## A study on Iris Recognition using Wavelet Transformation and Nonlinear Function

Jung-Youn Hur\*, Le Xuan Truong\*\*, Sang-Kyu Lee\*

\*Division of Computer Science and Engineering, Kyungnam University
449 Wolyoung-dong, Masan Korea 631-701

\*\*Computer Science Department, Hochininh City Open University
97 Vo Van Tan, Hochiminh City, Vietnam

#### **Abstract**

Iris recognition system is the one of the most reliable biometrics recognition system. An algorithm is proposed to determine the localized iris from the iris image received from iris input camera in client. For the first step, the algorithm determines the center of pupil. For the second step, the algorithm determines the outer boundary of the iris and the pupillary boundary. The localized iris area is transformed into polar coordinates. After performing three times Wavelet transformation, normalization was done using a sigmoid function. The converting binary process performs normalized value of pixel from 0 to 255 to be binary value, and then the converting binary process is compared pairs of two adjacent pixels.

The binary code of the iris is transmitted to the server by the network. In the server, the comparing process compares the binary value of presented iris to the reference value in the database. The process of recognition or rejection is dependent on the value of Hamming Distance.

After matching the binary value of presented iris with the database stored in the server, the result is transmitted to the client.

Key words: Iris recognition, Wavelet transformation, Sigmoid function, Hamming distance.

#### 1. Introduction

In bygone days, human race have knew ways to distinguish or recognize individual. In the 1890s, an anthropologist and police desk clerk in Paris named Alphonse Bertillon sought to fix the problem of identifying convicted criminals and turned biometrics into a distinct field of study, and then the police used fingerprinting for recognition individual [1].

Knowledge-based recognition makes use of a secret word, phrase, number or fact that an individual must remember to be able to prove his/her identity.

Biometrics of person operates by recognizing an individual by means of distinctive personal characteristics, such as face, fingerprint, iris and voice. The advantage of a biometrics approach is that these characteristics cannot be forgotten, lost or stolen. Moreover, clever use of biometrics may make access and checking procedures faster and more friendly, and the accuracy can be improved substantially. Still, this does not mean those biometrics are a panacea for all automatic recognition purposes. Especially, constructing a

biometric feature set which is measurable, distinctive and robust is a non-trivial task.

Iris recognition technology combines computer vision, pattern recognition, statistical inference, and optics. Its purpose is real-time, high confidence recognition of a person's identity by mathematical analysis of the random patterns that are visible within the iris of an eye from some distance. Because the iris is a protected internal organ whose random texture is stable throughout life, it can serve as a kind of living passport or a living password that one need not remember but can always present.

Iris image is inputted into camera and passed to client. In the client, the system determines the localized iris, and transforms the localized iris part into polar co-ordinates [2]. And the featured image of the iris is converted to binary value and then transmitted the server by the network. The database is stored in the server. In the database, presented recorded iris code is stored for future comparison. In the server, the system compares binary values of the presented iris to the reference recorded iris code in the database. After comparison, the result of recognition is transmitted to the client.[3][4].

Using the iris recognition system through networks can be ordered as Fig. 1.

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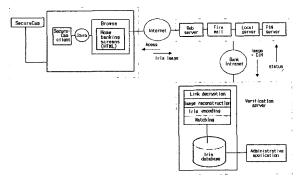


Fig. 1. Diagram of Iris recognition system .

Personal Information Binary value data

The structure of a recorded iris-code in the server That's why iris recognition technology is becoming an important biometric solution for people identification in access control as networked access to computer application. Compared to fingerprint, iris is protected from the external environment behind the cornea and the eyelid. No subject to deleterious effects of aging, the small-scale radial features of the iris remain stable and fixed from about one year of age throughout lif[5][6].

The statistical probability that two irises would be exactly the same is estimated at 1/1078 [7].

# 2. Determine the center and the outer boundary of the Iris and the pupillary boundary

Localization of iris is defined clearly, the location of iris area for the recognition is an area excluding the pupil (the area of the pupil is dark circular opening in the center of the iris ) and the outer boundary of the iris. So, it is important to determine the center of the pupil and the circle of pupillary boundary and the circle outer boundary of the iris for extracting exactly iris region.

For performance that process, the eye image is projected into row and column axis of 640x480. [8] And at first, we will have to determine the center of pupil. Second base on the centers position and the threshold detection of pupils area, and determine the radius of pupil and the circle of pupillary boundary. Base on the centers position and the threshold detection of scleras area, we can etermine the radius of iris and iris outer boundary circle[9].

Base on the defined position of the center and according to the real value of the papillary circles radius and the threshold detections value of pupils area, we can inspect the correctly of centers position. After histogram equalization of 70 data and projection onto x-axis, we can get suitable range from 40 to 90.

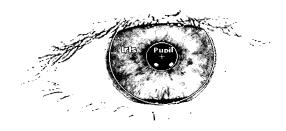


Fig. 2. Determining the center, outer boundary of iris and pupil by the system.

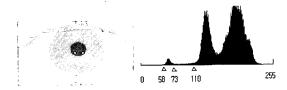


Fig. 3. Histogram of eye image and projection image onto x\_axis

Pupils area is a dark region and the threshold detection of pixels gray level value in pupils area are 50 and 90, so for determining the center of the pupil, the system counts the number of pixels carrying gray levels value more than 60 and less than 90.

Determining the center of the pupil is as followed [13].

- 1. From the iris image, the system counts all black pixels carrying gray level value more than 60 and less than 90 in each row.
- From the number of black pixels of each row, the system determines the row carrying the maximum number of black pixels.
- 3. Similar step 1 and step 2, the system determines the column carrying maximum number of black pixels carrying gray level value more than 60 and less than 90 in each row.
- 4. Determine the position of intersection (x0,y0) of the row (carrying maximum number of black pixels) and the column (carrying maximum number of black pixels),
- 5. The center of the pupil is (x0,y0).

Gray level value of pixel in pupil's area is defined by a value more than 50 and left than 90. And gray level value of pixel in iris's area is defined more than 90. So, determining the radius rp of pupil's circle is defined by an algorithm as:

- 1. From the center, drawing a concentric circle with radius(r),
- 2. The pixel's value on the circle by r are test,
- 3. if(number of  $(50 \le \text{the pixel value} \ge 90) \ge 90\%)$  then increase r and goto 2 else r is radius of pupil(rp)

#### Transform the localized iris's part and wavelet transformation.

The system requires that the localized iris is an area excluding the outer boundary of the iris and the pupil. For facilitation of the next process, the localized iris should be transformed into polar coordinates. The Cartesian to polar reference transform suggested by Daugman [10] authorizes equivalent rectangle shown as figure 3.5. In this way we compensate the stretching of the iris texture as the pupil changes in size, and we unfold the frequency information contained in the circular texture in order to facilitate next features extraction.

Moreover this new representation of the iris breaks the no-eccentricity of the iris and the pupil.

The process transforms a circle to a linear line, by transformation of the position A(xA,yA) in a circle, to polar coordinates. And assumer that A is ordered as Fig. 4

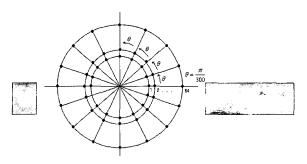


Fig. 4 Transform the localized iris part of Fig. 2.

The two-dimensional wavelet transformation can be implement using digital filters and down-samplers. With separable two-dimensional scaling and wavelet function, we simply take the one-dimensional wavelet transformation of rows of f(x,y), followed by the one-dimensional wavelet transformation of the resulting columns. The two-dimensional wavelet transformation filters the scale j+1 approximation coefficients to construct the scale j approximation and detail coefficients. In the two-dimensional case, however, we get three sets of the detail coefficients the horizontal, vertical, and diagonal details[11][12][13].

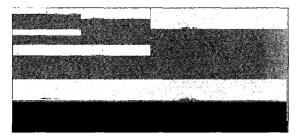


Fig. 5. 3-level wavelet transform of Fig. 4 iris image

Fig. 5 show an example of performance the 3-level wavelet transformation an iris image.

A sector has number of 64\*40 pixels, but 3-level wavelet transformation of a sector decrease number of 8\*5pixels so that processing time can reduced.

The image is reduced step by step. After one time of wavelet transformation, the size of the image is reduced a haft of horizontal and a haft of height.

#### 4. Results and Discussions

The pixels number of the image in polar coordinates is 64x600 and the image in polar coordinates is divide 15 sectors, so the pixels number of any sector is 64x40.

Some sector may carry eye hair or eyelid, so that the system selects locations of two sectors numbed sector 1 and sector 8, for recognition in next process, because two those sector are from areas carrying no eyelash and eyelid if the eye image captured in a good quality for the recognition process.

As Figure 6, we can see 15 sectors of the image in polar coordinates transformed from the iris area carry some area including eye hairs.

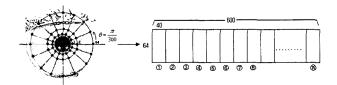


Fig. 6. Transformation 15 sectors and circular coordinates to polar coordinates.

### 4.1 Normalization using sigmoid function and convert binary values

We had performed hundreds of the process of iris recognition, the captured values of performance three times wavelet transformation.

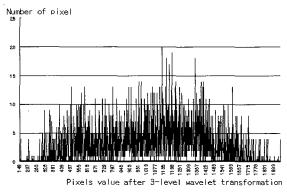


Fig. 7. Distribution of data of a sector after 3-level wavelet transformation.

Fig. 7 shows histogram of values from minimum value equal 149 to maximum number equal 1923 of 5050 pixels each sectors of 3-level wavelet transformations of

several iris images. Performance the statistics of the values, we have got the mean value is equal 1028 (region of values that less than 1028 take approximate 50% in whole values; and region of values that more 1028 take approximate 50%). Region of value that is less than 544 take approximate 10. Region of value that is more than 1509 also take approximate 10%.

We define that xp[5] is mean; xp[1] includes a value that values are less than xp[1] taking 10% values; xp[9] includes a value that values are more than xp[9] taking 90% values.

The frequency of present pixels values in region of value around mid of xp[1] and xp[9] is dense. And frequency of present pixels value in two regions of values, first from minimum number to xp[1], second from xp[9] to maximum number is too scattered for comparison to the frequency of present pixels value in region of value around mid of xp[1] and xp[9].

We will make allowance for the region of value around mid of xp[1] and xp[9] in the process of converting to normalized values by using sigmoid function.

The  $\lambda$  of sigmoid function is defined as following:

- 1. Perform initiative of array: integer x[80], integer pxl[80], integer p\_cnt[80], float prob[80], integer xp[10], integer y[80].
- Copy value of whole 80 pixels in process of converting to array x[]. And sort values of array x[].
- Define values of array pxl[], where array pxl[] includes difference values of array x[]. And values of pxl[] are sorted.
- 4. Define values of array p\_cnt[], where p\_cnt[i] includes a number of value pxl[i] in array x[].
- Define values of array prob[], where prob[i] includes values percent of region value around mid of x[0] and x[i] in whole values of array x[].
- 6. Define values of array xp[], where xp[i] includes a value that values less than xp[i] take i\*10% values of x[]. Values of array xp[] could be defined according to values of arrays prob[], pxl[].
- 7. We can get  $\lambda = 4.39445 \times \frac{xp[5]}{xp[9] xp[1]}$

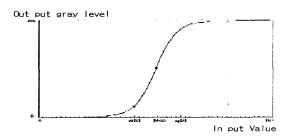


Fig. 8. Graph of sigmoid function  $y = \frac{1}{1 + e^{-\lambda x}}$ 

Fig. 8 shows sigmoid function by values of  $\lambda$ . The region of value around mid of xp[1] and xp[9] will be made allowance in the process of converting. Because regional of value around mid of xp[1] and xp[9] carry 80% values in whole pixel value.

Process of converting to binary data is performed in each disconnected set of two sectors. For each sector, binary process is performed according to each row. In each row, comparing any pair of pixels value [i,j] and [i,j+1], where  $1 \le i \le 8$ ;  $1 \le j \le 5$ .

If j=5, comparing pair of pixels value [i,1] and [i,5]. If two those value are different a sub pan that less than 3 then binary value equal 0, else binary value equal 1.

According to the test, we can get the most optimal critical value and several data from experiments.

For  $1 \le i \le 8$  and  $1 \le j \le 5$ 

$$\textit{BinaryData[k]} = \left\{ \begin{array}{ll} 0 & |\textit{nData[i,j]} - \textit{nData[i,j+1]}| \\ 1 & \textit{elsewhere} \end{array} \right\}$$

where  $1 \le k \le 80$ 

For  $1 \le i \le 8$  and j=5:

$$\textit{BinaryData[k]} = \left\{ \begin{array}{ll} 0 & |\textit{nData[i,5]} - \textit{nData[i,1]}| \leq 3 \\ 1 & \textit{elsewhere} \end{array} \right\}$$

where 
$$1 \le k \le 80$$

After binary process, a set of two sectors captured 80 binary values. If an iris is analyze by that process for recording in the database for the future recognition, then the process should perform five difference iris images of one human iris to create five sets of normalized value sectors. And then perform averaging of values of five sets to capture one set of normalized values for converting to binary value saving in the database.

#### 4.2 Discussion

The result of the iris recognition is in four possible cases: acceptance of authentic (AA), rejection of imposter (IR), rejection of authentic (AR), and acceptance of imposter (IA). The first case and the second case are desired. The third case and the fourth case are mistakes. The object of the systems decision is how to make the first case and second case are appeared almost in the recognition process. Making the third case and the fourth case are appeared scarce in the recognition process.

We have performed so many comparisons. In most cases of comparing two different irises, fig. 9 shaw a HD approximates to ~50%. In most cases of comparing the same irises, a HD approximates to 20%.

So, a value of HD is decided for recognition or rejection is 0.31 or (31%).

If HDs are more than 31%, then the system concludes that the two irises are different.

If HDs are less than 31%, then the system concludes

that the two irises are the same.

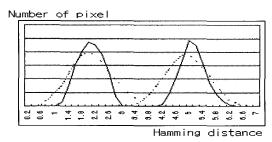


Fig. 9. Hamming Distance using linear and sigmoid function.

Fig. 9 shows two kinds of the hamming distance values results of seventy comparisons of irises by two algorithms including using linear function (a dot line), using sigmoid function (a solide line). From fig. 9 divide two area, HD of difference irises, and HD of the same irises. Case of simoid function(solide line) clearly divide two area at the 3.4, but linear function had overlap area from 3.4 of x-axis to 3.8 of x-axis. According to test, whole comparisons of the same irises have got 100% correct with simoid function, but linear function give 91.77% right number of result (91.77% comparisons have HD>31%; 8.33% comparisons have HD>31%). And whole comparisons of different irises have got 100% correct result, whole function give a right number of result (100% comparisons have HD>31).

#### 5. Conclusion

In this paper, we propose new algorithms for iris recognition using signoid function.

The process of iris recognition is following as: first is determined the center of the pupil, and determine the outer boundary of the iris and the pupillary boundary. And then, the localized iris part also is detected. And an algorithm of transforming the localized iris part into polar coordinates is also presented. Wavelet *Transform* technique is used three times to compress the two 40x64 images into two 5x8 image.

The normalization is transmitted to 80 binary codes. The system compares the presented iris to the preference iris code in the database. The value of Hamming Distance determines acceptance or rejection of recognition iris process.

By the system, we had tested so many of different eye images from one human and from difference human. And have got almost right result.

Iris identification techniques can use following computer networks, workstations, desktop computer, ATMs, etc to permit or prevent access, it can serve as a kind of living passport or a living password that one need not remember but can always present.

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#### 저 자 소 개



#### Jung-youn Hur

1982 Department of Electronic Engineering, Inha University. M.S 1992 Department of Electronic Engineering, Yeungnam University. Ph.D

1978~up to now: Professor of Department of Computer Science,

Kyungnam University

concerning sphere : Fingerprints Recognition, Iris Recognition, Handwriting Recognition.



#### Le Xuan Trung

1998 Department of Computer Science Kyungnam University. M.S 2005 Department of Computer Science Kyungnam University. Ph.D present, Professor of Computer Science Department, Hochiminh City Open University

concerning sphere: Fingerprints Recognition, Iris Recognition, Handwriting Recognition.



#### Snang-kyu Lee

2001 Department of Computer Science Kyungnam University. M.S 2004 Complete Ph.D of Department of Computer Science Kyungnam University. oncerning sphere: Fingerprints

Recognition, Iris Recognition,

Handwriting Recognition.