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Machine learning and computer vision for urban drainage inspections

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Machine Learning and
Computer Vision for
Urban Drainage Inspections

“What do such machines really do? They increase the number of things we can do without thinking. Things we do without thinking — there’s the real danger.”

Frank Herbert, *God Emperor of Dune*

Machine Learning and Computer Vision for Urban Drainage Inspections

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*Dedicated to the memory of Ilundi
for helping me rediscover meaning.*

CONTENTS

I	INTRODUCTION	II
I.1	Motivation	II
I.1.1	Sewer Asset Management	II
I.1.2	Machine Learning and Computer Vision	12
I.1.3	Scope	13
I.2	Research Questions	13
I.3	Contribution	16
2	PRELIMINARIES	18
2.1	Machine Learning	18
2.1.1	Classification	18
2.1.2	Regression	19
2.1.3	Overfitting, Regularization, Cross Validation	20
2.1.4	Model Validation	23
2.1.5	Anomaly Detection	27
2.1.6	Principal Component Analysis	28
2.2	Digital Image Processing	29
2.2.1	Convolution	29
2.3	Convolutional Neural Networks	31
2.3.1	The Perceptron	31
2.3.2	Convolutional layers	34
2.3.3	Pooling layers	35
2.3.4	Convolutional Neural Network Design	36
2.4	Computer Stereovision	37

3	IMAGE-BASED UNSUPERVISED ANOMALY DETECTION	40
3.1	Framework	40
3.1.1	PCA Decomposition and Partial Reconstruction	41
3.1.2	Feature Descriptors	42
3.1.3	Dissimilarity Function	43
3.2	Proof of Concept	44
3.3	Application in Sewer Pipe Images	47
3.3.1	Feature Extraction	50
3.3.2	Concatenating Feature Vectors	52
3.4	Convolutional Autoencoder	54
3.5	Summary	57
4	CONVOLUTIONAL NEURAL NETWORK CLASSIFICATION	58
4.1	Introduction	59
4.1.1	Image Classification	59
4.1.2	Classification Result Validation	60
4.1.3	Related Work	61
4.2	Data Exploration	63
4.2.1	Image data	63
4.2.2	Inspection Reports	65
4.3	Methodology	67
4.3.1	Loss Function for Multi-Label Classification	67
4.3.2	Class Imbalance and Oversampling	68
4.4	Aggregating performance on pipe level	70

4.5	Leave-two-inspections-out Cross Validation	71
4.5.1	Overfitting	72
4.5.2	Averaging performance metrics across folds	74
4.5.3	Class Imbalance	75
4.6	Implementation Details	76
4.7	Results	78
4.8	Discussion	78
4.8.1	Classifying individual images	78
4.8.2	Classifying entire pipes	79
4.8.3	Result Interpretation	88
4.8.4	Combining Defect Outputs	91
4.9	Conclusion	93
4.9.1	Future Work	94
5	STEREOVISION AND GEOMETRY RECONSTRUCTION	96
5.1	Introduction	96
5.2	Prior Work and Motivation	99
5.3	Framework	101
5.3.1	Image Acquisition	101
5.3.2	Stereo Matching	103
5.3.3	Three-Dimensional Geometry Reconstruction	105
5.3.4	Robust Pipe Surface Fitting	106
5.3.5	Anomaly Detection and Processing	111
5.4	Experimental Setup	112
5.4.1	Image Data	113

5.4.2	Implementation Details and Parameters	113
5.5	Results and Discussion	116
5.5.1	Stereo Matching and Geometry Reconstruction	116
5.5.2	Surface Fitting and Anomaly Detection	117
5.5.3	Discussion	121
5.6	Conclusion	125
5.6.1	Summary	125
5.6.2	Limitations	125
5.6.3	Recommendations	126
6	DISCUSSION AND CONCLUSIONS	128
6.1	Future Work	133
6.2	Closing Remarks	134
	BIBLIOGRAPHY	135
	CURRICULUM VITAE	142
	List of Publications	142
	ENGLISH SUMMARY	144
	NEDERLANDSE SAMENVATTING	147
	ACKNOWLEDGEMENTS	151

