

ENHANCEMENT AND FEATURE SELECTION FOR CLASSIFICATION OF X-RAY MAMMOGRAM MICROCALCIFICATIONS

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ABSTRACT

MICROCALCIFICATIONS MAY APPEAR AS AN EARLY SIGN OF BREAST CANCER AND PLAY AN IMPORTANT ROLE IN DIAGNOSING MAMMOGRAM. IN GENERAL, THE MODELS OF DETECTING MICROCALCIFICATIONS HAVE DIFFERENT KINDS OF DETECTION SCHEMES AND VARIOUS FEATURE EXTRACTION METHODS. IN THIS THESIS, A DIAGNOSTIC METHOD WITH TWO STAGE SCHEME AND DATA MINING BASED FEATURE EXTRACTION WITH HIGH PERFORMANCE CLASSIFIER IS DEVELOPED TO DETECT MICROCALCIFICATIONS IN X-RAY MAMMOGRAMS. THIS THESIS PRESENTS A COMPUTER-AIDED DIAGNOSIS (CAD) SYSTEM FOR THE AUTOMATIC DETECTION OF MICROCALCIFICATIONS IN DIGITIZED X-RAY MAMMOGRAMS. THE PROPOSED SYSTEM CONSISTS OF TWO MAIN STEPS. FIRST, POTENTIAL MICROCALCIFICATION PIXELS ARE SEGMENTED BY A CLOSED FORM CONSERVATIVE FILTER. THEN, INDIVIDUAL MICROCALCIFICATION IS TESTED BY THE FEATURES EXTRACTED FROM THE SPATIAL DOMAIN AND THE SPECTRAL DOMAIN. THE DISCRIMINATORY POWER OF THESE FEATURES IS ANALYZED VIA SEQUENTIAL FORWARD SELECTION METHOD. EXPERIMENT RESULTS SHOW THAT DATA MINING SCHEME IS SUPERIOR TO FEATURES WITHOUT BEING SELECTED. THE SUPPORT VECTOR MACHINE CLASSIFIER IS SUPERIOR TO THE GENERAL REGRESSION NEURAL NETWORK CLASSIFIER.

Keywords : MICROCALCIFICATIONS, FEATURE SELECTION, DATA MINING, CLASSIFIER

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REFERENCES

1. 吳智誠, "資料探勘於影像資訊之應用-以乳房微鈣化特徵處理為案例", 大葉大學工業工程學系碩士班論文(指導教授:傅家啟, 共同指導教授:李三剛), 2001.
2. 繆紹綱, "數位影像處理-活用MATLAB", 全華科技圖書股份有限公司, 1999.
3. 羅強華, "類神經網路:MATLAB的應用", 清蔚科技股份有限公司, 2001.
4. BROWN, M., GRUNDY, W., LIN, D., CRISTIANINI, N., SUGENT, C., FUREY, T., ARES, M., HAUSLER, D., "KNOWLEDGE-BASED ANALYSIS OF MICROARRAY GENE EXPRESSION DATA USING SUPPORT VECTOR MACHINES", TECHNICAL REPORT, UNIVERSITY OF CALIFORNIA IN SANTA CRUZ, 1999. (SUBMITTED FOR PUBLICATION).
5. HARALICK, R. M., SHANMUGAM, K., DINSTEN, I., "TEXTURAL FEATURES FOR IMAGE CLASSIFICATION", IEEE TRANS. SYSTEMS, MAN, AND CYBERNETICS, VOL. SMC-3, NO. 6, NOV. 1973.
6. HEYWANG-KOBRUNNER, S. H., SCHREER, I., DERSHAW, D. D., "DIAGNOSTIC BREAST IMAGING", THIEME MEDICAL PUBLISHERS, 1997.
7. KIM, J. K., PARK, H. W., "STATISTICAL TEXTURAL FEATURES FOR DETECTION OF MICROCALCIFICATIONS IN DIGITIZED MAMMOGRAMS", IEEE TRANS. MED. IMAG., VOL. 18, NO. 3, PP. 231-238, MAR. 1999.
8. LECUN, Y., JACKEL, L. D., BOTTOU, L., BRUNOT, A., CORTES, C., DENKER, J. S., DRUCKER, H., GUYON, I., MULLER, U. A., SACKINGER, E., SIMARD, P., VAPNIK, V., "COMPARISON OF LEARNING ALGORITHM FOR HANDWRITTEN DIGIT RECOGNITION", IN FOGELMAN-SOULIE, F. AND GALLINARI, P., EDITORS, PROCEEDINGS ICANN'95, VOLUME II, PAGES 53-60. EC2, 1995.
9. MORROW, W. M., PARANJAPPE, R. B., RANGAYAN, R. M., DESAUTELS, J. E. L., "REGION-BASED CONTRAST ENHANCEMENT OF MAMMOGRAMS", IEEE

TRANS. MED. IMAG., VOL. 11, NO. 3, PP. 392-406, SEPT. 1992. 10.NELLO, C. J., SHAVE T., "AN INTRODUCTION TO SUPPORT VECTOR MACHINES: AND OTHER KERNEL BASED LEARNING METHOD", CAMBRIDGE UNIVERSITY PRESS,2000. 11.OREN, M., PAPAGEORGIOU, C., SINHA, P., OSUNA, E., POGGIO, T., "PEDESTRIAN DETECTION USING WAVELET TEMPLATES", THE PROCEEDINGS OF CVPR'97, JUNE 1997. 12.OSUNA, E., FREUND, R., GIROSI, F., "TRAINING SUPPORT VECTOR MACHINES: AN APPLICATION TO FACE DETECTION", THE PROCEEDINGS OF CVPR'97, JUNE 1997. 13.PRINCIPE, J. C., EULIANO, N. R., LEFEBVRE, W. C., "NEURAL AND ADAPTIVE SYSTEMS: FUNDAMENTALS THROUGH SIMULATIONS", JOHN WILEY AND SONS, 1999. 14.SHEN, L., RANGAYYAN, R. M., LEO DESAUTELS, J. E., "SHAPE ANALYSIS OF MAMMOGRAPHIC CALCIFICATIONS", IN PROC. FIFTH ANNU. IEEE SYMP.COMPUTER-BASED MEDICAL SYSTEMS, JUNE 1992, PP. 123-128. 15.SONKA M., HLAVAC, V., BOYLE, R., "IMAGE PROCESSING, ANALYSIS,AND MACHINE VISION",BROOKS /COLE PUBLISHING COMPANY, 1999. 16.STRICKLAND, R.N. ,HAHN, H.I. , "WAVELET TRANSFORMS FOR DETECTION MICROCALCIFICATIONS IN MAMMOGRAMS", IEEE TRANS. ON MEDICAL IMAGING, VOL.15, NO.2,APRIL 1996. 17.VAPNIK, V., "THE NATURE OF STATISTICAL LEARNING THEORY", SPRINGER VERLAG, 1995. 18.VELDKAMP, W. J. H., KARSSEMEIJER, N., "NORMALIZATION OF LOCAL CONTRAST IN MAMMOGRAMS", IEEE TRANS. MED. IMAG., VOL. 19, NO. 7,PP. 731-738, JULY 2000. 19.YU, S., GUAN, L., "A CAD SYSTEM FOR THE AUTOMATIC DETECTION OF CLUSTERED MICROCALCIFICATIONS IN DIGITIZED MAMMOGRAM FILMS", IEEE TRANS. MED. IMAG., VOL. 19, NO. 2, PP. 115 -126, FEB. 2000. 20.ZHENG, B., QIAN, W., CLARKE, L. P., "DIGITAL MAMMOGRAPHY MIXED FEATURE NEURAL NETWORK WITH SPECTRAL ENTROPY DECISION FOR DETECTION OF MICROCALCIFICATIONS", IEEE TRANS. MED. IMAG., VOL. 15, NO. 5, PP. 589-597, OCT. 1996. 21 .[HTTP://CHEMDIV-WWW.NRL.NAVY.MIL/6110/SENSORS/CHEMOMETRICS/GRNN. HTML](http://chemdiv-www.nrl.navy.mil/6110/sensors/chemometrics/grnn.html) 22. [HTTP://WWW.DOHOV.GOV.TW/STATISTIC/DATA/公佈欄資料檔/90死因/90年死因分析.DOC](http://www.doh.gov.tw/statistic/data/公佈欄資料檔/90死因/90年死因分析.doc) 23. [HTTP://WWW.DOHOV.GOV.TW/STATISTIC/DATA/公佈欄資料檔/90死因/癌症8990.XLS](http://www.doh.gov.tw/statistic/data/公佈欄資料檔/90死因/癌症8990.xls)