

IEEE Signal Processing MAGAZINE

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HIGH-IMPACT INNOVATIONS

Powered by Signal Processing

Geometric Deep Learning

Adaptive Importance Sampling

Image Aesthetic Assessment

Beat Detection Meets
Embedded System at the SP Cup

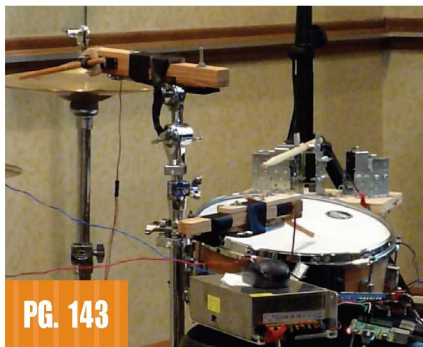
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This issue of *IEEE Signal Processing Magazine* showcases high-impact innovations in signal processing as well as recent advances and activities through editorials, feature articles, and a diverse set of columns.

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