

# An Image Retrieval System Based on Wavelet Decomposition and Gradient Variation

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## ABSTRACT

Texture gradient is a popular operation for extracting features used for content-based image retrieval (CBIR) of texture images. It is useful for depicting gradient magnitude and direction of adjacent pixels in an image. In this thesis, we proposed two methods for retrieving texture images. In the first method, discrete wavelet transform (DWT) and gradient operation were combined to extract features of an image with principal component analysis (PCA) used to determine weights of individual extracted features, while in the second method, only gradient operation without involvement of discrete wavelet transform was used to extract features. The Brodatz Album which contains 112 texture images, each has the size of  $512 \times 512$  pixels, was used to evaluate the performance of the proposed methods. Before experiment, each image was cut into sixteen  $128 \times 128$  non-overlapping sub-images, thus creating a database consisting of 1792 images. Regarding the number of features, a total of 126 features were extracted in the first method by calculating gradients after discrete wavelet transforms of the texture image, while in the second method only 54 features were extracted from each gradient image. By integrating useful features, image retrieval systems for retrieving texture images have been designed. The results show that the two proposed methods have been demonstrated to be able to achieve better retrieval accuracy than the method proposed by Huang and Dai. Additionally, our proposed systems, especially the second proposed method, use fewer features which significantly decrease the retrieval time compared to the previous investigation.

Keywords : Content-Based Image Retrieval ; Texture ; Gradient Operation ; Entropy ; DWT ; Principal component analysis

## Table of Contents

Authority.....	iii	Abstract of English.....	iv	Abstract of Chinese.....	v
Acknowledgements.....	vi	Contents.....	vii	List of Figures.....	ix
Tables.....	xi	Chapter 1 Introduction.....	1	1.1 Background.....	1
Goals.....	2	1.2 Motivations and Organization of this thesis.....	3	1.3 Organization of this thesis.....	3
Chapter 2 Related Works.....	4	2.1 Discrete Wavelet Transform.....	4	2.2 Gradient Operation.....	6
2.3 Principal Component Analysis Based Weight of Feature Vector.....	8	Chapter 3 Proposed Methods.....	10	3.1 Proposed Method Based on Wavelet Decomposition and Gradient Variation.....	10
3.1.1 Selection of Gradient Angle.....	11	3.1.2 Two-level Discrete Wavelet Transform... ..	12	3.1.3 Adopt PCA Weights for Image Retrieval..	13
3.2 Proposed Method Based on Features Obtained from Gradient Variation.....	15	3.2.1 Decision of Number of Regions.....	16	3.2.2 Features Extraction.....	18
3.2.3 The Image Retrieval System.....	18	Chapter 4 Experimental Results.....	21	Chapter 5 Discussion and Conclusion.....	25
References.....	32				

## REFERENCES

- [1] M. Stricker and M. Orengo, " Similarity of color images ", SPIE: Storage Retrieval Image and Video Database III, vol. 2420, pp. 381 – 392, 1995.
- [2] J. M. Fuertes, M. Lucena, N. Peres de la Blanca, and J. Chamorro-Martinez, " A Scheme of Color Image Retrieval From Databases ", Pattern Recognition, vol. 22, No. 3, pp. 323-337, 2001.
- [3] Y. K. Chan and C. Y. Chen, " Image retrieval system based on color-complexity and color-spatial features ", The Journal of Systems and Software, vol. 71, pp. 65-70, 2004.
- [4] C. C. Chang and Y. K. Chan, " A Fast Filter for Image Retrieval Based on Color Features ", SEMS2000, pp. 47-51, 2000.
- [5] Y. C. Ko, and H. Byun, " FRIP: A Region-Based Image Retrieval Tool Using Automatic Image Segmentation and Stepwise Boolean AND Matching ", IEEE Transactions on multimedia, vol. 7, pp. 105-113, 2005.
- [6] B. M. Mehre, M. Kankanhalli, and W. F. Lee, " Shape measures for content-based image retrieval: A comparison Info ", Processing & Management, vol. 33, pp. 319 – 337, 1997.
- [7] S. Arivazhagan and L. Ganesan: " Texture classification using wavelet transform ", Pattern Recognition Letters, vol. 36, pp. 1513 – 1521, 2003.

- [8] S. Arivazhagan and L. Ganesan: " Texture segmentatio using wavelet transform " , Pattern Recognition Letters, vol. 2, pp. 3197 – 3203, 2003.
- [9] P. W. Huang and S. K. Dai, " Image Retrieval by Texture Similarity " , Pattern Recognition, vol. 36, pp. 665-679, 2003.
- [10]S. Liapis and G. Tziritas " Color and Texture Image Retrieval Using Chroma-ticity Histograms and Wavelet Frames " , IEEE Transactions on multimedia, vol. 6 pp. 676-686, 2004.
- [11]N. Jhanwara, S. Chaudhurib, G. Seetharamanc and B. Zavidovique, " Content based image retrieval using motif co-occurrence matrix " , Image and Vision Computing, vol. 22 pp. 1211 – 1220, 2004.
- [12]B. Verma and S. Kulkarni " A fuzzy-neural approach for interpretation and fusion of colour and texture features for CBIR systems " , Applied Soft Computing, vol.5 pp.119-130, 2003.
- [13]R. M. Haralick, K. Shanmugam, and I. Dinstein, " Texture features for image classification " , IEEE Trans., vol. SMC-8, pp. 610 – 621, Nov. 1973.
- [14]H. C. Lin, C. C. Chang, J. C. Wu, L. L. Wang, and S. N. Yang, " Content-based image retrieval by color, texture, and shape " , Journal of Computers, vol. 13, No. 4, 2001.
- [15]R. Brnuelli and O. Mich, " Histograms Analysis for Image Retrieval " , Pattern Recognition, vol. 34, pp. 1625-1637, 2001.
- [16]R.M. Haralick, L.G. Shapiro, Computer and Robot Vision, vol. I, Addison-Wesley, Reading, MA, 1992.
- [17]H. Tamura, S. Mori, and T. Yamawaki, " Texture features corresponding to visual perception " , IEEE Trans., vol. 8, PP. 460 – 473, June 1978.
- [18]R.C. Gonzalez, R.E. Woods, Digital Image Processing, Commun. Pure Appl. Math. 41 (1988) 386 – 394.
- [19]D. Ballard, C. Brown, Computer Vision, Prentice-Hall, Englewood Cliffs, NJ, 1982.
- [20]R. C. Gonzalez, R. E. Woods, Digital Image Processing , Prentice-Hall, NJ, 2002 386 – 394 [21]D. F. Morrison, Multivariate statistical methods, New York: McGraw-Hill.
- [22]Y. D. Chun, S. Y. Seo, and N. C. Kim, " Image Retrieval Using BDIP and BVLC Moments " , IEEE Transactions on Circuits and for Video Technology, vol. 13, no. 9, September 2003 [23]Brodatz Album Texture Database.
- [Online]. Available: <http://www.ux.hwas.no/~tranden/brodatz.html> [24] M. Kokare, P. K. Biswas, and B. N. Chatterji, " Texture Image Retrieval Using New Rotated Complex Wavelet Filters " , IEEE Trans. on Systems, MAN, and Cybernetics, vol 35, no.6, December 2005.
- [25] M. Kokare, P. K. Biswas, and B. N. Chatterji, " Rotation-Invariant Texture Image Retrieval Using Rotated Complex Wavelet Filters " , IEEE Trans. on Systems, MAN, and Cybernetics, vol. 36, no. 6, December 2006.