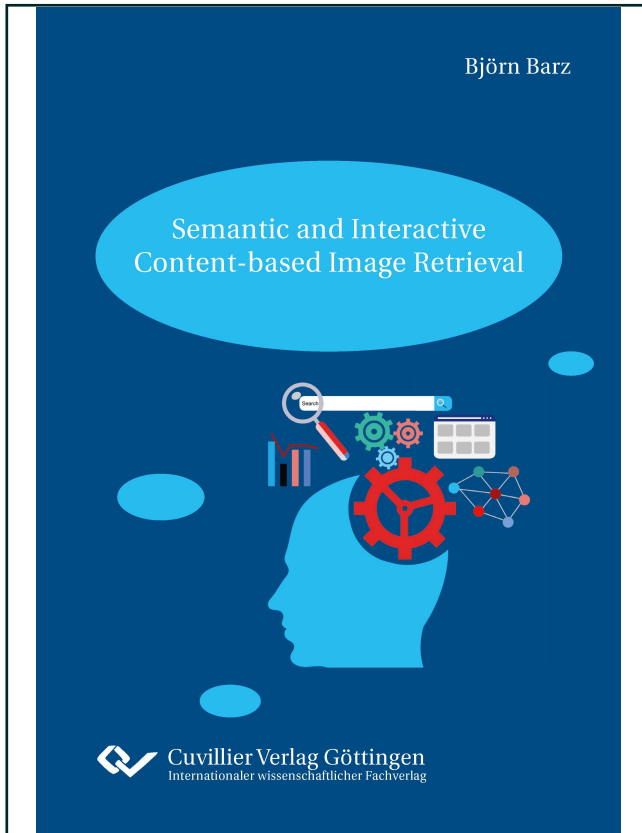




Björn Barz (Autor)

Semantic and Interactive Content-based Image Retrieval



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Contents

1	Introduction	1
1.1	Content-based image retrieval	1
1.2	Instance vs. category retrieval	5
1.3	Challenges	7
1.4	Interactive image retrieval	9
1.5	Semantic image retrieval	12
1.6	Contributions of this thesis	14
2	Methodical Background	17
2.1	Fundamental concepts and definitions	17
2.2	Classification	20
2.2.1	Problem setting	20
2.2.2	Support vector machines	21
2.2.3	Linear discriminant analysis	25
2.2.4	Nearest neighbor classification	26
2.2.5	Gaussian processes	27
2.2.6	Neural networks	30
2.2.7	Active learning	39
2.3	Clustering	41
2.3.1	k-means	42
2.3.2	Gaussian Mixture Models	43
2.4	Metric Learning	44
2.4.1	Problem setting and definitions	44
2.4.2	Duality between metric and feature learning	45
2.4.3	Learning metrics for fixed features	46

CONTENTS

2.4.4	Deep metric learning	49
2.5	Information retrieval	53
2.5.1	Problem description	53
2.5.2	Evaluation metrics	54
2.5.3	Learning to rank	56
2.5.4	System architecture	58
2.5.5	Spatial verification and re-ranking	60
2.5.6	Query expansion and diffusion	61
2.5.7	Cross- and multi-modal retrieval	65
2.6	Image representations for CBIR	66
2.6.1	Hand-crafted local features	67
2.6.2	Hand-crafted transformations and aggregations	69
2.6.3	PCA and whitening	71
2.6.4	Off-the-shelf CNN features	73
2.6.5	End-to-end learning for image retrieval	74
2.7	Relevance feedback	78
3	The Cosine Loss	81
3.1	Introduction and motivation	81
3.1.1	The problem of small data	82
3.1.2	Weakly supervised localization	84
3.2	Related work	86
3.2.1	Cosine Loss	86
3.2.2	Learning from small data	87
3.2.3	Weakly supervised localization	89
3.3	The cosine loss	91
3.3.1	Objective and notation	91
3.3.2	Comparison with other loss functions	92
3.4	Dense classification and scene understanding	96
4	Hierarchy-based Semantic Image Embeddings	101
4.1	In the need of prior knowledge	101
4.1.1	Semantic image retrieval	102
4.1.2	Explaining classification decisions	104
4.2	Related work	105
4.3	Knowledge in trees: class taxonomies	107
4.3.1	Hierarchy-based semantic similarity	108

4.3.2	Tree-shaped taxonomies	109
4.4	Hierarchy-based semantic embeddings	112
4.4.1	Exact solution	112
4.4.2	Low-dimensional approximation	114
4.5	Learning semantic image embeddings	117
4.6	Subsequent works on semantic embeddings	118
5	Experiments: Cosine Loss and Semantic Embeddings	123
5.1	Datasets	123
5.1.1	Visual classification datasets	123
5.1.2	FGVC datasets	125
5.1.3	Extreme Weather dataset	127
5.1.4	AG News dataset	128
5.1.5	MS COCO	129
5.2	Training details	129
5.3	Semantic image retrieval	132
5.3.1	Performance metrics	132
5.3.2	Competitors	133
5.3.3	Semantic image retrieval performance	134
5.3.4	Low-dimensional approximation	138
5.4	Learning from small data	139
5.4.1	Classification performance	139
5.4.2	Effect of semantic information	142
5.4.3	Effect of dataset size	143
5.5	Learned feature space	145
5.6	Dense classification	147
5.6.1	Weakly supervised localization	148
5.6.2	Explaining classifier decisions	154
6	Interactive Image Retrieval	159
6.1	Introduction	159
6.2	Related work	160
6.2.1	Multiple instance feedback	160
6.2.2	Active learning for image retrieval	162
6.2.3	Important image regions	164
6.3	Automatic query image disambiguation	166
6.3.1	Identification of image senses	168

CONTENTS

6.3.2	Refinement of results	170
6.4	Information-theoretic active learning	171
6.4.1	Idea and ideal objective	174
6.4.2	Relevance model	176
6.4.3	User model	178
6.4.4	Approximation of mutual information	179
6.4.5	Greedy batch construction	180
6.5	Adaptive pooling	181
6.5.1	Learning the Exemplar-LDA model	183
6.5.2	Modifying the representations of database images	184
7	Experimental Evaluation of Interactive Retrieval	187
7.1	Datasets and features	187
7.1.1	Natural image datasets	188
7.1.2	Domain-specific datasets	190
7.2	Experiments for AID	191
7.2.1	Simulation of the user	191
7.2.2	Evaluation metrics	192
7.2.3	Competitors	192
7.2.4	Quantitative results	193
7.2.5	Qualitative examples	195
7.3	Experiments for ITAL	196
7.3.1	Datasets and simulation of user feedback	197
7.3.2	Competitors	198
7.3.3	Hyper-parameter tuning	200
7.3.4	Quantitative performance evaluation	201
7.3.5	Comparison with MCMC[min] and AdaptAL	203
7.3.6	Effect of the user model	204
7.3.7	Sensitivity regarding feature dimensionality	204
7.3.8	Qualitative results	206
7.4	Experiments for adaptive pooling	210
7.4.1	Quantitative results	210
7.4.2	Qualitative examples	211

8	Conclusions	217
8.1	Summary and thesis contributions	217
8.2	Future work	223
8.2.1	Semantic embeddings	224
8.2.2	Learning from small data	225
8.2.3	Weakly supervised localization	226
8.2.4	Interactive image retrieval	227
A	Appendix	231
A.1	Derivation of Eq. (6.5)	231
A.2	Derivation of Eq. (6.6)	232
A.3	Additional metrics for semantic image retrieval	233
A.4	Further semantic retrieval results	234
A.5	Setup for instance and category retrieval comparison	235
A.6	ITAL failure cases	236
A.7	Taxonomy used for MS COCO	238
A.8	Taxonomy used for CIFAR-100	240
	Bibliography	241
	List of Own Publications	277
	List of Figures	281
	List of Tables	285
	List of Definitions, Theorems, and Lemmas	287
	Notations	289
	Acronyms	297
	Index	301