

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
Signal
Processing
Society



Contents

Volume 37 | Number 5 | September 2020

SPECIAL SECTION

NONCONVEX OPTIMIZATION FOR SIGNAL PROCESSING AND MACHINE LEARNING

15 FROM THE GUEST EDITORS

Anthony Man-Cho So,
Prateek Jain, Wing-Kin Ma,
and Gesualdo Scutari

18 UNDERSTANDING NOTIONS OF STATIONARITY IN NONSMOOTH OPTIMIZATION

Jiajin Li, Anthony Man-Cho So,
and Wing-Kin Ma

32 ADAPTIVE STOCHASTIC OPTIMIZATION

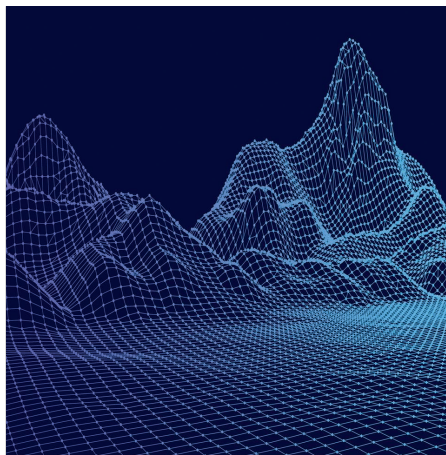
Frank E. Curtis and
Katya Scheinberg

43 A PRIMER ON ZERO-TH-ORDER OPTIMIZATION IN SIGNAL PROCESSING AND MACHINE LEARNING

Sijia Liu, Pin-Yu Chen,
Bhavya Kaikhura, Gaoyuan Zhang,
Alfred O. Hero III,
and Pramod K. Varshney



PG. 11



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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55 NONCONVEX MIN-MAX OPTIMIZATION

Meisam Razaviyayn, Tianjian Huang,
Songtao Lu, Maher Nouiehed,
Maziar Sanjabi, and Mingyi Hong

67 NONCONVEX STRUCTURED PHASE RETRIEVAL

Namrata Vaswani

78 COMPUTING LARGE-SCALE MATRIX AND TENSOR DECOMPOSITION WITH STRUCTURED FACTORS

Xiao Fu, Nico Vervliet, Lieven De
Lathauwer, Kejun Huang,
and Nicolas Gillis

95 THE GLOBAL LANDSCAPE OF NEURAL NETWORKS

Ruoyu Sun, Dawei Li, Shiyu Liang,
Tian Ding, and Rayadurgam Srikant

109 GEOMETRY, MANIFOLDS, AND NONCONVEX OPTIMIZATION

Jonathan H. Manton

120 SUBMODULARITY IN ACTION

Ehsan Tohidi, Rouhollah Amiri,
Mario Coutino, David Gesbert,
Geert Leus, and Amin Karbasi

COLUMNS

6 Society News

New Society Officers, Editors-in-Chief
Elected for 2020

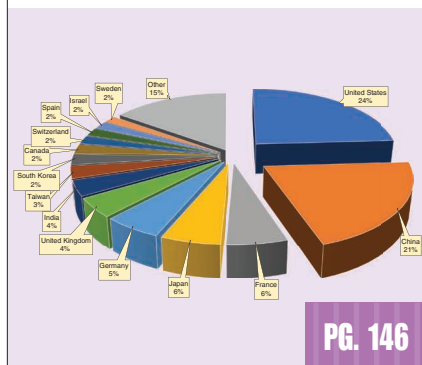
Election of Regional Directors-at-Large
and Members-at-Large
Ali H. Sayed

8 Reader's Choice

Top Downloads in IEEE *Xplore*

11 Special Reports

Three New Imaging Technologies
That Are Worth a Look
John Edwards



PG. 146

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134 Lecture Notes

Two Applications of Deep Learning in the Physical Layer of Communication Systems
Emil Björnson and Pontus Giselsson

Closed-Form Output Response of Discrete-Time Linear Time-Invariant Systems Using Intermediate Auxiliary Functions
Chun-Lin Liu and Soo-Chang Pei

146 Conference Highlights

A Green ICASSP 2020 in Virtual Barcelona
Ana Perez-Neira and Xavier Mestre

152 SP Competitions

Unsupervised Anomaly Detection Using Intelligent and Heterogeneous Autonomous Systems
Damian Campo, David Martin, and Lucio Marcenaro

Let There Be a Beam
Wei Liu, Mohammad Reza Anbiyaei, Xue Jiang, Lei Zhang, and Lucio Marcenaro

DEPARTMENTS

3 From the Editor

Reflections on Tutorials and Surveys
Robert W. Heath Jr.

5 President's Message

That This Nation, Under God, Shall Have a New Birth of Freedom
Ahmed Tewfik

163 Dates Ahead



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