

Review of Literature on Iris Recognition Biometrics

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Abstract: Biometric system is widely used and from all the biometric systems iris recognition is best suited for the purpose: authentication, identification, verifications due to its accuracy and uniqueness. The paper presents the literature review on iris recognition. The body of this paper details the basic steps of iris recognition. The steps are discussed briefly including iris image acquisition, image pre-processing which contains localization, segmentation and normalization, feature extraction and template matching. It also focuses on different literature discussing various techniques of feature extraction.

Keyword-Iris Biometric, Feature extraction

I. INTRODUCTION

Biometrics systems are widely used for authentication, identification and verification purposes for any individual [1]-[5]. Biometric measurements can be classified as physiological and behavioral characteristics [1] which is unique to an individual. The characteristics used for biometrics include [1],[2] facial features, body odor, features of eye (iris and retina) [2]-[6], thermal emissions, fingerprints, palm prints, voice prints, gesture etc [1]. Among these iris recognition is best [3] and accurate method [4] for identification and recognition purpose. Iris recognition is a method of biometric authentication [1]-[4]. It plays an important role in uniquely identifying a person and is based on the uniqueness of iris texture [2]-[6]. This system is one of the most accurate systems for identification of individuals. It produces better results in comparison with other biometric systems like face, fingerprint, voice etc [3], [18]. Iris recognition system has very low FAR (False Acceptance Rate) [7] and high FRR (False Rejection Rate) [72] compared to other biometric systems. The human iris, as shown in Figure 1, has an extraordinary structure and provides abundant texture information [1].

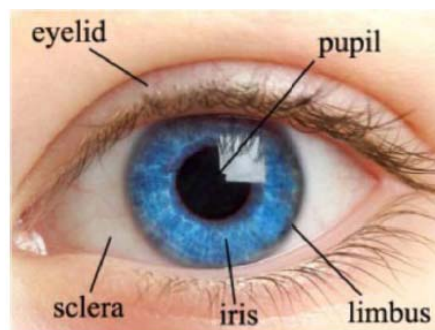


Fig.1. Front view of human eye [63]

II. MODEL OF IRIS RECOGNITION PROCESS

A primary iris recognition process includes mainly four steps:

A. Image acquisition

This is the first step in iris recognition. Image acquisition is capturing an eye image from a high resolution camera. It captures the sequence of iris images from subject by cameras and sensors. [4] These images clearly show the entire eye specifically iris and pupil part and then preprocessing operation is applied to enhance the quality of image.

The basic steps of iris recognition system are as shown in Figure 2.

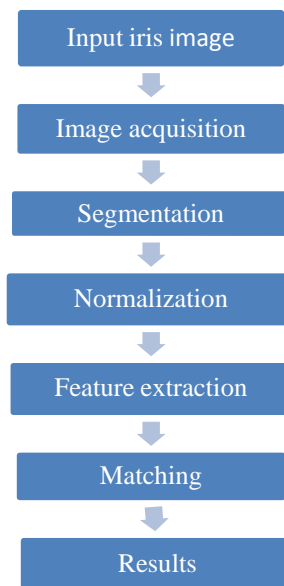


Fig. 2. Basic steps involved in iris recognition[4]

B. Image pre-processing

The pre-processing of eye image is necessary or essential to get the required and accurate input for further processing [5]. Image pre-processing is also necessary to increase the system performance and for the purpose or analysis[71]. It includes Localization, noise removal and normalization.

- 1) *Iris localization*: Iris localization is the process to find the iris lower and upper boundary value[5]. This step is detection of the inner boundary and the outer boundary [8] (The inner boundary is the boundary between iris and the pupil and the outer boundary is the boundary between the iris and the sclera).
- 2) *Segmentation*: This is the next step. Segmentation of iris depends on the quality of eye images [4]. It is a technique required to isolate and exclude the noise and also locates the circular iris region. To isolate the iris portion from the image and also locates the circular iris region. It is dependent on quality of eye image[6].
- 3) *Normalization*: This is the step followed by segmentation. In this step segmented iris is normalized [4]. Normalization is performed for the purpose of achieving more accurate recognition results as some elastic deformation in iris texture will affect the results of iris matching and is necessary to compensate these factors [5].

C. Feature extraction

It involves extraction of most distinct feature of iris. [4] In this step only most discriminating information presented in iris pattern is extracted to provide accurate recognition such that the comparisons can be made. Feature plays a very important role in the area of image processing [36]. Iris feature extraction is used for extracting most distinct feature of an iris image. It contains most of the information of an original iris image. This is one of the major steps in authentication of biometric system. It is used in selection and classification of task. Features are broadly classified as general features and domain specific features.

General features are application independent features like color, texture and shape. It is classified into three categories: Pixel level features, local features and global features.

- 1) *Pixel level features*: Features are computed at each pixel.
- 2) *Local features*: Features are calculated over the results of image subdivision.
- 3) *Global features*: Features are calculated over the whole image.

Domain specific features are also called application dependent features like human face, fingerprint etc. Feature extraction techniques are applied to get different features which are used for classification and recognition of images [36]. It extracts the most distinct features present in an image. It gives both local and global information of iris. Discriminated iris texture information must be extracted and encoded to have correct comparison between iris templates [15]. Complexity of feature extraction affects the complexity of program and processing speed of iris recognition system [18]. These are also used in various image processing applications like character recognition and time consumption also.

Feature extraction can be performed using different mathematical models, image processing techniques and computational tools [37]. These are generally classified in four categories: Feature based, Appearance based, Template based and Part based.

D. Matching

Image matching is one of the most fundamental aspects of image processing[9]. Matching contains comparing iris template for verification. In this step the extracted features of iris are required to match the iris template available in database [4]. This step is usually or basically the matching of the feature vectors of an image with feature vectors from any other image [9].

Iris recognition[39] is very accurate and distinct data acquisition due to its detailed structure and these differences do not change over a long period which make it more specific and unique from other biometric systems.[37] It is a natural authentication method and is based on unique nature of iris. The iris of our 2 eyes is different even for identically appeared twins. It is one of the most reliable methods. It is biometrically based technology which is helpful for identification and verification purposes with individually iris prints [39]. It has many applications like it is used in airport security, construction programs and military trainings or applications. It provides unique identity even for those who do not have a passport or identity card. Iris recognition is most powerful identification feature among all other biometric features due to its reliability, accuracy and uniqueness[38].

In the next section detailed literature review for the iris recognition is discussed.

III. LITERATURE REVIEW

W.W.Boles *et al* [31] in 1998 has proposed a novel technique for iris recognition which offers freedom in image capturing as it is translation and size invariant. The proposed algorithm was tested using real images. In this work the iris pattern of single eye was used to construct the representations in the database. The results had shown the correct classification and recognition of the different iris patterns. Li. Ma *et al*[32] in 2002 proposed a new method for personal identification based on iris recognition. The new approach is considered of three main components: image pre-processing, feature extraction and classifier design and a set of filters is applied. The proposed new algorithm was effective and also achieved high performance. In 2002, Li Ma *et al* [1] proposed an algorithm for personal identification based on iris recognition, the steps of which include image pre-processing, feature extraction and classifier design. This algorithm is more reliable, faster and achieves much higher identification rate. It effectively distinguishes different persons by identifying their irises. In 2006, Jun-Boa Li *et al*[10] proposed a novel matrix norm based on Gaussian kernel for feature extraction of images. Gaussian kernel is widely used in support vector machines and other kernel methods and provides local measure of similarity between vectors [10]. It brings large storage requirements and the large computational efforts for transforming images to vectors. The performance of M-Gaussian kernel is better than conventional Gaussian kernel. S.Poonguzhaliet *al* [27] in 2006 has performed evaluation of feature extraction for classifying abnormalities in ultrasound liver images using neural network. In this texture features were extracted by different methods and then were to classify the sets of ultrasonic liver images. The neural network classifier is used in this work for evaluation. The Gabor wavelet method among all other methods shown the high recognition rate as it gives best recognition. John Daugman *et al* [41] in 2007 has presented advancement in methods of iris recognition and showed more discipline methods for detecting and modeling the iris inner and outer boundaries, Fourier Based methods and statistical inference method for detection and exclusion of eyelashes and also explored a method for normalization.

Hugo Proenca *et al* [42] in 2007 focused the work on non cooperative iris recognition and proposed an iris classification method. With the implementations it resulted in decrease of number of error rate and improved flexibility. Zhenan Sum *et al* [43] in 2009 proposed a method using ordinal measure for iris feature representation. It achieved a good trade-off between distinctiveness and robustness. It resulted as powerful tool for complex tasks. Ordinal measures are used for image acquisition. The proposed methods computationally complexity was low and highly efficient. Karen P.GaganpreetKauret *al* [72] in 2010, has discussed about enhanced iris recognition. The paper presented a novel and automated iris recognition system in which accuracy is increased and computational speed is reduced. Hollingsworth *et al* [44] in 2011 has defined a new metric called the fragile bit distance. The work is focused on the fusion of fragile bit distance and hamming distance. It is better classifier. With the fusion it reduces the error and showed the improvement. The performance was superior with the fusion of algorithms than the algorithms used individually. In 2012, Dolly Choudhary *et al* discussed feature extraction methods for iris recognition [4]. These include image acquisition, segmentation, normalization, feature extraction, matching. The feature extraction methods discussed include Corner detection based iris encoding, Feature extraction using Haar Wavelet, feature extraction using Gabor filter, Statistical pattern recognition and Multichannel Gabor filter.

In 2013, Rodrigo D.C Silva *et al* discussed images extracted from a 3D industrial sensor using seven feature extractors and 3 classifiers. They reported a comparative study between seven invariant moments (Hub, Zernike, Legendre, Fourier-Mellon, Tschebichef, Basel Fourier and Gaussian- Hermit) and independent component analysis as feature descriptors of images from different databases. The three classifiers were k-NN classifier, neural network based classifier and support vector machine. The feature extraction step revealed that Zernike moments and Castor were good candidates for feature description with slight advantage of Castor when k-NN is

adopted as classifier [3]. The study of classifier revealed the superiority of the SVM when the Zernike moments are used as a feature description. Jan Barabaset *al* [33] in 2013 developed the software which is replacement of available system. The proposed algorithms may also be used in areas of image manipulation and feature extraction. The new work was more appropriate than the lasting one. Shuxiang Guo *et al* [34] in 2013 proposed a novel feature extraction method for Semg signals using image processing. The work is focused on feature extraction of Semg signals by calculating geometric feature of these signals. It used PCM (pixel count method) for feature extraction and ASM (Angular second moment) for textural features. The proposed method is superior and processing time was very short from other methods.

Chun-Wei Tan *et al* [35] in 2014 worked on efficient and accurate at-a-distance iris recognition using geometric key based iris encoding. Such iris encoding is computationally more efficient. The proposed approach used both visible and NIR imaging. The features were extracted both locally and globally. The proposed algorithm was improvement from others when compared. Gaurav Kumar *et al* [36] in 2014 reviewed detail in feature extraction in image processing systems. Firstly pre-processing techniques were applied and then feature extraction techniques are applied for further classification and recognition. The work is focused on feature extraction techniques for character recognition applications. Silviobarra *et al* [26] in 2014 has used a comprehensive method on mobile devices for iris authentication. The proposed approach performed well on iris database. The implementation of iris recognition was feasible and accuracy was improved. Vivekpaliet *al* [37] in 2014 reported an extensive survey on different types of feature extraction techniques. The reported techniques are classified into four types which can also be used in face recognition problem. It provided comparative study on these techniques. In 2014, Side Ali *et al* introduced hardware architecture for difference of Gaussian calculation in image feature extraction. Image matching techniques consist of features extraction and their matching with other features. They constructed hardware architecture for steps involved in the process. This approach resulted in much faster FPS as compared to others. The results were shown to be better than previous implementations in terms of required hardware resources [9].

Estefan Ortiz *et al* [2] in 2015 incorporated pupil dilation information into selection of images for enrolment using empirical distribution of dilation ratios for each iris to be enrolled which shows improved accuracy in iris recognition [2]. They used a quantile-based approach to dilation-aware enrolment which finds quantile points for each subject's distribution of dilation values. In this strategy, they used a commercial iris matcher (VeriEye) and found incorporating pupil dilation information into the selection of images for enrolment improves the accuracy of iris matching. The dilation-aware enrolment has measurable performance increases over the baseline random enrolment. In 2015, Albadarneh. A *et al* [71], has reviewed and evaluated four iris pattern recognition features which includes histogram of oriented gradients, gray level co-occurrence matrix and combined Gabor and discrete cosine transform. The results of proposed work shows that GLCM was most effective technique and also give largest recognition accuracy among others. In 2016, Silencer S *et al* used hybrid methods of feature extraction and matched them by hybrid classifiers for iris recognition system [5]. They discussed the feature extraction using Haar transform, PCA, Block sum algorithm with hybrid algorithm. These transforms were applied on iris images for finding the recognition rate and accuracy. The hybrid classifiers used in this study were, ANN and FAR/FRR. The experimental technique produced good performance on CASIA VI iris database. This proposed algorithm provides better accuracy and recognition rate than comparative algorithms.

In 2016, Ajay Kumar *et al* used cross spectral matching for more accurate iris recognition. Matching is done by two different domains; sensor specific and wavelength specific respectively [6]. It developed domain adaption framework which introduced a new algorithm Markov random fields (MRF) models to improve cross domain iris recognition. The proposed framework was based on naïve Bayes nearest neighbor classification. It presented three publicly available databases; PolyU cross spectral iris image database, IIITD CLI and UND database. The proposed method for cross spectral iris recognition was capable of benefitting from the final match score distribution of both the domains. The performance improvement for the above proposed method was higher as compared to performance of cross sensor iris recognition. In 2016, Mengzhe Li *et al* proposed an improved algorithm based on color feature extraction for image retrieval [7]. There were two main types of algorithms based on color features: Global algorithm and Local color algorithm and so on. The proposed algorithm considers the global and local color information, combining the fuzzy color histogram and block color histogram. It also compared different histograms with improved algorithm. This was an effective method for image retrieval and also saves the storage space in the system. This improved algorithm has a better performance than other algorithms. Harini R *et al* [28] in 2016 proposed a method for DR detection by using FCM (Fuzzy C-means) clustering and morphological image processing. It used SVM classifier. The proposed method achieved more accuracy and sensitivity.

In 2016, Tossy Thomas *et al*, has proposed a more accurate method called RANSAC (Random Sample Consensus). It located iris boundaries more accurately than the methods based on Hough transform. For iris normalization Daugman's rubber sheet model was used along with WVU database. Ellipse fitting through RANSAC provided a better result in iris localization compared to Hough transformed result and the performance of this system was better than Daugman's iris recognition system [8]. While, Alope Datta *et al* [11] in 2016 used partitioned maximum margin criteria (MMC) for supervised feature extraction of hyper spectral images. The main two approaches were feature selection and feature extraction. They proposed a feature extraction technique to reduce the Hughes phenomenon and computational complexity of the system. The proposed method was supervised in nature. The proposed method effectiveness is signified both qualitatively and quantitatively with five state-of-the-art techniques. The proposed method gave improvement, more consistency and better performance as compared to other methods [11].

Abhineet Kumar *et al* [18] in 2016 gave comprehension review of different iris feature techniques used in iris recognition system. This includes the latest development in terms of accuracy and complexity of iris recognition system. [18] The various methodologies of iris feature extraction were discussed such as Gabor filter, wavelet transform, Haar Wavelet, Gabor Wavelet, Dual tree complex wavelet transform, contour let transform, wavelet packet and fusion of 2D Gabor and 1D log-Gabor. It helped to increase the accuracy and reduce the complexity in iris recognition system. Qi Zhang *et al* [23] in 2016 explored complementary features for iris recognition on mobile devices. The features are explored to improve the accuracy. In this the om features and pairwise features are explored individually and then fused at one level. The fusion results demonstrated that these features are highly complementary and effective. Their algorithms used for fusion are faster than all others. Kiichifukuma *et al* [24] in 2016 had studied on feature extraction and disease stage classification for glioma pathology images. In this nucleus segmentation method and feature descriptors were discussed. With the implementations it improved the accuracy of nuclei segmentations.

Yosefinafinsensiaritiet *al* [25] in 2016 has used feature extraction for lesion margin characteristic classification from ct scan lungs image. This scan provided more opportunity for survival. Using computer based digital image processing improved the accuracy in results of the ct scan images. In this the work is done in stages like segmentation process and feature extraction methods with different number of features and classification process. It improved the accuracy of classification feature process.

TABLE I shows the iris recognition papers focusing on techniques used for feature extraction.

TABLE I. Techniques Used for Feature Extraction in Iris Recognition System from Year 1998-2017.

Year	Methodology/ Technique	Stage	Ref.
1998	Wavelet transform zero crossing	Extraction of unique features	48
2002	Circular symmetric filter	Capturing image information in specific frequency band	49
2002	ICA (Independent Component analysis)	Extract iris texture feature	50
2002	Multichannel Gabor filtering	Image processing for FE for texture analysis	4
2003	Statistical Pattern recognition	FE using FFT	31
2004	Gabor filter	Quantization feature extraction	12
2009	Contour let transform	Matching feature extraction	14
2010	Cumulative sum based analysis method	Analyzes grey value patterns in iris images and extracts iris features	72
2012	LPCC	Extract features in speech signal	52
2012	Corner detection based iris encoding	Texture, iris localization	36
2012	Gabor wavelet	Edge detection	53
2012	Gabor wavelet	Matching feature extraction	13
2012	Gabor filter	Normalization	43
2013	Fusion of Haar wavelet and 1D log gabor wavelet	Data analysis in iris region and feature encoding	54
2013	DWT	Wavelet transformation	55
2013	Fusion of 2D Gabor and 1D log Gabor	Extraction process	17
2014	GEFE	Texture classification	56
2014	MLBP(modified local binary pattern)	Iris texture classification	57
2014	Sobel, canny and prewitt edge detection methods	Image pre processing	69

2014	SIFT algorithm	Gaussian difference	9
2014	Neu-wave network(Combo of haar wavelet + neural network)	Extraction of significant iris feature	20
2014	Global iris bits stabilization+ local ZM's phase based encoding method	Recovery of iris features by matchingprocess.	58
2015	Principle Component Analysis	Compression of datasets from higher to lower dimensions in feature extraction	35
2015	Sift	Key points based feature extraction	59
2015	Gabor filters bank	Discriminate texture of an image	60
2015	Multi scale morphology algorithm	Extract structural/ textural features	61
2015	Hybrid combo of DCT and Gabor filter	Pattern recognition	71
2016	SURF (speeded up robust features)	Key points detection	62
2016	CLBP	Local texture feature extraction	63
2016	Rubber sheet model	Remapping of iris region	64
2016	LDA(Linear discriminant analysis)	Characterization of 2 or more classes	65
2016	Convolution technique	Face part detection	66
2016	Micro dimensional GEFE	Data analysis	67
2016	Fusion of OM features and pair-wise features	Encoding of local iris texture and measure of co-relation between 2 iris using CNN	
2016	Block Sum plus Haar Transform	Generation of iris code	19
2016	Partitioning of hyper spectral features and uses MMC based transformation.	Supervised feature extraction	11
2016	Hybrid Algorithm (combination of block sum and haar transform)	Feature vector and testing	5
2017	Discriminative statistics	Iris classification	70

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