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New Segmentation and Edge Detection Methods Using Physics-Based Models of Image Formation

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*Para María,
por tantos años de paciente espera.
Para Lucas,
aunque es mucho menos paciente.
Para Alex,
que acaba de llegar.*

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Contents

List of Figures	XV
List of Tables	XIX
List of Algorithms	XXI
Symbols and Notation	XXIII
Acronyms	XXV
1 Introduction and Objectives	1
1.1 The Computer Vision Problem	1
1.2 Problem Statement and Objectives	2
1.2.1 General discussion	2
1.2.2 Objectives of this thesis	5
1.3 Thesis Outline	7
2 The Image Formation Process	9
2.1 Radiometry	9
2.1.1 Radiometrical concepts	9
2.1.2 The Bidirectional Reflectance Distribution Function	11
2.2 Interaction of Light with Matter	11
2.2.1 Introductory concepts	11
2.2.2 Interaction of light with metals	12
2.2.3 Interaction of light with dielectrics	13
2.3 Reflection Models	14
2.3.1 The Reflectance Map	14
2.3.2 Body reflection models	14
2.3.3 Interface reflection models	17
2.3.4 Hybrid models	19
2.3.5 Inter-reflections	21
2.4 Optical Image Sensors	22
2.4.1 General image sensing	22
2.4.2 CCD basics	24
2.4.3 Colour image formation in CCD cameras	26
2.4.4 CCD cameras operation and noise modelling	28
2.4.5 Other aspects of CCD camera operation	31

3	Review of Image Segmentation Approaches	35
3.1	Brief Review on General Image Segmentation	35
3.2	The Roots of Physics-Based Segmentation	37
3.3	State of the Art in Physics-Based Segmentation	38
3.3.1	Reflectance estimation	39
3.3.2	Cluster analysis	40
3.3.3	Continuity of the image surface	45
3.3.4	Photometric invariants and specialized colour spaces	46
3.4	Summary and Conclusions	55
4	General Framework for Image Segmentation and Edge Detection	59
4.1	Axis Notation	59
4.2	Expanded Model of Image Formation (without noise)	59
4.3	Use of a Physics-Based Model for Segmentation and Edge Detection	62
4.4	Discussion about the Experimental Setup	63
4.4.1	Camera configuration and input data	63
4.4.2	Performance evaluation of segmentation and edge detection algorithms	65
	General discussion	65
	Image segmentation evaluation and the confusion matrix	66
	A discrepancy-based evaluation strategy for image segmentation	68
	Discussion over an illustrative example	74
	Edge detection evaluation	77
4.4.3	Performance evaluation setup	78
5	Estimation of Lighting Distribution Parameters	79
5.1	Estimation from Single Band Images	79
5.1.1	Estimation of surface normal vectors	80
5.1.2	Estimation of the lighting direction	81
5.1.3	Final considerations	87
5.2	Estimation from Colour Images	88
5.3	Error of Assuming Orthographic Projection	88
5.4	Extension to Perspective Projection	91
5.4.1	Projection of the sphere	91
5.4.2	Estimation of surface normal vectors	93
5.4.3	Estimation of the lighting direction	96
5.4.4	Summary of the extended estimation method	97
5.5	Previous Work	97
5.5.1	Illuminant orientation determination	97
5.5.2	Estimation of the illuminant chromaticity	98
5.5.3	General comment on the use of a calibration object	99
5.6	Experimental Results	100
5.6.1	Example of lighting parameters estimation	100
5.6.2	Orthographic projection <i>versus</i> perspective projection	103
5.6.3	Robustness measures	106
	Sensitivity regarding the initial contour	107
	Robustness against Gaussian noise	108
	Robustness of s estimations	109
	Robustness of L_a and L_d estimations	110
5.6.4	Comparison with other lighting direction estimation methods	112
5.7	Conclusions	115

6	Radiometric Calibration of CCD Cameras	119
6.1	Estimation of the Camera Noise Model Parameters	119
6.1.1	Estimation of the PRNU and DCNU distribution parameters	120
6.1.2	Estimation of camera gain and charge-independent non-spatial noise	121
6.2	Applications of Radiometric Camera Calibration	122
6.2.1	Incorporation of realistic noise into synthetic images	122
6.2.2	Determination of uncertainties in the measurement of image irradiance	123
6.3	Previous Work	125
6.4	Experimental Results	126
6.4.1	Estimation of noise distribution parameters	126
6.4.2	Generation of noisy synthetic images	129
6.4.3	Determination of irradiance measurement uncertainties	129
6.4.4	An example on the use of intensity uncertainties	131
6.5	Conclusions	133
7	Image Segmentation by Scene Reconstruction	137
7.1	Model of Image Formation	137
7.2	Overview of IS ² R	139
7.2.1	Basic strategy	139
7.2.2	Shape from X methods	139
7.2.3	Shape from Shading	140
7.2.4	Algorithmic description of IS ² R	140
7.3	Initialization of Regions	143
7.4	Region Shape Estimation	145
7.5	Shape Extrapolation	147
7.6	Consistency Test	148
7.7	Discussion on Segmentation Anomalies	150
7.8	Extension of the Model of Image Formation	151
7.8.1	Segmentation of colour images	151
7.8.2	Tolerance to shadows	152
7.8.3	About other extensions	152
7.9	Experimental Results	153
7.9.1	A detailed example	154
7.9.2	Segmentation results for noiseless synthetic images	154
7.9.3	Experiments with real images	158
7.9.4	Comparison with other segmentation algorithms	170
7.10	Conclusions	174
8	Analysis of Colour Channels Coupling and Edge Detection	181
8.1	General Properties of Uniformly Coloured Image Areas	181
8.2	Particularization of the General Properties	183
8.2.1	Case 1: non-glossy pixels/without ambient lighting	183
8.2.2	Case 2: non-glossy pixels/with ambient lighting	184
8.2.3	Case 3: glossy pixels/without ambient lighting	186
8.2.4	Case 4: glossy pixels/with ambient lighting	187
8.3	Usefulness of the Properties	188
8.4	Cases which Fail to Satisfy the Properties	189
8.5	Formulation of a Compatibility Relationship between Pixels	193
8.6	Coverage of Reflectance Transitions	195
8.7	Colour Channel Coupling-based Edge Detection (C ³ E)	198
8.7.1	Edge map computation	198
8.7.2	Implementation issues	198
8.7.3	Examples of edge maps and discussion	200
8.8	Edge Thinning Strategy	201

8.9	Experimental Results	202
8.9.1	Experiments with synthetic images	203
8.9.2	Experiments with real images	205
8.10	Conclusions	210
9	Image Segmentation by Analysis of Colour Channels Coupling	213
9.1	Outline of the Segmentation Algorithm	213
9.2	Region Growing	214
9.3	Region Merging	215
9.3.1	Merging of non-glossy regions	215
9.3.2	Merging of specularities	219
	General description	219
	Implementation details	220
9.3.3	An example of merging	223
9.4	Experimental Results	224
9.4.1	Experiments with synthetic images	224
9.4.2	Experiments with real images	228
9.5	Conclusions	235
10	Conclusions and Future Work	243
10.1	Conclusions	243
10.1.1	Global conclusions	244
10.1.2	Conclusions for chapter 4	245
10.1.3	Conclusions for chapter 5	245
10.1.4	Conclusions for chapter 6	246
10.1.5	Conclusions for chapter 7	246
10.1.6	Conclusions for chapter 8	247
10.1.7	Conclusions for chapter 9	247
10.2	Future Work	248
 Appendices		
A	Multi-line Least Squares Fitting	251
A.1	Common-Origin Multi-Line Least Squares Fitting	251
A.2	Common-Slope Multi-Line Least Squares Fitting	252
B	Proofs of chapter 8	255
C	Reflectance Transitions Covered by the \mathcal{C} Compatibility Relation	265
D	The Possibilistic C-means Algorithm (PCM)	267
D.1	General Formulation of PCM	267
D.2	Meaning and Importance of PCM Parameters	268
D.3	PCM as a Mode-Seeking Algorithm	268
 References		271
Index		283