

Sclera Segmentation and Sclera Vessel Enhancement

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Abstract

The construction of blood vessels in the sclera- the white portion of the humanoid eye, is distinctive for each singular, henceforth it is finest suitable for humanoid identification. In biometric authentication sclera pattern based human verification is gaining more importance. The sclera pattern of each human is unique, so analysis sclera pattern for individual gave an effective human identification. We have suggested basic technique for sclera segmentation constructed on Otsu segmentation, a novel scheme for sclera pattern improvement built on Contrast Limited Adaptive Histogram Equalization.

Keywords: Contrast Limited Adaptive Histogram Equalization, Circular Hough Transform, Local Binary Patterns, Dense Local Directional Pattern, Support Vector Machines, Deep Learning, Histogram Equalization.

1. INTRODUCTION

Biometrics refers to the automated recognition of people supported their physiological and/or activity characteristics. Among numerous biometrics, the ocular biometry as well as iris and retina square measure referred to as among the foremost correct biometry. However, they need disadvantages like demand of user participation and high sensing device value. For instance, capture of iris image needs cooperation of user since off-axis iris image will deteriorate the system performance, and retina scanning needs contact with eye-piece that is way from being easy [1]

Apart from iris and retina layer, the human eye has an ocular white surface referred to as the sclera that contains a texture pattern thanks to the presence of blood vessels in its surface in several orientation and layers. The sclera patterns are not heritable simply beside iris in one camera kind and it's additionally visible even in off-angle eye state of affairs. Thus by utilizing the texture pattern of the sclera, the performance of an iris recognition system will probably be improved throughout non-ideal or off-angle eye recognition state of affairs [3]. To date, this biometric is comparatively less studied and small is thought relating to its quality in addition as its performance [2].

Sclera is that the white and therefore the outer protecting a part of an eye fixed. one in all the key benefits of the sclera region is that the vas structure of the sclera is exclusive to every individual, and it is remotely obtained non-intrusively within the visible wavelengths while not the requirement of close to infrared emission in most of different recognition systems [5].

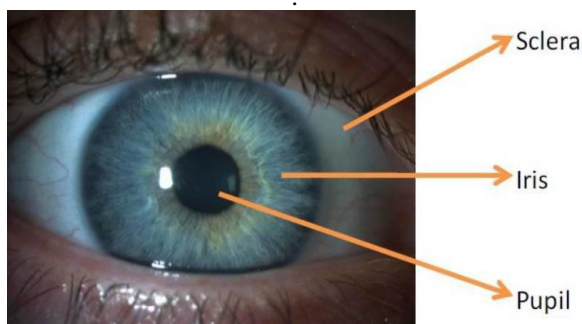


Figure 1.1: Human Eye close-up

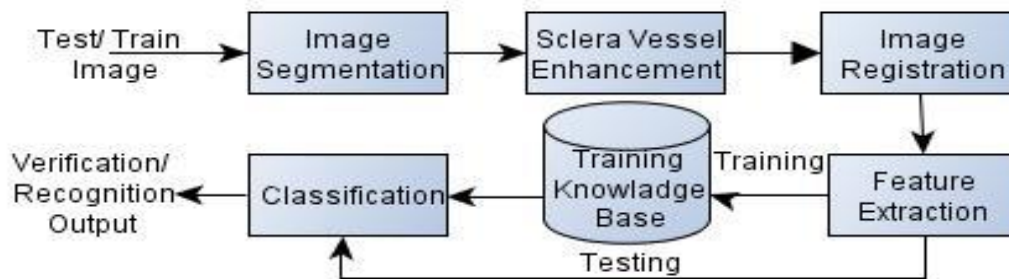


Figure 1.2: A typical Sclera Recognition System

The various challenges in sclera recognition embrace correct segmentation of the sclera space and sclera vessel improvement for authentication and identification functions. Sclera segmentation is that the initial and also the most difficult step during a sclera recognition system. The accuracy of the sclera recognition system can be degraded if the segmentation method fails to extract the right sclera regions from a watch image. Some incorrect sclera segmentation eventualities embrace segmenting the sclera with some components of the iris, eyelids, and eyelashes. The most purpose of the vessel improvement is to isolate the blood vessels within the sclera from their background. This method has 2 stages. Within the 1st stage, the inexperienced layer of the RGB image is extracted because it results in higher distinction between the sclera vessel and also the background. Then, he's applied to the sclera regions because it can enhance the inexperienced layer of the colored image.

1.1 Image Segmentation

The segmentation is the best significant phase for examining image correctly as it upsets the accurateness of the succeeding steps. Numerous procedures have been offered for image segmentation. They can be generally categorized as thresholding, edge-based or region-based approaches. Otsu's technique is ideal for thresholding stuffs from the contextual. This method is grounded on a discriminate examination which divides the image into two classes. Given an image denoted in L gray levels $\{0, 1, 2, \dots, L-1\}$, Otsu's thresholding technique divides the image pixels into two classes $C_0 = \{0, 1, 2, \dots, t-1\}$ & $C_1 = \{t, t+1, t+2, \dots, L-1\}$.

```

function [X1] = masking_sclera (cropped_image)
X1= cropped_image;[r,c,~]=size (cropped_image);
h = ones (12,12) / 144;
X = imfilter (X1,h);
IDX = otsu (X,3);
  
```

1.2 Contrast Limited Adaptive Histogram Equalization

As a main stage of the eye image improvement procedure, histogram equalization is useful to improve the image's contrast by changing the intensity values of the image. But, by improving the contrast of an image over a transformation of its intensity values, the histogram equalization can intensify the blare and create poorer outcomes, due to several pixels dipping exclusive the same gray level range. So, as an alternative of applying the histogram equalization, which works on the entire image, CLAHE (contrast limited adaptive histogram equalization) is castoff to improve the contrast of the minor strips of an image and to combine the adjacent strips by means of a bilinear interpolation which will remove the falsely prompted boundaries.

2. RELATED WORK

Recent research increases the interest in new biometric traits rather than traditional biometric modalities like fingerprint, face, retina, iris, voice etc. for person identification and verification. With the comparison of Iris and Sclera it is proved that places where Iris recognition is not possible sclera recognition comes out to be the better alternative.

Zhi Zhou et al. [2010], projected a comprehensive sclera image quality live which might quickly observe if the image encompasses a valid eye, assess the image quality, value the segmentation accuracy, and live if the image has decent feature info for recognition. Additionally, it used Dempster Shafer Theory to fuse the standard score, segmentation score, and have score along to come up with the combination score. It's through empirical observation verified victimization the UBIRIS information that the projected quality live is extremely related with the performance of sclera recognition [1]. **Kangrok OH et al. [2012]** projected a unique sclera example generation, manipulation, and matching theme for cancelable biometric identification. Primarily, a

neighborhood indicator matrix is generated supported an angular grid frame of reference. For binary feature example generation, a random matrix and area neighborhood binary patterns (LBP) operator are utilized. Afterward, the example is manipulated by user-specific random sequence attachment and bit shifting. Finally, matching is performed by a normalized playacting distance comparison. Some experimental results on UBIRIS v1 information [3]. **Abhijit Dasa et al. [2014]** projected an economical and reconciling biometric sclera recognition and verification system. Sclera segmentation was performed by Fuzzy C-means agglomeration. Since the sclera vessels don't seem to be distinguished, so as to form them clearly visible image improvement was needed. reconciling bar graph leveling, followed by a bank of separate Meyer moving ridge was accustomed enhance the sclera vessel patterns. Feature extraction was performed by, dense native Directional Pattern (D-LDP). D-LDP patch descriptors of every coaching image square measure accustomed kind a bag of features; additional special Pyramid Matching was accustomed turn out the ultimate coaching model. Support Vector Machines (SVMs) square measure used for classification [4]. **Therese Yamuna Mahesh et al. [2014]** conferred that the vessel pattern on the highest of the sclera poses many challenges: the vein structure moves and deforms with the movement of the attention and its close tissues; pictures of sclera patterns square measure typically defocused and/or saturated; and, most significantly, the vein structure within the sclera is multi-layered and has advanced non-linear deformation. The color of the mucous membrane layer on top of the sclera provides a really sensible indication of the prosperity of an individual. The pattern of the sclera based mostly blood vessels may be a sensible information for the identification of many diseases and also the thickness of the vessels offer a sign of the psychological state of the person [6]. **A. Suganya et al. [2014]** so as to eliminate high frequency noise parts gift in sclera, low pass filter is employed. To extract the options, a collection of vessel segments mix to form Y formed branches typically happiness to same sclera layer. Mapping theme relies on Y formed structure within the sclera that's determined to be a lot of stable feature and is employed to expeditiously eliminate the foremost unlikely matches. The empirical result shows that the projected technique will dramatically offer safer authentication while not compromising the popularity accuracy [7]. **Sinan Alkassar et al. [2016]** projected a brand new technique for sclera quality live and segmentation beneath relaxed imaging constraints. Particularly, for sclera image, they propose a brand new quality live approach supported a spotlight live.

Additionally, they propose a brand new fusion technique for sclera segmentation that uses constituent properties of each the sclera space and also the skin round the eye [8]. **S. Alkassar et al. [2016]** projected segmentation formula fuses multiple color area skin classifiers to beat the noise factors introduced through exploit sclera pictures like motion, blur, gaze and rotation. Additionally propose a vessel improvement and have extraction technique that author denote as advanced sclera options to extend the ability to wheezy vessel deformations. The projected system is evaluated victimization UBIRIS.v1, UBIRIS.v2 and UTIRIS databases and also the results square measure promising in terms of accuracy and quality in period of time applications because of low process times [9]. **B.Thiyaneswaran et al. [2016]** projected formula is employed for detective work moles within the human eye sclera. a watch mole image is that the input image for the projected formula. This input image is preprocessed victimization gray-scale conversion and a median filter. The filtered image undergoes binary conversion and morphological operations. Functions like morphological dilation, strel, dilation, area close, binary complement, and border clear square measure applied to retain the mole space within the eye image. Object space detection (OAD) formula is applied to go looking the regions of the mole boundary [10]. **Priti S. Tayade et al. [2017]** projected an economical technique for sclera segmentation and vessel improvement. Propose a formula to implement feature extraction technique victimization the 2D-DWT and also the extracted coefficients square measure accustomed represent the image. The projected system is evaluated victimization In-House information [11]. **S. Alkassar et al. [2017]** contribution of this paper is that the style of a sturdy sclera recognition system with high accuracy. The system includes of recent sclera segmentation and occluded eye detection ways. Propose an economical technique for vessel improvement, extraction, and binarization [12]. **Snehal S. Rajole et al. [2017]** projected distinctive technique that is reconciling to wheezy pictures for eye gaze detection as process wheezy sclera pictures captured at-a-distance and on-the-move has not been extensively investigated. Sclera blood vessels are investigated recently as an economical biometric attribute. Capturing a part of the attention with a standard camera victimization visible-wavelength pictures instead of close to infrared pictures has aggravated analysis interest. This technique involves sclera example rotation alignment and a distance scaling method to reduce the error rates once wheezy eye pictures square measure captured at-a-distance and on-the move [13]. **Amruta Dongare et al. [2017]** proposed a brand new

methodology for sclera segmentation that works for each color and greyscale pictures, style a physicist filter for sclera pattern sweetening methodology and a line descriptor primarily based methodology for feature extraction, registration and matching [14]. **Vanita Patil et al. [2017]** suggested basic scheme for sclera segmentation, a novel technique for sclera pattern improvement built on histogram equalization and line descriptor grounded feature mining and pattern matching with the support of matching score among the two segment descriptors [15]. **Dhanusha G. R et al. [2018]** reported that in biometric authentication sclera pattern based human verification is gaining more importance. The sclera pattern of each human is unique, so analysis sclera pattern for individual gave an effective human identification. In the proposed paper a smart effective human authentication using sclera pattern is designed by using efficient machine learning algorithm. Circular Hough Transform (CHT) segmentation with feature extraction techniques with Support Vector Machine (SVM) presents an effective output in person identification. Result section briefly summarize proposed system presents accurate result in person identification [16]. **Parth Nagarkar et al. [2018]** established a novel technique for sclera segmentation which works for both color as well as greyscale imageries. The blood vessel structure of sclera is dissimilar for dissimilar people and it lies in the area of the noticeable wavelengths, so it can be used for the humanoid ID method (ID). To get shape and construction of a sclera vessel kernel jobs are used in direction to distinct out the scale and stage plots. Gabor wavelet filter is a bi-dimensional Gaussian function which splits the R & G plane of the scanned image and due to its 2D nature, the B plane is problematic to plot as well as distinguish (math works) [17].

3. PROPOSED WORK

We implement a novel sclera segmentation process, a sclera vein enhancement technique.

Step 1: Sclera segmentation

Segmentation is the first step for most biometric related research. Similarly, here accurate segmentation of the sclera region is very important, otherwise, an incorrect segmentation can reduce the pattern available, other way it can also introduce other patterns such as eyelashes and eyelids. Otsu segmentation is performed.

```
Function [X1] = masking_sclera (cropped_image)
X1= cropped_image;[r,c,~] =size (cropped_image);
h = ones (12,12) / 144;
X = imfilter (X1,h);
```

```
IDX = otsu (X,3);
```

Step 2: Sclera vessel structure enhancement

The pots in the sclera are not noticeable, subsequently in direction to mark them evidently visible, image improvement is obligatory. Adaptive histogram equalization and CLAHE (Contrast stretching) is performed. As an alternative of applying the histogram equalization, which works on the entire image, CLAHE (contrast limited adaptive histogram equalization) is castoff to improve the difference of the minor tiles of an image and to combine the adjacent tiles by a bilinear interpolation which will remove the falsely induced borders. A number of non-overlapping image areas are produced by separating the input image. Additional histogram of all regions is computed. By using desired contrast expansion a clipping histogram is obtained. Based on clip limit the each region redistributed. This redistribution of contrast gifts the real output.

```
Function [Ivessel_enhanced] = vessel_enhancement
(normal_image)
I = rgb2gray (normal_image);
Is = imguifilter (I);
I = adapthisteq
(Is,'clipLimit',0.02,'Distribution','rayleigh');
Ivessel_enhanced = FrangiFilter2D (double (I));
end
```

3.1 Tool and Database

UBIRIS V.1 database is used for experiment. This database includes set eye samples of multiple humans. Along with the RGB planes it includes infrared eye samples (i.e. both right eye and left eye). Instead of using infrared samples RGB samples are used.

4. RESULTS AND DISCUSSION

Prior to segmentation process, the input human eye image is implemented to perform noise removal, glare area identification and to develop the quality of the image segmentation. The glare area identification is performed by employing salt and pepper and Sobel algorithms used to reduce noise in the input image. The Figure 3.2 shows the image of sclera segmentation part.

To evaluate the potential sclera regions, a Color Distance Map (CDM) is used for both natural and flash illuminators. The equation (4.1) shows the CDM is used for the natural illumination. The equation (4.2) shows the CDM is used for the flash illumination.

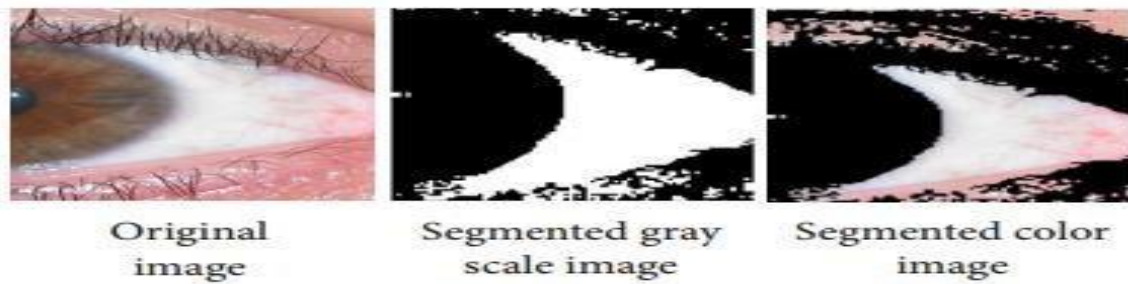


Figure 4.1 Image of the sclera segmentation part

$$CDM1 = \begin{cases} 1, & \begin{matrix} R > 95, G > 40, B > 20 \\ \max(R, G, B) - \min(R, G, B) > 15 \\ |R - G| > 15, R > G, R > B \end{matrix} \\ 0 & \text{else} \end{cases} \quad (4.1)$$

$$CDM2 = \begin{cases} 1, & \begin{matrix} R > 220, G > 210, B > 170 \\ \max(R, G, B) - \min(R, G, B) > 15 \\ |R - G| < 15, R > B, B > G \end{matrix} \\ 0 & \text{else} \end{cases} \quad (4.2)$$

The computation of the sclera map is given by matching the two CDM inequation (4.3)

$$SI(x, y) = \begin{cases} 1, & CDM^1(x, y) \text{ OR } CDM^2(x, y) = 0 \\ 0, & \text{else} \end{cases} \quad (4.3)$$

Sclera segmentation is the first method in the process of sclera recognition system. It has many steps involved in it. Once Sclera region detected, it get separated from input image, the segmented output is

shown in below Figure 4.2 (Input Image, Left Crop and Right Crop)



Figure 4.2: Sclera Segmentation by Otsu

Next step is sclera blood vessels enhancement. To improve the separation of the sclera blood veins from their contextual, two stages are used which comprise removing the green channel of the sclera image and relating Contrast Limited Adaptive Histogram

Equalization (CLAHE) which improves the local contrast of blood vessels. Then we examine the sclera image features by a bank of Gabor filters as revealed in below figure 4.3.

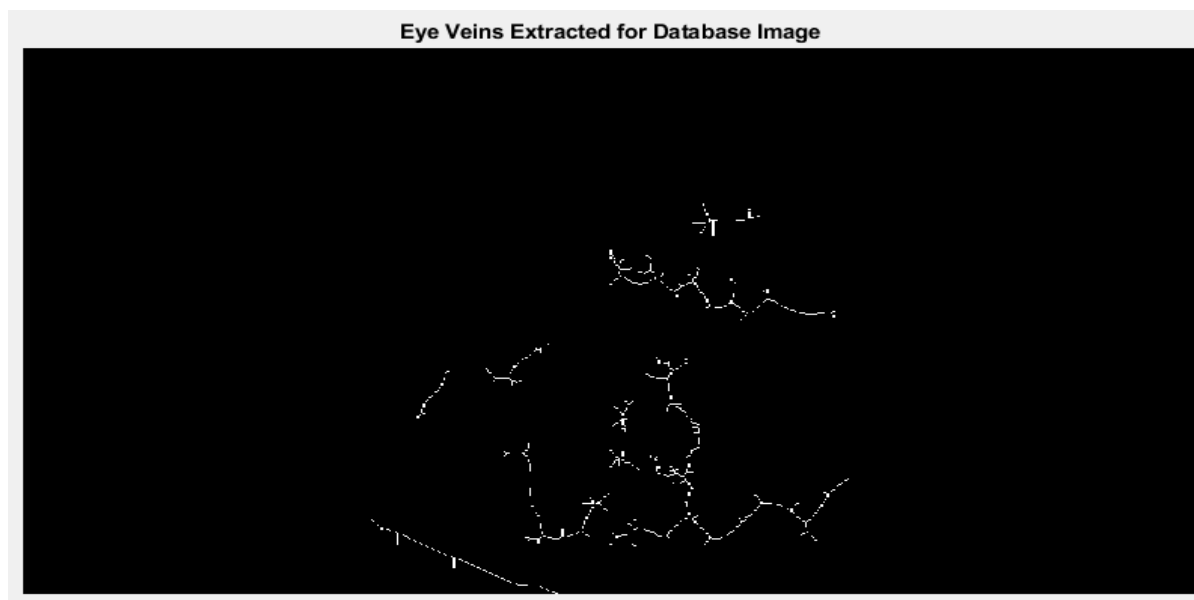


Figure 4.3: Sclera Vessel Structure Enhancement

CONCLUSION AND FUTURE SCOPE

The first part in sclera recognition is sclera segmentation. In segmentation, we retain the sclera part and get rid of the other useless parts of the input image. In segmentation, the image is divided into different parts so as to obtain the required features. We have done the image segmentation by Otsu segmentation. Once the image has been segmented, its intensity has to be enhanced so that the blood vessels become more visible and thus easy to detect and extract. We used the Contrast Limited Adaptive Histogram Equalization. Further the proposed approach can also extended by using one of the most

popular deep learning architectures to implement sclera recognition system.

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