

## Abstract

In the era of Internet of things, billions of embedded devices need to be powered with battery and tolerate the inconvenience come with recharging and replacing the battery. Energy harvesting is appealing to embedded systems especially in sensing since while the performance of embedded systems is improving every year, the battery development is lagging. However, the energy harvested from environment is usually weak and intermittent. With traditional CMOS based technology, whenever the power is off, the computation has to start from the very beginning. If we can save the intermediate computation and resume it when the power comes back, we can compute larger tasks with intermittent power. Compared with existing CMOS based memory devices such as SRAM which stores the data with charges, emerging Non-volatile memory devices such as PCM and STT-RAM, have the benefits of sustaining the data even when there is no power. These new devices bring promising opportunities to the computing paradigm since they have extremely low leakage power and better scaling than CMOS technology. With Non-volatile computing, we can turn off the processor and resume from where was left. In this way, we can either turn off processor on purpose to save energy or passively survive unstable power. This research focuses on achieving non-volatile computing for modern embedded systems.

## Background

**Emerging Non-volatile memory devices bring promising opportunities to the computing paradigm.**

**Energy Harvesting System Architecture**

**Energy harvesting is a promising alternative to batteries.**

Energy harvesting has several advantages over batteries in the era of IOT:  
 1) Free of rechargeable concerns.  
 2) Environmentally friendly.  
 3) Pervasively available.

**Energy Harvesting Technologies**

**Volatile vs Non-Volatile in Energy Harvesting**

**Non-volatile Computing**

## Non-Volatile Processor

### Stack Size Aware Checkpointing

Stack is a dynamic data structure, which increases and decreases along the program execution. Main idea: instead of saving everything at the moment the interrupt signal is received, we can let the processor continue the execution to a point where the stack size is smaller. Then do the checkpointing.

**Step1: Figuring Out Feasible Backup Positions**

Problem description: When an energy warning occurs, decide where to conduct backup.

**Step2: Determining The Backup Position**

Common: {0, 2}, 0 or 2? **MinCom**: choose the one with the smallest stack size

$stackSize(0) = \max \{ stackSize(0 \text{ in path } 1), stackSize(0 \text{ in path } 2), stackSize(0 \text{ in path } 3), stackSize(0 \text{ in path } 4) \};$   
 $stackSize(2) = \max \{ stackSize(2 \text{ in path } 1), stackSize(2 \text{ in path } 2), stackSize(2 \text{ in path } 3), stackSize(2 \text{ in path } 4) \};$

### Data Inconsistency Avoidance

Inconsistency may happen inside a basic block and across different blocks.

In order to reduce the overhead, energy-efficient checkpointing mechanism is proposed by setting two thresholds for voltage level: T1 and T2.

**Error locating**

**Trigger Point Insertion**

Measure Voltage  $V_c$  of Capacitor

- Continue execution without checkpointing
- Checkpoint and continue execution.
- Stall execution and checkpoint when energy is enough.

**Checkpointing Processor States**

**The benefits are twofold. First, we are making more progress. Second, we are saving less data and increase successful rate.**

**Eliminate all the errors with 6.3% more checkpoints**

## Future Work

**Ubiquitous Smart Low-Power Computing is Not Far Away.**

Heterogeneous Integration

Software: Applications, Compiler, OS, CAD, Runtime, Processor, Memory, I/O & Storage, FPGA, Accelerators, Circuits, Devices: Skyrmion, RRAM, STT-RAM, PCM, Flash

Hardware: **Medical Application: EEG Monitoring**

Challenges of True Wireless Longitude EEG Monitoring for Progressive Neurological Disease:  
 1. Power  
 2. Communication

Answers:  
 1. Energy Harvesting  
 2. Anomaly Detection/Storage

**More applications...**

Infrastructure Monitoring, HVAC Monitoring, Pipeline Monitoring, Cattle Monitoring

**NVM is Transforming Computing Paradigm**

Brain-Inspired Computing: pattern recognition, brain simulation, artificial intelligence, big data mining, Deep Learning CNN Implementations, Deep Learning CMOS/ReRAM Computing, computer vision

IoT-Driven Computing: Internet-of-things, mobile computing, mobile health network, smart wearables, smart dust

High-Bandwidth Dot-Product Engine, In/Near-Memory Computing, Non-Volatile Computing, Approximate Computing

ENABLING CIRCUITS AND ARCHITECTURES: Memory Modeling, Multi-Level Memory Cells, Read-Write Circuitry

EMERGING MEMORY DEVICES: 3D NAND, PCRAM, STT-MRAM, ReRAM