

## IMPLEMENTING A LEADING LOADS PERFORMANCE PREDICTOR ON COMMODITY PROCESSORS

BO SU<sup>†</sup> JOSEPH L. GREATHOUSE<sup>‡</sup> JUNLI GU<sup>‡</sup>
MICHAEL BOYER<sup>‡</sup> LI SHEN<sup>†</sup> ZHIYING WANG<sup>†</sup>

<sup>†</sup>NUDT <sup>‡</sup>AMD RESEARCH JUNE 19, 2014



# How fast is your application at different CPU frequencies?

#### WHAT HAPPENS WHEN YOU CHANGE FREQUENCY?



Estimate #1

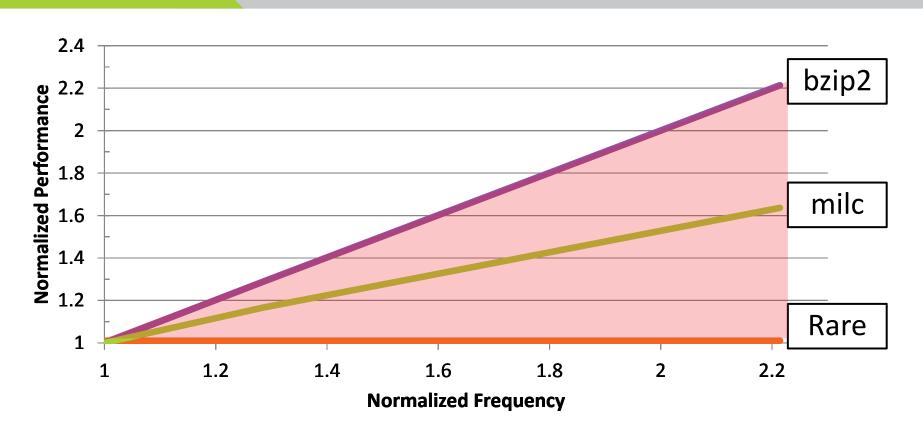
Nothing. Who cares about frequency?

Estimate #2

Performance difference is equal to frequency change.

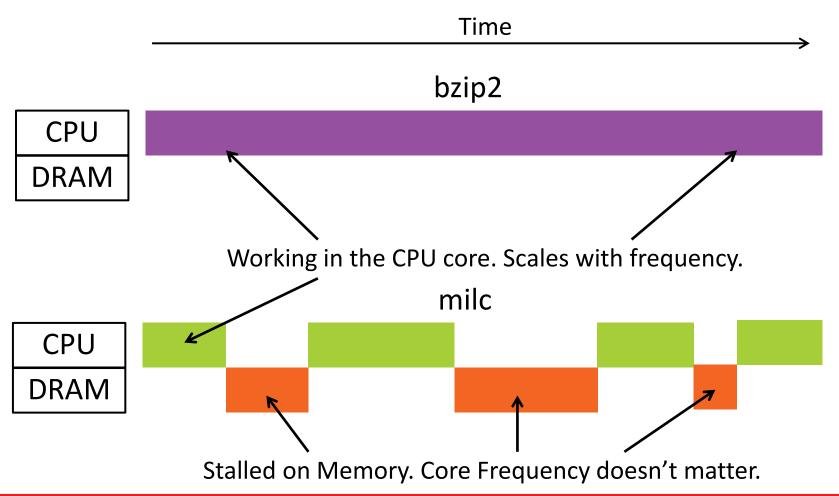
Estimate #3

Something in between.



### WHY DON'T NAÏVE ESTIMATES ALWAYS WORK?





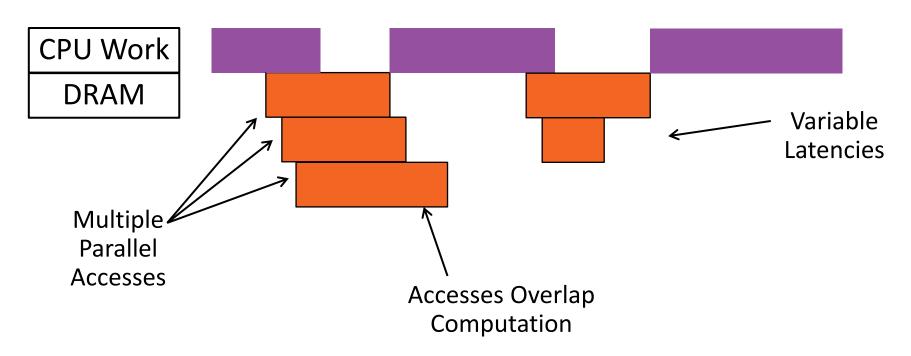
## Core and memory time both matter

#### HOW DO YOU ESTIMATE "MEMORY TIME"?



MODERN CORES MAKE THIS DIFFICULT

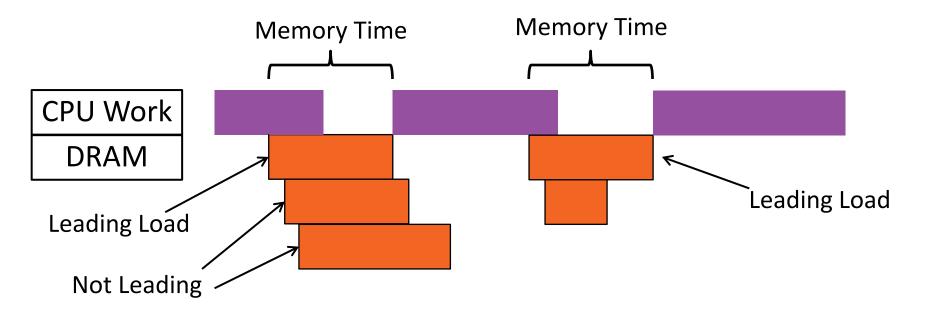
- ▲ Count the amount of time with an outstanding load?
- ▲ Count last-level cache misses?



#### "LEADING LOADS" MEMORY TIME ESTIMATION



Described by 3 separate groups in CF 2010, IEEE TOC, and IGCC 2011



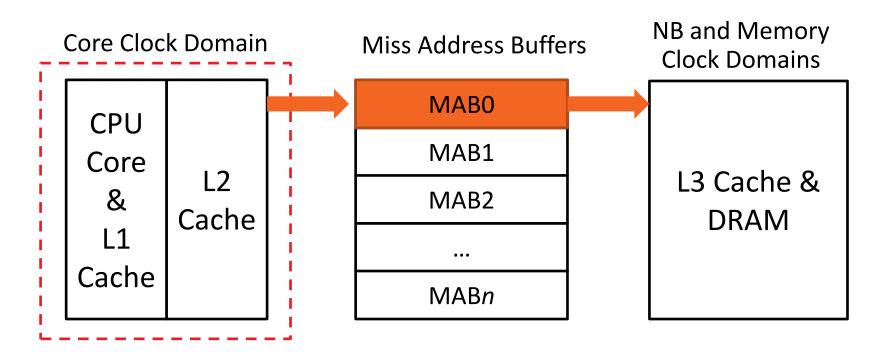
Memory time approximately time that a leading loads is active

Simulation: ~0.2% estimation error across 2x change in frequency



#### L2 cache misses held in Miss Address Buffer (MAB)

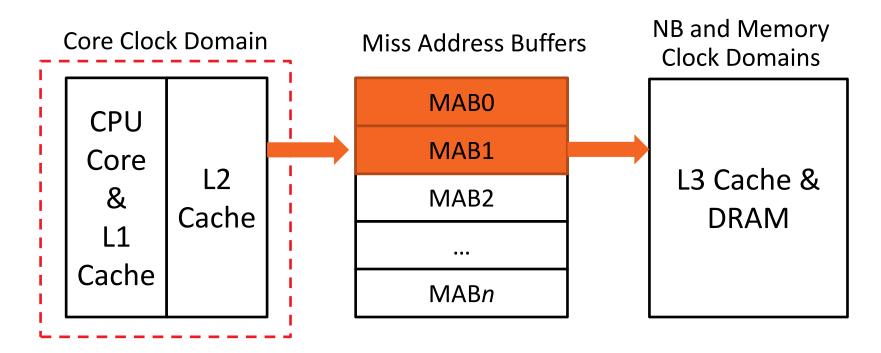
- MAB entries have a static priority (e.g. MABO is highest priority)
- Highest priority empty MAB holds the miss until it returns from memory





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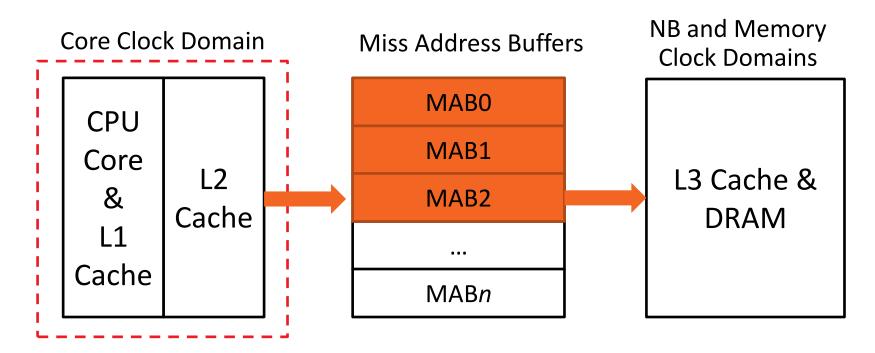
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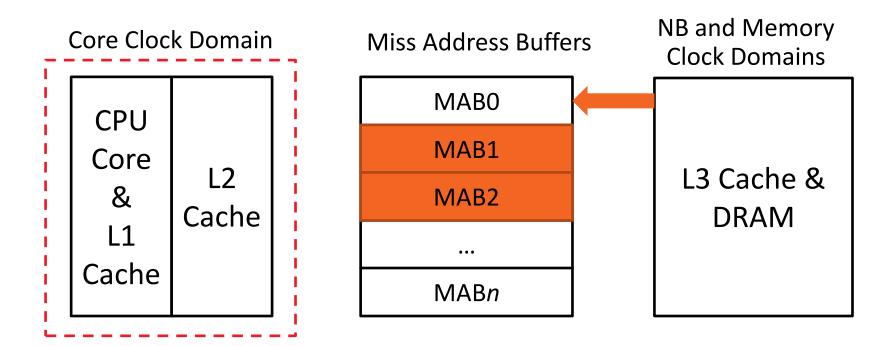
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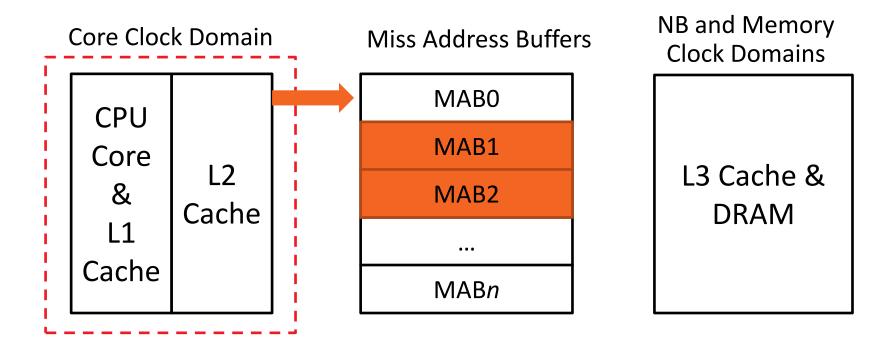
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#### PERFORMANCE ESTIMATION MODEL: LL-MAB



#### Measure occupancy time of the highest-priority MAB

- HW event 1: CPU Clocks not Halted (for Execution Time)
  - Performance Event 0x76
- HW event 2: MAB Wait Cycles (for Memory Time)
  - Performance Event 0x69
  - Family 15h Processors: Unit Mask 0

 $Memory\ Time(f1) = MAB\ Wait\ Cycles(f1)/(f1)$ 

Core  $Time(f1) = Execution\ Time(f1)$ -Memory Time(f1)

 $Execution\ Time(f2) = Core\ Time(f1) * f1/f2 + Memory\ Time(f1)$ 

#### **EVALUATING PERFORMANCE PREDICTORS**



- Run benchmarks at frequency 1, estimate runtime at frequency 2
- Run benchmark at frequency 2.
  - Difference between observed and estimated is estimation error.

- Estimation mechanisms:
  - Linear: Performance scales exactly with frequency (like bzip2)
  - Green Governor:
    - Count L3 cache misses
    - Assign delay to each cache miss
    - -# Cache Misses \* delay = "memory time"
  - LL-MAB: Count MABO cycles at "memory time"

#### EXPERIMENTAL SETUP



#### OTHER PROCESSORS TESTED IN THE PAPER

#### AMD Opteron™ 4386 Processor

- 2<sup>nd</sup> Generation Family 15h "Piledriver" CPU
- Minimum Frequency: 1.4 GHz, Maximum non-boost frequency: 3.1 GHz

#### Fedora® 19 Desktop (kernel version 3.10.6-200)

- Locked benchmarks to single core with numactl
- Used msr-tools to read performance counters around benchmark runs.
- CPUFreq userspace governor to manually control DVFS state. Boosting disabled.

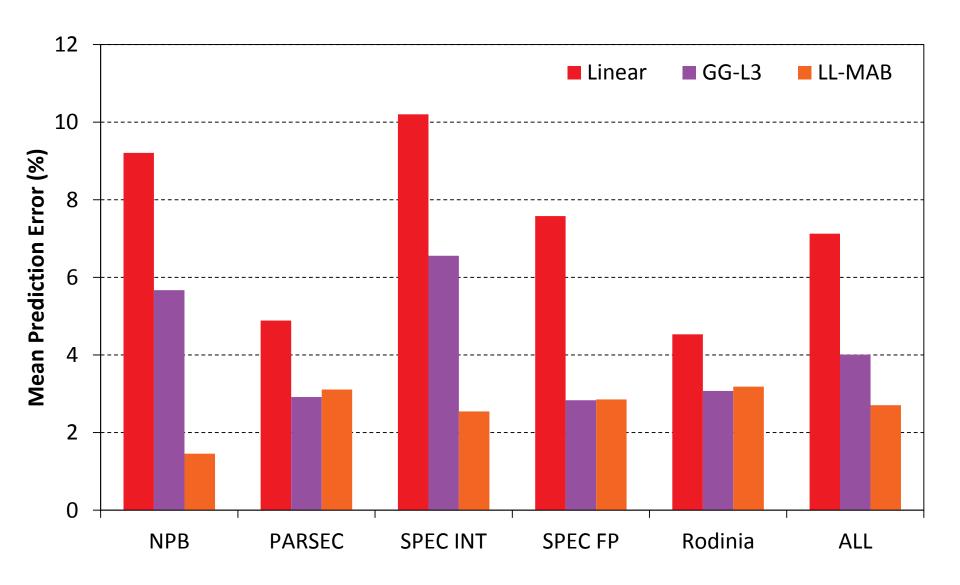
#### 66 Single-threaded benchmarks from:

- SPEC® CPU 2006
- NAS Parallel Benchmarks
- PARSEC
- Rodinia

### MEASURE AT 3.1 GHZ, ESTIMATE 1.4 GHZ RUNTIME

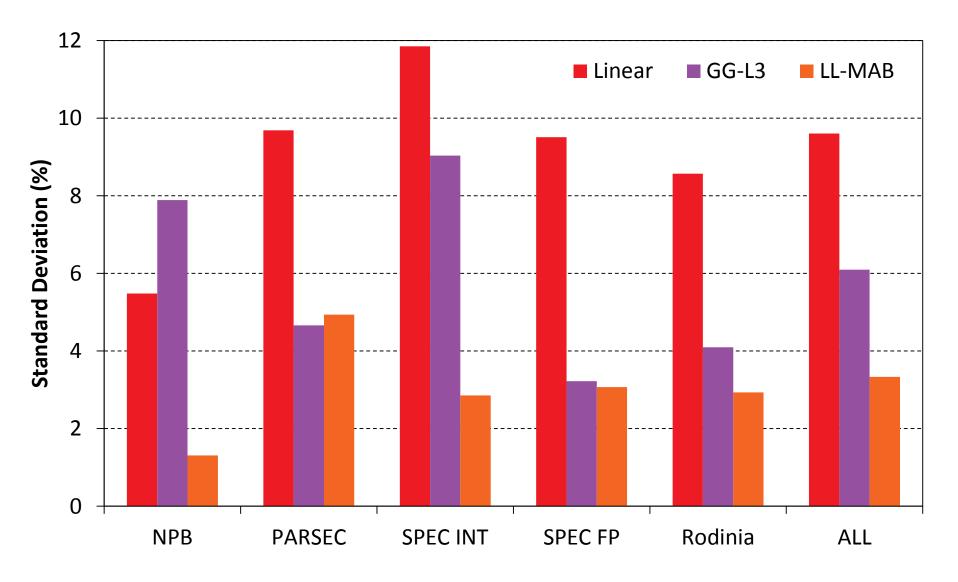


(LOWER IS BETTER)



## STANDARD DEVIATION IS IMPORTANT FOR PREDICTIONS AMD

(LOWER IS STILL BETTER)



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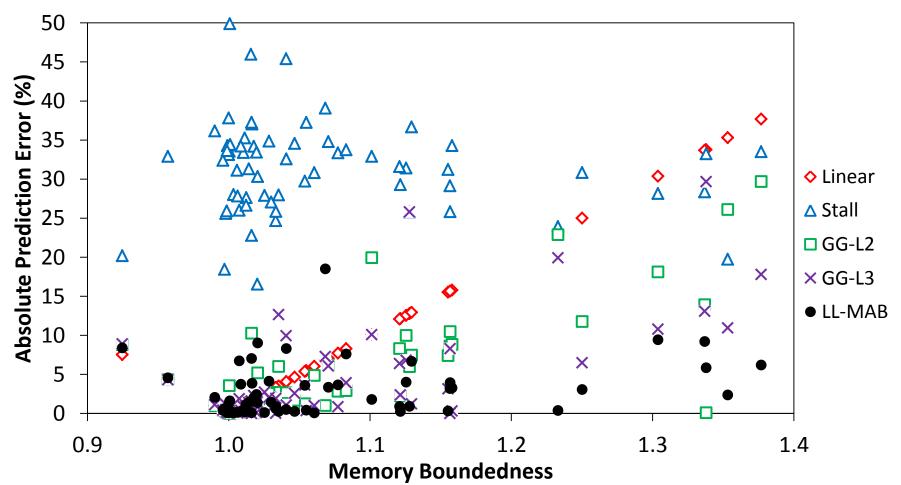
# Backup Slides

#### PREDICTION ACCURACY PER BENCHMARK



Memory Boundedness = Ratio of execution cycles at two frequencies

-1.0 = no change in cycles (completely compute bound, e.g. bzip2)



#### CONCLUSION



- ▲ First leading loads implementation on real processors
- ▲ Higher accuracy than existing predictors
- ▲ Lower accuracy than simulation due to HW complexity
- ▲ Lightweight estimation mechanism (only requires 2 counters)
  - Path to better performance and power prediction