December 2020 / VOL. 108 / NO. 12

# CONTENTS

#### SPECIAL ISSUE

#### APPROXIMATE COMPUTING: FROM CIRCUITS TO APPLICATIONS

Edited by W. Liu, F. Lombardi, and M. Schulte

## **2108** Approximate Arithmetic Circuits: A Survey, Characterization, and Recent Applications

By H. Jiang, F. J. H. Santiago, H. Mo, L. Liu, and J. Han

**INVITED PAPER**| This article provides a comprehensive evaluation of recently proposed approximate arithmetic circuits mainly including adders, multipliers, and dividers; they are compared under different design constraints and applied to image processing and deep learning applications.

#### 2136 Elementary Functions and Approximate Computing

By J.-M. Muller

**|INVITED PAPER|** This article presents classical approaches of approximate elementary functions with the mainstream techniques of shift-and-add algorithms, polynomial or rational approximations, table-based methods, and bit manipulation.

### **2150** Circuit-Level Techniques for Logic and Memory Blocks in Approximate Computing Systems

By S. Amanollahi, M. Kamal, A. Afzali-Kusha, and M. Pedram

**INVITED PAPER** | This article reviews the circuit-level techniques for both approximate logic and memory blocks.

## **2178** A Survey of Testing Techniques for Approximate Integrated Circuits

By M. Traiola, A. Virazel, P. Girard, M. Barbareschi, and A. Bosio

 $|\mathsf{INVITED}\ \mathsf{PAPER}|$  This article examines the test procedure of approximate integrated circuits by identifying the main approximation-aware testing phases.

#### 2195 Approximate Logic Synthesis: A Survey

*By I. Scarabottolo, G. Ansaloni, G. A. Constantinides, L. Pozzi, and S. Reda* |INVITED PAPER| This article reviews the transformation methods for functional approximation, which can achieve an approximate Boolean function from its exact designs.

## **2214** Security in Approximate Computing and Approximate Computing for Security: Challenges and Opportunities By W. Liu, C. Gu, M. O'Neill, G. Qu, P. Montuschi, and F. Lombardi

**INVITED PAPER**| This article focuses on an emerging area that links security and approximate computing.

#### D E P A R T M E N T S

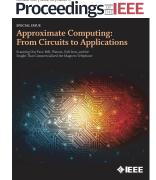
#### **2103** SCANNING THE ISSUE

Approximate Computing: From Circuits to Applications By W. Liu, F. Lombardi, and M. Schulte

#### 2311 SCANNING OUR PAST

Bell, Watson, Soft Iron, and the Insight That Commercialized the Magneto Telephone *By R. O. Meyer* 

2321 FUTURE SPECIAL ISSUE/SPECIAL SECTIONS



On the Cover: This month's cover image draws attention to printed circuit boards where approximate computing techniques are increasingly applied to achieve high performance and energy efficiency.

[Continued on page 2102 ▶]

## CONTENTS

SPECIAL ISSUE: Approximate Computing: From Circuits to Applications

#### 2232 Efficient Al System Design With Cross-Layer Approximate Computing

By S. Venkataramani, X. Sun, N. Wang, C.-Y. Chen, J. Choi, M. Kang, A. Agarwal, J. Oh, S. Jain, T. Babinsky, N. Cao, T. Fox, B. Fleischer, G. Gristede, M. Guillorn, H. Haynie, H. Inoue, K. Ishizaki, M. Klaiber, S.-H. Lo, G. Maier, S. Mueller, M. Scheuermann, E. Ogawa, M. Schaal, M. Serrano, J. Silberman, C. Vezyrtzis, W. Wang, F. Yee, J. Zhang, M. Ziegler, C. Zhou, M. Ohara, P.-F. Lu, B. Curran, S. Shukla, V. Srinivasan, L. Chang, and K. Gopalakrishnan

**|INVITED PAPER**| This article presents IBM's RAPID, which is a multi-TOPs DNN hardware accelerator core fabricated using 14-nm technology.

#### 2251 Deep In-Memory Architectures in SRAM: An Analog Approach to Approximate Computing

By M. Kang, S. K. Gonugondla, and N. R. Shanbhag

**|INVITED PAPER**| This article provides an overview of the recently proposed deep in-memory architectures (DIMAs) with several approximate prototype chips using 65-nm technology for hardware acceleration of machine learning algorithms.

#### 2276 Resistive Crossbars as Approximate Hardware Building Blocks for Machine Learning: Opportunities and Challenges By I. Chakraborty, M. Ali, A. Ankit, S. Jain, S. Roy, S. Sridharan, A. Agrawal,

A. Raghunathan, and K. Roy

**|INVITED PAPER|** This article presents a comprehensive overview of the emerging paradigm of approximate computing using NVM crossbars for accelerating machine learning workloads.

## Proceedings

## On the Web

#### proceedingsoftheieee.ieee.org

Find the following information on our website.

About the Proceedings Recent and Upcoming Issues Featured and Popular Articles Instructions for Guest Editors and Authors Editorial Leadership Webinar Series Subscription Information



#### www.ieee.org

#### MEMBERSHIP

Check out the many features available through the IEEE Membership Portal.

#### PUBLICATIONS

Find IEEE articles by using the search features of IEEE Xplore

#### SERVICES

The IEEE offers many services to Members, as well as other groups.

#### STANDARDS

The IEEE is the leader in the development of many industry standards.

#### CONFERENCES

Search for the ideal IEEE Conference, on the subject of your choice

#### CAREERS/JOBS

Find your next job through this IEEE service.