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Structural health monitoring meets data mining

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Cover photos: The Hollandse Brug (bridge) and a Correlation Matrix. The photo of the Hollandse Brug is taken by Gouwenaar, published under the Creative Commons CC0 1.0 Universal Public Domain Dedication; the Correlation Matrix is derived from correlations among 145 signals collected with 145 sensors installed on the Hollandse Brug.

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Contents

1	Introduction	1
1.1	Background	1
1.2	Objectives and Scope	2
1.2.1	Data Acquisition and Signal Processing	3
1.2.2	Feature Extraction	5
1.3	Thesis Outline	6
2	Preliminaries	9
2.1	Background	9
2.2	Fourier Transform	11
2.3	Convolution	12
2.4	Similarity Measurement	15
3	The Infrawatch Project	19
3.1	Description of the Bridge	19
3.2	The Sensor Network	20
3.3	The Specific Focus of each Sensor Type	22
3.3.1	The Specific Focus of Small Scale	23
3.3.2	The Specific Focus of Big Scale	24
4	Sensor Dependencies among Multiple Sensor Types	27
4.1	The Dependency between Strain and Temperature Sensors	29
4.2	The Dependency between Strain and Vibration Sensors	32
4.3	The Dependency between Vibration and Temperature Sensors	37
4.4	Meta-learning	38

CONTENTS

4.5	Conclusion	42
5	Baseline Correction	43
5.1	Introduction	43
5.2	The Most-Crossing Method	47
5.2.1	Baseline Recognition	47
5.2.2	Baseline Modeling	50
5.2.3	Traffic Jam Detection	50
5.2.4	Baseline Removal	53
5.3	Experimental Evaluation	53
5.3.1	Baseline Removal over a Short Period Signal	54
5.3.2	Baseline Elimination for Traffic Jams	57
5.4	Baseline Correction Applied to Traffic Counting	60
5.5	Related Work	63
5.6	Conclusion	64
6	Predefined Pattern Detection	67
6.1	Introduction	67
6.2	Preliminaries	70
6.2.1	Landmark Extraction	71
6.2.2	Predefined Pattern Detection	73
6.3	Landmark Constraints	74
6.4	Fitting Templates to the Data	75
6.4.1	Continuous Landmark Model	75
6.4.2	Discrete Landmark Model	77
6.4.2.1	Trust Region	79
6.5	Determining the Smoothing Level	81
6.5.1	Minimum Description Length	83
6.5.1.1	Encoding of the Model	84
6.5.1.2	Encoding the Data	84
6.5.2	Smoothing Level Selection	85
6.6	Experiments	85
6.6.1	Artificial Dataset	86
6.6.2	Real-life Traffic Dataset	88

6.6.3 ECG Signal	90
6.7 Related Work	92
6.8 Conclusion	94
7 Modal Analysis	97
7.1 Background	97
7.2 Data Selection	99
7.2.1 Sensor Selection	99
7.2.2 Traffic Event Detection	100
7.2.3 Free Vibration Periods Extraction	103
7.3 Modal Parameter Extraction	104
7.3.1 The Peak-Picking Method	105
7.3.2 The SSI Method	106
7.3.2.1 Stochastic State Space Model	107
7.3.2.2 The Stabilization Diagram	110
7.3.2.3 Experimental Settings on InfraWatch Dataset	112
7.3.2.4 The Results of the SSI Method	113
7.4 The Influence of Environmental Factors	114
7.4.1 The Influence of Temperature	117
7.4.2 The Influence of Traffic Events	119
8 Conclusion	125
8.1 Conclusion	125
8.2 Discussion	128
8.3 Future work	129
References	131
Nederlandse Samenvatting	145
English Summary	147
Acknowledgements	149
Curriculum Vitae	151

