# Advances in Computer Vision and Pattern Recognition

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## Advanced Topics in Computer Vision



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ISSN 2191-6586ISSN 2191-6594 (electronic)Advances in Computer Vision and Pattern RecognitionISBN 978-1-4471-5519-5ISBN 978-1-4471-5520-1 (eBook)DOI 10.1007/978-1-4471-5520-1Springer London Heidelberg New York Dordrecht

Library of Congress Control Number: 2013950636

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Printed on acid-free paper

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## Preface

Computer vision is the science and technology of making machines that see. It is concerned with the theory, design and implementation of algorithms that can automatically process visual data to recognize objects, track and recover their shape and spatial layout.

This edited volume contains a selection of articles covering both theoretical and practical aspects of the three main area in Computer Vision: Reconstruction, Registration, and Recognition. The book provides both, an in-depth overview of challenging areas, as well as novel advanced algorithms which exploit Machine Learning and Pattern Recognition techniques to infer the semantic content of images and videos. The topics covered by the chapters include visual feature extraction, feature matching, image registration, 3D reconstruction, object detection and recognition, human actions recognition, image segmentation, object tracking, metric learning, loopy belief propagation, etc. Each chapter contains key references to the existing literature.

The authors of the chapters have been selected among the best students who attended the International Computer Vision Summer School (ICVSS) in the last years, and are co-authored by world renowned researchers in Computer Vision. ICVSS was established in 2007 to provide both an objective and clear overview and an indepth analysis of the state-of-the-art research in Computer Vision. The courses are delivered by experts in the field, from both academia and industry, and cover both theoretical and practical aspects of real Computer Vision problems. The school is organized every year by University of Cambridge (Computer Vision and Robotics Group) and University of Catania (Image Processing Lab). Different topics are covered each year. A summary of the past Computer Vision Summer Schools can be found at: http://www.dmi.unict.it/icvss.

It is our hope that graduate students, young and senior researchers, and academic/industrial professionals will find the book useful for understanding and reviewing current approaches in Computer Vision, thereby continuing the mission of the International Computer Vision Summer School.

Sicily, Italy June 2013 Giovanni Maria Farinella Sebastiano Battiato Roberto Cipolla

## Acknowledgements

We would like to take this opportunity to thank all contributors of this book, and all people involved in the organization of ICVSS.

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Giovanni Maria Farinella obtained the Master degree in Computer Science (egregia cum laude) from University of Catania in 2004. He was awarded a Ph.D. degree (Computer Vision) in 2008. He became Associate Member of the Computer Vision and Robotics Research Group at University of Cambridge in 2006. He joined the Image Processing Laboratory (IPLAB) at the Department of Mathematics and Computer Science, University of Catania in 2008 as Contract Researcher. He is Contract Professor of Computer Vision at the School of Arts of Catania (since 2004) and Adjunct Professor of Computer Science at the University of Catania (since 2008). His research interests lie in the fields of Computer Vision, Pattern Recognition and Machine Learning. He has edited three volumes and co-authored more than 50 papers in international journals, conference proceedings and book chapters. He is a co-inventor of 3 international patents. Dr. Farinella also serves as a reviewer and on the programme committee for major international journals and international conferences. He has participated to several international and national research projects. Dr. Farinella founded (in 2006) and currently directs the International Computer Vision Summer School (www.dmi.unict.it/icvss).

#### Sebastiano Battiato

Sebastiano Battiato received his degree in computer science (summa cum laude) in 1995 from University of Catania and his Ph.D. in computer science and applied mathematics from University of Naples in 1999. From 1999 to 2003 he was the leader of the "Imaging" team at STMicroelectronics in Catania. He joined the Department of Mathematics and Computer Science at the University of Catania as assistant professor in 2004 and became associate professor in the same department in 2011. His research interests include image enhancement and processing, image coding, camera imaging technology and multimedia forensics. He has edited 4 books

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#### **Roberto Cipolla**

Roberto Cipolla obtained the B.A. degree (Engineering) from the University of Cambridge in 1984 and an M.S.E. (Electrical Engineering) from the University of Pennsylvania in 1985. From 1985 to 1988 he studied and worked in Japan at the Osaka University of Foreign Studies (Japanese Language) and Electrotechnical Laboratory. In 1991, he was awarded a D.Phil. (Computer Vision) from the University of Oxford and from 1991–1992 was a Toshiba Fellow and engineer at the Toshiba Corporation Research and Development Centre in Kawasaki, Japan. He joined the Department of Engineering, University of Cambridge in 1992 as a Lecturer and a Fellow of Jesus College. He became a Reader in Information Engineering in 1997 and a Professor in 2000. He is a Fellow at the Royal Academy of Engineering (since 2010); also a Professor of Computer Vision at the Royal Academy of Arts, London (since 2004) and Director of Toshiba's Cambridge Research Laboratory (since 2007). His research interests are in computer vision and robotics and include the recovery of motion and 3D shape of visible surfaces from image sequences; object detection and recognition; novel man-machine interfaces using hand, face and body gestures; real-time visual tracking for localization and robot guidance; applications of computer vision in mobile phones, visual inspection and image-retrieval and video search. He has authored 3 books, edited 8 volumes and co-authored more than 300 papers. Professor Cipolla founded (in 2006) and currently directs the International Computer Vision Summer School.

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