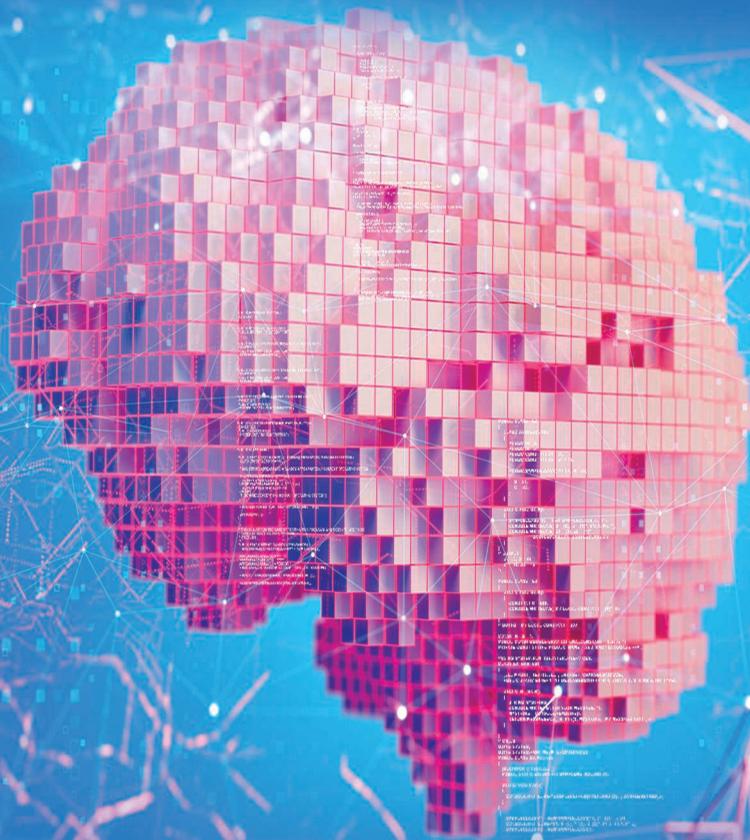


# IEEE Signal Processing MAGAZINE

Volume 36 | Number 6 | November 2019



## BRAIN-INSPIRED COMPUTING

Algorithmic, Hardware, and Neuroscience Perspectives

Speech Processing for Digital Home Assistants

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Medicine on the Move: Wearable Devices

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Monitoring Active Volcanoes

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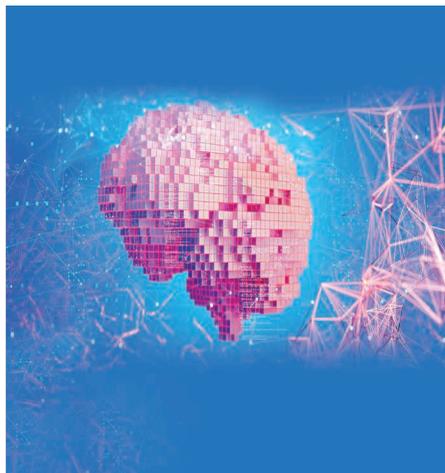
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The IEEE International Conference on Image Processing will be held 25–28 October 2020 in Abu Dhabi, United Arab Emirates.



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