

# Design & Implementation of Enhancement, Feature Extraction and Matching of a Fingerprint Image

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**Abstract**— Fingerprints are a great source for identification of individuals. Fingerprint recognition is one of oldest forms of biometric identification. However finding a good fingerprint image is not always easy. So the fingerprint image must be pre-processed before matching. The objective of this thesis is to present a better and enhanced fingerprint image. We have studied the factors relating to obtaining high performance feature points detection algorithm, such as image quality, separation, image enhancement and feature detection. Commonly used features for increasing fingerprint image quality are Fourier spectrum energy and local orientation. Accurate separation of fingerprint ridges from noisy background is necessary. For effective enhancement and feature extraction algorithms, the segmented features must be void of noise. A pre-processing method consisting of field orientation, ridge frequency estimation, filtering, segmentation and enhancement is performed. The resultant image is applied to a thinning algorithm and subsequent minutiae extraction. The methodology of image pre-processing and minutiae extraction is discussed. The simulations are done in the MATLAB environment to evaluate the performance of the implemented algorithms. Results and observations of fingerprint images are presented at the end.

**Keywords**- Fingerprinting, pattern recognition, feature extraction, minutia details, analysis of fingerprints.

## I. INTRODUCTION

In computer science and electronic engineering image processing, image processing is any form of processing of signals for which the input is an image, such as pictures or frames of video the output of image processing can be either an image or a set of characteristics or parameters related to the image [12]. Image processing techniques have been developed tremendously during the past five decades. Sometimes a distinction is made by defining image processing as a discipline in which both input and output of a process are image.

Most image-processing methods involve treating the image as a two-dimensional-signal and applying standard signal processing techniques to it. Image processing is used to resolve identification problems, such as in scientific medicine or in creating weather maps from satellite pictures. Although large-scale image processing systems still are being sold for massive imaging applications, such as handling of satellite images, the

trend continues toward diminishing and blending of general-purpose small computers with specialized image processing hardware [5].

Skin on human fingertips contains ridges and valleys which together forms distinctive patterns. These patterns are fully established under pregnancy and are permanent throughout entire lifetime. Prints of those patterns are called fingerprints. Injuries like cuts, burns and contusions can temporarily damage worth of fingerprints but when fully healed, patterns will be restored. Automatic fingerprint recognition has become a widely used technology in both forensic and biometrics applications.

Despite a part of a thousand years during which fingerprints have been used as individual's proof of identity and decades of research on automated systems, reliable fully automatic fingerprint recognition is still an unsolved challenging research problem. Moreover, most of research thus far, assumes that two fingerprint templates being matched are approximately of the same size and cover large areas of fingertip. However, this assumption is no longer valid. The miniaturization of fingerprint sensors has led to small sensing areas and can only capture partial fingerprints. Partial fingerprints are also common in forensic applications [1].

Fingerprints are the patterns formed on the epidermis of fingertip. The fingerprints are of three types: arch, loop and whorl. The interleaved pattern of ridges and valleys are the most evident structural characteristic of a fingerprint. The fingerprint of every individual is considered to be unique. No two persons have the same set of fingerprints. Also, Finger ridge designs do not change throughout the life of an individual. This property makes fingerprints an excellent biometric identifier. So it is one of popular and effective means for identification of an individual and used as forensic evidence.

Fingerprints are very popular as biometrics measurements. Unfortunately fingerprint matching is a complex recognition problem. Physical fingerprint matching is not only time consuming but education and training of experts takes a long time. Therefore since 1970s there have been done a lot of effort on progress of automatic fingerprint recognition systems [3]. Automatization of fingerprint recognition process turned out to be success in forensic applications. Achievements made in scientific

area expanded usage of the automatic fingerprint recognition into civilian applications [4].

The paper is organized as follows. In section II, we discuss related work with recognition of fingerprint images. In Section III, It describes steps of fingerprinting system. In Section IV, it describes the design and implementation algorithms used in fingerprinting image processing technique. The results are given in Section V. Finally, conclusion is explained in Section VI.

## II. RELATED WORK

In literature, authors present several improvements to an adaptive fingerprint enhancement method that is based on con-textual filtering. The term adaptive implies that parameters of the method are automatically adjusted based on the input fingerprint image. Five processing blocks comprise adaptive fingerprint enhancement method, where four of these blocks are efficient in our proposed system. Hence, proposed overall system is innovative. The four modernized processing blocks are: 1) pre-processing; 2) global analysis; 3) local analysis; and 4) matched filtering. In pre-processing and local analysis blocks, a nonlinear active range adjustment method is used. In global analysis and matched filtering blocks, different methods of order statistical filters are applied. These processing blocks produce an improved and new adaptive fingerprint image processing method [6].

Author proposed that there exist many human recognition techniques which are based on fingerprints. Most of these techniques use minutiae points for fingerprint representation and matching. However, these methods are not rotation invariant and fail when enrolled image of a person is matched with a rotated test image. Moreover, such methods fail when partial fingerprint images are coordinated. This paper proposes a fingerprint recognition technique which uses local robust features for fingerprint representation and matching. The technique achieves well in presence of rotation and able to carry out recognition in presence of partial fingerprints. Experiments are done using a database of 200 images collected from 100 subjects, 2 images per subject. [7].

Some proposed that automated recognition of a person is one of the most critical issues in the modern society. Common biometric systems rely on surface topography of an object and, thus, are potentially susceptible for spoofing. Optical coherence tomography is a technology that has the capability to probe the internal structure of multilayered tissues. The paper defines an algorithm for automation fingerprint recognition that the algorithm is applied on the OCT fingerprint images. This algorithm is based on scanning of enhanced and segmented OCT images [9].

Authors proposed that the heart of social equality is voting. The heart of voting is trust that each vote is recorded and tallied with accuracy and impartiality. The accuracy and neutrality are tallied in high rate with biometric system. Among these signs, fingerprint has been researched the longest period of time, and shows most promising future in real-world applications. Because of their exclusivity and reliability over time, fingerprints have been used for identification over time. However, because of

complex distortions among the different impression of the same finger in real life, fingerprint matching is still a challenging problem. Hence in this study, authors are interested in designing and analysing the Electronic Voting System based on the fingerprint minutiae which is the core in current modern approach for fingerprint analysis [8].

## III. FINGERPRINT IMAGE PROCESSING

A fingerprint recognition system constitutes of fingerprint device, minutia extractor and minutia matching. For fingerprint acquisition, optical or semi-conduct sensors are extensively used. They have large efficiency and acceptable accuracy except for some cases that user's finger is too dirty or dry.

### A. Fingerprint Features

There are three key fingerprint features

- a) Global Ridge Pattern
- b) Local Ridge Detail
- c) Intra Ridge Detail

- Global Ridge Detail

There are two types of ridge flows: the pseudo-parallel ridge flows and high-curvature ridge flows which are located around the core point and/or delta point(s). This representation relies on ridge structure, global landmarks and ridge design characteristics [13].

The commonly used fingerprint features are:

1. Singular Points – They are discontinuities in the orientation field. There are two kinds of singular points- core and delta. A core is uppermost of a curving ridge, and a delta point is point where three ridge movements meet. They are used for fingerprint registration and classification.
2. Ridge Orientation Map – They are local direction of the ridge-valley structure. It is helpful in organization, image enhancement, and features verification and filtering.
3. Ridge Frequency Map – They are the reciprocal of the ridge distance in the direction perpendicular to local ridge orientation. It is used for purifying of fingerprint images.

- Local Ridge Detail

This is the most widely used and studied fingerprint representation. Local ridge details are discontinuities of local ridge structure referred to as minutiae. They are used by forensic specialists to match two fingerprints. There are about 150 dissimilar types of minutiae. Among these features types, ridge ending and ridge bifurcation are the most commonly used as all the other types of minutiae are combinations of ridge endings and ridge bifurcations [11].

- Intra Ridge Detail

On every ridge of the finger epidermis, there are many small sweat pores and other permanent details. Pores are distinctive in relations of their number, position, and shape. However, removing pores is feasible only in high-resolution fingerprint images and with very high image quality. Thus cost is very high. Therefore, this way of representation is not adopted by current automatic fingerprint identification systems (AFIS).

B. Functional Block Diagram of Fingerprinting System

Fingerprint technique is one of the most popular applications in identification & verification as it develops a low-cost fast computing system. Applications include accessing buildings or facilities withdrawing money or using a credit card, gaining access to electronic information on a local computer or over the internet. There are various approaches for fingerprint recognition among which Pixel based is mostly preferred nowadays due to its pixel based localization [10].

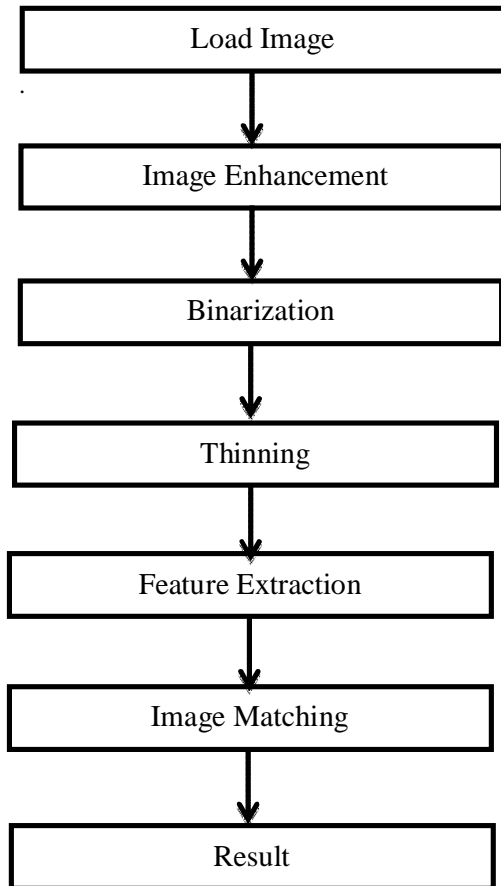


Figure 1: Functional Block Diagram of Fingerprinting Recognition Approach

C. Image Acquisition

Image acquisition is first step in the approach. It is very important as quality of the fingerprint image must be good and free from any noise. A good fingerprint image is desirable for better performance of fingerprint algorithms. Based on the mode of acquisition, a fingerprint image may be divided into off-line or live-scan. An off-line image is obtained by smearing ink on fingertip and creating an inked impression of fingertip on paper. A live-scan image, on other hand, is acquired by sensing tip of the finger directly, using a sensor that is accomplished of digitizing the fingerprint on contact. Live-scan is done using sensors. There are three types of sensors used. They are optical sensors, ultrasonic sensors and capacitance sensors [15].

Optical sensors capture a digital image of the fingerprint. The light reflected from the finger passes through a phosphor layer to an array of pixels which captures a visual image of the fingerprint. Ultrasonic sensors use very high frequency sound waves to penetrate the epidermal coating of skin. The sound waves are generated using piezoelectric transducers. The reflected wave measurements can be used to form an image of the fingerprint. Electrical charges are created between the surface of the finger and each of the silicon plates when a finger is placed on chip. The magnitude of these electrical charges depends on the distance between the fingerprint surface and the capacitance plates. Thus fingerprint ridges and valleys result in different capacitance patterns across the plates [2].

D. Fingerprint Image Enhancement

Fingerprint image quality is an important factor in performance of minutiae extraction and matching algorithms. A good quality fingerprint image has high contrast between ridges and valleys. A poor quality fingerprint image is low in contrast, noisy, wrecked, or smudgy, causing spurious and missing minutiae. Poor quality can be due to cuts, creases, or bruises on surface of fingertip, excessively wet or dry skin condition, uncooperative attitude of subjects, broken and unclean scanner devices, low quality fingers (elderly people, manual worker), and other factors [11].

Fingerprint Image enhancement is to make image clearer for easy further operations. Since fingerprint images acquired from sensors or other Medias are not assured with perfect excellence, those enhancement methods, for increasing contrast between ridges and furrows and for connecting the false broken points of ridges due to insufficient amount of ink, are very valuable for keep a higher accuracy to fingerprint recognition. Two Methods are adopted for image enhancement stage: the first one is Histogram Equalization; the next one is Fourier Transform [14].

Histogram equalization is to expand pixel value distribution of an image so as to increase perception information. The original histogram of a fingerprint image has bimodal type, histogram after the histogram equalization occupies all range from 0 to 255 and the visualization effect is improved. Image enhancement techniques are employed to decrease the noise and enhance the definition of ridges against valleys. In order to ensure good performance of ridge and minutiae extraction algorithms in poor quality fingerprint images, an enhancement algorithm to improve clarity of ridge structure is necessary. A fingerprint image contains regions of different excellence. They are:

- 1) Well-defined region
- 2) Recoverable region
- 3) Unrecoverable region.

Well-defined regions, recoverable regions and unrecoverable regions may be identified according to image contrast, alignment consistency, ridge frequency, and other local features. The goal of an enhancement algorithm is to improve the clarity of the ridge structures in recoverable regions and mark the unrecoverable regions as too noisy for

further processing. The input of enhancement algorithm is a gray-scale image. The output may either be a gray scale or a binary image [16].

#### E. Fingerprint Image Binarization

Fingerprint Image Binarization is to transform the 8-bit Gray fingerprint image to a 1-bit image with 0-value for ridges and 1-value for furrows. After operation, ridges in fingerprint are highlighted with black color while furrows are white. A locally binarization method is performed to binarize fingerprint image. Such a named method comes from mechanism of transforming a pixel value to 1 if value is larger than mean intensity value of current block (16x16) to which the pixel belongs [17].

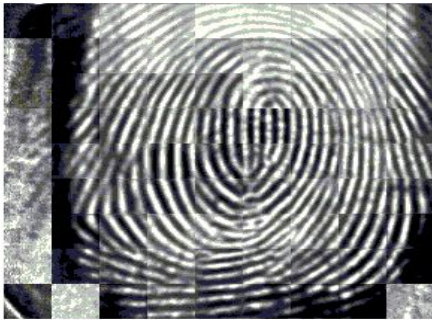


Figure2: Enhanced Image



Figure 3: Image after Binarization

#### F. Fingerprint Image Segmentation

In general, only a Region of Interest (ROI) is useful to be recognized for each fingerprint image. The image area without operative ridges and furrows is first discarded since it only holds background information. Then bound of the remaining effective area is sketched out since the minutia in bound region are confusing with those spurious minutia that are generated when the ridges are out of the sensor [18].

Local segmentation can be seen to belong to a continuum of approaches to image understanding. At a higher level is global segmentation which attempts to group together related pixels from throughout image. The highest level is object recognition, whereby global segments are combined into logical units representing real world objects of interest. The fundamental component of local segmentation approach is the segmentation algorithm itself. Most segmentation algorithms are designed to operate upon a whole image, or a large portion thereof. Local segmentation can only utilise a small number of pixels belonging to fragments of larger segments. Thus a local segmentation algorithm differs in that it has less data and fewer contexts to work with. Those image processing tasks suited to local segmentation are often first to encounter raw image data. This data is usually contaminated with one or more forms of noise. The fundamental attribute of a local segmentation based algorithm should be to preserve as much image structure (useful information) as possible, and to suppress or remove as much noise as possible. These goals are complementary and inseparable ability to identify structure implies ability to identify noise, and vice versa [20].

#### G. Minutiae Extraction

After enhancement of the fingerprint image, image is ready for minutiae extraction. For proper extraction, however, a thinning algorithm is applied to enhanced image. It produces a skeletonised representation of image.

- *Thinning of Image*

Thinning is a morphological operation that is used to remove selected foreground pixels from binary images. It is used to eliminate redundant pixels of ridges till ridges are just one pixel wide. Thinning is normally only applied to binary images, and creates another binary image as output. It is final step prior to minutiae extraction. It uses an iterative, parallel thinning algorithm. All pixels on boundaries of foreground regions that have at least one background neighbour are taken. Any point that has more than one foreground neighbour is deleted as long as doing so does not locally disconnect the region containing that pixel [15].

- *Features Extraction*

After the enhancement of fingerprint image the next step is features extraction. The method extracts features from the enhanced image. This method extracts the ridge endings and bifurcations from skeleton image by examining the local neighbourhood of each ridge pixel using a 3x3 window. The method used for features extraction is the crossing number (CN) method. This method involves the use of skeleton image where ridge flow pattern is eight-connected. The minutiae are pulling out by scanning local neighbourhood of each ridge pixel in the image using a 3x3 window. CN is defined as half the sum of the differences between the pairs of adjacent pixel. Thus features points can be extracted [19].

- *False Features Removal*

The pre-processing stage does not totally heal the fingerprint image. For instance, false ridge breaks due to insufficient amount of ink and ridge cross-connections due to over inking are not totally eliminated. Actually all



earlier stages themselves occasionally introduce some artefacts which later lead to spurious minutia. This false minutia will expressively affect the accuracy of matching if they are simply regarded as genuine minutia. So some mechanisms of eliminating false minutia are essential to keep the fingerprint verification system effective [16].

• *Fingerprint Matching*

Given two set of features of two fingerprint images, minutia match algorithm determines whether two minutia sets are from the same finger or not. An alignment-based match procedure is used. It includes two consecutive stages: one is alignment stage and second is match stage [16].

1. Alignment stage. Given two fingerprint images to be matched, any one feature from each image is chosen, and similarity of feature points is calculated. If similarity is larger than a threshold, each set of features is changed to a new coordination system whose origin is at referenced point and whose x-axis is coincident with direction of the referenced point.

2. Match stage: After obtaining two set of transformed minutia points, elastic match algorithm is used to count matched minutia pairs by assuming two minutia having nearly same position and direction are identical.

IV. DESIGN AND IMPLEMENTATION

In recent years, there have been significant advancements in algorithms and architectures for the processing of image. These advancements have proceeded along several directions.

A. *Proposed Algorithm of Image Contrasting*

1. Read the input RGB/ Gray Scale Image.
2. Set three ranges lies between 0 & 1.
  - a) Lower limit=0.001
  - b) Upper Limit=0.99
  - c) Mid limit=0.5
3. If (r=3) then
  - Mid limit2=0.04
  - Mid limit3=-0.04
4. Convert RGB to gray scale & separate R, G & B.
5. Mean Adjust= mid limit2- mean(Green Components)  
Image (green) =image (green) + mean adjust.
6. Mean Adjust= mid limit3- mean(Blue Components)  
Image (Blue) = image (Blue) + mean adjust.  
Else
  - Divide image by 255.
7. Mean Adjust= mid limit- mean(Red Components)  
Image (Red) = image (Red) + mean adjust.
8. If (r=3) then
  - Convert gray to RGB.
9. Else
  - Multiply with 255.
10. Find min. & max values by using lower and upper limits.
11. Find the slope of image, multiply with 255 and we get enhanced image.
12. Calculate Mean error and PSNR also.

B. *Proposed Algorithm of Fingerprinting Matching*

1. Read two input images manually.
2. Find the enhancement of images by mean adjustment technique.
3. Separate R, G and B by image segmentation process.
4. Apply thresholding process to remove noise.
5. Find the thinning of images by morphological operations.
6. Find features of extracted images.
7. Find the differences of two images.
8. If differences are detected, then images are not same, else they are same.

C. *Proposed Parameter: Signal Quality*

This term is often used to characterise the signal at the output of decoder. There is no universally accepted measure for signal quality. One measure that is often cited is the signal to noise ratio *SNR*, which can be expressed as eq. (1):

$$SNR = 10 \log_{10} \frac{\text{input signal energy}}{\text{noise error}} \quad (1)$$

The noise signal energy is defined as the energy measured for a hypothetical signal that is the difference between the encoder input signal and the decoder output signal. Note that, *SNR*, defined here is given in decibels (dB). In the case of images, *PSNR* (peak signal-to-noise ratio) is used instead of *SNR*.

V. RESULTS

Fingerprint recognition is one of the oldest forms of biometric identification. However finding a good fingerprint image is not always easy. So the fingerprint image must be pre-processed before matching. For fingerprint matching, it requires two input images. One is of victim and one for comparison. The figure 4 and 5 show the original 1<sup>st</sup> and 2<sup>nd</sup> image respectively and figure 6 shows the enhancement of image by contrast adjust technique. Enhancement of images is done by pixel approach. Using pixels, it can affect the intensity of images. Enhancement is calculated with the help of mean square error and PSNR parameter.



Figure 4: Original Input First Fingerprint Image



Figure 5: Original Input Second Fingerprint Image

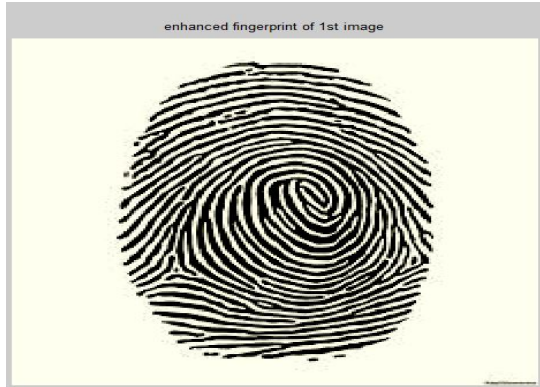


Figure 6: Enhanced Image

Segmentation is basically the separation of R, G and B colours from the images. It can be done using segmented process. Firstly, it requires only gray scale images. So RGB is converted to gray scale image and then separate these bands. Segmented output is shown in figure 7.

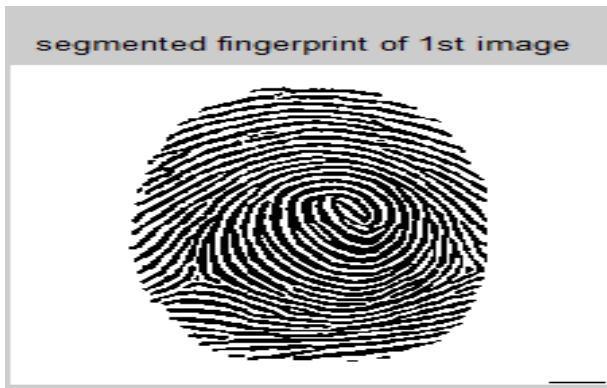


Figure 7: Segmented Image

Thinning process removes the boundary of image as shown in figure 8. After thinning process, features of image are required to be extracted. So regionprops are used for feature extraction process and results are shown in figure 9. And complete features within original thinned image are shown in figure 10. After this, both images are applied to fingerprinting matching system which matches images pixel by pixel. For this, it calculates the difference of the images. If both are matched, then difference image shows no error. But if both are different, then it shows error image as shown in fig 4.11.



Figure 8: Thinning Image

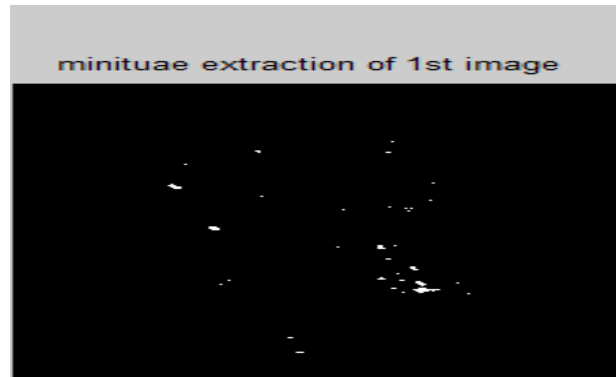


Figure 9: Feature Extraction of Image

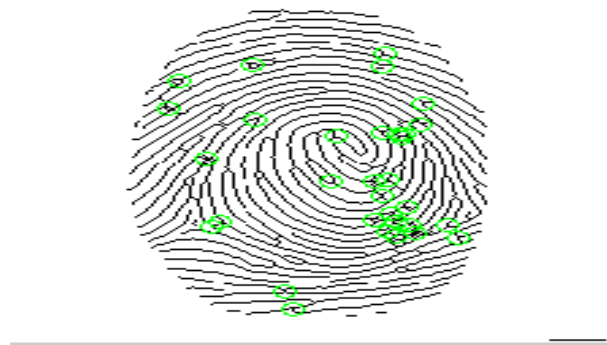


Figure 10: Complete Features Extraction of Image



Figure 11: Difference Detected Output

## VI. CONCLUSION

The goal of this thesis is to study the security impact of partial fingerprints on automatic fingerprint recognition systems and to develop an automatic system that can overcome the challenges presented by partial fingerprint matching. The proposed algorithm is implemented in MATLAB. The reliability of any automatic fingerprint system strongly relies on the precision obtained in the minutia extraction process. A number of factors are detrimental to correct location of minutia. Among them, poor image quality is most serious one. In this paper, we have combined many methods to build a minutia extractor and a minutia matcher. The following ideas have been used-segmentation using Morphological operations. The results show the detected output between two different fingerprints.

## REFERENCES

- [1] Josef Ström Bartun, "Image Enhancement in the JPEG Domain for People with Vision Impairment," *IEEE Trans. Biomed. Eng.*, vol. 50, no. 10, pp. 2013.
- [2] Madhuri, "Virtual Restoration of Ancient Chinese Paintings Using Color Contrast Enhancement and Lacuna Texture Synthesis," *IEEE Trans. Image Process.*, vol. 13, no. 4, pp. 416-429, 2012.
- [3] Nasibe Akbari et. al. "Whiteboard Scanning and Image Enhancement," *Digital Signal Process.*, vol. 17, no. 2, pp. 414-432, March 2012.
- [4] P. Fridman, "Radio Astronomy Image Enhancement in the Presence of Phase Errors using Genetic Algorithms," in *Int. Conf. on Image Processing*, Thessaloniki, Greece, Oct 2001, pp. 612-616.
- [5] D. Y. Tsai, L. Yongbum, M. Sekiya, S. Sakaguchi, and I. Yamada, "A Method of Medical Image Enhancement using Wavelet Analysis," in *6th Int. Conf. Signal Process.*, Beijing, China, Aug 2002, pp. 724-726.
- [6] K. Teddy, "Fingerprint Enhancement by Spectral Analysis Techniques," in *31st Applied Imagery Pattern Recognition Workshop*, WashingtonDC, WA, Oct 2002, pp. 15-18.
- [7] Andrés Almansa And Tony Lindeberg, *Member, IEEE, Fingerprint Enhancement By Shape Adaptation Of Scale-Space Operators With Automatic Scale Selection*, *IEEE TRANSACTIONS ON IMAGE PROCESSING*, VOL. 8, NO. 12, DECEMBER 2000.
- [8] Hartwig Fronthaler, Klaus Kollreider, And Josef Bigun, *Local Feature Extraction In Fingerprints By Complex Filtering*, *IWBRS 2005*, LNCS 3781, Pp. 76–84, 2005. Springer-Verlag Berlin Heidelberg 2005.
- [9] Koichi Ito1, Ayumi Morita1, Takafumi Aoki1, Hiroshi Nakajima2, Koji Kobayashi2, And Tatsuo Higuchi, *A Fingerprint Recognition Algorithm Combining Phase-Based Image Matching And Feature-Based Matching*, LNCS 3832, Pp. 315–325, 2005.
- [10] W. Armitage, and J. P. Oakley, "Noise Levels in Colour Image Enhancement," in *Visual Inform. Eng.*, London, UK, July 2003, pp. 104-108.
- [11] A.M. Bazen and S.H. Gerez. An intrinsic coordinate system for fingerprint matching. In *Proc. Int. Conf. on Audio- and Video-Based Biometric Person Authentication(3rd)*, pages 198–204, 2001.
- [12] Kaijun Tang, Jaakko Astola, Member, IEEE, and Yrjo Neuvo, Fellow, IEEE "multichannel Edge Enhancement in Color Image Processing" Vol-4 No-6 October 1994.
- [13] S. Chikkerur, C. Wu, and V. Govindaraju. A systematic approach for feature extraction in fingerprint images. In *International Conference on Biometric Authentication*, 2004.
- [14] Asker M. Bazen A, Martijn Van Otterlo, A Reinforcement Learning Agent For Minutiae Extraction From Fingerprints, Dept. Of Electrical Engineering, Signals and Systems, Dept. Of Computer Science, TKI.
- [15] Fernando Alonso-Fernandez, Julian Fierrez-Aguilar, Javier Ortega-Garcia, An Enhanced Gabor Filter-Based Segmentation Algorithm for Fingerprint Recognition Systems, Fernando Alonso-Fernandez, Julian Aguilar, Javier Ortega-Garcia Biometrics Research Lab.- ATVS, Politecnica Superior Universidad Autonoma de Madrid, Spain.
- [16] I. Nedeljkovic, Zahumska, Serbia and Montenegro "image classification based on fuzzy logic worked Fuzzy logic is relatively young theory".
- [17] Milindkumar V. Sarode, Dr.S.A.Ladhake, Dr.Prashant R. Deshmukh "Fuzzy system for color image enhancement". *World Academy of Science and Engineering Technology* 48 2008.
- [18] R. C. Gonzalez and R. E. Woods, "Digital Image Processing", Reading, MA: Addison Wesley, 2004.
- [19] David Salomon, *Data Compression, The Complete Reference*, 2nd Edition Springer-Verlag 1998.
- [20] A. Jain, *Fundamentals of Digital Image Processing*. EnglewoodCliffs, NJ: Prentice-Hall, 1989.