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Vishal M. Patel • Rama Chellappa

Sparse Representations and Compressive Sensing for Imaging and Vision

Vishal M. Patel
Center for Automation Research
University of Maryland
A.V. Williams Building
College Park, MD

Rama Chellappa
Department of Electrical and Computer
Engineering and Center for
Automation Research
A.V. Williams Building
University of Maryland
College Park, MD

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To my sisters Julie, Dharti and Gunjali
— Vishal M. Patel

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