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Computer-aided detection of wall motion abnormalities in cardiac MRI

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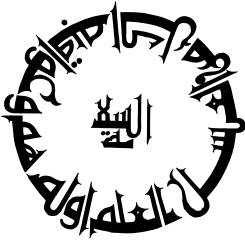
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Computer-Aided Detection of Wall Motion Abnormalities in Cardiac MRI

Avan Suinesiaputra

Colophon

About the cover:



The cover is an Arabic calligraphy made by an 11-year old M. Zulkhairi Rhiza Tala, which was based on a Kufic inscription written on an 11th–12th century Iranian dish. The text on the dish is translated into: “Science is bitter-tasting (of thinking) at first, but sweeter than honey in the end. Peace.” The dish is currently stored in the Islamic Art collection of the Musée du Louvre, Paris.

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Computer-Aided Detection of Wall Motion Abnormalities in Cardiac MRI

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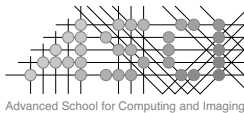
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*Papah/Bapak and Mamah/Mamak,
from whom I receive most of Allah's love through.*

CONTENTS

Contents	iii
1 Introduction	1
1.1 Imaging techniques for diagnosis of ischaemic heart disease	4
1.1.1 Magnetic resonance imaging (MRI)	4
1.1.1.1 Resting cine-MR images	5
1.1.1.2 Dobutamine stress MR (DSMR)	5
1.1.1.3 MR perfusion	5
1.1.1.4 Contrast-enhanced MRI (CE-MRI)	6
1.1.2 Echocardiography	7
1.1.3 ¹⁸ F-fluorodeoxyglucose (FDG) PET imaging	7
1.1.4 Electrocardiographically-gated perfusion SPECT imaging	8
1.2 Computer-assisted diagnosis for ischaemia	8
1.3 Motivation and objectives	10
1.4 Outline	10
1.5 References	12
2 Optic flow computation from cardiac MR tagging using a multiscale differential method: A comparative study with Velocity-Encoded MRI	21
<i>Suinesiaputra et. al., Medical Image Computing and Computer-Assisted Intervention, Lecture Notes in Computer Science Series vol. 2878, 483–490, Springer, 2003.</i>	
2.1 Methodology	24
2.1.1 Conservation principle in tagging MRI	24
2.1.2 The First Order Density Multiscale OFCE	24
2.1.3 The multiscale scheme	25
2.2 Experimental results	26
2.2.1 Clinical Data	27
2.2.2 Results	27
2.3 Discussion	28
2.4 References	30
3 Extraction of myocardial contractility patterns from short-axis MR images using Independent Component Analysis	31

Suinesiaputra et. al., Computer Vision and Mathematical Methods in Medical and Biomedical Image Analysis, Lecture Notes in Computer Science Series vol. 3117, 75–86, Springer, 2004.

3.1	Methodology	34
3.1.1	ICA model	34
3.1.2	Geometry-based sorting for ICA modes	35
3.1.3	Cluster measurement metrics	37
3.2	Experimental results	38
3.2.1	Weighting coefficient matrix	38
3.2.2	Mean cluster distance	39
3.2.3	Cluster analysis	40
3.2.4	Separation degree	41
3.3	Discussion	42
3.4	References	43
4	Detecting regional abnormal cardiac contraction in short-axis MR images using Independent Component Analysis	45
	<i>Suinesiaputra et. al., Medical Image Computing and Computer-Assisted Intervention, Lecture Notes in Computer Science Series vol. 3216, 737–744, Springer, 2004.</i>	
4.1	Methodology	47
4.1.1	ICA modeling of the normal cardiac contraction	47
4.1.2	Determining the number of independent components	49
4.1.3	Detection of abnormal contractility patterns	50
4.2	Experimental Results	51
4.3	Discussion	52
4.4	References	52
5	Automatic prediction of myocardial contractility improvement in stress MRI using shape morphometrics with Independent Component Analysis	55
	<i>Suinesiaputra et. al., Information Processing in Medical Imaging, Lecture Notes in Computer Science Series vol. 3565, 321–332, Springer, 2005.</i>	
5.1	Methodology	58
5.1.1	Modeling contraction of healthy myocardium	58
5.1.2	Optimal number of independent components	59
5.1.3	Density estimation of coefficient values from the ICA model	61
5.2	Experimental Results	63
5.2.1	Model construction	63
5.2.2	Qualitative prediction results of contractility improvement	63
5.3	Discussion	66
5.4	References	66
6	Automated detection of regional wall motion abnormalities based on a statistical model applied to multi-slice short-axis cardiac MR images	69
	<i>Suinesiaputra et. al., IEEE Trans Med Imaging, 4(28):595–607, 2009.</i>	
6.1	Introduction	72
6.1.1	Automated RWMA detection methods	72

6.1.2	Sparse decomposition in statistical shape analysis	73
6.1.3	Contribution of this chapter	74
6.2	Methodology	74
6.2.1	Statistical Shape Modeling of Cardiac Contraction	74
6.2.2	Myocardial Shape Decomposition with ICA	76
6.2.3	Robust Estimation of Independent Components	77
6.2.4	Estimating Density Functions of Independent Components	79
6.2.5	Detecting Abnormal Regions	80
6.3	Experimental Results	83
6.3.1	Data description and preprocessing	83
6.3.2	Validation Method	84
6.3.3	Classification performance	86
6.3.4	Disagreement with visual wall motion score	86
6.3.5	Disagreement with wall thickening	88
6.3.6	Comparison with direct landmark density estimation	90
6.4	Discussion	91
6.4.1	Method performance	91
6.4.2	Study limitations	91
6.4.3	Clinical utility	92
6.5	Conclusion	92
6.6	References	93
7	An automated regional wall motion abnormality detection by combining rest and stress cardiac MRI: Correlation with infarct transmuralty from contrast-enhanced MRI	97
	<i>Suinesiaputra et. al., submitted.</i>	
7.1	Materials and Methods	99
7.1.1	Study design	99
7.1.2	Data acquisition	100
7.1.3	Slice selection	100
7.1.4	Myocardial contour delineation and segmental definition	101
7.1.5	Normokinetic myocardial shape models	101
7.1.6	Building RWMA probability density functions	102
7.1.7	RWMA evaluation	102
7.1.8	Transmural extent	104
7.1.9	Statistical analysis	104
7.2	Results	105
7.2.1	Rest versus rest-stress data	105
7.2.2	Scar tissue detection	106
7.2.3	Correlation with infarct transmuralty	107
7.3	Discussion	107
7.4	References	109
8	Summary	111
8.1	Myocardial wall motion modeling	113

8.2	Automated evaluation of regional wall motion abnormalities	114
8.3	Automated prediction of functional improvement	115
8.4	Future directions	116
8.5	References	117
9	Samenvatting	119
9.1	Statistische modellering van de wandbeweging van het linkerventrikel . . .	121
9.2	Automatische detectie van afwijkingen in regionale wandbeweging van het LV	122
9.3	Automatische bepaling van functionele verbeteringen in wandbeweging .	123
9.4	Vervolgonderzoek	124
9.5	References	125
	Publications	127
	Acknowledgements	129
	Curriculum vitae	131