

Markov Random Fields for Vision and Image Processing

edited by Andrew Blake, Pushmeet Kohli, and Carsten Rother

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Contents

- 1 **Introduction to Markov Random Fields** 1
Andrew Blake and Pushmeet Kohli
- I **Algorithms for Inference of MAP Estimates for MRFs** 29
- 2 **Basic Graph Cut Algorithms** 31
Yuri Boykov and Vladimir Kolmogorov
- 3 **Optimizing Multilabel MRFs Using Move-Making Algorithms** 51
Yuri Boykov, Olga Veksler, and Ramin Zabih
- 4 **Optimizing Multilabel MRFs with Convex and Truncated Convex Priors** 65
Hiroshi Ishikawa and Olga Veksler
- 5 **Loopy Belief Propagation, Mean Field Theory, and Bethe Approximations** 77
Alan Yuille
- 6 **Linear Programming and Variants of Belief Propagation** 95
Yair Weiss, Chen Yanover, and Talya Meltzer
- II **Applications of MRFs, Including Segmentation** 109
- 7 **Interactive Foreground Extraction: Using Graph Cut** 111
Carsten Rother, Vladimir Kolmogorov, Yuri Boykov, and Andrew Blake
- 8 **Continuous-Valued MRF for Image Segmentation** 127
Dheeraj Singaraju, Leo Grady, Ali Kemal Sinop, and René Vidal
- 9 **Bilayer Segmentation of Video** 143
Antonio Criminisi, Geoffrey Cross, Andrew Blake, and Vladimir Kolmogorov
- 10 **MRFs for Superresolution and Texture Synthesis** 155
William T. Freeman and Ce Liu

| | | |
|-----|---|-----|
| 11 | A Comparative Study of Energy Minimization Methods for MRFs | 167 |
| | Richard Szeliski, Ramin Zabih, Daniel Scharstein, Olga Veksler, Vladimir Kolmogorov, Aseem Agarwala, Marshall F. Tappen, and Carsten Rother | |
| III | Further Topics: Inference, Parameter Learning, and Continuous Models | 183 |
| 12 | Convex Relaxation Techniques for Segmentation, Stereo, and Multiview Reconstruction | 185 |
| | Daniel Cremers, Thomas Pock, Kalin Kolev, and Antonin Chambolle | |
| 13 | Learning Parameters in Continuous-Valued Markov Random Fields | 201 |
| | Marshall F. Tappen | |
| 14 | Message Passing with Continuous Latent Variables | 215 |
| | Michael Isard | |
| 15 | Learning Large-Margin Random Fields Using Graph Cuts | 233 |
| | Martin Szummer, Pushmeet Kohli, and Derek Hoiem | |
| 16 | Analyzing Convex Relaxations for MAP Estimation | 249 |
| | M. Pawan Kumar, Vladimir Kolmogorov, and Philip H. S. Torr | |
| 17 | MAP Inference by Fast Primal-Dual Linear Programming | 263 |
| | Nikos Komodakis | |
| 18 | Fusion-Move Optimization for MRFs with an Extensive Label Space | 281 |
| | Victor Lempitsky, Carsten Rother, Stefan Roth, and Andrew Blake | |
| IV | Higher-Order MRFs and Global Constraints | 295 |
| 19 | Field of Experts | 297 |
| | Stefan Roth and Michael J. Black | |
| 20 | Enforcing Label Consistency Using Higher-Order Potentials | 311 |
| | Pushmeet Kohli, Lubor Ladicky, and Philip H. S. Torr | |
| 21 | Exact Optimization for Markov Random Fields with Nonlocal Parameters | 329 |
| | Victor Lempitsky, Andrew Blake, and Carsten Rother | |
| 22 | Graph Cut-Based Image Segmentation with Connectivity Priors | 347 |
| | Sara Vicente, Vladimir Kolmogorov, and Carsten Rother | |
| V | Advanced Applications of MRFs | 363 |
| 23 | Symmetric Stereo Matching for Occlusion Handling | 365 |
| | Jian Sun, Yin Li, Sing Bing Kang, and Heung-Yeung Shum | |

| | | |
|-----------|---|------------|
| 24 | Steerable Random Fields for Image Restoration | 377 |
| | Stefan Roth and Michael J. Black | |
| 25 | Markov Random Fields for Object Detection | 389 |
| | John Winn and Jamie Shotton | |
| 26 | SIFT Flow: Dense Correspondence across Scenes and Its Applications | 405 |
| | Ce Liu, Jenny Yuen, Antonio Torralba, and William T. Freeman | |
| 27 | Unwrap Mosaics: A Model for Deformable Surfaces in Video | 419 |
| | Alex Rav-Acha, Pushmeet Kohli, Carsten Rother, and Andrew Fitzgibbon | |
| | Bibliography | 433 |
| | Contributors | 457 |
| | Index | 459 |