

A Dimensionality Reduced Iris Recognition System with Aid of AI Techniques

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Abstract

Technologies that exploit biometrics have the potential for the identification and verification of individuals designed for controlling access to secured areas or materials. One of the biometrics used for the identification is iris. Many techniques have been developed for iris recognition so far. Here we propose a new iris recognition system utilizing unbalanced wavelet packets and FFBNN-ABC. In our proposed system, the eye images obtained from the iris database are preprocessed using the adaptive median filter to remove the noise. After removing the noise, iris part is localized by using contrast adjustment and active contour technique. Then unbalanced wavelet packets coefficients and Modified Multi Text on Histogram (MMTH) features are extracted from the localized iris image. Then MMTH features extracted are clustered by using the MFCM technique. After clustering, the dimensionality of the features is reduced by using PCA. Then the dimensionality reduced features unbalanced wavelet packet coefficients are given to FFBNN to complete the training process. During the training, the parameters of the FFBNN are optimized using ABC Algorithm. The performance of our proposed iris recognition system is validated by using CASIA database and compared with the existing systems. Our proposed iris recognition system is implemented in the working platform of MATLAB. Keywords: feed forward back propagation neural network (FFBNN), adaptive median filter, unbalanced haar wavelet, modified multi text on histogram (MMTH), iris recognition, artificial bee colony algorithm (ABC), principle component analysis (PCA), modified fuzzy c-means (MFCM).

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1 A Dimensionality Reduced Iris Recognition

System with Aid of AI Techniques N. Murali Krishna ? & P. Chandra Sekhar Reddy ? Abstract-Technologies that exploit biometrics have the potential for the identification and verification of individuals designed for controlling access to secured areas or materials. One of the biometrics used for the identification is iris. Many techniques have been developed for iris recognition so far.

Here we propose a new iris recognition system utilizing unbalanced wavelet packets and FFBNN-ABC. In our proposed system, the eye images obtained from the iris database are preprocessed using the adaptive median filter to remove the noise. After removing the noise, iris part is localized by using contrast adjustment and active contour technique. Then unbalanced wavelet packets coefficients and Modified Multi Text on Histogram (MMTH) features are extracted from the localized iris image. Then MMTH features extracted are clustered by using the MFCM technique. After clustering, the dimensionality of the features is reduced by using PCA. Then the dimensionality reduced features & unbalanced wavelet packet coefficients are given to FFBNN to complete the

training process. During the training, the parameters of the FFBNN are optimized using ABC Algorithm. The performance of our proposed iris recognition system is validated by using CASIA database and compared with the existing systems. Our proposed iris recognition system is implemented in the working platform of MATLAB.

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traditional biometrics such as finger prints and facial features [13]. Also, the probability of finding two people with identical iris pattern is almost zero [7]. That's why iris recognition technology is becoming an important biometric solution for people identification in access control [14]. More technically, the iris is part of the unveil, or middle, coat of the eye. It is a thin diaphragm stretching across the interior portion of the eye and supported by the lens [4]. Iris recognition is a method of biometric authentication that uses pattern-recognition techniques based on high-resolution images of the irises of an individual's eyes [2]. There are four main techniques in Iris Recognition System Namely: Segmentation, Normalization, Feature Extraction And Matching [12]. Iris recognition begins with finding an iris in an image, demarcating its inner and outer boundaries at the pupil and sclera, detecting the upper and lower eyelid boundaries if they occlude and detecting and excluding any superimposed eyelashes or reflections from the cornea or eyeglasses. These processes may collectively be called segmentation [1]. Iris normalization mainly involves two basic operations, one is to detect eye lids and the other is boundary detection. The first step involves extraction of circular shaped iris rim by removing the noisy regions. The second step is to detect the inner and outer boundaries of iris. [5]. The matching module generates a match score by comparing the feature sets of two iris images [11].

The great advantage of the authentication using iris recognition is the irreplaceable nature. It has various applications to high-security facilities, but it is now being widespread developed in information systems such as network, e-commerce, and retail applications [3]. Although, a number of iris recognition methods have been proposed, it has been found that several accurate iris recognition algorithms use multiscale techniques, which provide well-suited representation for iris recognition [10]. The main difficulty of human iris recognition is that it is hard to find the apparent feature points in the image and to keep their represent ability high in an efficient way [17]. The data are unique to the individual and remain so throughout one's life [8]. The performance of iris recognition systems highly depends on the Introduction today, many countries are considering or even announced procurement of bio-metrically enabled national identity (ID) card schemes, one of whose purposes will be to detect and prevent multiple IDs [1]. Applications such as passenger control in airports, access control in restricted areas, border control, database access and financial services are some of the examples where the biometric technology has been applied for more reliable identification and verification [6]. Biometric is unique to each individual and is reliable [16]. Iris recognition is the most reliable biometric system available because of iris uniqueness [19], stability, permanency and easily taking [3]. Iris based recognition has been gaining popularity in recent years, and it has several advantages compared to other II.

2 Related Works

Fernando et al. [21] have used a modular neural network architectures as systems for recognizing persons based on the iris biometric measurement of humans. In that system, the human iris database was enhanced with image processing methods, and the coordinates of the center and radius of the iris were obtained to make a cut of the area of interest by removing the noise around the iris. The input to the modular neural networks was the processed iris images and the output was the number of the person identified. The integration of the modules was done with a gating network method results demonstrate that the use of the human iris biometric measurement worked with modular artificial neural networks and favorable results of person identification were obtained. Kodituwakku et al. [22] have attempted to develop an algorithm for iris recognition based on Fuzzy logic incorporated with the visible properties of the human iris function. They were considered the visible features of the human iris such as pigment related features, features controlling the size of the pupil, visible rare anomalies and pigment frill. First they extracted the important and essential feature of a human iris image. Secondly, as an AI technique, Fuzzy logic was applied for iris recognition and person identification. The final system was a very successful at a rate of 98.6% accuracy in recognition with small mistakes.

Hariprasath et al. [23] have presented an iris recognition system based on Wavelet Packet Analysis. With an adaptive threshold, WPT sub images coefficients were quantized into 1, 0 as iris signature. Those signatures presented the local information of different irises. By using wavelet packets, the size of the iris signature of code attained was 1280 bits. The signature of the iris pattern was compared against the stored pattern after computing the signature of iris pattern Identification was performed by computing the hamming distance. The accuracy of the proposed system varied when different feature vector was chosen. Pushpalatha et al. [25] have proposed an iris recognition system with iris localization to segment and recognize cooler iris with highest speed and accuracy. Frequency domain magnitude and phase features were used for image feature representation. For classification process, support vector machines with "winner takes it all" configuration were used. Tests have shown 97% accuracy with average time of 31 milliseconds seconds for classifying each test image. They developed the iris recognition system using C#.Net (.Net 3.5).

3 III. Proposed Iris Recognition System using ai Techniques

In the proposed methodology, the given input image is preprocessed using adaptive median filter for removing salt and pepper noise at the first stage. Following that, by adjusting the contrast and applying active contour technique on the preprocessed eye image, iris is localized. Then Unbalanced Wavelet Packet coefficients and MMTH features are extracted from the localized iris image and the extracted features are clustered using MFCM. Following that the dimension of the features are condensed using PCA. The Unbalanced Wavelet Packet coefficients and the dimension reduced MMTH features are given to train FFBNN. While training the parameters of the FFBNN are optimized using ABC. During the testing process the same procedure is done here till the feature extraction process. Then the output obtained from the feature extraction process is given to well-trained FFBNN-ABC to validate whether the given input iris image is recognized or not. The architecture diagram of the proposed Iris Recognition System is shown in Fig. 1.

proposed method. Section 3 discusses about the proposed technique. Section 4 shows the experimental result of the proposed technique and section 5 concludes the paper. Naresh Babu et al. [24] have proposed an efficient Fuzzy based Iris Recognition Scheme (FIRS). That scheme has four stages namely Segmentation, Normalization, Feature extraction and classification using fuzzy logic. Hough transforms used for detection of Region of Interest (ROI), and combination of Discrete Wavelet Transform (DWT) and Independent Component Analysis (ICA) was used for feature extraction. Using mean and standard deviation as parameters a fuzzy classifier was used to classify the IRIS images. The results were quite convincing and encouraging. The input eye image is initially changed into grey level format. After that using Adaptive median filter, the grey level eye image is preprocessed to take away salt and pepper noise. The input image may have noises which destroy the good pixels in the image. The noise must be eradicated from the input image in order to attain good precision. We are applying adaptive median filter to salt and pepper noise in our suggested work. It identifies the impulse by calculating the difference between the standard deviation of the pixels inside the filter window and the concerned current pixel.

Let the iris database () I contains many eye images and let j i

x , be one of the grey level images taken from the database. The lower and upper bounds x are () ? ? + ? = + ? = = k i k i m k j k i n n m s j i s u , ,(2)

4 () () ()

j i WS j i s u j i , , , = μ (4) Global Journal of Researches in Engineering () Volume XIV Issue IV Version I () () () j i WS j i j i k i k i m k i k i n j i s , , , , ? ? ? ? ? ? = ? ? + ? = + ? = μ ? (5)

Next by means of these local mean, standard deviation and as well a user defined multiplier upper and lower bounds are computed. j i m j i s , , 1 min ? $\mu \times ? =$ (6) () () j i m j i s , , 1 max ? $\mu \times + =$ (7)

The noise candidates only substituted by the median s ws med j i , , in the above adaptive median filter algorithm, while staying behind are unaltered. By means of the above adaptive median filter algorithm the salt and pepper noise is eliminated from the specified input eye image and the preprocessed eye image is indicated as

x . This preprocessed eye image ()'

x is subsequently subjected to iris localization process.

5 b) Iris Segmentation and Normalization

Iris segmentation is the main part in the process of iris recognition. In order to segment the iris from the eye image, here enhanced iris segmentation technique by considering the adaptive thresholding is utilized. The proposed iris segmentation technique has four phases namely,? Removing Holes ? Pupil Detection ? Iris Detection ? Adaptive Normalization the preprocessed image ()'

x is binarized. The process of removing the hole from the pupil is detailed in the below steps:

Step 1: Set the threshold value (?) as 0.1.

Step 2: Obtain the binary image (' Bx).

Step 3: Take the complement image (' Cx) of the binarized image (' Bx).

Step 4: Take the binary image (' Bx) with all zeros and consider it as hole. 0 , ' = q where Hx q

Step 5: Catch a point (po) inside the hole.

Step 6: Check whether Bx Bx then go to step 7

Step 7:') ' (1 Cx Bx B q q ? Î?" ? = ? where Î?" is the structuring element defined as ? ? ? ? ? ? ? ? ?

0 1 0 1 1 1 0 1 0 Step 8: If 1 ' ' ? = q q Bx Bx ,then discover the hole filled image (' Hx) where ' ' ' Bx Bx Hx k ? =

Step 9: Find the number of connected components (?) from the hole filled image (' Hx).

Step 10: Increment the threshold value (?) as

6 i. Hole Filling

The eye image has holes in the pupil region which is the darkest region in the eye with nearly circular shape. In order to remove the holes from the pupil, binarized image is obtained by applying adaptive thresholding technique. The range of the threshold value (?) is between 0.1to 0.5. The binary images are obtained by adaptive thresholding technique. The maximum pixel value in the preprocessed image ()'

161 x is multiplied with the threshold value (?). Then by considering the value obtained after the multiplication,
 162 () (c L m d
 163) by 2. By using the obtained center (CPpl) and the radius (RPpl), pupil (Ppl) is detected.
 164 iii. Iris detection For iris identification, the preprocessed iris image is upgraded to have sharp variety at
 165 the image limits utilizing histogram evening out. This difference upgraded image is utilized for discovering the
 166 external iris range by drawing concentric loops of diverse radii from the understudy focus and the intensities
 167 lying over the border of the loop are summed up. Among the applicant iris loops, the loop having most extreme
 168 Here, scale based normalization approach [29] is utilized to normalize the iris image) (I in order to preserve the
 169 texture property of the features in the iris region) (I . In the normalization process, the obtained iris part) (I
 170 is converted into Cartesian space to nonuniform polar space. After that, the points lying on the perimeter of the
 171 iris
 172)) ((I P and pupil circle)) ((ppl P are obtained. Subsequently, the range of radius between the pupil and
 173 iris boundaries is obtained and it is mapped to a rectangle by considering the distance between the pupil and iris
 174 boundaries [29]. Finally, the obtained normalized iris image () , ..., 1 / , n i n i f X i i = + = ? (8) Where s i '
 175 ? are random variables with () . 0 = i E ?
 176 We first give a description of the construction of the UH vectors. Suppose that our domain is indexed by , ...,
 177 1 n i = as is the case in () , n b i ? + = The breakpoint n b < 1 , 0
 178 is to be chosen by the analyst. The positive change in power as for the long ago drawn round is the iris external
 179 limit. The sweep of the iris location steps is itemized in the accompanying steps.
 180 Input: radius of the pupil (RPpl), center of the pupil (CPpl), preprocessed image ()' x
 181 Output: Radius of the iris (IR)
 182 Step 1: Obtain the preprocessed image ()' x .
 183 Step 2: Find the histogram equalized image ()' x HE
 184 Step 3: Compute the size of the preprocessed image ()C R x × ? '
 185 Step 4: Calculate the radius of the iris as 5 . 1 × = Rppl IR Step 5: Check whether, 2 R IR ?
 186 , then go to step 6.
 187 Otherwise go to step 10
 188 Step Step 7: Find the coordinates (j i ,) of the image) cos() (? × + = IR l Rpp i i) sin(? × + = IR Rppl j
 189 j) ' () (x HE IR Sum = +
 190 Step 8: Increment the angle () ? by 10
 191 Step 9: If 360 ? ? go to step 7 otherwise go to step 5
 192 Step 10: Change the intensity over circumference
 193 Step 11: For i=1 to IR , do the following, 1 + ? = i i i

194 7 S S difference

195 Step 12: Find the maximum change in the intensity
 196 Step 13: Obtain the radius of the iris () IR way that () The recursion then continues in the same manner for
 197 as long as feasible, with each vector k j , ? having at most two "children" vectors ??).a the elements of l 1 l 1 l 1
 198 1 1 l 2 l 2 l e l b s e b e b l s s e s b < ? + ? ? ? ? ? ? + ? ? ? ? < ? ? ? ? ? ? ? + ? ? + ? = (9)
 199 The inner product between X and n b , , 1 + + + ? < = l j s l j e b X b l j max arg , 1 , 1 , 1 >
 200 where k k l 2 , 1 2 ? = again
 201 Where() k j k j f DUHT d , , =with() { } n i n i f f 1 = = and () K J k j DUHT , , ? ? = with { } . 1 n i i
 202 = = ? ? The s d k j '
 203 , are the true UH coefficients of f which are known and need to be estimated.

204 8 ?

205 Estimate each k j d , by means of a suitable "universal" shrinkage rule() , , , ? k j k j Y h d = . , , , k j k
 206 j k j d Y ? + = A Dimensionality Reduced Iris Recognition System with Aid of AI Techniques © 2014 Global
 207 Journals Inc. (US) () () . , , , i X DUHT X K J K J k j i ? ? = (12)
 208 where the function h has the property that ()

209 9) (2 V H

210) To remove the attributes from the images, MTH (Liu, et al., 2010) [26] is a dominant device which extorts the
 211 feature from the iris image by combining the benefits of co-occurrence matrix and histogram. Besides with these
 212 benefits, mean and variance measures are applied to develop the feature extraction process.
 213 By using the sobel operator on the iris image along both the horizontal and the vertical directions, the gradient
 214 images () The MMTH feature extraction process consists of following three steps:y gx x gx ' , '?' Computing
 215 Original Image Feature () (1 V H) ? Computing Orientation Image Feature () (2 V H) ? Modified Histogram
 216 Features () (V H) a. Computing Original Image Feature () (1 V H)
 217 Initially, the unique iris image is fragmented in to a number of grids where the grid may have the size of 3x3,
 218 5x5 and so on. Subsequently for every grid, mean (m) and variance (v) are computed and by means of those

are the uneven coefficients such as starting point, break point, ending point and features attained after dimension reduction correspondingly. The activation function for the output layer is specified in Eq. (16).

? Get the learning error. ii. Optimization of FFBNN parameters by ABC Now we are applying the ABC algorithm for optimizing the parameters of FFBNN while training to acquire competent iris recognition result. ABC algorithm is a swarm based meta-heuristic algorithm which was motivated by the sharp foraging behavior of the honey bees. It contains three components namely, employed bees, onlooker bees and scout bees. The employed bees are combined with the food sources in the region of the hive and they shift the data to the onlookers about the nectar quality of the food sources they are utilizing. Onlooker bees are looking the dance of the employed bees within the hive to pick one food source to use according to the data offered by the employed bees. The employed bees whose food source is discarded turn into Scout and look for novel food source randomly. The number of food sources indicates the location of probable solutions of optimization problem and the nectar amount of a food source represents the quality of the solution. The FFBNN parameters (). This generation process is called as initialization process. The fitness value of the produced food sources is computed by equation (??5) to assess the best food source.

15 b. Employed Bee Phase

Using the beneath equation, novel population parameters are produced in the employed bee phase, () $j \cdot k \cdot j \cdot i \cdot j \cdot j \cdot i \cdot j \cdot i \cdot x \cdot x \cdot V, \dots, ? + = ?$ (27)

? Compute BP mistake for every node and revise the weights as follows: () () ($tn \cdot tn \cdot tn \cdot w \cdot w \cdot ? + =$ (24)) ($tn \cdot w \cdot ?$ is attained as, () $B \cdot t \cdot x \cdot w \cdot n \cdot tn \cdot . \cdot$) ($? = ?$ (25)

Where ? is the learning rate, which usually ranges from 0.2 to 0.5, and Be is the Back Propagation fault.

? Next do again the steps (2)

Using ABC, the FFBNN parameters () for the onlooker bees from the solutions ($j \cdot i \cdot x$,) based on the probability value ($j \cdot P$). After that the fitness function is computed for the novel solution. In order to choose the best parameter, use the greedy selection process later.

16 d. Scout Bee Phase

Find out the abandoned parameters for the scout bees. If any abandoned parameter is present, after that substitute that with the novel parameters found out by scouts by means of the equation (??8) and assesses the fitness value. After that memorize the best parameters accomplished so far. Afterward the iteration is increased and the process is prolonged till the stopping criterion is arrived.

17 IV.

18 Experimental Results

Our proposed iris recognition system with FFBNN-ABC is implemented in the working platform of MATLAB (version 7.13). Our proposed iris recognition

19 J

Where, k and j is an arbitrary chosen index, ? is randomly produced number in the range [-1, 1] and $j \cdot i \cdot V$, is the novel value of the $th \cdot j$ position. Next the fitness value is calculated for every novel generated population parameters of food sources. From the calculated fitness value of the population, best population parameter is chosen i.e. the population parameter, which has the highest fitness value by using greedy selection process. Probability of the chosen parameter is calculated by the equation (??2) after choosing the best population parameter.

system is the combination of FFBNN and ABC. In order to reduce the computation complexity and get higher performance, the dimensionality of features is reduced with the help of the well-known optimization algorithm PCA. Then the dimensionality reduced features are given to the FFBNN to achieve the training process. So as to get more accuracy in the process of recognition, the FFBNN parameters are optimized using ABC algorithm. In the testing process, more data are given to the well trained FFBNN-ABC to validate the performance of the proposed technique. The performance of the proposed iris recognition system is evaluated using CASIA database and the proposed technique's performance is compared with the existing iris recognition systems given in [21], [23] and [24]. a) Performance Analysis By applying the statistical measures which is specified in [27], the concert of our suggested iris recognition system is examined. We employ CASIA iris thousand -NG database which has 788 number of iris images to complete the performance analysis process. For one dataset, our proposed technique takes 0.3225 seconds for training and 0.0054 seconds for testing. Totally our database consists of 51 dataset. The performance of the proposed technique is compared with other classifiers such as FFBN, FFBN_GA, Fuzzy, ANFIS&KNN and the corresponding statistical measures are given in Table 1(i). Then the performance of the proposed technique is analyzed by using Unbalanced Haar Wavelet and it is compared with other wavelets such as Haar, Coif let, Symlet & Bi-orthogonal wavelet and the corresponding statistical measures are given in Table 1(ii). Also our suggested iris recognition system performance is assessed and compared with the conventional iris recognition system given in [21], [23] & [24] and the corresponding statistical measures are given in Table

1(iii). Figure ??, 4 and 5 illustrate the sample of iris images, preprocessed images and iris segmented images correspondingly. In Table ??1(i) and Figure 6.(i), the performance of the proposed technique is compared with various classifiers such as FFBNN, FFBNN-GA, Fuzzy, ANFIS and KNN. By seeing both table and graph, we can say that the proposed technique yields higher rate of accuracy than the proposed technique. From the measurement of the accuracy, we can say that our proposed technique recognize the iris images effectively. In addition to that, the sensitivity and specificity are the two measurements which can provide the additional details about the performance of a technique. On looking at the sensitivity and specificity measures, our proposed technique has given better rate than the other classifiers. In specificity measure, our proposed technique is yielded 100% specificity. Also, when looking at the other measurements such as FPR and FDR, the proposed technique obtained 0% FPR and In Table ??1 (ii) and Figure (ii), the performance of the proposed technique is compared by changing wavelets such as Haar, Coif let, Symlet and Bi-Orthogonal. In our proposed technique, Unbalanced Haar Wavelet is utilized. On looking at both table and graph, we can say that the proposed technique yields higher rate of accuracy, sensitivity and specificity when compared to the other wavelet techniques. All the performance measures are showed that our proposed technique recognize the iris images efficiently. Similarly, the performance of the proposed technique is compared with the existing techniques such as [21], [23] and [24] and it is given in Table1.(iii) and figure 6 system in iris recognition process presents an incredible rate of accuracy (98.8317757), sensitivity, (98.69451697), specificity (100), FAR (0) and FRR (1.305483029). The high value of these measures illustrates that our suggested technique more precisely identifies the iris images from the specified test images. Based on FFBNN-ABC, the comparison result illustrates that our suggested iris recognition system has specified high accuracy than existing methods. Hence our suggested iris recognition system competently identifies the iris imaged by applying the FFBNN and ABC techniques.

Discussion: Comparison of the performance of the proposed technique with the other techniques in terms of FAR and FRR.

In Figure ??7, the performance of the proposed technique is compared with other techniques in terms of FAR and FRR. Our proposed technique has less FRR rate when compared to the other techniques. While seeing the value of FAR, our proposed technique offers 0% of FAR. It adds additional strength to our proposed technique in its performance. Thus our proposed technique proved its efficiency in the recognition of iris.

V.

20 Conclusion

We have suggested an iris recognition system based on FFBNN and ABC at this point. The suggested system was executed and CASIA iris thousand -NG database is employed to examine the results of the suggested iris recognition system. The presentation study confirmed that the suggested iris recognition J e XIV Issue IV Version

I 1 2 3



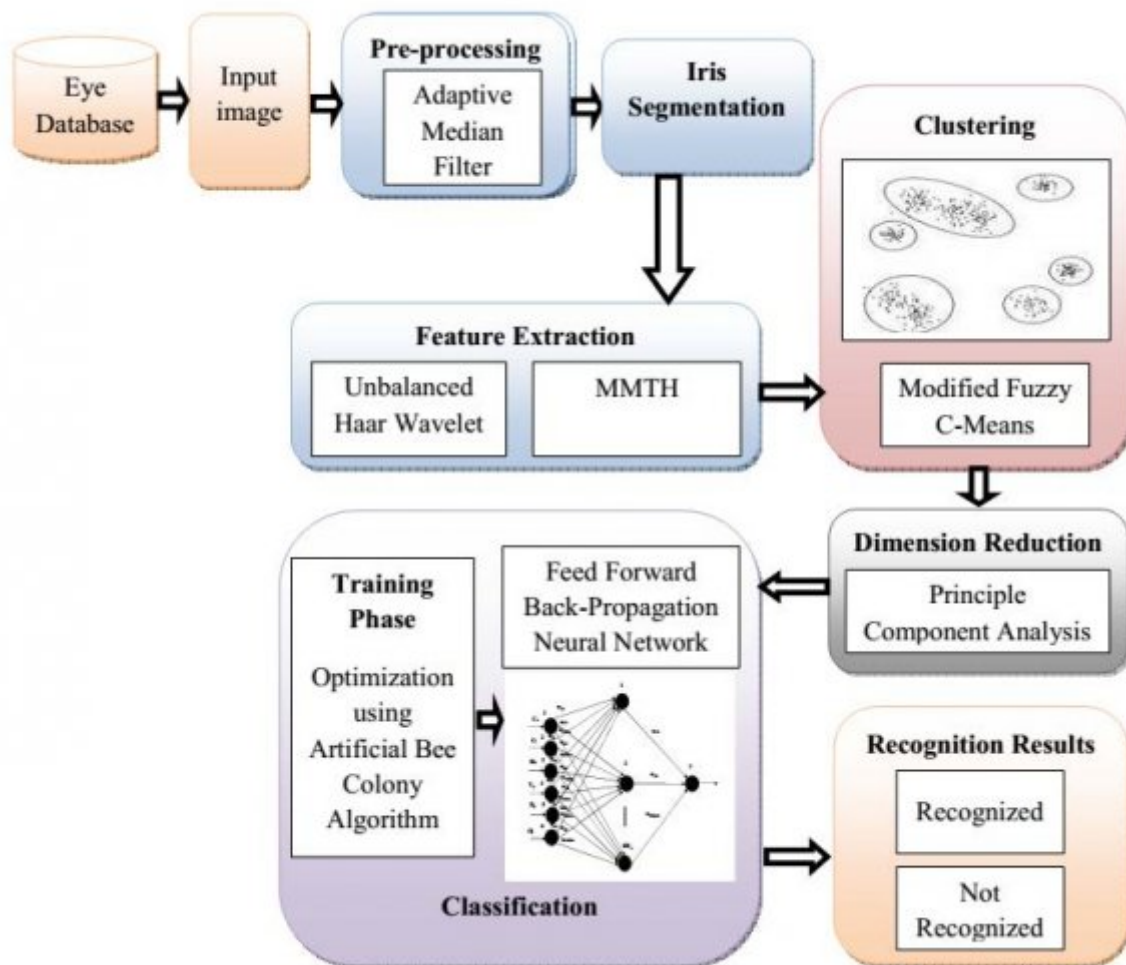
1

Figure 1: Figure 1 :

¹Year 2014 J

²© 2014 Global Journals Inc. (US) (MMTH). After that, gradient map ()

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Figure 2: 5 .

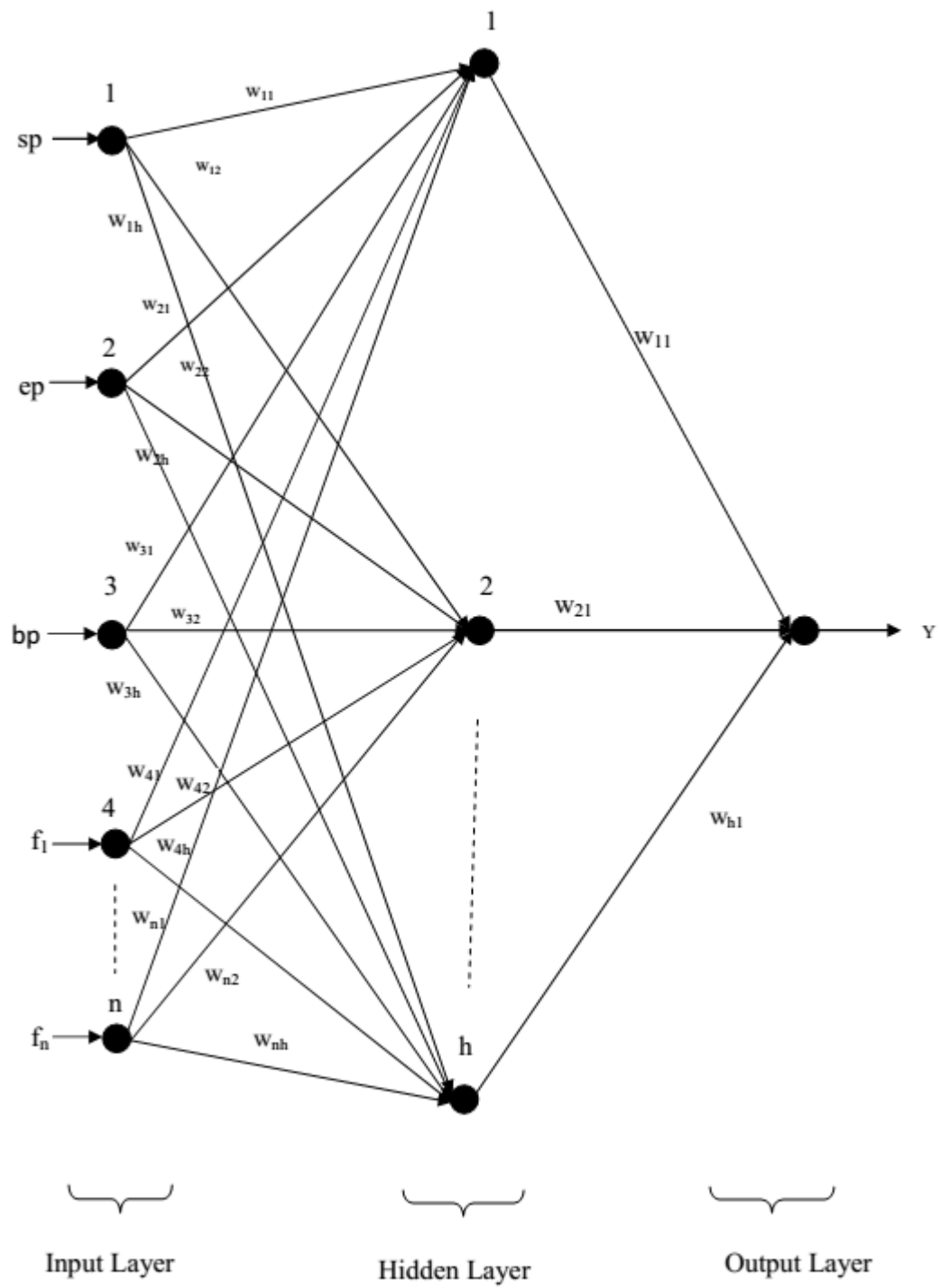


Figure 3: A



Figure 4: 12 :

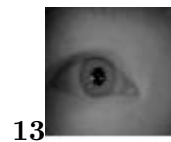


Figure 5: Step 13 :



Figure 6:



Figure 7: A



Figure 8: 6 :



Figure 9: ?

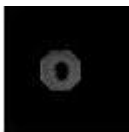


Figure 10:



Figure 11: the range of b is such that assumption 3.1 n

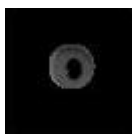


Figure 12:



Figure 13:



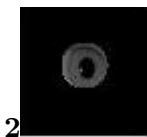
Figure 14:



Figure 15:



Figure 16:



2

Figure 17: Figure 2 :



Figure 18:

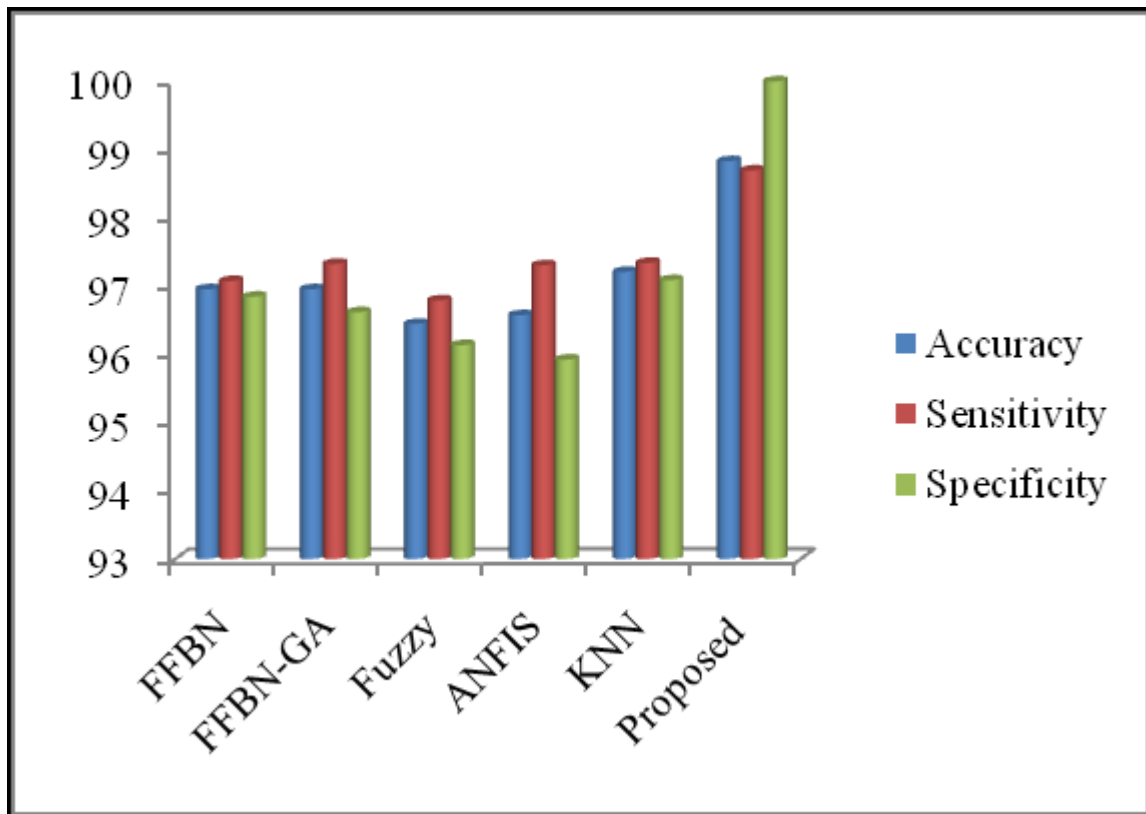


Figure 19:

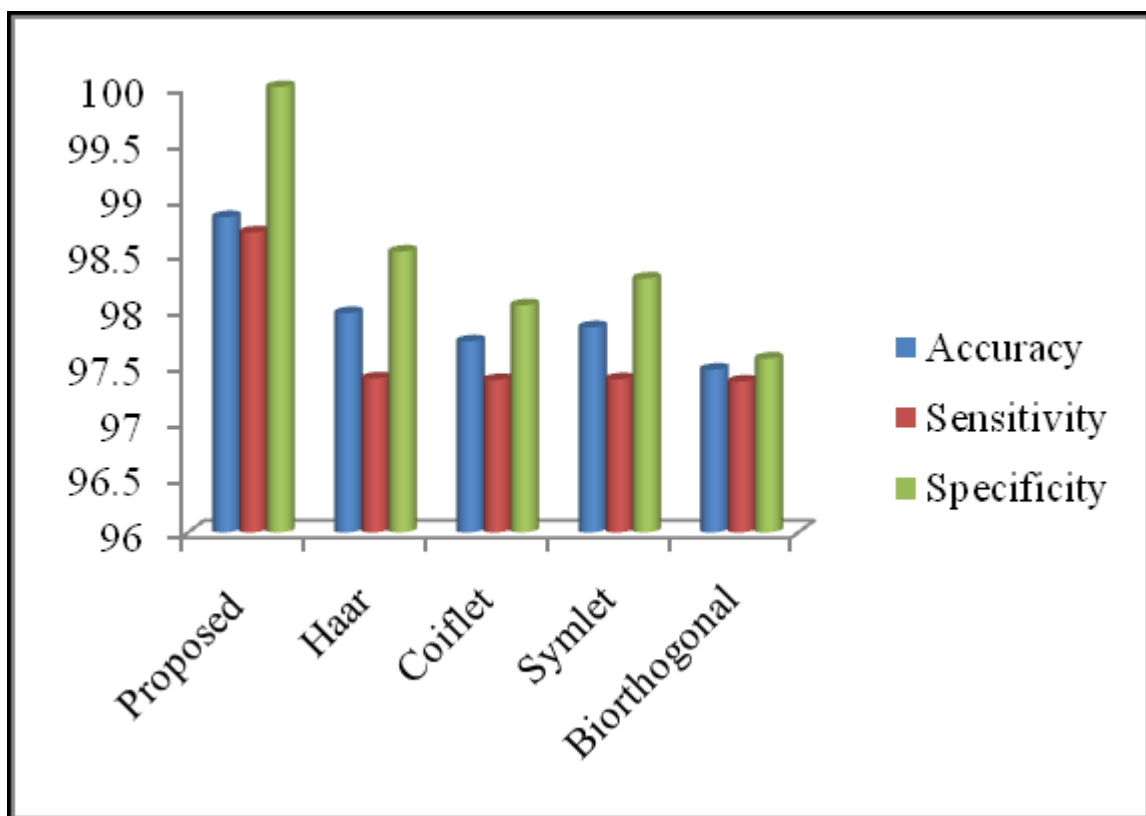


Figure 20: P

34

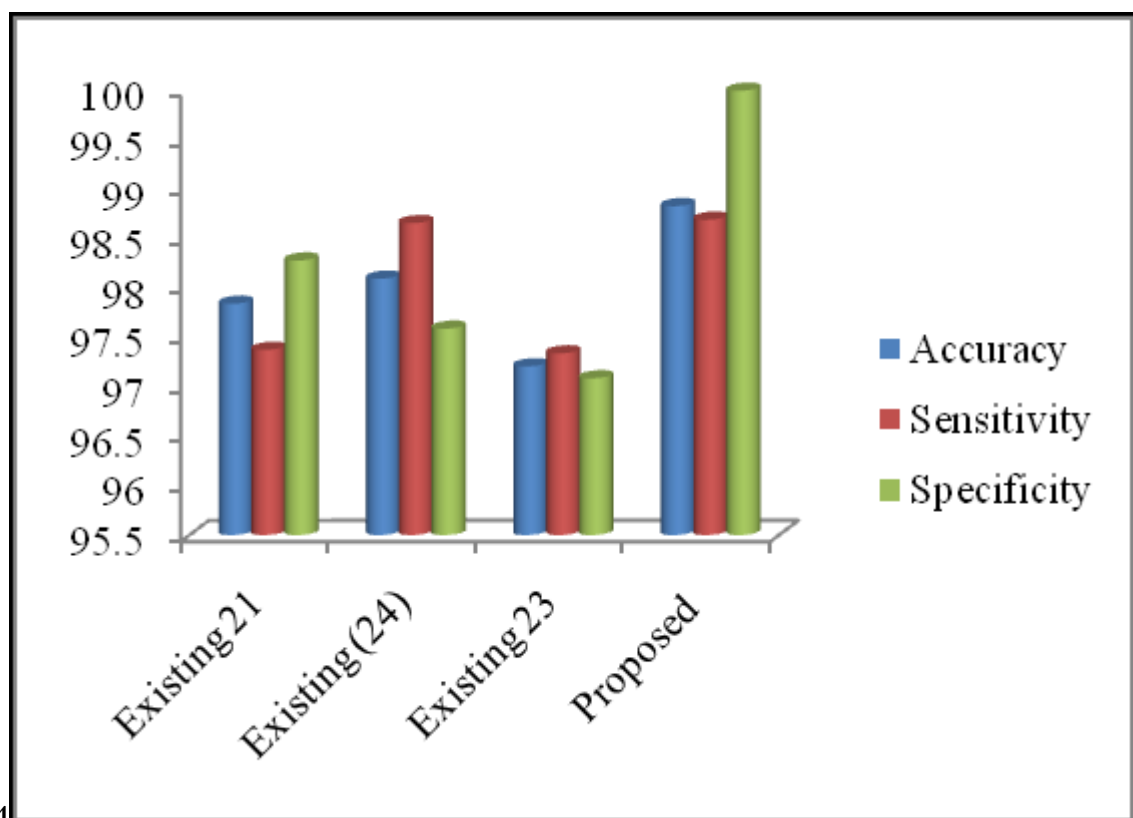


Figure 21: Figure 3 :Figure 4 :

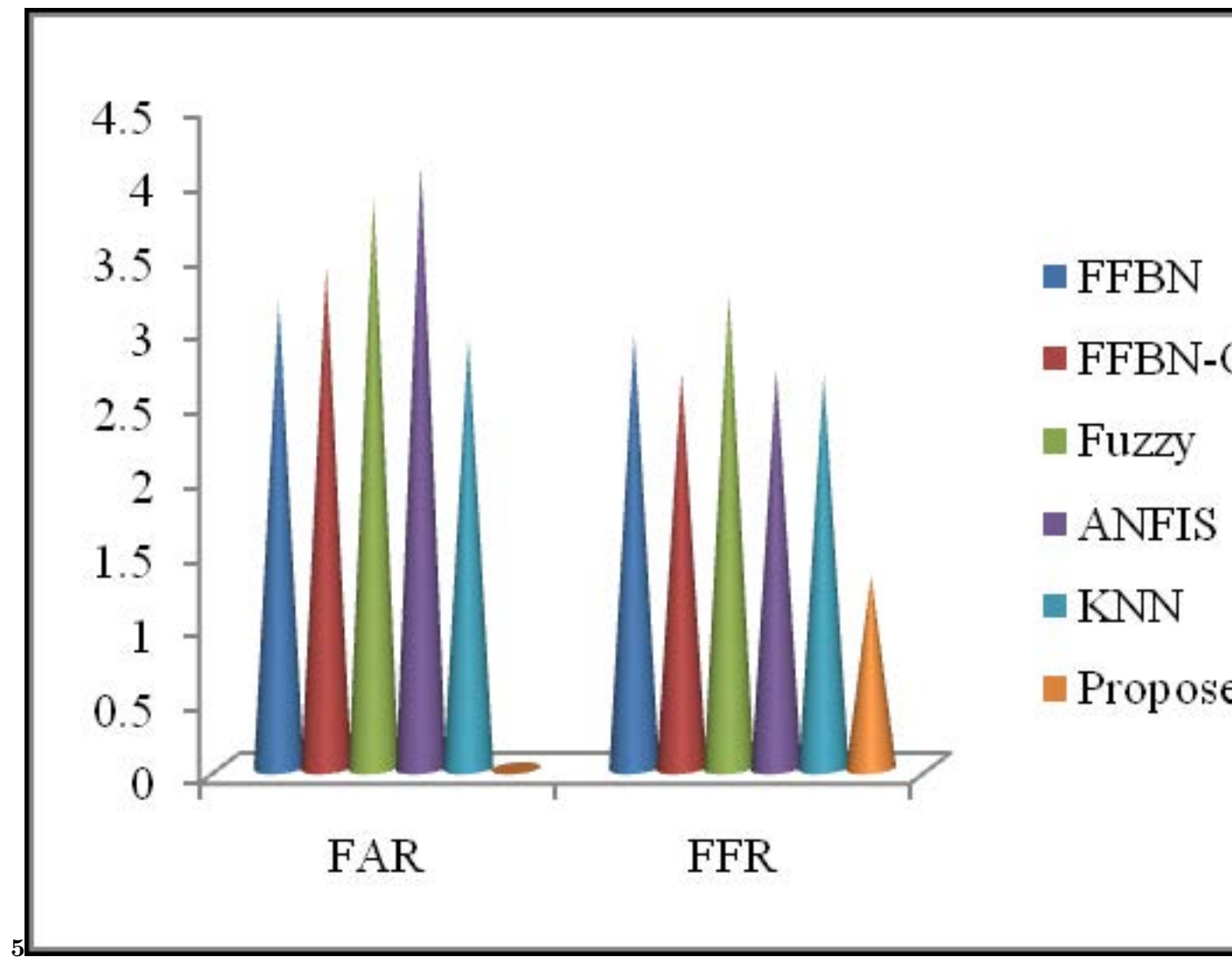


Figure 22: Figure 5 :

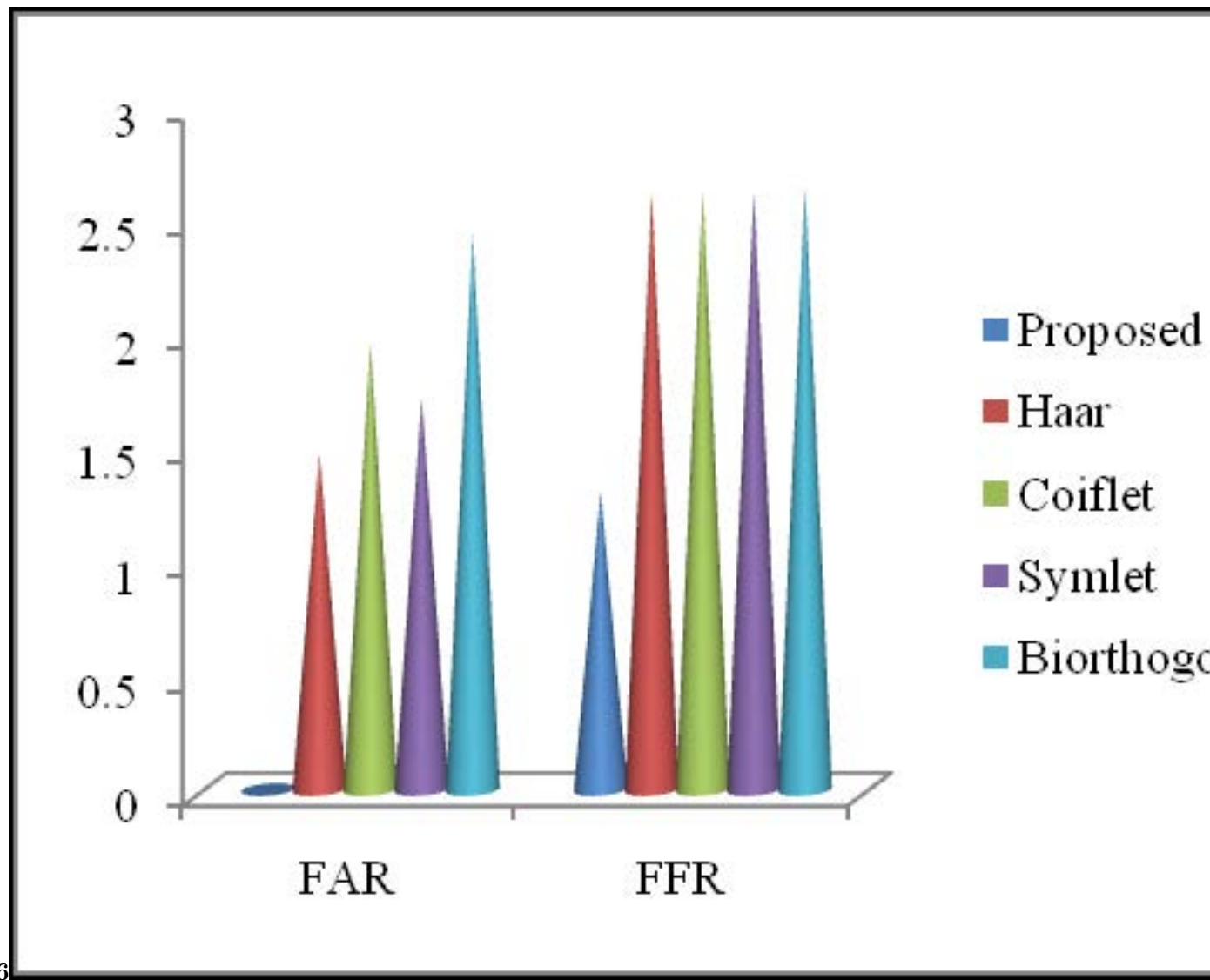


Figure 23: Figure 6 :

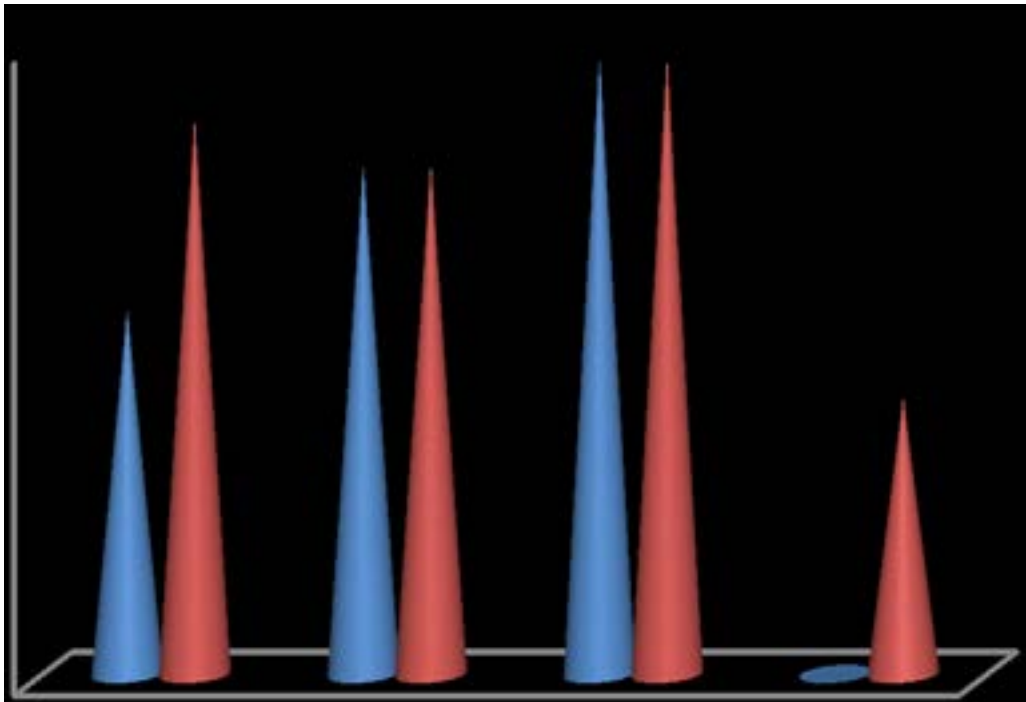


Figure 24: FDR

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| Global | Measures | Proposed FFBNN | FFBNN- | FUZZY | ANFIS | KNN |
|----------|----------|-------------------|-------------|-------------|-------------|-------------|
| Journal | Accu- | 96.95431472 | GA | 96.44670051 | 96.57360406 | 97.20812183 |
| of Re- | racy | 97.07446809 | 96.95431472 | 96.79144385 | 97.30458221 | 97.34042553 |
| searches | Sensi- | 98.83177576 | 97.32620321 | 96.1352657 | 95.92326139 | 97.08737864 |
| in Engi- | tivity | 98.69451637 | 96.61835749 | 3.8647343 | 4.076738609 | 2.912621359 |
| neering | Speci- | 100 0 96.56084656 | 3.381642512 | 95.76719577 | 95.5026455 | 96.82539683 |
| | ficity | 100 | 96.2962963 | | | |
| | FPR | | | | | |
| | PPV | | | | | |
| | NPV | 90 | 97.31707317 | 97.56097561 | 97.07317073 | 97.56097561 |
| | FDR | 0 | 3.439153439 | 3.703703704 | 4.232804233 | 4.497354497 |
| | MCC | 94.24705053 | 93.89852174 | 93.90090616 | 92.88352799 | 93.14569616 |
| | FAR | 0 | 3.155339806 | 3.381642512 | 3.8647343 | 4.076738609 |
| | FRR | 1.305483029 | 2.673796791 | 3.20855615 | 2.69541779 | 2.659574468 |

(i)

[Note: Performance measures of Proposed FFBNN-ABC-PCA technique with other (i) other classifiers (ii) other wavelets (iii) existing techniques (i)]

Figure 25: Table 1 :

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