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Aspects of the analysis of cell imagery: from shape to understanding

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Aspects of the Analysis of Cell Imagery: from Shape to Understanding

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Contents

1	Introduction	1
1.1	Microscopy Imaging	2
1.2	Data Patterns	4
1.3	Microscope Image Analysis with Machine Learning	5
1.3.1	Ground Truth Data	6
1.3.2	Image Classification	8
1.3.3	Image Segmentation	8
1.3.4	Object Tracking	9
1.4	Research Questions and Main Contributions	9
1.4.1	Classification of Pollen from Images	10
1.4.2	Neutrophil Tracking in Time-lapse Sequences	11
1.5	Thesis Structure	13
2	Neural Networks for Increased Accuracy of Allergenic Pollen Monitoring	17
2.1	Introduction	19
2.2	Materials and Methods	21
2.2.1	Collection of Pollen	21
2.2.2	Pollen Image Capture	23
2.2.3	Reference Pollen Image Library	23
2.2.4	Convolutional Neural Networks	24
2.2.5	Data Augmentation	25
2.2.6	Test Cases	26
2.3	Results	26
2.3.1	Model Performance	26
2.3.2	Application to Test Cases	29
2.4	Discussion	29
2.5	Conclusions	32

3	Analysis of Automatic Image Classification Methods for Urticaceae Pollen Classification	33
3.1	Introduction	35
3.2	Methods	38
3.2.1	Sample and Image Preparation	38
3.2.1.1	Sample Preparation of the Pollen Grains	38
3.2.1.2	Image Capturing and Pre-processing	38
3.2.2	Machine Learning Methods	41
3.2.2.1	Feature Extraction and Selection	41
3.2.2.2	Classifiers	43
3.2.2.3	Hierarchical Strategy	44
3.2.3	Deep Learning Methods	45
3.2.3.1	Convolutional Neural Networks	45
3.2.3.2	Data Augmentation	45
3.2.3.3	Cross-validation and Hard Voting	46
3.2.4	Performance Evaluation	46
3.3	Experiment Results and Discussion	47
3.3.1	Results with Machine Learning Methods	47
3.3.2	Results with Deep Learning Methods	49
3.3.3	Results on Smaller-size Image Datasets	54
3.4	Conclusions	57
4	An Automated Cell Tracking Pipeline for the Analysis of Neutrophil Dynamics	61
4.1	Introduction	63
4.2	Materials and Methods	66
4.2.1	Image Capturing and Pre-processing	66
4.2.2	Cell Segmentation	68
4.2.2.1	Ground Truth Labelling for Segmentation	68
4.2.2.2	Segmentation Models	69
4.2.2.3	Evaluations for Segmentation	70
4.2.3	Cell Tracking	71
4.2.3.1	Ground Truth Labelling for Tracking	71
4.2.3.2	U-Net for Tracking and Evaluations	71
4.2.3.3	Extended Viterbi Linkage Method	72
4.2.3.4	Evaluations for Linkage Trajectories	79
4.3	Results and Discussion	79
4.3.1	Segmentation Results	79

4.3.2	Tracking Results	82
4.3.3	Linkage Results	83
4.3.4	Results on Other Datasets	87
4.4	Conclusions	91
5	A Feature Weighted Tracking Method for 3D Neutrophils in Time-lapse Mi-	
	croscopy	93
5.1	Introduction	95
5.2	Data Collection and Pre-processing	96
5.2.1	Data Capturing	96
5.2.2	Data Pre-processing and Linear Interpolation	97
5.3	3D U-Net Segmentation	98
5.4	Feature Weighted Tracking	99
5.4.1	Cell Distance	99
5.4.2	Cell Movement Direction	99
5.4.3	Average Cell Movement Distance	101
5.4.4	Similarity Scores	101
5.4.5	Hungarian Association	102
5.5	Experimental Results	103
5.5.1	Ground Truth Annotation	103
5.5.2	Evaluation Criteria	103
5.5.3	Results	103
5.6	Conclusions	107
6	Conclusions and Discussion	109
6.1	Main Findings	109
6.2	Discussion	112
6.2.1	Data Perspective	112
6.2.2	Hardware Perspective	114
6.2.3	Algorithmic Perspective	114
6.3	Future Research Directions	115
	References	117
	Appendix A Supplementary Materials in Chapter 2	131
	Appendix B Supplementary Materials in Chapter 3	143

Summary	145
Nederlandse Samenvatting	149
Curriculum Vitae	153
Acknowledgements	155