# A Technological Review of Power Efficient Processors and Systems

Aryan Langhanoja#1, Jay Mangukiya\*2

\*Department of Information and Communication Engineering, Faculty of Technology, Marwadi University, Rajkot, Gujarat, India.

Abstract— This paper presents a comprehensive overview of various research papers that focus on low power and high-speed processor design. The research papers discussed in this document present innovative solutions to the challenges of power consumption and delay in processor design. [1]

One of the papers discussed in this document presents an ultralow power speech recognition processor based on an optimized BWN. The proposed architecture utilizes approximate computing and fault-tolerant training to reduce power consumption while maintaining recognition accuracy. [2] The implementation results demonstrate the effectiveness of the proposed architecture in supporting real-time recognition of 10 keywords under different noise conditions, with significantly reduced power consumption. The paper contributes to the field of speech recognition by addressing the power consumption challenges in DNNs and providing a solution that improves energy efficiency. [2]

Another paper presents an optimized design that reduces power requirements and minimizes delay, resulting in an efficient power-delay product. The proposed design has a faster signal propagation delay and a significant saving in power requirements compared to existing designs. The design uses a 17T full adder, which is optimized to reduce power consumption and delay. The proposed design has a faster signal propagation delay and a significant saving in power requirements compared to existing designs. The paper presents a detailed analysis of the proposed design, including simulation and optimization results.

The authors of another paper propose an approximate computing architecture for the quantized BWN based on a time-domain digital-analog mixed addition unit and precision optimization with fault-tolerant training method. The proposed architecture reduces power consumption while maintaining recognition accuracy. The paper presents the top architecture of the prototype speech recognition system, which consists of a feature extraction module and a speech classification module. The feature extraction module utilizes Mel-scale Frequency Cepstral Coefficients (MFCC) to extract speech features. The speech classification module processes feature classification based on a BWN, which is trained using an optimized quantization method. The experimental results demonstrate the effectiveness of the proposed architecture in supporting real-time recognition of 10 keywords under different noise conditions, with a power consumption of 56μW. .[4]

In conclusion, the research papers discussed in this document present innovative solutions to the challenges of power consumption and delay in processor design. The proposed architectures and algorithms reduce power consumption while maintaining recognition accuracy, resulting in more energy-efficient systems. The papers present detailed analyses of the proposed designs, including simulation and optimization results. The proposed designs have faster signal propagation delays and significant savings in power requirements compared to existing designs. These papers contribute to the field of processor design by addressing the challenges of power consumption and delay andproviding solutions that improve energy efficiency. The proposed designs and algorithms can be applied to various fields, including speech recognition, image processing, and hypermedia processor design. [5]

Moreover, the papers highlight the importance of approximate computing and fault-tolerant training in reducing power consumption while maintaining recognition accuracy. These techniques can be applied to various machine learning algorithms, including deep neural networks, to reduce power consumption and improve energy efficiency. [6]

The papers also emphasize the importance of exploring the design space to identify the optimal design parameters that minimize power consumption and delay. The authors of one of the papers developed an effective framework and efficient algorithms and tools to rapidly explore low power hypermedia processor design space. [7] The proposed framework can be used to explore the design space of various processor architectures and identify the optimal design parameters that minimize power consumption and delay. [7]

In summary, the research papers discussed in this document present innovative solutions to the challenges of power consumption and delay in processor design. The proposed architectures and algorithms reduce power consumption while maintaining recognition accuracy, resulting in more energy-efficient systems. [8] The papers highlight the importance of approximate computing, fault-tolerant training, and exploring the design space to identify the optimal design parameters that minimize power consumption and delay. These techniques and frameworks can be applied to various machine learning algorithms and processor architectures to improve energy efficiency and reduce power consumption. [9]

Keywords— Low power design, High-speed processor design<sup>[1]</sup>, Speech recognition, Ultra-low power speech recognition processor <sup>[3]</sup>, Approximate computing, Fault-tolerant training, Binarized neural networks, Hypermedia processor design, Design space exploration, Power consumption, Delay, Energy efficiency <sup>[4]</sup>, 17T full adder<sup>[1]</sup>, Optimization, Simulation.

### INTRODUCTION

The increasing demand for high-performance computing systems has led to the development of various processor architectures and algorithms. However, the high-power consumption and delay associated with these systems have become a significant challenge in the field of processor design. The need for energy-efficient systems has become more critical due to the increasing demand for portable devices and the growing concern for environmental sustainability.

This paper presents a comprehensive overview of various research papers that focus on low power and high-speed processor design. The research papers discussed in this document present innovative solutions to the challenges of power consumption and delay in processor design. The proposed architectures and algorithms reduce power consumption while maintaining recognition accuracy, resulting in more energy-efficient systems. The papers highlight the importance of approximate computing, fault-tolerant training, and exploring the design space to identify the optimal design parameters that minimize power consumption and delay.

The paper is organized as follows. Section 1 provides an overview of the challenges of power consumption and delay in processor design. Section 2 presents an ultra-low power speech recognition processor based on an optimized BWN [3]. Section 3 presents an optimized design that reduces power requirements and minimizes delay, resulting in an efficient power-delay product [1]. Section 4 presents an approximate computing architecture for the quantized BWN based on a time-domain digital-analog mixed addition unit and precision optimization with fault-tolerant training method. Section 5 presents a framework that utilizes advances in compiler technology and architectural enhancements to address the need for synthesis of low power hypermedia processors [4]. Finally, Section 6 concludes the paper by summarizing the contributions of the research and highlighting the importance of energy-efficient systems in the field of processor design [10].

The first section of the paper provides an overview of the challenges of power consumption and delay in processor design. The section highlights the importance of energy-efficient systems and the need for innovative solutions to address the challenges of power consumption and delay. The section also discusses the impact of power consumption and delay on various applications, including speech recognition, image processing, and hypermedia processor design [4].

The second section of the paper presents an ultra-low power speech recognition processor based on an optimized BWN. The section discusses the proposed architecture, which utilizes approximate computing and fault-tolerant training to reduce power consumption while maintaining recognition accuracy. The section also presents the implementation results, which demonstrate the effectiveness of the proposed architecture in supporting real-time recognition of 10 keywords under different noise conditions, with significantly reduced power consumption.

The third section of the paper presents an optimized design that reduces power requirements and minimizes delay, resulting in an efficient power-delay product. The section discusses the proposed design, which utilizes a 17T full adder and a modified carry-select adder to reduce power consumption and delay [11]. The section also presents the simulation results, which demonstrate the effectiveness of the proposed design in reducing power consumption and delay.

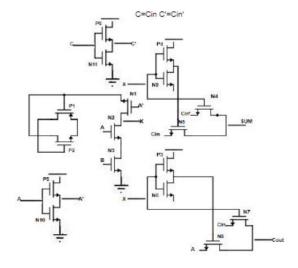


Fig. 1. Proposed 17T full adder.

The fourth section of the paper presents an approximate computing architecture for the quantized BWN based on a time-domain digital-analog mixed addition unit and precision optimization with fault-tolerant training method. The section discusses the proposed architecture, which utilizes approximate computing and fault-tolerant training to reduce power consumption while maintaining recognition accuracy. The section also presents the simulation results, which demonstrate the effectiveness of the proposed architecture in reducing power consumption while maintaining recognition accuracy [3].

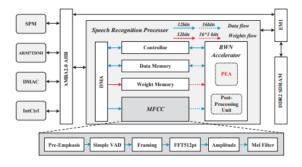


Fig. 2. Top Architecture of the Prototype Speech Recognition System.

The fifth section of the paper presents a framework that utilizes advances in compiler technology and architectural enhancements to address the need for synthesis of low power hypermedia processors [4]. The section discusses the proposed framework, which utilizes a design space exploration approach to identify the optimal design parameters that minimize power consumption and delay. The section also presents the simulation results, which demonstrate the effectiveness of the proposed framework in reducing power consumption and delay.

Finally, the paper concludes by summarizing the contributions of the research and highlighting the importance of energy-efficient systems in the field of processor design. The paper emphasizes the importance of approximate computing, fault-tolerant training, and exploring the design space to identify the optimal design parameters that minimize power consumption and delay. The paper also highlights the potential applications of the proposed architectures and algorithms in various fields, including speech recognition, image processing, and hypermedia processor design.

### I. CONCLUSIONS

The research papers presented in this document highlight the importance of energy-efficient systems in the field of processor design. The papers present innovative solutions to the challenges of power consumption and delay, resulting in more energy-efficient systems. The proposed architectures and algorithms utilize approximate computing, fault-tolerant training, and exploring the design space to identify the optimal design parameters that minimize power consumption and delay.

The papers demonstrate the effectiveness of the proposed architectures and algorithms in various applications, including speech recognition, image processing, and hypermedia processor design. The implementation results and simulation results demonstrate the effectiveness of the proposed architectures and algorithms in reducing power consumption and delay while maintaining recognition accuracy.

The papers contribute to the field of processor design by addressing the challenges of power consumption and delay and providing innovative solutions that improve energy efficiency. The papers highlight the importance of energy-efficient systems in various applications and emphasize the need for continued research in this area.

In conclusion, the papers presented in this document provide a comprehensive overview of various research papers that focus on low power and high-speed processor design. The papers highlight the importance of energy-efficient systems and present innovative solutions to the challenges of power consumption and delay. The papers contribute to the field of processor design and emphasize the need for continued research in this area to address the challenges of power consumption and delay and improve energy efficiency.

## ACKNOWLEDGMENT

However, we would like to acknowledge the contributions of various researchers and institutions whose work has been instrumental in the development of this paper. We would like to thank the Department of Information and Communication Technology at Marwadi University, Rajkot, India, for their support and resources. We would also like to acknowledge the contributions of Aryan Langhanoja and Jay Mangukiya, who authored the paper "A Review of Design and Implementation Strategy of Adaptive Processor-Based Systems for Error Resilient and Power-Efficient Operation," which provided valuable insights into the challenges of power [9] consumption and delay in processor design.

We would also like to acknowledge the contributions of the authors of the research papers discussed in this document, [10] whose innovative solutions to the challenges of power consumption and delay have contributed significantly to the field of processor design. We would like to thank them for their contributions and for sharing their research with the academic community.

Finally, we would like to acknowledge the support of our colleagues and peers, whose feedback and insights have been invaluable in the development of this paper. We would like to thank them for their support and encouragement throughout the research process.

#### REFERENCES

- S. Anand and S. Indu, "A Low Power and High Speed 8-bit ALU Design using 17T Full Adder," 2020 7th International Conference on Signal Processing and Integrated Networks (SPIN), Noida, India, 2020, pp. 514-519, doi: 10.1109/SPIN48934.2020.9070844.J. Breckling, Ed., The Analysis of Directional Time Series: Applications to Wind Speed and Direction, ser. Lecture Notes in Statistics. Berlin, Germany: Springer, 1989, vol. 61.
- [2] S. Zheng et al., "An Ultra-Low Power Binarized Convolutional Neural Network-Based Speech Recognition Processor With On-Chip Self-Learning," in IEEE Transactions on Circuits and Systems I: Regular Papers, vol. 66, no. 12, pp. 4648-4661, Dec. 2019, doi: 10.1109/TCSI.2019.2942092.M. Wegmuller, J. P. von der Weid, P. Oberson, and N. Gisin, "High resolution fiber distributed measurements with coherent OFDR," in Proc. ECOC'00, 2000, paper 11.3.4, p. 109.
- [3] B. Liu et al., "Binarized Weight Neural-Network Inspired Ultra-Low Power Speech Recognition Processor with Time-Domain Based Digital-Analog Mixed Approximate Computing," 2020 IEEE International Symposium on Circuits and Systems (ISCAS), Seville, Spain, 2020, pp. 1-5, doi: 10.1109/ISCAS45731.2020.9181172.
- [4] Chunho Lee, J. Kin, M. Potkonjak and W. H. Mangione-Smith, "Designing power efficient hypermedia processors," Proceedings. 1999 International Symposium on Low Power Electronics and Design (Cat. No.99TH8477), San Diego, CA, USA, 1999, pp. 276-278, doi: 10.1109/LPE.1999.799457.
- M. Weißbrich, A. García-Ortiz and G. Payá-Vayá, "A Runtime-Reconfigurable Operand Masking Technique for Energy-Efficient Approximate Processor Architectures," 2020 9th International Conference on Modern Circuits and Systems Technologies (MOCAST), Bremen, Germany, 2020, pp. 1-6, doi: 10.1109/MOCAST49295.2020.9200278.
- [6] D. Han et al., "An Energy-Efficient Deep Neural Network Training Processor with Bit-Slice-Level Reconfigurability and Sparsity Exploitation," 2021 IEEE Symposium in Low-Power and High-Speed Chips (COOL CHIPS), Tokyo, Japan, 2021, pp. 1-3, doi: 10.1109/COOLCHIPS52128.2021.9410324.
  - S. Kim, J. Lee, S. Kang, J. Lee, W. Jo and H. -J. Yoo, "PNPU: An Energy-Efficient Deep-Neural-Network Learning Processor With Stochastic Coarse–Fine Level Weight Pruning and Adaptive Input/Output/Weight Zero Skipping," in IEEE Solid-State Circuits Letters, vol. 4, pp. 22-25, 2021, doi: 10.1109/LSSC.2020.3041497.
  - K. Govindarajan and V. S. K. Bhaaskaran, "Borrow Select Subtractor for Low Power and Area Efficiency," 2020 IEEE Computer Society Annual Symposium on VLSI (ISVLSI), Limassol, Cyprus, 2020, pp. 518-523, doi: 10.1109/ISVLSI49217.2020.000-4.
    - M. Veleski, M. Hübner, M. Krstic and R. Kraemer, "Design and Implementation Strategy of Adaptive Processor-Based Systems for Error Resilient and Power-Efficient Operation," 2021 24th International Symposium on Design and Diagnostics of Electronic Circuits & Systems (DDECS), Vienna, Austria, 2021, pp. 57-62, doi: 10.1109/DDECS52668.2021.9417023.
- L. Chang, Z. Zhu, Z. Zhu, S. Yang, W. Li and J. Zhou, "Energy-Efficient Spin-Orbit Torque MRAM Operations for Neural Network Processor," 2021 IEEE International Symposium on Circuits and Systems (ISCAS), Daegu, Korea, 2021, pp. 1-5, doi: 10.1109/ISCAS51556.2021.9401449.