



# **Relyzer: Application Resiliency Analyzer for Transient Faults**

**Siva Kumar Sastry Hari, Illinois**

**Helia Naeimi, Intel Labs**

**Pradeep Ramachandran, Illinois**

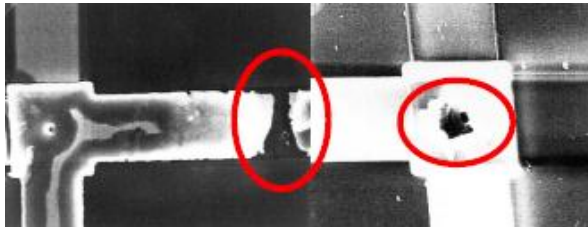
**Sarita Adve, Illinois**

**[swat@cs.uiuc.edu](mailto:swat@cs.uiuc.edu), [helia.naeimi@intel.com](mailto:helia.naeimi@intel.com)**

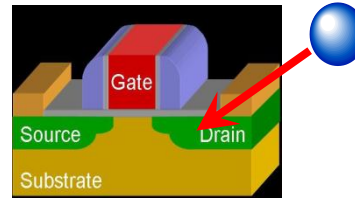


# Motivation

- **Reliability** is a major challenge
- Shipped hardware is likely to fail in the field



Wear-out Failures



Transient Errors



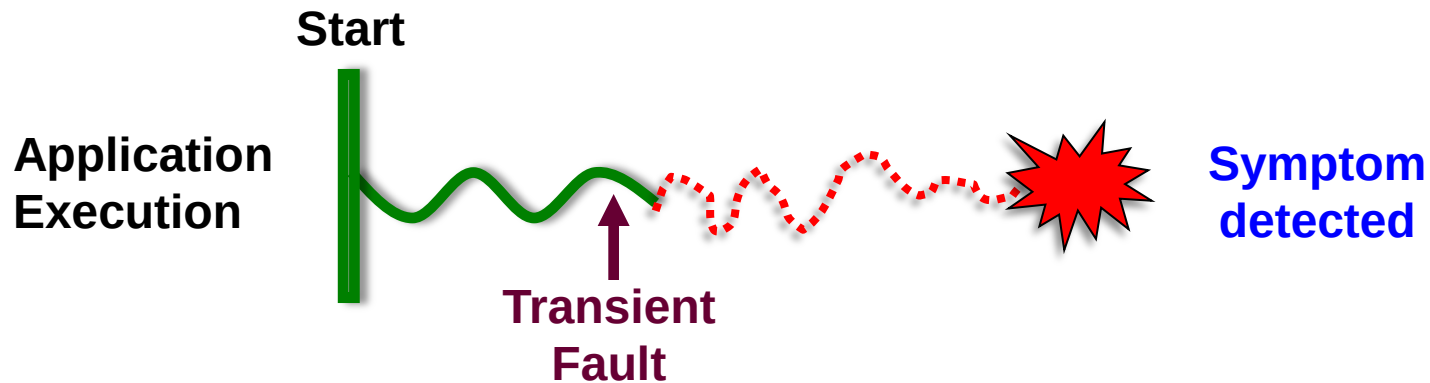
Design Bugs

...

- **Reliability problem pervasive across many markets**
  - Traditional redundancy solutions (e.g., nMR) expensive
- **Need in-field low-cost detection, diagnosis, and repair**

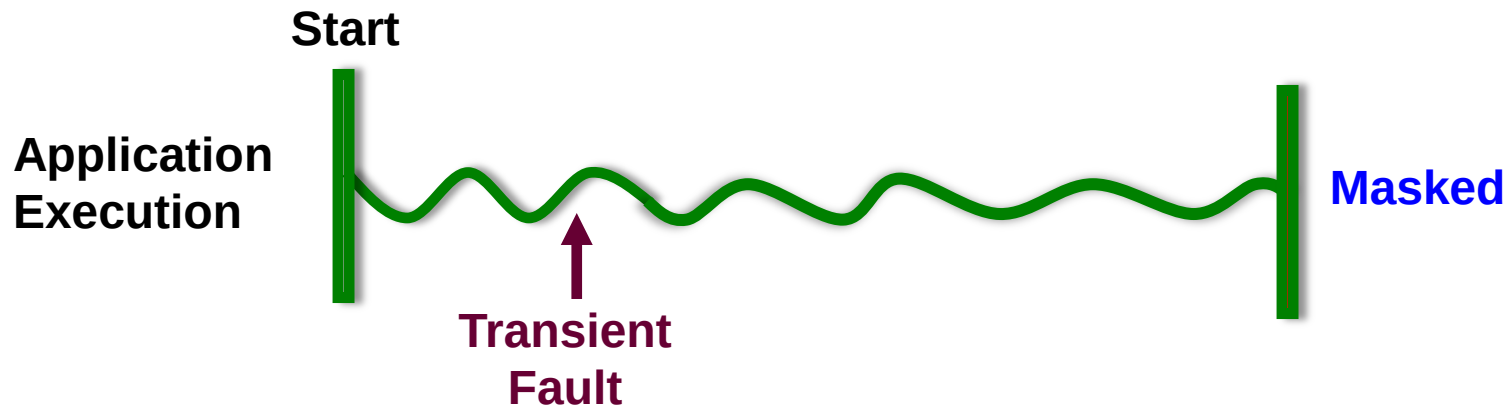
# Software-level Resiliency

- **Software-level anomaly detectors** are low-cost & effective
  - Detect faults by monitoring software misbehavior
- Evaluating resiliency solutions through fault injections



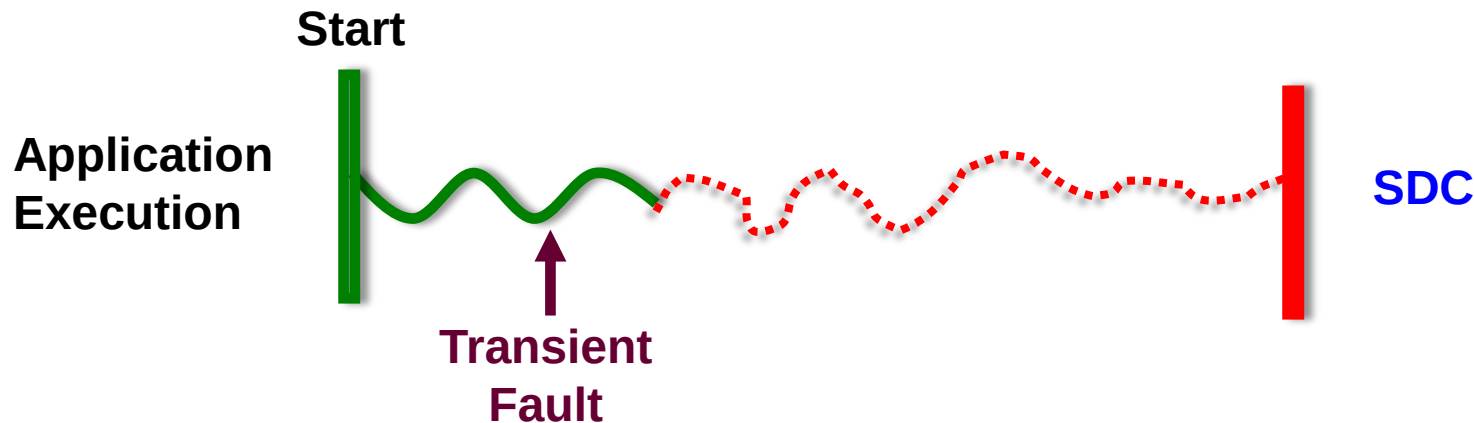
# Software-level Resiliency

- **Software-level anomaly detectors** are low-cost & effective
  - Detect faults by monitoring software misbehavior
- Evaluating resiliency solutions through fault injections



# Software-level Resiliency

- **Software-level anomaly detectors** are low-cost & effective
  - Detect faults by monitoring software misbehavior
- Evaluating resiliency solutions through fault injections



- **Each application has 100s of billions of fault sites**
- Performing fault injections on all is impossible
- Statistical approach: study 10s of thousands of faults
  - Cannot provide guarantees

# Challenges

- **Goal: Analyzing all transient faults affecting an application**
  - Provide guarantees to the detection mechanisms
- Do we need fault injections for all the faults?
- Can we reduce the # of faults that require detailed analysis?
- How to analyze all faults with fewer fault injections?

# Contributions

- **Prune faults with predictable outcomes**
  - Outcome: Detected, Masked, or SDC
  - Such faults do not need fault injections
- **Prune equivalent faults**
  - Faults that behave similarly
- **Only faults with unknown outcomes need fault injections**
  - Developed pruning techniques to ensure they are small
  - Validating pruning techniques is ongoing work
- **Analyze few faults to estimate behavior of all**

# Outline

- Motivation
- **Fault Model**
- **Pruning Techniques**
- **Results**
- **Conclusion and Future Work**

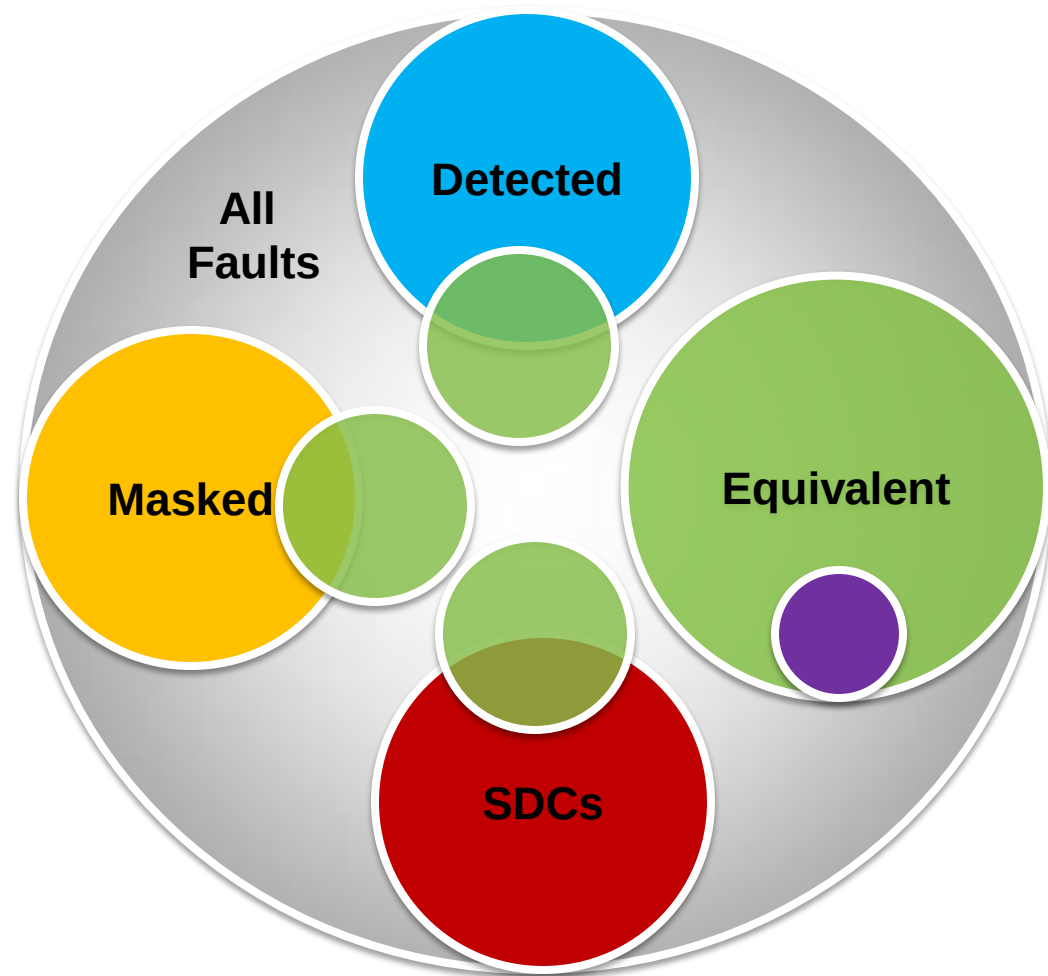


# Fault Model

- **Transient faults**
  - **Single bit flips**
- **Faults in ISA-visible instruction-level states**
- **Example:**
  - **Instruction: opcode rd, rs1, rs2**
    - **One bit faults in rd, rs1, and rs2**
  - **Instructions: opcode [addr+imm], rd**
    - **One bit faults in rd, addr, imm, (addr)[addr+imm], (value)[addr+imm]**

# Relyzer Overview

- List all faults
- Prune predictable faults
- Prune equivalent faults

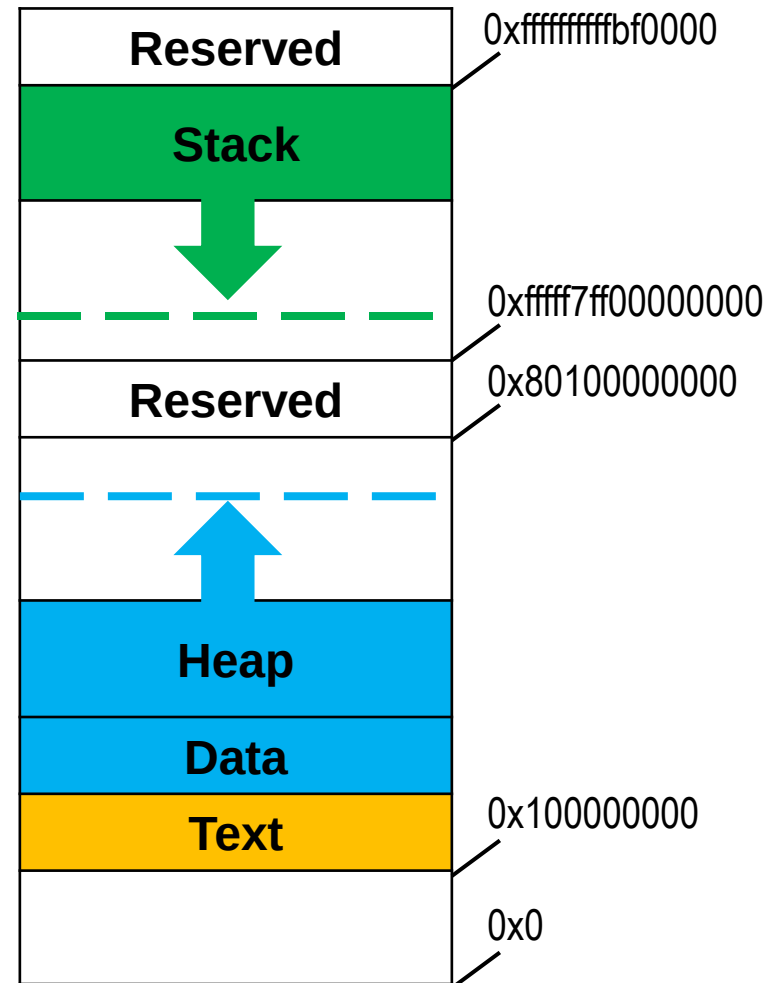


$$\text{Remaining Faults} = \text{All Faults} - \text{Detected} - \text{Masked} - \text{SDCs} - \text{Equivalent} + \text{Equivalent Faults}$$

# Pruning Predictable Faults

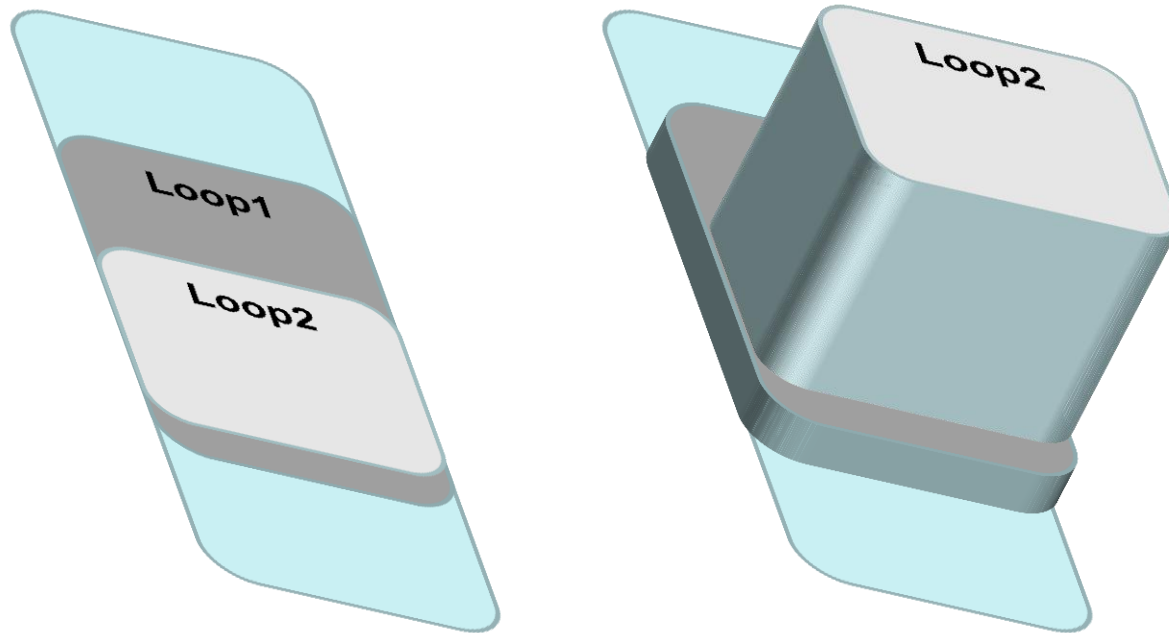
- Watch for out of bounds accesses
  - SWAT detects such accesses
- Prune out of bounds accesses
  - Memory addresses ( ■ & ■ )
  - Branch targets ( ■ )
- Boundaries obtained by profiling

SPARC Address Space Layout



# Pruning Equivalent Faults

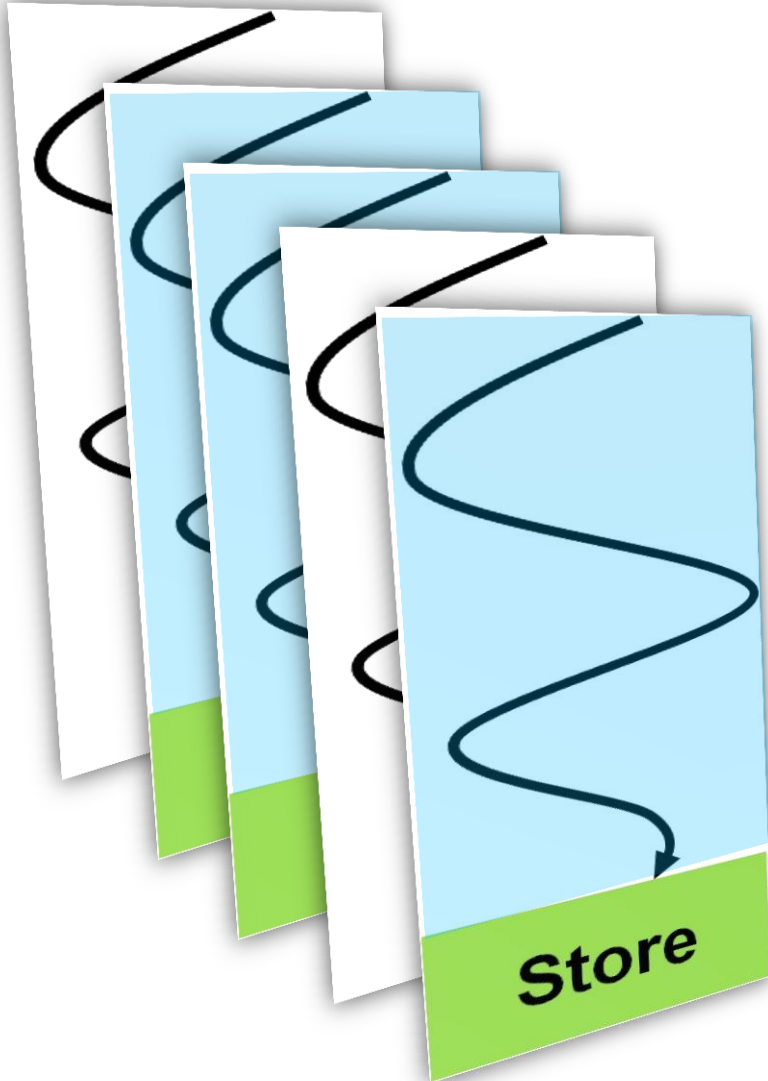
- Key Insights:
  - Faults in different **loop iterations** may be equivalent



- **Stores** and **Branches** have major effects on application

# Faults in Store Instructions

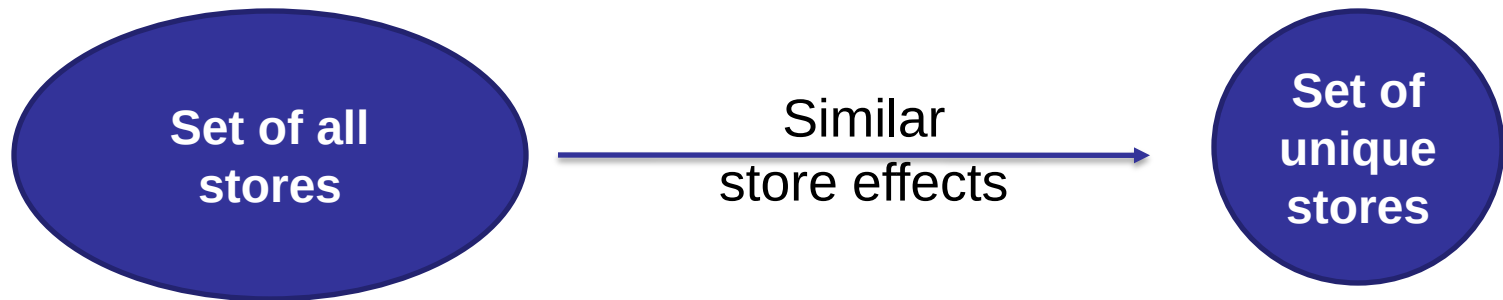
Data flow leading to a store



- Show ■ stores to be equivalent
- Faults in ■ instructions are also equivalent
- How to show store equivalence?

# Equalizing store instructions

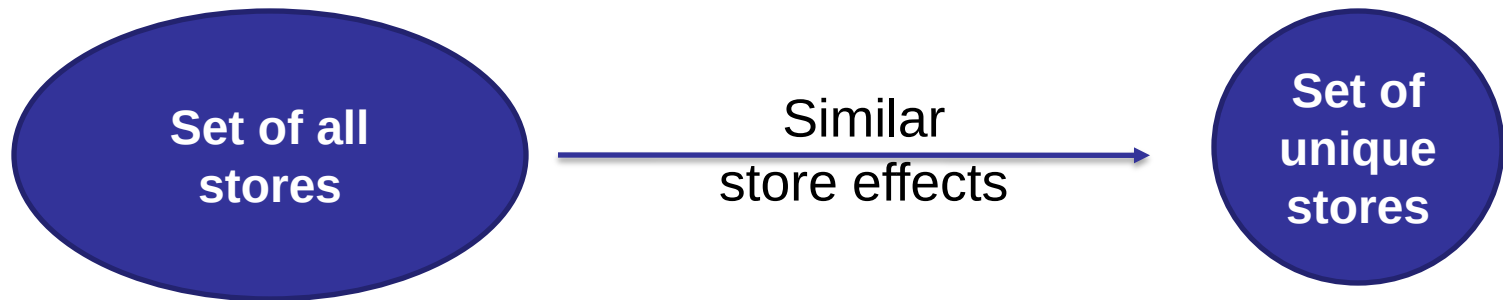
- Criterion that makes stores equal: **effect of faulty store**



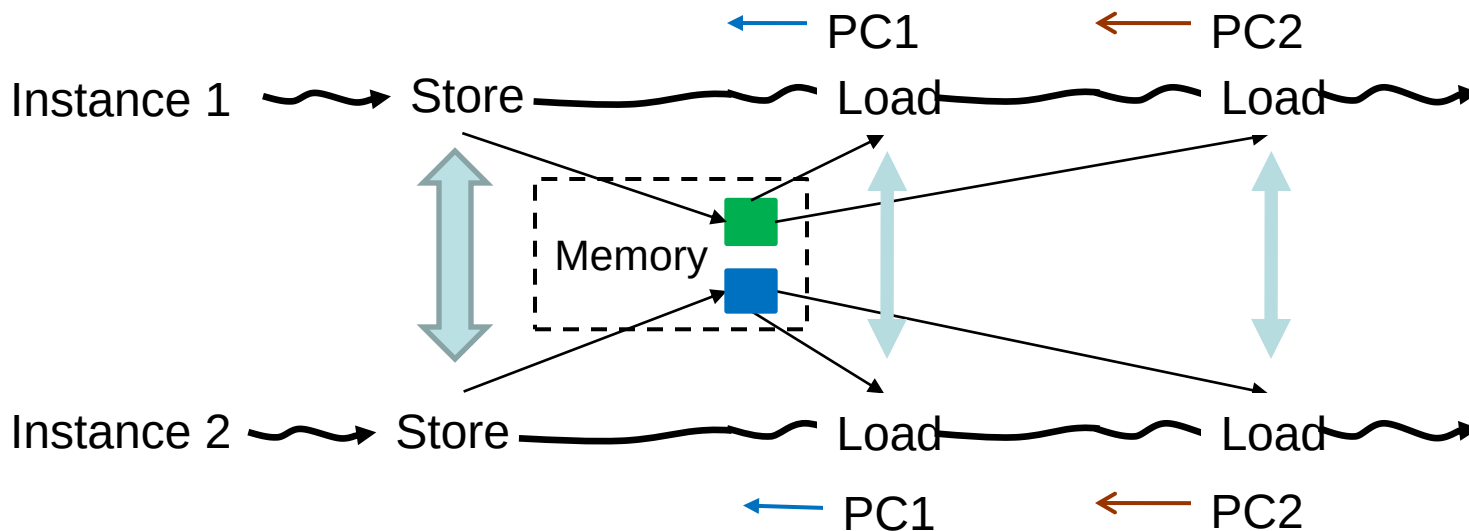
- Use heuristics to measure store effects

# Equalizing store instructions

- Criterion that makes stores equal: **effect of faulty store**

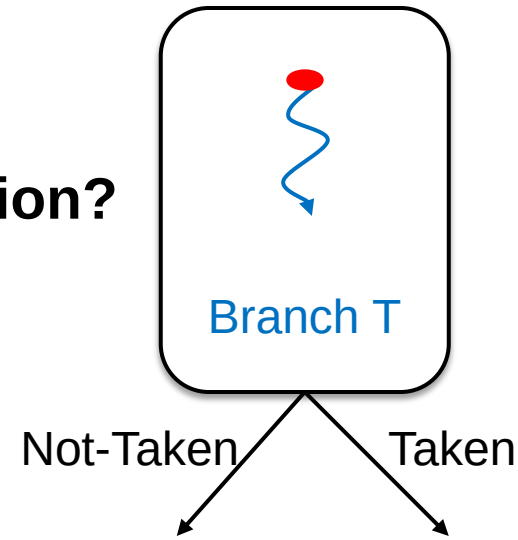


- Use heuristics to measure store affects
  - Location of every use + dynamic instruction flow info



# Faults in Branches

- Faults in **■** section affect only the direction of branch
  - No other side effects
- For **■** section we need to know
  - # of faults resulting in right branch direction?
    - **Distribution** of faults
  - **Outcome** of the wrong direction



- For **distribution**, inject faults exhaustively in one iteration
- For **outcome**, inject just one fault in the condition code



# Other Pruning Techniques

- **Constant Propagation**
  - Propagate faults through instructions using constants
  - Similar to the compiler optimization technique

- **Def-Use Analysis**

1. OR      r1, 0x1 → r2  
2. ADD    r2, r3 → r4

- Consider faults only in the uses
  - Prune faults from def
- **Statistical Pruning**
  - Remaining faults in branch instructions
    - In target of dynamic branch
    - One direction fault in dynamic conditional branch

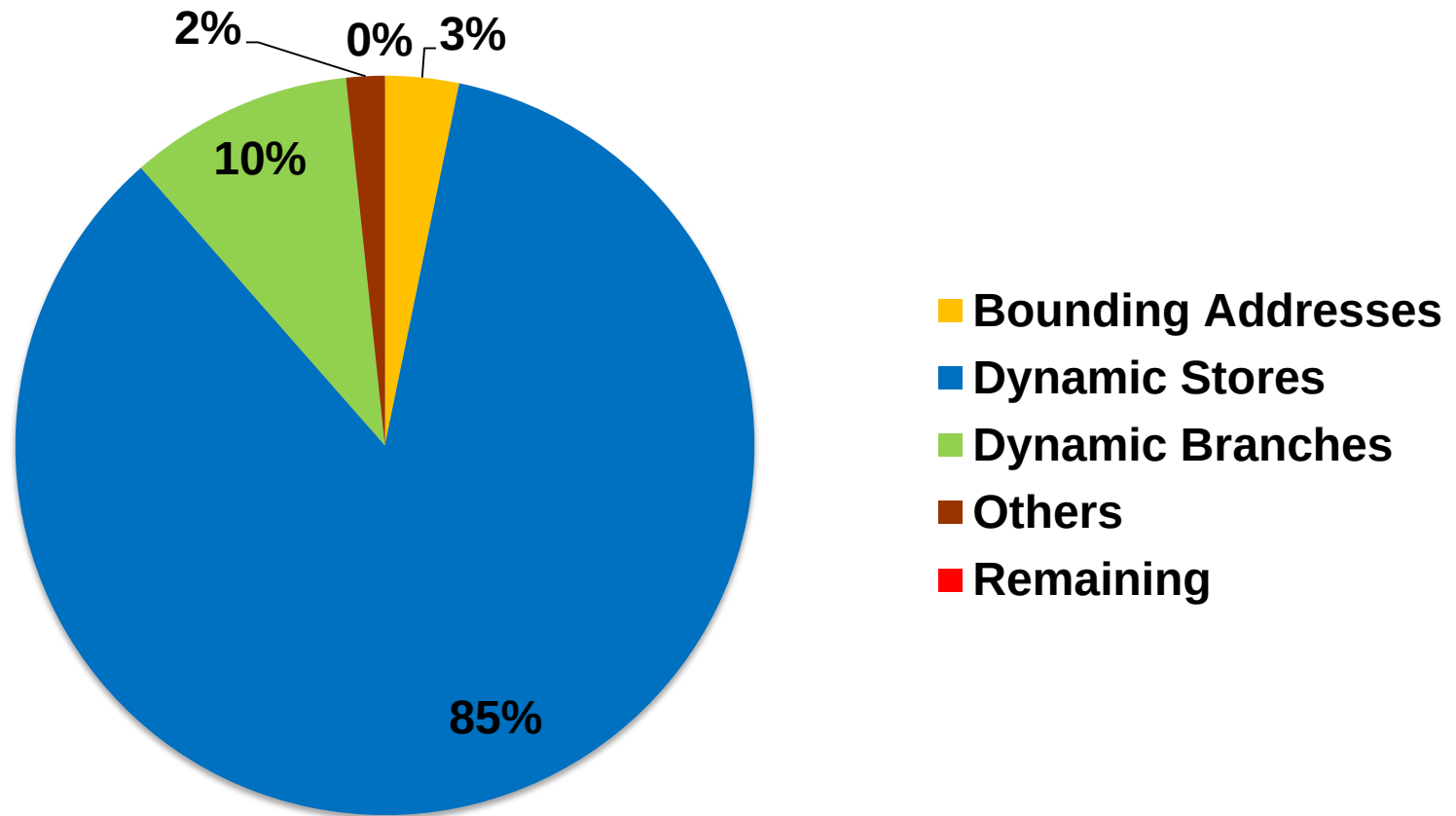
# Evaluating Fault Pruning Techniques

| Application              | Number of Instructions | Number of Faults |
|--------------------------|------------------------|------------------|
| LU<br>(SPLASH-2)         | 2.1 Billion            | 310 Billion      |
| FFT<br>(SPLASH-2)        | 7.1 Billion            | 111 Billion      |
| Blackscholes<br>(PARSEC) | 1.7 Billion            | 214 Billion      |
| Swaptions<br>(PARSEC)    | 2.7 Billion            | 534 Billion      |

**Total Faults = 1.17 Trillion**

# Results

- Pruned: **99.9979%**
- Remaining: **0.0021% (25 Million)**



Fault pruning across all applications

# Conclusions

- **Analyzing all transient faults effecting an application**
- **Reduced the number of fault injection experiments**
  - **Developed efficient pruning techniques**
    - **Predict outcome** without fault injection
    - Show **equivalence** between several faults
- **Pruned hardware faults by 5 orders of magnitude**
  - **Only 0.0021% of faults remaining**

# Ongoing and Future Work

- **Developed efficient fault injection framework**
- **Evaluating the accuracy of developed pruning techniques**
  - **Current results show an average inaccuracy of only 5%**
- **Compute effective SDC rate**
- **List and analyze SDC causing faults**
- **Identify SDC prone sections of applications**
  - **Devise low-cost detectors (software or hardware)**