

IEEE Signal Processing MAGAZINE

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NONCONVEX OPTIMIZATION

For Signal Processing and
Machine Learning

Worth a Look: Three New Imaging Technologies

A Green ICASSP 2020 in Virtual Barcelona

Closed-Form Output Response of Discrete-Time
Linear Time-Invariant Systems Using Intermediate
Auxiliary Functions

IEEE
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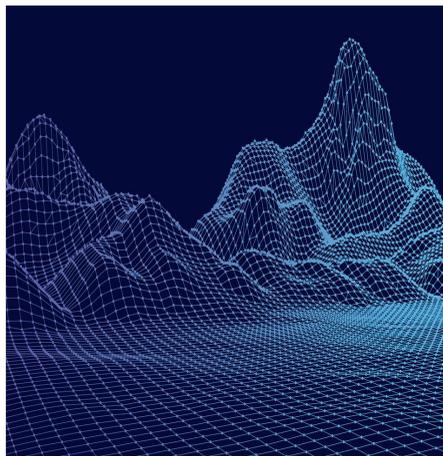
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ON THE COVER

This special issue introduces the essential elements of nonconvex optimization to the broader signal processing and machine learning communities, provides insights into how structures of the nonconvex formulations of various practical problems can be exploited in algorithm design, showcases some notable successes in this line of study, and identifies important research issues that are motivated by existing or emerging applications.

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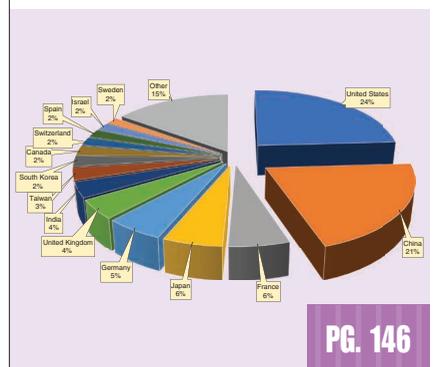
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The IEEE Spoken Language Technology Workshop will take place in Shenzhen, China, 19–22 January 2021.



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