# Siva Satyendra **Sahoo**, PhD

# EDA & Al/ML, System-level Design, Computer Architecture, Research and Innovation

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#### Ø Heverlee, Belgium

Senior Researcher at Interuniversity Microelectronics Centre (IMEC), Leuven, Belgium, working in the field of System Technology Co-optimization. Has more than 7 years of experience in Electronic System Design and Electronic Design Automation.

Expertise spans hardware/software co-design, embedded machine learning, system-level design, computer architecture, fault-tolerant computing, approximate computing, and digital VLSI. Thanks to his interdisciplinary background, has a successful record of accomplishments in both industry and academia.

In his current role at IMEC, he is working on integrating novel semiconductor technology innovations into the estimation of system-level performance metrics and planning of projects that enable the design of next-generation systems building on future semiconductor technologies.

Prior to joining IMEC, was working on the efficient modeling of state-of-the-art AI inference engines. The modeling was primarily for functional validation and early-stage architectural exploration.

Prior to joining SAIT, was working on the design of low-cost accelerators for AI/ML applications with the Chair for Processor Design at Technische Universität Dresden, Germany. Worked on the applications primarily targeted for embedded and cyber-physical systems. The design involved leveraging approximation and quantization techniques and innovations in system-, architecture- and IP-level for FPGA-based systems. Responsibilities in the research group also involved the supervision of research interns and master's students and the teaching of course modules offered by the group.

Holds a Ph.D. in Electrical and Computer Engineering from the National University of Singapore, Singapore, and has nearly 30 peer-reviewed scientific publications as well as some articles submitted for peer review.

He has lived in four countries and speaks English, Odia, and Hindi. Colleagues describe him as analytical, creative, and amicable.

### **Research Experience**

**Senior Researcher**, System Technology Co-optimization (STCO), Interuniversity 2023–present Microelectronics Centre (IMEC), Leuven, Belgium

Individual contributor to the exploration of technology-aware architecture design for executing workloads at varying scales of computation. Collaborator in the enablement of various 2.5D/3D technologies for system-level design and optimization.

**Senior Staff Engineer**, AI Computing, Samsung Advanced Institute of Technology (SAIT), 2021–2022 Samsung, Bangalore, India

Individual contributor to the modeling and design space exploration (DSE) of AI computing architectures. Collaborator in the analysis and optimization of mapping AI workloads on modern inference engines.

Post-doctoral Researcher, Chair for Processor Design, TU Dresden, Dresden, Germany2019–2021Subject matter expert and collaborator for various research projects involving Electronic System-level (ESL) de-<br/>sign, AI/ML for Electronic Design Automation (EDA) and embedded machine learning design (see Projects be-<br/>low). Co-instructor for Embedded Hardware System Design course. Supervisor (and co-supervisor) for research<br/>interns.

Ph.D Scholar, Department of ECE, National University of Singapore, Singapore	2015-2019
Research Scholar for projects that focused on optimizing the distribution of reliability method	ds across multi-
ple layers of the system stack with appropriate scheduling of tasks on heterogeneous embedd	ed systems (see
Projects below). Expertise on using multiple optimization methods for multi-objective design specific design s	pace exploration
(DSE) including AI/ML techniques. Graduate/Teaching Assistant for multiple courses related to	o electronic sys-
tem design.	
Digital Design Engineer. Intel India. Bangalore. India	2012-2014

**Digital Design Engineer**, Intel India, Bangalore, India 2012–2014 Worked in the domain of *Physical Design* of dense VLSI System-on-chip. Was primarily responsible for design quality assessment of full-chip as well as design blocks.

Guest Researcher, Chair for Processor Design, TU Dresden, Germany	2017
Assistant Systems Engineer, Tata Consultancy Services, Hyderabad	2008-2010

Page 1 / 5

# **Projects**

Technology-driven and workload-aware on-chip memory architecture design, STCO, IMEC 2023-present The project involves exploring the impact of semiconductor technology innovations on system-level design while also providing feasible directions for future technological innovations. One of the aspects being explored actively pertains to the investigation into the impact of provisioning **high-capacity on-chip memory**, using **novel** devices/3D integration/heterogeneous integration, for a variety of emerging workload scenarios.

#### AI/ML-driven approximate computer arithmetic design, TU Dresden

2022-present The project involves using emerging AI/ML methods such as generative AI, supersampling, etc. to improve the efficacy of traditional algorithms-based DSE for the synthesis of novel approximate arithmetic operator circuits.

Modelling of modern Al compute engines, Al Computing, SAIT, Samsung 2021-2022 The project involved modeling state-of-the-art Al inference engines for functional validation and early-stage architecture exploration.

#### Application-specific Approximate Computing for FPGA-based Embedded Systems, Chair 2020-2021 for Processor Design, TU Dresden

The project involves designing **application-specific** approximate computing for FPGA-based embedded systems. The project explores the possibility of using AI/ML in the design space exploration of **cross-layer ap**proximation that can leverage an application's implicit error tolerance to provide low-cost accelerator designs.

Accelerator Design for Reinforcement Learning, Chair for Processor Design, TU Dresden 2020-2021 The project involves designing low-cost FPGA-based accelerators for implementing Reinforcement Learning(RL)based control. The research aspects of the project include the design and implementation of novel techniques at multiple levels – algorithm, micro-architecture, and arithmetic operators. The project focuses on accelerating **Q-Learning** in the initial stage and delves into more complex Deep RL algorithms in the later stages.

As the **primary researcher** for the project, Satyendra has been contributing to: the survey of state-of-the-art, design, and implementation of novel techniques, determining the testing and characterization of the accelerator IPs, and the technical documentation. Satyendra has also been involved in the hiring and supervision of research interns for the project.

#### Embedded Machine Learning Design, Chair for Processor Design, TU Dresden 2019-2021

The project involves the design of low-power inference engines for embedded systems. Primarily, the research focuses on an application-specific design and efficient utilization of quantization, precision-scaling, and approximate arithmetic operators.

As a collaborator, Satvendra has contributed to the EDA aspects of the project. This includes application-specific DSE and characterization of the resulting designs. Satyendra has contributed to the related multi-objective optimization using evolutionary computing and Bayesian optimization.

#### 2015-2019 Cross-laver Reliability-aware Embedded System Design, Dep. ECE, NUS Singapore

As part of his doctoral thesis, Satyendra contributed to: a survey of state-of-the-art, defining the scope of research, design, and implementation of novel DSE approaches to cross-layer optimization along with the documentation of the research results. The project focused primarily on system-level design and resulted in novel contributions to modeling and analysis for reliability-aware HW/SW co-design, HW/HW partitioning, and Dynamic adaptation to varying operating conditions for embedded applications executing on heterogeneous hardware platforms.

<b>Hardware Accelerator for Training of Support Vector Machine</b> , Department of Electronic Systems Engineering, IISc Bangalore	2011-2012
Awards/Grants	

<ul> <li>HiPEAC Collaboration Grants, HiPEAC4 Network of Excellence</li> <li>NUS Graduate Scholarship, National University of Singapore, Singapore.</li> <li>MHRD (GATE) Scholarship, Government of India, India</li> <li>CET Merit Scholarship, CET, Bhubaneswar, India.</li> </ul>	Jan 2017 2015 - 2018 2010 - 2012 2004 - 2008
Education	
<b>Doctor of Philosophy (Ph.D.)</b> , Dep. of Electrical and Computer Engineering, National University of Singapore, Singapore	2019
Master of Technology (M.Tech.), Dep. of Electronic Systems Engineering, Indian Institute of Science Bangalore India	2012
<b>Bachelor of Technology (B.Tech.)</b> , Dep. of Instrumentation and Electronics Engineering, College of Engineering and Technology, Bhubaneswar, India	2008

### **Select publications**

- [ACM TECS '23] <u>S. S. Sahoo</u>, S. Ullah, & A. Kumar. 2022. AxOTreeS: A Tree Search Approach to Synthesizing FPGA-based Approximate Operators. ACM Trans. Embed. Comput. Syst. (Just Accepted 2023).
- [ASP-DAC '23] R. Ranjan, S. Ullah, <u>S. S. Sahoo</u> and A. Kumar, *SyFAxO-GeN: Synthesizing FPGA-based Approximate Operators with Generative Networks*, 2023 28th Asia and South Pacific Design Automation Conference (ASP-DAC '23), Tokyo, Japan, 2023, pp. 402-409.
- [ACM TECS '22] S. Ullah, S. Sahoo, N. Ahmed, D. Chaudhury, & A. Kumar. AppAxO: Designing Application-specific Approximate Operators for FPGA-based Embedded Systems, in ACM Trans. Embed. Comput. Syst. 21, 3, Article 29 (May 2022), 31 pages. https://doi.org/10.1145/3513262.
  - [GLSVLSI'21] <u>S. S. Sahoo</u>, A. R. Baranwal, S. Ullah & A. Kumar, *MemOReL: A Memory-oriented Optimization Approach to Reinforcement Learning on FPGA-based Embedded Systems*, in Proceedings of the 2021 on Great Lakes Symposium on VLSI (GLSVLSI 2021), 339-346.
    - [DATE '20] Rai, S., Raitza, M., Sahoo, S. S., & Kumar, A. (2020). DISCERN: Distilling Standard Cells for Emerging Reconfigurable Nanotechnologies. In 2020 Design, Automation & Test in Europe Conference & Exhibition, DATE 2020, Virtual Conference and Exhibition, April 21- May 31, 2020.
- [IEEE TCAD '20] A. R. Baranwal, S. Ullah, S. S. Sahoo & A. Kumar, ReLAccS: A Multi-level Approach to Accelerator Design for Reinforcement Learning on FPGA-based Systems, in IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems, doi: 10.1109/TCAD.2020.3028350.
  - [DAC '19] Sahoo, S. S., Veeravalli, B., & Kumar, A. (2019). A Hybrid Agent-based Design Methodology for Dynamic Cross-layer Reliability in Heterogeneous Embedded Systems. In Proceedings of the 56th Annual Design Automation Conference. DAC '19. Las Vegas, NV, USA.
- [ASP-DAC '18] Sahoo, S. S., Nguyen, T. D. A., Veeravalli, B., & Kumar, A. (2018). Lifetime-aware design methodology for dynamic partially reconfigurable systems. In 23rd Asia and South Pacific Design Automation Conference, ASP-DAC 2018, Jeju, Korea (South), January 22-25, 2018(pp. 393–398).

## **Skills**

Design Skills: Hardware IP (RTL and HLS), Physical Design, EDA Tool Design Design Languages: VHDL, SystemC, Verilog Programming Languages: C, C++, Python, MATLAB, Tcl Al/ML Frameworks: Tensorflow, PyTorch, OpenAl Gym EDA Tools: Xilinx Vitis & Vivado, Synopsys Design Compiler

### Languages

**English** : Full professional proficiency **Odia**: Native proficiency **Hindi**: Limited working proficiency

# **Personal interests**

Cricket, Badminton, Tennis, Traveling, Food, Beer, Movies, Music, Trekking

## **Publications**

Around <u>30 publications</u> in peer-reviewed conference proceedings and journals.

# References

Akash Kumar, Professor, Technische Universitåt Dresden, Dresden, Germany. Bharadwaj Veeravalli, Associate Professor, National University of Singapore, Singapore. Kuruvilla Varghese, Principal Research Scientist, Indian Institute of Science, Bangalore, India.

# List of all publications:

#### Journals:

- [J9] <u>S. S. Sahoo</u>, S. Ullah, & A. Kumar. 2023. *AxOTreeS: A Tree Search Approach to Synthesizing FPGA-based Approximate Operators*. **ACM Trans. Embed. Comput. Syst.** (Just Accepted 2023).
- [J8] Y. Zhao, S. Ullah, <u>S. S. Sahoo</u>, & A. Kumar. 2023. *NvMISC: Towards an FPGA-based Emulation Platform for RISC-V and Non-volatile Memories.* Embedded System Letters (Just Accepted 2023).
- [J7] S. Ullah, S. S. Sahoo, N. Ahmed, D. Chaudhury, & A. Kumar. AppAxO: Designing Application-specific Approximate Operators for FPGA-based Embedded Systems, in ACM Trans. Embed. Comput. Syst. 21, 3, Article 29 (May 2022), 31 pages. https://doi.org/10.1145/3513262.
- [J6] B. Ranjbar, A. Hosseinghorban, <u>S. S. Sahoo</u>, A. Ejlali & A. Kumar. *BOT-MICS: Bounding Time Using Analytics in Mixed-Criticality Systems*, in IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems, doi: 10.1109/TCAD.2021.3127867.
- [J5] <u>S. S. Sahoo</u>, Ranjbar, B., & Kumar, A, *Reliability-aware Resource Management in Multi-/Many-core Systems:* A Perspective Paper, in MDPI Journal of Low Power Electronics and Applications, 2021.
- [J4] Nambi, S., Ullah, S., Lohana, A., <u>S. S. Sahoo</u>, Merchant, F., & Kumar, A, *ExPAN(N)D: Exploring Posits for Efficient Artificial Neural Network Design in FPGA-based Edge Processing*. in IEEE Access, vol. 9, pp. 103691-103708, 2021, doi: 10.1109/ACCESS.2021.3098730.
- [J3] A. R. Baranwal, S. Ullah, <u>S. S. Sahoo</u> & A. Kumar, ReLAccS: A Multi-level Approach to Accelerator Design for Reinforcement Learning on FPGA-based Systems, in IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems, doi: 10.1109/TCAD.2020.3028350.
- [J2] S. Ullah, H. Schmidl, <u>S. S. Sahoo</u>, S. Rehman & A. Kumar, *Area-optimized Accurate and Approximate Softcore Signed Multiplier Architectures*, in IEEE Transactions on Computers, doi: 10.1109/TC.2020.2988404.
- [J1] <u>Sahoo, S. S.</u>, Nguyen, T. D. A., Veeravalli, B., & Kumar, A, *Multi-objective design space exploration for system partitioning of FPGA-based Dynamic Partially Reconfigurable Systems*, In Integration, the VLSI Journal, Elsevier, November 2018.

#### **Conference Proceedings**

- [C18] S. Ullah, S. S. Sahoo, and A. Kumar. 2023. CoOAx: Correlation-aware Synthesis of FPGA-based Approximate Operators. In Proceedings of the Great Lakes Symposium on VLSI 2023 (GLSVLSI '23). Association for Computing Machinery, New York, NY, USA, 671–677. https://doi.org/10.1145/3583781.3590222
- [C17] R. Ranjan, S. Ullah, <u>S. S. Sahoo</u> and A. Kumar, *SyFAxO-GeN: Synthesizing FPGA-based Approximate Operators with Generative Networks*, 2023 28th Asia and South Pacific Design Automation Conference (ASP-DAC '23), Tokyo, Japan, 2023, pp. 402-409.
- [C16] A. Immaneni, S. Ullah, S. Nambi, <u>S. S. Sahoo</u> and A. Kumar, *PosAx-O: Exploring Operator-level Approxima*tions for Posit Arithmetic in Embedded AI/ML," in 2022 25th Euromicro Conference on Digital System Design (Euromicro DSD '22), Maspalomas, Spain, 2022 pp. 214-223. doi: 10.1109/DSD57027.2022.00037
- [C15] S. S. Sahoo, A. Kumar, M. Decky, S. C. B. Wong, G. V. Merrett, Y. Zhao, Jiachen Wang, X. Wang & A. K. Singh, *Emergent design challenges for embedded systems and paths forward: mixed-criticality, energy, reliability and security perspectives*, in Proceedings of the 2021 International Conference on Hardware/Software Codesign and System Synthesis (CODESS, ESWeek 2021). Association for Computing Machinery, New York, NY, USA, 1–10. DOI:https://doi.org/10.1145/3478684.3479246
- [C14] S. S. Sahoo & A. Kumar, Using Monte Carlo Tree Search for EDA A Case-study with Designing Cross-layer Reliability for Heterogeneous Embedded Systems, in 2021 IFIP/IEEE 29th International Conference on Very Large Scale Integration (VLSI-SoC 2021), 2021, pp. 1-6, doi: 10.1109/VLSI-SoC53125.2021.9606987.
- [C13] <u>S. S. Sahoo</u> & A. Kumar, *CLEO-CoDe: Exploiting Constrained Decoding for Cross-Layer Energy Optimization in Heterogeneous Embedded Systems*, in 2021 IFIP/IEEE 29th International Conference on Very Large Scale Integration (VLSI-SoC 2021), 2021, pp. 1-6, doi: 10.1109/VLSI-SoC53125.2021.9606983.

- [C12] S. S. Sahoo, A. R. Baranwal, S. Ullah & A. Kumar, MemOReL: A Memory-oriented Optimization Approach to Reinforcement Learning on FPGA-based Embedded Systems, in Proceedings of the 2021 on Great Lakes Symposium on VLSI (GLSVLSI 2021), 339-346.
- [C11] S. Ullah, <u>S. S. Sahoo</u> and A. Kumar, *CLAppED: A Design Framework for Implementing Cross-Layer Approximation in FPGA-based Embedded Systems*, 2021 58th ACM/IEEE Design Automation Conference (DAC '21), San Francisco, CA, USA, 2021, pp. 475-480, doi: 10.1109/DAC18074.2021.9586260..
- [C10] Ranjbar, B., Hoseinghorban, A., <u>Sahoo, S. S.</u>, Ejlali, A. & Kumar, A. (2020). *Improving the Timing Behaviour of Mixed-Criticality Systems Using Chebyshev's Theorem*. In Design, Automation & Test in Europe Conference & Exhibition, DATE 2021, Virtual Conference and Exhibition, February 01-05, 2021.
- [C9] S. S. Sahoo, B. Veeravalli and A. Kumar, Markov Chain-based Modeling and Analysis of Checkpointing with Rollback Recovery for Efficient DSE in Soft Real-time Systems. (2020) IEEE International Symposium on Defect and Fault Tolerance in VLSI and Nanotechnology Systems (DFT 2020), Frascati, Italy, 2020, pp. 1-6, doi: 10.1109/DFT50435.2020.9250892.
- [C8] <u>Sahoo, S. S.</u>, Veeravalli, B., & Kumar, A. (2020). CL(R)Early: An Early-stage DSE Methodology for Cross-Layer Reliability-aware Heterogeneous Embedded Systems. In Proceedings of the 57th Annual Design Automation Conference. DAC '20. A Virtual Experience.
- [C7] Rai, S., Raitza, M., Sahoo, S. S., & Kumar, A. (2020). DISCERN: Distilling Standard Cells for Emerging Reconfigurable Nanotechnologies. In 2020 Design, Automation & Test in Europe Conference & Exhibition, DATE 2020, Virtual Conference and Exhibition, April 21- May 31, 2020.
- [C6] <u>Sahoo, S. S.</u>, Veeravalli, B., & Kumar, A. (2019). A Hybrid Agent-based Design Methodology for Dynamic Cross-layer Reliability in Heterogeneous Embedded Systems. In Proceedings of the 56th Annual Design Automation Conference. DAC '19. Las Vegas, NV, USA.
- [C5] Sahoo, S. S., Nguyen, T. D. A., Veeravalli, B., & Kumar, A. (2018). QoS-aware Cross-layer Reliability-integrated FPGA-based Dynamic Partially Reconfigurable System Partitioning. In International Conference on Field-Programmable Technology, ICFPT 2018, Naha, Okinawa, Japan, December 10-14, 2018.
- [C4] <u>Sahoo, S. S.</u>, Nguyen, T. D. A., Veeravalli, B., & Kumar, A. (2018). *Lifetime-aware design methodology for dynamic partially reconfigurable systems*. In 23rd Asia and South Pacific Design Automation Conference, ASP-DAC 2018, Jeju, Korea (South), January 22-25, 2018(pp. 393–398).
- [C3] Sahoo, S. S., Veeravalli, B., & Kumar, A. (2018). CLRFrame: An analysis framework for designing cross-layer reliability in embedded systems. In 31st International Conference on VLSI Design and 17th International Conference on Embedded Systems, VLSID 2018, Pune, India, January 6-10, 2018 (pp. 307–312).
- [C2] Sahoo, S. S., Kumar, A., & Veeravalli, B. (2016). Design and evaluation of reliability-oriented task re-mapping in MPSoCs using time-series analysis of intermittent faults. In 2016 Design, Automation & Test in Europe Conference & Exhibition, DATE 2016, Dresden, Germany, March 14-18, 2016 (pp. 798–803).
- [C1] Sahoo, S. S., Veeravalli, B., & Kumar, A. (2016). Cross-layer fault-tolerant design of real-time systems. In 2016 IEEE International Symposium on Defect and Fault Tolerance in VLSI and Nanotechnology Systems, DFT 2016, Storrs, CT, USA, September 19-20, 2016 (pp. 63–68).

#### **Book Chapters**

- [Ch3] S. Ullah, <u>S. S. Sahoo</u>, & A. Kumar, *Efficient Hardware Arithmetic for Embedded Machine Learning*, in **Embedded Machine Learning for Cyber-Physical**, **IoT**, **and Edge Computing**, **Springer 2022**. *To appear*.
- [Ch2] Ranjbar, B., Sahoo, S. S., Singh, A., Dziurzanski, P., & Kumar, A., *Power management of Multicore systems*, in Handbook of Computer Architecture, Springer 2022. *To appear*.
- [Ch1] Sahoo, S. S., & Kumar, A., Fault-tolerant Computer Architectures, in Handbook of Computer Architecture, Springer 2022. To appear.