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# Scale Space and Variational Methods in Computer Vision

8th International Conference, SSVM 2021  
Virtual Event, May 16–20, 2021  
Proceedings

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# Preface

The International Conference on Scale Space and Variational Methods in Computer Vision (SSVM) series was born in 2007 in Ischia, from the fusion of the biannual Conference on Scale Space and the workshop on Variational, Geometric and Level Set Methods (VLSM). Since then, it has become a major event in the mathematical imaging community. Following the tradition of biannual events at beautiful, remote places, the 8th edition of this conference (SSVM 2021, <https://ssvm2021.sciencesconf.org/>) was initially planned to take place in the romantic city of Cabourg, on the Normandy coast in France. However, the conference was eventually held online due to the COVID-19 pandemic situation.

The conference provides a platform for state-of-the-art scientific exchange on topics related to computer vision and image analysis, including diverse themes such as 3D-vision, convex and non-convex variational modeling, image analysis, inverse problems in imaging, optimization methods in imaging, machine learning in imaging, PDEs in image processing, registration, restoration and reconstruction, scale-space methods, and segmentation. The 45 contributions (15 selected for oral presentation and 30 for poster presentation) in this proceedings demonstrate a strong and lively community. The contributions underwent a rigorous peer-review process similar to that of a high-ranking journal in the field.

Following the tradition of previous SSVM conferences, four outstanding researchers were invited to give a keynote presentation: Daniel Cremers (TU Munich, Germany), Julie Delon (Université Paris Descartes, France), Carola-Bibiane Schönlieb (University of Cambridge, UK) and Jean-Luc Starck (CEA, France).

We would like to thank all those who contributed to the success of this conference. We are grateful to the authors for their contributions. We are indebted to the reviewers for their commitment, hard work and enthusiasm that made this event possible at the highest scientific standards. We thank the CNRS and NORMASTIC for financial support. Lastly, we thank the steering committee and the organizers of all the previous SSVM conferences.

April 2021

Abderrahim Elmoataz  
Jalal Fadili  
Yvain Quéau  
Julien Rabin  
Loïc Simon

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Julie Delon

Professor at MAP5, Université Paris Descartes, France

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