

Unconstrained Iris Recognition: Summary of Segmentation Techniques

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Abstract—The development of biometric recognition solutions able to work in visual surveillance conditions, i.e., in unconstrained data acquisition conditions and under covert protocols has been motivating growing efforts from the research community. In this scope, one of the most difficult phases is undoubtedly the segmentation process, where the degradation factors resulting from the unconstrained acquisition conditions should be handled first. This report summarizes some relevant iris segmentation techniques published over the last years.

Index Terms—Biometric recognition, iris recognition, iris segmentation, image segmentation.

I. INTRODUCTION

The human iris supports contactless data acquisition and can be imaged covertly. Thus, at least theoretically, the subsequent biometric recognition procedure can be performed without subjects knowledge. The feasibility of this type of recognition has received increasing attention and is of particular interest for forensic and security purposes, such as the pursuit of criminals and terrorists and the search for missing children.

II. IRIS SEGMENTATION METHODS

Despite the fact that many of the iris recognition approaches obtain minimal error rates, they do so under particularly favourable conditions, having as a prerequisite the existence of good quality images. These conditions are not easy to obtain and usually require the active cooperation of subjects. In this section we analyze and compare several iris segmentation proposals, especially focusing on those that may be more robust against degraded data.

It should be noted that the availability of iris databases with images acquired in visible light and unconstrained data acquisition conditions (e.g., [8] and [13]) made easier the development of research works on this topic. Also, several challenges and contests were organised, where participants from different countries had the opportunities to submit their proposals (e.g., [12])

The significant majority of the listed methods operate on NIR images that typically offer high contrast between the pupil and the iris regions, which justifies the order in which the borders are segmented. Also, various innovations have recently been proposed, such as the use of active contour models, either geodesic [17], based on Fourier series [4], or based on the snakes model [1]. All these techniques require

previous detection of the iris to properly initialize contours, and are associated with heavy computational requirements. Modifications to known form fitting methods have also been proposed, essentially to handle off- angle images (e.g., [19] and [18]) and to improve performance (e.g., [5] and [3]). Finally, the detection of non-iris data that occludes portions of the iris ring has motivated the use of parabolic, elliptical, and circular models (e.g., [2] and [3]) and the modal analysis of histograms [4]. Even so, in noisy conditions, several authors have suggested that the success of their methods is limited to cases of image orthogonality, to the nonexistence of significant iris occlusions, or to the appearance of corneal reflections in specific image regions. In [6] and later [7] authors propose a method divided into two blocks: the initial phase is subdivided into two processes: detecting the sclera and detecting the iris. The key insight is that the sclera is the most easily distinguish- able region in non-ideal images. Next, we exploit the mandatory adjacency of the sclera and the iris to detect noise-free iris regions.

More recently, [15] and [16] proposed to perform recognition in visible light data without even segmenting the iris region, or assuming that data has large segmentation errors, which can be an interesting direction for further work.

III. CONCLUSIONS

The development of biometric recognition solutions able to work in visual surveillance conditions, i.e., in unconstrained data acquisition conditions and under covert protocols has been motivating growing efforts from the research community. In this scope, one of the most difficult phases is undoubtedly the segmentation process, where the degradation factors resulting from the unconstrained acquisition conditions should be handled first. This report summarizes some relevant iris segmentation techniques published over the last years.

REFERENCES

- [1] E. Arvacheh and H. Tizhoosh. A Study on Segmentation and Normalization for Iris Recognition MSc dissertation, Univ. of Waterloo, 2006. 1
- [2] J. Dennis and R. Schnabel. Numerical Methods for Unconstrained Optimization and Nonlinear Equations. Prentice-Hall, 1983. 1
- [3] M. Dobs, J. Martineka, D.S.Z. Dobs, and J. Pospisil. Human Eye Localization Using the Modified Hough Transform Optik, vol. 117, pp. 468-473, 2006. 1
- [4] J.G. Daugman. New Methods in Iris Recognition IEEE Trans. Systems, Man, and CyberneticsPart B: Cybernetics, vol. 37, no. 5, pp. 1167-1175, 2007. 1
- [5] X. Liu, K.W. Bowyer, and P.J. Flynn. Experiments with an Improved Iris Segmentation Algorithm Proc. Fourth IEEE Work- shop Automatic Identification Advanced Technologies, pp. 118-123, Oct. 2005. 1

- [6] H. Proença. Iris Recognition: A Method To Segment Visible Wavelength Iris Images Acquired On-The-Move and At-A-Distance. *Springer Lecture Notes in Computer Science - ISVC 2008: 4th International Symposium on Visual Computing*, Las Vegas, Nevada, U.S.A., December 1-3, volume 1, pag. 731-742, 2008. [1](#)
- [7] H. Proença. Iris Recognition: On the Segmentation of Degraded Images Acquired in the Visible Wavelength. *IEEE Transactions on Pattern Analysis and Machine Intelligence*, 12(7), 32(8), pag. 1502-1516, 2010. [1](#)
- [8] H. Proença and L. Alexandre. UBIRIS: a noisy iris image database. *Springer Lecture Notes in Computer Science - ICIAP 2005: 13th International Conference on Image Analysis and Processing*, Cagliari, Italy, September 6-8, volume 1, pag. 970-977, 2005. [1](#)
- [9] H. Proença and L. Alexandre. Iris Segmentation Methodology for Non-Cooperative Recognition. *IEE Proceedings Vision, Image and Signal Processing*, 153(2), pag. 199-205, 2006.
- [10] H. Proença and L. Alexandre. A Method for the Identification of Inaccuracies in the Pupil Segmentation. *IEEE Proceedings of the First International Conference on Availability, Reliability and Security - ARES 2006*, 1 Vienna, Austria, April 20-22, vol. 1, pag. 227-230, 2006.
- [11] H. Proença and L. Alexandre. The NICE.I: Noisy Iris Challenge Evaluation - Part I. *Proceedings of the IEEE First International Conference on Biometrics: Theory, Applications and Systems - BTAS 2007*, Washington DC, U.S.A., September 27-29, 2007.
- [12] H. Proença and L. Alexandre. Introduction to the Special Issue on the Segmentation of Visible Wavelength Iris Images Captured At-a-distance and On-the-move. *Elsevier Image and Vision Computing.*, 28(2), pag. 213-214, 2010. [1](#)
- [13] H. Proença, S. Filipe, R. Santos, J. Oliveira, L. Alexandre. The UBIRIS.v2: A Database of Visible Wavelength Iris Images Captured On-The-Move and At-A-Distance *IEEE Transactions on Pattern Analysis and Machine Intelligence*, 32(8), pag. 1529-1535, 2010. [1](#)
- [14] H. Proença and L. Alexandre. Iris Recognition: Analysis of the Error Rates Regarding the Accuracy of the Segmentation Stage. *Elsevier Image and Vision Computing*, , 28(1), pag. 202-206, 2010.
- [15] H. Proença and J. C. Neves. IRINA: Iris Recognition (even) in Inaccurately Segmented Data *Proceedings of the IEEE Conference on Computer Vision and Pattern Recognition - CVPR 2017*, pag. 6747-6756, Honolulu, Hawai, U.S.A., July 21-26, 2017. [1](#)
- [16] H. Proença and J. C. Neves. Segmentation-less and Non-holistic Deep-Learning Framework for Iris Recognition *Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition "Bias Estimation in Face Analytics" Workshop*, - CVPRW 2019, pag. ?-?, Long Beach, U.S.A., June 17, 2019. [1](#)
- [17] A. Ross and S. Shah. Segmenting Non-Ideal Irises Using Geodesic Active Contours, Proc. IEEE 2006 Biometric Symp., pp. 1-6, 2006. [1](#)
- [18] M. Vatsa, R. Singh, and A. Noore. Improving Iris Recognition Performance Using Segmentation, Quality Enhancement, Match Score Fusion, and Indexing *IEEE Trans. Systems, Man, and CyberneticsPart B: Cybernetics*, vol. 38, no. 4, pp. 1021-1035, Aug. 2008. [1](#)
- [19] J. Zuo, N. Kalka, and N. Schmid. A Robust Iris Segmentation Procedure for Unconstrained Subject Presentation *Proc. Biometric Consortium Conf.*, pp. 1-6, 2006. [1](#)