

Robust Data- and Model-Driven Anatomical Landmark Localization in Biomedical Scenarios

Dissertation

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Contents

1	Introduction	1
1.1	Biomedical Application Scenarios Used in this Work	3
1.1.1	Animal Locomotion Analysis	3
1.1.2	Cardiac Cycle Analysis	8
1.1.3	Face Analysis for Palsy Identification	9
1.2	Outline and Contributions	11
1.2.1	Outline	11
1.2.2	Contributions	11
2	Literature Overview	13
2.1	Rigid Object Detection, Localization, and Tracking	13
2.1.1	Interest Point Detectors	14
2.1.2	Template Matching	15
2.1.3	Sliding Window Approaches	16
2.1.4	Further Approaches	17
2.2	Non-Rigid Object Detection, Localization, and Tracking	17
2.2.1	Deformable Part Models	18
2.2.2	Landmark-Based Approaches	19
2.3	Biomedical Landmark Localization	22
2.3.1	Biomedical Applications	22
2.3.2	Facial Landmark Analysis	23
2.4	Summary and Discussion	25

CONTENTS

3	Data-Driven Landmark Localization	27
3.1	Basic Local Techniques	28
3.1.1	Optical Flow	28
3.1.2	Scale-Invariant Feature Transform	30
3.2	Robust Template Matching	33
3.2.1	Standard Template Matching	33
3.2.2	Sub-Template Matching	35
3.2.3	Applicability and Limitations	40
3.3	Robust Pictorial Structures	41
3.3.1	Pictorial Structures	42
3.3.2	Sub-Template Extension	47
3.3.3	Optimization Techniques	49
3.3.4	Applicability and Limitations	57
3.4	Two-Stage Graph-Based Approach	58
3.4.1	General Approach	60
3.4.2	Generation of Hypotheses	62
3.4.3	Finding Tracklets	68
3.4.4	Finding Tracks	69
3.4.5	Applicability and Limitations	71
4	Model-Driven Landmark Localization	73
4.1	Active Appearance Models	74
4.1.1	Model Training	75
4.1.2	Model Fitting	83
4.1.3	Weaknesses and Extensions	89
4.1.4	Implications for this Work	100
4.2	Augmented Active Appearance Models	101
4.2.1	AAMs with Constraints	103
4.2.2	Subset AAM Knowledge	109
4.2.3	Direct Landmark Constraints	113
4.2.4	Region Knowledge	114
4.2.5	Epipolar Geometry Knowledge	119
4.2.6	Comparison to Related Approaches	122
4.2.7	Applicability and Limitations	123
4.3	Model Transfer for Active Appearance Models	124
4.3.1	Knowledge Transfer for AAMs	125

4.3.2	Full Source Variation Transfer	127
4.3.3	Subspace Transfer	132
4.3.4	Instance-Weighted Transfer	135
4.3.5	Applicability and Limitations	148
5	Beyond Landmark Localization	151
5.1	Animal Locomotion Analysis	152
5.1.1	3D Reconstruction and Visualization	152
5.1.2	Action Recognition	154
5.1.3	Center-of-Mass Analysis	158
5.1.4	Further Application Scenarios	166
5.2	Face Analysis	166
5.2.1	Facial Palsy Identification	166
5.2.2	Further Application Scenarios	173
5.3	Cardiac Cycle Analysis	174
5.3.1	Surface Reconstruction and Visualization	177
5.3.2	Further Application Scenarios	178
6	Experimental Evaluation	183
6.1	Datasets and Evaluation Methods	184
6.1.1	Animal Locomotion Analysis Scenario	184
6.1.2	Cardiac Cycle Analysis Scenario	194
6.1.3	Face Analysis Scenario	196
6.2	Basic Local Techniques	199
6.2.1	Influence of Parameter Settings	200
6.2.2	General Performance	201
6.2.3	Implementation and Runtime	203
6.3	Robust Template Matching and Pictorial Structures	203
6.3.1	Robust Template Matching Parameters	204
6.3.2	Comparison to Basic Local Methods	208
6.3.3	Comparison to Pictorial Structures	210
6.3.4	Implementation and Runtime	214
6.4	Two-Stage Graph-Based Tracking	215
6.4.1	Cardiac Cycle Analysis Scenario	215
6.4.2	Animal Locomotion Analysis Scenario	220
6.5	Augmented Active Appearance Models	224

CONTENTS

6.5.1	General Active Appearance Model Considerations . . .	225
6.5.2	Comparison to Standard Active Appearance Models . . .	234
6.5.3	Influence of Constraints	239
6.5.4	Comparison to Non-Holistic Approaches	241
6.5.5	Comparison to Pictorial Structures	244
6.5.6	Comparison to Human Experts	246
6.5.7	3D Evaluation	249
6.5.8	Implementation and Runtime	251
6.6	Active Appearance Model Transfer	253
6.6.1	Face Analysis Scenario	254
6.6.2	Animal Locomotion Analysis Scenario	262
6.7	Applications Beyond Landmark Localization	266
6.7.1	Action Unit Prediction and Facial Palsy Identification	266
6.7.2	Center-of-Mass Estimation	272
7	Conclusions	281
7.1	Summary and Contributions	281
7.2	Future Work	284
7.2.1	General Aspects	284
7.2.2	Two-Stage Graph-Based Approach	286
7.2.3	Augmented Active Appearance Models	287
7.2.4	Active Appearance Model Transfer	287
	Bibliography	289
	Own Publications	331
	List of Figures	335
	List of Tables	339
	List of Algorithms	341
	Index	343