

# IEEE Signal Processing MAGAZINE

Volume 33 | Number 5 | September 2016

## COMPUTATIONAL PHOTOGRAPHY AND DISPLAYS

Interfacing  
with the  
Visual World

Recent Advances  
in Phase Retrieval

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The MPEG Internet  
Video-Coding Standard

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Highlights from the IEEE SP Cup  
2016 Student Competition

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## ON THE COVER

*IEEE Signal Processing Magazine* is uniquely positioned to convey and embrace an evolving scope of signal processing. This issue showcases an example of a cross-disciplinary area—fascinating advances of computational photography and display. A variety of articles showcase the potential for the field to revolutionize imaging and displays and transform the way in which we capture, share, and interact with the visual world around us.

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ICIP 2016 will be held in Phoenix, Arizona, United States, 25–28 September, at the Phoenix Convention Center.

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