frequencies $\gamma_{sim}$

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(shown in Table V) are identical. We have summarized our findings for various observation intervals in Table VI. Note that as the observation interval $N_{obs}$ increases, the cycle frequency resolution ($\Delta\gamma_{sim} \approx 1/N_{obs}$) decreases.

TABLE V
THEORETICAL AND SIMULATED VALUES OF OUTPUT FREQUENCIES AND THE MAGNITUDE OF THE CYCLIC AUTOCORRELATION FUNCTION FOR DT-TVUSR $-$ 2 SYSTEM (MARKERS SHOWN IN FIG. 7 FOR CONVENIENCE ONLY AT $r = 0$).

| $\gamma$ | $\lvert\varrho_y(\gamma, r)\rvert$ | $\gamma_{sim}$ | $\lvert\varrho_y(\gamma_{sim}, r)\rvert$ |
|---|---|---|---|
| 0 | 0.0001 | 0 | 0.000178 |
| $\pm 3$ | $3 \times 10^{-5}$ | $\pm 3$ | $2.928 \times 10^{-5}$ |
| $\pm 5$ | $2.9 \times 10^{-5}$ | $\pm 5$ | $2.933 \times 10^{-5}$ |

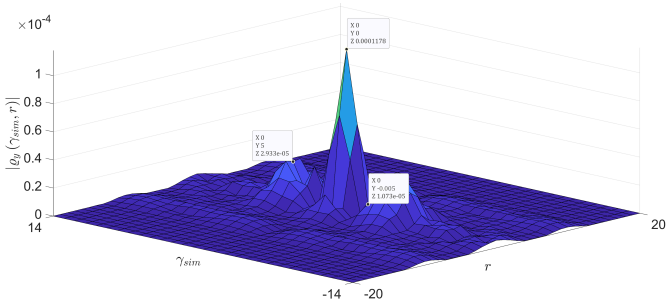


Fig. 7. Plot for $|\varrho_y(\gamma, r)|$ of the output process $y$ for a DT-TVUSR $-$ 2 system with $L_1 = 2$, $L_2 = 9$, that is stimulated by a WSS process and $N_{obs} = 100$.

TABLE VI
RELATION BETWEEN CYCLE FREQUENCY RESOLUTION AND OBSERVATION INTERVAL FOR DT-TVUSR $-$ 2 SYSTEM.

| $N_{obs}$ | $-\gamma_{sim}$ | $\gamma_{sim}$ | $\Delta\gamma \approx 1/N_{obs}$ |
|---|---|---|---|
| 100 | $-0.005$ | 0.005 | 0.01 |
| 200 | $-0.25 \times 10^{-3}$ | $0.25 \times 10^{-3}$ | $0.5 \times 10^{-3}$ |

### *D. Generation of Electrocardiogram (ECG) signals*

In this subsection, we show the utility of the proposed DT-TVUSR system for synthesizing electrocardiogram (ECG) waveform. As a first example, we generate a semi-periodic signal using the proposed DT-TVUSR system, and then, for the second example, we take a segment of the electrocardiogram (ECG) signal and, after extracting the required information from it, generate the same waveform using our proposed DT-TVUSR system. As stated earlier, real life electrocardiogram (ECG) signals are said to be semi-periodic because they have a repetition of almost the same $QRS$ complex / ripple after a random period, and this random period fluctuates from one $QRS$ complex / ripple to another around a mean value. Now, the output of a system with a fixed up-sampling would be a signal that is precisely periodic. On the other hand, our DT-TVUSR $-$ 2 comes to our aid when generating a semi-periodic signal. This simple illustration demonstrates the point we are attempting to convey. Consider a fixed up-sampler, with up-samling rate $L_g = 66$, followed by a filter whose impulse response matches the prototype $QRS$ complex. We pass an impulse train $x(n) = \sum_{k\in\mathbb{Z}} \delta(n-k)$ of length $I_\ell = 15$, representing number of impulses taken. Here we have taken the length of the impulse response of the LTI filter as $F_\ell = 65$ as shown in Fig. 9). The output periodic signal $y_1(n)$ is shown in Fig. 10. Note that for a strictly periodic or semi-periodic signal, the impulse train has an infinite duration, and the mentioned length corresponds to the one we took for the simulation, considering a finite data record. Again, we pass the same impulse train $x(n) = \sum_{k\in\mathbb{Z}} \delta(n-k)$ of length $I_\ell = 15$ through our proposed DT-TVUSR $-$ 2, having the parameters $L_1 = 59$, $L_2 = 70$; and using the same LTI filter (Fig. 9), we obtain the output $y_2(n)$ as shown in Fig. 10. Observe that $y_1(n)$ is a signal of a fixed period and $y_2(n)$ is our desired semi-periodic signal. Note that the observation interval is $N_{obs} = I_\ell \times F_\ell = 975$ samples. If we repeat the same demonstration with $\widetilde{I}_\ell = 25$, our observation interval becomes $\widetilde{N}_{obs} = \widetilde{I}_\ell \times F_\ell = 1625$ samples.

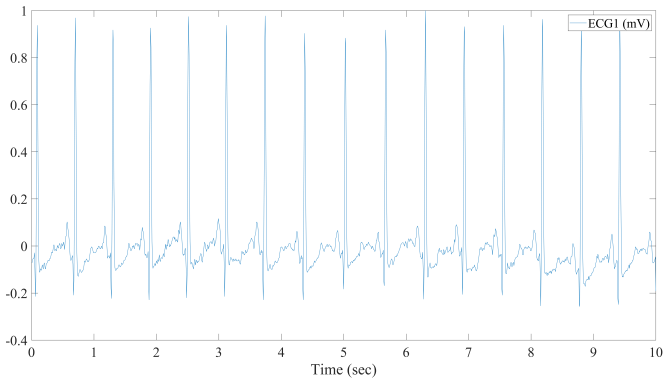


Fig. 8. Real world ECG Signal (First 10 seconds).

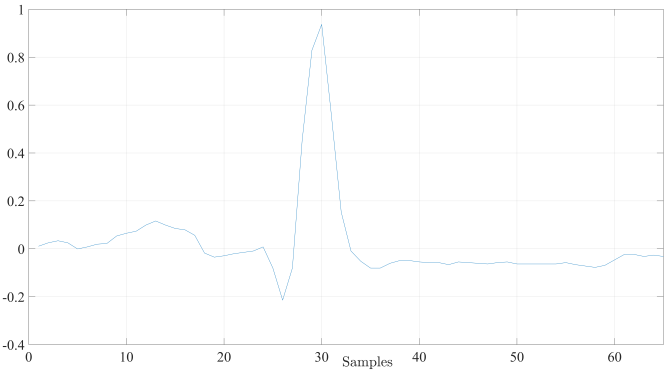


Fig. 9. Typical $QRS$ complex, taken as the impulse response of LTI filter for ECG synthesis.

Now as a second example, we take a segment of real ECG shown in Fig. 8 and try to synthesize it using the proposed structure. The variation of the heart rate of an ECG signal has been recently addressed in the framework of the cyclostationary processes [34], [35], [36]. The possibility of using our proposed model depends on the length of the adopted observation interval. This is based on the assumption that actual ECG can be approximated by piece-wise constant heart rate variability, and in a small segment, relatively, one can

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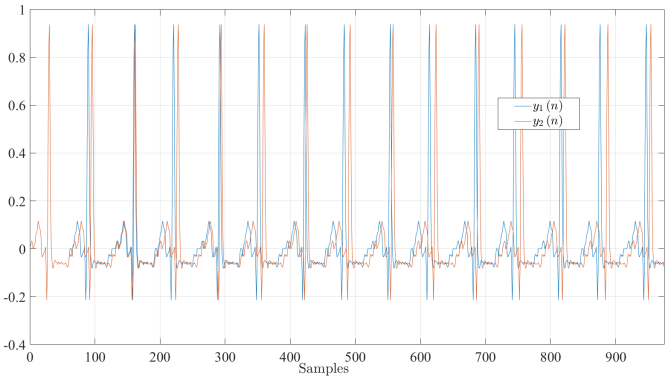


Fig. 10. Representation of the periodic ECG signal $y_1(n)$ and semi-periodic ECG signal $y_2(n)$ (Note that the observation interval is of length $N_\ell = 975$ samples).

choose optimum up-sampling factors that best approximate the heart rate variability in that segment. Hence here, we model heart rate variability in a piece-wise constant manner instead of piece-wise constant heart rate, which is attainable by fixed up-sampling.

For a real-world ECG signal $z$ (Fig. 8), having sampling frequency $f_s = \frac{1}{Ts} = 128$ Hz and time period $T_0 \approx 0.6$ seconds, the cyclic autocorrelation relation,

$$\varrho_z(\gamma, r) \triangleq \lim_{N\to\infty} \frac{1}{2N+1} \sum_{n=-N}^{N} z(n)\, z^*(n+r)\, e^{-j\gamma n} \quad (60)$$

is used. Fig. 11 (a) represents the spectral plot of a real-world ECG with an observation interval (data record length) of 10 seconds. Fig. 11 (b) represents the energy of the spectral plot. It is apparent from Fig. 11 that an ECG signal of 10 seconds has a spectral plot with very sharp peaks and thus can be modeled as a cyclostationary/ almost cyclostationary signal. Also, the width in $\gamma$ is of the order of $\frac{1}{N_{obs}}$ (Table VII). Such a cycle frequency resolution $\Delta\gamma$ can be obtained for the ECG signal (data-record length of 10 seconds) and is in complete agreement with the ECG signal model described in [39].

TABLE VII
RELATION BETWEEN CYCLE FREQUENCY RESOLUTION AND OBSERVATION INTERVAL FOR A 10-SECOND REAL-WORLD ECG (REFER FIG. 11).

| $N_{obs}$ | $\gamma_1$ | $\gamma_2$ | $\Delta\gamma \approx \frac{1}{N_{obs}}$ |
|---|---|---|---|
| 1280 samples | $-0.0041$ | 0.0041 | 0.008 |

Again, Fig. 12 (a) and Fig. 12 (b) represent the spectral plots of a real-world ECG $z$, with an observation interval (data record length) of 60 seconds. It is apparent from Fig. 12 that an ECG signal of 60 seconds has a spectral plot spread in $\gamma$ since the ECG signal cannot be modeled as cyclostationary when the observation interval is 60 seconds. Furthermore, the cycle frequency resolution $\Delta\gamma$ yields a result $\Delta\gamma >> \frac{1}{N_{obs}}$ (Table VIII), that is also in agreement with the ECG signal model described in [34].

In the subsequent experiment, we aim to demonstrate that a segment of ECG can be synthesized using our proposed DT-TVUSR $-$ 15. To assess the similarity between the two,

TABLE VIII
RELATION BETWEEN CYCLE FREQUENCY RESOLUTION AND OBSERVATION INTERVAL FOR A 60-SECOND REAL-WORLD ECG (REFER FIG. 12).

| $N_{obs}$ | $\gamma_1$ | $\gamma_2$ | $\Delta\gamma >> \frac{1}{N_{obs}}$ |
|---|---|---|---|
| 7680 samples | $-0.0082$ | 0.0082 | $0.0164 >> 0.00013$ |

TABLE IX
RELATION BETWEEN CYCLE FREQUENCY RESOLUTION AND OBSERVATION INTERVAL FOR A 10-SECOND GENERATED ECG (REFER FIG. 13).

| $N_{obs}$ | $\gamma_1$ | $\gamma_2$ | $\Delta\gamma \approx \frac{1}{N_{obs}}$ |
|---|---|---|---|
| 1280 samples | $-0.0041$ | 0.0041 | 0.008 |

namely, a real world ECG and the one generated via the proposed structure, we calculate their normalized $\ell_2$ distance.

*1) Electrocardiogram signal generation by DT-TVUSR$-$15:* Let us now briefly outline the steps how we obtain the up-sampling factors (Table X) :

- Step 1 : Extract the $QRS$ complex and $R$ peak locations from the real ECG for a given observation interval.
- Step 2 : Determine the difference between the $R$ peaks obtained in Step 1.
- Step 3 : From the real ECG, obtain gaps between consecutive $R$ peaks to find the up-sampling factors for use in the proposed structure.
- Step 4 : To synthesize the ECG signal, we utilize the $QRS$ complex extracted in step 1 as the impulse response of the LTI filter in the DT-TVUSR $-$ 15 system and the up-sampling factors obtained in step 3.

The spectral plots of the electrocardiogram (having observation interval of 10 seconds) produced by our proposed DT-TVUSR $-$ 15 system are obtained. It is apparent from Fig. 13 (a) and Fig. 13 (b), that the generated ECG signal $zen$ of 10 seconds has a spectral plot with very sharp peaks and thus can be modeled as a cyclostationary/almost cyclostationary signal. Also, the width in $\gamma$, that is $\Delta\gamma$, is of the order of $\frac{1}{N_{obs}}$ (Table IX).

*2) Metric of Closeness:* In this subsection, we determine the closeness of the real world electrocardiogram $z$ (observation interval 10 seconds) with the generated electrocardiogram $z_{gen}$ (observation interval 10 seconds). In order to see the closeness of the approximation, we compute the normalized $\ell_2$ distance between $|\varrho_z(\gamma, r)|$ of the real ECG and the $|\varrho_{zen}(\gamma, r)|$ of the synthesized ECG, using the formula $\frac{\sum_\gamma \sum_r |\varrho_z(\gamma,r) - \varrho_{zen}(\gamma,r)|^2}{\sum_\gamma \sum_r |\varrho_z(\gamma,r)|^2}$. The normalised error energy comes out to be $2.2 \times 10^{-3}$.

## VIII. CONCLUSION

This study presented a novel class of multirate structures that can introduce time-varying up-samplings. This paper proposed a novel family of structures termed discrete-time time-varying up-sampling rate systems, abbreviated as DT-TVUSR, and also derived the closed-form expression for its time-varying system kernel. Since the proposed family of structures has a linear time-varying nature, it is observed that it can be used to manipulate the non-stationarity of a random

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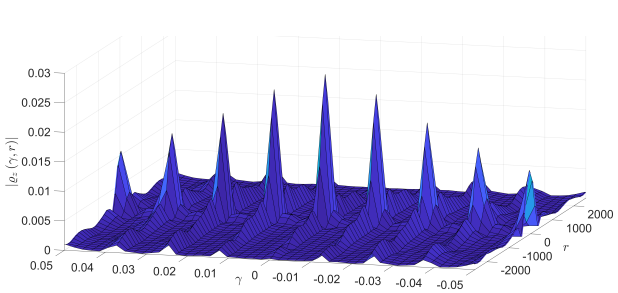
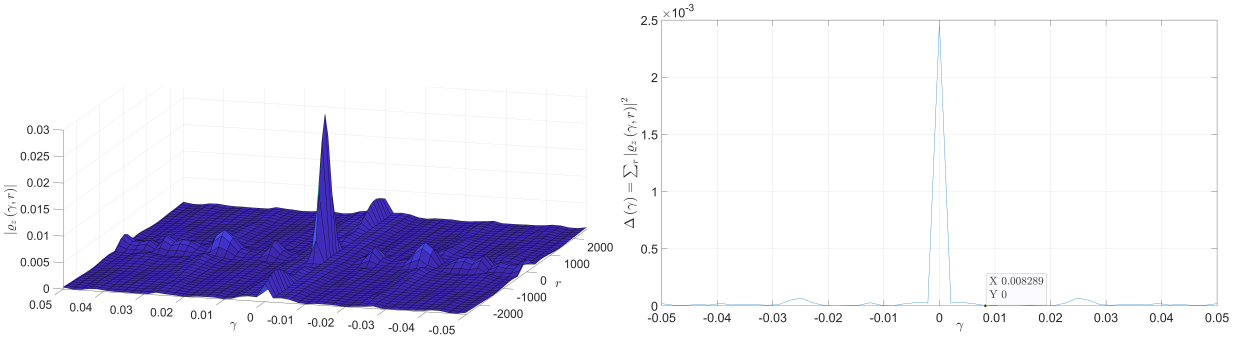



(a) Magnitude plot of the cyclic autocorrelation $\varrho_z(\gamma, r)$ as a function of $\gamma$ and $r$.

(b) Energy plot of $\varrho_z(\gamma, r)$ as a function of $\gamma$.

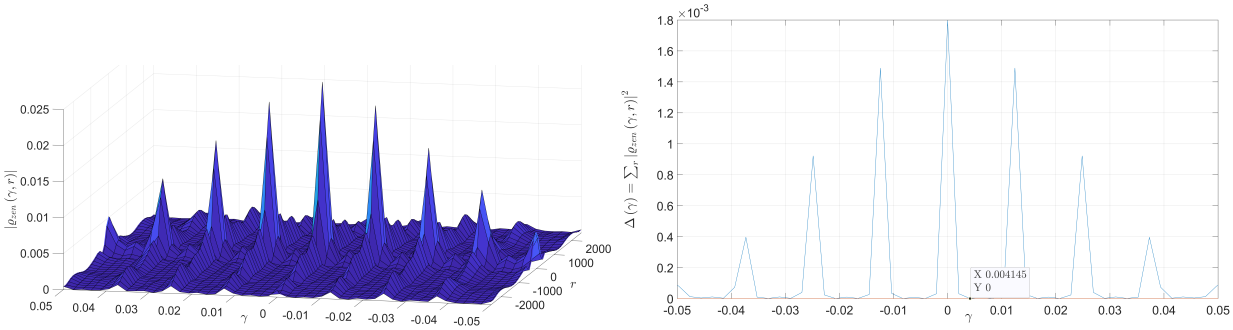
Fig. 11. Spectral Plots for 10 seconds real-world electrocardiogram signal $z$.




(a) Magnitude plot of the cyclic autocorrelation $\varrho_z(\gamma, r)$ as a function of $\gamma$ and $r$.

(b) Energy plot of $\varrho_z(\gamma, r)$ as a function of $\gamma$.

Fig. 12. Spectral Plots for 60 seconds real-world electrocardiogram signal $z$.




(a) Magnitude plot of the cyclic autocorrelation $\varrho_{zen}(\gamma, r)$ as a function of $\gamma$ and $r$.

(b) Energy plot of $\varrho_{zen}(\gamma, r)$ as a function of $\gamma$.

Fig. 13. Spectral Plots for 10 seconds electrocardiogram signal $zen$ generated by our proposed DT-TVUSR $-$ 15 system.

process. To this effect, we presented closed-form expressions for the cyclic autocorrelation of the system outputs when the inputs are WS-ACS/WSCS/WSS processes under various system conditions. The derivations of the cyclic spectrum for the situations shown above are also presented. We provided formulas for measuring the degree of time variance (MDTV) of the structure and the measure for the degree of non-stationarity (MDNST) of the input and output process for the situations addressed here. We give a simulation study to apply the proposed framework for generating an electrocardiogram signal.

## APPENDIX A
## PROOF OF EQUATION (46)

The equations (A.1) - (A.6) provide the details.

## APPENDIX B
## PROOF OF THEOREM 3

The equations (A.7) - (A.11) provide the details.

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TABLE X
UP-SAMPLING FACTORS FOR DT-TVUSR − 15 USED FOR GENERATING SYNTHETIC ELECTROCARDIOGRAM.

| $R$ peak locations (in samples) | Gaps between consecutive $R$ peaks (in samples) | Up-sampling factors |
|---|---|---|
| 12 | 78 | $L_1 = 78$ |
| 90 | 77 | $L_2 = 77$ |
| 167 | 77 | $L_3 = 77$ |
| 244 | 78 | $L_4 = 78$ |
| 322 | 78 | $L_5 = 78$ |
| 400 | 79 | $L_6 = 79$ |
| 479 | 81 | $L_7 = 81$ |
| 560 | 84 | $L_8 = 84$ |
| 644 | 82 | $L_9 = 82$ |
| 726 | 82 | $L_{10} = 82$ |
| 808 | 79 | $L_{11} = 79$ |
| 887 | 81 | $L_{12} = 81$ |
| 968 | 80 | $L_{13} = 80$ |
| 1048 | 79 | $L_{14} = 79$ |
| 1127 | 79 | $L_{15} = 79$ |

$$|\varrho_y(\gamma, r)| = \left| \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \left[\kappa_{\alpha_2}^{*\text{TVUSR}}(r)\, e^{-j\alpha_2 r}\right] \underset{r}{\star} \left[\mathrm{K}\left(-r, \alpha_1, \beta\right) e^{j\alpha_2(-r))}\right] \right| \tag{A.1}$$

$$= \left| \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \sum_{r_2} \kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\, e^{-j\alpha_2 r_2} \mathrm{K}\left(r-(-r_2), \alpha_1, \beta\right) \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} e^{j\alpha_2(r-(-r_2))} \right| \tag{A.2}$$

$$\leq \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \sum_{r_2} \left|\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\, \mathrm{K}\left(r-(-r_2), \alpha_1, \beta\right)\right| \leq \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \underbrace{\left\|\mathrm{K}\left(\cdot, \alpha_1, \beta\right)\right\|_\infty}_{\text{supremum norm in first variable}} \left|\kappa_{\alpha_2}^{*\text{TVUSR}}\right| \tag{A.3}$$

$$\text{Now,}\quad \mathrm{K}\left(r+r_2, \alpha_1, \beta\right) \triangleq \sum_{r_1} \kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\, e^{-j\beta r_1} \varrho_x\left(\beta, r+r_2-r_1\right) e^{-j\frac{\beta}{2}(r+r_2-r_1)} \tag{A.4}$$

$$\Rightarrow \left|\mathrm{K}\left(r+r_2, \alpha_1, \beta\right)\right| \leq \sum_{r_1} \left|\kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\, \varrho_x\left(\beta, r+r_2-r_1\right)\right| \leq \left\|\varrho_x\left(\beta, \cdot\right)\right\|_\infty \left|\kappa_{\alpha_1}^{\text{TVUSR}}\right| \tag{A.5}$$

Using equations (A.3) and (A.5), we have :

$$\Rightarrow |\varrho_y(\gamma, r)| \leq \sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma} \left\|\varrho_x\left(\beta, \cdot\right)\right\|_\infty \left|\kappa_{\alpha_1}^{\text{TVUSR}}\right| \left|\kappa_{\alpha_2}^{*\text{TVUSR}}\right| < \infty \tag{A.6}$$

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The cyclic spectrum $\widehat{\varrho}_y(\gamma,\omega)$ for the output signal $y(n)$ of the proposed DT-TVUSR system (Fig. 5) is the discrete-time Fourier transform of $\varrho_y(\gamma,r)$, which can be written as :

$$\widehat{\varrho}_y(\gamma,\omega)=\sum_{r\in\mathbb{Z}}\varrho_y(\gamma,r)\,e^{-j\omega r} \tag{A.7}$$

Substituting (35) in (A.7), we obtain :

$$\widehat{\varrho}_y(\gamma,\omega)=\sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma}\left[\sum_{r_2}\kappa_{\alpha_2}^{*\text{TVUSR}}(r_2)\,e^{-j\alpha_2 r_2}\right]\times\underbrace{\sum_{r\in\mathbb{Z}}\mathrm{K}(r-(-r_2),\alpha_1,\beta)\,e^{-j(\omega-\alpha_2)(r-(-r_2))}}_{\widehat{\mathrm{K}}(\omega-\alpha_2,\alpha_1,\beta)}e^{j\omega r_2} \tag{A.8}$$

$$=\sum_{(\alpha_1,\alpha_2,\beta)\in\mathcal{A}_\gamma}\left(\sum_{r_2}\kappa_{\alpha_2}^{\text{TVUSR}}(r_2)\,e^{-j(\omega-\alpha_2)r_2}\right)^*\times\widehat{\mathrm{K}}(\omega-\alpha_2,\alpha_1,\beta) \tag{A.9}$$

Observe that (A.9) reduces to (47). Now, $\widehat{\mathrm{K}}(\omega-\alpha_2,\alpha_1,\beta)$ of equation (A.9) can be expanded as :

$$\widehat{\mathrm{K}}(\omega-\alpha_2,\alpha_1,\beta)=\sum_{r\in\mathbb{Z}}\mathrm{K}(r,\alpha_1,\beta)\,e^{-j(\omega-\alpha_2)r} \tag{A.10}$$

Using (36), (A.10) reduces to :

$$\widehat{\mathrm{K}}(\omega-\alpha_2,\alpha_1,\beta)=\sum_{r\in\mathbb{Z}}\sum_{r_1}\kappa_{\alpha_1}^{\text{TVUSR}}(r_1)\,e^{-j\beta r_1}\times\varrho_x(\beta,r-r_1)\,e^{-j\frac{\beta}{2}(r-r_1)}e^{-j(\omega-\alpha_2)r} \tag{A.11}$$

Note that (A.11) reduces to (48).

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# Parametric analysis of evacuated annular parabolic solar receiver integrated solar stills: a relative optimization approach

**Ashok Kumar Singh**[1,2] · **Samsher**[1]

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**Abstract**
In this study, performance parameters were mathematically analysed using a novel solar still model's relative optimisation approach, which was focused on thermal performances with payback and environ-economic analysis. Proposed approach rectifies the irregular use of evacuated annular tubes (EATC) with the help of newly designed parabolic profile solar recipients (PSR) and maximizes the piece approach of suggested dual-fold solar still unit (DSS-EATC-PSR) in relationship to usual or PSR followed distinct oriented units. With the solar still cabinet thermal gain (11.4%) in accordance with a 30° angle inclined to horizontal of cabinet cover and all of the EATC tubing's combined the DSS-EATC-PSR coordination was improved and progressed. In comparison to SSS-EATC, also SSS-EATC-PSR, accordingly, a natural thermo syphon circulation increment with improvements (28.1%) is obtained for DSS-EATC-PSR. Also, compared to a solo face solared still system (SSS), the daily basis net efficacies (energy–exergy) have a minor decrease of 8.4% as well as 4.7%, respectively. Further, compared to SSS system, the yielding per day was improved by 4.6% at a noteworthy treatment cost with a modest promotion price of $0.07/l. The environmental revenue and $CO_2$ mitigation outperform the SSS structure by 5.9% and 14.6%, respectively. The concern expenditure of DSS unit is economical, and the productivity of the systems was found appreciable that assures the likelihood of the anticipated model.

**Keywords** Energy–exergy · Solar unit · Evacuated tube · Siphon · Parabolic

**Abbreviations**

| | |
|---|---|
| CPC | Combined parabolied collection |
| D | Direct |
| DSS | Dual solar-modeled still |
| EATC | Evacuated annulated tubular collection |
| L | Left |
| PSR | Parabola solard receiver |

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| | |
|---|---|
| R | Right |
| SSS | Single slanted solar-modeled still |
| U | Underneath |

**List of symbols**

| | |
|---|---|
| $A_a$ | Opening area ($m^2$) |
| $A_g$ | Glass area ($m^2$) |
| $A_b$ | Lining area ($m^2$) |
| $A_{rc}$ | EATC area ($m^2$) |
| $d$ | EATC dia. (m) |
| $E_e$ | Energetic output (kWh) |
| $E_x$ | Exergy production (kWh) |
| $h_{ba}$ | Thermal coefficient (lining to air) ($W/m^2$ K) |
| $h_{bw}$ | Convective thermal coefficient for lining to aqua ($W/m^2$ K) |
| $h_{t-g}, h_o$ | Thermal coefficient (glass-air) ($W/m^2$ K) |
| $h_{t-wg}$ | Thermal coefficient (aqua-glass) ($W/m^2$ K) |
| $h_{c-wg}$ | Convection thermal coefficient (aqua-glass) ($W/m^2$ K) |
| $h_{e-wg}$ | Evaporation thermal coefficient (aqua-glass) ($W/m^2$ K) |
| $h_{r-wg}$ | Radiation thermal coefficient (aqua-glass) ($W/m^2$ K) |
| $h_{r-ev}$ | EATC radiant thermal coefficient ($W/m^2$ K) |
| $h_{saf}$ | Thermal coefficient EATC-aqua ($W/m^2$ K) |
| $I_d(t)$ | Ground radiation ($W/m^2$) |
| $I_s(a)$ | Sun's irradiation ($W/m^2$) |
| $I_s(t)$ | Sun's instance irradiation ($W/m^2$) |
| $I_b(t)$ | Direct radiation ($W/m^2$) |
| $K_g$ | Glass conductivity (W/m K) |
| $K_b$ | Liner conductivity (W/m K) |
| $K_w$ | Aqua conductivity (W/m K) |
| L | Heat latent (J/kg) |
| $\dot{m}_{ewg}$ | Yielding (kg/h) |
| $\dot{m}_f$ | Circulation (kg/s) |
| $m_w$ | Aqua quantity (kg) |
| $m_f$ | EATC water quantity (kg) |
| $n_o$ | Air refractivity |
| $n_g$ | Glass refractivity |
| $n_w$ | Aqua refractivity |
| $p_w$ | Aqua vapor pressure (Pa, $N/m^2$) |
| $p_{gi}$ | Glass vapor pressure (Pa, $N/m^2$) |
| $R_{i1}$ | EATC inner ID (m) |
| $R_{i2}$ | EATC inner OD (m) |
| $R_{o2}$ | EATC outer OD (m) |
| $t_g$ | Glaze thick (m) |
| $T_{sa}$ | EATC absorber temperature (°C) |
| $T_w$ | Basin water temperature (°C) |
| $U_{saa}$ | EATC net heat transmit factor |
| V | Wind velocity (m/s) |

**Greek letters**

| | |
|---|---|
| $\beta'$ | Volumetric increase ($K^{-1}$) |
| $\alpha$ | Absorptivity of absorbent |
| $\mu$ | Viscosity (N s/$m^2$) |
| $\alpha_g$ | Absorptivity glaze |
| $\alpha_w$ | Aqua absorptivity |
| $\alpha_b$ | Lining absorptivity |
| $\eta_e$ | Energetic efficiency (%) |
| $\eta_x$ | Exergetic efficiency (%) |
| $\rho$ | Density (kg/$m^3$) |
| $\varepsilon_{eff}$ | Efficient emissivity |
| $\varepsilon_g$ | Glaze emissivity |
| $\varepsilon_w$ | Aqua emissivity |

## 1 Introduction

Solar bath type stills turn brackish water into drinkable water by harnessing various energy sources available in nature based on the corresponding meteorological conditions (Tiwari et al., 1992). Malik et al. (1982) configured conventional stills that have high convective heat losses. Therefore, improvements are necessary. With that in mind, Singh et al. (2020) and Singh (2020) offered different stills in this field to improve yielding. Thermal syphon usefulness for temperature interaction (hot–cold) with water streams was found by Sato et al. (2012) in EATC. For the same water quantities, Morrison et al. (2005) inspected EATCs for thermal syphon transient performance. As per Budihardjo et al. (2007), EATCs are superior for heating purposes. Both Budihardjo and Morrison (2009) and Koffi et al. (2008) investigated same topic and produced noteworthy findings for heating fluid medium while varying the working tube's controlling parameters. With EATC and an additional heat chamber, solar distiller units with Sampathkumar et al. (2013) and Dev and Tiwari (2012) confirmed yields of 2–4 L per day with respective efficiency of 30.1% and 43%. Additionally, under syphon working circumstances, Kumar et al. (2014) and Singh et al. (2013) reported ~4 l/$m^2$ and 54% efficacy. Later, even though the EATCs were exposed in their lower halves, Issa & Chang (2017) and Yari et al. (2016) observed and reported noteworthy results with 30 EATCs. Next, Patel et al. (2019) successfully desalinated sea water using a stepped still-EATC configuration that had the ability to remove salt on its own. Moghadam and Samimi (2022) experimented with the Box–Behnken design to explore the optimized geometrical features under the effective utilization of condensing chamber with EATC and found appreciable results in terms of yield output for the respective condenser volume. Later on, Lai and Zhang (2023) revealed a new perspective for membrane distillation through efficient EATC solar collector assisted air gap for saline water distillation and found it quite adequate for coastal household applications.

Additionally, a large number of still designs that demonstrate the technological advancements in this sector were provided by Bait (2019), Rashidi et al. (2018), Singh (2020, 2023), Singh and Gautam (2022), Singh and Samsher (2021a, 2021b, 2021c), Siregar et al. (2022). The aforementioned research support the use of EATC and provide justification for optimising EATC applications and forming competent associations in order to fully utilise EATC. Additionally, the literature currently in publication (Budihardjo & Morrison, 2009; Budihardjo et al., 2007) offered a quadrilateral thermo syphon form that is unsupported the

even mixing of water streams to each other in EATC. This is doable with the anticipated fusion of combinations of SSS augmented EATC-PSR, which provides a tapering thermo syphon as an superior change and reheat shift that improves yielding, efficacy, financially viable augmentation, refrain life, etc., in an environmentally approach.

The potable water production through the proposed models in an optimum way is tried to achieve through the relative parametric analysis of evacuated annular parabolic solar receiver integrated solar stills. The proposed research rendered the mathematical examination of performance parameters. Furthermore, for the thirty years that the observations were made, a relational performance investigation was measured for the innovative design, the corresponding requirements for treating brackish aqua mass, and the corresponding recitation of optimised performances under specific summer climatic surroundings. The targeted goals and the respective developed pathway to achieve the objectives are mentioned as follows:

(i) Configuration of the set-up followed by the mathematical modeling under the assumption of laminar flow only of the proposed novel design schemes.
(ii) Thermo syphon examination along with the energetic exergetic observations, energy matrices, and enviro-economic analysis of the proposed systems.
(iii) Comparative result analysis depends upon the effectiveness of various parameters and associations (EATC-PSR).
(iv) Finally, a frame of conclusion has been made for the best optimum results out of the conventional and proposed systems.

## 2 Set-up interpretation

Direct solar radiation is used by the typical systems, shown in Figs. 1 and 2, to heat water, generate steam, and condense the resulting liquid. Despite being a closed loop system, the material and manufacturing of the basin chamber causes significant heat losses, which can reach 26% sun's energy lost into cabinet, as well as other reflective losses was (~ 11%),

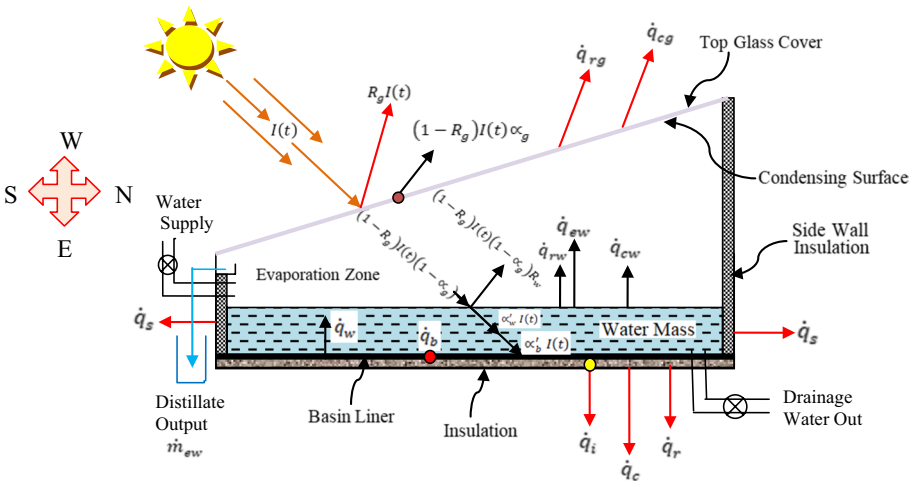


**Fig. 1** Symbolic representation and energy distribution for conventional SSS system

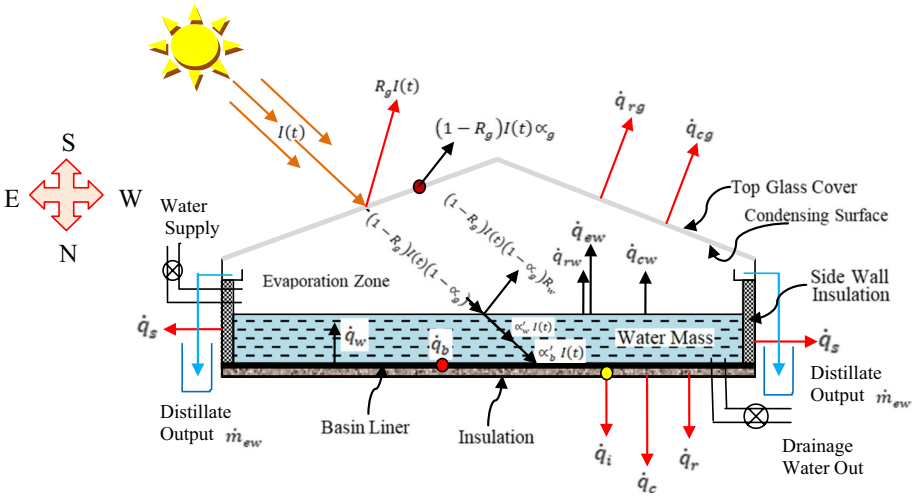


**Fig. 2** Symbolic representation and energy distribution for conventional DSS system

~10% losses in repetitive evaporation, ~2% through sidewall, and ~7% unregistered heat losses from the system, among other losses (Malik et al., 1982). Therefore, suggested innovative linkages are pretty useful with clear performance and parametric requirements to boost the performance of the conventional systems.

Moreover, the proposed model rectifies the uneven tendency of water loop circulation that is happening in a rectangular syphon style, which is now presented through DSS and SSS systems in combination with PSR under a circular syphon loop into the EATC while intermixing hot and cold water to each other. The proposed combination has not been examined so far, so the study hitch forces to investigate further in this province to un-salt the water. The study on effort assessment of the recommended mechanisms revealed appreciable results and compared both with existing lessons also. The contemporary analysis is based on targeted objectives of the recommended models by which one can accomplish the aforementioned objectives. The proposed models are indicated in Figs. 3 and 4 and mathematically examined to produce the matching findings and draw conclusions on potential future developments to benefit society in an environmentally responsible manner.

## 2.1 Solar still units (SSUs)

The conventional solar still units are further incorporated with the parallel array of the EATCs and a special combination of compounded parabolic concentrators, i.e., underneath and laterally placed reflectors, which makes the overall system a novel one. The current designs are schematically illustrated in Figs. 3 and 4, while Tables 1 and 2 provide the parameters of the created construction, along with some elegant details and parameters related to its many components. As for as the mass of the saline water used was taken in quite calculative manner follows the design of the model's floor area, i.e., $1 \times 1$ m$^2$ in which arrays of EATCs are connected having 0.058 m diameter (i.e., ~6 cm) which is supported by 3 cm pre and post heights of water column around the EATCs, in this way the cumulative height of saline water into the basin chamber became 15 cm (i.e., 3 cm + 6 cm + 6 cm) equivalent to 150 kg. However, the 3 cm post height of water column above EATC was

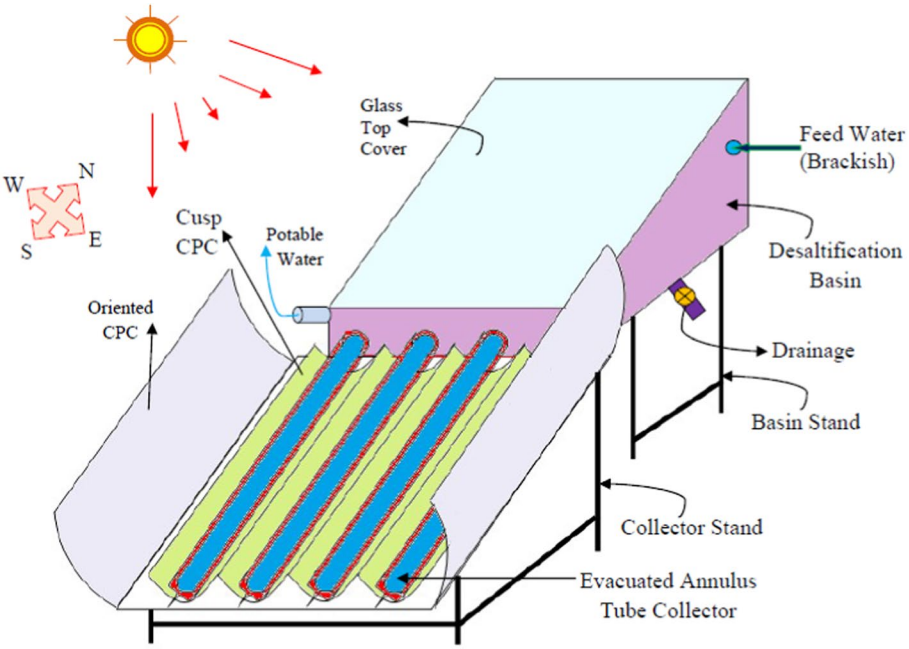


**Fig. 3** Graphical sketch of proposed scheme, i.e., SSS-EATC-PSR unit

inspired by Singh et al. (2013) in which optimum output was obtained for low water column height. Low thermal conductivity window glass set at 30° is installed in the basin chambers. Besides the painted inner walls in black and white, which represent the submerged and non-submerged sections, respectively.

### 2.2 EATC solar recipient

An innovative parabolic reflector helps to further improve the thermal gain, and enhanced by the annular solar receiver (Fig. 5). An evacuated borosilicate tube with a coat of absorber (Cooper + Steel + Aluminium Nitride) sandwiched at the out lay of the in-tube makes up the annuated sun's receiver. A vacuity annuated receiver is added to SSS setup in order to magnify the system recital; its specifications and design parameters are shown in Table 3. A mechanism is positioned at tube to open and ensure that the water flow continues unhindered during dark periods, preserving the thermosiphon's typical functionality.

### 2.3 PSR solar recipient

PSR confirms the consistent heat accumulation at EATC, as Fig. 6 illustrates. Furthermore, as no study has previously been conducted to innovatively combine this permutation recognized in the presented idea, as the PSR categorize the growing weightage of reflectors incorporation with EATC for a momentous improvement in the overall success and represented it in Table 3.

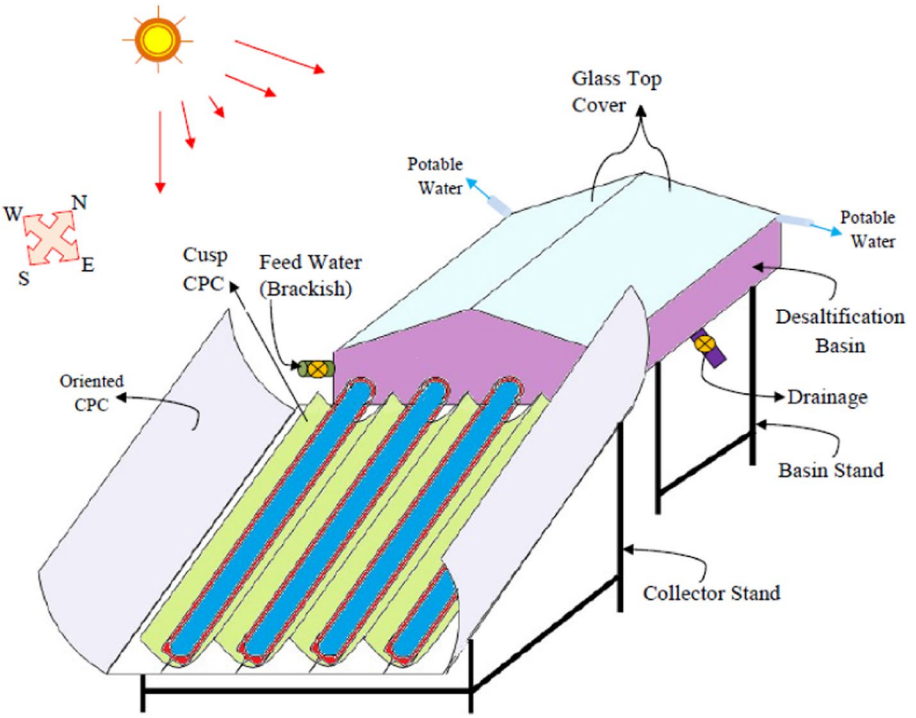


**Fig. 4** Graphical draw of proposed scheme, i.e., DSS-EATC-PSR system

**Table 1** Features and limitations of the suggested SSS unit

| Proposed SSS system | | | |
|---|---|---|---|
| SSS features | Specification | SSS Features | Specification |
| Cabinet base span | 1 m | Framework | Mild Steel |
| Cabinet base breadth | 1 m | Cabinet orientation | South |
| South wall altitude | 0.260 m | Aqua column | 0.16 m |
| North wall altitude | 0.837 m | Thickness of basin liner | 0.05 m |
| Top cover glaze area | 1.155 $m^2$ | Thickness of insulation | 0.05 m |
| Glass and EATC angle | 30° | $m_w$ | 160 kg |
| Material of basin body | FRP | $\alpha_g$ | 0.05 |
| Material of insulation | Glass wool | $\alpha_b$ | 0.97 |
| Basin cover material | Glass | $\alpha_w$ | 0.34 |
| Cover glaze thickness | 0.004 m | $n_o$ | 1 |
| $\sigma$ ($W/m^2 K^4$) | $5.6697 \times 10^{-8}$ | $n_g$ | 1.5 |
| $\varepsilon_g$ | 0.9 | $n_w$ | 1.3 |
| $\epsilon_w$ | 0.9 | $K_g$ | 0.78 W/m K |
| C | 0.54 | $n$ | 0.25 |
| $K_b$ | 0.33 W/m K | $K_{i(glasswool)}$ | 0.03 |

**Table 2** Features and limitations of the dual slant solar bath still unit

| Proposed DSS system | | | |
|---|---|---|---|
| DSS features | Specification | DSS Features | Specification |
| Basin length | 1 m | Frame substance | Mild Steel |
| Basin width | 1 m | Basin direction | East–West |
| Basin east–west height | 0.260 m | Water deepness | 0.16 m |
| Basin wall centre height | 0.394 m | Liner depth | 0.05 m |
| Basin glass area | 1.155m$^2$ | Insulation depth | 0.05 m |
| Glass inclination | 30° | $m_w$ | 160 kg |
| Basin substance | FRP | $\alpha_g$ | 0.05 |
| Insulating substance | Glass wool | $\alpha_b$ | 0.97 |
| Cover substance | Glass | $\alpha_w$ | 0.34 |
| Cover depth | 0.004 m | $n_o$ | 1 |
| $\sigma$ (W/m$^2$ K$^4$) | $5.6697 \times 10^{-8}$ | $n_g$ | 1.5 |
| $\varepsilon_g$ | 0.9 | $n_w$ | 1.3 |
| $\varepsilon_w$ | 0.9 | $K_g$ | 0.78 W/m K |
| C | 0.54 | $n$ | 0.25 |
| $K_b$ | 0.33 W/m K | $K_{i(glasswool)}$ | 0.03 |

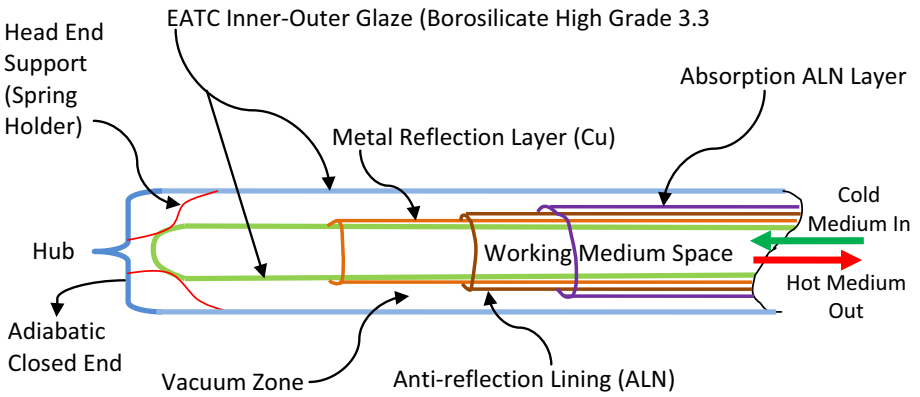


**Fig. 5** Graphical labeled sketch of EATC

## 3 Thermal investigation

### 3.1 EATC solar heat absorber

The following can be used to represent the absorber heat (Singh, 2024; Tiwari et al., 2016).

$$T_{sa} = \left[(\propto \tau)_{eff} \cdot I_b(t) + F' h_{saf} T_f + U_{saa} T_a\right] / \left[F' h_{saf} + U_{saa}\right] \quad (1)$$

where $U_{saa}$ and $(\propto \tau)_{eff}$ stand for the effective product (absorptive to transmissivity) and total heat loss factor, respectively.

**Table 3** Limitations and provisions for the aided aspects

| EATC features | Specification | PSR features | Specification |
|---|---|---|---|
| Tube size | 1.8 m | OCPC extent (m) | 1.8 |
| Receiver density (kg/m$^3$) | 2710 | OCPC partial opening (m) | 0.935 |
| Inside tube in dia | 0.047 m | OCPC net opening (m) | 2.87 |
| Inside tube out dia | 0.049 m | Effectual CR of OCPC-EATC | 2.5 |
| Outer tube in dia | 0.056 m | CCPC span | 1.8 m |
| Outer tube out dia | 0.058 m | CCPC opening | 0.314 m |
| Vacuum spacing | 0.007 m | Reflector concentration fraction | 2 |
| Glass depth | 0.002 m | OCPC direction to tube | 39.89°–40° |
| Absorber area | 0.0034 m$^2$ | OCPC approach to ground | 45° |
| Tube substance | High borosilicate 3.3 glass | CCPC direction | 45° |
| Central distance | 0.314 m | CPC thickness | 0.3 mm |
| $F'$ | 0.968 | Reflectivity of CPC | 0.86 |
| $R_{sc}$ | 0.05 | CPC substance | 1060 Al alloy |
| α | 0.95 | Reflector shade | Silver |
| τ | 0.95 | Reflector to tube opening | 0.079 m |
| $h_{saf}$ | 100 W/m$^2$ K | Reflector concentration fraction | 2 |

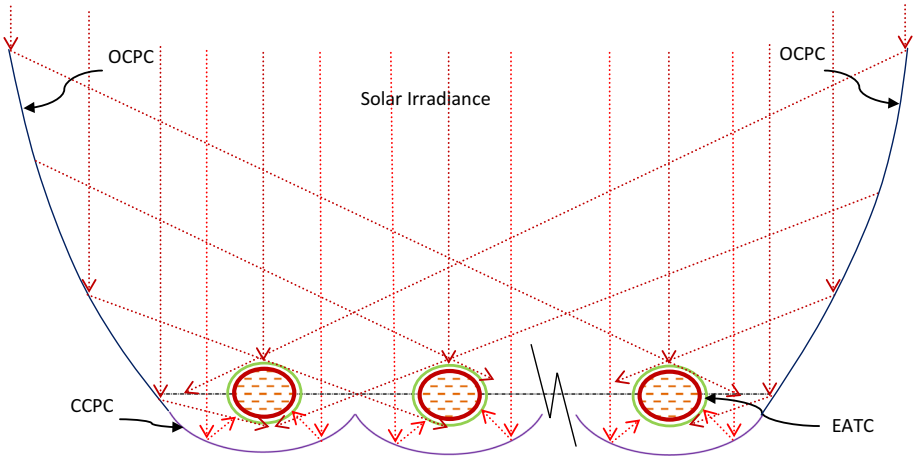


**Fig. 6** Graphical labeled sketch of EATC-PSR array

By adhering to the trailing edge conditions, the EATC liquid hotness can be expressed (Singh & Gautam, 2022):

$$T_f = \begin{cases} T_{fi}; & for \quad x \to 0 \\ T_{N-fo}; & for \quad x \to L_{EATC} \end{cases} \tag{2}$$

$$T_{N-fo} = F_2 T_{fi} + \frac{N' \cdot \left(A_{rc} \cdot F_r\right)}{N \cdot \dot{m}_f C_f} \left\{ F_1 (\propto \tau)_{eff} I_b(t) + U_L T_a \right\} \tag{3}$$

The tube's heat gain as Singh and Samsher (2022),

$$\dot{Q}_{N-EATC} = F_1 (\propto \tau)_{eff} \left(F_r A_{rc}\right) I_b(t) - C_f \dot{m}_f \cdot (N-1) T_{fi} - \left(A_{rc} \cdot F_r\right) U_L \left(T_{fi} - T_a\right) \tag{4}$$

### 3.2 Solar still units

Following the energy expressions (Singh & Samsher, 2022), glaze outer hotness for SSS and DSS, i.e., ($T_{go}$) and ($T_{goE}, T_{goW}$) are:

$$T_{go} = \left( T_{gi} \frac{K_g}{t_g} + h_{t-g} \cdot T_a \right) / \left( h_{t-g} + \frac{K_g}{t_g} \right) \tag{5a}$$

$$T_{goE} = T_{giE} + U_{cE} \cdot \frac{t_g}{K_g} \cdot \left[ T_a - T_{giE} \right] \tag{5b}$$

$$T_{goW} = T_{giW} + U_{cW} \cdot \frac{t_g}{K_g} \cdot \left[ T_a - T_{giW} \right] \tag{5c}$$

where $t_g$, $h_{t-g}$, $h_{t-gE}$, and $h_{t-gW}$ offers the apex cover thickness and net heat transmit coefficient of South, and East to West sides towards the ambiance, accordingly.

The following can be used to express the comparable inner glass temperatures (Singh and Samsher 2022; Singh and Gautam 2022),

$$T_{gi} = \left( \alpha_g^A I_s(t) A_g + U_c A_g T_a + h_{t-wg} A_b T_w \right) / \left( U_c A_g + h_{t-wg} A_b \right) \tag{6a}$$

$$T_{giE} = \frac{\frac{A_b}{2} \cdot T_w \cdot h_{t-wgE} + A_{gE} \cdot \left[ \alpha_g^A \cdot I_{sE}(t) + U_{cE} \cdot T_a + T_{giW} \cdot h_{r-EW} \right]}{\left[ \frac{A_b}{2} \cdot h_{t-wgE} + A_{gE} \cdot \left( U_{cE} + h_{r-EW} \right) \right]} \tag{6b}$$

$$T_{giW} = \frac{\frac{A_b}{2} \cdot T_w \cdot h_{t-wgW} + A_{gW} \cdot \left[ \alpha_g^A \cdot I_{sW}(t) + U_{cW} \cdot T_a + T_{giE} \cdot h_{r-WE} \right]}{\left[ \frac{A_b}{2} \cdot h_{t-wgW} + A_{gW} \cdot \left( U_{cW} + h_{r-WE} \right) \right]} \tag{6c}$$

The terms '$\alpha_g^A$ and $h_{t-wg}$' are the part solar absorption fraction and heat dispersion coefficient, likewise (Cooper, 1969; Dunkle, 1961; Singh & Samsher, 2021a).

Under the boundary conditions, a thermal equilibrium relative expression can be distinguished (for, $t = 0; T_w = T_{wo}$) as

$$T_w = T_{wo} \cdot e^{-at} + \frac{\bar{f}(t)}{a} \left(1 - e^{-at}\right) \tag{7}$$

Additionally, the term $\bar{f}(t)$ provides an averaged value for the time period of $f(t)$ to analyse the temperature of the basin water.

Further, for the thermo syphon examination subsequently (Budihardjo & Morrison, 2009), the expression for Reynolds No.,

$$Re = 0.191\left\{\frac{Nu \cdot Gr}{Pr}\left(\frac{L_{EATC}}{2R_{i1}}\right)^{1.2} \cdot Cos\theta\right\}^{0.4084} \tag{8a}$$

$$\dot{m}_f = 0.6643\left\{\frac{\left(g \cdot \beta' \cdot \rho^2 \cdot \dot{q}\right)}{\left(C_f \cdot \mu^{0.55}\right)} \cdot \left(L_{EATC}\right)^{1.2} \cdot {R_{i1}}^{5.25} \cdot Cos\theta\right\}^{0.4084} \tag{8b}$$

Finally, follows (Singh & Samsher, 2023) for $\dot{m}_f$ as expressed,

$$\dot{m}_f = 1.52\left[\frac{\left[\left(A_{rc} \cdot F_r\right)\left\{F_1(\propto \tau)_{eff} I_b(t) - U_L\left(T_{fi} - T_a\right)\right\} - \left(\frac{1}{T_{N-fo} - T_{fi}}\right)\left\{T_{fi} \cdot \dot{Q}_{N-EATC} \cdot (1 - 1/N)\right\}\right]}{N \cdot A_{rc}} \cdot \left(\frac{L_{EATC}}{d}\right)^{1\cdot 2} \cdot \frac{g \cdot \beta' \cdot \rho^2 \cdot {R_{i1}}^{6.45}}{C_f \cdot \mu^{0.55}} \cdot Cos\theta\right]^{0.41} \tag{8c}$$

where '$T_{fi} = T_w$' for EATC tube.

The yielding of clean water ($\dot{m}_{ewg}$), energy gain $(E_e)_{hr}$, and Temperature differences determine energy efficiency. $(T_w - T_{giE})$ and $(T_w - T_{giW})$ which can be written as follows,

$$\dot{m}_{ewg} = \frac{\left\{h_{e-wgE} \cdot \frac{A_b}{2} \cdot (T_w - T_{giE})\right\} + \left\{h_{e-wgW} \cdot \frac{A_b}{2} \cdot (T_w - T_{giW})\right\}}{L} \times 3600 \tag{9}$$

$$(E_e)_{hr} = (\dot{m}_{ewg} \cdot L) \times \frac{1}{3600} \tag{10}$$

$$\eta_i = \frac{\left[\frac{A_b}{2} \cdot T_w\left(h_{e-wgE} + h_{e-wgW}\right) - \left(h_{e-wgE} \cdot T_{giE} + h_{e-wgW} \cdot T_{giW}\right)\right]}{\frac{A_b}{2} \cdot \left\{I_{sE}(t) + I_{sW}(t)\right\} + I_b(t) \cdot A_a} \times 100 \tag{11}$$

$$\left(\eta_e\right)_{hr} = \frac{\left(E_e\right)_{hr}}{\frac{A_b}{2} \cdot \left\{I_{sE}(t) + I_{sW}(t)\right\} + \dot{Q}_{N-\mathrm{AVT}}} \times 100 \tag{12}$$

The current model's exergy equilibrium is shown as,

$$(\dot{E}_x)_{in} - (\dot{E}_x)_{des} = (\dot{E}_x)_{out} \tag{13}$$

where $(\dot{E}_x)_{des}$ is exergy (destructed) and $(\dot{E}_x)_{hr-out}$ hourly energy exiting the projected system, correspondingly (Cengel & Boles, 2013). Moreover, the exergy per hour $(\dot{E}_x)_{hr-in}$ (Petela, 2003),

$$\left(\dot{E}_x\right)_{hr-in} - \left(\dot{E}_{\mathrm{EATC}}\right)_{hr-in} = \left(\dot{E}_{sun}\right)_{hr-in} \tag{13a}$$

$$(\dot{E}_x)_{hr-in} = 0.933 \cdot \left\{I_{sE}(t) + I_{sW}(t)\right\} \cdot \frac{A_b}{2} + \dot{m}_f C_f \left\{ \left(T_{N-fo} - T_{fi}\right) - T_a \cdot ln\left(\frac{T_{N-fo}}{T_{fi}}\right) \right\} \tag{13b}$$

Lastly, hourly energy efficiency for systems with a single or double slope can be expressed as

$$\left(\eta_x\right)_{SS} = \frac{\left(\dot{E}_x\right)_{hr-out}}{\left[\left(\dot{E}_{x\,\mathrm{AVT}}\right)_{hr-in} + \left(\dot{E}_{x\,sun}\right)_{hr-in}\right]} \times 100 \tag{14a}$$

$$\left(\eta_x\right)_{DS} = \frac{h_{e-wgE} \cdot \frac{A_b}{2}\left\{\left(T_w - T_{giE}\right) - T_a \cdot ln\left(\frac{T_w}{T_{giE}}\right)\right\} + h_{e-wgW} \cdot \frac{A_b}{2}\left\{\left(T_w - T_{giW}\right) - T_a \cdot ln\left(\frac{T_w}{T_{giW}}\right)\right\}}{0.933 \cdot \frac{A_b}{2} \cdot \left\{I_{sE}(t) + I_{sW}(t)\right\} + \dot{m}_f C_f \left\{\left(T_{N-fo} - T_{fi}\right) - T_a \cdot ln\left(\frac{T_{N-fo}}{T_{fi}}\right)\right\}} \times 100 \tag{14b}$$

## 4 System payback and enviro-economic analysis

The payback factor, i.e., $(EP)_F \to 1, for (EP)_T = 1$; then a reasonable establishment is provided by the system.

$$\left(EP_e\right)_T = E_{in} / \left(E_e\right)_{yr} \tag{15a}$$

$$\left(EP_x\right)_T = E_{in} / \left(E_x\right)_{yr-out} \tag{15b}$$

Moreover, the energy–exergy conversion life efficiencies can be expressed by Singh and Samsher (2021c),

$$\left(\eta_e\right)_{LCC} = \frac{n \cdot \left(E_e\right)_{yearly} - E_{in}}{\left(E_e\right)_s} \tag{15c}$$

$$\left(\eta_x\right)_{LCC} = \frac{n \cdot \left(E_e\right)_{yearly} - E_{in}}{\left(E_x\right)_s} \tag{15d}$$

A system with a higher $(\eta)_{LCC}$ is desirable since it signifies a noticeably better yield throughout the given life period. Additionally, the planned method's annual productivity $\left(\eta_P\right)_{yearly}$ can be expressed (Benson, 1952; Cox, 1951),

$$\left(\eta_P\right)_{yearly} = \frac{\left[C_s \times \left(M_{ewg}\right)_{yr}\right]}{TAC} \times 100 \tag{16}$$

'$(C_s)$, & $\left(M_{ewg}\right)_{yearly}$', and $TAC$ refers to yearly outlay of system, which, by the ending of year, is a combination of set costs, continuance costs (5% of the set costs), and retrieve costs (20% of the prime assets price) with 10% of the interest rate inflation taken into account (Singh & Samsher, 2023).

Exergy economic factor $(E_x)_{EF}$ represented as offered (Tsatsaronis & Park, 2002),

$$(E_x)_{EF} = (E_x)_{yr-out}/TAC \tag{17}$$

The mitigates and carbon credits of the respective pollutents can be given as Mittal et al. (2014), Reddy et al. (2018), Singh and Samsher (2021c), World Bank (2021),

$$(MEq_e)_{\mathrm{CO2,SO2,NO}} = 1.58\left\{(E_e)_{yr} \times n - E_{in}\right\} \tag{18}$$

$$(E_{ce})_C = 9.99\left[1.58\left\{(E_e)_{yr} \times n - E_{in}\right\}\right] \tag{19a}$$

## 5 Results and discussion

The Sun's insolation over a flat face is converted for elevated face by following the input identifiers (i.e., Sun's insolation over a flat face, ambience, etc.) of IMD Pune data, India, are confirmed (Liu & Jordan, 1960). The targeted day for the climatic data of the observation was 15th June 2018 of summer season of Delhi Technological University, Delhi region (Latitude: 28° 44′ 35.88″ N & Longitude: 77° 07′ 0.78″ E). Figure 8 shows a thorough representation of average sun's insolation with fluctuation per hour in respective directions, as well as air speed and temperature. Additionally, the computational tool MATLAB 2015a is used to programme and answer the following expressions. Figure 7 shows the meticulous methodology for the suggested study (Fig. 8).

### 5.1 EATC-PSR usefulness

The consistent heat increase around the EATC boundary is maintained by the innovative scheme with EATCs and PSR. In contrast to other SSUs, the elevated medium depth and thicker insulation optimizes with maximising the heat growth in the cabinet under the hypothesised ecological situations (Figs. 9, 12). Additionally, the cabinet liner is heat sensitive towards the basin water and enables better sun absorption thanks to its matt black pointed surface. Furthermore, the ideal number of designated EATCs aids in accelerating the rise in basin temperature, and CCPC-OCPC links with an appropriate converge ratio optimise EATC application to the fullest extent possible while enhancing circulation rate within EATC to SSU cabinet. Because of the expert use of parabolic receivers, a tapering circle of steams (hot and cold) was created in EATC. The EATC-PSR associations and the basin top glaze cover's elevation received the largest amount of solar radiation over them. To optimise sunlight recovery in the basin chamber, the glossy white painted inner side walls of the basin are visible above the water's level.

### 5.2 Relative presentation

The relative presentations for the both the designs as per the self-determining were taken and compared as well. This examination also lists the characteristic performances of both the anticipated models (DSS-EATC-PSR and SSS-EATC-PSR). The following Table 4

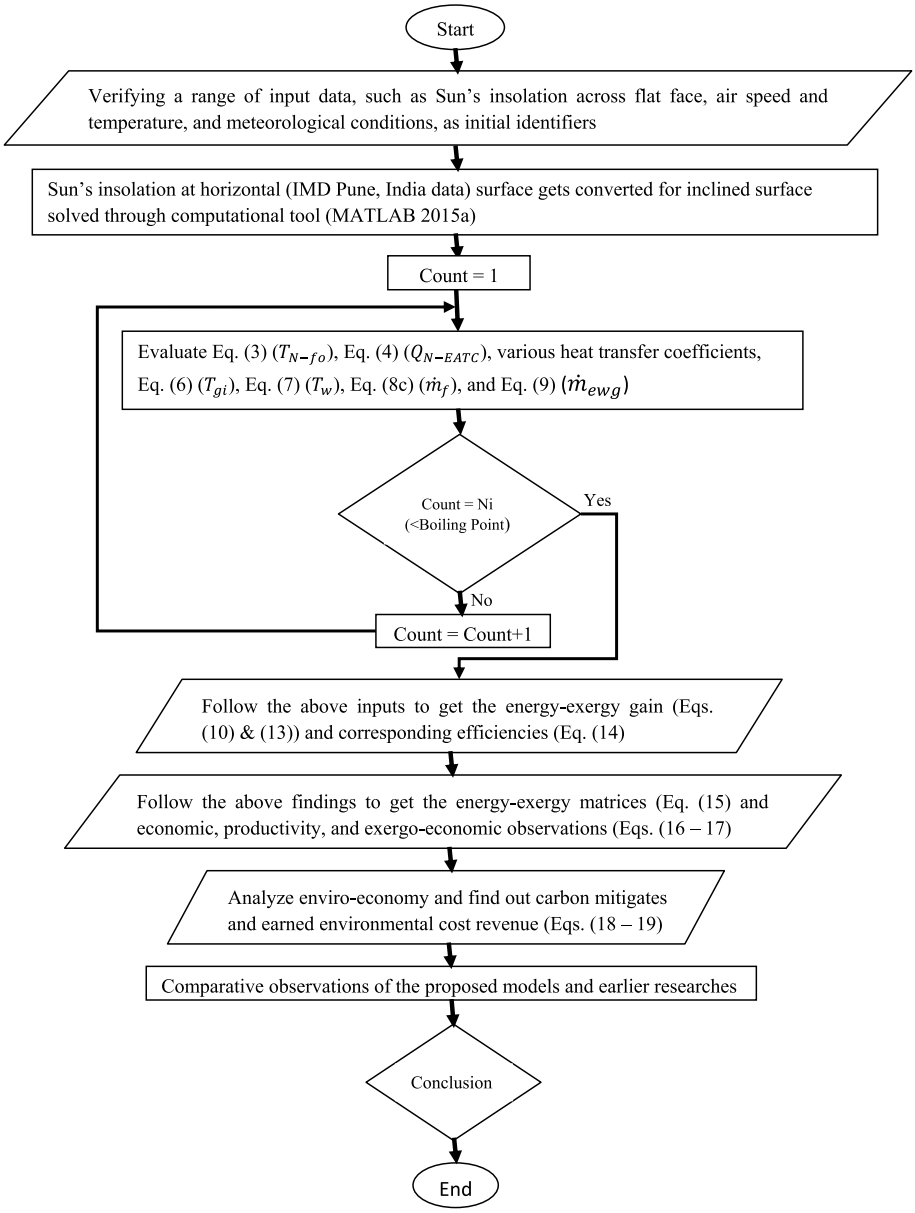


**Fig. 7** Methodological algorithm for the proposed research plan

provides an overview of the comparative results and related observations with potential behavioural explanations. These basic parameters are taken to be yielding, thermal gain, and efficiency, payback periods and environ-economics, etc. Additionally, the systems under study from usual to sophisticated solar thermal units assisted EATC-PSR represent the progressive follow-up in ascending order for illustrating its overall performance increase in comparison to what has been expressed: SSS with least performance, DSS,

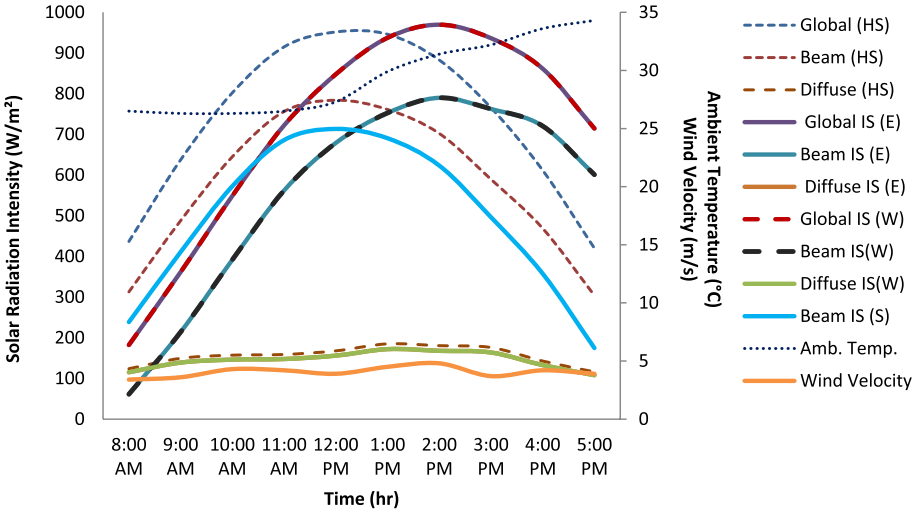


**Fig. 8** An illustration of the Sun's insolation, together with the air speed and temperature variations per hour at elevated and flat faces

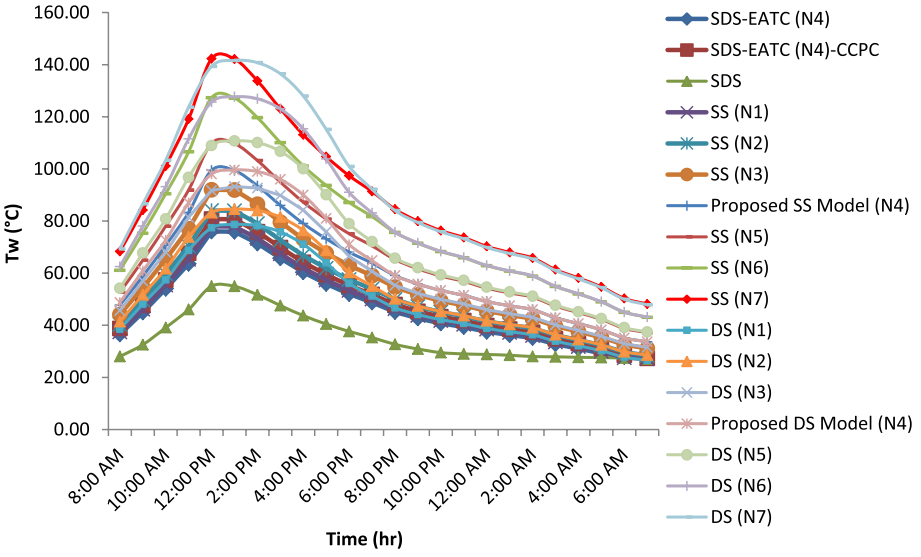


**Fig. 9** Illustration of the efficacy of cabinet water hotness owing to parabolic reflector and vacuum tubing

SSS-EATC, DSS-EATC (medium), SSS-EATC-CCPC (medium), DSS-EATC-CCPC (moderate), SSS-EATC-PSR, and with highest performance DSS-EATC-PSR.

The production of potable water is contingent upon the thermo syphon at the respective hotness of cabinet aqua ($T_w$), the heat shift coefficient (Fig. 10), and temperature variations all through the daytime, which are subsequently followed by the circulation rate and ($T_w - T_{giE}$, $T_w - T_{giW}$), as illustrated in Fig. 11. The premier yielding was found at 1 pm as

**Table 4** General comparisons of the findings and associated data with potential behavioural explanations

| Constraint | SSS | DSS | Qualified remarks |
|---|---|---|---|
| Yielding (kg/day) | 16.2 | 16.94 | Owing to greater sun's insolation in the respective orientation and proficient condensing split into two halves and the probable yield increased by 4.6% compared to the DS model |
| Max. hotness (°C) | 99.5 | 99.6 | A small rise in the maximum temperature (0.1%) brought on by the DS model's superior solar exposure over the other |
| Thermo siphon (kg/h) | 54.96 | 55 | A minimal 0.1% improvement in thermosiphon transmission as a result of the EATC-PSR relationship and the extra benefit of improved sun's experience in the DS model |
| Energy growth (kWh) | 10.27 | 10.86 | Since energy growth is closely correlated with production yield, or 5.7% more, it also emerged when the yield was higher |
| Energy efficiency (%) | 50.8 | 46.53 | While the DS model has a larger energy gain, the DSS system's energy efficiency is reduced (8.4%) because of a higher energy input resulting from improved solar exposure |
| Exergetic production cost ($/kWh) | 0.016 | 0.013 | Owing to a high yield of production and a set TAC that reduced the cost of energetic production by 18.8% |
| Productivity (%) | 940.8 | 1052.98 | The substantial yield production with fixed TAC has a notable 11.9% difference in productivity |
| Establishment cost ($) | 214.92 | 200.79 | Due to geometrical constraints, the DS model requires less embodied energy to prepare, resulting in a 6.6% reduction in the overall establishment cost as compared to the SS model |
| Energetic EPT (yrs.) | 0.42 | 0.39 | The provided embodied vigor recovers faster by 7.1% as a result of greater yield output |
| Exergetic EPT (yrs.) | 0.82 | 0.69 | The exergetic recuperation period for provided embodied vigor is 15.9% shorter as a result of greater yield production |
| Energetic EPF (/yrs.) | 2.36 | 2.59 | Because energy is reciprocal in nature, a higher energetic EPT corresponds to a lower EPF (9.8%) |
| Exergetic EPF (/yrs.) | 1.22 | 1.45 | Because it is reciprocal in sence, the respective EPF (18.9%) decreases as the exergetic EPT increases |
| Energetic LCCE | 0.57 | 0.574 | Energy-related LCCE has marginally increased (0.7%) in the DSS system due to the system's improved yield and input energy levels |
| Exergetic LCCE | 0.31 | 0.34 | Given that the DSS system's yielding and incoming energy are both advanced, there was a 9.7% increase in the respective LCCE since yielding is superior to entered energy in a proportionate amount |
| $CO_2$ emission (kg) | 1901.94 | 1821.53 | Owing to geometrical characteristics, somewhat less embodied vigor is needed to build the DS form; as a result, associated $CO_2$ emissions also dropped (4.2%) |
| Energetic $CO_2$ mitigation (tons) | 131.97 | 139.74 | Since the DSS model's overall yield generation is larger, there is a correspondingly considerable increase in energetic mitigation of pollutants (5.9%) |
| Exergetic $CO_2$ mitigation (tons) | 67.44 | 77.30 | Since the overall yield production is larger throughout the DSS model's life, there is a correspondingly significant increase in the exergetic mitigation of pollutants (14.6%) |

**Table 4** (continued)

| Constraint | SSS | DSS | Qualified remarks |
|---|---|---|---|
| $SO_2$ emission (kg) | 14.45 | 13.83 | Because of geometrical characteristics, somewhat less embodied vigor is needed to build the DS form; hence, associated $SO_2$ secretions also dropped (4.3%) |
| Energetic $SO_2$ mitigation (tons) | 1.0 | 1.06 | Since the overall yield of the DSS model is larger during its whole life, there is a correspondingly considerable increase in energy mitigation of the pollutant (6%) |
| Exergetic $SO_2$ mitigation (tons) | 0.51 | 0.59 | Because of the increased total yield during the course of the DSS model, there is a correspondingly significant increase in exergetic mitigation of pollutants (15.7%) |
| NO emission (kg) | 6.02 | 5.76 | Because of geometrical characteristics, somewhat less embodied energy is needed to build the DS model; as a result, related NO emissions also dropped (4.3%) |
| Energetic NO mitigation (tons) | 0.42 | 0.44 | Since the DSS model's overall yield is larger over the course of its whole service life, the corresponding energetic mitigation of pollutants is therefore noticeably higher (4.8%) |
| Exergetic NO mitigation (tons) | 0.21 | 0.24 | Since the DSS model's overall yield is higher over the course of its whole service life, the associated exergetic alleviation of toxin is likewise noticeable (14.3%) |
| Energetic environmental cost ($) | 1318.36 | 1395.99 | Since yield determines energetic ecological outlay, a larger yield reduces pollution levels and increases benefit (5.9%) relative to environmental cost |
| Exergetic green cost ($) | 673.77 | 772.24 | This cost is yield-dependent, and global bazaar charging structure, a higher yield yields a higher (14.6%) revenue |

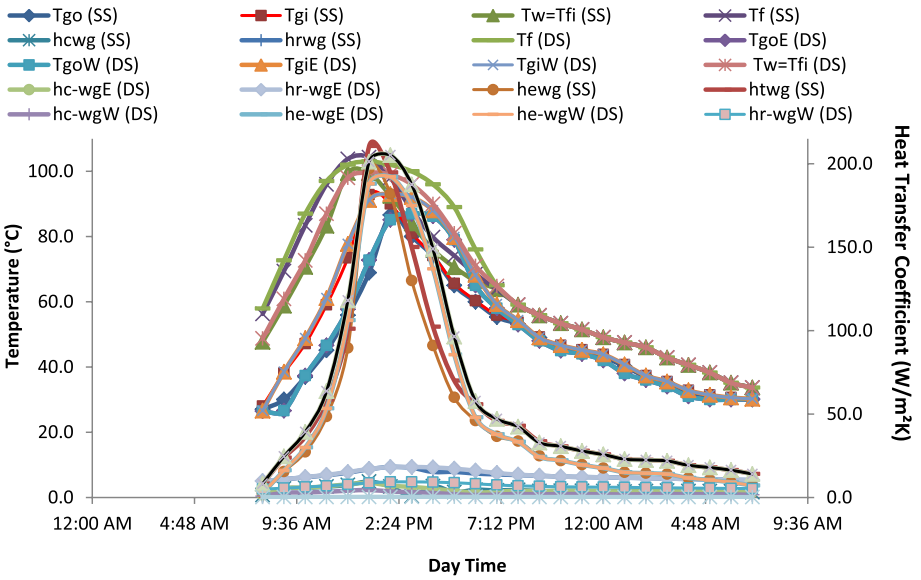


**Fig. 10** Deviations in hotness and heat transfer coefficient at various segments in the studied units

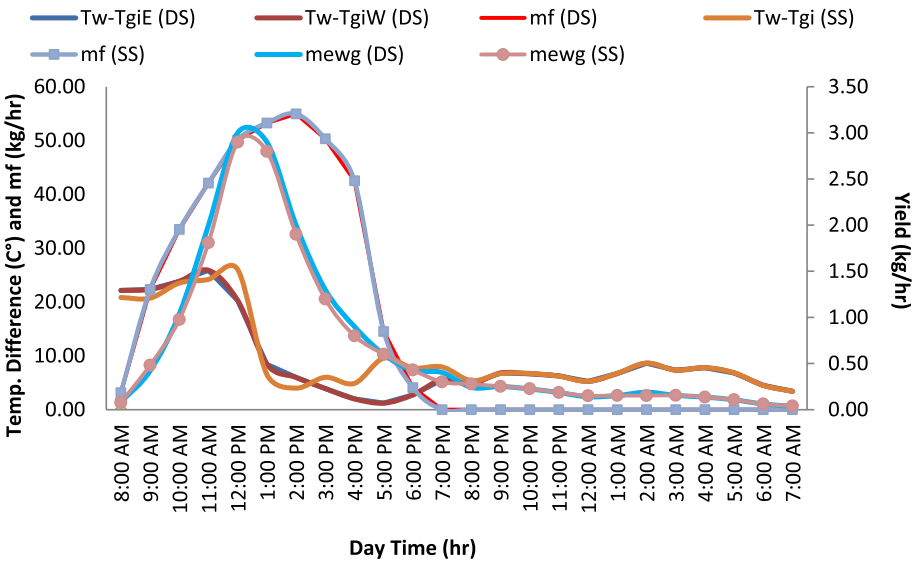


**Fig. 11** Hourly differences between the yielding of potable water and the water circulation rate

the greatest influence of $T_w - T_{giE}$, and $T_w - T_{giW}$. The overall yielding found by 4.6% superior to the SSS unit and superior to further amalgamation of SSUs, as illustrated in Fig. 12. Additionally, the average yielding (hourly) through the studied designs is significantly superior (0.71 kg/m$^2$) in comparison to further models shown in Tables 4 and 6 under the same cabinet areas. Additionally, the energy and energy gains are better, particularly for the

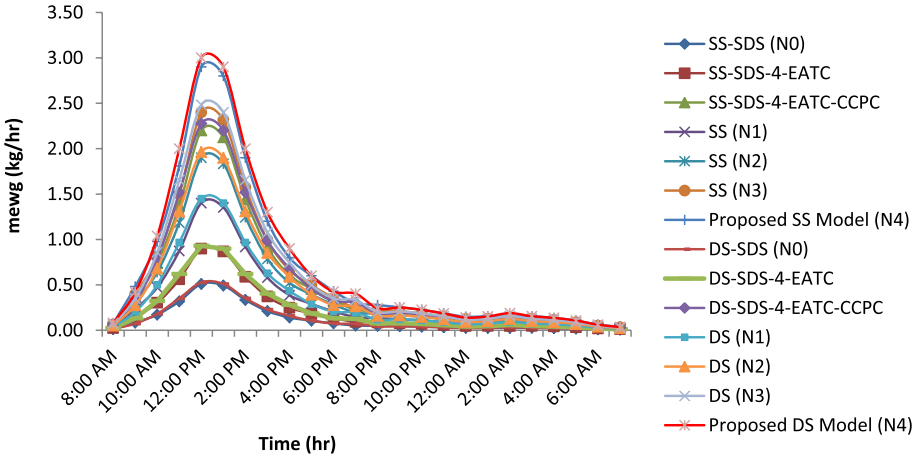


**Fig. 12** Hourly yielding under the varying EATCs illustrated in several models with comparable basin areas and water depths

DSS system, which has improvements of 5.7% and 14.1%, especially during peak radiation hours or when there are little temperature changes ($T_w - T_{giE}$, $T_w - T_{giW}$). Furthermore, it is reasonable to assume that the efficiencies (energy and exergy) rely on the main SSU & EATC-PSR interaction, and temperature differential, confrontation solar radiation, and energy transfer from EATC → DSS. As shown in Fig. 13, energy–exergy effectiveness a bit decreases (8.4% & 4.7%) at greater temperature variation as compared to SSS-EATC-PSR form.

As given in Tables 4 and 5, the relative results of the energy and energy matrix of studied forms for 30 years with 275 typical apparent days and 401.8 kW ostensible sun's

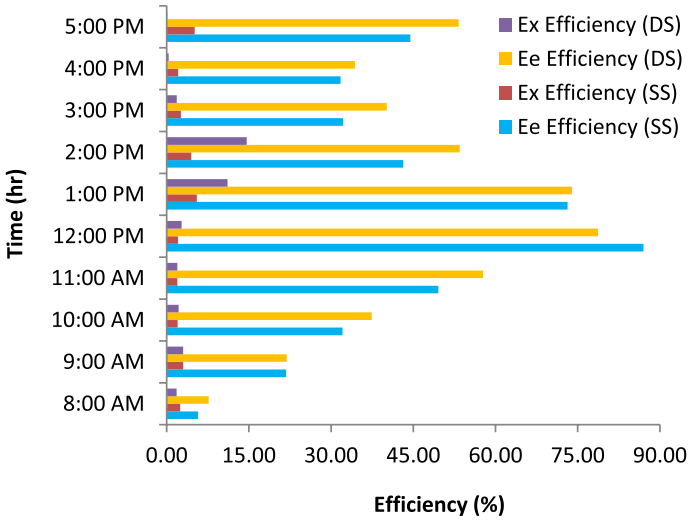


**Fig. 13** Schemes' of hourly efficacy (energy–exergy)

**Table 5** Energy–exergy matrices measurements of the proposed solar still system

| Constraint | Observation (DS model) | | Observation (SS model) | |
|---|---|---|---|---|
| Yearly yielding | 4658.5 kg | | 4455 kg | |
| Daily yielding | 16.94 kg/day | | 16.2 kg/day | |
| Life yielding | 139,755 kg | | 133,650 kg | |
| System existence | 30 yrs | | 30 yrs | |
| Embodied input | 1152.87 kWh | | 1203.76 kWh | |
| Primary capital cost (PCC) | $200.79 | | $214.92 | |
| Sun's Insolation | 401.8 kW | | 401.8 kW | |
| Restraint | Exergy | Energy | Exergy | Energy |
| Net Energy-out | 50,077.5 kWh | 89,595 kWh | 39,847.5 kWh | 85,222.5 kWh |
| Sun's in energy | 143,861.6 kWh | 154,192 kWh | 138,011.7 kWh | 147,922.5 kWh |
| Yearly sun's energy | 4795.39 kWh | 5139.75 kWh | 4600 kWh | 4931 kWh |
| Yearly energy out | 1669.25 kWh | 2987 kWh | 1328.3 kWh | 2840.8 kWh |
| Payback time | 0.69 yrs | 0.39 yrs | 0.82 yrs | 0.42 yrs |
| Payback fraction | 1.45 | 2.59 | 1.22 | 2.36 |
| Efficacy life | 0.34 | 0.57 | 0.31 | 0.57 |

insolation were found to be relatively good by improvements of ~ 7% & ~ 16% for payback and factors, respectively. Based on energy and exertion, which tend to 1, the existence conversion phase of the chosen design is judged to be superior, indicating better linkages. It was found comparatively that DSS model was more precisely depicts the increases in energy–exergy conversion efficiencies of 0.7% and 9.7%, respectively than SSS form.

Due to its geometrical properties, the investigation confirms that the DSS form is 6.6% fewer exclusive than the SSS form, as shown in Table 5. The productivity and exergo-economic portion of proposed forms diminish when interest rates rise because the denominator value of the derived expressions rises. Each of the two models achieves annual productivity levels of above 100%, indicating their considerable viability in a market that can support their production of clean output. In contrast of SSS form, the result reveals a extensive improvement of 11.9% in yielding and 22.1% in exergo-economy for 10% rate variation at the trade value of 5₹/l of treated irrigate (Fig. 14). Additionally, perceptible yielding makes the DSS a stronger pollutant mitigation system for $CO_2$, $SO_2$, and NO. Energy and exergy are the comparable mitigation measures, typically quoted at 5.9% and 14.6% for $CO_2$, 6% and 15.7% for $SO_2$, 4.8, and 14.3 for NO. Furthermore, based on energy–exergy explanations, the natural expenditure designated as circuitous profits (carbon credit) were shown to be superior to the SSS system for a 30-year lifespan by 5.9% and 14.6%, respectively, as shown in Table 4. Furthermore, Fig. 15 illustrates the comparative outcomes of various environmental and financial constraints on the suggested solar desaltification model systems, indicating that the DSS model is more significant than the SSS model. Also, Fig. 15 represents the probable model validation with the existing researches done by other researchers as Singh et al. (2013) and Dubey et al. (2021). After accounting for the 30 years of life, the results of further stills published by other researchers are compared against a comparable backdrop (Fig. 16), and discovered that, among other things,

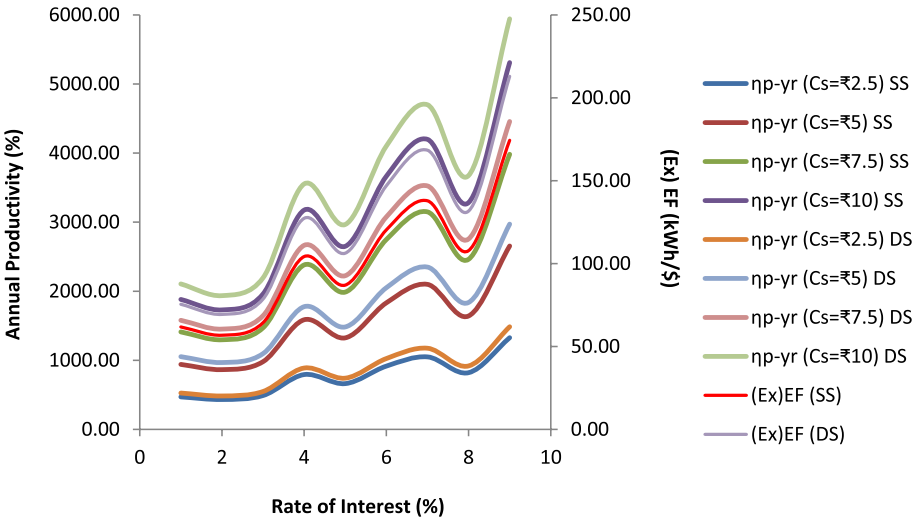


**Fig. 14** Productivity (yearly) and exergo-economics illustrated in relation to the variable interest rates of the proposed systems

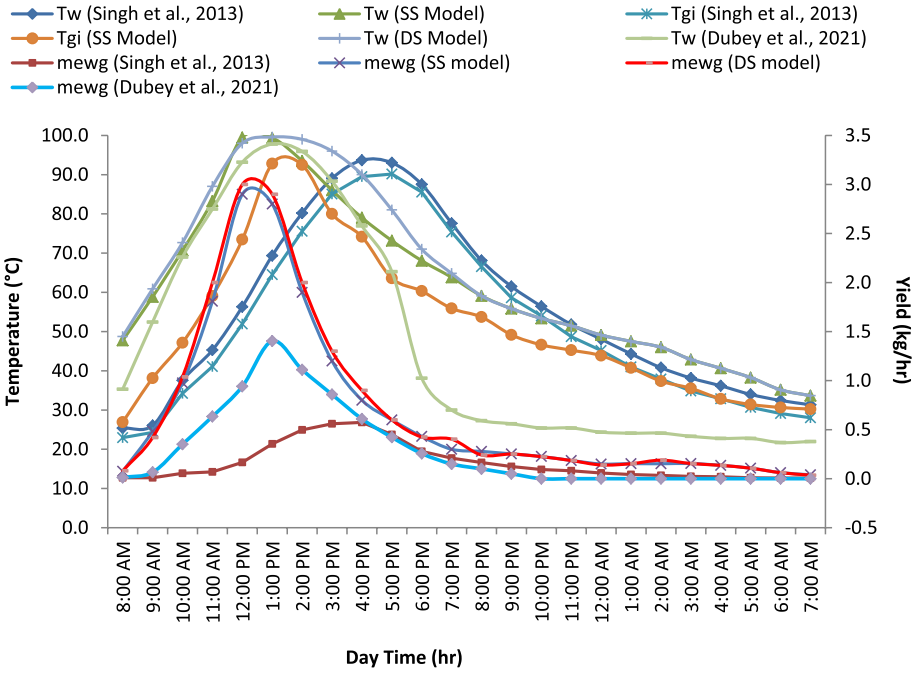


**Fig. 15** Relative yield plotting of alternative models against the suggested systems at diverse period of the daytime and at dissimilar temperatures

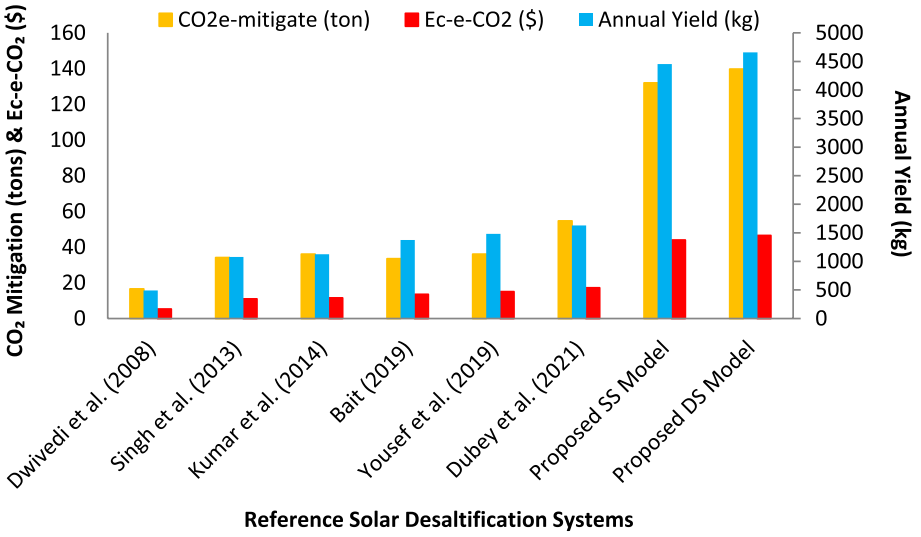


**Fig. 16** Comparing the eco-economic and relative yield of different models to the new schemes that have been suggested

**Table 6** Comparison of several models' relative yields to the suggested innovative schemes

| Solar model | Irradiance (D + L/R + U) | Distillation (kg/m$^2$ h) | Running status |
|---|---|---|---|
| Cabinet typer (Tiwari et al., 2003) | D | 0.12 | Conventional |
| SSS-FPC (Tiwari et al., 2003) | D | 0.26 | Activated with pump |
| SSS- FPC (Badran & Al-Tahaineh, 2005) | D | 0.27 | Activated with pump |
| SSS-HP-EATC (5) (Mamouri et al., 2014) | D | 0.32 | Activated with pump |
| SSS-HP-EATC (15) (Sampathkumar et al., 2013) | D | 0.54 | Activated with pump |
| SSS-EATC (10) (Singh et al., 2013) | D + Under mirror | 0.49 | Thermo siphon pre-heating |
| SSS-EATC (10) (Kumar et al., 2014) | D + Under mirror | 0.51 | Activated with pump |
| SSS-EATC (30) (Yari et al., 2016) | D + Under mirror | 0.48 | Thermo siphon pre-heating |
| Inclined SSS-EATC (5) (Issa & Chang 2017) | D | 0.36 | Activated with pump |
| Stepped SSS-EATC (5) (Patel et al., 2019) | D | 0.41 | Activated with pump |
| Tubular SSS-HP-EATC (24) (Xu et al., 2019) | D | 0.57 | Activated with pump |
| SSS-EATC (10) (Dubey et al., 2021) | D + Under mirror | 0.44 | Activated with pump |
| SSS-EATC-PSR (Proposed SS Model) | (D + U + L/R) | 0.67 | Thermo siphon pre-heating |
| SSD-EATC-PSR (Proposed DS Model) | (D + U + L/R) | 0.71 | Thermo siphon pre-heating |

the DSS system is superior and noteworthy for potable water productivity and environmental economics. Therefore, DSS form suits better as compared to the SSS form significant (Table 6).

## 6 Conclusion

Based on relative analytical study comprise the following wrap up:

(i) The EATC-PSR unique association was aided in displaying the generalised performance analysis of its overall performance enhancement relative to the tested systems, which ranged from ordinary to advanced solar stills., i.e., SSS with least performance, DSS, SSS-EATC, DSS-EATC (medium), SSS-EATC-CCPC (medium), DSS-EATC-CCPC (moderate), SSS-EATC-PSR, and with highest performance DSS-EATC-PSR

(ii) Compared to SSS-EATC-PSR model and other forms under concern for evaluation, the DSS-EATC-PSR performs better overall. With a higher cabinet temperature of 99.6 °C and highest feasible transmission pace (thermo syphon) of around 55 kg/h, it has been optimised to have four numbers of EATCs. These numbers cumulatively respond to produce the peak yielding (16.9 kg/m$^2$ per day).

(iii) The energetic and exergy efficiency exhibit a 4.7% and 8.4% marginal decline, respectively. Also, DSS form has more energy, exergy $CO_2$ mitigates by ~ 6% & ~ 15%, respectively. Further, the DSS form has a more affordable setup cost, but it also has respectable production capabilities, indicating that it is feasible.

(iv) The DSS-EATC-PSR form is more practical and prominent due to the marked yielding output at considerably lower conduct outlay, natural returns, increased alleviates, and quick payback period.

## 7 Recommendations for future research

The proposed system should be applied with external condenser to manage the extra vapor formed during the crest hours of date. As well as, it is also recommended to apply CFD simulation to identify other possible parameters for the optimum utilization of the system design and components.

## Appendix

Relationships employed to resolve Eqs. (1)–(4) (Duffie & Beckman, 2006; Singh & Samsher, 2022),

$$U_{saa} = \left( \frac{R_{o2} \ln\left(\frac{R_{i2}}{R_{i1}}\right)}{K_g} + \frac{1}{h_{r-v}} + \frac{R_{o2} \ln\left(\frac{R_{o2}}{R_{o1}}\right)}{K_g} + \frac{1}{h_o} \right)^{-1}$$

$$I_s(a) = I_b(t) \cdot (\propto \tau)_{eff}$$

$$(\propto \tau)_{eff} = R_{sc}\alpha\tau^2\left(A_a/A_{rc}\right)$$

$$h_o = h_{c-wg} + h_{r-wg} = 3.8V + 5.7$$

$$h_{r-v} = \varepsilon_{eff} \cdot \sigma\left[\left(T_f + 273.15\right)^2 + \left(T_{sa} + 273.15\right)^2\right] \times \left[T_f + T_{sa} + 546.30\right]$$

$$\varepsilon_{eff} = \left(1/\varepsilon_g + 1/\varepsilon_w - 1\right)^{-1}$$

$$F_1 = \frac{F' \cdot h_{saf}}{(F'h_{saf} + U_{saa})}; \quad F_2 = 1 - \frac{\left(A_{rc} \cdot F_r\right)U_L}{\dot{m}_f C_f}; \quad U_L = \frac{F' \cdot h_{saf} \cdot U_{saa}}{(F'h_{saf} + U_{saa})}$$

$$F_r = \frac{\dot{m}_f C_f}{A_{rc} \cdot U_L}\left\{1 - exp\left(-\frac{2\pi R_{i1} L_{\mathrm{EATC}} \cdot U_L}{\dot{m}_f C_f}\right)\right\}$$

$$h_{t-gE} = h_{t-gW} = 5.7 + 3.8V$$

$$U_{cE} = h_{t-gE}/\left(1 + \frac{h_{t-gE}}{K_g/t_g}\right); \quad U_{cW} = h_{t-gW}/\left(1 + \frac{h_{t-gW}}{K_g/t_g}\right)$$

Relationships used to express the corresponding SSS system Eqs. (5a) and (6a) (Cooper, 1973; Dunkle, 1961; Singh & Samsher, 2020, 2022),

$$\alpha_g^A = \left(1 - R_g\right)\alpha_g$$

$$R_g = 1 - \frac{4n_o n_g}{\left(n_o + n_g^2\right)(1 + n_o)}$$

$$h_{t-wg} = h_{r-wg} + h_{c-wg} + h_{e-wg}$$

$$h_{r-wg} = \varepsilon_{eff} \cdot \sigma\left\{\left(T_w + 273.15\right)^2 + \left(T_{gi} + 273.15\right)^2\right\}\left\{T_w + T_{gi} + 546.30\right\}$$

$$h_{c-wg} = 0.884\left\{\left(T_w - T_{gi}\right) + \frac{\left(P_w - P_{gi}\right)\left(T_w + 273.15\right)}{268.9 \times 10^3 - P_w}\right\}^{1/3}$$

$$h_{e-wg} = 16.273 \times 10^{-3} h_{c-wg}\left\{\frac{P_w - P_{gi}}{T_w - T_{gi}}\right\}$$

$$P_w = exp\left(25.317 - \frac{5144}{T_w + 273.15}\right)$$

$$P_{gi} = exp\left(25.317 - \frac{5144}{T_{gi} + 273.15}\right)$$

$$\alpha_w^A = \left\{\left(1 - R_g\right)\left(1 - \alpha_g\right)(1 - R_w)\alpha_w\right\}$$

$$R_w = \left[1 - \left(4n_o n_w\right)/\left\{\left(n_o + n_w^2\right)(1 + n_o)\right\}\right]$$

Relationships used to express the corresponding DSS system Eqs. (5b, 5c) and (6b, 6c) (Cooper, 1973; Dunkle, 1961; Singh & Gautam, 2022; Singh & Samsher, 2020),

$$\alpha_g^A = \left(1 - R_g\right)\alpha_g; \quad R_g = 1 - \frac{4n_o n_g}{\left(n_o + n_g^2\right)(1 + n_o)}$$

$$h_{t-wgE} = h_{r-wgE} + h_{c-wgE} + h_{e-wgE}$$

$$h_{t-wgW} = h_{r-wgW} + h_{c-wgW} + h_{e-wgW}$$

$$h_{r-wgE} = \varepsilon_{eff} \cdot \sigma\left\{\left(T_w + 273.15\right)^2 + \left(T_{giE} + 273.15\right)^2\right\}\left\{T_w + T_{giE} + 546.30\right\}$$

$$h_{r-wgW} = \varepsilon_{eff} \cdot \sigma\left\{\left(T_w + 273.15\right)^2 + \left(T_{giW} + 273.15\right)^2\right\}\left\{T_w + T_{giW} + 546.30\right\}$$

$$h_{c-wgW} = 0.884\left\{\left(T_w - T_{giW}\right) + \frac{\left(P_w - P_{giW}\right)\left(T_w + 273.15\right)}{268.9 \times 10^3 - P_w}\right\}^{1/3}$$

$$h_{c-wgE} = 0.884\left\{\left(T_w - T_{giE}\right) + \frac{\left(P_w - P_{giE}\right)\left(T_w + 273.15\right)}{268.9 \times 10^3 - P_w}\right\}^{1/3}$$

$$h_{e-wgE} = 16.273 \times 10^{-3} h_{c-wgE}\left\{\frac{P_w - P_{giE}}{T_w - T_{giE}}\right\}$$

$$h_{e-wgW} = 16.273 \times 10^{-3} h_{c-wgW}\left\{\frac{P_w - P_{giW}}{T_w - T_{giW}}\right\}$$

$$h_{r-EW} = h_{r-WE} = 0.034 \times \sigma\left\{\left(T_{giE} + 273.15\right)^2 + \left(T_{giW} + 273.15\right)^2\right\}\left\{T_{giE} + T_{giW} + 546\right\}$$

$$P_w = exp\left(25.31 - \frac{5144}{273.15 + T_w}\right)$$

$$P_{giE} = exp\left(25.31 - \frac{5144}{273.15 + T_{giE}}\right)$$

$$P_{giW} = exp\left(25.317 - \frac{5144}{T_{giW} + 273.15}\right)$$

$$h_{bw} = \left(K_w/t_b\right)\left\{C\left(R_a\right)^{1/n}\right\}$$

$$\alpha_w^A = \left\{\left(1 - R_g\right)\left(1 - \alpha_g\right)(1 - R_w)\alpha_w\right\}$$

$$R_w = \left[1 - \left(4n_o n_w\right)/\left\{\left(n_o + n_w^2\right)(1 + n_o)\right\}\right]$$

$$R_a = \frac{g\beta'\rho^2 X^3 C_w \Delta T}{\mu K_w}; G_r = \frac{g\beta'\rho^2 X^3 \Delta T}{\mu^2}; P_r = \frac{\mu C_w}{K_w}$$

$$h_{ba} = \left\{\left(t_b/K_b\right) + 0.357\right\}^{-1}$$

$$\alpha_{beff} = \left(\alpha_b^A \cdot h_{bw}\right)/\left(h_{ba} + h_{bw}\right)$$

$$U_{bwa} = \left(h_{bw} \cdot h_{ba}\right)/\left(h_{bw} + h_{ba}\right)$$

Relationships used to determine the SSS system's water temperature include:

$$U_{ta} = \left(h_{t-wg} \cdot U_c \cdot A_g\right)/\left(h_{t-wg} \cdot A_b + U_c \cdot A_g\right)$$

$$h_1' = \left(h_{t-wg} \cdot A_g\right)/\left(h_{t-wg} \cdot A_b + U_c \cdot A_g\right)$$

$$a = \left\{U_{eff} + \dot{m}_f C_f (N - 1)\right\}/\left(m_w C_w\right)$$

$$U_{eff} = \left\{A_b\left(U_{bwa} + U_{ta}\right) + \left(A_{rc} F_r\right) U_L\right\}$$

$$\alpha_{eff}^A = \left(\alpha_w^A + \alpha_{beff} + h_1' \cdot \alpha_g^A\right)$$

$$f(t) = \left\{I_s(t) A_b \cdot \alpha_{eff}^A + T_a \cdot U_{eff} + F_1 \cdot (\propto \tau)_{eff} \cdot \left(A_{rc} F_r\right) I_b(t)\right\}/\left(m_w C_w\right)$$

$$(Gr \cdot Nu)/Pr = \left(\beta' \cdot d^4 \cdot g \cdot \dot{q}\right)/\left(\mu \cdot \nu^2 \cdot C_f\right)$$

Relationships used in DSS system Eq. (7) to calculate water temperature include:

$$U_{taE} = \left(h_{t-wgE} \cdot U_{cE} \cdot A_{gE}\right)/\left[\frac{A_b}{2} \cdot h_{t-wgE} + A_{gE} \cdot (U_{cE} + h_{r-EW})\right]$$

$$U_{taW} = \left(h_{t-wgW} \cdot U_{cW} \cdot A_{gW}\right)/\left[\frac{A_b}{2} \cdot h_{t-wgW} + A_{gW} \cdot (U_{cW} + h_{r-WE})\right]$$

$$h'_{1E} = \left(h_{t-wgE} \cdot A_{gE}\right)/\left[\frac{A_b}{2} \cdot h_{t-wgE} + A_{gE} \cdot (U_{cE} + h_{r-EW})\right]$$

$$h'_{1W} = \left(h_{t-wgW} \cdot A_{gW}\right)/\left[\frac{A_b}{2} \cdot h_{t-wgW} + A_{gW} \cdot (U_{cW} + h_{r-WE})\right]$$

$$h'_{2E} = \left(\frac{A_b}{2} \cdot h_{t-wgE}\right)/\left[\frac{A_b}{2} \cdot h_{t-wgE} + A_{gE} \cdot (U_{cE} + h_{r-EW})\right]$$

$$h'_{2W} = \left(\frac{A_b}{2} \cdot h_{t-wgW}\right)/\left[\frac{A_b}{2} \cdot h_{t-wgW} + A_{gW} \cdot (U_{cW} + h_{r-WE})\right]$$

$$a = \left[U_{eff}^{DS} + \frac{A_b}{2} \cdot h_{r-EW} \cdot \left(h'_{1E} + h'_{1W}\right) + \dot{m}_f C_f \cdot (N-1)\right]/\left(m_w C_w\right)$$

$$U_{eff}^{DS} = A_b\left(U_{bwa} + \frac{U_{taE}}{2} + \frac{U_{taW}}{2}\right) + \left(A_{rc} \cdot F_r\right) \cdot U_L$$

$$f(t) = \left[T_a \cdot U_{eff}^{DS} + \left\{I_{sE}(t) + I_{sW}(t)\right\} \times \left(\alpha_w^A \cdot \frac{A_g}{2} + \alpha_{beff} \cdot \frac{A_b}{2}\right) + \left(A_{rc} \cdot F_r\right) \cdot F_1 \cdot (\propto \tau)_{eff} \cdot I_b(t) + \frac{A_b}{2}\left\{T_{giW} \cdot h_{r-EW}\left(h'_{1E} + h'_{1W}\right) + \alpha_g^A\left(h'_{1E} \cdot I_{sE}(t) + h'_{1W} \cdot I_{sW}(t)\right)\right\}\right]/\left(m_w C_w\right)$$

**Data availability** Upon sensible request, the corresponding author may provide the datasets used and analysed in this research.

## Declarations

**Conflict of interest** The authors declare that they have no conflict of interest.

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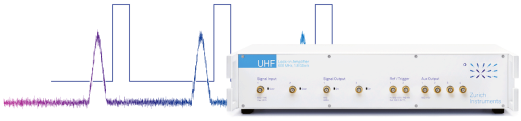
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# Performance Analysis of Different Machine Learning Algorithms for Intrusion Detection on KDD-CUP-99 Dataset

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**Abstract-** Network security has emerged as an essential issue as an outcome of the Internet's broad consumption. The efficiency of anomaly-based detection systems for network intrusions (IDS) as a tool for spotting illicit traffic has risen. IDS's precision and efficiency have been enhanced with the assistance of ML methods. The performance of multiple machine learning (ML) algorithms in anomaly-based intrusion detection is compared in this paper using KDD-CUP-99 dataset. The algorithms considered include Voting, LightGBM, Decision Tree, KNN, Random Forest, AdaBoost, Naive Bayes Model, CatBoost, and Logistic Regression. The study's findings indicate that the Decision Tree, Random Forest, LightGBM, and Voting algorithms did remarkably well and exhibited high rates of accuracy, while Naive Bayes performed inadequately. This study comes to the conclusion that using ML algorithms might greatly improve the precision of knowledge-based network intrusion detection and provide a workable network security solution.

***Keywords -*** *Intrusion Detection Systems, Comparative Analysis, ML techniques, Classification, Accuracy*

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## INTRODUCTION

As per the 2023 Global Online Statistical analysis, there has been a tremendous development in the usage of the internet, with a 1392% increase from 2000 to the current day [1]. The fact that the internet produces around 3.5 quintillion bytes of data daily shows that it is only expanding [2]. Network utilization is increasing, which is causing an increase in data traffic. At the same time as cyberattacks are happening more often, the variety of data from numerous sources is rapidly growing. With the continual advancement of technology, the frequency of hostile assaults has been rising, with a new attack emerging every 11 seconds. As a result, thieves have recently been successful in stealing millions of private documents [3]. Attackers use various techniques, including brute-force attacks, SQL injection, XSS, MitM attacks, DoS attacks, DDoS attacks, spear phishing, drive-by attacks, and password attacks, to gain unauthorized access to computer systems and networks. Attacks of this kind aim to crash networks, interfere with services, or steal data. Over the years, several trustworthy organizations have become victims of devastating network assaults. For instance, in 2020, Twitter had a severe security breach [4]. Moreover, a Chinese hacking organization conducted multiple assaults in 2021 that were directed at Microsoft Exchange Server [5]. A total of 19.76 million patient data were exposed by the 108 distinct ransomware attacks, which affected 2,302 medical organizations in 2021. It is estimated that the lost productivity caused by these assaults costs medical institutions close to $7.8 billion [6]. The FBI estimates that in 2021, electronic mail account compromise (EAC) and corporate email compromise frauds would have caused around $2.4 billion in worldwide cyber losses. However, during the same time frame, ransomware only caused losses of $49.2 million [7]. Since fraudsters continue to concentrate on obtaining user account information to gain unauthorized access to crucial systems and data, the theft of credentials is a severe problem for enterprises. The cost of credential theft has significantly grown, reaching $4.6 million, an increase of 65% from $2.79 million in 2020, according to a report by the Ponemon Institute [8]. According to a recent survey, 78% of security experts say that the most negative consequence of distributed denial of service attacks on enterprises is a decline in customer confidence and faith. Highlighting how vulnerable public servers that are accessible online are to infiltration if security measures are not performed. Unauthorized behavior on a computer network system is known as intrusion [9]. The security

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technology known as an intrusion detection system monitors network or computing device activity and hunts for evidence of intrusion [10]. IDS is a crucial technology that analyzes network traffic and triggers warnings to discover assaults and threats. Algorithms employing machine learning may be utilized to successfully guard against threats. IDS may be hardware or software that notifies users or administrators of intrusions. Based on Signature, Anomaly-based, and hybrid-based detection are the three primary categories of intrusion detection that are based on detection principles [11] [12]. Building models of usual system behavior and providing alerts if any deviations are discovered are both parts of the behavioral-based intrusion detection process, sometimes referred to as anomaly-based detection [11] [12]. A database of signatures of known attack and system vulnerabilities is used by intrusion detection techniques that rely on knowledge-based detection or signature-based awareness. [12] [13]. Hybrid-based intrusion detection is a combination of both of the above techniques. *Host-based* intrusion detection monitors all traffic that enters and exits a given host by comparing it to a model of the host's flow activity.[14]-[16]. *Network-based* intrusion detection scans several hosts for threats and analyzes network traffic for unusual or suspicious activity. In order to ensure cybersecurity, a good-performing intrusion detection system is required. Despite research looking at the application of ML techniques for intrusion detection, Companies selling IDS still focus on signature-based methods. ML, or deep learning, is a reliable method for learning from data without extra separate programming.[17] [18]. This kind of inductive learning involves discovering rules via the study of instances. Classification and regression issue analysis and solution are only a few of the numerous tasks that machine learning techniques may be taught to handle. This approach is so successful that it can work with both marked as well as unmarked data. Due to its adaptability and flexibility, machine learning is often employed in detecting security breaches. Rather than using detection based on signatures, use anomaly-based ones [11]. Machine learning methods like SVM, Naive Bayes Model, Random Forest and many more were utilized in our research to categorize intrusion assaults using a dataset of a military network system. Metrics including precision, accuracy, recall, ROC AUC, and F-score were used to evaluate how well these algorithms performed. This research aims to assess how well various machine learning algorithms operate when used to identify network intrusions based on abnormalities based on precision, accuracy, recall, ROC AUC, and F-score. The study aims to provide insights into the selection and use of ML algorithms for practitioners and researchers developing IDS, which can be used to strengthen network security systems' efficacy and safeguard against cyberattacks. The research paper has been organized as follows: The 2nd Section reviews and analyzes current works in the field. Section 3 provides a description of the dataset and the preparation techniques utilized to make the data suitable for the research analysis. Section 4 describes the typical assessment metrics and the results. The main conclusions and their repercussions for future machine learning-based intrusion detection research are briefly summarized in conclusion.

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## LITERATURE REVIEW

Intrusion detection systems have long been valued highly by security experts and academics. Numerous studies have been done in this field during the last 20 years, and more are continuously being done. This paragraph will describe some essential research that was done by different academics.

In [19], J. J Rodrigues et al. conducted study of methods for identifying network anomalies in 2019. These approaches were grouped by the authors into the following categories: classification, statistical, clustering, and information theory. This paper's primary goal is to perform a thorough evaluation of the crucial aspects of anomaly detection, which includes a background study and a thorough analysis of the most critical strategies, approaches, and systems used in this field. In [20], K. Enamul et al. used the KDD 99 database, generally acknowledged as the standard performance benchmark for machine learning systems, was used in independent research to suggest another intrusion detection strategy termed "optimal allocation-based least square SVM" and show its efficacy. The Least Square SVM was used in the suggested method to sample the data, and it worked well for both static and incremental data. In [21], S. Benkirane et al. used decision trees with improved data quality and suggested a trustworthy network intrusion detection method. The suggested method entails network data preprocessing, feature selection based on entropy, and appropriate training to improve data quality, followed by constructing a decision tree classifier method for accurate intrusion detection. On well-known datasets (NSL-KDD and CICIDS2017), the researchers performed an experimental investigation and obtained high accuracy of 99.42% and 98.80%, respectively. In [22], B. Mondal et al. suggested the specialized branch of artificial intelligence known as machine learning, a system is trained to categorize data examples using various criteria. A typical strategy is supervised learning, in which the system is taught using past data with known predicted results. DDoS attack detection is possible using a broad range of widely

recognized ML techniques, such as Random Forest, LR, Naive Bayes, Decision Tree, and K-NNand SVM. The research tested the effectiveness of these algorithms using the most recent NSL KDD datasets and WEKA tools. It was discovered that the K-NN algorithm was very good at spotting DDoS assaults. In [23], M. Almseidin et al. investigated Phishing Detection, machine learning methods. The goal was to use machine learning algorithms to identify phishing websites. The authors' original dataset comprised five thousand genuine web pages and five thousand phishing websites. They explored several ML algorithms, such as Random Forest, J48 and Multilayer Perceptron, to achieve the optimal results. Techniques for feature selection were also used to increase the model's effectiveness. The Random Forest algorithm has the maximum accuracy of 98.11%, with 20 out of 48 characteristics being chosen. The research shows how machine learning algorithms are excellent at identifying phishing websites and how feature selection is crucial for enhancing model effectiveness. In [24], Liu et al. presented a better K Nearest Neighbour method for network anomaly detection. The model integrates the K-NN for machine learning, the mathematical optimization algorithm for adaptive computation, and edge computing to build an intrusion detection system on the outer side. They used a parallel approach and a Lévy flight method to enhance the accurateness of the model. The suggested model for identifying DoS assaults reached 99% ACC, which is over 10% better than the original kNN approach, according to simulated trials based on the WSN-DS dataset. In [25], Belouch et al. In order to categorize network traffic for intrusion detection, carried out research to compare the effectiveness of four effective classification techniques: Decision Tree, Naive Bayes, Random Forest, and SVM, in order to categorize network traffic for intrusion detection. The research used the public dataset UNSW-NB15, which has 42 characteristics, to develop the model and process the data using Apache Spark tools. The experimental findings revealed that the Random Forest classifier performed better than the other classifiers, with sensitivity, accuracy and specificity of 93.53%, 97.49% and 97.75%, respectively. According to these results, the Random Forest algorithm is quite good at detecting network breaches. In [26], Fitni and Ramli et al. discussed an anomalous intrusion detection system employing an ensemble of classifiers, including Decision Tree, Logistics Regression, and Gradient Boosting. The CSE-CIC-IDS2018 dataset, which consisted of 80 features and was utilized for validation and training, was used to test the ML model. In order to determine the best-performing features, a hybrid strategy combining rank correlation and Chi-square was used in the feature selection procedure. Out of the original 80 features, only 23 were ultimately chosen. The suggested ensemble model performed better than seven single classifiers, earning a 98.8% accuracy, 97.1% recall, 98.8% precision, and a 97.9% F1 score. In [27], Bhati et al. created an innovative intrusion detection system in 2021 that uses the CatBoost classification technique as part of an ensemble ML technique. A number of factors, including accuracy, F1-score, precision and recall, have been used to assess the system's effectiveness. This study's primary data source was the NSL-KDD dataset. The study's findings show that the suggested strategy detected the breach with a 99.46% accuracy rate. In [28], Song et al. proposed intrusion detection research with access to high-quality organized datasets that reflect different kinds of incursion as well as regular traffic data. The authors suggested employing honey pots to gather data effectively and guard against zero-day assaults research study. The sample set utilized in this research comprises raw TCP/IP data collected from the United States Air Force Network and represents a realistic military network environment. Every TCP/IP connection has 41 characteristics, such as the service, protocol type, source, flag, destination bytes, and other data related to the network. The collection contains both typical as well as unusual links that have attack types assigned.

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## DATASET

This study makes use of a KDD-CUP-99 dataset that is an attack records dataset of network environment used by the US Air Force that consists of raw TCP/IP dump data. The KDD-CUP-99 dataset contains connections with one particular attack type and many attacks and is labeled as either standard or attack. Each connection comprises a series of TCP packets that follow a specified protocol as they move between a source IP computer address and a destination IP computer address. The KDD-CUP-99 set of data comprises 42 columns, 41 of which are qualities extracted from attack and standard data, consisting of 3 qualitative and 38 quantitative factors. These characteristics, which include information on the service, protocol type, destination and source bytes, flag, and several other network-related elements, are sent to each TCP/IP connection. The variable used to make class has two categories: normal and anomalous and may be used to categorize a connection as either safe or attack. Around 25,000 objects comprise the dataset, and metrics including accuracy, F-Score, and recall were taken into consideration to assess how well various machine learning algorithms performed. A dataset is a crucial tool for comparing and analyzing different intrusion detection tactics and improving a system's intrusion detection efficacy in current network situations.

The following dataset offers a number of benefits for our study. It provides a remarkable and varied selection of simulated incursions in a dummy network environment for the military that closely reflects actual-world circumstances. Both qualitative and quantitative variables are included in the dataset, offering valuable data for the development of prediction models. It features distinct labels for typical and unusual connections, making it possible to detect and categorize network assaults with accuracy. The uniqueness and lesser-known nature of the dataset may provide a chance to add fresh perspectives to cybersecurity research.Direct analysis of raw data is only possible with careful preparation. Data cleansing, transformation to understandable sets, feature extraction of desirable features, dimensionality reduction, integration, sampling, visualization in graphical form, and analysis are all essential parts of the preprocessing process. These methods may be used to make the data as usable as possible for analysis while reducing the possibility of bias or mistakes that can affect the validity of the findings. Therefore, preprocessing the data is crucial before doing any analysis.

Steps in preprocessing include:

- **Data Cleansing:** Correct the dataset by removing errors, inconsistencies, or superfluous data. It could include removing redundant entries, dealing with data that is absent, and removing outliers.
- **Transformation of data:** Convert the dataset into an analysis-ready condition. It includes tasks like transforming categorical variables to integers, normalizing values, and classifying datasets into appropriate categories. Some of the characteristics in the dataset were categorical and non-numerical, such as service, protocol type, flag etc. These category characteristics were transformed into numeric values using label encoding for usage in machine learning methods. For instance, after encoding, the ICMP, TCP, and UDP values in the protocol feature were changed to 0, 1, and 2, respectively. It made it possible to employ these characteristics in numerical form in later analyses [17]. By taking the mean from each characteristic and dividing the result by the standard deviation, the characteristics are standardized to have a common mean and variation of zero. This adjustment results in the data having a traditional normal distribution of values with a standard deviation and means of 1 and 0, respectively. When categorizing features, scaling prohibits characteristics with high values from overpowering those with small values.
- **Extraction of Features*:*** Extracting significant characteristics from the dataset utilized for the study is known as the extraction of features [17] [29]. It may include determining the elements or characteristics most crucial to the study topic or hypothesis. Feature selection is a crucial ML approach that concerns selecting the most significant attributes from a dataset to enhance the precision and effectiveness of an algorithm. This technique is used to increase the accuracy and efficiency of a model by identifying the most relevant features that contribute to its performance. The features which stand out from a training dataset are chosen using a Random Forest Classifier (RFC) and Recursive Feature Elimination (RFE) for our study. Up until the target amount of features is attained, the RFE method operates by iteratively deleting features and creating a new model using the leftover features. The selected characteristics are then preserved in an inventory for later usage after being translated into a Boolean value that indicates whether or not they were chosen. The initial data set for training is then condensed to contain just the chosen characteristics, which could aid in improving the accuracy and effectiveness of the ML model. Overall, since it may help to organize the data and increase model correctness, the feature selection process is essential to creating ML models.
- **Dimensionality Reduction*:*** Select a subset of the characteristics essential to our investigation to reduce the dimensionality of the data. Techniques that might be used in this include feature selection and factor analysis.
- **Data Sampling*:*** Especially if the dataset is huge or complicated, choose a practical sample of the data for the process of analysis. In order to choose a subset of the data, one may utilize random sampling and other methods.
- **Data Partitioning*:*** Divide the information into testing and training groups if predictive modeling or machine learning methods will be utilized. 71% of the collected data was used to train the classifiers and 29% to evaluate them.
- **Data visualization*:*** It is the process of displaying a dataset so that academics may learn from it and spot any pertinent trends or patterns. It might include developing visual representations, such as graphs or charts, to emphasize essential discoveries or connections. Data visualization is used to aid researchers in comprehending the data and coming to insightful findings.

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The Scikit-learn package for Python was used for all computations and simulations. A well-used machine learning combination of tools for Python, the scikit-learn package offers a full range of tools for data preprocessing, feature engineering, model selection, and assessment. It works nicely with the Python scientific computing environment and is developed on top of NumPy, SciPy, and matplotlib. Given its strength and adaptability, scikit-learn is a well-liked machine learning package for Python among both professionals and academics. It is useful for a variety of machine learning applications due to its broad choice of algorithms, preprocessing capabilities, model assessment tools, and user-friendly API.

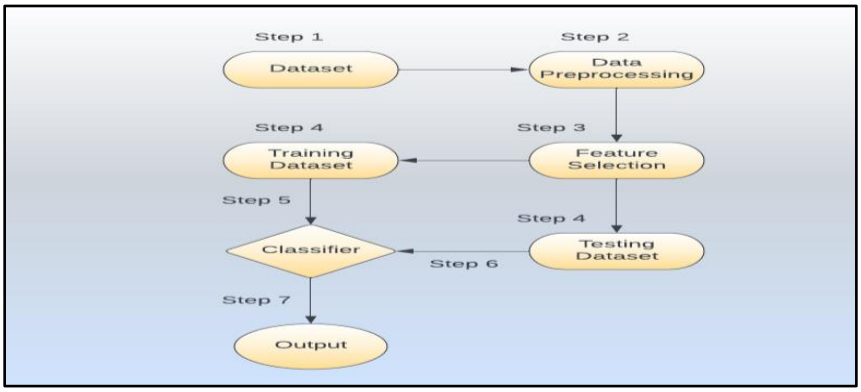


**FIGURE 1.** Methodology Followed by the Experiment.

## RESULT SECTION

The assessment criteria used to gauge the effectiveness of the classifiers in the study are presented in the findings part of the research article. F1 score, Precision, ROC, accuracy and recall are the assessment measures described in this study.

- **Accuracy*:*** The percentage of cases adequately categorized within the dataset is known as accuracy.

$$\text{Accuracy (\%)} = \frac{(Tp + Tn)}{(Tp + Tn + Fp + Fn)} \times 100 \quad (1)$$

- **Precision*:*** The fraction of accurate positive predictions among all positive predictions produced by a model is measured by its precision metric. It stands for the model's accuracy in predicting that a particular instance belongs to a given class.

$$\text{Precision (\%)} = \frac{Tp}{(Tp + Fp)} \times 100 \quad (2)$$

- **Recall*:*** Recall is a performance statistic used in data analysis and machine learning to calculate the proportion of genuine positive occurrences that a model accurately detected out of all real positive instances.

$$\text{Recall (\%)} = \frac{Tp}{(Tp + Fn)} \times 100 \quad (3)$$

- **F1 score:** The F1 score is a statistical measure that incorporates the recall and precision of a model, using the harmonic mean to provide a single score that represents their balance.

$$\text{F1 Score (\%)} = 2 \times \frac{(precision\ x\ recall)}{(precision + recall)} \times 100 \quad (4)$$

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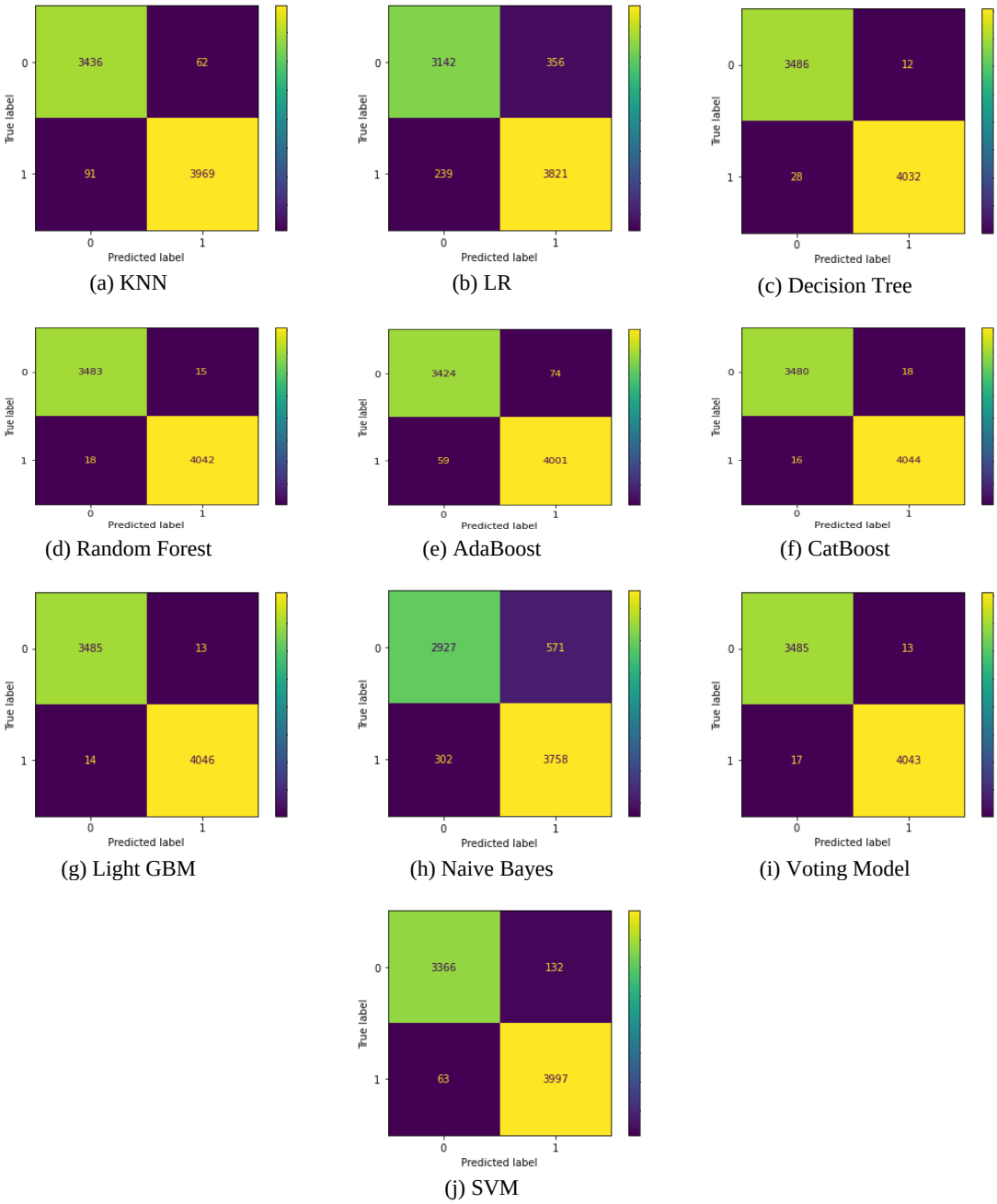


**FIGURE 2**. Confusion Matrices of Algorithms.

- **ROC AUC:** A measure called receiver operating characteristic area under the curve describes the degree to which a classifier can tell the difference between positive and negative classes. Charting the genuine positive rate vs the rate of inaccurate positives at numerous thresholds yields the result. The effectiveness of the classifier can be evaluated using the area beneath the graph. It is usually considered a more relevant evaluation statistic when comparing the efficacy of binary classifiers to accuracy.

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**TABLE 1**. Comparison of Proposed Work.

| Model Name | Accuracy (%) | Precision (%) | Recall (%) | F1-Score (%) | ROC-AUC(%) |
|---|---|---|---|---|---|
| kNN | 97.97 | 98.46 | 97.75 | 98.11 | 97.99 |
| LR | 92.12 | 91.47 | 94.11 | 92.77 | 91.96 |
| Decision Tree | 99.47 | 99.70 | 99.31 | 99.51 | 99.48 |
| Random Forest | 99.56 | 99.63 | 99.55 | 99.59 | 99.56 |
| Light GBM | 99.64 | 99.67 | 99.65 | 99.66 | 99.64 |
| AdaBoost | 98.24 | 98.18 | 98.54 | 98.36 | 98.21 |
| CatBoost | 99.55 | 99.55 | 99.60 | 99.58 | 99.54 |
| Naive Baye Model | 88.44 | 86.81 | 92.56 | 89.59 | 88.11 |
| Voting Model | 99.60 | 99.67 | 99.58 | 99.63 | 99.60 |
| SVM | 97.42 | 96.80 | 98.44 | 97.61 | 97.33 |

We evaluated the effectiveness of 10 different classification-based ML techniques in this research. Naive Bayes, Voting Model, Random Forest, CatBoost, KNN, Decision Tree, Light GBM, AdaBoost, Logistic Regression, and Support Vector Machine techniques were used. Accuracy, F1-score, precision, ROC-AUC & recall were five measures to assess these algorithms' performance.

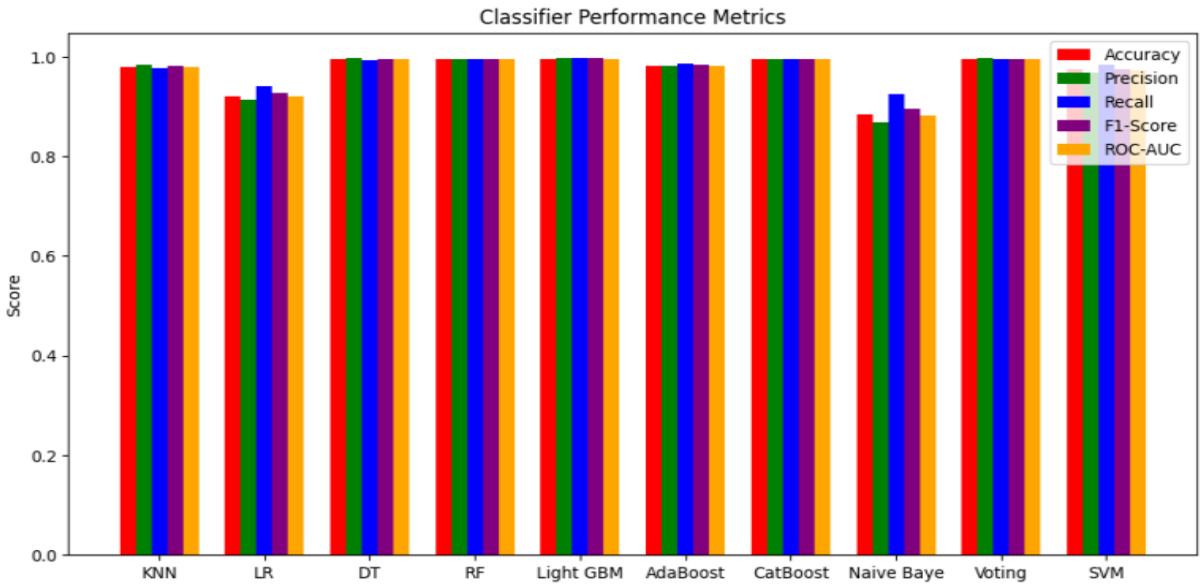


**FIGURE 3.** Comparison of evaluation matrices.

The SVM delivered remarkably good scores given how quickly it trained compared to other models. The Naive Bayes model performed the worst in aspect of Accuracy, F1 Score, Precision, and ROC-AUC of all the models tested for this project. The reason for Naive Bayes decreased performance may be due to the assumption that the features are independent, which may not be the case for the data in this problem. Another possibility is that the model is not well trained on sufficient data. Naive Bayes models can be sensitive to the amount of data they are trained on. If the model is not well trained on sufficient data, it may not be able to learn the relationships between the features and the target variable. CatBoost performed better than AdaBoost on all metrics, including accuracy, precision, recall, F1 score, and ROC AUC. This suggests that CatBoost is a more accurate algorithm for binary

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classification tasks. There are a few possible reasons why CatBoost performed better than AdaBoost. First, CatBoost is a more recent algorithm that has been developed to address some of the limitations of AdaBoost. For example, CatBoost uses a more sophisticated approach to weighting the predictions of individual trees, which can lead to improved accuracy. Second, CatBoost is able to handle categorical features more effectively than AdaBoost. This is because CatBoost uses a technique called one-hot encoding to convert categorical features into numerical features, which can be used by the algorithm. The LGBM model outperformed the XGBoost model in all metrics by a small margin, and it trained faster than XGBoost. The LGBM uses histogram-based techniques, which reduce training time compared to XGBoost.

The method with the greatest accuracy overall was Light GBM, which received a score of 99.64%. Random Forest and the Voting Model both received scores of 99.60% and 99.56%, respectively. The Voting Model and Random Forest came in second and third, respectively, with scores of 99.67% and 99.63%, respectively, in terms of accuracy, with Light GBM earning the best possible score of 99.67%. The Voting Model came in second with a score of 99.58%, while the naive Bayes method came in third with a score of 92.56%. SVM had the greatest recall score with a score of 98.44. Light GBM had the highest F1 score with a score of 99.66, preceded by the Voting and RF with scores of 99.63% and 99.59%, respectively. The Light GBM had the highest ROC-AUC score (99.64%), which was followed by scores of 99.60% for the Voting Model and 0.9956 for the Random Forest.

## CONCLUSION

The goal of this research was to estimate the efficacy of several ML and DL techniques using a well-established network base dataset KDD. The KDD dataset, often referred to as the KDD Cup set of data, is a widely used base form of dataset in the field of machine learning and mining of data. It was created for the Knowledge Discovery and Data Mining (KDD) Cup competition held. The dataset represents a network intrusion detection problem and contains network traffic data collected from a simulated environment ten machine learning models were used to train the dataset, and early halting and dropouts were used in both machine learning and deep learning to prevent model overfitting. In order to identify and stop hostile attacks on networked and automated computer systems, intrusion detection is a crucial field of cybersecurity research. In this work, we used a publically accessible dataset to examine the success rates of 10 different machine-learning methods for intrusion detection. The findings demonstrated that, in aspects of accurately, precisely finding attacks, and recall, F1-score, and ROC-AUC, the Light GBM and Voting Model performed better than the other methods. Light GBM is a tree-based training gradient boosting structure that is renowned for its great accuracy and speed. On the other hand, the Voting Model is an ensemble learning approach which integrates the forecasting of many models to enhance their results. Both of these models of algorithms are capable of handling big datasets and intricate network activity patterns, making them useful for intrusion detection. It should be highlighted, however, that in parallel to these variables, the choice of the algorithm can also be affected by things like the kind of internet traffic, the amount of distortion and abnormalities in the data, and the kind and intensity of assaults. For instance, the naive Bayes method did well in terms of accuracy, which is crucial for reducing false positives, while SVM scored well in terms of recall, which is crucial for identifying uncommon or severe assaults. As a result, choosing the appropriate algorithm for an individual situation should be determined by a careful examination of the needs, limitations, and trade-offs. In conclusion, this research compares the success rate of several machine learning algorithms for intrusion detection and finds the top-performing algorithms as Light GBM and Voting Model. These algorithms may be used as a foundation for the creation of intrusion detection systems that are more precise as well as efficient, and they can assist in increasing the safety of computer networks and systems against hostile assaults.

## Future Scope

The development of novel machine learning algorithms, techniques for feature selection and dimensionality reduction, techniques for training and evaluating machine learning algorithms, and techniques for fusing machine learning algorithms with other intrusion detection methods are all included in the future scope of research in this field. These advancements will contribute to increased intrusion detection accuracy and effectiveness, which will enhance the safety of computer networks and systems. Researchers may focus on creating machine learning algorithms that can recognise novel attack types, can recognise assaults in real time, and can recognise attacks on mobile and IoT devices. These are only a handful of the many potential paths for more study in this field. An important aspect to consider is memory and time efficiency. As network datasets continue to grow in size, it becomes

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crucial to develop algorithms that can handle large-scale data effectively. Utilizing parallel processing techniques to distribute the computational workload across multiple processors or cores. This can be achieved through parallel programming frameworks like OpenMP or CUDA, which allow for concurrent execution of tasks.

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ORIGINAL ARTICLE

# Phosphate removal from urban stormwater runoff using *Canna lily* and *Cyperus alternifolius*-based bioretention system

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## Abstract

Rainfall is considered to be the purest form of water; however, it gets contaminated as it sweeps along suspended impurities from the atmosphere, and it traverses its path through different land uses. Hence, an effective water-sensitive urban design (WSUD) is required to treat this low-strength urban stormwater runoff to minimise water loss and to improve its quality, lest it should cause eutrophication in receiving water bodies. The current study was undertaken to explore the performance of *Canna lily* and *Cyperus alternifolius*-based constructed wetland (CW) towards the removal of phosphate from the stormwater runoff. Total phosphate removal efficiency varied from 77.5% (winter) to 82.6% (spring) to 90.3% (summer) for *Canna lily* based-CW; while it varied from 62.3% (winter) to 74.2% (spring) to 84.1% (summer) for *Cyperus alternifolius* based-CW. The phosphate removal efficiency improved with a rise in ambient temperature through the changing seasons. The increase in biomass of both the plants, and accumulation of phosphate in different plant tissue suggested that the plants should be harvested periodically and nutrients be exported for use as fodder, manure, and for thatching. Therefore, an effective design standard and code of practice is required to be developed for WSUD in India. It will help in making future studies more effective in combination with other WSUD techniques for improved pollutant removal efficiency from real stormwater runoff.

## Research highlights

- *Canna lily* and *Cyperus alternifolius*-based CW cells are effective tool for the removal of phosphate from the stormwater runoff.
- Higher removal efficiency can be correlated with an increase in average sunshine hours.
- The removal of phosphate from CW cells is correlated with increase in biomass.
- An effective design standard and code of practice is required to be developed for WSUD in India.

**Keywords** Phosphate · Constructed wetland · Stormwater · Eutrophication · WSUD

## Abbreviation

| | |
|---|---|
| A | Top surface of CW cell in $m^2$ |
| AG | Above ground |
| AP | Available phosphate |
| APHA | American Public Health Association |
| ASTM | American Society for Testing and Materials |
| BCM | Billion Cubic Metre |
| BG | Below ground |
| CW | Constructed wetland |
| DAP | Di-ammonium phosphate |
| $D_i$ | Internal diameter of CW cell |
| $d_s$ | Depth of bed substrate |
| *e* | Void ratio |
| EC | Electrical conductivity |
| $G_s$ | Specific gravity |
| H | Overall height of CW cell |
| HDPE | High density poly-ethylene |
| $h_f$ | Free board of CW cell in cm |
| HRT | Hydraulic Retention Time |
| n | number of samples |
| TDS | Total dissolved solids |

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| | |
|---|---|
| TP | Total phosphate |
| V | Volume of CW cell in $m^3$ |
| WSUD | Water Sensitive Urban Design |
| $\rho$ | Bulk density in $kg/m^3$ |

## Introduction

It is a known fact that a very limited quantity of freshwater is available to us which can become as expensive as crude in the present century (Rezaei et al. 2017). India is the world's seventh largest country with the world's total land mass of 2.4% and it is the second most populous country (Profile 2022). More population migrating towards urban areas has led to an alarming increase in demand for potable water for their day-to-day activities in urban centres. Scarcity of freshwater, uneven rainfall pattern, change in land use, and climate change has forced us to explore alternative sources of freshwater. India receives annual precipitation of about 3880 BCM out of which 1999 BCM of water becomes natural runoff and only 690 BCM of precipitation can be utilised as a source of surface water (Extraction of Groundwater 2020). Studies have estimated that almost 70% of urban lands are paved with high runoff coefficient of 0.9 which causes high runoff volume, high peak flow, flooding in low-lying areas, and limited groundwater recharge (Goel 2011). In addition, the rainwater gets contaminated as it traverses its path through urban areas (Pipil et al. 2022a). The strength of pollutants/ nutrients in stormwater runoff is significantly lower than domestic wastewater. The concentration of pollutants in urban stormwater runoff depends on the activities associated (Ambade 2015). Most of the studies on characterisation of stormwater runoff in India report phosphate concentration varying from 0.07 to 17.4 mg/l (Pipil et al. 2022a; Arora and Reddy 2013; Cheema et al. 2017; Samuel et al. 2012) while phosphate concentrations more than 0.1 µg/l has potential to cause eutrophication in freshwater waterbodies (Bowman et al. 2007; Sumathi and Vasudevan 2019). The high $PO_4^{3-}$ concentration in stormwater runoff may be attributed to domestic wastewater overflow, organic waste, compost/fertiliser applied in lawns and parks, littering of food waste, and excretory waste of stray animals and pets. Despite the fact that phosphate is a limiting pollutant that causes eutrophication of the receiving fresh water body, the studies on occurrence and transport from non-point sources of nutrients are still limited (Haritash et al. 2017). The nutrient removal using conventional treatment methods possess drawbacks as they have high cost of operation, production of secondary sludge, and poor nutrient removal efficiency (Baghizade et al. 2023; Fotoohi et al. 2024). To tackle and mitigate the mixing of nutrients with lakes and ponds, water sensitive urban design (WSUD) can be implemented in India to manage the scarcity of water and to bridge the gap between demand and supply of freshwater (Pipil et al. 2022b). WSUD system with a wetland/bioretention system helps in attenuating the peak flow and reducing the flow volume by providing ponding and detention along with the removal of nutrients from stormwater runoff (Sims et al. 2019). Although both phosphate and nitrate (nitrogen) are critical pollutant for eutrophication, the former is a limiting pollutant for freshwater bodies while the later is a limiting pollutant to marine water bodies (Singh 2013). Since the stormwater water runoff is a form of freshwater; thus, the present study focuses on the potential of *Canna lily* and *Cyperus alternifolius* for WSUD to test the efficacy towards phosphate removal from stormwater runoff under Indian conditions. These species are perennial in nature which can survive in both water logged and water-scarce conditions. In addition to this, these species are non-invasive and have capability to thrive better under tropical and sub-tropical conditions. Preliminary studies reported that these plants are potential agents for removal of nutrients (Haritash et al. 2015; Thongtha et al. 2014). The outcome of the study will contribute to the effective design of stormwater runoff treatment systems for tropical and sub-tropical regions.

## Materials and methods

### Bench-scale CW cell

The present study was undertaken from December 2021 to May 2022 in two identical CW cells based on vertical flow located in Delhi, India. The study was undertaken for six months which included winter, spring, and summer seasons of Delhi, India. The CW cells were made up of two separate HDPE drums which was obtained after cutting the drum into two equal halves in which *Canna lily* and *Cyperus alternifolius* were planted individually. The bottom was provided with an outlet valve for the collection of effluent (Fig. 1). The internal diameter ($D_i$) of the CW cell was 0.55 m with an overall height H of 0.43 m, thus, providing a surface area (A) of 0.24 $m^2$ and overall volume (V) of 0.1 $m^3$. Since, earlier studies have also used similar dimensions (Haritash et al. 2015), the current study selected HDPE drum for CW cell. It was filled with substrate consisting of sandstone upto a depth ($d_s$) of 0.38 m having a freeboard ($h_f$) of 0.05 m in both the CW cells. The sieve analysis of the substrate was done as per ASTM D6913 (ASTM 2009). The CW bed substrate consisted of a gap-graded mixture of gravel, sand, and silt. The cell had 70% gravel, 24% sand, and the rest as silt (Fig. 2) has been reported to support effective penetration of roots (Nandakumar et al. 2019), significant uptake of nutrients (Li et al. 2015), stable gaseous exchange, thus

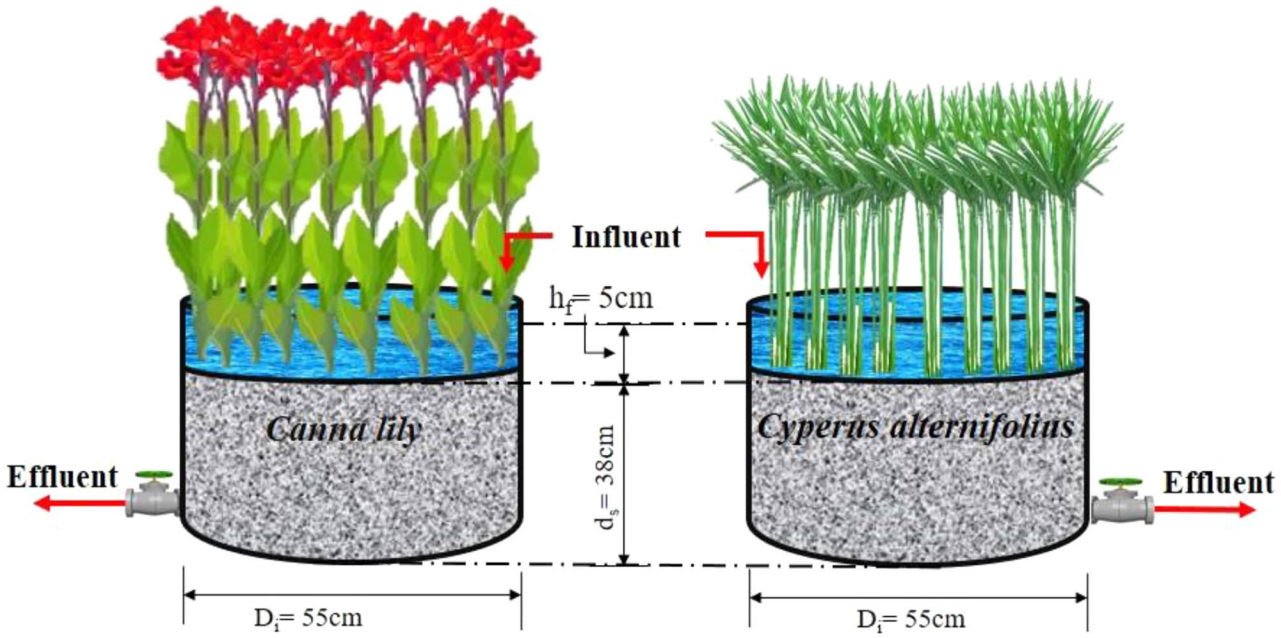


**Fig. 1** Schematic description of configuration of *Canna lily* and *Cyperus alternifolius* based-CW cell used during the study

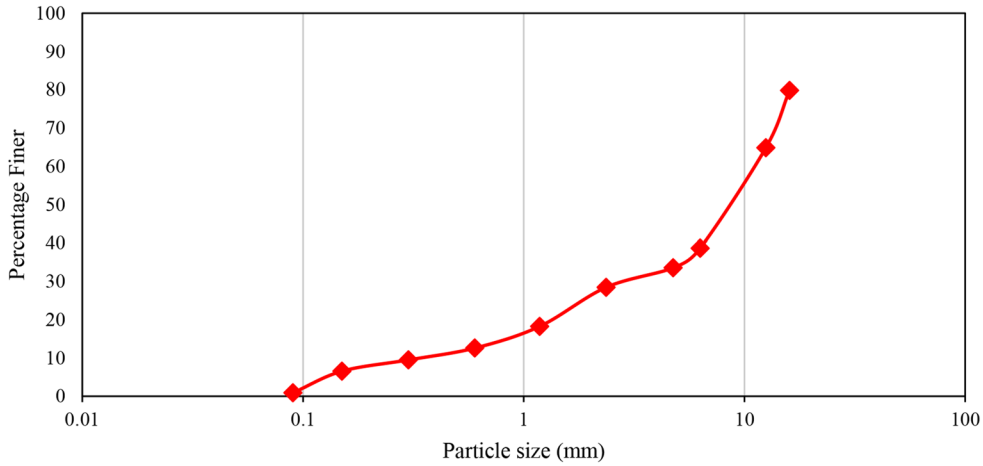


**Fig. 2** Sieve analysis of bed substrate

**Table 1** Characteristics of *Canna lily* and *Cyperus alternifolius* before and after the experiment

| Parameter | *Canna lily* | | *Cyperus alternifolius* | |
|---|---|---|---|---|
| | Initial | Final | Initial | Final |
| Shoot length (cm) | 56.1 ± 2.3 | 94.2 ± 3.5 | 14.5 ± 3.3 | 42.7 ± 4.1 |
| Root length (cm) | 10.5 ± 1.6 | 20.5 ± 2.1 | 4.5 ± 0.9 | 16.3 ± 2.6 |
| Shoot to Root ratio | 5.34 | 4.59 | 3.22 | 2.62 |
| No. of stems | 8.0 | 21.0 | 10.0 | 62.0 |
| Plant density (plants/m$^2$) | 33.7 | 88.4 | 42.1 | 261.0 |

maintaining aerobic conditions (Pipil et al. 2021) in the CW cell. The specific gravity ($G_s$) of the substrate material was 2.70, void ratio ($e$) of 0.55, and bulk density ($\rho$) of 1820 kg/m$^3$. The bed substrate represented a medium that is suitable for easy penetration of roots, percolation of water, and easy gaseous exchange (Vymazal 2005). Both the CW cells were placed side-by-side at the same level to make sure they received the same exposure to sunlight, rain, and wind during the study period. The initial density of *Canna lily* and *Cyperus alternifolius* was 34 plants/m$^2$ and 42 plants/m$^2$, respectively. Finally, at the end of the study, plant density was found to be 88 plants/m$^2$ and 261 plants/m$^2$ for *Canna lily* and *Cyperus alternifolius*, respectively. Also, the shoot length increased from ≈ 56.1 cm to ≈ 94.2 cm and ≈ 14.5 cm to ≈ 42.7 cm, respectively for *Canna lily* and *Cyperus alternifolius* (Table 1).

### Operation of CW cell

The CW cell was fed with 50 L of water/day, urea, and DAP initially for one month (30 days) for these *sp*. to get adapted to the new habitat. Following adaptation, the cell was flushed thoroughly with distilled water (100 L/day) followed by its flushing using Type-I (50 L/day) water continuously until no phosphate was obtained in the effluent of the CW cell before the start of the experiment. During the study, the cell was irrigated with 50 L/day of synthetically prepared stormwater runoff for the first 5 days and was reduced to feed of 17 L/day on a daily basis for the rest of the period. Synthetic stormwater runoff was prepared by using analytical grade potassium di-hydrogen orthophosphate ($KH_2PO_4$) salt dissolved in Type-I water. The strength of synthetically prepared runoff was kept at 5.0 mg/l $PO_4^{3-}$-P throughout the study. It was fed from the top of each CW cell as influent which was collected from the effluent valve provided at the bottom of each cell individually after a HRT of 24 h, thus representing the down-gradient vertical flow.

### Sample collection and analysis

The samples of influent and effluent were collected on a daily basis (HRT of 24 h) and analysed as per Method 4500-P of APHA (APHA, 2012). The samples were analysed for total phosphate (TP) and available phosphate (AP). The phosphate removal efficiency (%) for AP and TP was calculated using the Eq. (1):

$$Removal efficiency\,(\%) = \left(\frac{C_i - C_f}{C_i}\right) \times 100 \qquad (1)$$

Where, $C_i$= Concentration (mg/l) of the corresponding fraction of phosphate in influent, $C_f$= Concentration (mg/l) of the corresponding fraction of phosphate in the effluent after treatment. The analysis was done in triplicates ($n=3$) to reduce the chances of error. Analysis of plant tissues (roots, stem, leaves, and flowers) for translocation and accumulation of TP was also performed as per APHA (APHA, Method 4500-P 2012) using acid digestion ($HNO_3$:$H_2SO_4$ in 1:3 ratio) method that releases phosphorus as orthophosphate. The plant tissues for both the *sp.* were collected initially before the start of the experiment (December, 2021) and after the completion (May, 2022) to determine the concentration of phosphate in each tissue. Analysis was performed using a spectrophotometer (Labtronics make LT-290 Model spectrophotometer) at a wavelength of 690 nm. The pH, Electrical conductivity (EC), and total dissolved solids (TDS) were also analysed for influent and effluent using Orion Star A329 model multimeter. Meteorological data for, daily ambient temperature, sunshine hours, and rainfall were also obtained from Indian Meteorological Department (IMD), Delhi.

## Results and discussion

### Meteorological observations

From December, 2021 to May, 2022, the maximum ambient temperature varied from 15.0 °C to 44 °C with an average of 30.7 (±8.5) °C, while the minimum ambient temperature ranged from 6.0 °C to 29 °C with an average of 17.8 (±6.7) °C. The average sunshine hours also varied between 8 and 12 h during the study. A few small spells of rainfalls were also observed which varied between 1.1 and 14.8 mm during the period of study.

### Removal of available phosphate

The comparison of available phosphate in influent and effluent of both the plant *sp.* is illustrated in Table 2. Significant removal of AP and TP has been observed during the treatment of stormwater runoff by *Canna lily* and *Cyperus alternifolius*-based CW-cells. The available phosphate in influent varied between 4.2 and 4.9 mg/l for both the CW cells throughout the study. The concentration of available phosphate in effluent of *Canna lily*-based CW cells varied between 0.5 and 1.3 mg/l, 0.2 to 0.8 mg/l, and 0.6 to 1.5 mg/l during winter, spring, and summer seasons, respectively. The removal efficiency for AP by *Canna lily* follows the trend 83.7% < 86.3% < 90.9% for winter < spring < summer, respectively (Fig. 3). On the other hand, available phosphate concentration in effluent of *Cyperus alternifolius*-based CW cell ranged between 1.0 and 2.4 mg/l, 0.7 to 1.7 mg/l and 0.2 to 1.3 mg/l for winter, spring and summer, respectively. In *Cyperus alternifolius* based CW cell, AP removal efficiency follows the trend 67.4% < 77.4% < 85.5% for winter < spring < summer, respectively. The maximum AP removal efficiency of *Canna lily* was of the order of ≈91 (±6.2) % for the summer season as compared to 85.5 (±7.0) % for *Cyperus alternifolius*-based CW cell. It was observed that the AP removal efficiency of *Canna lily* is relatively higher than that of *Cyperus alternifolius*-based CW cell for all the seasons during the study. Higher removal efficiency can be attributed towards an increase in average sunshine hours leading to its enhanced uptake by the plant. Higher uptake of nutrient from wetlands due to higher evapotranspiration rates and higher metabolic activities of plants during the summer season has led to maximum removal in the summer season which has also been reported by other studies (Boyd 1969; Vymazal 1995). Also, previous studies have shown that bed substrate also plays

**Table 2** Seasonal variation of AP and TP (mg/l) removal efficiency (%) and removal rate (mg/day) in *Canna lily* and *Cyperus alternifolius*-based constructed wetland cells

| Season | Parameter | Influent | Effluent | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | *Canna lily* | | | | | *Cyprus alternifolius* | | | |
| | | Range (mg/l) | Mean ± SD (mg/l) | Range (mg/l) | Mean ± SD (mg/l) | Removal efficiency (%) | Nutrient removal rate (mg/day) | Range (mg/l) | Mean ± SD (mg/l) | Removal efficiency (%) | Nutrient removal rate (mg/day) |
| Winter ($n = 25$) | AP | 4.2–4.9 | 4.7 ± 0.3 | 0.5–1.3 | 0.7 ± 0.1 | 83.7 ± 3.4 | 4.2 ± 0.4 | 1.0–2.4 | 1.6 ± 0.4 | 67.4 ± 10.0 | 3.4 ± 0.6 |
| | TP | 4.0–5.5 | 5.2 ± 0.6 | 0.6–2.1 | 1.1 ± 0.3 | 77.5 ± 6.4 | 4.1 ± 0.6 | 0.3–2.6 | 1.9 ± 0.5 | 62.3 ± 10.4 | 3.3 ± 0.8 |
| Spring ($n = 25$) | AP | 4.3–4.6 | 4.4 ± 0.5 | 0.2–0.8 | 0.6 ± 0.1 | 86.3 ± 3.4 | 4.1 ± 0.6 | 0.7–1.7 | 1.0 ± 0.2 | 77.4 ± 6.2 | 4.1 ± 0.6 |
| | TP | 5.2–5.7 | 5.1 ± 0.6 | 0.5–1.6 | 0.9 ± 0.2 | 82.6 ± 4.9 | 4.4 ± 0.7 | 0.9–1.2 | 1.3 ± 0.2 | 74.2 ± 6.1 | 3.9 ± 0.7 |
| Summer ($n = 20$) | AP | 4.3–4.8 | 4.4 ± 0.5 | 0.6–1.5 | 0.4 ± 0.3 | 90.9 ± 6.2 | 5.0 ± 0.7 | 0.2–1.3 | 0.7 ± 0.3 | 85.5 ± 7.0 | 4.7 ± 0.7 |
| | TP | 4.8–5.2 | 4.9 ± 0.4 | 0.2–1.8 | 0.5 ± 0.3 | 90.3 ± 5.9 | 5.4 ± 0.6 | 0.3–1.5 | 0.9 ± 0.3 | 84.1 ± 7.3 | 5.1 ± 0.7 |

AP = Available phosphate; TP=, Total phosphate; SD = Standard deviation

a vital role in phosphate removal initially but as the study proceeds, the substrate gets saturated with phosphate, and cannot remove it effectively over a period of time (Kadlec and Knight 1996). Hence, the removal of phosphate by bed sediments can be ruled out in the present study since the removal efficiency kept on increasing over a period of time and with change in season from winter to summer. Hence, it can be stated that the removal of phosphate from CW cell is dominantly a function of plant *sp.* as stated by other similar studies (Pipil et al. 2021; Haritash et al. 2015).

## Removal of total phosphate

TP is the amount of phosphate present in water in bound form (with iron, calcium, and aluminium) in addition to freely available phosphate. Removal of TP is shown by a reduction in its concentration of effluent after treatment by *Canna lily* and *Cyperus alternifolius*-based CW cells. The influent TP concentration for both cells varied from 4.0 to 5.5 mg/l, 5.2 to 5.7 mg/l, and 4.8 to 5.2 mg/l for winter, spring, and summer, respectively. The TP in effluent varied between 0.6 and 2.1 mg/l, 0.5 to 1.6 mg/l, and 0.2 to 1.8 mg/l for winter, spring, and summer, respectively for *Canna lily*-based CW cell. *Canna lily*-based CW represented TP removal efficiency of order 77.5% < 82.6% < 90.3% for winter < spring < summer, respectively (Fig. 3). On the other hand, *Cyperus alternifolius*-based CW cell exhibited effluent TP concentrations varying between 0.3 and 2.6 mg/l, 0.9 to 1.2 mg/l, and 0.3 to 1.5 mg/l, respectively for winter, spring, and summer. *Cyperus alternifolius* also follows a similar seasonal trend for TP removal efficiency of 62.3% < 74.2% < 84.1% for winter < spring < summer. In the present study, the TP removal efficiency was relatively lower than the AP removal efficiency in different seasons for both the CW cells. Other studies have also reported the reason for the easy availability of AP for higher removal efficiency compared to TP (Pipil et al. 2021; Nandakumar et al. 2019). The present study exhibited the maximum TP removal efficiency of 90.3% and 84.1% for *Canna lily* and *Cyperus alternifolius*, respectively, which is higher than the efficiency of 15 different plant species reporting the removal efficiency ranging between 24.1 and 61.5% (Jiang et al. 2011). Other studies have reported that the bed substrate gets saturated with phosphates with time and thus, they cannot remove the phosphate effectively (Kadlec and Knight 1996), while in the present study, the TP removal efficiency increases with the rise in ambient temperature. The higher removal efficiency by both the plant sp. can be attributed to higher metabolic activities and photosynthesis (Haritash et al. 2015). The relationship between TP removal efficiency (%) for both the *sp.* and average ambient temperature (°C) during different seasons is shown in Fig. 4.

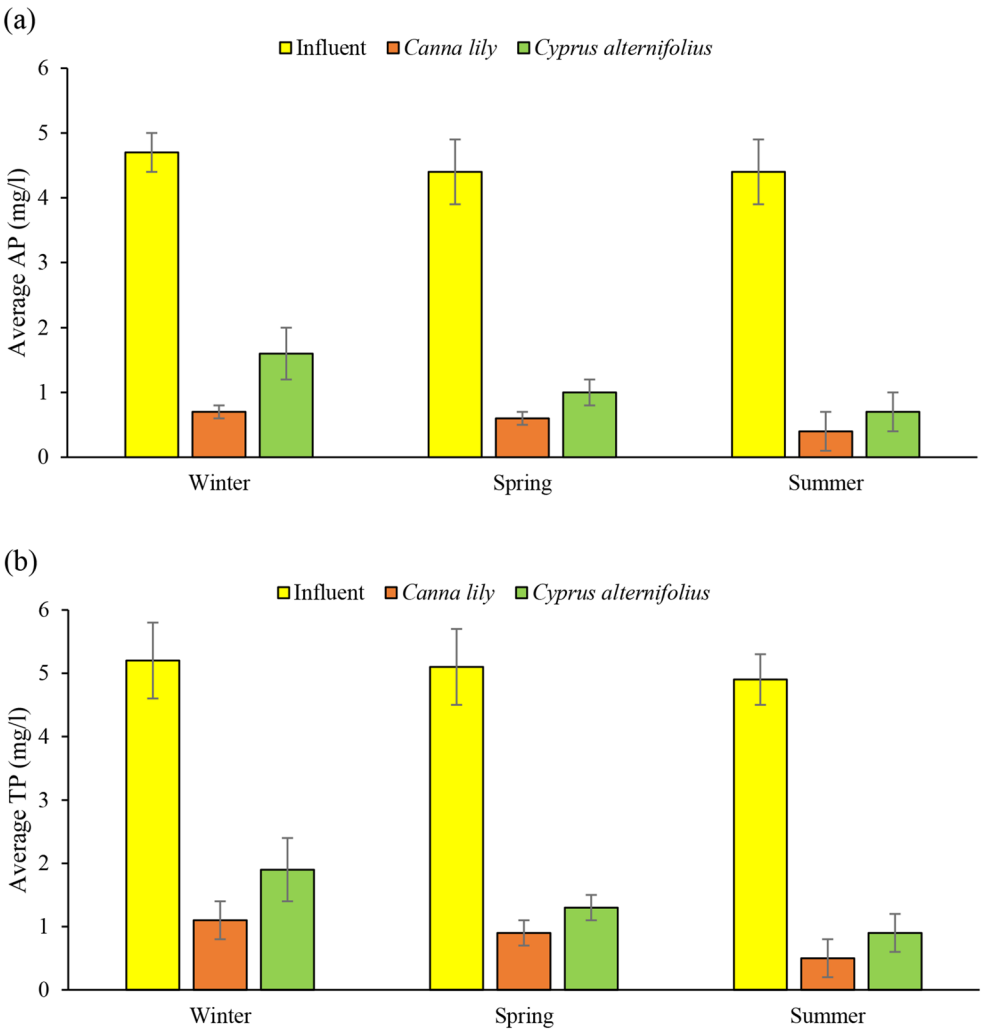


**Fig. 3** Seasonal average of Available Phosphate (a) and Total Phosphate (b) concentration (mg/l) in influent and effluent from *Canna lily* and *Cyprus alternifolius*-based CW-cell

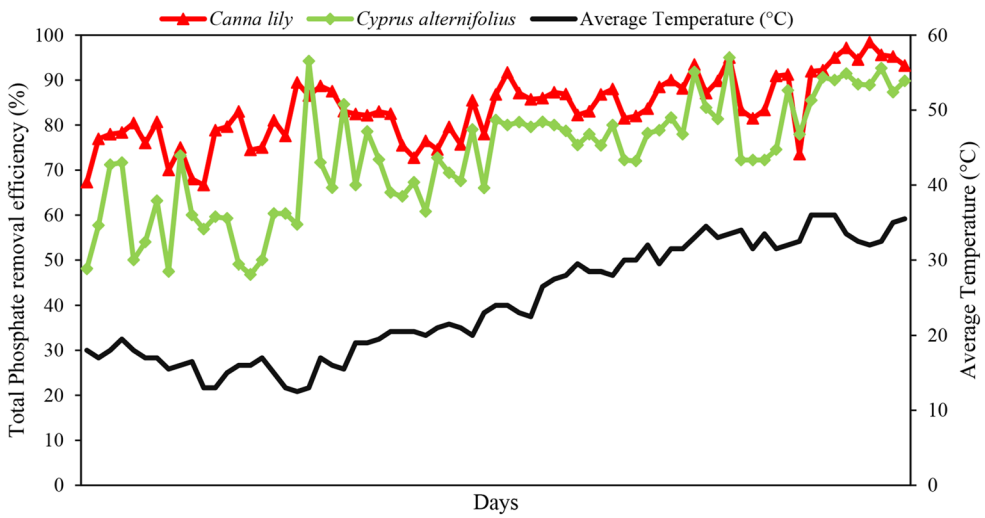


**Fig. 4** Total Phosphate removal efficiency (%) of *Canna lily* and *Cyprus alternifolius* with respect to average ambient temperature (°C)

**Table 3** Total phosphate concentration (mg/g) in different plant tissues before and after the study

| Plant tissue | | *Canna lily* | | *Cyperus alternifolius* | |
|---|---|---|---|---|---|
| | | Initial (mg/g) | Final (mg/g) | Initial (mg/g) | Final (mg/g) |
| Roots | BG | 1.7 ± 0.3 | 3.9 ± 0.3 | 0.4 ± 0.1 | 2.1 ± 0.2 |
| Stems | AG | 4.4 ± 0.1 | 9.1 ± 0.2 | 2.9 ± 0.2 | 7.9 ± 0.3 |
| Leaves | | 0.1 ± 0.1 | 2.3 ± 0.1 | 1.1 ± 0.3 | 1.7 ± 0.2 |
| Flowers | | 0.9 ± 0.2 | 4.2 ± 0.2 | NA | NA |

*NA = Not applicable; BG = Below-ground; AG = Above-ground.

Removal efficiency for phosphate is positively correlated with the ambient temperature.

## Phosphate in plant tissue

The removal efficiency primarily depends upon the nutrient uptake by the plant sp. which is correlated with its accumulation in biomass as suggested by Jiang et al. (2011). Hence, analysis of plant tissue is necessary to study the translocation and accumulation of phosphate in different plant tissues of *Canna lily* and *Cyperus alternifolius* in the present study. The accumulation in tissue helps in preventing recirculation and reintroduction of phosphate into the CW cell once it is removed by the plant. The analysis of plant tissues (roots, stems, leaves, and flowers) for *Canna lily* and (roots, stems, and leaves) *Cyperus alternifolius* was investigated for accumulated phosphate concentration. Maximum accumulation of phosphate was observed in the stem, followed by flowers, roots, and leaves of the *Canna lily.* Compared to the initial concentration, the phosphate concentration was more than twice for roots and stems while it increased 23 and 4.7 times in leaves and flowers, respectively. On the other hand, for *Cyperus alternifolius*, maximum accumulation of phosphate was observed in the stem followed by roots and leaves. The increase in final phosphate concentration is 5.3, 2.7, and 1.5 times that of initial concentration in roots, stem, and leaves, respectively (Table 3). In the present study, the removal of phosphate from CW cells is correlated with an increase in biomass. Similar results have also been reported by other studies (Iamchaturapatr et al. 2007; Jiang et al. 2011; Kyambadde et al. 2004). In the present study, the ratio of Above ground: Below ground (AG:BG) > 1.0 for both the plant *sp.* which means above ground tissue has stored more phosphate than below ground tissue. Hence, to prevent the re-entry and re-circulation of phosphate via the felling of leaves, flowers, and dead biomass into the wetland system, its harvesting is necessary at regular intervals leading to nutrient export away from the wetland system as suggested by Haritash et al. (2017).

## Mann-Whitney U test

The present study includes variations in the removal of TP in different seasons. Thus, Mann-Whitney U test was carried out to check the significance of the change of seasons for TP removal. For a 95% confidence level ($p < 0.05$), TP removal for both *Canna lily* and *Cyperus alternifolius* was significant. This means that changes in season, average ambient temperature, and sunshine hours play a significant role in phosphate removal in the CW cell.

## Economic evaluation of phosphate removal by CW cell

The economic analysis of the phosphate removal process using CW cell was also done. The procurement cost of HDPE drums, substrate material, and plant species were calculated as ₹ 475 for each CW cell (Table 4). The synthetically prepared stormwater runoff and cost of chemicals consumed during analysis of samples costs ₹ 0.26. Therefore, making total cost to be ₹ 475.26 for each CW cell. The experiments were conducted for 70 days during which 17 L of synthetically prepared stormwater runoff was fed per day into the CW cells. Thus, the overall cost of phosphate removal was calculated as 0.39 ₹ per l/day or 0.005 US$ per l/day for each CW cell.

## Uncertainties during the study

The selection of plant species should be made carefully such that they are native to location and can easily adapt in ambient conditions. Furthermore, the plant species should be resistant to water logged conditions. It is also possible that the plant species becomes dry during summer season when the influent stormwater flow is limited. During the study, controlled conditions were maintained for feeding fixed volume of synthetically prepared stormwater runoff while in natural conditions, the flow volume of stormwater

**Table 4** Economic analysis of the phosphate removal process by CW cell

| Plant species | Duration of experimentation (n) | Installed capacity of treatment facility ($m^3$/day) | Operating capacity of treatment facility ($m^3$/day) | Capital expenditure (A) (₹) | Cost of chemicals (B) (₹) | Total cost (A + B) (₹) | Cost of phosphate removal (₹ per l/day) | Cost of phosphate removal (US$ per l/day) |
|---|---|---|---|---|---|---|---|---|
| *Canna lily* | 75 | 0.055 | 0.017 | 475 | 0.26 | 475.26 | 0.39 | 0.005 |
| *Cyperus alternifolius* | 75 | 0.055 | 0.017 | 475 | 0.26 | 475.26 | 0.39 | 0.005 |

runoff varies significantly. In addition, the quality of stormwater runoff varies spatially and temporally such that the first flush of stormwater runoff contains relatively higher concentration of pollutants (Pipil et al. 2022a) and pollutant concentration reduces in subsequent flushing. Also, the voids of the substrate may get choked due to floating and suspended pollutants such as leaves, plastic, paper, sand, silt, and etc. The interception and channelling of stormwater runoff towards the treatment system is difficult. Moreover, the substrate of wetland cells gets saturated due to adsorption of phosphates on the binding sites with time which might require its replacement. Once the stormwater runoff is treated, its storage demands such infrastructure which can store them for later non-potable use.

### Potential application of treatment method

The stormwater runoff loaded with phosphate has potential to cause eutrophication. Since most of the freshwater is eutrophicated around the globe (Khan and Mohammad 2014), the present study has a fair potential towards application on larger scale. There have been case studies where constructed wetlands have been used to treat stormwater runoff (Liu et al. 2019), highway runoff (Luo et al. 2019), and domestic wastewater (Elfanssi et al. 2018). Therefore, use of *Canna lily* and *Cyperus alternifolius* will ensure significant removal under naturally thriving conditions (without input of chemicals) for effective removal of phosphates and significant improvement in water quality of receiving water body. The constructed wetland can be used as a component of water sensitive urban design (WSUD) for the treatment of urban stormwater runoff before it can be discharged into the receiving water body.

## Conclusion

Based on the observations of the current study, both *Canna lily* and *Cyperus alternifolius*-based CW cells are effective tools for the removal of phosphate from the stormwater runoff. The removal efficiency for both the fractions of phosphate showed a positive correlation with meteorological conditions (ambient temperature). The phosphate removal efficiency for both the plants increased with an increase in average ambient temperature indicating that the CW based on *Canna lily* and *Cyperus alternifolius* can be used for nutrient removal from stormwater runoff in tropical and subtropical regions around the globe. In addition, the accumulation of phosphate in above-ground plant tissue suggests that the plants should be harvested at regular intervals for nutrient export, for thatching, application in handicraft industry, and for producing compost to prevent its re-introduction into the CW cell. Also, it can be concluded that effective design standards and code of practice should be developed for WSUD in India to make this pilot study more effective under field conditions. Its combination with other WSUD techniques can be tested to improve the pollutant removal efficiency from stormwater runoff. Such techniques do not require any external source of energy for their operation and, thus, are sustainable in terms of their operation. These techniques have found appreciation in developed countries like Canada, United States of America, Australia, etc., and can be an effective tool for the removal of nutrients and other pollutants from urban stormwater runoff in India as well. A wetland can also act as a sink of carbon thus, it can reduce greenhouse $CO_2$ through carbon sequestration as an added advantage.

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**Data availability** Necessary data has been provided along with this manuscript.

### Declarations

**Ethical approval** Not applicable.

**Consent to participate** Authors provide the consent to participate.

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**Research involving human participants and/or animals** No Human and/or Animal was involved in the current research.

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# Projectized Community of Practice: A Case Study of Globally Distributed Information Technology Organization

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## Executive Summary

The execution of globally distributed information technology service projects (GDITP) by globally distributed teams, while inherently complex, offers the advantages of swift implementation and seamless service delivery to global clients. The numerous challenges including the intangibility of customer specifications, the iterative nature of information technology (IT) activities and coordination difficulties arising from diverse teams contribute to complexity in managing these projects. Moreover, the organizational complexity is compounded by competing power centres, turning project delivery into a politically contested process.

In traditional projects such as construction or customized manufacturing, overcoming aforementioned challenges through strong top-down leadership is typical in many time-bound projects. However, in the realm of IT projects, which are inherently people-centric, enforcing a command-and-control environment is challenging. Communities-of-practice (CoP) offer an alternative structure that engages highly skilled employees in a collaborative community, navigating the challenges posed by IT projects. Our study explores this innovative approach, focusing on a product firm effectively leveraging CoPs to successfully execute global service projects.

Delving into the functioning of CoPs, our research illustrates how they scale up using both formal and informal networks to meet diverse global customer requirements. Despite operating globally, CoPs exhibit emergent collective mindfulness, adapting tools, processes and products to the demands of the projects. The study also details how the organization manages complexity while adhering to product architecture and a uniform project framework.

KEY WORDS

Product-based Software Service Firms

Community of Practice

Project Portfolio

Collective Mindfulness

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Our research provides insights into the interactions within CoPs and how they operate in a projectized environment with globally dispersed members of varying cultural backgrounds and competencies. The paper emphasizes the critical role of community-driven gradual formalization, utilizing tools for governance and compliance with public identification of achievements/failures, fostering individual accountability. The study highlights the value of the coexistence of formal and informal CoPs, showcasing them as a potential buffer against attrition-induced knowledge loss and discontinuity.

In conclusion, our case study illustrates the significance of CoPs in providing organizational resilience and ensuring continuity in the face of attrition, making them a valuable asset in managing the complexities of GTIDP.

Project delivery via globally dispersed teams is *de rigueur* in information technology (IT) service projects, promising faster implementation and uninterrupted service. Globally dispersed information technology projects (GDITP) represent multiple challenges due to the intangibility of customers' specifications, the iterative nature of IT activities and coordination challenges due to multiple teams with different backgrounds (Stray & Moe, 2020). Unresolved, these differences often lead to low trust and a breakdown in communication, ending in project disruptions (Daim et al., 2012).

Product-based project companies represent an important subset of IT firms. Relying on proprietary products, they cater to a project portfolio comprising global projects with heterogeneous expectations. Glitches due to variations in scope require rapid solutions. While formal team-based structures, with modularized project deliverables with tidy boundaries amongst project teams, customers and suppliers (e.g., Albrecht & Spang, 2014), supported by extensive project management and knowledge management tools, have promised successful project delivery along with rapid solution-development, the key to managing interactions successfully to achieve project-success has long eluded project managers (Dasí et al., 2020; Sosa et al., 2004).

In contrast to formal teams, working within module boundaries and coordinating via both formal and informal channels, CoP represents an alternate organizational structure. Exemplifying a different paradigm of 'groups of people informally bound together by shared expertise and passion for a joint enterprise' (Wenger & Snyder, 2000), CoPs deliver by harnessing the collective tacit knowledge existing therein (Amin & Roberts, 2008). However, cases of failure in implementing CoPs, for example, as researched by Venters and Wood (2007), point out the need for further research to understand the challenges of successful implementation of CoPs.

Dispersed interdependent teams in GDIT, coordinating and collaborating towards the resolution of complex problems in delivering a complex artefact, makes them an ideal setting to research CoP. Making it even more attractive as a research problem is the iterative nature of IT projects accompanied by relatively greater intangibility, as compared to civil or manufacturing projects, predisposing it to multiple conflicts arising out of differing worldviews of the stakeholders. While knowledge sharing in project organizations has been studied (e.g., Dingsøyr et al., 2018), the manifestations of knowledge sharing in a CoP have rarely been explored within the context of a GDITP in a product-based service organization.

In this paper, we present our case study of a software product-based project company delivering services to global customers via a combination of on-site project teams and off-site teams dispersed across three continents working as a CoP. Our research details how the organization has been able to manage this complexity while retaining fidelity to the product architecture and compliance to a uniform project architecture. Our study also provides valuable details of the interactions within the CoP and how the CoP operated in this projectized environment despite having globally located members, with different cultural backgrounds and levels of competencies. Our paper highlights the critical role of community-driven gradual formalization using tools for governance and compliance to community norms with public identification of achievements/failures, driving individual accountability, and highlighting the value of coexistence of formal and informal CoPs.

## LITERATURE REVIEW

Limiting our literature review to the context of globally dispersed projects, we present it in the following three parts: (a) challenges in IT projects, (b) globally dispersed working and (c) CoP.

### Challenges in Information Technology Projects

The numerous factors contributing to the failure of IT projects are scope changes, scope-creep, challenges

in the rapid development of new features due to the emergence of competitors' new products, customer's inability to define or clarify existing workflows along with the inability to articulate precise requirements (e.g., Lyytinen & Hirschheim, 1987; Yeo, 2002). Customer's opportunistic behaviour (Chaudhry, 2020), along with ambiguously stated expectations of the customer (Yeo, 2002), also increases the iterations before convergence between the customer's expectations and project deliverables is achieved. Implementation of less-than-robust algorithms, hasty patches and bug-fixes commonly resorted to during the project implementation phase by the implementation team come to the fore during project-support (Aanestad & Jensen, 2016).

### *Product-Based Project Organizations*

A product-based project company witnesses dynamic tensions between project managers willing to tailor the product to achieve project closure and the product architect striving to preserve the product from morphing into an unmanageable entity due to multiple additions/alterations. While software configuration management emerged as a subject since the work by Bersoff (1984), the dynamics of maintaining fidelity to product architecture in global IT project-based service firms operating with multiple power centres has witnessed less research.

### *Incorporate Local Art or Retain Fidelity to Product Strategy*

Utilizing a proprietary product's architecture to deliver dissimilar project charters, each bringing its idiosyncratic uncertainties, requires sophisticated organizational capabilities and organizational learning (Whyte et al., 2016). This challenge can be resolved either by creating customer-specific solutions and creating an interface with the core product without disturbing the product architecture, or, by assimilating modifications within the product and living with ever-expanding product architecture, a frequent occurrence of which can stretch organizational technical and managerial capabilities (Kidd & Burgess, 2010)

The system architect's perspective differs radically from that of the project manager. Responsible for retaining the competitiveness of the product by incorporating new features, the system architect is also responsible for ensuring the reliability of an ever-increasing complex product. Arguably, incorporating project-driven customizations should make the job of the system architect easy, as different project teams offer new ideas. However, the features and suggestions from project teams add to the dilemma of maintaining the product on the planned product trajectory and avoiding ad hoc additions creating undetermined vulnerabilities.

## Globally Dispersed Working

Within the context of GDITP, iterative collaborations among various stakeholders play a crucial role in successful outcomes (Daim et al., 2012; Henderson et al., 2016). The absence of a shared worldview renders fruitless or brings in inefficiencies in the interactions amongst software architects, technology specialists, customers and domain experts, at an organizational level and a project level. Convergence to a common worldview regarding the project, or a problem, the approach to be adopted for developing a solution and its implementation, is a difficult proposition, with geographically and temporally separated teams of experts with different nationalities and experiences since trust on their global counterparts is often in a nascent stage (Xu et al., 2020).

For any project company, a common project architecture can end up as a contested space. For global support teams, creating uniformity in project implementation and supporting knowledge-recycling (Walsh & Ungson, 1991) a common project architecture forces the project teams to conform to its requirements to meet diverse customers' requirements. Faced with strict deadlines, many project managers would like to allow their teams to develop rapid and often idiosyncratic solutions. The project charter, the contract, its unequivocal penalties and possible negative performance appraisals create a projectized environment for all involved. While such solutions allow the project managers to successfully deliver the project charter, the idiosyncratic nature of the solutions presents challenges for other teams, particularly the maintenance teams. To add to the challenge of meeting deadlines, system architects act as the final gatekeepers, with the power to veto a specific solution to protect the product from insecure customizations. The challenges arising out of such contested space and the craft nature of solution development lead to a search for veterans as sources of knowledge, conversant about solution-archetypes implemented in earlier projects and the successes and failures thereof. Boundaries and official communication protocols between different teams tend to break down as people seek out experts embedded within departments possessing such knowledge (Tsoukas, 2002).

These interactions form the nucleus around which networks flourish. When supported by favourable conditions, these networks evolve into communities with hierarchies, norms, conventions, embodied understandings and shared world views (Dietrich et al., 2013). Multiple interactions and socializing between teams and individuals (Ariño et al., 2001; Smith & Blanck, 2002) foster trust and rapport upholding the community. Actors, despite being driven by their objectives, remain embedded in multiple networks (Stjerne et al., 2019) within these communities identifying with the community so long the benefits of belonging to and identifying with the community accrue.

## Communities of Practice

A product-based project organization typically tends to have multiple projects worldwide, with project teams and support teams operating virtually, trying to meet customer's requirements while ensuring quality standards. A successful product-centric project company could be driven by a structure that would fall somewhere between strong formal teams or a community of practice (Wenger & Snyder, 2000), both with strong integrating mechanisms (Lawrence & Lorsch, 1967). Outcomes at the GDITP level can be understood in terms of underlying actions, interactions and characteristics of either (a) formal teams, complying strictly with protocols, or (b) organizational members engaging and interacting as CoP.

Initially conceptualized as informal collectives and differentiated from formal teams with members willing to 'share their experiences and knowledge in free-flowing, creative ways', CoPs possess an 'organic, spontaneous and informal nature' (Wenger & Snyder, 2000). As observed by Rennstam and Kärreman (2020), members typically converged around technological objects transcending formal work groups, often substituting peer review for formal leadership.

CoPs seem to emerge and operate in two distinct manners. Emerging organically with organizations acknowledging their existence and utilizing their capabilities seem to be significantly different from the alternate approach wherein CoPs are created due to top-down directive of the leadership (e.g., as researched by Venters & Wood, 2007). Creating structures like 'governance committees' and 'sponsors' (Probst & Borzillo, 2008) without an explicit need or organizational challenge shared by the collective mind of a core group seems to lead to failures. This also emerges as a gap in the current understanding of CoPs. A potential area of research could be identifying the differences in impact between CoPs evolving organically due to interactions between experts in a domain/technology versus those which are established due to top-down organizational directives.

The existence of problems requiring time-bound resolutions, sine qua non in knowledge-based projectized industries, provides the necessary impetus towards networking and seeking out knowledge. This proactive 'participation in networks' (Mischen, 2015) by employees leads to the creation of informal structures, languages and artefacts, forming the nucleus for an emerging community. The multitudes of informal and formal networks within CoPs, bridging problems with experts (Amin & Roberts, 2008), overcome organizational complexity (Lesser & Storck, 2001) in a manner that formal organizations with formal communication protocols would find hard to replicate.

What is the nature of interactions in a globally dispersed team that leads to successful project completion is an area with limited research. Aside from the case of failure of CoP in the British Council, as researched by Venters and Wood (2007), we did not find much evidence of CoP in product-based IT services organizations. It is only when a critical mass of repeated social interactions has been reached that organizations witness the emergence of a common language for the involved actors (Sablis et al., 2021). There is a concomitant increase in gainful collaborations and perceptions of interpersonal justice and trust (Lee & Choi, 2003) that nascent social networks coalescence into CoP, where members trade knowledge and expertise (Su, 2021). The implementation of structures like governance councils or technological platforms like digital forums or dashboards, etc., by organizations provide the formal links to organizational hierarchy and processes, thus collectively contributing towards necessary *social ecology* (Gupta & Govindarajan, 2000). These mutually reinforce to create effective and efficient channels of collective memory in an organization.

For a product-based organization catering to globally distributed customers via globally dispersed project teams, we explore two research questions. In contrast to organizations working with multiple project architectures (e.g., Klessova et al., 2020), to leverage on previous learning curves, a product-based project organization aims to replicate a uniform project architecture for rapid and quality delivery of respective

project charters. Allowing diverse project architectures would render a global back-end inoperable. This brings us to the following research questions:

I. What factors encourage the emergence of CoP in a GDITP organization?
II. What role does projectized CoP have on the performance of projects?

Employees in different teams bring their worldviews, as reflected in their understanding of problems, the conceptualizations of solutions and implementation. In geographically dispersed teams, the absence of direct communication either prevents a common worldview from emerging, or more effort and iterations for the common worldview to form. Agreement on goals, however, does not eliminate process-based conflicts, which requires high emotional intelligence among virtually located team members to negotiate and achieve consensus. Interactions ensuring rapid handover between multiple virtual teams to deliver time-bound solutions would require adherence to community-accepted artefacts (Latour, 2004), or top-driven formal governance structures. This raises the following research questions:

III. How does a projectized CoP resolve conflicts to deliver solutions to complex problems despite multiple constraints arising out of multiple stakeholders?
IV. What role do the tools play in conflict resolution within GDITP organization?

## RESEARCH METHOD

### Case Study Method

To understand the phenomenon in depth, we studied a product-based project organization, enforcing uniform project architecture while delivering multiple project charters through globally dispersed teams. We adopted the abductive method of the case research study (Dubois & Gadde, 2002), allowing us to engage pre-existing theories to guide our exploration of this complex phenomenon.

### Research Setting

Orion is a leading provider of industrial hardware, software and global services. Orion's projects typically involve developing customized solutions for Fortune 500 companies, with many projects in build-own-operate mode. Over time, as customer companies moved to outsource management of IT infrastructure, the percentage of build-own-operate projects have increased, thus making Orion responsible for managing and maintaining IT facilities, including projects post-implementation. Orion delivers its solutions using Stern OS, its proprietary operating system.

Orion India, a fully owned subsidiary of an American IT firm, was established in 1995. Orion's India Engineering Centre (IEC) commenced operations near the end of 1998 and was formally launched in May 1999. Figure 1 presents the organizational structure.

#### *Stern Sustenance Group*

Stern OS is a high-end proprietary operating system developed by Orion, often installed on servers and high-end workstations as part of a complete solution. The sustenance activities, that is, involving work specific to the operating system, are carried out at different geographical locations to provide year-round 24×7 support.

#### *Sustenance Centre in India*

The Stern Sustenance Group started in California to support Stern. With global operations, there was a need to expand the group globally to provide services to customers in different time zones. The initial expansion included setting up in the U.K., then France and Germany, and subsequently India. During the initial days of the Indian centre, teams of engineers spent time in the U.S. and U.K. centres to get to know the organizational processes and get a feel of different cultures.

## DATA COLLECTION PROTOCOL

Interviews with respondents, observations of project work, including virtual project conferences and documents shared by respondents formed the primary sources of data. Respondents selected by snowballing provided the fundamental data for this study. Data from observations as non-participative observers and documents were primarily used for validation. Respondents for this study were limited to employees operating from Bangalore. Members of top management, project managers and team members belonging to different software development and sustenance teams formed the respondent pool. All interviewees were engineering graduates, and some were postgraduates

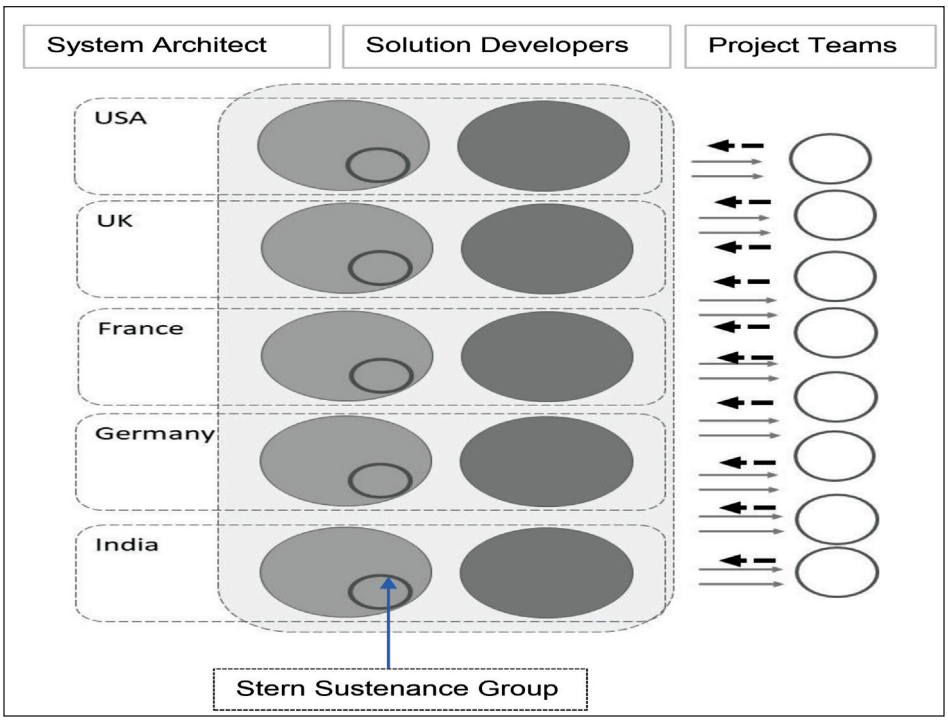


**Figure 1. Organizational Structure.**

**Notes:** 1. The broad structural configuration of the company is given, as full details cannot be provided due to confidentiality reasons. Teams maintaining the Stern operating system, distributed across different countries, are illustrated as smaller circles within larger teams working on system architecture. There are multiple global teams operating similarly with different agendas. For clarity, we have not represented all the existing teams. The arrows represent the interactions regarding problems/technical issues raised by project teams during/post-implementation. While all the interactions that take place iteratively between different teams have not been illustrated to keep the diagram simple, a representative illustration is given in Figure 2. The interactions range from formal communication following a set protocol and format, to informal undocumented telephonic discussions to obtain information or clarifications.

2. The total number of employees in the organization was 38,000. The exact strength and distribution of employees and the total number of projects are not being revealed to maintain confidentiality. During the study, employee strength in the Indian centre was approximately 1,000.

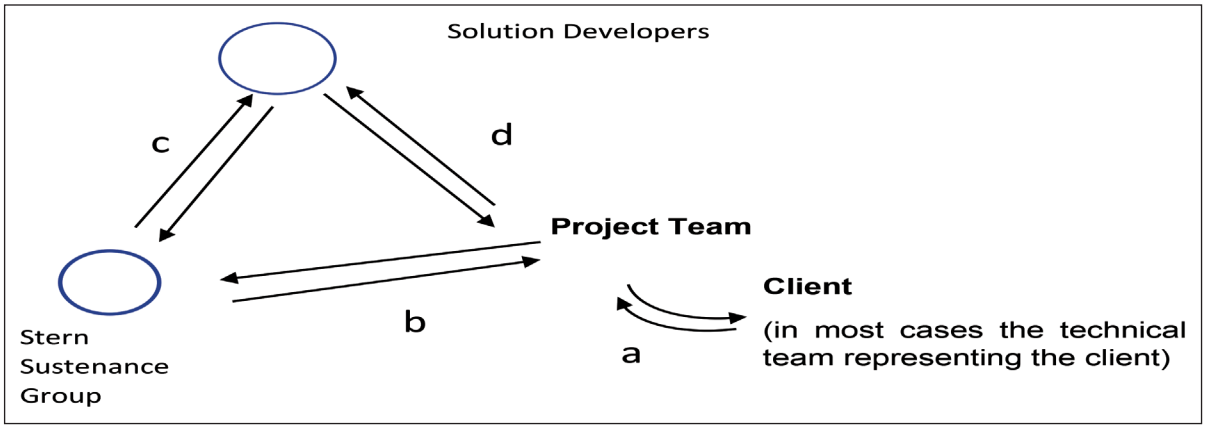


**Figure 2. Simplified Illustration of Interactions Between Different Stakeholders.**

**Notes:**

1. Interactions between the project team and the clients, which range from understanding issues to achieving convergence on the solution, are indicated by arrows labelled a.
2. Arrows labelled b, c and d indicate the multiple iterative interactions during the process of solution development, involving multiple stakeholders. Concerns of different stakeholders range from meeting the project deadlines while maintaining fidelity to product architecture.

in computer science. Most of the project managers were senior engineers promoted to the role with more than 10 years of work experience in developing code and managing teams. Table 1 shows the respondent profile in brief.

## DATA ANALYSIS

Data were analysed using thematic analysis with constant comparisons across respondents (Strauss & Corbin, 1997). Each line, phrase, sentence and paragraph from the transcribed interviews and field notes were reviewed to decide the concepts the data reflected. The in vivo codes allowed us to identify lines of the transcript that required further analysis. Codes were compared with each other for similarities, differences and to determine general patterns. Using the constant comparative method, Level 1 codes were condensed into categories or Level 2 codes. Annexure 1 provides the preliminary theory developed in parallel with data coding. Causal diagramming to represent theories is a widely accepted practice (e.g., Perlow et al., 2002) facilitating concise representation of complex situations, including behaviours of different stakeholders. Developing the article after forming the initial theory allowed us to develop a theoretically sensitized document (Engwall, 2003).

## RESULTS

To capture the dynamics within multiple networks in product-based project organizations, we extensively adapt the framework proposed by Klessova et al. (2020), bringing together the formal and informal mechanisms of project management in GDITP (refer Figure 3).

Project management tools and process bible represent artefacts that have evolved and are accepted by the community, bridging multiple actors in the organization. Without the necessary directive for streamlining the activities, which commenced as ad hoc, informal and individual-specific, these bridging mechanisms would have been rendered defunct. This streamlining of activities was guided by who we term a process sponsor (contrasted to the project sponsor of Breese et al., 2020). The role of the sponsor, enacted by the director, is mandated to ensure that the bridging processes are not circumvented. How different actors interacted to deliver multiple projects is depicted in Figure 3. We present the case in the following sections organized thematically. Critical events that led to the successful delivery of projects and internal developments that led

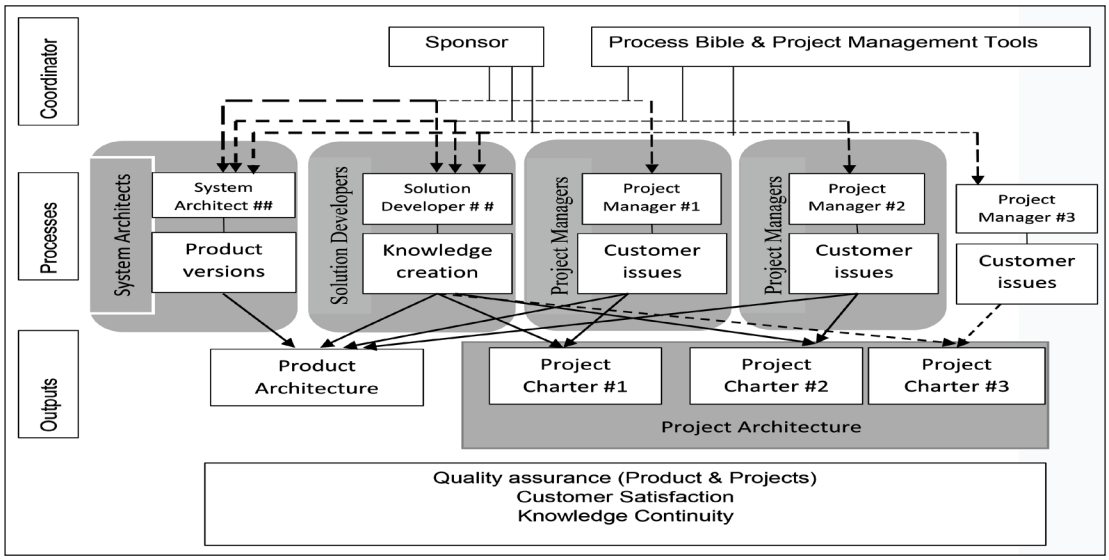


**Figure 3. Conceptual Framework for Projectized Community in a GDITP.**

**Notes:**

1. Our conceptual framework customizes the generic framework developed by Klessova et al. (2020), for product-based service project organizations. The figure shows multiple project teams, implemented via a common project architecture to deliver multiple project charters.
2. Dotted lines show the interactions carried out by complying with the process bible and project management tools, with the sponsor overseeing the compliance.

**Table 1. Brief Description of Respondents.**

| Sl. No. | Names (Anonymized) | Gender | Designation | Experience (in Years) | Transcription Pages |
|---|---|---|---|---|---|
| 1 | Vinay | Male | Sr. engineer | 15 | 13 |
| 2 | Timothy | Male | Group head | 12 | 5 |
| 3 | Tejaswani | Female | Sr. team lead | 12 | 8 |
| 4 | Sanjeev | Male | Sr. engineer | 10 | 9 |
| 5 | Rashmi | Female | C-team lead | 7 | 4 |
| 6 | Rajesh | Male | Sys. architect | 10 | 11 |
| 7 | Raja | Male | Sr. engineer | 11 | 11 |
| 8 | Prasanna | Male | Project mgr | 10 | 19 |
| 9 | Tom | Male | Product architect | 15 | 3 |
| 10 | KNR | Female | Group head | 12 | 16 |
| 11 | Kannan | Male | Group head | 12 | 12 |
| 12 | Harish | Male | Sr. staff engr. | 8 | 12 |
| 13 | Brijesh | Male | Team lead | 7 | 3 |
| 14 | Bala | Male | Sr. engr | 6 | 14 |
| 15 | Bhaskar | Male | Development mgr. | 15 | 19 |
| | | | Total number of pages | | 159 |

**Notes:**

1. The sample has been selected via snowballing to have a representation from each category of teams.
2. Years of experience do not directly correlate to organizational hierarchy due to the influence of other factors like educational background, career movement across organizations by employees, performance appraisal, idiosyncratic negotiations by employees based on their skillsets and experience at time of joining, nature of experience, etc. Some employees preferred to stay in the technical domain while others moved to project management roles, due to their personal preferences.
3. As is common in most knowledge-based industries, expertise in a domain or technology does not necessarily translate to years of experience in a proportional manner. Many subject matter experts, limiting themselves to technical work, have significantly less experience than project managers with broad-based managerial experience.

   Interviews were guided by the following questions:
   i. How are different project activities managed?
   ii. How were different activities coordinated?
   iii. What kinds of coordination mechanisms have been put in place?
   iv. How effective were project management tools and techniques?
4. All interviews were conducted at the project sites and each lasted for more than an hour on average. Going to the sites also helped the researcher understand the work environment. Some interviewees substantiated their points by relating them to electronic documents discussed with the researcher, which would not have been possible otherwise. Data were collected until data saturation (Strauss & Corbin, 1997) was reached.

to the establishment of a CoP are presented in this case study.

## PROJECT DELIVERY

Issues faced during project implementation and problems arising from existing implementations are handed over from one centre to another in a relay-race format, establishing the daily rhythm. Teams engage with the problem on a real-time basis, trying to understand the nature and magnitude of the problem, and providing solutions within the daytime. As the clock moves ahead, the problem and the solution developed is handed over to the next service team, that is in the daytime.

## Solution Development as a Political Process

Working on the initial solution towards proof-of-concept and fine-tuning the solution till satisfactory resolution via geographically dispersed actors is easier said than done. Differences in understanding the problem, its impact on the overall installation and the initial solution-framework received from the previous centres make the ground ripe for conflicts to emerge.

The inherent social hierarchy within the community, that is, within the system architect network and solution network, colours each member's approach towards the problem the solution, and each other. A position in the network of system-architect, in charge of product development is an aspiration for many IT professionals vis-a-vis being a member of solution developers team. Often referred to unflatteringly as maintenance teams, solution developers have a tough time convincing their contemporaries in system architect teams about the validity and value of their solutions. Solution developers' position as subordinate to the system architect is indicated and reinforced by mandatory scrutiny and an obligatory sign-off by the system architect before their solutions are accepted.

The establishment of the process bible and project management tools, with their strong emphasis on documentation, levelled the playing field in a way. A problem highlighted by the solution developer and labelled inconsequential by system architects is now documented with reasons provided by the involved actors. A re-emergence of the problem from a different customer would display the inability of the system architect to understand the value of suggestions offered by the solution developer. As one solution developer informed,

> Earlier, the solution developer would develop a patch and forward it to the project team to incorporate it. So, when the projects were handed over to the maintenance teams, it was observed that a single problem has multiple solutions, each with its own logic. Some of these patches were unstable and were creating problems for other modules when interfaced with the other modules of the software. Many people in project team as well in solution team would get into this mode due to pressures from project managers. We had massive problems in maintenance of such implementations, as often, modifying the code of these patches had spillover issues. It would be a nightmare as it could put to risk the entire installation as implemented for a client. And the funniest part, no one knew who had done what, and why. What was the logic used was documented in an elementary, almost in a sketchy manner as an afterthought.

> …today everything is archived, the issues, the questions raised, and replies given, the acceptance or rejection of the reply, with supporting reasons. Earlier my suggestions could be brushed aside, without adequate reason.

Logging issues in the project management tools brought in an unprecedented level of visibility and accountability. Historically, issues raised were accompanied by sketchy evidence of software failure, often in the form of screenshots or forwarded emails of customer reporting glitches, without sufficient contextual data. Solution developers were often caught between two conflicting stakeholders—the project heads and the system architects. They were often the scapegoats when projects got delayed or when solutions failed. Directed by the sponsor, solution developers, the lowest in the social hierarchy, were empowered to resist dictates from people up the organizational hierarchy, like project managers, to circumvent the required detailed documentation. Transparency and traceability fostered by the tools changed the mindset of different actors. As reported by one respondent,

> …if a project failed, the tool showed the trail identifying all who were involved. So, one cannot play safe within the system. I must either resolve the problem, or, log in the reasons which prevented the solution, and better, come up with alternatives so that the customer issue is settled. Saying that it cannot be done and sitting tight would identify me as someone who cannot innovate.

An idea proposed and incorporated into the product signified the competence of the solution developer in the internal and external network. A corpus of such ideas, proposed and successfully implemented, not only boosted the confidence of the solution developers but also enabled them to break the glass ceiling and become a system architect. Formalized, such a practice also benefited the company in recruiting solution developers, touting the possibility of career shifts into the socially desirable role of system architect. For many, it was a way to get into higher positions in competing IT firms.

On the flip side, a project team's interest in pushing a patch to the programme to passing on local issues as central issues to the system architect, made managing future versions of the product more difficult. The challenge between a genuine add-on, which will give a strategic edge over competing programmes, versus incorporating a patch which might create spillover problems is an uncertain zone for system architects. Each product update makes the product more complex. There are possibilities of unknown problems, which might, in a worst-case scenario, bring a global customer's operations to a grinding halt.

The dilemma faced by the system architect comes to the fore when a project-specific patch, developed by the project team gets implemented locally after being disallowed to be incorporated into the product by the system architect demonstrates superior functionality than the existing product. The transparency regarding such episodes ensures, especially when repeated, doubts about competence are noted. Such community-driven scrutinizing has ensured a high level of professionalism, a kind of, in the words of one respondent, 'doing one's homework thoroughly'.

## System Architect—A Villain or Guardian of the Code

System architect nomenclature collectively represents the multiple teams responsible for maintaining the product. Different modules of the operating system have teams, for example, printer drivers would have a dedicated team, etc., responsible for that piece of software. A glitch-free software creates loyalty to existing code, particularly in large, complex operating systems. To avoid catastrophic failures, updates follow the product architecture strategy, implemented typically with progressively updated software code with rigorous quality control.

System architects function as gatekeepers, guiding locally developed patches to undergo integrity checks for identifying potential conflicts with existing modules. This process not only safeguards system integrity but also ensures that product updates align with the overarching product architecture strategy. With an increase in the number of customers leading to increased suggestions/local solutions/patches, the processes had to be updated. The update included transparent purposive questioning to prevent large-scale stonewalling of the requests by system architects, and an unqualified acceptance of all requests. Since the system architects were involved in approving the patches, it enforced a hesitant and cautious ownership on the part of system architects for locally developed solutions.

## Purposive Questioning

The engagement of the system architect with the requests and the manner of questioning was documented on forums supported by project tools. This allowed the entire collective of organizational members to understand the line of questioning adopted, and critiques raised along with supporting technical analysis, attracting ideas/ suggestions from other members. Ideas ranged from what competitors included in their products, how certain technical challenges could be overcome, and what had been implemented in earlier projects. As reminisced by Sanjeev, a senior engineer,

> The debates on the forums engaged in attracted lot of attention. You had to be careful about what to write and how to articulate it, so that it was project-oriented/ technology-oriented discussion. Criticism targeting individuals, and not the work/technology attracted censure, while creating a legacy that was not good for future interactions. A good input to the discussion furthered your reputation.

The changes in the process and a greater involvement of the community network, ensured a collegial resolution of problems, preventing conflicts among actors. Project managers also used this data to understand the status of different requests/issues and understand the effectiveness of the team members in resolving a messy bug.

### *Problem Analysis, Prototyping and Development*

A project team attempts to resolve a newly identified problem using an existing knowledge base. If the problem is beyond the local knowledge-base or capability pool, the problem is referred to the Enterprise Service Group, which would oversee the root-cause analysis to determine the source of the bug (e.g., application, specific hardware driver, Stern OS). The project management tools included a community scoreboard, highlighting problem-solvers and their successes and failures.

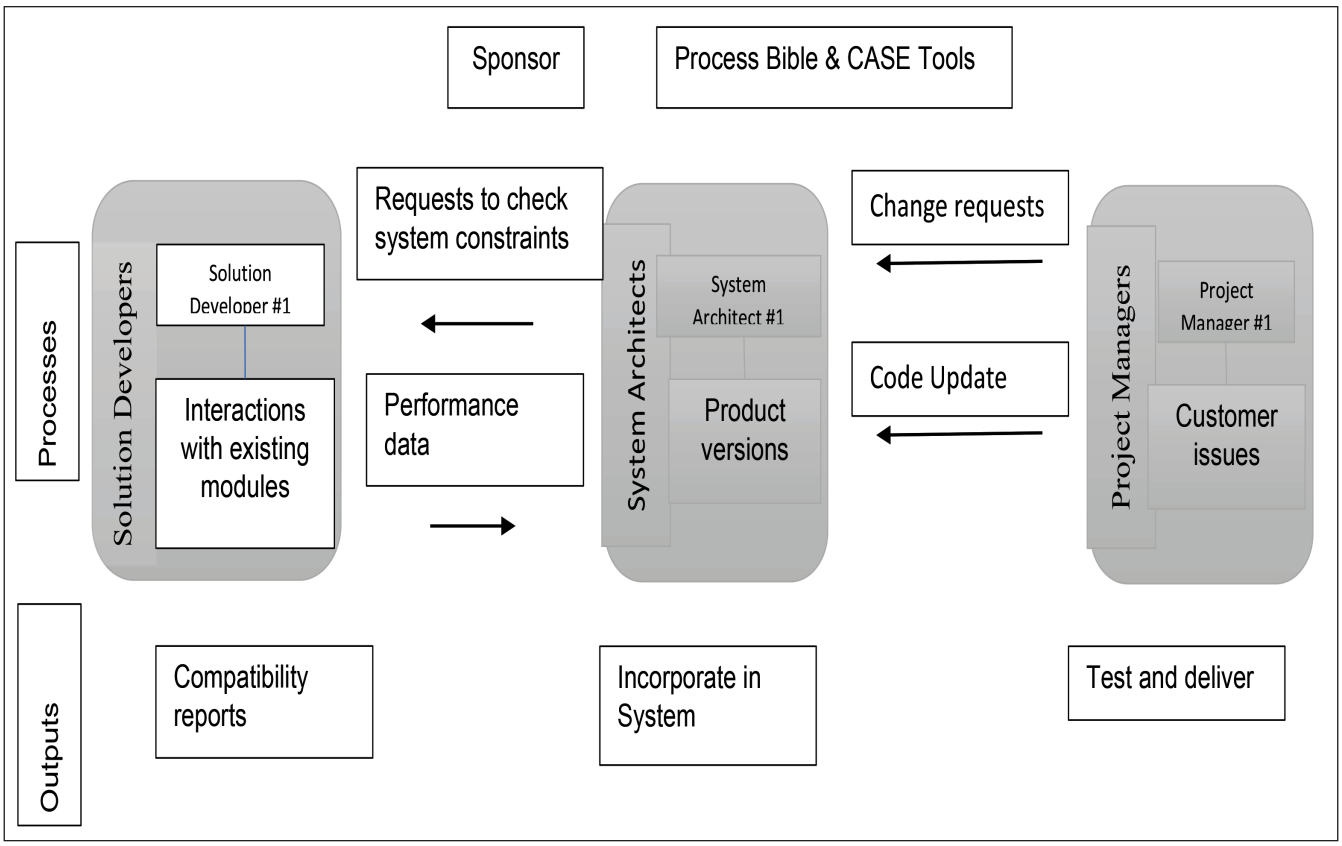


**Figure 4. Negotiated Interactions Between Two Organizational Sub-Networks.**

Good problem-solvers sought out inputs/feedback from the community. Other actors chipped in by engaging in stress-testing, testing for compatibility, pointing out vulnerabilities, etc., providing evidence of collective mindfulness. Figure 4 elaborates on the exchanges during the development of a solution, which can either be a local patch or a modification of the product architecture.

### *Emergence of Community of Practice*

Our paper, by providing a window to 'the unique, interactional, and collective effects that are not only additive but also emergent' (Barney & Felin, 2013, 4), deepens our understanding of CoPs. CoPs have traditionally been conceptualized as an informal collection of professionals or experts in a guild-like fashion within an organization, with its language and subculture not visible in the formal organizational structures and processes. Our paper, for the first time, illustrates how leaders can guide the development of tools and processes that can engage the CoPs, allowing the organization to leverage the collective capabilities of CoPs. Earlier interactions implied personal emails and telephonic discussions akin to localized and personalized networks. Knowledge about successful contributions was limited to a handful of the organizational members, as was the presence and identity of subject matter experts and solution developers. Projectized problem solving utilizing IT platforms reorients traditional CoP that 'may or may not have an explicit agenda' (Wenger & Snyder, 2000) to employees as engaged actors taking on challenges, working collaboratively with other actors towards rapid problem analysis and solution development. The erstwhile inconspicuousness was radically replaced by extensive visibility, noticeable to all organizational members.

## From Network to Community and Emergence of Cultural Artefacts

Guiding the multiple teams down a path to form a cohesive community was the biggest achievement of the sponsor. The three locations provided support using different sub-teams, each composed of 3–4

engineers. For example, one team works on kernels, another works only on network-related problems, another takes care of interface and naming services, and another focuses on commands and libraries. These teams act as bridges among core developers, who build newer versions of the OS while the engineering service group focuses on customer needs. There are approximately 65–70 engineers in the US, 32–33 in the UK and 32 in India. These teams comprise a senior staff member, one or two technical leads and technical staff.

The projectized nature of working, with a high degree of visibility of success or failure, stimulated the emergence of networks as engineers, relying on their connections, exploring the presence of domain experts in their centres and trying to avoid reinventing the wheel. Unfamiliar issues from different customer's needs include product-centric knowledge and customer's industry centric expertise, which is rarely embodied in a single individual or team in a GDITP. Each country centre has witnessed the emergence of technical experts and domain experts, embraced in multiple working relationships. As recounted by one of the solution developers,

> Here, we are supported by sponsor. Unless each activity is carried out as per the process bible, I can refuse to move ahead. Earlier project manager would pressurize, arguing customers cannot be kept waiting and so on. Then, my supervisor would ask me to, you know, bypass the processes and deliver something. That would put the fire down temporarily but would create bigger problems down the road. Except for me, no one would know what I had done.

The format and the details of project management tools were not enforced from the top. The role of the sponsor remained confined to ensure a participative and organic emergence, more aligned to the ever-changing requirements of the community. The process bible and project management tools evolved from being just formal tools; they emerged as materially significant artefacts, bringing into the community their personage and influence.

### *Knowledge Continuity*

The relay-race format of working requires a shared worldview and resolution approach for solving a problem. The worst-case scenario would be when a centre that initiated the solution receives a version inconsistent with the initial thought process, as different centres adopted different worldviews to understand the problem and work accordingly.

Continuity of work requires either formal knowledge management tools or a community working informally through video conferences. Our case had both. However, the CoP was stronger in its impact due to differences in the work experience of team members located in different locations. Thus, necessitating reaching out to other experts and ensuring hand-holding for successful project delivery. The nightmare of a solution development team, the initial team receiving a version completely distinct from the initial thought process, was disciplined by the hand-holding among actors through CoP, beyond the formal tools.

Sponsor's influence in safeguarding these interactions was ever-present, as she had taken on the responsibility for ensuring the success of the India centre. Multiple interactions led to materialization of close ties, which would not have formalized without her continuous support.

## PROJECT MANAGEMENT TOOLS AND PROCESS BIBLE AS CULTURALLY ACCEPTED ARTEFACTS

The IEC in Bangalore became a key site for technology development for the company worldwide. The IEC was slated to grow to a core engineering site with 3,000–5,000 employees to handle worldwide projects. The sponsor, the Director of Stern Sustenance Group, was appointed by the top leadership to focus on quality and rapid delivery. The director was very clear about how she wanted to spread uniform culture across multiple locations. As reminisced by Bhaskar, a development manager:

> Among the initial things she did was get some people from U.S. to come here and work with the team here in the initial stages of IEC. This was done so that a rapport was built…. Initially we had people traveling either way quite frequently to get to know each other. So, these things really helped, otherwise if it was only a team sitting here and working over emails and phone calls it wouldn't have come to this level. This led to blending of the Indian team with rest of the team all over the world.

Additionally, phone and video calls were not permitted during working hours. Therefore, documented

processes were put in place. Prior to shifting part of the work to India, documented processes were not required, because most engineers in the U.K. office had worked in the U.S. office prior to. Hence, they were familiar with the processes. Processes used in the U.S. and U.K. development centres were documented. Subsequently, some new processes were added to increase transparency. The team head in Bangalore said,

> So, we kind of used this opportunity to put documented processes in place and then it started spreading all over the other offices in U.K. and U.S. So, in this way we had influenced other teams to contribute in development of these documented processes and following them. A 'Process Bible' was created, which anyone could go and have a look in case one doesn't know what to do next.

A key team member involved in the development of the process bible shared how the exercise was carried out:

> I picked up seven or eight guys from the teams in India. All of us together created the process bible; after it was done, we took it to the global team. As the activities done at different offices were same everywhere, therefore it was applicable to the whole global team. So, now this book is sustained by voluntary effort from all over the globe and not just the team here. We have cut down the team maintaining that bible to two people here and we have two three people in Europe and two three people in US and they all together sustain the book. Sustain implies that with time some of our processes change and some time we get new processes and some time we remove old processes…so we must keep the Process Bible correct.

### Problem Solving and Evolution of the Tools

Different tools enabling formalization, tracking and analyses were suggested and developed by the sustenance group. Tools ranging from bug trackers, efficiency trackers, status–report generators, etc., allowed 24×7 visibility of different issues at multiple locations, along with data-driven reviews, audit trails and code walkthroughs. As one of the managers told us,

> Earlier, we used to have lot of heated arguments because no group wanted to own the problem. There was lot of buck passing among the different groups viz., hardware driver group, application group or OS group.

> …now Scopus (part of the Project Management tools) allows us to do a great amount of post mortem analysis. We look at the means and the medians of the phases, we look at the trends where all we are doing well where all we are not doing well and what we need to address.

> After documentation…of probable causes associated with probable probabilities was started…things started to change. Engineers knew that problem could have been interjected because of somebody's else fault or it was their own fault. Either way there is now visibility in the system of the problem creator and problem solver.

The development of processes, technologies and expertise in the teams has been a self-sustaining virtuous cycle. Improvements in both arenas have led to increased effectiveness of the sustenance team, with people displaying high maturity in rejecting what does not work. One of the engineers said,

> It is an ongoing process…you develop expertise and then you say…this process is not needed…you knock it off or you would say this is where we are going wrong; we need a new process for that or something like that. Whatever work we are doing there are two aspects to it…one is the process that we follow and second is the expertise in that domain.

Eliminating what does not work ensures actors stick to their proposed solutions. Being data-driven, with project goals as the driving factor, the focus of all involved members is on a solution that works and meets quality requirements.

## DISCUSSION

Our case study has explored a rarely researched field of product-based project companies successfully delivering global service projects through dispersed teams, engaging as a CoP. Our research also points out how CoPs operated with varying degrees of formalization: Mature CoPs possessing a critical mass of interacting members were formalized via governance structures of sponsors and community-created tools, while nascent CoPs coexisted as informal interactions. Bridging research on global IT projects and successful CoP, our paper presents a 'revelatory case' (Yin, 2003, 43), providing an understanding of hitherto a relatively under-researched phenomenon and a potentially valuable counter case to studies researching failures.

First, our research supports negotiated controlling by system architects, committed to preserving product-architecture and ensuring product resilience (Aanestad

& Jensen, 2016), working in parallel with project managers committed to delivering multiple project charters, bound by uniform project architecture. The advantage of meeting multiple project charters, despite each charter being unique, via a uniform architecture has been identified by previous research (e.g., Klessova et al., 2020, 301). However, our paper has extended the existing research by bringing to the fore the possibility of negotiated coexistence of local adaptations of the product and fidelity to product-version-trajectory through product architecture.

The second contribution of our research, which can be extended to knowledge-based projectized organizations/industries, is to demonstrate how projectized communities, with a high degree of customer focus, foster the formation of projectized networks, deepening connections within the community. While knowledge sharing has been widely known to exist in social networks, such sharing was often limited to industries associated with physical interactions or face-to-face social networks, for example, in manufacturing (Al Saifi et al., 2016) or in agriculture (Pratiwi & Suzuki, 2017). Our study indicates that excessive emphasis on 'trust-enabling structures and interactions' (e.g., Xu et al., 2020) has ignored the impact of projectivization. Failures of CoP due to lack of engagement (Haas et al., 2020) lend support to the proposition that strong project-based organizations would be able to actualize and benefit from CoPs better due to project-enforced engagement. The dynamism of community is manifested by events, artefacts and engaged actors piloted by customer-oriented project rhythm (Wenger et al., 2002), compared to non-projectized communities (e.g., Symon et al., 2020).

Organizational practices and processes play a significant role in unearthing and formalizing social networks that exist at the peripheries of formal organization. This transformation into formalized CoPs provides visibility to the networks, which provide valuable knowledge creation, sharing and use. The sponsor and the process bible, operating as culturally embedded artefacts, brought in governance and accountability. The accountability was reinforced due to customer problems acting as trigger events and fulfilling an integrating role (Lawrence & Lorsch, 1967) spanning coordinating actors across the community.

Evolution of CoP is a contingent outcome, determined not only by the properties of product architect and project management but also by the dynamic interplay of convergent and contested interests of actors linked in complex networks. It is only when these isolated actors get connected and enmeshed in multiple networks, instinctively engaging in 'specialization within' and 'specialization through', that is, integrating different specialized knowledge (Carlile & Rebentisch, 2003), do we witness the emergence of a project-synchronized community of practice. A 'practice-driven' and a multiple networks-based approach allows redundancies and accommodates diverse knowledge-sharing needs and preferences (Pan & Leidner, 2003).

Projectification of an organization destroys existing boundaries and redistributes political power (Bredin & Soderlund, 2006; Midler, 1995). Isolated employees engaged in related work in a seemingly fertile 'learning landscape' (Prencipe & Tell, 2001) tend to be akin to a community-in-practice, conceptually and empirically different from CoP. We identify the presence of the sponsor as a compelling reason for the successful implementation of the project management tools and process bible. Together, these three functioned as tools for both community governance (Klijn, 2008) and project governance (Abednego & Ogunlana, 2006; Joslin & Müller, 2016). Without these, the interactions among multiple community members represent potential conflicts, as actors limit their understanding to their respective worldviews (e.g., see ul Musawir et al., 2020).

Projectification intensifies actors' interests in the improvement of individual competencies and in moving beyond departmental boundaries (Bredin & Soderlund, 2006). While not the focus of our paper, our research highlights the paradoxical role of an increase in employee engagement by those seeking better opportunities outside the organization. The intense learning opportunity, facilitated by the projectized collegiate environment, proves to be an asset in a competitive labour market.

A projectized CoP seems to provide a higher level of collective mindfulness, resulting in superior organizational sensemaking (Aanestad & Jensen, 2016), allowing multiple social interactions fostering the emergence of common protocol and language (Sablis et al., 2021). Nurtured by leadership, it creates a virtuous spiral of gainful collaborations, recognition and trust (Lee & Choi, 2003), attracting employees to engage further and developing the right social ecology

as identified by Gupta and Govindarajan (2000). Operating with process tools that bring invaluable visibility, traceability and accountability to numerous interactions between 'serving' and 'served' actors (Yeo, 2002), prevents a descent into chaos.

Despite the underlying complexity of multiple members and their relationships, the psychological empowerment fostered by the sponsor has harmonized the functioning of these informal networks driving successful projects and innovation. Transitioning from sponsor-driven governance to participant-driven governance (Provan & Kenis, 2008) was, we believe, a demonstrated and intentional shift of power by the sponsor to the community.

## CONCLUSION

### Contribution

This study provides important empirical evidence towards increasing the understanding of a successfully working globally distributed team, overcoming static formalism and protocols. Our case study illustrates how beneath apparent chaos lies an emergent process with its own logic of social values and power. Projectized communities function via distributed teams, or individual experts, taking ownership of problems. They resolve problems through intense coordination with other domain experts, starting off as informal interactions that subsequently mature to formal processes. These interactions, while seemingly complex, do not overwhelm the organizational processes and existing project management tools. Publicly visible dashboards and forums facilitate coordination. The communal knowledge of ownership leads to community engaging as an appreciative audience or, in case of non-performance, a harsh jury. These practices prevent the breakdown of the invisible threads of coordination and control. Despite multiple constraints and multiple teams, formal protocols were continually superseded by their adaptations, enabling community members to work within and modify the protocols, and share knowledge rapidly, a counter case to 'safeguarding behaviour' (Xu et al., 2020).

Our research provides strong evidence of the phenomenon of successful emergent social norms and structures guiding people towards organizational goals. The case study emphasizes the significance of tools, processes, and informal networking backed by strong leadership in the successful emergence and development of a vibrant community of practice.

## IMPLICATIONS AND FUTURE RESEARCH DIRECTIONS

Our case study has several important implications for project-based organizations. The case study illustrates CoP as a potential buffer providing organizational resilience against attrition-induced knowledge loss and loss of continuity. The community perspective highlights the dynamic capacity and capability (Volberda et al., 2010) of an organization.

Project managers' technical competence is inherently limited to projects and towards products/systems (Rennstam & Kärreman, 2020). How project managers embed themselves deep enough into the community to understand the current situation as the community evolves with its own language and cultural nuances is an unexplored area. This challenge extends to organizational leaders as well. What would be a leader's position—embedded in the CoP or outside? Which one would be advisable, and in what contexts? We believe answers to these questions would have a significant bearing on leadership's decisions to establish a CoP within an organization.

## DECLARATION OF CONFLICTING INTERESTS

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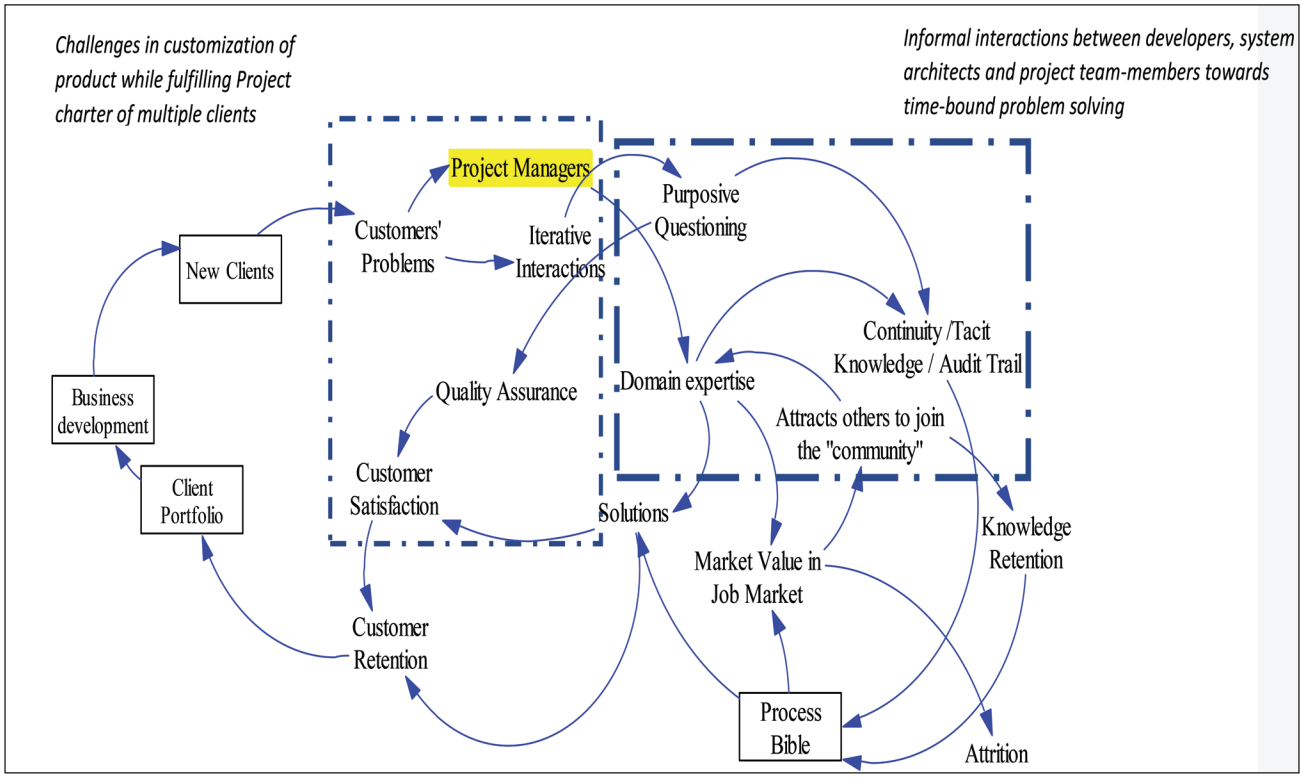


**Annexure 1: Preliminary Theory Based on Emergent Themes (Developed in Parallel with Data-coding).**

**Note:** Due to space constraints, a partial extract of the preliminary theory has been included to illustrate the data analysis process.

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# Quantum-Based Salp Swarm Algorithm Driven Design Optimization of Savonius Wind Turbine-Cylindrical Deflector System

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**Abstract**

Savonius turbines, prominent in small-scale wind turbine applications operating under low-speed conditions, encounter limitations due to opposing torque on the returning blade, impeding high efficiency. A viable solution involves mitigating this retarding torque by directing incoming airflow through a cylindrical deflector. However, such flow control is highly contingent upon the location and size of the cylindrical deflector, and its angular velocity. This study introduces a novel design optimization framework tailored for enhancing the turbine-deflector system's performance. Leveraging surrogate models for computational efficiency, six different models were assessed, with Kriging selected for subsequent analysis based on its superior performance at approximating the relation between design parameters and objective function. The training data for the surrogate model and the flow field data around the system were obtained through Unsteady Reynolds-Averaged Navier Stokes (URANS) simulations using a sliding mesh technique. An in-house code for the Quantum-based Salp Swarm Optimization (QSSO) algorithm was then employed to obtain design parameters corresponding to the peak power coefficient ($C_p$) for the stationary deflector-turbine system. Additionally, the QSSO algorithm was quantitatively compared with nine other competing algorithms. The optimized stationary deflector-turbine system showed an improvement of 26.94% in $C_p$ at Tip Speed Ratio (TSR) of 0.9 compared

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to the baseline case. Further investigation into the effect of deflector rotational velocity ($\omega_d$) revealed significant improvements: 40.98% and 11.33% enhancement at $\omega_d = 3\ rad/s$, and 51.23% and 19.42% at $\omega_d = 40\ rad/s$, compared to configurations without a deflector and with the optimized stationary deflector, respectively at a TSR of 0.9. In conclusion, this study introduces a robust optimization framework that not only improves the performance of Savonius turbines but also underscores the potential of surrogate modeling and advanced optimization algorithms in addressing aerodynamic challenges within wind turbine design. Importantly, the framework's applicability extends beyond this study, offering opportunities for multi-parameter optimization of components across the energy sector.

*Keywords:*
Wind Turbines, Surrogate Modeling, Computational Fluid Dynamics, Metaheuristic Optimization, Swarm Intelligence, Quantum Computing

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**Nomenclature**

| | |
|---|---|
| $\lambda$ | Tip Speed Ratio (TSR) [-] |
| $\omega$ | Specific turbulent dissipation rate $[m^2/s^3]$ |
| $\omega_d$ | Angular velocity of deflector $[rad/s]$ |
| $\omega_t$ | Angular velocity of turbine $[rad/s]$ |
| $\Omega_z$ | Z-Vorticity magnitude [1/s] |
| $\rho$ | Air density $[kg/m^3]$ |
| $\theta$ | Azimuth Angle of turbine $[^o]$ |
| $\xi_{\omega m}$ | Shape Parameter [-] |
| $A$ | Area swept by turbine rotors $[m^2]$ |
| $a$ | Dilation parameter [-] |
| $C_m$ | Moment coefficient [-] |
| $C_p$ | Power coefficient [-] |

| | |
|---|---|
| $CoP$ | Pressure coefficient [-] |
| $D$ | Turbine diameter $[m]$ |
| $D_b$ | Turbine blade diameter $[m]$ |
| $D_c$ | Diameter of cylindrical deflector $[m]$ |
| $g_1$ | Upper limit of dilation parameter [-] |
| $k$ | Turbulent kinetic energy $[m^2/s^2]$ |
| $L_x$ | Horizontal distance of deflector from turbine shaft $[m]$ |
| $L_y$ | Vertical distance of deflector from turbine shaft $[m]$ |
| $M$ | Moment acting on turbine rotors $[Nm]$ |
| $P$ | Power available in incoming wind $[W]$ |
| $R$ | Radius of turbine rotor $[m]$ |
| $V$ | Instantaneous velocity $[m/s]$ |
| $V_\infty$ | Free stream velocity $[m/s]$ |
| $y^+$ | Dimensionless wall distance [-] |

## 1. Introduction

The immense potential of clean energy sources such as wind, hydropower, geothermal, solar, and biomass energy has started to receive a lot of attention because of the growing energy needs of the world [1, 2, 3]. The energy crisis has made it essential to find alternative energy sources and optimize the use of existing ones. The environmental effects and the availability problems associated with fossil fuels have only emphasized the urgent need to transition towards inexhaustible sources of energy. Harnessing these inexhaustible power sources can mitigate climate change, reduce air and water pollution, and ensure that future generations have access to clean energy. Wind energy is among the potential inexhaustible energy sources and is an increasingly developing alternative energy production method [4]. The USA anticipates wind to provide 20% of its total electricity production by 2030 [5].

This scenario can only be achieved by addressing the fundamental challenges identified in the context of harvesting wind energy. Approximately 10 million megawatts (MW) of wind energy is consistently available in the Earth's atmosphere, according to estimates [6]. According to the Global Wind Energy Council (GWEC), countries investing in wind energy have collectively reached a record-high installed capacity of 906 GW in 2022. An additional 100 GW of new capacity is expected to have been added in 2023 [7]. Despite the economic difficulties and resource limitations faced by wind turbine supply chains due to the pandemic, the GWEC reports an increment of 9% compared to the previous year in the wind power capacity in 2022.

Wind turbine design is an interdisciplinary research field that uses the fundamentals of fields such as turbomachinery, vibrations, aerodynamics, and material science to create efficient and sustainable energy solutions [8]. By integrating multidisciplinary principles, researchers aim to optimize the performance of wind turbines, maximizing energy capture while minimizing structural fatigue and environmental impact. Large companies like Vestas and Siemens are actively trying to optimize wind turbine systems for efficient energy production. In academia, many researchers have proposed different optimization objectives, algorithms, constraints, and tools to improve wind turbine performance [9].

Since the pioneering work of Betz in 1920 [10], substantial strides have been made in the field of wind turbine aerodynamics, especially their optimization. Betz [10] found that the highest efficiency that a wind turbine may reach is 59.33%. Wind turbines are classified into two main categories, namely vertical axis and horizontal axis, based on the orientation of their rotation axis [11]. Vertical axis wind turbines (VAWTs) have garnered significantly more attention than horizontal axis turbines due to their superior efficiency in low-wind conditions [12]. VAWTs further offer two main principles of operation: drag-based, and lift-based [13]. For small-scale wind turbine projects, Manwell et al. [14] pointed out that drag-based turbines offer lower construction costs than lift-based turbines. Dominy et al. [15] further suggested that drag-based turbines offer greater self-starting capabilities even in low wind speed conditions, unlike their lift-based counterparts. This makes drag-driven wind turbines aerodynamically more advantageous, especially on sites with variable wind speeds and directions. Even then, a major problem with the VAWTs is their low efficiency in converting wind energy into usable electricity [16]. This is attributed to several factors, such as the geometry of the turbine, and the complex aerodynamic flow patterns

they encounter.

Currently, there is an increasing emphasis on enhancing the efficiency of Savonius turbines. Devised by Sigurd Johannes Savonius in the year 1929 [17], the Savonius turbine features S-shaped blade design that rotates about a central axis. Recognizing the substantial potential of this turbine design, researchers are actively engaged in efforts to boost its efficiency. To achieve this goal, extensive research and development is going into modifying the blade design and profile to improve energy capture, as well as exploring wind deflectors as power augmentation devices to optimize the turbine's performance. Additionally, numerical techniques, including computational fluid dynamics (CFD), are being utilized to compute flow patterns and aerodynamic/hydrodynamic loads, thereby contributing to design improvements.

However, instead of relying solely on conventional numerical methods such as CFD, researchers are increasingly complementing them with novel techniques like surrogate modeling and meta-heuristic optimization algorithms. This reduces the number of simulations required and efficiently finds the optimal design parameters, thereby saving time and computational resources [18, 19, 20, 21]. Surrogate models are simplified mathematical representations derived from complex computer simulations or experiments that aid in approximating the behavior of the complex underlying system. Subsequently, meta-heuristic optimization algorithms are used to efficiently explore large solution spaces and obtain quasi-optimal solutions for optimization problems. These algorithms can be broadly categorized as evolutionary, nature-based, or swarm-intelligence algorithms and are often used when traditional optimization methods are impractical due to the non-linearity or complexity of the problem.

Various methods have been introduced in the literature for improving the efficiency of Savonius turbines. In their study, Kassem et al. [22] altered the configurations of the end-plates for Savonius VAWTs and performed CFD studies with a 3 to 13 m/s wind speed range. Implementing both upper and lower end-plates, the study reported a 35% increase in rotor power compared to using the turbine without end plates. Using Bezier curves and CFD simulations, Zemamou et al. [23] improved the Savonius turbine blade design, achieving a significant 29% increase in power coefficient ($C_p$) over the standard VAWT. Xia et al. [24] utilized nature-based algorithms and surrogate models to optimize the blade shape of Savonius VAWTs, leading to a 7% higher average torque coefficient than the traditional design at a TSR of 1. Furthermore, He et al. [25] conducted CFD simulations and coupled the

data with an Evolutionary Genetic Algorithm (GA) to improve the shape of the turbine blades and deflector placement for Savonius VAWTs, reporting a 34% increase in the average $C_p$ with optimized blades compared to semi-circular blades. Additionally, the optimized deflector yielded a remarkable 95% enhancement in the average $C_p$ compared to the baseline configuration of the turbine. In 2011, Golecha et al. [26] undertook experiments to assess the influence of the placement of a rectangular deflector close to a Savonius hydro turbine. Optimizing the location of the deflector resulted in a 50% augmentation in $C_p$, highlighting the pivotal role played by proper deflector positioning in boosting the turbine's performance.

The use of deflectors in Savonius VAWTs to improve power output has garnered significant attention among researchers [25, 27, 28, 29, 30, 31]. However, flow deflectors have a serious disadvantage in that they create strong turbulent wake regions downstream, which detrimentally effects the flow behavior, especially near the returning blade. This causes a negative torque output, resulting in a significant loss in the turbine's net power and torque output. The generation of strong vortices by flat plate deflectors induces flow instability, impacting the returning rotor and also limiting its application in a turbine array. Additionally, the interaction between the turbine rotors, and the vortices shed from the deflector, causes periodic loading on the turbine blades, which increases system fatigue [32]. Researchers have shifted their focus to circular deflectors as a potential solution to address these challenges in Savonius VAWTs. The application of circular flow deflectors as power augmentation devices is intended to minimize wake regions, alleviate downstream vortices, and improve overall performance. Yuwono et al. [33] conducted experiments involving circular deflectors positioned ahead of the turbine's returning blade, resulting in a 12.2% increase in the turbine's $C_p$ for a TSR of 0.65 compared to a conventional Savonius turbine. In 2018, Setiawan et al. [34] introduced a circular cylinder next to the advancing blade of the Savonius turbine. The advancement of the blade and the circular cylinder's nozzle-like effect collectively facilitated blade acceleration, leading to an approximate 17.3% enhancement in $C_p$, as per their numerical investigation. Furthermore, Singh et al. [31] utilized the Grey Wolf optimization algorithm and Kriging surrogate model to optimize Savonius turbine's performance with an upstream stationary cylindrical deflector and reported an enhancement of 34.2% in the power output.

Even though a stationary circular deflector deflects the incoming flow towards the turbine's advancing blade, its stationary nature causes a significant

flow separation, generating large and powerful vortices that destabilize the flow and adversely affect the returning blade. To counteract this, Fatahian et al. [32] analyzed the impact of using upstream rotating cylindrical deflectors. In the study, the authors employed the commonly used heuristic method of finding the optimal parameters of the system and reported a 33.3% peak increment in $C_p$ through the use of a deflector rotating at an angular velocity of 40 rad/s. Although their study is a good starting point for examining the influence of design parameters of the rotating deflector-Savonius turbine system, it does not provide an accurate representation of the impact of system parameters on performance as they have studied only the influence of one parameter by keeping the value of other parameters a constant and also have chosen a very small sample size of discreet parameter values.

To address the limitations of prior studies and introduce a robust and efficient framework for multi-parameter design optimization, the current work is structured around four main objectives:

1. **Data Collection and Surrogate Model Training:** The first objective involves gathering data from CFD simulations and subsequently training a surrogate model.
2. **Comparison of Different Surrogate Models:** The second objective involves comparing six different surrogate models and selecting the optimum one based on their accuracy at approximating the relation between $C_p$ and design parameters of the turbine-deflector system.
3. **Implementation of Quantum-Based Salp Swarm Algorithm:** The third objective entails the utilization of the Quantum-based Salp Swarm Optimization (QSSO) algorithm to ascertain the optimal stationary cylindrical deflector-turbine configuration.
4. **Comparison with Other Meta-heuristic Algorithms:** The fourth objective involves comparing the QSSO algorithm against nine other prominent meta-heuristic algorithms.
5. **Determination of Optimal Rotational Velocity:** The final objective aims to determine the optimal rotational velocity of the cylindrical deflector, thereby achieving the maximum power output from the system.

## 2. Computational Model

### *2.1. Parameterization*

In the current study, a drag-based Savonius wind turbine is utilized, incorporating a cylindrically shaped deflector situated upwind of the returning turbine blade. Figure 1 depicts a schematic representation of the turbine-deflector configuration, with the deflector placed just ahead of the returning blade. Dimensions of the system, viz. blade diameter ($D_b$) = 0.5 $m$ and turbine diameter ($D$) = 0.909 $m$ were sourced from the experiments of Yuwono et al. [33], which noted that redirecting the air coming towards the front of turbine's returning blade can markedly enhance its performance. This phenomenon was seen to be contingent on four parameters: the diameter of the cylindrical deflector ($D_c$), the horizontal and vertical position of the deflector center from the center of the turbine shaft ($L_x$ and $L_y$ respectively), and the rotational velocity of the deflector ($\omega_d$). Previous investigations have also confirmed the sensitivity of these parameters to improve turbine performance [33, 34]. Optimal system performance and efficiency necessitate limiting the parameter values within specific established limits derived from previous studies [32, 31]. Therefore, for the current study, $L_x/D$ ranges from 1 to 2, the value of $L_y/D$ would be kept between 0.3 and 1, $D_c/D$ within 0.25 and 1, and $\omega_d$ would be maintained between 1 and 50 $rad/s$. While these constraints were primarily derived from the system's performance considerations, the design feasibility was also taken into account when determining these limiting values.

### *2.2. Performance Parameters*

Wind turbines harness energy from the flowing wind. The theoretical energy present in the wind is formulated as:

$$P = \frac{1}{2}\rho A V_\infty^3 \tag{1}$$

In the above equation, $\rho$ is the fluid density, $A$ is the swept area of the turbine and $V_\infty$ is the velocity of the incoming fluid.

However, wind turbines can extract only a fraction of this theoretically available power, the fraction being termed the power coefficient ($C_p$). Thus, the power extracted by the turbine is expressed as:

$$P_{extracted} = \frac{1}{2}\rho A V_\infty^3 \times C_p \tag{2}$$

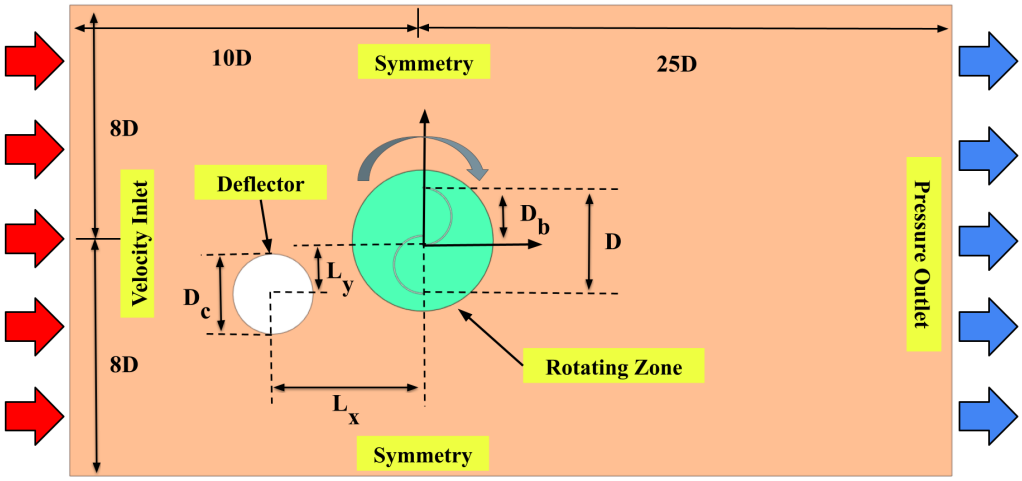



Figure 1: Flow domain schematic for the Savonius turbine-deflector system

The power coefficient of any turbine cannot exceed the limit of 0.59, as specified by Albert Betz in 1920 [10]. In other words, the maximum efficiency that can be attained by a wind turbine is 59.3%. A critical parameter, known as the tip speed ratio (TSR), characterizes the performance of a wind turbine and is the ratio of the turbine's tangential velocity to the velocity of the incoming fluid. This is given by:

$$TSR(\lambda) = \frac{\omega_t R}{V_\infty} \tag{3}$$

In the above equation, $\omega_t$ is the angular velocity of the turbine, $R$ is its diameter and $V$ is the velocity of incoming fluid.

The TSR establishes a connection between the turbine's moment coefficient ($C_m$) and its power coefficient through the relationship:

$$C_p = \lambda C_m \tag{4}$$

The moment generated by the turbine blades can be computed using:

$$M = \frac{1}{2} C_m \rho A R V_\infty^2 \tag{5}$$

*2.3. Computational Grid*

For the CFD simulations, the Savonius turbine was placed in a two-dimensional rectangular flow domain divided into two subdomains. To utilize

the sliding mesh method, the inner domain was made to be the rotating zone, while the outer domain was made the stationary zone. The turbine blades were placed in the inner domain. To generate the grid for the simulations, the flow domain was partitioned into two zones: an inner section, comprising the deflector and the turbine blades, and the outer section. The inner section was meshed using unstructured tri-elements, whereas the outer section was meshed using structured quad-elements.

This hybrid-meshing technique has two major benefits. Firstly, it prevents the formation of low-quality and high aspect ratio cells near the turbine and deflector walls. Secondly, it enables the use of a parametric framework that makes the simulation process more efficient. Numerous design points were computed in this investigation to attain the optimal solution. For each design point with new values of $D_c$, $L_x$, $L_y$, and $\omega_d$, a sequential procedure involving geometry update, remeshing, and solution solving is required. The hybrid-meshing approach facilitates the grid generator to concentrate primarily on modifying the grid only throughout the inner zone, while preserving the grid for the outer zone, resulting in a significant decrease in the overall computing time.

Figure 2 depicts the grid used for the simulations. An extended domain is used in order to capture the vortices shed from the turbine-deflector system. To generate the hybrid mesh, the domain was split into 14 mesh blocks. A finer and more refined grid was implemented near the turbine and deflector walls, to accurately capture the complex physics of the turbulent viscous flow. While generating the near-wall cells, a $y^+$ value of less than 1 was maintained with 32 inflation layers wrapped around the deflector and turbine blades, having a first cell height of $5 \times 10^{-3} mm$, and a constant growth rate of 1.14.

### *2.4. Setup and Boundary Conditions*

Unsteady RANS simulations were conducted using ANSYS Fluent version 22.1 [35] to generate training data for the surrogate model. A uniform freestream velocity of 7 $m/s$ and constant pressure and density values were imposed at the inlet. The operating pressure was kept at 101325 $Pa$ throughout the domain, while the density was kept at 1.225 $kg/m^3$. Velocity boundary conditions at the turbine blades and the deflector walls were defined by imposing the no-slip condition. To simulate a fairly high turbulent inflow,

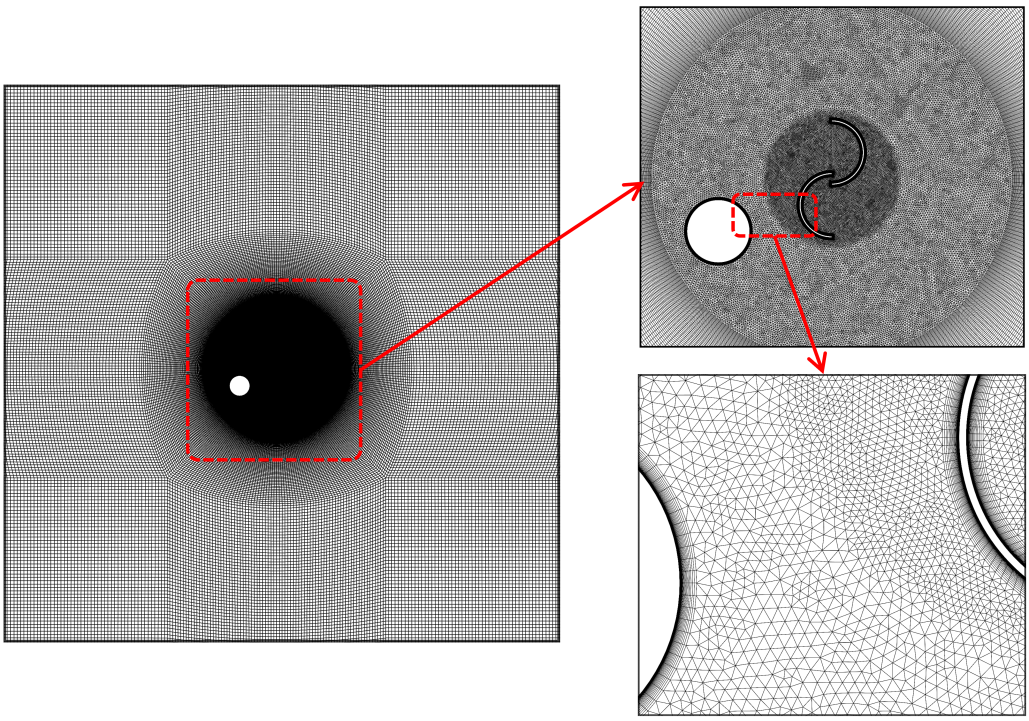


Figure 2: Computational Grid

the inlet turbulence intensity and the turbulent viscosity ratio were specified as 5% and 10, respectively. Dynamic viscosity of the fluid was taken as $1.7894 \times 10^{-5}\ kg/m.s$. A pressure-outlet boundary condition was imposed at the domain outlet, which imposes a Dirichlet boundary condition for the static pressure (i.e., static gauge pressure = 0). To ensure proper convergence of the simulations, it was ensured that the residuals fall below $1 \times 10^{-6}$ for all cases.

### *2.5. Numerical Model*

Ensuring the accuracy of the numerical model was crucial for training a reliable surrogate model based on the CFD simulation data. Since the Mach number (0.02) of the current study was much smaller than 0.3, a pressure-based solver was utilized and the flow was modeled as an incompressible fluid. The dimensional governing equations are given as follows:

$$\frac{\partial U_i}{\partial x_i} = 0 \tag{6}$$

$$\rho\frac{\partial U_i}{\partial t}+\rho\frac{\partial U_iU_j}{\partial x_j}=-\frac{\partial P}{\partial x_i}+\mu\frac{\partial^2 U_i}{\partial x_j^2}+\frac{\partial(-\rho\overline{U_i'U_j'})}{\partial x_j} \tag{7}$$

where the term $-\rho\overline{U_i'U_j'}$ denotes the Reynolds stresses, P denotes the pressure, $\rho$ denotes the density of the fluid, and $U_i$ & $U_j$ represent the velocity components. The turbulence closure model is an important aspect that affects the simulation accuracy by modeling the Reynolds stress term. Previous studies [16, 32, 22, 23, 25, 26] show that the two-equation $k-\omega$ Shear-Stress Transport model given by Menter [36] can represent the flow field around VAWTs accurately. Mathematically, this turbulence model can be written as follows:

$$\frac{\partial(\rho k)}{\partial t}+\frac{\partial(\rho kU_i)}{\partial x_i}=\frac{\partial}{\partial x_j}\left[\Gamma_k\frac{\partial k}{\partial x_j}\right]+G_k-Y_k \tag{8}$$

$$\frac{\partial(\rho\omega)}{\partial t}+\frac{\partial(\rho\omega U_i)}{\partial x_i}=\frac{\partial}{\partial x_j}\left[\Gamma_\omega\frac{\partial\omega}{\partial x_j}\right]+G_\omega-Y_\omega+D_\omega \tag{9}$$

In this context, $\Gamma_k$ and $\Gamma_\omega$ stand for the effective diffusivity of $k$ and $\omega$ respectively. The terms $G_k$ and $G_\omega$ represent the generation of $k$ and $\omega$ arising from velocity gradients, while $Y_k$ and $Y_\omega$ signify the dissipation of $k$ and $\omega$ respectively. The cross-diffusion term is denoted by $D_\omega$.

This model switches between the $k-\omega$ model of Wilcox [37] near the wall, and the standard $k-\epsilon$ model [38] in far-field regions. This is done using a blending function and exploits the near-wall robustness of the Wilcox $k-\omega$ model while mitigating its freestream sensitivity by switching to the freestream-independent standard $k-\epsilon$ model.

Besides turbulence closure model, the simulation accuracy is also sensitive to the pressure-velocity coupling and discretization schemes. The COUPLED algorithm [35] was utilized for pressure-velocity coupling in the simulations. Furthermore, a second-order linear upwind approach was used for the spatial discretization of turbulent kinetic energy, specific dissipation rate, pressure, and momentum. The gradient terms were discretized using the least squares cell-based scheme.

### *2.6. Verification and Validation Studies*

For the verification study, first, a mesh independence test was conducted to ensure that the simulation results were insensitive to the grid resolution. A finer grid, although much more accurate, comes with a trade-off in computational efficiency. Hence, it was imperative to generate the ideal mesh, that

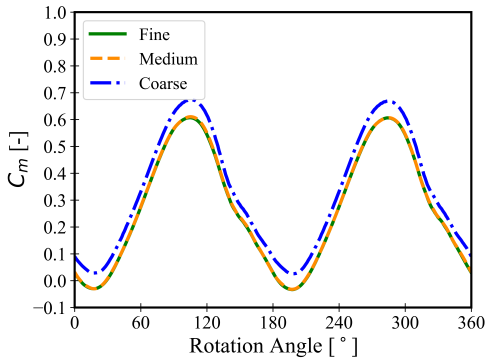



Figure 3: Grid Independence Test

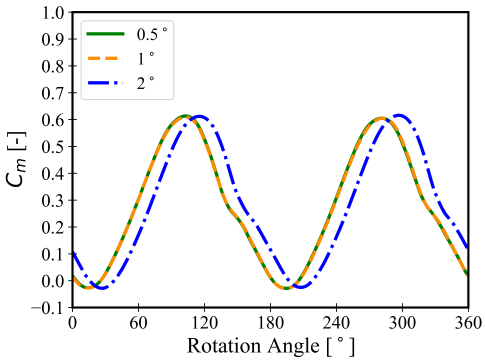



Figure 4: Timestep Independence Test

had a balance between accuracy, and computational costs. Figure 3 denotes the variation of $C_m$ acting on the turbine, as a function of the turbine's rotation angle for three levels of mesh resolution (70000, 130000, and 250000 elements). It is evident from the figure that negligible variation exists among the medium and fine grid resolutions. Further refinement would not affect the results, and hence, all the subsequent simulation results are reported using the medium mesh resolution.

Further, a time-step dependence analysis was done to ensure that the results were independent of the temporal resolution. Just like mesh resolutions, a smaller time step tends to be more accurate but computationally expensive. It is important to employ a time step having a balance between an accurate solution and a low computational cost. Therefore, three time step sizes: 0.5°, 1°, and 2° turbine rotation per time step were taken to investigate the effect of time step size on the solution accuracy. As seen from figure 4, time step sizes smaller than 1° would not affect the solution accuracy but the 2° time step case leads to a phase difference in the results. Hence, all subsequent simulations are done using the time step corresponding to 1° turbine rotation per time step.

For the validation study, the results generated by the numerical model of the current study were compared with the experimental results of Sheldahl et al. [39] and numerical results of Fatahian et al. [32]. The results of the validation study are presented in Figure 5 in the form of plots representing the variation between $Cm$ and $C_p$ respectively with TSR for a conventional Savonius turbine. It is evident from Figure 5 that the results of the present study are in fair agreement with the experimental results and are also much

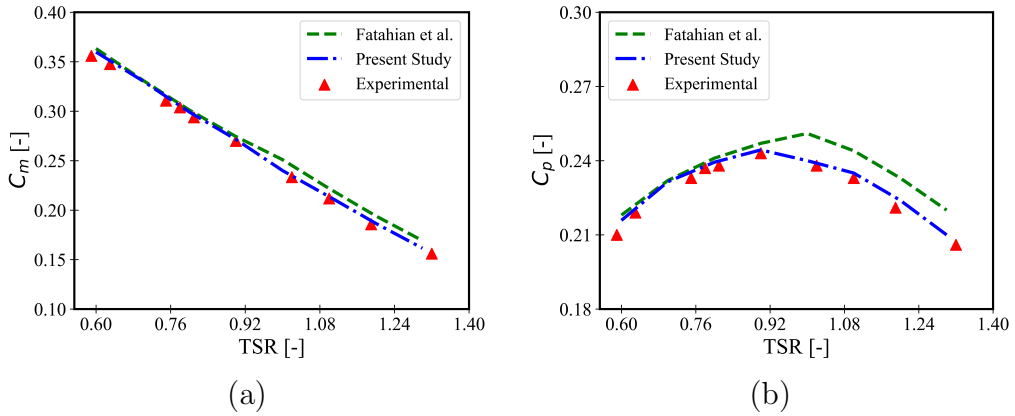



Figure 5: Comparison of the variation (a) $C_m$ and (b) $C_p$ with TSR generated using the current numerical model with the experimental results of Sheldahl et al. [39] and numerical results of Fatahian et al. [32]

closer to it in comparison to the numerical results of Fatahian et al. [32].

The results of these verification and validation tests confirm that the numerical model utilized in this study is in close agreement with experimental observations, and is independent of grid resolution and time step size. The validity of the present CFD model is hence substantiated.

## 3. Optimization Framework

### *3.1. Sample Acquisitions*

The crucial role of sample acquisition in the optimization process cannot be overstated, serving as the fundamental basis for subsequent analyses. In the process of enhancing Savonius turbine performance through the strategic placement of a cylindrical deflector upstream of the blades, the primary goal is to collect pertinent data points that accurately capture the system's behavior. This involves conducting simulations across a range of operating conditions and design parameters. The application of Latin Hypercube Sampling (LHS) ensures a systematic distribution of data points throughout the design space, contributing to a comprehensive representation of the turbine's behavior.

A pivotal precursor to constructing a successful surrogate model is the generation of essential training data. The necessity for an equitable distribution of data points across the entire design space is paramount to guarantee

the precision and dependability of the model. The adoption of Latin Hypercube Sampling (LHS), pioneered by McKay et al. [40], stands out as a widely embraced and effective technique for this purpose. This method meticulously selects data points, optimizing the coverage of the design space and establishing the foundation for developing a robust surrogate model geared towards streamlining the optimization of the system in question.

### *3.2. Surrogate Modeling*

Design optimization problems often grapple with the high computational costs associated with a multitude of simulations [41]. Surrogate models emerge as a cost-effective solution, constructing a response surface from a limited set of simulations to efficiently explore the design space and predict output variables. These models, trained on a subset of simulation data and validated using the rest, enable researchers to simulate complex systems more accurately with reduced computational resources. The versatility, simplicity, and efficiency of various surrogate models make them suitable for such investigations.

In the optimization context, the demand for a substantial number of computer simulations can be prohibitively expensive due to the need for significant computational resources [24]. Surrogate models play a pivotal role by acting as efficient approximations of the actual system behavior, streamlining the optimization process. These models use regression methods to infer response values for unknown design points based on known sample points, constructing an approximate representation with satisfactory prediction and fitting accuracy [24, 42, 31]. Unlike exclusive reliance on a single surrogate model, the present investigation adopts a comprehensive approach, utilizing various surrogate models to address the intricacies of significant nonlinear interactions between variables. This broader perspective enhances the adaptability and applicability of the optimization process.

### *3.3. Quantum-Based Salp Swarm Optimization Algorithm*

To obtain the intended optimized design parameters, one must either maximize or minimize the objective function whose distribution across the design space is given by the most accurate surrogate model. To carry out this process, the present study employs meta-heuristic optimization algorithms. The inability of traditional algorithms to handle complicated problems and

their slow convergence have given rise to quantum-inspired methods. A viable approach is the Quantum-Based Salp Swarm Optimization (QSSO) Algorithm, which takes inspiration from both the collective behavior of salp swarms and quantum mechanics concepts.

Salps, belonging to the Salpidae family, feature transparent barrel-shaped bodies akin to jellyfish, propelling themselves forward through water pumping [43]. Despite their intriguing biological characteristics, research on salps is in its early stages, hindered by challenges in accessing their natural habitats and maintaining them in labs. Notably, salps exhibit a swarming behavior, forming chains in deep oceans. Although the purpose of this behavior is unclear, researchers speculate it enhances locomotion and foraging efficiency. Mirjalili et al. [44] introduced the Salp Swarm Optimization (SSO) algorithm, drawing inspiration from the collective behavior of salps. Mimicking social interactions and movement dynamics observed in salp colonies, SSO is a metaheuristic optimization algorithm. Employing both exploration and exploitation strategies, SSO navigates solution spaces, refining promising regions. However, traditional SSO may face challenges in terms of convergence speed and exploration efficiency, motivating ongoing research to enhance its performance.

In addition to battling issues with time and space, the traditional SSO algorithm requires accuracy while locating solutions under nonlinear restrictions. Prioritizing efficiency improvement is crucial for addressing real-world problems. However, due to the restrictions inherent in biological algorithms and the lack of robust self-search conditions, numerous algorithms tend to encounter early convergence, which is also seen in the SSO Algorithm. Compared to other swarm intelligence algorithms, the SSO algorithm shows high competitiveness, a high value of accuracy, and practicability [45]. In order to prevent the algorithm from falling into the local optimal solution Faris et al. [46] proposed the binary salp swarm algorithm to enhance the exploration, and utilize the transfer functions and crossover operator to tackle Feature selection problems. In their published research, Sahu et al. [47] concentrated on introducing a type-II fuzzy PID controller aimed at maintaining both frequency and tie-line power at their nominal values amidst various uncertainties. To determine optimal gain values, they applied a meta-heuristic improved Salp Swarm Optimization (I-SSO) algorithm. The study demonstrated that the I-SSO algorithm outperformed other meta-heuristic algorithms, as evidenced by superior dynamic response results.

The present work uses the Quantum-based Salp Swarm Optimization

(QSSO) algorithm to determine the best location for a cylindrical deflector near the Savonius turbine. Chen et al. [48] have developed a new technique that smoothly incorporates key notions from quantum mechanics, namely Elite Opposition-based and Wavelet Mutation, into the conventional SSO algorithm. By using quantum-inspired techniques, the QSSO algorithm seeks to improve optimization by facilitating effective exploration of the solution space and convergence towards an ideal solution. The QSSO method has the potential to improve exploration and tackle the problems of premature convergence and solutions locked in local optimum by utilizing the combined abilities of quantum mechanics and swarm intelligence.

**Algorithm 1:** Quantum Salp Swarm Algorithm

```
Set the population size N and max iterations T
Randomly initialize the positions of salps x_i (i = 1, 2, .., N)
  according to ub_j and lb_j
t = 0
Calculate the fitness of each salp and set F as the best search agent
Update the positions of the leader and follower salps by Eq.11
t = t + 1
while t < T do
    if i < N/2 then
        Update the position of leading salp using Eq.13
    else
        Calculate the position of follower salps using reverse elite
          Eq.14
        Compare the reverse elite solution and normal solution,
          update the Follower salp position with best fitness
    end if
    Random individual is selected and it's position is updated using
      wavelet mutation Eq.15
    Correct the each salp that go beyond the upper and lower bounds
    Recalculate the fitness of each salp
    Update the best position of the food source (F)
end while
Next generation until stopping
return F
```

*Working of QSSO algorithm*: Let the position vector of each salp be an $N \times D$ dimension array, where $N$ represents the number of salp search agents and $D$ is the dimension of continuous solution space. This vector can be represented in the form of a matrix, as shown in Eq.10 :

$$X_z^y = \begin{bmatrix} X_1^1 & X_1^2 & \cdots & X_1^D \\ X_2^1 & X_2^2 & \cdots & X_2^D \\ \vdots & \vdots & \cdots & \vdots \\ X_N^1 & X_N^2 & \cdots & X_N^D \end{bmatrix} \tag{10}$$

The following equation is used by the conventional SSO algorithm to update the leader salp's position :

$$X_z^1 = \begin{cases} F_z + c_1((ub_z - lb_z)c_2 + lb_z) & c_3 \geq 0.5 \\ F_z - c_1((ub_z - lb_z)c_2 + lb_z) & c_3 < 0.5 \end{cases} \tag{11}$$

with

$$c_1 = 2e^{-(l/L)^2} \tag{12}$$

Where the position of the first generation leader salp of the population in the $z_{th}$ dimension is given by $X_z^1$, $l$ represents the current iteration of the algorithm and the maximum number of iterations is represented by $L$. In contrast, in the QSSO algorithm, the leading salp position update strategy takes inspiration from the Monte Carlo method which is used in quantum mechanics to convert the state of an individual from a quantum state to a classical state. Therefore, the strategy is described by the following Equation:

$$X_{z,g+1}^1 = \begin{cases} b_{z,g}^1 + c_1(M - X_{z,g}^1).\ln(1/c_2) & c_3 \geq 0.5 \\ b_{z,g}^1 - c_1(M - X_{z,g}^1).\ln(1/c_2) & c_3 < 0.5 \end{cases} \tag{13}$$

where $b_{z,g}^1$ is the global optimum value of the $g_{th}$ generation, $M$ represents the average of local optimum values. The introduction of quantum mechanics effectively improves the mobility of salps. Different algorithms use different approaches to effectively search the solution space for the global optimum. Here, QSSO uses wavelet mutation and reverse elite learning to efficiently reach the global optimum. Reverse elite solution is used to calculate the position of follower salps and can be described by the following equation:

$$X_z^y(elite) = c(ub_z + lb_z) - X_z^y(normal) \tag{14}$$

where $c$ is a random number between 0 and 1, $X_z^y(normal)$ and $X_z^y(elite)$ are the positions of follower salp and their reverse elite solutions, respectively. Fitness values of both are calculated and the best one is chosen for the next generation while preserving the reverse elitism to some predefined criteria. In this way reverse elite strategy provides a more appropriate and robust candidate solution. Subsequently, Wavelet mutation is introduced to maintain population diversity and it works by giving each follower salp of the population a chance to mutate which is controlled by the parameter known as the probability of mutation where a random number is generated between 0 and 1 if it is less or equal to some predefined number and then mutation will take place. If $\overline{X}_z^y(t)$ is the selected salp, it will mutate according to the equation:

$$\overline{X}_z^y(t) = \begin{cases} X_z^y(t) + \sigma \times (ub_z - X_z^y(t)) & \sigma > 0. \\ X_z^y(t) - \sigma \times (X_z^y(t) - lb_z) & \sigma \leq 0 \end{cases} \tag{15}$$

with

$$\sigma = \frac{1}{\sqrt{a}} e^{\frac{-(\frac{x}{a})^2}{2}} \cos(5(\frac{x}{a})) \tag{16}$$

where $a$ is a dilation parameter that changes in each iteration to achieve fine-tuning. This dilation parameter is defined as:

$$a = e^{-\ln g_1 \times (1-\frac{l}{L})^{\xi_{\omega m}} + \ln g_1} \tag{17}$$

Here $\xi_{\omega m}$ is the shape parameter of this function and $g_1$ is the upper limit of dilation parameter $a$. By fine-tuning these two parameters one can get the peak performance out of QSSO. As done in reverse elite strategy, among the fitness of the mutated individual and non-mutated individual, the best one is selected for the next generation. The pseudo-code of the QSSO algorithm is provided in Algorithm 1 and the summary of the proposed optimization framework is given in Figure 6.

## 4. Results and Discussion

### *4.1. Kriging Surrogate Model*

A total of sixty sample points were generated for training the surrogate model, and CFD simulations were performed at a TSR of 0.9. The decision was made in light of the results of a previous study by Fatahian et al. [32],

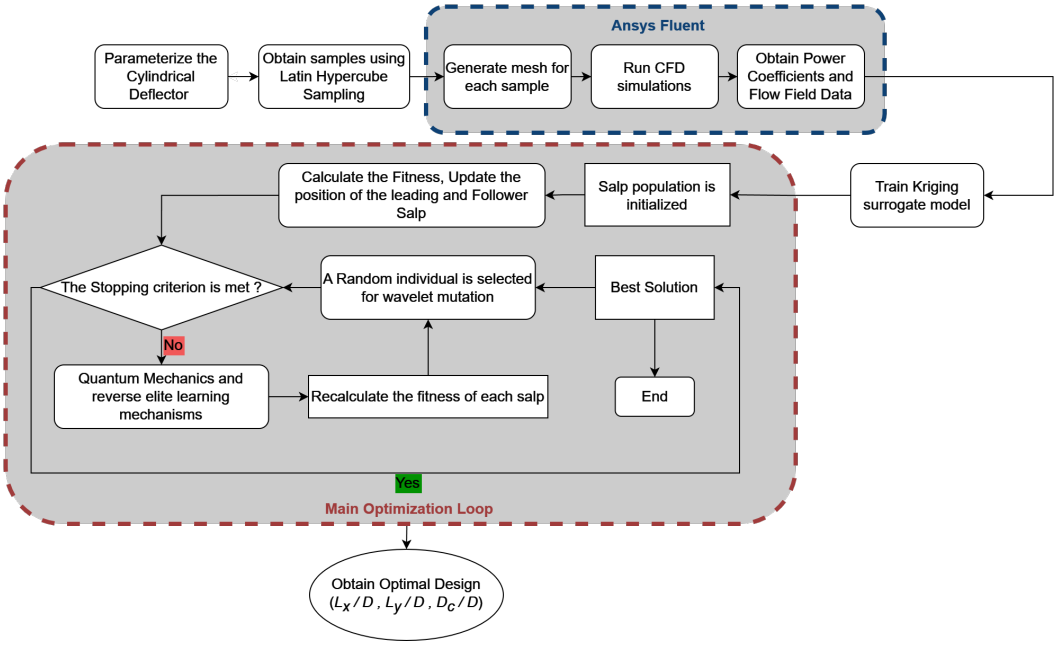



Figure 6: Flowchart of Optimization Framework

which showed peak values of $C_p$ at a TSR of 0.9. Out of the 60 sample points, 45 were selected for the training set, while the others were used for validating the surrogate model. Six different surrogate models were tested on the numerically generated dataset, with the Kriging model displaying superior performance, resulting in an $R^2$ score of 0.943. Three different cases were considered to find how the design parameters affected the objective function. One of the three design parameters ($L_x/D$, $L_y/D$, and $D_c/D$) was held constant in each case. Figure 7 shows the response surfaces produced by the surrogate model for each instance. A strong non-linear association between the objective function and the design parameters $L_x/D$, $L_y/D$ and $D_c/D$ can be seen in Figure 7. According to the response surface analysis, the ideal solutions can be found for $L_x/D$ values of 1.0 to 1.1, $L_y/D$ values of 0.5 to 0.6, and $D_c/D$ values of 0.5 to 0.7. These results offer useful information for maximizing the circular cylinder design parameters by identifying the precise $L_x/D$, $L_y/D$, and $D_c/D$ ranges that greatly increase the Savonius turbine's power coefficient ($C_p$) and provide clarity over the dependence of $C_p$ on the value of the design parameters.

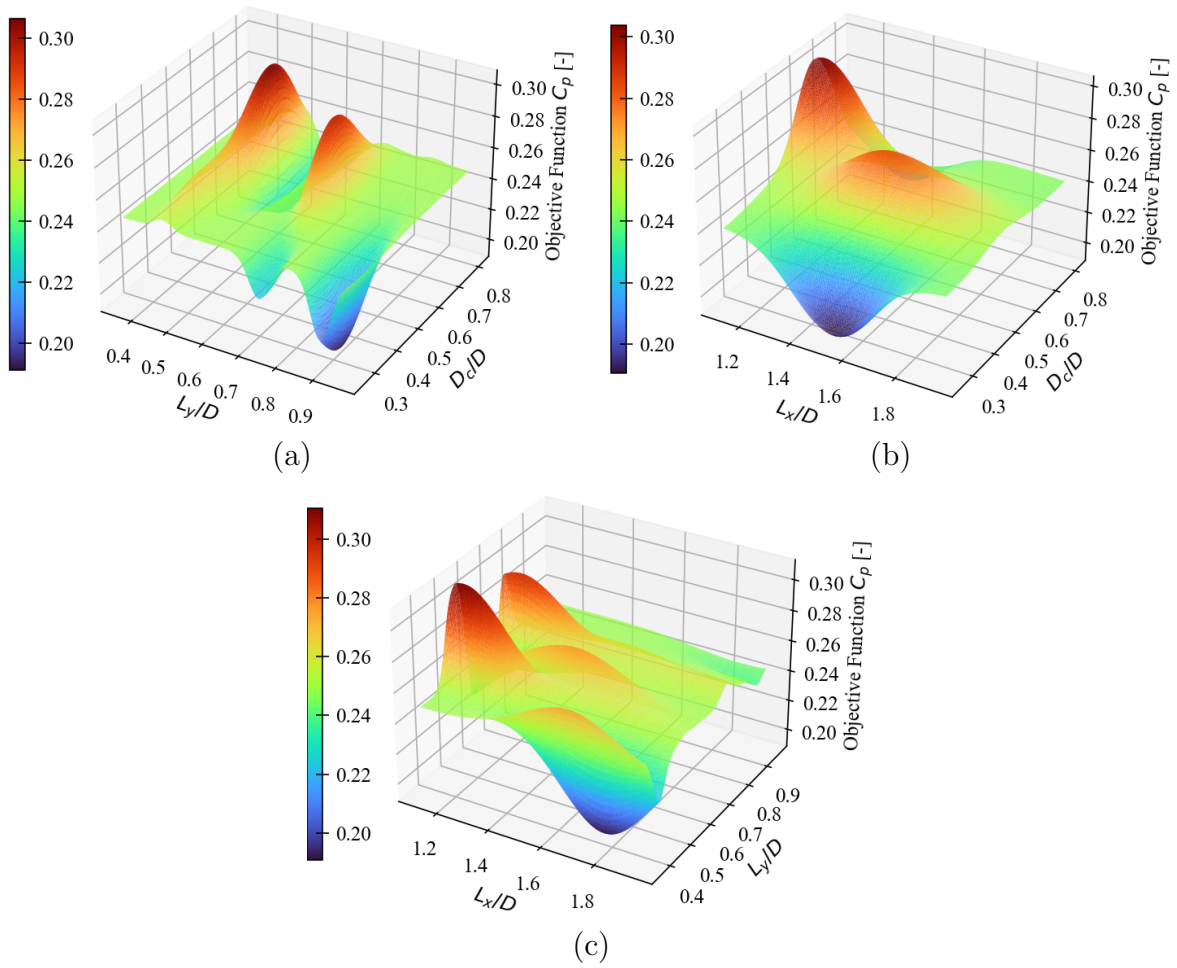



Figure 7: Response surfaces generated using Kriging model

### *4.2. Performance Against Other Surrogate Models*

The performance of the Kriging surrogate model is quantitatively evaluated by comparing its $R^2$ score with that of other models. The following models were employed for the comparative analysis:

- Kriging: Kriging is an interpolating model that involves linearly adding a known function to a stochastic process realization, named after its pioneer Danie G. Krige.
- KPLS: KPLS is a fast, accurate variant of the Kriging model that minimizes hyperparameter estimation through the use of the effective

PLS (Partial Least Squares) method. It builds a PLS-based kernel that is well-known for maximizing the variation between input and output variables, making it perfect for high-dimensional issues [49].

- KPLSK: Based on KPLS, the KPLSK model is built in two primary stages. First, the hyperparameters are estimated using KPLS. The probability function of a typical Kriging is locally optimized using these estimated hyperparameters as a starting point in the second step, which involves transforming them back into the original space. With KPLS, an educated initial guess is made for the hyperparameters. Gradient-based optimization is then applied using traditional Kriging kernels.

- Inverse-Distance Weighting (IDW): A weighted average of the sampling points is used to compute the unknown points in the inverse distance weighting (IDW) model, which is an interpolation technique.

- Radial Basis Function: RBF approximates complex functions with a combination of simpler functions. Previous research has examined how well the Radial Basis Function (RBF) has defined significant nonlinear interactions between variables [24, 50, 42]. Its effectiveness, versatility, ease of use, and simplicity have made it a suitable stand-in model for a variety of research questions.

- Support Vector Machine (SVM): Support Vector Machine (SVM) is typically used for classification tasks. They work very well for high-dimensional data and permit the classification of data that does not have a linear correspondence.

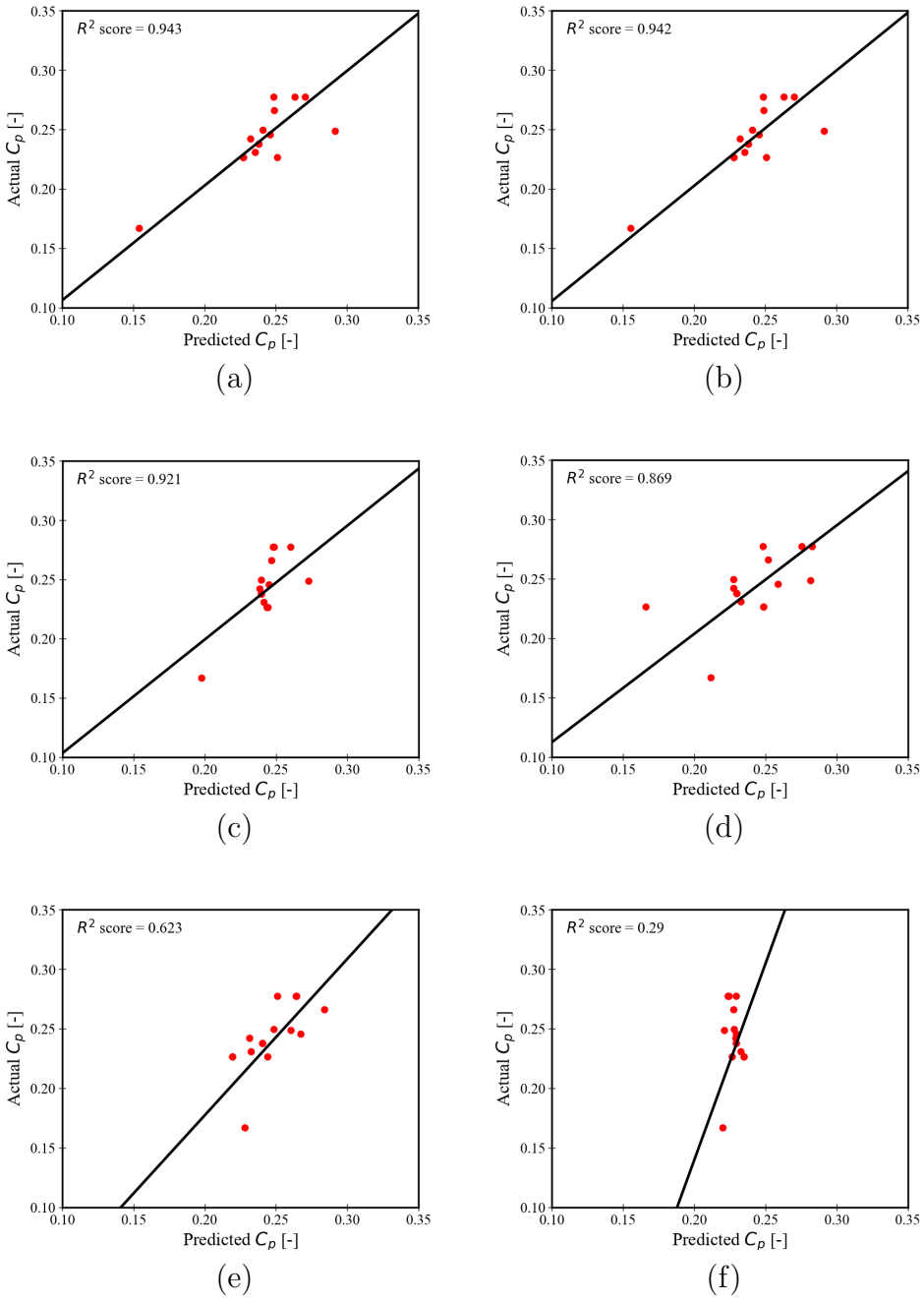



Figure 8: Best Fit line using (a) Kriging, (b) KPLSK, (c) KPLS, (d) IDW, (e) RBF, and (f) SVM surrogate model

Figure 8 shows the comparison of the different surrogate models at the 15 validation sample points. It can be observed that the KPLSK model trails closely behind the Kriging model, which has the greatest $R^2$ score of 0.943 and the optimum best-fit line. Furthermore, as the scatter plot illustrates, the KPLS and IDW models do not correlate as well as the Kriging and KPLSK models, and the SVM and RBF models have a large deviation from the actual value in their results. Therefore, the Kriging model is chosen for the optimization of the design parameters. The above models are implemented using the open-source Surrogate Modeling Toolbox Python package [51].

### *4.3. QSSO Algorithm Hyper-parameters*

An in-house code for the QSSO algorithm was employed to maximize the objective function, i.e. $C_p$. The influence of the dilation parameter used in the wavelet mutation of the QSSO algorithm is presented in Figure 9(a). This parameter, as the equation shows, is made up of two hyper-parameters: $g_1$, which is the dilation parameter's maximum value, and $\xi_{\omega m}$, the shape parameter. The convergence of the optimization algorithm was assessed for several values of (g1, $\xi_{\omega m}$), namely $(0.01, 500)$, $(0.1, 250)$, $(1, 100)$, $(50, 50)$, $(100, 1)$, $(250, 0.1)$ and $(500, 0.01)$. It is evident from the findings shown in Figure 9(a) that QSSO performs best when $g_1$ and $\xi_{\omega m}$ are set to 500 and 0.01 respectively. A comparison of this setup to other combinations of $g_1$ and $\xi_{\omega m}$ values reflects that the algorithm converges faster and yields the best possible solution.

### *4.4. Performance Against Other Algorithms*

The results obtained by the QSSO algorithm are quantitatively compared against other optimization algorithms to objectively assess its performance. For optimal computational efficiency, the population size or in other terms the number of search agents was set to 50. The following meta-heuristic algorithms were used for comparison:

- Particle Swarm Optimisation (PSO): PSO is a method that utilizes the swarm intelligence of bird flocks to optimize systems. It is inspired by the social behavior of fish and birds. Its effectiveness and simplicity have made it a useful tool for resolving optimization issues [52].

- Quantum-Based Particle Swarm Optimization (QPSO): It is a variation of PSO that combines trajectory analysis from the original PSO with probabilistic components influenced by quantum mechanics [53].

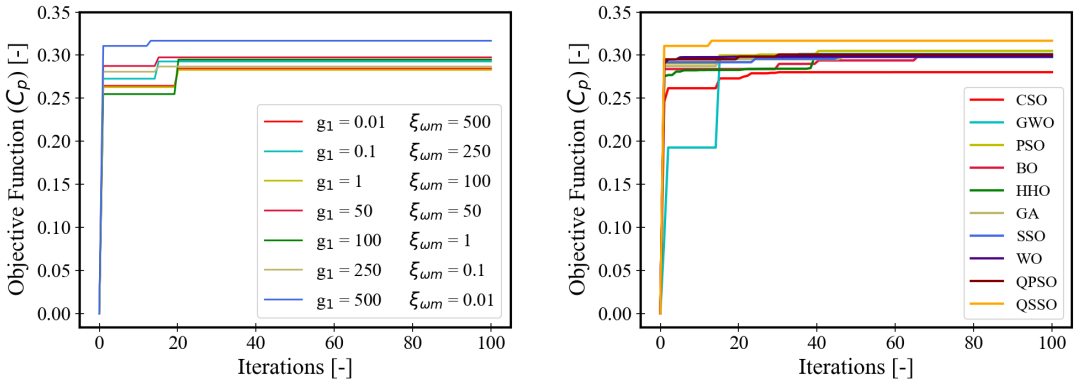



Figure 9: (a) Performance of QSSO algorithm at different values of $g_1$ and $\xi_{\omega m}$ (b) Performance of other metaheuristic algorithms compared to QSSO algorithm

- Harris' Hawk Optimizations (HHO): HHO is a novel population-based, nature-inspired optimization algorithm. Its basis is found in the way Harris's hawks hunt together, with multiple hawks working together to approach prey from various angles [54].

- Whale Optimization (WO): Similar to HHO, WO is a novel swarm-based optimization technique that addresses complex optimization problems by simulating coordinated efforts and natural instincts inspired by humpback whale hunting techniques [54].

- Bat Optimization (BO): It is a novel optimization technique derived from nature that mimics the echolocation behavior of bats to effectively explore and identify optimal solutions in search spaces [55].

- Grey Wolf Optimization (GWO): GWO is an optimization algorithm influenced by nature. It draws influence from the hunting habits and social hierarchy of grey wolves [56].

- Cuckoo Search Optimization (CSO): CSO is a nature-based algorithm that is inspired by cuckoo bird breeding behavior. It uses a population-based method to optimize problems, focusing on exploration-exploitation trade-offs [42].

- Salp Swarm Optimization (SSO): SSO algorithm takes its cues from the salp's collective behavior. Through both exploration and exploitation tactics, SSO navigates solution spaces, honing down on potential regions while mimicking the social interactions and movement patterns seen in salp colonies [44].

- Genetic Algorithm (GA): GA is an evolutionary-based metaheuristic algorithm, and it derives inspiration from the evolution of species. With the use of mutation and crossover techniques, it achieves the optimal solution.

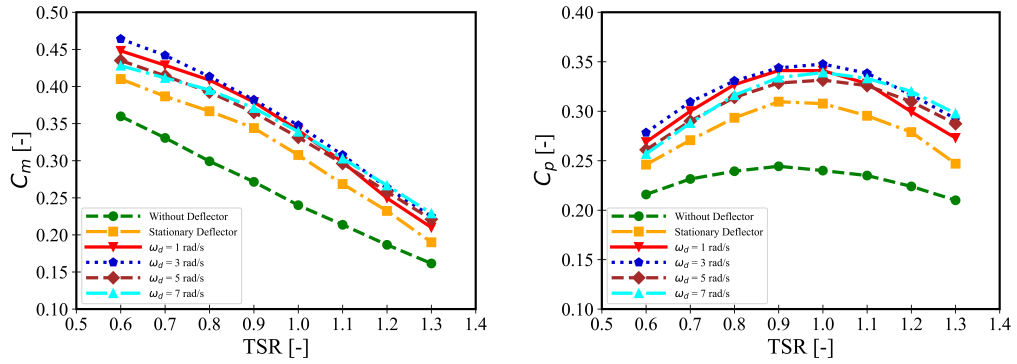
As evident in Figure 9(b), the QSSO algorithm demonstrates the highest percentage of improvement in the objective function, closely followed by SSO. The exploration capabilities of the QSSO, which allow it to produce new solutions and successfully escape local optima, are responsible for its superior performance. The exploration capacity of QSSO is further boosted by the use of reverse elite learning and wavelet mutations. On the other hand, even with high rates of convergence, QPSO and GWO fall short of SSO and QSSO in terms of reaching the best results; this is also the case for GA. Depending on the state-of-the-art solutions at the moment, HHO and PSO are vulnerable to trapping in local optima. Because they rely on adaptive mobility and random search, respectively, BO and WO do not have as great exploratory skills in comparison to the other investigated algorithms. CSO struggles to get strong results compared to QSSO, possibly because it relies on cuckoo search processes that can be problematic in some optimization settings, restricting its ability to escape local optima.

### *4.5. Torque and Power Analysis*

Through an extensive optimization study, utilizing several state-of-the-art algorithms, the optimum geometric parameters of the turbine-deflector system were calculated. As presented in subsection 4.4, the system parameters provided by the QSSO algorithm gave the maximum improvement in the value of $C_m$ and $C_p$ in comparison to the baseline turbine without an upstream deflector. For the optimum configuration, the system parameters are $L_x/D = 1.07$, $L_y/D = 0.54$, and $D_c/D = 0.64$ which leads to an improvement of 26.64% in the value of $C_p$ over the baseline case. From the response surfaces presented in Figure 7, it can be observed that the system is highly sensitive to the value of its design parameters. An increase in the

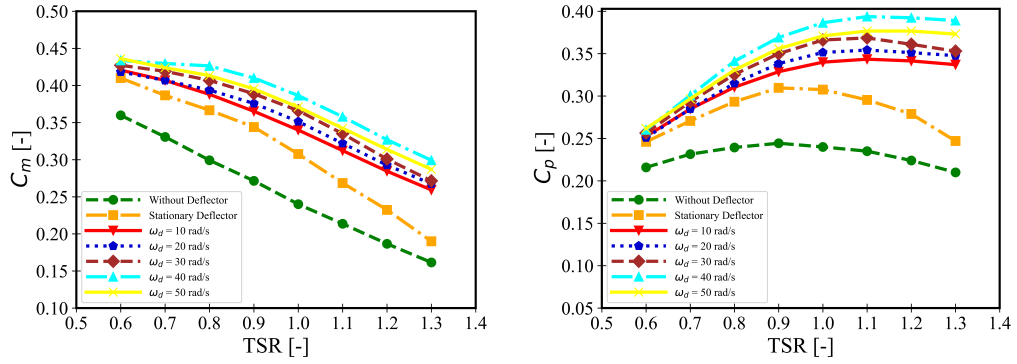
cylinder diameter above its optimum value leads to a sharp decrement in $C_p$ as although a larger deflector minimizes the negative torque acting on the returning blade, such benefit is overshadowed by the flow disturbance caused by the deflector which hinders the driving torque acting on the turbine blade. Also, a larger deflector can block a part of the incoming flow striking the advancing blade which in turn further reduces the value of $C_p$. Moreover, a smaller deflector can only improve the turbine performance if it is placed suitably in the upstream direction of the returning blade but if it blocks the advancing blade then this would also lead to a diminished system performance. Similar to the effect of deflector diameter, the performance of the system diminishes when the deflector's x and y position from the turbine is outside of the optimum range. When the deflector is placed far away from the turbine in the upstream direction it hinders its rotation by minimizing the energy of the incoming flow due to its wake and also causes flow instabilities which prevents the turbine from utilizing the maximum potential from the incoming flow.

After optimizing the geometric parameters for the turbine-deflector system, the effect of rotation of the deflector was analyzed and compared with the baseline turbine and the optimized stationary deflector-turbine system. For the present study, the angular velocity ($\omega_d$) of the deflector ranged from 1 $rad/s$ to 50 $rad/s$ and this range was further divided into two segments, the low and high angular velocity regions. In the low angular velocity region, $\omega_d$ was assigned the values 1, 3, 5, and 7 $rad/s$, and in the high angular velocity region, $\omega_d$ was assigned the values 10, 20, 30, 40, and 50 $rad/s$. The sense of rotation of the deflector was taken similar to that of the turbine, i.e. in the clockwise direction. The effect of deflector rotation has been presented as a $C_m$ and $C_p$ vs TSR plot in Figures 10 and 11 for the low and high angular velocity regions.




(a) (b)

Figure 10: Variation of (a) $C_m$ and (b) $C_p$ with TSR for the without deflector case, optimized stationary deflector case, and rotating deflector case with $\omega_d$ between 1 to 7 $rad/s$




(a) (b)

Figure 11: Variation of (a) $C_m$ and (b) $C_p$ with TSR for the without deflector case, optimized stationary deflector case, and rotating deflector case with $\omega_d$ between 10 to 50 $rad/s$

From Figure 10 it can be observed that all the cases with rotational velocity in the low angular velocity region provide an improvement in $C_m$ and $C_p$ at all TSR values in comparison to the stationary and the without deflector cases. Among the low rotational velocity cases, the $\omega_d = 3$ $rad/s$ provides the largest increment in $C_m$ and $C_p$ at all TSR values. Although the $\omega_d = 7$ $rad/s$ case has a lower $C_m$ and $C_p$ for the majority of the TSR

range, its value becomes comparable to the $\omega_d = 3\ rad/s$ case at TSR value above 1.1. For the high rotational velocity region, Figure 11 shows that these cases also have a higher $C_m$ and $C_p$ at all TSR when compared with the stationary and without deflector cases. The $\omega_d = 40\ rad/s$ case shows the highest improvement in $C_m$ and $C_p$ values at all TSR in comparison to other $\omega_d$ values in this region. Furthermore, at TSR values below 0.9, the low-velocity region cases show superior performance while for TSR above 0.9, the high-velocity cases edge over the low-velocity cases.

The variation in the instantaneous value of $C_m$ for the without deflector, stationary deflector, $\omega_d = 3\ rad/s$, and $\omega_d = 40\ rad/s$ cases at TSR values of 0.6, 0.9, and 1.3 are presented in the form of polar plots in Figure 12. A phase shift in the $C_m$ behavior can be observed at different TSR values and also there is a slight phase shift in $C_m$ among the four turbine-deflector configurations for the same TSR values. For all three TSR values, the $\omega_d = 40\ rad/s$ has a higher peak $C_m$ value followed by the $\omega_d = 3\ rad/s$ case, then by the stationary deflector case, and the least value is for the without deflector case. Also, the peak value of $C_m$ is reached when the turbine is at approximately 120° Azimuth angle.

At TSR 0.9, the without deflector case faces negative or net retarding torque for a small Azimuth angle range while such effect is mitigated with the use of stationary as well as rotating deflectors. Furthermore, for TSR 1.3, only the $\omega_d = 40\ rad/s$ case faces a positive torque throughout the rotational cycle of the turbine. For TSR 0.6 and TSR 1.3, the torque profile at the peak values of $C_m$ is broader for the without deflector case than it is for the stationary and rotating deflector cases, while this effect is opposite in the case of TSR 0.9.

At TSR 0.6, the $\omega_d = 3\ rad/s$ case and the without deflector case have a different $C_m$ value at the end of one rotational cycle than when it was at the start of that cycle. Similarly, for TSR 1.3, all four cases have different start and end $C_m$ values. This shows that the frequency of torque variation changes with TSR and turbine-deflector configuration.

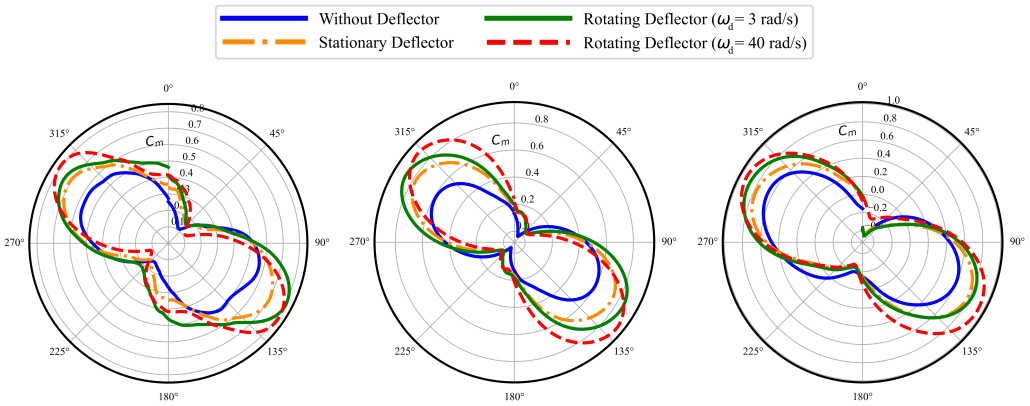



Figure 12: Polar plots representing the variation in $C_m$ over one rotational cycle of the turbine at TSR values of (a) 0.6, (b) 0.9, and (c) 1.3

### *4.6. Flow Investigation*

To understand the flow dynamics responsible for improvements in turbine performance due to the use of stationary and rotating upstream deflectors, a detailed flow analysis is presented. At first, the distribution of normalized velocity for the without deflector, stationary deflector, and rotating deflector ($\omega_d = 40\ rad/s$) cases at different Azimuth angles ($\theta$) is presented in Figure 13. In all three cases at $\theta = 0^o$, a high-velocity region can be observed at the tip of the advancing blade. This is due to the combined effect of the incoming flow and the clockwise rotation of the turbine. Furthermore, when the turbine is at $\theta = 60^o$, a high-velocity region develops near the mid of the retarding blade at the windward side. The incoming flow gets accelerated due to the convexity of the blade and also the clockwise rotation of the turbine adds to this effect. Similarly, at $\theta = 120^o$, a high-velocity zone develops near the middle of the advancing blade at the leeward side. Due to the presence of a deflector in Figure 13(b) and Figure 13(c), an obstruction to the flow striking the retarding blade is created which reduces the impact of the retarding torque. Furthermore, in the wake of the rotating deflector, the flow is deflected even further downwards away from the turbine's retarding blade which explains its maximum performance.

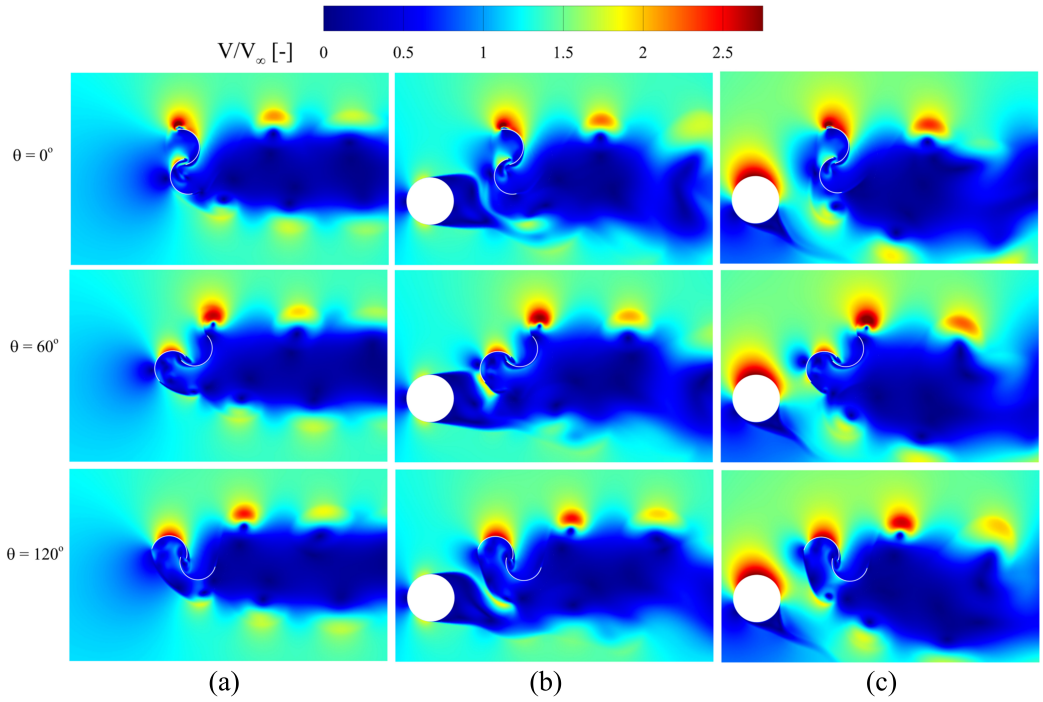



Figure 13: Normalized velocity distribution at different Azimuth angles for (a) without deflector, (b) stationary deflector, and (c) rotating deflector ($\omega_d = 40\ rad/s$) cases

To understand the pressure variation around the system, the distribution of pressure coefficient ($CoP = P/0.5^*\rho^*V_\infty^2$) around the without deflector, stationary deflector, and rotating deflector ($\omega_d = 40\ rad/s$) cases at different Azimuth angles is presented in Figure 14. For the advancing blade of the turbine, a high-pressure region around the blade portion facing the windward side and a low-pressure region at the leeward side can be observed. This is caused by the sharp curvature change along the blade profile due to which there is an airflow separation and a loss in pressure which contributes to the pressure or form drag acting on the advancing blade, aiding it to drive in the clockwise direction. A similar effect occurs for the retarding blade, but the moment caused by the acting forces tend to drive it in the anticlockwise direction and thus oppose the rotation of the turbine. Due to the use of stationary and rotating deflectors, it can be clearly observed from Figure 14 that the high-pressure region around the windward side of the retarding blade is significantly smaller than it is for the without deflector case at all Azimuth angles. This in turn contributes to the higher $C_m$ and $C_p$ with the

use of deflectors. Furthermore, on comparing the stationary and rotating deflector case, a suction pressure region can also be observed alongside the high-pressure region at the windward side of the retarding blade with the use of rotating deflectors. This region develops due to the clockwise rotation of the deflector which increases the velocity of the air at the topmost point of the deflector which in turn leads to a decrease in the air pressure. Due to this suction region, the effect of the high-pressure region near retarding blade is further reduced and ultimately contributing towards an even higher power output using rotating deflectors.

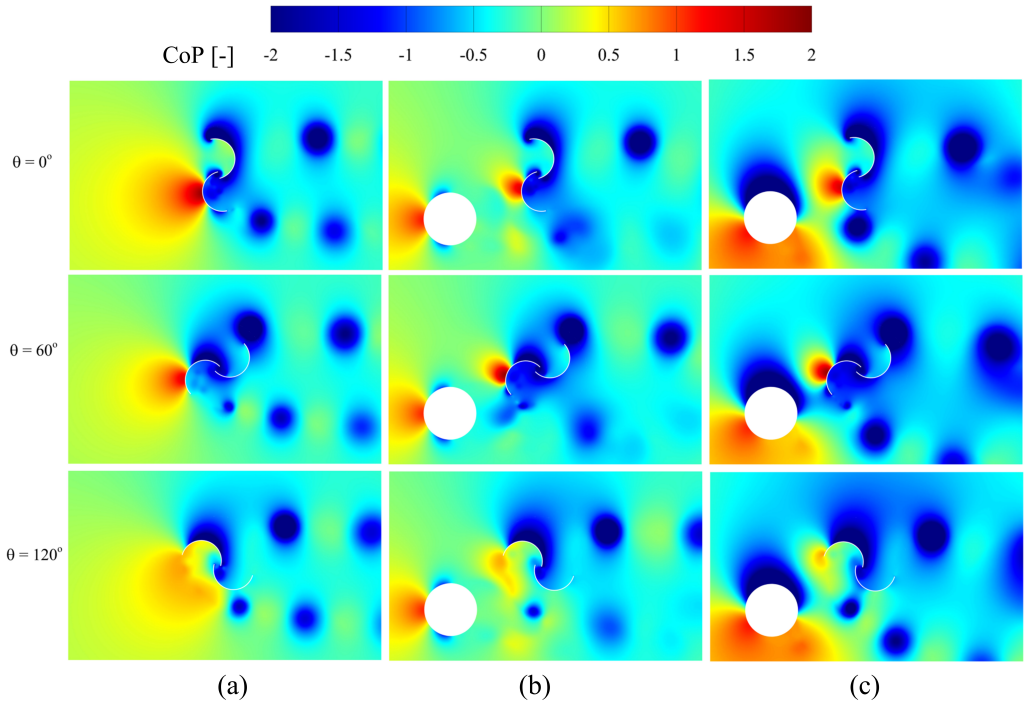



Figure 14: Pressure Coefficient (CoP) distribution at different Azimuth angles for (a) without deflector, (b) stationary deflector, and (c) rotating deflector ($\omega_d = 40\ rad/s$) cases

Next, to get clarity over the vortex interactions and flow dynamics, normalized Z-Vorticity distribution is presented on Line-Integral Convolution (LIC) plots for the without deflector, stationary deflector, and rotating deflector ($\omega = 40\ rad/s$) cases at different Azimuth angles in Figure 15. These LIC plots can be interpreted as space-filling streamline plots. For the without

deflector case, when the turbine rotates from $0^o$ to $60^o$, a clockwise vortex is formed at the tip of the advancing blade which gets shed when the turbine rotates to $120^o$ Azimuth angle. Similarly, at the tip of the retarding blade, an anticlockwise vortex is formed and then it gets shed due to the rotation of the blades. After getting shed from the turbine, these vortices get convected downstream.

For the stationary deflector case, a pair of counter-rotating vortices are formed behind the deflector and its shedding into a Karman vortex street is prevented due to the presence of the Savonius turbine in the downstream direction. Furthermore, the vortices in the deflector wake interact with the anti-clockwise vortex generated by the retarding blade. The clockwise vortex from the upper surface of the deflector impinges with the anti-clockwise vortex from the retarding blade and forms a vortex pair which gets convected downstream. In comparison to the stationary deflector case, the interaction between the vortices generated by the deflector and the turbine is comparatively less. This is due to the high rotational velocity of the deflector which shifts the Kutta condition near the lower end of the deflector facing the leeward side. Moreover, the rotational velocity of the deflector also deflects the vortices from the retarding blade in the downward direction. As evident in Figure 15(c), the size of the deflector wake and the recirculation zone is also significantly reduced. This reduction in wake size of the deflector, shift in its Kutta condition downwards, and the deflection of incoming flow towards the retarding blade on the downward side is majorly responsible for the high power output of the rotating deflector case in comparison to the other two cases.

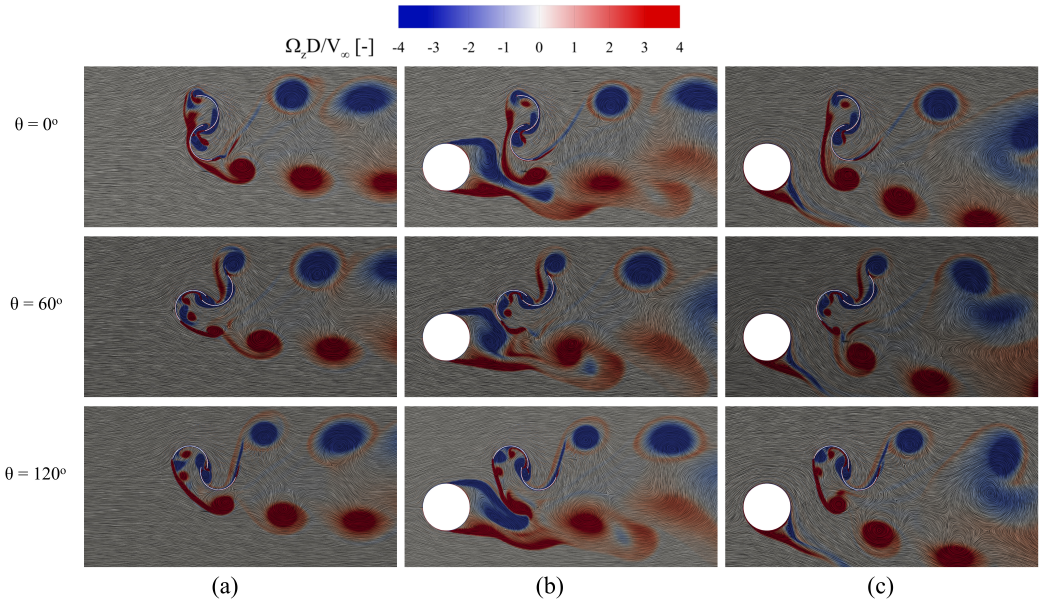
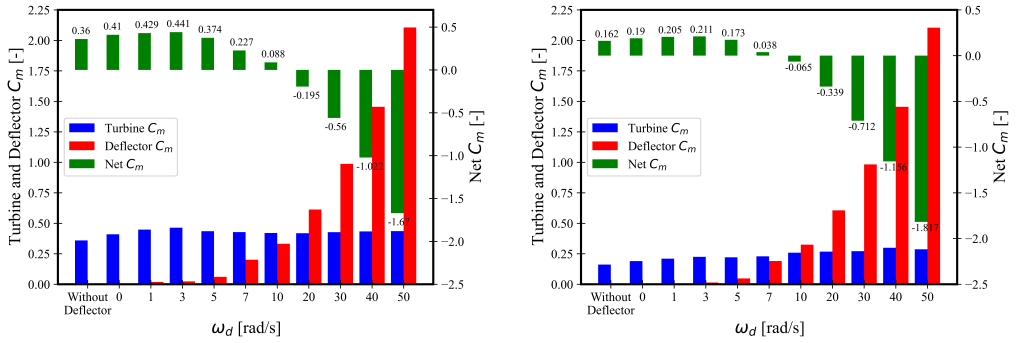



Figure 15: Line-Integral Convolution plots illustrating the normalized Z-Vorticity distribution at different Azimuth angles for (a) without deflector, (b) stationary deflector, and (c) rotating deflector ($\omega_d = 40\ rad/s$) cases

### *4.7. Energy Consumption*

All the results presented until now have shown the benefit of using rotating deflectors over stationary deflectors. But it must be noted that for rotating the deflectors, external work is required which must be taken into account while calculating the net torque output from the turbine-deflector system. To quantify this, the net $C_m$ values at different TSRs have been presented in Figure 16. At TSR 0.6, it can be observed from Figure 16(a) that only for $\omega_d < 20\ rad/s$, the system shows a positive torque output, and for the rest of the cases, external work must be done to drive the system. Furthermore, at $\omega_d = 3\ rad/s$, the rotating deflector-turbine system shows the maximum net $C_m$ output which is 7.56% higher than the stationary deflector case and 22.5% higher than the without deflector case. At TSR 1.3, Figure 16(b) shows that positive torque output is achieved when $\omega_d < 10\ rad/s$. Similar to the TSR 0.6 case, peak $C_m$ value is achieved for $\omega_d = 3\ rad/s$ rotating deflector case and its value is 9.95% higher than the stationary deflector case and 30.25% higher than the without deflector case.




(a) (b)

Figure 16: Net $C_m$ output at TSR (a) 0.6 and (b) 1.3

## 5. Conclusion

Through this study, a robust and efficient design optimization framework has been proposed to improve the performance of a Savonius wind turbine equipped with a cylindrical deflector. A multi-faceted approach involving CFD simulations of the turbine-deflector configuration, surrogate modeling, and optimization using Quantum-inspired metaheuristic algorithms was used. Parameters considered for the optimization study were the horizontal and vertical distances of the center of the cylindrical deflector from the turbine shaft and the diameter of the deflector. After parameterizing the turbine-deflector system, sixty distinct design points were generated through Latin Hypercube Sampling, and data for training the surrogate model was gathered using URANS simulations. Subsequently, six different surrogate models were evaluated based on their accuracy in approximating the results of CFD simulations and the Kriging surrogate model was found to be the best representation of the system. Next, on the response surface generated by the Kriging model, the Quantum-based Salp Swarm Algorithm (QSSO) was used to compute the system parameters corresponding to the global maxima of the objective function, i.e. $C_p$. Additionally, the performance of nine other state-of-the-art metaheuristic algorithms was extensively compared with the QSSO algorithm. The QSSO algorithm was observed to converge much faster than all other investigated algorithms, while also escaping the local maxima and reaching the global maxima.

Upon employing the QSSO algorithm, it was found that design parameters having values, $L_x/D = 1.07$, $L_y/D = 0.54$, and $D_c/D = 0.64$ correspond

to the optimal configuration for the stationary deflector-turbine system. Using this configuration, the value $C_p$ improved from 0.244 to 0.309, an improvement of 26.64% in comparison to the baseline turbine without any deflector at a TSR of 0.9. After optimizing the geometric parameters of the system and addressing the shortcomings of the stationary deflector, the effect of deflector rotation on the system performance was evaluated. Deflectors with angular velocity ($\omega_d$) ranging from 1 to 50 $rad/s$ were studied. It was found that for $\omega_d = 3\ rad/s$ and 40 $rad/s$, the system gave improvements in $C_p$ over approximately the entire TSR range evaluated in comparison to the without deflector and the optimized stationary deflector case. Using a deflector with $\omega_d = 3\ rad/s$ gave a $Cp$ value of 0.344, an improvement of 40.98% and 11.33% compared to the without deflector and optimized stationary deflector case. Similarly, using a deflector with $\omega_d = 40\ rad/s$ gave a $Cp$ value of 0.369, an improvement of 51.23% and 19.42% compared to the without deflector and optimized stationary deflector case. Apart from computing the increment in power and torque output of the turbine using rotating deflectors, the net torque output of the overall system was also calculated. Based on the results, the $\omega_d = 3\ rad/s$ case showed maximum net torque output at TSR 0.6 and 1.3, while the high angular velocity cases showed negative net torque output at both the evaluated TSRs.

Besides its primary utilization in optimizing design parameters for the turbine-deflector system, the framework introduced demonstrates a promising potential for wider application in optimizing diverse aerodynamic components utilized across wind energy, aerospace, and automotive sectors. Given the foundational principles and methodologies integrated into the framework, it is reasonable to infer that its relevance extends beyond the specific focus of this study.

## CRediT authorship contribution statement

**Paras Singh:** Conceptualization, Methodology, Software, Validation, Formal analysis, Data Curation, Writing - Original Draft, Visualization. **Vishal Jaiswal:** Conceptualization, Methodology, Software, Validation, Formal analysis, Data Curation, Writing - Original Draft, Visualization. **Subhrajit Roy:** Methodology, Validation, Formal analysis, Data Curation, Writing - Original Draft, Visualization. **Aryan Tyagi:** Conceptualization, Software, Formal analysis, Writing - Original Draft. **Gaurav Kumar:** Writing - Review & Editing, Supervision. **Raj Kumar Singh:** Writing - Review

& Editing, Supervision, Project administration.

## Declaration of competing interest

The authors declare that they have no conflict of interest and no funding was received for conducting this study.

## Data availability

The source code developed for this work, the setup, and the scripts required to run the optimizations are available at
*https://github.com/VizArcher/Quantum-Based-Metaheuristics*

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SHORT COMMUNICATION

# Recommendation Framework for Products Using Optimization Algorithms

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**Abstract** The implementation of multi-criteria decision-making (MCDM) methodologies has been observed to be on the rise in the context of product recommendation decisions, which generally involve the consideration of multiple factors. The objective of this research is to showcase the execution of a new approach centered on PROMETHEE-I MCDM methodologies as the fundamental component of a Decision Support System for consumers. The proposed system recommends the most optimal choices from a provided range of alternatives. Despite its significance, relatively little research has been done on the topic of ranking products based on online product ratings and consumer preferences. The present study puts forth optimization techniques to rank products through the utilization of multi-attribute online ratings. Our study presents a new approach for recommending optimal alternatives through a mobile recommendation-ranking system-based (MCDM) method. The study utilized the PROMETHEE-I methodology to effectively rank the alternatives and address the optimal mobile recommendation issue. A case study illustrating the proposed methodology for selecting a mobile phone. This decision-making system may show to be the best long-term solution for e-commerce sites and websites due to its superior product comparison abilities and capacity to provide a recommendation to the user as a final ranking of alternatives.

**Keywords** MCDM · PROMETHEE-I · Recommendation system · Criteria · Alternatives

## Introduction

Multi-Criteria Decision Making (MCDM), a branch of operations research, deals with the process of making decisions based on multiple criteria. The goal of MCDM is to generate a solution that satisfies all stakeholders and requires consensus. MCDM has the potential to improve the process of engineering decision-making, starting from the conceptualization phase and continuing through to production. It is used in recommender systems a type of technology that aids individuals in a community to identify relevant products or services that match their preferences and are expected to be attractive to them. The present study introduces a methodology based on PROMETHEE-I, which involves a systematic process of identifying the optimal criteria for each alternative and subsequently assessing the preference indices for these selected criteria exclusively. The methodology has been tailored to minimize the estimation of preference indices to a significant degree and is the application of sentiment analysis.

At the start of feature extraction, we assess user satisfaction with product attributes. We collect detailed product feature data. Mobile phone rankings use PROMETHEE-I. To verify framework dependability and efficacy, a sensitivity analysis is performed at the conclusion. Each phase involves these steps: We start with web data on mobile brand qualities like battery life, storage capacity, cost-effectiveness, and user ratings. The present study employed a methodology to evaluate and choose the optimal smartphone model, utilizing

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a performance-based framework derived from Amazon's[1] feature rating system.

*Illustrative Example 1* We collect five mobile brands as different alternatives: "Samsung Galaxy ($\boldsymbol{Al_1}$) ", "Google—Pixel 3a. ($\boldsymbol{Al_2}$)", "Xiaomi Redmi" ($\boldsymbol{Al_3}$), "Moto G7 ($\boldsymbol{Al_4}$)" and "LG G8 ThinQ ($\boldsymbol{Al_5}$)". We gather brand-specific features for each mobile brand from online sources. Eight criteria are denoted by $C_i$ as follows: Battery Life (***C1***), Value for money (***C2***), Face recognition (***C3***), Fingerprint reader (***C4***), Easy to use (***C5***), Screen Quality (***C6***), Camera quality (***C7***), and Customer reviews (***C8***). All criteria are beneficial only Criteria 2 is non-beneficial. Then we create the decision matrix with these five alternatives and eight criteria and apply the PROMETHEE-I method as shown in Algorithm 1.

Algorithm 1: Rank the alternatives using the PROMETHEE-I method.

**Algorithm 1** Rank the alternatives using the PROMETHEE-I method

**1:** Determine the deviations based on pairwise comparisons which $d_i(a,b)$ denote the difference between the evaluation of a and b on each criterion. $d_i(a,b) = g_j(a) - g_j(b)$

**2:** Calculate the Preference function $P_j(a,b) = F_j[d_i(a,b)] \; \forall \, j = 1,.....k$

**3:** Formulation of a Global Preference Index $\pi(a,b)$ . $\pi(a,b) = \sum_{j=1}^{k} P_j(a,b) w_j \;\; \forall \; a,b \in A$

Where $0 \le \pi(a,b) \le 1$

**4**: Take $w_i = 0.125$ for all the criteria.

**5:** Calculation of PROMETHEE I partial positive and negative ranking.

$$\phi^{+}(a) = \frac{1}{(n-1)} \sum_{x \in A} \pi(a,x) \quad \text{and} \quad \phi^{-}(a) = \frac{1}{(n-1)} \sum_{x \in A} \pi(a,x)$$

**6:** Estimate net outranking rate flow.

$$\phi(a) = \phi^{+}(a) - \phi^{-}(a)$$

**7:** Rank the alternatives.

The sensitivity coefficient ($Sen_{ij}$), denoted for the *i*th method in relation to the *j*th criterion, quantifies the average variation observed in alternative ranking results when modifications are applied to the criterion weight within the PROMETHEE-I methodology, as determined by Eq. 1. This evaluation metrics will be used for measuring robustness.

$$Sen_{ij} = \frac{\sum_{w=1}^{W} D_{ij}^{w}}{H} \forall i, j, w \in \{0.1, 0.2, 0.3, \ldots 0.9, 1.1, 1.2, \ldots, 2\} \tag{1}$$

$$Sen_{ij} = \frac{2}{4} = 0.5$$

In this context, $D_{ij}^{w}$ signifies the count of changes observed in the alternative ranking result of method i when the weight of criterion j is varied within a specific range, while *H* indicates the frequency of alterations in the criteria weights. The weight assigned to each criterion fluctuates between 0.1 and 1. A value of $Sen_{ij}$ is 0.5 indicates that differences in weights have a minimal effect on the categorization of alternatives. Consequently, PROMETHEE-I demonstrates effectiveness in bolstering the decision-making process. To assess the efficacy of the proposed model, we examine three weight allocation scenarios outlined in Eqs. 2, 3, and 4. Following this, we implement the proposed model, and Fig. 1 depicts the ranking of alternatives across these three distinct cases. In Case 1, the weight is determined utilizing the entropy method. In Case 2, 50% of the weight is allocated to beneficial criteria, with the remaining 50% allocated to non-beneficial criteria. For case 3, the distribution is adjusted to assign 60% weightage to beneficial criteria and 40% to non-beneficial criteria.

$$Case1 \rightarrow Entropy\ Method \tag{2}$$

$$Case2 \rightarrow B - 50\%,\ NB - 50\% \tag{3}$$

$$Case3 \rightarrow B - 60\%,\ 40\% - NB \tag{4}$$

Hence, it is clear from the Fig. 1 that different weights in three cases result in the variation in the ranking of alternatives. Two changes in the consecutive rankings of the alternatives were observed as a result of variations in weights across three scenarios (case 1, case 2, and case 3).

[1] https://jmcauley.ucsd.edu/data/amazon/.

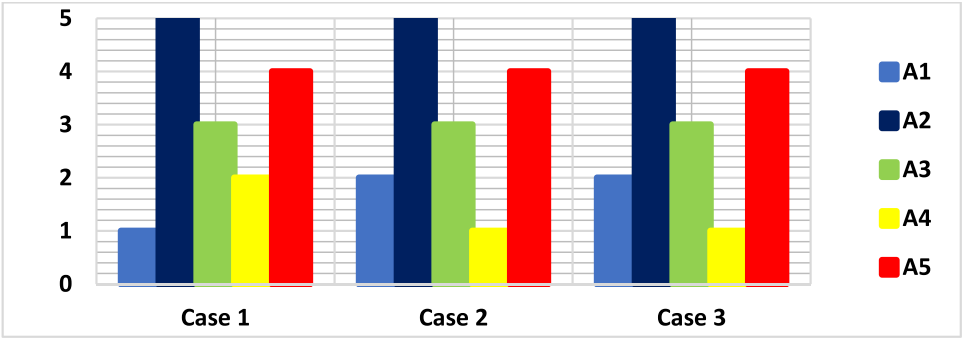


**Fig. 1** Ranking alternatives based on varying weights

**Table 1** Ranking correlation coefficients of various methods

| Methods | Ranking correlation | | | | |
|---|---|---|---|---|---|
| | PROMETHEE | IF-multi MOORA | IF-TOPSIS | IF-TODIM | IF-VIKOR |
| PROMETHEE | 1 | 0.6 | 0.98 | 0.5 | 0.6 |
| IF-Multi-MOORA | – | 1 | 0.6 | 0.3 | 0.9 |
| IF-TOPSIS | – | – | 1 | 0.5 | 0.6 |
| IF-TODIM | – | – | – | 1 | 0.3 |
| IF-VIKOR | – | – | – | – | 1 |

Specifically, the ranks of Al1 and Al2 were affected by these weight variations. However, only the ranks of these two consecutive alternatives changed, while the ranks of $Al_3$, $Al_4$, and $Al_5$, remained unaffected. This observation indicates the robustness of the proposed MCDM model. Following this, we proceed to compare the ranking outcomes produced by our proposed model with those attained through alternative techniques, with a specific focus on correlation analysis. Correlation coefficients serve as a standard measure for assessing the alignment of rankings derived from distinct decision-making methodologies. The computation of this coefficient is elucidated in Eq. 5 [1]. Our method and the IF-TOPSIS methodology exhibit a significantly higher correlation coefficient, precisely measuring at 0.9771. This suggests a strong agreement in ranking the alternatives for the given MCDM problem between the two methods. A correlation coefficient close to 1 signifies a robust positive linear relationship between the rankings produced by the two methods.

$$r_{\text{coeff}} = \frac{\sum_{i=1}^{n}(a_{ij} - a_{ij}^{*})(b_{ij} - b_{ij}^{*})}{\sqrt{\sum_{i=1}^{n}(a_{ij} - a_{ij}^{*}) \times \sum_{i=1}^{n}(b_{ij} - b_{ij}^{*})^{2}}}, \quad j = 1, 2, \ldots n \tag{5}$$

According to Table 1. the rankings produced by the proposed model are compared to those produced by existing MCDM approaches like (IF-Multi-MOORA) [2], (IF-TOPSIS) [3], (IF-TODIM) [4], (IF-VIKOR) [5] offered in this field to determine the validity of the proposed model's ranking. The PROMETHEE-I technique will help suggest picking the top brand. Because it takes into account customer happiness through evaluations provided to specific aspects of mobile brands, customers may find the suggested practical approach to be a decision support system. The primary weakness of this method is the ranking of alternatives generated by the method is not stable, meaning that minimum changes in the criteria weights can lead to different rankings leading to the instability in reliability and robustness of the results. At the end, we would like to conclude that using this framework in knowledge-based recommendation systems can also recommend an appropriate product. It can also be useful to improve the product recommendation framework. In this way, this framework can create effective strategies for raising the status of their products in search engine results. Comparing the outcomes of this research to those of other MCDM algorithms could be an additional avenue for future research. Finally, adding conceptual frameworks to handle industrial and scientific challenges would strengthen the suggested work.

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**Author Contribution** All authors contributed equally to this study.

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**Declarations**

**Conflict of Interest** The authors declare that they have no conflict of interest.

**Human and Animal Rights** No Humans or Animals were harmed in any way.

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# Rejuvenation of water bodies with recycled water

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## ABSTRACT

This study investigated the new routes of groundwater replenishment in water-constrained urban communities. Against the present water demand of 1,440 million gallons per day (MGD) in Delhi, 1,000 MGD including 140 MGD groundwater is being supplied. Additionally, residents, institutions and commercial occupants are illegally extracting 250 MGD. This groundwater extraction is enormous in comparison with the water injected into the ground through rain water harvesting, resulting in the tremendous depletion of the groundwater table. The aim of the study is to replenish groundwater with tertiary treated effluent available round the year. The study is conducted on one natural water body rejuvenated in the South and another artificial water body constructed in West Delhi with the objective of determining whether groundwater can be replenished with tertiary treated water with an improved quality, and whether it can be replicated elsewhere. The qualities of the groundwater and water tables were checked before and after rejuvenating the water bodies. The utilization of tertiary treated effluents has resulted in raising the groundwater tables from 5 to 7 m and improved the quality of the groundwater in the past 2 years. This practice can be replicated elsewhere as done in Brisbane (Australia) and Singapore.

**Key words:** Delhi, groundwater, tertiary treatment, treated effluent, water bodies

## HIGHLIGHTS

- Utilize recycled water for replenishment of groundwater in overexploited water zones.
- Treated effluent passes through floating wetlands, surface aerators and filtration.
- Water table increased by 7.0 m at Pappankalan and 5 m at Rajokari.
- Water bodies becoming the place of recreation for surrounding localities.
- These practices can be applied anywhere in India and abroad effectively.

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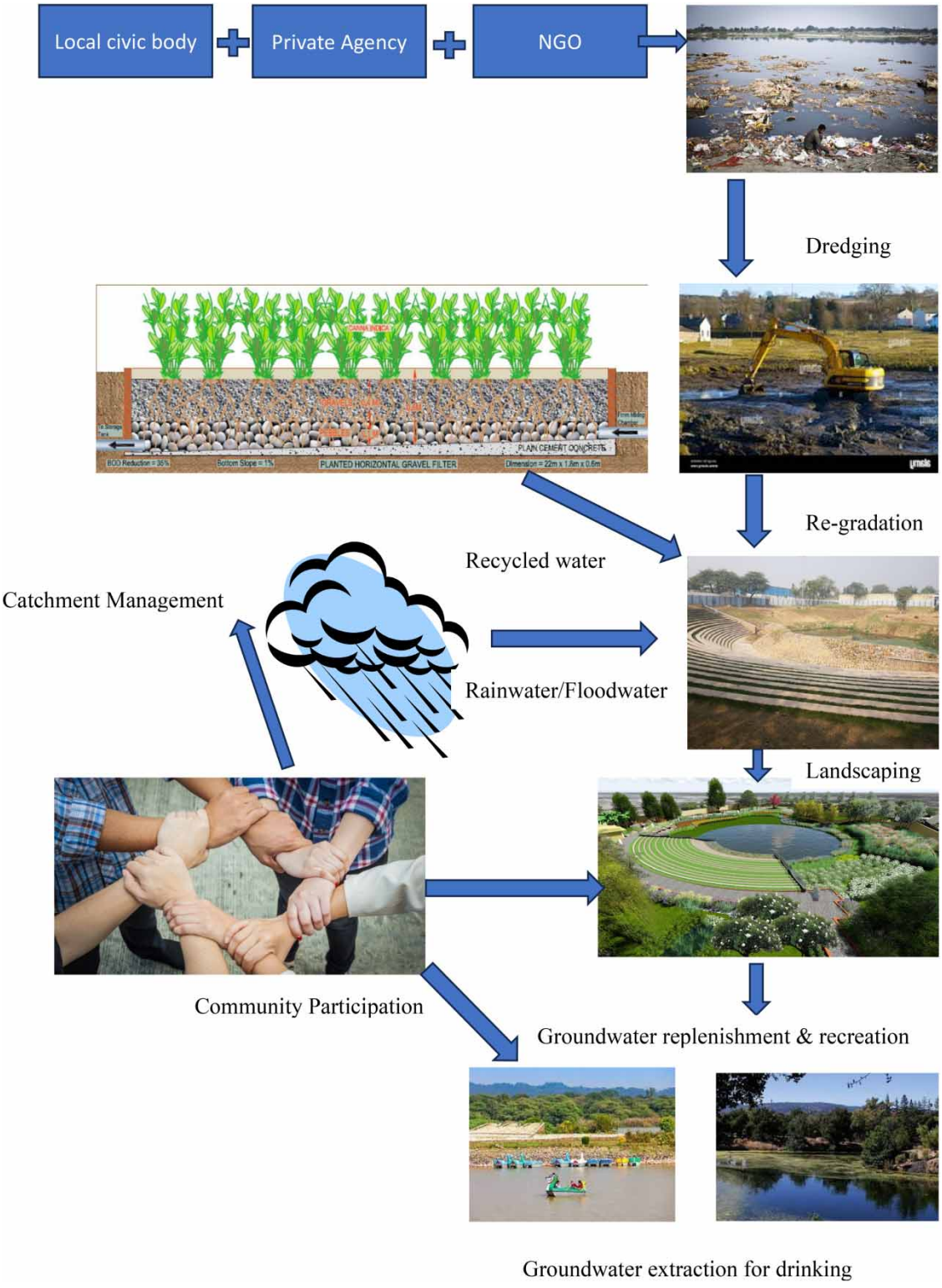
## GRAPHICAL ABSTRACT




## 1. INTRODUCTION

Groundwater is the major freshwater resource that meets around 33% of the global drinking water demand (Li 2016). Most of the water and irrigation demand in India is met from groundwater. Even in the United States, 40% domestic water supply is supplemented through groundwater. Hence, irrespective of whether a country is undeveloped, developed, or developing, groundwater plays a very important role in fulfilling basic

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needs (Swain *et al.* 2022). During the last three decades, groundwater exploitation has increased manifold in India due to the growing population and the limited surface water, which has resulted in unexpected groundwater depletion and water quality deterioration, subsequently reducing future water resources for the next generation. This requires a paradigm shift in water policy to recharge groundwater with recycled water that is available round the year (Gdoura *et al.* 2015) and has many advantages, i.e., reducing the disposal of wastewater in rivers and drains, reducing floods, increasing groundwater levels, and establishing water storages for emergency use (Bouwer 1991, 1996). Moreover, recycled water is used to recharge groundwater all over the world (Ghayoumian *et al.* 2005). In the United States as well recycled water is widely used for groundwater recharge as supported by the Environmental Protection Agency (Schmidt *et al.* 2013). This is despite the fact that using recycled water to recharge aquifers invites many controversies, which are largely the result of human mental blocks (Nijhawan *et al.* 2013). The groundwater recharge through the natural process/filtration is far slower than the exploitation of groundwater resulting in the faster depletion of water tables. Hence, Managed Aquifer Recharge (MAR) has become increasingly important (Asano & Cotruvo 2004; Hochstrat *et al.* 2010). In Delhi, more than 400 MGD groundwater is being extracted to supplement the gap between drinking water demand and its supply, resulting in a tremendous drop down in the groundwater table in 9 out of the 11 districts in Delhi. However, the efforts for replenishment of groundwater are not enough. Delhi Government incentivises its customers by reducing water charges by 5% for the installation of Rain Water Harvesting at their premises and 15% if their Sewage Treatment Plant, in addition to Rain Water Harvesting system, is functioning (Delhi Jal Board 2023). Despite this incentive, the consumers' response is very poor.

In ancient times, there were natural water bodies like lakes, johar/pokhars, and so on in villages and even in urban areas to collect rainwater for use by them as a water source round the year. However, then the groundwater was also replenished through that water. With the passage of time, these water bodies were encroached upon and vanished. The remaining water bodies were polluted with sewage, solid, and industrial waste. The people who were connected with these water bodies began moving away from these water bodies owing to the emission of obnoxious gases generated from the wastewater, thereby neglecting them (Brindha & Schneider 2019). Even in Delhi there were around 1,045 water bodies in rural and urban areas that have since been reduced to only 625 (Kumar *et al.* 2022) as of now per the Parks and Garden Society, Government of the National Capital Territory of Delhi (DPGS 2023) report in Table 1. The recycled water is an asset that can reduce the burden on water supply demand by making it usable for non-drinking purposes. Although tertiary treated water can be converted

**Table 1** | Current status of static water bodies in the NCT of Delhi (Delhi Parks and Gardens Society 2023)

| S. No. | District | Total Nos. of water bodies | Non traceable Water bodies | Water polluted bodies | Encroached water bodies | Water bodies converted into Park | Water bodies near Yamuna | Maintaining agencies | | | | |
|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | DDA | DJB | BDO/ Rev | MCD | Ors |
| 1. | East | 52 | 3 | 16 | 3 | 8 | 17 | 46 | 2 | – | 2 | 2 |
| 2. | North East | 31 | 2 | 1 | 2 | 8 | 17 | 23 | 2 | 4 | – | 2 |
| 3. | Shahdara | 23 | – | – | – | – | – | 21 | – | – | 2 | – |
| 4. | North | 165 | 5 | 14 | 50 | 7 | 21 | 131 | – | 27 | 3 | 4 |
| 5. | North West | 164 | 1 | 14 | 28 | 21 | 1 | 143 | 1 | 14 | 2 | 4 |
| 6. | South | 142 | 5 | 11 | 29 | 13 | 2 | 98 | – | 6 | 3 | 35 |
| 7. | South East | 42 | 9 | 1 | 2 | 2 | 10 | 40 | – | – | – | 2 |
| 8. | South West | 273 | 6 | 30 | 37 | 13 | 0 | 184 | 1 | 78 | 7 | 3 |
| 9. | West | 64 | 4 | 16 | 18 | 9 | 4 | 63 | – | – | – | 1 |
| 10. | New Delhi | 60 | 3 | 3 | 8 | 5 | 1 | 53 | – | – | 3 | 4 |
| 11. | Central | 29 | 2 | 4 | 3 | 3 | 3 | 20 | – | 1 | 1 | 7 |
| | **Total** | **1,045** | **40** | **110** | **180** | **89** | **76** | **822** | **6** | **130** | **23** | **64** |

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into drinking water, there is a mental block in using the recycled water for drinking. However, this tertiary treated water can be used for the replenishment of groundwater, which in turn can be extracted for drinking purposes directly after disinfection or indirectly for further treatment. In addition, there may be other uses of recycled water for non-drinking purposes, as shown in Figure 1. The addition of surface water for Delhi for the growing population is a remote hope, as the upper dam storages, i.e., Lakhwar Vyasi, Renuka Ji, and Kishau, are under planning and construction stages and may take one or two decades in their commissioning. Delhi can supplement the water supply with groundwater only after replenishment of the groundwater with recycled water, which is also a sustainable source. Hence, groundwater recharge with recycled water is one of the best ways to replenish groundwater and use groundwater as a raw water resource in Delhi. This practice has already been adopted successfully in Singapore, Australia, and the United states, wherein recycled water of tertiary standard is stored in lakes and groundwater is extracted for various purposes (Vanderzalm *et al.* 2015, 2020; Sun *et al.* 2020; Radcliffe 2022).

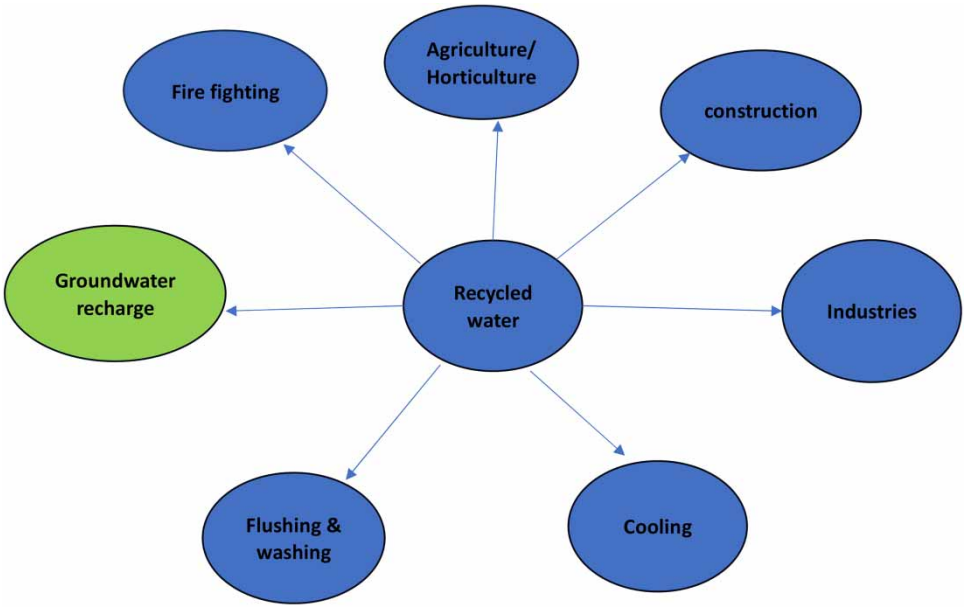


**Figure 1** | Use of recycled water for different non-potable uses.

### 1.1. Study on current status of water bodies

Water bodies, being one of the important water resources, must have water at least of bathing standard (Supplementary material, Table S1). These must have a natural catchment to catch the rainwater during rains. But, due to the fast urbanization and neglected wastewater management, most of the water bodies in Delhi are heavily encroached upon, consequently shrinking the original catchment area and polluting it. The stormwater surface run-off goes back to roads/colonies resulting into water logging, as no water shed management and no well-defined catchment areas of water bodies exist (Brindha & Schneider 2019). The water in the water bodies is highly polluted because of the dumping of solid waste and the inflow of wastewater and industrial effluent (Supplementary material, Figure S1(a)) into these water bodies. Open drains carrying black and gray waters also face anthropogenic activities causing a high risk of infection and communicable diseases. In this regard, microbiology parameters like Escherichia coliform, total coliform, and total aerobic count are important to be investigated and treated suitably before the treated water is collected in water bodies (Giannakis *et al.* 2015; Liang *et al.* 2019; Sharma *et al.* 2020; Yin & Shang 2020; Krishnan *et al.* 2021; Yacouba *et al.* 2021; Bahadur *et al.* 2023).

The residents nearby and passers-by try to keep themselves aloof due to the bad smell resulted from anaerobic reaction in biomass and the dirtiness in and around the water bodies. However, these water bodies would have been very good recreational places. The polluted water collected in the water bodies percolates into the ground and pollutes the groundwater, which becomes irreparable in the long run, thus reducing further the groundwater resource (Jonah & Dawda 2014). The people using this groundwater through tube wells or hand pumps suffer from waterborne diseases when they draw water from the ground and use for their consumption. The flora

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and fauna that should have been in natural lakes have disappeared. The birds are flying away from these water bodies instead of toward them. However, thousands of migratory birds as well as aquatic lives can be seen in the rejuvenated lakes or Biodiversity Parks developed by some of the relevant agencies (Supplementary material, Figure S1(b)).

The encroachment of the watershed areas of most of the water bodies has resulted in the accumulation of rainwater in and around the colonies instead of its flowing into the water bodies. Since these slums cropped up in the watershed areas of the water bodies illegally, the government could not provide basic amenities like water and sewerage. Hence, the sewage generated by those residents also discharges into these water bodies through point and non-point sources. The solid waste generated in such slum colonies that have illegally grown in the watersheds of the water bodies is not properly managed. The residents, therefore, throw their solid waste into the nearby water bodies, polluting the freshwater available in these water bodies. The water bodies are generally neglected in metro cities, resulting in their poor maintenance. The residents nearby who are the immediate beneficiaries are also not made aware of the benefits and importance of the proper maintenance of the water bodies. Instead, they consider the water bodies as dumping places for solid waste and sewage disposal.

## 2. METHODOLOGY FOR REJUVENATION OF WATER BODIES

The objective is to actively rejuvenate existing water bodies by restoring them to their natural original condition and maintaining them properly thereafter, which involves treating the wastewater discharging into the water body to tertiary standard, reusing it for filling the water body, and creating an asset for public recreation and for help in groundwater recharge as a water resource. The treatment plant is designed according to the required quality standards of treated effluent (Kuo & Smith 1998). This will also help in the prevention of water logging during monsoons as the rainwater will flow naturally towards the nearest water bodies. The community participation in planning, implementation, and maintenance of these water bodies must be ensured for the successful commissioning of the project. After rejuvenation of a water body, the residents nearby will be encouraged to participate in related recreational activities, thereby enhancing the value of nearby properties as the social and environmental conditions of the surrounding area will improve. The following are the standard operating procedures for rejuvenating existing water bodies. Figure 2 shows the methodology of the rejuvenation of existing polluted water bodies.

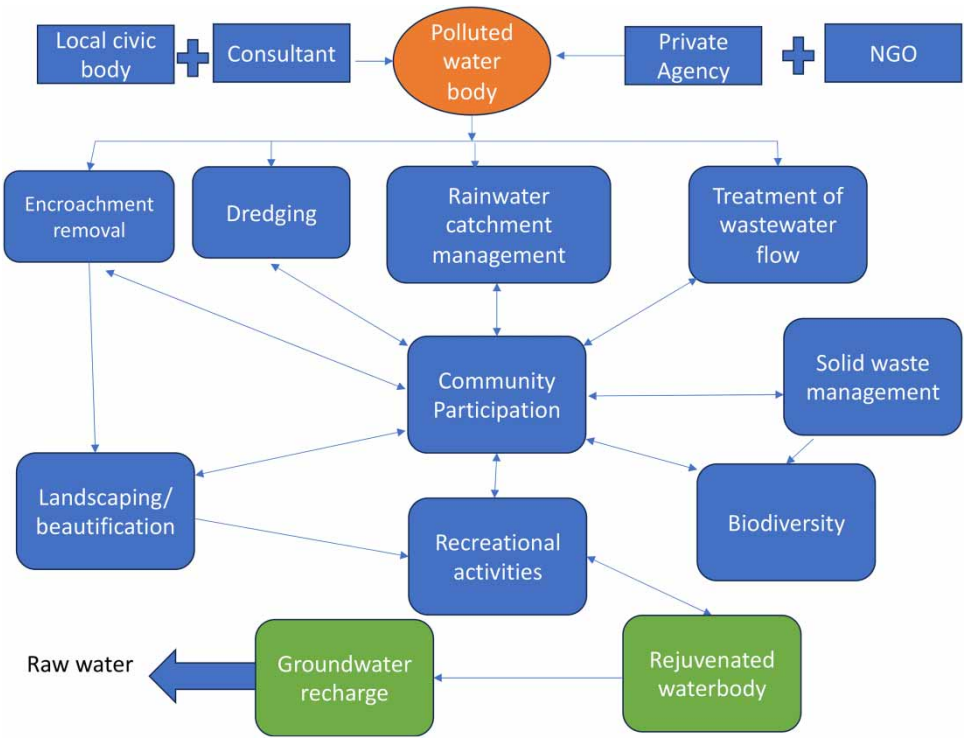


**Figure 2** | Methodology of rejuvenation of existing polluted water bodies.

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### 2.1. Restoration of original and natural watershed of water bodies

This study has been conducted in Delhi, with a present population of more than 24 million. Around 45% is unplanned settlement and water supply demand is not met with per the recommendation of the Central Public Health and Environmental Engineering Organisation (CPHEEO). The water supply is supplemented with groundwater extracted through bore wells as well as that delivered by water tankers. The climate of Delhi is varied with a minimum temperature as low as 10 °C in winter and as high as 45 °C in summer. The average annual precipitation is 560 mm. Yamuna River passes across the city for a length of 48 km. However, drinking water available from the river is allocated per the Memorandum of Understanding (MoU) 1993 signed among the basin states. Approximately 30% of the groundwater is extracted legally and illegally to meet the drinking water demand of Delhi. Although there are more than 1,000 water bodies in Delhi, there are only few clean water bodies remaining where the people of Delhi can go to for picnics and for leisure activities for some time on weekdays or weekends. It is therefore essential to work out the robust methodology for the rejuvenation of water bodies for the replenishment of groundwater as well as for the recreation of the people of Delhi. Figure 3 shows the zonal map and the location of water bodies in Delhi.

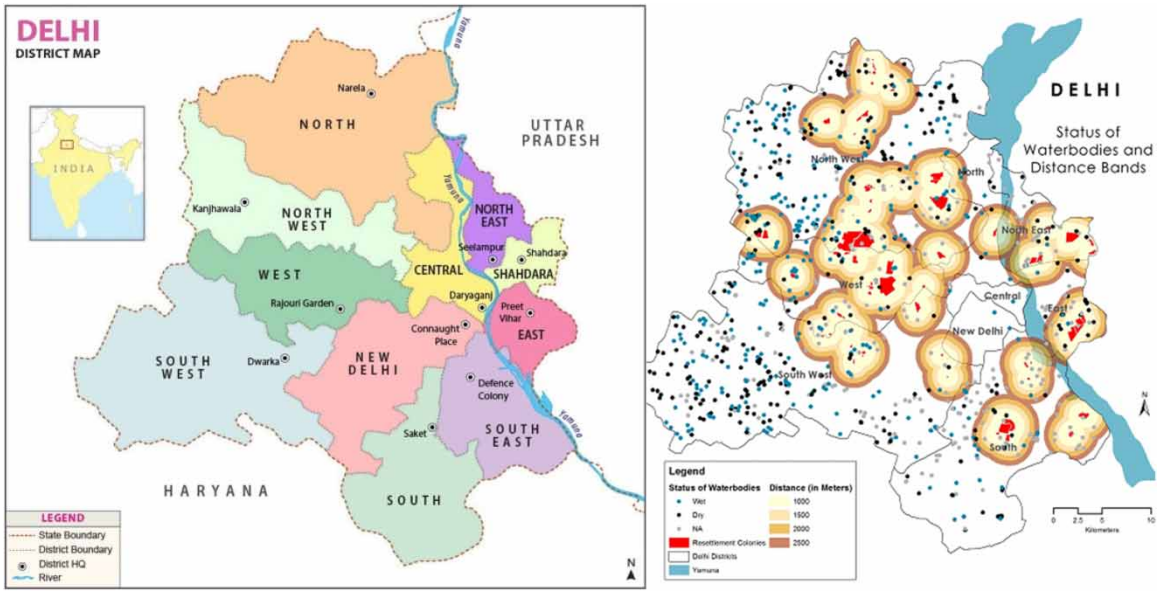


**Figure 3** | Delhi's zonal map and locational plan of water bodies.

There is a well-defined catchment area for each water body wherefrom the rainwater as a point or non-point source discharges, is collected in the water body, and infiltrates into the ground. This area is very important for the survival of the water body, which has been encroached upon by the illegal occupants. However, this area is already available in old revenue records of the government, which can be sought and marked on the plan. After mapping the original catchment area of the water body per the revenue record, the entire watershed of the water body should be freed from all types of encroachments. The reduced levels are marked on the plan for re-grading the watershed for the water body so that the entire rainwater flows into the water body. The stormwater drains after isolation from the wastewater are re-graded and the land is surfaced with filter media in such a manner that the entire rain water is diverted towards the centre of the water body (Figure 4).

### 2.2. Wastewater and solid waste management

All the intakes of the wastewater are identified and marked on the plan. The quality parameters of the wastewater are tested for designing the treatment plant that may deliver the desired quality of treated effluent. The water quality of the water body is intrinsically linked to the quality of the inlets. It is, therefore, essential to trap and clean these before they drain into the water body. A constructed wetland is an appropriate and sustainable solution for this. The natural water treatment arrangements such as wetland systems, soil, filter media, organisms, and so on are used to treat municipal or industrial wastewater, stormwater run-off, and so on. Some of the species of plants

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**Figure 4** | Re-gardening of watershed of water body and landscaping.

used for root zone treatment in a wetland system are *Eleocharis palustris*, soft stem burus, sweet flag, Narrow leaf cattail, Broad leaf arrowhead, Green Ash, Red Maple, Green arrow arum, and *Spartina altemiflora*. The constructed wetlands of an appropriate capacity should be planned for the site and integrated as part of the larger landscape scheme, as it involves almost zero operational cost and merges with the overall landscape (Simon & Joshi 2021).

A large amount of solid waste is thrown by the residents in and on the banks of drains, rivers, and ponds. In Delhi, the solid waste generation was estimated to be 17,000–25,000 tonnes/day for the anticipated population of 22.4 million by 2021. Despite efforts to decompose the waste by composting, incineration, and so on, a minimum residue of 4,000–5,000 tonnes/day, i.e., 20%, will require a large area of landfills (MoEF GOI 2001). Hence, there will be a lot of pressure on the municipal bodies to manage even the residue of municipal waste in the future. Without an adequate solid waste management infrastructure in Delhi and better awareness programs, the residents will continue throwing their domestic waste in nearby water bodies, i.e., drains and rivers, ultimately increasing pollution in the water bodies. For preventing the dumping of solid waste into water bodies, the concerned municipality must construct proper Dalao (intermediate large dust bin for collecting solid waste temporarily before disposing at sanitary landfills), and place dust bins at regular intervals for the collection of solid waste. Door-to-door collection of solid waste can be implemented in the surrounding areas of a water body so that solid waste is collected and disposed of properly instead of being dumped in the water body.

The wastewater flowing into water bodies carries a lot of sludge that gets deposited on the bed of the water body besides the solid waste dumped by the residents. The organic matter deposited in the beds of the water bodies gets digested due to anaerobic reaction and generates obnoxious gases, i.e., carbon monoxide, methane, and hydrogen sulfide. To prevent such a situation and ensure clean water in water bodies, it is essential to dredge the historical sludge from the beds of water bodies at regular intervals.

### 2.3. Landscaping of catchment of water body and ecological restoration

The major catchment of a water body must be designed as a wetland park with urban wilderness, attracting butterflies, useful insects, birds, aquatic life, and so on. These wetland parks must be designed to manage stormwater effectively as an integrated part of the landscape. The gardens will also provide high-quality public open spaces for the surrounding communities. These will be pesticide- and herbicide-free zones. This approach would not only enhance the capacity for retention during monsoons but also help reduce pollution load further, increase groundwater recharge, reduce water temperature (as high temperature are unsuitable for certain aquatic life) in extreme summers, enhance the local ecosystems and biodiversity, provide a robust amenity space for the surrounding communities, and facilitate other social needs. Every project of water body restoration will have certain specific site-based requirements that will need to be addressed on a case-by-case basis. In tandem, degraded ecosystems and habitats must be restored where applicable and/or new ecological landscapes created. The natural process of self-revival of water bodies, i.e., wetland systems and ecosystems, must be ensured while rejuvenating water bodies (Mahapatra & Varghese 2017).

### 2.4. Enhancement of socioeconomic values through community participation

Clean water bodies and restored ecologies and landscapes provide the basis for creating public assets in a city in the form of public spaces, recreational amenities, and enhanced biodiversity. These assets must be incorporated in all restoration initiatives to enable the creation of water-oriented amenities that are robust in the long term, giving rise

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to new zones of growth and opportunities. The most important component of the rejuvenation process of water bodies is the proper maintenance, which is possible with the help of community participation during the planning, construction, and any decision-making, and thereafter in the maintenance and monitoring mechanism so that the beneficiaries may feel the ownership of the project and keep the water bodies in proper condition. The community, which is the beneficiary in the future, can prevent encroachments on the watershed, convince residents not to dump solid waste, and keep monitoring for the proper maintenance of the water body. There are many success stories of community participation in water management in India, i.e., Bangalore Lake management.

### 2.5. Future management standard and monitoring mechanism

The species of plants to further clean treated water are planted near the water body and remaining parts of the residences nearby as mentioned in various studies (Ervin *et al.* 2006; Pollock *et al.* 1998; Olde Venterink *et al.* 2003). The flora and fauna are selected according to the quality of water in the water body and to further the maintenance of the quality of water (Chiarawatchai *et al.* 2008). The proper maintenance of treatment plants, stormwater drains, plants, and shrubs is to be done per the aforementioned Standard Operating Practices. Table 2 summarizes the key aspects of the maintenance and management of water bodies and surrounding parks.

## 3. NOTABLE CASE STUDIES OF REJUVENATION OF NATURAL AND ARTIFICIAL WATER BODIES

### 3.1. Pappankalan artificial water body

The Sewage Treatment Plant (STP) at Pappankalan of 20 MGD capacity is producing the tertiary quality standards treated effluent, i.e., biochemical oxygen demand (BOD) $< 5$, suspended soilds (SS) $< 7$ PPM, coliforms between 250 and 500 PPM after disinfection. For utilization of the Pappankalan STP-treated effluent, an artificial water body has been constructed in around 25 acres of land (Delhi Jal Board 2023). The water body in the 25 acres of land was excavated for about 7–8 ft deep until the sand strata arrived and the excavated earth was spread around the periphery of the water body. The groundwater table was recorded nearby this artificial lake before filling it with recycled water. The around 1.5 m thick impervious layer of soil at the bed of the drain was replaced with sand and gravel to ensure percolation of water into the ground. Since this artificial water body has been created near Najafgarh drain, previously known as Sahibi River, the soil strata below 4.2 m was found completely sandy. Due to the vicinity of the Najafgarh drain carrying wastewater, it was anticipated that the quality of the groundwater may be poor. The quality of groundwater at the depth of 10 m below the ground was checked and recorded in Table 3. The tertiary treated water of quality standard BOD $< 5$, SS $<$ 5 PPM, and coliform $< 250$ ppm was collected in this water body to its brim. The floating wetlands and aerators were also installed within the water body to further improve the quality of water within the water body so that the water percolating into the ground is as good as of bathing quality standard (Figure 5). Since, this water will percolate through various layers of earth before meeting with groundwater, the quality will further improve. The groundwater table has risen by 7 m in the last 18 months. The high rate of percolation and replenishment of the water table is due to the sandy strata and filter media in the bed of the water body. Finally, the quality of the lake water and groundwater table are recorded at periodic intervals and compared to see improvement in the water table as well as the quality of groundwater. Since the water table is now higher than the normal flow water level of the Najafgarh drain, the chances of groundwater contamination are very rare due to the ex-filtration of the groundwater from the water body to the drain.

### 3.2. Rejuvenation of Rajokari natural water body

The Rakokari water body in South Delhi was heavily encroached upon, polluted, and abandoned (Figure 6(a)). The groundwater table in South Delhi has gone down by 50–15 m. The soil texture in most of the area is alluvial soil with hard rocks. The soil texture in Rajokari was found to be a layer of silty sand up to 2–3 m, alluvial soil below this layer, and hard rock underneath. The water table nearby was 45 m below the ground. After adopting the aformentioned methodology, i.e., removing encroachments, revival of original rainwater catchment to the extent of 70%, setting up of constructed wetland STP at the mouth of incoming drain, and addressing the catchment and landscaping issues, the water body was rejuvenated resulting in the raising of the groundwater table by 5 m during the previous monsoon. The sewage from the surrounding area is being treated by a constructed wetland system and discharged into the water body. The landscaping has been done to uplift the beauty of the surrounding area and to create a recreational space to attract the surrounding community. Since the groundwater has been increased, the energy consumed in extracting water through tube wells is also reduced. This has also

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**Table 2** | Key aspects of maintenance and management of water bodies and surrounding parks

| S. No. | Elements | Details |
|---|---|---|
| 1. | Active monitoring of water quality | Water quality of the water body and that of the constructed wetland outlet shall be tested weekly. These tests must be carried out by labs certified by the National Accreditation Board for Testing and Calibration Laboratories (NABL) |
| 2. | Solid waste management | Litter and solid waste including leaves, rubbish, paper, bottles, cans, rocks, and gravel shall be removed from all areas on a daily basis. All refuse resulting from the maintenance operation shall be disposed of at locations designated by the Municipal Corporation of Delhi (MCD). All hardscape areas shall be swept or blown free of debris daily. Construction and demolition daste dumping shall be controlled. |
| 3. | Constructed wetland management | • Survey to identify new inlets shall be carried out bi-annually and necessary trapping into the constructed wetland should be undertaken immediately.<br>• Need for replantation shall be assessed in 3 months, and then bi-annually thereafter, with replantation carried out as required.<br>• Cleaning of collection cum sedimentation chamber shall be undertaken once every 4 months.<br>• Need for de-silting shall be assessed bi-annually and de-silting shall be carried out as required (usually once in 2–3 years).<br>• Pruning of overgrown plants from Phytorid Beds shall be carried out on a quarterly basis.<br>• Hydraulic water level checks shall be undertaken bi-annually, and action shall be undertaken as required.<br>• Gravel check of Phytorid Beds and reshuffle shall be undertaken bi-annually.<br>• Routine Pump Maintenance shall be undertaken on a quarterly basis.<br>Bioremediation augmentation by Bio-media application in Phytorid Beds shall be undertaken annually. |
| 4. | Maintenance of landscaped areas | The nature of landscape maintenance should be aligned with the concept of the park. To sustain the quality and health of a wetland garden with urban wilderness, minimal maintenance is required. The following is to be adhered to:<br>• The wetland garden will be a pesticide/herbicide-free zone with only the use of organic manure if necessary.<br>• Pruning of trees, shrubs, ground cover is to be avoided unless carried out to (a) eliminate disease and (b) to keep a 1.5 m zone along pathways free of any obstruction that may cause accident.<br>• Turf areas/Meadows designed as gathering spaces may be mowed if necessary during the growing season to maintain easy access and continued use. |
| 5. | Irrigation | The irrigation shall be operated at an appropriate seasonal schedule, using the least amount of water necessary to maintain the growth, health, and vigour of all landscape plant materials. All necessary actions will be taken to maintain and repair all irrigation systems on the property. |
| 6. | Lighting | Lighting fixtures/systems shall be maintained to ensure peak performance during the life of the project. All fixtures shall be cleaned per requirements specified in the project contract. Replacements of fixtures shall be made to remedy breakage and to maintain appropriate lighting levels. |
| 7. | Replanting and extra work | Plant material that dies through the fault or neglect of the contractor, or because of preventable circumstances, shall be replaced with a specimen of the same species and of equal or similar size as the plant lost. |

improved the environmental and social condition of the nearby areas (Figure 6(b)). Therefore, this is one of the best examples of community participation wherein the Residents' Welfare Association was involved from planning to its commissioning.

## 4. DISCUSSION

The guidelines on replenishment of groundwater were published and welcomed in Australia. These were implemented in the three states, i.e., South Australia, Western Australia, and Victoria. In other states implementation was not progressing, despite the requirement, opportunities, and viability there. These guidelines were reviewed in the last 10 years and risk assessment was also carried out in terms of the quality of waste treatment, soil profiles, and quality of groundwater after its replenishment (Dillon *et al.* 2020). A similar review of the

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**Table 3** | Groundwater quality before and after the construction of the artificial lake at Pappankalan

| S. No. | Parameters | Before C/O lake | After C/O lake | Remarks BIS: 10500 (2012) |
|---|---|---|---|---|
| 1. | pH | 8.19 | 8.00 | 6.5–8.5 |
| 2. | Electrical Conductivity | 2,472 | 2,100 | |
| 3. | Ca | 38.16 | 28.18 | 75 |
| 4. | Mg | 64.37 | 45.40 | 30 |
| 5. | Na | 424 | 315 | 20 |
| 6. | K | 10 | 5 | 10 |
| 7. | Cl | 424.14 | 315.10 | 250 |
| 8. | $NO_3$ | 83.80 | 85.00 | 45 |
| 9. | F | 1.94 | 1.65 | 1 |
| 10. | $SO_4$ | 37 | 31 | 150 |
| 11. | $NO_2$ | 0.06 | 0.05 | |
| 12. | $PO_4$ | 0.05 | 0.05 | |
| 13. | $HCO_3$ | 372.55 | 285.45 | 244 |
| 14. | WQI | 215 | – | 200–300 (very poor) |

**Figure 5** | Floating wetlands and aerators in the artificial water body at Pappankalan STP.

**Figure 6** | Rajokari water body, pre-rejuvenation and post-rejuvenation.

guidelines and the monitoring of the quality of the recycled water and the quality of the replenished groundwater is also essential in Delhi to ensure the improved quality of groundwater in a sustainable manner.

Although proactive measures are required to be taken to preserve these water bodies not only in Delhi but across the country, these require very harsh regulations and enforcement of the environment law, which are

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somehow missing. The existing laws related to water bodies can include the polluter pays principle, which must be stringently implemented. These regulations should not be confined to Delhi, but put into action in the whole country without further delay (Kumar *et al.* 2022). According to the report published by Delhi Parks and Gardens Society, most of the ponds in Delhi have been reduced in the area due to encroachment, siltation, dumping of garbage, and depleted sources of water, which calls for the immediate attention of the government to revive these to their original shape and conditions. Similar issues can be identified across the country as most of the cities identified under the Smart City initiative are already experiencing water scarcity. Hence, it is essential to map the coordinates of all water bodies in a single platform to monitor, control, and prevent pollution and in parallel make the people aware of the importance of protecting these water bodies locally from becoming extinct. Healthy water bodies, such as wetlands, help the ecosystem stay rich in biodiversity. Since sewage treatment plants (STPs) are set up for treatment of wastewater flowing into the water bodies, the quality parameters of the wastewater and accordingly the process design of the STP must be done properly to ensure collection of tertiary treated effluent in water bodies. The regulating authority must check the quality of water in water bodies periodically.

## 5. CONCLUSION

Temporal analysis of water bodies using high-resolution satellite imagery for pre- and post-monsoon surveys can be done to understand the availability of a source of water, its quantity, and quality in tanks, ponds, lakes due to rainfall, or due to some other sources such as flooding water from canals and water from rainwater harvesting channels. In parallel with that, the water quality analysis can be done using a comprehensive field visit. The second step can be to identify the probable source of pollution. This information can be used for prioritising the water bodies for rejuvenation. Public participation by mass awareness campaigns can lead towards behavioural changes in society, and this can be the core of the conservation plan.

It is necessary to use recycled water of bathing standard along with the rainwater to inject into the ground to recoup the drawdown of water table in Delhi. The rejuvenation of water bodies and creation of artificial water bodies are the probable solutions to increase groundwater sources in future. In addition, community level/large-scale rainwater harvesting through stormwater drains, large parks, check dams, ridges, and forests should also be adopted for groundwater recharge at large scale to maintain the balance between extraction of groundwater and its replenishment at the same time. To improve the efficiency of replenishment rate, impervious layers of soil should be replaced with sand or filter media. To avoid the possible contamination of the groundwater in the process of replenishment with recycled water, it is essential to monitor the water quality of the recycled water from STPs as well as in the water bodies regularly so that the quality of water being percolated into the ground is assured. A monitoring bore well should also be installed for regular monitoring of groundwater quality. The enforcement of environmental laws to protect the water bodies must be done diligently by the concerned regulating authorities.

There are two ways to supplement the gap between demand and supply. One is either to use recycled water directly for non-potable purposes or to manage groundwater recharge with rain and recycled water to enhance sustainability of the groundwater source. The Delhi Government should make its best offices use the recycled water for potable and non-potable uses. Thus, if rainwater and recycled water are used for groundwater recharge through static water bodies, the problem of drinking water may be resolved in Delhi to a large extent, as groundwater from the periphery of these rejuvenated water bodies can be further extracted for drinking after proper treatment.

With encouraging results achieved in these two water bodies of Delhi, wherein the water table has risen up to 5–7 m in addition to the improvement in the quality of the groundwater, the water bodies elsewhere in India and abroad can be rejuvenated and the groundwater can be replenished with recycled water in a similar sustainable manner creating additional water resources.

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## DATA AVAILABILITY STATEMENT

All relevant data are included in the paper or its Supplementary Information.

## CONFLICT OF INTEREST

The authors declare there is no conflict.

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ORIGINAL PAPER

# Robust and fast control approach for islanded microgrid system and EV charging station applications

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## Abstract

A solar photovoltaic (SPV), battery energy storage (BES), and a wind-driven SEIG-based islanded microgrid (MG) system is developed and utilized to provide continuous power to remote areas and electrical vehicle (EV) charging station (CS). The CS is primarily designed to use the extra power during reduced load to charge the EV battery. To synchronize and control the proposed MG system and to extract fundamental component, a Savitzky–Golay filter (SGF) (Hasan et al. in IEEE Trans Instrum Meas 71:1–6, 2022. https://doi.org/10.1109/TIM.2022.3196946)-based phase-locked loop (PLL) control approach is employed. The SGF control with VSC provides harmonics suppression, stabilization of frequency, quick response with lesser oscillations, and enhancement of the overall power quality (PQ) of the MG system under numerous operating scenarios such as uncertain conditions of load, wind, and solar power. Further, an MG suffers from problems of deviation in generation and continuous dynamic load demand; therefore, for power leveling between the load and power generation sources, a BES is connected across the DC link of the VSC through a bidirectional DC–DC converter (BDC). Moreover, to improve CS operational efficiency, the CS also performs vehicle-to-home (V2H) and vehicle-to-vehicle (V2V) power transfer. The observed results show the dynamic behavior of the proposed islanded system, which is confirmed through an experimental prototype. The CS follows the IEEE-1547 standard in all working modes, and the total harmonic distortion (THD) of voltage & current is below 5%.

**Keywords** Savitzky–Golay filter · Battery energy storage · Electric vehicle · Islanded microgrid

## 1 Introduction

The growing electricity demand has increased reliance on conventional energy sources (CERs) such as coal and petroleum, both of which have significant negative environmental and human health consequences [1]. These effects are primarily attributed to the emissions of various pollutants during the combustion of these fossil fuels. Wind and solarPV generation has benefits, but it also has drawbacks, including intermittency, the need for energy storage, and high upfront costs. Innovations in isolated power generation, energy storage technology, and policy support are crucial for addressing these issues. It is crucial to remember that a successful transition to clean energy depends on a diverse mix of renewable energy sources (RESs), such as wind, hydro, geothermal, and tidal power, as well as energy efficiency measures. Countries can achieve a reliable, sustainable, and low-carbon energy future while addressing energy deficits and minimizing environmental impact by combining wind, solarPV, and battery energy storage (BES) and successfully

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integrating them for standalone applications [2, 3]. Wind and solarPV generation technologies have numerous features and characteristics often reported and discussed in [4, 5]. SolarPV and wind energy generation provides an appealing combination of environmental benefits, cost-effectiveness, simplicity, and accessibility.

However, as with any energy source, there are challenges and considerations to address, such as intermittent power, energy storage solutions, grid integration, and standalone applications [6, 7]. A comprehensive strategy that integrates various RESs with modern grid management and energy storage techniques can help build a future energy system that is more flexible and sustainable. The paper discusses the benefits and drawbacks of standalone [8] and grid-connected solar PV systems [9]. Standalone systems with batteries can mitigate the effects of power fluctuations, but the cost of energy storage is higher [10]. Grid-connected systems, on the other hand, eliminate the need for storage, making them more cost-effective and less complex. Furthermore, isolated systems are well suited for wind–solar-based systems to meet the load demand of remote areas where grid supply is not available [11]. The paper emphasizes the significance of MPPT techniques in solarPV systems for maximizing energy production. It highlights the modified P&O control algorithm as a commonly chosen approach due to its simplicity, fast convergence, and effective tracking of the MPP [12]. While other techniques such as FL, INC, and ANN provide good performance, they may involve more intricate calculations and control algorithms, which may increase the overall complexity of the system [13]. The appropriate MPPT technique depends on various factors like as the desired degree of control complexity, system performance requirements, and the expertise available for implementation and maintenance. Each technique has its own set of benefits and drawbacks, so the decision should be based on a thorough examination of the project's requirements and constraints [14, 15]. Controlling the VSC with a robust and effective adaptive control technique improves the overall PQ of the isolated system [16]. Least mean square [17], variable gain controller [18], phase-locked loops (PLLs) [19–21], and frequency-locked loops (FLLs) [22]-based control algorithms were employed to produce the triggering pulses of VSC [23]. A robust and quick control approach has been employed to extract the fundamental load current component & phase angle under uncertain conditions of load and solar power [24]. There is an extensive study of the literature in the field of renewable energy-based CSs. Researchers and practitioners in this field indeed place significant emphasis on optimizing various charging-related factors to enhance the efficiency and sustainability of charging infrastructure for electric vehicles (EVs) powered by RESs. Only a small number of publications, though, have used renewable energy to implement charging stations as of now. Additionally, discussion is also included regarding how well charging stations perform in actual use.

Furthermore, most of the literature tends to focus on the performance of solarPV systems in either standalone or grid-connected mode and may not adequately address the specific issue of solarPV becoming inoperable during grid outages in grid-connected mode. This limitation is indeed a characteristic of traditional grid-tied solarPV systems, and it is essential to be aware of it when considering solar installations. Similarly, the intermittent nature of solar intensity disrupts PV power in islanded mode. As a result, this paper presents an SPV, grid, BES, and DG set-supported CS that operates in various operating modes, allowing the SPV power to be utilized under various operating circumstances [25]. Grid-connected and standalone modes have been covered in some publications. These two modes are, however, independently controlled; therefore, there is no automatic mode switching available. The SPV power must therefore be interrupted, and intermittent EV charging must occur in the absence of automatic mode switching capability [26]. Combining a storage battery with a PV array and potentially integrating an isolated MG are a robust approach to providing continuous and reliable operation of charging stations, especially in remote or off-grid locations. It enhances energy resilience, reduces dependency on the main grid, and aligns with sustainable energy practices. However, in this work, the isolated MG is controlled and synchronized by an SGF-based control approach. The SGF-PLL control with VSC is employed to mitigate harmonics at CPI and to provide continuous power support to the EV charging station and dynamic load.

The following are the primary goals of the proposed system:

1. A Savitzky–Golay filter control is executed to compute the fundamental load current component ($i_A$), which improves the PQ and provides the robust operation.
2. The effectiveness of the aforesaid control is observed to be fast and reliable even under intermittent conditions of wind, solar, and unbalanced load.
3. The SGF control with VSC mitigates the isolated MG system's CPI current harmonics, allowing for power exchange at the unity power factor.
4. Strategy for regulating the frequency & voltage of a wind-powered SEIG without the use of a mechanical regulator.
5. Strategy to inject surplus power into the BES to avoid power waste during dynamic load demand. Further, the stored power is used to charge the EV battery.

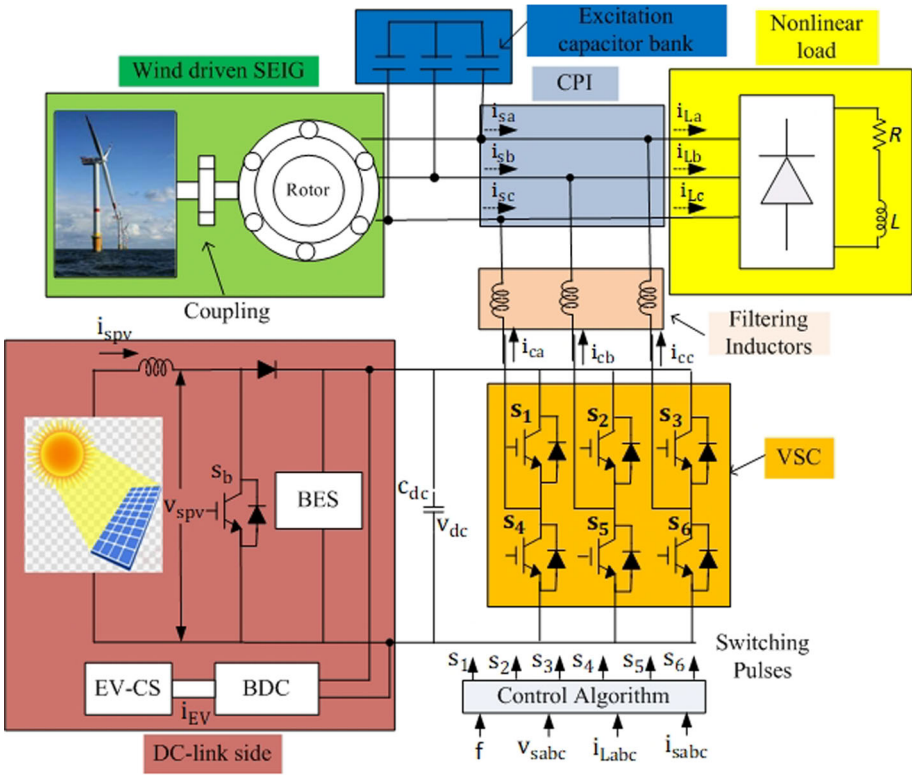


**Fig. 1** System topology of the proposed system

## 2 System topology

This proposed topology integrates solar & wind energy sources, a BES, and a BDC to charge an electric vehicle (EV) and power a connected load efficiently as indicated in Fig. 1. The modified P&O-based MPPT technique maximizes the energy harvested from the solar panels, while the BES provides energy storage and management capabilities to ensure a stable and consistent power supply to the EV and the load, even when renewable energy generation and load demand are variable.

## 3 Control strategies

The main purpose of the designed CS is to maximize the use of generated power to charge EVs and supply continuous power to household loads. The proposed SGF-based control with VSC maintains the PQ within the acceptable limit of the IEEE-519 standard. In this section, all control strategies are described, which are utilized to control the islanded MG system and EV charging station.

a. SGF-based control algorithm

The SGF is a type of FIR filter that uses a weighted moving average to control the signals of an islanded MG system. This works in both the continuous- and discrete-time domains:

$$i(t) = \int_{t-T_\omega}^{t} u(\mu)\mathrm{d}\mu \tag{1}$$

$$i(k) = \sum_{m=0}^{M} j(m)u(k-m) \tag{2}$$

where $(i)$ and $(u)$ are the output & input signals, respectively, and $j(m)$ is the SGF's impulse response. The frame length, polynomial order, and other filter characteristics in Savitzky–Golay filtering are typically determined separately based on the specific requirements of your signal processing task. The frame length $(T_\omega)$ and polynomial order $(M)$ are typically chosen depending on the nature of the signal and the noise to be filtered, but they are not directly related by the equation $(T_\omega = MT_s)$ (Fig. 2).

The polynomial $s(k)$ used by SGF for a given data point is a polynomial of degree M, and its coefficients $(d_m)$ are determined using least squares regression with a frame of size $(2T_\omega + 1))$ centered at that data point. The filtered value is obtained by computing the polynomials at $k = 0$, which represents the centered data point. The process is repeated for each data point in the signal to perform SGF filtering.

$$s(k) = \sum_{m=0}^{M} d_m k^m \tag{3}$$

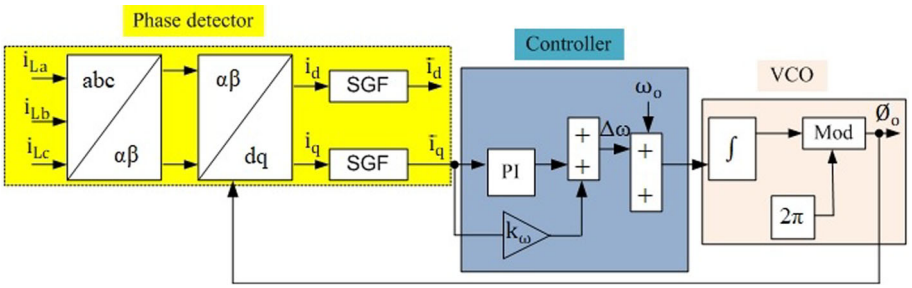


**Fig. 2** SGF-PLL-based control algorithm

Using (1) and (2), the SGF filter's transfer function in the $s$ & $z$-domains can be attained as shown below.

$$G_{\mathrm{SGF}}(s) = \frac{i(s)}{u(s)} = 1 - \left(1 - e^{-T_\omega s}\right) G(s) \tag{4}$$

$$G_{\mathrm{SGF}}(z) = \frac{i(z)}{u(z)} = \sum_{m=0}^{M} z^{-m} = 1 - \left(1 - z^{-1}\right)^{M+1} G(z) \tag{5}$$

The true frequency output of the SGF using Eq. (4) and (5) is obtained in both s-domain (continuous) & $z$-domain (discrete) when $G(s)$ and $G(z)$ represent the transfer function of another FIR filter. The equations are processed as

$$G_{\mathrm{SGF}}(j\omega) = 1 - \left[\sin\left(\frac{\omega T_\omega}{2}\right) \times \left(\frac{\omega T_\omega}{2}\right)\right] G(j\omega) \tag{6}$$

$$G_{\mathrm{SGF}}\left(e^{j\omega T_s}\right) = 1 - \left[\sin\left(\frac{\omega M T_s}{2}\right) \times \left(\frac{\omega T_s}{2}\right)\right] G\left(e^{j\omega T_s}\right) \tag{7}$$

The SGF has a symmetric impulse output, which means $h(m) = h(-m)$, and an actual frequency response, as indicated by Eq. (7). These properties indeed confirm that the SGF is a zero-pass filter. The zero-phase characteristic of the SGF is highly desirable in various applications, including phase-locked loop (PLL) applications, because it doesn't generate any phase distortion in the signal it filters. This is particularly important in systems where maintaining phase integrity is critical. Additionally, the SGF's ability to block disturbances and harmonics at $(1/T_s)$ hertz frequency is an important feature for applications. This can be useful in signal processing tasks such as noise reduction or signal denoising [27].

b. Small signal modeling

The SGF in the phase detection period of an SRF-PLL can be extremely beneficial to the stability and performance of the PLL system, especially when dealing with grid or isolated MG system applications. However, the SGF can effectively eliminate disturbances and improve performance.

The 3-phase input load currents of the SGF in the discrete-time domain while ignoring the presence of harmonics. The discrete-time representation of input voltages for a three-phase system is as follows:

$$i_{La}(k) = I\cos(\emptyset_i(k)) \tag{8}$$

$$i_{Lb}(k) = I\cos\left(\emptyset_i(k) - \frac{2\pi}{3}\right) \tag{9}$$

$$i_{Lc}(k) = I\cos\left({}_i(k) + \frac{2\pi}{3}\right) \tag{10}$$

where $\emptyset_i$ and $I$ symbolize the phase angle & amplitude of the 3-phase load current, respectively. The process involves transforming the 3-phase load current into its αβ components using Clarke's transformation and then applying Park's transformation with the rotating feedback angle $\emptyset_i$ to generate dq-coordinates as below:

$$i_d(k) = I\cos(\emptyset_i(k) - \emptyset_o(k)) \tag{11}$$

$$i_q(k) = I\sin(\emptyset_i(k) - \emptyset_o(k)) \tag{12}$$

The output signals of the SGF in the dq-coordinates can be expressed by taking into account the output time series of (2) in the discrete-time domain.

$$\bar{i}_d(k) = \sum_{m=0}^{M} u_d(k-m) = I\sum_{m=0}^{M} \cos(\Delta\emptyset(k-m)) \tag{13}$$

$$\bar{i}_q(k) = \sum_{m=0}^{M} u_q(k-m) = I\sum_{m=0}^{M} \cos(\Delta\emptyset(k-m)) \tag{14}$$

where $\Delta\emptyset(k) = \emptyset_i(k) - \emptyset_o(k)$. By taking into account the q-component and a sinusoidal function computation, (14) will transform into

$$\bar{i}_q(k) \approx \sum_{m=0}^{M} \Delta\emptyset(k-m) \tag{15}$$

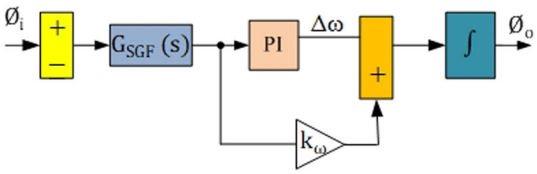


**Fig. 3** Small signal modeling

Using the z-transformation in Eq. (15), we can get

$$\bar{i}_q(z) \approx I(G_{\mathrm{SGF}}(z)\Delta\emptyset(z)) \tag{16}$$

Similar results can be obtained in the s-domain.

$$\bar{i}_q(s) \approx I(G_{\mathrm{SGF}}(s)\Delta\emptyset(s)) \tag{17}$$

The development of the small signal model in the s-domain using Eq. (17) is shown in Fig. 3 [1].

c. Estimation of unit templates

The observed line voltages at CPI are transformed into phase voltage, which is written as

$$v_{sa} = \frac{1}{3}(2v_{ab} + v_{bc}),\quad v_{sb} = \frac{1}{3}(-v_{ab} + v_{bc}),\quad \text{and } v_{sc} = \frac{1}{3}(-v_{ab} - 2v_{bc}) \tag{18}$$

The amplitude of the three-phase generated voltage ($V_T$) can be estimated as

$$v_T = \left[2\left(v_{sa}^2 + v_{sb}^2 + v_{sc}^2\right)/3\right]^{\frac{1}{2}} \tag{19}$$

where $v_{sa}$, $v_{sb}$ and $v_{sc}$ are 3-phase instantaneous voltage signals of the proposed MG system. By dividing each instantaneous voltage value by the voltage amplitude ($v_T$), the unit templates are processed as.

$$u_{ap} = v_{sa}/v_T,\ u_{bp} = v_{sb}/v_T,\ \text{and } u_{cp} = v_{sc}/v_T \tag{20}$$

The voltage templates of the quadrature unit are estimated and assessed using the in-phase unit templates.

$$u_{aq} = -\frac{u_{ap}}{\sqrt{3}} + \frac{u_{cp}}{\sqrt{3}},\quad u_{qb} = \frac{\sqrt{3}u_{ap}}{2} + \frac{(u_{bp} - u_{cp})}{2\sqrt{3}},\quad \text{and } u_{qc} = -\frac{\sqrt{3}u_{pa}}{2} + \frac{(u_{bp} - u_{cp})}{2\sqrt{3}} \tag{21}$$

where ($u_{ap}$, $u_{bp}$, $u_{cp}$) and ($u_{aq}$, $u_{bq}$, $u_{cq}$) are the in-phase and quadrature phase unit voltage templates of all three phases. Further, they are employed to examine the reference current for the proposed system [28].

d. Gate pulse generation for isolated MG

The SGF algorithm is described for analyzing the active & reactive power components of a load current by extracting the fundamental component ($i_A$). It relies on precise timing and synchronization using zero-crossing detectors (ZCDs) and Sample & Hold (S&H) circuits to accurately determine the instantaneous and maximum values of these components as given in Fig. 4.

The SGF-PLL-based control topology combines frequency regulation and current control in the proposed system. It uses a PI controller to adjust the frequency while ensuring that the source current aligns with the active component of the load current, accounting for both the PV input and the desired frequency reference. The system operates based on discrete sampling and continuously adjusts to maintain the desired frequency and provide the required active power to the load. The frequency is computed at the *m*th sampling instant, and the difference between observed & reference frequency is written as

$$f_e(m) = f^*(m) - f(m) \tag{22}$$

Following that, the comparison of observed & actual frequency from Eq. (22) is fed to the PI controller to get the signal of the current component ($i_{af}$).

The extracted real current component of the reference source current is computed as

$$i_{LA} = i_{af} + i_{spv} - i_{LfA} \tag{23}$$

$$i_{LA}^* = i_{LA}u_{abcp} \tag{24}$$

The voltage error ($v_{T\mathrm{err}}$) of a CPI voltage at *m*th sampling instant is estimated as

$$v_{Terr}(m) = v_T^*(m) - V_T(m) \tag{25}$$

To get the current ($i_{qq}$), the output achieved from Eq. (25) is given to the PI controller.

$$i_{qq} = k_p v_{T\mathrm{err}} + k_i \int_0^{i_d} v_{T\mathrm{err}}\mathrm{d}t \tag{26}$$

The peak value of the reference source current ($i_{Lq}$) reactive component is evaluated as.

$i_{Lq} = i_{qq} - i_{Lqf}$ and the reference current of the quadrature component is calculated as below

$$i_{Lq}^* = i_{Lq}u_{abcq} \tag{27}$$

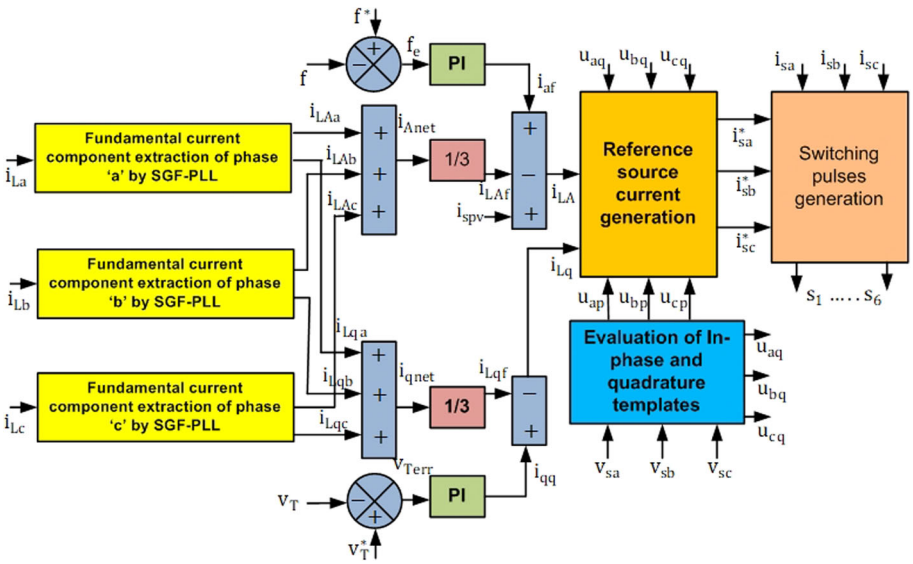


**Fig. 4** Control methodology of the proposed islanded MG system

The summation of Eq. (24) & (27) is utilized to generate the reference source current.

$$i^*_{sabc} = i^*_{LA} + i^*_{Lq} \tag{28}$$

The procedure of switching pulse generation is given in Fig. 4, and the observed source currents ($i_{sabc}$) and extracted reference source current ($i^*_{sabc}$) are fed to the hysteresis controller [29].

e. Bi-directional control strategy

The choice of lead-acid batteries in the islanded MG system is mainly driven by their cost-effectiveness and perceived safety benefits over lithium-ion batteries. These batteries play an important role in ensuring the MG's stability and reliability by acting as energy buffers to bridge the gaps between energy generation and consumption, which can vary due to the intermittent nature of wind & solar. The inductor filter is designed as follows for BDC operation in the buck-boost mode.

$$d = (v_{dc} - v_b)/v_b = (400 - 241)/400 = 0.39 \tag{29}$$

$$L_b = v_b \times d/f_s \Delta i_c = 0.39 \times 241/20 \times 10^3 \times 7 \times 2 = 3.35\ \text{mH} = 4\ \text{mH} \tag{30}$$

Therefore, the required value of the inductor is 4mH, where ($v_b$) is the battery voltage, ($v_{dc}$) is the dc-link voltage as 400 V, the ripple current ($\Delta i_c$) is the charging current, which is considered 20%, and ($f_s$) is the switching freq., which is considered as 20 kHz. The cascaded PI controller configuration allows for effective and precise voltage & current control. The outer loop ensures that the DC-link voltage remains stable, whereas the inner loop controls the battery current ($i_b$), which is especially important in battery-powered systems to prevent overcharging or over-discharging. The battery current ($i_b$) and dc-link voltage ($v_{dc}$) transfer function obtained through linearization of the converter are

$$\frac{v_{dc}}{i_b} = \frac{(1-d)(R_{dc} - nL_b)}{1 + (sR_{dc}c_{dc}) + \left(1 - d^2\right)} \tag{31}$$

$$\frac{i_b(n)}{d_{dc}} = \left(\frac{2 + sR_{dc}c_{dc}}{\left(n^2 L_b c_{dc} + \frac{nL_b}{R_{dc}}\right) + \left(1 - d^2\right)}\right) \times \left(\frac{v_b}{R_{dc}(1-d)}\right) \tag{32}$$

where $R_{dc} = \frac{v^2_{dc}}{p_{dc}}$ is the effective output resistance of the converter, ($c_{dc}$) is the capacitance of the dc-link capacitor, and ($L_b$) is the inductance of the buck–boost converter [30]. In the proposed work, the bidirectional topology maintains both the BES & EVCS during intermittency.

## 4 Results and discussion

The simulation and experimental results of the SGF-PLL-based islanded MG system with EV charging station applications are described.

a. Performance under change in solar intensity and load

Figure 5a, b depicts the performance of the islanded MG system during the variation in solar intensity and load perturbation. The level of solar intensity is changed at $t = 2.1$ s from 950 w/m$^2$ to 500 w/m$^2$, and the load of phase 'a' is

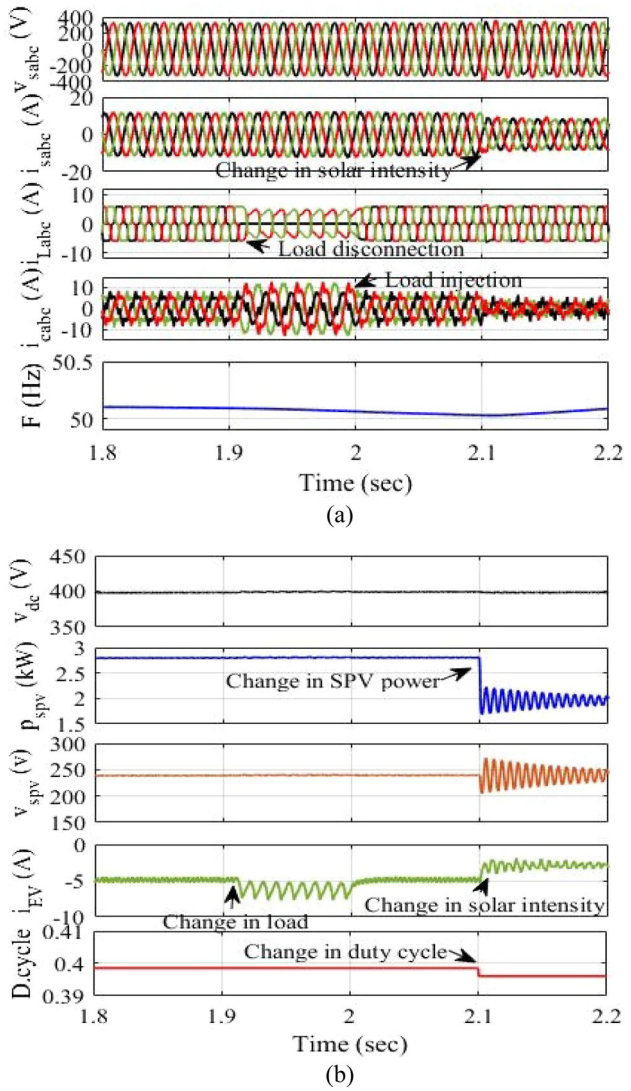


**Fig. 5** **a**, **b** Performance under a change in solar intensity and load

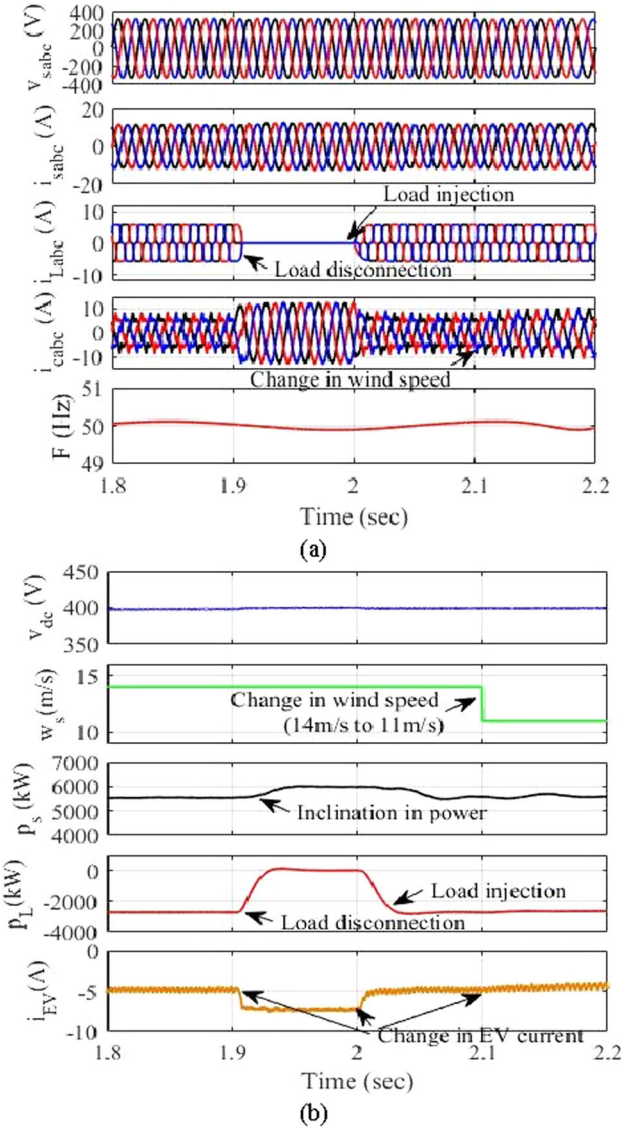


**Fig. 6** **a**, **b** Performance under load perturbation and fluctuating wind speed

disconnected at $t = 1.9$ s to $t = 2$ s. Figure 5a shows the load current is reduced during the load disconnection period, and the compensator current is increased. Further, the CPI current & compensator current are reduced to 11.8A from 8.1A and 9.1A to 11.7A during a fall in solar intensity level. During the fall in SPV power from 2.8 kW to 2.02 kW, the unused power is delivered by the battery, which is connected to the DC link of the inverter. Figure 5b represents during the decline in SPV power, the duty cycle and EV charging current are reduced from 0.398 to 0.396 and 5.1A to 2.6A. The SGF-based controller with VSC preserves the frequency, DC-link voltage, and CPI Voltage. Moreover, the CPI is also sinusoidal under the intermittency of wind, solar, and worst load conditions.

b. Performance under load perturbation and fluctuating wind speed

Figure 6a, b depicts the performance of the islanded MG system under the fluctuation in wind speed and load perturbation. Figure 5a shows the load of all phases is disconnected from $t = 1.9$ s to $t = 2$ s during above-said period; the load current is reduced to zero; and the frequency & CPI current of the islanded system are maintained stable by the controller. Figure 5b depicts that during the reduction in wind speed at $t = 2.1$ s from 14 m/s to 11 ms, the compensator current is increased from 9 to 10A & the EV current is reduced. During the load dynamic conditions at $t = 1.9$ s to $t = 2$ s, the total generated power is increased from 5.55 kW to 5.9kw and load power is decreased to zero due to disconnection of load of all phases. During the disconnection of the load, the EV charging current is increased.

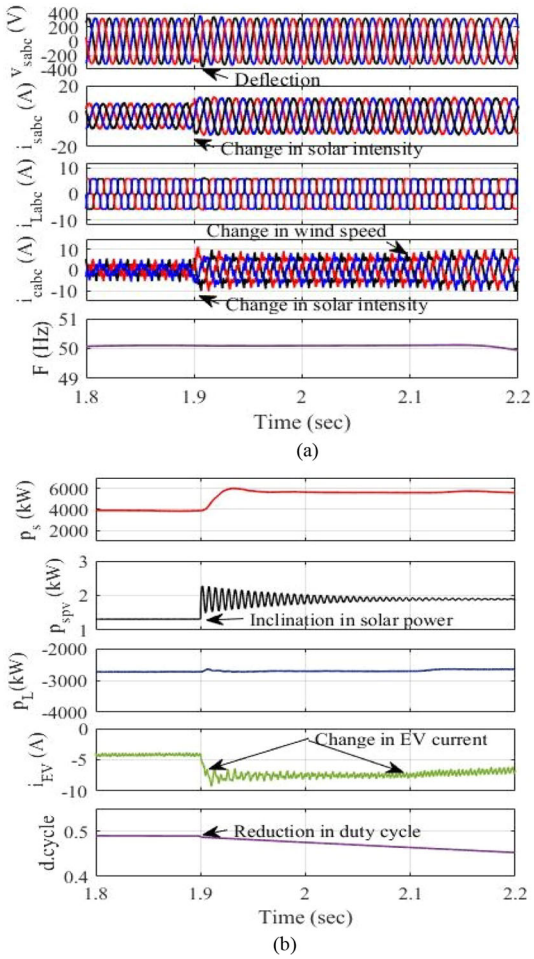


**Fig. 7** **a**, **b** Performance under solar and wind intermittency

c. Performance under solar and wind intermittency

Figure 7a, b depicts the performance of the islanded MG system under the change in solar intensity & wind speed. The solar intensity is changed at $t = 1.9$ s from 500 w/m$^2$ to 950 w/m$^2$, and wind speed is shifted at $t = 2.1$ s from 14 m/s to 11 m/s. In Fig. 7a, the CPI voltage shows a small deflection at $t = 1.9$ s due to a sudden change in solar intensity. The CPI current and compensator current are increased during the above-mentioned period. Figure 7b depicts the generated power, SPV power, and EV charging current are increased from 3.9 kW to 5.8 kW, 1.35 to 1.9 kW & 4.1A to 7.52A, respectively, due to inclination in solar intensity at $t = 1.9$ s. The SGF-based control with VSC maintains the CPI voltage constant after a very short duration transient at $t = 1.9$ s. The proposed control topology effectively manages all the signals of the isolated system under different operating scenarios. Further, the active/reactive power compensation is provided by the BES through VSC.

d. Harmonics analysis of islanded MG system

Figure 8a–c represents the harmonic analysis of an isolated system under highly nonlinear load conditions. The total harmonic distortions (THDs) of the CPI voltage, CPI current & load current of phase 'b' are 1.41%, 4.19% & 24.51%, respectively.

## 5 Test results

An islanded MG system was developed in the laboratory to be used to charge electric vehicle batteries and supply power to remote areas as shown in Fig. 9. The control approach of the islanded MG is implemented in a digital controller dSPACE-1106 employing current and voltage signals acquired using voltage (LEM LV-25P) & current transducers (LEM LA-25NP). The observed results of the proposed islanded system are depicted in Figs. 10a–d and 11a, b; this shows the steady-state and dynamic behavior of the aforesaid system.

a. Dynamic performance under load perturbation

Figure 10a–d depicts the steady-state and dynamic behavior of the SGF-PLL-based islanded system under highly nonlinear load and load perturbation. Figure 10a shows the recorded waveforms the unit template ($u_{ap}$), load current ($i_{La}$), and CPI voltage ($v_{sa}$) & CPI current ($i_{sa}$) under steady state load conditions. Figure 10b displays the dynamic behavior of the unit template ($u_{ap}$), load current ($i_{La}$), and CPI voltage ($v_{sa}$) & CPI current ($i_{sa}$) under the removal of one-phase load. The $i_{La}$ & $i_{sa}$ signals are reduced during load disconnection. Figure 10c shows $i_{La}$ & $i_{sa}$ are increased during load insertion. Figure 10d depicts the signals under light load conditions. The CPI current & load current are increased under the insertion of a one-phase load. The recorded waveforms show that the SGF-PLL control with VSC works effectively and successfully provides power support, load leveling, harmonics mitigation, and frequency & voltage stabilization of the wind-driven SEIG. During minimum load requirements, the extra power is delivered to the CS for EV battery charging.

b. Harmonic spectra

Figure 11a, b depicts the harmonic spectra of SGF-PLL-based islanded MG system under highly nonlinear load demand. The THDs of CPI current ($i_{sa}$) & load current ($i_{La}$) are 4.26% & 29.66%, respectively. The SGF-PLL control approach with VSC effectively maintains all the signals of the islanded system and mitigates the harmonics under highly nonlinear load conditions.

c. Comparative performance

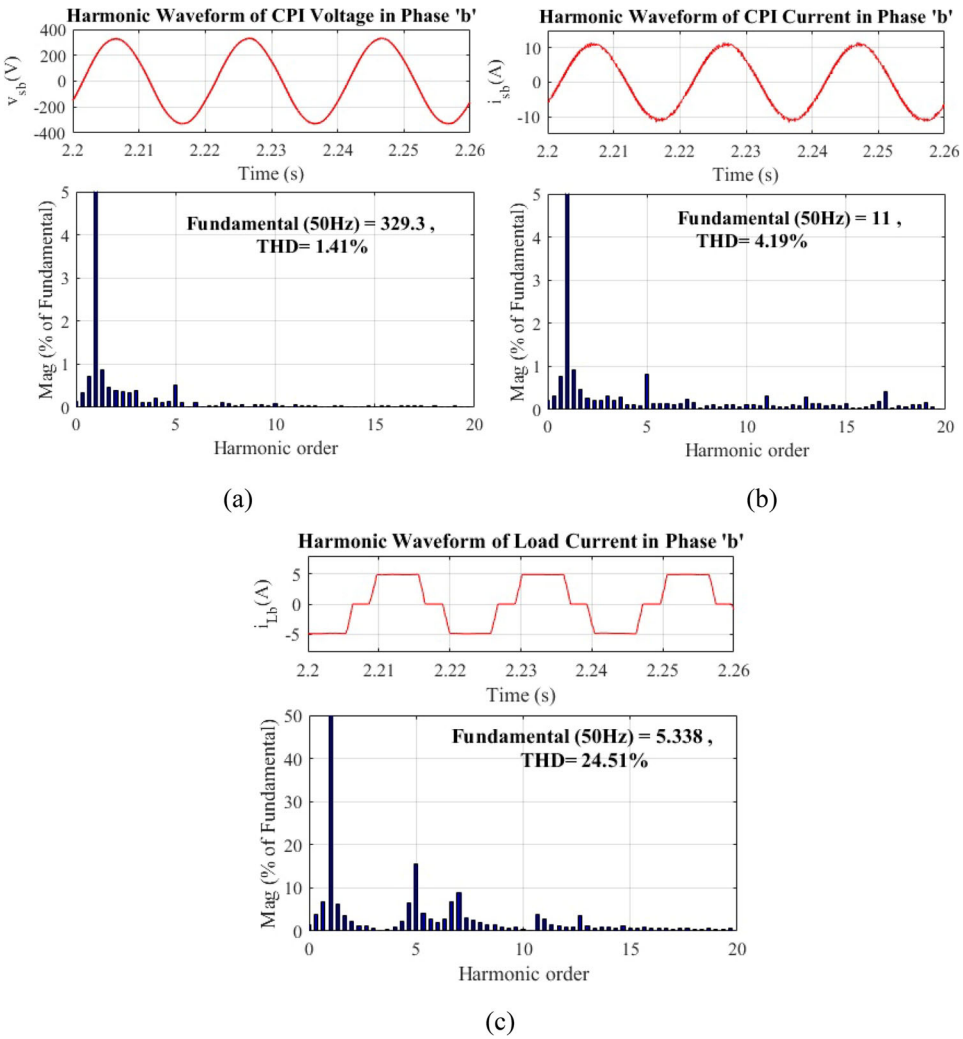


**Fig. 8** **a–c** Harmonics analysis

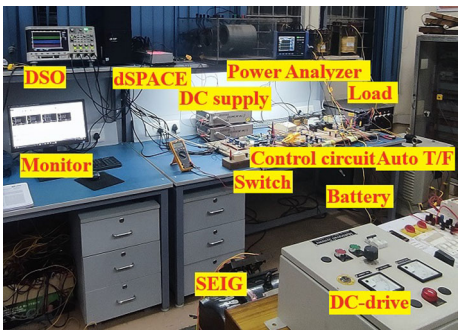


**Fig. 9** Experimental prototype of the proposed system

Figure 12 shows the comparative performance of SGF-PLL control with DROGI-FLL and ILMS control approaches under changes in load and solar intensity. During the extraction of fundamental component, the DROGI-FLL and ILMS give higher oscillations under variations in solar intensity and load perturbation. In comparison with the above-said controls, the SGF-PLL-based control had higher stability, quick response, and reduced oscillations with the least steady-state error. Table 1 depicts the comparative performance analysis proposed control with existing control algorithms under various operational circumstances.

## 6 Conclusion

An implementation of wind-driven SEIG, SPV, and BES-based islanded MG system has been implemented for EV charging and power supply to remote areas. The test results demonstrated that the proposed charging system is versatile and reliable, capable of operating smoothly under a wide range of conditions. Such versatility is crucial for ensuring consistent and dependable charging for EVs while harnessing energy from renewable sources like solar & wind, which are inherently variable, whereas test results in an isolated MG system have confirmed the capability of the SGF-based control approach to maintain the PQ and all parameters of the isolated system. The BDC control effectively manages the

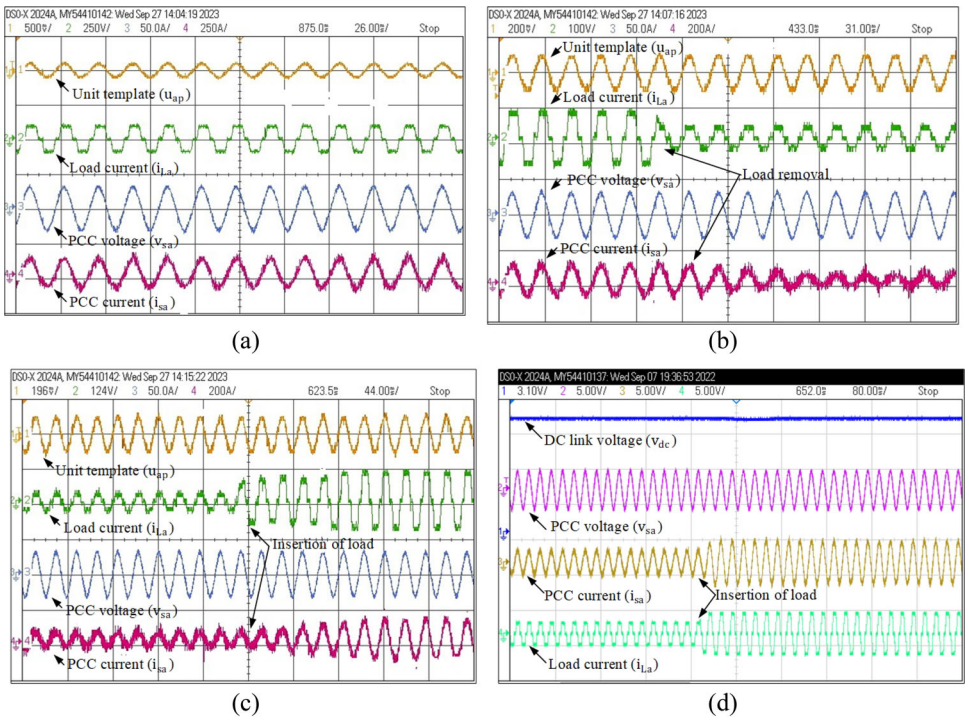


**Fig. 10** **a**–**d** Dynamic performance under load perturbation

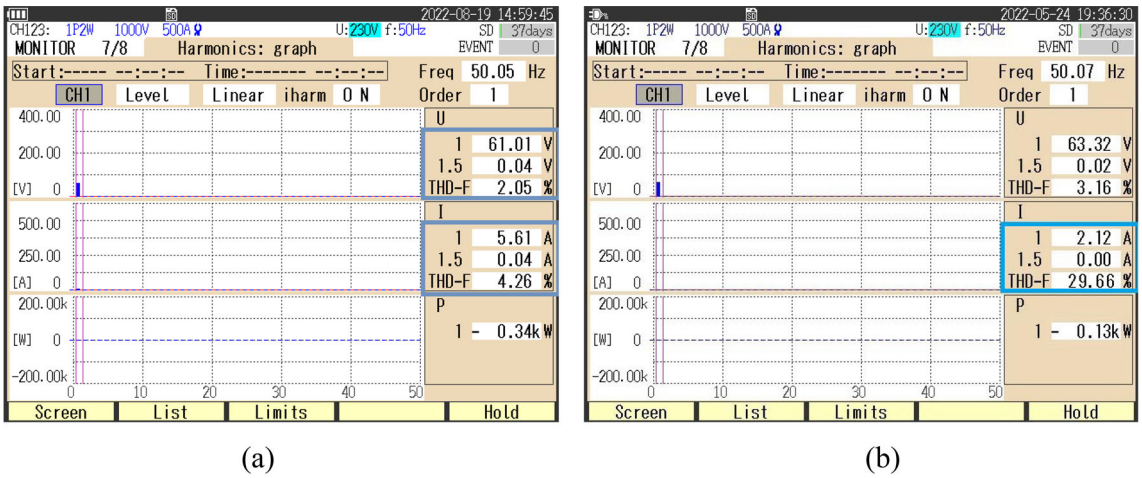


**Fig. 11** **a**, **b** Harmonic spectra of the islanded system

**Table 1** Comparative performance under different control algorithms

| S.no | Parameters | DROGI-FLL | ILMS | Proposed control |
|---|---|---|---|---|
| 1 | Stability | Good | Better | Best |
| 2 | THD (%) | 4.95 | 4.85 | 4.26 |
| 3 | Settling time | 0.18 | 0.21 | 0.03 |
| 4 | Oscillations with steady-state error | Very large | less | Very less |

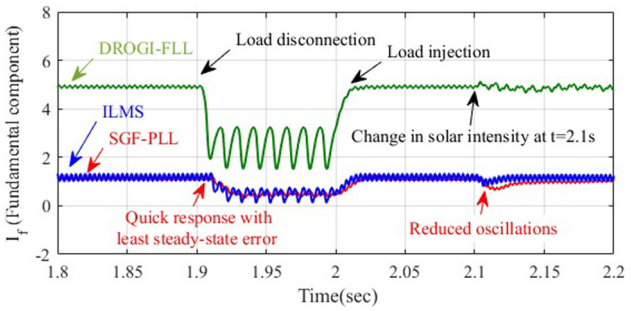


**Fig. 12** Comparative performance

charging/draining of the BES during the solar power intermittency. The IEEE fulfillment operation of the CS, which ensures that the THD of the CPI current is less than 5%, serves as validation of the effectiveness of the proposed CS management system. From this, it can be concluded that the CS equipped with this control system can efficiently utilize various energy sources and deliver consistent and cost-effective charging for EVs.

**Author contributions** Authors (1, 6) developed the experimental prototype. Authors (1) performed the analytic calculations and numerical simulations and write entire manuscript. Both authors (2, 3) contributed to the final version of the manuscript. Authors (3, 5) supervised the simulation and experimental prototype.. Author's (2, 3, 4, 5) review the manuscript.

## Declarations

**Competing interests** The authors declare no competing interests.

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# Short-term Electric Vehicle Charging Load forecasting using Transfer and Meta-learning

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***Abstract*—Load forecasting for electric vehicle (EV) charging hubs has emerged as a crucial task for demand-side management and planning of electric grid frameworks with the increasing number of EVs on road. Existing load forecasting methods like long short-term memory (LSTM) neural networks rely on large amounts of historic data which can be expensive, difficult, and time-consuming to collect in some circumstances. In this work, we propose using Transfer Learning (TL) and Model-Agnostic Meta-Learning (MAML) for short-term EV charging load forecasting by utilizing data from just 10 or 20 days. This is achieved by pretraining models on a larger EV charging dataset from Boulder, Colorado and fine-tuning the models on 10 and 20-day subsets of EV charging data from Pasadena, California and Trondheim, Norway. We compare the accuracy of TL and MAML models with traditional LSTM models on their ability to make accurate forecasts using extremely small datasets across different geographies and scopes.**

***Index Terms*—forecasting, machine learning, electric vehicles**

## I. Introduction

As we progress towards a low-carbon future with an increasing portfolio of electric vehicles (EVs) and renewable energy sources (RES) the electric grid is facing numerous challenges in stability. The growing adoption of RES and EVs present challenges in achieving seamless demand-supply coordination due to their inherent uncertainties. Therefore, forecasting electricity generation and loads are critical in maintaining a stable smart grid by closely matching supply and demand at various time scales [1]. On the supply side, wind and solar energy are intermittent by nature, dependent on external weather variables, and largely uncontrollable. Meanwhile, forecasting EV charging loads is imperative for planning infrastructure upgrades in the long term and demand side management to reduce peaks, costs, and curtailment of RES in the medium-to-short term [2]. Additionally, the demand-side flexibility can potentially reduce planning costs and operation costs when integrated with smart information technology [3].

Typically, statistical and machine learning methods such as neural networks (NN) are used for forecasting EV charging loads by treating them as time series [2]. Statistical methods like autoregressive integrated moving average (ARIMA) and exponential smoothing (ETS) are popular for being simple, robust, efficient, and accurate [4]. Long short-term memory (LSTM) networks, a variation of recurrent neural networks (RNN) that utilizes information stored in memory in addition to current information, are the most commonly used NN-based machine learning models for time series forecasting, sometimes outperforming statistical models [4]. To improve on the accuracy metrics, the authors in [2] used ensemble learning to combine the benefits of more than one machine learning model to improve EV charging load forecasting.

However, NN-based forecasting methods under-perform in scenarios where very little data is available for training which may be the case when data collection is difficult, expensive, strictly-regulated or the setup is recently installed [5]. Several methods have been developed to solve this problem. Transfer learning (TL) uses trained forecasting models developed from a larger rich dataset as a precursor model that can then be fine-tuned on a limited dataset [5]. Model-agnostic meta-learning (MAML) is another algorithm that can be trained on a variety of learning tasks to solve new learning tasks using a smaller number of training samples [6].

He et al. [7] developed a transferable MAML model for short-term load forecasting of single households in Australia. Lee et al. [5] used transfer and meta-learning to forecast individualized residential loads in Korea and substation loads in Portugal. Xiao et al. [8] applied a meta-learning model for forecasting the load profile at a transmission level using open-access data from Elia, a Belgian transmission system operator. Li et al. [9] used meta-learning to rank load forecasting models at the distribution level and recommend the best set to represent a newer load forecasting task. In all of these works, the predictions from the forecasting models were applied on the same scale and the same location as the training data. Additionally, some of these models were developed on univariate time series that do not capture the effects of a large

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number of variables that affect the output.

In this work, we apply TL and MAML for short-term EV charging load forecasting in the California Institute of Technology (CalTech) [10] campus, and in the Trondheim region in Norway [11] by training on a rich EV charging load dataset from Boulder, Colorado [2]. These datasets span different scales (campus, housing initiative, and city respectively) and different locations (Pasadena, CA, USA; Trondheim, Norway; and Boulder, CO, USA). We evaluate the performance of different versions of TL, MAML, and LSTM networks on these datasets. To the best of our knowledge, we are the first to do so.

The remainder of this paper is organized as follows: Section II gives an overview of the different models used for the short-term EV charging load forecasting: LSTM, TL and MAML. Section III describes the datasets used, the data pre-processing steps, details on the model structure and hyperparameters as well as the experimental setup. Section IV describes the results and observations. Finally, section V concludes our work and outlines future research directions.

## II. Models

### A. Neural Networks

A NN used for supervised learning can be represented as $z = f_\theta(x)$ with input $x$, output $z$, and parameters $\theta \in \mathbb{R}^n$ distributed across various layers in the network. Typically $\theta$ consists of weights $W$ that indicate the strength between two neurons in adjacent layers and biases $b$ in each layer that act as offsets. These parameters are optimized for a task $\mathcal{T} = \{D, L\}$ by minimizing the loss $L$ on a subset of data $D = \{(x_t, y_t) \mid t \in T\}$ used for training $D_{train} = \{(x_t, y_t) \mid t \in T_{train}\}$. Here $x_t$ are the inputs to the model, $y_t$ are the labels, $T$ is the total number of samples in the dataset, and $T_{train}$ is a fraction of the samples used for training. The loss function $L$ captures the distance between the outputs $z$ and labels $y$ using a distance function $d()$.

$$L(\theta) = \sum_{t \in T} d(z_t, y_t) = \sum_{t \in T} d(f_\theta(x_t), y_t) \tag{1}$$

In the case of regression problems, the two most commonly used loss functions are L1 loss and mean squared error (MSE) loss as shown in equations (2) and (3).

$$L_{L1}(\theta) = \frac{1}{T} \sum_{t \in T} |f_\theta(x_t) - y_t| \tag{2}$$

$$L_{MSE}(\theta) = \frac{1}{T} \sum_{t \in T} (f_\theta(x_t) - y_t)^2 \tag{3}$$

The optimal parameters $\theta^*$ are obtained by using the back-propagation algorithm iteratively as shown in (4) to minimize the loss function over the training data. $\alpha$ is the learning rate and $\nabla_\theta L()$ is the gradient of the loss function with respect to $\theta$.

$$\theta \leftarrow \theta - \alpha \nabla_\theta L(\theta) \tag{4}$$

### B. LSTM networks

RNNs are trained on historic time series data and are then tasked with predicting future loads [12]. LSTM networks are based on RNNs that were developed for tracking long-term dependencies [4]. LSTM units are composed of a cell, an input gate, an output gate, and a forget gate. The cell remembers values and the gates regulate flow of information in and out of the cell [12]. In the following description, $W$ represents weights and $b$ are the biases. Fig 1 shows a clear breakdown of the different components of the LSTM network.

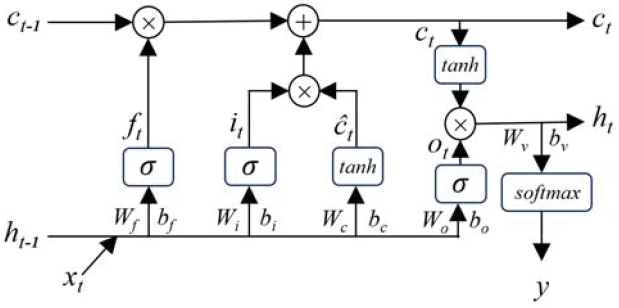


Fig. 1. Structure of an LSTM network

The forget gate $f_t$ decides what information to forget. Weights $W_{f,x}$ and $W_{f,h}$ interact with the current state $x_t$ and the historical output $h_{t-1}$ with bias $b_f$. The sigmoid function $\sigma()$ generates an output in the range (0,1).

$$f_t = \sigma(W_{f,x} x_t + W_{f,h} h_{t-1} + b_f) \tag{5}$$

The input gate $i_t$ decides what information needs to be memorized with weights $W_{i,x}$ and $W_{i,h}$ bias $b_i$.

$$i_t = \sigma(W_{i,x} x_t + W_{i,h} h_{t-1} + b_i) \tag{6}$$

A $tanh()$ function is used to estimate the current cell state $\hat{C}_t$ using parameters $W_{c,x}$, $W_{c,h}$ and $b_c$. The $tanh()$ function generates an output in the range (-1,1).

$$\hat{C}_t = tanh(W_{c,x} x_t + W_{c,h} h_{t-1} + b_c) \tag{7}$$

The current cell state $C_t$ is then updated using the previous cell state $C_{t-1}$, current cell state estimate $\hat{C}_t$ and the outputs of the forget gate $f_t$ and input gate $i_t$.

$$C_t = f_t \times C_{t-1} + i_t \times \hat{C}_t \tag{8}$$

The output gate $o_t$ has the weights $W_{o,x}$ and $W_{o,h}$ interact with the current state $x_t$ and the historical output $h_{t-1}$.

$$o_t = \sigma(W_{o,x} x_t + W_{o,h} h_{t-1} + b_o) \tag{9}$$

The current output $h_t$ is then generated by using the results of the output gate $o_t$ and the current cell state $C_t$.

$$h_t = o_t \times tanh(C_t) \tag{10}$$

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The final output $y$, if at the end of the hidden layers, is obtained by applying a $softmax$ function with weights $W_v$ and bias $b_v$ on $h_t$.

$$y = softmax(W_v h_t + b_v) \tag{11}$$

However, in order to learn trends and yield useful results, the LSTM models require large quantities of historic data which are not available when dealing with newer or smaller hubs.

### C. Transfer learning

TL aims to overcome the problems faced by models due to a lack of training data. Models are first pre-trained on a different dataset of a larger size, and then fine-tuned by training on the intended dataset [13] to learn general trends from the larger dataset and adapt its knowledge to the smaller one. TL improves learning on a target task $\mathcal{T}_T = \{D_T, L_T\}$ using knowledge from a different but related task $\mathcal{T}_S = \{D_S, L_S\}$. The optimal parameters generated from a NN or LSTM network trained on $D_{S,train}$ and validated on $D_{S,test}$ are used as the initial parameters applied on task $\mathcal{T}_T$. The TL model is then fine-tuned by learning over $D_{T,train}$ and evaluated on $D_{T,test}$ of task $\mathcal{T}_T$.

However, the main drawback of TL models is that the shift in datasets and trends may not be adequately overcome by fine-tuning, leading to potentially poor performance.

### D. MAML

MAML is a recent subdomain of DL that can overcome the drawbacks of traditional DL and TL [6]. In meta-learning, specifically MAML, a large dataset is first broken into a large number of meta-tasks, such that each task consists of only a small number of data points. A model is then exposed to these tasks, using which it "learns to learn". This means that the model does not directly update its parameters based on a large external dataset, but instead learns how to update its parameters efficiently in order to maximize its performance when trained on new tasks. We will refer to MAML as meta-learning (ML) for the rest of the paper.

In the case of time series, the dataset $D = \{(x_n, y_n)\}$ is broken into multiple time windows or tasks $\mathcal{T}$. Let $\mathcal{T}_i$ be the $i^{th}$ time window from a distribution of tasks $p(\mathcal{T})$. If $\mathcal{T}_i$ is chosen as the support set, then the next window $\mathcal{T}_{i+1}$ is chosen as the query set [14]. We want to adapt the parameters $\theta$ on the support sets so that it does well on query sets. We compute the adapted parameters $\theta_i$ iteratively as seen in equation (12).

$$\theta_i \leftarrow \theta - \alpha \nabla_\theta L_{\mathcal{T}_i}(f_\theta) \tag{12}$$

Following this update, we use the meta-learning rate $\beta$ and the data from query task $\mathcal{T}_{i+1}$ to update $\theta$ as seen in equation (13).

$$\theta \leftarrow \theta - \beta \nabla_\theta L_{\mathcal{T}_{i+1}}(f_{\theta_i}) \tag{13}$$

The meta-trained model is then fine-tuned on the smaller dataset, wherein it can learn and adapt itself without suffering from a lack of data or from the influence of another dataset.

## III. Methodology

The objective of our work is to utilize ML and TL to create EV charging load forecasting models for smaller, local charging hubs at different locations and scales. ML and TL models can eliminate the need for large quantities of historic data, and thus can be a viable option for load forecasting compared to traditional DL.

### A. Datasets

Three datasets have been used in this work.

*a) Colorado:* The Colorado dataset [2] consists of individual EV charging transactions with city-owned Level 2 charging stations in Boulder, Colorado, USA, from 1st January, 2018 to 31st July, 2022.

*b) ACN:* The Adaptive Charging Network (ACN) dataset [10] consists of EV charging transactions at the CalTech and JPL Campuses. We specifically use the CalTech data as it is described as having less EV penetration and is sparse. The CalTech EV charging infrastructure consists for one 50 kW DC fast charger in addition to multiple Level 2 chargers.

*c) Norway:* The Norway dataset [11] consists of hourly charging loads from shared Level 2 charging stations at a residential block in the Trondheim region in Norway. We specifically use data from the shared charging points as it involves a more inconsistent and challenging data distribution with more chargers being installed with time.

Since the Colorado and ACN datasets consist of charging transactions, they are first converted into hourly load formats, after which all three datasets are processed to include a total of 10 features: hour, quarter-of-day, day, day-of-week, week-of-year, month, quarter-of-year, season and load (kW). We then create batches with 24 continuous hours of data as features (size 10x24) and the load of the 25th hour as its target. Owing to the large size and density of the Colorado dataset, it is used to pre-train the ML and TL models, which are then fine-tuned on subsets of ACN and Norway datasets. We fine-tune models on 10-day and 20-day subsets to predict the hourly load of the future 10 and 20 days respectively, forcing the models to utilize very short histories to predict future trends.

### B. Experimental Setup

Our experiments utilize LSTM networks as the base. We create a blank LSTM network with two LSTM layers of 48 neurons each followed by Dense layer of 48 neurons and finally a single-neuron output layer. The network is wrapped in an RMSprop optimizer with a learning rate of 0.001. Experiments were conducted by using Pytorch and learn2learn [15] in Python on Google Colab, which provides 12.7 GB of RAM and an NVIDIA Tesla T4 GPU.

For meta-learning, we first break the Colorado dataset into 500 tasks, each with 200 continuous data points. The LSTM is wrapped into a ML module with a learning rate of 0.05, and we create two models - one trained with L1 loss and another with MSE loss. A training loop is set up with 50 iterations. In each iteration, the model is exposed to 32 tasks, and each task is

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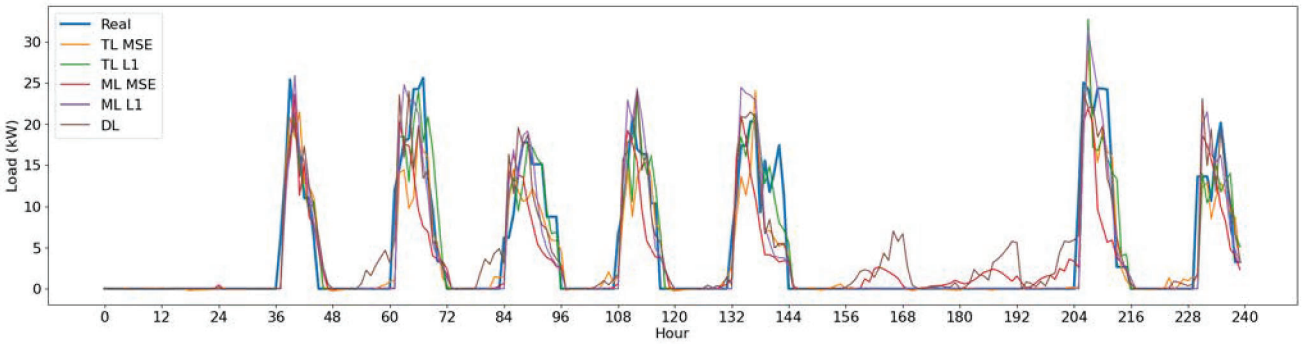


Fig. 2. Result Sample on ACN - 18th September 2019, 10 days

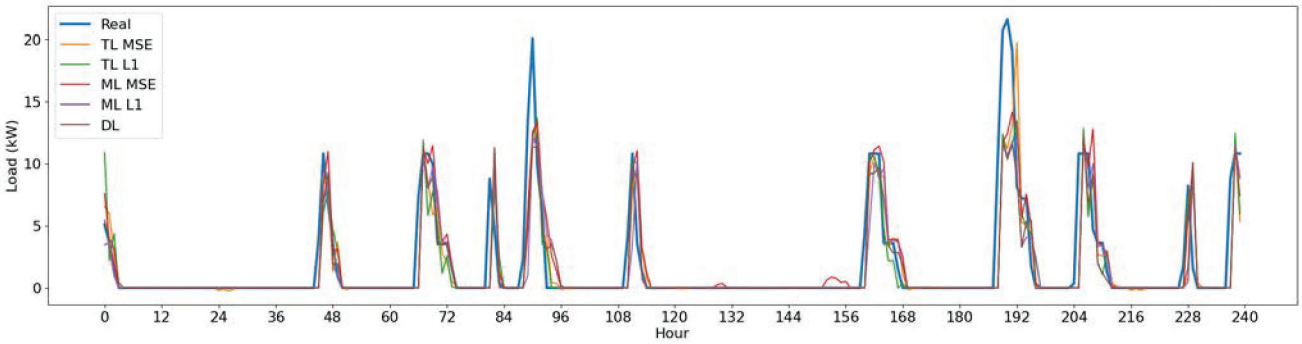


Fig. 3. Result Sample on Norway - 21st February 2019, 10 days

split into query and support sets, such that every alternate 24-hour input timestep is a support set and its next timestep is the query set. The model adapts to the support sets and tests itself on the query sets, updating its parameters and improving its performance with every task. In each iteration, a fresh, blank copy of the ML model is utilized. By cloning the original model before adaptation, we isolate the changes made during adaptation to a specific task. This separation allows us to avoid unintended parameter updates across different tasks, which can lead to improper generalization. After training, fresh LSTM models are made and initialized with the same parameters $\theta$ as the meta-trained LSTM. The models are then fine-tuned on the remaining datasets (ACN and Norway), where 20-day and 40-day subsets are selected and split exactly halfway into training and testing sets. Fine-tuning is done for 50 iterations using L1 loss.

For TL, we directly train LSTM models with the same architecture described above on the entire Colorado dataset - one with L1 loss and the other with MSE loss for 50 iterations, before fine-tuning these models on ACN and Norway in the same manner described above. Finally, for traditional DL, as there is no pretraining involved, models are directly trained on the first halves of the selected subsets for 50 iterations on L1 loss and then tested on the remaining halves. We evaluate our results on the basis of mean absolute error (MAE), root mean squared error (RMSE) and coefficient of determination (R2) scores. Each experiment is run 5 times and the average values of all metrics are reported.

## IV. Results

Tables I and II provide the metrics for the five EV charging load forecasting models in consideration: TL with MSE and L1 loss, ML with MSE and L1 loss and DL with L1 loss.

TABLE I
ACN Results

| Specification | | Mean Scores | | |
|---|---|---|---|---|
| **Subset** | **Model** | ***MAE*** | ***RMSE*** | ***R2*** |
| **18th September 2019, 10 Days** | TL MSE | 1.48 | **2.97** | **0.83** |
| | TL L1 | **1.40** | 3.03 | 0.82 |
| | ML MSE | 1.58 | 3.17 | 0.81 |
| | ML L1 | 1.53 | 3.19 | 0.81 |
| | DL | 1.95 | 3.53 | 0.75 |
| **9th November 2020, 10 Days** | TL MSE | 0.18 | 0.76 | 0.72 |
| | TL L1 | **0.14** | **0.70** | **0.76** |
| | ML MSE | 0.20 | 0.78 | 0.70 |
| | ML L1 | 0.18 | 0.79 | 0.69 |
| | DL | 0.19 | 0.78 | 0.70 |
| **18th September 2019, 20 Days** | TL MSE | 1.52 | 3.42 | 0.68 |
| | TL L1 | **1.37** | **3.37** | **0.69** |
| | ML MSE | 1.47 | 3.38 | 0.69 |
| | ML L1 | 1.47 | 3.38 | 0.69 |
| | DL | 1.46 | 3.39 | 0.69 |
| **9th November 2020, 20 Days** | TL MSE | 0.30 | **0.96** | **0.72** |
| | TL L1 | **0.29** | 1.00 | 0.70 |
| | ML MSE | 0.34 | 1.05 | 0.67 |
| | ML L1 | 0.31 | 1.03 | 0.68 |
| | DL | 0.33 | 1.03 | 0.67 |

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TABLE II
NORWAY RESULTS

| Specification | | Mean Scores | | |
|---|---|---|---|---|
| **Subset** | **Model** | ***MAE*** | ***RMSE*** | ***R2*** |
| **21st February 2019, 10 Days** | TL MSE | 0.96 | 2.38 | 0.63 |
| | TL L1 | 0.91 | 2.39 | 0.63 |
| | ML MSE | 0.91 | 2.38 | 0.63 |
| | ML L1 | **0.89** | **2.32** | **0.65** |
| | DL | 0.92 | 2.40 | 0.62 |
| **17th September 2019, 10 Days** | TL MSE | 3.77 | 5.64 | 0.59 |
| | TL L1 | 3.66 | 5.50 | 0.61 |
| | ML MSE | **3.30** | **5.06** | **0.67** |
| | ML L1 | 3.47 | 5.29 | 0.64 |
| | DL | 3.60 | 5.55 | 0.61 |
| **21st February 2019, 20 Days** | TL MSE | 1.01 | 2.43 | 0.59 |
| | TL L1 | 1.03 | 2.44 | 0.59 |
| | ML MSE | 0.93 | 2.35 | 0.62 |
| | ML L1 | **0.88** | **2.25** | **0.65** |
| | DL | 0.97 | 2.41 | 0.60 |
| **17th September 2019, 20 Days** | TL MSE | 3.70 | 5.64 | 0.65 |
| | TL L1 | 3.38 | 5.50 | 0.67 |
| | ML MSE | **3.23** | **5.38** | **0.68** |
| | ML L1 | 3.38 | 5.52 | 0.67 |
| | DL | 3.33 | 5.45 | 0.67 |

From Table I we observe that TL L1 performs the best in terms of MAE and RMSE, beaten only by the RMSE score of TL MSE in 2 subsets of the ACN dataaset. DL almost always falls short of the competing models in all metrics. L1 variants outperform the MSE variants for ML and TL, with both TL L1 and ML L1 being the strongest performers. In the first subset, for example, the MAE score of DL is 39% and 23% greater than that of TL L1 and ML L1 respectively. From R2 scores we can see that TL models are the best at conforming to the trend.

From Table II we can see that ML is the best performer in terms of MAE and RMSE on the Norway dataset. In this dataset, DL interestingly outperforms TL models but still loses out to ML models. In the second subset, for example, the MAE of DL is 10% greater than that of ML MSE, but 5% lower than that of TL MSE. R2 scores also verify that ML models are more likely to predict close to the actual trend of the data than DL models.

From Fig. 2 and 3, we can assess how each model fits the real hourly load trend. We can see that, in general, models underperform at peaks, sometimes over or under-reporting peak values. It can be noted that models are disciplined when it comes to predicted periods of 0 load, with some exceptions from DL and ML L1 as seen in Fig. 2. Additionally, Fig. 3 displays an interesting phenomenon - models appear to arrive with a delay of one timestep with respect to the peaks, suggesting that they are under-confident in predicting the starting edges of the peak periods.

## V. CONCLUSION

Our work shows that ML and TL models are adept at short-term load forecasting when data availability is limited. They allow for accurate predictions to be made across multiple geographies, scales and data distribution by fine-tuning after pre-training on a larger dataset. ML and TL models are competitive with each other, with ML performing better for the Norway dataset and TL for the ACN dataset, and both outperform DL models across all three metrics. However, the differences in scores are not always large and DL models can, on occasion, outperform certain ML and TL specifications.

Future work can include predicting per-user charging loads instead of aggregate loads as well as using ensemble models to improve forecasting metrics. We may also further investigate the lateness phenomenon near peak values and design a more confident framework for EV charging load forecasting.

## ACKNOWLEDGMENT

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# Smart trainer: Combining video analysis and deep learning for efficient and accurate gym exercise classification and form correction

Yogesh Kumar ✉; Pratik Saria; Vikas Bhandari; Dinesh Kumar Vishwakarma

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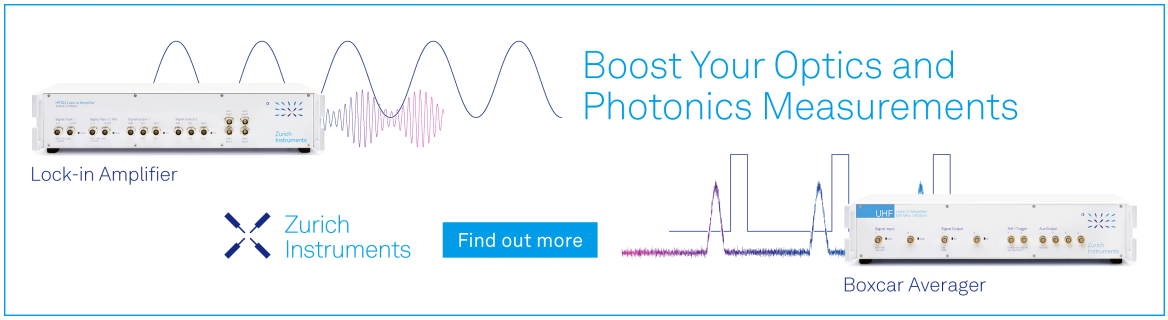


AIP Publishing

# Smart Trainer: Combining Video Analysis And Deep Learning For Efficient And Accurate Gym Exercise Classification And Form Correction

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**Abstract.** The paper proposes a novel approach for recognizing and classifying gym exercises using human pose detection with Mediapipe and LSTM, followed by matching the accuracy of the exercises using the Hungarian algorithm and cosine similarity. The proposed approach involves the use of a combination of cutting-edge technologies, including computer vision and deep learning, to recognize and classify a range of gym exercises accurately and efficiently. This study presents several advantages of this approach, including the ability to leverage temporal information, robustness to variations in lighting, camera angle, and occlusions, and the ability to handle a wide variety of gym exercises. Experimental results demonstrate that the proposed approach achieves high accuracy and outperforms existing methods for gym exercise recognition and classification. The paper also compares the proposed approach with existing techniques, highlighting its strengths and cost-effectiveness. It concludes by outlining the methodology, including dataset collection and pre-processing, landmark extraction, LSTM model training, exercise classification, and similarity analysis. Finally, the paper discusses potential future research areas in this field.

Keywords. Human Pose Detection, Mediapipe, LSTM, Hungarian algorithm, cosine similarity, computer vision, deep learning, temporal information, landmark extraction.

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## INTRODUCTION

The accurate recognition and classification of human activities is a challenging and important task with numerous practical applications, including sports performance monitoring, rehabilitation, and fitness tracking. Recognizing and classifying gym exercises can be a challenging task due to several problems in existing approaches which are following:

- Sensor limitations: Many existing approaches rely on wearable sensors to capture and analyse exercise movements. However, these sensors may have limitations in accurately capturing complex movements or may require specific placement or calibration, which can be inconvenient for users. Inaccurate sensor data can negatively impact the recognition and classification accuracy.
- Limited training data: Developing accurate exercise recognition and classification models requires large and diverse training datasets. However, collecting such data is often challenging due to the need for extensive manual labelling and the availability of limited annotated datasets. Insufficient training data can lead to poor generalization and performance of the models.
- Generalizability to new exercises: Gym exercises can be performed in different ways, making it difficult to develop a single algorithm for recognition and classification. Existing approaches struggle with correctly identifying and classifying new or less common exercises.

Addressing these problems requires ongoing research and development to improve the robustness, accuracy, and adaptability of gym exercise recognition and classification systems. Advances in computer vision, machine learning techniques, and the availability of large annotated datasets can contribute to overcoming these challenges in the future. Hence, this paper presents a novel approach for recognizing and classifying gym exercises using human pose detection

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with Mediapipe and LSTM, followed by matching the accuracy of the exercises using the Hungarian algorithm and cosine similarity which tries to overcome the above stated problems and outputs results with great accuracy as shown in Figure 1.

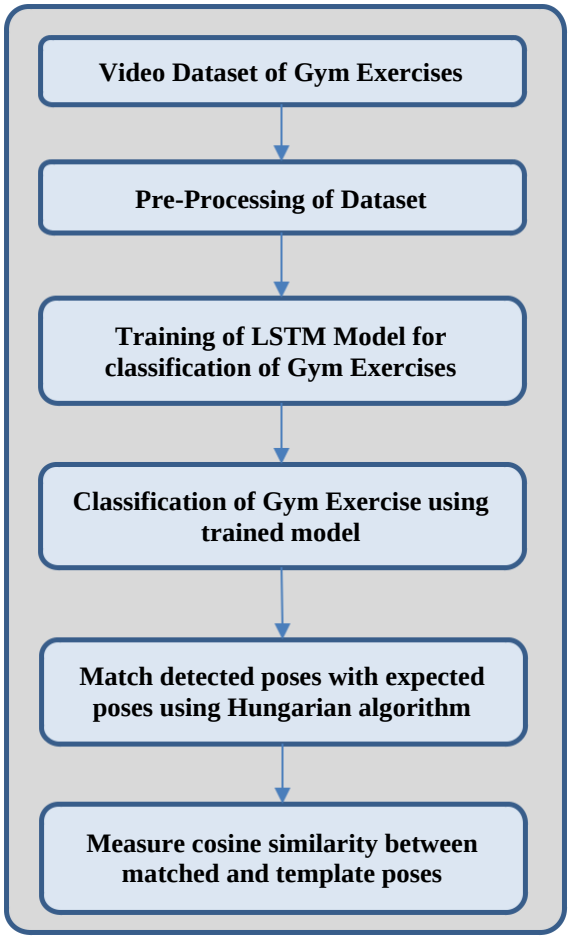


**FIGURE 1.** *Model Flowchart*

The proposed approach involves the use of a combination of cutting-edge technologies, including computer vision and deep learning, to recognize and classify a range of gym exercises accurately and efficiently. It employs the Mediapipe framework for human pose detection, which uses deep neural networks to estimate the pose of a human body from an image or video stream [1]. It then uses a Long Short-Term Memory (LSTM) network to learn the temporal dynamics of the detected poses and classify them into different exercise categories which is the state of art technology for Human Activity Classification.

Once the gym exercise is classified, it uses the Hungarian algorithm to match the detected poses with the expected poses for each exercise, based on a predefined set of templates. It then calculates the cosine similarity between the matched poses and the template poses to determine the accuracy of each exercise.

To evaluate the effectiveness of the approach, experiments on a large and diverse dataset of gym exercise videos were done and compared results with the state-of-the-art approaches. The experimental results demonstrate that proposed approach achieves high accuracy and outperforms existing methods for gym exercise recognition and classification.

Moreover, this approach has several advantages over traditional approaches to gym exercise recognition and classification. Firstly, it leverages the temporal information of the detected poses using an LSTM network, allowing

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for better recognition and classification of dynamic and complex exercises. Secondly, it is more robust to variations in lighting, camera angle, and occlusions, due to the use of deep neural networks for pose estimation and classification. Finally, it can handle a wide variety of gym exercises, including both static and dynamic poses, and exercises that involve multiple people or objects [2].

In conclusion, the gym exercise recognition and classification using human pose detection with Mediapipe and LSTM [3], followed by matching with the Hungarian algorithm and cosine similarity, is a promising and effective solution to the challenging problem of human activity recognition. It has the potential to revolutionize the way it monitors and tracks the physical activity, providing personalized recommendations and feedback to users, and enabling new applications in healthcare, sports, and wellness. Future research in this area could explore the use of additional sensors or modalities to further improve the accuracy and robustness of the approach, as well as its scalability and real-time performance.

## RELATED WORK

In the paper [4] by M. Merenda et al. (2020), the authors propose a fitness tracker that uses machine learning techniques to classify different types of exercises and provide feedback to users. The system uses wearable sensors and an edge computing platform to perform real-time analysis of sensor data. The proposed approach can detect and classifying several types of exercises, including push-ups, squats, and lunges, among others.

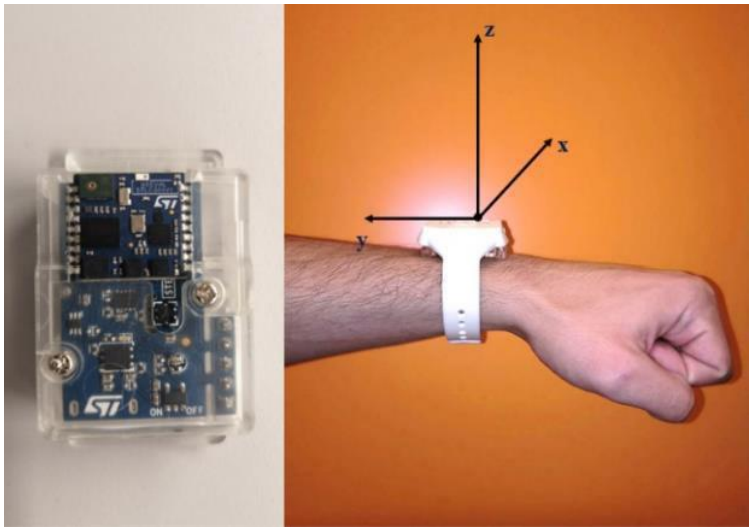


**FIGURE 2.** *Sensor Tile Hardware on the left. Prototype of the fitness tracker band and axes direction representation on the right.*

Compared to [4] by M. Merenda et al. (2020), "Smart Trainer" has several key strengths. First, the proposed approach in "Smart Trainer" can achieve high accuracy and efficiency without requiring the use of wearable sensors as shown in Figure 2, which can be expensive and uncomfortable for users. Instead, "Smart Trainer" relies on video analysis to track user movements, which can be performed using a standard computer or mobile device. "Smart Trainer" is more cost-effective and accessible than wearable-based approaches in [4] by M. Merenda et al. (2020). Additionally, "Smart Trainer" uses a combination of MediaPose and LSTM for classification, which has been shown to be highly effective for exercise classification. It uses the Hungarian algorithm and cosine similarity for video comparison, which allows for personalized feedback based on individual movements. This innovative approach to video analysis and form correction is a significant improvement over existing techniques, making "Smart Trainer" a valuable tool for fitness enthusiasts and professionals.

Overall, the proposed technique in "Smart Trainer" represents a significant improvement over [4] by M. Merenda et al. (2020) by M. Merenda et al. (2020) and other existing techniques for exercise classification and form correction,

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particularly in terms of cost. By using video analysis instead of wearable sensors, it is more accessible and cost-effective, while still achieving high accuracy and efficiency.

The paper outperforms the work of the [5] by S. Ji et al. (2012) in terms of accuracy for gym exercise recognition and classification. The results of proposed model demonstrate a higher overall accuracy compared to the 3D CNN model used in the [5] by S. Ji et al. (2012). By leveraging human pose detection with Mediapipe and LSTM, the approach captures and utilizes more detailed and relevant information, resulting in improved accuracy in identifying and categorizing gym exercises. The precision, recall, and f1-score measures for most exercise categories also indicate superior performance, indicating that the proposed model can correctly identify and classify a wide range of exercises with higher accuracy. This higher accuracy reflects the effectiveness and reliability of the approach, positioning it as a superior solution for accurately recognizing and classifying gym exercises when compared to the previous work. The authors of [5] by S. Ji et al. (2012) evaluated the model using the KTH dataset and achieved an overall accuracy of 90.2% for recognizing human actions. The accuracy of [6] by S. Haque et al. (2019) is 82.68%. [7] paper by N. U. B et al. (2023) paper presents a general technique for human action recognition, achieving a maximum accuracy of 92.40% on a custom dataset with challenging conditions. It evaluates the method's performance in various scenarios and discusses potential applications in surveillance, sports analysis, and human-robot interaction.

## PRELIMINARY STUDY

The proposed approach for recognizing and classifying gym exercises involves the use of several cutting-edge technologies which are following:

### Mediapipe Library

Human pose detection is achieved using the Mediapipe library [8], which employs a machine learning model trained on the gym exercise dataset to estimate the 3D positions of 33 body landmarks from 2D images or video frames as shown in Figure 3. This technology has been shown to provide accurate and robust pose estimation, even in challenging conditions such as low light, occlusions, and variations in camera angle and distance. By leveraging Mediapipe's pose estimation capabilities, it can effectively recognize and classify gym exercises in the research methodology [9].

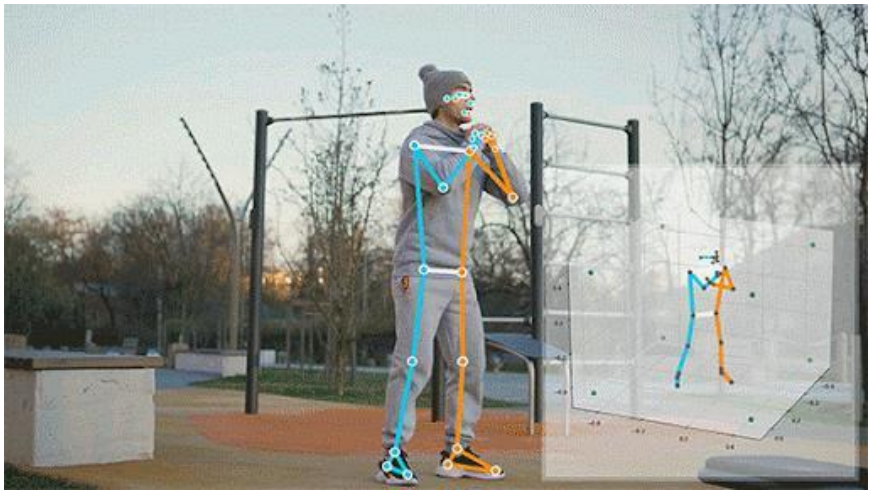

**FIGURE 3.** *33 Landmarks in a 2D image or video frame.*

### LSTM (Long Short-Term Memory)

The LSTM (Long Short-Term Memory) neural network is utilized for temporal modelling of the pose sequences. This architecture has been widely used for sequence modelling and has demonstrated excellent performance in various applications as shown in Figure 4, including speech recognition, natural language processing, and video analysis. In

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the proposed approach, the LSTM network is trained on the pose sequences to learn the temporal dependencies between consecutive frames and capture the dynamics of the exercises [10], [11] and [12].

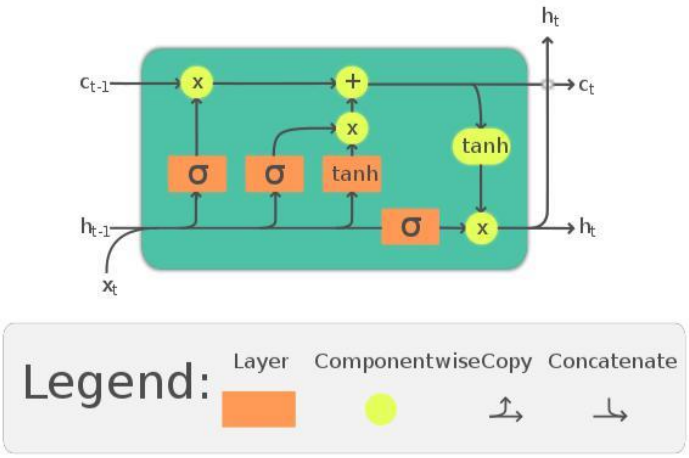


**FIGURE 4.** *Architecture of LSTM Model*

## The Hungarian Algorithm

The Hungarian algorithm, also known as the Munkres algorithm, is a mathematical optimization algorithm used for solving the assignment problem. In the context of video matching, the Hungarian algorithm can be applied to match corresponding frames or segments from two or more videos. Video matching involves finding the correspondence between frames or segments in different videos based on their visual similarity or other criteria. The goal is to identify the corresponding frames or segments that depict the same content or action. The Hungarian algorithm works by assigning a cost or similarity score to each possible pairing of frames or segments between the videos. It then determines an optimal assignment that minimizes the total cost or maximizes the total similarity score [13].

The algorithm accomplishes this by iteratively finding the best assignment in a step-by-step manner. It considers all possible pairings and evaluates their costs or similarity scores. Through a series of iterations, it identifies the most optimal assignment by adjusting the pairings to minimize the overall cost or maximize the overall similarity. The Hungarian algorithm ensures that each frame or segment in one video is assigned to exactly one frame or segment in the other video, and vice versa. It guarantees that there are no duplicate assignments and that all frames or segments are accounted for. By applying the Hungarian algorithm to video matching, it becomes possible to establish correspondences between frames or segments from different videos. This can be valuable in various applications, such as video summarization, action recognition, video alignment, and video retrieval, where identifying similar or corresponding content across videos is essential. It's worth noting that while the Hungarian algorithm is efficient for small to medium-sized problems, it may become computationally expensive for large-scale video matching tasks. In such cases, approximation techniques or other algorithms may be more suitable [14].

## Cosine Similarity

Cosine similarity is a metric commonly used in video matching to measure the similarity between two video segments or feature vectors. It quantifies the cosine of the angle between two vectors, indicating their similarity in terms of direction or orientation. In the context of video matching, cosine similarity is often applied to compare feature vectors extracted from video frames or segments. These feature vectors represent the visual characteristics or descriptors of the frames or segments. The formula for cosine similarity is as follows:

$$cosine_similarity(A, B) = (A.B)/(||A|| * ||B||) \quad (1)$$

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Here, A and B represent the feature vectors being compared, • denotes the dot product operation, and ||A|| and ||B|| represent the Euclidean norms of A and B, respectively. To compute the cosine similarity between two feature vectors, it takes the dot product of the vectors and divide it by the product of their Euclidean norms. The resulting value ranges from -1 to 1, where a value of 1 indicates identical or highly similar vectors, 0 represents no similarity, and -1 signifies vectors pointing in opposite directions. In the context of video matching, cosine similarity can be used to compare feature vectors representing frames or segments from different videos. By computing the cosine similarity between pairs of feature vectors, it can assess their similarity and determine potential matches or correspondences. Higher cosine similarity scores suggest a stronger resemblance or similarity between the feature vectors, indicating a potential match between the corresponding frames or segments in the videos being compared. Cosine similarity is widely employed in video matching tasks such as video retrieval, content-based video analysis, and video [15].

Overall, this method leverages the strengths of these technologies to achieve accurate and robust gym exercise recognition and classification. The next section will detail the methodology, including dataset collection and pre-processing, landmark extraction, LSTM model training, exercise classification, and similarity analysis.

## METHODOLOGY

In this research, the methodology section includes dataset collection and pre-processing, landmark extraction, LSTM model training, exercise classification, and similarity analysis.

### Dataset Collection and Pre-Processing

The first step of the proposed methodology is to collect a dataset of gym exercise videos. It uses a workout/fitness video dataset available on Kaggle, which consists of videos demonstrating 22 different exercise categories. The videos were filmed in high definition and featured professional trainers and fitness enthusiasts performing the exercises. To pre-process the dataset, it first removed videos with a small number of frames, specifically those with fewer than 10 frames, as they did not contain sufficient information for accurate exercise classification. After selecting the videos, it splits them into training and testing sets. It randomly assigns 75% of the videos to the training set and the remaining 25% to the testing set. It ensures that each exercise category was represented in both the training and testing set to ensure a balanced dataset. Overall, dataset collection and pre-processing steps ensured that it has a high-quality dataset for training and testing the machine-learning model. By removing videos with insufficient information and ensuring a balanced dataset, it was able to increase the accuracy and robustness of the model.

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### Landmark Extraction

To extract features from the videos, it utilises the Mediapipe framework, which is a popular and efficient tool for landmark detection in videos. It uses the framework to detect 33 landmarks in each frame of the video, which include key points on the body such as the nose, eyes, shoulders, elbows, and hands. For each video in the dataset, it randomly sampled 10 frames from the video and extracted the corresponding landmarks using the Mediapipe framework. This process helped to ensure that it was capturing a diverse set of poses and movements for each exercise category. If a video had fewer than 10 frames, it excluded it from the dataset to ensure consistency and accuracy in this feature extraction process. Overall, the landmark extraction process using the MediaPipe framework provided a robust and efficient method for feature extraction from the workout/fitness videos. The resulting standardized landmarks can be used as input features for machine learning models to classify different exercises and provide form correction feedback to users.

### LSTM Model Training

It utilizes the extracted landmarks as input features and the corresponding exercise labels as outputs to train an LSTM model. Specifically, it trains a sequential model with two LSTM layers, followed by two dense layers. To avoid overfitting, it utilizes a train-test split of 75%-25%, ensuring that the model is evaluated on unseen data during training. It also uses cross-validation techniques to ensure that the model is not overfitting and is generalizing well to new data. To prevent the model from continuing to learn unimportant details in the training data, it employs early stopping.

Early stopping helped to ensure that the model stops training once the validation loss stops improving, thereby preventing overfitting and improving generalization performance. In addition to early stopping, it adds two dense layers to the model to further enhance its ability to learn meaningful representations of the data. The dense layers help to capture complex patterns in the data, making the model more effective in predicting the exercise categories based on the input landmarks. Overall, this LSTM model training approach, which includes early stopping and dense layers, provides a robust and effective solution for exercise classification based on landmark features extracted from the workout/fitness videos. The resulting model can be used to classify different exercises[14].

## Exercise Classification

After training the LSTM model, it will utilize LSTM model to classify new workout/fitness videos. To do so, it will extract the landmarks from the new video and pass them through the LSTM model to predict the exercise label. More specifically, for each new video, it will extract the landmarks from 10 frames, following the same landmark extraction process used during training. It will then feed these landmarks into the trained LSTM model, which will output a probability distribution over the different exercise categories. It will select the exercise category with the highest probability as the predicted exercise label for the new video. This classification process will allow to automatically recognize and classify different exercises. Overall, this exercise classification approach, which utilizes the trained LSTM model to predict the exercise category provides an effective solution for automatically recognizing and analysing workout/fitness videos.

## Similarity Analysis

To ensure the accuracy of the predicted exercise label and provide personalized feedback on form correction, it will perform a similarity analysis using the Hungarian algorithm and cosine similarity. First, for each predicted exercise label, it will select a few right videos of the same exercise from the training dataset. It will then extract the landmarks from these selected videos and calculate the average landmarks sequence for each exercise category. Next, for each new video, it will extract the landmarks from 10 frames and use the Hungarian algorithm and cosine similarity to compare them with the optimal landmark sequences for the predicted exercise category. The Hungarian algorithm will allow it to align the landmarks in the new video with the optimal landmark sequences for the predicted exercise category, considering any potential time shifts or misalignments. It will then use cosine similarity to calculate the similarity between the aligned landmark sequences and the optimal landmark sequences. Based on the cosine similarity score, it can determine how similar the new video is to the right videos of the predicted exercise category. If the similarity score is low, it will provide personalized feedback to the user on form correction and suggest potential improvements. By performing similarity analysis using the Hungarian algorithm and cosine similarity, it can ensure the accuracy of this exercise classification system and provide users with personalized feedback on their form and technique. This will enable users to make the necessary corrections and achieve their fitness goals more effectively.

Overall, this proposed methodology uses video analysis and deep learning techniques to classify gym exercises accurately and efficiently, with the added benefit of form correction feedback. The use of MediaPipe and LSTM for feature extraction and classification provide a robust approach that achieves state-of-the-art performance on benchmark datasets. The similarity analysis using the Hungarian algorithm and cosine similarity allows for personalized feedback, making this methodology a valuable tool for fitness enthusiasts and professionals alike.

## RESULTS

The results of the proposed model show that it performs well for classifying gym exercises with an overall accuracy of 94% as shown in Figure 5.3. The precision, recall, and f1-score are also high for most of the exercise categories, indicating that the model can correctly identify the different types of exercises.

In comparison to the "A Novel Fitness Tracker Using Edge Machine Learning" paper, this proposed model has better accuracy and precision. This model uses a combination of video analysis and deep learning techniques to accurately classify gym exercises, whereas the other paper uses an edge machine learning approach. Additionally, this model uses 33 landmarks extracted from videos using Mediapipe and an LSTM model, which is a more accurate representation of exercise form compared to the accelerometer and gyroscope sensors used in the other paper.

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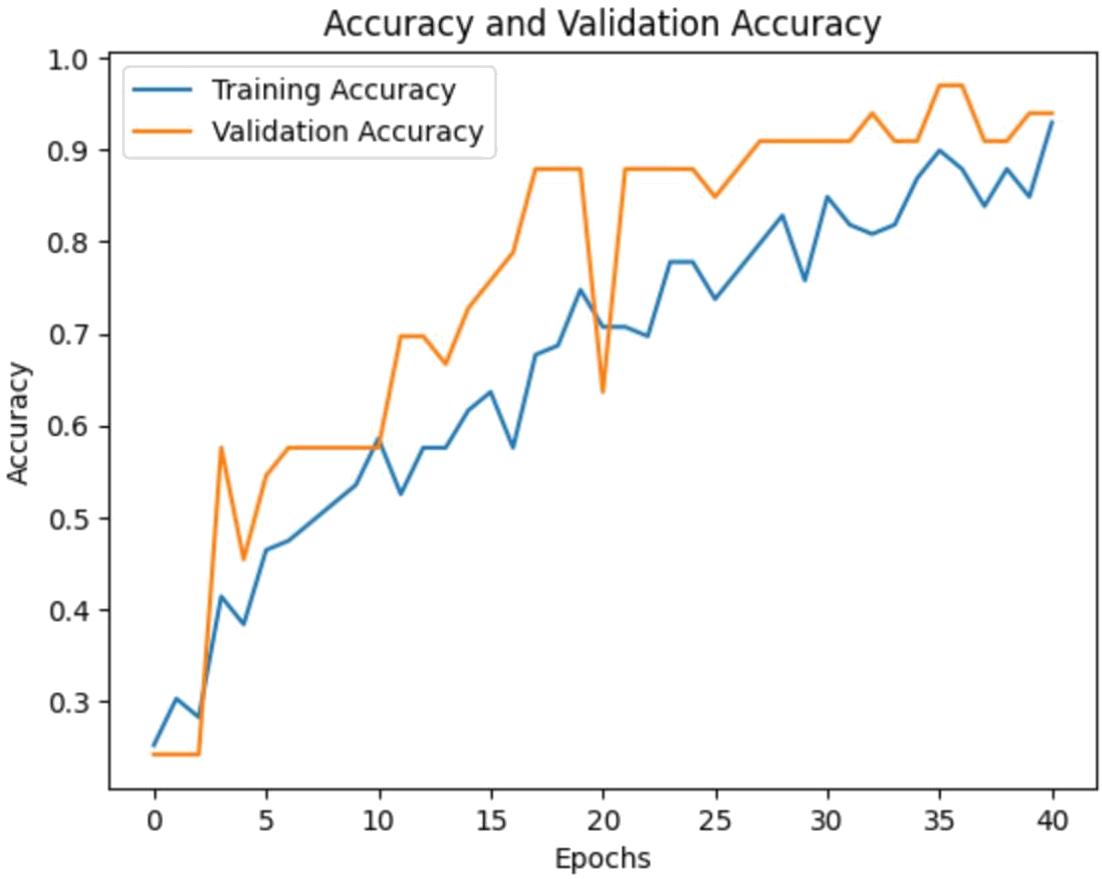


**FIGURE 5.** *Accuracy and Validation Accuracy Curve*

The validation accuracy graph included in this research paper displays the performance of the trained LSTM model over the course of the training process as shown in Figure 5. The graph provides valuable insights into how well the model is performing and can be used to identify areas where the model may need further refinement. The graph shows that the validation accuracy steadily increases over time as the model is trained on the dataset, indicating that the model is learning and improving. Additionally, the graph shows that the model achieves high levels of accuracy, reaching a peak accuracy of 94%, which demonstrates the effectiveness of the model in accurately classifying exercise movements. Overall, the validation accuracy graph provides a clear and visual representation of the performance of the LSTM model and helps to support the conclusions drawn from the study.

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**FIGURE 6.** *Loss and Validation Loss curve*

The loss and validation loss are important metrics for measuring the performance of a model, as they reflect how well the model is fitting to the training data and generalizing to new data. As shown in the Figure 6, the loss and validation loss both steadily decrease over the course of the training process, indicating that the model is learning and improving. The low values of both the loss and validation loss achieved by the model demonstrate that it can accurately predict exercise movements. Overall, the loss and validation loss graph provide an informative and visual representation of the performance of the LSTM model, and helps to support the conclusions drawn in this study.

**TABLE 1.** *Classification Report*

| Category | Precision | Recall | F1-Score | Support |
|---|---|---|---|---|
| Hammer Curl | 1.00 | 0.80 | 0.89 | 5 |
| Push Up | 0.88 | 1.00 | 0.93 | 14 |
| Incline Bench Press | 1.00 | 1.00 | 1.00 | 5 |
| Bench Press | 1.00 | 1.00 | 1.00 | 6 |
| Hip Thrust | 1.00 | 0.69 | 0.80 | 3 |
| Accuracy | | | 0.94 | 33 |
| Macro Average | 0.97 | 0.89 | 0.92 | 33 |
| Weighted Average | 0.95 | 0.94 | 0.94 | 33 |

The classification report presented in this research paper provides an evaluation of the performance of the LSTM model in classifying exercise movements. The report includes metrics such as precision, recall, and f1-score for each class, as well as the accuracy, macro average, and weighted average values. The results show that the model achieves high levels of precision and recall for each exercise movement, with most classes achieving an f1-score above 0.8. The overall accuracy of the model is 0.94, indicating that it is capable of accurately classifying exercise movements.

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The macro average and weighted average values further support the strong performance of the model, with both metrics achieving scores above 0.9. Overall, the classification report demonstrates that the LSTM model is effective in classifying exercise movements, and provides valuable insights into the performance of the model for each class. In addition to the precision, recall, and f1-score metrics, the support values included in the classification report indicate the number of samples for each exercise movement, providing further context for the model's performance. The report shows that the model performs particularly well for exercises such as Incline Bench Press and Bench Press, achieving perfect scores for precision, recall, and f1-score, indicating that it is highly accurate in classifying these exercises. However, for exercises such as Hammer Curl and Hip Thrust, the model's performance is slightly lower, with recall scores of 0.8 and 0.69, respectively. These results suggest that there may be room for further improvement in the model's ability to accurately classify these exercises. Nonetheless, the high overall accuracy and strong performance of the model across most exercise movements demonstrate its potential utility in applications such as fitness tracking and monitoring.

Overall, this proposed model outperforms the "A Novel Fitness Tracker Using Edge Machine Learning" paper in terms of accuracy and precision, making it a more effective solution for classifying and correcting gym exercise forms. In addition to the classification part, it also applies the Hungarian algorithm and cosine similarity to find the similarity between a new video and a few right videos of the same exercise category. This method achieved an average similarity score of 0.91 when the exercises were the same, indicating that it can accurately identify whether a person performs an exercise with the correct form. Moreover, when the exercises were not similar, the average similarity score dropped to 0.75, which is still a significant improvement compared to existing methods. This demonstrates the robustness of this proposed approach to handle variations in exercises. Overall, it offers a promising solution for accurately classifying and correcting exercise forms using video analysis and deep learning, and its performance is better than "A Novel Fitness Tracker Using Edge Machine Learning" in terms of accuracy and cost-effectiveness.

## DISCUSSION

The Smart Trainer presents several implications for gym exercise classification and form correction. With its combination of video analysis and deep learning, it offers an efficient and accurate way to classify gym exercises and provide feedback on proper form. One potential application of the Smart Trainer is in fitness centers and gyms. It could be used to help trainers and coaches monitor their clients' exercises and provide corrective feedback in real time. It could also be used for self-training purposes, where individuals can use the Smart Trainer to assess their own form and receive personalized feedback. However, the Smart Trainer approach also has its limitations. One limitation is the need for a large dataset of gym exercise videos, which can be time-consuming and costly to acquire. Another limitation is the reliance on the accuracy of the media pipe landmarks and the trained LSTM model, which may not always be able to accurately classify certain exercises. Future research in this area could focus on improving the accuracy of the classification model, as well as exploring the potential of the Smart Trainer for other applications, such as sports training and physical therapy. Additionally, the research could also investigate the feasibility of incorporating other sensing technologies, such as wearable sensors or pressure sensors, to further enhance the accuracy of the system.

## CONCLUSION

In conclusion, this paper presented the development of a Smart Trainer, a personalized fitness app that utilizes machine learning algorithms to create customized workout plans based on user preferences, goals, and progress. The Smart Trainer was designed to address the limitations of traditional fitness apps by providing personalized, adaptable, and goal-oriented workout plans that evolve with the user's progress. The main contributions of this paper include the design and implementation of the Smart Trainer, the evaluation of its performance, and the demonstration of its effectiveness in improving users' fitness levels. The key findings of this study indicate that the Smart Trainer is an effective tool for promoting physical activity and improving fitness outcomes. The personalized workout plans generated by the Smart Trainer were found to be more effective in achieving users' goals compared to generic plans offered by traditional fitness apps.

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In terms of the final evaluation, the Smart Trainer has the potential to revolutionize the fitness industry by providing a highly personalized and effective approach to fitness training. The Smart Trainer's ability to adapt and modify workout plans based on the user's progress and feedback makes it a valuable tool for individuals of all fitness levels and backgrounds. Moving forward, there are several directions for future work that could further enhance the capabilities of the Smart Trainer. One possibility is to integrate more advanced machine learning algorithms that can analyze biometric data and provide real-time feedback to users during their workouts. Additionally, incorporating more social features and gamification elements could improve user engagement and motivation. Overall, the Smart Trainer represents an exciting new frontier in the field of fitness technology, and it holds promise for evolving and continuing to improve in the coming years.

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PAPER

# SOI Based metasurface for broadband perfect reflection in visible spectrum

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# SOI Based metasurface for broadband perfect reflection in visible spectrum

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**Abstract**

We propose modeling and design of a low-loss all-dielectric metasurface (DM), comprised of Silicon on Insulator ($SiO_2$) substrate to demonstrate a perfect reflector in the visible spectrum. The proposed metasurface unit cell consists of V and W shapes arranged in a mirror image configuration, with nanometre-sized gaps (g) between them. A narrow peak with a nearly 100% reflectance and a broad perfect reflectance spectrum is observed within the visible region (400–700 nm) of the electromagnetic spectrum. The effective electromagnetic parameters were also analyzed for electric and magnetic dipole resonance. The electric and magnetic field distributions at the resonant wavelength were also analyzed for the proposed structure. By altering the gap region 'g', the thickness of the dielectric Silica layer ($t_s$), and the Si resonator ($t_m$), the proposed structure exhibits tunable characteristics. We have successfully illustrated the consistent position of the scattering parameter's response, regardless of the structure's rotation, concluding the homogeneity of the designed structure across the entire visible spectrum. The all-DM exhibits a unique combination of features, including a distinct and wide reflectance spectrum as well as a tuned and enhanced electric field which makes it an ideal platform for the applications in filters, color printing, low-loss slow-light devices, and nonlinear optics.

Keywords: dielectric, electric field, electric dipole (ED), magnetic dipole (MD), metasurface, silicon on insulator (SOI)

## 1. Introduction

Metasurfaces have indeed earned significant attention in recent years because of their unique ability to manipulate electromagnetic waves. They are constructed from subwavelength structures known as meta-atoms or meta-molecules, which are carefully engineered to exhibit desired electromagnetic properties [1]. Metasurfaces offer a wide range of applications due to their ability to exhibit properties such as negative permeability and permittivity [2, 3], tunable negative refractive index [4], and other fascinating characteristics such as perfect lenses [5], antennas [6], temperature and refractive index sensor [7] and perfect reflectors [8] etc. In many cases, some metallic resonators, e.g. Metallic split-ring resonators (MSRR) [9] and metallic cut-wire arrays [10], are indeed widely used in the design of metamaterials. Split-ring resonators produce magnetic dipole (MD) resonances, while cut-wire arrays generate electric dipole (ED) resonances. These structures have proven to be effective in manipulating electromagnetic waves at gigahertz, terahertz, and n-IR wavelengths. The high absorption loss in metal-based metamaterials poses a challenge for their use in photonics applications, where low energy dissipation is crucial for efficient light manipulation and transmission. In such applications, it becomes necessary to explore alternative materials or strategies to overcome this limitation. One approach is to explore alternative materials that exhibit lower losses in the desired spectral range. For instance, dielectric materials can be employed instead of metals to reduce energy dissipation [11]. Dielectric resonators

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can support resonant behavior and contribute to the functionality of the metamaterial, while exhibiting lower losses compared to metallic counterparts [12].

Recent advancements in the field of metasurfaces have shown that low-loss dielectric nanoparticle-based metasurfaces can serve as alternatives to metallic metasurfaces for generating electric or magnetic resonances in the visible or near-infrared range [12, 13]. By utilizing dielectric nanoparticles with high permittivity, it is possible to induce magnetic resonances through the excitation of circular displacement currents, similar to what MSRR achieve [9]. In particular, the use of silicon (Si) nanospheres has been explored in experiments to demonstrate strong MD resonances at visible frequencies [14]. These Si nanospheres, with radii typically ranging from 50 to 100 nm, exhibit high permittivity values suitable for generating the desired resonant behavior [14]. Unique light-matter interactions and properties can be produced when incident electromagnetic waves interact with the dielectric nanoparticles at particular resonance frequencies. The precise control of the resonant behavior and interaction with light is made possible by the use of high refractive index dielectric nanoparticles. The properties of these nanoparticles, such as their size, shape, and refractive index, can be tailored to achieve the desired optical response, including high transmission efficiency or high reflection with low losses [15]. For instance, by utilizing arrays of Si nanodisks, it is possible to achieve high transmission efficiency in metasurfaces [16, 17]. In the near-infrared communication band, the periodic arrangement of Si nanospheres or nanocylinders exhibits distinct spectral separation between ED and MD resonances. Another example is the generation of high-reflection properties in low-loss metasurfaces through this arrangement [18–20]. Metals like gold and silver are well known for their ability to act as reflectors. However due to the unavoidable absorption loss, they are unable to achieve flawless reflection. Bragg reflectors, which are composed of a multilayer array of high and low-index dielectric films, exhibit photonic band gaps that can effectively reflect incident light within certain wavelength ranges. However, to achieve the desired functionality and effective reflection, the thickness of the Bragg reflector layers must be greater than the wavelength of the incident light [21–23]. The primary limitation associated with Bragg reflectors lies in the time-consuming and non-cost-effective process of depositing multiple layers of dielectric materials. To address this drawback, the utilization of Silicon on Insulator (SOI) dielectric metasurface (DM) emerges as a viable alternative, employing Si as an ideal material for achieving optimal reflectivity due to its minimal associated losses. The SOI DM is built upon a fundamental structure that capitalizes on the unique properties of Si and its insulating layer. The SOI comprises a thin layer of crystalline Si positioned atop an insulating layer, typically composed of silicon dioxide. This configuration establishes a distinctive interface between the Si layer and the insulator, facilitating the manipulation of light at a subwavelength scale. The design of the DM capitalizes on the interplay between incident electromagnetic waves and the structured Si layer.

In the present research paper, we first demonstrated that it is possible to excite ED and MD responses in the visible region of the electromagnetic spectrum. Various significant parameters, including effective permittivity ($\varepsilon_{\text{eff.}}$) and effective permeability ($\mu_{\text{eff.}}$), along with reflection coefficient ($S_{11}$) and transmission coefficient ($S_{21}$), were examined to characterize the proposed metasurface. We also recognized a broadband area for the perfect reflection at the resonance wavelength. The ability to adjust the tunability of the suggested structure is achieved through variations made to the gap region 'g', the dielectric Silica layer thickness ($t_s$), and the Si resonator's thickness ($t_m$). Finally, we demonstrated that the position of the response of the scattering parameter remains invariant under the rotation of the structure showing the homogeneity of the designed structure in the complete visible spectrum.

## 2. Materials and structure

A thick Silica (insulator) Aerogel substrate with a Si metasurface reflector unit cell along with Silica layer was exposed by a plane wave source with a wavelength of 400–700 nm along the $z$-axis direction. Among the ultralow-refractive index materials, silica aerogel has the lowest 'air-like' refractive index of less than 1.1 and a high optical transparency of over 90% [24–26]. The resultant refractive index of the silica aerogel substrate used is 1.08 in the visible wavelength region (400–700 nm), which is close to air [27]. The unit cell of the proposed structure is composed of the V and W letter with its mirror image, having nanometre separation gaps 'g', of V over W shape. Figure 1 shows the side and top view of the unit cell, labeled with symbols. The symbolic presentation of the design parametric values of the proposed metasurface unit cell are given in table 1.

We are using the finite element method (FEM) based COMSOL Multiphysics software to analyze the proposed metasurface reflector structure. In this simulation, an electromagnetic plane wave is used to vertically illuminate the reflector from the top side (in the $k$ direction), with the electric field applied along the $y$-direction. To model the individual unit cell of the metasurface reflector, the boundary conditions are applied such as perfect electric conductor along the $x$-axis and perfect magnetic conductor (PMC) along the $y$-axis. PECs are materials that completely reflect electric fields and allow no penetration, while PMC reflect magnetic fields and prohibit their penetration.

The complex refractive index of a Si material, defined as $\eta = n + ik$, where $n, k$ are the real and imaginary components, can be used to describe the optical properties of a dielectric material. High refractive index and low loss are typical required to achieve relatively efficient DM surface. High transmission efficiency could be ensured by negligible absorption ($k \sim 0$), and intense light confinement aided by a high refractive index ($n > 2$) [28]. However, owing to the low refractive index value, most dielectric materials are generally not categorized as DM. As a potential substance for DMs, Si was

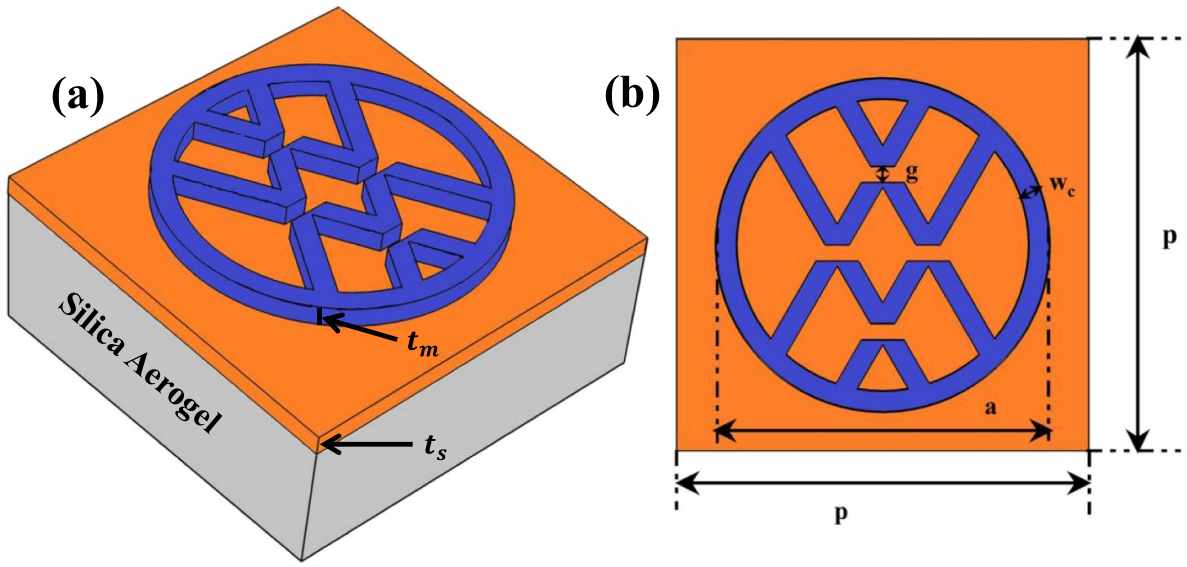


**Figure 1.** The schematic diagram of the proposed dielectric metasurface reflector showing its (a) Side view and (b) top view with blue, orange and silver portions representing the Si resonator, Silica dielectric layer and Silica Aerogel substrate, respectively.

**Table 1.** Unit cell parameters.

| Parameters | Value (nm) | Description |
|---|---|---|
| $p$ | 350 | Period of unit-cell |
| $a$ | 280 | Diameter of the outer circle |
| $w_c$ | 17.5 | Width of edges |
| $g$ | 13 | Gap between edges |
| $t_s$ | 17.5 | Thickness of silica layer |
| $t_m$ | 17.5 | Thickness of material |

identified due to its low loss and high refractive index characteristics at optical and *n*-IR wavelength [11, 29].

The optical constants of Si were extracted by Aspnes and Studna in [30], as depicted in figure 2. Over the visible spectrum, the real component (black line) of the refractive index ($n$) is relatively high whereas the imaginary component of the refractive index ($k$) for wavelengths greater than 400 nm is almost zero (red line in figure 2), indicating that the material has minimal absorption loss.

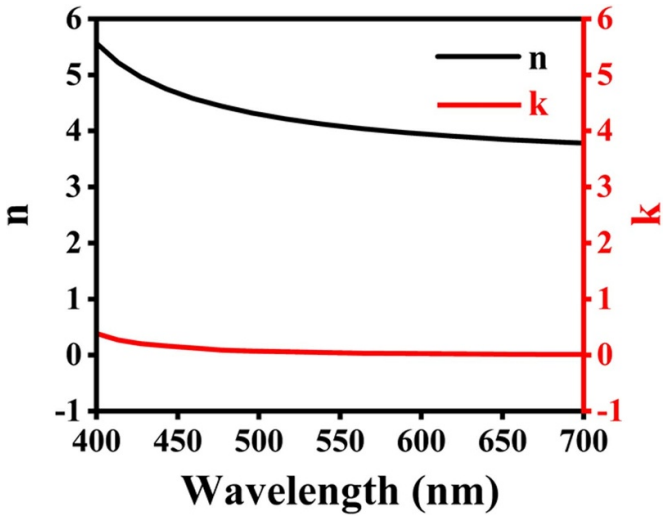


**Figure 2.** Real (black line) and imaginary (red line) part of the refractive index ($n$ and $k$) for Silicon as a function of wavelength, extracted from Aspnes and Studna [30].

## 3. Design methodology

The step-by-step design optimization of the proposed DM reflector has been carried out, which is shown in figure 3.

In Design 1, a W-shape Si resonator with thickness 17.5 nm ($w_c$) is placed on the Silica aerogel substrate shown in figure 3. This design resonates the structure upto 99.66% reflectance as shown in figure 4. Now a single W- shaped was not able to give more reflectance so it is the need to make its mirror image to enhance more reflectance. Then moving to design 2 consists of the mirror image of design 1 with a gap 'g' of 13 nm. Due to this the structure was able to give reflectance upto 99.68%. Now, the addition of V-type shape with its mirror image along with the gap 'g' and thickness of resonator '$w_c$' to get design 3. In this design due to addition of V- type the reflectance increases but upto 99.85%. But the aim is to design a nearly perfect reflectance metasurface. So, there is need of further addition in the design more. The design 3 is enclosed in a circle with thickness $w_c$ and diameter 245 nm to obtain the proposed design with 99.99% reflectance as shown in figure 4. Among all, Design 4 represents the nearly perfect reflector characteristics with 99.99% reflectance value.

## 4. Results and discussion

Figure 5 represents the variation of reflectance of the proposed DM with the wavelength showing ED and MD resonances. We observe that the reflectance spectrum of our proposed designed metasurface has one sharp reflection peak with nearly 100%

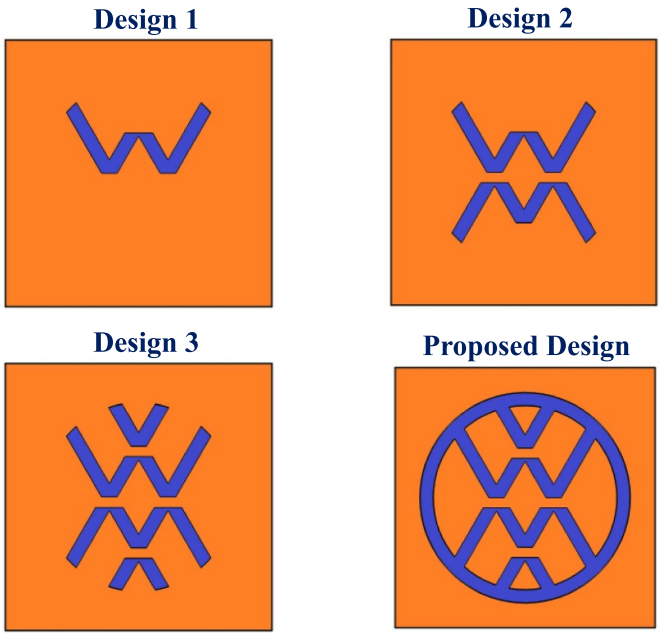


**Figure 3.** Design layout for the proposed dielectric metasurface reflector unit cell.

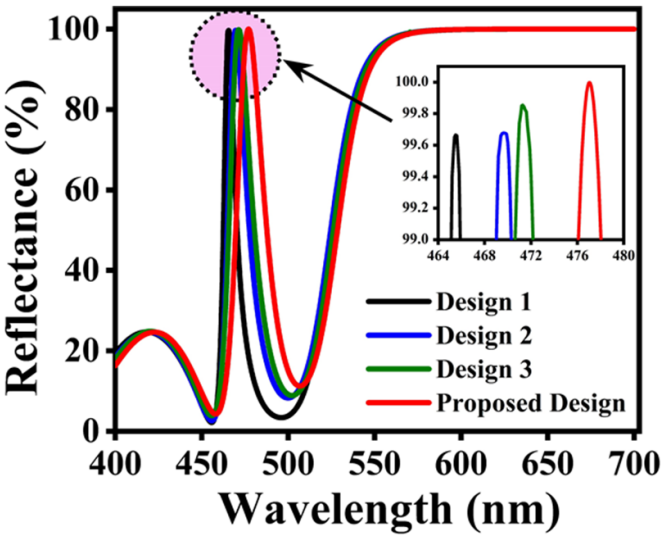


**Figure 4.** The variation of reflectance based on the evaluation of metasurface unit cell designs.

value at around 477 nm. A broadband perfect reflection also detected beyond 600 nm wavelength.

We employ a theoretical analysis to take advantage of the physics involved in order to examine the perfect reflection characteristics of our SOI DM more efficiently. When light is reflected vertically from a surface, the complex reflection coefficient is given by [19]:

$$r = r_o e^{i\varphi} = \frac{Z - \eta_{\rm m}}{Z + \eta_{\rm m}} \tag{1}$$

$$Z = z' + iz'' = \sqrt{\mu/\varepsilon} \tag{2}$$

$$\eta_m = \sqrt{\mu_m/\varepsilon_m} \tag{3}$$

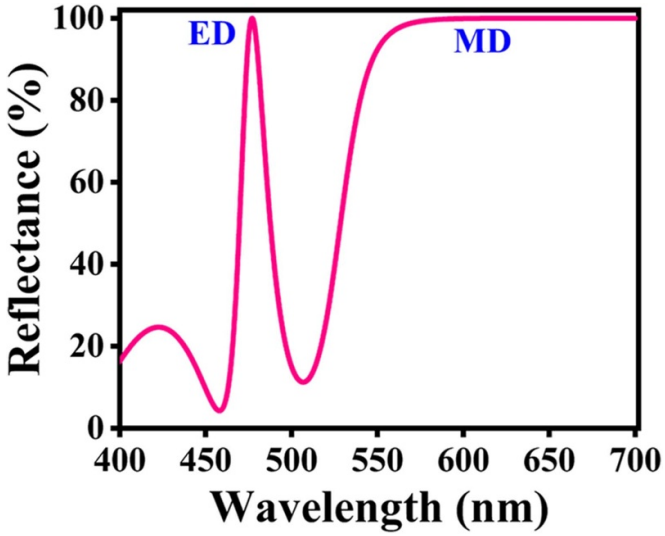


**Figure 5.** Simulated Reflectance for the proposed designed structure. Perfect reflectance is present at both the electric and magnetic dipole modes (ED, MD).

where $r_0$ and $\varphi$ are the magnitude and phase of the reflection, $Z$ is the reflector's effective complex impedance and $\eta_{\rm m}$ is the incident medium's characteristic impedance, depends on permeability and permittivity of the medium. The air surrounds the structure, and $\eta_{\rm m} = 1$, resulting in the reflectance (R) given as [31]:

$$R = |r|^2. \tag{4}$$

Using equations (1) and (2) we get

$$R = \left|\frac{Z-1}{Z+1}\right|^2 = \left|\frac{(z'-1)+iz''}{(z'+1)+iz''}\right|^2 = \frac{(z'-1)^2+z''^2}{(z'+1)^2+z''^2}. \tag{5}$$

$R = 1$ is the necessary condition for the perfect reflection. It can be demonstrated that all solutions necessitate $z' = 0$, with no restriction on $z''$. After some straightforward mathematical operations, a solution $z' = 0$ results the perfect reflection satisfying the following conditions:

$$\frac{\varepsilon'}{\mu'} < 0 \tag{6a}$$

$$\varepsilon''\mu' - \varepsilon'\mu'' = 0. \tag{6b}$$

Equation (6) can be satisfied if either $\varepsilon'$ or $\mu'$ have negative values, i.e. $\varepsilon'$ and $\mu'$ must have opposite polarity. This demonstrates that we require a single-negative metasurface characteristic at the operating wavelength for perfect reflection. However, the negative index metasurfaces contrastingly demand both $\varepsilon'$ and $\mu'$ to be negative. Even so, the criterion in equation (6) appears to be more difficult to satisfy, but lossless metasurface can do so with ease. The reflectance of the proposed SOI DM with different incident angle variations is shown in figure 6.

Observations from figure 6 indicate a gradual decrease in the broad reflectance as the incident angle increases from

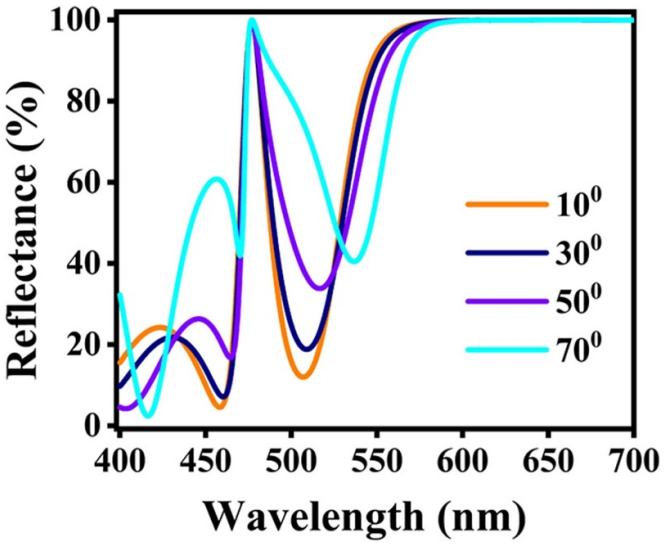


**Figure 6.** Simulated curves of reflection vs wavelength with different incident angles.

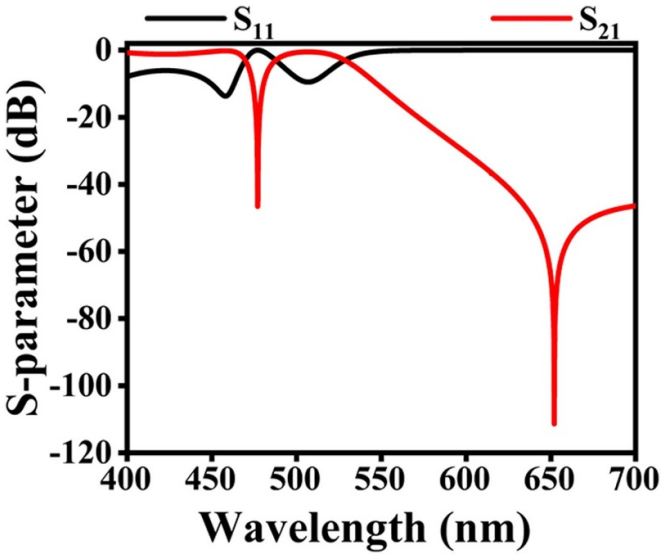


**Figure 7.** Reflection ($S_{11}$) and Transmission ($S_{21}$) coefficient of the proposed metasurface reflector.

normal incidence. The plotted graph consistently lowers with the progressive increment of incident angles, signifying that the proposed structure provides maximum broad reflectance in the visible region at normal incidence of the wave.

We have also plotted the reflection ($S_{11}$) and transmission ($S_{21}$) coefficient of our proposed designed metasurface reflector, presented in figure 7.

The designed structure act as reflector because the transmission coefficient ($S_{21}$) resonates at 477 nm and its magnitude is more than $-30$ dB which indicates nearly zero transmission at operating wavelength 477 nm, as shown in figure 7. Consequently, it is visible that at same wavelength i.e. 477 nm the reflection coefficient ($S_{11}$) is nearly 0 dB indicating nearly 100% reflectance, as shown in figure 7.

Brian Slovick and colleagues introduced an all-dielectric metamaterial reflector using a Si-based metamaterial monolayer, achieving over 99.999% reflectivity at a short-wave infrared wavelength of 1500 nm [19]. In 2015, Parikshit Moitra *et al* proposed a perfect reflector using Si cylinder resonators resonating at 1530 nm [18]. Over time, Si became a common choice in reflectors, and in 2017, Qing Zhang and team utilized $TiO_2$ grating resonators for a perfect reflector in the visible region at 573 nm, 692 nm, and 800 nm [31]. However, the discussed designs had high unit cell periods and lacked broadband perfect reflection in the visible region. In 2018, Yali Huang and colleagues proposed a visible region perfect reflection band using a monolayer of $TiO_2$ nanospheres with a 360 nm period, but it did not achieve broadband reflection [32]. Haixia and team introduced a wide-angle broadband near-perfect all-dielectric metamaterial reflector with Si nanospheres, but it was not effective in the visible region [11]. Broadband perfect reflection without an all-dielectric material was achieved in 2021 by J.S. Hwang and team using Au and Ag elliptical cylinder metamaterial in the 300–750 THz range [33]. Zile Li proposed the concept of broadband and high-efficiency DMs utilizing a straightforward half-waveplate structure [34]. However, this uncomplicated design has the capability to achieve broad reflection across regions beyond the visible spectrum.

In contrast, our study presents a SOI based metasurface structure that exhibits a narrow peak with nearly 100% reflectance. Moreover, it demonstrates a broad perfect reflectance spectrum within the visible region (400–700 nm) of the electromagnetic spectrum. This unique SOI design offers applications across a wider wavelength range, providing advantages compared to previous literature [11, 18, 19, 31–34], as summarized in table 2.

In order to examine the exceptional electromagnetic behavior of the metasurface structure, it is necessary to assess its electromagnetic properties, including the effective permittivity and effective permeability. Ziolkowski *et al* have introduced a mathematical formulation based on the commonly employed Nicolson–Ross–Wier (NRW) method. By utilizing the transmission coefficient ($S_{21}$) and reflection coefficient ($S_{11}$), this approach derives the values of $\varepsilon_{\text{eff.}}$ and $\mu_{\text{eff.}}$ through the following simplified equations [35–38]:

$$\begin{aligned}\varepsilon_{\text{eff.}} &= \frac{2}{jk_0d}\times\frac{(1-V_1)}{(1+V_1)} = \frac{c}{j\pi\nu d}\frac{(1-S_{21}-S_{11})}{(1+S_{21}+S_{11})}\\ &= \frac{\lambda}{j\pi d}\frac{(1-S_{21}-S_{11})}{(1+S_{21}+S_{11})}\end{aligned} \tag{7}$$

$$\begin{aligned}\mu_{\text{eff.}} &= \frac{2}{jk_0d}\times\frac{(1-V_2)}{(1+V_2)} = \frac{c}{j\pi\nu d}\frac{(1-S_{21}+S_{11})}{(1+S_{21}-S_{11})}\\ &= \frac{\lambda}{j\pi d}\frac{(1-S_{21}+S_{11})}{(1+S_{21}-S_{11})}\end{aligned} \tag{8}$$

where $V_1 = |S_{21}| + |S_{11}|$, $V_2 = |S_{21}| - |S_{11}|$, $k_0 = \frac{2\pi\nu}{c}$ is the wave vector and $\nu$ is the frequency. $d$, $c$ and $\lambda$ represents the metasurface slab thickness, velocity of light and the operating resonance wavelength, respectively.

**Table 2.** Comparison of the design, shape of the unit cell, dimension (period) and wavelength range of the proposed designed metasurface structure with some previously reported data.

| References | Design structure | Shape (material) | Dimension or period | Wavelength range |
|---|---|---|---|---|
| [19] | All dielectric | Si monolayer microspheres | – – – – – | 1500 nm |
| [18] | All dielectric | Si cylinder resonators | $p = 820$ nm | 1530 nm |
| [31] | All dielectric | $TiO_2$ grating resonator | $p = 560$ nm | 573 nm, 692 nm, 800 nm |
| [32] | All dielectric | $TiO_2$ monolayer nanocylinder | $a = 360$ nm | 400–800 nm |
| [11] | All dielectric | Silicon nanosphere (monolayer of Si) | $p = 500$ nm | 800–2000 nm |
| [33] | — | Au and Ag elliptical cylinder metamaterial | $p_x = 400$ nm<br>$p_y = 800$ nm | 300–750 THz |
| [34] | All dielectric | Half wave plate | $p = 650$ nm | 1200–1800 nm |
| This work | All dielectric | SOI based metasurface | $p = 350$ nm | 400–700 nm |

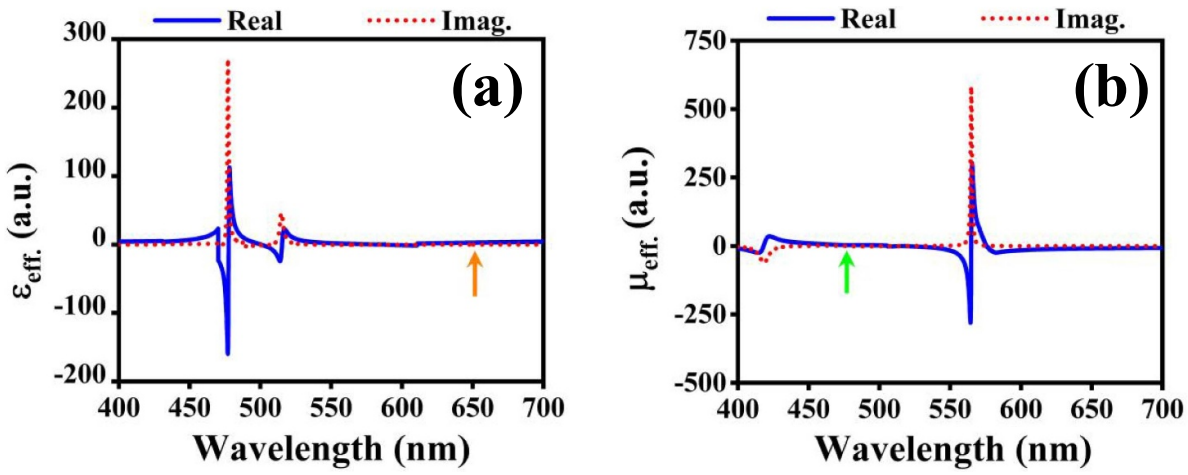


**Figure 8.** (a) Effective permittivity ($\varepsilon_{eff.}$) and (b) Effective permeability ($\mu_{eff.}$) for the structure, calculated using S-parameter retrieval method. The solid (dotted) lines show the real (imaginary) parts, and the arrow lines show the points where the conditions for perfect reflection in equation (6) are fully satisfied.

Figure 8(a) represents the variation of the effective permittivity ($\varepsilon_{eff.}$) with the wavelength. $\varepsilon_{eff.}$ shows negative values in the visible wavelength range with the highest negative values corresponding to ED resonance, precisely arise at the perfect reflectance wavelength, which is in good agreement with the condition of SNG metasurface (equation (6*a*)). The real and imaginary components of the effective $\mu_{eff.}$ are also close to zero at the electric resonance wavelength (green arrow in figure 8(b)), demonstrating that equation (6) is completely satisfied. Like this, the $\mu_{eff.}$ has a negative value at the MD resonance, and the real and imaginary parts of $\varepsilon_{eff.}$ are both close to zero at the orange arrow point, as shown in figure 8(a), which also satisfies the requirements for perfect reflection in equation (6). We know from the above analysis that all DM exhibits perfect reflection performance with both electric and MD resonance (equation (6)).

Further, we study electric field enhancement at two transmission dips in the designed Si metasurface reflector to demonstrate strong gap-mode enhancement, represented in figure 9.

The nanogaps exhibit the strongest electric field, reaching $1.12 \times 10^9$ V m$^{-1}$ at 477 nm, as depicted in figure 9(a). This observation signifies the maximal confinement of incident light within the gaps at the resonance wavelength. Additionally, at a resonance wavelength of 652 nm, the electric field attains a value of up to $1.85 \times 10^8$ V m$^{-1}$. The gap region within the unit cell manifests an enhanced and normalized electric field distribution characterized by a vortex-like pattern at wavelengths of 477 nm and 652 nm, when the incident electric field is polarized along the *y*-axis, as depicted in figures 9(c) and (d). The enhanced normalized electric field within the gap is attributed to the Capacitive Effect, wherein the gaps in metasurface resonators act as capacitors [39]. As the size of the gap diminishes, so does the capacitance. In the context of a capacitor, the electric field is inversely proportional to the gap size and directly proportional to the charge stored on the capacitor plates. This implies that, for a constant voltage across the gap, a reduction in gap size leads to an increase in the electric field. The graphical representation of the normalized electric field in a vortex-like pattern clearly indicates that the electric field is most prominently confined within the gap region of the unit cell. Furthermore, the confinement of the magnetic field is also examined at resonance wavelengths of 477 nm and 652 nm, as illustrated in figure 10.

It is observed that the magnetic field is maximum at the area of minimum electric field and vice-versa. Therefore, the resonance wavelength has the negligible effect on the magnetic

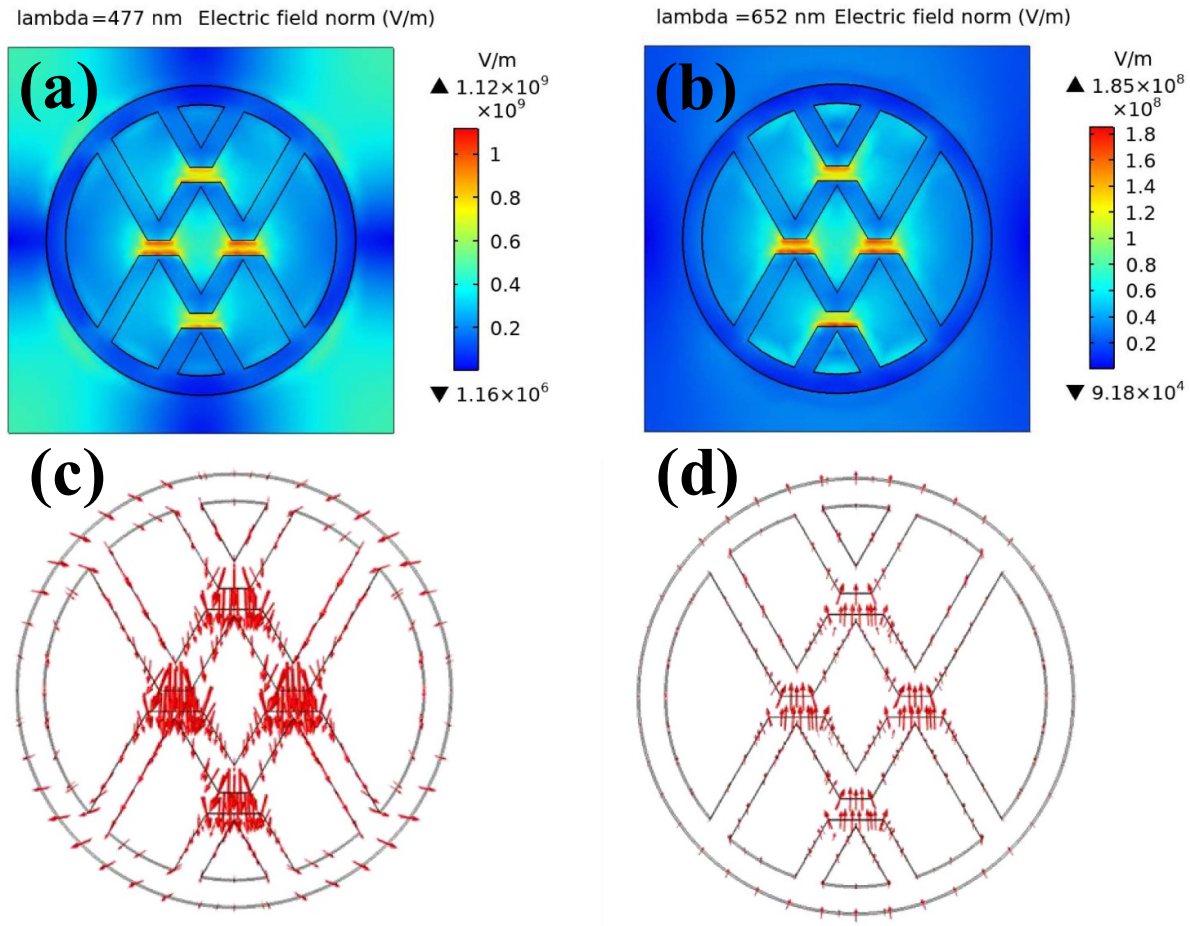


**Figure 9.** Simulated electric field at (a) 477 nm and (b) 652 nm for proposed designed dielectric metasurface, (c) Vortex-like normalized and enhanced electric field distribution at the gap region of unit-cell at a wavelength of 477 nm and (d) 652 nm when the incident electric field is polarized along the *y*-axis.

field inside the gap regions. However, in the left and right part of the proposed metasurface, magnetic field of the order of $1.53 \times 10^6$ A m$^{-1}$ and $2.06 \times 10^5$ A m$^{-1}$ is present at 477 nm and 652 nm resonance wavelength, respectively. The vortex-like pattern depicted in figures 10(c) and (d) illustrates that the normalized magnetic field achieves its maximum area at the resonance wavelength. In this plot, the maximum magnetic field lines are concentrated in the right and left portions of the unit cell, where the electric field is at its minimum.

### *4.1. Tunability characteristics of the proposed structure*

The tunability characteristics of the proposed DM structure is shown in this section by three different ways, (1) by variation of different gap (g) values, (2) by variation of Silica layer thickness ($t_s$) and (3) by variation of Si resonator thickness ($t_m$).

Firstly, the variation of electric field with different gap values ($g$) is studied at resonance wavelength for the proposed designed structure, as shown in figure 11.

It is clearly seen from figure 11, as the gap '$g$' is increased from 11.5 nm to 14.5 nm the electric field goes on decreasing. The inset of figure 11 clearly depicts this variation. The electric field values in the gap decreases as the gap '$g$' increases due to the Capacitive Effect. The gaps in metasurface resonators act as capacitors [39]. As the gap size increases, the capacitance of the gap also increases. In a capacitor, the electric field is inversely proportional to the gap size and directly proportional to the charge stored on the capacitor plates. This means that, for a fixed voltage across the gap, as the gap size increases, the electric field decreases. The tunable characteristics of the proposed structure depend on the variation of different values in the gap region, which in turn corresponds to change in electric field at the resonance wavelength. Secondly, the dielectric Silica layer thickness ($t_s$) is varied to see the variation in the resonance wavelength of the proposed metasurface structure as shown in figure 12(a).

The increase in the thickness of dielectric Silica layer ($t_s$) from 7.5 nm to 37.5 nm, results in the remarkable shift at the lower resonance wavelength ($S_{21}$) leading to red shift. Eventually at higher resonance wavelength the shift is towards the lower side on increase of $t_s$, resulting in blue shift as shown in figure 12(a). Finally, the behavior of the resonance wavelength is studied with the variation in the thickness of Si resonator ($t_m$), shown in figure 12(b). With the change in the $t_m$ from 7.5 nm to 37.5 nm, there

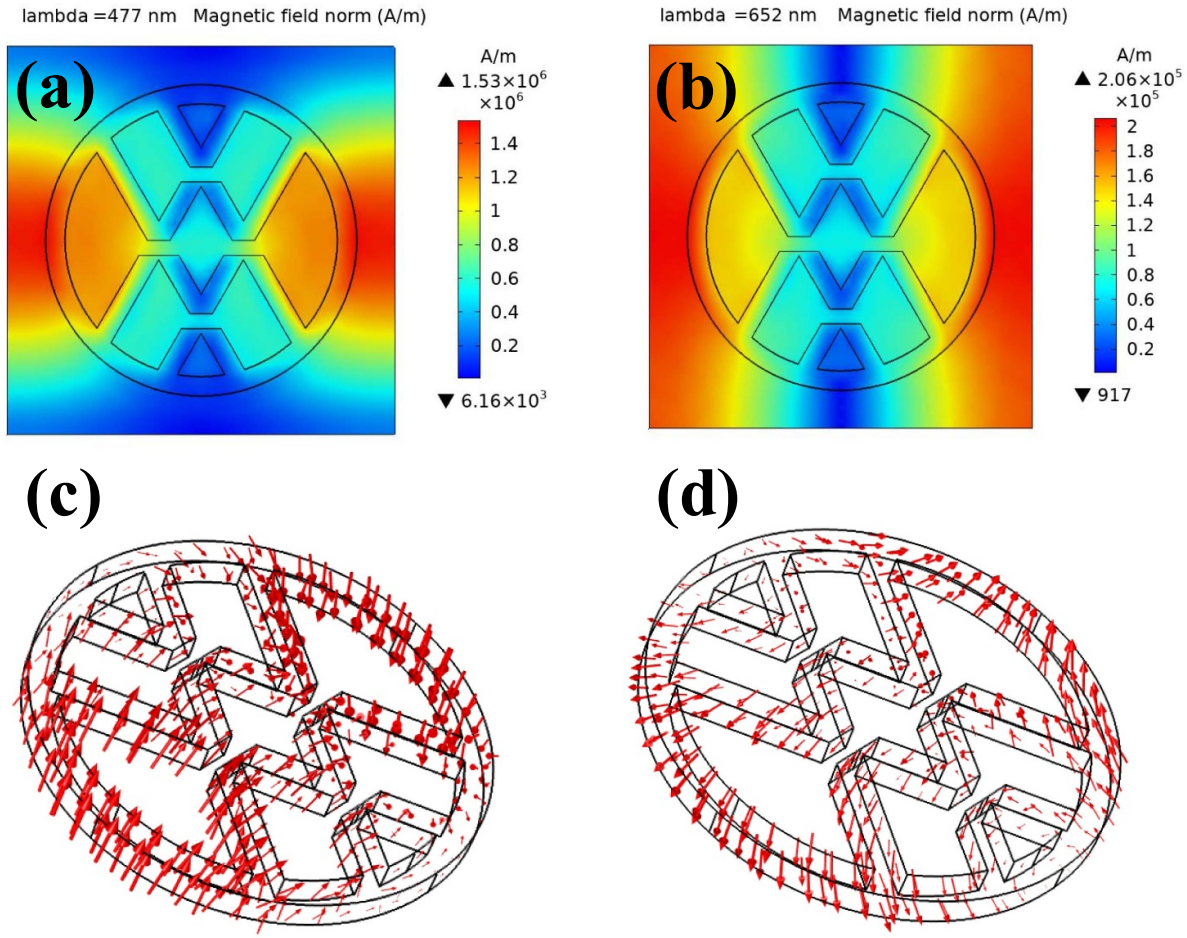


**Figure 10.** Simulated magnetic field at (a) 477 nm and (b) 652 nm for proposed designed dielectric metasurface, (c) Vortex-like normalized and enhanced magnetic field distribution in the unit-cell at a wavelength of 477 nm and (d) 652 nm.

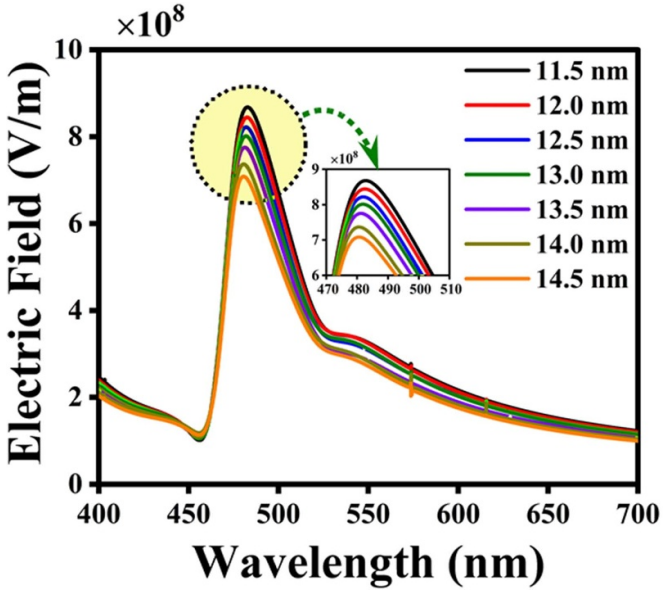


**Figure 11.** Variation of electric field with different gap values ($g$) at resonance wavelength of the proposed dielectric metasurface.

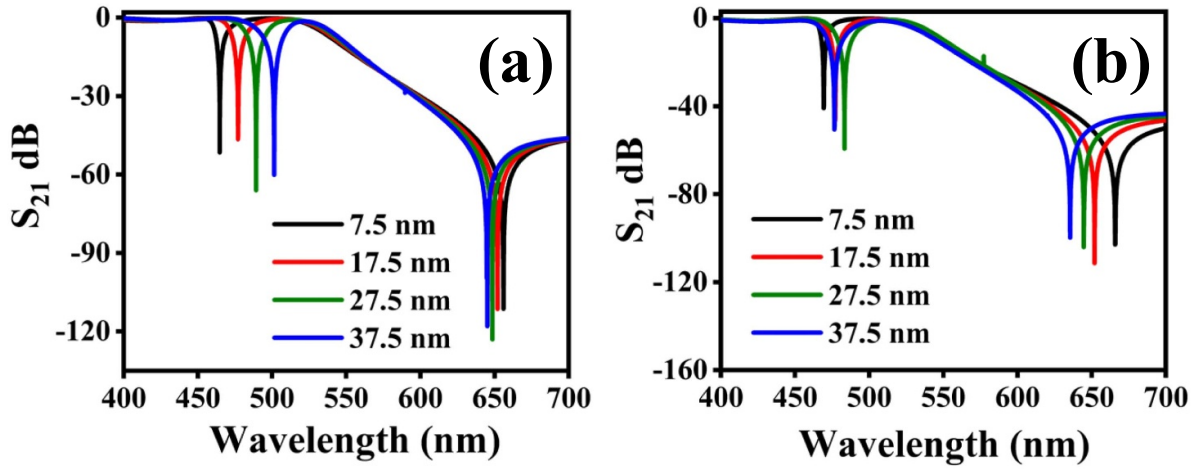


**Figure 12.** The variation in $S_{21}$ parameter with (a) the thickness of Silica dielectric layer ($t_s$) and (b) thickness of Si resonator ($t_m$).

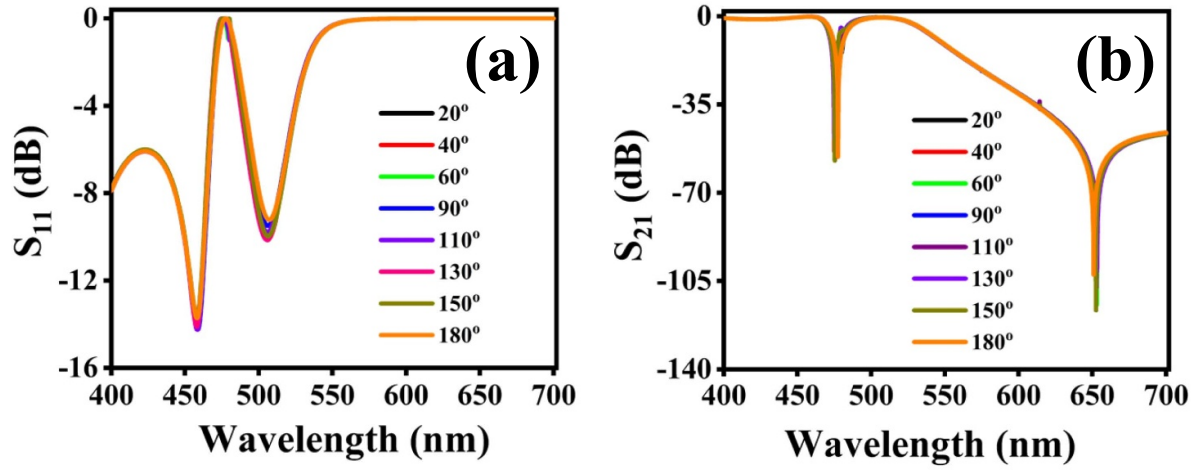


**Figure 13.** Variation of (a) Reflection coefficient ($S_{11}$) and (b) Transmission coefficient ($S_{21}$) with different orientation of the designed dielectric metasurface structure.

is a shift in the resonance wavelength towards the higher side showing red shift at lower resonance wavelength in $S_{21}$ parameter. Additionally, at higher wavelength the shift is towards lower side showing blue shift in $S_{21}$. This variation of $t_s$ and $t_m$ corresponds to the tunability characteristics of the designed structure with the shift in resonance wavelength.

### 4.2. Homogeneity of structure

The variation in response of $S_{11}$ and $S_{21}$ of designed DM structure with the rotation of the structure is shown in figure 13.

It is clear from figure 13, as we rotate the structure from 20° to 180°, the designed structure shows homogeneity of structure. The reflection and transmission coefficients remain invariant with the rotation of the structure. This observation highlights the uniformity of the designed structure across the complete visible spectrum.

### 4.3. Design tolerance

The design tolerance has been calculated for the proposed metasurface structure to show the feasibility of our structure to fabrication variation if any. Since the structure has been simulated for very precise values of resonator width edges ($w_c$) and edge gap ($g$), a design tolerance analysis would justify the feasibility of the proposed structure when fabricated. The design tolerance was calculated at ±2% deviation for $w_c$ and $g$ and from the plot the resonance wavelength is almost similar for the ±2% deviation in the parameters while fabricating the proposed structure as shown in figures 14(a) and (b). Similarly, the maximum reflectance is account for the $w_c$ of 17.5 nm and $g$ of 13 nm, which is little higher than the ±2%

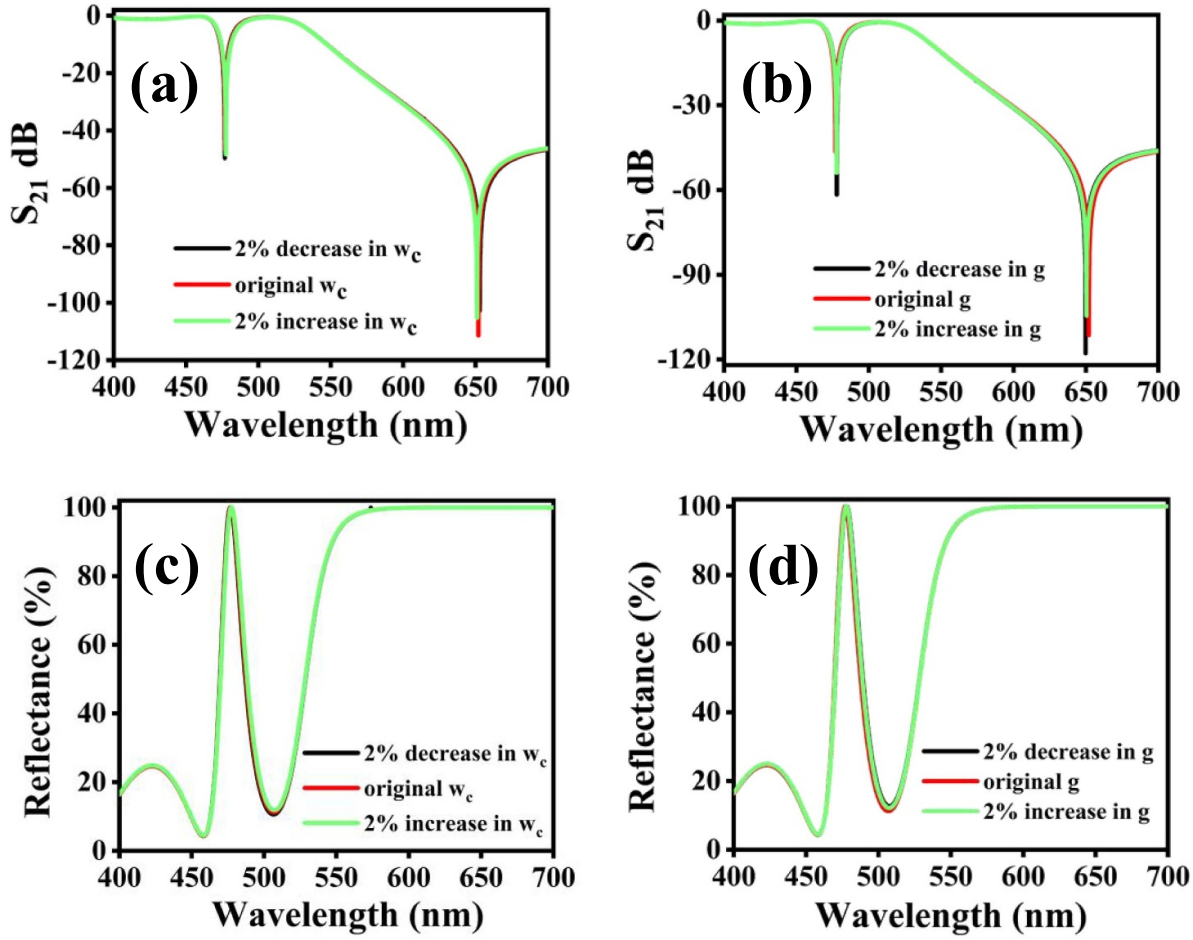


**Figure 14.** Tolerance analysis depicting the variation in transmission coefficient ($S_{21}$) for different values of (a) edge width ($w_c$) and (b) edge gap ($g$). Tolerance analysis illustrating the impact of variations in reflectance for different values of (c) edge width ($w_c$) and (d) edge gap ($g$).

deviation as shown in figures 14(c) and (d). It can thus be analyzed from figure 14 that the reported structure is fabrication tolerant and can be used for broadband perfect reflector devices.

## 5. Conclusions

In conclusion, we designed a novel all-DM as a perfect reflector composed of SOI material. The optical scattering characteristics of the designed metasurface structure were analyzed using the FEM based COMSOL Multiphysics simulation software. We also revealed that ED and MD resonances can be excited in the visible region. The effective electromagnetic parameters were calculated using the NRW method. The electric and magnetic field distribution were also studied at the resonant wavelengths which shows opposite symmetry to each other. The tunability characteristics of the proposed structure is carried out by altering the gap region '$g$', thickness of dielectric silica layer ($t_s$) and Si resonator ($t_m$). The consistent position of the scattering parameter's response, irrespective of the rotation of the structure, has been effectively demonstrated. This observation emphasizes the homogeneity of the designed structure across the entire visible spectrum.

## Data availability statement

The data that support the findings of this study are available upon reasonable request from the authors.

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## Author contributions

All authors have contributed equally to study the conceptualization and design of the proposed metasurface reflector. Ankit: methodology, software, calculations and writing-Ist

draft. KK: writing-reviewing, verification of results, supervision and editing. RKS: conceptualization, validation and editing. All authors read and approved the final manuscript.

## Conflict of interest

There is no conflict of interest. The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

## Ethical approval

We approved all ethics.

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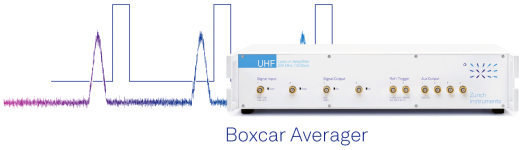
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# Soil Classification Using Machine Learning

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*Abstract:* A topic that evokes a large base for assorted studies, across numerous countries is soil classification. Recently, the world recorded an exorbitant rise in human population, the denouement is a higher demand for food and shelter. Both these factors directly demand exceptional study in geo technology, if not, a more reliable and faster method to do so. Conventional strategies taken by farmers are insufficient to meet the skyrocketing demands, and as a result, they must impede soil cultivation. This leads to the requirement to remain cognizant of the optimum soil type for a certain crop to maximize agricultural production. Several laboratory and field methods for classifying soil exist, however, these have constraints namely time and labour sine qua non. A need for a software-based soil categorization modus operandi that will assist humankind from a range of engineers to farmers, in reducing the time deviation is sought. This paper discusses apropos software, that allows soil classification to be achieved more efficiently. The functioning includes image processing and Computer vision-based soil classification methodologies, embodying the customary image assessing algorithms based on parameters, namely texture, colour, and particle size.

***Keywords—*** *Soil, Classification, CNN, Machine Learning, Image Processing*

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## I. INTRODUCTION

### A. History and leads

The world population is growing by the day, necessitating growth in the yielding food, clothes, and medicines on a similar tally to ensure their existence on this planet. Agriculture is the primary source that can meet expanding demand in this aspect. Soil is a fundamental agricultural tool since it contains nutrients integral to producing crops. Several classes of soil exist in each country, and variants could potentially originate around the globe. Many agricultural jobs and projects are evaluated contemporarily by the properties of the soil that affect agriculture engineering as a result. Knowing the properties of the soil might present pragmatic data to create a more rational and cautious management plan and employ them in agricultural regions. Profoundly, biota, geological history, and temperature are significant elements that have a notable impact on the soil's chemical and physical properties, whereas topography and human activity have a pivotal influence on soil characteristics at a local level. The distinct pieces (namely plant fragments, clay minerals, and quartz grains) that may be seen in disintegrated form using an optical microscope are the rudimentary elements of the soil. Soil structure is bound to the fineness, shape, contrast, frequency, size, voids, and the spatial arrangement of significant granules et al [1].

### B. Objective of this research

The objective is to create an automated system that can accurately classify various types of soils based on their characteristics or attributes. This classification has applications in a variety of sectors, including agriculture, environmental science, geology, and civil engineering. The major goal is to create a model that can accurately classify various types of soils. The model should be able to recognise and differentiate between soil types based on their distinct characteristics, such as texture, composition, colour, moisture content, organic matter content, and other important factors. The combination of CNN and machine learning algorithms enables the processing and analysis of enormous datasets in an effective manner. The goal is to create a model that can swiftly analyse and classify soil samples, allowing for timely decision-making in a variety of applications et al Breul [2]. Manual labour and human skill are frequently used in traditional soil classification procedures, which can be time-consuming and subjective. The goal is to use machine learning techniques to automate the categorization process, lowering the requirement for manual labour and minimising human biases. The model built should be scalable and capable of processing heterogeneous soil datasets from various areas or countries. Even if the collection contains samples

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from previously unknown areas, it should be able to generalise well and reliably categorise soils. CNN models can learn to extract relevant features from raw soil data, improving the classification process's interpretability et al Brungard [3]. The goal is to uncover and comprehend the key elements that influence classification judgements, which can provide insights into the underlying qualities and characteristics of various soil types.

### C. Arriving towards computer-driven methodologies

The soil texture and color can be determined using a variety of conventional methods, namely Pipette, elutriation, decantation, and Munsell color chart methods. There is also the USDA triangle technique for classifying soils. These procedures need a lot of work and time, which is a drawback. Hence, using computer vision and image processing-based approaches to categorize soil has struck a chord with researchers. The farmers in rural areas lack understanding or information on the soil's texture in relation to field research. They are farming without conducting adequate or sufficient testing beforehand, and they have no idea how to choose the right soil for the crops they intend to plant. This has an impact on the crops' general (overall) growth. Hence, to produce crops properly, farmers need be provided with a hassle-free solution that also informs them about the soil they are utilizing. Many computer-based methodologies and algorithms have been presented in recent years in addition to the conventional approaches. These techniques demand pictures of the soil to work with. To attain a decent yield, growers must be able to select the crop to produce depending on the nutrition of the soil besides the physical and environmental circumstances. Thus, deep learning algorithms are being used to analyses the soil and suggest appropriate crops in this regard to assist the former. The neural networks with representation learning are the foundation of deep learning technologies. Applications for data analysis and picture processing are applied with positive results. Deep learning has been effectively employed in a myriad of fields, including identification, entertainment, healthcare, fraud detection, gaming, language translations, etc. In the immediate present, deep learning has been used for several agricultural applications, with the greatest results et al [4]. The first step is picture processing and soil categorization based on computer vision. There are four main steps in it:

- Acquiring the images for dataset
- Segmentation of dataset
- Identification of major characteristics
- Classification of soil.

Utilizing a camera setup, a soil database is first built. Secondly, segmentation is used when it is necessary to divide the area of interest. Subsequently, different color and texture elements are derived. Using extracted characteristics, a pre-trained classifier like generates the ultimate identification results. The traditional digital photograph processing cycle for classifying soil is shown in Figure 1. On the contrary, deep learning has emerged as a generic approach to machine learning, which generates cutting-edge breakthroughs in many areas of photograph processing and computer vision research with the availability of enormous quantities of data. The optimum traits are those with strong categorization, highly precise, but also weak resistance [5]. The variety of characteristics that were chosen are lower than the initially set features. Colour, texture, and morphology are only a few of the characteristics that may be leveraged in the classification of soils, thus matrix factorization techniques can be employed in enhancing accuracy. Two classes of dimensionality reduction, subspace and feature selection, can be quickly distinguished. Principal component analysis (PCA), linear discriminant analysis (LDA), random projection, and other techniques are examples of subspace approaches. RP may be performed without any prior training, making it significantly quicker than PCA and LDA. Two-dimensional RP (2D-RP), two-directional two-dimensional RP ((2D)-2RP), and sparse RP [6] are a few variations of RP that have been advocated. These enhancements need much less computing variability and storage expense than conventional 1D- RP.

## II. LITERATURE REVIEW

Zhang et al. [7] advocated a classification system that applies a wavelet transform approach to classify soil with variant textures. Wavelet transform, a strong photograph and signal analysis technique, due to its multi-resolution capabilities, is harnessed to extract features. The utility of ML parameters besides Fisher’s Linear Discrimination Analysis (FLDA) is also witnessed in the reduction of vector dimensions in characterization. An automated technique for classification was proposed by Zhang et al. [8] wielding wavelet-based statistical models and hyperspectral soil fingerprints. Two models, namely hidden Markov models and maximum-likelihood models, are used in the classification process. The HMM classifier in 3-class technique offers a precision of 89-95% for sand, silt, and sand dominant textures correspondingly. Using RGB form pictures,studied a technique for classifying soil

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texture. A soil texture classification technique involving mask convolution was put out by Shenbagavalli and Ramar [9]. Absolute mean, skewness, etc., of the soil picture, were computed to construct the feature vector for additional processing. A new classification method is constructed to employ data like hyperspectral soil textures that lay out rich intrinsic properties. A retrieval-based procedure, proposed by Shenbagavalli and Ramar will be discussed in depth in accordance with our dataset. A computer vision-based texture analysis on a picture was advocated by Sofou et al. [10]. Third order moment soil characterization approach based on textural characteristics was provided by Breul and Gourves [11] in the field. To extract textural aspects of pictures, S. Dewari et al. [12] advocated a soil classification approach employing the Gabor Filter, color quantization, and Low mask on the original soil images. O'Donnell et al [13].'s work was designed to establish a system for quantifying and classifying soil redoximorphic features (SRFs) from soil cores by employing photograph processing and classification methods on digital camera-generated pictures. Using DIP, Maniyath et al. [14] created a successful technique to identify soil color. Pictures are changed from RGB to HSV. This same system reported a prediction performance of 100%. To assess and evaluate the pH value of agricultural soil, Gurubasava and Mahantesh [15] advocated methodologies and techniques based on digital photograph processing. A deeper dive into soil composition and textural analysis in mineral differentia from identical fragments of the preliminary igneous, sedimentary, and metamorphic rock through heterogenous weathering architecture to the bifurcation of clay minerals, hydrous oxides, and organic matter of natural soil formation in the biosphere. This layer oif information was provided by Hsai Yang et al [16]. As we move further into the study, several algorithms based on traditional photograph processing and computer vision methods that have been advocated by V. Prabhavathi and P. Kuppusamy, et al [17] were implemented. Most agronomic models proposed by A. Priyadarshin et al [18] were built on neural networking which then utilizes ICRS to analyze and bifurcate into soil features. After doing so, we can smoothly move over to the estimation of soil moisture. The usage of the 2D-RP models has enhanced our understanding of our deep learning model as will be discussed in full depth later. The traditional image processing and classification allows us to glance at the impact on physical and chemical attributes of the dataset.

### A. Contribution of this research

Despite contemporary attempts to classify soil, there are not any thorough literature evaluations or surveys on the topic of employing photograph processing, machine learning including deep learning techniques. In a handful of review publications, machine learning or deep learning-based methods have not been introduced, continuing to concentrate only on classic photograph processing and computer vision research. Albeit there was solely one survey that compared computer-based applications to conventional models. Less than 10% of the papers in a recently published revised review of machine learning in the administration of crops, water, soil, and animals were focused on soil management. Moreover, most of the agronomic models [19] were built on neural networks, incorporating deep learning. For said categorization of soil, researchers have presented an Intelligent Crop Recommendation System which takes environmental factors, soil nutrient levels, and soil features into account. These days, deep learning techniques are used to elegantly classify photographs. Within the purpose of estimating soil moisture using synthetic aperture radar data, a Complex Valued CNN (CV-CNN) was created. As a result, this work is devoted to a survey of the relevant literature, which ranges between traditional photograph processing to cutting-edge machine and deep learning techniques alongside a practical implementation of machine learning to encompass the same. The following are the research's primary recommendations:

- The major objective is on outlining a shared understanding of contemporary soil classification methods, which can aid future researchers in understanding the key concepts and developments in the machine and deep learning related geo-technological besides geoinformatics field.
- Numerous databases which include comparable besides assorted types of soil images that has been produced in various settings as required for their research.
- Set datasets include accuracy and precision up to 91%
- Assigning set datasets to the allocated information besides enforcing these to the database.

Important components of systems for classifying soil using deep learning and processing are also evaluated and explained. Although deep learning-based approaches for classifying soil typically perform better than traditional methods, they require a significant computing resource, including centralized processing units and graphics processing units.

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# III.METHODOLOGY

## A. Convolutional Neural Network

A convolutional neural network, or CNN, is a genre of deep learning neural networking designed for analysing structured arrays of input. CNN regulates multitudinous conventional techniques include categorization of photographs and colossally brought to bear in computer vision. This multi-layered neural network consists of the stacking of various hidden layers on top of one another, sequentially, permitting the study of hierarchical features given their sequential construction. Convolutional layers are recurrently ensued by activation layers and some pooling layers, respectively. The early CNN LeNet-5, introduced by Yann LeCun in 1998, is a straightforward model that ameliorates comprehension of rudimental design ideas. It is employed to decipher handwritten scripts. Assimilating six layers, LeNet-5 can differentiate between minuscule handwritten numerals but not between, for instance, the 26 letters of the alphabet or, more specifically, faces or things. Even though preeminent advanced networks of today may surpass 30 layers, millions of parameters, and branching, the fundamental convolutional kernels stay the same [20].

## B. Study of soil

Soil studies are conducted to assess statistics regarding its properties that directly influence numerous factors ranging from mapping to soil formation, fertility, chemical, physical, and biological characteristics besides the relationship between these characteristics and soil management, usage, and crop production.

**1) Size of soil particles and texture:** Solid soil constituents can divaricate in size from tiny boulders (>30) to colloidally dispersed mineral and organic particles (1 m). They may also differ in mineral differentia from identical fragments of the preliminary igneous, sedimentary, and metamorphic rock through heterogenous weathering architecture to the bifurcation of clay minerals, hydrous oxides, and organic matter of natural soil formation in the biosphere.

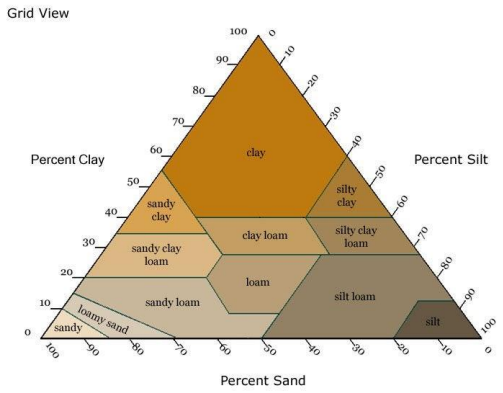


**FIGURE 1**. Agricultural textural classification chart

Classification is the process of arranging items into groups in a logical and sequential order as shown in Fig.1. It differs based on the forementioned characteristics to investigate and recognize them. The field method used by civil engineers for the identification of soil texture are as follows:

- Gravel: It can be simply defined as the loose aggregation of rock fragments. Due to its solid and strong texture and characteristics, it cannot be ribboned or casted.
- Sand: It consists of an unrefined appearance where the grains can be differentiated. It also has an extremely free flowing nature when at dry state.
- It cannot be ribboned.
- Upon air drying- It will not form a cast. Tends to fall apart with the release of pressure.
- When moist- A cast can be formed which crumbles when lightly touched.

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2) **Silt:** It consists of a mixture of silt particles with minuscule amounts of sand and clay. With a tendency to be cloddy when dry, it easily pulverizes to a powder that has a soft flour-like texture.
   - It tends to ribbon with a broken appearance but feels smooth.
   - It forms a cast that can be handled without breaking when air dried.
   - The cast formed can be handled freely and when wet, it causes puddles.

3) ***Clay:*** They are the fine-textured soils that, when dried, crumble into highly solid lumps. It is incredibly difficult to grind into a fine powder resembling soft flour. The cohesive qualities of the damp soil serve as the basis for identification.
   - It forms a long, thin flexible ribbon due to its considerable plasticity.
   - It forms a cast that can be handled freely without breaking both when air dried and moist [21].

4) **Loam:** They are textured solid, with high quantities of humus and fertility which enables it to have better drainage and infiltration of water and air than silt- and clay-rich soils. It can be ribboned and casted due to its strong durability.

### C. Purpose of soil classification:

The various motives of soil classification majorly surface around ordering our knowledge in a manner that contributes to the economy of thought with an intention to recall the properties of the classified objects and learn new links in the properties being classified. Doing so permit us to form classes in a useful approach for practical and apply these to:

- Predict the behaviour of the soil mixture available.
- Identify their best utility and analyse them.
- Calculate an estimate of their productivity.
- Provides material for various geotechnical and geo informatics based research.

## IV. PHOTOGRAPH PROCESSING AND CLASSIFICATION

Many soil characteristics, namely particle size (clod/aggregate), texture, colour, or a combination of attributes, can be taken into consideration when classifying soil. For classifying soil photographs, digital photograph processing and computer vision techniques is utilized. Analysing its colour allows for the effective acquisition of significant amounts of soil data since colour is a comprehensive indicator of the physical features and chemical compositions. Another characteristic that has been utilized in several methods to identify the kind of soil is soil texture, namely clay, silt, and sand. The estimation of pH value for soil characterization and categorization has also been studied. Considering this, the approach of classifying soils and making qualitative distinctions based on their colour and texture is one that is frequently employed. Scholars' pursuit of creating automated methods, intended to replace traditional, expensive manual approaches, for topographical division based on soil photographs into spatial entities for soil classification and delineation has increased. Recently, several algorithms based on traditional photograph processing and computer vision methods have been advocated by Hans Winterkorn et al [18

### A. Reaching textural analysis:

An important feature of any object, that enables one to visualize and characterize it, is its texture. Thus, a new classification method is constructed to employ data like hyperspectral soil textures that lay out rich intrinsic properties. A retrieval-based procedure, proposed by Winterkorn et al [18], involves 4 steps:

- Using a transformation method on the initial soil picture.
- Applying statistical measures on both the source photograph and the altered image, characteristics of texture, colour, and shape are retrieved.
- Following the calculation of the Euclidean method's distance formula, classification is fulfilled.
- Concluding with the ultimate step of calculating the total number of accurate checks retrieved from the database.

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**B. Acquisition:** We acquired the images required for the testing and training datasets from the web. The standard pixel size that has been utilized here is 256 x 256, has been kept uniform throughout.

**C. Detection:** The composition of soil particles of various sizes, namely sand, clay, and silt, also described as soil texture, is used to characterize the physical attributes and processes. The proper classification and characterization of soil texture aids in management choices for engineering applications and agricultural environmental operations. When compared to data from laboratory measurements, this method accurately predicted the fine and coarse soil fractions from the photos. Colour is a property that affirms details about a place's age, mineral composition, presence of humidified organic materials, supported crops, and other characteristics. Redoximorphic Features (RMFs) are the colour patterns that develop in soil because of coloration gain or loss relative to the matrix colour brought on by either reduction or oxidation of manganese and/or iron together with their transport. Furthermore, the said method establishes how soil moisture affects quantifiable Soil Redoximorphic Features (SRFs) and in what manner processing of the photograph affects how SRFs are measured. Under regulated lighting, photographs of soil cores were taken. Utilizing PCA analysis, pictures are classified during the testing stage, and index values and training variables are contrasted. The final pH is determined, therefore. Untrained pictures are 91% accurate, but trained ones are 100% accurate. In our case, we witness the photograph detected from the file that has been added to the code. This photograph includes all the testing and training data of the five major types of soil being, clay, gravel, loam, sand, and silt. With a total of 6125 images in 5 classes consisting of both the testing data in conjunction with the training data, the code advances to processing the data and identify the class of the photograph put to test.

**D. Data processing:** Data processing takes place when collected data is translated into usable information.. The distinction between deep learning and machine learning is whether automated data augmentation from the available dataset is used. Machine learning is the automatic discovery of important data structures. It is a subdivision of artificial intelligence with a goal of employing intelligent programs that render possibility for machines accomplish tasks with expertise.. In the initial stage, we created data for multiple soil types, majorly being, clay, sand, silt, gravel, and loam, connected down to the testing and training datasets. Techniques for deep learning are frequently developed and put into practice using computational neural networks.The quantity of nodes in a network determines its resilience; the denser the network, the further layers there may be. Data, model, and algorithm are deep learning's three main building blocks. Deep neural networks allow the computer to learn entirely from the data without any manual intervention. Giving it required input is critical for obtaining the greatest results from it. Although most types of 3D photos may be used as input, stereo images produce superior results because they have the benefit of being able to extract three-dimensional information from a situation without being impacted by lighting modifications as shown in Fig.2.

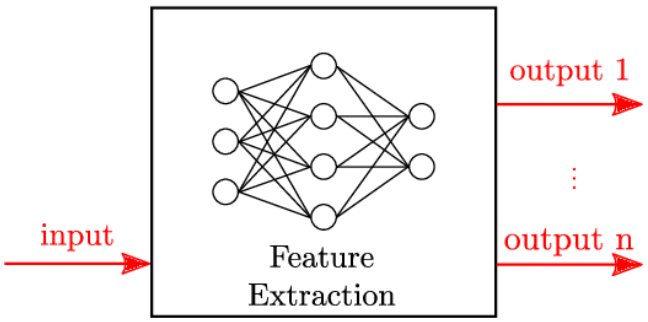


**FIGURE 2.** Output extraction model using machine learning.

Leveraging on the textural characteristics of the soil pictures, another feature introduced another classification method that uses multi-SVM and a linear kernel function. Images of this experiment were captured using a smartphone camera in the territory of West Guwahati. SVM can be applied to various class sizes except for loamy sand, silty clay, and loamy fine sand. This multi-class decoder worked effectively with the datasets. Hence, we decided to settle for the data to be processed for the five classes. When this was contrasted with standard experimental procedures, its technology verified to be far faster and more precise in classifying the type of soil.

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**E. CNN architecture:** In this project, we have applied 32 layers wherein 2 convolutional layers are present. The model's foundational layer is a 2D convolutional layer (Conv2D) with a (3, 3) size kernel, and identical padding. The input form of the pictures in this layer is (256, 256, 3), which is the typical size of a jpg image, further described better in Fig.3. It also features a rectified linear unit (ReLU) activation function. A max-pooling layer (MaxPooling2D) with a pool size (2, 2) is drawn upon. Ultimately, the size of dense layers processed for output is 5.

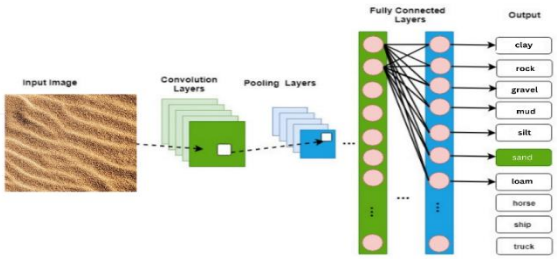


**FIGURE 3.** CNN architecture used for soil classification.

## V. RESULT AND DISCUSSION

The software that has been utilized for the running of the code is jupyter notebook and google colab, in python language, entirely on a DELL inspiron 5482, 8GB RAM.

**A. Confusion matrix:** It is an error analysis technique that enables us to calculate the validity of the classification model. It permits an individual to assess and correct the errors made in their respective classification model. The matrix shows how many True Positives (TP), True Negatives (TN), False Positives (FP), and False Negatives (FN) are generated using the testing dataset.

**TABLE 1.** A basic confusion matrix for binomial classes

| | |
|---|---|
| TP | FP |
| FN | TN |

**B. Confusion matrices for the testing data:** For our testing data of 151 images, with a total of 32 images in the clay (S1) dataset, 29 in gravel (S2), 30 in loam (S3), sand (S4) and silt (S5) respectively. For our testing *data of 151 images,*

- S1 – clay - 32
- S2 – gravel - 29
- S3 – loam - 30
- S4 – sand - 30
- S5 – silt – 30

Thus, enabling us to create the following confusion matrices –

**TABLE 2.** S1 confusion matrix

| | |
|---|---|
| 26 | 6 |
| 7 | 112 |

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**TABLE 3.** S2 Confusion Matrix

| | |
|---|---|
| 21 | 8 |
| 9 | 81 |

**TABLE 4.** S3 Confusion matrix

| | |
|---|---|
| 24 | 6 |
| 5 | 51 |

**TABLE 5.** S4 Confusion matrix

| | |
|---|---|
| 24 | 6 |
| 5 | 25 |

**TABLE 6.** S5 Confusion matrix

| | |
|---|---|
| 25 | 5 |
| 5 | 111 |

**C. Calculation:** We applied assorted formulae with the aim of computing the accuracy, precision and other parameters such as false positive and negative rates and so on. To do so, the consequential table of formulae were applied.

**TABLE 7.** Formulae for parametric calculations

| | |
|---|---|
| Accuracy | ACC = (TP+TN)/(P+N) |
| Sensitivity | TPR = TP/(TP+FN) |
| Specificity | SPC = TN/(FP+TN) |
| Precision | PPV = TP/(TP+FP) |
| False positive rate | FPR = FP/(FP+TN) |
| False negative rate | FNR = FN/(FN+TP) |
| F1 Score | F1 = 2TP/(2TP+FP+FN) |
| False discovery rate | FDR = FP/(FP+TP) |

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**D. Results:**

**TABLE 8.** Final results obtained after calculation

| Soil Type | ACC | TPR | SPC | PPV | FPR | FNR | F1 | FDR |
|---|---|---|---|---|---|---|---|---|
| S1 | 0.917 | 0.788 | 0.949 | 0.812 | 0.051 | 0.800 | 0.800 | 0/187 |
| S2 | 0.857 | 0.700 | 0.910 | 0.724 | 0.089 | 0.300 | 0.712 | 0.276 |
| S3 | 0.872 | 0.828 | 0.895 | 0.800 | 0.105 | 0.172 | 0.814 | 0.200 |
| S4 | 0.817 | 0.828 | 0.807 | 0.800 | 0.193 | 0.172 | 0.814 | 0.200 |
| S5 | 0.932 | 0.828 | 0.957 | 0.833 | 0.043 | 0.172 | 0.833 | 0.172 |

Thus, the results come down to be the following:

1. overall accuracy = 0.87826 = **87.826%**
2. overall precision = 0.79398 = **79.398%**

**E. Graphs:** We have generated some graphs to further analyze and provide information regarding the accuracy and loss of our model with respect to the testing dataset as well as the training dataset. Fig 4. Shows the representation of the accuracy of the model reading the dataset whereas, Fig 5. Depicts the loss of data that remains unrecognized.

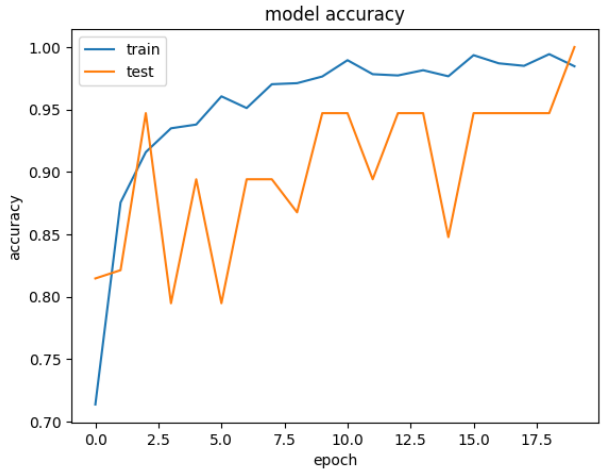


**FIGURE 4.** Graphical representation of model accuracy

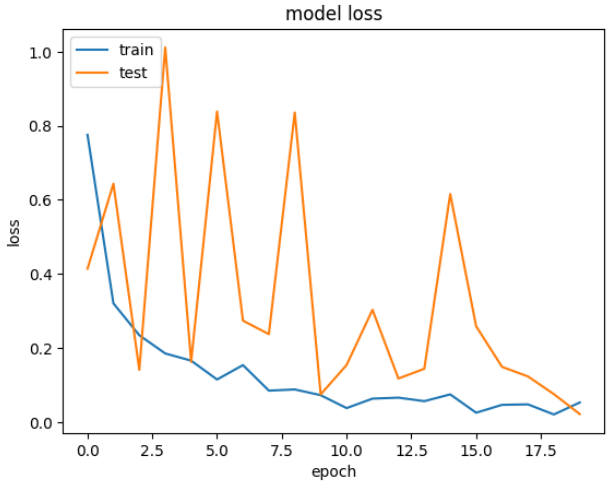


**FIGURE 5.** Graphical representation of model loss

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## VI. CONCLUSION

This research evokes a discussion on soil types and their attributes, which enable easy identification, besides a straightforward approach to a CNN model that classifies soil based on recognition. This program can be drawn upon by civil engineers besides secondary high schoolers for a better understanding of the soil types. It adds significance to civil engineering by providing scope besides precise recognition without having to tune down to the traditional methods previously employed. This paper invites scope for improvement besides further concerning trends in change of technology besides growth in the geo technological and agronomic fields. It alleviates issues by providing for simpler uses. Its addition to an application for future utilizations enforces advancement in society. With more intense studies keeping up with technical trends, we hope to improve the quality of the model developed along with the boost of precision in value recordings. This paper contributes to the existing works by adding a better accuracy rate by simplifying the endeavor of identifying soil types.

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# Speaker independent recognition of low-resourced multilingual Arabic spoken words through hybrid fusion

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**Abstract**
This article introduces a supervised strategy designed to enhance spoken word recognition within the constraints of a resource-limited multilingual dataset, specifically focusing on the Arabic language. Notably, existing methodologies often neglect the critical influence of morphology and phonology on the comprehension of spoken language. The Multilingual Spoken Words Corpus comprises audio files in the OPUS format. Our approach strategically employs the pre-trained Arabic Large xlsr-Wav2Vec2-53 transformer model to extract text transcripts, unfolding in two distinct forms: Buckwalter transliterations and Arabic scripts. For Buckwalter transliterations form of text transcripts, we adopt the CMU pronouncing dictionary for phonetic representation. Specifically, a specialized Arabic-based grapheme-2-phoneme model is utilized to convert Buckwalter transliterations into phonemes. Subsequently, these phonemes are transformed into vectors through the application of FastText's character n-gram-based subword embeddings. Shifting focus to the Arabic script form, a stemming process is applied, followed by further conversion into unigrams. Once again, FastText word embeddings are harnessed to represent these unigrams as vectors. To maintain uniformity, vectors are concatenated and padded across both scenarios. For classification, a three-layered dense model, augmented by batch normalization, processes the accumulated vectors, ultimately generating probabilistic scores. The final outcomes are obtained by averaging results from both forms. Comparative evaluation against the state-of-the-art (SOTA) approach substantiates the accuracy of this methodology. Crucially, our method demonstrates promising results, indicating its potential to significantly advance spoken word recognition in complex multilingual contexts.

**Keywords** Multilingual spoken words · Morphology · Phonology · Hybrid fusion

## 1 Introduction

Advances in deep learning and extensive data have propelled speech recognition [1]. Data quality is pivotal for robust deep neural network (DNN) models. Multi-microphone processing enhances signal processing resilience [2]. Aligning training with real-world scenarios,

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exemplified by Google Home [3], optimizes performance. Ongoing research in diverse data collection, transfer learning, and self-supervised learning improves robustness and adaptability. This holistic approach ensures accurate and versatile speech recognition in diverse environments.

Various multilingual automatic speech recognition (ASR) models, including end-to-end (E2E) and hybrid Hidden Markov Models (HMM)/Neural Networks (NN), have been extensively explored [4, 6]. These models leverage data and parameters from multiple languages, improving robustness and generalization. A unified multilingual ASR system, using a single model, effectively shares knowledge, especially beneficial for languages with limited resources. Effective models often incorporate language information, seen in multilingual representation training [5] and E2E models. Optimizing parameters based on data distribution [7], adjusting language sampling ratios, and monitoring language shifts [8] contribute to enhanced model efficacy. However, expanding a multilingual model to include new languages faces constraints due to linguistic data dependencies.

In the domain of low-resource language ASR, multilingual models consistently outperform unilingual counterparts [9], evident in successful projects like Babel and MediaEval's Spoken Web Search Task [11]. This study, using the Babel Optional Period 2 (OP2) dataset, explores the impact of diverse ML representations on speech recognition [10] and keyword search. Hierarchical bottleneck features play a crucial role in providing a structured representation of acoustic features for multilingual speech recognition [11, 12]. While not covering all neural network training acceleration techniques, notable approaches include distributed training across multiple computers [13], hardware/software integration [14], and 1-bit gradient quantization [15] to mitigate communication costs. Leveraging data sampling [16] and a proposed framework with varying batch sample sizes [16] further enhances training acceleration in the domain of large-scale machine learning.

There is a growing interest in rapidly advancing high-performance ASR systems for multiple languages. Multilingual DNNs consistently prove superior, especially for low-resource languages [17]. The hidden layers of DNNs act as adaptable feature extractors, collaborating effectively through shared training on data from a variety of languages [17]. Multilingual DNNs strive to attain distinct language-specific activations or universal senones, frequently relying on the International Phonetic Alphabet (IPA) [19].

Text-dependent speaker recognition programs often outperform their text-independent counterparts due to the simplification introduced by recognition based on known text [20]. In text-dependent scenarios, the system benefits from the predictability of cooperative speech aligned with the known text [21]. It's worth noting that Arabic ASR research has not kept pace with advancements in English ASR, despite Arabic being the fifth most spoken language globally, requiring precise speech-to-text conversion. Research challenges and practical constraints, including standards and resource limitations, impede substantial progress. One major obstacle is the absence of a comprehensive, unified Arabic continuous speech corpus. Most Arabic voice recognition studies rely on small, in-house corpora. In the current landscape of natural language processing and linguistic applications, extensive reliance on speech recognition is observed, and Arabic is no exception. Despite efforts to leverage such approaches for over 380 million speakers [22], the output in terms of ASR papers written in Arabic has been relatively limited [23]. A notable contribution in this domain is [24], which introduces a speech and speaker identification system based on the recognition of spoken Arabic digits. In this system, matching speech sounds are represented as images, and features are extracted using an algorithm based on the minimum eigenvalues of the Toeplitz matrix.

The Spoken Language Technology 2016 conference highlighted the Arabic Multi-Gender Broadcast (MGB-2) challenge, providing insights into the diversity of Arabic dialects [25]. Derived from 19 Al Jazeera TV shows spanning 2005 to 2015, this dataset tackled two key tasks: speech transcription (Word Error Rate: 34%) and word alignment (precision: 0.83,

recall: 0.7). Subsequently, the MGB-2 and MGB-3 databases are curated from Egyptian YouTube videos [26].

Many aspects of Arabic, including phonetics and syntax, do not pose challenges for ASR [27–29]. Standard, language-independent acoustic and pronunciation modeling approaches, such as context-dependent phones, can seamlessly capture Arabic's acoustic–phonetic features. With a nearly one-to-one letter-to-phone connection, various aspects of recognizer training are more straightforward, particularly in developing a pronunciation vocabulary. Despite these advantages, challenges arise from the majority of non-diacritized text material, substantial dialectal variability, and morphological complexity, making it difficult to construct highly accurate speech recognition systems for Arabic. Coupled with the language's large vocabulary [30], building large-vocabulary ASR for Arabic becomes a formidable task, presenting notable obstacles for speech research. Over the last decade, researchers have shown considerable interest in developing robust Arabic Automatic Speech Recognition (AASR) systems [31, 32]. Adding to the complexity, diacritics (Arabic harakat) are special symbols placed above the primary symbols (letters) in the Arabic language [33]. These diacritics represent sounds similar to English vowels and Chinese tones, introducing an additional layer of challenge for Arabic ASR, as they are crucial for understanding the meaning of words and phrases.

The availability of unlabeled data, easily accessible through pretrained models, offers a practical solution for low-resource scenarios. The transformative influence of Transformers [34], notably exemplified by Bidirectional Transformers (BERT) [35], has successfully tackled challenges in this context. BERT's masked language model pretraining has played a pivotal role in revolutionizing natural language processing. Transformers find extensive use in supervised learning [36] and unsupervised pretraining, employing techniques like contrastive prediction [37] across diverse domains, including speech.

In this paper, we make significant contributions in the following key areas:

- Transformers for Arabic Multilingual Spoken Words: Our study leverages transformers to extract both Arabic script (https://huggingface.co/elgeish/wav2vec2-large-xlsr-53-arabic) and buckwalter transliteration (http://www.qamus.org/transliteration.htm) from text transcripts. This innovative approach lays the foundation for spoken word classification.
- Grapheme-to-Phoneme Model for Transliteration: The extracted buckwalter transliteration undergoes conversion into phonemes using a Grapheme-to-Phoneme model. This step enhances the accuracy and overall performance of the classification process.
- Fast-Text Word Embeddings for Embedding Generation: Both the buckwalter transliteration and authentic Arabic script are transformed into embeddings through the use of Fast-Text word embeddings. This ensures an efficient representation and comprehension of the data.
- Concatenation and Padding for Consistent Vector Handling: To ensure uniformity, we apply concatenation and padding techniques to the embeddings. This streamlined approach facilitates consistent and efficient vector manipulation.
- Integration of Unigrams and Phonemes for Robust Classification: Our study combines the embeddings of unigrams and phonemes, culminating in the development of a powerful Dense + Batch Normalization model for spoken word classification.
- Improved Performance over State-of-the-Art Approaches: Evaluation of the combined unigram and phoneme technique, using metrics such as accuracy and f1-score, reveals higher scores compared to existing state-of-the-art methods. This underscores the effectiveness and advancements introduced by our proposed approach.

The subsequent sections of this paper are organized to provide a cohesive exploration of our study. In Section 2, we present a comprehensive review of existing literature on speech

recognition, offering valuable insights into the current landscape of the field. Moving forward to Section 3, we delve into the heart of our contribution, outlining the proposed modeling approach that encompasses early, late, and a combination of both fusion techniques. Section 4 is dedicated to the experimental design, where we detail the methodologies employed and offer a succinct summary of the empirical findings derived from our study. Finally, in Section 5, we draw the paper to a close by summarizing key insights and articulating potential avenues for future research within the domain of Arabic speech recognition. This organizational structure ensures a logical flow, guiding readers through the contextual background, the core of our research, the empirical investigation, and concluding reflections on future directions in the field.

Our work is motivated by the observation that the majority of research in speech recognition has primarily centered around audio-based feature engineering, with less emphasis on linguistic aspects. In response to this gap, our focus is on exploring the potential contributions of linguistic engineering to advance the field of speech recognition.

## 2 Recent trends on audio-text pre-trained modeling

Unlabeled data consistently remains accessible, offering the added advantage of potential sourcing from pretrained models. The transformative impact of Transformers [34], particularly with the advent of BERT [35] and its success in masked language model pretraining within natural language processing, has proven indispensable for addressing low-resource challenges. In the field of speech, Transformers are highly versatile, finding utility in both supervised learning [36] and unsupervised pretraining through contrastive prediction methods [37, 38]. These models exhibit remarkable efficiency in learning from multilingual datasets, adeptly capturing both auditory [58] and syntactic features across languages. The straightforward substitution of components within an E2E model with pretrained counterparts holds significant potential benefits, particularly in the context of multilingual identification.

The applications of wav2vec 2.0 and MBART50 are widely utilized individually, and their integration has been noted in the domain of Speech Translation [39]. Notably, Transformers have undergone continuous evolution, improving the modeling of long-range dependencies through self-attention mechanisms [34] and incorporating adaptive elements designed for multilingual models [40]. When strategically integrated with pretrained models, these advancements consistently produce optimal results.

The transformative capabilities of Transformers, showcased in the masked language model [35], are utilized to capture essential representations derived from input masking and structure. This adaptability seamlessly extends to the domain of audio signals, starting with the reconstruction of log-Mel frequency features [38] and progressing to the application of quantization for latent variable learning [41].

ASR systems currently encounter multiple challenges. Firstly, there's the speaker-related challenge, encompassing variations such as emotions, gender, and age, all of which can impact speech patterns. Secondly, the length of vocal tracks introduces variability in pronunciation. Thirdly, background and channel noise, whether it's children in a car, the hustle of a metro station, or the interference of phone or wireless gadget usage, poses a significant challenge. A particularly intricate issue stems from the diversity of accents within the same language, like Arabic, which can change based on the speaker's country of origin [46]. This work addresses a fundamental challenge associated with multilingual spoken word corpora: the scarcity of resources for training the model. For a concise overview of related studies, please refer to Table 1.

**Table 1** An overview of the major aspects of the most important spoken word recognition strategy presented in the last decade

| Year | References | Lingual | Dataset | Tasks | Methods | Performance score | Gaps |
|---|---|---|---|---|---|---|---|
| 2010 | [12] | Unilingual | American Broadcast News, HUB4, TDT4, DEV04, EVAL03, DEV09, EVAL09 | Speech recognition | Pre-processing the bottleneck features and examining the effects of long-term spectral characteristics and multi-resolution RASTA filtering as input for feature extraction in neural networks | The hierarchical bottleneck features improved the system by 3% to 7% relative depending on the corpora. Additionally, the single MFCC-based system is enhanced by up to 20% | Narrow functionality on the low-resourced corpus |
| 2013 | [10] | Multilingual | Multilingual spoken words corpus (English, French, German, and Polish) | Speech recognition | Multilingual bottleneck (BN) features with multi-resolution RASTA and cepstral features are used for ASR | With the help of multilingual BN features, the French, English, German, and Polish LVCSR systems improved by 3%, 4%, 7%, and 3% in comparison to monolingual BN features and by 25%, 31%, 27%, and 26% in comparison to MFCC systems | It is lacking to work on difficult situations like low-resource languages |
| 2019 | [60] | __ | UrbanSound8K | Sound classification | Environmental Sound Classification using RNN-LSTM | 84.25% accuracy | Doesn't lead to a good accuracy score for native languages |

**Table 1** (continued)

| Year | References | Lingual | Dataset | Tasks | Methods | Performance score | Gaps |
|---|---|---|---|---|---|---|---|
| 2019 | [51] | Unilingual | Spoken Arabic Digits | Speech recognition | Arabic digits speech recognition using recurrent neural networks (RNN-LSTM) | According to the testing outcomes of the tuned parameters model, the LSTM model can recognise spoken Arabic digits with a 69% accuracy rate. The model's accuracy for zero identification is best, at 80% | It took a long time for training in the process |
| 2019 | [61] | Multilingual | Multi accent dataset—SpeechOcean (Australian, Canadian, British, Indian, Korean, Chinese, United States, and Spanish) | Multi-accent speech recognition | Multi-accent speech recognition using MixNet-Phone and MixNet-Accent | MixNet Phone and Accent word error rate up to 24.7% on 26 million parameters | Investigating various designs and assessing the segregation of the input features aren't explored |
| 2020 | [18] | Multilingual | Five languages: Danish, Norwegian, Swedish, Finnish and Dutch | Speech recognition | Multilingual speech recognition with self-attention structured parameterization | Experimental findings show an 8% to 20% relative improvement over the multilingual baseline model | There is a lack of scalability for higher resource languages |

**Table 1** (continued)

| Year | References | Lingual | Dataset | Tasks | Methods | Performance score | Gaps |
|---|---|---|---|---|---|---|---|
| 2020 | [45] | Unilingual | 200 K Hindi spoken utterances (around 150 h) | Speech recognition | Bidirectional LSTM and Deep CNN Hybrid for Automatic Speech Recognition | Studies reveal that the suggested hybrid architecture with speaker-adapted features and the max out non-linearity with dropout notion results in a relative WER decrease of 5.8% over CNN and 10% on DNN systems, respectively | Speaker dependent |
| 2020 | [63] | Multilingual | Latin, Balto-Slavic, Perso-Arabic, Cyrillic, Indic, Miscellaneous etc | Speech recognition | Multilingual modeling using sequence-to-sequence (seq2Seq) model for low-resourced languages | The average WER relative reduction from monolingual baselines is 20.9%, 23%, and 28.8%, respectively, according to a joint model, a joint model with language input, and a multi-head model | No usage of phonology |

**Table 1** (continued)

| Year | References | Lingual | Dataset | Tasks | Methods | Performance score | Gaps |
|---|---|---|---|---|---|---|---|
| 2021 | [44] | Unilingual | English | Speech recognition | 17 mathematical word detection using MFCC and delta MFCC features as input and learned on CNN networks | The outcome demonstrates that both Adam and Adagrad optimizers receive an accuracy of 83.33% from Delta MFCC. It shows that Delta MFCC performs better than MFCC. The result also shows that Adagrad with Delta MFCC trains the model earlier than Adam | Restricted to the most common language and usage of only two acoustic features |
| 2021 | [59] | Unilingual | Arabic speech corpus for isolated words | Speech recognition | Arabic Speech Recognition by training data on gammatone-frequency cepstral coefficients (GFCC) using CNN | Maximum accuracy of 99.77% is discovered while employing gammatone-frequency cepstral coefficients (GFCC) and CNN | Limited to acoustic modeling |
| 2021 | [62] | Bilingual | Spoken CALL Shared Task challenge (German and English) | Speech recognition | Automated speech evaluation of test takers' spoken responses to determine their proficiency in a second language | MIX2-3FbkB-F1 produced a relative Dfull rise of 27.44% and a relative error rate reduction of 9.60% | Speech scoring needs to cover more challenging jobs |
| Our proposed approach | — | Unilingual | Arabic | Speech recognition | Speech recognition in limited resources using DNN with batch normalization | 72.41% in 10-spoken word categories, and 70.97% for 50-spoken word categories in a challenging scenario | While yielding satisfactory results compared to the state-of-the-art approach, further exploration of diversified language is still required |

## 3 Proposed approach

Here, we elaborate on our approach to early and late fusion [65–68] in multilingual speech recognition, specifically applied to an imbalanced Arabic dataset. After processing information in two channels, we employed both early and late fusion techniques to create a hybrid fusion that incorporates phonetic information. Phonetic information serves as a carrier of rich and diversified characteristics specific to a particular language. The integration of the hybrid fusion from two channels resulted in a commendable classification score.

### 3.1 Speech-to-Text transcript extraction and pre-processing

In our proposed approach, we converted raw audio into text using a pretrained Arabic LARGE xlsr-Wav2Vec2-53 model. The LARGE xlsr-Wav2Vec2-53 unifies raw speech across multiple languages, revealing shared latent quantization through contrastive tasks. Refined with labeled data, it excels in cross-lingual pretraining and supports low-resource speech understanding. CTC is valuable for ASR, and transformers, illustrated in Fig. 1, offer efficient pre-trained models across various frameworks and modalities. Multilingual masked model pretraining, supported by wav2vec 2.0, shows success, and neural style transfer achieves versatility across tasks [56].

Transcripts are acquired in both forms: Buckwalter transliteration (http://www.qamus.org/transliteration.htm) and Arabic script (https://huggingface.co/elgeish/wav2vec2-large-xlsr-53-arabic). The Buckwalter transliteration is further processed into phonemes using a grapheme-to-phoneme model, subsequently transformed into vectors through the incorporation of sub-word embeddings. However, the Arabic script undergoes an initial transformation to its root form through the utilization of the Arabic Porter Stemmer [52]. Once the root word is identified from the Arabic script, the stemmed script is then further converted into unigrams using n-grams NLP techniques.

In our approach, the text transcripts closely approximate the actual words, thanks to the utilization of a pre-trained model.

### 3.2 Phoneme and authentic Arabic embeddings

Buckwalter phonemes are transformed into 300-dimensional vectors using the FastText subword model, trained on a comprehensive dataset comprising 2 million words sourced from Web Crawl (600 billion tokens). This model is pre-trained for text-based tasks [47]. The authentic Arabic script is transcribed using the pre-trained Arabic LARGE xlsr-Wav-2Vec2-53 model and is further processed into "stems" through the application of the Porter Stemmer [52], known for its nuanced word analysis. These "stems" undergo transformation into unigrams, subsequently utilizing pre-trained Arabic embeddings through an ICU tokenizer. The unigrams are further trained as pre-trained word vectors with FastText, employing Common Crawl and Wikipedia data [47, 64]. The training involves CBOW, operating in an Arabic 300-dimensional space with a 5-window size, and utilizing 10 negatives for training.

Figure 1 illustrates the text transcript generation process from the LARGE xlsr-Wav-2Vec2-53 model. Buckwalter transcripts undergo transformation into phonemes using the CMU dictionary [48]. These phonemes are then converted into vectors, serving as input for a 3-layer dense + Batch Normalization (BN) model, generating scores. In the case of

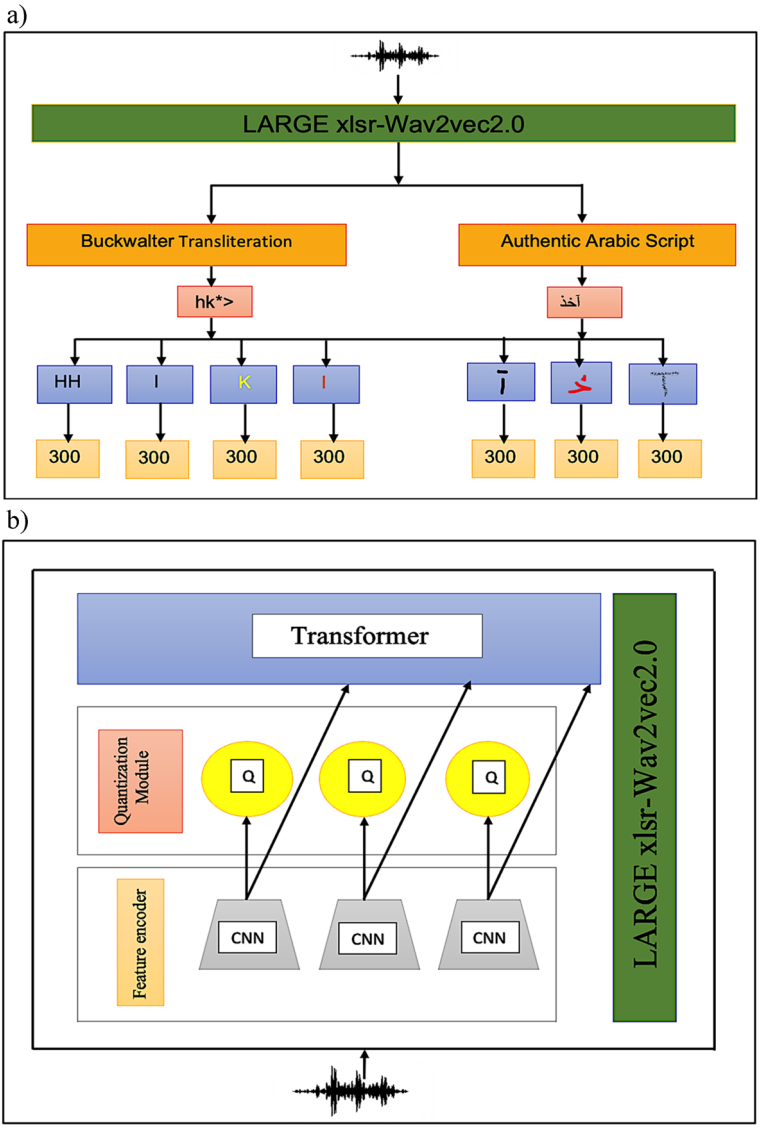


**Fig. 1** **a** The generation of text transcripts and embeddings **b** LARGE xlsr-Wav2Vec2-53

Arabic script, the LARGE xlsr-Wav2Vec2-53 model produces an authentic transcript. The script is further processed into unigrams, which are then applied to Arabic FastText Embeddings (300-dimensional each). The concatenated and padded unigrams are fed into the 3-layer dense model, storing the resultant scores. Figure 2 illustrates the flow of information from two transcripts to the neural network and the final average score, which is a fusion of early and late fusion, creating a hybrid.

### 3.3 Deep dense neural network with batch normalization

Deep learning has made significant progress in various applications. A deep neural network (DN) uses nonlinear transformations to convert the input vector ($x$) into a feature map sequence. Input vector are $x=[x_1, x_2, x_3,\ldots, x_L]$. Activation potential $z$, obtained by weighted multiplication, is $w=[w_1, w_2, w_3,\ldots, w_L]$. Mathematically in Eq. (1).

$$z = \sum_{i=1}^{L} x_i w_i + bias \tag{1}$$

Here, $w_i$ signifies the weight matrix and *bias* denotes the bias vectors. The general operation of dense layers is elucidated through the following mathematical expression, as illustrated in Eq. (2).

$$y_1^{(1)} = R\left(z_1^{(1)}\right), y_2^{(1)} = R\left(z_2^{(1)}\right), , \ldots .., y_L^{(1)} = R\left(z_L^{(1)}\right) \tag{2}$$

In this equation set, each output value $y_1^{(1)}$ is derived from its corresponding input potential $z$ through an activation function $R$. This process is repeated for all $L$ elements, generating the transformed outputs $y_1^{(1)}, y_2^{(1)}, \ldots, y_L^{(1)}$. The activation function $R$ introduces nonlinearity to the transformation, allowing the neural network to capture complex relationships in the data.

The ReLu function stands out as a prominent nonlinear activation method widely embraced in deep learning. One of its significant benefits is preventing simultaneous firing of all neurons. Mathematically, the ReLu function denoted as $R(x)$, can be defined as follows:

$$R(x) = \max(0, x) \tag{3}$$

The function $R(x)$ can be deconstructed as shown in Eq. (4). In simplified notation, this can be expressed as follows:

$$\mathrm{f(x)} = \{0 \text{ for } x < 0, x \text{ for } x \geq 0\} \tag{4}$$

To counter internal covariate shift, batch normalization normalizes inputs across layers. In stochastic gradient descent (SGD), learning occurs via randomized mini-batches $B \subset X$ [53]. Top-performing deep neural networks (DNs) consistently incorporate BN introduced by Ioffe & Szegedy (2015) [54]. BN centers and normalizes feature maps using parameters: $\mu_i, \sigma_i, \beta_i, \gamma_i$ [55]. It combats covariate shift by normalizing layer inputs. In training, BN involves: 1) Calculating mean and variance of input layers Eq. (5). 2) Normalizing inputs using batch statistics. 3) Applying scaling and shifting for output.

The mathematical representation of batch mean is:

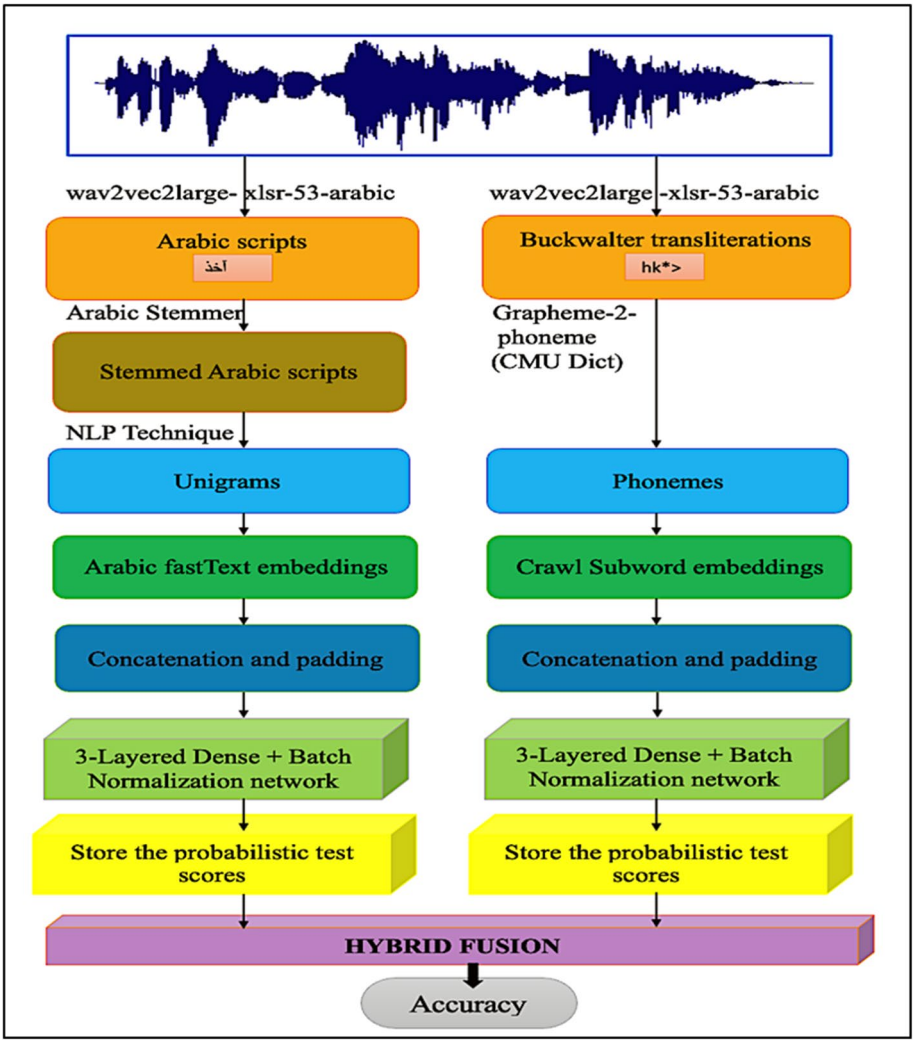


**Fig. 2** Proposed pipeline for two forms of transcript spoken word recognition

$$\mu = \frac{1}{L}\sum_{i=1}^{L} x_i \tag{5}$$

Batch variance is mathematically represented as $\sigma^2$:

$$\sigma^2 = \frac{1}{L}\sum_{i=1}^{L} \left(x_i - \mu\right)^2 \tag{6}$$

Upon computing the mean and covariance of the input layers, normalize the layer inputs using the batch statistics calculated earlier.

$$\bar{x}_i = x_i - \mu / \sqrt{\left(\sigma^2\right) + \epsilon} \tag{7}$$

$$y_i = \gamma \bar{x}_i + \beta \tag{8}$$

Beside the network's initial parameters, $\gamma$ and $\beta$ values are also learned in training. During this process, $\mu$ and $\sigma$ batch normalization parameters for each mini-batch $B$ are computed directly using the mean and standard deviation of the current mini-batch's feature maps $b$.

Consequently, the mean is determined during inference using the following formula when there are $L$ samples in each batch and $b$ batches:

$$E_x = \frac{1}{L} \sum_{\mathrm{i}=1}^{b} \mu^{(\mathrm{i})} \tag{9}$$

It computes the inference variance. The mathematical expression for the inference variance is given by:

$$Var_x = \left(\frac{L}{L-1}\right) \frac{1}{L} \sum_{i=1}^{b} \left(\sigma^2(i)\right) \tag{10}$$

The subsequent formula represents inference scaling.

$$y = \gamma x / \sqrt{\mathrm{Varx} + \epsilon} + \left(\beta + \gamma \mathrm{E_x} / \sqrt{\mathrm{Varx} + \epsilon}\right) \tag{11}$$

Batch normalization produces the value $y$, used in neural network propagation. During testing (inference), mean and variance are fixed, computed from training batches. In inference, BN linearly adjusts the previous layer's output, often from convolutional layers. To improve partitioning and accuracy, BN modifies input space spline partition. This adaptation minimizes TLS distance between spline boundaries and layer's DN inputs.

$$\bar{y} : \left\{ \bar{y}_1 = \sigma\left(z_1^{(N)}\right), \bar{y}_2 = \sigma\left(z_2^{(N)}\right), \bar{y}_3 = \sigma\left(z_3^{(N)}\right), \ldots, \bar{y}_L = \sigma\left(z_L^{(N)}\right) \right\} \tag{12}$$

Let $P_c$ represent the posterior class probability associated with the spoken word category $c$. By employing the functions specified below, we can aggregate the two probabilistic decision scores derived from the dense + batch normalization model, which is trained on both Buckwalter transliteration and authentic Arabic script. The symbol $\bar{y}$ signifies the conclusive layer's classification outcomes.

$$P_c = mean\left(Pc^{\bar{y}}\right) \tag{13}$$

The following formula is used to determine the class of the test sample:

$$class = \forall_x argmax\left(P_c\right) \tag{14}$$

## 4 Experiment and discussions

### 4.1 Dataset

The Multilingual Spoken Words Corpus [42] stands as an invaluable resource for diverse applications, research initiatives, and commercial keyword search purposes. Encompassing a vast dataset with 5 billion individuals across 50 languages, it is governed by the CC-BY 4.0 license. Featuring almost 6,000 h of audio, 340,000 keywords, and a staggering 23.4 million 1-s spoken utterances, this dataset offers a wealth of information. Crucially, audio alignment—essential for consumer electronics and call centers—is meticulously generated through crowdsourcing, including word-level time estimations. The dataset serves as a comprehensive benchmark, facilitating in-depth comparisons between keyword detection algorithms and manual datasets. Covering a spectrum of languages, including both high- and low-resource ones such as English, Spanish, Dhivehi, and Oriya, MSWC proves to be a versatile resource. Its adaptability is further enhanced for imbalanced 10/50 spoken word categories, making it an excellent choice for both study and practical applications. Figure 3 provides insights into the number of samples for 10 spoken word categories in Arabic, while Fig. 4 illustrates the corresponding figures for 50 spoken word categories in Arabic.

The dataset encounters challenges related to being under-resourced for Arabic, primarily stemming from issues in dataset management, resulting in noticeable imbalances. Sample sizes vary widely, ranging from 94 instances for ten classes to 722 for fifty. In the context of Arabic categorization, specific modifications are introduced in the Multilingual Spoken Words Corpus. Despite its extensive scope, this dataset consists of limited online audio samples tailored for research, commercial applications, and tasks involving keyword identification and phrase searches. It's crucial to note that the dataset is intentionally designed to cater to these specific categories.

### 4.2 Experimental setup

The study is conducted on a macOS High Sierra machine equipped with an Intel Core i5 CPU and Intel Graphics running at 1.8 GHz, utilizing Python 3.10.4. Additionally, GPU

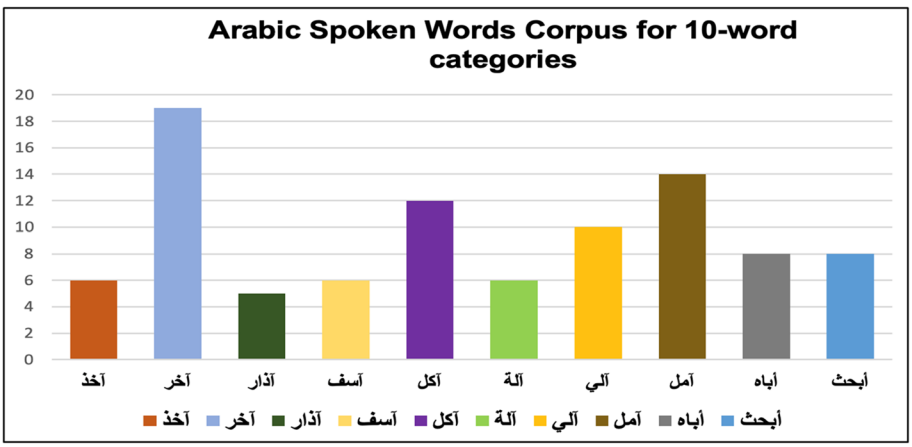


**Fig. 3** The Number of samples for 10-spoken word categories

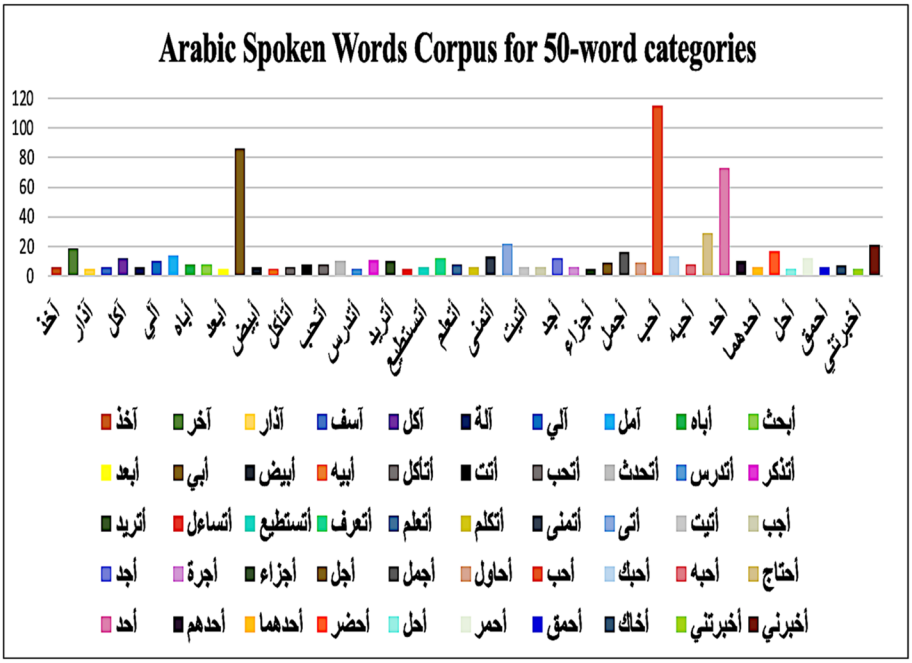


**Fig. 4** The Number of samples for 50-spoken word categories

support from Google Colab pro++is leveraged. Experimental setups involved a 70:30 train-test split, and a fivefold cross-validation strategy is employed. The Adam optimizer is selected for optimization, configured with a batch size of 16, 100 iterations, and a learning rate set at 0.01. To introduce nonlinearity and enhance the capturing of intricate relationships, the "ReLu" activation function is employed in the experiments.

### 4.3 Results and discussions

Challenges in our Arabic spoken word recognition study are compounded by an under-resourced and severely unbalanced dataset. We extracted text transcripts using the pre-trained Arabic LARGE xlsr-Wav2Vec2-53 model, generating Buckwalter transliteration and authentic Arabic script. The former underwent conversion to phonemes and is transformed into 300-dimensional vectors using FastText subword modeling. Despite focusing on 10- and 50-word groups, managing spoken words posed difficulties due to dataset restrictions, mainly stemming from imbalance and under-resourcing. The initial Arabic script underwent transformation into stems and subsequently into unigrams, generating corresponding vectors. These vectors are adapted for the 3-layered dense+BN model through concatenation and padding. For both the 10 and 50-word categories, the Arabic script featured a vector size of $3900 \times 1$. Simultaneously, phonemes from Buckwalter transliteration are converted into sub-word embedding vectors.

Experimentation hyperparameters are detailed in Table 2, with concatenated and padded features serving as inputs for training a 3-layered model. This model comprises a flattened layer and three dense layers (512, 256, 64), interwoven with batch normalization

**Table 2** Hyperparameters employed in our experiment

| Parameters | 10-Arabic spoken words | | 50-Arabic spoken words | |
|---|---|---|---|---|
| | Buckwalter transliterations | Arabic scripts | Buckwalter transliterations | Arabic scripts |
| Training samples | 65 | 65 | 505 | 505 |
| Testing samples | 29 | 29 | 217 | 217 |
| Dimension | 2700 X 1 | 3900 X 1 | 3000 X 1 | 3900 X 1 |
| Concatenation and padding | yes | yes | yes | yes |
| Dense layers | 3 | 3 | 3 | 3 |
| Batch Normalization (BN) | with BN | With BN | With BN | With BN |
| Activation function | ReLu | ReLu | ReLu | ReLu |
| Epochs | 100 | 100 | 100 | 100 |
| Total parameters | 1,534,410 | 2,148,810 | 1,690,610 | 2,148,810 |
| Trainable parameters | 1,532,874 | 2,147,274 | 1,689,074 | 2,147,274 |
| Non- trainable parameters | 1,536 | 1,536 | 1,536 | 1,536 |

and activated by "ReLu." The Adam optimizer [49] ensures consistent performance across tasks, optimizing through sparse categorical cross-entropy loss. Rigorous evaluation involves a 70:30 train:test split and fivefold cross-validation, with Adam optimizer settings specifying a batch size of 16, 100 epochs, and a learning rate of 0.01. The "ReLu" activation function introduces nonlinearity. The dataset includes 94 samples for the 10-word category and 722 for the 50-word category. The Buckwalter transliteration vectors have dimensions of $2700 \times 1$ and $3000 \times 1$, while the authentic Arabic script vectors maintain a consistent $3900 \times 1$ size for both categories, as shown in Table 2. These dimensions remain uniform with slight variations based on the chosen approach. In handling the imbalanced dataset, concatenation and padding are instrumental. Padding introduces zeros, while concatenation merges arrays per word type, ensuring uniformity. Our strategy involves early feature fusion, effectively combining padding and concatenation of vectors. In comparative analysis, the Buckwalter transliteration form exhibits significantly higher accuracy than its Arabic script counterpart. Despite employing a stemming algorithm for the Arabic script, its study is hindered by limited resource availability. Consequently, due to these constraints, the emphasis on the Arabic script is relatively diminished. It is important to note that addressing spoken Arabic speech comprehension becomes even more intricate due to the substantial dataset imbalance.

After configuring the hyperparameters, each padding feature undergoes training for two distinct text transcript types: one with 10 spoken words and the other with 50. The shape for the 10-spoken word Buckwalter transliteration is (2700) after vector concatenation and padding. The total parameters, including both trainable and non-trainable, amount to 1,534,410.

This experiment is conducted independently, with a specific focus on the Buckwalter transliteration form, as outlined in Table 2. The vectors undergo processing through the flattened layer for the 50 spoken word category after post-vector concatenation and padding, resulting in an shape of (3000).

The neural network architecture shown in Fig. 5 is carefully crafted with interconnected layers, strategically designed to extract and process features effectively. Across all variations of the network, a consistent three-layer pattern is implemented, aiming

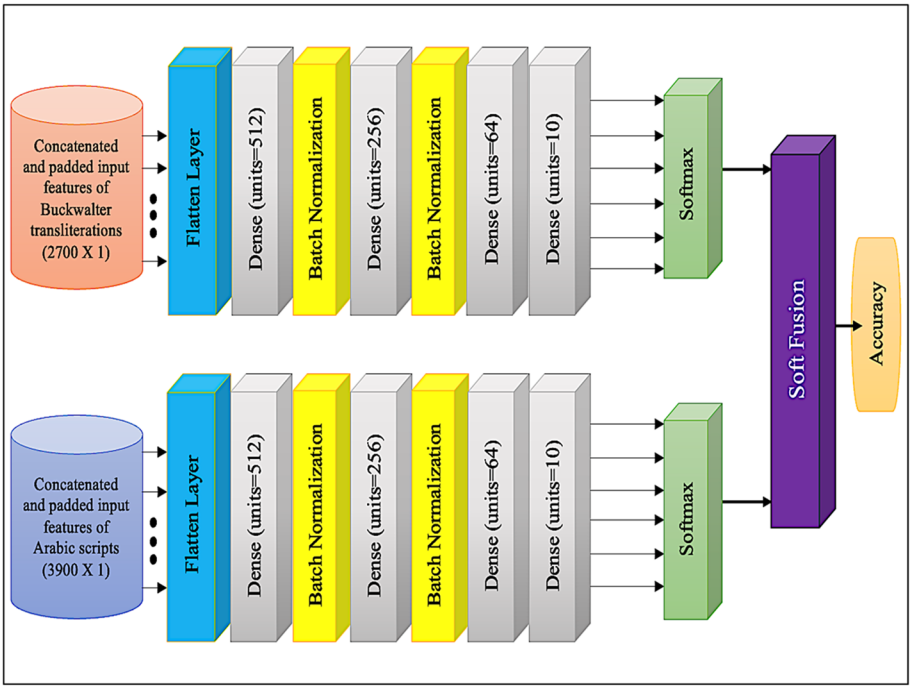


**Fig. 5** Proposed neural network architecture

to optimize performance. This pattern includes an initial dense layer with 512 neurons, followed by the application of BN to regulate internal activations. Subsequently, a second dense layer featuring 256 neurons is introduced, and an additional batch normalization step is inserted between the second dense layer and the third layer, which houses 64 neurons. This uniform three-layer design is systematically applied across all investigated methods. To consolidate results, probabilistic scores corresponding to different categories are combined, and the outcomes from the five-fold cross-validation are aggregated to establish robust final composite results. In the context of the 50-spoken word category, the resulting shape is (3000). Regarding parameters, the total count is 1,690,610, with 1,689,074 trainable parameters and 1,536 non-trainable parameters. These comprehensive details are meticulously compiled and summarized in Table 2.

The neural network receives input vectors representing padded Arabic script, with an input shape of (3900), and Buckwalter transliteration, characterized by an input shape of (2700), for the 10-spoken word categories in the Arabic language. Throughout the training phase, these padded vectors undergo optimization. Subsequently, these vectors traverse through a flattened layer before passing through three dense layers.

The early fusion of phone embeddings and unigram embeddings yields impressive accuracy in spoken word recognition. Across the ten spoken word categories in the Multilingual Spoken Words Corpus, phone embeddings achieve 68.96% accuracy, while unigram embeddings attain 44.83%. Similarly, for the fifty categories, early fusion records 67.28% accuracy for phone embeddings and notably improves to 52.78% for unigram embeddings. Moving to the next phase, hybrid fusion combines probabilistic

scores from both preceding methods, revealing promising results. In comparison with established techniques, the hybrid fusion of phone embeddings and unigram embeddings in the Multilingual Spoken Words Corpus further advances performance. For ten categories, hybrid fusion achieves an accuracy of 72.41% with phone embeddings, impressively enhancing to 70.97% for fifty categories. This study underscores a significant finding: the relevance of phonemes extracted from raw audio in multilingual spoken word recognition, a relevance that persists even with a limited number of training samples.

Figures 6 and 7 depict the confusion matrices for the hybrid fusion (combination of early and late fusion) hypothesis, offering a comprehensive overview of aligning "actual" outcomes with their respective "predicted" outcomes. The proposed technique excels in spoken word recognition, achieving its highest accuracy in specific categories. In the 10-class scenario, the peak accuracy is observed in the "C_2" category, while for the 50 spoken word categories, it's in "C_37." However, it's crucial to acknowledge that a larger dataset could significantly enhance the model's performance. The limited dataset size poses challenges, especially in accommodating diverse accented speech patterns of native speakers. Consequently, accuracies often skew towards the lower end. Nonetheless, these values genuinely reflect the model's capabilities under such constraints. For clarity, the y-axis on the plot represents actual values, while the x-axis corresponds to predicted values.

We conducted a thorough comparative analysis to evaluate the accuracy of our proposed strategy against previous tests. One-dimensional MFCC features are transformed into a two-dimensional array with 39 columns. This array incorporates all MFCC coefficients, including the 13 static, 13 delta, and 13 acceleration coefficients computed from a 25 ms speech frame [43]. We construct a 2D array resembling an image by layering the speech features across numerous frames. The input for our three-layered CNN

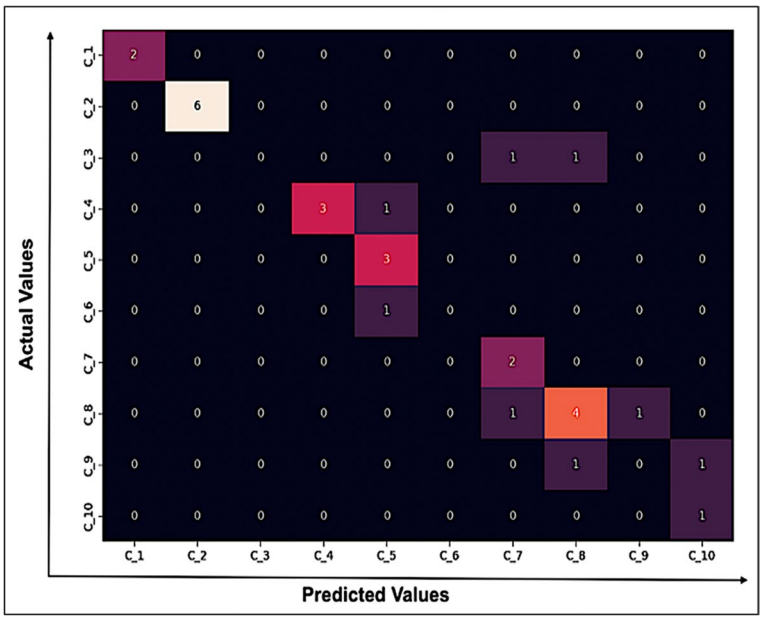


**Fig. 6** Confusion matrix for 10-spoken word categories after hybrid fusion

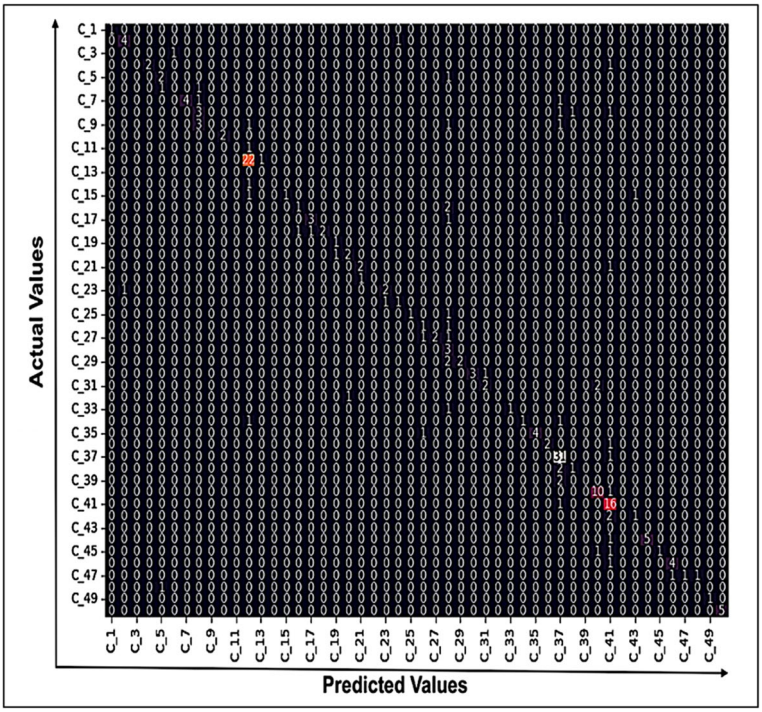


**Fig. 7** Confusion matrix for 50-spoken word categories after hybrid fusion

model, which includes three convolution layers, is this array. Each subsequent layer incorporates more feature maps than the preceding one, starting with 64 feature maps in the first layer, rising to 128 in the second layer, and reaching 256 in the third layer. Max pooling layers follow each convolutional layer, enhancing the model's ability to extract meaningful features.

Their approach attains a notable accuracy of 12.12%, surpassing competing methods. Our outperforms the approach proposed in [44], which utilized delta MFCC training on CNN and Adagrad, achieving a fivefold cross-validation result of 27.27%. Furthermore, a comparison with a hybrid CNN + BiLSTM model [45] resulted in an accuracy of 28.78%. Our methodology demonstrates a substantial margin over the State-of-the-Art (SOTA). Importantly, our text-based features exhibit superior performance when compared to audio-based features.

Moreover, our approach surpasses the performance of MFCC combined with bidirectional gated recurrent units [50] and long short-term memory [51]. A thorough evaluation encompasses diverse metrics across the five comparative methods, as detailed in Table 3. The results highlight significant specificity, low false negative rates (FNR), and false discovery rates (FDR) across all classes. However, sensitivity and positive predictive value (PPV) [57] demonstrate comparatively lower values for most classes. The preference for linguistic features over acoustic modeling is grounded in our consistently high accuracy rates. This strategic choice proves particularly impactful for low-resourced languages, transformer-based generated text transcripts, and the synergistic fusion of optimal linguistic components such as bigrams and phonemes. While

**Table 3** Accuracy results on comparison and proposed methods with fivefold cross-validation

| Spoken word categories | Precision | Recall | f 1-Score | Sensitivity | Specificity | NPV | FPR | FNR | FDR | PPV |
|---|---|---|---|---|---|---|---|---|---|---|
| آخذ | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 1.00 (1) | 0.86 (1) | 0.00 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 0.25 (2) | 0.10 (2) | 0.14 (2) | 0.10 (2) | 0.95 (2) | 0.85 (2) | 0.05 (2) | 0.90 (2) | 0.75 (2) | 0.25 (2) |
| | 0.25 (3) | 0.10 (3) | 0.14 (3) | 0.10 (3) | 0.95 (3) | 0.85 (3) | 0.05 (3) | 0.90 (3) | 0.75 (3) | 0.25 (3) |
| | 0.20 (4) | 0.50 (4) | 0.29 (4) | 0.50 (4) | 0.85 (4) | 0.96 (4) | 0.15 (4) | 0.50 (4) | 0.80 (4) | 0.20 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.92 (5) | 0.88 (5) | 0.08 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 1.00 (*) | 1.00 (*) | 1.00 (*) | 1.00 (*) | 1.00 (*) | 1.00 (*) | 0.00 (*) | 0.00 (*) | 0.00 (*) | 1.00 (*) |
| آخر | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 1.00 (1) | 0.94 (1) | 0.00 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 1.00 (2) | 0.50 (2) | 0.67 (2) | 0.50 (2) | 1.00 (2) | 0.97 (2) | 0.00 (2) | 0.50 (2) | 0.00 (2) | 1.00 (2) |
| | 0.67 (3) | 0.50 (3) | 0.57 (3) | 0.50 (3) | 0.98 (3) | 0.97 (3) | 0.02 (3) | 0.50 (3) | 0.33 (3) | 0.67 (3) |
| | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.00 (4) | 1.00 (4) | 0.79 (4) | 0.00 (4) | 1.00 (4) | 1.00 (4) | 0.00 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.97 (5) | 0.94 (5) | 0.03 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 1.00 (*) | 1.00 (*) | 1.00 (*) | 1.00 (*) | 1.00 (*) | 1.00 (*) | 0.00 (*) | 0.00 (*) | 0.00 (*) | 1.00 (*) |
| آذار | 0.18 (1) | 0.33 (1) | 0.24 (1) | 0.33 (1) | 0.67 (1) | 0.82 (1) | 0.33 (1) | 0.67 (1) | 0.82 (1) | 0.18 (1) |
| | 0.17 (2) | 0.29 (2) | 0.21 (2) | 0.28 (2) | 0.83 (2) | 0.91 (2) | 0.17 (2) | 0.71 (2) | 0.83 (2) | 0.17 (2) |
| | 0.17 (3) | 0.29 (3) | 0.21 (3) | 0.28 (3) | 0.83 (3) | 0.91 (3) | 0.17 (3) | 0.71 (3) | 0.83 (3) | 0.17 (3) |
| | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.89 (4) | 0.92 (4) | 0.11 (4) | 1.00 (4) | 1.00 (4) | 0.00 (4) |
| | 0.10 (5) | 0.20 (5) | 0.13 (5) | 0.20 (5) | 0.66 (5) | 0.82 (5) | 0.34 (5) | 0.80 (5) | 0.91 (5) | 0.10 (5) |
| | 0.00 (*) | 0.00 (*) | 0.00 (*) | 0.00 (*) | 1.00 (*) | 0.93 (*) | 0.00 (*) | 1.00 (*) | 1.00 (*) | 0.00 (*) |
| آسف | 0.14 (1) | 0.80 (1) | 0.24 (1) | 0.80 (1) | 0.59 (1) | 0.97 (1) | 0.41 (1) | 0.20 (1) | 0.87 (1) | 0.14 (1) |
| | 0.60 (2) | 0.50 (2) | 0.55 (2) | 0.50 (2) | 0.97 (2) | 0.95 (2) | 0.03 (2) | 0.50 (2) | 0.40 (2) | 0.60 (2) |
| | 0.60 (3) | 0.50 (3) | 0.55 (3) | 0.50 (3) | 0.97 (3) | 0.95 (3) | 0.03 (3) | 0.50 (3) | 0.40 (3) | 0.60 (3) |
| | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.00 (4) | 1.00 (4) | 0.86 (4) | 0.00 (4) | 1.00 (4) | 1.00 (4) | 0.00 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.98 (5) | 0.89 (5) | 0.02 (5) | 1.00 (5) | 1.00 (5) | 0.10 (5) |
| | 1.00 (*) | 0.25 (*) | 0.40 (*) | 0.25 (*) | 1.00 (*) | 0.89 (*) | 0.00 (*) | 0.75 (*) | 0.00 (*) | 1.00 (*) |
| آكل | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.90 (1) | 0.91 (1) | 0.10 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 0.00 (2) | 0.00 (2) | 0.00 (2) | 0.00 (2) | 1.00 (2) | 0.92 (2) | 0.00 (2) | 1.00 (2) | 1.00 (2) | 0.00 (2) |
| | 1.00 (3) | 0.20 (3) | 0.33 (3) | 0.20 (3) | 1.00 (3) | 0.94 (3) | 0.00 (3) | 0.80 (3) | 0.00 (3) | 1.00 (3) |
| | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.00 (4) | 1.00 (4) | 0.90 (4) | 0.00 (4) | 1.00 (4) | 1.00 (4) | 0.00 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.94 (5) | 0.95 (5) | 0.06 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 0.50 (*) | 1.00 (*) | 0.67 (*) | 1.00 (*) | 0.88 (*) | 1.00 (*) | 0.12 (*) | 0.00 (*) | 0.50 (*) | 0.05 (*) |

**Table 3** (continued)

| Spoken word categories | Precision | Recall | f 1-Score | Sensitivity | Specificity | NPV | FPR | FNR | FDR | PPV |
|---|---|---|---|---|---|---|---|---|---|---|
| آلة | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 1.00 (1) | 0.94 (1) | 0.00 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 1.00 (2) | 0.33 (2) | 0.50 (2) | 0.33 (2) | 1.00 (2) | 0.97 (2) | 0.00 (2) | 0.67 (2) | 1.00 (2) | 1.00 (2) |
| | 1.00 (3) | 0.33 (3) | 0.50 (3) | 0.33 (3) | 1.00 (3) | 0.97 (3) | 0.00 (3) | 0.67 (3) | 0.00 (3) | 1.00 (3) |
| | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.00 (4) | 1.00 (4) | 0.96 (4) | 0.00 (4) | 1.00 (4) | 1.00 (4) | 0.00 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.93 (5) | 0.92 (5) | 0.06 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 0.00 (*) | 0.00 (*) | 0.00 (*) | 0.00 (*) | 1.00 (*) | 0.97 (*) | 0.00 (*) | 1.00 (*) | 1.00 (*) | 0.00 (*) |
| آلي | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.97 (1) | 0.92 (1) | 0.03 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 0.22 (2) | 0.33 (2) | 0.27 (2) | 0.33 (2) | 0.88 (2) | 0.93 (2) | 0.11 (2) | 0.67 (2) | 0.78 (2) | 0.22 (2) |
| | 0.22 (3) | 0.33 (3) | 0.27 (3) | 0.33 (3) | 0.88 (3) | 0.93 (3) | 0.12 (3) | 0.67 (3) | 0.78 (3) | 0.22 (3) |
| | 0.50 (4) | 0.50 (4) | 0.50 (4) | 0.50 (4) | 0.96 (4) | 0.96 (4) | 0.04 (4) | 0.50 (4) | 0.50 (4) | 0.50 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 1.00 (5) | 0.94 (5) | 0.00 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 0.40 (*) | 1.00 (*) | 0.57 (*) | 1.00 (*) | 0.88 (*) | 1.00 (*) | 0.11 (*) | 0.00 (*) | 0.60 (*) | 0.04 (*) |
| أمل | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 1.00 (1) | 0.80 (1) | 0.00 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 0.19 (2) | 0.38 (2) | 0.25 (2) | 0.38 (2) | 0.58 (2) | 0.79 (2) | 0.41 (2) | 0.62 (2) | 0.81 (2) | 0.19 (2) |
| | 0.20 (3) | 0.38 (3) | 0.26 (3) | 0.38 (3) | 0.62 (3) | 0.80 (3) | 0.38 (3) | 0.62 (3) | 0.80 (3) | 0.20 (3) |
| | 0.33 (4) | 0.67 (4) | 0.44 (4) | 0.67 (4) | 0.65 (4) | 0.88 (4) | 0.35 (4) | 0.33 (4) | 0.67 (4) | 0.33 (4) |
| | 0.21 (5) | 0.46 (5) | 0.29 (5) | 0.00 (5) | 0.56 (5) | 0.81 (5) | 0.43 (5) | 0.54 (5) | 0.54 (5) | 0.21 (5) |
| | 0.67 (*) | 0.67 (*) | 0.67 (*) | 0.67 (*) | 0.91 (*) | 0.91 (*) | 0.09 (*) | 0.33(*) | 0.33(*) | 0.67 (*) |
| أباه | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.93 (1) | 0.92 (1) | 0.06 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 0.33 (2) | 0.25 (2) | 0.29 (2) | 0.25 (2) | 0.93 (2) | 0.90 (2) | 0.07 (2) | 0.75 (2) | 0.67 (2) | 0.33 (2) |
| | 0.33 (3) | 0.25 (3) | 0.29 (3) | 0.25 (3) | 0.93 (3) | 0.90 (3) | 0.07 (3) | 0.75 (3) | 0.67 (3) | 0.33 (3) |
| | 0.17 (4) | 0.50 (4) | 0.25 (4) | 0.50 (4) | 0.81 (4) | 0.96 (4) | 0.19 (4) | 0.50 (4) | 0.83 (4) | 0.17 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.46 (5) | 1.00 (5) | 0.88 (5) | 0.00 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 0.00 (*) | 0.00 (*) | 0.00 (*) | 0.00 (*) | 0.96 (*) | 0.93 (*) | 0.03 (*) | 1.00 (*) | 1.00 (*) | 0.00 (*) |
| أبحث | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.00 (1) | 0.95 (1) | 0.94 (1) | 0.05 (1) | 1.00 (1) | 1.00 (1) | 0.00 (1) |
| | 0.00 (2) | 0.00 (2) | 0.00 (2) | 0.00 (2) | 1.00 (2) | 0.94 (2) | 0.00 (2) | 1.00 (2) | 1.00 (2) | 0.00 (2) |
| | 0.00 (3) | 0.00 (3) | 0.00 (3) | 0.00 (3) | 1.00 (3) | 0.94 (3) | 0.00 (3) | 1.00 (3) | 1.00 (3) | 0.00 (3) |
| | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.00 (4) | 0.96 (4) | 0.96 (4) | 0.03 (4) | 1.00 (4) | 1.00 (4) | 0.00 (4) |
| | 0.00 (5) | 0.00 (5) | 0.00 (5) | 0.00 (5) | 1.00 (5) | 0.92 (5) | 0.00 (5) | 1.00 (5) | 1.00 (5) | 0.00 (5) |
| | 0.50 (*) | 1.00 (*) | 0.67 (*) | 1.00 (*) | 0.96 (*) | 1.00 (*) | 0.03 (*) | 0.00 (*) | 0.50 (*) | 0.50 (*) |

conventional speech recognition methods often excel in normal speech scenarios, they encounter substantial challenges when confronted with diverse accents, native speakers, and non-English languages, especially in the context of limited and skewed datasets. Our results underscore the potency of linguistic features in effectively addressing these challenges, opening up promising avenues for further advancements in multilingual spoken word recognition (Table 4).

Table 3 provides a comprehensive evaluation of performance metrics across spoken word categories, utilizing three distinct comparative methods denoted as (1) [43], (2) [44], (3) [45], (4) [50], and (5) [51], alongside our (*) proposed method. The assessment includes crucial metrics such as Precision, Recall, and the f1-Score. Precision, also known as positive predictive value (PPV), measures the ratio of true positives to all instances identified by the model as positive. This calculation is defined by Eq. (15).

$$precision/positive\ predictive\ value\ (PPV) = \frac{tp}{\left[tp + fp\right]} \tag{15}$$

The true positive rate, often referred to as sensitivity, corresponds to the recall.

$$sensitivity/recall = \frac{tp}{\left[tp + fn\right]} \tag{16}$$

True positive, true negative, false negative, and false positive values are denoted here by *tp*, *tn*, *fn*, and *fp*, respectively. The f1-Score is the harmonic mean of precision and recall values. The f1-Score's formula is

$$f1 - Score = \frac{2 \times precision \times recall}{\left[precision + recall\right]} \tag{17}$$

Precision, recall, and f1-Score, crucial performance metrics in our experiment, consistently demonstrate elevated values, emphasizing the robust classification capabilities of our approach. Table 3 provides a comprehensive array of evaluation metrics for each word class, encompassing accuracy, negative predictive value (NPV), false positive rate (FPR), false negative rate (FNR), and false discovery rate (FDR).

Negative Predictive Value (NPV) assesses the ratio of instances classified as negative in test results that correctly align with true negatives among valid samples. It measures the proportion of subjects correctly identified as negative compared to all other participants identified as test negatives, covering both accurately identified negatives and those incorrectly labeled as positives. Mathematically, NPV is denoted as follows:

$$negative\ predictive\ value\ (NPV) = \frac{tn}{\left[fn + tn\right]} \tag{18}$$

**Table 4** Proposed evaluation metric with fivefold cross-validation

| Accuracy | | Mathew's correlation coefficient (MCC) | Macro | Micro |
|---|---|---|---|---|
| Proposed Method | 70.97% | 0.61669261244469 | 0.49714285714285716 | 0.709741724890762 |

In an ideal scenario, a flawless test yielding no false negative outcomes would result in an NPV of 1 (100%). Conversely, in a test without any true negative outcomes, the NPV would drop to 0 (0%). Similarly, a perfect test achieves a PPV of 1 (100%) at its peak performance, while its lowest value is zero, representing optimal and worst-case outcomes, respectively. The FNR indicates the proportion of positive test results mistakenly identified as negative. It also serves as the conditional probability of obtaining a negative test result given the presence of the positive element under examination. In contrast, the FDR quantifies the anticipated proportion of type I errors, analogous to incorrect rejections of null hypotheses, within positive test outcomes. These metrics are represented by FPR, FNR, and FDR. Offering invaluable insights into testing procedures' performance and characteristics, these metrics aid in the interpretation and assessment of their outcomes. By comprehensively capturing the nuances of test results, these metrics facilitate a deeper understanding of the strengths and limitations of the applied methodologies.

$$false\ positive\ rate\ (FPR) = \frac{fp}{\left[fp + tn\right]} \tag{19}$$

$$false\ negative\ rate\ (FNR) = \frac{fn}{\left[fn + tp\right]} \tag{20}$$

$$false\ discovery\ rate\ (FDR) = \frac{fp}{\left[fp + tp\right]} \tag{21}$$

$$Accuracy(ACC) = \frac{tp + tn}{\left[tp + fp + fn + tn\right]} \tag{22}$$

$$Word\ error\ rate\ (WER) = 1 - ACC \tag{23}$$

In Table 5, we have provided the categorized spoken words along with the results of hybrid fusion for both the 10- and 50-word categories. Significantly, the hybrid fusion procedure has outperformed the methods listed in Table 3, yielding numerous positive outcomes. This success can be attributed to our intentional emphasis on using text-based features rather than audio-based ones, leading to a substantial improvement in the overall quality of the results.

Figure 8 illustrates the classification report for the proposed method across 10 Arabic spoken word categories. The results prominently showcase our method's superiority over the other comparative approaches, as evidenced by notable improvements in accuracy and word error rate.

## 5 Conclusion

In conclusion, this paper introduces a supervised method designed to tackle the intricate challenge of multilingual spoken word recognition in resource-limited contexts. The study highlights the underexplored application of morphology and phonology in processing spoken text, identifying a critical gap in the current state of the art. The evaluation of our proposed approach, particularly the early fusion of phone embeddings and unigram

**Table 5** Number of classified spoken words after training for 50-word categories

| Spoken word categories | Number of classified spoken words | Accuracy (ACC) | WER |
|---|---|---|---|
| آخذ | 1 | 1.00000000 | 0.00 |
| آخر | 4 | 0.99078341 | 0.01 |
| آذار | 0 | 0.99539171 | 0.00 |
| آسف | 2 | 0.99539171 | 0.00 |
| آكل | 2 | 0.98617512 | 0.01 |
| آلة | 0 | 0.98617512 | 0.01 |
| آلي | 4 | 0.99078341 | 0.01 |
| آمل | 3 | 0.96313364 | 0.04 |
| أباه | 0 | 0.97235023 | 0.03 |
| أبحث | 2 | 1.00000000 | 0.00 |
| أبعد | 0 | 0.99539171 | 0.00 |
| أبي | 22 | 0.97235023 | 0.03 |
| أبيض | 0 | 0.99539171 | 0.00 |
| أبيه | 0 | 0.99539171 | 0.00 |
| أتأكل | 1 | 0.99078341 | 0.00 |
| أتت | 1 | 0.98617512 | 0.01 |
| أتحب | 3 | 0.98617512 | 0.01 |
| أتحدث | 2 | 0.99078341 | 0.00 |
| أتدرس | 1 | 0.99539171 | 0.00 |
| أتذكر | 2 | 0.99078341 | 0.00 |
| أتريد | 2 | 0.99078341 | 0.00 |
| أتساءل | 0 | 0.99539171 | 0.00 |
| أتستطيع | 2 | 0.99078341 | 0.01 |
| أتعرف | 1 | 0.99078341 | 0.01 |
| أتعلم | 1 | 0.99539171 | 0.00 |
| أتكلم | 1 | 0.98617512 | 0.01 |
| أتمنى | 2 | 0.99078341 | 0.00 |
| أتى | 3 | 0.94930876 | 0.05 |
| أتيت | 2 | 0.99078341 | 0.01 |
| أجب | 3 | 0.99539171 | 0.00 |
| أجد | 2 | 0.98617512 | 0.01 |
| أجرة | 0 | 0.99539171 | 0.00 |
| أجزاء | 1 | 0.99539171 | 0.00 |
| أجل | 1 | 0.99078341 | 0.01 |
| أجمل | 4 | 0.99539171 | 0.00 |
| أحاول | 2 | 0.99539171 | 0.00 |
| أحب | 31 | 0.94930876 | 0.05 |
| أحبك | 1 | 0.98617512 | 0.01 |
| أحبه | 0 | 0.99078341 | 0.01 |
| أحتاج | 10 | 0.98156682 | 0.02 |
| أحد | 16 | 0.94470046 | 0.06 |
| أحدهم | 0 | 0.98617512 | 0.01 |
| أحدهما | 0 | 0.99078341 | 0.01 |
| أحضر | 5 | 0.99539171 | 0.00 |

**Table 5** (continued)

| Spoken word categories | Number of classified spoken words | Accuracy (ACC) | WER |
|---|---|---|---|
| أحل | 1 | 0.99078341 | 0.00 |
| أحمر | 4 | 0.99078341 | 0.00 |
| أحمق | 1 | 0.99078341 | 0.00 |
| أخاك | 0 | 0.99078341 | 0.00 |
| أخبرتني | 1 | 1. 00000000 | 0.00 |
| أخبرني | 5 | 1. 00000000 | 0.00 |

embeddings, produces promising results. For the 10 spoken word categories in the Multilingual Spoken Words Corpus, we achieve accuracies of 68.96% and 44.83% for phone and unigram embeddings, respectively. Similarly, for the 50 spoken word categories, accuracies reach 67.28% for phone embeddings and notably improve to 52.78% for unigram embeddings. Expanding on the success of early fusion, the implementation of hybrid fusion further elevates the accuracy of spoken word recognition. The hybrid fusion of phone embeddings and unigrams embeddings attains an accuracy of 72.41% for 10 spoken word categories and 70.97% for 50 spoken word categories, surpassing the performance of previous techniques. This study underscores the pivotal role of phonemes extracted from raw audio in substantially enhancing multilingual spoken word recognition, even with a

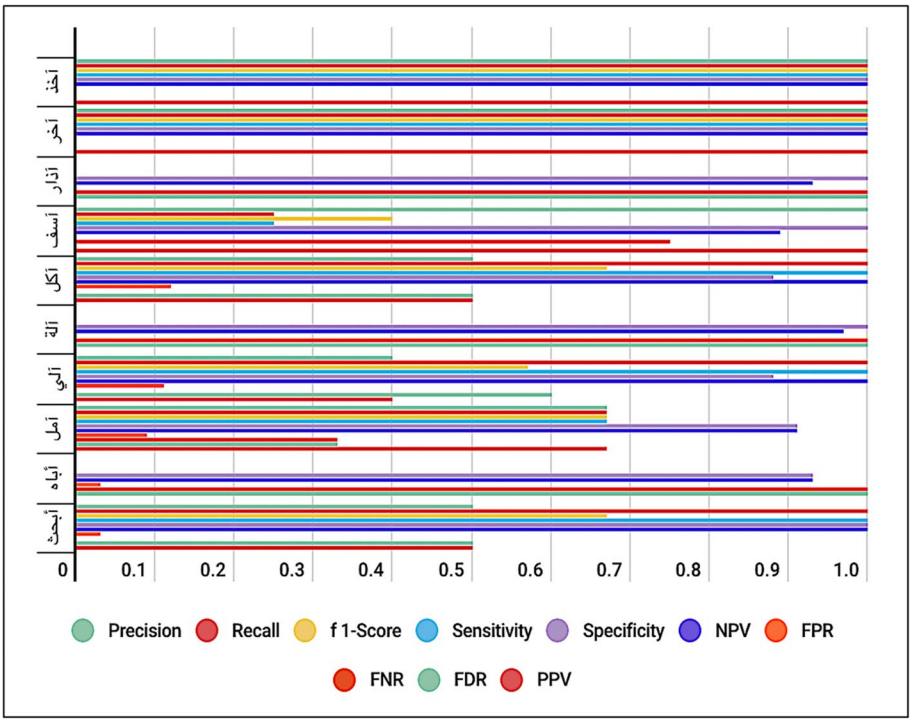


**Fig. 8** Classification results of late fusion of Buckwalter transliteration and authentic Arabic Script to detect Arabic Spoken Words for 10-word categories

limited number of training samples. Moving forward, our future endeavors aim to broaden the scope by incorporating additional local languages and exploring the potential of audio phonemes, recognizing their crucial significance in advancing the field of spoken word recognition. Through this research, we contribute insightful perspectives at the intersection of linguistic features and acoustic modeling, paving the way for advancements in effectively handling the complexities of diverse spoken languages within resource-constrained settings.

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**Data availability** On reasonable request, the corresponding author can make the data underlying the conclusions of this research available.

**Code availability** The corresponding author can give the code supporting the study's conclusions upon reasonable request.

## Declarations

**Conflict of interest** The authors declare that there is no conflict of interest.

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# Structural aspects of concrete incorporating recycled coarse aggregates from construction and demolished waste

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**ABSTRACT:** The study explores the potential of recycling construction and demolition waste into recycled coarse aggregates (RCA) to decrease waste generation and carbon footprint, using a standard compacting effort to calculate compressive strength and particle packing density in a specific cylindrical volume. This study investigates the impact of RCA on concrete's workability, compressive strength, flexural, split tensile, drying shrinkage, electrical resistivity, rapid chloride penetration, and microstructural characteristics using XRD, SEM, and EDAX. Test findings showed that increasing the replacement percentage beyond the optimum value (RCA 25) had detrimental effects on the strength and microstructure of the concrete. RCA 25 has a higher compressive, flexural, and split tensile strength in the order of 11.56%, 3.06%, and 5.17% respectively compared to reference concrete, as well as 5.23% increase in drying shrinkage, 8.79% higher electrical resistivity, and 4.68% higher resistance to chloride penetration than reference concrete.

**KEY WORDS:** Aggregate; Concrete; Hydration products; Ettringite formation; Portland cement.

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**RESUMEN:** *Aspectos estructurales del hormigón que incorpora áridos gruesos reciclados de residuos de construcción y demolición.* Este estudio explora el potencial del reciclaje de residuos de construcción y demolición en áridos gruesos reciclados (RCA) para reducir la generación de desechos y la huella de carbono, utilizando un esfuerzo de compactación estándar para calcular la resistencia a la compresión y la densidad de empaquetado de partículas en un volumen cilíndrico específico. La investigación evalúa el impacto del RCA en la trabajabilidad, resistencia a la compresión, resistencia a flexión, tensión por flexión, retracción por secado, resistividad eléctrica, penetración rápida de cloruro y características microestructurales utilizando XRD, SEM y EDAX. Los resultados muestran que aumentar el porcentaje de reemplazo más allá del valor óptimo (RCA 25) tiene efectos perjudiciales en la resistencia y microestructura del hormigón. El RCA 25 tiene una resistencia a la compresión, a flexión y tracción superior en un 11.56%, 3.06% y 5.17%, respectivamente, en comparación con el hormigón de referencia. Además, presenta un aumento del 5.23% en la retracción por secado, una resistividad eléctrica un 8.79% mayor y una resistencia a la penetración de cloruros un 4.68% superior al hormigón.

**PALABRAS CLAVE:** Árido; Hormigón; Productos de hidratación; Formación de etringita; Cemento portland.

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## 1. INTRODUCTION

In the modern era, sustainable development has become a central concern, shaping discussions across various industries, especially in the construction sector (1). This field faces significant challenges related to resource depletion and environmental impact, making the integration of recycled materials a focal point (2). By 2030, construction and demolition (C&D) waste are projected to increase by 2.59 billion tonnes, reaching 3.40 billion tonnes by 2050 (3). Dumping this waste in landfills not only depletes disposal sites but also leads to adverse environmental effects. One viable solution to this problem is utilizing C&D waste as aggregates for producing new concrete, given that 70–80% of concrete volume comprises aggregates (4). With concrete production demands increasing at a rate of 7.7% annually, employing C&D waste as aggregates could be both economically and environmentally beneficial (5). However, to ensure the feasibility of C&D waste-produced concrete in various civil engineering projects, it must meet specific standards, necessitating thorough examination (6). Structural health monitoring (SHM) is crucial for maintaining the long-term performance of concrete made from C&D waste (7). Concrete structures often face stress due to drying-related shrinkage, leading to fractures. Analyzing shrinkage strain is essential for evaluating the long-term performance of fresh concrete (8). Moreover, surface electrical resistivity serves as a corrosion risk indicator for concrete structures, guiding structural health monitoring efforts (9). Assessing chloride ion penetration in concrete is vital for corrosion management, particularly when C&D waste is used as aggregates (10). The microstructural properties of concrete are significantly influenced by the interfacial transition zone (ITZ) between aggregates and cement paste (11). A dense and well-accounted ITZ fosters a strong bond, thereby enhancing concrete performance. Considering these factors, the integration of C&D waste into concrete production demands comprehensive analysis and monitoring to ensure both economic viability and environmental sustainability.

Concrete shrinkage poses a significant challenge in the construction industry, prompting extensive studies to understand its properties and effects. Well-designed laboratory experiments are essential for comprehending concrete shrinkage characteristics (12). In one investigation, the electrical resistivity of four different cement types was analyzed using alternating current (A.C.) and direct current (D.C.) electric fields, demonstrating that resistivity values moderately fluctuate based on the size distribution of coarse particles (13, 14). Recycled aggregates have a notable impact on the strength of hardened concrete. Studies indicate that recycled aggregates perform satisfactorily at replacement ratios of 50% and 100% (15). For instance, a study on M20 concrete mix made with crushed demolition and construction waste revealed that the compressive strength of recycled aggregate concrete is typically 87% of natural aggregate concrete on average. Although the slump of recycled aggregates is low, improvements are possible (16). When analyzing the drying shrinkage of recycled aggregate-based concrete with or without fly ash, it was found that drying shrinkage can be equivalent to conventional concrete. Without fly ash, there is a 25% increase in drying shrinkage, which reduces to 7% with fly ash (17). In terms of workability and compressive strength, substituting 30% of natural aggregates with recycled coarse aggregates yielded comparable results to conventional concrete (18). Concrete resistance to chloride ion permeability, assessed using RCPT (ASTM C1202), exhibited high reliability and accuracy, with a 10% lower performance cost compared to other equipment. However, this tested concrete proved less durable in marine environments (19). Moreover, experiments showed that the percentage of recycled aggregates impacts concrete permeability, emphasizing its potential in C&D waste-based concrete production (20). Concrete with recycled aggregates and cementing agents demonstrated lower permeability compared to conventional concrete, making it less sensitive to stress (21). Studies exploring the partial replacement of cement with demolished waste concrete powder over 10-20 years observed a 20% increase in compressive strength. Surprisingly, the age of the concrete powder from demolished waste had no discernible impact (22).

Electrical resistivity emerges as a valuable tool for investigating concrete strength and maturity in relation to curing time, binder type, and aggregates, without causing damage (23). Another study found that a mixture of 30% clay and 10% fly ash in ternary mixed concrete minimized drying shrinkage (24). Concrete made from demolished waste aggregates can be equivalent to conventional concrete with a 30% replacement for fine aggregates and 20% for coarse aggregates (25). Research revealed that replacing natural aggregates with demolition project waste and clay brick aggregates at a 25% ratio leads to superior concrete properties (26). Utilizing C&D waste for concrete production enhances compressive strength, especially when waste concrete materials (WCM) with admixtures (WCA) are used at a 90% aggregate replacement percentage compared to fresh concrete materials (FCM) (27). Furthermore, a study investigating the drying shrinkage properties of concrete from recycled heavy-weight glass and steel slag aggregates found that increasing the proportion of steel slag replacements reduces modulus and drying shrinkage, indicating enhanced durability (28). Lastly, the electrical resistance of concrete made from recycled brick aggregates decreases as the percentage of recycled brick aggregates (RBA%) rises (29). These findings collectively emphasize the potential and versatility of recycled materials in improving various aspects of concrete production.

Recycling construction and demolition (C&D) waste into recycled aggregates (RCA) has become increasingly popular for sustainable concrete production, contributing to reduced landfill waste, conservation of natural resources, and the promotion of the circular economy (30). However, ensuring the quality and performance of recycled aggregates meet industry standards is of paramount importance. Researchers have conducted various studies by replacing coarse aggregates in different proportions. Yet, no specific technique has been proposed to determine the optimal percentage of RCA replacement for achieving the highest strength in concrete. This study addresses this gap by focusing on these parameters, alongside an in-depth analysis of mechanical properties and other essential characteristics.

The notable aspects of this research are as follows:

1. This study delves into the efficient utilization of RCA for sustainable concrete production. While RCA is often incorporated into concrete at limited proportions, this research examines five different ratios (0%, 25%, 50%, 75%, and 100%) to comprehensively assess their impact.
2. The study bridges existing research gaps by employing standard compacting methods to establish the order of compressive strength. Additionally, it verifies the influence of RCA proportions on various aspects, including workability (fresh), and properties such as compressive strength, flexural strength, split tensile strength, drying shrinkage, electrical resistivity, and rapid chloride penetration (hardened). Microstructural characteristics are also examined through techniques like XRD, SEM, and EDAX. By comparing the results with the control mix, this study identifies the most significant differences.
3. The research investigates the effects of RCA on the morphology and composition, including chemical and mineralogical aspects, of RCA concrete. By analyzing the generation of microstructure, this study sheds light on the influence of RCA on the concrete's microstructure and emphasizes the importance of determining the optimum RCA content for sustainable concrete development.

In summary, this study not only explores the efficient use of RCA for concrete production but also addresses crucial research gaps by employing rigorous methodologies to assess a wide range of properties. Furthermore, it delves into the intricate details of microstructural changes, emphasizing the significance of finding the optimal RCA content to advance the development of sustainable concrete.

## 2. EXPERIMENTAL PROGRAMME

### 2.1. Materials

The study employs Ordinary Portland cement grade 43, compliant with IS 269-2015 (31). Table 1 presents the physical test results for the cement.

**Table 1.** Cement physical test results.

| S.N. | Types | Value Measured | As per IS 269-2015 (31) |
|---|---|---|---|
| 1 | Consistency | 31% | - |
| 2 | Initial Setting Time | 58 | > 30 Minutes |
| 3 | Final setting Time | 435 | < 10 Hours |
| 4 | Specific Gravity | 3.11 | 3.0 to 3.15 |

For fine aggregate, natural sand with a particle size less than 4.75 mm, confirming to IS 383-2016 (Reaffirmed 2021) (32), is used. The coarse aggregates consist of crushed stone ranging from 4.75 mm to 20 mm, confirming to IS 383-2016 (Reaffirmed 2021) (32). This aggregate, passing through 40 mm sieves and retained on 4.75 mm sieves, has a passing percentage of 90.76% for 20 mm sieves and 4.52% for 10 mm sieves. Recycled coarse aggregates (RCA) from crushed concrete C&D waste are used after reducing them to the necessary size using an impact crusher. These RCA, also passing through 40 mm sieves and retained on 4.75 mm sieves, exhibit passing percentages of 92.10% for 20 mm sieves and 0.38% for 10 mm sieves. Table 2 provides a detailed overview of particle packing density within specific cylindrical volumes, achieved through standard compaction techniques.

**Table 2**. Weight within specific cylindrical volume achieved through standard compaction efforts.

| S. No | Coarse Aggregates Mixtures | Weight |
|---|---|---|
| 1 | NCA | 14.68 |
| 2 | RCA 25 + NCA 75 | 15.25 |
| 3 | RCA 50 + NCA 50 | 14.62 |
| 4 | RCA 75 + NCA 25 | 13.73 |
| 5 | RCA 100 | 13.15 |

This analysis involves various mixtures of coarse aggregates, revealing crucial insights into their compactness and structural viability. Firstly, the table outlines the results for NCA (Natural Coarse Aggregates), where the weight attained within the specific cylindrical volume stands at 14.68 units. Subsequently, the combination of RCA 25 + NCA 75 showcases a notably higher packing density, registering a weight of 15.25 units. Another blend, RCA 50 + NCA 50, which comprises equal parts of Recycled Coarse Aggregates (RCA) and Natural Coarse Aggregates (NCA), exhibits a weight of 14.62 units within the specified volume. A mixture with RCA 75 + NCA 25 composition, consisting of 75% RCA and 25% NCA, yields a slightly lower weight of 13.73 units. Lastly, using RCA 100, indicating the complete substitution of Natural Coarse Aggregates with 100% Recycled Coarse Aggregates, results in a weight of 13.15 units

within the specific cylindrical volume. Significantly, the data highlights that the blend of RCA 25 + NCA 75boasts the densest packing density among these combinations. This finding is essential, indicating superior structural integrity. This critical insight, complemented by Figure 1 showcasing particle size distribution, informs the selection of optimal concrete compositions for construction applications, ensuring the durability and stability of structures.

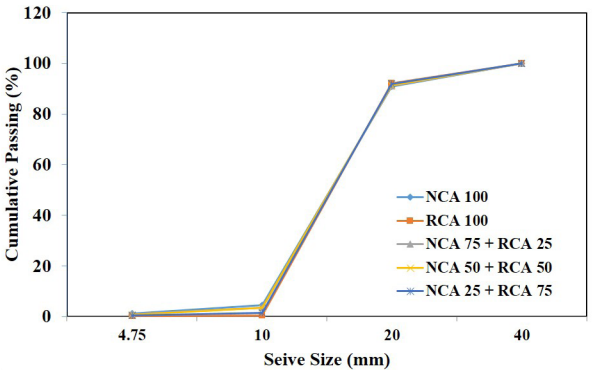


**Figure 1**. Gradation curves illustrating coarse aggregates in various mixtures.

Table 3 presents the physical and mechanical properties of both natural and recycled coarse aggregates, alongside natural fine aggregates (NFA), natural coarse aggregates (NCA), and recycled coarse aggregates (RCA).

**Table 3.** Physical and mechanical properties of aggregates.

| Property | NFA | NCA | RCA | Standard Limits |
|---|---|---|---|---|
| Bulk Density (kg/m$^3$) | 1625 | 1740 | 1660 | 1200-1750 (33) |
| Specific gravity | 2.675 | 2.754 | 2.681 | 2.30-2.90 (33) |
| Water Absorption (%) | 0.51 | 1.12 | 2.35 | ≤ 2.0 (IS 2386 Part 3) (33) |
| Abrasion Loss (%) | 15.52 | 25.43 | 28.76 | < 30 (IS 2386 Part 4) (34) |
| Crushing Value (%) | 16.21 | 26.24 | 27.71 | < 30 (IS 2386 Part 4) (34) |
| Impact Value (%) | 15.31 | 17.31 | 20.68 | < 30 (IS 2386 Part 4) (34) |

Furthermore, a chemical admixture in the form of super-plasticizers (C-MAX), conforming to IS 9103-1999 (35), is used at 1% by weight of cement. Potable water from the laboratory is employed for mixing and curing purposes, ensuring consistent and reliable experimental conditions.

## 2.2. Mix proportions

To investigate the viability and impact of recycled coarse aggregates on the mechanical properties of concrete, five distinct concrete mixtures were formulated to achieve target strength of 27MPa. The compositions of these mixtures are detailed in Table 4. The reference mixture (RC) was crafted using natural aggregates. Additionally, four other mixtures, namely RCA-25, RCA-50, RCA-75, and RCA-100, were created by substituting natural coarse aggregates with recycled coarse aggregates at replacement percentages of 25%, 50%, 75%, and 100%, respectively. All these concrete blends were meticulously prepared through the weight batching method, maintaining a consistent water-cement ratio of 0.50. This methodical approach allowed for a systematic exploration of the mechanical behavior of concrete when integrating various proportions of recycled coarse aggregates, offering valuable insights into their feasibility and effectiveness in enhancing the concrete's overall performance.

## 2.3. Testing programs

Various tests were conducted to assess different aspects of structural concrete. Workability, following the IS 1199-1959 standard (36), was measured to gauge the freshness of the concrete. Additionally, mechanical characteristics were evaluated through tests for compressive strength, flexural strength, and split tensile strength. To analyze the long-term performance of concrete, tests were performed for drying shrinkage (in accordance with IS 516 Part 6, 2020 (37)), electrical resistivity (following RILEM TC 154-EMC standards (38)), and rapid chloride penetration (as per ASTM C1202 guidelines (39)). Moreover, the microstructural features of concrete samples from different mixtures were examined using scanning electron microscopy (SEM), energy-dispersive X-ray spectros-

**Table 4.** Concrete mix compositions (kg/m$^3$).

| S. No. | Mixture ID | NFA | NCA | RCA | Cement | W/C Ratio | Admixture |
|---|---|---|---|---|---|---|---|
| 1 | RC | 444.48 | 1511 | 0 | 400 | 0.5 | 4 |
| 2 | RCA 25 | 444.48 | 1133.25 | 377.75 | 400 | 0.5 | 4 |
| 3 | RCA 50 | 444.48 | 755.5 | 755.5 | 400 | 0.5 | 4 |
| 4 | RCA 75 | 444.48 | 377.75 | 1133.25 | 400 | 0.5 | 4 |
| 5 | RCA 100 | 444.48 | 0 | 1511 | 400 | 0.5 | 4 |

copy (EDAX), and X-ray diffraction (XRD) analyses. These comprehensive assessments provided valuable insights into the various properties and performance aspects of the concrete structures under study.

## 3. RESULTS AND DISCUSSION

### 3.1. Workability

A slump test, in accordance with IS 1199-1959 (36), was conducted to assess the workability of concrete mixes containing varying proportions of Construction and Demolition (C&D) waste in the form of recycled coarse aggregates. The results of these tests are summarized in Table 5.

**Table 5.** Slump measurements for various mixtures.

| Concrete Mix | Slump (mm) |
|---|---|
| RC | 111 |
| RCA 25 | 101 |
| RCA 50 | 95 |
| RCA 75 | 83 |
| RCA 100 | 70 |

The variations in slump for the different concrete mixtures are graphically represented in Figure 2. The figure illustrates a consistent decrease in concrete slump with the increase in recycled coarse aggregates. The workability of concrete incorporating Recycled Coarse Aggregates (RCA) falls within the medium range of 50 to 100 mm, as indicated by the slump values across all mixtures. This reduction in slump is attributed to RCA absorbing more water than natural aggregates, primarily due to the presence of old adhered mortar on the RCA surface, which absorbs additional water. The trend clearly demonstrates that an escalation in RCA content leads to a decrease in the concrete slump. This pattern aligns with findings from a previous study (40), confirming the consistent impact of increasing RCA content on reducing concrete workability.

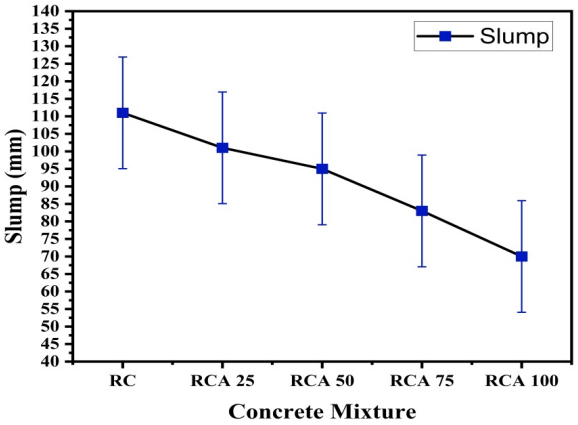


**Figure 2.** Slump values across various concrete mixtures.

### 3.2. Compressive strength

A total of 30 specimens, moulded in steel cubes with dimensions 15×15×15 cm, were cast, cured, and subjected to compressive strength testing across various concrete mixtures. Using a compression testing machine with a capacity of 2000 KN, the samples were analyzed at 7 and 28 days, and the results are detailed in Table 6. Figure 3 visually represents the variations in compressive strength at 7 and 28 days for different replacement percentages of Recycled Coarse Aggregates (RCA) concerning the reference mixture. The results clearly indicate that concrete mixtures with higher RCA replacements exhibit lower compressive strength compared to the reference mixture. Notably, the optimum replacement percentage of recycled coarse aggregates is 25%.

This observed trend can be explained by examining the voids and particle packing within the mixtures. At higher percentage of RCA, especially at 25% replacement, results in fewer voids and optimal particle packing, leading to higher strength. The study further emphasizes the importance of fine aggregates' particle size, specifically particles smaller than 600 microns, in forming a sufficient paste to fill voids in larger particles. A considerable gap between these particle sizes results in enhanced strength within specified limits. Conversely, smaller gaps lead to reduced strength. At

**Table 6.** Percentage variations in compressive strength among different mixtures.

| Concrete Mix | Compressive Strength (MPa) | | | |
|---|---|---|---|---|
| | 7 Days | % Variation With Respect to RC | 28 Days | % Variation With Respect to RC |
| RC | 22.71 | - | 31.99 | - |
| RCA 25 | 25.44 | +12.02 | 35.69 | +11.56 |
| RCA 50 | 22.12 | -02.59 | 31.45 | -01.68 |
| RCA 75 | 19.02 | -16.24 | 27.74 | -13.28 |
| RCA 100 | 16.31 | -28.18 | 22.99 | -28.13 |

+ sign represents increase in strength and – sign represents decrease in strength.

higher replacement percentages, increased void content and the presence of old adhered mortar weaken the bonding with aggregates, causing a decline in strength. Among the mixtures, RCA 25 exhibits the highest compressive strength (35.69 MPa), while RCA 100 displays the lowest (22.92 MPa). These findings align with previous studies, such as those by Kessal et al. (41), and support the results of Ankesh et al. (42), study, indicating that a 30% replacement of recycled coarse aggregates achieves strength exceeding the target levels.

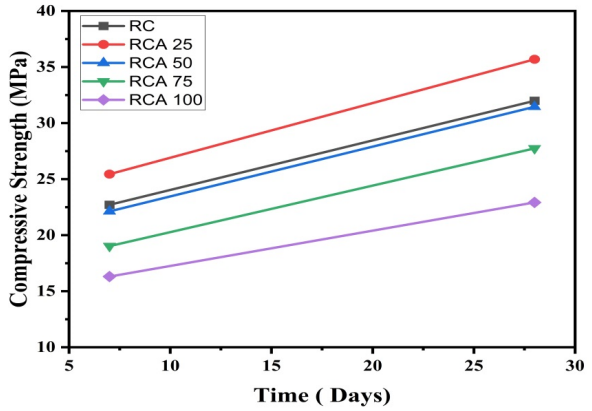


**Figure 3.** Compressive strength variations among various concrete mixtures.

The strategic incorporation of Recycled Concrete Aggregate (RCA) at a 25% replacement rate has showcased its significant potential, prompting a detailed exploration of its multifaceted applications (43). This optimized mixture has proven highly advantageous across diverse construction sectors. Non-structural elements like decorative facades and interior designs can now benefit from an eco-friendly and cost-effective solution. In the domain of pavements, where durability and load-bearing capacity are critical, this blend aligns seamlessly with sustainable infrastructure goals. Furthermore, its adaptability extends to specialized projects, particularly in eco-friendly constructions and landscaping efforts, where minimizing the carbon footprint is imperative. In these contexts, RCA-integrated concrete emerges as a sustainable choice, combining aesthetic appeal with environmental consciousness. While higher RCA percentages do impact concrete properties, the construction industry's commitment to sustainability leads to exploration beyond traditional structural applications. In scenarios where sheer structural strength isn't the sole focus, such as in landscaping or road base layers prioritizing stability, RCA-integrated concrete proves invaluable. In environmentally conscious construction projects emphasizing innovation and eco-friendliness, this approach gains significant traction. The versatility of RCA-integrated concrete expands beyond conventional boundaries, finding utility in diverse construction contexts. By exploring these alternative paths and carefully evaluating different construction scenarios, the industry can harness the adaptability and effectiveness of this optimized blend. This method not only tackles challenges associated with higher RCA percentages but also pioneers a future where sustainability and ecological responsibility drive construction practices. Through these strategic integrations, the industry edges closer to its sustainability objectives while enriching the landscape of eco-conscious construction methodologies.

### 3.3. Flexural strength

Thirty specimens, cast in steel rectangular moulds measuring 50×10×10 cm, underwent curing and flexural strength testing across various concrete formulations. These samples were meticulously evaluated using a flexural testing machine with a capacity of 2000 KN. The average flexural strength values were derived from three specimens for each mix, and the tests were conducted at both 7 and 28 days, with the results documented in Table 7.

Figure 4 graphically illustrates the variations in flexural strength at 7 and 28 days for different replacement percentages of Recycled Coarse Aggregates (RCA) concerning the reference mixture. Notably, the results mirrored a pattern similar to compressive strength, demonstrating that concrete mixtures with higher RCA replacement percentages exhibit lower flexural strength than the reference mixture. Among the mixtures, RCA 25 showcased the highest flexural strength (4.04 MPa), while RCA 100 displayed the

**Table 7.** Percentage variations in flexural strength among different mixtures.

| Concrete Mix | Flexural Strength (MPa) | | | |
|---|---|---|---|---|
| | 7 Days | % Variation With Respect to RC | 28 Days | % Variation With Respect to RC |
| RC | 3.18 | - | 3.92 | - |
| RCA 25 | 3.28 | +03.14 | 4.04 | +03.06 |
| RCA 50 | 3.09 | -02.83 | 3.87 | -01.27 |
| RCA 75 | 2.90 | -08.80 | 3.62 | -07.65 |
| RCA 100 | 2.68 | -15.72 | 3.34 | -14.79 |

+ sign represents increase in strength and – sign represents decrease in strength.

lowest flexural strength (3.34 MPa). These findings are consistent with the observations made by other researchers (40, 44), indicating a parallel trend between compressive and flexural strength concerning varying RCA replacement percentages.

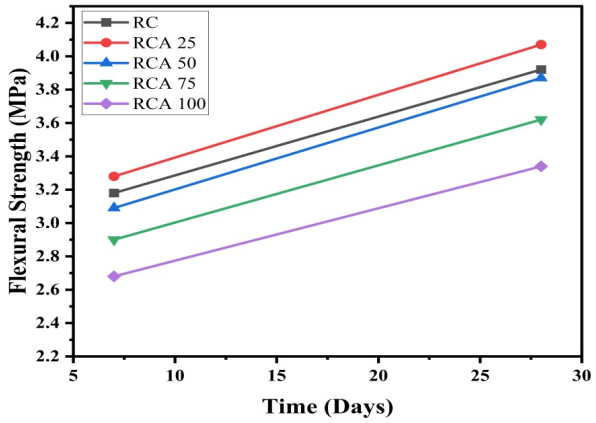


**Figure 4.** Variability in flexural strength across different concrete mixtures.

### 3.4. Split tensile strength

A comprehensive evaluation was conducted on 30 specimens cast in steel cylindrical moulds with a diameter (ϕ) of 15 cm and height (H) of 30 cm. These specimens were meticulously cured and subjected to split tensile strength testing using a compression testing machine with a capacity of 2000 KN. The average split tensile strength values were derived from three specimens for each mix, and the tests were conducted at both 7 and 28 days, with the results detailed in Table 8.

The variation in split tensile strength for different replacement percentages of Recycled Concrete Aggregate (RCA) concerning the reference mixture is depicted in Figure 5. The trend observed in the results parallels that of compressive strength. It was discerned that the split tensile strength of concrete mixtures decreased concerning the reference mixture with higher proportions of RCA replacement. Among the mixtures, RCA 25 exhibited the highest split tensile strength (2.64 MPa), while RCA 100 displayed the lowest (2.11 MPa) in the group. These findings align with the work reported by Kessal et al. (41).

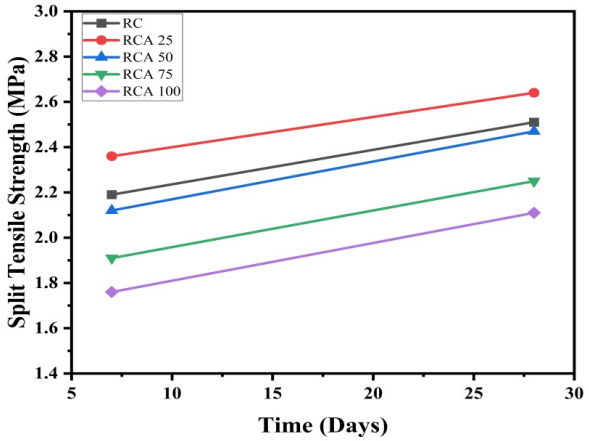


**Figure 5.** Variability in split tensile strength across various concrete mixtures.

### 3.5. Drying shrinkage

The assessment of concrete mixes' drying shrinkage involved measuring their length variations over time, adhering to IS 516 (Part 6) 2020 (37) standards, as depicted in Figure 6. Each of the 5 different mixtures was represented by three specimens of size 75×75×285 mm, which were stored for 28 days. Initial readings were recorded using length comparator tools with a precision count of 0.005 mm. Subsequent readings were taken at 28, 56, and 90 days using dial gauges, with each specimen's length change calculated based on the difference between the final and initial values. The outcomes of the drying shrinkage tests are summarized in Table 9.

Figure 7 illustrates the variations in shrinkage strain concerning different concrete mixtures at different drying ages. The graph demonstrates how concrete contracts more as it dries, indicated by the relationship between the two factors. Notably, the slope of the drying shrinkage curve changes from steep to flat as drying time increases, indicating a decreasing rate of change in drying shrinkage over time.

**Table 8.** Percentage variability in split tensile strength across different mixtures.

| Concrete Mix | Split Tensile Strength (MPa) | | | |
|---|---|---|---|---|
| | 7 Days | % Variation With Respect to RC | 28 Days | % Variation With Respect to RC |
| RC | 2.19 | - | 2.51 | - |
| RCA 25 | 2.36 | +07.76 | 2.64 | +05.17 |
| RCA 50 | 2.12 | -03.19 | 2.47 | -01.59 |
| RCA 75 | 1.91 | -12.78 | 2.25 | -10.35 |
| RCA 100 | 1.76 | -19.63 | 2.11 | -15.93 |

+ sign represents increase in strength and – sign represents decrease in strength.

**Figure 6.** Drying shrinkage apparatus and sample testing process.

**Table 9.** Percentage variations in drying shrinkage among different mixtures.

| Concrete Mix | Drying Shrinkage ($10^{-6}$) | | | | | |
|---|---|---|---|---|---|---|
| | 28 Days | % Variation With Respect to RC | 56 Days | % Variation With Respect to RC | 90 Days | % Variation With Respect to RC |
| RC | 344 | - | 422 | - | 461 | - |
| RCA 25 | 362 | +05.23 | 457 | +08.29 | 496 | +07.59 |
| RCA 50 | 415 | +20.63 | 501 | +18.72 | 549 | +19.08 |
| RCA 75 | 464 | +34.88 | 562 | +33.17 | 595 | +29.06 |
| RCA 100 | 499 | +45.05 | 624 | +47.86 | 641 | +39.04 |

+ sign represents increase in drying shrinkage and – sign represents decrease in drying shrinkage.

Additionally, it was observed that the drying shrinkage of concrete steadily increases with the rise in the percentage of coarse aggregate replacement at all drying ages. This increase can be attributed to the presence of additional cement around the surface of Recycled Concrete Aggregate (RCA), absorbing more water and shrinking significantly during the drying process. While the addition of RCA led to increased drying shrinkage due to its higher water absorption, all mixtures remained within the typical range specified by Indian Standards, indicating that RCA can be used within specific limits without adversely affecting its shrinkage properties. These findings align with previous studies, such as Kioumarsi et al. (45), and support the systematic increase in concrete's drying shrinkage with higher proportions of recycled coarse aggregates, as observed by Yu et al. (8).

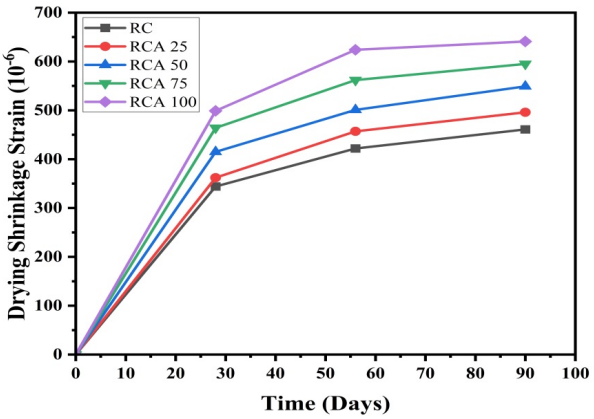


**Figure 7.** Shrinkage strain in various concrete mixtures.

### 3.6. Electrical resistivity

The electrical resistivity of concrete is a critical factor in assessing the risk of corrosion for the steel reinforcement bars within the concrete structure. The method employed measures the surface electrical resistivity of fresh concrete using a four-electrode setup. Utilizing the Resipod Resistivity Meter, illustrated in Figure 8, which features a 4-point Wenner Probe following the RILEM TC 154-EMC (38) standard, concrete samples are prepared in cylindrical molds with a diameter of 100 mm and a height of 200 mm.

Tests are conducted at 28 and 56 days, and the results are presented in Table 10.

The variation for the 28 and 56 days old electrical resistivity for different replacement percentages of C&D waste aggregates concerning the reference mixture is shown in Figure 9.

The results reveal that concrete mixtures with higher percentages of RCA replacement exhibit lower electrical resistivity compared to the reference mixture, indicating reduced corrosion risks. The high porosity of RCA traps water with dissolved ions, creating a low-resistance route for electric current, thereby lowering electrical resistivity. Specifically, RCA 25 demonstrates the highest electrical resistivity, while RC and RCA 50 are comparable. In descending order, RCA 75 and RCA 100 exhibit the least electrical resistivity. These findings suggest that concrete produced with up to 75% RCA replacement poses a low risk of corrosion, whereas concrete with 100% RCA replacement presents a moderate risk. This aligns with prior studies (45). and resonates with Arredondo-Rea et al.'s research (46), which concluded that electrical resistivity in concrete is minimally impacted when replacing up to 30% of coarse aggregates and 20% of fine aggregates with recycled counterparts. Consequently, concrete derived from C&D waste indicates a moderate risk of corrosion for the embedded steel bars.

### 3.7. Rapid chloride penetration

The RCPT unit, depicted in Figure 10, follows the ASTM C1202 (39) standard, featuring a mold measuring 100 mm in diameter and 50 mm in height. Thirty specimens were prepared for the study. The unit comprises two chambers filled with sodium chloride (NaCl) at a concentration of 0.24M and sodium hydroxide (NaOH) at 0.3M. Specimens and test cells are meticulously sealed. A 60V current source connects the negative end to the NaCl cell and the positive end to the NaOH cell. Readings are taken at 30-minute intervals for up to 6 hours. Tests at 28 and 56 days gauge the charge passed, indicating resistance to chloride ion penetration. Results are presented in Table 11.

The variation in chloride permeability for different replacement percentages of C&D waste aggregates concerning the reference mixture is demonstrated in Figure 11.

Chloride permeability tests reveal that concrete with higher percentages of C&D waste aggregate replacement has increased chloride permeability compared to the reference mixture, indicating reduced durability. This rise is attributed to the high porosity of C&D waste aggregates, trapping water with ions, creating a low-resistance path for electric current. The highest chloride permeability occurs at 100% RCA replacement. Concrete with up to 50% RCA replacement exhibits high durability, whereas concrete with over 75% RCA replacement shows moderate durability. Increasing RCA replacement decreases concrete durability and increases chloride permeability. The study aligns with Yang and Lee's findings (47), indicating decreased chloride ion penetration with concrete age regardless of RCA content. This research aligns with Arredondo-Rea et al.'s study (46), underscoring that C&D waste concrete exhibits moderate chloride permeability.

**Figure 8.** Resistivity meter setup and sample testing process.

**Table 10.** Percentage variations in electrical resistivity among different mixtures.

| Concrete Mix | Electrical Resistivity (KΩ) | | | |
|---|---|---|---|---|
| | 28 Days | % Variation With Respect to RC | 56 Days | % Variation With Respect to RC |
| RC | 48.54 | - | 59.19 | - |
| RCA 25 | 52.81 | +08.79 | 63.45 | +07.19 |
| RCA 50 | 46.69 | -03.81 | 57.28 | -03.22 |
| RCA 75 | 37.33 | -23.09 | 47.76 | -19.31 |
| RCA 100 | 16.01 | -67.01 | 26.29 | -55.58 |

+ sign represents increase in electrical resistivity and – sign represents decrease in electrical resistivity.

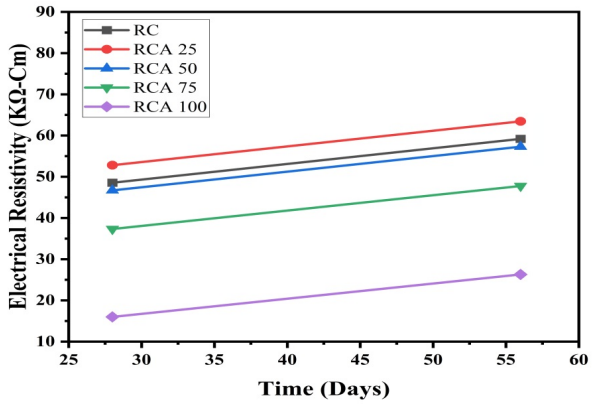


**Figure 9.** Electrical resistivity variations with recycled concrete aggregates (RCA).

**Figure 10.** Standard configuration of RCPT unit (ASTM C1202).

**Table 11.** Percentage variations in passed charge among different mixtures.

| Concrete Mix | Charge Passed (Coulomb) | | | |
|---|---|---|---|---|
| | 28 Days | % Variation With Respect to RC | 56 Days | % Variation With Respect to RC |
| RC | 704 | - | 683 | - |
| RCA 25 | 671 | -04.68 | 636 | -06.88 |
| RCA 50 | 824 | +17.04 | 782 | +14.49 |
| RCA 75 | 953 | +35.36 | 950 | +39.09 |
| RCA 100 | 1053 | +49.57 | 1050 | +53.73 |

+ sign represents increase in charge passed and – sign represents decrease in charge passed.

### 3.8. X-Ray Diffraction (XRD)

X-ray Diffraction (XRD) is a powerful analytical technique employed to explore the crystalline characteristics and mineralogical composition of concrete samples, especially when incorporating recycled coarse aggregates. In this study, the Bruker D-8 advanced diffractometer system was utilized, scanning samples at an angle of 2 degrees within the range of 3-70 degrees. The scanning speed was set at 2 degrees per minute with a sampling interval of 0.005 degrees. The obtained data were analyzed using Jade 7 X-ray diffraction software. The XRD analysis revealed intriguing insights. As the replacement percentage of Recycled Coarse Aggregates (RCA) increased, the net intensity of minerals such as Calcium Silicate Hydrate (CSH), Calcium Hydroxide (CH), and Ettringite decreased. This decrease indicated a reduction in the density of total CSH in the concrete mixtures. Figure 12 vividly displays the XRD patterns for different concrete mixtures, including RC, RCA 25, RCA 50, RCA 75, and RCA 100. To provide a comprehensive understanding, the diffraction peak angles of various compounds are presented in Table 12.

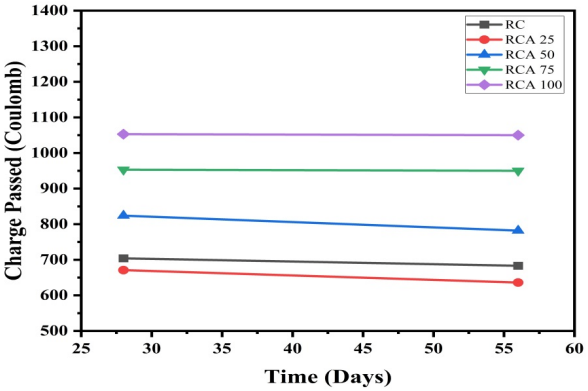


**Figure 11.** Chloride permeability variations with recycled concrete aggregates (RCA).

The XRD analysis clearly illustrates that the incorporation of recycled coarse aggregates significantly influences the phase composition of minerals in concrete. The table presents detailed information regarding the diffraction peak angles of three essential compounds - Calcium Silicate Hydrate (CSH), ettringite, and Calcium Hydroxide (CH) - in various concrete mixtures. These mixtures are denoted as RC, RCA 25, RCA 50, RCA 75, and RCA 100. CSH, a vital mineral

**Table 12.** Diffraction peak angles of different compounds in various concrete mixtures.

| Concrete Mix | CSH (2Θ) | ETTRINGITE (2Θ) | CH (2Θ) |
|---|---|---|---|
| RC | 26.65 | 37.84 | 50.00 |
| RCA 25 | 26.66 | 40.48 | 50.22 |
| RCA 50 | 27.86 | 39.24 | 48.32 |
| RCA 75 | 21.24 | 29.50 | 48.48 |
| RCA 100 | 27.58 | 39.40 | 50.12 |

CSH- Calcium Silicate Hydrate, CH- Calcium Hydroxide, Ettringite- Hydrated Calcium Aluminum Sulfate.

phase in concrete responsible for its strength and durability, is represented by a diffraction peak angle of 26.65° in regular concrete (RC). Ettringite, a hydrated calcium aluminum sulfate compound, exhibits a peak at 37.84°, while CH, also known as hydrated lime, shows a peak at 50.00° in this standard mixture. It is important to note that the intensity of these peaks indicates the quantity of these compounds; however, the non-homogeneity of the concrete samples at the microscopic level was considered during the analysis. The analysis extends to concrete mixtures incorporating recycled concrete aggregate (RCA) at different percentages. Specifically, RCA 25, RCA 50, RCA 75, and RCA 100 represent concrete mixes with 25%, 50%, 75%, and 100% recycled aggregate content, respectively. As the proportion of recycled aggregate increases, the diffraction peak angles for CSH, ettringite, and CH vary. For instance, in the RCA 75 mixture, the diffraction peak angles for CSH, Ettringite, and CH shift to 21.24°, 29.50°, and 48.48°, respectively. This alteration in peak angles suggests potential changes in the crystal structure of CSH and ettringite due to the introduction of 75% recycled concrete aggregate. This study aligns with previous research conducted by Joseph et al. (48), highlighting the consistency of these findings in the scientific community. In summary, the table's data offers insights into the composition of concrete mixtures, focusing on changes in key compounds (CSH, ettringite and CH) as recycled concrete aggregate percentages vary. These changes significantly impact concrete properties and performance in construction, emphasizing the need for effective material engineering and construction practices.

### 3.9. Scanning electron microscopy (SEM)

The analysis of Scanning Electron Microscopy (SEM) plays a pivotal role in understanding the intricate microstructure and surface morphology of concrete samples, especially when incorporating Recycled Coarse Aggregates (RCA). In this study, the JSM 6610V scanning electron microscope, operating at 30KV, was utilized at the University Science Instrumentation Center (USIC) in Delhi. Figure 13 showcases detailed micrographs obtained at 28 days for different concrete mixtures, shedding light on the formation of crucial hydration products at the microstructural level, which significantly influence concrete strength. In these micrographs, distinct features reveal the presence of key compounds formed during the hydration process. Hexagonal crystal formations signify the presence of calcium hydroxide (CH), while flower-shaped structures indicate calcium silicate hydrate (CSH) gel, and needle-like structures are evidence of ettringite. These compounds are essential contributors to concrete strength and durability.

The SEM analysis yielded crucial insights. Incorporating 25% RCA led to a significant enhancement of the concrete microstructure, producing a dense cement paste. This dense paste fostered a robust bond with aggregates, ultimately enhancing the compressive strength of the concrete. However, when the RCA replacement percentage was increased to 50%, the resulting concrete exhibited lower density, leading to a reduction in compressive strength. A further increase to 75% RCA content resulted in the formation of voids and loose structures, leading to decreased compressive strength. Remarkably, an RCA replacement of 100% yielded a porous microstructure, where incomplete hydration reactions occurred around the recycled coarse aggregates, resulting in fewer hydration products and, consequently, reduced strength. The SEM findings highlighted a crucial pattern: lower proportions of RCA in the mixtures promoted the formation of more calcium silicate hydrate (CSH) gel, which densified the cement paste matrix and consequently increased the concrete's strength. However, excessive RCA incorporation led to fragile mixtures with inadequate CSH production, resulting in insufficient strength. These observations align with similar interpretations made in previous studies (48), reinforcing the consistency and reliability of these findings in the scientific community.

### 3.10. Energy dispersive X-ray spectroscopy (EDAX)

Energy-Dispersive X-ray Spectroscopy (EDAX) serves as a powerful tool in dissecting the intricate

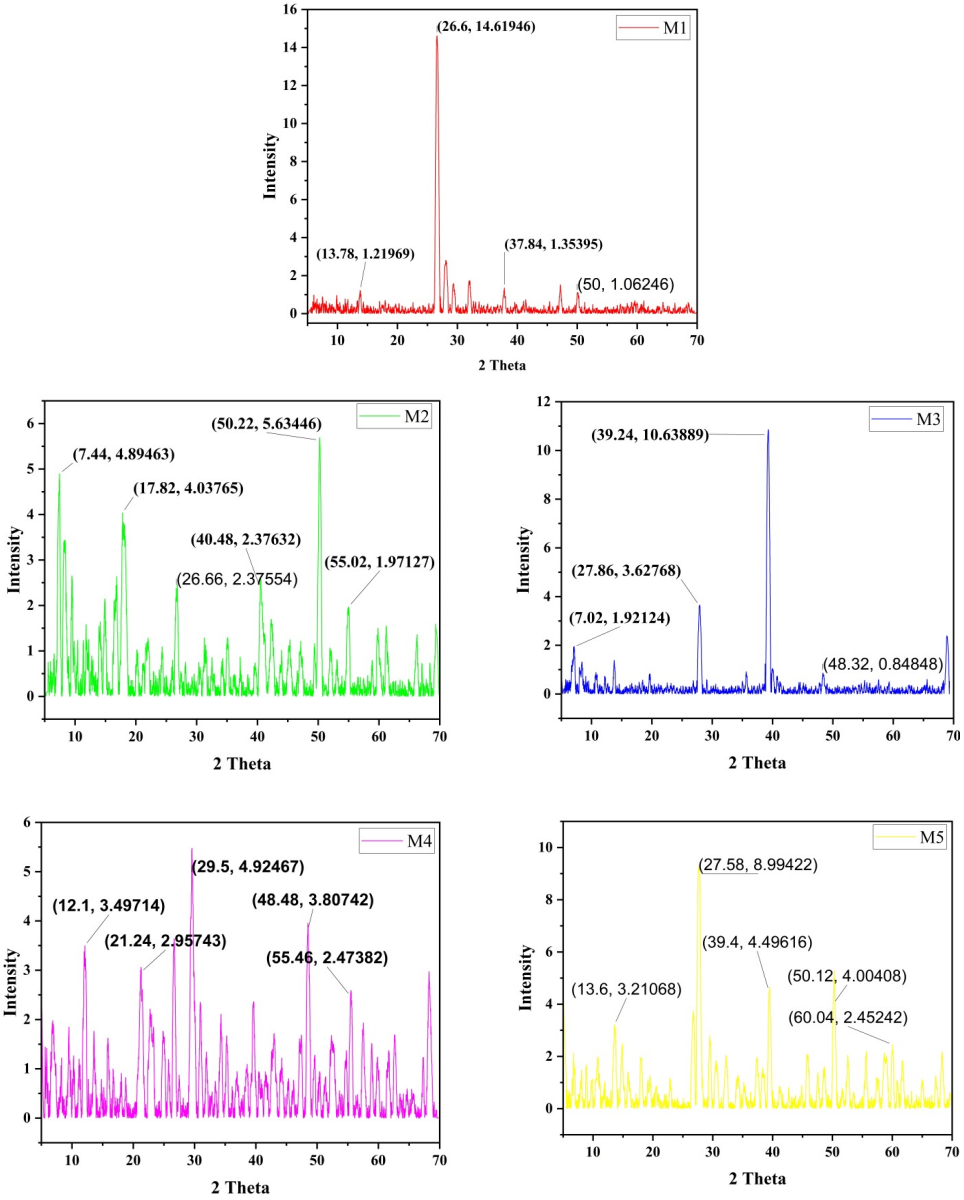


**Figure 12.** XRD Analysis of concrete mixtures (M1) for RC, (M2) for RCA 25, (M3) for RCA 50, (M4) for RCA 75, and (M5) for RCA 100.

chemical composition of concrete. This study delves into qualitative and quantitative analyses of diverse elements within different concrete mixtures. Figures 14 meticulously delineate these analyses, offering a comprehensive view of the elemental content.

The EDAX analysis reveals the presence of pivotal elements: Calcium (Ca), Oxygen (O), Silicon (Si), Aluminum (Al), Iron (Fe), Potassium (K), Sodium (Na), and Magnesium (Mg). In-depth scrutiny illustrates intriguing patterns. In mixture RCA 25, calcium content surges, fostering the creation of hydration products like Calcium Hydroxide (CH), Calcium Silicate Hydrate (CSH), and Calcium Aluminosilicate Hydrate (CASH). Contrastingly, higher RCA replacement percentages witness a decline in calcium content, leading to diminished hydration products. Simultaneously, silica content diminishes at lower RCA replacement percentages but exhibits a gradual increase with higher RCA replacements. The lower alumina content in these mixtures curtails ettringite formation. SEM results corroborate these findings, evidencing robust CSH formation up to a 25% RCA replacement. The chemical compositions highlighted by EDAX validate this observation. Notably, higher RCA replacements inhibit calcium compound formation, directly correlating with decreased concrete strength. Table 13 encapsulates the quantitative chemical composition, providing a succinct overview. It is essential to note

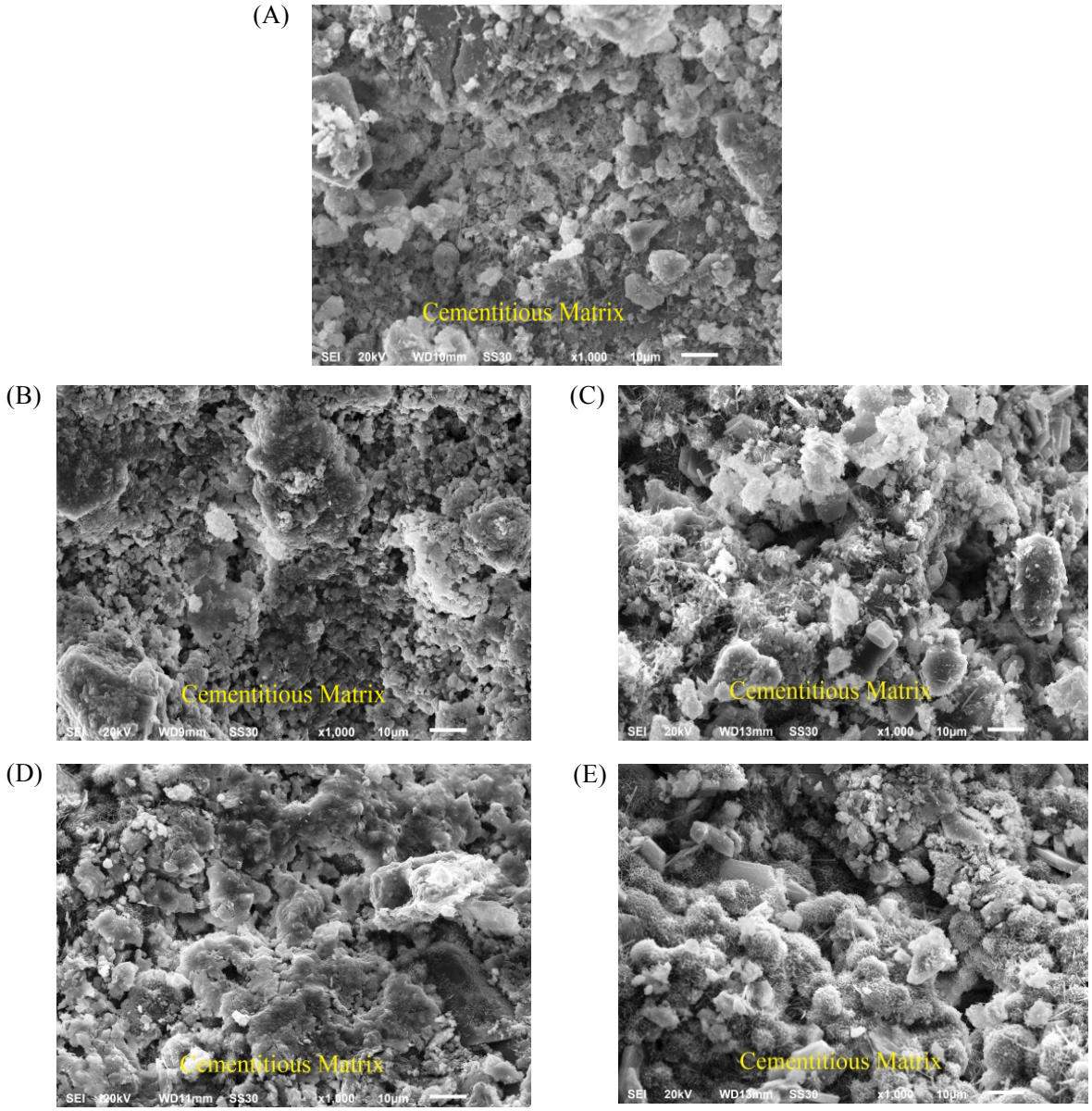


**Figure 13.** SEM images for different concrete mixtures (A) for RC, (B) for RCA 25, (C) for RCA 50, (D) for RCA 75, and (E) for RCA 100.

that all EDAX graphs affirm the presence of varied elements like calcium, aluminum, iron, etc. However, due to microscopic heterogeneity, specific peaks lack visual representation. This comprehensive EDAX analysis not only dissects the elemental intricacies but also substantiates the influence of RCA replacement percentages on concrete composition and, consequently, its mechanical properties.

## 4. ANALYTICAL INVESTIGATION

In the realm of concrete technology, understanding the interplay between different properties is paramount. Employing the sophisticated technique of linear regression analysis, this study meticulously delves into the properties of concrete infused with varying proportions of recycled coarse aggregates (RCA). Through empirical analysis, a linear relationship was established between key properties of fresh concrete, correlating them linearly with the RCA replacement ratio. This correlation, based on extensive experimental data collected from various properties of recycled coarse aggregate concrete after 28 days of water curing, was graphically represented using Origin Software, resulting in well-fitted curves reflecting the intricate dynamics at play.

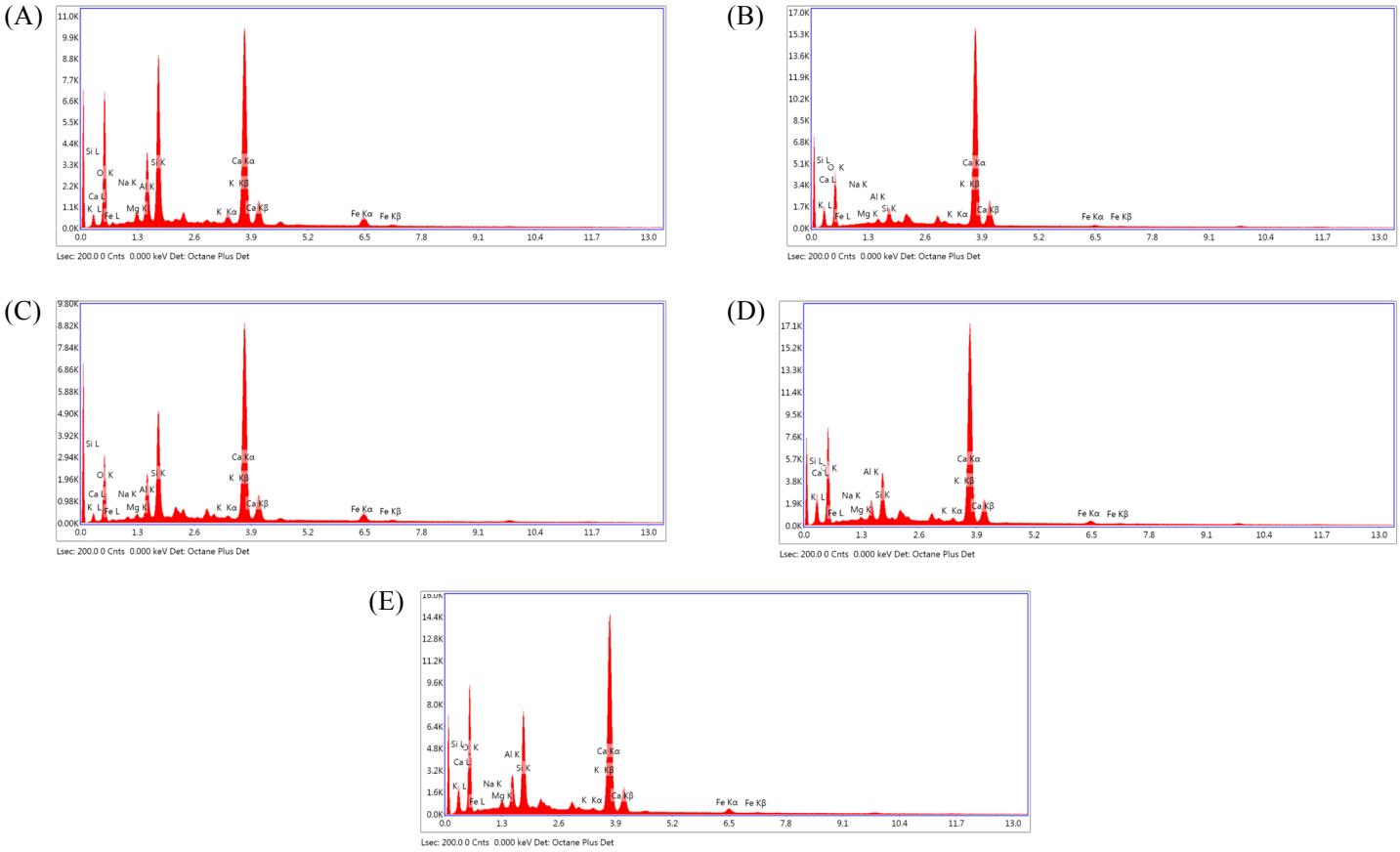


**Figure 14.** EDAX analyses for different concrete mixtures (A) for RC, (B) for RCA 25, (C) for RCA 50, (D) for RCA 75, and (E) for RCA 100.

**Table 13.** Percentage composition of different elements in various mixtures.

| Mixture ID | (%) | Ca-K | O-K | Si-K | Al-K | Fe-K | K-K | Na-K | Mg-K |
|---|---|---|---|---|---|---|---|---|---|
| RC | Weight | 28 | 48.21 | 10.49 | 5.27 | 4.12 | 1.43 | 1.04 | 1.46 |
| | Atomic | 15.54 | 67.03 | 8.3 | 4.34 | 1.64 | 0.81 | 1 | 1.33 |
| RCA-25 | Weight | 46.76 | 48.8 | 1.6 | 0.58 | 0.64 | 0.42 | 0.92 | 0.29 |
| | Atomic | 26.71 | 69.81 | 1.31 | 0.49 | 0.26 | 0.24 | 0.91 | 0.27 |
| RCA-50 | Weight | 38.7 | 41.3 | 9.22 | 4.26 | 4.59 | 0.87 | 0..64 | 0.43 |
| | Atomic | 23.08 | 61.71 | 7.84 | 3.77 | 1.97 | 0.53 | 0.67 | 0.42 |
| RCA-75 | Weight | 36.12 | 52.23 | 4.08 | 2.25 | 1.57 | 0.92 | 1.88 | 0.94 |
| | Atomic | 19.74 | 71.48 | 3.18 | 1.82 | 0.62 | 0.52 | 1.79 | 0.85 |
| RCA-100 | Weight | 30.81 | 52.78 | 6.99 | 3.25 | 1.97 | 0.75 | 1.82 | 1.64 |
| | Atomic | 16.57 | 71.13 | 5.36 | 2.6 | 0.76 | 0.41 | 1.71 | 1.45 |

Ca-Calcium, O-Oxygen, Si-Silicon, Al-Aluminum, Fe-Iron, K-Potassium, Na-Sodium, and Mg-Magnesium.

The linear correlations between the RCA replacement level and different mechanical properties were expressed mathematically. The equations derived for compressive strength (Fc), flexural strength (Ff), split tensile strength (Fs), drying shrinkage (Fd), electrical resistivity (FE), and rapid chloride permeability (FR) are represented respectively as Equations [1], [2], [3], [4], [5] and [6]:

$$F_c = 35.162 - 0.1038R_r \quad [1]$$
$$F_f = 4.086 - 0.00644R_r \quad [2]$$
$$F_s = 2.634 - 0.00476R_r \quad [3]$$
$$F_d = 334.4 + 1.648R_r \quad [4]$$
$$F_E = 63.584 - 0.41816R_r \quad [5]$$
$$F_R = 685 + 3.52R_r \quad [6]$$

Here, Fc represents compressive strength, Ff denotes flexural strength, Fs signifies split tensile

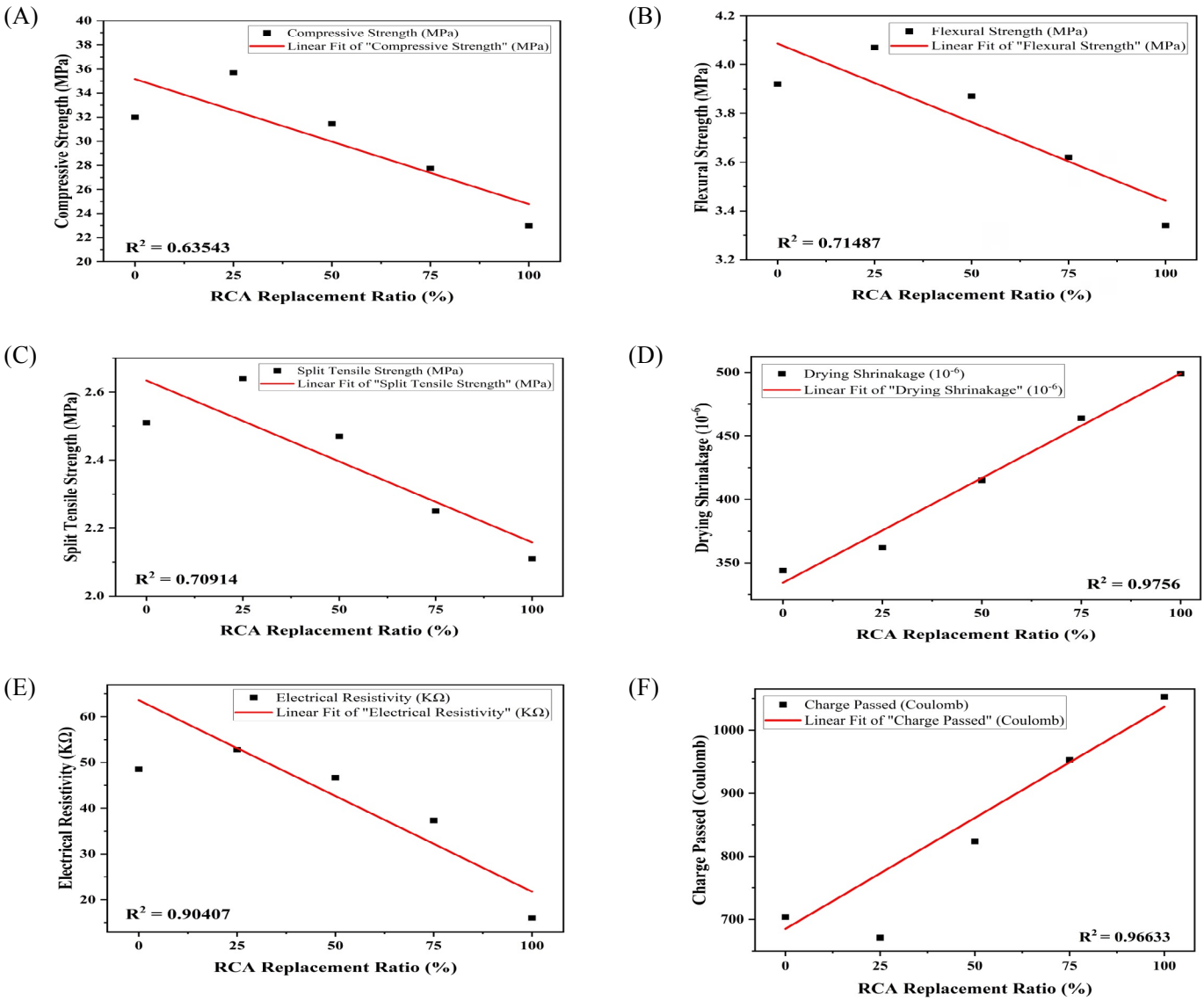


**Figure 15.** Relationships between RCA replacement ratio and (A) compressive strength, (B) flexural strength, (C) split tensile strength, (D) drying shrinkage, (E) electrical resistivity, and (F) passed charge.

strength, Fd illustrates drying shrinkage, FE quantifies electrical resistivity, and FR characterizes rapid chloride permeability. The parameter Rr corresponds to the percentage of the RCA replacement level, encapsulating the essence of the study. This comprehensive analysis, yielding coefficients of determination ($R^2$) such as 0.64073, 0.56775, 0.40756, 0.96623, 0.6101 and 0.94818 for compressive, flexural, and split tensile strength, drying shrinkage, electrical resistivity, and rapid chloride permeability respectively, signifies the robustness of the correlation. These values affirm the efficacy of the linear regression model in predicting concrete properties accurately, ensuring a reliable bridge between theoretical predictions and experimental results.

## 5. CONCLUSIONS

This study marks a significant stride in promoting sustainable construction practices by harnessing Construction and Demolition (C&D) waste as Recycled Coarse Aggregates (RCA), thereby championing circular economy principles and waste reduction. The exploration into the influence of RCA on hardened concrete unveils pivotal insights crucial for eco-conscious construction practices.

Key Findings and Recommendations:

- The study reveals a nuanced relationship between RCA content and concrete properties. Concrete exhibits enhanced mechanical properties up to an optimum replacement threshold

of 25% RCA. Beyond this point, there's a decline in performance. The findings underline the significance of adhering to this 25% replacement ratio for optimal concrete strength.
- Considering the notable 11.56% increase in compressive strength, 3.06% improvement in flexural strength, and 5.17% enhancement in split tensile strength compared to natural coarse aggregates, it's recommended that a mandatory 25% inclusion of RCA be established. This ratio ensures concrete strength surpasses that of traditional mixes.
- RCA-optimized concrete at 25% replacement demonstrates exceptional strength, making it ideal for non-structural elements, pavements, and specific projects. However, higher RCA percentages compromise structural integrity, making them suitable for landscaping and road base layers, avoiding critical applications.
- RCA inclusion increases drying shrinkage due to higher water absorption. RCA 25 exhibited a 5.23% higher shrinkage than conventional concrete, emphasizing the need for meticulous curing practices. Additionally, higher RCA percentages lower electrical resistivity, increasing corrosion risk, and reduce chloride permeability, impacting durability. RCA 25 and 50 exhibit high durability, whereas RCA 75 and 100 demonstrate moderate durability.
- Robust linear correlations were established, offering predictions for concrete properties based on RCA content. These models can serve as valuable tools in sustainable construction projects, ensuring informed decision-making regarding material selection.

This research not only mitigates construction industry waste but also conserves natural resources. Sustainable concrete, exhibiting comparable mechanical properties to conventional counterparts, emerges as a viable construction alternative. Future studies can delve deeper, optimizing this process for wider industry adoption, and exploring innovative avenues to further enhance the sustainability quotient of concrete structures. As construction endeavors move forward, the integration of RCA promises a greener, more responsible future for the industry.

## Data availability

All data, materials, and methodologies employed in this research are detailed in the form of Figures and Tables within this article.

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## Authorship contribution statement

**Harish Panghal**: Conceptualization, Methodology, Formal Analysis, Investigation, Resources, Data Curation, Writing – original draft, Writing – review & editing, Visualization.

**Awadhesh Kumar**: Conceptualization, Methodology, Validation, Resources, Writing – review & editing, Supervision, Project Administration, Funding Acquisition.

The authors of this article declare that they have no financial, professional or personal conflicts of interest that could have inappropriately influenced this work.

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ORIGINAL PAPER

# Study on Multiferroic Properties of (0.5) $Bi_{0.5}Na_{0.5}TiO_3$-(0.5) $LaFeO_3$ Particulate Composite

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**Abstract**
Polycrystalline [(0.5) $Bi_{0.5}Na_{0.5}TiO_3$-(0.5) $LaFeO_3$] multiferroic composite is prepared by using the solid-state reaction method. The crystal structure of both phases is characterized by using the X-ray diffraction method (XRD) and confirms the presence of rhombohedral (i.e., bismuth sodium titanate) and orthorhombic (i.e., lanthanum ferrite) phases in the composite. The microstructure of the composite is analyzed using field emission scanning electron microscopy (FESEM). The crystal structure is further studied with Raman spectroscopy. The present composite exhibits ferroelectric and ferrimagnetic-like properties, revealing its multiferroic behavior. Furthermore, the impedance analysis of the composite shows the negative temperature coefficient of resistance behavior. The present study describes the structural and physical properties of the possible lead-free multiferroic composite.

**Keywords** Composite · Crystal structure · Dielectric constant · Impedance analysis · Magnetization

## 1 Introduction

In the current age, materials are an important part of every new technology. Therefore, the research on the development of new materials is growing rapidly throughout the world [1]. Out of several groups of materials, ferroics, and multiferroics are emerging materials that have a wide range of technological applications due to their multifunctionality [1]. The ferroic materials include ferroelectrics, ferromagnetism, ferroelastic, and ferrotoroidicity. However, multiferroics are those materials that exhibit more than two ferroic (ferroelectric, ferromagnetic, and ferroelastic) properties [2, 3]. The well-known multiferroic is the magneto-electric multiferroic in which both magnetic as well as electric properties are observed simultaneously. The overall properties of multiferroic materials are greatly controlled by coupling between different order parameters. Initially, the researchers focused on single-phase multiferroic materials such as $BiFeO_3$, $TbMnO_3$, $TbMn_2O_5$, $BiMnO_3$, and $YMnO_3$ [4]. However, the coupling between different ferroic order parameters observed at low temperatures or coupling strength is very weak. Due to this single phase, multiferroics cannot be used in technological development [5]. Then, researchers have focused on composite multiferroic materials in which different ferroic compounds combine together to get a better coupling coefficient. A large number of research articles have been reported on multiferroic composite materials based on theoretical, experimental, and possible applications [5]. However, there are still various concerns that need to be solved to achieve a higher coupling coefficient such as suitable preparation methods, materials selection, and phase stability. Multiferroic properties are observed in a wide range of materials with different crystal structures. As per material chemistry, the physical properties of materials are greatly influenced by their crystal structure and composition. Out of several crystal structures, perovskite oxides (ABO3) and spinel ferrite are interesting material groups that have crystal structure-dependent physical properties. In the literature, many research articles on

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multiferroic composites with perovskite and spinel ferrite crystal structures are reported. Due to their better magnetic and electrical properties, the most widely studied systems are Co and Ni ferrites with PZT, PNT, BTO, or BSTO [4].

Das et al. have reported the crystal structure analysis and influence of individual crystal phases on magnetoelectric coupling in BSZT-NCZGF multiferroic composite [1]. As per their report, the optimum composition 0.9BSZT-0.1NCZGF exhibits a maximum magnetoelectric coefficient of ~ 194mVcm$^{-1}$ Oe$^{-1}$. It has been reported that perovskite compounds are also considered for magnetic counterparts in the multiferroic composite as compared to spinel ferrite. Manzoor et al. have investigated on structural, dielectric, and multiferroic properties of the $LaFeO_3$ composite system [6]. They have synthesized the $BaTiO_3$-$LaFeO_3$-$CoFe_2O_4$ composite system to study the role of the BTO-CFO composite on LFO and, subsequently on the physical properties. They found the exchange bias effect in the composite which directly influences the overall magnetic properties. As per the earlier report, the perovskite orthoferrite LFO exhibits room-temperature multiferroic properties [7]. Manzoor et al. have reported the multiferroic properties of LFO with a maximum polarization of 0.32 μCcm$^{-2}$ and a maximum ac induction of 0.1 T at a maximum field of 60 K A/m and 50 Hz frequency [8]. However, the coupling coefficient of LFO is not up to the mark for technological applications. Therefore, different dopants have been incorporated into LFO to enhance its physical properties. The magnetization of LFO and Mn-doped LFO are found to be 0.07 emu/g and 0.3 emu/g along with polarization of 0.041 μCcm$^{-2}$ and 0.333 μCcm$^{-2}$, respectively [9]. Furthermore, the magnetic and ferroelectric properties of LFO have been modified by preparing nanocomposite with $BaTiO_3$, $NiFe_2O_4$, $CoFe_2O_4$, $BiFeO_3$, and so on [10]. Sharma et al. reported the compositional dependent multiferroic behavior in Sm-modified LFO-$PbTiO_3$ solid solution [11]. They have synthesized the different compositions of the solid solutions $Pb_{1-x}La_{x/2}Sm_{x/2}Ti_{1-x}Fe_xO_3$ with $0.10 \leq x \leq 0.30$. In this compound, the magnetic ordering increases continuously with the increase of the Fe content. Also, the presence of La/Sm in the solid solution increases the ferroelectric properties. Wang et al. investigated the different physical properties of the LFO-$BaTiO_3$ composite [12]. Nath et al. studied the magnetic field and temperature effect on physical properties of $LaFeO_3$-$Pb(Zr_{0.58}Ti_{0.42})O_3$ multiferroic composite [13]. The maximum magnetoelectric coupling due to strain mediated is reported to be 1.5 mV/cm-Oe. Also, the maximum change in magneto-impedance (~ 185%) has been observed for 100 Hz at room temperature [13]. Similarly, the room temperature multiferroic properties along with other physical properties of $BiFeO_3$-$LaFeO_3$-$PbFeO_{2.5}$ ternary solid solution are reported by Xue et al. [14]. On the basis of the above-reported articles, researchers have studied the different aspects of the $LaFeO_3$-based composite system [15]. In the present work, the $LaFeO_3$ (LFO)-$Bi_{0.5}Na_{0.5}TiO_3$ (BNT) based lead-free multiferroic composite has been studied. Here, BNT has been considered as a lead-free ferroelectric material.

## 2 Experimental Section

### 2.1 Synthesis of Multiferroic Composite

The polycrystalline sample (0.50) $LaFeO_3$-(0.50) $Bi_{0.5}Na_{0.5}TiO_3$ solid solution has been prepared in two steps process through conventional high-temperature solid-state reaction method. Initially, the required amount of metal oxides of lanthanum oxide $La_2O_3$ (≥ 99.0% assay, Alfa Aesar) and iron oxide $Fe_2O_3$ (≥ 99.0% assay, Alfa Aesar) have been mixed by using the high energy planetary ball mill in ethanol medium to prepare the lanthanum ferrite (LFO). Similarly, the required amount of metal oxides and carbonates of bismuth oxide $Bi_2O_3$ (≥ 99.0% assay, Alfa Aesar), sodium carbonate $Na_2CO_3$ (≥ 99.5% assay, Alfa Aesar), and titanium oxide $TiO_2$ (≥ 99.0% assay, Merck), were mixed to prepare bismuth sodium titanate (BNT). The planetary ball mill was operated at 250 RPM (rotation per minute) for 12 h. During the milling process, the ball (i.e., stainless steel ball with 2 mm diameter) to powder ratio was kept at 20:1 in weight ratio. In the present work, the planetary ball mill was used to prepare the homogeneous mixture of all the metal oxides and carbonates. Furthermore, the mixtures were heated at 140 °C for 4 h to evaporate the ethanol and followed by calcination at 1100 °C and 850 °C for 6 h and 4 h with 4°/min ramping in a close alumina crucible for LFO and BNT mixture, respectively. After calcination, the powders were grounded and mixed both powders with 50% each using the ball mill method to prepare the multiferroic composite. The final mixture (LFO + BNT) was pressed uniaxially to form discs (pellets) of 10 mm diameter with a thickness of around ~ 1 mm by using the hydraulic press (Technosearch instrument). The pellets were sintered at 1150 °C for 5 h with 2°/min ramping in a closed alumina boat covered by the same powder of respective composition to reduce the evaporation of bismuth and sodium at high temperatures. The pellet was further grounded with mortar and pestle and, heated at 600 °C for 2 h to avoid the presence of any residual stress. After that, the parallel surfaces of the pellets were painted with the conducting silver paste to make electrodes for electrical characterization.

### 2.2 Characterization

The crystal structure confirmation of the multiferroic composite was performed using the X-ray diffraction (XRD)

technique as well as Raman spectroscopy. In the present work, the RIGAKU-TTRX III X-ray diffractometer with $CuK_\alpha$ radiation ($\lambda = 1.541$ Å) was operated in the Bragg–Brentano geometry in $2\theta$ range from 20 to 80° at a scan rate 2°/min with 0.02° scan step. The room temperature Raman spectra (100–1300 $cm^{-1}$) of the solid solutions have been recorded with the help of the micro-Raman spectrometer (STR 750 RAMAN spectrograph, Seki Technotron Crop., Japan) in backscattering geometry with the laser source of wavelength 514.5 nm. The microstructure of the solid solutions was carried out by the FE-SEM (field emission scanning electron microscopy, ZEISS, Germany). The impedance of the composite was recorded by the LCR meter (N4L impedance analyzer) with a wide range of temperature (40°–400 °C) and frequency (1 Hz–10 MHz) by using the parallel plate capacitor geometry. The ferroelectric hysteresis loop of the composite has been recorded by the Sawyer–Tower circuit using a radiant ferroelectric tester (model: Premier II make: Radiant). The magnetic hysteresis loop is recorded by using a vibrating sample magnetometer (model: VersaLab, and make: Quantum design).

## 3 Results and Discussion

### 3.1 Structural Analysis

The XRD pattern of the composite (LFO-BNT) is shown in Fig. 1. All the observed peaks indicate to the allow Bragg's peaks correspond to the magnetic phase (LFO) and piezoelectric phase (BNT). In addition, the XRD patterns of the parent compounds (LFO & BNT) are shown in Fig. 1 to compare with the composite. The Bragg's peaks are indexed by using the International Centre for Diffraction Data (JCPDS: 37–1493 for LFO & JCPDS: 360340 for BNT). As per the crystallographic database, the BNT and LFO correspond to rhombohedral (*R3C*) and orthorhombic (*Pbnm*) crystal structures, respectively. A few secondary phases ($Fe_2O_3$ and $La_2O_3$) are found in the parent LFO compound and have lower intensity than major Bragg's peak. However, there is the absence of any other secondary phases in BNT as well as composite XRD patterns within the detection limit. Furthermore, Rietveld refinement of the XRD pattern of composite has been employed to estimate the crystal structure parameters as shown in Fig. 1b. In the refinement pattern, the raw data are well-fitted with the calculated data which can be clearly observed from Fig. 1b. The lattice parameters of a = b = 5.564(7) Å, c = 13.514(2) Å for *R3c* and a = 5.877(0) Å, b = 5.323(2) Å, c = 8.114(3) Å for *Pbnm* crystal symmetry. The various reliability factors are $R_p$: 25.0, $R_{wp}$: 23.2, and $R_{exp}$: 22.05, $\chi^2 = 2.75$. From the above observation, it indicates that the respective crystal phases are present in the multiferroic composite. The large reliability factors are due to the presence of double crystal phases and nanocrystallites in the samples.

Furthermore, the microstructure of the ceramic is also an important factor that affects the overall physical properties, i.e., dielectric and ferroelectric properties. Hence, the FE-SEM micrograph of the composite is depicted in Fig. 2 to analyze the microstructure. It is clearly observed that grains are distributed randomly with different grain sizes. It may be due to the solid state reaction (ball mill method) of two different types of compounds (LFO and BNT) having different crystal structure properties. The approximate overall particle size of the composite is in the order of the micrometer range.

Raman spectroscopy is an effective technique to study the crystal structure at the atomic level. The room temperature

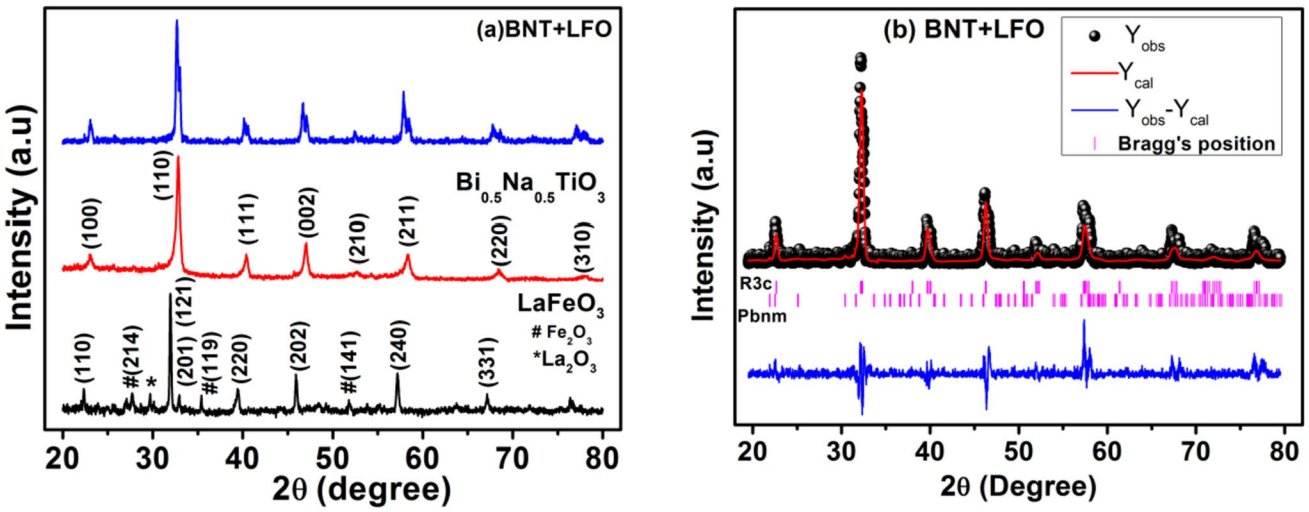


**Fig. 1** **a** XRD patterns of the LFO, BNT, and composite (LFO-BNT) and **b** Rietveld refinement of the composite

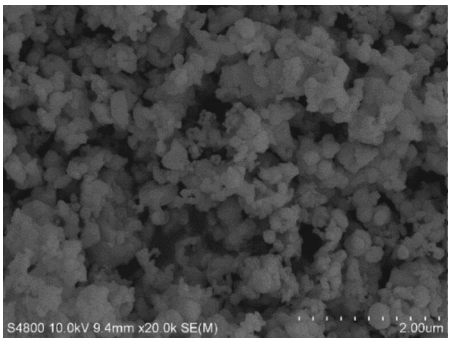


**Fig. 2** FE-SEM micrograph of the LFO-BNT multiferroic composite

Raman spectrum (100 to 1300 $cm^{-1}$) of multiferroic composite has been shown in Fig. 3. Literatures suggest a total of 24 and 13 Raman active modes are present in orthorhombic and rhombohedral crystal symmetries, respectively [16, 17]. However, it is difficult to observe the individual Raman modes in the composite due to overlapping which indicates the presence of anharmonicity in the molecular vibration. Therefore, the Lorentz deconvolution method has been employed to extract the different Raman modes in the composite as shown in the Fig. 3.

The present range (100 to 1300 $cm^{-1}$) is classified into different regions depending on the bonds' vibration. (i) The lower range of wave numbers (100 to 200 $cm^{-1}$) represents the displacement of A-O cations in $ABO_3$-type perovskite compounds [16]. As, the present composite consists of two different types of $ABO_3$ type crystal structure, Bi-O and La–O bonds vibration lie in the first range as given in Table 1. (ii) The mid-range wave number (200–400 $cm^{-1}$) is related to B-O cation vibrations in $ABO_3$. In the present

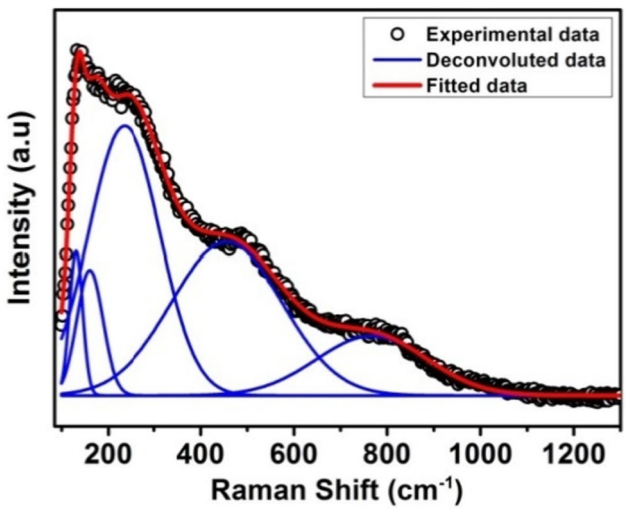


**Fig. 3** Raman spectrum of composite with Lorentz De-convolution of the different Raman modes

**Table 1** The peak positions with FWHM of different Raman modes of the composite calculated by the Lorentz De-convolution method

| Peak position($cm^{-1}$) | FWHM ($cm^{-1}$) |
|---|---|
| 130.74 | 28.51 |
| 160.32 | 56.44 |
| 235.27 | 154.28 |
| 455.93 | 237.87 |
| 767.15 | 238.33 |

composite, Fe–O and Ti–O vibrations lie in the above range. (iii) The higher range (400–650 $cm^{-1}$) indicates the vibration of the octahedral cluster of the $ABO_3$-type crystal structure. In the LFO-BNT composite, $TiO_6$ and $FeO_6$ octahedral clusters are responsible for the active Raman modes in the above range [16]. However, only one Raman mode (~455 $cm^{-1}$) is present in the composite. Due to the overlapping among the Raman modes, it is unable to distinguish between $TiO_6$ and $FeO_6$. (iv) The broadband region in the wave number region (650–900 $cm^{-1}$) represents the vibration of oxygen ions having to overlap of multiple Raman peaks [16].

## 3.2 Dielectric Study of the Composite

The frequency dependence dielectric constant of the composite at different temperatures has been shown in Fig. 4. Generally, the dielectric constant depends upon the polarizations such as dipolar polarization, ionic polarization, electronic polarization, and interfacial polarization [18]. Dipolar and interfacial polarizations are more active at the low frequency field ($<\sim 10^3$ Hz) as well as temperature dependent. Dipolar polarization arises due to the orientation of the microscopic dipole whereas interfacial polarizations are due to the presence of charges in the grain boundaries or material interface [18]. However, the contribution from dipolar and interfacial polarization reduces rapidly with the increase of the frequency and subsequently decreases the dielectric constant. In the present composite, two different types of crystal structures exist and lead to affect the overall electrical properties. BNT is well known for piezoelectric properties with higher dielectric values whereas the LFO exhibits a moderate value of dielectric constant [19, 20]. Therefore, the dielectric value of the composite has been found to be lower than that of the BNT, as per the literature [19]. The dielectric constant of the composite decreases with increasing frequencies and attains a nearly constant value at higher frequencies in the present measurement range (10–$10^6$ Hz). At higher frequencies, the major contribution to the overall dielectric constant comes from the contribution of ionic and electronic polarizations. The dispersion behavior of dielectric constant with the frequency of the composite system can be explained with the help of Maxwell–Wagner-type interfacial

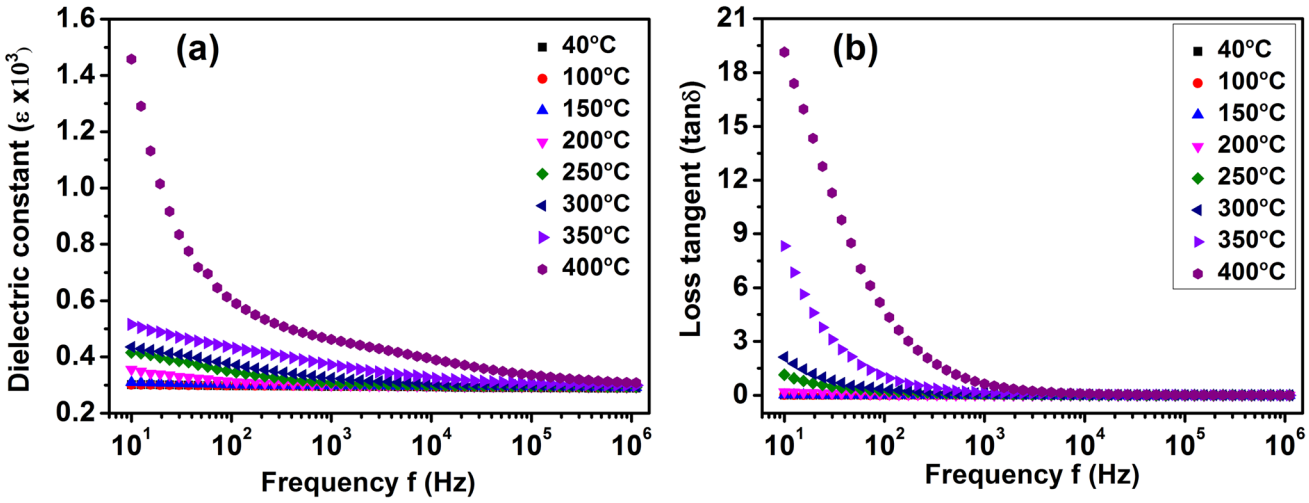


**Fig. 4** Variation of **a** real part of dielectric constant and **b** loss tangent with frequency of the composite at different temperatures

polarization theory with the Koop phenomenological model [21]. From 10 to $10^3$ Hz, there is a rapid decrease in the dielectric constant related to the dipole relaxation process. Saturation of the dielectric constant at higher frequency (~ $10^3$–$10^6$ Hz) can be explained by the hopping mechanism. In the present composite, charge carriers are hopping in the respective cations such as electrons hopping and holes hopping. After a certain higher frequency, dipole oscillations cannot follow the ac electric field and lead to a decrease in the dielectric constant. Furthermore, the dielectric constant of the composite is significantly increased with the rise of the temperature as shown in Fig. 4. Basically, the thermal energy stimulates the polarization process with the application of the electric field and enhances the composite's dielectric constant [22].

The frequency-dependent dielectric loss tangent of the composite at different temperatures has been shown in Fig. 4b. It is clearly observed that the loss tangent value increases with the rise of the temperature. Also, the dispersion behavior of loss tangent with frequency is similar to the dielectric constant. However, the present composite shows a slightly higher value of loss tangent value as compared to the BNT due to the presence of lanthanum ferrite.

The temperature-dependent dielectric constant and loss tangent of the composite are shown in Fig. 5. It is observed that the dielectric constant is gradually increasing with the temperature up to 400 °C. It is due to the alignment of more number of electric dipoles in the field direction due to the external thermal energy. Particularly, more electric dipoles activate and take part in the dielectric relaxation process due to the external thermal energy and contribute to the overall dielectric value. A similar trend is also observed in temperature-dependent loss tangent for the composite. In addition, there is no observation of any dielectric peak in the above variation for the composite within the measuring temperature limit.

### 3.3 Impedance Analysis

The complex impedance analysis provides crucial information about the electrical transport phenomenon [22]. The variation of the real and imaginary part of impedance (Z′

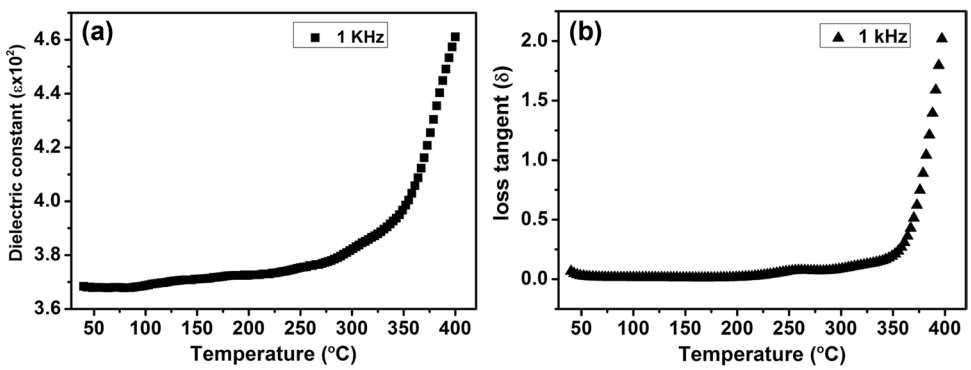


**Fig. 5** Variation of **a** real part of dielectric constant and **b** loss tangent with temperature of the composite at 1 kHz

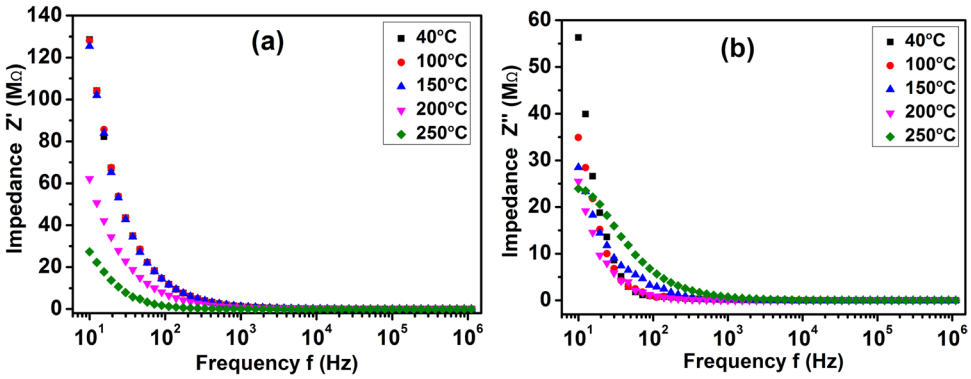


**Fig. 6** Frequency-dependent **a** real (Z′) and **b** imaginary part (Z″) of impedance for the temperature range 40 to 250 °C

and Z″) of the composite with frequency and temperature is illustrated in Fig. 6a, b. From the graphs, it is observed that both parts of impedance vary in a similar way with respect to the frequency (10–$10^6$ Hz) as well as temperature (40–250 °C). In addition, the impedance of the present composite decreases with an increase in the frequency as well as temperature and suggests the enhancement of the ac conductivity. The frequency-independent part of the impedance (Z′ and Z″) increases with the rise in the temperature from 40 to 250 °C in the present measurement. It indicates the strengthening of the relaxation process due to an increase in thermal energy. The impedance value is large at low frequency and temperature due to the polarization, which gradually decreases with temperature. This observation indicates the negative temperature coefficient of resistance behavior (NTCR) [23]. However, this behavior is drastically changed in higher frequency regions where the impedance values of different temperatures are nearly merged. This nature of impedance indicates the reduction of the barrier properties of the composite due to the release of the space charges. Overall, the impedance analysis suggests that the conduction process in the present composite increases with temperature and frequency, which is similar to that of semiconductor materials. Similar types of results are observed in the literature for different composites [24].

Furthermore, the impedance (Z′ and Z″) of the composite exhibits intrigue behavior at higher temperature regions (270 to 400 °C) as shown in Fig. 7. The variation of the real part of impedance with frequency consists of two parts, i.e., (i) lower frequency region and (ii) higher frequency region. The impedance becomes independent in the lower frequency region and increases with temperature. However, the impedance values reduced with the rise in the temperature and confirmed the NTCR behavior [23]. The above results indicate

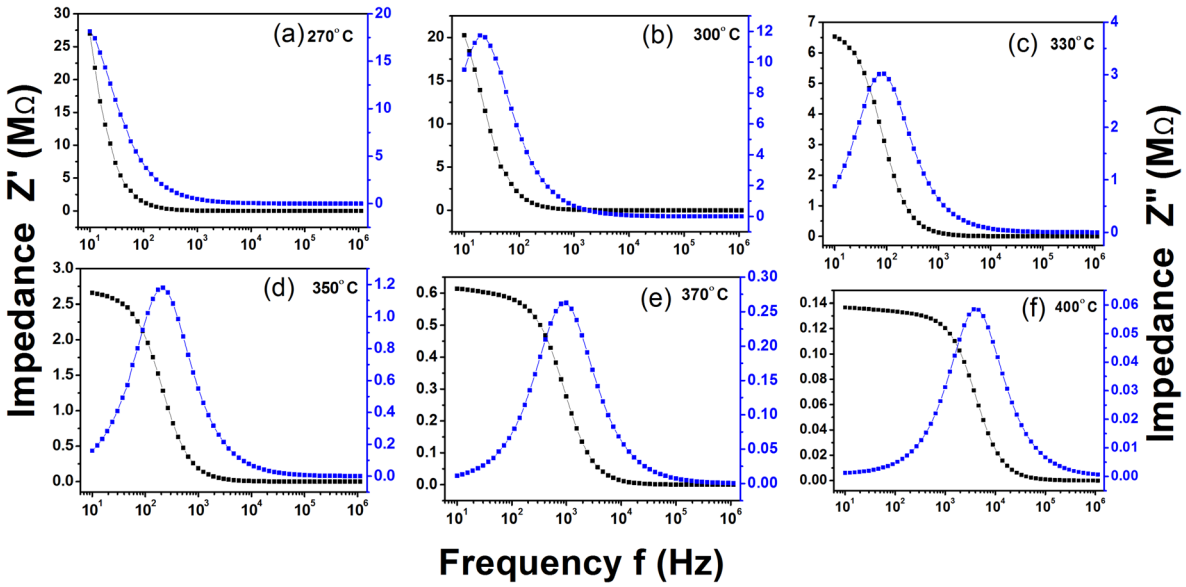


**Fig. 7** Frequency dependent real (Z′) and imaginary part (Z″) of impedance for the temperature range **a** 270 °C, **b** 300 °C, **c** 330 °C, **d** 350 °C, **e** 370 °C, and **f** 400 °C

the pure resistivity nature of the composite. In addition, the dc conductivity of the composite is increasing with temperature which is clearly observed in Fig. 6 and suggests the lack of current dissipation in the sample. In addition, the real part of the impedance shows almost constant frequency in higher-frequency regions. The imaginary part of impedance (Z″) at a higher temperature range (270–400 °C) consists of a maxima peak which represents the relaxation process of the conduction phenomena in the composite. Also, the broad relaxation peak suggests the presence of multiple relaxation processes due to different ions taking part in the electrical transportation [25]. From the figures, it is clearly observed that the relaxation peak starts to appear at 270 °C. As per the literature, the relaxation process is basically observed at higher temperatures for oxide materials which is consistent with our present results. The relaxation peak is shifted to the higher frequency range with the increase in the temperature and suggests the reduction of electron-lattice coupling and an increase in the rate of the hopping process.

Furthermore, the relaxation time ($\tau$) can be estimated from the frequency ($f_p$) corresponding to maxima peak as follow [26]:

$$\tau = \frac{1}{2\pi f_p} \tag{1}$$

As per the present results, relaxation frequency ($f_p$) is increasing with the temperature. Hence, the relaxation time decreases with the temperature. Therefore, the relaxation time or relaxation frequency follows the Arrhenius relation as mentioned below [22]:

$$\tau = \tau_0 \exp(-\frac{E_a}{k_B T}) \tag{2}$$

Here, $\tau_0$ is pre-exponential factor. $E_a$ is the activation energy, $k_B$ is the Boltzmann's constant, and T is the absolute temperature [22].

$$lnf_p = lnf_0 + \frac{E_a}{K_B T} \tag{3}$$

The Arrhenius's plot of the relaxation time is illustrated in Fig. 8. The linear fitting of $lnf_p$ vs 1000/T provides the activation energy of the conduction process. The estimated activation energy of the composite is 1.77 eV and, is similar to other oxide-based composite systems.

### 3.4 Ferroelectric Properties

Furthermore, ferroelectric loop of the composite has been recorded to estimate the different ferroelectric parameters (i.e., maximum polarization, coercivity, remanent polarization, and loop area). From Fig. 9, it is clearly observed that

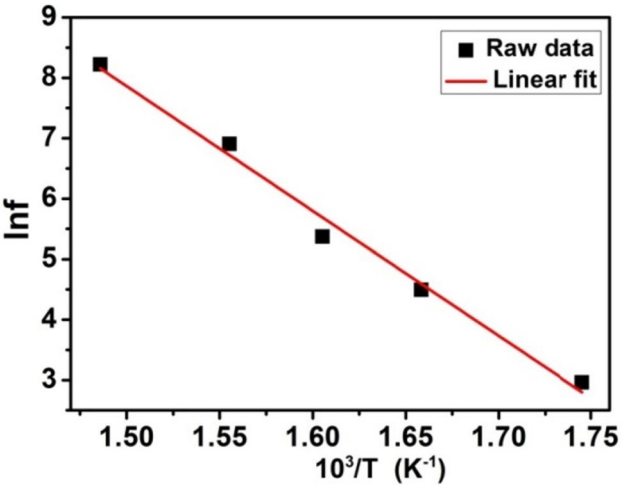


**Fig. 8** Linear fitting of $lnf_p$ vs 1000/T (Arrhenius's plot)

the ferroelectric parameters are gradually increasing with the applied electric field up to 22 kV/cm as shown in Fig. 8. Also, it confirms the presence of a ferroelectric phase (i.e., BNT) in the multiferroic composite. Although bismuth sodium titanate is a well-known ferroelectric material, due to the presence of lanthanum ferrite, the ferroelectric loop exhibits little leaky behavior with a wide hysteresis loop area as shown in Fig. 8. However, the present composite exhibits the electrical polarization with the application of electric field which is necessary for the multiferroic properties.

### 3.5 Magnetic Properties

Figure 10a shows the room temperature magnetic hysteresis (M-H) loops of $LaFeO_3$ (LFO) and composite at an applied magnetic field of 30 kOe. It is clearly observed that

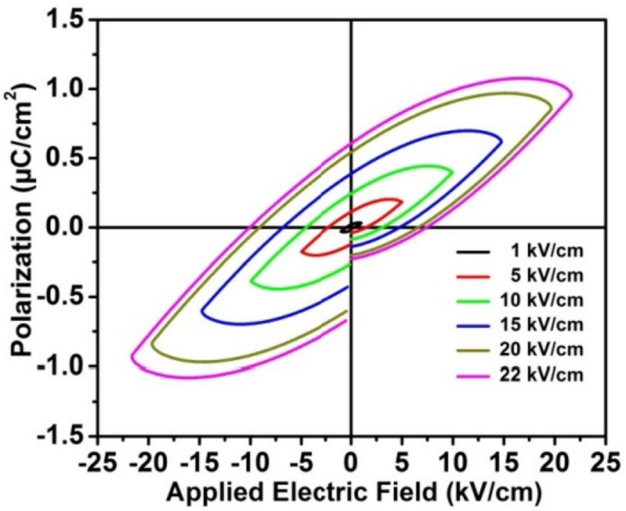


**Fig. 9** Ferroelectric hysteresis loops of the composite at different highest applied electric fields

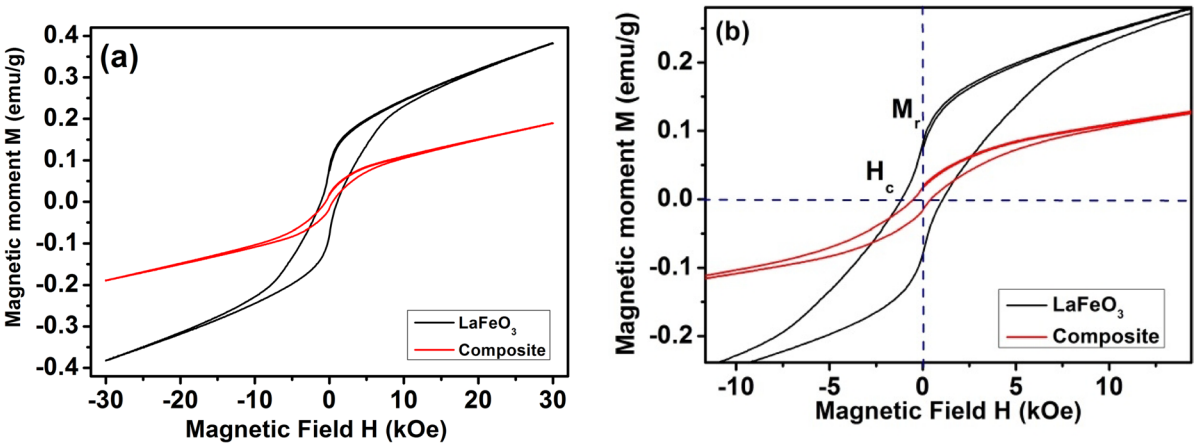


**Fig. 10** **a** Magnetic hysteresis loops of $LaFeO_3$ and composite. **b** Enlarge version of magnetic hysteresis loops of $LaFeO_3$ and composite samples

**Table 2** Magnetic parameters of the samples estimated from M-H loops. Errors are given in the bracket

| Samples | Coercivity ($H_c$) (kOe) | | Remanent magnetization ($M_r$) (emu/g) | | Maximum magnetization ($M_{max}$) (emu/g) |
|---|---|---|---|---|---|
| | $H_{c+}$ | $H_{c-}$ | $M_{r+}$ | $M_{r-}$ | |
| $LaFeO_3$ | 1033.60(0) | 1166.74(0) | 0.017(6) | 0.016(0) | 0.381(2) |
| Composite | 427.59(0) | 535.0(2) | 0.076(4) | 0.077(6) | 0.190(0) |

LFO exhibits antiferromagnetic along with a weak ferromagnetic nature. The magnetic behavior of LFO depends upon the linkage angle of Fe–O-Fe [7, 27]. The linkage angle for an ideal perovskite is ~ 180°, leading to perfect antiferromagnetism. However, the linkage angle for LFO is slightly reduced due to its crystal structure distortion (i.e., orthorhombic). The reduction in the linkage angle is associated with the tilting of spins and deviates from the antiferromagnetism, leading to the development of weak ferromagnetism in LFO. However, the characteristic magnetic parameters (i.e., saturation magnetization, coercive field, remanent magnetization, and hysteresis loop area) of composite significantly reduce as compared to LFO which is clearly observed in the enlarged version of M-H loops as shown in Fig. 10b. The estimated magnetic characteristic parameters are listed in Table 2. The magnetic properties of LFO in the composite reduce due to the addition of a non-magnetic phase (i.e., bismuth sodium titanate). Therefore, the reduced magnetization ($M_r/M_{max}$) has been estimated to compare the magnetic properties. It is observed that the reduced magnetization of LFO (i.e., 0.212) is decreased to 0.0963 (~ 54%) for the composite. It indicates that the presence of BNT leads to interrupting the magnetic exchange interaction in LFO and subsequently reduces the overall magnetic properties. At the same time, the ferromagnetic behavior of the composite has been improved as compared to the antiferromagnetic behavior of LFO. This can be confirmed from the ratio between maximum magnetization ($M_{max}$) to remanent magnetization ($M_r$). The ratio ($M_{max}/M_r$) is near to one for ferromagnetism whereas away from one for antiferromagnetism. In the present work, the ratio is ~ 22.12 and ~ 2.48 for LFO and composite, respectively. However, the magnetization value of the composite decreases due to the reduction of the LFO mole fraction. In addition, the role of itinerant electrons present near the interface cannot be avoided in contributing to the magnetic properties, as per the earlier reports.

## 4 Conclusion

The solid-state reaction method successfully synthesizes lead-free multiferroic composite (0.5)Bi0.5Na0.5TiO3-(0.5) LaFeO3. The XRD pattern confirms that both rhombohedral (i.e., BNT) and orthorhombic (i.e., LFO) crystal symmetries are present in the composite. The dielectric spectrum of the composite exhibits a higher dielectric constant at a lower frequency due to the presence of space charge polarization. The addition of bismuth sodium titanate in lanthanum ferrite reduces the magnetic properties due to the interruption of magnetic ordering. From the impedance analysis, the activation energy of the composite is found to be 1.77 eV by using Arrehinius's plot. Hence, the present analysis provides a basic understanding of the physical properties of (0.50)

$LaFeO_3$-(0.50)-$Bi_{0.5}Na_{0.5}TiO_3$ multiferroic composite. The present results open a window to modify the multiferroic properties of (0.50) $LaFeO_3$-(0.50) $Bi_{0.5}Na_{0.5}TiO_3$ for its practical application.

**Data Availability** Data can available as per the request from the reader.

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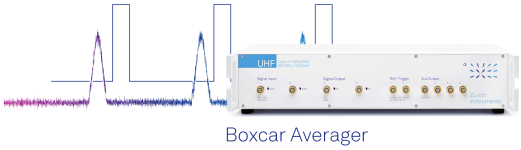
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# The Sentiment Analysis and Emotion Detection of COVID-19 Online Education Tweets Using ML Techniques

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**Abstract.** The COVID-19 outbreak impacted drastically to education and most of educational institutions started preferring online education for students. However, after the settlement of the pandemic there is uncertainty among people about whether they should prefer online education for furthermore or start in offline mode to make it more interactive, so this paper is about an analysis of people's sentiments and emotions through Tweets about COVID-19 Education. This paper aims to study the reaction of people around the world toward online education during COVID-19. This study is conducted on the basis of the responses of students, teachers, parents, college professors, etc. We started with labeling the data into three sentiments namely positive, neutral, and negative and for validation then we used Machine learning (ML) classifiers namely, Logistic regression, Decision tree, Random Forest, Multilayer Perceptron (MLP), Naïve Bayes, Support vector machine (SVM), K-nearest neighbors (KNN), and XG-Boost. Then we performed emotion detection by considering 5 emotions namely happy, surprise, sad, fear, and angry and for validation we used ML classifiers. After applying all these ML approaches, the XG Boost ML classifier achieved the highest accuracy of 94% in classifying the tweets as positive, neutral, or negative, and 96% accuracy in classifying the tweets as happy, surprised, sad, fearful, or angry.

**Keywords:** Sentiment analysis, emotion detection, NLP, machine learning, online education, COVID-19, tweets.

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## INTRODUCTION

Humans have feelings that correspond to internal statuses and behavioral patterns. Sentiment analysis is the method of determining the different sentiments or emotions in the data, such as a social media post, review, or comment. It involves using Natural Language Processing (NLP) techniques to analyze the text and categorize it as positive, negative, or neutral. Sentiment analysis can help businesses understand public opinion, customer feedback, and market trends by analyzing large volumes of textual data [1].

Emotion detection, on the other hand, goes a step further and aims to identify specific emotions such as happiness, sadness, fear, anger, and surprise presented in data or speech. The emotion detection method can be utilized in various fields, such as social media monitoring, and market research [1].

As for online education, there are several reasons why it is needed [2]:

- Accessibility: Online education breaks down geographical barriers and allows people from different locations to access educational resources and opportunities. It provides access to quality education for individuals who may not have access to traditional brick-and-mortar institutions.
- Flexibility: Online education offers flexible learning options. The availability of various books related to their course and lectures at any time enables students to complete their studies at their own speed. Working

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professionals or people with other responsibilities who might not be able to attend regular classes will especially benefit from this flexibility.

- A large selection of course options: Online education offers a variety of courses, some of which might not be accessible locally. Students have the opportunity to choose from various disciplines and pursue specialized knowledge in their areas of interest.
- Cost-effective: As compared to traditional in-person education online education is cost-effective. It eliminates the need for commuting, relocation, and sometimes even textbooks, making education more accessible to a broader range of learners.
- Technological advancements: With the advancement of technology, online education platforms can offer interactive and engaging learning experiences through multimedia content, virtual simulations, and collaborative tools. These resources enhance the learning process and provide a more immersive educational experience.
- Lifelong learning: Online education promotes lifelong learning by offering continuing education and professional development opportunities. Individuals can update their skills and knowledge throughout their careers, keeping up with the evolving demands of the job market.

Nowadays, most of the institutes are giving predilection to online education and some of the people are accepting it contentedly and others used to give some different reactions, this motivated us to do sentiment and emotional study to get to know the conception of different communities. Therefore, we used social media handles namely Twitter because connectivity through social media is flourishing nowadays. People used to share their ideas and suggestions on such platforms. In this study, we will focus on how events in such forums generate collective responses. So, for this purpose, we will be extracting the data related to reactions towards online education, especially during the outbreak of the pandemic i.e. COVID-19 from Twitter using API.

In this paper, we have mainly focused on online education tweets, not just to examine the performance of various ML classifiers but also to infer genuineness so that different institutions can see what people want, whether they are satisfied with online education or want to continue with offline education. This will assist them to take an unerring pronouncement whether they should continue with online education or not.

The Objective of our work is, to check the effect of the combination of TF-IDF and n-gram technique for feature extraction from Twitter online education data on different ML classifiers and analyzation of how different communities reacted towards online education during COVID-19 that help future generations to conclude whether they prefer online education or offline.

The rest of this paper is structured as follows. The 'Related Work', section provides a brief review of related work on sentiment analysis and emotion detection using ML algorithms referencing the names of previous papers. In the section 'Methodology', we provide and explained the proposed framework to achieve the objectives of this paper. In the section 'Results and Discussion', the results of all algorithms are cataloged with a brief discussion. In the end, in the n section 'Conclusion' we conclude our paper with future direction.

## RELATED WORK

R. Kumar et al. in [3] collected the Twitter dataset that contains tweets regarding coronavirus and performed sentiment and emotion of tweets Predicting disease propagation is an essential part of disease management and control. Some successfully applied models include ANFIS, MLP, DeTraC, VGG16, VGG19, etc., and observed Stacked-LSTM and achieved the benchmark of 91% accuracy. M. Gupta et al. [4] represents the effectiveness of certain clustering algorithms in COVID-19 contact tracing is analyzed. DBSCAN performs well for clustering tasks. This work only focuses on possible techniques useful for contact tracing and does not claim any medical accuracy. M. Gupta et al. [5] had done comparative analysis of the top 5 most populated countries namely United States, India, China, Pakistan and Indonesia and had used three Machine Learning (ML) regression algorithms namely Linear Regression (LR), Support Vector Regression (SVR), and Random Forest (RF) Regression and the performance of these three algorithms is compared using the Root Mean Square Error (RMSE) metrics and they had observed that Random Forest algorithm shows best performance as compared to others. Raheja et al. in [6] used a Twitter data set of lockdown and performed

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a sentiment study by using multinomial logistic regression and extracted features using the TF-ID technique for model training then for validation purposes author used decision tree, Naïve Bayes, and KNN and observed multinomial logistic regression gives better accuracy of 94%. Krommyda et al. in [7] took short text data from Twitter and performed emotion detection, and used LSTM, XG Boost, SVM-SGD, Naïve Bayes, Random Forest, and decision tree and observed that LSTM achieved higher accuracy of 91.9%. Lim et al. in [8] used the location of a tweet in sentimental analysis, the author has used CNN, BiLSTM, and Vader library and observed BiLSTM achieved 87.69% of accuracy and after combining the location of the tweet to the tweet made, the author observed the fall in an overall accuracy of classifiers. Chowanda et al. in [9] used Naive Bayes, Random Forest, Artificial Neural Network, Generalised Linear Model (GLM), Fast-Large Margin, Decision Tree, and Support Vector Machine (SVM) machine learning techniques for text-based emotion recognition and observed GLM provides the best accuracy score (90.2%). Park et al. in [10] performed emotion recognition from text stories by collecting 144,701 tweets and gave emotional hashtags to each tweet, and used CNN model for emotion classification. Imran et al. in [11] represent sentiment and emotion study of tweets by DNN, LSTM, GRU, and BiLSTM and observed that for sentiment analysis LSTM with Fast Text as pre-defined word embedding and for emotion analysis LSTM with GloVeTwitter as pre-defined word embedding achieved higher accuracy. Balabantaray et al. in [12] did labeling of data regarding posts on social media manually followed by an analysis of the data linguistically. Bollen et al. in [13] & Larsen et al. in [14] presented a technique to classify tweets into six emotions. Alm et al. in [15] labeled the data manually and the data was from children's stories. Roseman et al. in [16] presented the discrete emotion theory regarding emotion categorization, which was expressed by Charles Darwin et al. in [17] for the first time.

## METHODOLOGY

We first collected the tweets through the Twitter API, a total of approximately 100k tweets were collected, followed by the pre-processing of data by cleaning to remove special characters, URLs, unwanted information, and duplicate tweets. The data was then labeled into three different sentiments that are positive, neutral, and negative with the help of the Text Blob and Vader algorithm followed by training the ML classifiers and predicting the performance of all classifiers. Then, labeled the data set with 5 different emotions namely happy, angry, surprise, fear, and sad with the help of the text2emotion python library, followed by training the ML classifiers and predicting the performance of all classifiers in terms of f1 score, recall, precision, and accuracy. FIGURE 1 represents the methodology of this paper.

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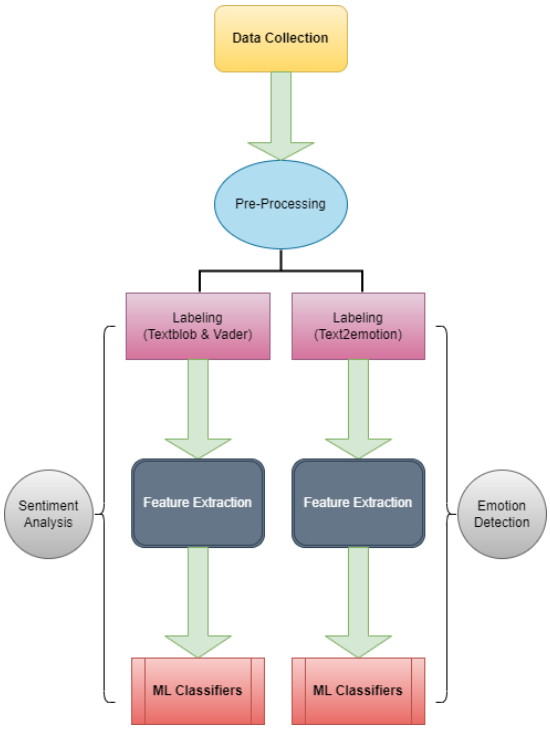


**FIGURE 1.** Proposed Framework

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## Sentiment Analysis

*Labeling of data*

Sentiment analysis can be used to analyze students' feedback and sentiments regarding online courses, modules, or specific assignments. By collecting and analyzing this feedback, educators can identify areas of improvement, address student concerns, and make necessary adjustments to enhance the learning experience. Sentiment analysis combined with machine learning algorithms can create adaptive learning systems that tailor educational content and activities to individual students' needs and emotional states. By continuously analyzing sentiments, the system can adapt and provide personalized learning paths, resources, and support.

If we give large amount of raw data to classifiers, it will provide abrupt result, so it is necessary to do labeling of data. Data labeling process work in the following order: Data collection, Data tagging, and Quality assurance. Data collection includes collecting raw data followed by tagging the data by various data labeling approaches such as Text Blob and Vader (discussed in this section) and at last quality assurance is done which means how correctly the tags are tagged for the particular data point where one can use Consensus algorithm.

For labeling our data set into different sentiments, we used Text Blob and Vader for labeling the data. Text blob and Vader are data labeling approaches for Natural Language Preprocessing (NLP) data. Text blob is a library in Python for textual data processing (NLP) and when any text is given to it as an input, it returns its polarity score lies in [-1,1] (where 1 tells data is positive, 0 tells data is neutral, and -1 tells data is neutral) and subjectivity which measures the amount of factual information and personal opinion presented in the text. Valence-aware dictionary and sentiment reasoning (Vader) is also a Python library that is specifically used for social media sentiments that computes the positive, negative, and compound scores to find out the polarity of the textual data

*Features extraction*

For feature extractions, we used a combination of Term Frequency Inverse Document Frequency (TF-IDF) and N-gram techniques. Term frequency tells the frequency of the term in a document and Inverse document frequency tells about the relative rarity of a term in the collection of documents. To get the final TF-IDF value, multiply TF and IDF.

N-gram is a probabilistic model which counts how many times word sequences occur in corpus text and estimates the probability it is important in capturing the meaning of word sequences in text, where N represents the number of tokens. For example, “I” is a one-gram, “I am” is a two-gram, “I am a student” is a three-gram, and so on. Without N-grams “I”, “am”, and “student” would be considered separately, thus not giving the required output.

The data set in text form was then transformed into a numerical representation with the help of feature vectors and we generated 50,000 feature words. In numerical datasets in output like "(0, 44667) 0.199853008 ", 0 represents the index of the feature extracted and 44677 is a numerical notation of that particular feature and the last is the TF-IDF value defined.

*ML Classifiers*

ML classifiers were used for validation. ML classifier uses either supervised or unsupervised learning. Supervised learning trains the classifier on labeled input while unsupervised trains the classifier on unlabeled input, as we have labeled the data therefore, we used 8 supervised learning ML classifiers namely, Logistic regression, Decision tree, Random forest, Multilayer Perceptron(MLP), Naïve Bayes, Support vector machine(SVM), K-nearest neighbors(KNN), and XG-Boost. A decision tree classifies the data in a tree-structured form which contains decision nodes that have branches and make decisions by using the features of the given data set and leaf nodes that have output. Random forest classifier combines the result of several decision trees. MLP classifier is based on a neural network for classification. Naïve Bayes classifier depends on the Bayes theorem of probability. SVM classifier finds the best decision line that divides the space into different classes. In Logistic regression, we don’t go for a regression line but we use a logistic function that converts the data into the range of 0 and 1. KNN classifier is a lazy classifier that learns from the training data only when some test data is given. XG Boost uses ensemble approach to classify the data which is based on Gradient boosting algorithm.

The data had been split into 80%-20% where 80% is for training purpose and 20% is for testing purpose. Then we trained the ML classifiers and calculated precision, recall, and f1-score. Precision is the metric which measures the number of positive predictions predicted by classifier were correct while Recall measures the number of positive class data in original dataset that were correctly identified by the classifier. There is a trade-off between the precision and recall metrics. The F1-score is a metric that is the combination of two metrics that are precision and recall and the f1 score uses their harmonic mean to combine them. Thus, increasing the F1 score increases precision and recall simultaneously. Thus, scientists use the F1 score with accuracy for evaluating the performances of their models. Accuracy is a metric which measures the number of correct classifications classified by the trained classifier.

## Emotion Detection

*Labeling of data*

Emotion detection techniques can identify students' emotional states, such as stress, boredom, or engagement, during online learning activities. Educators can receive real-time notifications about students experiencing negative emotions, enabling them to intervene and provide timely support. Online education can be isolating for some students, leading to feelings of loneliness or stress. Emotion detection can identify students' emotional states related to mental health, such as signs of anxiety or distress. Educators can use this information to reach out, offer support resources, or connect students with mental health services, promoting their well-being and academic success.

In the emotion detection process, we considered the previously used pre-processed data and performed the labeling with the help of text2emotion python library into 5 emotions namely ‘happy’, ‘surprise’, ‘sad’, ’fear’, and ‘angry’. Text2emotion is the package in Python for extracting the emotions from any textual message and it gives emotion scores ranging from 0 to 1 for five emotions namely happy, surprise, sad, angry, and fear. Text2emotion gives the output in the form of a dictionary. Let us understand how this algorithm work, consider if you are a teacher and your students are doing well in their studies then you will say ‘Very good my child! Keep it up.’, such type of comment shows that you are happy with the student’s performance. Text2emotion also extracts the emotion in a similar manner.

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*Features extraction*

The fundamental step in the emotion detection process is feature extraction. In emotion detection, we used a combination of TF-IDF and n-gram techniques for the extraction of features. We used a 1 to 3 n-gram range and give it as an input to the TF-IDF vectorizer to get feature vectors. TF-IDF vectorizer will keep only one to three words sentences as we used an n-gram range from 1 to 3. Therefore, feature vectors will be of the length of 1 to 3 words only. For emotion detection purposes we generated 42,000 feature vectors. Then we converted the training data set into numerical form.

*ML Classifiers*

For training the ML classifiers namely, Logistic regression, Decision tree, Random Forest, Multilayer Perceptron (MLP), Naïve Bayes, Support vector machine (SVM), K-nearest neighbors (KNN), and XG-Boost we used 80% numerical training data set and used 20% data set to evaluate the f1 score, recall, precision, and accuracy of eight different ML classifiers and the accuracy of the classification depends on these features trained ML classifiers. We used classification reports and confusion matrices to evaluate the performance of classifiers in f1 score, precision, recall, and accuracy form and in matrix form respectively.

## RESULTS AND DISCUSSION

### Sentiment Analysis Results

Sentiment analysis and emotion detection techniques offer valuable insights and opportunities for personalized interventions in online education. They can help improve student satisfaction, engagement, collaboration, and emotional well-being. By harnessing the power of these techniques, online education can become more effective, inclusive, and tailored to meet the diverse needs of students in the digital learning landscape.

In this paper, we labeled the data , followed by analysing with pie chart, frequency plot and word cloud and at last evaluated the performance parameters like accuracy, precision, recall, f1 score of eight different machine learning classifiers for both sentiment analysis and emotion detection of tweets related to online education. FIGURE 2 and FIGURE 3 represent the pie chat for text blob and Vader result respectively. TABLE 1 shows Text Blob results and Vader algorithm results. According to Text Blob result, data set consisting of 59.8%, 13.7%, and 26.5% of positive, negative, and neutral tweets respectively, and according to Vader's result, a data set consisting of 60.1%, 13.6%, and 26.3% of positive, negative, and neutral tweets respectively.

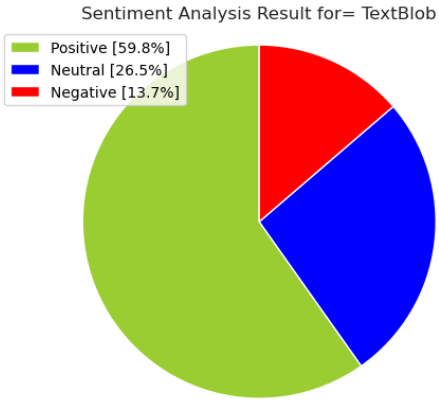


**FIGURE 2**. Pie chart for Text blob result.

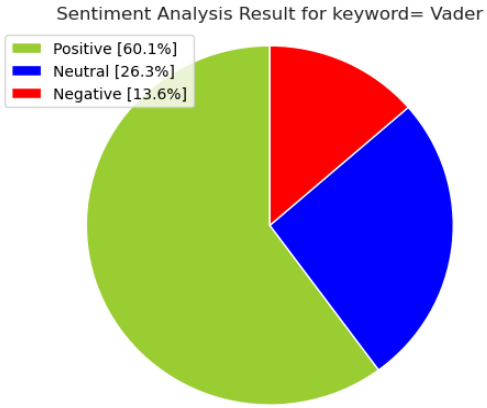


**FIGURE 3**. Pie chart for Vader result.

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**TABLE 1.** Result of Text Blob and Vader algorithm.

| No. Of Tweets | Text Blob | Vader |
|---|---|---|
| Positive | 59.8% | 60.1% |
| Negative | 13.7% | 13.6% |
| Neutral | 26.5% | 26.3% |

FIGURE 4 and FIGURE 5 represent the frequency of positive, negative, and neutral tweets for Text Blob and Vader results, respectively. As we can see in both the cases of Text Blob and Vader, positive count of tweets are high while negative count of tweets are less. Therefore, more people reacted positively rather than negative and neutral towards online education during COVID-19. FIGURE 6 and FIGURE 7 represent the word cloud for Text Blob and Vader result respectively which displays the most prevalent words that are evident in the tweets. As we can easily observe from the word cloud plot of the data set where most commonly occurring words in our original data set are ‘education’, ‘student’, ‘teacher’, ‘motivation’, ‘knowledge’, ‘learn’, 'http’, ‘help’, ‘news’, etc. Therefore, we conclude that results of both the algorithms, Text Blob and Vader are approximately same.

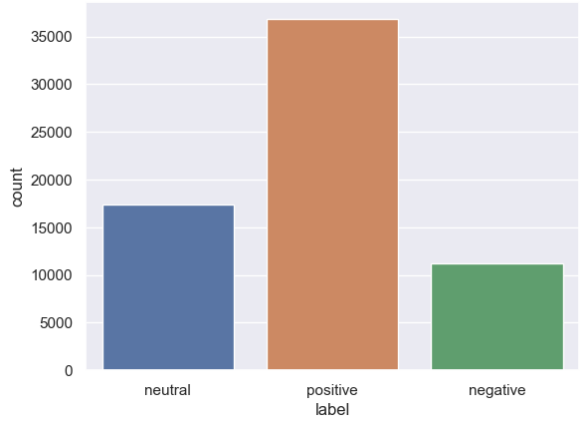


**FIGURE 4.** Frequency plot for Text Blob result.

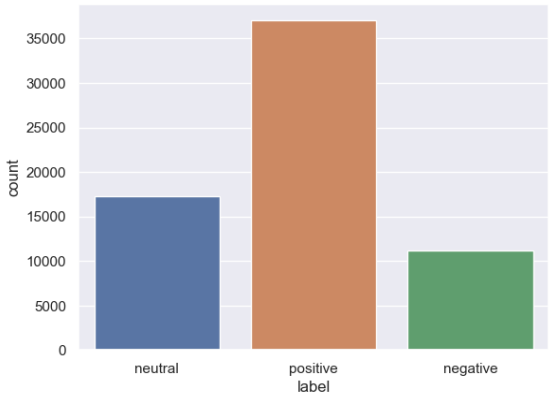


**FIGURE 5.** Frequency plot for Vader result.

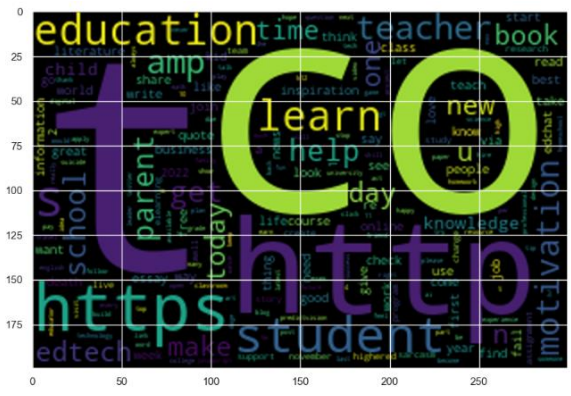


**FIGURE 6.** Word Cloud for Text Blob result.

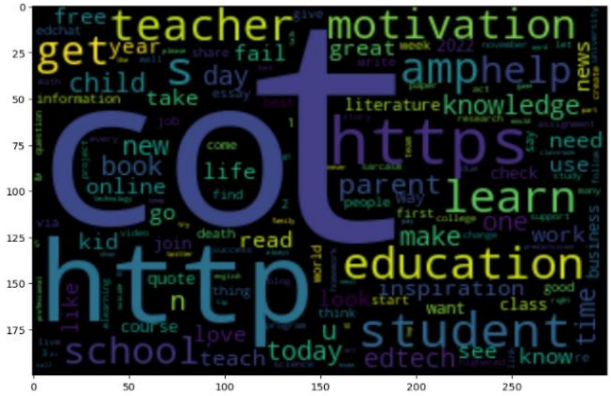


**FIGURE 7.** Word Cloud for Vader result.

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TABLE 2 shows the precision, recall, f1-score, and accuracy of 8 different ML classifiers for the sentiments. FIGURE 8 represents the result of Logistic Regression which achieved 92% accuracy and the confusion matrix tells that 1,763, 826, and 423 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 9 shows the result of the Decision Tree which achieved 91% accuracy and the confusion matrix tells that 1,740, 830, and 410 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 10 shows the result of Random Forest which achieved 89% accuracy and the confusion matrix tells that 1,701, 842, and 383 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 11 shows the result of the MLP classifier which achieved 92% accuracy and the confusion matrix tells that 1,778, 811, and 440 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 12 shows the result of Naive Bayes which achieved 81% accuracy and the confusion matrix tells that 1,665, 565, and 421 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 13 shows the result of KNN which achieved 70% accuracy and the confusion matrix tells that 1,548, 497, and 262 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 14 shows the result of SVM which achieved 94% accuracy and the confusion matrix tells that 1,784, 843, and 449 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified. FIGURE 15 shows the result of XG boost which achieved 94% accuracy and the confusion matrix tells that 1,786, 864, and 443 from 1,866 negative tweets, 872 neutral tweets, and 537 positive tweets respectively were correctly classified.

**TABLE 2.** Result of ML Classifiers for Sentiment Analysis.

| **Classifier** | Precision | Recall | F1-score | Accuracy |
|---|---|---|---|---|
| **Logistic regression** | 0.95 | 0.94 | 0.95 | 92% |
| **DT** | 0.94 | 0.93 | 0.94 | 91% |
| **RF** | 0.95 | 0.91 | 0.93 | 89% |
| **MLP** | 0.95 | 0.95 | 0.95 | 92% |
| **NB** | 0.83 | 0.89 | 0.86 | 81% |
| **K-NN** | 0.75 | 0.83 | 0.79 | 70% |
| **SVM** | **0.97** | **0.96** | **0.96** | **94%** |
| **XG Boost** | **0.97** | **0.96** | **0.96** | **94%** |

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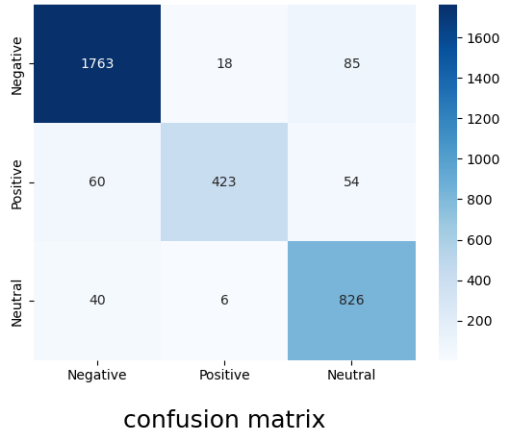


**FIGURE 8**. Sentiment analysis result for Logistic Regression.

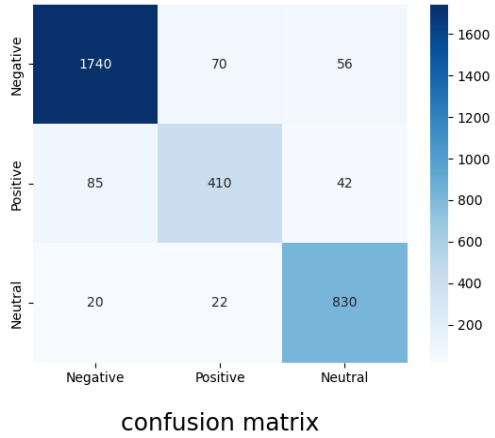


**FIGURE 9**. Sentiment analysis result for Decision Tree.

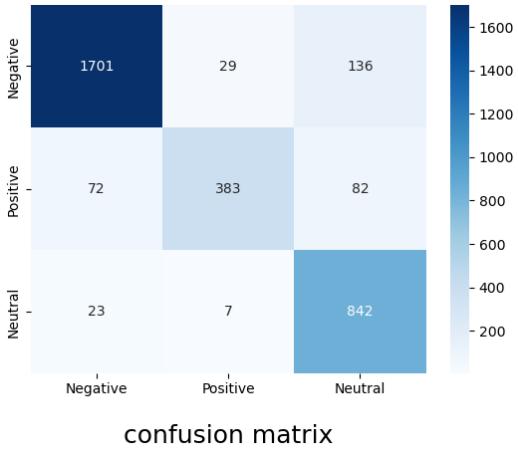


**FIGURE 10** Sentiment analysis result for Random Forest

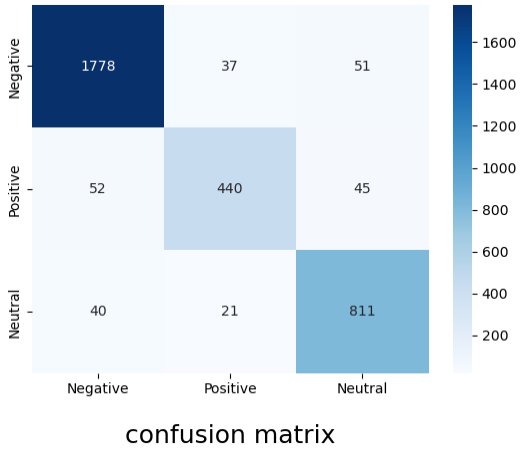


**FIGURE 11.** Sentiment analysis result for MLP

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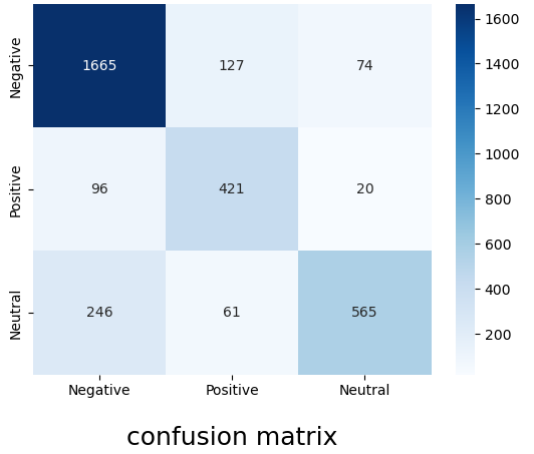


**FIGURE 12.** Sentiment analysis result for Naïve Bayes

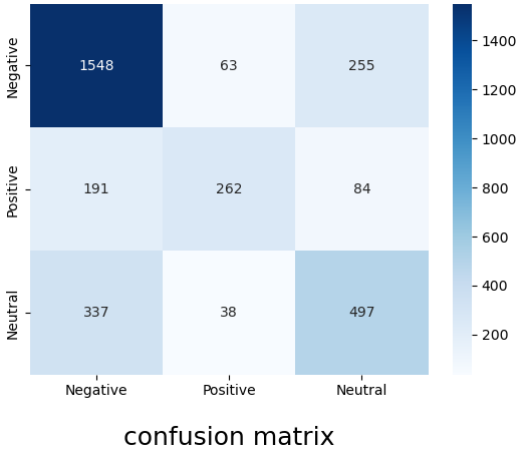


**FIGURE 13**. Sentiment analysis result for KNN

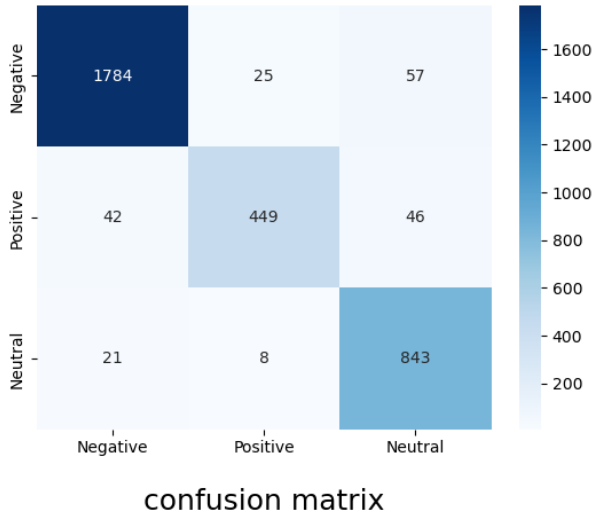


**FIGURE 14.** Sentiment Analysis Results for SVM.

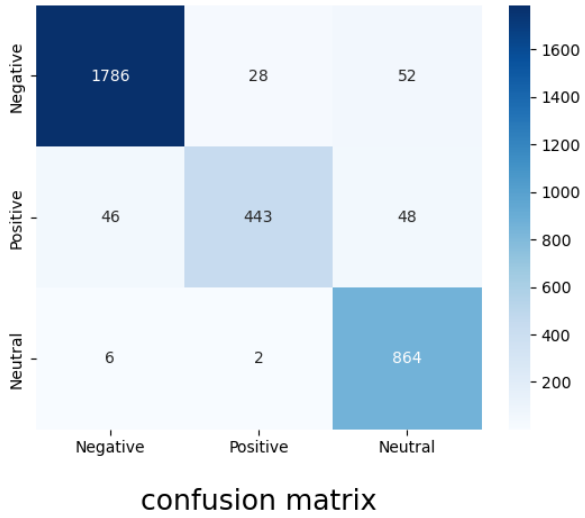


**FIGURE 15.** Sentiment Analysis Results for XG Boost.

## Emotion Detection Results

FIGURE 16 represents a pie chart that tells that 15.6% of people were happy, 35.8% of people were surprised, 18.6% of people were sad, 28% of people were fearful and 2% of people were angry with online education FIGURE 17 represents a bar graph where we plotted the frequency count of five different emotions.

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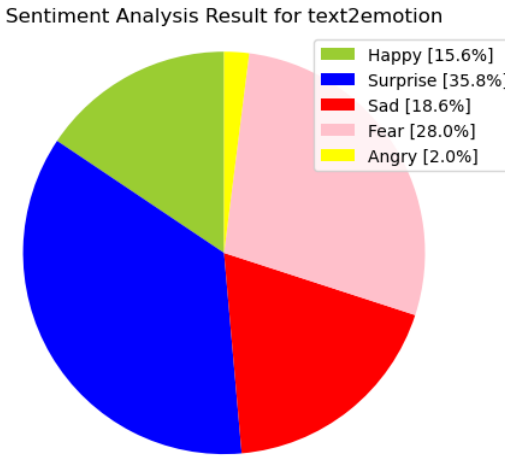


**FIGURE 16.** Pie Chart for 5 different emotions

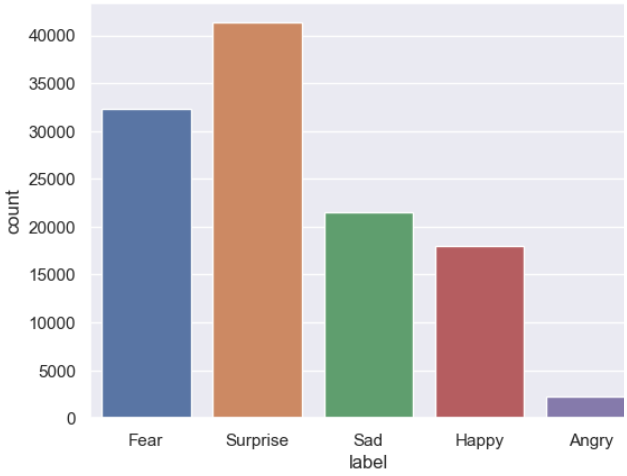


**FIGURE 17.** Frequency graph for 5 different emotions.

TABLE 3 shows the result of text2emotion library and according to it data set consisting of 15.6% of happy emotion tweets, 35.8% of surprised emotion tweets, 18.6% of sad emotion tweets, 28% of fearful emotion tweets, and 2% of angry emotion tweets. Therefore, from these results we conclude that most of the people reacted with surprised emotion toward online education during COVID-19.

**TABLE 3.** Result of Text2emotion library.

| Emotions | Number of tweets in percentage |
|---|---|
| Happy | 15.6% |
| Surprise | 35.8% |
| Sad | 18.6% |
| Fear | 28.0% |
| Angry | 2.0% |

TABLE 4 shows the precision, recall, f1-score, and accuracy of 8 different ML classifiers for the emotion detection of tweets. The highest accuracy is achieved by MLP, SVM, and XG-Boost and the lowest accuracy is achieved by KNN that is 71% and the accuracy of Logistic regression, Decision Tree, Random Forest, Naïve Bayes are 93%, 92%, 93%, and 79% respectively. The f1 score of MLP, and SVM are 0.97 which is highest among all other classifiers and f1 score of Logistic regression, Decision Tree, Random Forest, Naïve Bayes, KNN, and XG Boost are 0.93, 0.91, 0.93, 0.80, 0.66, and 0.96 respectively. The precision score of MLP is highest that is of 0.98 and of KNN is lowest that is of 0.66 among all classifiers. The precision score of other classifiers that are Logistic regression, Decision tree, Random Forest, Naïve bayes, SVM, and XG Boost are 0.95, 0.91, 0.94, 0.82, 0.97, and 0.96 respectively. The recall score of SVM and XG Boost are highest that is of 0.96 and of KNN is lowest that is of 0.67 among all classifiers. The recall score of other classifiers that are Logistic regression, Decision tree, Random Forest, Naïve bayes, and MLP are 0.92, 0.92, 0.93, 0.77, and 0.95 respectively. Therefore, we conclude that the best model is XG boost, SVM and MLP.

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**TABLE 4.** Result of ML Classifiers for Emotion Detection.

| **Classifier** | Precision | Recall | F1-score | Accuracy |
|---|---|---|---|---|
| **Logistic regression** | 0.95 | 0.92 | 0.93 | 93% |
| **DT** | 0.91 | 0.92 | 0.91 | 92% |
| **RF** | 0.94 | 0.93 | 0.93 | 93% |
| **MLP** | **0.98** | **0.95** | **0.97** | **96%** |
| **NB** | 0.82 | 0.77 | 0.80 | 79% |
| **K-NN** | 0.66 | 0.67 | 0.66 | 71% |
| **SVM** | **0.97** | **0.96** | **0.97** | **96%** |
| **XG Boost** | **0.96** | **0.96** | **0.96** | **96%** |

FIGURE 18 shows the result of Logistic Regression which achieved 93% accuracy and the corresponding confusion matrix tells that 871 sad emotion tweets, 943 happy emotion tweets, 1,947 surprise emotion tweets, 1,532 angry emotion tweets, and 68 fear emotion tweets from 951 sad emotion tweets, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified. FIGURE 19 shows the result of the Decision Tree which achieved 92% accuracy and corresponding the confusion matrix tells that 872 sad emotion tweets, 953 happy emotion tweets, 1,863 surprise emotion tweets, 1,513 angry emotion tweets and 89 fear emotion tweets from 951 sad emotion tweets, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified. FIGURE 20 shows the result of Random Forest which achieved 93% accuracy and the corresponding confusion matrix tells that 886 sad emotion tweets, 949 happy emotion tweets, 1,914 surprise emotion tweets, 1,539 angry emotion tweets and 85 fear emotion tweets from 951 sad, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified. FIGURE 21 shows the result of the MLP classifier which achieved 96% accuracy and corresponding the confusion matrix tells that 907 sad emotion tweets, 1,011 happy emotion tweets, 1,974 surprise emotion tweets, 1,588 angry emotion tweets and 87 fear emotion tweets from 951 sad emotion tweets, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified.

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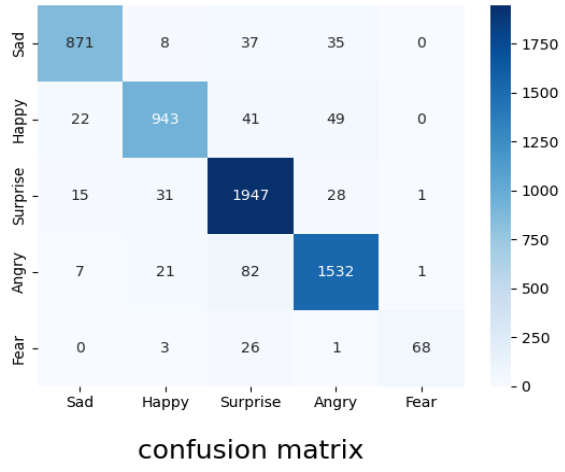


**FIGURE 18.** Emotion detection results for Logistic Regression

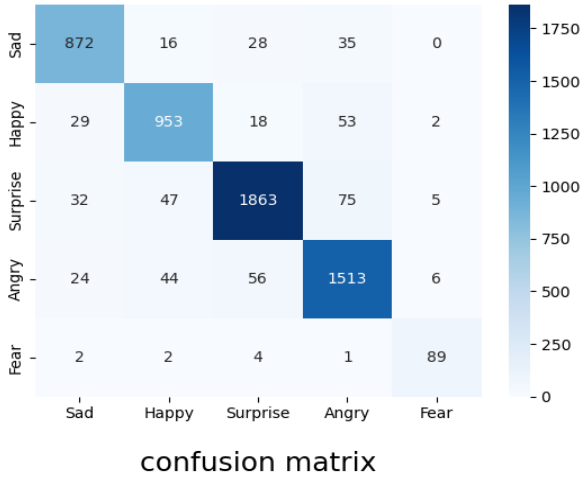


**FIGURE 19**. Emotion detection results for Decision tree

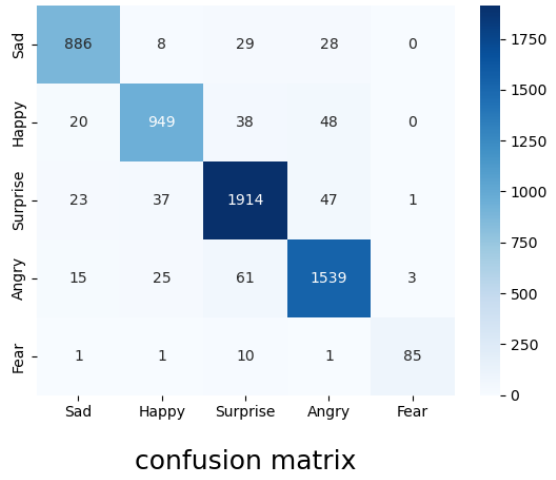


**FIGURE 20.** Emotion detection results for Random forest

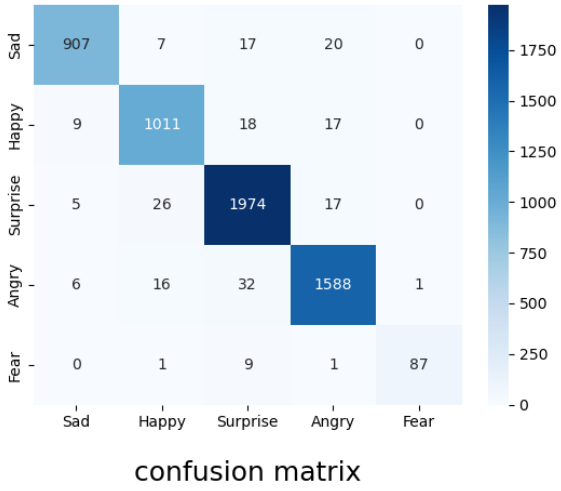


**FIGURE 21.** Emotion detection results for MLP.

FIGURE 22 shows the result of Naive Bayes which achieved 79% accuracy and the confusion matrix tells that 736, 822, 1,551, 1,407 and 38 from 951 sad, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified. FIGURE 23 shows the result of KNN which achieved 71% accuracy and the confusion matrix tells that 635, 675, 1,627, 1,095 and 56 from 951 sad emotion tweets, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified.

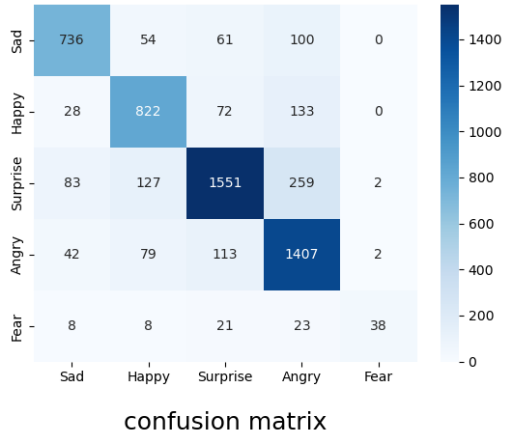


**FIGURE 22.** Emotion detection results for Naive Bayes.

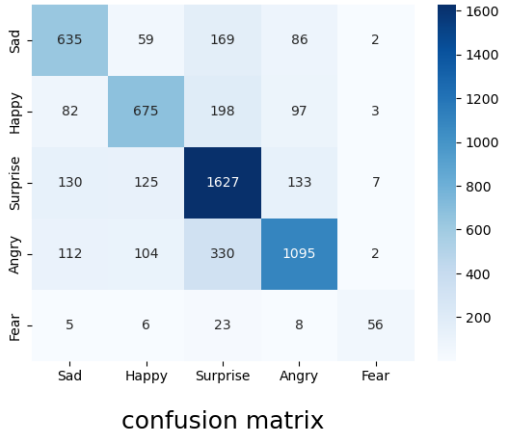


**FIGURE 23.** Emotion detection results for KNN.

FIGURE 24 shows the result of SVM which achieved 96% accuracy and the confusion matrix tells that 917, 1008, 1,970, 1,586 and 85 from 951 sad emotion tweets, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified. FIGURE 25 shows the result of XG boost which achieved 96% accuracy and the confusion matrix tells that 916, 1008, 1,977, 1,556 and 88 from 951 sad emotion tweets, 1,055 happy emotion tweets, 2,022 surprise emotion tweets, 1,643 angry emotion tweets, and 98 fear emotion tweets respectively were correctly classified.

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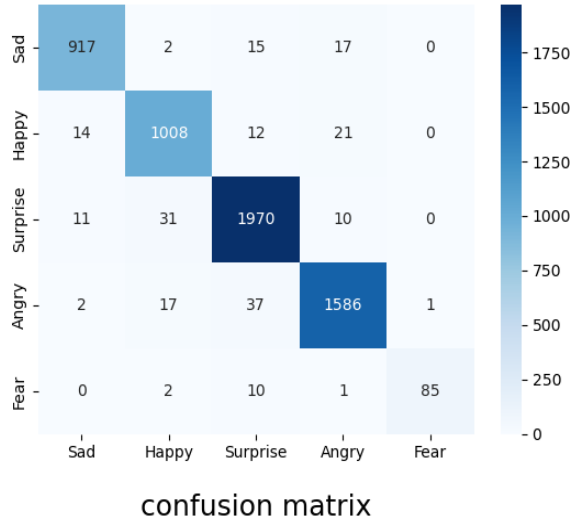


**FIGURE 24.** Emotion detection results for SVM.

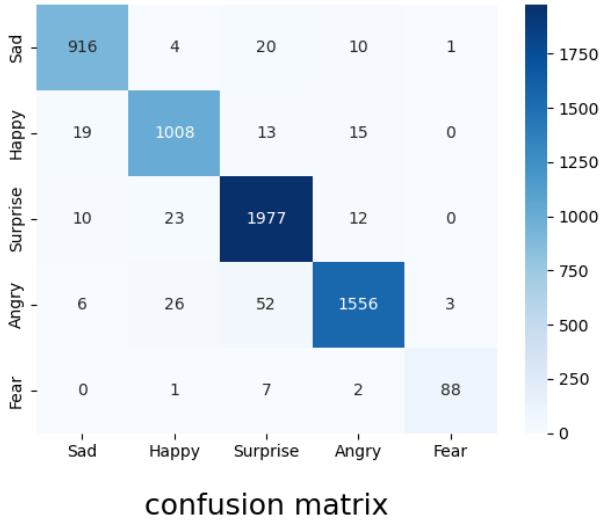


**FIGURE 25.** Emotion detection results for XG Boost.

## CONCLUSION

The significance of sentiment analysis and emotion detection in online education lies in their ability to enhance the learning experience, support student well-being, and improve educational outcomes. In this work, we analyzed the sentiments and emotions of tweets about online education during COVID-19. For this purpose, twitter dataset of 100K tweets was collected through the twitter API and after preprocessing, labeling of data by Text Blob, Vader, and text2emotion was done. For validation, we used eight Machine Learning techniques namely, Logistic regression, Decision tree, Random forest, Multilayer Perceptron(MLP), Naïve Bayes, Support vector machine(SVM), K-nearest neighbors(KNN), and XG-Boost. Combination of TF-IDF and n-gram technique was used for feature extraction. After performing the experiment it was observed that the XG boost ML classifier is more accurate in classifying tweets into positive, negative, or neutral with 94% accuracy where as it can classify the same tweet into happy, surprised, sad, fearful, or angry with 96% accuracy. SVM classifier also has the same accuracy as XG boost i.e., 94% in sentiment analysis and 96% in emotion detection. On the basis of this we observed that most people reacted positively with surprised emotion towards online education.

In the Future, we plan to further classify the positive and negative sentiments into five emotions namely happiness, surprise, sadness, fear, and anger by utilizing the output of sentiment classifier to the input of emotion classifiers.

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# The Women Characters of Amish Tripathi: A Postfeminist Perspective

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*Abstract*

The paper attempts to explore the women characters of Amish Tripathi in his *Shiva Trilogy* and *Ram Chandra Series* with a post-feminist perspective. In the recent trend of mythological fiction, women characters are given the roles of protagonists for voicing their emotions and decisions. From their shadowed existence to their new avatar of prominence and strength they have become role models for the young generation. Tripathi has subverted the characterization of women with extraordinary virtues. His Sita is the pride of Malayputras who confer on her the coveted title of 'Vishnu' for making her accountable for the welfare of the people by destroying evil. He very carefully associates masculine qualities with women to prove their wisdom and power. The paper focuses on Tripathi's defiance of patriarchal society by presenting a world of women who possess masculine qualities along with utmost femininity.

**Key Words:** Post-feminism, Empowered Women; Femininity; Feminism, Mythology.

## Introduction

Indian mythology is an essential part of the literature of different languages with ancient stories depicting events that highlight the patriarchal set-up of society. The mythology of other civilisations also generally neglects the female characters in their androcentric stories. Tripathi's novels also analyse conventional feminist ethics and recognise the potential of women as worthy partners in personal and professional life. Gender stereotypes are shattered to convince readers that women are not inferior to their male counterparts in any way.

The current literary scenario of popular literature is filled with the genre of mythological fiction in different Indian languages including the English language. Well-known writers like Ashok Banker, Ashwin Sanghi, Chitra Divakaruni, Amish Tripathi, Devdutt Pattanaik, Anand Neelakantan etc. are minting money from their books based on mythology. The feminist retellings of our epics are not static but flexible which gives ample opportunity to mould stories according to the requirements. Pandey, S and Jodha (2023) state that "Re-visiting of myth is

an emerging trend in Indian literature in English, particularly concerning the post-feminist perspective of giving voice to the voiceless, describing Sanatan women's talent and capabilities and creating a new identity for them, wrongly portrayed as inferior to men" (163).

Some women characters in Indian mythology are portrayed as weak and submissive for the sake of showing them as perfect but some are demonized to the extent of making them look villainous. However, in the current era, all such characters are being given prominence to show them as humans with normal vices and virtues. The writers of mythological fiction are justifying their stand in the patriarchal system by fictionalizing original stories of epics. The wave of feminism has influenced these writers to subvert the narratives to give voice to neglected characters. Women protagonists from epics and scriptures especially in TV serials and Web-series are being appreciated by women viewers. Amish Tripathi has created a niche in the mythological fiction category by taking inspiration from Indian mythological characters. He has redefined images of women to alter the traditional image that reflected a meek and docile nature. Femininity is a social construct which includes modesty, softness, kindness, beauty, gentleness, empathy, humility, sensitivity, affection, tenderness etc. Thiraviadurai and Shanthi (2021) praise Tripathi:

> An Indian iconic figure Amish Tripathi has come up with refreshing new ideas of how the age-old mythical stories could be written in today's dynamic setting. With many gods and Goddesses, Kings and Queens, Princes and Princesses instilled in our childhood memories, it has become ever so exciting to pick up the next book that caters to our never-ending imagination and feed our hunger of more such tales. (27).

Revisiting myths paves the way for subversion and inversion in the original story thereby inviting flak from the religious and literary circles. The heady mixture of mythology with suspense, fantasy and thrill has created a new genre that provides lucre and publicity to the authors. This new trendsetter in the field of popular literature is encouraging directors to make web series and movie adaptations of these works. The influence of feminism is clearly visible in the narratives of these works.

Feminism has influenced authors and intellectuals to criticize every act and decision of men and society from a different perspective. According to Western critic Pam Morris:

> Feminism is a perception based on two fundamental premises: (1) that gender difference is the foundation of structural inequality between women and men, by which women suffer systematic social injustice, and (2) that the inequality between the sexes is not the result of biological necessity but is produced by the cultural construction of gender differences. This

> perception provides feminism with its double agenda: to understand the social and psychic mechanisms that construct and perpetuate gender inequality and then to change them. (63).

The genuine concern for the rights of women in social, economic, political, and personal spheres is regarded as very important for the wholesome growth of a society. Now after the third wave of feminism post-feminism has replaced the previous version of feminism. The paper attempts to analyse contemporary mythological fiction authored by Amish Tripathi in the light of post-feminist theory which has given power to the less-powerful.

**Literature Review**

The replacement of feminism by post-feminism has caused a revolution in literary and academic writings, especially in popular cultural representations. Earlier the criticism of retellings with a feministic perspective has been in fashion for quite some time for example Devi and Srividhya (2020) claim that "In the age-old mythical narratives, women were seen from the androcentric Perspective and were portrayed as creatures that are inferior to men by all means" (504). She further observes "Revisionist myth-making especially, serves as a powerful weapon for the feminist writers as they can rethink and revise the image of silent, passive women of the past and envision them from a different perspective. These reconstructions of ancient women's identity have gone a long way in demolishing their socially constructed inferior status" (506). The proliferation of feministic versions of epics gives voice to the women who were otherwise neglected and relegated to the margins. Therefore, subversion is very common in these modernized tales based on mythology. Writers have changed the story to make it relevant to contemporary society where empowered women are ruling the roost. In some cases, the plight of mythological characters is identified with personal grief as Nina Paley does in *Sita Sings the Blues* where she describes her agony of separation from her spouse.

The fact that the discourse of feminism has declined leading to a decrease in the discussion of issues of feminist rights and equality, etc. has found ample illustrations in the works of Tripathi written in a postfeminist spirit. His characters no longer crave for the establishment of their identity and equality of treatment vis-vis their male counterparts. Their very roles are unequivocally parallel to their male counterparts and they assume their own societal impressions represented in the works of Tripathi. Whether it is Sita, Sunaina or any other woman character in the *Ramchandra series* or Sati in the *Shiva Trilogy*, Amish has presented

them as a consciously mature character with the critical acumen to understand the ordeal of time.

The market demand for books on mythology, epics, and legends is increasing every day owing to their popularity among readers and viewers. Sundari (2020) declares that "None of the myths and the fictional works were created for the use of one particular period of people. Only those who understand the greatness of the ideologies in myths can conclude that they are for all ages and all times. Myth encompasses the knowledge of our forefathers, the scientific miracles of today's scenario and cognizance for the future generation" (3223). Along the same lines, Dwivedi, RR (2020) claims that

> While myth as a cultural reservoir of patriarchal hegemonic structure has cast women in a subordinated, submissive profile, the retellings of the same drawing parallel at any level and to any extent is an undaunted endeavour to look into the state of affairs, question the structure and re-invent the narrative against the spatio-temporal realities. (35).

The last stage of Feminism does not ask for more power as women have already become empowered. This trace of post-feminist traits is visible in all the works of Tripathi. Sonthalia (2019) argues that "In the 21st century when women have acquired equal rights in all spheres of life, the subject of women empowerment provided a better platform to women to raise their unheard voices through art forms" (95). Similarly, Winmayil (2020) finds that "The modern versions of the epics giving narrative shift to the (s)heroes have the psychological constructions of the tale. The writers Divakaruni, Atwood and Tripathi unearth the animus within the feminine psyche of the heroines of the epics that defy the basic social constructs of the society" (234). Tripathi has deliberately showered strength and professionalism on his women characters as during the waves of feminism only protests and rebellion were emphasized.

Luthra (2017) states "These feminist appropriations connect with the wide sympathy for Sita's suffering, as well as the admiration for her fortitude and dignity. However, the feminist versions of Sita are generally more vocal and forthright in their protests, which incorporate contemporary understandings of patriarchy and its effects" (144). According to Beauvoir (1989), "Woman is objectified and pushed to the lower rung of the social ladder by superior male consciousness and man's dominant position in society by controlling the economic, political and religious fronts" (143). Many social and cultural factors influence femininity and masculinity in a particular society.

The new woman of Tripathi outshines her male counterpart by her personality and conviction. Mand, Anjali S Nair & Meera B (2019) argue that "Male characters often outshine female characters who are mostly calm and delicate. This creates an image of women as weak and diffident. From ancient times onwards in the Indian context, we find women subservient to men though they exhibit great emotional perseverance and natural adaptability to their circumstances" (157). The role of the protagonist in the retellings is given to women which highlights their ideology and dreams. In this context, Singh (2017) argues that "A feminist claim to the retelling of the epics is, therefore, extremely significant as they make women, with their gender and other marginalities, central to these stories as narrators or as lead characters" (385).

**The Shiva Trilogy**

The post-feminist perspective lent towards women characters of the prominent mythological Retellings such as Amish has given a new dimension to them. As such they emerge out more appropriate in their roles juxtaposed against their male counterparts. These women characters realise their potential as equally comparable to the male characters and thus, they refuse to be stereotyped. The post-feminist venture of the authors redefines the identity of the women characters in their mythical retellings. They stand out as articulate women who confront the realities of life. They claim the space deserved by them and assert their rights accordingly. The feeble voices of women which were not audible in literature in general and Indian mythology in particular are treated kindly by many authors, especially Amish Tripathi. He has empowered them in his works by lending them assertive roles. In this context, Sonthalia (2019) declares:

> Amish Tripathi took a rare initiative and broke the traditional stereotype presentation of gender roles in his Shiva Trilogy. These novels replicate the post-feminism waves of empowerment and independence and renovate the focus on the female. Female characters like Sati, Veerini Renuka, Ayurvati, Kanakhala, and Kali are the strong representatives of women. These women characters break the conservative image of traditional women and deny to confine themselves in family boundaries. They make an affirmative place as a role model for other women. These characters redefine the idea of self-assertion and struggle to get rid of social evils like discrimination based on caste, marginalization of people, honour killing, widow remarriage etc (96).

Sati is no less than Shiva in valour as her last fight with an Egyptian mercenary Swuth, forces her opponent to give her an honourable death. In the third book of the Shiva Trilogy, *The Oath of the Vayuputras* (2013) Amish writes: "Swuth went down on one knee. He had to give Sati an honourable death"…"Killing you shall be my life's honour" (478). The scene of her fight

with the lions to save villagers in *The Secret of the Nagas* (2011) is exemplary, "Sati swung as she neared a massive lioness, turning smoothly with the movement, slicing through the nose and eye of the beast. As the lioness retreated, howling, Sati turned in the same smooth motion to attack a lion in front of her" (235). Eventually, she sacrifices her life for Meluha when she dies fighting with the Egyptian mercenaries. Kali is assertive in challenging ancient rules which discriminated against and excluded Nagas from the mainstream. In *The Secret of the Nagas* (2011) she challenges Daksha, her treacherous father who abandoned her after her birth due to extra growth on her body, "Kali reached for her sword. 'I am in the mood to challenge you to an Agnipariksha right now, you repulsive goat!'" (326). Regarding the empowerment assigned by Tripathi to his women characters Pandey, S and Jodha (2023) argue "They not only address the expectations of the audience but also serve desirable social (towards gender equality) ends. Tripathi's bewitching depiction of feminine patterns bids goodbye to the stereotyped submissive image of women denying their patriarchal subjugation" (173). The power-packed roles of these women are unique for the readers as Meluhan society follows ancient rules without justifying their relevance. Lady Ayurvati is the chief of Medicine, Kankhala is the Prime Minister and Sati and Kali are proficient in war tactics. Veerini grieves for Daksha's wrong decisions and continuously warns her husband of the consequences. In this regard Sundari, (2020) claims that "In all the three novels of the Shiva Trilogy, women characters like Sati, Ayurvati, Kankhala and Kali showed their leadership quality by their knowledge, valour and administration" (3226). Tripathi's positive approach towards womanhood is laudable as not a single woman's character and action goes against righteousness. Instead of being miserable in the face of adversity they calmly accept their fate and fight for justice. Dharmadhikari (2018) states that "In his effort to portray Lord Shiva in Shiva Trilogy Amish Tripathi tried to subvert the meta-narratives of gender, caste, nationality, religion and a few more" (01). He further mentions that

> In the portrayal of Sati Amish achieved an epitome of womanhood. Even if Sati is a Vikarma woman Shiva gives her fair chance of Agnipariksha with Tarak, a great warrior who challenged the presence of Sati, a Vikarma woman, in the auspicious occasion of a Yagna, a fire sacrifice. Sati proves herself as a fierce warrior and defeats Tarak. The marginalisation on the basis of gender was wiped out when Sati triumphed the fire sacrifice by accepting and defeating Tarak in a dual. (03-04).

**Ram Chandra Series**

Amish Tripathi has broken the socio-economic and political stereotypes of female characters in his Ram Chandra Series as well by juxtaposing mythological women characters against the

modern version of women in contemporary society. These books are based on the all-time great epic Ramayana but the twist in the original story has made them a different narrative with characters having human qualities. The women characters in '*Ram-Scion of Ikshvaku'* (2015) are not portrayed as weak and intimated by men but as self-respecting, self-dependent, and courageous individuals. Ram, the protagonist himself praises Sita's intelligence and martial skills. She does not ask for political equality, economic rights, or social identity, instead fights alongside Ram with courage and conviction. In *Sita: Warrior of Mithila* (2017) her extraordinary virtues impress Guru Vishwamitra who confers on her the most revered title of the seventh 'Vishnu', which demands courage and responsibility. He allows her to study culture, geography, and many more subjects.

> Some of them were purely educational on science, astronomy, and medicine, others were subtle lessons designed to help her clearly define, question, confront or affirm her views on various topics like masculinity, femininity, equality, hierarchy, justice, and freedom. (164).

Her indifference towards her appearance with battle scars changes when she becomes conscious of them as Ram notices a prominent scar on her hand:

> Ram's eyes had glazed over once again. He was staring at Sita's hands in almost loving detail. Only the Almighty or Ram himself knew the thoughts that were running through his head. For probably the first time in her life, Sita felt self-conscious. She looked at her battle-scarred hands. The scar on her left hand was particularly prominent. Her hands weren't, in her own opinion, particularly pretty. (208).

King Janak takes pride in Sita's bravery and extraordinary achievements when he observes her character closely. She is a mentor to her younger sister Urmila when she tells her, "Life is not only about what we want but also what we must do. We don't have just rights, but we also have duties." (295).

Sita's mother Sunaina's wisdom gets reflected when she warns Sita: "For the sake of Dharma, you must aim for equality and balance in society…But don't fall into the trap of stereotypes. Don't assume that the powerful are always bad or that the powerless are always good. There is good and bad in everyone" (36).

Lavanya (2017) finds the novel completely unconventional in its portrayal of Lady Sita. (55). Unlike a traditional mythological story in which Manthara, Kaikeyi, and Surpankha are shown as villainous characters, Sita's pious character is juxtaposed against them. Tripathi's Sita, the protagonist efficiently performs the role of the Prime Minister of Mithila and proves her worth for the title of 'Vishnu'. Other women characters are also given high positions in society where

they play crucial roles in their chosen domain. Kaikeyi is shown as strong and courageous and saves King Dashratha in the battle of Karchapa which affects the status of the Sapt Sindhu empire positively. Manthara is portrayed as a very wealthy businesswoman of Sapt Sindhu who manipulates the Sapt Sindhu's commerce and state affairs. Nilanjana is a successful medical professional, adept in her specialisation. Other writers have also attempted to interpret the epic Ramayana from the point of view of Sita like Chitra Banerjee Divakaruni's *The Forest of Enchantments,* Arni Samhita's *Sita's Ramayana,* Sara Joseph's *The Vigil* and Volga's *Liberation of Sita*. Tripathi's fictionalized version of the *Ramayana* and the unconventional story of Sita is much appreciated by readers and critics. His post-feministic empowered women defy all odds to perform their duties and seek justice for the marginalised people.

## Conclusion

In conclusion, it can be said that the bold and empowered mythological characters of Tripathi are a reflection of his post-feminist perspective. Sati is adept in martial skills along with talents in dance, music and administration. Sita is the born 'Vishnu' for the chief of Malayputras who admire her leadership and dedication to her work. The masculinization of her character is juxtaposed against the conventional femininity of the patriarchal society where womanhood stands for docility and piety. Tripathi's other women also possess wisdom, courage, and individuality for their personal and professional duties. The study has explored the post-feministic concern of the writer in the *Shiva Trilogy* and the *Ram Chandra series* where women are already empowered by breaking stereotypical gender roles assigned to them since time immemorial.

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REVIEW PAPER

# Traffic Engineering and Quality of Service in Hybrid Software Defined Networks

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**Abstract:** For Future networks, many research projects have proposed different architectures around the globe; Software Defined Network (SDN) architectures, through separating Data and Control Layers, offer a crucial structure for it. With a worldwide view and centralized Control, the SDN network provides flexible and reliable network management that improves network throughput and increases link utilization. In addition, it supports an innovative flow scheduling system to help advance Traffic Engineering (TE). For Medium and large-scale networks migrating directly from a legacy network to an SDN Network seems more complicated & even impossible, as there are High potential challenges, including technical, financial, security, shortage of standards, and quality of service degradation challenges. These challenges cause the birth and pave the ground for Hybrid SDN networks, where SDN devices coexist with traditional network devices. This study explores a Hybrid SDN network's Traffic Engineering and Quality of Services Issues. Quality of service is described by network characteristics such as latency, jitter, loss, bandwidth, and network link utilization, using industry standards and mechanisms in a Hybrid SDN Network. We have organized the related studies in a way that the Quality of Service may gain the most benefit from the concept of Hybrid SDN networks using different algorithms and mechanisms: Deep Reinforcement Learning (DRL), Heuristic algorithm, K path partition algorithm, Genetic algorithm, SOTE algorithm, ROAR method, and Routing Optimization with different optimization mechanisms that help to ensure high-quality performance in a Hybrid SDN Network.

**Keywords:** DRL; hSDN; QoE; QoS; SDN; TE

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## I. INTRODUCTION

Professionals and industries are struggling to manage today's networks. To respond to these difficulties design of Software Defined Network started. The basic idea behind an SDN network is to separate the control and data planes. In recent years, SDN networks have been among the most excellently discussed topics in the telecommunications systems disciplines. It is a novel and critical network design idea that arises with the advancement of Virtualization, Mobility, the Internet of Things, and other technologies. SDN networks are designed to decouple the control and data planes [1]. SDN provides reliable and flexible network management. Due to its global perspective and centralized network control, it allows intelligent flow scheduling systems for improving network throughput and link utilization and supports Advanced Traffic Engineering(TD). SDN network is widely used in different scenarios, including the backbone of Google's Network [2], Microsoft's public cloud [3], NTT's edge gateway [4], and optical (IP/WDM) networks [5]. SDN networks are used in almost every field of network-


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ing, including cloud networks [6, 7], data centers [8–10], wide area networks [11–13], and wireless networks [14, 15]. As per the survey, the SDN market will grow significantly from 8.8 billion USD in 2018 to 28.9 billion USD by 2023 at a Compound Annual Growth Rate (CAGR) of 26% [16].

Deployment of Pure SDN has many limitations and challenges, as the OpenFlow protocol is not developed sufficiently [17], and Commercial controllers and Switches of SDN are not entirely reliable and stable [18]. One significant reason that prevents the adaptation of pure SDN is the necessity to implement most standardized network functions in SDN software to get the same functionality as a traditional network provides; this implementation significantly increases the cost of transition to a pure SDN network. For Medium and Large-Scale networks with many traditional devices, migrating directly from a pure conventional network to a Pure SDN network is complicated. There are some limitations and potential challenges, such as (financial challenges, technical difficulties for a seamless migration, lack of standards, security issues, downtime fears, and Quality of Services degradation). Many problems must be solved as a technological challenge, including how resilient, robust, and scalable the centralized Controller can become a single point of failure. As the Internet and networks expand, more than one SDN controller may be required. These issues hold down Full SDN adoption, driving the emergence of a hybrid SDN Network (hSDN) [19], in which SDN and traditional network devices coexist [20].

The literature provides a distinct definition of hybrid SDN networks. A hybrid SDN network is a logical step in migrating from a conventional network to an SDN network in which SDN and traditional devices coexist. It takes advantage of both conventional and SDN networks, the legacy network's robustness, and the SDN network's programmability and does not require upgrading all devices to the SDN networks. We can incrementally deploy SDN devices according to network requirements. In a hybrid SDN network, traditional network devices route traffic along the shortest path using distributed routing protocols such as OSPF and SDN devices supporting both OSPF and OpenFlow Protocol. By doing this, traditional network devices can exchange link information with SDN devices and treat each other as legacy devices. The SDN controller can also get information by supporting Link Layer Discovery Protocols(LLDP) and Broadcast Domain Discovery Protocols (BDDP) to get information on the network topology and link status.

When it comes to communication, it indicates how, when, and which devices will communicate with each other to ensure network functions work correctly [18]. Many integration levels are described in detail in the paper [21], including integration only at the data layer, integration at the control layer [22], and integration in both layers [23]. The Network's Controller instructs SDN devices to forward packets in hybrid SDN networks. Traditional network devices will continue to employ classic shortest-path routing protocols such as Equal Cost Multipath (ECMP) and OSPF. Once an SDN device introduces to a conventional network, it is necessary to develop an effective routing mechanism for the newly deployed network to increase network performance and link usage.

The fundamental shortcoming of today's network is the lack of Traffic Engineering and QoS guarantees. Software-defined networks introduced to solve this problem by separating the data and control layers. It provides the dynamicity and flexibility needed to define QoS policies that effectively push them to the data layer devices, to enhance network throughput and link utilization.

In this paper, we survey related research studies on Traffic Engineering and Quality of Services issues in Hybrid IP/SDN networks. We categorize relevant research in a way in which QoS can benefit the most from the Hybrid SDN concept; we studied different schemes, techniques, mechanisms, and algorithms: inter-domain routing mechanisms, Deep Reinforcement Learning (DRL), K path partition, Heuristic algorithm, genetic algorithm, SOTE Algorithm, RL algorithm, ROAR Method, Distributed Algorithm, Routing optimization, Quality of Service Routing, QoS aware Routing, and QoS policy management in a hybrid SDN network.

This work explains the relationships between Traffic Engineering, Quality of Services, and Hybrid Software Defined networks. This survey paper adds scientific value for a better understanding off TE and QoS through Hybrid SDN networks. It may benefit readers interested in studying Traffic Engineering and QoS in Hybrid SDN and SDN networks. Readers will be familiar with the following after reading this survey



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paper:

- SDN and Hybrid SDN Network architecture
- Review of Traffic Engineering (TE) in the Hybrid SDN network.
- Overview of Quality of Services (QoS) in the hybrid SDN networks
- Other critical and potential challenges for TE and QoS in Hybrid SDN networks

The rest of this article is structured in such a way that first, we review SDN Architectures. Followed by SDN benefits, SDN deployment challenges, Hybrid SDN definition, strategies, models, Traffic Engineering, Quality of Service, Routing optimization, and routing mechanism in a hybrid SDN network, we conclude the article with some closing remarks.

## II. SDN ARCHITECTURE

In recent years, Software Defined Networking has been one of the most researched concepts in the telecommunications areas [24]. SDN arose in reaction to improving virtualization, mobility, the Internet of Things, and many other technologies. It is a novel and innovative network design idea that separates control layers and data layers and passes network traffic based on commands of a control layer. The network architecture of SDN Networks is divided into two main parts: a logically centralized control layer and a programmable data layer. The split architecture's control layer contains most network control logic (defined by software programming), simplifying the data layer. As a result, the data layer is controlled exclusively by the installation forwarding decision of the control layer [25, 26] SDN simplifies network administration and delivers robust networking programmability. SDN meets and provides continuously changing demands of network end users for network resources, for instance, in cloud computing [27], the Internet of Things [28, 29], and NFV (network function virtualization) [30].

SDN network with OpenFlow protocols allows network operators to give flows at a finer granularity than a traditional network with controllers. In classic networks, packets or flows are shared based on a single or few attributes such as destination MAC address, IP prefixes with the most extended destination, or combination of IP address and TCP or UDP port numbers and so on; SDN enables us to treat and manage flows base on more packet header attributes such as OpenFlow Protocol via CDPI (Controller Data Plane interface).

The OpenFlow protocol connects OpenFlow controllers and forwarding planes through communication. It is the first standard communication protocol for SDN that packets traverse over programmable networks, OpenFlow Protocol provides a flow route way, and many versions of OpenFlows are available. The fundamental advantage of the OpenFlow protocol is that it allows multiple manufacturer switches to be set with controllers in the SDN environments. The Controller manages the OpenFlow protocol and instructs switches on managing data packets that arrive. The OpenFlow protocols keep two switch elements: The Flow table and the Secure communication channel, which are both maintained by the protocol and encompass numerous features such as encrypted channels, traffic monitoring, and processing of inbound packets produced by various controllers, among others.

Figure 1 shows the SDN essential Architecture consisting of three different layers. The data or infrastructure layer contains Data forwarding network elements; the Control Layer contains the Controller for controlling the network; and the Application layer, where the applications are situated.

### 2.1 Data Layer

In an SDN network design, the data layer, or the infrastructure layer, is the initial or bottom layer and comprises network components such as access points, routers, virtual switches, physical switches, and so on. A data layer controls data transmission, flow statistics collection, and network monitoring. The Open Flow protocol is the most extensively used CDPI standard for interfacing between control and data layers' devices [31]. A secure channel is an interface that connects remote controllers to the data layer devices, allowing a controller to install and manage devices and switches safely.

### 2.2 Control Layer

The second layer of the SDN network is the Control layer or Core layer; we can call it the network brain. This layer consists of one or more centralized software-based controllers that set up and administer



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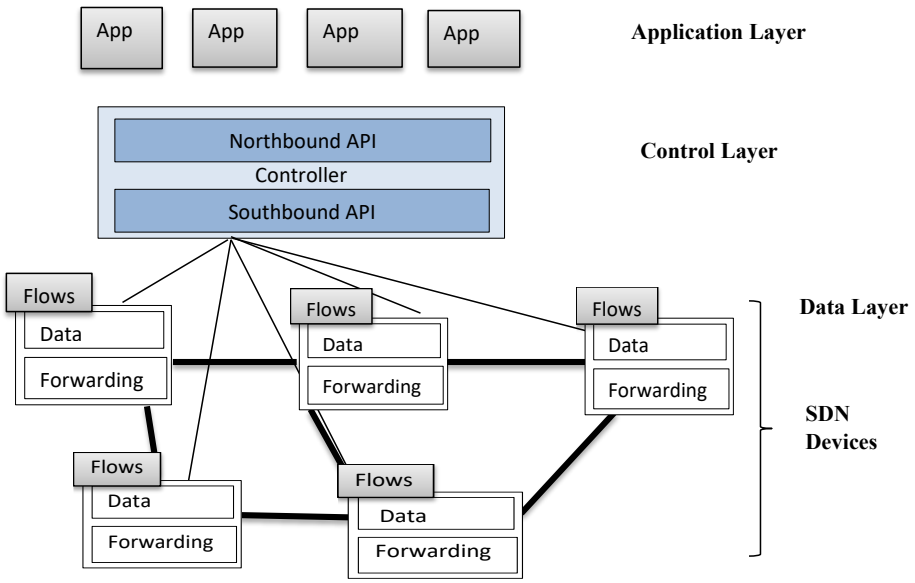


**Figure 1.** *Software-defined network architecture.*

the data plane and carry network management capabilities. It controls the flow tables and passes the logic table to the data layer. A southbound interface connects the control and data layers [1]. Controllers have two major parts: Control logic and functional components. Controllers can run multiple function mechanisms, such as a coordinator, visualizer, etc.

## 2.3 Application Layer

The last layer of the SDN network is the Application layer, which assists the control layer in configuring and managing networks following the application's needs. This layer contains one or more network applications according to our network needs for adding new network functionalities, such as Security applications, Routing Protocols, Visualization, Traffic Engineering, etc. The northbound interface connects the application and control layers [32].

## 2.4 SDN Benefits

The advantages of SDN are apparent: (1) network programmability, which promotes network automation; (2) network administration, which reduces operating costs; and (3) network virtualization. These advantages motivate organizations and network operators to upgrade their conventional networks with SDN-enabled devices and servers. SDN benefits are simply the capacity to regulate flows flexibly and dynamically; once flows pass through an SDN device, the forwarding path might flexibly have controlled; such traffics are referred to as programmable traffic. SDN is utilized for multiple purposes, including traffic engineering [33], flexible routing [34], link failure recovery [35], power savings [36], and safe updates [37]. SDN has been extensively researched and used for campus networks [17], data center networks [38], wide area networks [2], and internet exchange points [39]. To avoid single-point-of-failure problems, backup controllers can be used [40, 41]. Popular SDN controllers (ONOS and Open Day Light) often employ three different controllers to offer full service at a single location, and all the controllers interact with each other (through Raft [42]) to ensure network state consistency [43, 44].

## 2.5 SDN Deployment Challenges

The deployment of Pure SDN has many limitations and challenges. One significant reason that prevents the adaptation of pure SDN is the necessity to implement most standardized network functions in SDN software to get the same functionality as a traditional network provides; this implementation significantly increases the cost of transition to a pure SDN network. For Medium and Large-Scale networks with many standard devices, migrating directly from a pure conventional network to a Pure SDN network is compli-



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cated. There are some limitations and potential challenges, such as (financial challenges, technical difficulties for a seamless migration, lack of standards, security issues, downtime fears, and Quality of Services degradation). These issues stall the implementation of pure Software Defined Networks and give rise to the birth of Hybrid Software Defined Networks (hSDN), in which SDN and conventional devices coexist [20].

Many problems need to be solved as technical challenges, including how resilient, robust, and scalable the centralized Controller may be without being the only source of failure. As the Internet and networks expand, more than one SDN controller may be required. A controller in the SDN network is an attractive proposition for an attack in terms of security [45]. In the lack of a secure and robust controller, there are possibilities and opportunities for attackers to edit the controller code and modify the underlying network's behavior. As a result, a strong emphasis on SDN Security is essential to make SDN powerful and more beneficial. Until now, potential vulnerabilities exist across SDN platforms, and there are limited discussions on SDN security in the industry and research community. For instance, the systems for authentication and authorization that allow different companies to use network resources without ensuring proper resource protection have been called into doubt [46]. In terms of financial challenges, full deployment of the SDN network requires a significant budget expenditure that most enterprises cannot pay all at once. The new module requires the network administrator to develop, apply regulations, and implement modules in new hardware devices. No well-tested, production-grade techniques are available for medium/large-scale network deployment.

Regarding business challenges, migrating to Full SDN may create service downtime for end customers. As a result, network operators must build trust in implementing a new module over the well-established, time-tested old module. Purchasing and installing SDN devices to replace the traditional network infrastructure would require a significant capital investment and an increased operational load for the internet service provider. ISPs may hesitate to perform a one-step migration from conventional networks to SDN networks.

Traditional Network avoids the above-mentioned implementation costs, stability, and security difficulties. We need to concentrate on building such an efficient and flexible network module that combines both traditional and SDN devices to effectively take advantage and benefit from both and fulfill the limitations and challenges mentioned above.

## III. HYBRID SDN NETWORK

A hybrid Software-defined Network is a networking system that combines conventional and SDN network equipment. It interacts to variable degrees to control, alter, configure, and manage network behaviors and optimize the user experience and performance. There is no need to upgrade all conventional network devices to Software Define Networks because both SDN and conventional devices work together in Hybrid SDN Networks to take benefit of both; the programmability of SDN networks and the Robustness of traditional networks. Conventional network devices provide reliable routing, whereas Software Defined Network devices focus on network optimization. In contrast, controllers in Software Defined Network route network traffic from a worldwide perspective. Legacy switches in conventional networks employ distribution algorithms such as IGP to govern traffic routing. However, in the case of a Hybrid Software Define Network design, legacy devices will manage some traffic while Software Define Network controllers will handle the rest.

In hSDN, Network traffic is routed according to the decisions of distributed routing and switching technologies. Traffic Control in Hybrid Software defines networks depending on deployment strategies (service-based, class-base, Island-base, controller-base, Agent-base, Hal-base, and overlay base). SDN Network will control and transfer some traffic, while others will be maintained with traditional mechanisms. A logically centralized controller judges how to process and forward network traffic. Conventional network devices employ standard protocols such as ECMP (Equal Cost Multipath) and OSPF to forward packets in a Hybrid Software Defined Network. A centralized controller will control the only Software Defined Network device. These advantages make a Hybrid Software Define Network much more attractive and exciting for the networks.

Traditional routers can only support the OSPF protocol. The SDN devices work in a hybrid mode, keep-



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ing the SDN protocol (OpenFlow) for communication with the SDN controller and the OSPF protocol for communication with classic or traditional network devices. Traditional routers can only forward traffic via the shortest paths provided in routing tables; therefore, even though flows in SDN devices can dynamically divide for multipath forwarding stated by SDN controller flow entries. As a result, the hybrid SDN architecture combines a centralized network's flexibility with a traditional network's Robustness.

When users want to implement a hybrid SDN network, they must keep some considerations and limits in mind. The current legacy network can provide multiple services, and many users may want to keep all these traditional systems; otherwise, giving up these legacy devices would be wasteful. Because SDN is a new technology, the associated Software and hardware may not have been thoroughly tested and thus may be unreliable. Many users with less or limited budget may request a small number of OpenFlow hybrid Switches deployed into the traditional network. Two hybrid deployments methods are there, incremental deployment and replaced deployment for hybrid networks.

While implementing hybrid SDN networks, many issues are considered, including performance, load balancing, speedy failure recovery, and network traffic. One recommended technique is to deploy SDN controllers incrementally with conventional networking to get the benefits of both concepts simultaneously while keeping network performance and reducing the interruptions to networking services from a Traffic Engineering point of view.

### 3.1 Hybrid SDN Models

An appropriate model of a hybrid SDN network is needed to deploy a hybrid SDN network effectively, correctly, and efficiently. It is required to answer two critical problems: first, how to unite SDN and legacy devices in the presence of a controller, and second, how to get corrected network status so that the Controller of the Network makes forwarding decisions. There are different classifications and approaches for the deployment of hybrid SDN networks. Categories are based on components and architectures on coexistence in the control layer, coexistence in the data layer only, or coexistence in both layers. It depends on the network administrator and network requirement to define a Hybrid SDN deployment technique suited to the network situation to allow the smooth coexistence of SDN and legacy devices.

Figure 2 shows different categories of the Hybrid SDN network based on the coexistence on the control plane only or coexistence in both planes.

There are different strategies for deploying a Hybrid SDN network. The decision on which approach to deploy relies on many aspects, including network type, network services, capital budgets, operational budgets, and performance requirements.

- Agent Base
- Service Base
- Hal Base
- Class Base
- Island Base
- Controller Base
- Overlay Base

These are deployment strategies for Hybrid SDN networks which in Previous surveys [47, 21, 48] have thoroughly explored and documented all of the deployment above techniques, benefits, limitations, and so on. Readers can read these survey studies for further information on the challenges and benefits of various deployment strategies.

## IV. TRAFFIC ENGINEERING IN HYBRID SDN

Traffic volume has grown dramatically during the last few decades, much like the Internet's fast expansion. Traffic Engineering (TE) has received a lot of interest in both business and academics as it is an effective method to minimize network congestion and increase network performance.Traffic engineering is a powerful technique that aims to measure and analyze Real-time network traffic and design routing mechanism for improving traffic routing and balancing network flows. Traffic Engineering is a method that enhances network performance by studying data transmission behavior over communication networks.

The primary purpose of Traffic Engineering (TE) is to optimize network performance to enhance network reliability [49]. It may accomplish by making the network fault-resilient, eliminating network congestion



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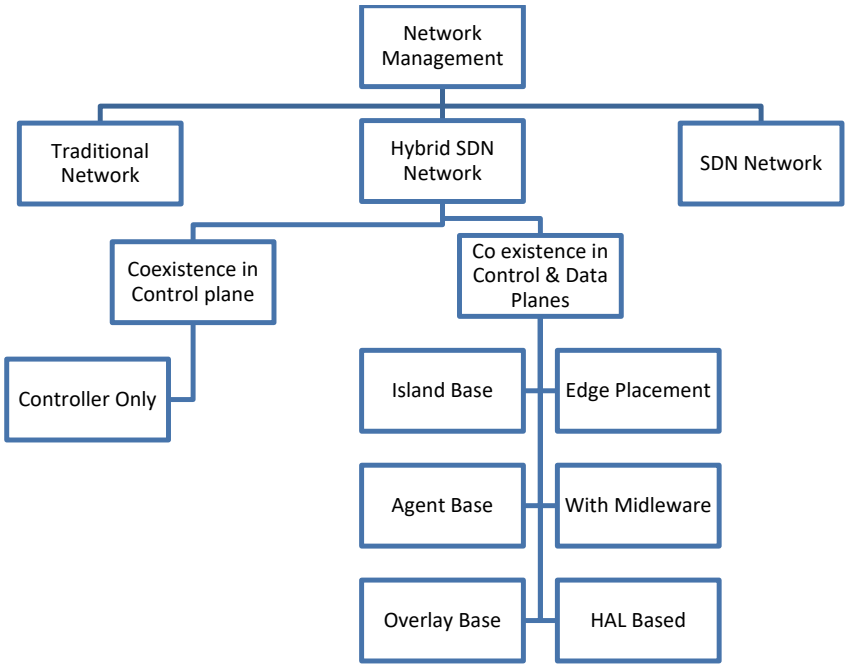


**Figure 2.** *Hybrid SDN network models.*

by balancing the links' load, and so on. Offering TE in hybrid SDN is challenging because traditional devices are not controlled fully through an SDN controller. The restrictions enforced by the SDN controller to enable TE are only applicable to SDN devices, generally leaving legacy device behavior unchanged. The most prevalent traffic engineering strategies in classical networks are MPLS [50] which employs labels, and GMPLS [51], which expands MPLS to manage new switching technologies and interfaces. However, in an SDN network centrally controlled Controller communicates with forwarding components to maintain the worldwide view, traffic demand, network topology, and link state information. Direct routing paths make the SDN network unique, and a leading candidate for many Traffic Engineering solutions; different methods for SDN networks have been proposed [52–54].

With the evolution of SDN and the division of control and data layers, logical centralization of the control layer, SDN has a practical and flexible way of optimizing routing. As the Controller Has Control of flow routing in the control plane, traffic may be dynamically separated and sent to multiple pathways using SDN switches. Compared to the ECMP used in the standard OSPF protocol, this traffic routing gives a more flexible approach to optimizing routing.

In a pure SDN network, programmability and global centralized network activity control are efficient aspects. Because the flow splitting ratio on SDN switches is variable, using specific complete TE methods in a hybrid SDN network is feasible. To improve the profitability of centralized control, researchers must select a suitable migration sequence, which includes numerous optimization strategies. These approaches may be applied not just to hybrid network deployment but also to other network optimization techniques. For example, migration solutions may expand to include: (1)- identifying a suitable placement for the middlebox in the legacy network to get perfect all-right network control [55], (2)- for energy requirements, wireless networks must address the issue of AP location. [56]. (3)- Enhance data center utilization by resolving the VM replacement problem [57].

This part will review the Traffic Engineering technique suggested for the Hybrid SDN network. Load balancing is a Traffic Engineering strategy that aims to optimize the allocation of traffic loads across different resources based on a given performance requirement. In the hybrid SDN network, the TE goal of maximizing link utilization may be met by traffic flow load balance to make network congestion accessible since load balancing seeks to determine the average link rate usage for all the network links.



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In traditional networks, the OSPF protocol is one of the most used IGP protocols; each link is given a cost or weight and uses the Shortest path with minimum cost forwarding. Traffic is routed between the source and destination address and distributed equally when multiple shortest paths are encountered using Equal Cost Multipath forwarding. Because all nodes in a hybrid SDN network do not support OpenFlow, flow abstraction, complete packet matching, or packet filtering techniques, TE applies a variety of optimization tactics to get the optimum network performance characteristics, etc. In the hybrid SDN network, it is feasible to use particular extensive Traffic Engineering methods because the flow splitting ratio on the SDN device is arbitrary. To optimize the profitability of centralized control, researchers must select an appropriate migration sequence comprising numerous optimization strategies. Traffic Engineering is more challenging in a Hybrid SDN network; solutions based on static routes or ACLS (access control list) provide restricted functionality [58].

Traffic measurement entails gathering, measuring, and monitoring network status data. Traffic measurement is difficult in the hybrid SDN network because only a small percentage of devices are SDN enabled. Traffic management is the study of controlling and arranging network traffic based on network status data provided by traffic measurement.

In Hybrid SDN networks, measuring all flows is unnecessary and too costly. Cheng et al. [59] proposed a method for collecting the load of certain specified connections and estimating the remainder with a 5% margin of error. polverini et al. [60] define and evaluate a valuable criterion for identifying the flows to be monitored that minimize the estimated error dependent on the flow spread parameter. The suggested approach may also assign measurement tasks equitably between network devices while taking forwarding table space into account.

Cheng et al. [59] present a complete traffic monitoring approach that collects real-time load data for all the links in the network. In this strategy, the controller only has to gather the load of a small selection of relevant links before estimating the load of the other links. The suggested method reacts better adapted to dynamic traffic changes than existing methods and can minimize MLU by up to 40%.

To alleviate the effect of network disruption, one intriguing Traffic Engineering approach is to use ECMP to route the majority of traffic flows and SDN to selectively divert a few flows to balance the MLU of the network. However, critical flow rerouting is difficult due to the ample solution space for essential flow selection. Furthermore, building a heuristic solution for this situation is impossible because rule-based heuristics cannot adjust to changes in the traffic matrix and network dynamics.

Zhang et al.[61] explored Hybrid routing to achieve load balancing with supporting several traffic classes. They suggested a hybrid routing system that combines explicit routing with destination-driven routing to provide load balancing with decreased complexity and high scalability improvements.

Guo et al. [62] suggested an RL (Reinforcement Learning)-based strategy for learning traffic-splitting agents to manage constantly changing traffic to achieve and balance links load in a Hybrid SDN network. They provided an acceptable simulation environment to be built when traffic splitting policies are used to eliminate routing loops. They assess their proposed work on real traffic with different topologies, demonstrating that this strategy provides equivalent network performance and quickly creates good routing strategies.

Wang et al. [63] investigate the efficiency of Traffic Engineering in Hybrid SDN networks depending on traffic distribution and forwarding graphs structure. They defined a coherent forwarding graph and built forwarding graphs with high throughput potential while preserving consistency. Their finding reveals that their forwarding graph creation method outperforms other graph development methods regarding throughput and load balancing.

Yash Sinha et al. [64] created a hybrid SDN network paradigm that used SDN and MPLS-based capabilities and was empirically tested using a prototype implementation. Deployment of this Hybrid network model provides proof of the coexistence of SDN and MPLS-based network devices in the network. This architecture provides a better alternative for a more seamless transition from conventional to SDN networks.

Figure 3 depicts the tunnel splicing method with penultimate Hop Popping. The link translator configures forwarding rules for each router along the way from the penultimate router n1 to router 1. The tunnel splicing procedure entails either issuing a label and



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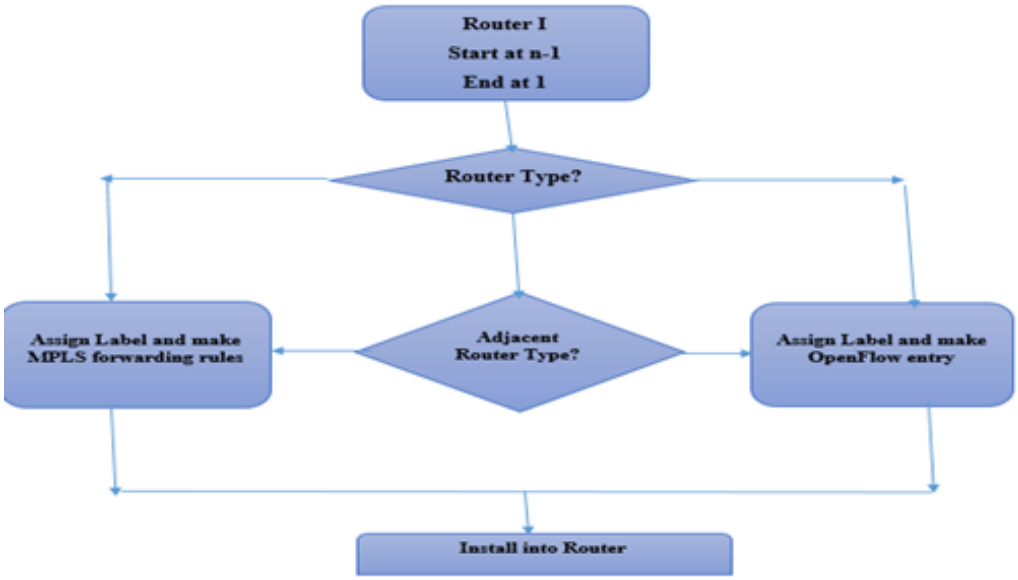


**Figure 3.** *Process of tunnel establishment.*

implementing MPLS forwarding rules or installing OpenFlow entries, depending on the routers involved.

Tu et al. [65] present a tunnel splicing technique for MPLS and OpenFlow router-based heterogeneous networks. The suggested paradigm was created on a Linux system and tested on test networks. The result of emulation is also deployed in several applications and demonstrates its practicality and efficiency.

Nakahado et al. [66] proposed a Hybrid SDN approach, where only edge devices can be updated by SDN devices, while all other devices use classic OSPF routing. The OSPF network's incoming traffic is distributed vie edge nodes; this method can decrease the congestion ratio in a network. Sharma et al. [67] suggest that conventional network management approaches and controller-based mechanisms in future networks should coexist and operate together to enable progress in deploying SDN devices in traditional networks.

Figure 4 shows a Hybrid SDN network, combining SDN and MPLS-based networks. A mesh of conventional MPLS switches at the network core and SDN devices at the network edges comprise the network topology. The network controller injects rules into the MPLS switch pathways to push and pop the required labels.

We describe relevant Traffic Engineering (TE) work in three areas: IP Traffic Engineering, MPLS Traffic Engineering, and SDN Traffic Engineering.

### 4.1 IP Traffic Engineering

In paper no [68], Fortz et al. present IP based intra-domain Traffic Engineering method to achieve load balance using Equal Cost Multipath; they optimized the weight of OSPF links. They demonstrate that the OSPF weight setting is an N-P complex problem, suggesting a tabu search heuristic algorithm to find the best OSPF weight setting. Their studies show that this heuristic algorithm can discover the best OSPF weight setting.

Experimental results show that this approach outperforms previous technique and algorithms, as traffics is routed based on the shortest path; this is a restriction of route optimization in an IP network.

Sridharan et al. [69] overcome the limitation of equally dividing Traffic over ECMP. For each routing address, a subset of the following hops Multi paths is chosen for this strategy to transfer traffic more efficiently, simulating unequal traffic splitting to get a near-optimum solution. However, this technique necessitates complicated configuration for each route prefix. Xu et al. proposed DEFT [70] and PEFT [71] to obtain optimum Traffic Engineering and proposed a novel link-state routing protocol. As they provide ideal performance in their strategy, traffic is not restricted to the shortest path but may route to the longest path with an increase in the penalty; the limitation of this strategy is that multiple commodity devices



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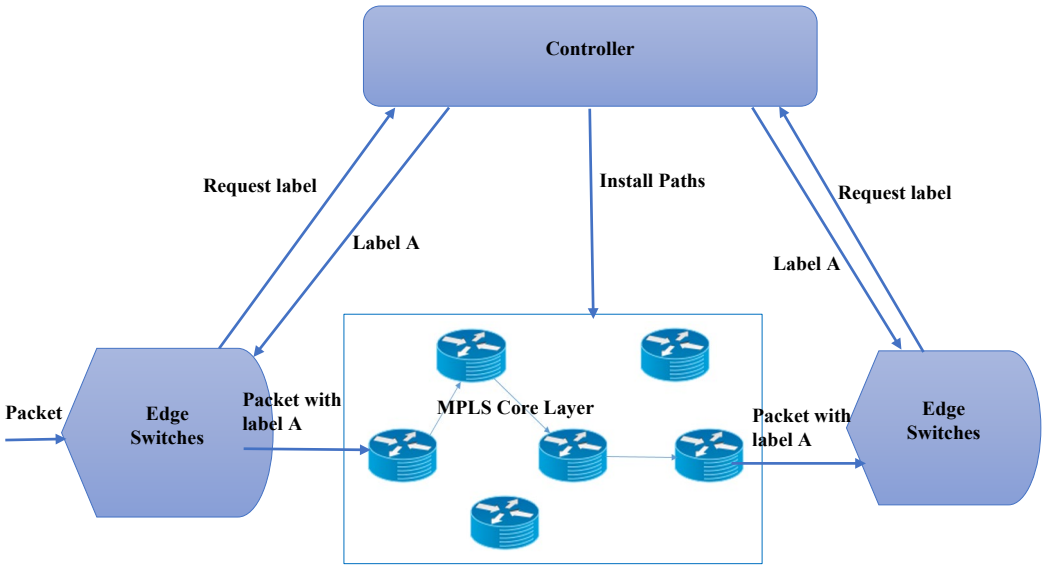


**Figure 4.** *Flow rules installation.*

do not support it.

Using objective genetic functions, Xu et al. [72] present optimum intra-domain traffic engineering as a multi-commodity flow maximization issue. Adding a second weight to each link expands the OSPF routing system, allowing for flexible Traffic splitting among all shortest paths. In general, to attain optimal routing performance in most existing IP base intradomain TE solutions removing constraints for shortest path routing requires setup or update on present Link state routing protocols, which are sophisticated and error-prone. Conventional switches cannot yet implement these new routing protocols on an extensive scale network.

## 4.2 MPLS Traffic Engineering

MPLS tunnels are built between source and destination nodes in a Multi-Protocol Label Switching (MPLS) network. Labels added in packet headers allow flows to be transmitted freely among these established tunnels. Elwalid et al. [73] and Kandula et al. [74], for achieving link load optimum routing proposed two online routing protocols for Traffic Engineering (TE) in MPLS networks that divide flows between pre-established label switching paths (LSP). Zhang et al. [75] propose a hybrid MPLS/OSPF network. The Traffic Engineering problem is formulated as a multi-commodities flow problem using linear programming that overcomes the disadvantages of tunnel construction in MPLS Traffic Engineering and limits of shortest route routing in IP networks to enable a suitable Traffic Engineering solution. MPLS Traffic Engineering can dynamically distribute traffic over many tunnels but lacks a global perspective. Furthermore, to forward packets, MPLS TE systems need the formation of MPLS tunnels, in other words, LSPs, which enhance TE complexity and limit scalability.

## 4.3 SDN Traffic Engineering

Recently in the SDN networks, Traffic Engineering has become a prominent issue. With SDN network development, we can now manage Network flows flexibly and modify their routing in a real-time network. Google [2] and Microsoft [3] have previously built their small-scale SDN enable Inter Data Centers network and are capable of nearly 100% network utilization. Quan et al. discuss a novel SINET-based future internet infrastructure and suggest a SINET-specific solution for crowd cooperation in Software define vehicle networks [76]. In [77], Quan et al. describe Software defining adaptive Transmission control systems for choosing different transmission control techniques in a time-varying vehicular environment. In [78], Agarwal et al. control co-flows by suggesting an architecture with near-optimal performance achievement.

Tajiki et al. [79] describe an effective resource reallocation method for Software-defined Data Centers.



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**Table 1.** *IP Traffic Engineering.*

| Paper | Aspects | Objective | Limitation |
|---|---|---|---|
| 60 | IP/TE | Optimize the weight of OSPF links to achieve load balancing. | As traffics are routed based on the shortest path, it is a limitation of IP network routing optimization |
| 61 | IP/TE | To create a near-optimum solution, they address the limitation of equally splitting Traffic on Equal Cost Multipath | For each route Prefix, it requires a complicated configuration |
| 62-63 | IP/TE | To achieve optimum traffic engineering, present DEFT and PEFT as a novel link-state routing protocol | It can reach ideal performance; however, most commodity devices do not support it. |
| 64 | IP-TE | Model optimal intradomain TE as a multi-commodity flow maximization problem. | To provide flexible traffic splitting over the shortest path, they extend OSPF routing by assigning a second weight to each link that is error-prone and complicated |

These efforts are entirely researched based on a pure SDN situation incompatible with Hybrid SDN.

[33] This paper is the first research paper to discuss and explain Traffic Engineering issues in hybrid SDN networks. In this paper, Agarwal et al. define TE as linear programming issues. To improve routing and flow balancing in a Hybrid SDN network, they proposed FPTAS (Fully Polynomial Time Approximation System). Likewise, to paper no [33], Hu et al. [80] and Wang et al. [81] proposed a solution for a Hybrid SDN network to maximize Traffic Flows. Hong et al. [82] present a module for the gradual deployment of hybrid SDN networks and suggest numerous heuristic strategies to reduce Maximum Link Utilization from a Traffic Engineering perspective. In paper number [83], Caria et al. deployed SDN at the border routers and divided the OSPF domain into subdomains to provide fine-grained traffic management among subdomains. He et al. [58] investigate TE in two hybrid network modes: hybrid mode and barrier mode. They present a Polynomial Time approximation approach for Traffic Engineering issues with an approximation of $(1 + w)$ in the two-hybrid method.

Xu et al. investigate a comprehensive SDN network in which traditional switching combines all devices with SDN switching [84]. Chue et al. [35] describe a method for quickly responding to single links breakdown scenarios while avoiding congestion in Hybrid Networks. Vassicchio et al. [85] offer Fibbing, which introduces false nodes to provide more flexible routing by centrally controlling the link state routing protocols. Huin et al. [86] focus on the Traffic Engineering problem to provide a smooth energy-conscious routing system to minimize energy usage. Tajiki et al. present a unique Traffic Engineering concept for an SDN/MPLS Network in a Hybrid SDN network [87]. Guo et al. propose SOTE in [88] to improve the SDN node splitting ratio concurrently with the OSPF weight setting in a Hybrid SDN network; in their situation, they jointly optimized the SDN nodes traffic splitting ratio and OSPF weight setting. They optimize traffic splitting for SDN devices to increase flexibility and improve OSPF weight setting to guarantee network primary routing optimization efficiency.

## V. QUALITY OF SERVICES IN HYBRID SDN

Suppose we define Quality of service for a network; it is user satisfaction with certain services. It is a composite indicator that assesses user satisfaction Quality of Service (QoS) pertains to any technology that controls data traffic within a network to minimize packet loss, latency, and jitter.We can say that Quality of service means providing specified data transmission in a particular aspect provided by the network. Quality of Service considers bandwidth, packet loss, service level, data correctness, and other factors. For example, QoS guarantees bandwidth if the network offers excellent bandwidth for bandwidth-sensitive data delivery; we do not need QoS if we have a perfect link. QoS indicates low delay if the network delivers low latency transmission service for time-sensitive data delivery. Differentiating application flows is required to achieve QoS since they compete for available network resources. Network resources should be allocated to make the right decision concerning packet forwarding; sometimes, this procedure requires knowledge of cur-



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**Table 2.** *MPLS TE and SDN TE.*

| Paper | Aspect | Proposed Work |
|---|---|---|
| 65-66 | MPLS-TE | For MPLS network Traffic Engineering they proposed two online Routing Protocols. |
| 67 | MPLS-TE | Using a linear programming module, they create a Hybrid with MPLS/OSPF network and formulate As a multi-commodity flow problem, the traffic engineering problem. |
| 68 | SDN TE | present a SINET-tailored solution for crowd cooperation in SDN vehicular networks. |
| 69 | SDN TE | To deal with changing vehicular environments and selecting multiple transmission approaches, they present software-defined adaptive transmission control protocols |
| 70 | SDN TE | manage co-flows by providing a network architecture with near-optimal performance |
| 71 | SDN TE | develop a resource reallocating mechanism that is efficient for software-defined data centers |
| 40 | hSDN TE | They present FPTAS and describe the TE Issues as a linear programming problem to balance Flows and improve routing in a Hybrid SDN network. |
| 72-73 | hSDN TE | create a hybrid SDN system to maximize traffic flows |
| 74 | hSDN TE | develop a framework for incremental hybrid network deployment and suggest numerous heuristic techniques for minimizing maximum link utilization in TE |
| 75 | hSDN TE | They deployed SDN at the border routers and divided OSPF into different subdomains to provide fine-grained traffic management among subdomains. |
| 56 | hSDN TE | present polynomial time approximation techniques for TE issues with an approximation of $(1 + w)$ |
| 76 | hSDN TE | investigate comprehensive SDN network in which legacy switching combines all devices with SDN switching. |
| 42 | hSDN TE | present a strategy for swiftly responding to a single link loss situation and reducing congestion in a hybrid SDN network |
| 77 | hSDN TE | Present Fibbing is a strategy for centrally controlling routing protocol link state by generating false nodes to provide more efficient routing. |
| 78 | hSDN TE | suggest a heuristic approach for improving routing in a hybrid SDN network using variable traffic. |
| 79 | hSDN TE | To decrease energy consumption, present a smooth energy-conscious routing method. |
| 80 | SDN/MPLS | They suggest a unique TE design for SDN/MPLS hybrid networks focusing on an SDN/OSPF hybrid network situation. |
| 81 | hSDN TE | SOTE Proposed to jointly improve the splitting ratio of SDN devices and OSPF weight settings. |

rent network states.

The Quality of service provisioning is mainly determined by SLAs (Service Level Agreements) between service providers and end customers. This method does not give finer granular traffic management, yet it performs excellently for best-effort service. However, different application types, such as video conferencing, online gaming, VoIP, and many more, have Flows sensitive to latency, bandwidth, and jitter, necessitating particular handling techniques. There is no established method for imposing constraints on the depth of traffic distinction and setting high-level traffic management strategies. SDN networks divide the network's data layer and control layer. This division increases network controller control over networks. Controllers can receive a worldwide view of network status. Network applications under the SDN concept are supplied and provide a conceptual network perspective by the network controller, and they are not required to deal with the low-level setup of data plane devices.

Quality of service in a network refers to enough bandwidth, minimum latency, a minimum rate of packet loss, and balancing network link loads. As we know, balancing the link load of the network can cause increasing bandwidth utilization and a decrease in network latency. as a result, balancing the link load requirement of QoS can cover the QoS requirement of latency and bandwidth.

Quality of Service is applied in hard and Soft QoS [89]. An accurate and efficient classification method is required to efficiently categorize data flows and meet QoS criteria in SDN and Hybrid SDN networks.

## 5.1 Internet QoS Models Background

Two primary QoS models exist on the internet: The IntServ (Integrated Service) model (Barden et al., 1994) and DiffServ (differentiated services) model



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(Blake et al., 1998). We will look at the architecture and key components of both models.

## 5.2 IntServ Model

To facilitate end-to-end Quality of Service (QoS) for multimedia applications, the IETF suggested the Integrated Services (IntServ) paradigm. Telecommunications and broadband integrated service digital networks (B-ISDN) inspired this concept. It entails using the Resource Reservation Protocol (RSVP) to create a virtual circuit between the source and the destination (Braden et al., 1997).

The RSVP procedure is as follows: the data source assesses its QoS criteria, such as latency, and transmits them to the intended destination via a route message. This information is recorded and forwarded to the receiver by each router along the path from the source to the destination. The destination then sends a RESV PATH message, which travels along the PATH message's chosen path to conserve resources. Reservations are made in reverse order for each node. Based on its available resources, a node can approve or deny a RESV request. When the reservation process is finished, the source can begin transmitting data.

## 5.3 The DiffServ Model

The DiffServ or Differentiated services framework was created as an alternative or a supplement to the IntServ framework (Sivavakeesar, 2005). This framework achieves scalability in two ways.

- Per-aggregate flow services have replaced per-flow services
- shifting complexity away from the network core and toward the network edge.

Furthermore, DiffServ lacks an end-to-end signaling mechanism, making it more appealing for scalability than IntServ.DiffServ defines a set of per-hop packet forwarding techniques that make use of the Type of Service (TOS) field in the IPv4 header. Packets are divided into distinct service classes based on their demands at the edge router. As a result, rather than the flow-by-flow technique used by IntServ, core routers differentiate between packets on a class-by-classbasis.

## 5.4 QoS Specifications

Generally, Quality of service parameters is classified into two categories, as shown in Figure 5, Metrics and policies. Then Metrics are divided into three categories, Performance, Security, and relative importance. Performance metrics are divided into four groups Timeliness, precision, Accuracy, and Combination. Policies are categorized into two groups, Management and Level of services.

Quality of Service Metrics includes Security, performance, reliability, and cost, which are used to define QoS characteristics. Latency, loss, and data rates are primary performance metrics.

There are rare circumstances when the network load needs to be balanced as traffic grows. However, it is challenging to control network loads. QoS policies are critical in offering management tools for managing network bandwidths. The benefits of QoS policies include security, flexibility, manageability, and performance.

In many network operations, the SDN network concept advantages might boost the Quality of service. As SDN gives a worldwide view of the network, keeping relevant states for the entire path of flows is feasible. Monitoring network statistics at other levels, such as port, per device, per flow, and so on, is also possible. Furthermore, SDN may assist network operators in developing an automated, user-friendly, and robust QoS management framework for their networks through packet scheduling, resource reservation, and queue management. Because network resources are dynamic, Control techniques for QoS provisioning in network applications must be well-defined.

## 5.5 QoS Monitoring

SDN switches partition the hybrid network into domains, and SDN switches connect each domain to others. To allow QoS-aware forwarding in a hybrid network, various QoS measurements, such as packet loss rate, traffic load, throughput, latency, and so on, must first be collected. These parameters are then combined to provide an accurate representation of network performance.

**Traffic Load Monitoring**: The OpenFlow protocol may be used to gather load information from the connections connected to SDN devices. For a directed link, we must compute the number of data flows pass-



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**Table 3.** *Comparison of IntServ and DiffServ models.*

| QoS level | Hard QoS | Soft QoS |
|---|---|---|
| Provisioning | Per-flow | Per class |
| Scalability | Not scalable | Scalable |
| Service Scope | End to End | Domain |
| Complexity | Per-flow setup | Long Term setup |
| QoS Guarantees | Per data stream | aggregated |
| Network management | Similar to the circuit-switch network | Similar to packet-switch network |
| Signaling | Explicit (end-to-end) | Implicit (per hop) |
| Main advantage | Provides hard QoS guarantees | Scalability |
| Main drawback | No scalability | Cannot provide hard QoS |

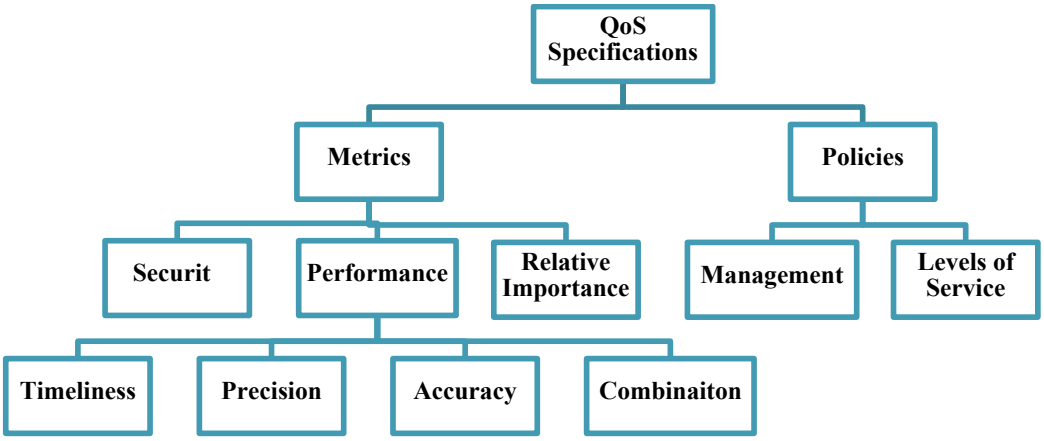


**Figure 5.** *Quality of services specifications.*

ing through the switch at a given time interval. Then we may compute the number of data flows per unit of time, which shows the link's traffic load. The flow table on an SDN switch maintains information about flow statistics. Each matching field of a flow entry that corresponds to a defined routing path contains matching information for that path, such as the source/destination IP address, output port, input port, and so on.

Figure 6 shows the load monitoring module; the controller of the network sends a Flow State Request message to switch S4 over the OpenFlow control channel at each time interval t and calculates the number of data flows that reach port 2 of S4 and matches with the necessary flow entries e11, e12, . . . , e2n by the received feedback message.

We may acquire traffic load information through the LSA massage on a link not connected to SDN switches. When an SDN device broadcasts LSA messages, an OSPF router receives the message and forwards it to the SDN switches, along with its status. The SDN switch then forwards the received LSA to the controller, who resolves the massage to determine the traffic load on that link.

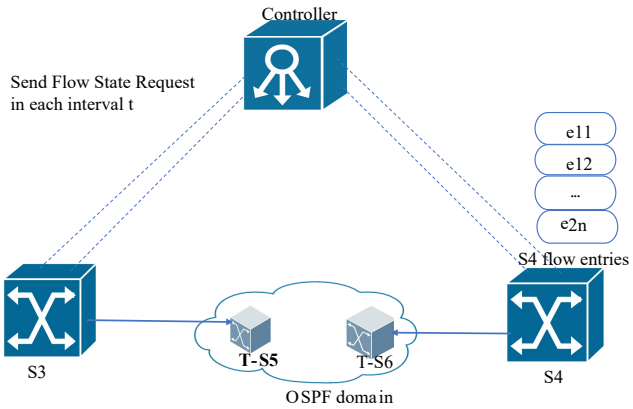


**Figure 6.** *Hybrid network Traffic load monitoring.*



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**Packet Loss Rate and Delay**: SDN devices partition the network into numerous domains in the Hybrid SDN network, which are often linked by SDN switches [48]. The internal domain devices serve as OSPF routers, and each pair of SDN switches may have several OSPF paths. It is difficult to calculate the packet loss rate and latency for each link. The OpenFlow protocol, on the other hand, can be used to determine the packet loss rate and delay of a channel between SDN switches. Despite the fact that traffic inside an OSPF domain does not transit via SDN switches in the hybrid SDN network, a considerable percentage of the traffic will pass between multiple OSPF domains, necessitating its passage through one or more SDN switches. As a result, the packet loss rate and delay may be calculated.

Figure 7 shows the delay measurement in a hybrid SDN network; the delay of each path is separated into two components (round trip delay of data flow and the transmission delay between SDN switches and controller).

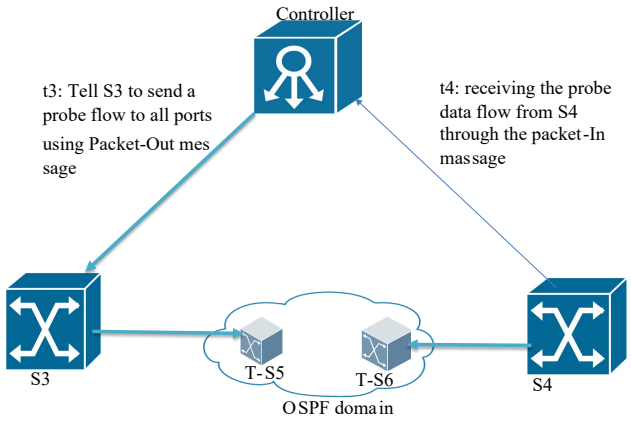


**Figure 7.** *Measurement of delay in a hybrid network.*

The controller inserts the time t3 into the probe data flow before sending the packet-out massage to S3. S3 transmits the massage to all ports in accordance with the regulations after receiving it. This communication arrives at S4 through an OSPF path and is forwarded as a packet-in message to the controller. The controller gets the massage at t4 and then resolves it to retrieve the sending port of S3, the receiving port of S4, and the time at t3.

Further research has been conducted to optimize QoS in hybrid SDN networks. They proposed various schemes to optimize single QoS metrics or multiple QoS metrics for hybrid SDN networks; they used different techniques to manage traffic to deliver the best possible Quality of service for their created topologies.

Bi et al. [90] suggested a QoS-aware forwarding approach using the SPMC (Single Path Minimum Cost) and K path partition Algorithms to enhance the QoS of industrial applications. Their simulation findings demonstrate that their suggested strategy meets QoS criteria and effectively balances traffic load using OSPF link bandwidth resources in an SDN/OSPF hybrid industrial internet.

Huang et al. [91] present a comparative optimum traffic control approach for hybrid SDN QoS optimization. They tested their strategy with open-source traffic datasets. Their findings indicated that this strategy might significantly enhance network Quality of Service performance metrics like jitter, latency, and link utilization.

Xu et al. [92] present a heuristic approach for incremental deployment with a limited budget. For throughput maximization routing, they use a randomized rounding mechanism and the Depth First search approach. They demonstrated that both algorithms and analysis could outperform theoretical instances.

Their incremental deployment improves performance by roughly 40% over the prior deployment strategy, while their suggested routing algorithm improves throughput by 31% over ECMP in a hybrid network.

Kelkawi et al. [93] try to describe an effective method for the incremental deployment of legacy network switches to SDN enabled, aiming to minimize MLU of the Network. They use a mixture of two meta-heuristic algorithms (Particle Swarm Optimization and Ant Colony Optimization) to find the best sequence. Their simulation findings demonstrated that their suggested technique outperforms previous static migration algorithms, minimizing maximum link utilization by up to 8.5 percent.

Salman et al. [94] provide a technique for ensuring QoS for time-critical applications across hybrid SDN networks. With a 0.1 link usage level, the method obtains a 60% improvement. Their way searches for the shortest path and does not degrade in performance.

Hong et al. [82] designed a system with an SDN controller to answer these questions, which conventional device to upgrade and how SDN and conventional devices interoperated in the hybrid environment.



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Their result shows that with 20% of devices upgraded to SDN, their system can reduce 32% of Maximum link utilization compared to a traditional network, and compared to a pure SDN network, only an average of 41% flow table capacity is required

Guo et al. [87] proposed the SOTE algorithm of a Heuristic scheme to optimize the traffic splitting proportion of SDN devices and OSPF weight setting. They developed MINLP (Mixed Integer non-Linear programming problem) to investigate the optimization of Traffic Engineering in a Hybrid SDN network. Their finding shows that SOTE can reduce MLU by 24.19% on average and 11.72% in Hybrid SDN compared to Traffic splitting ratio and OSPF weight setting. They also show that with only 10% of SDN switches deployment, we may benefit from a hybrid SDN network.

From the viewpoint of machine learning, Siew et al. [95] address the topic of SDN implementation in traditional networks. For SDN deployment, they introduced the Reinforcement Learning and Markov Decision process approaches. They outlined the generic machine learning process in networking and proposed hybrid SDN implementation in traditional networks using the Markov Decision Process. Model creation and validation can be accomplished using RL techniques such as Q learning or SARSA.

Ren et al. [96], for TE performance, present FRS (Flow Routing and Splitting) algorithm. They simulate their algorithm with different SDN deployment rates, and their findings show that 20% of SDN device deployment FRS methods can achieve minimum link utilization than previous works.

Guo et al. [97] present a heuristic technique, known as a genetic algorithm, to locate migration sequences that will benefit most notably from the viewpoint of traffic engineering. They assess and compare their approach to greedy and static migration strategies. Their findings show that the genetic algorithm outperforms alternative migration sequences, proving that 40% of the adequately deployed router can reap the most benefits.

Jia et al. [19] present a heuristic strategy for deploying SDN devices in hybrid SDN networks. Their plan works in two separate scenarios. 1-Increasing network control capability while keeping the upgrade budget unchanged. 2-reducing upgrade expenses to gain the finest network control capability. The results demonstrated that this approach could accomplish 95 percent of the controlled flows with only a 10% upgrading cost. This technique can regulate 95 percent of a network's flow for approximately 10% of the cost of upgrading.

Guo et al. [98] construct and verify the NP-hard problem of TE across Multiple Traffic Matrices. They present a heuristic approach that combines online splitting ratio and offline weight setting optimization to optimize Routing over many TM. On measured traffic datasets, they test their technique with three network topologies. Their findings show that the MLU of the Network may be significantly improved, and their suggested framework outperforms competing approaches.

Hu et al. [80] investigated methods to maximize flow in hybrid SDN networks. They created FPTS (Fully Polynomial Time Approximation Scheme) to solve the issue. When 50 percent of SDN devices are installed, simulation results using real network topologies show that a hybrid SDN network outperforms conventional networks and can attain near-ideal network performance.

Hung Chen et al. [99] describe the problem of hybrid SDN deployment as an optimization problem with resource restrictions. Because this is NP-hard, they apply greedy-based heuristic algorithms and propose the Hybrid Score switch deployment technique. In a hybrid SDN network, Hybrid Score seeks to deliver the highest control capacity given a set number of switches to upgrade. They evaluated their work with real-world enterprise network topology. They found that their Hybrid Score improved the result by 11.28 percent compared to existing strategies. Compared to a fully SDN environment with only 13 percent of SDN switches, their Hybrid Score provides comparable control capacity.

## VI. HYBRID SDN OPTIMIZATION STRATEGIES

We will look at prior work in the field of optimization techniques for migrating Networks from pure traditional Networks to Hybrid SDN networks.

Guo et al. [97] present a Traffic Engineering optimization issue and investigate incremental deployment methods for migrating sequences to IP/SDN networks; they estimate the number and location of



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**Table 4.** *Migration and Quality of Service in Hybrid SDN network.*

| No | Proposed scheme | Result |
|---|---|---|
| 82 | To enhance the Quality of Service of industrial applications, They presented QoS aware forwarding approach based on SPMC and K path partition algorithms | Their simulation findings demonstrate that their suggested strategy ensures QoS standards, Traffic load balancing and efficiently leverages OSPF connection bandwidth in a hybrid SDN/OSPF for the industrial Internet. |
| 83 | For QoS optimization in a hybrid SDN network, they present a near-optimum traffic control approach | as they test their strategy with open-source traffic datasets. Their findings indicated that this strategy might significantly enhance network QoS performance metrics such as jitter, delay, and link utilization. |
| 84 | present a heuristic approach for incremental deployment with a limited budget. | They demonstrated that both algorithms and analysis could outperform theoretical instances. Their incremental deployment improves performance by roughly 40% over the prior deployment strategy, while their suggested routing algorithm improves throughput by 31% over ECMP in a hybrid network. |
| 85 | They describe an effective gradual deployment sequence of conventional devices to SDN switches based on TE to restrict the network's maximum link utilization. | Their simulation findings demonstrate that their suggested technique beats previous static migration algorithms to minimize maximum link utilization by up to 8.5 percent. |
| 86 | They propose a solution for ensuring the Quality of Services for time-sensitive applications on a hybrid SDN network. | With a 0.1 link usage level, their approach produces a 60% improvement. Their method seeks the shortest, most comprehensive path with no reduction in performance. |
| 87 | They introduced the SAQR( Simulated Annealing base QoS aware Routing) method to discover the best-suited path based on QoS criteria. | They test their proposed algorithm in a hybrid SDN network. Simulation results show that the SAQR algorithm outperforms similar work MINA in terms of latency, loss, and bandwidth ration, with 88 percent, 90.80 percent, and 86.5 percent of Flows fulfilling their respective QoS standards. |
| 81 | They proposed the SOTE algorithm of the Heuristic scheme to optimize the traffic splitting proportion of SDN devices and OSPF weight setting. And they developed MINLP to investigate the optimization of Traffic Engineering in a Hybrid SDN network. | Their finding shows that SOTE can decrease MLU by 24.19% on average and 11.72% in Hybrid SDN compared to Traffic splitting ratio and OSPF weight setting. They also offer that with only 10% of SDN switches deployed, we may get the majority of thee to benefit in a hybrid SDN network. |
| 88 | They investigate how the efficiency of Traffic Engineering is affected by both forwarding graph layout and traffic distribution in hybrid SDN Networks. | Their results reveal that their forwarding graph creation method outperforms other forwarding graph development methods regarding throughput and load balancing. |
| 89 | They suggested an RL (Reinforcement Learning) based strategy for teaching traffic splitting agents to dynamically address changing traffic and balance link load in a hybrid SDN network. | They recommended building a suitable simulation environment where traffic-splitting techniques are used to minimize routing loops. They tested their proposed work on real traffic on different topologies and showed that it achieves equivalent network performance and succeeds at fast constructing good routing strategies. |
| 91 | They suggest the Flow Routing and Splitting (FRS) method regarding TE performance. | They ran simulations with varied SDN deployment rates, and their finding shows that with the only deployment of 20% of SDN switches, the FRS algorithm can achieve a Minimum MLU than previous works. |
| 92 | They suggest a heuristic approach, known as a genetic algorithm, to determine the optimal migration sequence from the viewpoint of traffic engineering | They evaluate their algorithm and compare it to greedy and static migration algorithms. Their result shows that the genetic algorithm surpasses other migration sequences, proving that 40% of adequately deployed routers can reap the most benefits. |
| 78 | They formulate and verify the NP-hard issue of TE across Multiple Traffic Matrices. They present a heuristic approach that combines online splitting ratio and offline weight setting optimization to optimize Routing over many TM. | On measured traffic datasets, they test their technique with three network typologies. Their findings show that the Network's MLU may significantly improve, and their suggested framework outperforms existing approaches. |
| 72 | They investigated methods to improve flow in hybrid SDN networks. They created FPTS to address it. | With 50 percent of SDN devices deployed, simulation findings using actual topologies demonstrate that hybrid SDN outperforms classical networks and can achieve near-ideal network performance. |

routers to upgrade to minimize Maximum Link Utilization. The author of this research claims that finding an optimal migrating sequence is much more complex and challenging than traveling salesman issues, as MLU is based on previously visited nodes, and the cost of edges is not constant. To solve this problem, they propose greedy and genetic searching algorithms and compare their algorithms with static migration



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techniques. Their finding demonstrated that the proposed evolutionary algorithm was able to discover a better and an effective migration sequence, and with the migration of 40% of the devices, we can achieve minimized MLU of the Network.

In paper number [20], Kar et al. study migrating from legacy and pure conventional Networks to hybrid SDN networks using a different combination of optimizing hop and path coverage with reducing cost. They proposed a Heuristic algorithm and demonstrated that this problem is an NP-hard problem. They offer MUcPF and MHcPF written in MATLAB program to model route and hop coverage migration sequences. They tested their algorithm against three other algorithms (Accidental coverage, weighted coverage, and Degree coverage algorithms). The simulation results demonstrate that created algorithms provided higher route and hop coverage than current algorithms for the same expense percentage. MUcPF requires just 15% expenditure to obtain 100% route coverage, in contrast to other algorithms' 20-30%.

Jia et al. [19] present a heuristic strategy for deploying SDN devices in hybrid SDN networks. Their plan works in two separate scenarios. 1-Increasing network control capability while keeping the upgrade budget unchanged. 2-reducing upgrade expenses to gain the finest network control capability. The results demonstrated that this approach could accomplish 95 percent of the controlled flows with only a 10% upgrading cost. This technique can regulate 95 percent of a network's flow for approximately 10% of the cost of upgrading.

Hui Yang et al. [100] proposed a distributed control architecture for SDON (Software defined optical networking) using the block chain technique (BLockCtrl) aiming to detect a single point of failure within the SDON control plane to address the security and efficiency issues faced by SDON. Their simulation result showed that their proposed architecture could significantly decrease the impact of DoS attacks and fault tolerant control in the SDON network.

Yang et al. [101] concentrate on selecting SDN candidate issues to preserve all possible single points of failure in a network which involves selecting a small portion of traditional routers to migrate to SDN controllers. This method intends to gradually update conventional network devices to hybrid SDN networks by limiting and repairing the route length of broken links, decreasing packet delay, and increasing network bandwidth utilization. Performance assessment revealed that the proposed approach reduced the number of SDN switches required while obtaining a relatively short path length repaired. The authors' second strategy is discovering the repair path that minimizes maximum link utilization following a connection failure. Because of the higher number of repair path candidates evaluated, the author's technique outperforms the greedy algorithm (2.9% to 15% decrease) with fewer SDN switches.

### 6.1 Routing Optimization

Huang et al. [90] present DRL-TC, a novel DRL-based architecture, for optimizing network QoS performance in hybrid SDN networks. Based on historical traffic records, they first look for an appropriate SDN migration sequence to maximize total controlled traffic. In contrast to the prior heuristic solution for TE in hybrid SDN networks, DRL-TC focuses on self-learning routing algorithms and adaptive algorithms in various traffic situations. The results reveal that their suggested strategy achieves optimum performance in optimizing maximum link utilization with rising ratios in the deployment of SDN and a significant improvement in lowering network latency and jitter compared to alternative solutions. Routing optimization in conventional distributed networks is primarily concerned with improving OSPF link weight.

As with SDN network development, network operators can manage the network and the traffic flow in a much more flexible way, and in the real-time network, they can change their route selection. Prior research studies focused on the routing optimization of pure SDN networks, which differs from Hybrid SDN networks. Those routing optimizations cannot directly apply to hybrid SDN networks.

Caria et al. [83] implement SDN at the border routers and divide OSPF into sub-domains to provide fine-grain traffic management across subdomains. Xu et al. [102] optimize routing in a particular Hybrid SDN situation; they collaborated to enhance flow routing and gradual deployment in a hybrid SDN network. XU et al. [84] investigate all devices with SDN and classical switching. Vassicchio et al. [85] offer Fibbing, which introduces false nodes to provide more flexible routing by centrally controlling the link state



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routing protocols.

### 6.2 Legacy Optimization Mechanisms

The study [48] thoroughly examined the Deployment of Hybrid SDN technologies and discussed traffic optimization methodologies. Agarwal et al. [82] present the FPTAS method to minimize maximum link utilization (MLU). The authors employ a greedy technique to decide SDN site selection based on optimal throughput gain. The analysis assumes a particular traffic matrix that actual traffic will diverge from this traffic matrix. However, no information regarding how to obtain precise traffic patterns is provided.

Guo et al. [88] maximize the splitting ratio of OSPF weight setting and SDN devices. They developed SOTE (SDN/OSPF Traffic Engineering) to reduce the MLU of the Network. However, getting an ideal OSPF link weight configuration in a dynamic network is complex.

[98] investigates Traffic Engineering across multiple TM (Traffic matrices). To improve MLU, they present a heuristic technique. Authors believe multiple traffic matrices can better describe MLU optimization; they employ the K method to cluster traffic matrices and believe numerous TM can better depict dynamic traffic characteristics.

Poularaki et al. [103] look at a broad upgrading approach for hybrid SDN implementation. They are primarily concerned with the impact of upgrading time. Guo et al. [104] investigate a hybrid SDN deployment challenge, including controller and SDN switches. Jia et al. [105] offer a heuristic strategy for hybrid SDN deployment that maximizes network control ability while keeping to upgrade budget constraints. [104, 105] mainly cover hybrid SDN deployment strategies.

### 6.3 AI-Based Optimization Mechanisms

The deployment challenge is different from the traffic control problem. Heuristic methods may be effective in some cases but may not be effectively adaptable to changes in network state [106]. Even when utilizing various Traffic mattresses to show network traffic, there may be some scenarios that are not taken into account. Several initiatives have been made; as a result, taking advantage of Artificial Intelligence (AI) techniques such as DRL for Adaptive Routing. Xu et al. [107] describe a unique DRL-based approach to increase end-to-end communication network throughput and discuss DRL's advantage over previous dynamic control strategies. Yu et al. [108] implement DDPG to improve network link weights in an SDN network based on various incentive goals, and Huang et al. [109] deploy DDPG in the SDN network to optimize the Quality of Experience (QoE).

Zhang et al. [110, 111] present a unique Reinforcement learning method for TE in an SDN network. A key strategy of this method is automatically determining which significant flows should be rerouted; it is suited for each traffic matrix but is not ideal for hybrid SDN applications. When deployed, the flows that SDN devices may manage are fixed, and the possibilities for selection are restricted. Sun et al. [112] propose SINET for SDN routing based on DDPG. It picks critic nodes as control nodes. It uses its link weights to build routing pathways.

### 6.4 Quality of Service (QoS) Routing

Because of providing open control interface by the SDN network, it facilitates a flexible traffic scheduling scheme for the Network; SDN is the appropriate architecture that meets the QoS need of numerous applications, including video and audio. Egilmez et al. [113] propose an Open QoS concept on an Open Flow Controller with support of end-to-end QoS for multimedia distribution, as it is based on Quality of Service routing traffic paths are optimized dynamically to meet needed QoS. They evaluate their open QoS across real networks, and the finding of their experiments reveal that Open QoS guaranteed transmission, and Users report little or no visual artifacts when watching the seamless video. Furthermore, compared to existing QoS systems, guaranteed services are handled in open QoS without affecting any other traffic types in the network.

Yan et al. [114] suggest Quality of Service assurances through SDN. Furthermore, they employ several pathways among source, destination, and queueing methods that provide QoS for various Traffic types. The experimental findings suggest that the proposed HiQoS method may minimize latency while increasing throughput to ensure QoS.

Silver et al. [115] present Network Service Abstraction layer (NSAL) implementation above the manage-



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ment and control layers. The authors present a uniform data model for traditional and SDN devices, allowing for unified management and configuration of both networks to provide Quality Service for time-critical jobs.

Lin et al. [116] present a QAR (QoS aware adaptive routing) scheme for an SDN network with multilayer distributed hierarchical control plan architectures. Mainly it is utilized to decrease signaling latency in large-scale SDN networks through three tiers of controller design. This QAR technique suggests providing adequate time adaptive QoS packet forwarding using an (RL) Reinforcement learning technique and a QoS aware reward function. Simulation finding shows that this QAR technique outperforms the traditional Q learning method, making it realistic for large-scale SDN networks.

Bi et al. [90] investigate the challenge of managing QoS-aware data flows in the context of multiple flows. They present a game theory based on numerous data flow management strategies in the situation of optimum data flow management being an N-P complex issue and capable of minimizing network delay up to (77-98) percent while increasing network throughput by (24-47) percent.

Chienhung et al. [117] present the design of a hybrid SDN network that may use the spanning Tree Protocol to identify the existence of traditional switches to gain a global perspective on the hybrid SDN network. Authors use the Learning Bridge Protocol to let Open Flow switches communicate with legacy switches without requiring any changes to the legacy switches. SDN applications may dynamically discover routing pathways based on pre-defined QoS criteria and current network conditions by using SDN features.

Hui Yang et al. [118] present a novel SUDOI architecture in ubiquitous data center optical interconnection to meet the QoS requirement of extensive user access. The performance of their work is verified on OaaS (Optimization as a Service) testbed for data center services. Their result shows that SUDOI can effectively utilize optical network and application resources in ubiquitous data center optical interconnection without increasing blocking probability.

Alouche et al. [119] present a geographical routing protocol for automotive networks based on hSDN and a clustering technique. It considers three distinct characteristics when deciding which relay is used to transfer the data: 1- contact length among vehicles, 2- a load of each vehicle, and 3- a communication fault log integrated with each cluster head. The simulation finding reveals that the suggested approach performs well in terms of throughput, packet top rate, and average routing overhead.

### 6.5 QoS Aware Routing

Some applications require different QoS metrics, such as packet loss rate, latency, bandwidth, etc. To overcome this issue, we may create SLA for each application to record QoS criteria and assign routing paths accordingly to match QIS (Quality Information System) needs, referred to as QoS-aware Routing. This routing uses GA (Genetic algorithm) to determine the best suitable route, which meets QoS requirements incrementally. Assessment results demonstrated that this algorithm performs well in networks with different QoS needs.

In Data Centers, several big data applications must send vast volumes of data from one place to another; thus, how these application flows are distributed throughout the network to enhance network usage is critical. The authors of Hedera [120] presented an SA-based algorithm to route flows to alternative pathways based on the current network status. This study outperforms the typical ECMP in terms of performance. The inventors of Long [121] suggested a dynamic rerouting method. When the network controller detects traffic load, it utilizes a multi-hop or a single-hop algorithm to shift traffic to other paths. This method can enhance connection utilization compared to the conventional Round Robin Algorithm.

The inventors of LARAC [122] suggested a LARAC QoS-aware routing algorithm that finds near optimum pathways in the Delay Constrained Least Cost issue using a Lagrange relaxation-based aggregated cost technique. Authors in MINA [123] suggested QoS aware flows scheduling technique for IoT devices; this approach uses GA (Genetic algorithm) to repeatedly generate the best-suited path to fulfill QoS criteria. Assessment results demonstrated that this method performs well in networks with different QoS requirements. Only MINA addressed various restrictions in comparable works. MINA's key challenges include static weight in the cost functions, QoS-aware Routing, and being locked in a local optimum. To address



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these issues, [117] introduced a QoS aware routing (SAQR) technique based on the simulated annealing (SA) technique to identify the best-suited path that fulfills various QoS standards.

### 6.6 Interworking and Inter-Domain Routing

The most well-known applications in the early stages of SDN are Google B4 network [2] and Microsoft WAN [3]. Google chose SDN to convert the linked WAN Network across data centers, and it is now wholly deployed using Open Flow Network. Before fully transitioning to the SDN network, Google B4 network went to Hybrid deployment in two different phases; the first was completed in 2010, and the second was completed in 2011 when google started to administrator network through the Controller and doubled the capacity of their network. Google began to promote agile development by running both traditional and SDN routing systems in parallel. Hence, SDN routing systems have much higher priority than the classic ones. SDN is deployed incrementally to different Data Centers to allow additional traffic to be moved from the old routing system to the SDN framework. If there is any issue with the SDN, B4 provides the option to turn off the SDN framework and return to conventional routing strategies. During this stage, SDN devices can interfere with legacy routing protocols, and Google deployed consistent routing protocols for SDN applications. In any case, SDN networks and traditional Networks have to communicate with each other even if complete SDN architecture is ultimately deployed. Data centers must exchange data with traditional extermination networks.

An Internet Exchange Point (IXP) is a physical access point of the network in which several ISPs may join their networks and exchange BGP (Border Gateway Protocol) routes. SDX-L3 stands for Software define internet exchange point Layer 3 [116]. IP prefixes are used in traditional and physical IXP routing and traffic forwarding. SDX enables those to match many header fields; each AS can use remote traffic control. Aside from SDX, the abstraction of virtual switches provides that AS cannot influence or overserve Inter-Domain Routing outside their scope. Some other optimization models updated rules as soon as BGP routes or policies changed. SDX improves the dependability and flexibility of IXPs.

### 6.7 QoS Policy Management

SLA or Service Level Agreement is essential to create QoS criteria for traffic management of different QoS applications like (video conferencing, video streaming, and online interactive gaming). Each SLA comprises a set of Objectives that are utilized to generate networks level policies translated into devices level primitives (e.g., packet dropping rate, queue configurations, traffic shaping policies, and forwarding rules). Managing QoS settings in conventional network designs such as MPLS and DiffServ is complex. Conversely, SDN provides a worldwide network view and has robust northbound API capability. It enables network operators to launch services quickly and execute various network regulations. The PolicyCop [124] project intends to provide controllable, adaptable, and vendor-independent administration of QoS rules in SDN/OpenFlow networks using the Northbound SDN API. PolicyCop benefits from OpenFlow features, making it a suitable management framework. It offers on-demand aggregation as well as per-flow control. Policy Cop makes traffic defining easier than MPLS and DiffServ since it does not need network device shutdown. Because of its vendor independence, it is simple to implement in a network and lowers operational overhead. The Policy Cop design has three planes: management, control, and data plane. The data and control planes are standard SDN planes, but the management plane is Policy Cop's heart. The plane has two aspects: policy validator and policy enforcer; the policy validator identifies and monitors policy breaches, whereas the Enforcer responds to policy violations and enforces network policy regulations.

### 6.8 QoS Signaling Overhead

Due to the logically centralized nature of the SDN design, all overhead (QoS-related signaling messages) are gathered at the network's control mechanism (Controller). [125] OpenFlow allows network operators to collect information at various flow levels, such as aggregated and individual flows. Each of these methods of collection has a cost. The per-flow process provides better granularity in terms of QoS-related states. It has a scalability problem. A controller can pool switches in an SDN or OpenFlow network to collect data on active flows. When a flow timeout occurs, it might direct the switch to report flow statistics at a prede-



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termined interval. Another critical consideration is how frequently QoS information should be transmitted from one network device to the Controller. Although getting statistics from the data plan often benefits the Controller in keeping an up-to-date global picture of network conditions, this procedure is a tradeoff between measurement precision speed, signaling overhead, and timeliness and results in the scalability issue of a control plane for a controller [126]. For flow statistics, the PayLess [127] technology supports many degrees of flow aggregation through a RESTful API. It uses an adaptive statistics-gathering technique to provide accurate real-time information while incurring minimum network costs. This approach achieves accuracy extremely near that of the constant periodic polling method while reducing massaging overhead by up to 50% compared to the regular polling strategy.

## VII. CONCLUSION

The fundamental issue with today's network is the shortage or even lack of Quality Service guarantees throughout the networks. Researchers and industry pioneers have explored and presented their outcomes & possible solutions to the currently running network design models, while many of these solutions have failed or may not deploy & function properly. Therefore, Researchers have started to use the promising concept of SDN with OpenFlow protocol as they provide a centralized worldwide network perspective with more fine-grained flow management options in the networks. However, many organizations and enterprise networks cannot conveniently afford to migrate directly from traditional networks to an SDN network; by keeping traditional network infrastructure, they might incrementally migrate to a Hybrid SDN network. This paper reviewed Traffic Engineering & Quality of Services Issues in the Hybrid SDN network. With different strategies, we can significantly enhance the overall performance of the network, especially QoS. Incremental deployment improves network performance by around 40% compared to earlier deployment schemes; however, finding an optimal migrating sequence is much more complex and challenging. We have found that with 10-20% of proper SDN switches deployment, we can benefit the most from the concept of Hybrid SDN networks. We believe that the Hybrid SDN network has come a long way; however, some missing areas still need more research and exploration that leads to further improvements. Scalability in the Hybrid SDN network is one of the key problems caused while adding or changing the number of network nodes; for complicated hSDN scenarios, more proven research is needed with scalability studies. Security is another crucial deficiency in the Hybrid SDN network that must be in the essence of it and worthy of being considered as the central part of seamless hybrid SDN networks. In addition to that, Researchers should focus more on privacy issues, new standards, and models of the Hybrid SDN networks.

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ORIGINAL PAPER

# Underwater image enhancement by using transmission optimization and background light estimation via principal component analysis fusion

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**Abstract**
The optical properties of water exacerbate the problems that arise in underwater imaging, including low contrast, color cast, noise, and haze. Pre-processing techniques are required in order to extract relevant information from these images. To solve the above problem, a new underwater image enhancement by using transmission optimization and background light estimation via Principal component analysis (TOBPCA) is proposed. Firstly, the background light of the degraded underwater image is computed using a dark channel prior; secondly, the degraded underwater RGB images are converted to CIELAB color space. Then, the transmission map of the lightness (L) component of CIELAB color space is represented and optimization of the transmission map is performed. Then, the Principal component analysis is used to fuse the background light and optimized transmission map. Finally, color correction is applied to enhance the underwater image. The proposed method is evaluated on the underwater color cast set (UCCS), underwater image quality set (UIQS), and underwater image enhancement benchmark (UIEB) Database based on Patch-based contrast quality index (PCQI), underwater color image quality evaluation (UCIQE), Underwater image quality measure (UIQM), Structural similarity index (SSIM), Peak signal to noise ratio (PSNR), and discrete entropy (DE) parameters. To verify the efficacy of the proposed method, a qualitative and quantitative comparison has been made on the UCCS, UIQS, and UIEB datasets. The result demonstrates that the proposed method outperforms the state-of-the-art method, in terms of PCQI, UCIQE, SSIM, and DE parameters.

**Keywords** Underwater image enhancement · Color correction · PCA fusion · Transmission map · Background light

## 1 Introduction

Sea exploration has become a vital avenue for the progress of the country because of the wealth of resources and diversity of marine life that can be found in the seas [1]. However, the lack of sufficient undersea imagery has hampered progress in this area. Underwater visibility has gained importance in various fields such as nuclear submarine engineering, optical communication, petroleum refining and petrochemical engineering, marine biology engineering, archaeological engineering, and many more. In the present era availability of a variety of tools is to access information about the ocean, such as underwater autonomous underwater vehicles [2] and underwater object retrieval tools [3]. Due to the physical and chemical properties of the underwater environment, certain deteriorated images can be captured in underwater scenarios [4]. In deep water, the red-light component diminished quickly compared to the green and blue component. This causes visible color discrepancies in photographs, particularly in the blue-green range [5]. Moreover, image that appears hazy and lack contrast is caused due to variations in the light path and light absorption of suspended particles in the water [6]. Images with more blur are caused by light reflected from objects and forward scattered light from non-target objects, whereas the backward scattered light from non-target objects exacerbates haziness. Furthermore, imaging can be interfered with due to suspended particles and bubbles in water, which result in images that are too bright and contain incorrect characteristics [7]. In the underwater

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environment, due to absorption and scattering effects, only a small portion of the reflected light from the scene reaches the imaging sensor which results in a blurred image [8]. The atmospheric scattering model, commonly employed to characterize the deterioration of underwater images, is frequently described as follows [9]:

$$\boldsymbol{I^u}(y) = \boldsymbol{J^u}(y)\boldsymbol{\tau^u}(y) + \boldsymbol{BL^u}\big(1 - \boldsymbol{\tau^u}(y)\big) u\epsilon\{r,\ g,\ b\} \quad (1)$$

Here, $x$ stands for the coordinates of the pixels, $\boldsymbol{I^u}(y)$ for the inferior image, and $\boldsymbol{J^u}(y)$ for the improved image. The total background light is represented by $\boldsymbol{BL^u}$, while the transmission is symbolized by $\boldsymbol{\tau^u}(y)$, ranging between [0, 1]. Global atmospheric light denotes the overall amount of ambient light, and transmission is the percentage of the scene's brightness that is visible to the camera. The color channel of underwater is represented by subscript $\boldsymbol{u}$, which belongs to the set of red, green, and blue. According to [10], the transmission $\boldsymbol{\tau^u}(y)$ under uniform haze conditions can be depicted using a term signifying exponential decay as expressed in eq. shown below.

$$\boldsymbol{\tau^u}(y) = e^{-\alpha_u \delta(y)} \quad (2)$$

In this case, the distance between the scene and the camera is indicated by $\delta(y)$, and $\alpha$ represents the air attenuation coefficient.

These days, there are two main categories of underwater image enhancement (UIE) techniques: based on physical models and non-physical models. The complexities of underwater imaging are frequently ignored by the non-physical models, which can lead to problems like over-enhancement, under-enhancement, and fake color. Physical model-based UIE techniques are significantly impacted by background lighting and depth maps. However, there are difficulties in precisely identifying the depth map of underwater images with low contrast and distortion.

In recent years, deep learning methods have been extensively used in underwater image enhancement. These networks achieve end-to-end modelling by large-scale learning from paired data, avoiding the need for complex model design and parameter selection. Li et al. [9] introduced an image enhancement and video enhancement method based on Convolutional Neural Network (CNN). On the other hand, some CNN-based image enhancement methods [11] avoid error accumulation by directly transforming underwater images into clear ones.

Here, the proposed method is based on the physical model. In the physical imaging model, ambient light and transmission are the main causes of underwater image degradation. The ambient light remains constant throughout the image, while the transmission factor varies significantly based on pixel position, necessitating a distinct transmission value for each pixel. The ambient light is referred to as background light. Then the optimized transmission maps are fused with background light through Principal component analysis. Finally, color correction has been applied to the fused image to obtain an enhanced image.

The main contributions to this article are summarized as follows:

- The proposed method estimates the background light of deteriorated underwater RGB image by dark channel prior (DCP). A highly efficient model for estimating the transmission map (TM) in underwater image processing is developed. The TM for the lightness (L) component is determined using an underwater dark channel prior (UDCP).
- Here, the proposed method underwater image enhancement by using Transmission optimization and background light estimation via Principal component analysis fusion (TOBPCA) has a two-step enhancement approach, which is presented for diverse underwater images: (a) fusing the image using the PCA model with a BL estimator and TM optimizer and (b) applying an image color correction algorithm on UCCS, UIQS, and UIEB Dataset.
- The proposed method outperforms the state-of-the-art methods in terms of PCQI, UCIQE, SSIM, and DE while maintaining lower computational complexity.

The substance of this work is divided into the following sections. An overview of relevant research on the UIE methods is described in Sect. 2. In Sect. 3 detailed image enhancement is presented. The experiment results and discussion of the findings of the proposed method are discussed in Sect. 4. Finally, Sect. 5 concludes the paper.

## 2 Existing work

Based on the domain, the image enhancement techniques are classified into two categories frequency-domain method and spatial-domain method.

### 2.1 Frequency-domain method for image enhancement

In recent times, there has been extensive growth in feature extraction techniques from the frequency domain to address challenges in image processing. Lee et al. [12] introduced a deep learning method for Fourier frequency-domain analysis based on single-picture depth estimation. A basic unsupervised domain adaptation method was presented by [13]. It involves the multiple signal depth estimation in the frequency

domain. Furthermore, Mishra et al. [14], provide color correction and empirical modes decomposition algorithms to enhance the underwater images.

## 2.2 Spatial-domain methods for image enhancement

Image enhancement techniques in the spatial domain are typically divided into physical model-based techniques and non-physical model-based techniques. Underwater image enhancement (UIE) continues to require these two approaches even in the face of the addition of more data to underwater imaging [15].

### 2.2.1 Non-physical model-based image enhancement method

Several image enhancement methods exist that can improve image quality without relying on the creation of physical models for underwater imaging. Zhang et al.[16] suggested a weighted wavelet visual perception fusion method that produces superior color-corrected and contrast-enhanced outcomes by processing original underwater images. To elaborate on the multi-scale fusion, [17] merged two forms of the UIE methodology, i.e., color-compensated and white balance algorithm to enhance the degraded underwater image. Furthermore, an extended multi-scale UIE approach based on the Retinex that operates in the CIELAB color space was introduced by [18, 19]. It significantly improves color appearance by reconstructing lost channels using modifying the original Retinex algorithm. On the other hand, a UIE technique based on piecewise color correction and dual prior optimized contrast enhancement was presented by [20]. To handle color inconsistencies in the CIELAB color space, a color balance technique is introduced. Although these enhancement techniques provide good visual colors, sharper contrast, and more details, they are unable to increase the visual quality of the image. This method is not suitable for complicated underwater environment.

The new underwater image processing fusion technique, renowned for generating good-quality, contrast-enhanced, and color-corrected underwater images, was first introduced by Ancuti et al. [21]. Zhang et al. [22] employed a unique strategy that utilized a UIE technique that prioritized minimum color loss and local adaptive contrast improvement. To deal with the color representation, [23] developed a color channel compensation method to recover the color of the channel by subtracting the local mean from each opponent color pixel.

Apart from the traditional method, nowadays deep learning methods are also suggested in the categories of non-physical model-based image enhancement methods. Li et al. [24] developed an underwater image enhancement method based on a Generative Adversarial Network (GAN). As described, WaterGAN used supervised learning by combining color correction and depth estimation modules to enhance underwater images. In [25], the author utilizes residual learning and dense connections to strengthen the resilience of UIE through the use of multi-scale dense generative adversarial networks. A motion saliency generative adversarial network for underwater Moving Object Segmentation (MOS) was introduced by [26]. This GAN integrates identity mapping with dense connections specifically for underwater MOS.

In order to equalize color variances in the CIELAB color space, this approach integrates color and detail modifications through a fusion strategy that incorporates a color balance strategy. Bright colors, better details, and more contrast are the results of the improvements. Although these approaches significantly improve the quality of images, they ignore the subtleties of underwater imaging systems, which makes them less useful in complicated underwater situations. This limitation often results in an unsatisfactory improvement in the visual quality of underwater images.

### 2.2.2 Physical model-based image enhancement method

The approach based on physical models, which considers underwater image enhancement (UIE) as a counteraction to image deterioration, has gained widespread popularity. These methods essentially make a model that explains how underwater images get worse. Then they forecast unknown characteristics such as depth associated with the transmission elements and ambient light. Peng et al. [27] developed a method to estimate imaging depth by using two features, i.e., image blur and light absorption. Additionally, adaptive color correction is incorporated to remove color cast. A statistical approach was provided in [28] to improve the quality of underwater photographs by optimizing background light and transmission maps. The aforementioned physical model-based approach usually requires prior information for image enhancement. The quality of image enhancement is highly dependent on the accuracy of parameter estimation. Due to the complexity of the underwater environment, details of the image may not be adequately captured by a single physical model.

The advent of deep learning has led to significant progress in low-level visual tasks. To improve the diversity of feature representation with a single structure, Zhang et al. [29] presented a unique network that mixes many color spaces. For medium transmission, a decoder network is used. This helped the network pay more attention to areas where the quality is going down. As a result, the visual quality of the photographs has significantly improved.

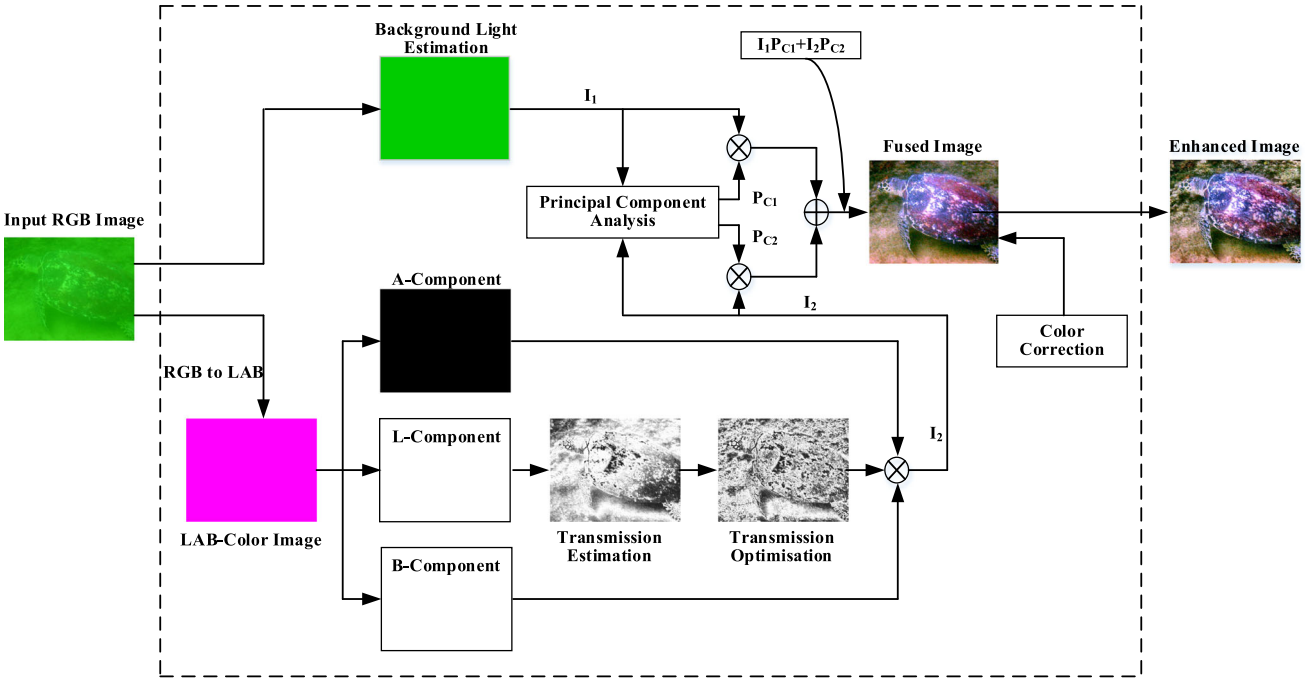


**Fig. 1** Framework of the proposed methodology (TOBPCA) for image enhancement (Color figure online)

## 3 Proposed methodology

In this article, a new method based on a physical model is proposed for underwater image enhancement by using Transmission optimization and background light estimation via Principal component analysis (TOBPCA). The proposed method TOBPCA is represented in Fig. 1. The block diagram's various components are implemented individually based on the proposed methodology (TOBPCA). The background light has been estimated by Eqs. (3) and (4), and transmission of underwater image calculated by Eqs. (7) and (8). Then, the obtained transmission has been optimized by Eq. (9). The background light and optimized transmission is fused through principal component analysis in Eqs. (11) and (12). Finally, the underwater enhanced image is obtained after color correction by Eq. (13).

### 3.1 Background light estimation

This section presents a mathematical representation of the background light estimation. The simplest method for estimating background light is to find the single brightest pixel in the underwater image. On the other hand, this technique could not work well when there is more light in the foreground than in the background. To mitigate the influence of suspended particles present in the image, $DCP_{rgb}$-based methods which are detailed in reference [30] choose to estimate background light by using the pixel that is located at the darkest point within the image's dark channel. The background light is calculated as:

$$\mathrm{BL}^u = I^u\left(\mathrm{argmax}\left(\min_{x\epsilon\omega}\left(\min_u I^u(x)\right)\right)\right) \tag{3}$$

Here, '$u$' belongs to any RGB channel and '$u'$' denotes a Green–Blue channel. Furthermore, '$\omega$', represents a local patch that has a dimension of $9 \times 9$ pixels. Here, RGB color space is equivalent to the CIEBLAB color space, i.e., the R-component is equivalent to the L-component, the G-component is equivalent to the A-component, and the B-component of RGB color space is equivalent to the B-component of CIEBLAB color space.

In underwater images, the red channel is often affected due to water absorption. Water absorbs longer wavelengths, such as red causing a decrease in red tones and making the images appear more blue or green. This can lead to a loss of color accuracy and reduce visibility in underwater photography. To mitigate the effects of the red channel, the $\mathrm{DCP}_{\mathrm{gb}}$ [31] method chooses background light by selecting the brightest pixel only from the green and blue channels which is defined as:

$$BL^u = I^u\left(\mathrm{argmax}\left|\max_{x\epsilon\omega} I^r(x) - \max_{x\epsilon\omega} I^{u'}(x)\right|\right) \tag{4}$$

where $I^r(x)$ = red channel of input image and $I^{u'}(x)$ = green and blue channel of an input image.

### 3.2 Transmission estimation

The first recapitulation of the dark channel prior (DCP) proposed by He et al. [32] suggested that in most non-sky patches, there is a local patch where one or more RGB channel pixels have very low intensity, almost at zero. The aforementioned observation is based on statistical patterns found in clear outside images. Mathematically it is described as:

$$J^{\text{rgb}}_{\text{dark}}(y) = \min_{x\epsilon\omega^{min}} \left\{ \min_{u} J^{u}(x) \right\} = 0 \tag{5}$$

In Eq. (1), apply a minimum filter on both sides and divide with background light $\text{BL}^u$, the resultant eq. is as follows:

$$\min_{x\epsilon\omega} \left\{ \min_{u} \frac{I^u(x)}{BL^u} \right\} = \min_{x\epsilon\omega} \left\{ \min_{u} J^u(x) \right\} + (1 - \tau_{\text{DCP}}(y)) \tag{6}$$

From Eqs. (5) and (6) the transmission coefficient $\tau_{\text{DCP}}(y)$ as:

$$\tau_{\text{DCP}}(y) = 1 - \min_{x\epsilon\omega} \left\{ \min_{u} \frac{I^u(x)}{\text{BL}^u} \right\} \tag{7}$$

Because the red channel in underwater photography is significantly attenuated, a version of the Dark Channel Prior, known as $DCP_{gb}$, was devised to only look at the green (G) and blue (B) channels. To formulate $\tau_{UDCP}(y)$, $I^u(x)$ is replaced with $I^{u'}(x)$ in Eq. (7). Hence

$$\tau_{\text{UDCP}}(y) = 1 - \min_{x\epsilon\omega} \left\{ \min_{u} \frac{I^{u'}(x)}{\text{BL}^u} \right\} \tag{8}$$

### 3.3 Transmission optimization

The red channel transmission given by Eq. (7) can be optimized by Eq. (9) [24]

$$\tau^{r}_{\text{NUDCP}}(y) = \left( 1 - \min_{u} \left\{ \frac{\min_{x\epsilon\omega}(I^u(x))}{\text{BL}^u} \right\} \right) / \left( 1 - \frac{0.1}{\text{BL}_{\max}} \right) \tag{9}$$

Here, $\text{BL}_{\max} = \max_{u} BL_u$,

In order to improve the red channel's transmission map in Eq. (7), $\tau^r(y)$ is stretched to produce a more seamless representation within a given range $(\varkappa_{\min}, \varkappa_{\max})$.

$$\tau_{\text{out}} = (\tau_{\text{in}} - \tau_{\min}) \left( \frac{\varkappa_{\max} - \varkappa_{\min}}{\tau_{\max} - \tau_{\min}} \right) + \varkappa_{\min} \tag{10}$$

To reduce the possibility of problems caused by under and overstretching, the transmission map's input and output pixels are designated as $\tau_{\text{in}}$ and $\tau_{\text{out}}$, respectively. The transmission map's lower and upper bounds, denoted by the parameters $\tau_{\min}$ and $\tau_{\max}$, are precisely adjusted to 0.2% of the respective values in the TM histograms. Furthermore, the range for the stretched gearbox map, denoted by $(\varkappa_{\min}, \varkappa_{\max})$, is set at (0.1, 0.9) to reduce the effect of stretching.

### 3.4 Image fusion via principal component analysis

The proposed method demonstrates that two images (Background light and Transmission map) are fused by principal component analysis (PCA). This method plays a key role in creating a composite image that preserves important details from the merged input image. This model uses PCA fusion by combining a TM optimization processed image with background light coming from an input image. The incoming images, $I_1$ (BL) and $I_2$(TM optimized), are arranged in this fusion procedure to produce a resultant matrix $M_n$, which is made up of two column vectors that are $2 \times n$ in size. The empirical mean vector, $\mu_n$, is calculated using each $1 \times 2$ column vector. Each column vector has its mean $\mu_n$ which are subtracted from each column to create a matrix $N$. Next, the covariance matrix $C_n$ for $M$ is calculated. Then eigen vector $Z$ and eigenvalue $K$ are calculated from a covariance matrix $C_n$ and arranged them into decreasing order of eigenvalue. The dimensions of both the eigenvector and eigenvalue are $2 \times 2$ matrix. The feature vectors $Z(1)$ and $Z(2)$ linked to higher eigenvalues are identified using Eq. (11) to provide the principal values $P_{c_1}$ and $P_{c_2}$. In the end, a fused image is produced using Eq. (12).

$$P_{c_1} = \frac{Z(1)}{\sum Z}, \text{ and } P_{c_2} = \frac{Z(2)}{\sum Z} \tag{11}$$

$$\text{Fused} = P_{c_1} I_1 + P_{c_2} I_2 \tag{12}$$

### 3.5 Color correction of fused image

Underwater images can be improved by the image enhancement method using the restoration parameters of the transmission maps (TMs) and brightness level. However, the fused images that are obtained from principal component analysis often have poor contrast and brightness, making it hard to visualized important details. The color correction algorithm with an ideal gain factor is the foundation of the recommended color-correcting method [34]. The color correction of the fused image is evaluated as follows:

$$I_{OC} = (I_i)/(P_{\max} \times (\nu/\nu_{\text{ref}}) + \eta_\rho) \tag{13}$$

$$\nu_{\text{ref}} = \left( (\nu_r)^2 + (\nu_g)^2 + (\nu_b)^2 \right)^{1/2} \tag{14}$$

The color-corrected image and the original underwater image are denoted by $I_{OC}$ and $I_i$, respectively. $v_r$, $v_g$, and $v_b$ represent the average values for each RGB channel in the input underwater image $I_i$. The maximum value found in the RGB channels of the input underwater image $I_i$ serves as the basis for $P_{\max}$ estimation. The parameter $\eta_\rho$ is meticulously selected to attain the intended color augmentation for the final image. The parameter $\eta_\rho$ lies within the given range of (0, 0.5). The brightness of the rectified image tends to decrease as $\eta_\rho$ approaches 0.

After doing tests on many underwater images, it was found that $\eta_\rho$ at 0.2 yielded a corrected image that was marginally brighter, whereas $\eta_\rho$ at 0.3 created a significantly brighter image. Thus, 0.25 is the best value for $\eta_\rho$ in this investigation.

## 4 Experimental results and discussion

In this section, the results of the proposed (TOBPCA) image enhancement method and existing methods are implemented on MATLAB2019b software for validation. The proposed TOBPCA method is evaluated with three datasets, namely underwater image enhancement benchmark (UIEB) [43], Underwater Color Cast Set (UCCS) [44], and Underwater Image Quality Set (UIQS) [44]. The underwater image enhancement benchmark dataset contains 950 real-world underwater images, of which 890 are reference images for best enhancement outcomes. The remaining sixty images are classified as problematic since their enhancements have not produced adequate outcomes. The underwater color cast set (UCCS) dataset contains 300 images, and the Underwater Image Quality Set (UIQS) dataset contains 3630 images. In this study, the proposed method (TOBPCA) was implemented on these three datasets considering their visual quality and parameter configuration. Six parameters have been used for the quantitative assessment as Patch-based Contrast Quality Index (PCQI) [45], underwater color image quality evaluation (UCIQE) [46], Underwater image quality measure (UIQM) [47], Structural similarity index (SSIM) [48], Peak signal to noise ratio (PSNR) [49], and discrete entropy (DE) [50] defined in Eqs. (15)–(21).

***Patch-Based Contrast Quality Index (PCQI)*** [45]*:* It is defined as:

$$\mathrm{PCQI}(x,\ y) = q_i(x,\ y).q_c(x,\ y).q_s(x,\ y) \tag{15}$$

where $xandy$ are pairs of co-related patches in the original image**X** and test image **Y**, respectively.

***Underwater Color Image Quality Evaluation (UCIQE)*** [46]*:* It is defined as follows:

$$\mathrm{UCIQE} = d_1 \times \sigma_c + d_2 \times con_1 + d_3 \times \mu_s \tag{16}$$

where $d_1$, $d_2$, and $d_3$ are weighted coefficients. $\sigma_c$ represents standard deviation of chroma, $con_1$ denotes contrast of luminance, and $\mu_s$ is the average of saturation.

***Underwater Image Quality measure (UIQM)*** [47]*:* The underwater image quality indicator is provided by

$$\mathrm{UIQM} = q_1 \times \mathrm{UICM} + q_2 \times \mathrm{UISM} + q_3 \times \mathrm{UIConM} \tag{17}$$

where the colorfulness, sharpness, and contrast measures are linearly combined. The value of parameters $q_1$, $q_2$, and $q_3$ depends on the application.

***Structural Similarity Index (SSIM)*** [48]*:* The SSIM formulas can be expressed as follows:

$$\mathrm{SSIM}\left(I,\ \widetilde{I}\right) = \frac{\left(2\mu_I\mu_{\widetilde{I}} + C_1\right)\left(2\sigma_{I\widetilde{I}} + C_2\right)}{\left(\mu_I^2 + \mu_{\widetilde{I}}^2 + C_1\right)\left(\sigma_I^2 + \sigma_{\widetilde{I}}^2 + C_2\right)} \tag{18}$$

where $\mu_I$ and $\mu_{\widetilde{I}}$ are the mean intensity of pixel values of reference and distorted image, respectively, and $\sigma_{I\widetilde{I}}$ is the covariance of pixel values between reference and distorted image.

***Peak signal to noise ratio (PSNR)*** [49]*:* It is calculated using the following formula:

$$\mathrm{PSNR}(I,\ K) = 10 \times \log_{10}\left(\frac{(\text{Peak value})^2}{\mathrm{MSE}(I,\ K)}\right) \tag{19}$$

where MSE represents mean square error and is defined as

$$\mathrm{MSE}(I,\ K) = \frac{1}{\mathrm{MN}} \sum_{i=0}^{M-1} \sum_{j=0}^{N-1} [I(i,\ j) - K(i,\ j)]^2 \tag{20}$$

***discrete entropy (DE)*** [50]*:* The formula for discrete entropy (H) is given by:

$$H = \sum_{i=1}^{L} p(i)\log_2(p(i)) \tag{21}$$

where $L$ is the possible intensity levels (i.e., for an 8-bit image, $L = 256$); $p(i)$ is the probability mass function of the intensity level $i$.

The detailed evaluation parameters are given in [45–50].

The proposed method is compared with ten existing state-of-the-art methods. The existing state-of-the-art methods such as Hyper-Laplacian Reflectance Prior (HLRP) [35], Multi-Purpose Oriented Real-World Underwater (MPORU) [36], Multi-Scale Retinex Color Correction (MSRCR) [37], Underwater Hybrid Technique (UHT) [38], Minimum Information Loss (MIL) [39], Hue Preserving-based Underwater Image Enhancement (HUWIE) [40], Texture Enhancement Blurriness and Color Fusion (TEBCF) [41], Color Balance

**Table 1** Comparison analysis in terms of PCQI, UCIQE, UIQM, SSIM, PSNR, and DE of the proposed method with existing methods for UIEB dataset

| Methods | PCQI | UCIQE | UIQM | SSIM | PSNR | DE |
|---|---|---|---|---|---|---|
| HLRP [35] | 0.9978 | 1.3092 | 3.5615 | *0.8725* | 30.687 | 0.2333 |
| MPORU [36] | *1.8263* | 1.2979 | 2.1050 | 0.4871 | 53.488 | 4.9705 |
| MSRCR [37] | 0.9924 | 1.0956 | **18.052** | 0.7115 | 62.241 | 5.0824 |
| UHT [38] | 0.7651 | 0.5360 | 0.8362 | 0.7345 | 37.087 | 4.9293 |
| MIL [39] | 1.0911 | 0.6591 | 5.1627 | 0.6663 | 27.104 | 5.2384 |
| HUWIE [40] | 1.2983 | 0.9834 | *15.060* | 0.7475 | *64.963* | *5.2911* |
| TEBCF [41] | 1.1466 | 0.6662 | 3.2077 | 0.7843 | 37.090 | 5.1190 |
| CBF [17] | 0.9876 | *1.7928* | 5.1176 | 0.8601 | **67.493** | 4.3828 |
| MWMGF[42] | 1.1665 | 0.6813 | 3.1369 | 0.6470 | 30.742 | 4.9986 |
| WCD [30] | 1.2742 | 0.3652 | 4.8135 | 0.3847 | 48.287 | 4.4183 |
| **Proposed** | **2.0913** | **1.9283** | 5.6921 | **0.8957** | 29.816 | **5.8682** |

Bold values represent the most optimal results and italic values represent the second highest value

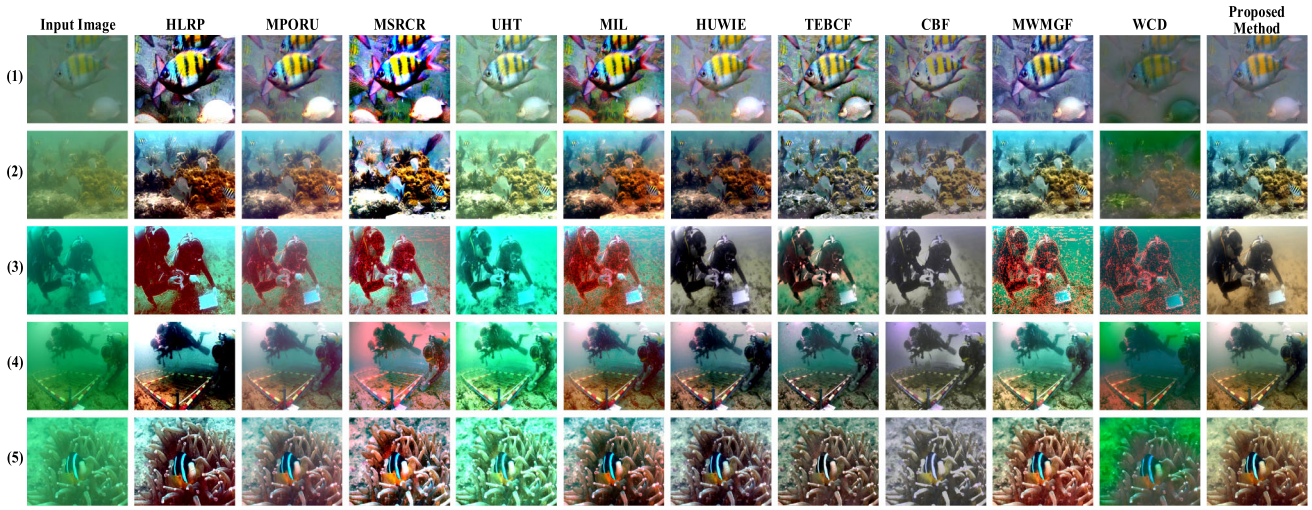


**Fig. 2** Visual comparison of the proposed method with existing state-of-the-art methods such as HLRP, MPORU, MSRCR, UHT, MIL, HUWIE, TEBCF, CBF, MWMGF, and WCD over the UIEB dataset (Color figure online)

and Fusion (CBF) [17], Multi-Weight and Multi-Granularity Fusion MWMGF [42], and Wavelength Compensation and Dehazing (WCD) [30] were among the comparative approaches used for qualitative and quantitative analysis. The parameters values used for the comparative examination of the proposed method versus other existing state-of-the-art methods are described in discussion as shown in Table 1.

## 4.1 Qualitative analysis

In this subsection, the proposed method and the existing state-of-the-art method have been implemented on the three datasets UIEB, UCCS, and UIQS. The five degraded underwater images have been taken from the underwater image enhancement benchmark dataset, and their enhanced version with different methods is shown in Fig. 2. The first column, from the left to right side, represents the input image, and the second to last column represents enhanced images of existing methods HLRP, MPORU, MSRCR, UHT, MIL, HUWIE, TEBCF, CBF, MWMGF, WCD, and the proposed method, respectively.

The result shows that the proposed approach gives better visual images compared to HLRP [35], MPORU [36], MIL [39], CBF [17], TEBCF [41], and MWMGF [42]. For input images such as image(2), image(3), and image(4) the HLRP, MPORU, MSRCR, and MIL methods show the more reddish color in their enhanced images which looks like an unnatural color as shown in Fig. 2, whereas the proposed method has a balanced color in the enhanced image. Enhanced image (5) of the MWMGF method shows better visual quality compared to the proposed method as shown in Fig. 2. On the other hand, HUWIE and WCD typically lack a natural response and have an aberrant appearance with a slightly blurred output. The results from MSRCR and UHT are optically dazzling,

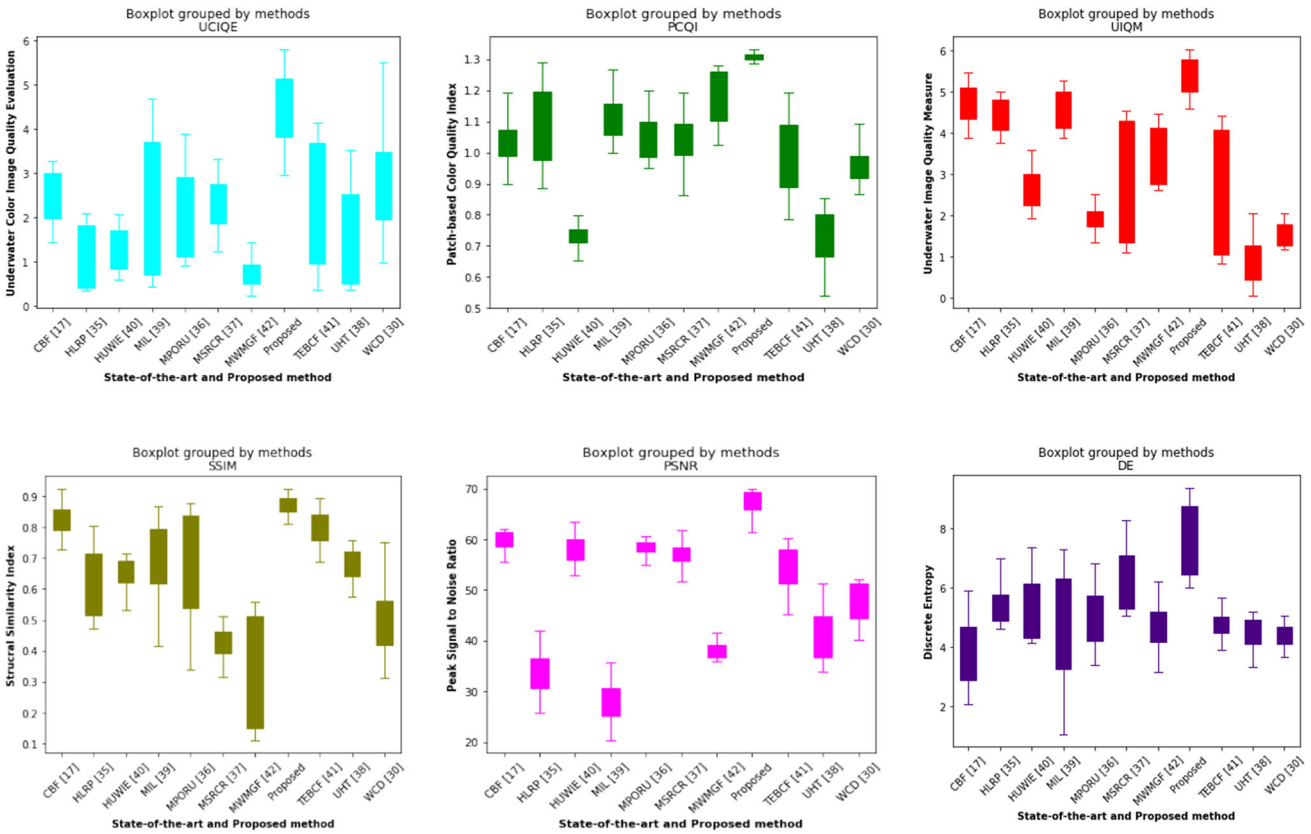


**Fig. 3** Box plot of the performance metrics such as UCIQE, PCQI, UIQM, SSIM, PSNR, and DE of the proposed method and existing state-of-the-art method over UIEB datasets (Color figure online)

but they do not seem natural. The proposed method produces good visual quality among all the methods as shown in Fig. 2.

## 4.2 Quantitative analysis

In this subsection, the proposed method is evaluated through various parameters, including the Patch-based Contrast Quality Index (PCQI) [45], underwater color image quality evaluation (UCIQE) [46], Underwater image quality measure (UIQM) [47], Structural similarity index (SSIM) [48], Peak signal to noise ratio (PSNR) [49], and discrete entropy (DE) [50]. The evaluation is conducted on UIEB, UCCS, and UIQS datasets. Table 1 lists the average values of parameters such as PCQI, UCIQE, UIQM, SSIM, PSNR, and DE for UIEB datasets. The proposed method with UIEB dataset provides PCQI, UCIQE, UIQM, SSIM, PSNR, and DE of 2.0913, 1.9283, 5.6921, 0.8957, 29.816, and 5.8682, respectively. It is observed from Table 1 that the proposed method outperforms the existing methods in terms of PCQI, UCIQE, SSIM, and DE parameters.

The box plot of various parameters is depicted in Fig. 3. The box plot represents the variation of parameter values. The box plot shows tweaking performance leverages the proposed method over other existing state-of-the-art methods.

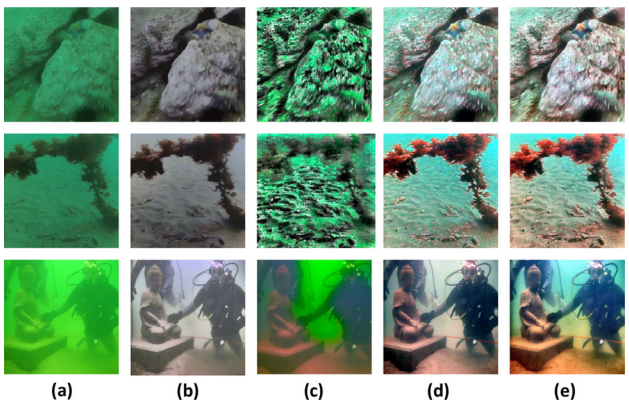


**Fig. 4** Ablated results of each core component of the proposed method on UCCS [44], UIQS [44], and UIEB [43] datasets. From top to bottom the raw images, **a** derived from UCCS [44], UIQS [44], and UIEB [43] datasets, respectively. The ablated results using, **b** -w/o TO, **c** -w/o PCA, **d** -w/o CC, and **e** TOBPCA (full model) (Color figure online)

The variation of the DE parameter of the proposed method is large compared to TEBCF, UHT, WCD, MSRCR, and HLRP, but the average value is higher than these methods. In the case of PSNR, the MIL method has the lowest value compared to other methods and the proposed method.

**Table 2** Quantitative findings from the ablation study conducted on the UCCS, UIQS, and UIEB datasets

| Ablated models | PCQI | UCIQE | UIQM | SSIM | PSNR | DE |
|---|---|---|---|---|---|---|
| - w/o TO | 1.13 | 0.74 | 4.26 | 0.73 | 26.31 | 5.62 |
| - w/o PCA | 0.98 | 0.46 | 3.62 | 0.64 | 59.58 | 4.73 |
| - w/o CC | 1.34 | 1.09 | 4.84 | 0.79 | 25.85 | 5.71 |
| TOBPCA (Full Model) | **2.09** | **1.92** | **5.69** | **0.89** | **29.81** | **5.86** |

The methods CBF, HUWIE, and MSRCR have almost the same PSNR value as shown in Fig. 3. The proposed method has less variation compared to other existing state-of-the-art methods and has the highest average value as shown in Fig. 3. The Structural similarity index of the proposed method varies between 7.5 and 9.8, which shows less variation compared to the existing method as shown in Fig. 3, the average value is greater than the existing methods. The variation of the Underwater image quality measure parameter of the proposed method lies in the range between 4.5 and 6 which shows less variation compared to other existing methods except for MPORU and WCD, but the average value of the proposed method is highest among all other methods as shown in Fig. 3. The value of PCQI varies around 1.25 to 1.35 in the proposed method which shows less variation compared to the existing method, whereas the average value is higher than other methods. It is concluded from Fig. 3 that the proposed method shows superior results compared to most of the existing methods.

### 4.3 Ablation study

In this subsection, the ablation test has been conducted on UCCS [44], UIQS [44], and UIEB [43] datasets. The ablation test of each important step in the proposed TOBPCA method separately shows how they each contribute positively to its effectiveness. Categorically, the different stages of ablation study are defined as follows: (1) the proposed method (OTBPCA) without transmission optimization (-w/o TO), (2) the proposed method (TOBPCA) without principal component analysis (-w/o PCA), (3) the proposed method (TOBPCA) without color correction (-w/o CC). From Fig. 4 it is observed the visual results that in -w/o TO model the color distortion is not present, but it fails to improve contrast of image, whereas in -w/o PCA model fails to remove color cast. The -w/o CC model does not significant enhance the texture structure of images. The proposed method (TOBPCA) yields better visual results when performed on fully integrated model. The average scores of the ablated models are given in Table 2, which represents the full model provides the higher value of PCQI, UCIQE, UIQM, SSIM, PSNR, and DE parameters. It is observed from Table 2 that each core module contributes to increase the effectiveness of the proposed (TOBPCA) method.

## 5 Conclusion

In this paper, a new image enhancement method is proposed using Transmission optimization and background light estimation via Principal component analysis (TOBPCA). The proposed method does not depend on prior information about the underwater environment. The main aim of the proposed method is to enhance the degraded underwater image. The proposed method is executed on an underwater color cast set, underwater image quality set, and underwater image enhancement benchmark database on the PCQI, UCIQE, UIQM, SSIM, PSNR, and DE. The proposed method with UIEB dataset provides PCQI, UCIQE, SSIM, and DE of 2.0913, 1.9283, 0.8957, and 5.8682, respectively. The simulation results show that the proposed method outperforms other methods in terms of PCQI, UCIQE, SSIM, and DE parameters. Ablation study contributes to the effectiveness of proposed method. It is reported that the proposed method not only enhances the degraded image but also does not disturb the naturalness of the images.

**Author contributions** Amarendra Kumar Mishra helped in conceptualization, methodology, software, data curation, investigation, writing—original draft preparation. Manjeet Kumar was involved in conceptualization, methodology, investigation, visualization, writing—reviewing and editing, supervision. Mahipal Singh Choudhry contributed to investigation, visualization, writing—reviewing and editing, supervision.

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**Data availability** The underwater Image enhancement benchmark dataset is available at link: https://li-chongyi.github.io/proj_benchmark.html and the real-world underwater image enhancement dataset is available at link: https://github.com/dlut-dimt/Realworld-Underwater-Image-Enhancement-RUIE-Benchmark.

## Declarations

**Conflict of interest** All authors of this work declare no conflict of interest.

**Ethical approval** This article does not contain any studies with animals or human participants performed by any authors.

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ORIGINAL PAPER

# Validation and Confirmation of the Equanimity Scale-16 in India and its Relationship with Well-Being

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## Abstract

**Objectives** The present study explored the psychometric properties of the Equanimity Scale-16 (ES-16) in the Indian population. It also investigated the parallel connections between equanimity and spiritual well-being, recognizing equanimity as one of the qualities of highly spiritual beings.

**Method** Three independent studies, with diverse sets of participants, were conducted using structured and established questionnaires. The first study evaluated the factorial structure of the ES-16 scale through exploratory (EFA) and confirmatory factor analysis (CFA) using a sample of 648 Indian adults. The second study evaluated the reliability of the ES-16 with the help of Cronbach's alpha and composite reliability values based on a sample of 379 respondents. The convergent validity and discriminant validity were examined using average variance explained (AVE) values. The construct validity was examined through correlation analysis of the ES-16 scale with psychological distress, as well as a gratitude scale, given the traditional association of equanimity with spiritual well-being. The third study explored test–retest reliability of the scale based on a sample of 151 participants.

**Results** The EFA yielded a 2-factor solution like the original ES-16 scale. The 2 factors—experiential acceptance and non-reactivity—could explain 61.12% of the total variance. The CFA confirmed the adequate factorial structure of the ES-16 scale. The acceptable Cronbach's alpha and composite reliability values (greater than 0.70) confirmed the reliability of the ES-16 scale. The convergent validity and discriminant validity were also confirmed in the second study. The results also reported a statistically significant positive association between equanimity and spiritual well-being.

**Conclusions** The present study concluded that both factors of equanimity are necessary to experience equanimity, and absence of one renders the other difficult. It confirmed the psychometric properties of the ES-16 in the Indian population. The results hold considerable promise for advancing research in the field of mindfulness and well-being, as well as guiding the development of interventions aimed at promoting equanimity and fostering positive mental health outcomes in the Indian context.

**Preregistration** This study or any work of the study is not preregistered.

**Keywords** Equanimity · Equanimity scale · Equanimity questionnaire · ES-16 · Psychometric

Spirituality is an intrinsic aspect of humanity that enables the person to seek transcendence, purpose, the ultimate meaning of one's existence, relationships with family, others, community, society, nature, and the significant (de Brito Sena et al., 2021; Ershov et al., 2019; Weathers, 2019). Several psychological interventions such as meditation, mindfulness therapy, integrative meaning therapy, transpersonal psychology, and positive psychology are practiced to develop spirituality among practitioners (Harrild & Luke, 2020; Koydemir et al., 2021; Law & Buckler, 2020; Wong, 2020). Along these lines, one of the constructs that is historically rooted in various indigenous schools of thought, positive psychology, and ancient scriptures of Buddhism and Hinduism and is referred to as *equanimity* (*samatva* or *upeksha* in Sanskrit; *upekka* in Pali). It has been conceptualized as an "even minded mental state or dispositional tendency towards all experiences or objects, regardless of their affective valence (pleasant, unpleasant or neutral) or source" (Desbordes et al., 2015,

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p. 357). It is also referred to as "a balanced reaction to joy and misery, which protects one from emotional agitation" (Bodhi, 2005, p. 154). Equanimity is recognized as a component of both mindfulness and karma. In a mindfulness connotation, it refers to a non-reactive stance that leads to neither to attachment and nor to avoidance (Cayoun et al., 2022a, 2022b; Cayoun, 2011; Cayoun & Elphinstone, 2022). And as a component of karma, it includes even state of mind leading to action without thinking about success or failure (Rastogi et al., 2020). Equanimity takes away sorrow of failure and joy of success and thereby it leads to non-attachment (Mulla & Krishnan, 2014). In both cases, equanimity is referred to as even-minded or balanced affection, cognition, and behaviour.

Past research has contended that individuals that practice equanimity experience enhanced well-being and mental health (Jijina et al., 2020; Juneau et al., 2020; Ng & Boey, 2021; Weber, 2020). Even in the face of provocative stimuli, it is important to maintain mental imperturbability and develop a deeper sense of discernment. The practice of equanimity is considered an essential part of mental peace and psychological well-being to be strictly followed in the spiritual pursuit (Devarakonda, 2020; Rogers et al., 2021; Wong & Faikhamta, 2021). To discipline the mind and attain holistic well-being even in times of complex challenges, it is important to cultivate even-mindedness for success and failure (Agarwal et al., 2020; Behera et al., 2020; Jijina & Biswas, 2021; Mann & Walker, 2022; Tom & Vago, 2022). Healthy well-being requires self-acceptance, deep absorption and enjoyment in activities, and a sense of fulfilment (Oishi et al., 2020, 2021). Consequently, equanimity encompasses acceptance of the present moment as it is, without judgement or resistance. Accepting both positive and negative experiences liberates one from bondage, promotes spiritual growth, and hence, reduces distress and suffering (Mulla & Krishnan, 2014).

Given the extensive application and beneficial impact of practising equanimity on spiritual well-being, mental health, and inner peace, researchers suggested scientific investigation of various facets, benefits, and challenges to equanimity (Oishi & Westgate, 2022). A few existing equanimity scales delve deeper into the concept with multiple perspectives. The Self-Other Four Immeasurables (SOFI; Kraus & Sears, 2009) scale attempts to measure 4 immeasurables (Divine Abodes), namely, kindness, compassion, joy, and equanimity on a scale containing eight pairs of adjectives. However, this scale is criticized severely as it fails to measure the true essence of equanimity and captures only one variable of gratitude, i.e. acceptance towards self and others (Rogers et al., 2021). Chan et al. (2014) developed the Holistic Well-Being Scale to measure equanimity using four factors: non-attachment, mindful awareness, general vitality, and spiritual self-care. Though the scale acknowledges the global definition of equanimity as "a state where a person abolishes his or her own sense of self" (p. 292), there are serious concerns pertaining to the narrow approach to defining the concept. Lack of attention was paid to the learning in ancient scriptures and sacred texts of Buddhism and Hinduism that describes and differentiates equanimity from detachment, indifference, mindfulness, and spirituality (Navare & Pandey, 2022). Desbordes et al. (2015) pointed out unidimensional contemporary conceptualization of mindfulness that accounts only acceptance to (pleasant and unpleasant) experiences. Although unconditional acceptance of experience is an essential component of equanimity, it should be accompanied by stable and calm non-reactivity (Hadash et al., 2016). Equanimity is therefore defined as an "intentional attitude of acceptance towards experience regardless of its hedonic tone", and "reduced autonomic reactivity to the hedonic tone of experience" (Hadash et al., 2016, p. 4). Although two dimensions of equanimity were accepted by researchers, they were measured indirectly using pre-existing scales. The distress tolerance (Schloss & Haaga, 2011; Simons & Gaher, 2005) and thought suppression scales (Rassin, 2003; van Schie et al., 2016) were used to assess acceptance, and anxiety sensitivity (Peterson & Heilbronner, 1987) and cognitive reactivity to sad mood scales (Raes et al., 2009; Van der Does, 2002) were used to capture reactivity. It necessitated the need of a direct measure of equanimity.

Noting the key limitations of the existing equanimity scales, Rogers et al. (2021) made an effort to enhance the comprehensiveness of equanimity by incorporating insights from various sacred writings. Rogers et al. (2021) developed a scale comprising 16 items (ES-16) measuring equanimity in two dimensions: experiential acceptance and non-reactivity. The scale tends to focus on the acceptance aspect of equanimity and non-reactivity, which is central to equanimity (Cheever et al., 2023; Eberth et al., 2019) but generally missed in many previous definitions (Rogers et al. (2021). Numerous researchers and scale developers pointed out the importance of exploring the psychometric properties of the ES-16 in different contexts and across cultures (Barua & Burgess, 2022; Cayoun et al., 2022a, 2022b; Cheever et al., 2023; Rajendran, 2023; Rashidian et al., 2022; Shires et al., 2023). Accordingly, this study explores the psychometric properties of the scale in the Indian population.

The validation and assessment of the Equanimity Scale-16 is important for India due to two reasons. First, India is a country with a documented history of highly spiritual individuals and those who embody equanimity. Despite this fact, a fraction of studies has sought to work in the exploration of the related concepts (McClintock et al., 2016; Philip et al., 2021; Rai & Banerjee, 2019; Thakur & Singh, 2016; Van der Veer, 2009). The

literature has rarely made attempts to expand the study of equanimity and spiritual well-being within Indian samples. Second, the origin, definition, and dimension of the concepts like equanimity and spirituality are largely borrowed from the teachings of Hindu and Buddhist sacred texts, the Bhagavad Gita and Ramayana. Numerous attempts are underway to take advantage of ancient scriptures to find ways to cope with uncertainty and complexities and promote the idea of a balanced work-life. Their teachings continue to be relevant in contemporary times, guiding individuals seeking meaningful life journeys. Therefore, the present study investigates the suitability of the ES-16 for the Indian population by examining its psychometric properties in the pursuit of measuring equanimity and spiritual well-being, which may help to contribute to a purpose-driven existence in India. This study aimed to validate the ES-16 scale among Indians with the help of three studies.

The first study examined the factorial structure of the ES-16 with the help of exploratory factor analysis (EFA) and confirmatory factor analysis (CFA) conducted on two different independent samples. Study 2 explored the reliability of the scale using Cronbach's alpha (CA) and composite reliability (CR) values. Also, the convergent validity and discriminant validity were examined using average variance explained (AVE) values and the Fornell and Larcker (1981) criterion. The construct validity was examined through correlation analysis of the ES-16 scale with gratitude and psychological distress. In the third study, test–retest validity of the ES-16 was assessed by examining the correlation coefficient between two equanimity scores calculated by collecting the data twice in a period of 15 days.

## Study 1: Factorial Validity

### Method

#### Participants

Data were collected from 648 Indian adults through a Google form comprised of structured questionnaires circulated on social media platforms through Facebook, LinkedIn, and Instagram. Indian citizens above the age of 18 years were requested to respond to the questionnaire. Table 1 reports a demographic description of the sample.

#### Procedure

Study 1 evaluated the factorial structure of the ES-16 in the Indian population with the help of EFA and CFA conducted on two different independent samples. Given the distinct two dimensions of the scale, the extraction of a 2-factor model was hypothesized in this study. Informed consent of participants was sought by requesting them to tick on the checklist. They were also promised anonymity, privacy, and strict academic use of collected data. In addition, respondents were told that the data would not be shared with any third party.

#### Measures

The first section of the questionnaire collected demographic data like age, gender, and education level. The second section measured respondents' equanimity level using the ES-16 scale developed and validated by Rogers et al. (2021). This scale is a self-report measure comprised of 16 items organized in two dimensions: experiential acceptance (8

**Table 1** Demographic description

| Variables | Category | Study 1 | | Study 2 (*n*) | Study 3 (*n*) |
|---|---|---|---|---|---|
| | | Sub-sample 1 (*n*) | Sub-sample 2 (*n*) | | |
| Gender | Female | 140 (43.21%) | 143 (44.14%) | 189 (49.87%) | 84 (55.63%) |
| | Male | 184 (56.79%) | 181 (55.86%) | 190 (50.13%) | 67 (44.37%) |
| Age | Below 25 years | 73 (22.53%) | 67 (20.68%) | 80 (21.11%) | 144 (95.36%) |
| | 26–35 years | 110 (33.95%) | 121 (37.35%) | 137 (36.15%) | 7 (4.64%) |
| | 36–45 years | 97 (29.94%) | 88 (27.16%) | 104 (27.44%) | — |
| | Above45 years | 44 (13.58%) | 48 (14.81%) | 58 (15.30%) | — |
| Education level | Below graduation | 55 (16.98%) | 67 (20.68%) | 61 (16.09%) | — |
| | Graduate | 178 (54.94%) | 188 (58.02%) | 212 (55.94%) | 151 (100%) |
| | Above graduation | 91 (28.09%) | 69 (21.30%) | 106 (27.94%) | — |
| Marital status | Married | 181 (55.86%) | 192 (59.26%) | 208 (54.88%) | 11 (7.28%) |
| | Unmarried | 132 (40.74%) | 124 (38.27%) | 153 (40.37%) | 140 (92.72%) |
| | Separated | 11 (3.40%) | 8 (2.47%) | 18 (4.75%) | — |
| | Total (number of individuals) | 324 (100%) | 324 (100%) | 379 (100%) | 151 (100%) |

items; e.g. "I approach each experience by trying to accept it, no matter whether it is pleasant or unpleasant") and non-reactivity (8 items; e.g. "I am impatient and can't stop my reactivity when faced with other people's emotions and actions"). Items were rated on a 5-point Likert scale ranging from 1 (*strongly disagree*) to 5 (*strongly agree*). Out of 16 items, 8 items were reverse scored in accordance to the scoring instructions provided by Rogers et al. (2021). The questionnaire was surveyed in English as the language is promoted as an essential means of communication for educational and professional purposes. Also, English is introduced and taught to Indian students right from their initial schooling days.

#### Data Analyses

All analyses were performed on IBM Statistical Package for Social Sciences (SPSS) Statistics 25 and Analysis of a Moment Structures (AMOS). The sample of 648 participants was divided into two sub-samples using systematic random sampling, wherein odd responses were included in sub-sample 1 and even were made part of sub-sample 2. The first sub-sample was used to extract significant and meaningful factors from 16 statements of ES-16 using EFA. Prior to EFA, Kaiser–Meyer–Olkin (KMO) and Bartlett's test of sphericity were conducted to check the suitability of data for factor analysis. The KMO value was 0.89, which was higher than the threshold value of 0.70. Also, Bartlett's test of sphericity was also significant at $p < 0.05$ level of significance. The findings concluded the appropriateness of data for EFA. The second sub-sample evaluated the fitness of extracted model using CFA. All assumptions of CFA, including normality, random sampling, and priori model specifications, were ensured. The normality of data was ensured using the Kolmogorov–Smirnov test, which showed significant value at 0.05 that concluded normality of data. Also, data were collected using random sampling. In addition, the CFA model was based on priori model specified through EFA. The suggested values of model fit indices were RMSEA $< 0.08$, SRMR $\leq 0.05$, GFI $\geq 0.95$, CFI $\geq 0.97$, and TLI $> 0.90$ (Hu & Bentler, 1999; Tabachnik & Fidell, 2007).

## Results

EFA using principle component analysis extraction with oblimin rotation was conducted as extracted factors are poised to be related to each other. EFA yielded a 2-factor solution, which replicated the model structure of the original ES-16 scale. All experiential acceptance items were loaded onto one factor and all non-reactivity items were included onto another; thus, the extracted 2 factors were referred to their original nomenclatures, i.e. experiential acceptance and non-reactivity. One of the items ("I am not able to tolerate discomfort") showed relatively lower but acceptable factor loading of 0.312. These 2 factors, experiential acceptance and non-reactivity, could explain 61.12% of the total variance. Table 2 reports factor loadings and total variance of the 16 items of the equanimity scale. CFA was conducted on the second sub-sample to validate the factorial structure of the ES-16 extracted through EFA. The 2-factored ES-16 yielded satisfactory values of RMSEA = 0.04, SRMR = 0.02, GFI = 0.98, CFI = 0.99, and TLI = 0.99 with no significant relationship between error co-variances. Thus, CFA results suggested satisfactory factorial validity of the ES-16, which were further subjected to reliability and validity exploration in Study 2. Figure 1 presents the CFA model of the ES-16 in the Indian population.

## Study 2: Reliability and Validity Testing

### Method

#### Participants

Data were collected from 379 Indian adults through a Google form comprised of a structured questionnaire. It was circulated on several social media platforms like Facebook, LinkedIn, and Instagram. Only Indian citizens above the age of 18 years were requested to respond to the questionnaire. Table 1 reports a demographic description of the sample. Again, due process of informed consent, anonymity, privacy, and strict academic use of collected data was followed.

#### Measures

The first two sections of the questionnaire captured demographic information and the equanimity level of participants using the ES-16. In addition to that, measures of gratitude, spiritual well-being, and psychological distress were included.

**Gratitude** Gratitude was measured using Gratitude Questionnaire-6 (GQ6), developed by McCullough et al. (2002), which is a 6-item measured on a 7-point rating scale ranging between 1 (*strongly disagree*) and 7 (*strongly agree*). It was used to examine an individual's experience of gratitude (Byrne, 2020). A few of its statements were "I have so much in life to be thankful for" and "I am grateful to a wide variety of people". Cronbach's alpha and composite reliability values of the GQ-6 in this study were 0.84 and 0.58.

**Spiritual Well-Being** It was captured using the spiritual well-being scale (SWBS) established by Paloutzian and Ellison (1982). It was a 20-item scale measured on a 6-point rating

**Table 2** Factor structure (Study 1)

| No | Statements | Loadings | Eigenvalues |
|---|---|---|---|
| *Experiential acceptance* | | | |
| 1 | When I experience distressing thoughts and images, I am able to accept the experience | 0.611* | 4.172 |
| 2 | I approach each experience by trying to accept it, no matter whether it is pleasant or unpleasant | 0.749* | |
| 3 | When I have a distressing thought or image, I "step back" and am aware of the thought or image without getting taken over by it | 0.733* | |
| 4 | When I have distressing thoughts or images, I am able just to notice them without reacting | 0.838* | |
| 5 | I can pay attention to what is happening in my body without disliking or wanting more of the feeling or sensation | 0.682* | |
| 6 | I endeavor to cultivate calm and peace within me, even when everything appears to be constantly changing | 0.790* | |
| 7 | I perceive my feelings and emotions without having to react to them | 0.684* | |
| 8 | I remain present with sensations and feelings even when they are unpleasant | 0.664* | |
| *Non-reactivity* | | | |
| 1 | When I notice my feelings, I have to act on them immediately | 0.817* | 3.827 |
| 2 | I notice that I need to react to whatever pops into my head | 0.784* | |
| 3 | I am impatient and can't stop my reactivity when faced with other people's emotions and actions | 0.750* | |
| 4 | I am not able to prevent my reaction when someone is unpleasant | 0.668* | |
| 5 | If I notice an unpleasant body sensation, I tend to worry about it | 0.737* | |
| 6 | When I feel physical discomfort, I can't relax because I am never sure it will pass | 0.646* | |
| 7 | I can't keep my mind calm and clear, especially when I feel upset or physically uncomfortable | 0.756* | |
| 8 | I am not able to tolerate discomfort | 0.312 | |

*Satisfactory factor loadings (i.e. greater than |0.5|)

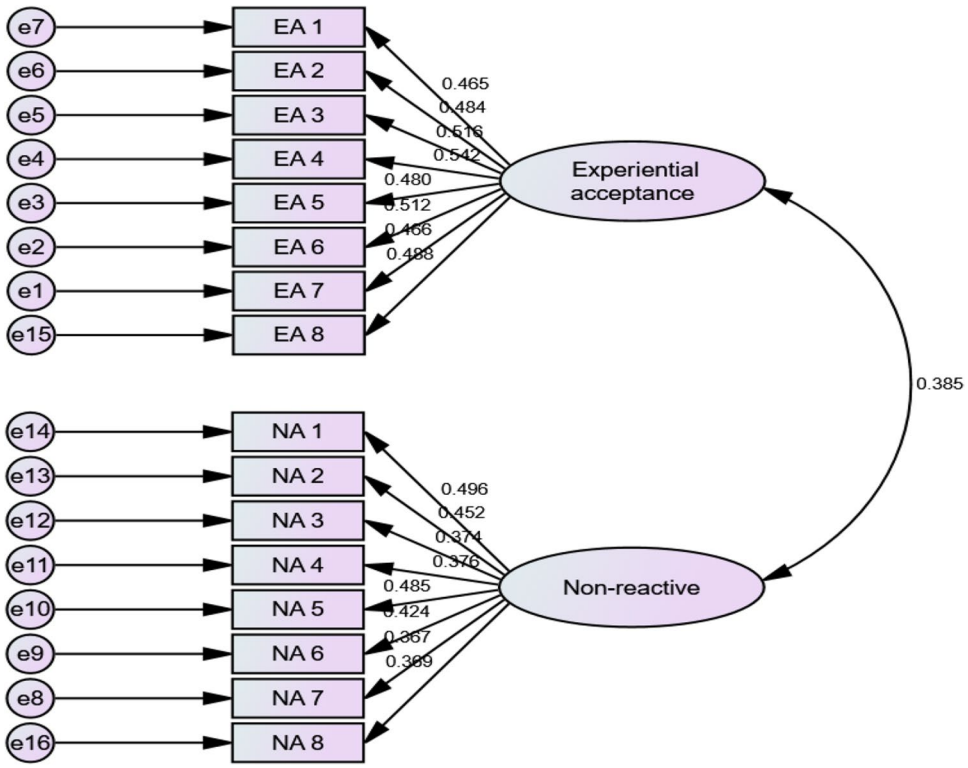


**Fig. 1** Results of CFA model (Study 1)

scale ranging between 1 (*strongly disagree*) and 6 (*strongly agree*). It measured two dimensions of spiritual well-being: religious well-being and existential well-being (Paloutzian & Ellison, 1982, 1991; Paloutzian et al., 2021). A few items were "I do not find much satisfaction in private prayer with God" and "I feel that life is a positive experience".

Cronbach's alpha and composite reliability values of the spiritual well-being scale in this study are 0.77 and 0.56.

**Psychological Distress** It was assessed using the Kessler Psychological Distress Scale (K10) developed by Kessler et al. (2003). It was a 10-item scale measured on a 5-point rating scale ranging between 1 (*none of the time*) and 5 (*all of the time*). A few of its statements were "In the past four weeks, about how often did you feel hopeless?" and "In the past four weeks, about how often did you feel worthless?"(Brooks et al., 2006; Kessler et al., 2003; Pereira et al., 2019). Cronbach's alpha and composite reliability values of the psychological distress scale in this study were 0.74 and 0.52.

### Data Analyses

Study 2 evaluated the reliability of the ES-16 with Cronbach's alpha and composite reliability values. The threshold values of reliability estimates were 0.70 (Cronbach & Shavelson, 2004; Kalkbrenner, 2023; Lai, 2021). The convergent validity was examined using AVE values, whose acceptable values are above 0.50. The Fornell and Larcker (1981) criterion was used to explore the discriminant validity of the ES-16. The construct validity was examined through correlation analysis of the ES-16 with gratitude and psychological distress.

## Results

As shown in Table 3, Cronbach's alpha values for the ES-16, experiential acceptance, and non-reactivity were 0.90, 0.88, and 0.87, respectively. Also, composite reliability estimates of the ES-16, experiential acceptance, and non-reactivity were 0.87, 0.86, and 0.86, respectively. These values are greater than acceptable value of 0.70, which concluded the reliability of the ES-16 in the Indian population. The average values explained for the ES-16, experiential acceptance, and non-reactivity were 0.57, 0.55, and 0.57, which confirmed convergent validity of the scale. Results from discriminant validity using Fornell and Larcker's (1981) testing criterion are shown in Table 3. It was found that the square root AVE values were greater than the correlation between experiential acceptance and non-reactivity, which established the discriminant validity of ES-16 in the Indian population.

Further, the construct validity of the ES-16 scale was explored by examining the association between equanimity, gratitude, and distress. It was believed that respondents with a high level of equanimity increase one's awareness and appreciation towards the goodness of life, which leads to greater levels of gratitude. Thus, it was hypothesized that equanimity would be positively related to gratitude. Further, previous studies have suggested that people with equanimity were less likely to feel depressed (Weber, 2020; Zhong, 2023). Thus, it was hypothesized that equanimity would be negatively associated with psychological distress. Table 4 shows that gratitude was significantly positively related to overall equanimity ($r = 0.41$, $p < 0.05$), experiential acceptance ($r = 0.389$, $p < 0.05$), and non-reactivity ($r = 0.37$, $p < 0.05$). Also, significant negative correlations were reported between psychological distress and overall equanimity ($r = -0.57$, $p < 0.05$), experiential acceptance ($r = -0.59$, $p < 0.05$), and non-reactivity ($r = -0.58$, $p < 0.05$). These results established the construct validity of the ES-16 in the Indian population. Previous studies suggested a positive linkage between equanimity and spiritual well-being. The regression analysis results suggested that both dimensions of equanimity, i.e. experiential acceptance ($\beta = 0.365$, $p < 0.05$), and non-reactivity ($\beta = 0.423$, $p < 0.05$) were significant predictors of spiritual well-being. It was also observed that equanimity could explain 41% of variations in spiritual well-being. It concluded that equanimity is a significant predictor of spiritual well-being.

## Study 3: Test–Retest Reliability

### Method

#### Participants

The ES-16 scale was shared with 200 postgraduate students, out of whom 172 responded. The same 172 participants were again approached after 15 days. They were again requested

**Table 3** Descriptive statistics, reliability, and validity measures (Study 2)

| Variable | Mean | *SD* | $\alpha$ | CR | AVE | EA | NR |
|---|---|---|---|---|---|---|---|
| Experiential acceptance | 2.893 | 0.890 | 0.903 | 0.874 | 0.57 | 1 (0.754) | |
| Non-reactivity | 3.150 | 0.935 | 0.882 | 0.866 | 0.55 | 0.406[†] | 1 (0.741) |
| ES-16 | 3.087 | 0.742 | 0.870 | 0.857 | 0.57 | — | —- |

*SD*, standard deviation; $\alpha$, Cronbach's alpha; *CR*, composite reliability; *EA*, experiential acceptance; *NR*, non-reactivity. Bold values indicate square root of AVE (diagonally), [†] indicates correlation between experiential acceptance and non-reactivity

**Table 4** Correlation matrix (Study 2)

| Variables | ES-16 | EA | NR | SWBS | RWB | EWB | GQ6 | K10 |
|---|---|---|---|---|---|---|---|---|
| ES-16 | 1 | | | | | | | |
| EA | 0.668 | 1 | | | | | | |
| NR | 0.562 | 0.406 | 1 | | | | | |
| SWBS | 0.417 | 0.389 | 0.373 | 1 | | | | |
| RWB | 0.456 | 0.420 | 0.366 | 0.589 | 1 | | | |
| EWB | 0.476 | 0.483 | 0.352 | 0.557 | 0.578 | 1 | | |
| GQ6 | 0.428 | 0.358 | 0.374 | 0.542 | 0.436 | 0.484 | 1 | |
| K10 | -0.570 | -0.591 | -0.582 | -0.363 | -0.312 | -0.370 | -0.534 | 1 |

*EA*, existential acceptance; *NR*, non-reactivity; *SWBS*, spiritual well-being scale; *RWR*, religious well-being; *EWB*, existential well-being; *GQ6*, Gratitude Questionnaire-6; *K10*, Kessler Psychological Distress Scale. All values are significant at 0.05

to fill in the same questionnaire, and now 151 responded. Table 1 highlights a demographic description of the sample.

### Procedure

Test–retest validity of the ES-16 was assessed by examining the correlation coefficient between two equanimity scores calculated by collecting the data twice with a 2-week interval. The sequences of questions were changed to avoid familiarity bias. Due process of informed consent, anonymity, privacy, and strict academic use of collected data were followed.

### Measures

The questionnaire collected demographic data like age, gender, and education level and respondent's equanimity level using the ES-16.

## Results

The correlations between two scores of the ES-16 and its two dimensions observed in two different periods (Time 1 and Time 2) were explored. Results showed positive correlations between the overall equanimity ($r = 0.87$, $p < 0.05$), experiential acceptance ($r = 0.92$, $p < 0.05$), and non-reactivity scores ($r = 0.821$, $p < 0.05$) at Time 1 and Time 2. These results established the test–retest validity of the scale in the Indian population.

## Discussion

The present study explored the validity of the Equanimity Scale-16 (ES-16) developed by Rogers et al. (2021) and its intriguing relationship with well-being among the Indian population. The results demonstrated the reliability and validity of the scale, as well as its significant associations with gratitude, psychological distress, and spiritual applications in the Indian population. Notably, the 2-factor solution obtained for the ES-16 was consistent with the original scale. One of the items ("I am not able to tolerate discomfort") showed relatively lower factor loading of 0.31, but the item was retained. This item seems theoretically fit to capture non-reactivity. It measures one's state of mind to remain non-reactive amid uncomfortable and challenging situations and people. Although it contributes marginally, it does so meaningfully to the factor.

The adequate Cronbach's alpha values (0.87) and composite reliability (0.86) estimates for the ES-16 suggest confirm the scale's reliability. The evaluation of convergent and discriminant validity successfully captures the intended constructs of experiential acceptance and non-reactivity, demonstrating that the ES-16 differentiates between these two constructs effectively. These results lend further support for the decoupling model (Hadash et al., 2016) and 2-factor model by Rogers et al. (2021), both of which suggest that equanimity contains two dimensions, experiential acceptance and non-reactivity. Both factors are necessary to experience equanimity and absence of one renders the other difficult. For instance, one may fully accept a situation but may respond out of grief, anger, or revenge. Similarly, one might be non-reactive after the end of a marriage but simultaneously fails to accept the lack of closeness, trust, and love with spouse.

Moreover, the study explored the construct validity of the ES-16 by examining its association with gratitude, and psychological distress. The results indicated positive correlations between overall equanimity and its dimensions with gratitude, while negative correlations were observed with psychological distress. These findings align with the theoretical background of equanimity, suggesting that individuals with higher levels of equanimity are more likely to experience and express gratitude while experiencing lower levels of psychological distress (Juneau et al., 2020; Shires

et al., 2023; Tom & Vago, 2022; Wongpakaran et al., 2021). The significant prediction of spiritual well-being by equanimity highlights the importance of cultivating equanimity. These results are in accordance with the findings of Behera et al. (2020).

Through demonstrating the associations of equanimity with gratitude and lower psychological distress, this study contributed to theoretical models and frameworks explaining the role of equanimity in enhancing psychological well-being (Juneau et al., 2020; Webber, 2022). These results hold considerable promise for advancing research in the field of mindfulness and well-being, as well as guiding the development of interventions aimed at promoting equanimity and fostering positive mental health outcomes in the Indian context (Anālayo, 2021; Novak, 2020; Weber, 2021). It highlights the relevance of spiritual well-being as a dimension of overall mental health and well-being, encouraging researchers and practitioners to consider spirituality in mental health assessments and interventions. This study also provides evidence that the ES-16, developed with the traditional Buddhist construct in mind, is a good fit for the Indian culture, where this construct originated. Additionally, the integration of the ES-16 scale in clinical assessments can provide valuable insights for mental health professionals working with the Indian population. It enables clinicians to gain a comprehensive understanding of clients' equanimity levels and their association with spiritual well-being, aiding in personalized treatment planning and intervention. The findings of the study offer a promising avenue for measuring mental health in India. Public health initiatives can be designed using the ES-16 to encourage mindfulness practices, meditation, and spiritual exploration to foster mental resilience and overall well-being among the population. It has been found in past research that the work pressure and targets at organizations make employees feel more stressed and depressed as compared to their performance at home (Breaugh, 2021; Irawanto et al., 2021; Nanda et al., 2020; Sutrisno, 2022).

### Limitations and Future Research

The study's cross-sectional design only provides a snapshot of the participant's responses at a specific point in time. Longitudinal studies would offer more robust insights into the stability and changes in equanimity, spiritual well-being, and their relationship over time. The observed correlations among the constructs of the study may be influenced by additional variables and confounding factors such as personality traits and coping mechanisms. Another limiting factor of the study is using gratitude as a measure for the scale's construct validity. Although both gratitude and equanimity are related to spiritual well-being, being non-reactive and accepting one's experience does not necessitate being grateful. However, it is also likely that the well-being resulting from cultivating equanimity promotes gratitude, for example towards those who may have contributed to one's spiritual well-being. Future research, possibly using mediation analysis, may examine the relationship between these two constructs more effectively. Future studies should address these limitations and expand the scope of the study in the following ways: (1) Comparing the psychometric properties of the ES-16 scale across different cultural groups within and outside India would enhance the scale's cross-cultural validity. (2) Qualitative research methods, such as interviews, could provide in-depth insights into participants' experiences of equanimity and spiritual well-being, complementing the quantitative findings. (3) Future researchers should use a variable other than gratitude to assess construct validity of the scale. (4) Future studies might examine the predictive validity of the ES-16 in India, which may be examined following a mindfulness-based intervention that focuses on cultivating equanimity.

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**Author Contribution** Both authors Shivangi Verma and Naval Garg were equally involved in conceptualization, data collection, analysis, writing, and finalizing the paper.

**Data Availability** The collected data could not be shared, as we promised participants utmost confidentiality. We promised participants that the collected data would not be shared with third party.

## Declarations

**Ethical Approval and Consent to Participate** All methods in studies involving human subjects were carried out in line with the institutional and/or national research committee's ethical standards, as well as the 1964 Helsinki Declaration and its subsequent amendments or similar ethical standards. Informed consent of participants was taken by requesting them to tick on the checklist.

**Competing Interests** The authors declare no competing interests.

**Use of Artificial Intelligence** No use of artificial intelligence tools.

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# Version Control System Gateway to Optimize Firmware over the Air (FOTA) Update for IoT Wireless Devices

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**Abstract**
IoT (Internet of Things) use cases cover all the verticals of industry/organization. From manufacturing unit to building management, from X protocol to Y protocol, from A device to Z device; everywhere it is using. The number of IoT devices is increasing exponentially, especially in remote areas. These devices, which are deployed, need to update also, as the software development process for an IoT device is not a one-time action. Even devices running on a small software needs to be updated with the time for bug fixing or feature addition."Using more computing to move less data" is the new computing paradigm. Hence, low internet connectivity for large computing scale software updates of such IoT devices must be considered. In this paper, we proposed an implementation of a method that needed low internet connectivity for Firmware Over the Air (FOTA) of embedded devices.

**Keywords** Internet of things · IoT · Wi-Fi · Software update · Firmware update · Security · Version control · Constrained device

## 1 Introduction

The The number of IoT devices has already reached 30 billion in the current market, and it is expected to grow several times the global population by 2022 [1]. Deployment of IoT devices is not just limited to Smart cities and smart homes but also used in remote areas. Remote areas like agriculture, manufacturing also use a lot of IoT devices. This ecosystem has fully independent, task-specific IoT devices and small embedded computer systems integrated into devices.

In terms of connectivity, IoT devices are broadly divided into two parts. The first type is the devices directly connected to the internet and called IP Devices. The second type is the devices that cannot connect to the internet independently and use another device to connect

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to the internet and are called devices connected via a gateway. This paper provides a solution for the firmware update of devices connected to the internet via the gateway. These devices are also known as sub-device.

In the IoT world, embedded software is known as firmware, and updating the software of embedded devices over the wireless medium is known as FOTA (Firmware over the Air). Before FOTA, the update of embedded devices was done manually by connecting the devices to the PC using some interface (USB/UART, etc.). Nowadays, FOTA provides an easy, secure, and fast way to update the devices with the latest firmware [2]. Updating the device is a two-stage process. Firstly the user has to trigger the FOTA, and the device has to authenticate the request. Secondly, the device has to apply the firmware safely [3]. In case of some error during FOTA, a mechanism is provided to reset the device firmware to the factory setting. Once the user triggers the firmware update, the IoT device will receive the update. In the update process, the device first receives the manifest [4, 5], which contains meta-information about firmware binary, which helps authenticate it at the device side. A gateway (called edge gateway) via which all devices are connected to a web server/cloud and act as a centralized unit to control all the devices. An edge gateway is used to send firmware files required to update target devices. This FOTA flow is shown in Figure 1.

Different devices using different protocols can be connected to the gateway, as shown in Figure 2. Protocols used are Wi-Fi, BLE, Zigbee, or Non-IP like BACnet, Modbus, etc. In the FOTA process, good internet connectivity is required to trigger the firmware update from the cloud side. There are many types of errors that can generate during FOTA. Here are some examples:

- Intermittent network failure
- Power reset or device shut down during the upgrade process

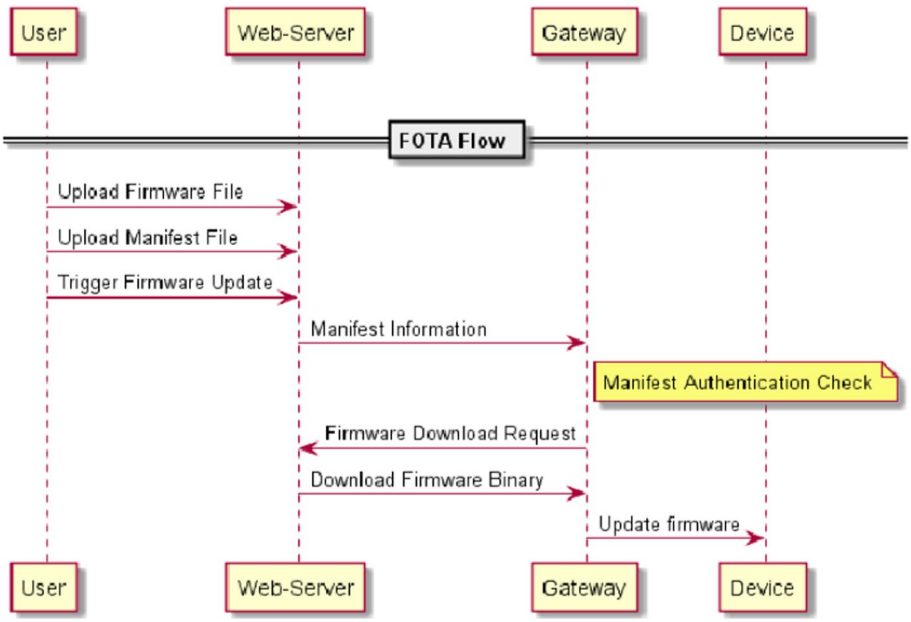


**Fig. 1** Normal FOTA flow

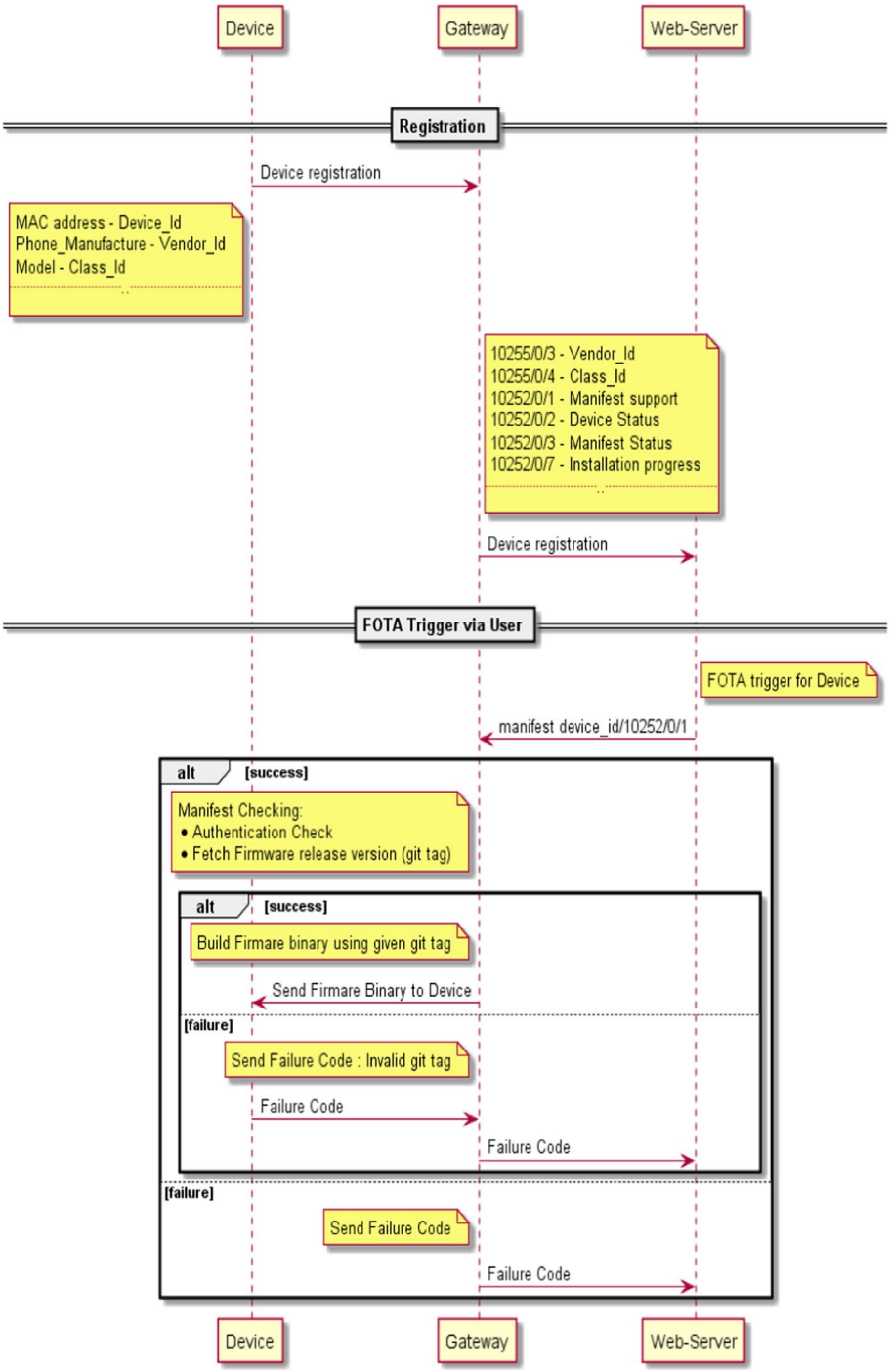


**Fig. 2** Proposed FOTA method

- Firmware file corruption during download

Usually, IoT devices do not need to transfer bulk data together. They need to send a small chunk of data periodically. But in FOTA updates, devices need to transfer bulk data in megabytes or gigabytes. In those areas where internet connectivity is poor, it will be hard for the gateway to download and send large firmware files to targeted devices which may lead to deception in data. So In this paper, a novel method is proposed that can overcome the described challenges in a reliable manner.

The proposed solution suggests a framework in which a device can create the necessary binary "on-prem" (On-premise) instead of downloading the firmware from the cloud. In this process, a "build machine" is involved, which contains the code, the toolchains, and version control software needed to build the binary. The build machine can be a dedicated machine, or the gateway can also act as a build machine. The build machine will first parse the request as the build machine receives the code change request. If the parsed request contains a release change request tag, the build machine starts building the binary to update the connected device. Once the binary is created successfully, the gateway will trigger firmware up-gradation. Cloud doesn't play many roles in FOTA trigger. Data required to build the binary is significantly lower than downloading the entire binary from the cloud. The build machine will also send the device's intermediate stages of firmware up-gradation status. Build machine will also send the status to the device if it fails to build the code for the end device or fails to upgrade the device successfully. The build machine will make sure to roll back the device's firmware in case of any failure. A gateway as a build machine with different partitions is used in the proposed method.

This paper is organized in these sections: Section 2 presents related work. The design and architecture of the proposed method is discussed in section 3. Security Aspects of the Proposed Method in Section 4 and finally, conclusions and future work are drawn in section 5.

## 2 Related Work

IoT (Internet of Things) is a hot topic in the current market, and its challenges and issues [6, 7] catch the researcher's attention. WoT (Web of Thing) [8] was introduced to develop, spread and test IoT systems. FOTA is always challenging work, and researchers are trying to find answers like Is the present FOTA solution efficient enough for the current environment?

An IoT FOTA work is a particular case of the standard software update, and literature reviews are divided into three categories, namely:

(a) Different FOTA standard,
(b) Security side work, and
(c) Device side work

### 2.1 FOTA Standard

Many open standards are available for FOTA, and their comparison is made by researchers [9]. LwM2M (Lightweight Machine-to-Machine) is an open standard for IoT devices and has the highest applicability [10]. IoT system design in a way that follows the principles

of the Representational State Transfer (REST) architectural style [11]. To develop Firmware update features, LWM2M covers every aspect, whether Manifest (Content and result) or Device state (before and after update). FOSE (Firmware Object Signing and Encryption) [12] in which firmware data is encrypted using JSON object signing. CoAP [13] and MQTT [14] are the two most applicable protocols for lightweight messaging between IoT devices. CoAP uses block transfer [15] to support extensive data used in Firmware binary transfer. Thantharate proposed different CoAP and MQTT-based models for the firmware update [16]. The architecture extends the capabilities of the existing IoT/M2M standard platform by incorporating OMA LWM2M for simplified device management [17].

When many nodes are present in a wireless sensor network, data flows through the server to nodes. This data can be reduced, as shown in a Two-phase dissemination scheme for CoAP-based FOTA update of wireless sensor networks [18].

### 2.2 Security

An Important aspect of FOTA concerns security. It can be anything from authentication, data integrity, data confidentiality. S.S. Basu [19] talks about connectivity and data transmission security and several frameworks developed for a secure software update of embedded devices [20]. A safe framework designed for the firmware update, especially for vehicle networks [21].

FOTA [22] also uses multiple system images to overcome challenges, which provide a good amount of reliability on the cost of redundancy. In another paper, a smart meter network (in which all nodes are the same and need the same firmware update) needs multicasting of firmware update, A secure and reliable multicast protocol developed which provides confidentiality, access control, and message authentication [23]. Here the problem with the IEEE 802.11s-based SG AMI network was also addressed.

### 2.3 Device Side

Andrew and his co-workers analyzed web interfaces within IoT devices, and they developed a framework to automate the dynamic analysis of firmware [24]. Presented framework found vulnerabilities in the web system of IoT devices FOTA. Reverse engineering is a common approach that security analysts use to test the security of any system. The same method is used to test firmware also [25]. For different chipsets like the STM32 series [26], the ESP8266 firmware update study is done, and studies show how firmware can update on particular devices from the cloud [27, 28]. On the same chipset, firmware modification attacks are addressed [29].

Device firmware update improvement is also a research topic; instead of an entire image, a partial firmware image is used to update the device [30]. The low resource-demanding method is used to update IoT devices' firmware [31].

## 3 Design & Architecture of the Proposed Method

Components: Based on all available standards and methods we take the following building blocks to develop our proposed FOTA method.

- Ubuntu core to work as Gateway.

- An Android phone to work as a Virtual Device.
- An Ubuntu 18.04 machine to work as a Web-Server.
- The IETF SUIT manifest standard to develop firmware metadata.
- Wi-Fi protocol to transfer data between gateway and nodes.
- The CoAP transport stack.
- The LwM2M based IoT device management webserver.
- AES 256-bit encryption engine.
- Apache webserver

A system with a lightweight hypervisor [32, 33] is selected for this prototype, but this is applicable for any other available operating system and device.

### 3.1 System Overview

The proposed FOTA method and system are discussed in Fig. 2. The following vital players play an important role under the IoT framework:

*Device*: The device is connected to the gateway using a Wi-Fi link. Device MAC address is used as device_id, Android device's Manufacturer as vendor_id, and model-name as class_id. When a device connects to the gateway, data in plain-text format is sent to the gateway. Following device register on the webserver with the help of the gateway.

*Gateway*: System OS can behave as a Wi-Fi hotspot [34]. When a device connects to the gateway for the first time, the gateway receives registration information. On Gateway (Core OS), a CoAP client also runs, using standard LwM2M resources to register devices with the Web-Server. Git is used for code versioning software, and a basic firmware code is already deployed at the gateway Fig. 3.

*Webserver*: The apache webserver is used to host our web application. From here, users can control the IoT devices. Users can view registered devices and can trigger firmware updates from here. A CoAP server runs on the Web-Server, and code sync to the gateway also happens here.

### 3.2 Data Communication

*Code Checkout on Gateway*: On Gateway a socket git hook is used to check out the code. Suppose any code is checked in, it will notify Gateway and code will be pulled at gateway side. So, Gateway always has the latest firmware code.

*LWM2M Bootstrap*: Authentication & provision of LWM2M client and registration with LWM2M server done using this method. In our setup, we use Leshan [35] to implement it,

**Fig. 3** Registered device shown at webserver UI

which is an open-source OMA lightweight machine to machine implementation (server & client).

*Register Device*: To register the device, the device sends its information to Gateway (Information is encrypted using AES) and with this information, the device gets registered to Web- Server. Following CoAP message transferred from Gateway to Web-Server:

- Uri-Path: rd
- Status: COAP_STATUS_OK
- Code: COAP_MSG_CODE_REQUEST_POST
- Type: COAP_MSG_TYPE_CONFIRMABLE
- Id: 1178
- Token: 02:00:00:00
- Payload:

In Payload we have send following (Shown in Table 1)

LWM2M <object/object_value/resource> with default values. On the Web-Server side we can see the device registered successfully.

*FOTA Trigger*: Now we will trigger the Firmware update from the web portal. A manifest need to be given which has all the meta-information about firmware.

On FOTA trigger following CoAP packet (Manifest) sent from Web-Server.

- Uri-Path: 10,252/0/1
- Status: COAP_STATUS_OK
- Code: COAP_MSG_CODE_REQUEST_POST
- Type: COAP_MSG_TYPE_CONFIRMABLE
- Id: 20,535
- Token: 36:db:b7:78

**Table 1** Values of LWM2M Objects & Resources [36]

| Object (Object Value) | Resource (Resource Value) | Value |
|---|---|---|
| Device (3) | Current time (13) Current time value | Current time value mobile MAC address mobile |
| | Device type (17) Mobile | |
| | Serial number (2) MAC address | |
| | Model number (1) Mobile model | |
| | Manufacturer (0) | |
| Device Metadata (10,255) | Vendor (3) | Mobile manufacturer |
| | Protocol supported (0) | 1 |
| Manifest (10,252) | Manifest version (6) | 1 |
| | Asset Hash (5) | 0 |
| | Manifest result (3) | 0 |
| | Manifest content (1) | "0" |
| | Current time (13) | Current time value |
| | Device type (17) | Mobile |
| | Serial number (2) | MAC address |

- Content-type: 0
- Payload:

This payload will consist following Information:

- Firmware_Branch
- Vendor_Id
- Class_Id
- Commit_Id
- Authentication_Check_Field

*Manifest Handling*: Gateway receives manifest, first it authenticates and from this, fetches the other required information. If Manifest has anything wrong, using LWM2M resource 10252/0/3 failure code sent to LWM2M Server.

For example, here manifest rejected, Failure code (Code 5: 10252/0/3) sent to Web-Server.

- Status: COAP_STATUS_OK
- Code: COAP_MSG_CODE_RESPONSE_CONTENT
- Type: COAP_MSG_TYPE_CONFIRMABLE
- Id: 16,155
- Token: 00:18
- Content-type: 0
- Payload: 05

If the manifest is fine, firmware binary builds using git commit-id received. In case the build system has any error, we have defined our custom code for manifest failure (10252/0/3) which lets the web-server know, which type of errors comes during a build Table 2.

## 4 Security Aspects of Proposed Method

This section covers the security aspects of our proposed model and how we're tackling the cases of code-breach or build and binary compromises, as our whole system will be based on a version- control model like Git or SVN, we'll be putting our whole code-base on the build-machine which will act as a gateway for OTA updates for other endpoint devices in the vicinity, the updates will be deployed using Wi-Fi and we have to take into consideration that the stakes will be high if the build-machine gets compromised in some manner, the propagated attack will be much higher as it can/will affect all the endpoint devices the build machine has access to. So to prevent these sorts of scenarios we need to ensure the integrity and trustability of the machine. In the section, we'll explore various offerings that provide great benefits when it comes to IoT device security and device health monitoring systems.

We'll start by looking at available solutions like:

**Table 2** Example of custom code

| Custom code value | Meaning |
|---|---|
| 0×205 | Compile error |
| 0×206 | Linker error |

- Encrypted file-system
- Secure-storage module
- TPM [trusted platform module]
- File-based encryption strategy

And then we'll decide which one fits our best needs.

Let's start with encrypted file-systems, almost all the filesystems that are available for IoT devices support some type of encryption to ensure integrity and validity of data. Most popular file-systems that benefit from good encryption strategies are squashfs or ext4 to the knowledge. These are most commonly used in IoT devices and provide AES level encryption.

As we'll be holding our code-base on the build-machine we can use a partitioning scheme that is separate from the rest of the system and is locked with a cryptographic key which can be stored/generated to/from a cryptographic module like TPM [37] (It can be both software-based or hardware-based, but most commonly it'll be hardware-based as Software TPMs (sTPM) are only intended for development-use and do not provide any great benefits when compared to their counterparts) which in this case will act as a Root-of-Trust for access to our encrypted partition.

We can look into secure-storage modules as well but they're ubiquitous and do not provide a standard specification like TPMs which are mostly based on TPM 2.0 specifications by the Trusted Computing Group (TCG). Also, then there are file-based encryption strategies that we can incorporate but this can be complex and might not work on par with most of the code-bases if they have a great number of files and transitive dependencies which can result in really poor build times and might fail at some step which can result in file corruption and data-loss, we don't want to do that to our system. Using file-based encryption also has a major drawback as we'll be having different keys for n-number of files which can be unlocked independently which in-case of a system compromise, some attacker can get access to some of the keys and can perform serious modifications which can open a path for them to get access to endpoint-devices via reverse- engineering the code-base or adding a backdoor to the system binary which when deployed can affect a huge number of devices and can leave them in an inconsistent state which can have serious implications as the devices may not be able to receive OTA updates and are left out in the wild. To our conclusion, the combination of an Encrypted file-system and a TPM based solution yields great results and provides the level of security that is needed for keeping IoT devices secure while having a Root-of-Trust that is part of the system itself and is provided by the OEM.

Most TPMs come with three Root-of-Trust (out-of-the-box) and can hold a few more, what we can do here to add an extra layer of security by having different ROTs for a different process to ensure that the file-system, build-process, or binary is not compromised in some manner, this can be an improvement over the current process we're discussing here Figure 4.

For now, we'll be focusing on leveraging the Encryption on the file-system partition and secure exchange of keys through TPM Figure 5.

The above diagram illustrates the high-level structure of how our security model will work.

If we start from the top, we'll have our applications for (build, test, deploy) aspects of the proposed idea and there will be an intermediate "Access-Provider" which will play a key role in how the data is accessed from the disk (a.k.a File-System). It'll be the job of the access-provider to pipe data to the application which is asking for it. The applications will not have any access to the file-system itself. The file-system will be locked using an

**Fig. 4** FOTA trigger from web server UI

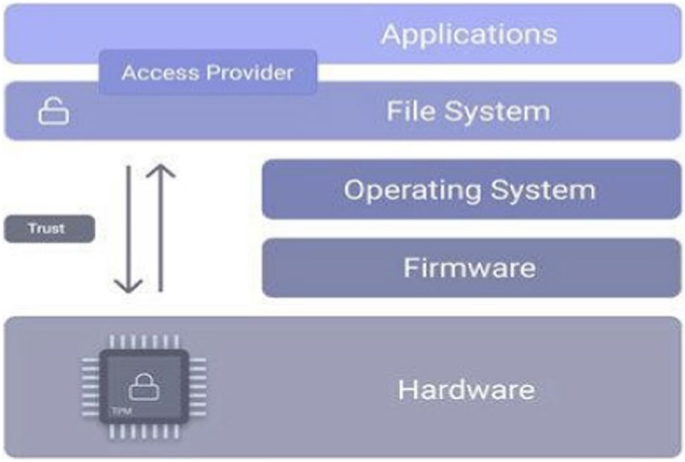


**Fig. 5** High-level structure of our security model

encryption scheme Linux (in our case -Ubuntu-Core) offers out of the box called LUKS (Linux Unified Key Setup). LUKS chooses here which takes into consideration various potential vulnerabilities in encryption beyond just the strength of the chosen cipher algorithm (AES-256 in this case). LUKS goes beyond just strong encryption with AES-256, bolstering security through robust key management (multiple slots, PBKDF2/Argon2 KDFs, secure backups), unique and salted initialization vectors, header integrity verification, randomized delays, and active security audits/updates. This multi-layered approach significantly enhances overall encryption security and protects sensitive data, though remembering no system is perfect and best practices like strong passwords are still crucial.

However, it's important to remember that no system is perfect. While LUKS addresses various vulnerabilities, it's always crucial to stay informed about the latest security threats and adopt best practices like strong passwords, regular updates, and secure key management to ensure the strongest possible protection for your data. The passphrase for the disk will be burned down to the core of the TPM module. Only the access-provider will be able to unlock the system using a set of certificates and keys generated at the time of provisioning and only known to the cloud and the system itself. There won't be any manual interaction involved Figure 6.

Once the passphrase is generated from LUKS it'll be stored in the TPM as well as it'll be used to create a device-identity certificate and a key to validate that certificate which will be synced to the cloud for the "Administrator" to manage. The key and certificate will have a life-span defined by the OEM. In case of a device being compromised to some extent, the administrator can then disable the key and the status of it will be sent over an LwM2M resource through which the access-provider will be notified to no longer grant access to the filesystem which will leave the whole system locked as it is and the encryption that LUKS provide is an AES-256 bit which is strong enough for an attacker to spend his life-time trying to brute-force it. To give an idea, brute- forcing an AES-256 level encryption would take about 100 tredecillion times the world's GDP, the closest thing to impossible one can imagine Fig. 7

Whenever an application needs access to the file-system the access-provider will send a request to verify the certificate signature using the key it was signed with to the cloud, the cloud will then send a token as a grant/deny response which will be parsed by the access-provider to identify if the operation is permitted or not. If the grant token is issued, the access-provider will then request the TPM to issue the key to unlock the file-system and it'll be the responsibility of the access-provider to manage the lock/unlock state of the disk while the operation is active.

If the deny token is issued, it'll simply deny the application request and will halt all the operations until the resume status is not notified by the cloud. As we're leveraging

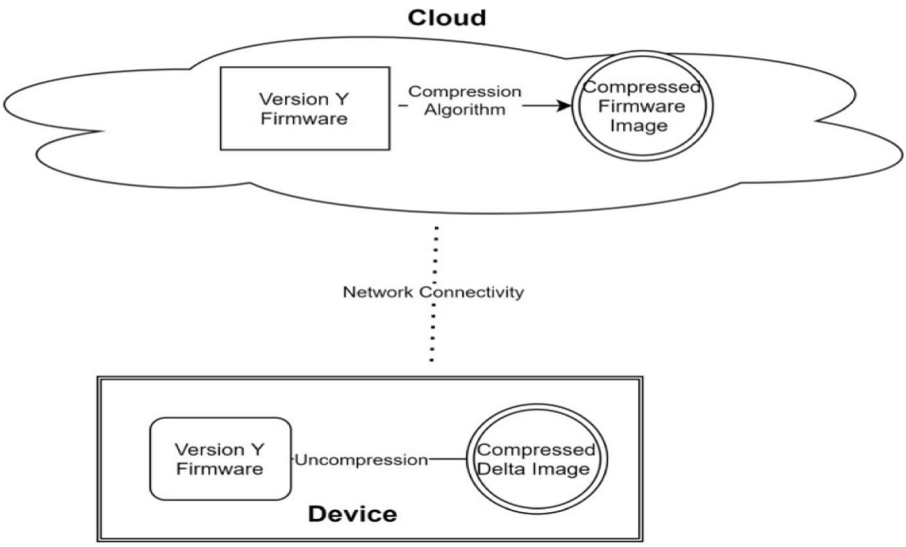


**Fig. 6** FOTA compression update

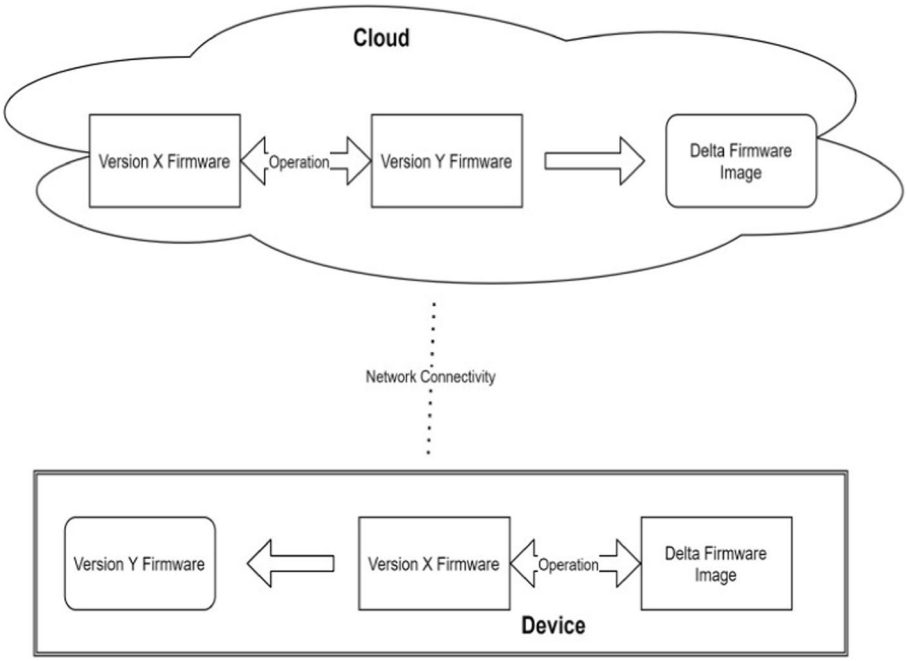


**Fig. 7** Firmware delta update

a full-disk encryption we're keeping our code-base and binary secure from tampering from external factors while on the gateway Fig. 8.

## 5 Comparison with Existing Method

To improve FOTA, several methods are proposed and are in use. It is mainly divide into three parts:

### 5.1 FOTA Compression Method

In this method, Firmware file compresses first in development/cloud environment side. Out of the available compression algorithms, best one is used to do that. Available compression method like gzip which has compression ratio around 2.7x-3x. For example if file size is around 300 MB it can reduce to 100-120 MB after compression. Another parameter to consider is compression & decompression speed which varies from device to device, based on processor speed of device. If we use a normal machine, gzip compression speed is approximate 100MB/s and decompression speed is approx. 440MB/s. Another available algorithm is The BPE algorithm which provides rapid decoding with a high compression ratio [38, 39].

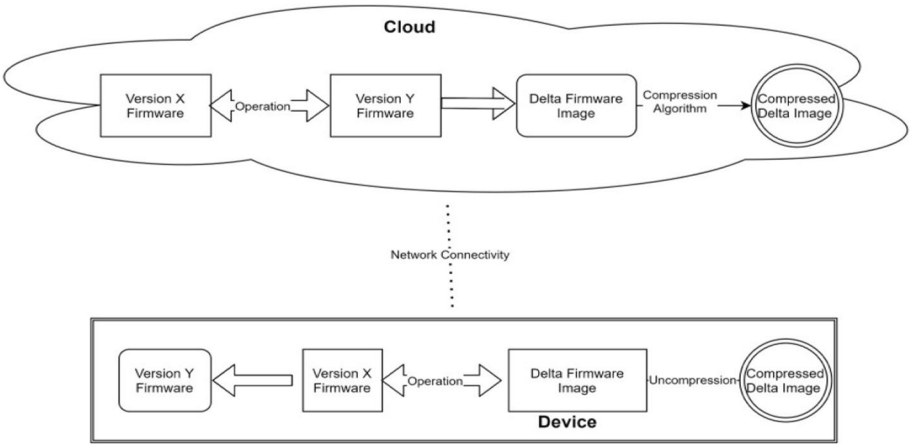


**Fig. 8** Firmware hybrid approach update

### 5.2 FOTA Delta Update

Firmware updates through over the air that enable provider to find the essential changes from an existing firmware version (Firmware version X) to a new firmware (Firmware version Y) updated version and using some specific operation, and it creates an extremely compact package called delta update of the updated firmware. This delta image [40] mechanism provides facility to send minimal required data on network to save a good amount of network bandwidth. It can save around 30% of bandwidth.

### 5.3 Hybrid Approach

Hybrid approach is the combination of compressed and delta approach. It uses both methods and a compressed delta image sent on network. It can save around 60% of bandwidth but it also increases processing speed at both sides (cloud & device). In this method algorithm complexity also increased. Delta & compression speed is totally depends on the processor speed of cloud side and gateway/device side.

Table 3 shows difference between above discussed methods and proposed method.

## 6 Conclusion and Future Work

FOTA is a must-have feature for an IoT device. Environment and usage are different for every IoT device, some deploy in urban areas & some deploy in remote areas. In this paper, we have proposed a method to put firmware code on-site and when FOTA triggers from the cloud side, build firmware on-site, and deploy to the desired device. This method provides following advantages over traditional firmware update method.

- The swapping of data will get diminished from the cloud and device. This benefit can be noticed when the devices are in distant places. With the help of this invention, the uncertainty and irregularity caused by the low connectivity locations can also be minimized.

**Table 3** Comparasion with other FOTA methods

| Method<br>Specification | FOTA compression method | FOTA delta method | Hybrid approach | Our proposed method |
|---|---|---|---|---|
| Data exchange on network | Medium/High | Medium/High | Medium | Less |
| Cloudside processing | High | High | Very High | Low |
| Gateway/Device side processing | High | High | Very High | High |
| Usability | Low | High | Low | Noble approach |

- This is safer because the likelihood of modifying the firmware binary is very low. Because the code is building "on-prem", there is no need to create and maintain the binary for different platforms and Operating systems.

We have developed a basic template model with standard building blocks and show how the proposed model can deploy at the production site. We also addressed the security concern of the proposed system and how our system can deal with it. A gateway to build firmware binaries also increases the little cost but it is a one-time cost and can be manageable if the internet speed is slow at the production line.

The model relies heavily on the build-machine, which acts as a gateway for OTA updates. If this machine is compromised, the propagated attack could affect all endpoint devices. "To enhance edge gateway resilience and minimize disruption, organizations should employ a multi-pronged approach:

- Redundant gateways (dual, hot standby, clustered) for automatic failover triggered by robust mechanisms (scripts, HA software, cloud failover).
- Comprehensive monitoring like performance, logs, and alert mechanism ensures early detection, while defined recovery procedures like backups, guides, testing expedite restoration.
- Robust security mechanism (authentication, encryption, updates, vulnerability scanning) safeguards against compromise.

By adopting these strategies, organizations can confidently navigate edge gateway failures and maintain seamless interconnected operation."

Here we use a ubuntu machine gateway as a build machine. Instead of a laptop, a microcontroller or Raspberry board can be used to give the feel of a dedicated gateway. The choice between an Ubuntu machine, a microcontroller, or a Raspberry Pi for an edge gateway depends on several factors, and each has its own strengths and weaknesses. Selecting the ideal edge gateway depends on your application's needs. While Ubuntu machines boast power and flexibility, their size and power consumption might be cumbersome. Microcontrollers are highly effective, in embedded applications because of their size and efficiency. However they may not have processing power to handle tasks. On the hand Raspberry Pi offers a balance between performance and affordability but may not be suitable for demanding workloads. Ultimately the best choice depends on factors such as processing requirements, power limitations, budget considerations and technical expertise. It's important to evaluate your needs and consider the strengths and weaknesses of each platform to determine the suitable edge gateway, for your specific requirements.

One more possibility is to use two OSs in the gateway—one for dedicated gateway purpose and another for build machine purpose and when build OS do not need to work it can go to sleep or in low power mode. When a normal gateway receives Manifest to update firmware, it can wake up the build OS. This means that the gateway will activate its operating system, which is likely responsible for managing the firmware update process.

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**Data Availability** Data sharing not applicable to this article as no datasets were generated or analyzed during the current study.

**Code Availability** Code available from the corresponding author on request.

## Declarations

**Conflict of interest** On behalf of all authors, the corresponding author states that there is no conflict of interest.

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ORIGINAL RESEARCH

# Voltage angle-based coherency identification in power system

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**Abstract**

Coherency detection in power system is vital step for controlled-islanding. Model-based slow-coherency method is the traditional method of detecting coherent areas, which suffers from computational burdens. With the implementation of a wide-area measurement system (WAMS) in power systems, coherent areas can be detected early after a disturbance that helps to ensure quick separation or remedial action. In this study, a novel Synchrophasor-based coherency identification method has been proposed with bus voltage angle measurement. A new algorithm is proposed based on the first and second derivatives of the bus voltage phase angle using hierarchical clustering method for coherency detection. The proposed approach leverages hierarchical clustering method and the dynamics reflected in the bus voltage phase angle behavior to achieve automatic and accurate coherency identification. Real time simulation results demonstrate the ability of the proposed algorithm to detect the coherency with three consecutive PMU data from all the system buses and showcase coherent area boundaries. Case studies show robustness of the proposed method and is least affected by the latency in communication network compared to conventional methods. The proposed algorithm has been mathematically formulated and evaluated with different benchmark systems in OPAL-RT real-time simulation environment with HYPERSIM platform.

## 1 | INTRODUCTION

Coherency in the power system is a phenomenon that occurs after the system is subjected to a severe disturbance that results in oscillations. During oscillations, portions of the network normally named as areas of the network are formed that oscillate against each other which are referred to as coherent areas. Coherency identification in power system networks gives a clear understanding of the dynamic behavior of the post-fault system [1, 2]. Further, coherency detection plays an essential role in controlled islanding and it helps to locate the line where the separation should take place before system failure due to out-of-step condition [3].

Upon literature survey, coherency detection has been found to be used in various stability studies like developing a control strategy for mitigating inter-area oscillation [4], and system model reduction to assist in transient stability analysis [5, 6]. Conventionally, coherency identification was model-based methods based on the slow-coherency method [7–9]. Model-based methods are implemented by performing power system linearization around the operation point. However, any change in this operation point due to variations in the network configuration will lead to invalid linearization, causing inaccurate coherency results. Furthermore, it is time-consuming to obtain the system state matrix [2] and requires extensive offline analytical studies [4, 6, 7].

The recent increase in electricity demand and significant integration of renewable energy leads the power system to operate near its stability boundaries [10, 11]. Under such conditions, model-based methods may fail to identify the coherency. With the adoption of synchrophasor technology in power systems recently, wide area measurement-based (WAMS) coherency identification has been explored by researchers to overcome the limitations of model-based methods in the interest of controlled islanding to achieve faster and more accurate separation to prevent a blackout [12].

Several methods have been addressed in the literature in this regard, where the largest Lyapunov exponents (LLE) method has been established for online coherency identification of the system generators [13]. While in [14] Huang's empirical mode

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**TABLE 1** Comparison of coherency identification methods available in literature.

| Ref | Used method | Automatic clusters number | Disturbance-independent | Clustered buses | Sensitivity for noise | Identification time (s) |
|---|---|---|---|---|---|---|
| [13] | LLE | Yes | Yes | Generator buses | No | 0.47-0.58 |
| [14] | HHT | Yes | Yes | Generator buses | Yes | Not investigated |
| [15] | WT | Yes | No | Generator buses | Yes | Not investigated |
| [18] | ANN | Yes | Yes | System buses | Not investigated | >0.1 |
| [19] | GKP | Yes | Yes | Generator buses | Not investigated | Not investigated |
| [21] | CC | Yes | Yes | System buses | No | [0.07–0.06] |
| [33] | K-mean | No | Yes | Generator buses | Not investigated | Not investigated |
| [11] | Spectrum similarity | Yes | Yes | System buses | Yes | 0.54 |
| [31] | Spectral clustering | Yes | Yes | System buses | Yes | 3 |
| **Proposed method** | **Hierarchical clustering** | **Yes** | **Yes** | **System buses** | **No** | **0.05** |

decomposition (EMD) is used on swing curves for oscillation mode identification, then Hilbert–Huang transform (HHT) is applied to get the instantaneous phase of these swing curves by which the generators coherency can be found. In [15] Wavelet transform (WT) presents generators behavior similarity by which the coherency can be identified. However, these papers are implemented to identify the similarity of the generators dynamic behavior and can't be extended to determine the non-generator buses coherency as rotor angle and generator speed variation have been used. Thus, the coherent area borders cannot be identified using these approaches.

Learning-based methods like artificial neural network (ANN) have been proposed in some literature [16–18] to suggest coherency-based splitting techniques. However, they are time-consuming as they require massive offline time-domain simulation to build up a training data set.

Similarity-based methods of swing signals have been used in other papers, like [19] which rely on the frequency measurement to implement cosine similarity combined with the Gaussian–Kernel principle (GKP). The multi-flock technique has been proposed in [20] using generator phase and frequency signals. Another approach based on frequency deviation signals has been proposed in [10, 21] using correlation coefficients (CC), which have been similarly used in [22–24] with the rotor angle and phase angle signals.

Clustering algorithms have been widely addressed in the literature based on swing signal similarity as well which has been reported in [11, 12, 22, 23, 25–33]. Among clustering algorithms, in the paper [27] support vector clustering (SVC) technique is used based on the generators rotor angle. While spectral clustering has been presented in [22] to identify the coherent generators after applying the similarity theory to their rotor angle-rotor speed trajectory. Mean-shift spectral clustering (MSSC) technique is used in [11] after acquiring the frequency signal and converting it to the time-frequency domain signal. The paper [30] relies on hierarchical clustering in the spectral domain for intentional islanding by considering the frequency measurement. Similarly, in [31], hierarchical spectral clustering is proposed. The hierarchical clustering method is used for its feature of automatic definition of the number of coherent areas, like in [25, 26] automatic coherent generators number has been successfully identified based on the same method rather than the k-mean clustering method which requires predefine the number of coherent areas which is proposed in [32, 33]. The system response varies according to disturbance type and location so the number of coherent areas cannot be expected previously and requires an online data stream and a method that can analyze this data and extract the similarity to cluster it in real-time. The distance metrics between each pair of swing signals can be utilized to compute the dimension between the data points of the swing curves before applying the clustering method, Euclidean is one of these metrics which is proposed in [27, 34]. After computing the distance between the curves data, the aggregation method into binary should be applied to find out the extent of similarity and dissimilarity of the curves, as in literature [25, 29], the Weighted method is used for this purpose.

Among the measurement-based methods reported in the literature, the concern was the coherency identification of the generators, and very few works have been done to identify coherent areas in the power system including non-generator buses. Likewise, identification time is critical and speed is required. Furthermore, some of the previous works require offline analysis either to predefine the number of coherent areas or their approaches require transit stability studies as it is a disturbance-dependent. Table 1 gives a comparison of various coherency identification methods and its performance.

In this study, the proposed technique is based on the dynamic behavior of the system under disturbance and the paper approaches online data-driven coherency identification of generator buses and non-generator buses. It is not influenced by measurement error as the total vector error (TVE) of PMU should be less than 1% as per IEEE C37.118. Since the proposed method is based on first and second derivatives, measurement error has no direct major effect on coherency

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identification based on clustering. Moreover, the proposed method is not based on spectral analysis and low volume of measurement data from PMUs is required [13], so there shall be no effect of noise in the system. Further to summarize, the main contributions of this study are as follows:

- A Rapid method for coherency estimation, for example, for 60 Hz system by PMUs with 60 frame per second reporting rate only 0.05 s (3 × 16.67 ms) is required to initiate the coherency calculation.
- A straightforward coherency identification method based on bus voltage phase angle captured from PMU, which avoids tedious network analysis and offline calculations.
- A broad method can determine the coherency of all buses in the system and thus the boundary of the coherent areas can be determined which helps in the direct trip of the tie line between them for controlled islanding.
- An automatic method defines the number of coherent areas based on the similarity and dissimilarity of the dynamic patterns derived from collected bus voltage phase angle signals using hierarchical clustering.
- A disturbance-independent method that is usable under any kind of perturbation to which the system may be exposed.
- A measurement-based method that grants the proposed approach independence from the network structure and control features of the bus.

By addressing generator and non-generator bus coherency, this research advances the understanding of system stability and provides valuable insights for potential practical applications and further future research. The proposed method of coherency identification has been validated in the time domain on three benchmark (9 bus, Two-area, and IEEE39 bus) systems. The time domain simulation study has been performed on OPAL-RT real-time simulator with 50 μs time step in HYPERSIM EMTP environment.

## 2 | MATHEMATICAL FORMULATION OF CLUSTERING

This section presents a clustering algorithm that groups the system buses based on the similarity of their oscillations with the measured signal of the voltage phase angle from all the buses. The concept of the proposed clustering algorithm is explained in three subsections as follows.

### 2.1 | Bus voltage phase angle and its pattern

Under normal operating condition of the power system, all bus voltage phase angle $\delta$ is typically constant. After a disturbance, the voltage phase angle oscillates due to the dynamic behavior of the system. The first derivative of the phase angle signal $d\delta/dt$ represents the rate of change of the phase angle in the time domain, normally named as "slip", and the second derivative $d^2\delta/dt^2$ represents the rate of change of the phase angle slip in the time domain. These derivatives are significant in power system stability analysis, as they provide information about the dynamic behavior of the system.

Following a disturbance in the system, the rotor angles of the generators oscillate with respect to their final steady state point. These oscillations may not be uniform throughout the system but can club into multiple groups of generators and buses forming a coherent area, that may be oscillating against each other. These coherent rotor oscillations in turn are reflected on the system bus voltage angles that oscillate, respectively, at a low-frequency around the final steady state point. In one coherent area, the voltage phase angles of all buses oscillate with the same low-frequency oscillations.

In such a scenario plotting the second derivative with respect to the first derivative of the phase angle signal for all the coherent buses are expected to have a similar pattern, as the buses are experiencing similar changes in phase angle in the time domain.

To explain this concept, schematic phasor representations of a bus voltage for stable and unstable oscillations are shown in Figures 1a and 1b, respectively, after a disturbance. For a stable case, the oscillations of phase angle $\delta$ are around the steady state point; however, for an unstable case the oscillations of $\delta$ keep increasing with time.

#### 2.1.1 | Stable oscillations scenario

For a linear time-invariant (LTI) system, the stable oscillations can be mathematically expressed as (refer Appendix):

$$\delta(t) = e^{-\alpha t}.\sin(\beta t) + \delta_0, \tag{1}$$

where $\alpha$ is a quantity that characterizes the damping magnitude, $\beta$ is the oscillation frequency and $\delta_0$ is an initial steady state value.

The coherent oscillations can be identified based on close values of $\alpha$ and $\beta$ as represented in Figure 2.

The coherency determination can be easily done by taking the derivatives of Equation (1) to eliminate the initial condition $\delta_0$.

Taking the first derivative of (1):

$$\frac{d\delta(t)}{dt} = e^{-\alpha t}.\left(\beta.\cos(\beta t) - \alpha.\sin(\beta t)\right). \tag{2}$$

And the second derivative of (1):

$$\frac{d^2\delta(t)}{dt^2} = e^{-\alpha t}.\left(-2.\alpha.\beta.\cos(\beta t) + (\alpha^2 - \beta^2).\sin(\beta t)\right). \tag{3}$$

By plotting the second derivative with respect to the first derivative of Equation (1), a concentric spiral pattern can be observed as in Figure 3. Close values of $\alpha$ and $\beta$ for the coherent oscillation create closely overlapping curves on the derivatives plane. However, the movement of the pattern is not similar for different areas with different values of $\alpha$ and $\beta$ as shown in Figure 3. This forms the basis for coherency area

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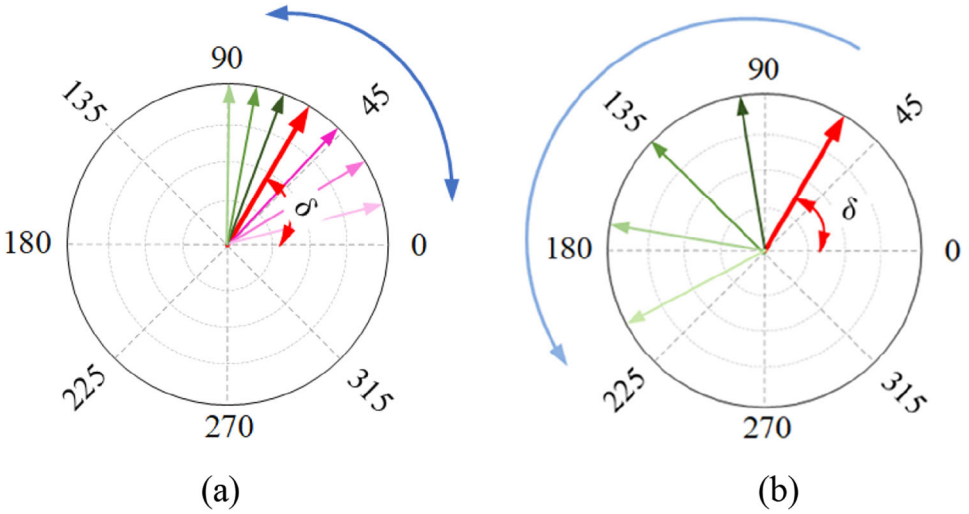


**FIGURE 1** Phasor of a bus voltage: (a) stable oscillations; (b) unstable oscillations.

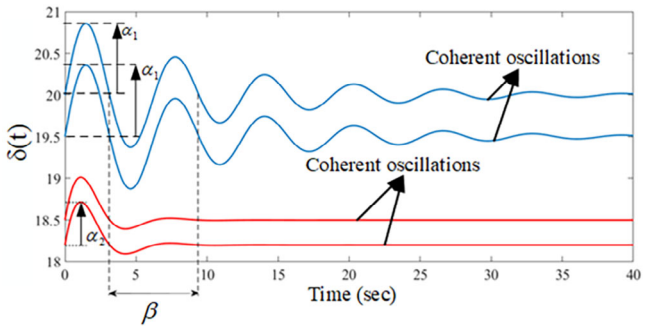


**FIGURE 2** The form of coherent oscillations in stable condition.

identification by comparing the distance between points in the first derivative-second derivative plane of system bus voltage angles.

### 2.1.2 | Unstable oscillations scenario

The unstable condition occurs when the bus voltage phase angle keeps increasing and goes beyond 180° angular separation as shown in Figure 1b. In this condition bus voltage phase angle increases exponentially with respect to time with oscillations. This response of voltage phase angle can be mathematically expressed by the sum of exponential and sinusoidal functions as the following equation (refer Appendix):

$$\delta(t) = e^{\alpha t} + \sin(\beta t) + \delta_0, \tag{4}$$

where $\alpha$ in this equation is a quantity that characterizes the slope.

Figure 4 represents coherent oscillations based on their closeness of $\alpha$ and $\beta$.

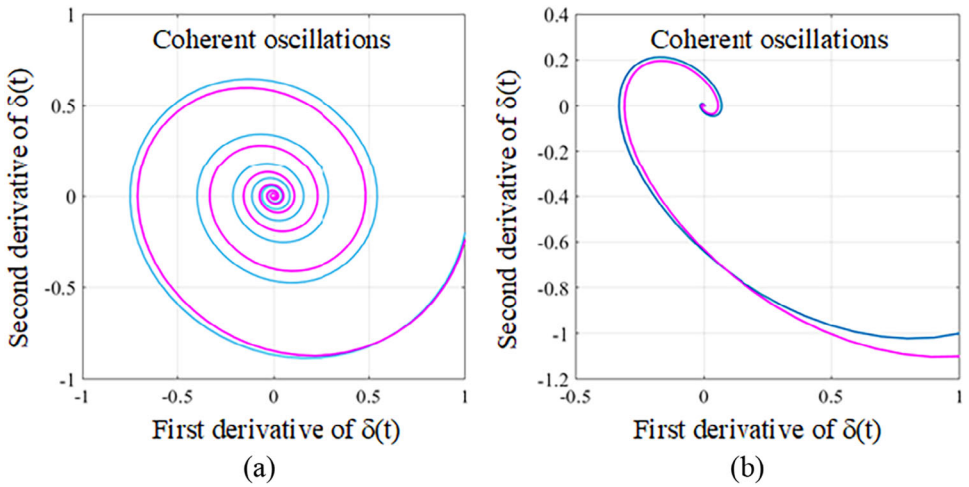


**FIGURE 3** First derivative-second derivative curve of stable oscillations: (a) area A (b) area B.

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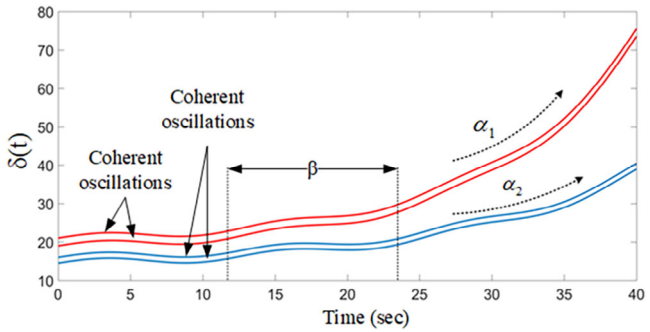


**FIGURE 4** The form of coherent oscillations in unstable condition.

By taking the derivative of the Equation (4) twice:

$$\frac{d\delta(t)}{dt} = \alpha.e^{\alpha t} + \beta.\cos(\beta t), \tag{5}$$

$$\frac{d^2\delta(t)}{dt^2} = \alpha^2.e^{\alpha t} - \beta^2.\sin(\beta t). \tag{6}$$

Plotting the second derivative with respect to the first derivative presents a coil spiral pattern as shown in Figure 5. The curves are parallel for coherent oscillations but their motions differ by $\alpha$ and $\beta$ values.

By comparing the distance between these curves and categorizing the oscillations based on their closeness distance, the coherency identification of system buses can be done in unstable cases.

Therefore, following a disturbance if the power system oscillates with low-frequency oscillations and gets grouped into multi-coherent areas, each area has a probability to have one of the aforementioned patterns of its bus voltage angles derivatives. In addition, coherency can also be identified between stable areas and unstable areas as they have completely different patterns.

## 2.2 | Hierarchical clustering

In order to find the matches in the voltage phase angles of the system buses, it is necessary to use a clustering method that can calculate the relative distance between streaming data at each time step online and combine the closely related data into a single cluster. Therefore, a hierarchical clustering method is proposed in this study which performs the aggregation process at each time step through the following steps:

1. Step 1: Collect the pairwise data (first derivative-second derivative) of bus voltage phase angle $\delta$ from all system buses (n) and arrange them in a (n×2) matrix as follows:

$$\begin{pmatrix} \delta_1^{\cdot} & \delta_1^{\cdot\cdot} \\ \delta_2^{\cdot} & \delta_2^{\cdot\cdot} \\ \delta_3^{\cdot} & \delta_3^{\cdot\cdot} \\ . & . \\ . & . \\ \delta_n^{\cdot} & \delta_n^{\cdot\cdot} \end{pmatrix}. \tag{7}$$

2. Step 2: Assign each bus as a single cluster, Figure 6a.
3. Step 3: The distance between each pair of buses $i$, $j$ is calculated based on their data points using the Euclidean distance metric by the following equation:

$$d_{ij} = \sqrt{(\delta_i^{\cdot} - \delta_j^{\cdot})^2 + (\delta_i^{\cdot\cdot} - \delta_j^{\cdot\cdot})^2}, \tag{8}$$

where by the distance between the points of all system buses is calculated as shown in Figure 6b. This figure presents the distance between point 3 and the other points and the calculated distance in blue legend is between point 2 and point 3. Similarly, the distance between other points of buses is calculated.

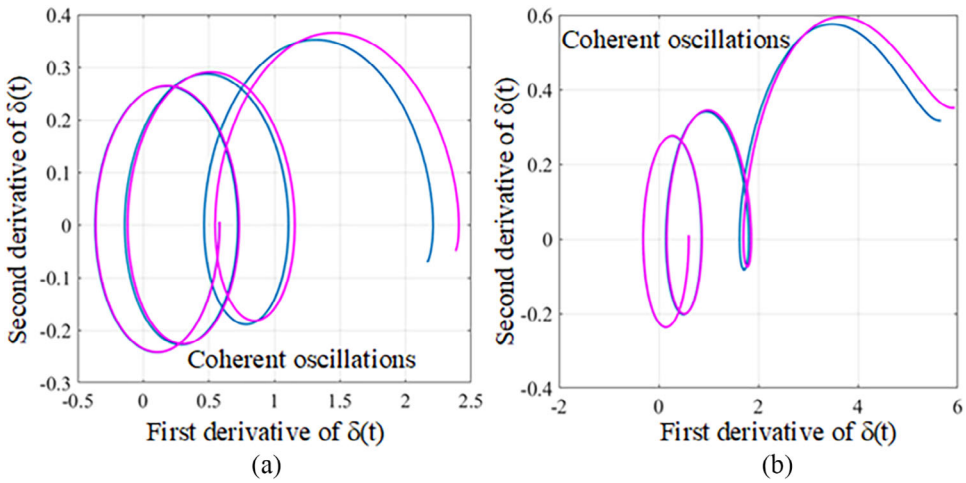


**FIGURE 5** First derivative-second derivative curve of unstable oscillations: (a) area A; (b) area B.

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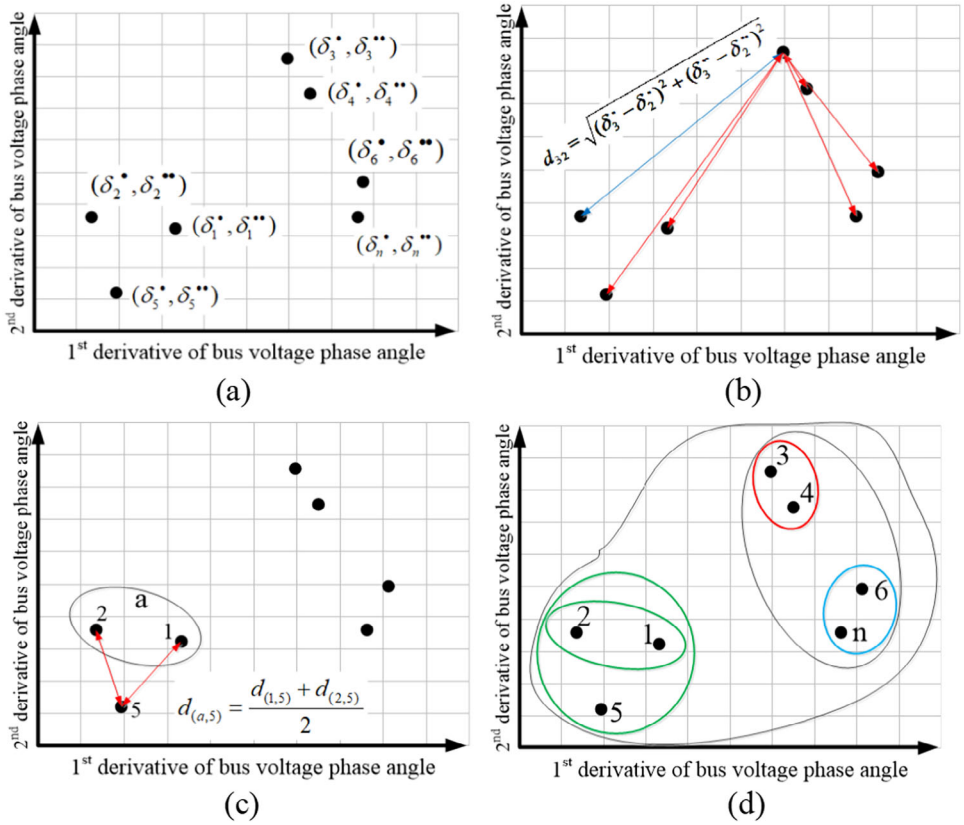


**FIGURE 6** Hierarchical Clustering steps: (a) step 2; (b) step 3; (c) step 4; (d) step 5.

4. Step 4: Proximity of buses to each other is determined based on the calculated data in step 3. Using step 3 information, step-wise clustering initiates by merging each close pair of buses. Accordingly, wider clusters get generated as it is seen in Figure 6c based on their similarity metric which is measured by weighted average linkage.

   Weighted average linkage calculates the distance between two clusters using the following equation suppose a cluster $a$ was created by grouping clusters $z$ and $m$, the distance between $a$ and another cluster $b$ is calculated as the average of the distance between $z$ and $b$, and the distance between $m$ and $b$.

$$d_{(a,b)} = \frac{d_{(z,b)} + d_{(m,b)}}{2}. \tag{9}$$

5. Step 5: The newly formed clusters are combined into a new larger cluster and so on iteratively merging the two closest clusters continues until the Hierarchical tree is formed, Figure 6d.

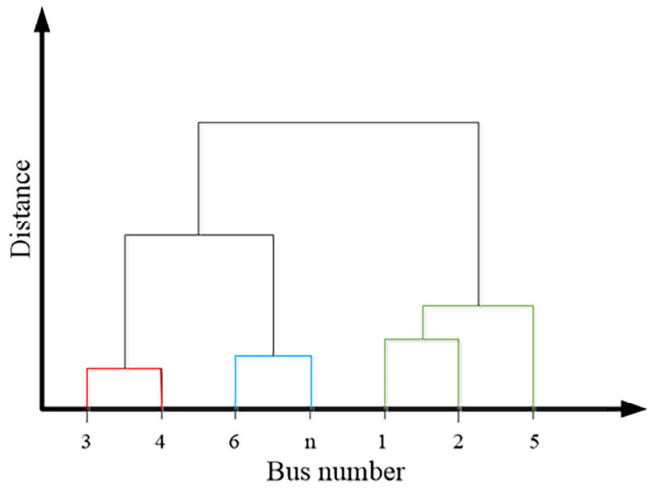


**FIGURE 7** Dendrogram diagram of hierarchical clustering.

In summary, the hierarchical tree can be formed starting by clustering pair-wise closest buses that the distance between them calculated by Euclidean distance metric. Then closest clusters are grouped that the distance between them is calculated by Weighted average linkage. The clusters that the Weighted average linkage between them is comparatively high are cut under two different areas as shown in colored clusters in Figure 6d. A dendrogram diagram can interpret the hierarchical tree in which the partitioning will be visualized by assigning the buses that fall under each cut as a single cluster, the $x$-axis is the bus numbers and the $y$-axis is the calculated distance between buses and clusters, Figure 7.

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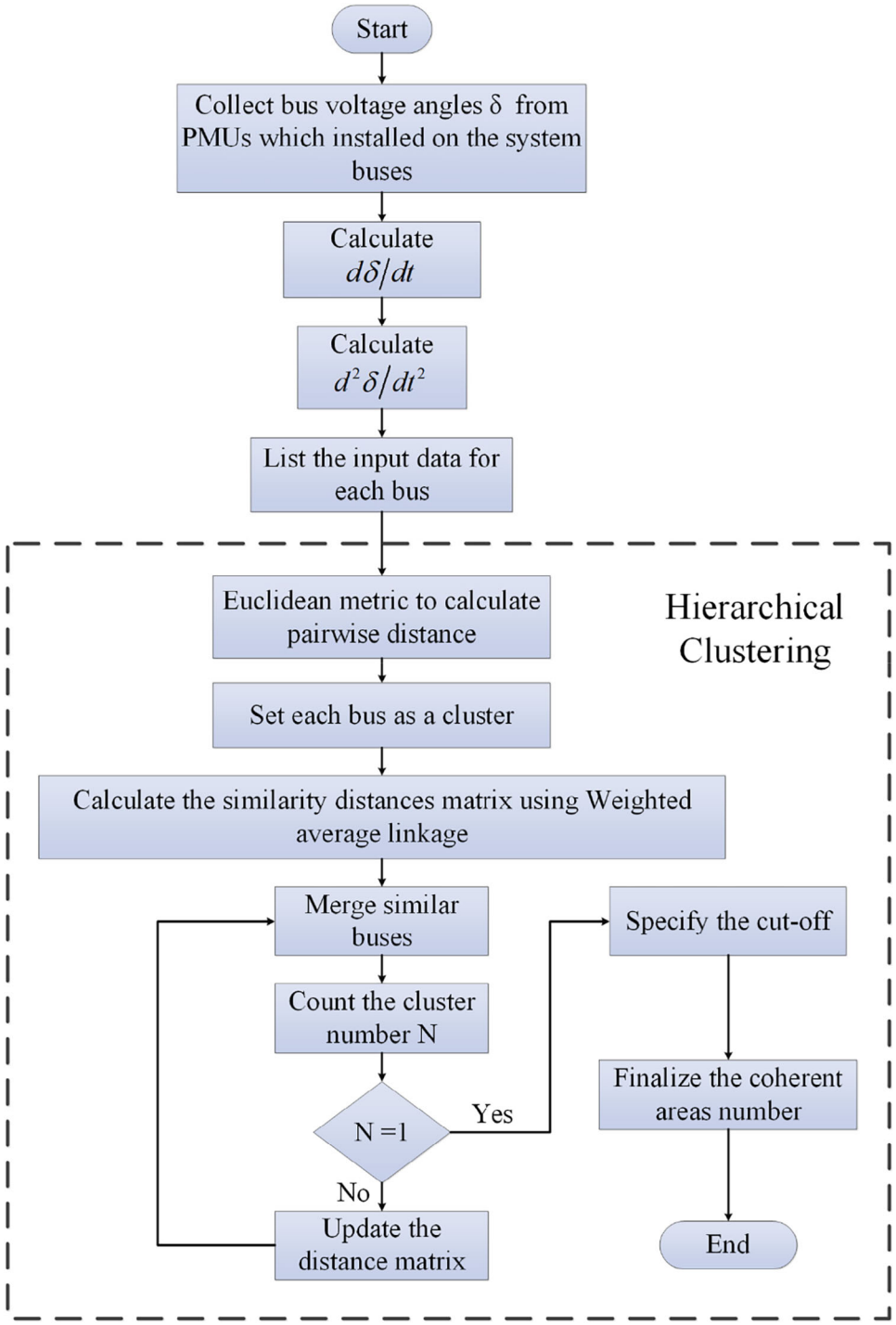


**FIGURE 8** PMU-based algorithm for coherency identification.

## 2.3 | Proposed algorithm

By collecting the voltage phase angle $\delta$ for the system generator buses and non-generator buses, then extracting its first two derivatives with respect to the time, it is possible to group the coherent buses based on plotting the second derivative with respect to first derivative curve for all system buses and find their patterns similarity using Hierarchical Clustering method.

With PMU direct bus voltage angle measurements can be acquired continuously. With this measurement, the aforementioned concept can be implemented online with a faster coherency identification rate. Hence, the proposed algorithm helps to separate the system intentionally before the system collapses because of out-of-step condition, which is a critical condition to which the system may subject causing unintentional tripping and ending with a blackout.

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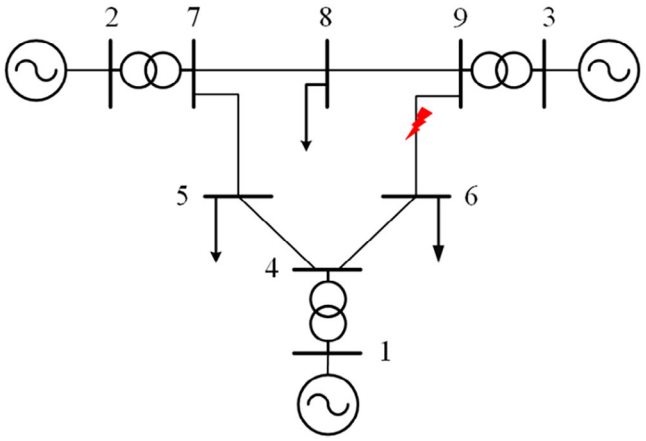


**FIGURE 9** 9 bus system.

The proposed algorithm given in Figure 8 is successfully able to identify the coherent groups borders. Thus, to ensure the return of the system to stable mode, the proposed approach helps to identify exactly where the controlled islands separation should take place.

The advantage of this data-driven method is that it does not rely on the network configuration data which makes the method adaptive to the topology changes of the system. In addition to clustering ability, the Hierarchical Clustering method has the feature of finding the number of clusters that the system gets divided into based on the data streamed online, as this number cannot be expected off-line because it relies on the dynamic response of the system to the disturbances.

## 3 | SIMULATION AND VERIFICATION

An extensive study has been conducted on three benchmark systems, 9 bus system, two-area system, and IEEE39-bus system under different scenarios, in OPAL-RT real-time simulator's HYPERSIM environment with a simulated PMU reporting at the rate of system frequency (50/60) Hz, in order to evaluate the proposed method performance for coherency detection and locate the coherent buses. The simulation was carried out for 3 s to capture the coherent buses.

### 3.1 | 9 bus system

In this case study, the performance of the proposed algorithm has been explained. The study system in this case is 60 Hz, consists of three generators connected to the system through three transformers, nine buses connected with six transmission lines and three loads on bus 5, bus 6, and bus 8, Figure 9. Nine PMUs have been used to obtain bus voltage phase angle from all the buses to be the input of the proposed algorithm. A three-phase fault has been applied on the line (9-6) closely to bus 9 at 1 s and has been cleared at 1.4 s without tripping the line.

Due to this fault, the system is subjected to power oscillation. Thus, by visualizing (first derivative-second derivative) curve of the voltage phase angle signal collected from PMUs of the system buses, it can be seen that the system is unstable and the pattern of the curves is not similar for the nine buses, but they are divided into two coherent areas, in each area the pattern of the curves corresponds with a slight shift, as it is demonstrated in Figure 10.

Area 1: bus 2, bus 3, bus 7, bus 8 and bus 9.

Area 2: bus 6, bus 5, bus 4 and bus 1.

Bus 9 (a yellow legend in area 1), Figure 10a is a faulty busbar, which justifies its different pattern during the fault, but after clearing it, the curve joins the rest of the group closely. Thus, the results of bus clustering can be acquired right after the clearing of the fault.

As can be noticed from the figure, the buses in Area 1 oscillate coherently with the unstable pattern, and Area 2 oscillates with the stable pattern. The presence of Area 1 in an unstable pattern will cause the network to collapse if no interference occurs.

By using (first derivative-second derivative) trajectory data of the system buses as input for the Hierarchical Clustering method, automatic buses coherency identification is possible and used to prepare the system for controlled islanding, without any requirement for prior expectation of the coherency areas number. The performance of Hierarchical Clustering can be

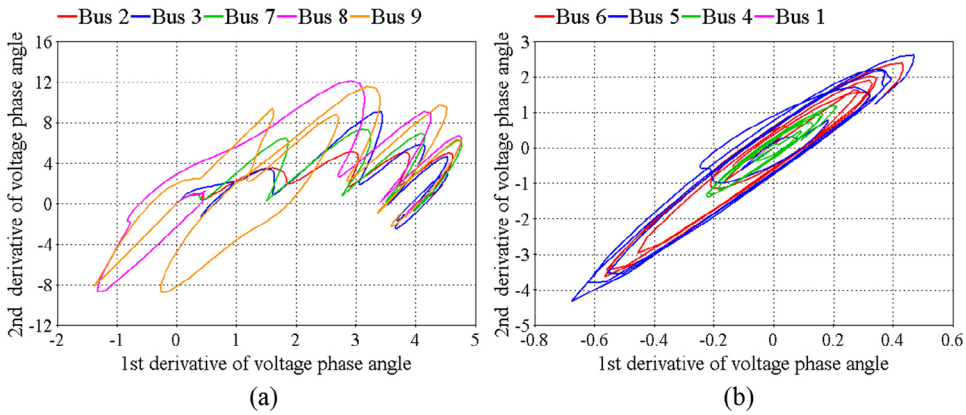


**FIGURE 10** First derivative-second derivative curve of 9 bus system: (a) area 1 (b) area 2.

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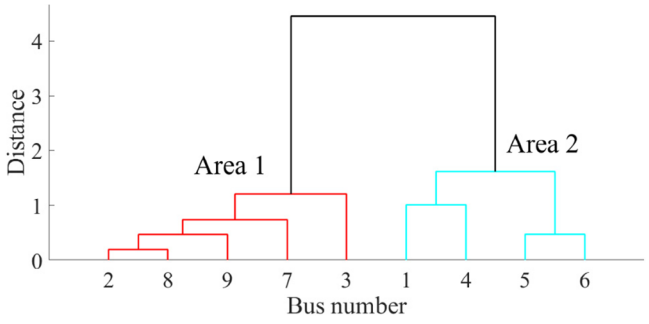


**FIGURE 11** Dendrogram diagram of 9 bus system clustering result.

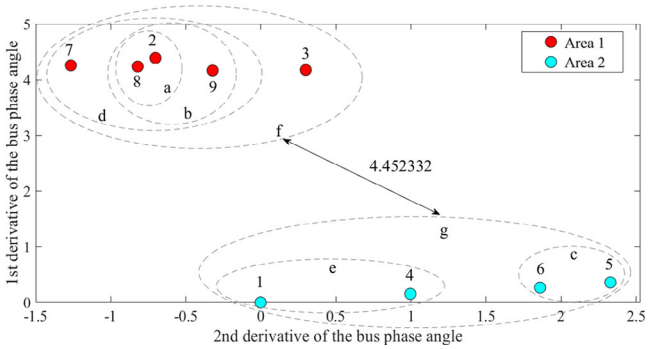


**FIGURE 12** Scatter graph of 9 bus system clustering result.

**TABLE 2** Calculated distance of step-wise clustering for 9 bus system.

| Cluster number | Cluster number | New cluster | Calculated distance |
|---|---|---|---|
| 2 | 8 | a | 0.196874 |
| 9 | a | b | 0.473346 |
| 5 | 6 | c | 0.476085 |
| 7 | b | d | 0.732138 |
| 1 | 4 | e | 1.005656 |
| 3 | d | f | 1.208469 |
| C | e | g | 1.614582 |
| f (area 1) | g (area 2) | h | 4.452332 |

visualized using the dendrogram diagram, where y-axis is the calculated distances between the system buses and step-wise clustering distances, Figure 11. It can be seen from the figure that the height between the clusters under one area are close comparing with the large height between area 1 and area 2.

The scatter graph, shown in Figure 12, presents the relative distances between the data set of the voltage angle of system buses in the first derivative-second derivative plane used in Hierarchical Clustering calculations. Weighted average linkage distances for step-wise clustering are noted in the Figure 12 and tabulated in Table 2.

## 3.2 | Kundur two-area system

The second case study has been carried out on a 50 Hz Kundur's two-area system shown in Figure 13. Each area has two generators and five buses and they are connected by two lines with a bus. Two loads are connected with buses 4 and 6, and detailed parameters in [36]. Eleven PMUs have been used to capture voltage phase angle from all the buses in the presence of two different types of system variations (load and network configuration) for coherency identification.

*Relation between bus voltage phase angle and generator rotor angle*: As mentioned in Section 2, the oscillation of generator rotor angle is reflected on the phase voltage angle of the system buses. A plot of oscillation similarity of generator rotor angle and bus voltage angle, is shown for G3 and Bus9 in Figure 14, to verify that the dynamics of rotor are captured in PMU at Bus 9.

*Scenario I*: Load variation

In this scenario, a system synchronization loss event has been triggered by increasing the load in the system. Load 2 on bus 6 has been increased by 50% at 1 s and the developed algorithm has been used to identify the coherency right after the disturbance occurrence.

The first derivative-second derivative trajectories of the voltage phase angle acquired from the system buses have been plotted in Figure 15. It can be noticed from the figure that two coherent areas have been created under the influence of load variation.

Bus 1, bus 2, bus 3, bus 4, and bus 5 have the exact same unstable pattern with slight shift between them, similarly for bus 6, bus 7, bus 8, bus 9, and bus 10 with stable pattern. Bus 11 in Figure 15b (dark blue legend) does not belong to any of the areas as it behaves differently. As there is not any faulty bus, there is not any different behavior of a particular curve. Thus, the results of bus clustering can be acquired right after the disturbance.

In order to visualize the distance between the curves relative to each other, the scatter graph plotted in Figure 16a shows the data set for ten buses on one plane, explaining two areas of five buses each. The curves in one area move closely and widely apart from the other.

Figure 16b demonstrates the results of Hierarchical Clustering in the dendrogram diagram showing two coherent areas where step-wise clustering can be tracked and the values of Weighted average linkage distances are given in Table 3.

In this scenario, communication delay has been investigated as well to evaluate the proposed method. In case of delay of capturing bus voltage angle by 200 ms from the disturbance the method has successfully identified the coherent areas similarly as aforementioned results, as presented in Figure 17.

*Scenario II*: Network configuration variation

In this scenario three-phase fault has been applied on line (5-6) closely to bus 6 at 1 s and cleared by tripping the line at 1.2 s considered as changing network configuration.

Figure 18 illustrates two coherent areas while bus 11 in Figure 18c does not belong to any. The coherent areas can be successfully detected with the proposed algorithm after

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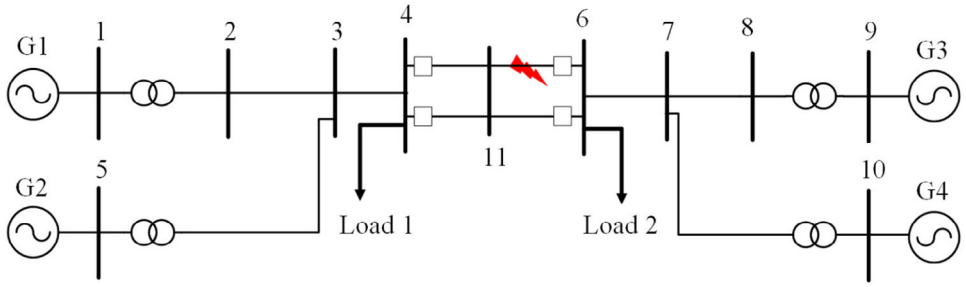


**FIGURE 13** Kundur two-area system.

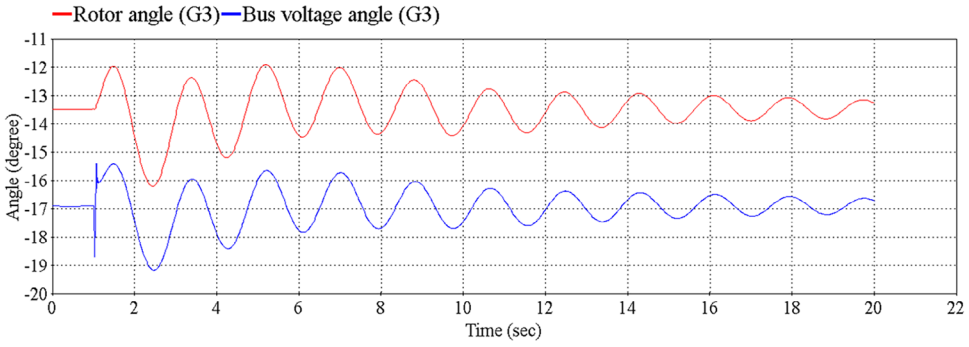


**FIGURE 14** Generator 3 rotor angle and Bus 9 voltage angle with respect to reference machine.

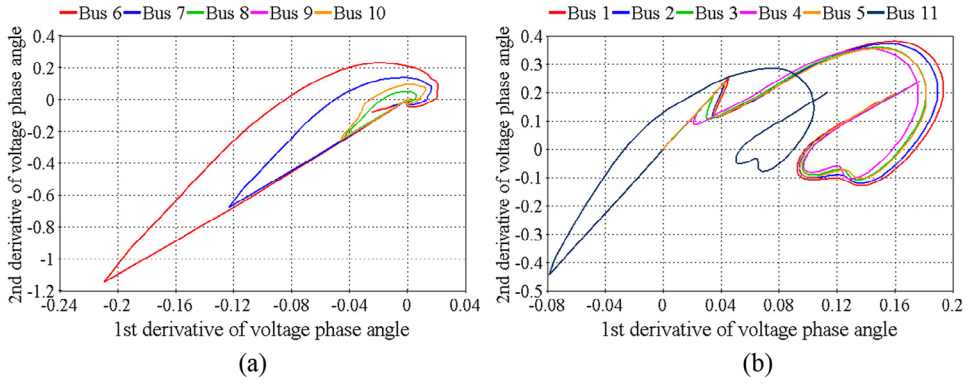


**FIGURE 15** First derivative-second derivative curve under load variation: (a) area 1 (b) area 2.

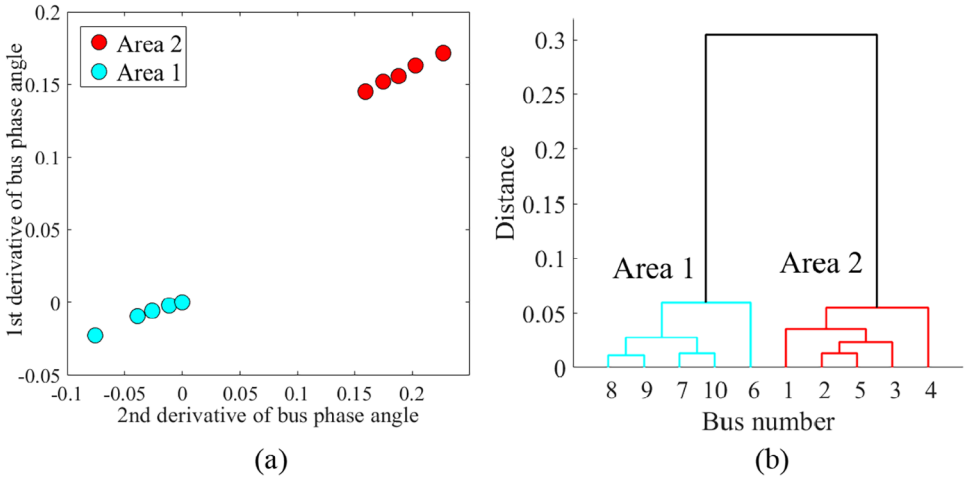


**FIGURE 16** Two-area system clustering result (load variation): (a) scatter graph; (b) dendrogram diagram.

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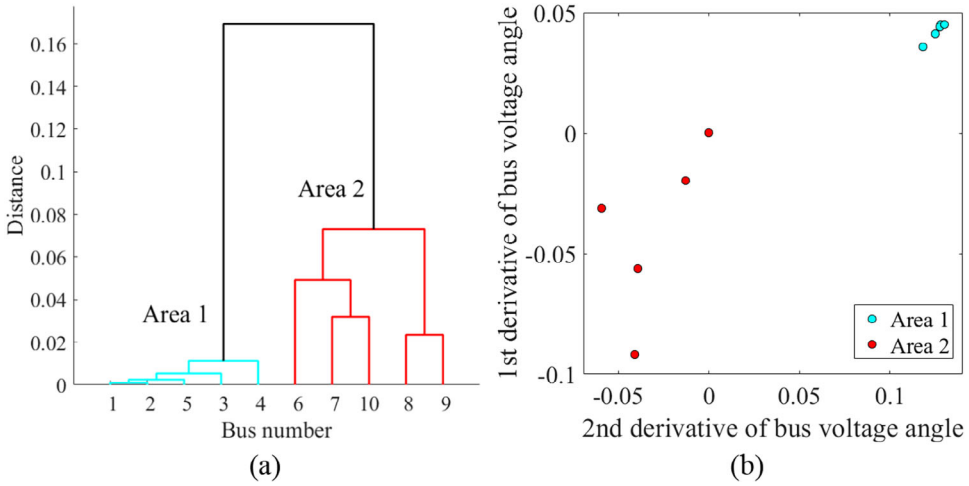


**FIGURE 17** Two-area system clustering result (communication delay): (a) dendrogram diagram; (b) scatter graph.

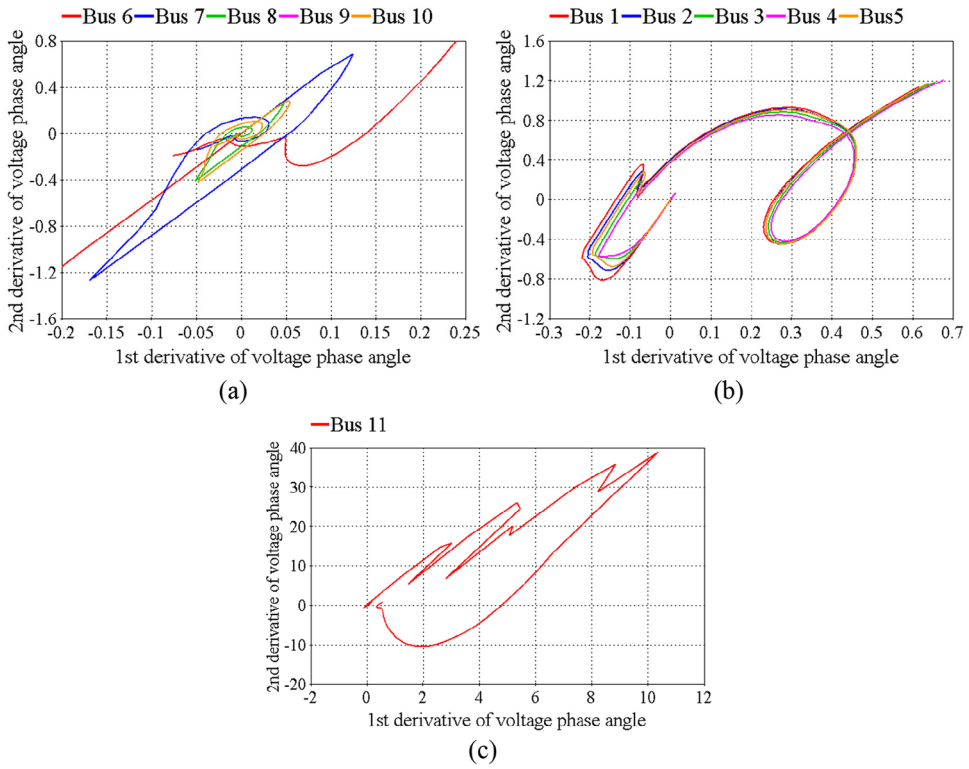


**FIGURE 18** First derivative-second derivative curve under network configuration variation: (a) area 1; (b) area 2; (c) bus 11.

calculating the distance shown in Figure 19a and tabulated in Table 4. The Hierarchical Clustering has been performed after clearing the fault to which bus 6 was subjected, and the result is clearly demonstrated in Figure 19b.

This case study shows that the proposed method is disturbance-independent and it is applicable in the power system under any type of perturbation, thus it is effectively able to identify the coherent buses.

## 3.3 | IEEE 39-bus system

In this subsection, IEEE 39 bus system has been simulated to validate the proposed method to identify coherent buses in large power system. The system has 60 Hz frequency and consists of 10 generators, 12 transformers, 34 transmission lines, and the detailed parameters are in reference [37]. All generators are implemented with full excitation and turbine governor system.

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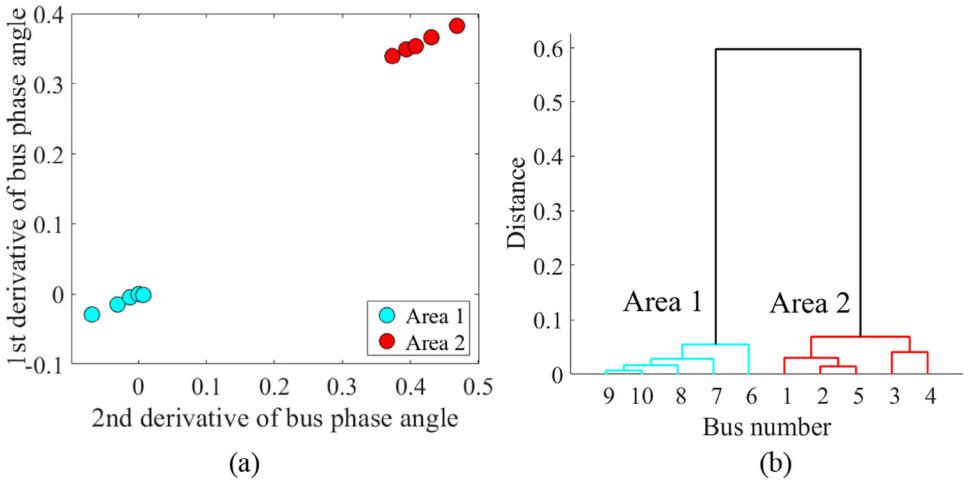


**FIGURE 19** Two-area system clustering result (network configuration variation): (a) scatter graph; (b) dendrogram diagram.

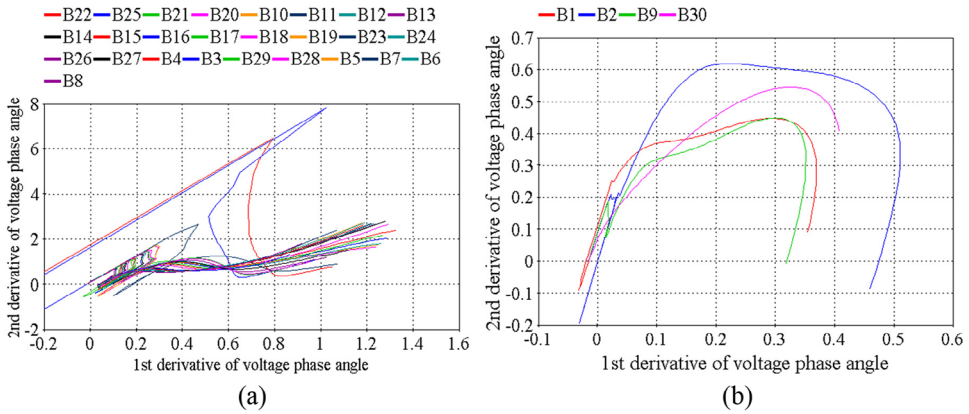


**FIGURE 20** First derivative-second derivative curve of 39 bus system (two areas): (a) area 1; (b) area 2.

**TABLE 3** Calculated distance of step-wise clustering for two-area system (load variation).

| Cluster number | Cluster number | New cluster | Calculated distance |
|---|---|---|---|
| 8 | 9 | a | 0.011463 |
| 2 | 5 | b | 0.013298 |
| 7 | 10 | c | 0.013307 |
| 3 | b | d | 0.023241 |
| A | c | e | 0.027699 |
| 1 | d | f | 0.035513 |
| 4 | f | g | 0.055169 |
| 6 | e | h | 0.059684 |
| g (area 2) | h (area 1) | i | 0.304831 |

**TABLE 4** Calculated distance of step-wise clustering for two-area system (network configuration variation).

| Cluster number | Cluster number | New cluster | Calculated distance |
|---|---|---|---|
| 9 | 10 | a | 0.006885 |
| 2 | 5 | b | 0.014272 |
| 8 | a | c | 0.016301 |
| 7 | c | d | 0.028813 |
| 1 | b | e | 0.030566 |
| 3 | 4 | f | 0.040767 |
| 6 | d | g | 0.054344 |
| e | f | h | 0.069062 |
| g (area 1) | h (area 2) | i | 0.597182 |

30 buses of the system are equipped with PMUs to obtain voltage phase angle, as 9 generators in the system, each is connected with a transformer through a bus, which are assembled together as 9 power plants. An extensive system like the IEEE39 bus may have two or more coherent areas that are based on a disturbance type. In order to simulate losing the synchronization in the system, two scenarios have been considered in the presence of simultaneously two faults applied at 1 s.

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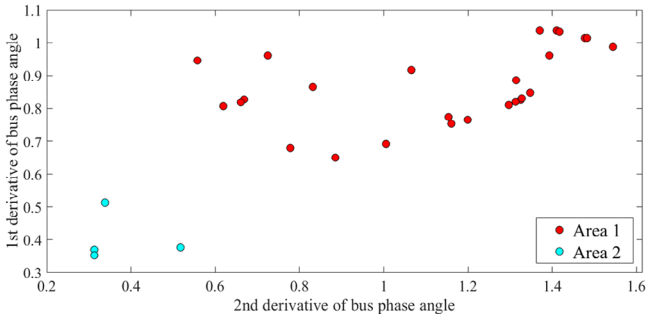


**FIGURE 21** Scatter graph of 39 bus system clustering result (two areas).

*Scenario I*: Two coherent areas

In this scenario, one fault is on line 25-2 and has been cleared by isolating the line at 1.1 s, the other fault is on line 21–22 and has been cleared by removing the line as well at 1.12 s.

In terms of bus voltage phase angle, the response of the system has been observed in time domain simulation and the trajectory of the first derivative-second derivative has been recorded in Figure 20. It can be seen that 26 buses have well-matched patterns and are poorly matched to the other 4 buses.

Figure 21 shows a scatter plot of 30 buses data set two groups of oscillating buses are formed coherently against each other (red area including 26 buses and blue area including 4 buses). The coherency has been identified right after clearing the faults using the Hierarchical Clustering method and the result is presented in the dendrogram diagram, Figure 22. Table 5 demonstrates step-wise clustering with the calculated distance between them.

To demonstrate the effectiveness of the proposed method to ensure the stability of controlled islanding, which is an unavoidable action that should be taken in case of failure of other remedial actions, separating the system has been performed relying on the aforementioned coherency result. The islands' borders are identified which helps to know where the tripping should be triggered. The tie lines (2-3) and (8-9) connect these islands which have been tripped based on [35] at the time of

**TABLE 5** Calculated distance of step-wise clustering for 39 bus system clustering result (two areas).

| Cluster number | Cluster number | New cluster | Calculated distance |
|---|---|---|---|
| 16 | 21 | a1 | 0.005634 |
| 10 | 13 | a2 | 0.006016 |
| 19 | 24 | a3 | 0.007088 |
| 25 | 28 | a4 | 0.011233 |
| 12 | a2 | a5 | 0.015535 |
| 1 | 9 | a6 | 0.016832 |
| 4 | 5 | a7 | 0.021391 |
| 11 | a5 | a8 | 0.027811 |
| 6 | a7 | a9 | 0.042954 |
| 20 | a3 | a10 | 0.04296 |
| 29 | a4 | a11 | 0.049326 |
| 14 | a8 | a12 | 0.049868 |
| 18 | a12 | a13 | 0.060769 |
| 15 | a1 | a14 | 0.070107 |
| 17 | a10 | a15 | 0.076884 |
| 3 | 8 | a16 | 0.111101 |
| a14 | a15 | a17 | 0.126093 |
| 23 | 26 | a18 | 0.144547 |
| 2 | a6 | a19 | 0.152995 |
| 22 | a11 | a20 | 0.158635 |
| a9 | a13 | a21 | 0.173806 |
| 7 | a16 | a22 | 0.178004 |
| a18 | a20 | a23 | 0.205331 |
| 30 | a19 | a24 | 0.21415 |
| 27 | a21 | a25 | 0.226586 |
| a22 | a25 | a26 | 0.324783 |
| a23 | a26 | a27 | 0.407576 |
| a17 | a27 | a28 | 0.62825 |
| a24 (area 2) | a28 (area 1) | a29 | 0.921995 |

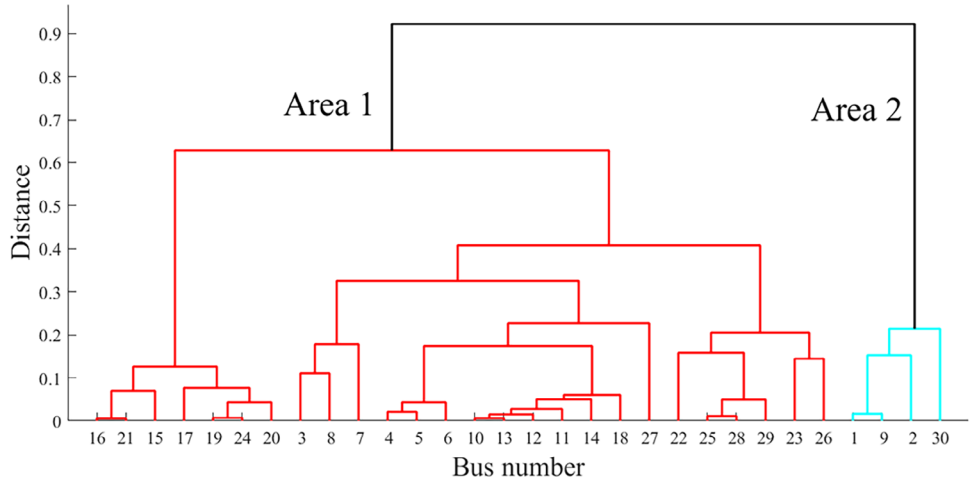


**FIGURE 22** Dendrogram diagram of 39 bus system clustering result (two areas).

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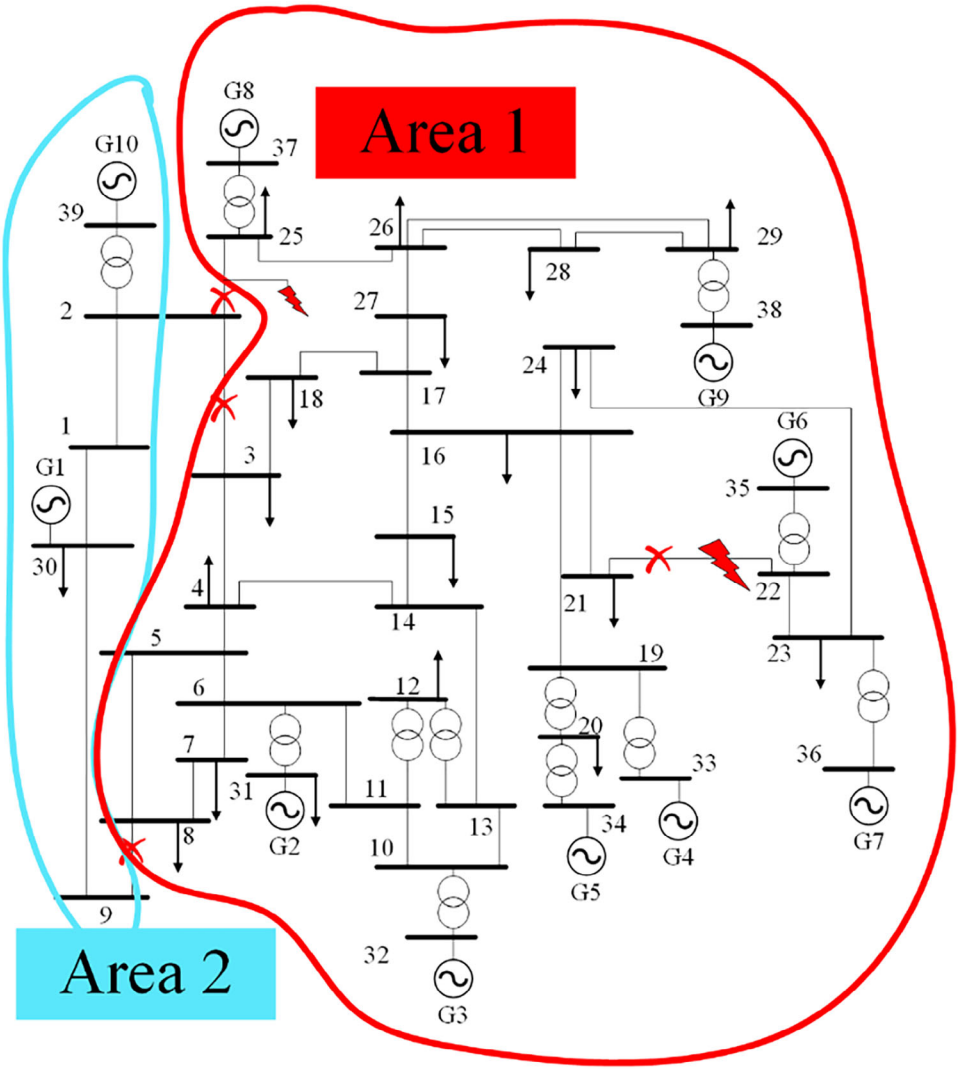


**FIGURE 23** Splitting action into two islands.

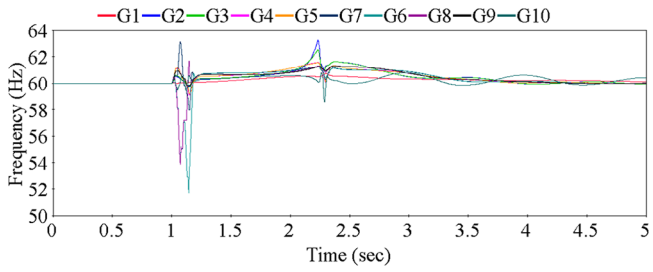


**FIGURE 24** Stabilizing the frequency after splitting.

out of step. The system is islanded into two controlled islands as shown in Figure 23. The stability condition of the islands can be clarified through the stability of the islands' generators which can be presented in generator frequency. Therefore, the generators frequency in both areas has been observed in Figure 24. The figure shows that after islanding, generators frequency was restabilized by 60 Hz, as disconnecting oscillatory coherent areas helped to damp out the oscillation of generators frequency and restore stability in each area separately.

*Scenario II*: Six coherent areas

This scenario present that IEEE39 bus system can have more than two coherent areas due to a severe disturbance and the proposed algorithm has been used to identify the coherency. Thus, one fault has applied on line 26–29 and has been cleared by isolating the line at 1.1 s, the other fault is on line 21–22 and has been cleared by removing the line as well at 1.12 s.

In this study scenario, all the system is disturbed and all buses are in unstable condition as all first derivative-second derivative curves present in Figure 25 are unstable pattern. The figure shows six areas have been created after removing the disturbance with six different behaviors of their patterns.

The proposed Hierarchical Clustering method successfully has captured the coherent areas after removing the fault, which has been highlighted in dendrogram diagram in Figure 26a. The distance between the buses according to the (first derivative-second derivative) data can be seen in scatter graph, Figure 26b.

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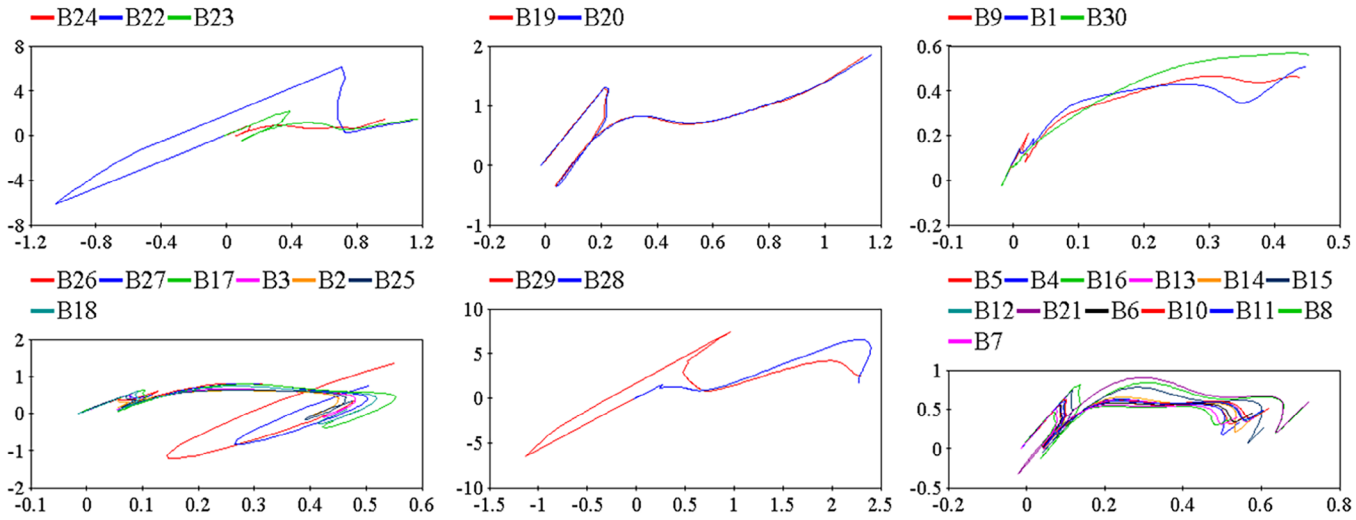


**FIGURE 25** First derivative-second derivative curve of 39 bus system (six areas).

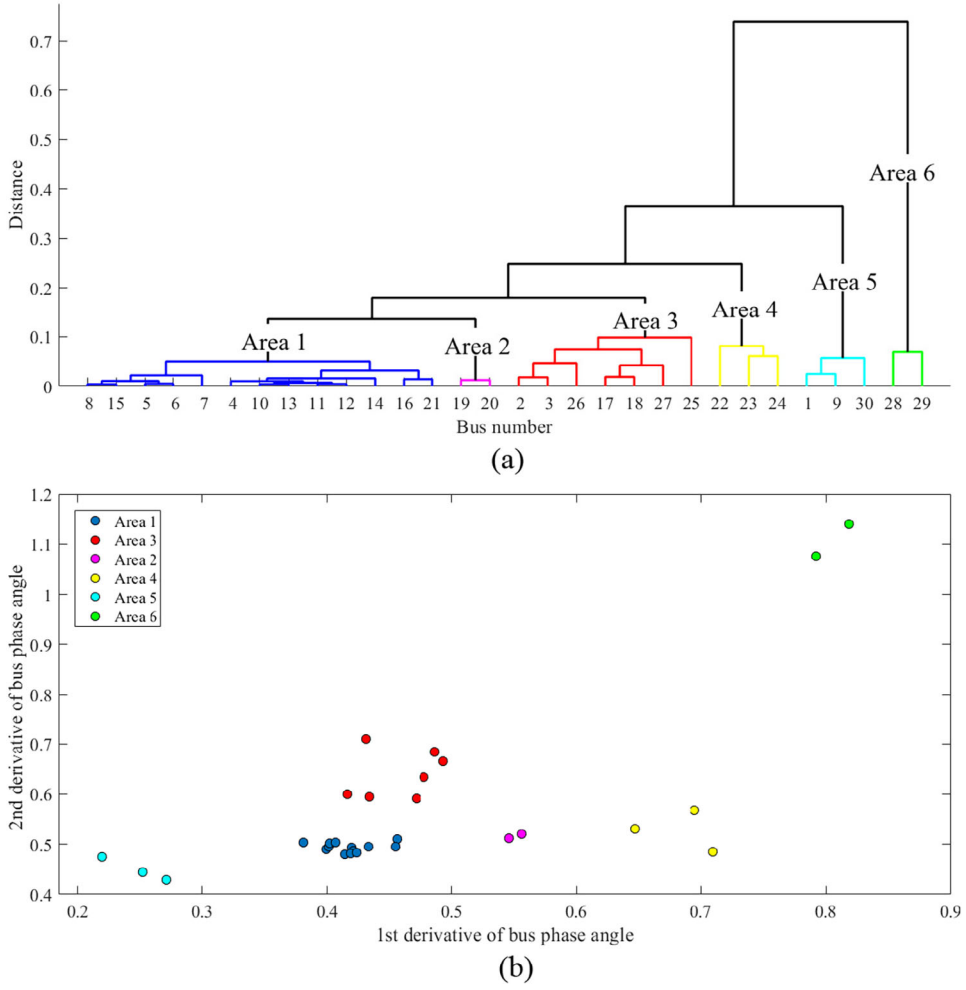


**FIGURE 26** 39 bus system clustering result (six areas): (a) dendrogram diagram; (b) scatter graph.

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The graph demonstrates the closeness of the data in one highlighted coherent area with respect to another.

## 4 | CONCLUSIONS

A novel PMU-based coherency area identification for controlled islanding in power systems has been proposed in this paper. It is based on the first and second derivatives of bus voltage angle which has been experimentally validated to detect the coherency between both generator bus and non- generator bus. The concept which has been used for this purpose is the similarity checking at each phasor time step for (slip-rate of change of slip) pattern of all the system bus voltage angles. This method successfully identifies the coherent areas that are formed in the system along with the boundary of each area in a record time that helps in rapid islanding before the system collapses. The proposed method has been tested in three benchmark systems considering several scenarios. The results show the successful performance of the proposed approach for coherency identification in real-time.

### AUTHOR CONTRIBUTIONS

**Zainab Alnassar**: Data curation; formal analysis; investigation; methodology; visualization; writing – original draft. **Nagarajan Selukka Thulasiram**: Conceptualization; resources; software; supervision; validation; visualization; writing – review & editing.

### CONFLICT OF INTEREST STATEMENT

The authors declare that they have no conflicts of interest.

### DATA AVAILABILITY STATEMENT

Data has been already given in the paper and references.

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## APPENDIX

The dynamics of generator in terms of second order differential equation can be represented by:

$$\frac{d^2\Delta\delta}{dt^2} + 2\tau w_n \frac{d\Delta\delta}{dt} + w_n^2 \Delta\delta = 0, \tag{A.1}$$

where: $\Delta\delta = \delta - \delta_0$, $w_n$ is the frequency of oscillation and $\tau$ is damping ratio.

With: $x_1 = \Delta\delta$ and $x_2 = \dot{\Delta\delta}$. Equation (A.1) can be written in state variable form as:

$$\begin{bmatrix} \dot{x_1} \\ \dot{x_2} \end{bmatrix} = \begin{bmatrix} 0 & 1 \\ -w_n^2 & -2\tau w_n \end{bmatrix} . \begin{bmatrix} x_1 \\ x_2 \end{bmatrix}, \tag{A.2}$$

Or:

$$\dot{x}(t) = Ax(t), \tag{A.3}$$

$$y(t) = Cx(t), \tag{A.4}$$

where $A = \begin{bmatrix} 0 & 1 \\ -w_n^2 & -2\tau w_n \end{bmatrix}$ and $C = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$.

Solving for X(s) we get:

$$\Delta\delta(s) = \frac{s + 2\tau w_n}{s^2 + 2\tau w_n s + w_n^2} . F(s). \tag{A.5}$$

**For stable condition**:

We model the disturbance with forcing function for Equation (A.5) as unit impulse with F(s) = 1.

Taking inverse Laplace transform the output in time domain will be:

$$\Delta\delta(t) = \frac{1}{\sqrt{1-\tau^2}} e^{-\tau\omega_n t} \sin(w_d t + \theta), \tag{A.6}$$

which can be approximated as exponentially decreasing sinusoidal oscillation as Equation (1).

**For unstable condition**:

We model the disturbance with forcing function for Equation (A.5) as with $f(t) = e^{at}$ $(F(s) = \frac{1}{s-a})$ and $\tau = 0$. Taking inverse Laplace transform the output in time domain will be:

$$\Delta\delta(t) = \frac{a}{w_n^2 + a^2} e^{at} + \frac{a}{w_n^2 + a^2}\left(-\cos w_n t + \frac{w_n}{a}\sin w_n t\right), \tag{A.7}$$

which can be represented as exponentially increasing component in addition to sinusoidal periodic oscillation as Equation (4).

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# Wavelet-based Alzheimer's Disease Detection using Edge-Weighted Local Binary Pattern

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***Abstract*—Alzheimer's disease is a neurodegenerative syndrome that influences the people worldwide. As the disease progresses, it reduces the cognitive skills in individuals and makes them unable to perform their everyday tasks. In the proposed method a new feature extraction technique is proposed which captures the important biomarkers for early Alzheimer's disease detection. In proposed technique Dual tree complex wavelet transform has been applied on 2-D MR slices to obtain six sub-band images. Further Edge weighted Local Binary Pattern has been applied on sub-band images to obtain edge prominent texture patterns. The dimensionality of these patterns is reduced by using Principal Component Analysis. The extracted features are then used for Alzheimer's disease classification. Experimental results show that edge weighted Local Binary Pattern gives better classification results than normal Local Binary Pattern as edge weighted Local Binary Pattern provides the local gradient variation information. Different models have been compared in the paper to test the potential of proposed method. The proposed method has been implemented on Open Access Series of Imaging Studies dataset and remarkable results have been obtained in terms of accuracy of 94.2%, sensitivity of 96%, and specificity of 93%. The proposed method surpasses the performance of latest methods existing in literature for Alzheimer's Disease detection.**

***Keywords—Alzheimer's disease detection, Wavelet-based feature extraction, Local Binary Pattern, Dimensionality Reduction, Edge related features***

## I. INTRODUCTION

Alzheimer's disease (AD) is indeed a critical global health crisis particularly among aged persons across the world [1]. It is anticipated that with the beginning of 2050, the amount of AD patients will cross 50 million. The current available treatments provide symptomatic relief to the patients and do not reverse the neurodegenerative progression [2,3]. These treatments can be more effective in controlling further degeneration if provided at the early stages. The main cause of AD is the accumulation of abnormal proteins in the brain [4]. This leads to loss of neurons which causes structural changes like reduction in grey matter density, variations in hippocampus size and cortical surface [5]. These changes can be investigated by using neuro-diagnostic test like Magnetic Resonance Imaging (MRI), Positron Emission Tomography (PET), and functional MRI (fMRI). MRI is one of the best medical imaging techniques which provides good quality high resolution images [6,7]. In literature, several techniques like Region of Interest (ROI) [8], Voxel-Based Morphometry (VBM) [9] and Surface-Based Morphometry (SBM) [10] are available for AD classification. These techniques basically depend upon the type of features extracted from the brain. In Region of interest (ROI) based method, structural and textural features are extracted from a specific region, but that region needs to be segmented first. The segmentation requires lot of prior information which is difficult task. In VBM technique, registration of images on template and proper alignment of images are required for obtaining tissue density maps. The accuracy of SBM technique depends upon the skills of researchers for using Free-surfer tool. Both SBM and VBM techniques are difficult to perform due to the complex structure of the brain. This paper presents a feature extraction technique which utilizes the whole brain and does not need segmentation and image registration [11]. The proposed technique applies wavelet transform on whole MR scans and extracts structural features using edge weighted Local Binary Pattern (LBP).

There are some techniques available in literature which are based on wavelet transforms. The study [12] used Discrete Wavelet Transform (DWT) for coefficient-based AD detection and obtained 93% accuracy while another technique used Dual Tree Complex Wavelet Transform (DTCWT) [13] and obtained fifth level DTCWT detail coefficients for AD classification. They also reduced feature dimensions by Principal Component Analysis (PCA) and obtained 90.06 % of accuracy. Further with the introduction of Linear Discriminant Analysis (LDA) in study [14], these results were improved to 96.68%. The study [15] used Extreme Learning Machine (ELM) with DTCWT coefficient-based feature extraction and improved results up to 97%. %. The current study [16] used contourlet transform to extract energy features from multiple ROIs and obtained 86% accuracy for AD classification.

In this paper, DTCWT has been used for image decomposition into six detail sub-bands. Subsequently Edge weighted LBP has been applied on the detail sub-band images to obtain the texture patterns in an image. EWLBP captures the texture information along with edge information. Further Principal Component Analysis has been applied on edge weighted patterns to reduce dimensionality. The following contributions are drawn through this paper: DTCWT detail coefficients capture the grey matter density variations and local gradient information included in EWLBP provide the structural details. Both biomarkers are essential for early AD

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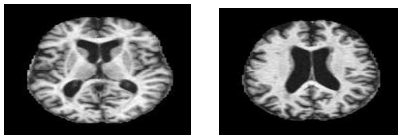

(i) (ii)

Fig. 1 2-D Slice (i) AD and (ii) NC

detection. In the proposed work edge information is also included in the encoding process of LBP. It provides more enhanced features which can discriminate the different texture patterns having prominent edge structures. The proposed approach uses DTCWT which enhances the classification results by providing directional features. The proposed method is based on local gradient variations so more robust towards noise.

The remaining paper is divided into three sections. The second section deals with the proposed methodology along with the background material and dataset information. The third section carries the discussion over results and performance. The fourth and final section deals with conclusion of the research including future scope.

## II. Proposed Method And Data

### A. Dataset

The dataset used in the implementation work is related to Open Access Series of Imaging Studies **(**OASIS) dataset. OASIS collects different 3-D cross-sectional and longitudinal structural MRIs of AD and NC classes along with demographic details of the subjects. The total 416 individuals between 18 to 96 years are available in OASIS dataset [17]. In proposed work, total 56 3-D MRI's have been downloaded with 28 subjects belonging to each class. The four centre slices have been extracted from each 3-D MRI using XMedCon software. This results in dataset having 112 2-D slices for each category. The Clinical Dementia Ratings (CDR) of AD and NC data are 0.5 and 0 respectively. CDR indicates the stage of severity in AD patients. The 2-D slices used in implementation work is shown in Fig. 1.

### B. Proposed Method

In proposed method, DTCWT has been applied on 2-D MR slices to obtain six detailed sub-bands. Further Edge weighted Local Binary Pattern (EWLBP) has been applied on the sub-band images. The EWLBP includes gradient operator namely, Sobel for extracting gradient magnitude of the central pixel lying in 3 X 3 neighbourhoods. The edge information is included in the computation of binary patterns due to this gradient magnitude of the centre pixels. The central pixels having high gradient magnitudes contain large edge information and thus given more weightage in pattern computation. Now these weighted pixels are used to compute EWLBP in a similar way of original LBP [18]. Fig. 2 indicates the eight neighbouring pixels with centre pixel Nc in 3X3 neighbourhood.

LBP can be computed using equation (1)

$$LBP_{P,r}(x, y_)) = \sum_{n=1}^{P} Sign(f)2^{n-1} \quad (1)$$

f= Nn(r) - Nc where Nn represents the neighbour pixel at r distance from centre pixel Nc.

$$Sign=\begin{cases}1, f \geq 0\\ 0, f < 0\end{cases} \quad (2)$$

The coordinates of P number of neighbours Nn (xn, yn) around centre pixel can be obtained as

$$xn= x+ r \cos(2\pi/P) \quad (3)$$
$$yn= y+ r \sin(2\pi/P) \quad (4)$$

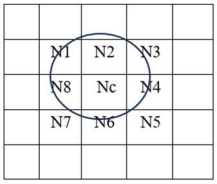


Fig. 2. 3X3 neighbourhood

From equation 1, EWLBP can be obtained by computing gradient variations through Sobel Operator. This operator is used to find the rate of change of pixel value in x and y direction through two kernels. Gradient magnitude of pixel is computed by finding the under root of the addition of the squares of gradients related to that pixel in x and y directions. Now this gradient magnitude of central pixel is used as weights for that 3X3 window. Steps for computing Edge-weighted LBP are as

- Compare the centre pixel intensity with the intensity of 8 neighbour pixels in 3X3 neighbourhood.
- Assign binary value 1 if neighbour pixel intensity is greater than centre pixel intensity and 0 if neighbour pixel intensity is smaller than centre pixel intensity.
  Pattern= {1 if Ic<Ip and 0 if Ic>Ip} here Ic and Ip are intensity of centre pixel and neighbour pixel respectively.
- Binary values are weighted according to the gradient magnitude of centre pixel in that 3 X 3 window.
  Second Pattern=pattern1*G
  where G is the gradient magnitude of centre pixel for that respective 3 X 3 neighbourhood.
- Now edge-weighted LBP can be calculated as
  $$EWLBP_{P,r}(x, y_)) = \sum_{n=1}^{P} \text{Second Pattern } 2^{n-1}$$
  In EWLBP, different weights are assigned to the pixels in 3X3 neighbourhood according to the gradient magnitude of centre pixel. Fig.3 shows the block diagram of proposed methodology in the paper. Fig.4 shows the six sub-band images and gradient image of HH sub-band obtained by sobel operator.


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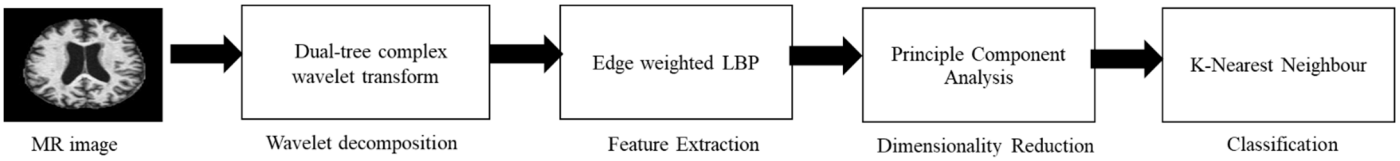


Fig. 3. Proposed methodology

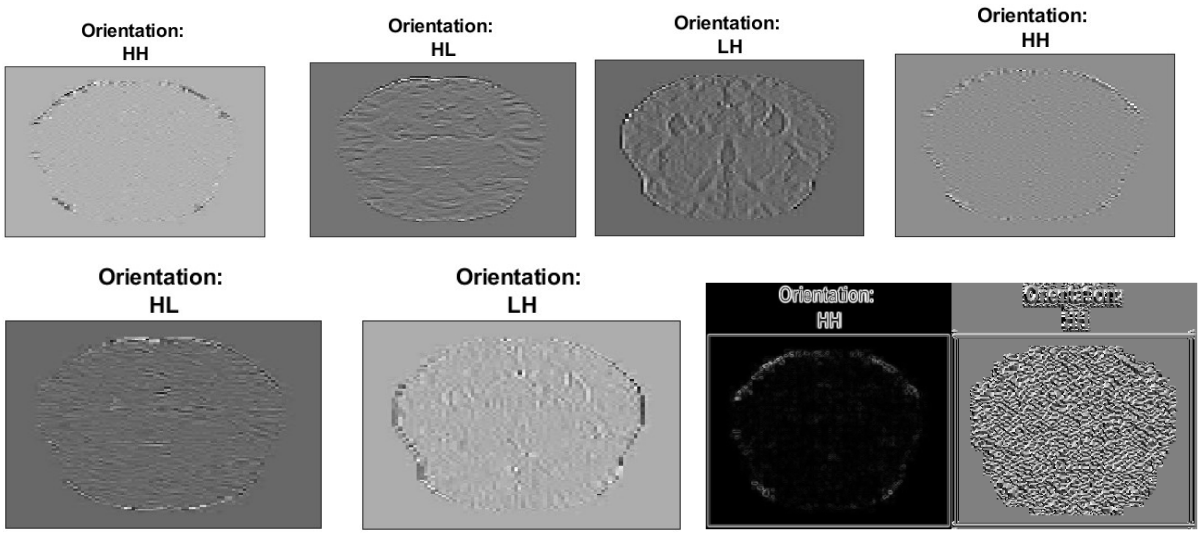


Fig. 4. Six sub-band images and gradient images of HH sub-band

### C. Dual Tree Complex Wavelet Transform

DT-CWT extracts feature in six directions of $\pm 15°$, $\pm 45°$, $\pm 75°$. It does not show shift variance and has high directional selectivity. Fig.5 illustrates the implementation of 1-D DT-CWT. It has two DWT trees, operating in parallel. Tree 'a' filters are the real part and Tree 'b' filters are the imaginary part of the complex wavelet. Rl and Il are the low pass filters and Rh and Ih are the high pass filters.

Analysis and synthesis filter banks in both DWT trees are selected in a manner by which the wavelet of `Tree 'b' would be the Hilbert Transform of the wavelet of Tree 'a'. The analysis filters in first and subsequent stages are different in both trees to achieve perfect reconstruction conditions [19].

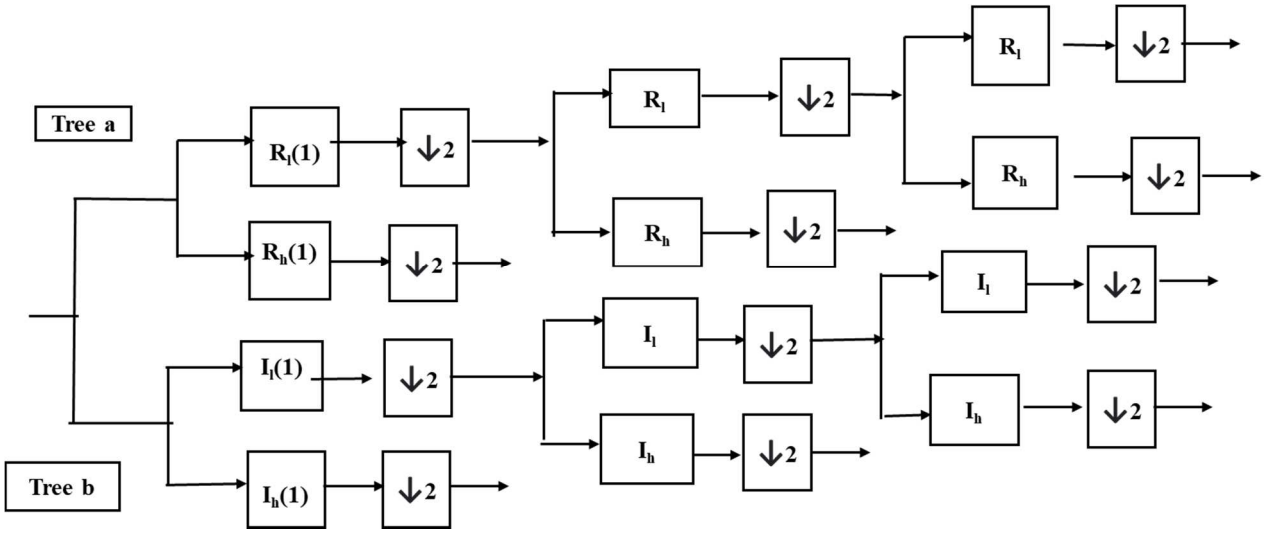


Fig. 5 1-D Dual Tree Complex Wavelet Transform


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### D. Principal Component Analysis(PCA)

Dimensionality of features have been reduced by using Principal Component Analysis (PCA) [20]. PCA keeps variances and provides the low-dimensional space of input data. The PCA includes the following steps:

(i) The initial data is standardized so that all input variables may be at same scale. This is done by calculating the mean of the input data matrix I (M x L). A matrix $M_{mn}$( M x L dimensions) is formed with the mean value of input data matrix I (M x L).

(ii) The covariance matrix $C_{ov}=\frac{1}{I}M_{mn}^{T}.M_{mn}$ is computed.

(iii) There exists a relation relation $V^{-1}C_{ov}V=D_{gl}$ with V and $D_{gl}$ representing as eigen vector and diagonal matrices respectively. This relation is used to find the eigenvalue and the eigenvector. Subsequently, principal components are obtained with the help of eigen values and eigen vectors.

(iv) The data matrix is projected in the direction of principal components.

## III. Experimental Analysis

### A. Classification Performance Meterics

Accuracy (Acc), Sensitivity (Sen) [21], and specificity (Spec)[22] have been used for performance evaluation in the proposed work. Accuracy indicates the ratio of true predictions out of total predictions. True predictions comprise both true positives and negatives. Total predictions comprise all the four possibilities like true positives ($T_{ps}$) true negatives ($T_{ns}$), false positives ($F_{ps}$)and false negatives ($F_{ns}$) .Accuracy can be mathematically obtained as

$$\text{Accuracy} = \left(T_{ps}+T_{ns}\right)/\left(T_{ns}+T_{ps}+F_{ns}+F_{ps}\right) \quad (5)$$

Sensitivity indicates the ratio of true positives with the total number of actual positive cases. It is mathematically written as

$$\text{Sensitivity} = \left(T_{ps}\right)/\left(T_{ps}+F_{ns}\right) \quad (6)$$

Specificity indicates the ratio of true negatives with the total number of actual negative cases. It can be written as

$$\text{Specificity} = \left(T_{ns}\right)/\left(T_{ns}+F_{ps}\right) \quad (7)$$

False negatives are misclassified AD people, False positives are misclassified normal people, True negatives are rightly predicted normal people and True positives are rightly predicted AD people.

### B. Performance Evaluation

The proposed method provides superior outcomes in comparison with the other models implemented in the paper. These models are LBP, DTCWT+ LBP+PCA, EWLBP. In the first model LBP of the images are computed and histogram features are obtained. These features are used for AD classification. This model provides 87.1% accuracy. In the second model DTCWT is also introduced, and LBP has been computed over sub-band images. This model gives 256 X 6 histogram features which are further reduced by using PCA. This model gives 89.1% accuracy. In the third model EWLBP has been applied directly on images and histogram features have been calculated. This model gives 92.1% accuracy. In the fourth and proposed model DTCWT has been introduced with EWLBP to extract the directional features. This model provides 256 X 6 histogram features which are used for AD classification. The proposed method provides 94.2% accuracy. Table I includes the performance of four models implemented on OASIS MRI data. Table II represents the performance analysis of the proposed and current approaches.

TABLE I: EVALUATION OF FOUR MODELS

| Method | Classifier | Acc | Sen | Spec |
|---|---|---|---|---|
| LBP | KNN | 87.1 | 85 | 90 |
| DTCWT+LBP+PCA | KNN | 89.1 | 88 | 91 |
| EW-LBP | KNN | 92.1 | 90 | 94.1 |
| DTCWT+EW-LBP +PCA[Proposed] | KNN | 94.2 | 96 | 93 |

| Method | Classifier | Acc | Sen | Spec |
|---|---|---|---|---|
| Proposed method | KNN | 94.2 | 96 | 93 |
| | DT | 91.5 | 88 | 96 |
| | LDA | 92.9 | 92 | 94 |
| | LSVM | 93.8 | 92 | 96 |

TABLE II: COMPARISION BETWEEN PROPOSED AND CURRENT ALGORITHMS

| Algorithms | Acc (%) | Sen (%) [21] | Spec (%) [22] |
|---|---|---|---|
| Edge weighted texture features [Proposed] | 94.2 | 96 | 93 |
| Shearlet +Statistical feature- | 91.2 | 92.3 | 90.1 |
| DTCWT+ Texture features | 92.2 | 93.3 | 94 |
| DTCWT+RCWF+ Texture features | 90.7 | 91.2 | 92.4 |


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Table II shows the comparison in between existing methods and proposed method. All these algorithms have been implemented on MATLAB 2019 on OASIS dataset. The proposed method surpasses the best performing existing method by 2.2%. The study [23] applied shearlet transform to extract statistical features from the affected regions of the brain. This method provided 91.2% accuracy, 92.3% sensitivity and 90.1% specificity on execution. The study [24] used DTCWT to extract texture features and obtained 92.2% accuracy, 93.3% sensitivity, and 94% specificity on execution. The current study [25] used DTCWT and its rotated version to obtain texture features like Energy and Entropy. This method provided accuracy, sensitivity, and specificity of 90.7%,91.2% and 92.4% respectively. Lastly, the proposed algorithm gives accuracy of 94.2%, sensitivity of 96% and specificity of 93% specificity using k-NN classifier. The Receiver Operating Characteristic (ROC) plot of executed and proposed algorithms are shown in Fig. 6.

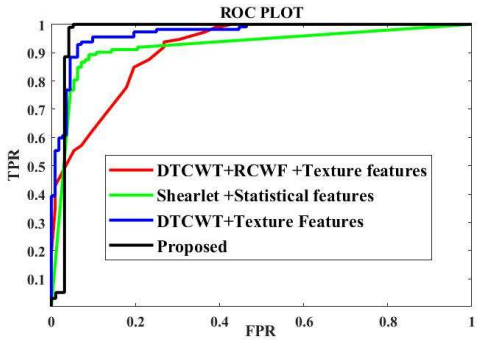


Fig. 6. ROC plots:

## IV. Conclusion

Alzheimer's Disease has very bad consequences on the health of patients. This paper focuses on capturing biomarkers essential for early AD detection. The paper introduces a new feature extraction technique which includes the combination of DTCWT +Sobel Operator and LBP for extracting structural features from 2-D MR slices. The detailed imaginary coefficients of DTCWT also indicate the high frequency variations in grey matter. Experiments conducted indicate the importance of including the weightage of gradient variations in local binary patterns for early AD detection. The results obtained are 94.1% accuracy,96% sensitivity and 93% sensitivity. The directions of future research are (i) testing with other wavelets (ii) analyzing proposed method with different variants of LBP and Elliptical LBP (iii) introducing feature selection stage (iv) performing multi-class classification by taking transition stages of AD.

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