



Quantitative measurement of pseudoexfoliation in the anterior segment of the eye performed in visible light

Koprowski *et al.*



RESEARCH



Open Access

Quantitative measurement of pseudoexfoliation in the anterior segment of the eye performed in visible light

Robert Koprowski^{1*}, Zygmunt Wróbel¹, Anna Nowinska² and Edward Wylegala²

* Correspondence: koprow@us.edu.pl

¹Faculty of Computer Science and Materials Science, Institute of Computer Science, Department of Biomedical Computer Systems, University of Silesia, ul. Będzińska 39, 41-200 Sosnowiec, Poland Full list of author information is available at the end of the article

Abstract

Introduction: Pseudoexfoliation syndrome (PEX) is a systemic disease involving the accumulation of pathological material deposits in the tissues of the anterior segment of the eye. The problem of modern ophthalmology is a quantitative assessment of the severity of PEX in the diagnosis and evaluation of the treatment progress in patients.

Material and method: For the purposes of this study, 52 images of the anterior segment of the eye with the resolution of $M \times N = 1280 \times 960$ pixels were obtained in jpg format using the slit lamp CSO 450-SL. The patients were aged 50–80 and were recruited from Poland. All patients who participated in the study provided written informed consent after explanation of the nature and possible consequences of the study. The image analysis method proposed by the authors contains the calculation of the direction field, setting a straight perpendicular line passing through each pixel of the edge of the pupil, the calculation of the intersection of straight lines in order to determine the central point of the pupil position, the detection of the contour of PEX and the outer border of the iris with the use of the polar coordinate system. All analyzed parameters were set automatically with one exception parameter chosen manually depending on the slit lamp type.

Results: A fully automatic measurement of PEX was carried out with the proposed method. Quantitative results enable to perform reproducible tests independently of the research centre. Owing to the image analysis method proposed by the authors, it is possible to obtain results in no more than 1 second on the Intel Core 2 Quad CPU 2.50 GHz with a measurement error below 3%. Other known methods of image analysis and processing that are compared in this paper give results with a greater error (4-35%) which depends on the degree of magnification (\times 6, \times 16, \times 20) and are not fully automatic.

Conclusions: The methods of image analysis and processing enable a quantitative, repeatable and automatic measurement of the severity and progress of PEX syndrome. They support medical diagnosis and automatic archiving of results.

Keywords: Automatic, Eye, Image processing, PEX, Pseudoexfoliation



© 2013 Koprowski et al.; licensee BioMed Central Ltd. This is an Open Access article distributed under the terms of the Creative Commons Attribution License (http://creativecommons.org/licenses/by/2.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

Introduction

Pseudoexfoliation syndrome (PEX) is related to aging of the body. It is more common in people over 50 years of age, and in about 20% of the population above 60 years of age in the countries of northern Europe. PEX syndrome is a systemic disease and is recognized by an ophthalmologist during routine testing. Mydriasis and image analysis with a slit lamp enable to detect the nature and severity of PEX. This disease involves dysregulation of elastin synthesis and the formation of irregular elastic fibre aggregates, with a concomitant significant reduction of collagen fibres. Elastic changes are observed in the arterial and venous vessels and also around the sieve plates in the eye. Examples of images of the eye with PEX syndrome are shown in Figure 1.

The works on image analysis and processing of PEX images in ophthalmology are related to eye morphometric measurements performed in visible light. Morphometric analysis is presented in several works devoted to comparative analyses and in those associated with a selected region of the world. Quantitative parameters are presented in detail in the work of Seitz B. et al. from 1995 [1] on the analysis of images of the eyes with PEX performed for 85 images. However, the analysis in this work was not fully automatic - manual adjustment of the results with a mouse was provided. Patients with cataracts were analysed for the presence of PEX in the work of Upender K. Wali et al. in 2008 [2]. 69 preoperative cataract patients (43 males, 26 females) were analysed there. In the work of Bialasiewicz A.A. et al. from 2005 [3], 204 glaucoma eyes and 135 open-angle glaucomas were analysed. The incidence of PEX glaucomas relative to all glaucomas was 50.9% and to open-angle glaucomas 77%. This is one of many works concerning the analysis of PEX incidence in patients with glaucoma. Other known works refer to the quantitative analysis of patients from different areas of the world, for example, from Ethiopia [4], Greece [5], Iceland [6] or others [7] (the largest number of cases studied - 4430). Microscopy analysis presented in the work of Schlotzer-Schrehardt U.M. et al. [8] showed that eighty-five percent of the 85 PEX-eyes had endothelial cells





polymegalism, 77% pleomorphism; 68% had white deposits and 42% had corneal guttae. White deposits and guttae were significantly more frequent and more intensive in PEXeyes than in control eyes. PEX-eyes with and those without glaucoma studied in [8] showed no significant differences concerning the four qualitative parameters.

Due to the nature and shape of PEX syndrome [9-17], the methods of image analysis and processing which operate fully automatically offer different kinds of solutions. These include the active contour method [18], morphological methods or even simple binarization methods. It is also possible to use and profile well-known automatic methods of image analysis and processing from other branches of medicine [19-21]. These are for example: the methods of analysis of the eve tomographic images [22], the image analysis methods using the Hough transform [23,24], the methods of iridocorneal angle analysis in the images of the anterior segment of the eye [25] or other profiled methods of image analysis and processing [26-29]. The methods profiled for the analysis of non-parametric objects, that is PEX syndrome, are manual or semi-automatic [30]. An operator manually indicates the central point of the pupil position and then the algorithm draws the contour to the outline of PEX. In some cases, the operator also manually adjusts and corrects the algorithm errors. It follows that due to the quantitative reproducible assessment of the treatment progress, it is necessary to introduce fully automatic measurements. It is possible by profiling the algorithm strictly to the analysis of PEX syndrome. This type of algorithm is presented below.

Material

For the purposes of this study, 52 images of the anterior segment of the eye with the resolution of $M \times N = 1280 \times 960$ pixels were obtained in jpg format using the slit lamp CSO 450-SL. The patients were aged 50–80 and they were all from Poland. All patients who participated in the study provided written informed consent after explanation of the nature and possible consequences of the study. In order to verify the sensitivity of the discussed method to the parameter changes, the images of the anterior segment of the eye were taken for 6-fold, 16-fold and 20-fold magnifications.

Method

The method of image analysis and processing was divided into three parts – Figure 2. The first part concerns image pre-processing. The second one describes the method of determining the central point of the pupil position. The third part describes the method for translating an image to a different coordinate system and the final measurement of PEX. The results obtained in the subsequent stages, which are described below, are shown in Figures 3 and 4.

Pre-processing

Image pre-processing involves the removal of noise and normalization of brightness levels. The input image $L_{RGB}(m,n,k)$ (where m – rows, n – columns, k – components R, G or B) derived from the slit lamp CSO 450-SL is subjected to median filtering using a mask h_e sized $M_{he} \times N_{he} = 3 \times 3$ pixels [19]. Then, there follows normalization of the individual components R,G,B to the range 0–1. The image $L_W(m,n,k)$ obtained in this way is converted to gray levels $L_{GRAY}(m,n) = 0.2989^*L_W(m,n,1) + 0.5870^*L_W(m,n,2) +$



0.1140* $L_W(m,n,3)$ [20,21]. The resulting image $L_{GRAY}(m,n)$ is subjected to further image analysis (Figure 3a).

Image processing

The main image processing algorithm consists of two stages - Figures 3b and 4. These concern determination of the position of the pupil centre and the contour of PEX syndrome. In the initial stage of processing, the $L_{GRAY}(m,n)$ image convolution with the h_s (m,n) mask is calculated. The size of the mask h_s is chosen once for a given type of the slit lamp. In the analysed case (slit lamps CSO 450-SL), it is $M_{hs} \times N_{hs} = 45 \times 45$. The mask h_s is shown in Figure 3b. The mask h_s is rotated sequentially in the angular range $\theta \in [0, 180)$ by increments of 1°, 5°, or 10°. Small values of increments increase the computation time and accuracy, and vice versa, larger values reduce the accuracy and computation time. In each step of the rotation of h_s mask, the weave with the $L_{GRAY}(m,n)$ image is calculated and two matrices, namely $L_m(m,n)$ and $L_{\theta}(m,n)$, are formed. The first marix $L_m(m,n)$ contains the maximum pixel values obtained in each weave. The





matrix $L_{\theta}(m,n)$, on the other hand, contains the angular values showing for what angle θ of rotation of the h_s mask, it occured. On the basis of the matrices $L_m(m,n)$ and $L_{\theta}(m,n)$, it is possible to calculate the direction field shown in Figure 3b. Then, when setting a straight perpendicular line passing through each pixel with a slope of $\theta + 90^\circ$, the intersection of straight lines is calculated. As a consequence, two matrices $L_T(m,n)$ and $L_r(m,n)$ are formed. The first one $(L_T(m,n))$ contains information about the intersection of straight lines. The value of a given pixel in the matrix $L_T(m,n)$ represents the number of intersections of the straight lines at this point (Figure 3b). The other matrix $(L_r(m,n))$ contains information about the radius calculated from a given pixel to the intersection (Figure 4). The position of the pupil centre is therefore at the location (m^*, n^*) of the maximum value in the matrix $L_T(m^*,n^*) = \max(L_T(m,n))$. The pupil diameter is a value read from the matrix $L_r(m^*,n^*)$. This information is necessary to perform subsequent image analysis operations in the last step (Figure 4) of determining the numerical values of PEX syndrome.

In order to calculate the severity of PEX syndrome, it is necessary to detect the contour of PEX and the outer border of the iris. With the value of the pupil radius r_z and the position of the pupil centre (m^*,n^*) , conversion to polar coordinates is performed, which results in the image $L_{\phi}(r,\theta)$ (Figure 4). The change of the coordinate system facilitates detection of contours and their proper localization. In order to determine the contour of the pupil $K_z(n)$, the image $L_t(m,n)$ was subjected to binarization, followed by the method of filling the holes. The resulting image Ls(m,n) enables to detect the pupil edge position. Its position is further approximated by a polynomial (yellow and green in Figure 4). Then, the contour of PEX syndrome $K_P(n)$ and the contour of the outer boundary of the iris $K_I(n)$ are determined using the method of the modified active contour [22]. The results obtained ($K_z(n), K_P(n), K_I(n)$) are shown in the images $L_s(m,n)$ and $L_t(m,n)$ in Figure 4, marked in green, blue and red respectively. The value of the severity of PEX syndrome was calculated as:

$$W_{PEX} = \sum_{n} \frac{K_I(n) - K_P(n)}{K_I(n)} * 100\%$$
(1)

The defined value W_{PEX} enables to obtain reliable results only in the case of a fully visible contour $K_P(n)$. It is therefore necessary to check the following condition in each case:

$$W_{1/0} = \begin{cases} 0 & if & \min_{n} (K_Z(n) - K_P(n)) > 0\\ 1 & if & \min_{n} (K_Z(n) - K_P(n)) \le 0 \end{cases}$$
(2)

When the pupil contour coincides with the set contour of PEX ($W_{1/0} = 0$), the measurement is considered to be unreliable.

The analysis of the obtained results

The proposed method and algorithm was used for analysis of 52 images. Representative examples of obtained results and image processing parts were presented on Figures 3 and 4. The algorithm is fully automatic. The only manually chosen parameter is the size of the mask h_s (for a given type of the slit lamp). However, the quality of the obtained image of the PEX contour has the greatest impact on the results. In many cases the

image analysis had to be conducted despite the high level of noise. The image noise was usually caused by disturbances of the measurement path (optical), small inclusions, dust, etc. The observed image disturbances were characterized as Gaussian noise. Therefore, a verification of the results obtained according to the artificial noise added to the image L_{RGB} was conducted. The artificial noise was the Gaussian noise with zero mean value and the variance σ^2 ranged from 0 to 0.05 at 0.001. The Figure 5 contains a plot of a function that displays the change of the W_{PEX} value dependent on the increase of the noise level (variance σ^2) on the input image L_{RGB} . Additionally the Figure 5 contains representative examples of the results obtained for the same patient for the selected variance (0.001, 0.005, 0.01, 0.02 and 0.05). The obtained results were significantly disturbed by the increasing of the noise level. An almost double increase of the W_{PEX} value was noticed when the variance value exceeded 0.035 (Figure 5). Further increasing the level of noise added to the image L_{RGB} further aggravated this result (increase of the W_{PEX} value). In this presented case the reason for measurement errors was incorrectly determined contour $K_P(n)$ – Figure 5 marked blue. This is the result of the insufficient visibility of the PEX contour, which made an accurate measurement impossible. It should be noted that adding noise to the image do not significantly change the accuracy of the $K_{I}(n)$ contour determination (marked red). The reason is a sufficient contrast between the iris and the sclera and thus little influence of noise on the obtained results.

The comparison among other known methods with the proposed methods is presented in the next part.



respectively (analogous to Figure 4).



Results and their comparison with the results obtained with known methods

The discussed measurement method of PEX syndrome was compared with two other methods. The results were referred to the contours marked by a specialist physician. As a result, a comparison was made of the value W_{PEX} determined automatically by three methods with the value W_{PEXE} determined by a specialist physician. Denoting the



(<i>WPEXE</i> - 2470)				
Magnification	W _{PEX1}	W _{PEX2}	W _{PEX3}	
Хб	25%	30%	25%	
×16	25%	28%	25%	
×20	25%	34%	26%	

Table 1 Summary of the results obtained for the compared methods for a sample image $(W_{PEXE} = 24\%)$

subsequent values W_{PEX} as W_{PEXM} , where M - method number, an error for each method was calculated:

$$\delta_{PEXM} = \frac{|W_{PEXM} - W_{PEXE}|}{W_{PEXE}} * 100\%$$
(3)

The comparison of the quality of the results was performed based on the following methods:

- Method 1 (W_{PEXI}) image pre-processing is the same as for the described case (median filtering, normalization to the full range of gray levels). Proper analysis concerning determination of the contours of PEX, the pupil and the iris is based on the active contour method proposed by Wu H. et al. in [18]. Nodes in this method are set manually by an operator. The number of set points is not strictly defined. Typically, a physician introduces 4–6 points in the pupil area. The block diagram of this method is shown in Figure 6.
- Method 2 (W_{PEX2}) image pre-processing only involves conversion of an ego colour image into a grayscale image. Proper analysis is related to binarization which is necessary to pre-determine the position of the pupil. The resulting binary image is used as a mask on which the contour is determined using Canny method [31]. The resulting contour fragments are not continuous. These are further connected to each other by straight lines. The block diagram of this method is shown in Figure 7.
- Method 3 (W_{PEX3}) described in this paper.

The three methods were implemented and the value of the error δ_{PEXM} was measured for each method for the analysed 52 images. Calculations were carried out for different magnifications: ×6, ×16 and ×20. The results are shown in Tables 1 and 2. The analysis of the obtained data shows that the proposed method 3 introduces the smallest measurement error for the 10fold magnification, that is δ_{PEX3} = 3%. The largest error is introduced by the method 2, namely δ_{PEX3} = 25%. Such a large error value is due to the adopted methodology, that is the sequence of operations in each block (Figure 7). The procedure for the image analysis in the method 2 leads to

Table 2 Summary of average values of errors obtained for all images for all the compared methods

Magnification	δ_{PEX1}	δ_{PEX2}	δ_{PEX3}
Хб	5%	25%	4%
×16	5%	17%	3%
×20	6%	35%	7%



the formation of numerous artefacts and errors – examples are shown in Figure 8. Similarly, the method 1 leads to errors related to matching of the active contour to the edges of the pupil and iris (Figure 8). The correct position of these edges is often skewed by, for example, reflections of the light source. The set magnification (×6, ×16 and × 20) affects, to a large extent, the accuracy obtained by the methods 2 and 3. This is due to the size of the pupil in the scene. For small magnifications, the pupil is relatively small in the scene. For large magnifications, the pupil is not fully visible, or due to the focal length, the image is blurred. The result is that for 16-fold magnification (Table 2), the error obtained is the smallest for all the considered methods.

Conclusions

This paper presents a quantitative, fully automatic method for the assessment of the severity of pseudoexfoliation syndrome. The advantages of the presented method are:

- reproducibility of measurements for large interindividual variability of patients,
- information for the physician concerning the quality of the measurement $(W_{1/0} \text{ ratio})$,

- measurements with an error of less than 3% for 6-fold and 16-fold magnifications,
- correct algorithm operation in different lighting conditions,
- setting all the parameters automatically depending on the image resolution,
- lack of impact of physician's individual settings of the slit lamp on the results obtained,
- lack of impact of the slit lamp type on the results obtained (owing to the full automation of measurements),
- single image analysis time in under 1 second on the computer Intel Core 2 Quad CPU Q9300 @ 2.GHz RAM 8GB.

The practical usefulness of this method has been confirmed by specialist physicians. It is used in many branches of ophthalmology supporting medical diagnostics or enabling clinical trials. It is now being implemented in the Department of Ophthalmology in District Railway Hospital in Katowice, Poland.

Further papers of the authors will focus on the analysis of the correlation between other ocular parameters such as intraocular pressure or visual field and the severity of the pseudoexfoliation syndrome.

Abbreviation

PEX: Pseudoexfoliation.

Competing interests

The authors declare that they have no competing interests.

Authors' contributions

RK and ZW suggested the algorithm for image analysis and processing, implemented it and analysed the images. AN, EW performed the acquisition of the 52 images and consulted the obtained results. All authors have read and approved the final manuscript.

Acknowledgements

No outside funding was received for this study.

Author details

¹Faculty of Computer Science and Materials Science, Institute of Computer Science, Department of Biomedical Computer Systems, University of Silesia, ul. Będzińska 39, 41-200 Sosnowiec, Poland. ²Department of Ophthalmology, District Railway Hospital, Katowice, Poland.

Received: 14 June 2013 Accepted: 22 July 2013 Published: 24 July 2013

References

- Seitz B, Müller EE, Langenbucher A, Kus MM, Naumann GO: Endothelial keratopathy in pseudoexfoliation syndrome: quantitative and qualitative morphometry using automated video image analysis. Klin Monbl Augenheilkd 1995, 207(3):167–175.
- Wali UK, Al-Mujaini AS, Al-Kharusi NS, Bialasiewicz A, Rizvi SG: Quantitative and qualitative corneal endothelial morphology of Omani patients with pseudoexfoliation syndrome. Sultan Qaboos Univ Med J 2008, 8(3):300–305.
- Bialasiewicz AA, Wali U, Shenoy R, Al-Saeidi R: Patients with secondary open angle glaucoma in pseudoexfoliation (PEX) syndrome among a population with high prevalence of PEX: clinical findings, morphological and surgical characteristics. *Ophthalmologe* 2005, 102:1064–1068.
- Bedri A, Alemu B: Pseudoexfoliation syndrome in Ethopian glaucoma patients. East Afr Med J 1999, 76:278–280.
- Kozobolis VP, Detorakis ET, Tsilimbaris MK, Vlachonikolis IG, Tsambarlakis IC, Pallikaris IG: Correlation between agerelated macular degeneration and pseudoexfoliation syndrome in the population of Crete (Greece). *Arch Ophthalmol* 1999, 117:664–669.
- Allingham RR, Loftsdottir M, Gottfredsdottir MS, Thorgeirsson E, Jonasson F, Sverisson T: Pseudoexfoliation syndrome in Icelandic families. Br J Ophthalmol 2001, 85:702–707.
- 7. Forsius H: Exfoliation sybdrome in various ethnic populations. Acta Ophthalmol 1988, 66:71–85.
- Schlotzer-Schrehardt UM, Dorfler S, Naumann GO: Corneal endothelial involvement in Pseudoexfoliation syndrome. Arch Ophthalmol 1993, 111:666–674.
- 9. Knorr L, Junemann A, Handel A, Naumann GO: Morphometric and Qualitative changes in corneal endothelium in Pseudoexfoliation syndrome. *Fortschr Ophthalmol* 1991, **88**:786–789.
- 10. Elhawy E, Kamthan G, Dong CQ, Dania J: Pseudoexfoliation syndrome, a systemic disorder with ocular manifestations. *Hum Genomics* 2012, 6:22.

- Schlotzer-Schrehardt UM, Koca MR, Naumann GO, Volkho Iz H: Pseudoexfoliation syndrome. Ocular manifestations of a systemic disorder? Arch Ophthalmol 1992, 110:1752–1756.
- 12. Aasved H: Study of relatives of persons with fibrillopathia epithelio capsularis (psedoexfoliation of the lens capsule). Acta Ophthalmol 1975, 53:879–886.
- Hattori Y: Corneal endothelial examination of pseudoexfoliation syndrome. Nippon Ganka Gakkai Zasshi 1990, 94:957–963.
- 14. Miyake K, Matsuda M, Inaba M: Corneal endothelial changes in pseudoexfoliation syndrome. *Am J Ophthalmol* 1989, **108:**49–52.
- 15. Gottfried OH, Naumann GO, Schlotzer-Schrehardt U: Keratopathy in pseudoexfoliation syndrome as a cause of corneal endothelial decompensation. *Ophthalmology* 2000, **107**:1111–1124.
- Wirbelauer C, Anders V, Pham DT, Wollensak J: Corneal endothelial cell changes in pseudoexfoliation syndrome after cataract surgery. Arch Ophthalmol 1998, 116:145–149.
- 17. Brooks AM, Grant G, Robertson IF, Gillies WE: Progressive corneal endothelial cell changes in anterior segment disease. Aust NZ J Ophthalmol 1987, 15:71–78.
- 18. Wu H, Appia V, Yezzi A: Numerical conditioning problems and solutions for nonparametric i.i.d. statistical active contours. *IEEE Trans Pattern Anal Mach Intell* 2013, **35**(6):1298–1311.
- Koprowski R, Teper S, Weglarz B, et al: Fully automatic algorithm for the analysis of vessels in the angiographic image of the eve fundus. Biomed Eng Online 2012, 11:35.
- Koprowski R, Wrobel Z, Zieleznik W: Automatic Ultrasound Image Analysis in Hashimoto's Disease, 2nd Mexican Conference on Pattern Recognition, Natl Inst Astrophys, Puebla, MEXICO, Advances In Pattern Recognition, Lecture Notes in Computer Science, Volume 6256; 2010;98–106.
- Koprowski R, Wrobel Z: The cell structures segmentation, Computer Recognition Systems CORES 2005, Rydzyna Castle, Poland, Proceedings Book Series: Advances In Soft Computing; 2005:569–576.
- Koprowski R, Wróbel Z: Image Processing in Optical Coherence Tomography Using Matlab. Katowice, Poland: University of Silesia; 2011. http://www.ncbi.nlm.nih.gov/books/NBK97169/.
- 23. Porwik P, Wróbel K, Doroz R: The polish coins denomination counting by using oriented circular hough transform. Adv Intell Soft Comput 2009, 57:569–576.
- 24. Porwik P, Para T: Some handwritten signature parameters in biometric recognition process, Proceedings of the International Conference on Information Technology Interfaces, (ITI2007), Dubrovnik; 2007:185–190.
- 25. Koprowski R, Wróbel Z, Wilczyński S, Nowińska A, Wylęgała E: Methods of measuring the iridocorneal angle in tomographic images of the anterior segment of the eye. *Biomed Eng Online* 2013, **12**(1):40.
- Sonka M, Michael Fitzpatrick J: Medical image processing and analysis. In Handbook of Medical Imaging. Belligham: SPIE; 2000.
- 27. Korzynska A, Iwanowski M, Neuman U, Dobrowolska E, Hoser P: Comparison of the methods of microscopic image segmentation. *IFMBE Proc* 2009, 25(4):425–428.
- 28. Korzynska A: Automatic counting of neural stem cells growing in cultures. Adv Soft Comput 2007, 45:604–612.
- 29. Foster KR: Thermographic detection of breast cancer. IEEE Eng Med Biol Mag 1998, 17(6):10.
- 30. Patterson AJ: Analysis Of Retinal Images In Glaucoma, A thesis Doctor of Philosophy. London: Eye Hospital; 2006.
- 31. Canny J: A computational approach to edge detection. IEEE Trans Pattern Anal Mach Intell 1986, 8(6):679-698.

doi:10.1186/1475-925X-12-74

Cite this article as: Koprowski *et al.*: **Quantitative measurement of pseudoexfoliation in the anterior segment of the eye performed in visible light.** *BioMedical Engineering OnLine* 2013 **12**:74.

Submit your next manuscript to BioMed Central and take full advantage of:

- Convenient online submission
- Thorough peer review
- No space constraints or color figure charges
- Immediate publication on acceptance
- Inclusion in PubMed, CAS, Scopus and Google Scholar
- Research which is freely available for redistribution

Submit your manuscript at www.biomedcentral.com/submit

