



ExaScience Lab
Intel Labs Europe



EXASCALE COMPUTING

SAMPLED SIMULATION OF MULTI-THREADED APPLICATIONS

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[HTTP://WWW.SNIPERSIM.ORG](http://www.snipersim.org)
MONDAY, APRIL 22ND, 2013

OVERVIEW

- How can we help the hero save the princess?
- How can we create a representative sample of a multi-threaded application?

- Prior Work
- Key Contributions of this Work
- Results

DEMANDS ON SIMULATION ARE INCREASING

- Increasing cache sizes
 - Need a large working set to fully exercise a large cache
 - Scaled-down applications do not exhibit the same behavior
- Increasing core counts
 - Linear increase in simulator workload
 - Single-threaded simulator sees a rising gap
 - workload: increasing target cores
 - available processing power: near-constant single-thread performance of host machine
- Multi-threaded workloads
 - Not reproducible with traces requiring a number of simulation runs
- New solutions are needed

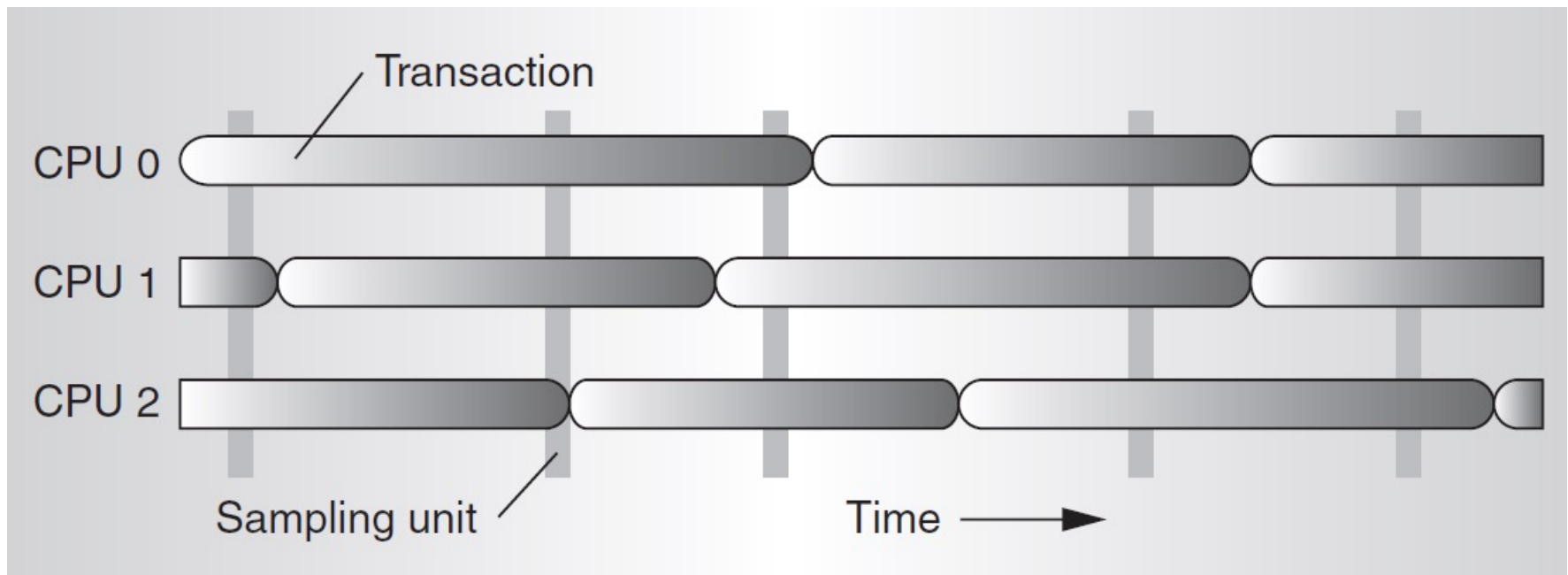
WORKLOAD REDUCTION IS THE KEY

- Many workload reduction techniques exist today
 - Sampling
 - SimPoint
 - SMARTS
 - FlexPoints
 - Reduction
 - Smaller input sizes
 - Reduced numbers of iterations
- Current sampling techniques are not sufficient
 - Using CPI as a proxy for runtime does not hold for multi-threaded applications
 - Invalidates assumptions of previous work
 - Waiting for locks and barriers and other synchronization primitives

FLEXPOINTS

- Overview

- Supports sampling multi-threaded throughput (server) applications
- Creates a sample based on a number of sampling units to minimize CPI variation
- Not applicable to applications where threads synchronize or communicate

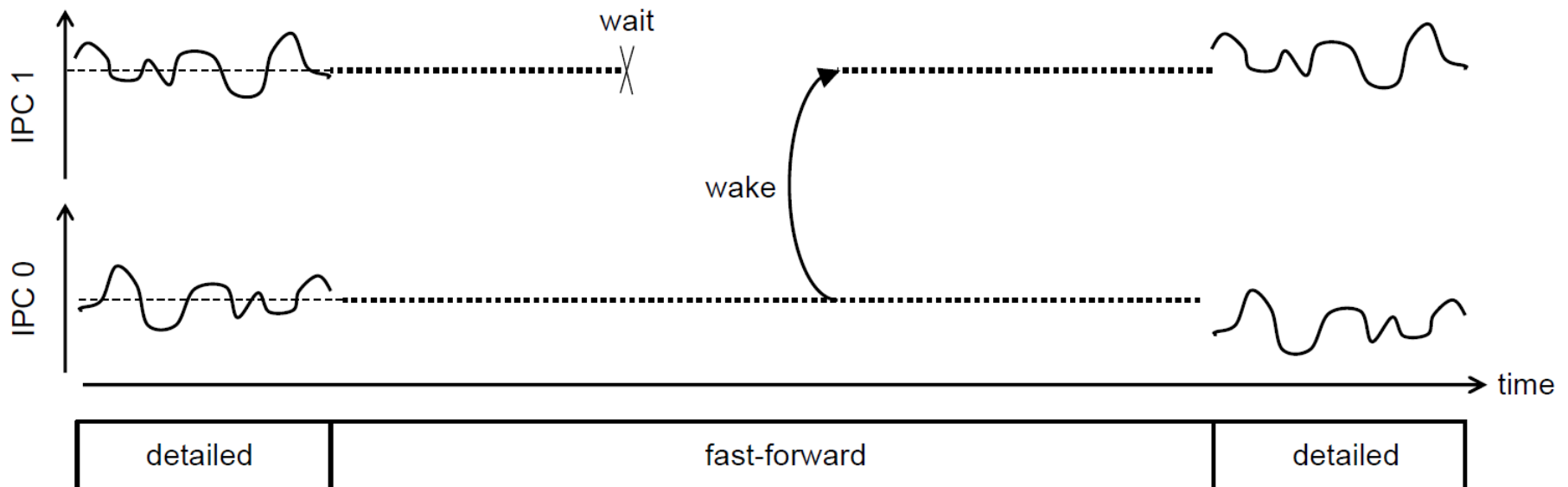


MULTI-THREADED SAMPLING

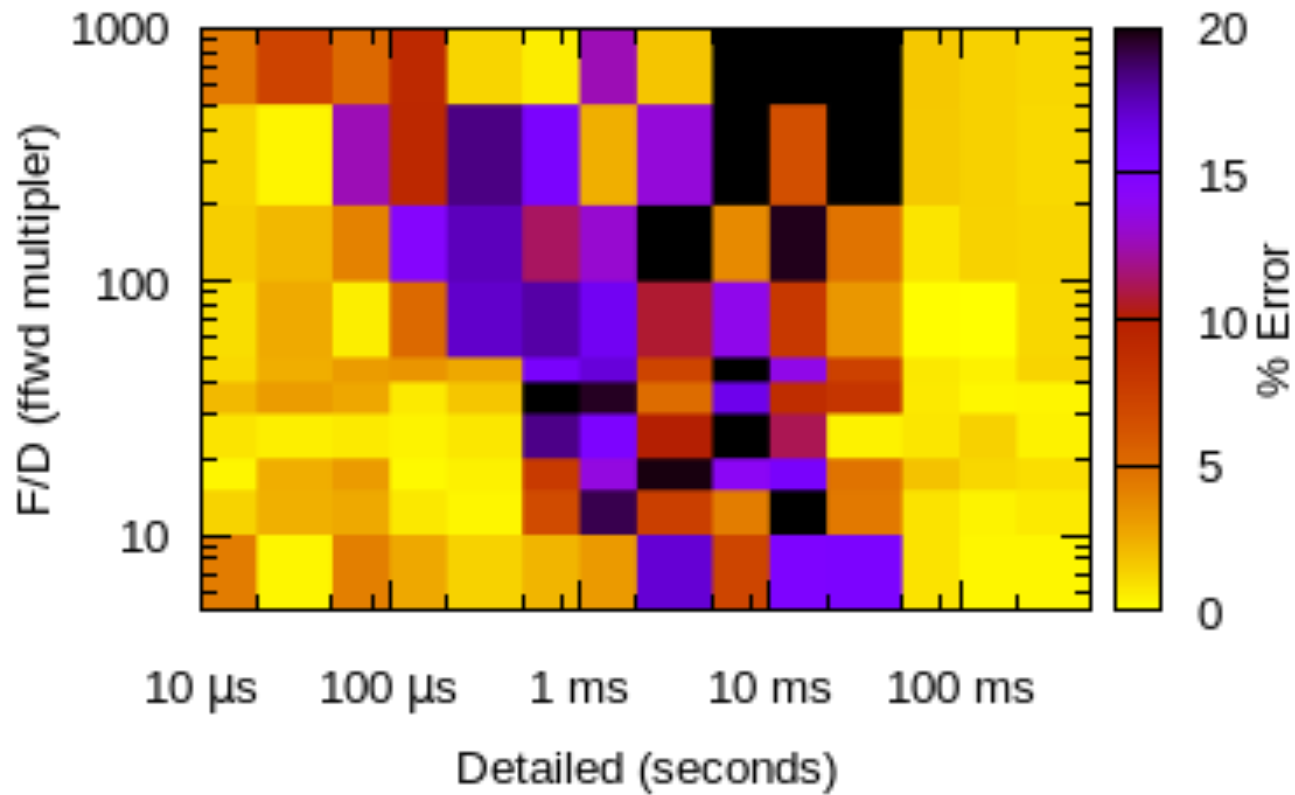
- **Goals:**
 - Accurately predict application runtime of synchronizing multi-threaded applications
 - (not just average CPI)
 - Periodically sample a multi-threaded application to reduce amount of detailed simulation time
- **Examples of synchronizing mechanisms**
 - Barriers, mutexes
 - OMP-style parallelism
 - Pipelined parallelism
 - LOCKed instructions, compare-and-swap

INITIAL SAMPLING PROCESS

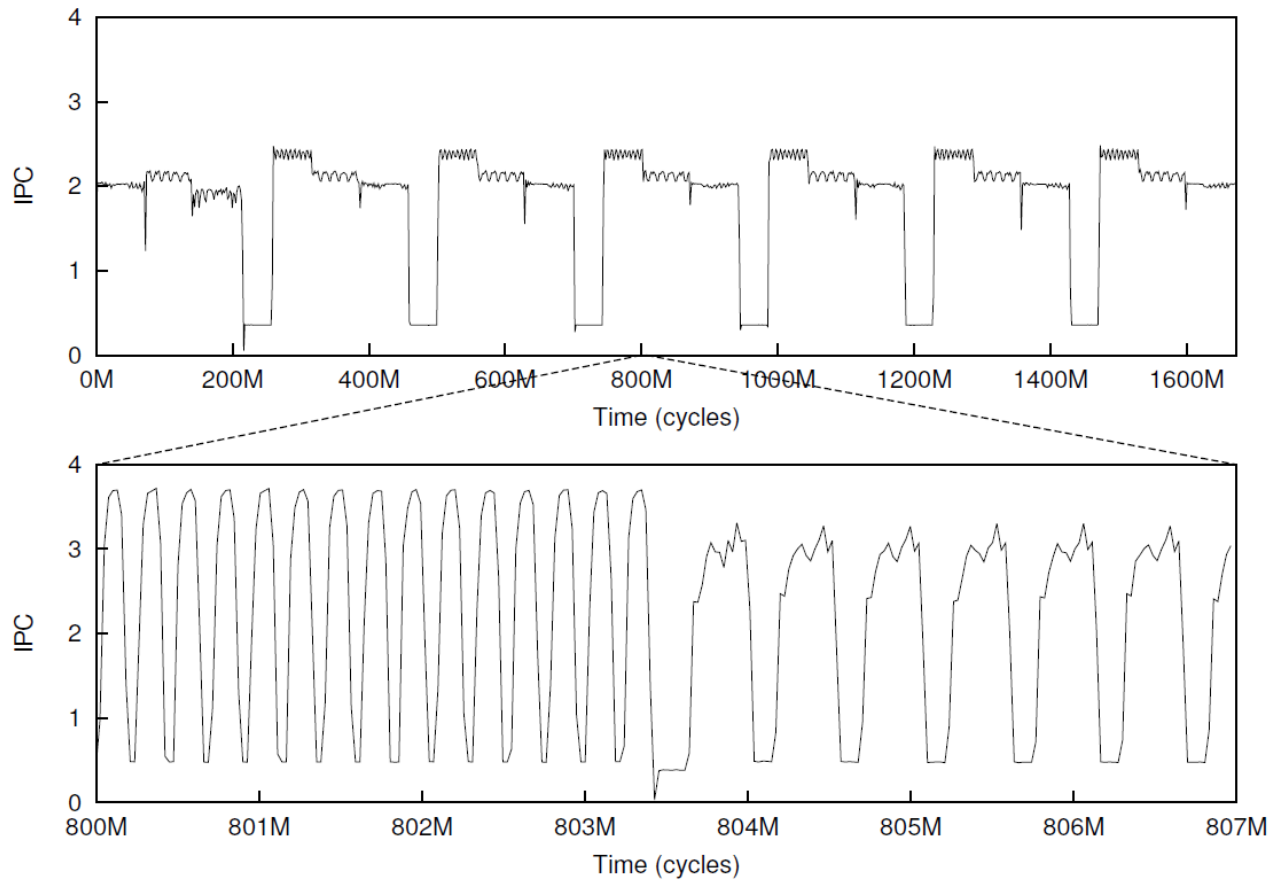
- Sampling Overview
 - Detailed = all components enabled (warmup+simulation)
 - Fast-forward = memory-hierarchy enabled
- Key Insights
 - Independent IPCs for each individual thread
 - Keeping track of wait/wake during fast-forwarding



SAMPLE SELECTION

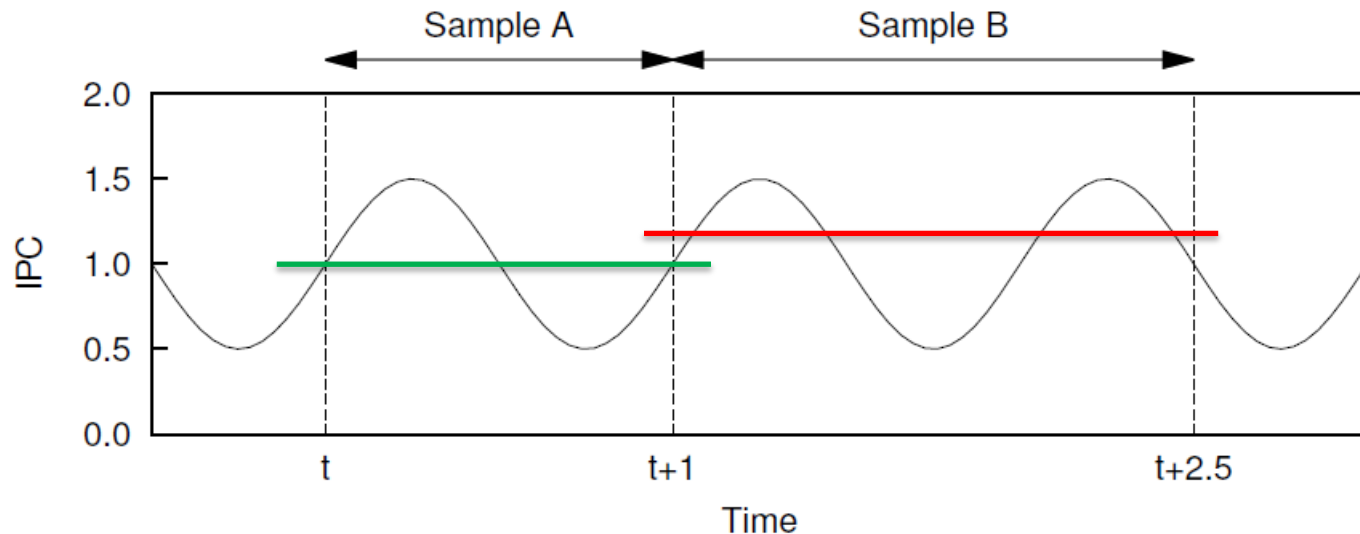


APPLICATIONS ARE PERIODIC



npb-ft, class A, 8 threads

APPLICATION PERIODICITY AFFECTS ACCURACY

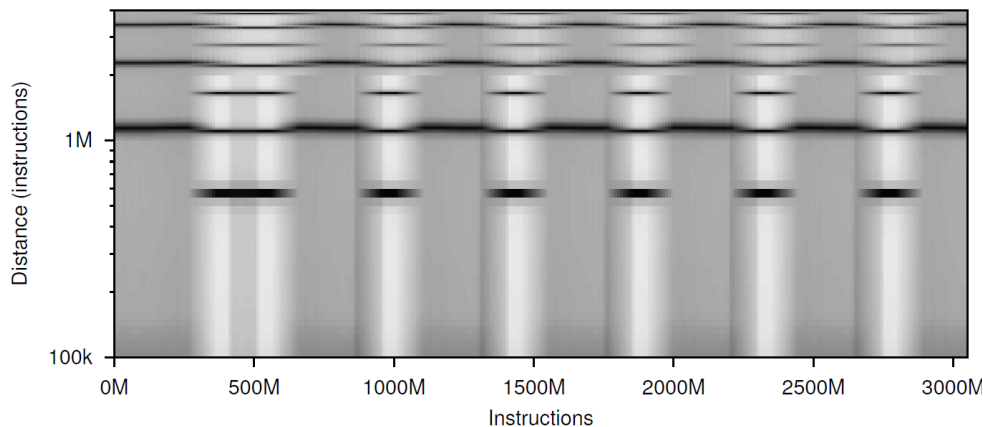


Sampling at exactly one period would produce excellent results

Sampling at more than one period can produce a sampling error

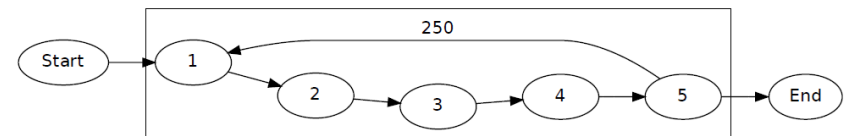
IDENTIFY PERIODICITIES

- We wanted to identify application periodicities in a micro-architectural independent manner



BBV Autocorrelation

npb-ft, class A, 8 threads, with 550k and 1.14M insn periodicities



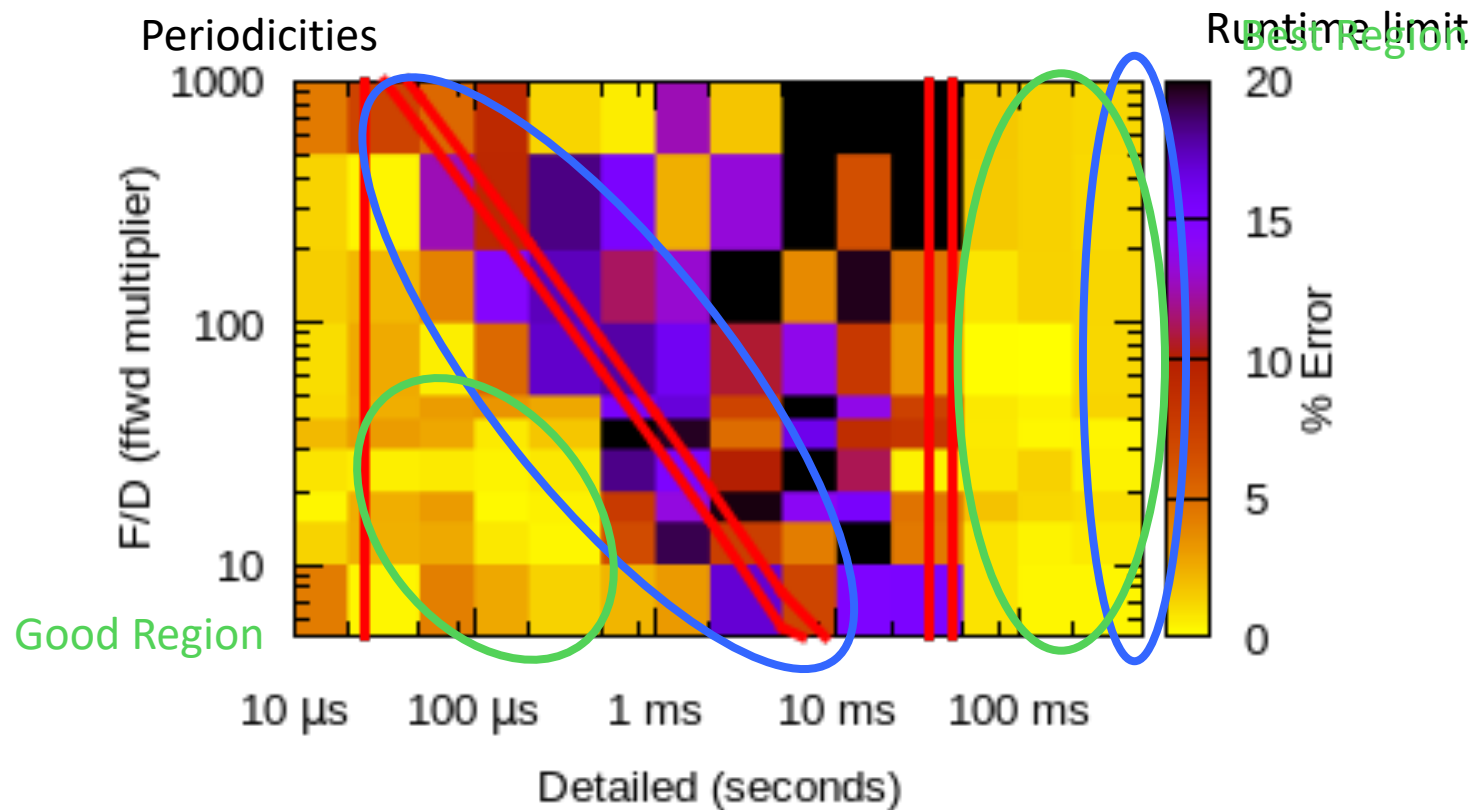
Edge	Avg	Δ/μ
1 → 2	37.14 M	12.0%
2 → 3	38.97 M	16.1%
3 → 4	1.96 M	36.6%
4 → 5	17.45 M	<1%
5 → 1	9.83 M	<1%

OMP Call Structure

npb-lu, class A, 8 threads with high variability (not used)

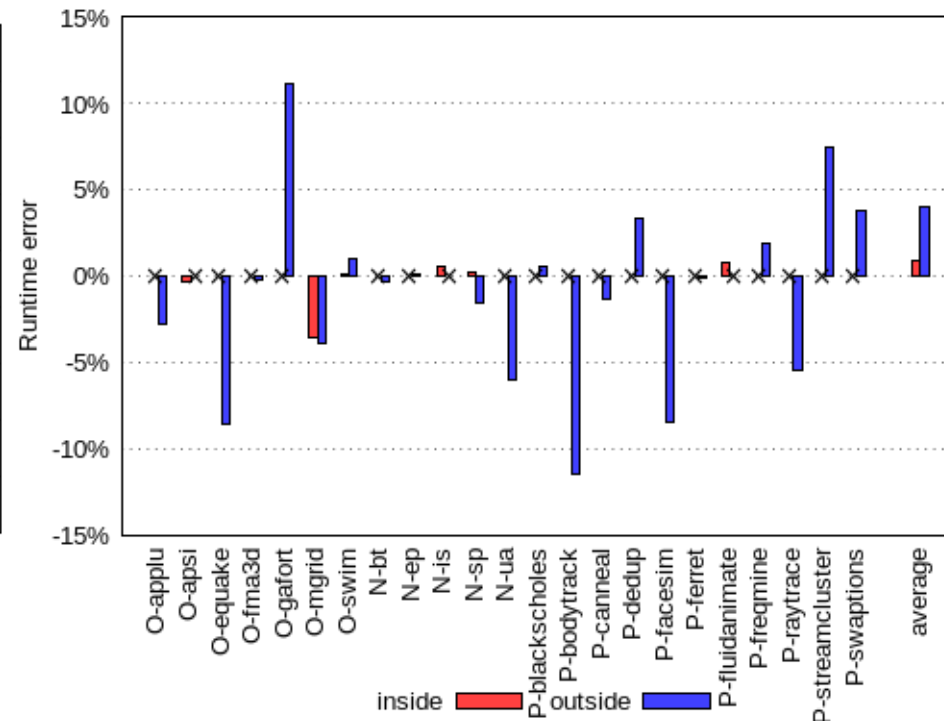
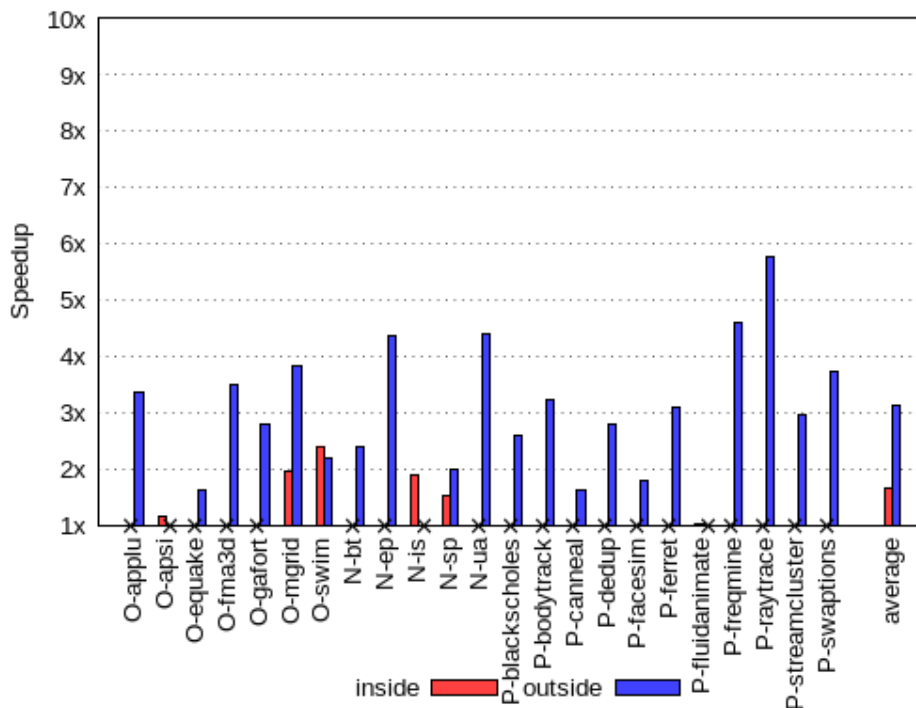
SAMPLING PROCESS

- Sampling sufficiently above or below the period will minimize error



RESULTS

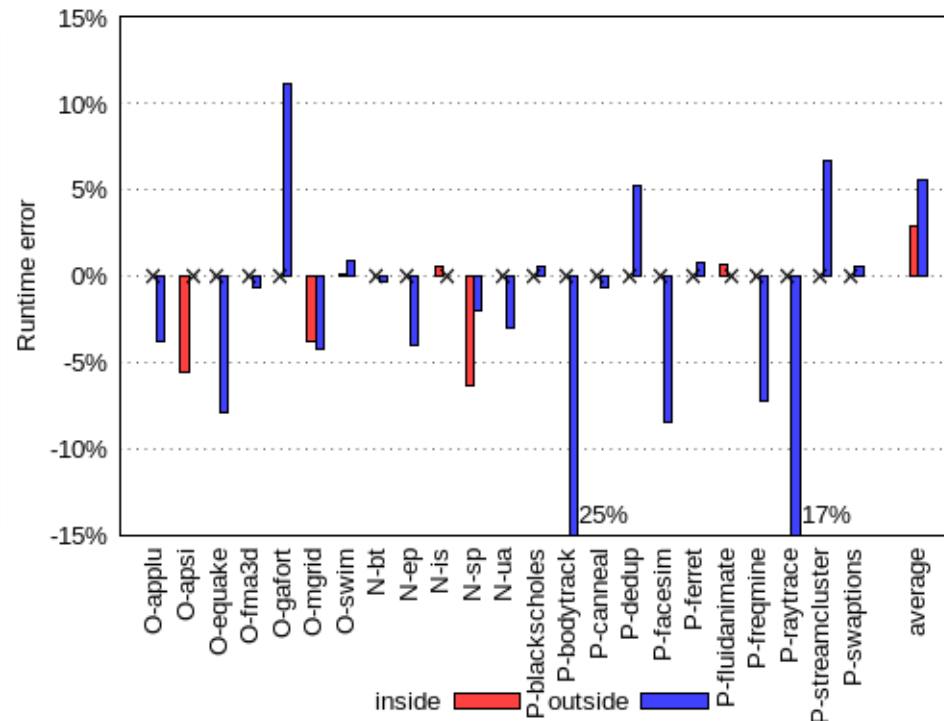
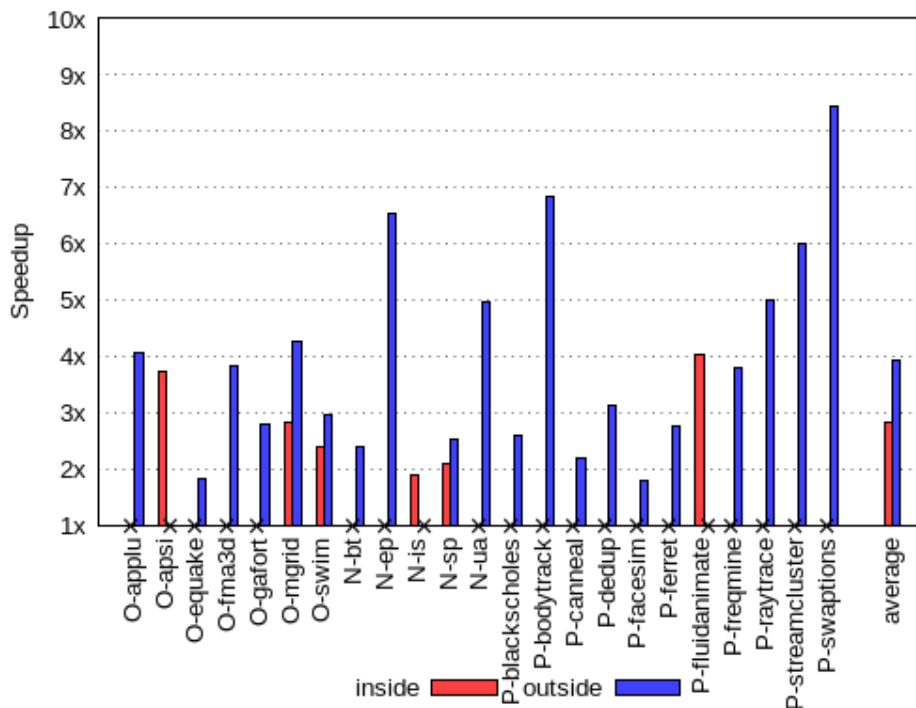
- Predicted Most-Accurate Results
 - Average speedup of 2.9x, maximum of 5.8x
 - Average absolute error of 3.5%



RESULTS

- Predicted Fastest Results

- Average speedup of 3.8x, maximum of 8.4x
- Average absolute error of 5.1%



MULTI-THREADED SAMPLING

- **Key Contributions**
 - Understanding application phase behavior is key to effective sampling
 - Modeling inter-thread interactions during fast-forwarding is important for multi-threaded sampling accuracy
- **Predicted Most-Accurate Results**
 - Average speedup of 2.9x, maximum of 5.8x
 - Average absolute error of 3.5% across applications
- **Predicted Fastest Results**
 - Average speedup of 3.8x, maximum of 8.4x
 - Average absolute error of 5.1% across applications



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