

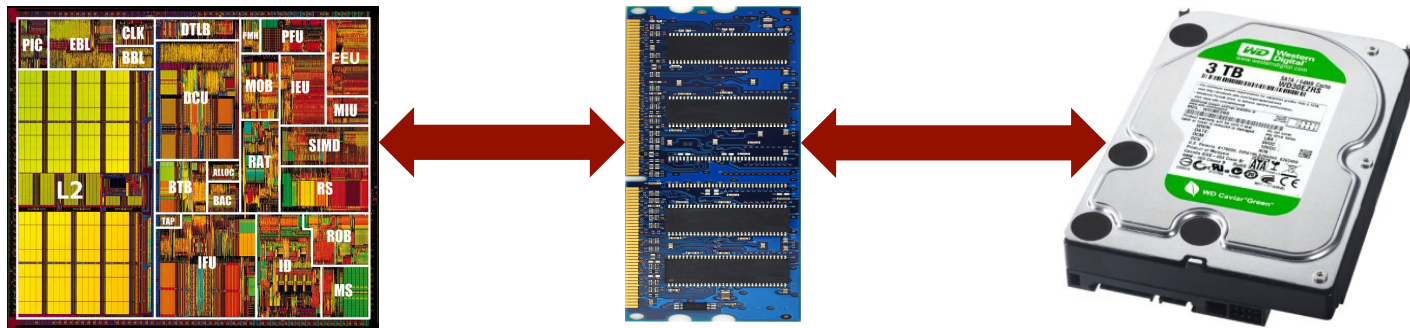
# To expose, or not to expose, hardware heterogeneity to runtimes

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# Circa 2000: Hardware fixed at design



Out-of-order 1 GHz processor

Volatile DRAM main memory

Persistent disk storage

# The shift to power-aware computing

Dennard scaling has stopped

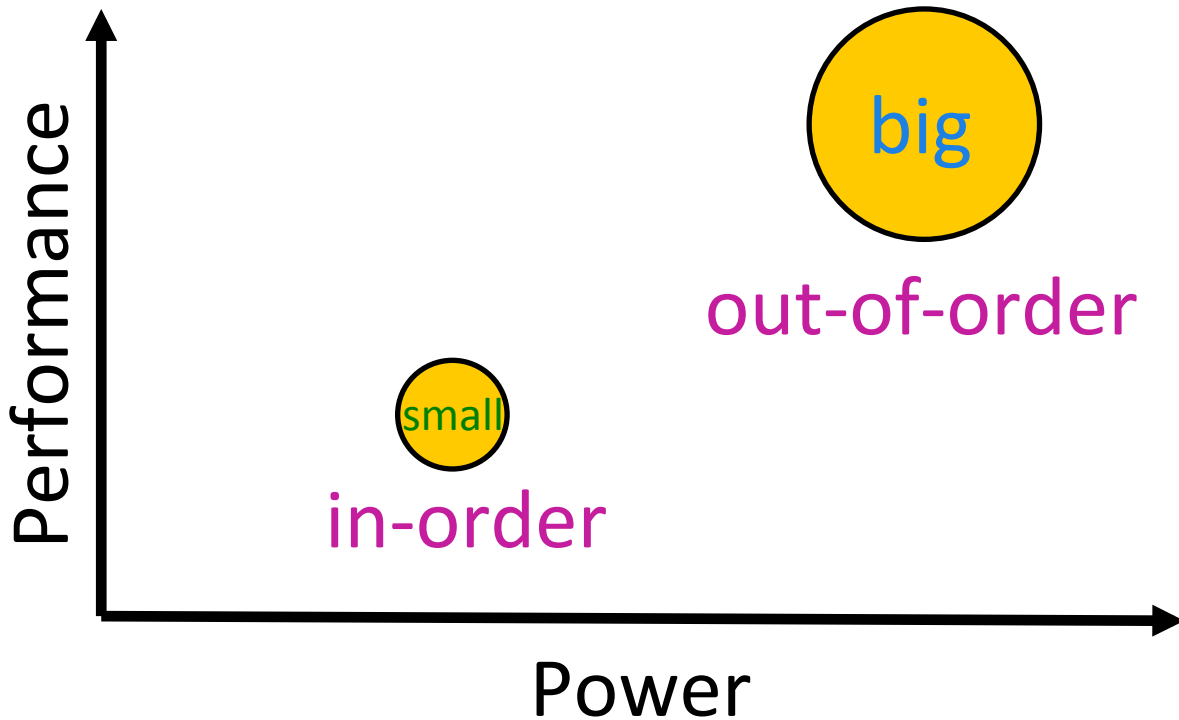
Constant power density as transistor size shrinks

Reliance on battery-operated devices



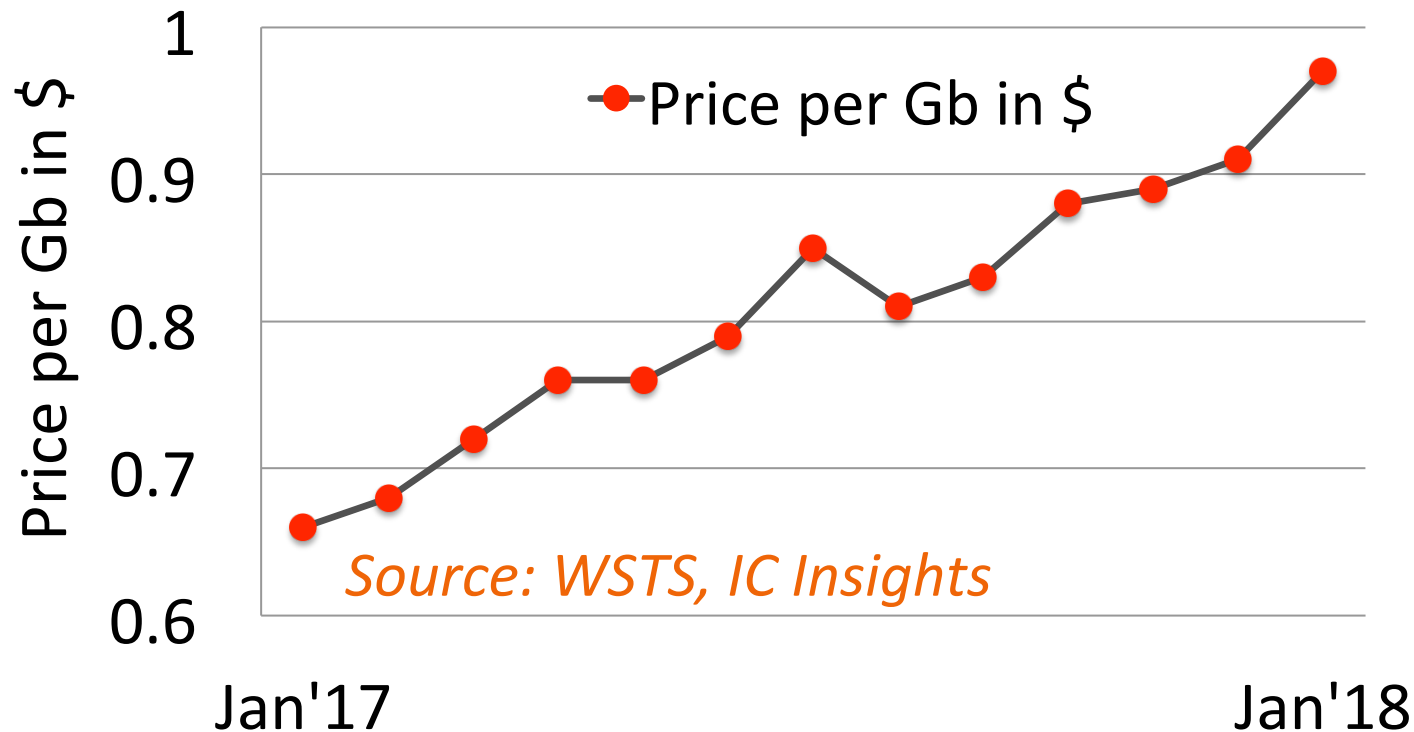
# Heterogeneous Multicores

Each core has its own frequency domain (DVFS)





# DRAM price and supply trends



# Hybrid DRAM-PCM memory

☺ More GB/\$ with Phase Change Memory

☹ Higher latency *and* low endurance

Speed  
Endurance

---

DRAM

Capacity  
Persistence

---

PCM

# Some challenges of heterogeneity

Schedule threads on **big-small** cores

Regulate **DVFS**

Mitigate **PCM** wear-out

Bridge **DRAM-PCM** latency-gap

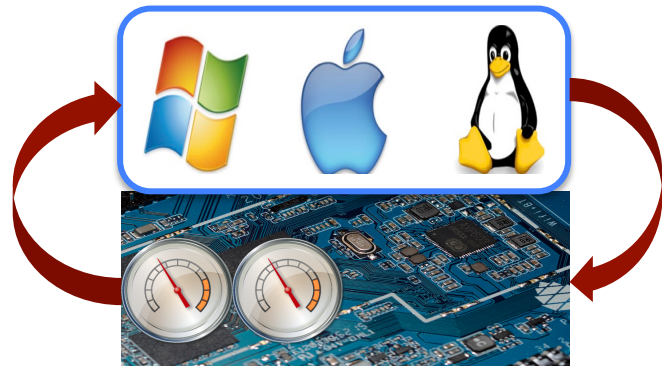
...

# Hardware/OS only approaches

Hardware exposes counters

OS predicts how software behaves

OS configures knobs and manages heterogeneity



# Pros/**cons** of moving up the stack

Gain in semantic  
knowledge 😊

Loss in abstraction 😞



# Exposing heterogeneity to runtimes

## ☺ Proactive

Thread  $x$  chases pointers (memory-bound)

$x \rightarrow y$  is producer  $\rightarrow$  consumer

Memory region  $x$  is highly written

## ☺ Flexible granularity

Memory mgmt in OS fixed at page granularity

# Exposing heterogeneity to runtimes

## ☹ Dependency

Hardware vendor relies on Microsoft/Oracle etc  
OS is ubiquitous

## ☹ Software complexity

Gain insight into software behavior  
Design, code, verify

## ☹ Native applications

C has a non-negligible fan base

# Beyond heterogeneity

Hardware multithreading

Turbo boost

Prefetching

Variable page sizes

Cache and memory-bandwidth partitioning

Accelerators and FPGAs

3D Stacked memory



# Outline

Garbage collection for hybrid memories

Concurrent collection on heterogeneous multicores

# Managing DRAM-PCM memory

Mitigate PCM wear-out ✓

Bridge the DRAM-PCM latency gap

Speed  
Endurance

DRAM

Capacity

PCM

# Managing DRAM-PCM memory

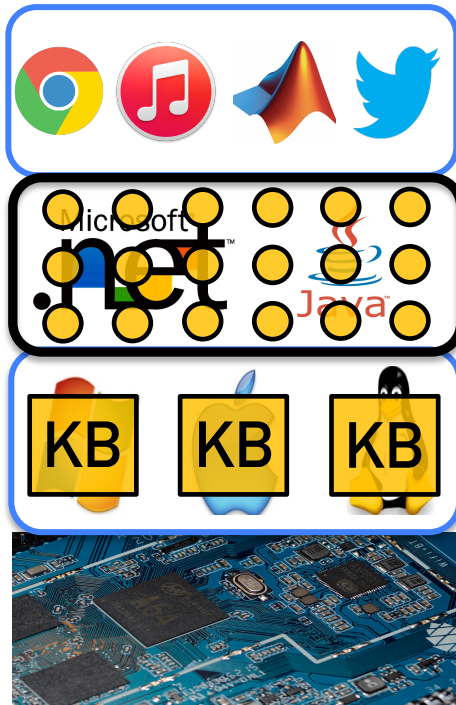
*Write-Rationing*

*Garbage Collection  
for Hybrid Memory*



Operating System

Coarse-grained  
pages



Garbage collection

Proactive 😊

Fine-grained

objects ○ ○ ○ ○

GC manages DRAM-PCM hybrid better than OS

# DRAM heap management

Heap Tracker



available



occupied

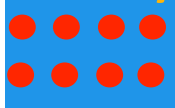


HEAP\_BEGIN

HEAP\_END

Heap Organization

nursery



mature



# DRAM heap management

Heap Tracker

✓ available

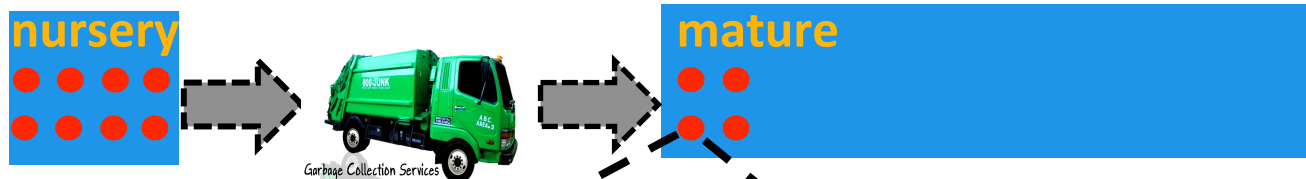
★ occupied



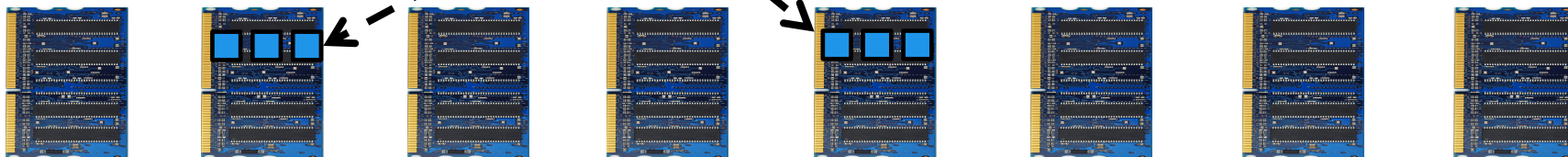
HEAP\_BEGIN

HEAP\_END

Heap Organization



Physical Memory



# DRAM-PCM heap management

Heap Tracker



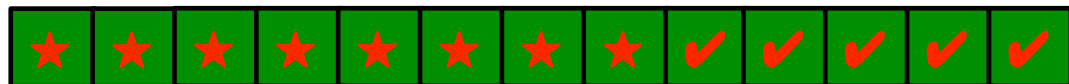
available



occupied



DRAM\_BEGIN



PCM\_BEGIN

PCM\_END

Heap Organization



nursery



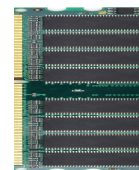
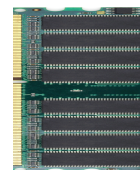
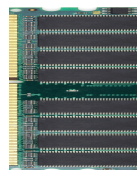
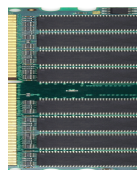
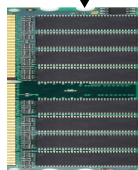
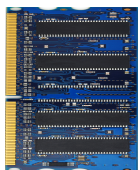
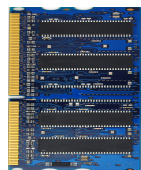
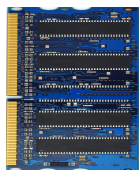
mature



Imbind("pcm")



Physical Memory



# Kingsguard-Nursery (KG-N)



**Write-rationing GC:** concentrate **writes** in **DRAM**

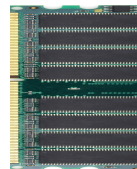
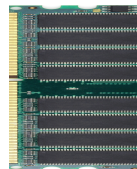
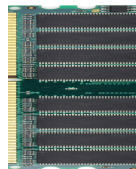
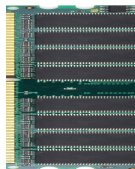
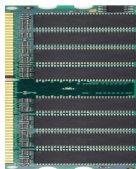
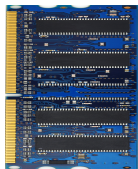
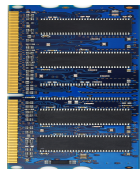
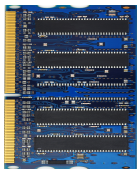
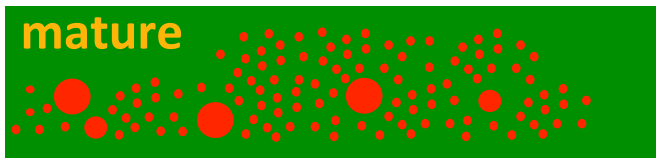
**70%**

of **writes**



**22%**

to 2% of objects

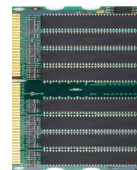
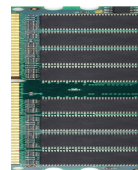
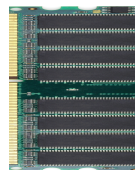
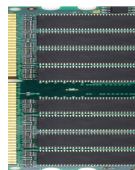
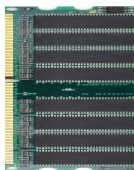
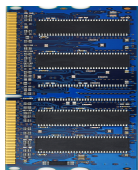
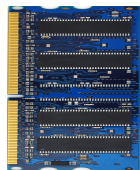
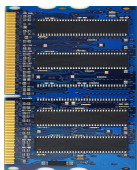
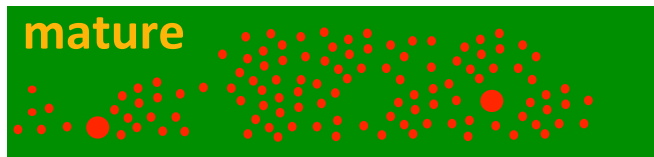
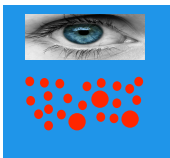


# Kingsguard-Writers (KG-W)



KG-W monitors writes in a DRAM observer space

Trades off performance for better endurance





# More optimizations in KG-W



## Short-lived large objects in DRAM

Large data-structures cause writes to PCM  
Keep them in DRAM

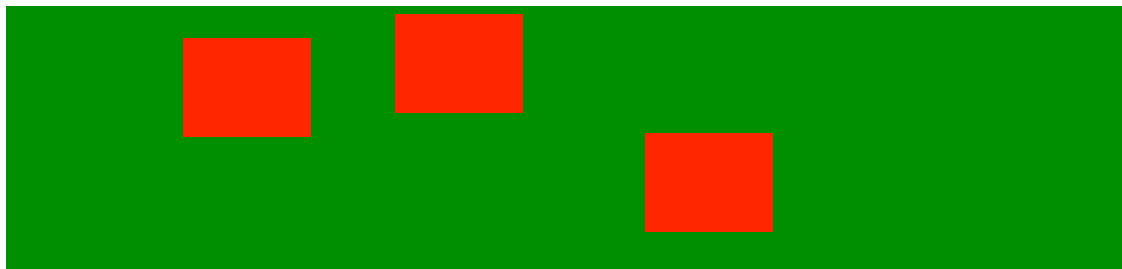
## Object meta-data in DRAM

GC updates to mark bits lead to writes to PCM  
Keep them in DRAM

# OS versus Kingsguard



DRAM



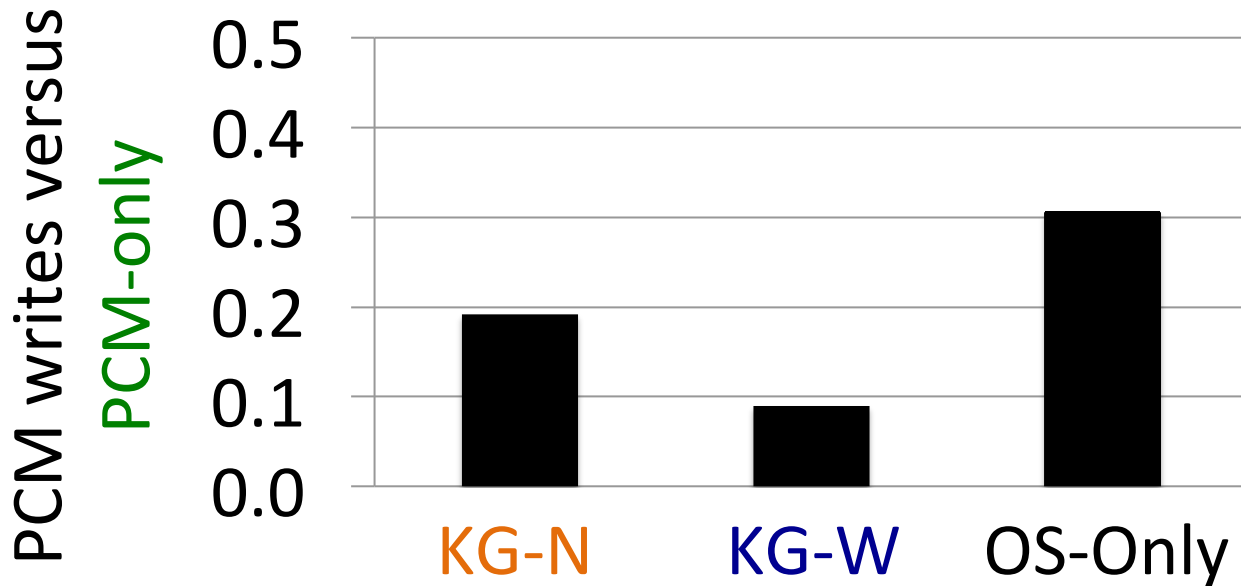
PCM

Rank pages according to writes

A page with  $\mathcal{T}$  writes is a DRAM candidate

Adjust for phase behavior

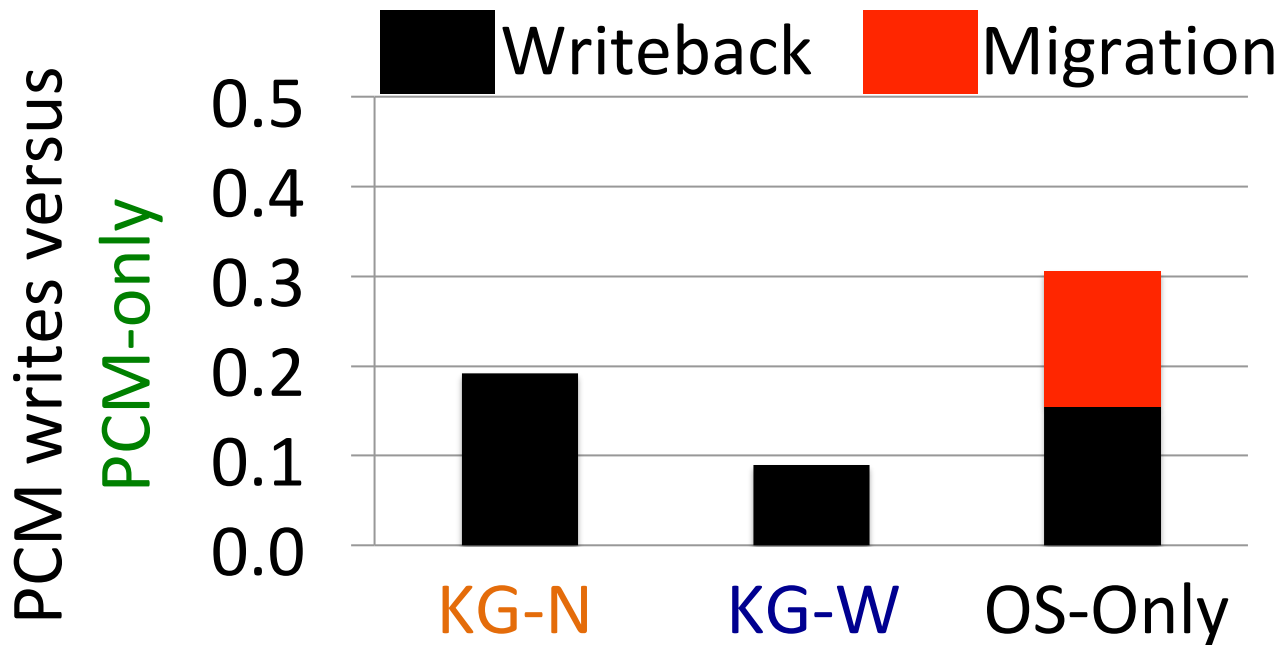
# OS versus Kingsguard



Average for 7 DaCapo benchmarks in simulation

KG-W reduces 3X more writes than OS-Only

# OS versus Kingsguard



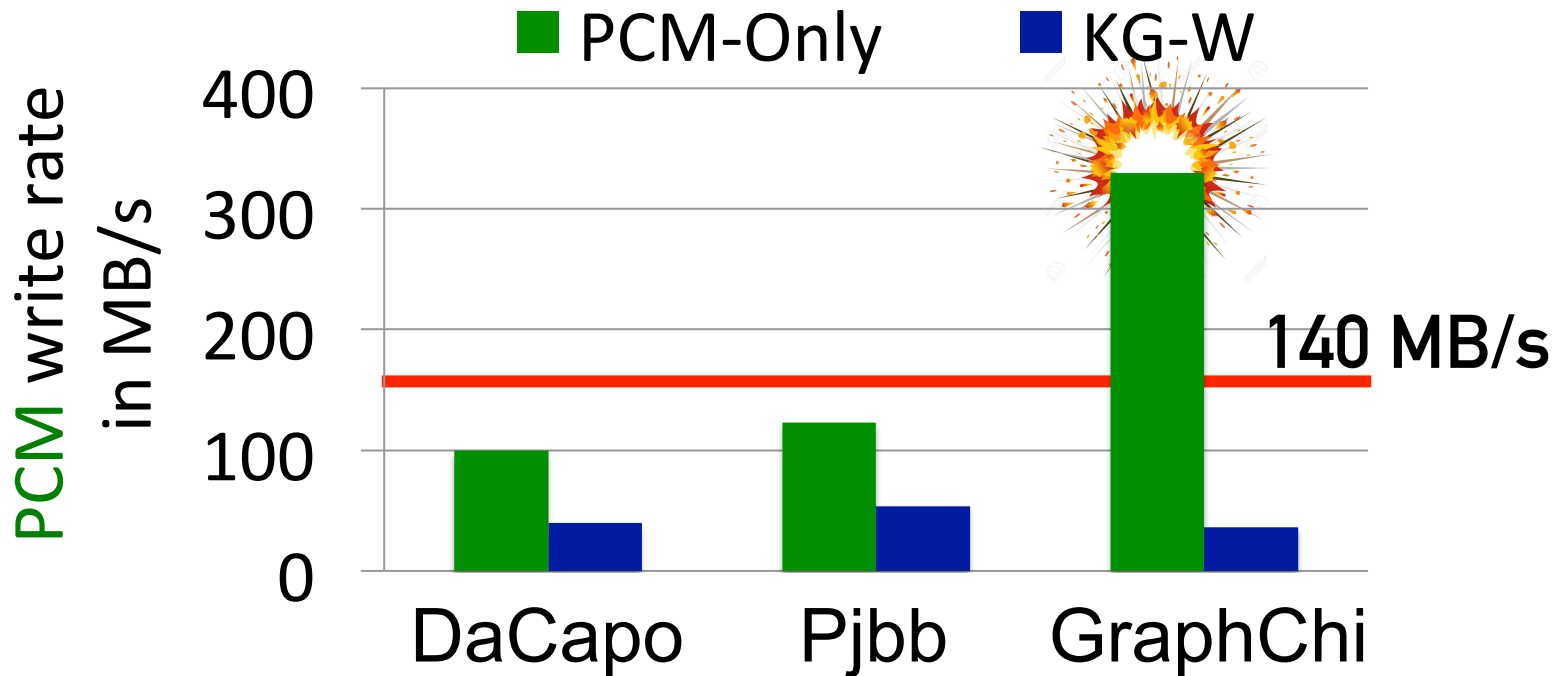
Average for 7 DaCapo benchmarks in simulation

OS predicts nursery pages but migrations harmful

# Emulation on NUMA hardware



# PCM-Only is not practical as main memory

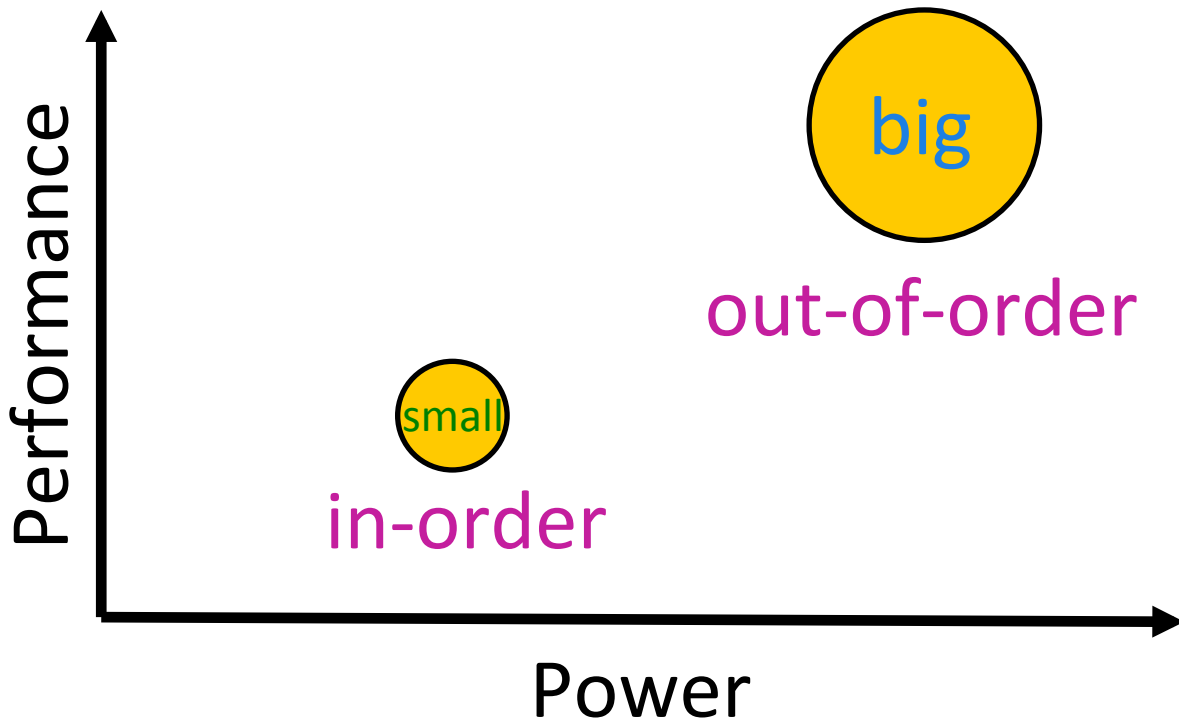


# Crystal Gazer: Profile-Driven Write-Rationing Garbage Collection for Hybrid Memories



# Heterogeneous multicore scheduling

Mutator → big, Concurrent GC → **big** or **small**?



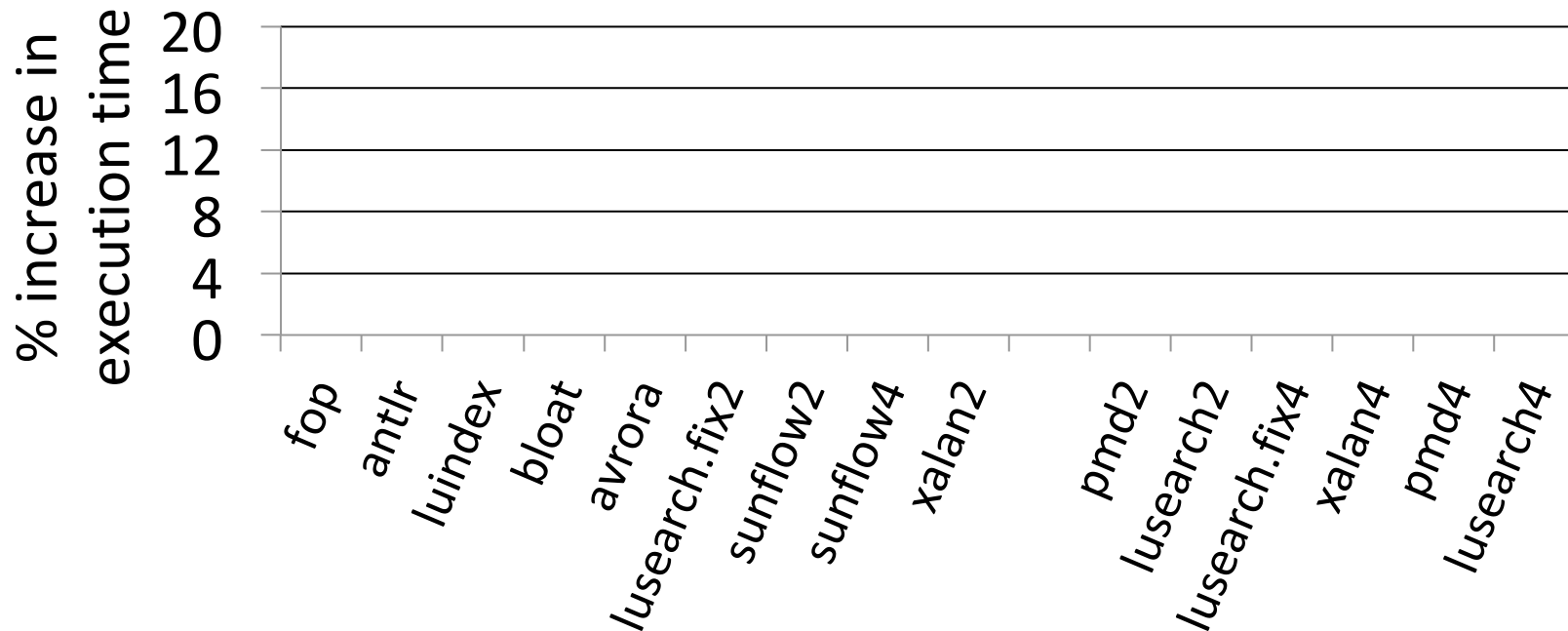


# GC on big or small

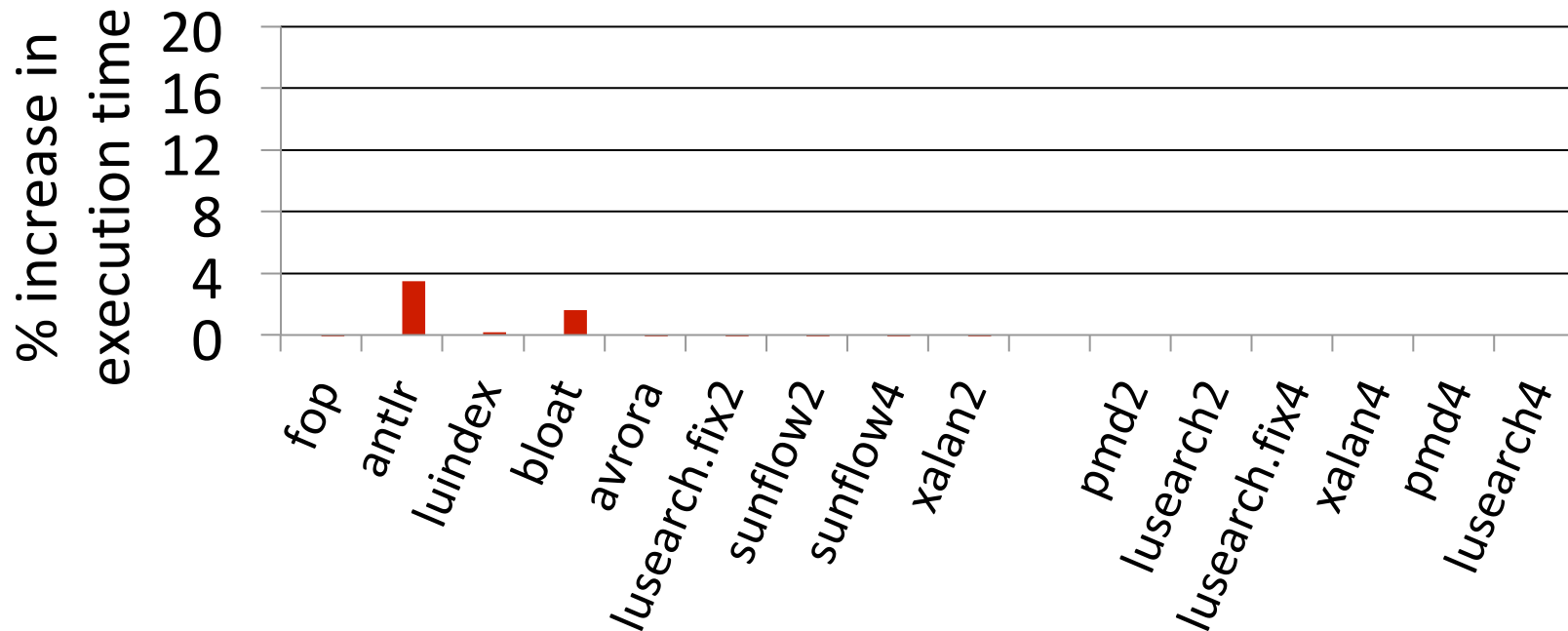


Slow GC pauses application due to no memory

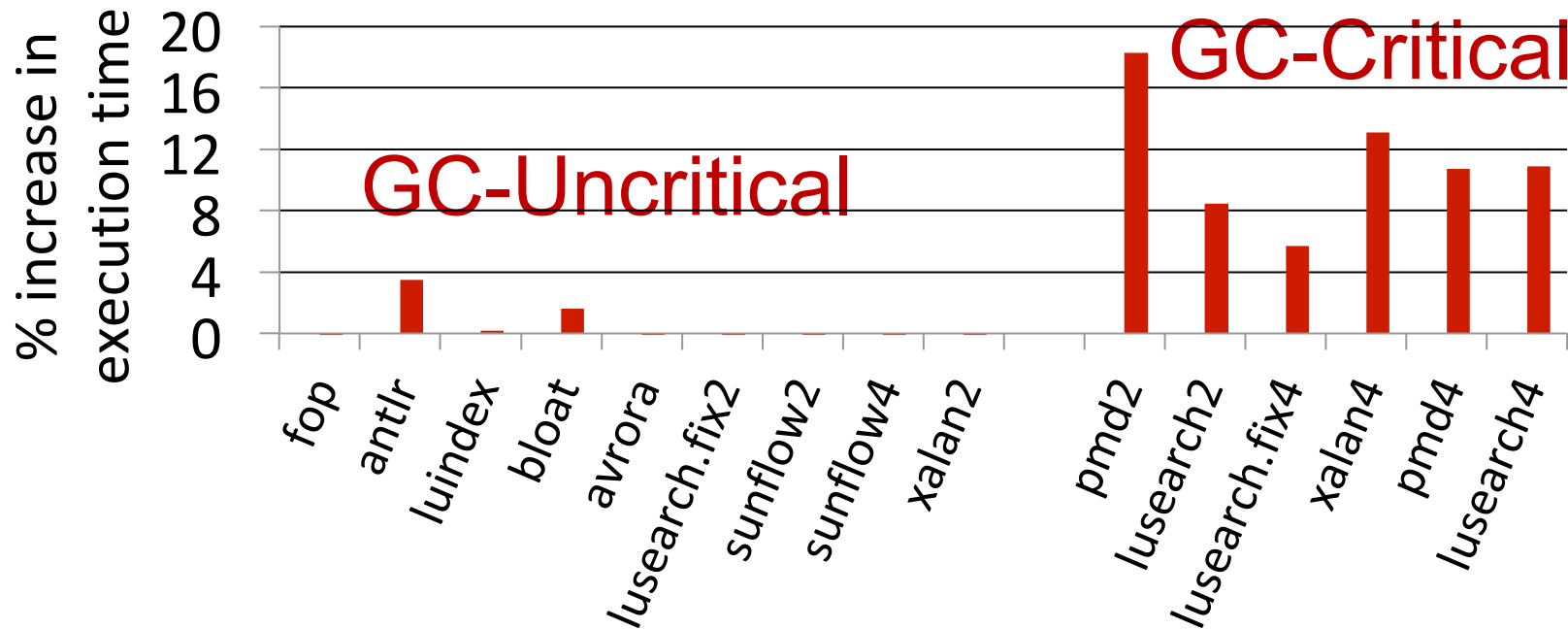
# GC on big or small



# GC on big or small



# GC on big or small

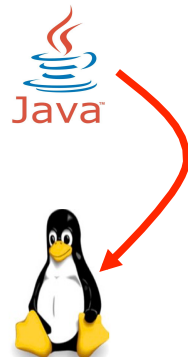


# GC-criticality-aware scheduling

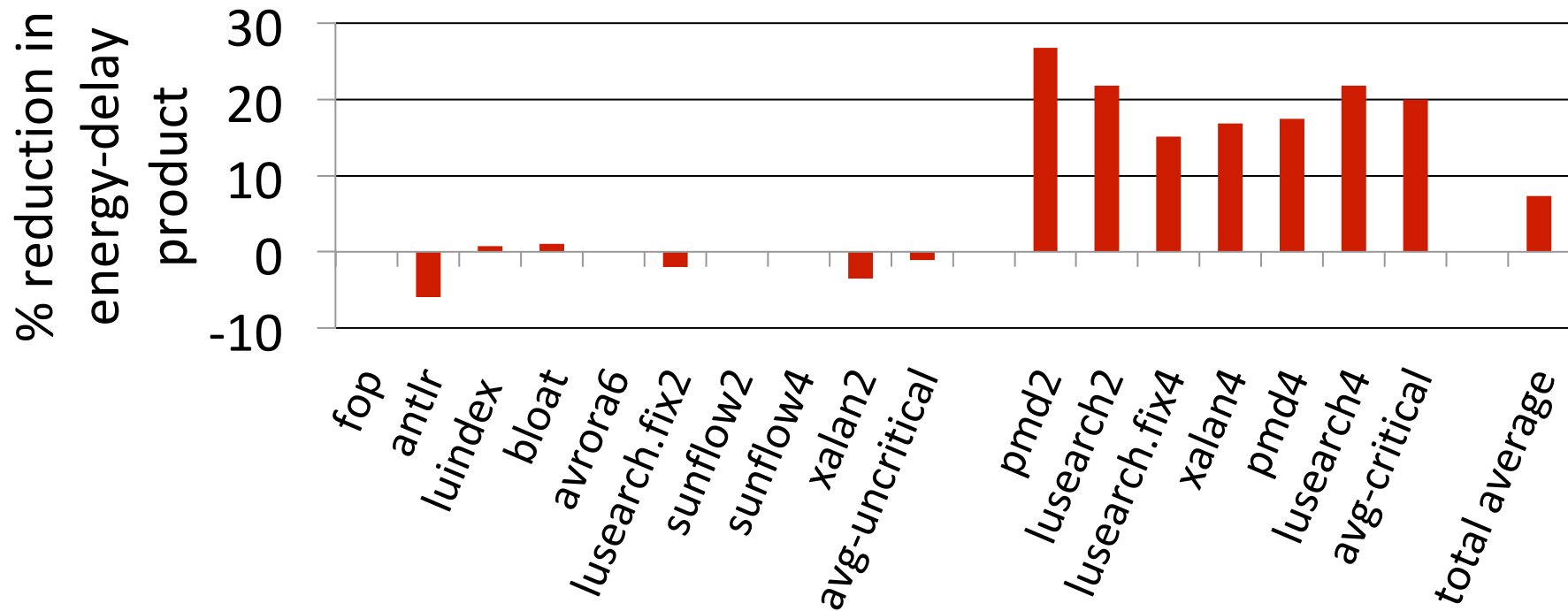
Runtime detects GC-criticality

Communicates criticality to the OS

OS adjusts GC priority



# Better energy efficiency with GC-criticality-aware scheduling



# To expose, or not to expose, hardware heterogeneity to runtimes

Always need OS (supervisory role)

Virtual memory, thread migration, and so on

Language runtimes can guide OS in forming  
the best policies to manage emerging hardware