## Contents

| Preface   |   | xvii     |
|-----------|---|----------|
| Author    |   | xix      |
| Chapter 1 | Introduction  | 1        |
| 1.1       | Image Basics  | 2        |
|           | 1.1.1 Image Representation and Display                                | 2        |
|           | 1.1.2 Spatial Resolution and Amplitude Resolution                     | 5        |
|           | 1.1.3 Image Quality   | 7        |
| 1.0       | 1.1.4 Half-Tone and Dithering Technology                              | 11       |
| 1.2       | Image Technology  | 16       |
|           | 1.2.1 Image Engineering   | 16       |
|           | 1.2.2 Classification of Image Technology                              | 17       |
| 1 2       | 1.2.3 Image Processing System   | 18       |
| 1.5       | 1.2.1 Writing Mativation  | 19       |
|           | 1.3.1 Withing Motivation<br>1.3.2 Material Selection and Contents     | 19       |
|           | 1.3.2 Waterial Selection and Contents                                 | 20       |
| 1.4       | References  | 23       |
| Chantar ? | Imaga Da Naising  | 25       |
| Chapter 2 | Noise Types and Characteristics                                       | 23       |
| 2.1       | 2.1.1 Different Noises  | 20       |
|           | 2.1.1 Different Noises<br>2.1.2 Noise Characteristics and Description | 20       |
| 2.2       | Image Enhancement and De-Noising                                      | 32       |
| 2.2       | 2.2.1 Spatial Noise Filter  | 33       |
|           | 2.2.2 Frequency Domain Periodic Noise Filter                          | 41       |
| 2.3       | Selective Filter  | 45       |
| 2.4       | Switching Median Filter   | 48       |
|           | 2.4.1 The Principle of Switching Median Filter                        | 48       |
|           | 2.4.2 Switch-Based Adaptive Weighted Mean Filter                      | 52       |
|           | 2.4.3 Further Improvements  | 55       |
| 2.5       | Some Recent Developments and Further Researches                       | 58       |
|           | 2.5.1 Non-Switching Random Impulse Noise Cancellation                 | 58       |
|           | 2.5.2 De-Noise Feature Extraction                                     | 59       |
|           | 2.5.3 Strong Noisy Image De-Noising                                   | 60       |
| 26        | 2.5.4 Classify Noise Filtering Results in Seismic Images              | 61       |
| 2.0       | Kelerences  | 02       |
| Chapter 3 | Image De-Blurring   | 63       |
| 3.1       | Overview of Image De-Blurring   | 64       |
|           | 3.1.1 General Image Degradation Model                                 | 64       |
|           | 3.1.2 Blurring Degradation  | 66       |
| 2.2       | 3.1.3 Blur Kernel Estimation  | 68       |
| 3.2       | Image Restoration and De-Blurring                                     | 70       |
|           | 3.2.1 Inverse Filtering   | /1       |
|           | 3.2.2 when r Filtering  | 76       |
|           | 3.2.5 Consulation Least squares Restoration                           | /9<br>70 |
| 2 2       | 5.2.7 Inclacive Residential   | /9<br>01 |
| 5.5       | 3 3 1 Fast Blind Deconvolution  | 82<br>82 |
|           | 3.3.2 CNN-Based Method  | 86       |
| 34        | Low-Resolution Image De-Blurring                                      | 90       |
|           | 3.4.1 Network Structure   | 92       |

| 3.5       | <ul> <li>3.4.2 Loss Function Design and Effects</li> <li>3.4.3 Multi-Class Generative Adversarial Network</li> <li>Some Recent Developments and Further Researches</li> <li>3.5.1 Various De-Blurring Approaches</li> <li>3.5.2 Treating Blurred Images in Applications</li> </ul> | 94<br>97<br>99<br>100<br>104 |
|-----------|--|------------------------------|
| 3.6       | References   | 109                          |
| Chapter 4 | Image Repairing  | 111                          |
| 4.1       | Image Repairing Overview   | 112                          |
|           | 4.1.1 Discrimination and Analysis of Image Repairing<br>4.1.2 Principle of Image Repairing   | 112                          |
|           | 4.1.3 Image Inpainting for Small-Scale Repairing   | 117                          |
| 1.2       | 4.1.4 Image Completion for Large-Scale Repairing   | 120                          |
| 4.2       | Algorithms Combined with Sparse Representation   | 123                          |
|           | 4.2.2 Basic Sparse Representation Algorithm  | 125                          |
|           | 4.2.3 Improvements for Sparse Representation Algorithm   | 127                          |
| 4.3       | Weighted Sparse Non-Negative Matrix Factorization  | 131                          |
|           | 4.3.1 Weighted Non-Negative Matrix Factorization<br>4.3.2 Filling Algorithm  | 131                          |
|           | 4.3.3 WSNMF Based on EM process  | 132                          |
| 4.4       | Context-Driven Hybrid Approach   | 135                          |
|           | 4.4.1 Overall Flowchart  | 136                          |
|           | 4.4.2 Pre-Processing Step  | 137                          |
|           | 4.4.4 Diffusion-Based Repairing Step   | 138                          |
| 4.5       | Some Recent Developments and Further Researches  | 140                          |
|           | 4.5.1 Categorization of Repairing Methods  | 140                          |
| 4.6       | 4.5.2 AE and GAN in Image Repairing  | 141                          |
| 4.0       | Kelelences   | 144                          |
| Chapter 5 | Image De-Fogging   | 147                          |
| 5.1       | Summary of Image De-Fogging Approaches   | 149                          |
|           | 5.1.2 Methods Based on Image Restoration   | 149                          |
| 5.2       | Dark Channel Prior De-Fogging Algorithm  | 152                          |
|           | 5.2.1 Atmospheric Scattering Model   | 152                          |
|           | 5.2.2 Dark Channel Prior Model   | 154                          |
| 53        | Improvement Ideas and Techniques   | 155                          |
| 5.5       | 5.3.1 Determination of Global Atmospheric Light Region   | 156                          |
|           | 5.3.2 Global Atmospheric Light Value Correction  | 158                          |
|           | 5.3.3 Scale Adaptation   | 160                          |
|           | 5.3.4 Atmospheric Transmittance Estimation<br>5.3.5 Dense Foggy Image De-Fogging   | 163                          |
| 5.4       | Integrated Algorithm for Reducing Distortion   | 169                          |
|           | 5.4.1 Algorithm Flowchart  | 169                          |
|           | 5.4.2 <i>T</i> Space Conversion  | 170                          |
|           | 5.4.3 Atmospheric Scattering Map in Transmittance Space  | 171                          |
|           | 5.4.5 Contrast Enhancement   | 172                          |
| 5.5       | Evaluation of De-Fogging Effects   | 174                          |
|           | 5.5.1 Objective Evaluation Index   | 175                          |
| 5 (       | 5.5.2 Examples of Evaluations Combining Subjective and Objective Indices   | 179                          |
| 5.0       | Some Recent Developments and Further Researches  | 183                          |
|           | 5.6.2 More General Fog Removal Techniques  | 186                          |
| 5.7       | References   | 188                          |
|           |  |                              |

## Chapter 6 Image Reconstruction from Projection

193

| 6.1       | Projection Reconstruction Forms  | 194        |
|-----------|--|------------|
|           | 6.1.1 Transmission Tomography  | 195        |
|           | 6.1.2 Emission Tomography  | 196        |
|           | 6.1.3 Reflection Tomography  | 198        |
|           | 6.1.4 Electrical Impedance Tomography                                      | 200        |
| ( )       | 6.1.5 Magnetic Resonance Imaging   | 201        |
| 6.2       | Principles of Reconstruction from Projection                               | 202        |
|           | 6.2.1 Basic Model  | 202        |
| (2)       | 6.2.2 Radon Transform  | 203        |
| 0.3       | Inverse Fourier Transform Reconstruction                                   | 204        |
|           | 6.3.2 Fourier Transform Projection Theorem                                 | 204        |
|           | 6.3.2 Model Deconstruction   | 203        |
| 64        | Back-Projection Reconstruction   | 200        |
| 0.4       | 6.4.1 Principles of Back-Projection Reconstruction                         | 208        |
|           | 6.4.2 Convolutional Back-Projection Reconstruction                         | 200        |
|           | 6.4.3 Other Back-Projection Reconstruction Methods                         | 216        |
| 6.5       | Iterative Reconstruction   | 220        |
|           | 6.5.1 Iterative Reconstruction Model                                       | 220        |
|           | 6.5.2 Algebraic Reconstruction Technique                                   | 221        |
|           | 6.5.3 Maximum Likelihood-Maximum Expectation Reconstruction Algorithm      | 225        |
| 6.6       | Combined Reconstruction  | 228        |
| 6.7       | Some Recent Developments and Further Researches                            | 229        |
|           | 6.7.1 Metal Artifact Reduction   | 229        |
|           | 6.7.2 4-D Cone-Beam CT Reconstruction                                      | 234        |
| 6.8       | References   | 238        |
| Chapter 7 | Image Watermarking   | 241        |
| 7.1       | Overview of Watermarking   | 243        |
|           | 7.1.1 Embedding and Detection of Watermark                                 | 243        |
|           | 7.1.2 Watermark Characteristics  | 244        |
|           | 7.1.3 Watermark Classification   | 247        |
| 7.2       | Watermark Measurement Index  | 249        |
|           | 7.2.1 Saliency/Perception Measurement                                      | 250        |
|           | 7.2.2 Robustness Measurement   | 252        |
|           | 7.2.3 Security and Watermark Attack  | 253        |
| 7.3       | DCT Domain Watermarking  | 255        |
|           | 7.3.1 Features and Principles  | 255        |
|           | 7.3.2 Meaningless Watermarking Algorithm                                   | 256        |
| 7.4       | 7.3.3 Meaningful Watermarking Algorithm                                    | 260        |
| 7.4       | Dw I Domain watermarking   | 264        |
|           | 7.4.1 Features and Process<br>7.4.2 Human Viewal Characteristics           | 204        |
|           | 7.4.2 Human visual Characteristics<br>7.4.3 Wavelet Watermarking Algorithm | 203        |
| 75        | Some Recent Developments and Further Researches                            | 209        |
| 1.5       | 7.5.1. Zero-Watermarking   | 272        |
|           | 7.5.2 More Extensive Watermarking Technology                               | 272        |
| 7.6       | References   | 284        |
| Chantor 9 | Image Super Desolution   | 287        |
|           | Principle of Image Super-Resolution  | 201        |
| 0.1       | 8.1.1 Basic Model and Technology Classification                            | ∠00<br>288 |
|           | 8.1.2 Super-Resolution Restoration Rased on Single Image                   | 200        |
|           | 8.1.3 Super-Resolution Reconstruction Based on Multiple Images             | 292        |
| 8.2       | Super-resolution Technology Based on Learning                              | 297        |
| 0.2       | 8.2.1 Conventional Process   | 297        |
|           | 8.2.2 Example-Based Single-Frame Super-Resolution                          | 298        |
|           | 8.2.3 Example-Based Multi-Frame Super-Resolution                           | 302        |
|           | 8.2.4 Method Combined with Total Variation Regularization                  | 304        |
|           | 8.2.5 Learning-Based Method  | 305        |
|           |  |            |

| 8.3 | Super-resolution Reconstruction Based on Sparse Representation             | 306 |
|-----|--|-----|
|     | 8.3.1 Reconstruction Process   | 306 |
|     | 8.3.2 Sparse Coding  | 307 |
|     | 8.3.3 Dictionary Learning  | 308 |
|     | 8.3.4 Image Reconstruction   | 308 |
| 8.4 | Super-resolution Reconstruction Based on Locally Constrained Linear Coding | 309 |
|     | 8.4.1 Locally Constrained Linear Coding                                    | 309 |
|     | 8.4.2 Super-Resolution Reconstruction Algorithm Based on                   |     |
|     | Locally Constrained Linear Coding  | 310 |
|     | 8.4.3 Multi-Mrame Image Super-Resolution Reconstruction                    | 311 |
|     | 8.4.4 Reconstruction Results and Method Comparison                         | 312 |
| 8.5 | Some Recent Developments and Further Researches                            | 315 |
|     | 8.5.1 Overview of Super-Resolution Based on Deep Learning                  | 315 |
|     | 8.5.2 Loss Functions and Evaluation Indicators                             | 319 |
| 8.6 | References   | 322 |
|     |  |     |

## Index