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## **Approximate Computing**

Approximate Computing: A survey
 An eDRAM-based Approximate Register File for GPUs

Mitigating the Memory Bottleneck with Approximate Load Value Prediction
 Quality Control for Approximate Accelerators by Error Prediction
 Exploring the Precision Limitation for RRAM-Based Analog Approximate Computing











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