# 18-447 Computer Architecture Lecture 32: Heterogeneous Systems

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Carnegie Mellon University
Spring 2014, 4/20/2015

#### Where We Are in Lecture Schedule

- The memory hierarchy
- Caches, caches, more caches
- Virtualizing the memory hierarchy: Virtual Memory
- Main memory: DRAM
- Main memory control, scheduling
- Memory latency tolerance techniques
- Non-volatile memory
- Multiprocessors
- Coherence and consistency
- In-memory computation and predictable performance
- Multi-core issues (e.g., heterogeneous multi-core)
- Interconnection networks

# First, Some Administrative Things

#### Midterm II and Midterm II Review

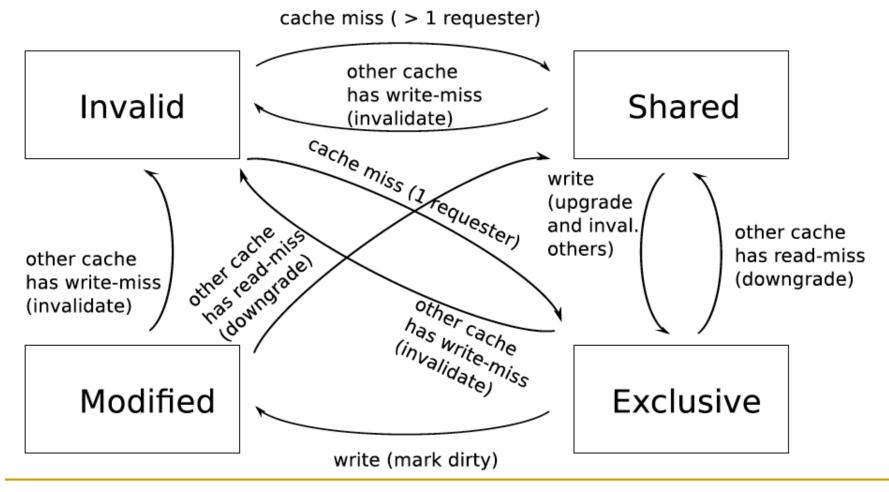
- Midterm II is this Friday (April 24, 2015)
  - 12:30-2:30pm, CIC Panther Hollow Room (4<sup>th</sup> floor)
  - Please arrive 5 minutes early and sit with 1-seat separation
  - Same rules as Midterm I except you get to have 2 cheat sheets
  - Covers all topics we have examined so far, with more focus on Lectures 17-32 (Memory Hierarchy and Multiprocessors)
- Midterm II Review is Wednesday (April 22)
  - Come prepared with questions on concepts and lectures
  - □ Detailed homework and exam questions and solutions → study on your own and ask TAs during office hours

## Suggestions for Midterm II

- Solve past midterms (and finals) on your own...
  - And, check your solutions vs. the online solutions
  - Questions will be similar in spirit
- http://www.ece.cmu.edu/~ece447/s15/doku.php?id=exams
- Do Homework 7 and go over past homeworks.
- Study and internalize the lecture material well.
  - Buzzwords can help you. Ditto for slides and videos.
- Understand how to solve all homework & exam questions.
- Study hard.
- Also read: <a href="https://piazza.com/class/i3540xiz8ku40a?cid=335">https://piazza.com/class/i3540xiz8ku40a?cid=335</a>

#### Lab 8: Multi-Core Cache Coherence

- Due May 3; Last submission accepted on May 10, 11:59pm
- Cycle-level modeling of the MESI cache coherence protocol



#### Reminder on Collaboration on 447 Labs

- Reminder of 447 policy:
  - Absolutely no form of collaboration allowed
  - No discussions, no code sharing, no code reviews with fellow students, no brainstorming, ...
- All labs and all portions of each lab has to be your own work
  - Just focus on doing the lab yourself, alone

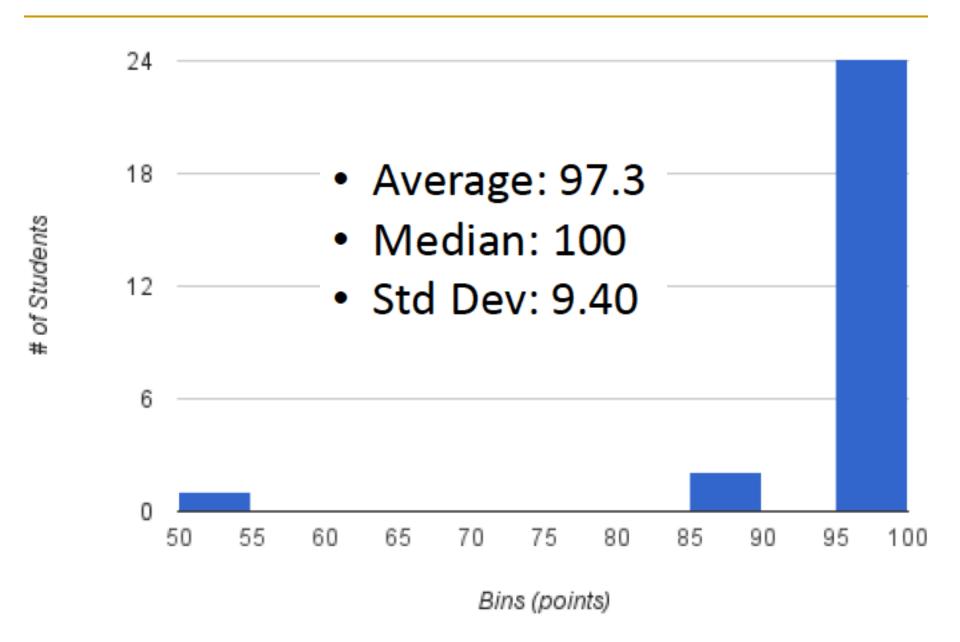
#### We Have Another Course for Collaboration

- 740 is the next course in sequence
- Tentative Time: Lect. MW 7:30-9:20pm, (Rect. T 7:30pm)
- Content:
  - Lectures: More advanced, with a different perspective
  - Recitations: Delving deeper into papers, advanced topics
  - Readings: Many fundamental and research readings; will do many reviews
  - □ Project: More open ended research project. Proposal →
     milestones → final poster and presentation
    - Done in groups of 1-3
    - Focus of the course is the project (and papers)
  - Exams: lighter and fewer
  - Homeworks: None

## A Note on Testing Your Own Code

- We provide the reference simulator to aid you
- Do not expect it to be given, and do not rely on it much
- In real life, there are no reference simulators
- The architect designs the reference simulator
- The architect verifies it
- The architect tests it
- The architect fixes it
- The architect makes sure there are no bugs
- The architect ensures the simulator matches the specification

#### Lab 6 Grade Distribution



## Lab 6 Extra Credit Recognitions

Stay tuned...

## Lab 4-5 Special Recognition

- Limited out-of-order execution
  - Terence An

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## Today

- Heterogeneity (asymmetry) in system design
- Evolution of multi-core systems
- Handling serial and parallel bottlenecks better
- Heterogeneous multi-core systems

## Heterogeneity (Asymmetry)

## Heterogeneity (Asymmetry) -> Specialization

- Heterogeneity and asymmetry have the same meaning
  - Contrast with homogeneity and symmetry
- Heterogeneity is a very general system design concept (and life concept, as well)
- Idea: Instead of having multiple instances of the same "resource" to be the same (i.e., homogeneous or symmetric), design some instances to be different (i.e., heterogeneous or asymmetric)
- Different instances can be optimized to be more efficient in executing different types of workloads or satisfying different requirements/goals
  - Heterogeneity enables specialization/customization

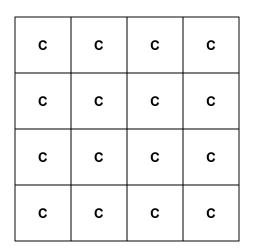
## Why Asymmetry in Design? (I)

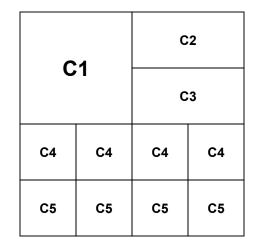
- Different workloads executing in a system can have different behavior
  - Different applications can have different behavior
  - Different execution phases of an application can have different behavior
  - The same application executing at different times can have different behavior (due to input set changes and dynamic events)
  - E.g., locality, predictability of branches, instruction-level parallelism, data dependencies, serial fraction, bottlenecks in parallel portion, interference characteristics, ...
- Systems are designed to satisfy different metrics at the same time
  - There is almost never a single goal in design, depending on design point
  - E.g., Performance, energy efficiency, fairness, predictability, reliability, availability, cost, memory capacity, latency, bandwidth, ...

## Why Asymmetry in Design? (II)

- Problem: Symmetric design is one-size-fits-all
- It tries to fit a single-size design to all workloads and metrics
- It is very difficult to come up with a single design
  - that satisfies all workloads even for a single metric
  - that satisfies all design metrics at the same time
- This holds true for different system components, or resources
  - Cores, caches, memory, controllers, interconnect, disks, servers, ...
  - Algorithms, policies, ...

## Asymmetry Enables Customization





Symmetric

Asymmetric

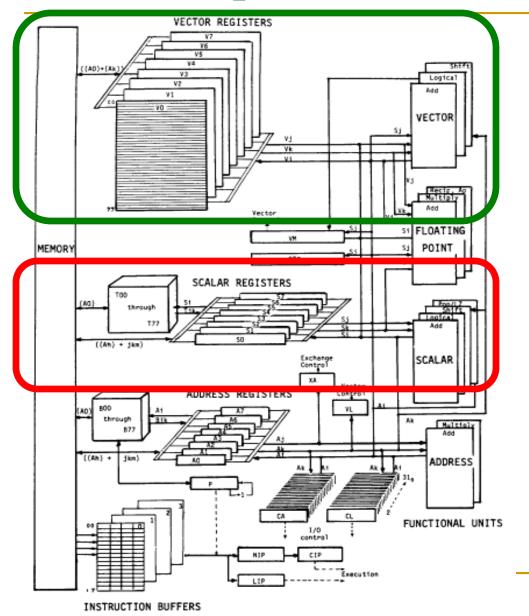
- Symmetric: One size fits all
  - Energy and performance suboptimal for different "workload" behaviors
- Asymmetric: Enables customization and adaptation
  - Processing requirements vary across workloads (applications and phases)
  - Execute code on best-fit resources (minimal energy, adequate perf.)

### We Have Already Seen Examples Before (in 447)

- CRAY-1 design: scalar + vector pipelines
- Modern processors: scalar instructions + SIMD extensions
- Decoupled Access Execute: access + execute processors
- Thread Cluster Memory Scheduling: different memory scheduling policies for different thread clusters
- RAIDR: Heterogeneous refresh rate
- Hybrid memory systems
  - DRAM + Phase Change Memory
  - Fast, Costly DRAM + Slow, Cheap DRAM
  - Reliable, Costly DRAM + Unreliable, Cheap DRAM

**...** 

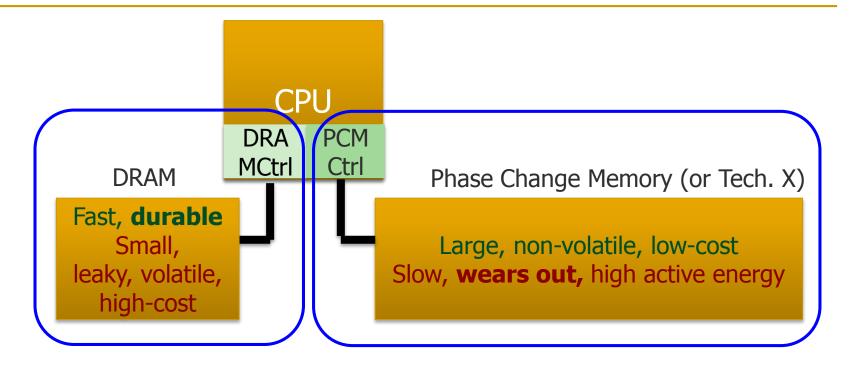
## An Example Asymmetric Design: CRAY-1



- CRAY-1
- Russell, "The CRAY-1 computer system," CACM 1978.
- Scalar and vector modes
- 8 64-element vector registers
- 64 bits per element
- 16 memory banks
- 8 64-bit scalar registers
- 8 24-bit address registers

21

## Remember: Hybrid Memory Systems



Hardware/software manage data allocation and movement to achieve the best of multiple technologies

Meza+, "Enabling Efficient and Scalable Hybrid Memories," IEEE Comp. Arch. Letters, 2012. Yoon, Meza et al., "Row Buffer Locality Aware Caching Policies for Hybrid Memories," ICCD 2012 Best Paper Award.

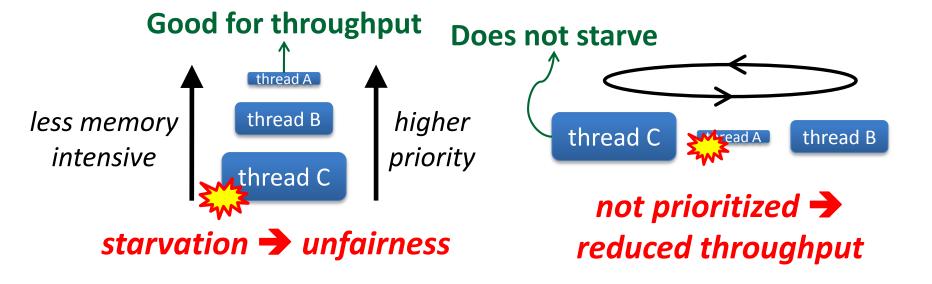
## Remember: Throughput vs. Fairness

#### Throughput biased approach

Prioritize less memory-intensive threads

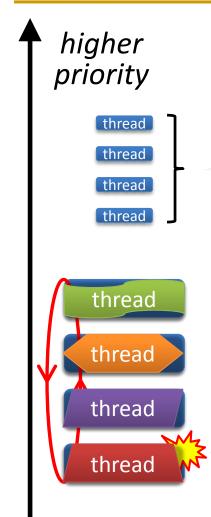
#### Fairness biased approach

Take turns accessing memory



Single policy for all threads is insufficient

#### Remember: Achieving the Best of Both Worlds



#### For Throughput



**Prioritize memory-non-intensive threads** 

#### **For Fairness**

- Unfairness caused by memory-intensive being prioritized over each other
  - Shuffle thread ranking
- Memory-intensive threads have different vulnerability to interference
  - Shuffle <u>asymmetrically</u>

#### Remember: Heterogeneous Retention Times in DRAM

64-128ms

>256ms

128-256ms

## Aside: Examples from Life

- Heterogeneity is abundant in life
  - both in nature and human-made components
- Humans are heterogeneous
- Cells are heterogeneous → specialized for different tasks
- Organs are heterogeneous
- Cars are heterogeneous
- Buildings are heterogeneous
- Rooms are heterogeneous
- ...

## General-Purpose vs. Special-Purpose

- Asymmetry is a way of enabling specialization
- It bridges the gap between purely general purpose and purely special purpose
  - Purely general purpose: Single design for every workload or metric
  - Purely special purpose: Single design per workload or metric
  - Asymmetric: Multiple sub-designs optimized for sets of workloads/metrics and glued together
- The goal of a good asymmetric design is to get the best of both general purpose and special purpose

## Asymmetry Advantages and Disadvantages

- Advantages over Symmetric Design
  - + Can enable optimization of multiple metrics
  - + Can enable better adaptation to workload behavior
  - + Can provide special-purpose benefits with general-purpose usability/flexibility
- Disadvantages over Symmetric Design
  - Higher overhead and more complexity in design, verification
  - Higher overhead in management: scheduling onto asymmetric components
  - Overhead in switching between multiple components can lead to degradation

## Yet Another Example

- Modern processors integrate general purpose cores and GPUs
  - CPU-GPU systems
  - Heterogeneity in execution models

## Three Key Problems in Future Systems

- Memory system
  - Applications are increasingly data intensive
  - Data storage and movement limits performance & efficiency
- Efficiency (performance and energy) → scalability
  - □ Enables scalable systems → new applications
  - □ Enables better user experience → new usage models
- Predictability and robustness

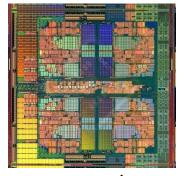
Asymmetric Designs
Can Help Solve These Problems

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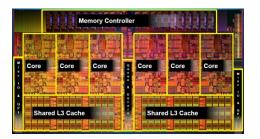
## Multi-Core Design

## Many Cores on Chip

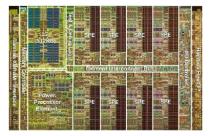
- Simpler and lower power than a single large core
- Large scale parallelism on chip



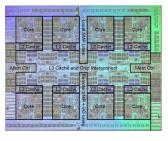
AMD Barcelona 4 cores



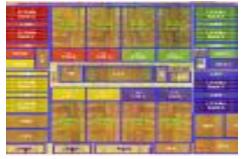
Intel Core i7 8 cores



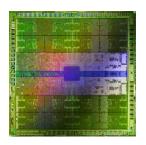
IBM Cell BE 8+1 cores



IBM POWER7 8 cores



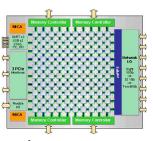
Sun Niagara II 8 cores



Nvidia Fermi 448 "cores"



Intel SCC 48 cores, networked



Tilera TILE Gx 100 cores, networked

## With Many Cores on Chip

#### What we want:

 N times the performance with N times the cores when we parallelize an application on N cores

#### What we get:

- Amdahl's Law (serial bottleneck)
- Bottlenecks in the parallel portion

#### Caveats of Parallelism

- Amdahl's Law
  - f: Parallelizable fraction of a program
  - N: Number of processors

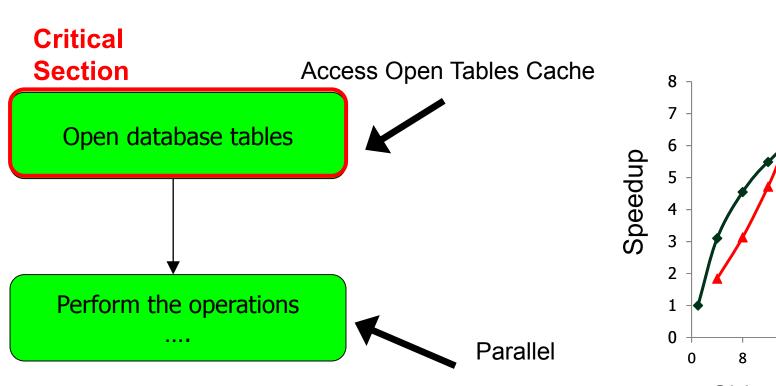
Speedup = 
$$\frac{1}{1 - f} + \frac{f}{N}$$

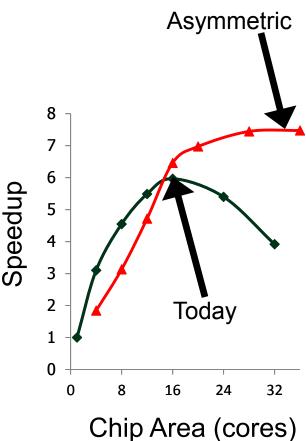
- Amdahl, "Validity of the single processor approach to achieving large scale computing capabilities," AFIPS 1967.
- Maximum speedup limited by serial portion: Serial bottleneck
- Parallel portion is usually not perfectly parallel
  - Synchronization overhead (e.g., updates to shared data)
  - Load imbalance overhead (imperfect parallelization)
  - Resource sharing overhead (contention among N processors)

#### The Problem: Serialized Code Sections

- Many parallel programs cannot be parallelized completely
- Causes of serialized code sections
  - Sequential portions (Amdahl's "serial part")
  - Critical sections
  - Barriers
  - Limiter stages in pipelined programs
- Serialized code sections
  - Reduce performance
  - Limit scalability
  - Waste energy

## Example from MySQL





### Demands in Different Code Sections

- What we want:
- In a serialized code section → one powerful "large" core
- In a parallel code section → many wimpy "small" cores
- These two conflict with each other:
  - If you have a single powerful core, you cannot have many cores
  - A small core is much more energy and area efficient than a large core

### "Large" vs. "Small" Cores

Large Core

- Out-of-order
- Wide fetch e.g. 4-wide
- Deeper pipeline
- Aggressive branch predictor (e.g. hybrid)
- Multiple functional units
- Trace cache
- Memory dependence speculation

Small Core

- In-order
- Narrow Fetch e.g. 2-wide
- Shallow pipeline
- Simple branch predictor (e.g. Gshare)
- Few functional units

Large Cores are power inefficient: e.g., 2x performance for 4x area (power)

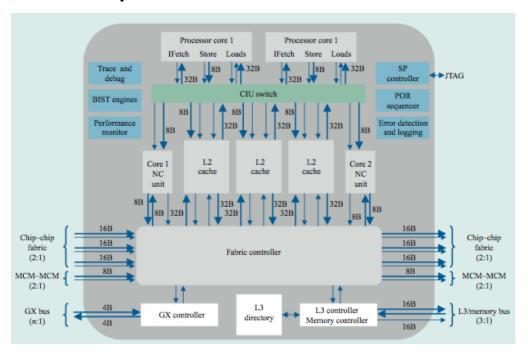
### Large vs. Small Cores

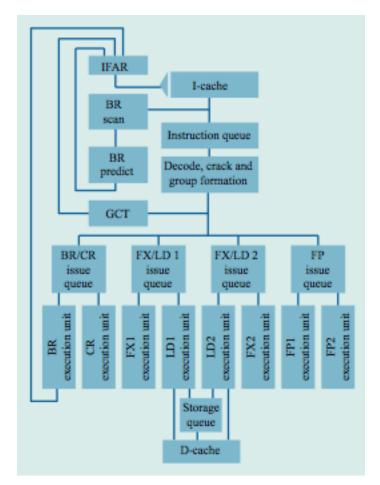
 Grochowski et al., "Best of both Latency and Throughput," ICCD 2004.

	Large core	Small core
Microarchitecture	Out-of-order, 128-256 entry ROB	In-order
Width	3-4	1
Pipeline depth	20-30	5
Normalized performance	5-8x	1x
Normalized power	20-50x	1x
Normalized energy/instruction	4-6x	1x

### Meet Large: IBM POWER4

- Tendler et al., "POWER4 system microarchitecture," IBM J R&D, 2002.
- A symmetric multi-core chip...
- Two powerful cores





### IBM POWER4

- 2 cores, out-of-order execution
- 100-entry instruction window in each core
- 8-wide instruction fetch, issue, execute
- Large, local+global hybrid branch predictor
- 1.5MB, 8-way L2 cache
- Aggressive stream based prefetching

#### IBM POWER5

 Kalla et al., "IBM Power5 Chip: A Dual-Core Multithreaded Processor," IEEE Micro 2004.

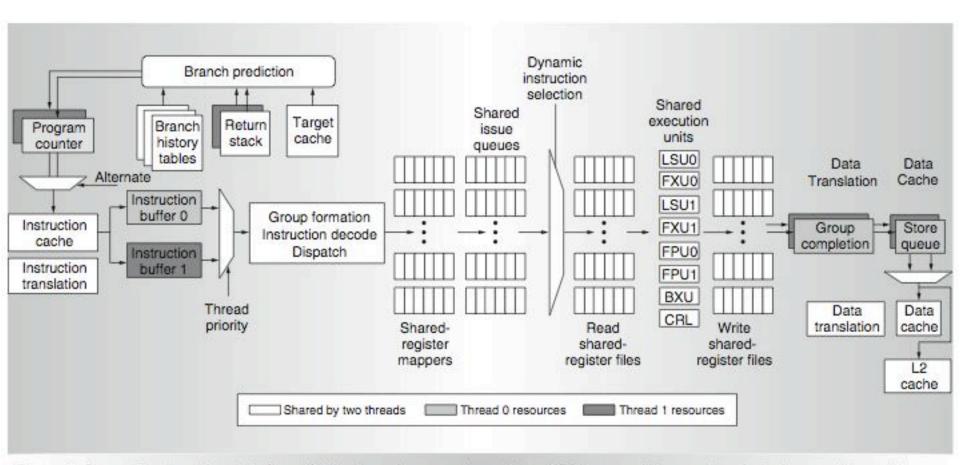
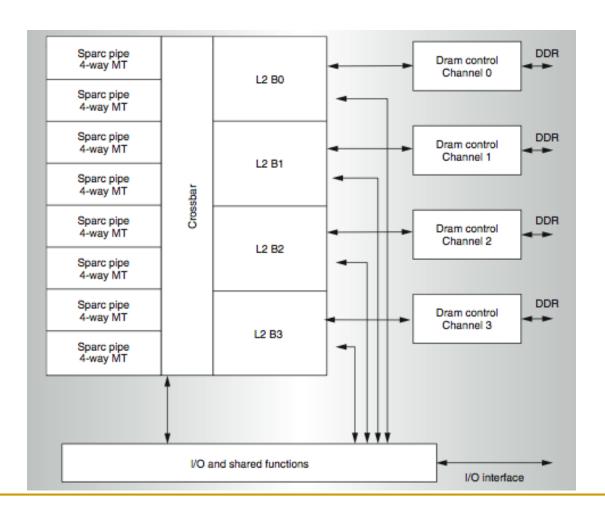


Figure 4. Power5 instruction data flow (BXU = branch execution unit and CRL = condition register logical execution unit).

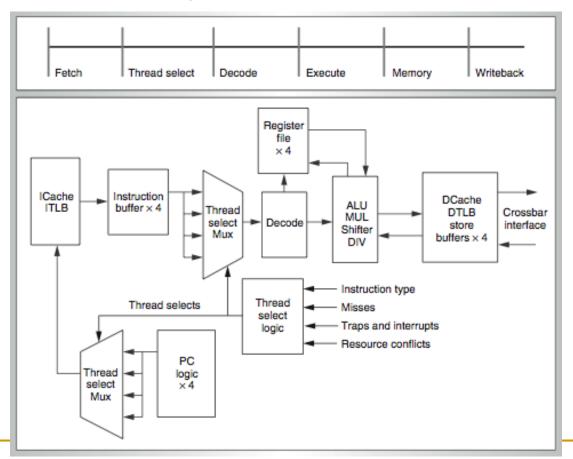
# Meet Small: Sun Niagara (UltraSPARC T1)

 Kongetira et al., "Niagara: A 32-Way Multithreaded SPARC Processor," IEEE Micro 2005.



# Niagara Core

- 4-way fine-grain multithreaded, 6-stage, dual-issue in-order
- Round robin thread selection (unless cache miss)
- Shared FP unit among cores



#### Remember the Demands

- What we want:
- In a serialized code section → one powerful "large" core
- In a parallel code section → many wimpy "small" cores
- These two conflict with each other:
  - If you have a single powerful core, you cannot have many cores
  - A small core is much more energy and area efficient than a large core
- Can we get the best of both worlds?

### Performance vs. Parallelism

#### Assumptions:

- 1. Small cores takes an area budget of 1 and has performance of 1
- 2. Large core takes an area budget of 4 and has performance of 2

# Tile-Large Approach

Large	Large
core	core
Large	Large
core	core

"Tile-Large"

- Tile a few large cores
- IBM Power 5, AMD Barcelona, Intel Core2Quad, Intel Nehalem
- + High performance on single thread, serial code sections (2 units)
- Low throughput on parallel program portions (8 units)

### Tile-Small Approach

Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core

"Tile-Small"

- Tile many small cores
- Sun Niagara, Intel Larrabee, Tilera TILE (tile ultra-small)
- + High throughput on the parallel part (16 units)
- Low performance on the serial part, single thread (1 unit)

### Can we get the best of both worlds?

- Tile Large
  - + High performance on single thread, serial code sections (2 units)
  - Low throughput on parallel program portions (8 units)
- Tile Small
  - + High throughput on the parallel part (16 units)
  - Low performance on the serial part, single thread (1 unit), reduced single-thread performance compared to existing single thread processors
- Idea: Have both large and small on the same chip → Performance asymmetry

# Asymmetric Multi-Core

# Asymmetric Chip Multiprocessor (ACMP)

Large	Large
core	core
Large	Large
core	core

Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core

Large		Small core	Small core
CO	ore	Small core	Small core
Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core

"Tile-Large"

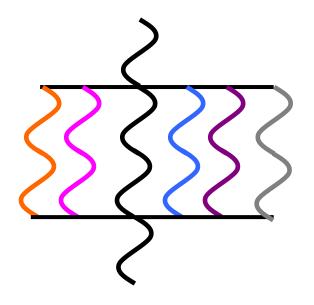
"Tile-Small"

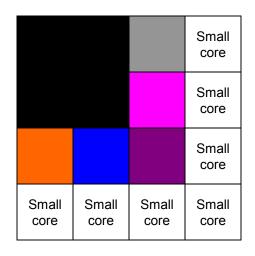
**ACMP** 

- Provide one large core and many small cores
- + Accelerate serial part using the large core (2 units)
- + Execute parallel part on small cores and large core for high throughput (12+2 units)

# Accelerating Serial Bottlenecks

#### Single thread → Large core





**ACMP Approach** 

### Performance vs. Parallelism

#### Assumptions:

- 1. Small cores takes an area budget of 1 and has performance of 1
- 2. Large core takes an area budget of 4 and has performance of 2

### ACMP Performance vs. Parallelism

Area-budget = 16 small cores

Large	Large			
core	core			
Large	Large			
core	core			
"Tile-Large"				

1	Small core	
1	Small core	
1	Small core	
1	Small core	

"Tile-Small"

Large		Small core	Small core
core		Small core	Small core
Small core	Small core	Small core	Small core
Small core	Small core	Small core	Small core

**ACMP** 

Large Cores	4	0	1
Small Cores	0	16	12
Serial Performance	2	1	2
Parallel Throughput	2 x 4 = 8	1 x 16 = 16	1x2 + 1x12 = 14

5

### Amdahl's Law Modified

- Simplified Amdahl's Law for an Asymmetric Multiprocessor
- Assumptions:
  - Serial portion executed on the large core
  - Parallel portion executed on both small cores and large cores
  - f: Parallelizable fraction of a program
  - L: Number of large processors
  - S: Number of small processors
  - X: Speedup of a large processor over a small one

Speedup = 
$$\frac{1}{\frac{1-f}{X}} + \frac{f}{S+X^*L}$$

### Caveats of Parallelism, Revisited

- Amdahl's Law
  - f: Parallelizable fraction of a program
  - N: Number of processors

Speedup = 
$$\frac{1}{1 - f} + \frac{f}{N}$$

- Amdahl, "Validity of the single processor approach to achieving large scale computing capabilities," AFIPS 1967.
- Maximum speedup limited by serial portion: Serial bottleneck
- Parallel portion is usually not perfectly parallel
  - Synchronization overhead (e.g., updates to shared data)
  - Load imbalance overhead (imperfect parallelization)
  - Resource sharing overhead (contention among N processors)

### Accelerating Parallel Bottlenecks

 Serialized or imbalanced execution in the parallel portion can also benefit from a large core

#### Examples:

- Critical sections that are contended
- Parallel stages that take longer than others to execute
- Idea: Dynamically identify these code portions that cause serialization and execute them on a large core

# Accelerated Critical Sections

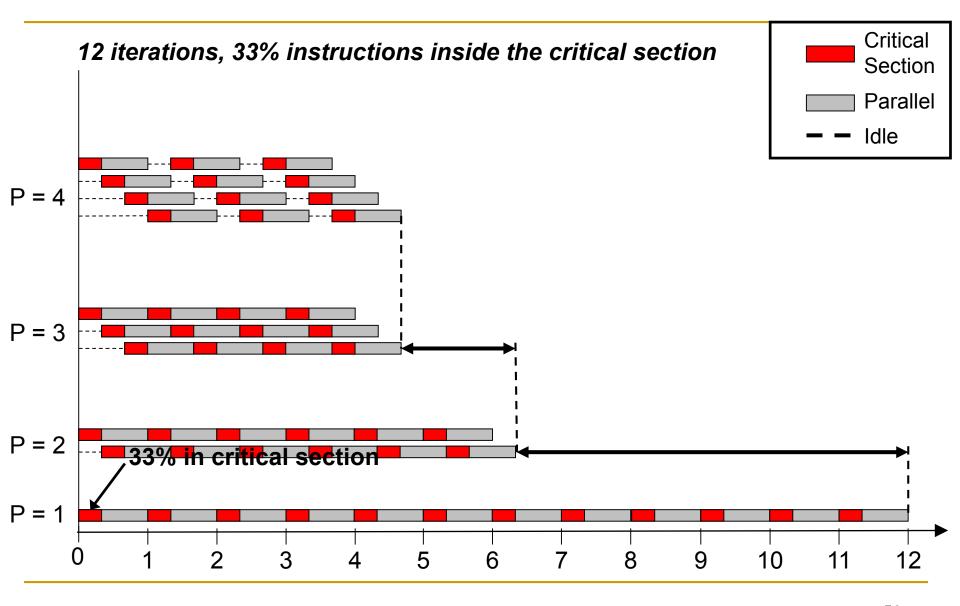
M. Aater Suleman, <u>Onur Mutlu</u>, Moinuddin K. Qureshi, and Yale N. Patt,

"Accelerating Critical Section Execution with Asymmetric Multi-Core Architectures"

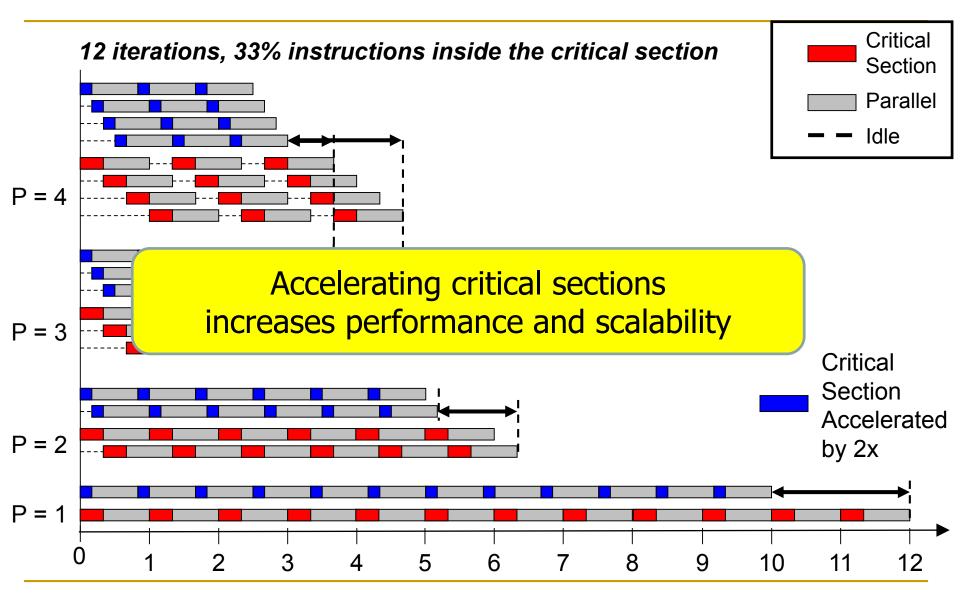
Proceedings of the <u>14th International Conference on Architectural Support for Programming</u>

<u>Languages and Operating Systems</u> (ASPLOS), 2009

### Contention for Critical Sections

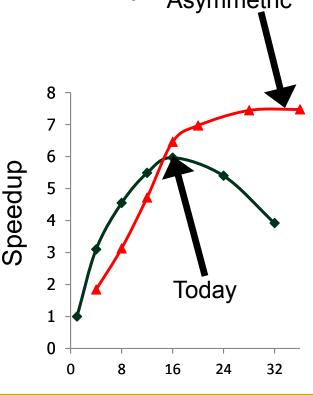


### Contention for Critical Sections



# Impact of Critical Sections on Scalability

- Contention for critical sections leads to serial execution (serialization) of threads in the parallel program portion
- Contention for critical sections increases with the number of threads and limits scalability Asymmetric



MySQL (oltp-1)

Chip Area (cores)

### A Case for Asymmetry

- Execution time of sequential kernels, critical sections, and limiter stages must be short
- It is difficult for the programmer to shorten these serialized sections
  - Insufficient domain-specific knowledge
  - Variation in hardware platforms
  - Limited resources
- Goal: A mechanism to shorten serial bottlenecks without requiring programmer effort
- Idea: Accelerate serialized code sections by shipping them to powerful cores in an asymmetric multi-core (ACMP)

# An Example: Accelerated Critical Sections

Idea: HW/SW ships critical sections to a large, powerful core in an asymmetric multi-core architecture

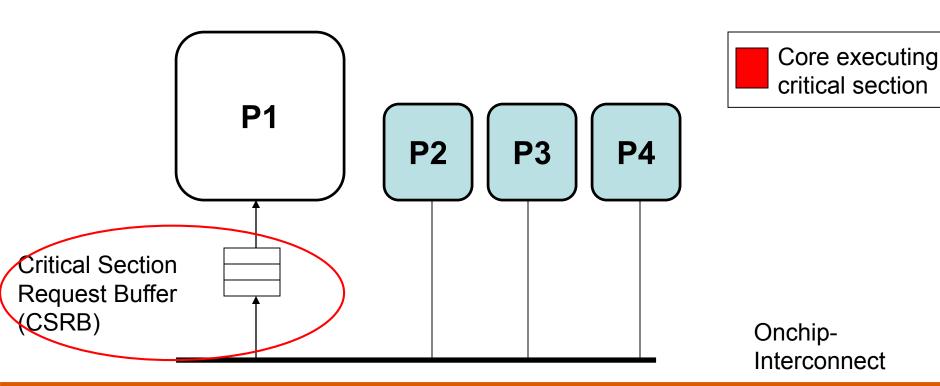
#### Benefit:

- Reduces serialization due to contended locks
- Reduces the performance impact of hard-to-parallelize sections
- □ Programmer does not need to (heavily) optimize parallel code → fewer bugs, improved productivity
- Suleman et al., "Accelerating Critical Section Execution with Asymmetric Multi-Core Architectures," ASPLOS 2009, IEEE Micro Top Picks 2010.
- Suleman et al., "Data Marshaling for Multi-Core Architectures," ISCA 2010, IEEE Micro Top Picks 2011.

#### **Accelerated Critical Sections**

EnterCS()
PriorityQ.insert(...)
LeaveCS()

- 1. P2 encounters a critical section (CSCALL)
- 2. P2 sends CSCALL Request to CSRB
- 3. P1 executes Critical Section
- 4. P1 sends CSDONE signal



# Accelerated Critical Sections (ACS)

#### Small Core

A = compute()

result = CS(A)
UNLOCK X

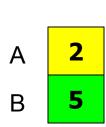
print result

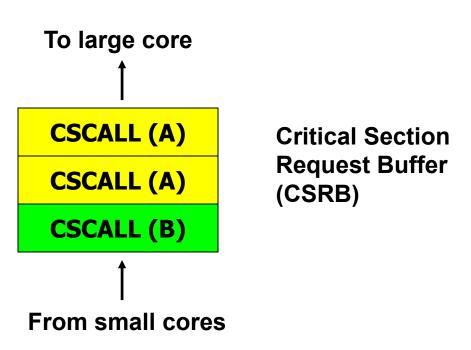
```
Small Core
                                               Large Core
A = compute()
PUSHA
CSCALL X, Target PC
                         CSCALL Request
                           Send X, TPC,
                        STACK PTR, CORE ID
                                             TPC: Acquire X
                                                   POP A
                                                   result = CS(A)
                                                   PUSH result
                                                   Release X
                                                   CSRET X
                        CSDONE Response
POP result
print result
```

 Suleman et al., "Accelerating Critical Section Execution with Asymmetric Multi-Core Architectures," ASPLOS 2009.

#### False Serialization

- ACS can serialize independent critical sections
- Selective Acceleration of Critical Sections (SEL)
  - Saturating counters to track false serialization





### ACS Performance Tradeoffs

#### Pluses

- + Faster critical section execution
- + Shared locks stay in one place: better lock locality
- + Shared data stays in large core's (large) caches: better shared data locality, less ping-ponging

#### Minuses

- Large core dedicated for critical sections: reduced parallel throughput
- CSCALL and CSDONE control transfer overhead
- Thread-private data needs to be transferred to large core: worse private data locality

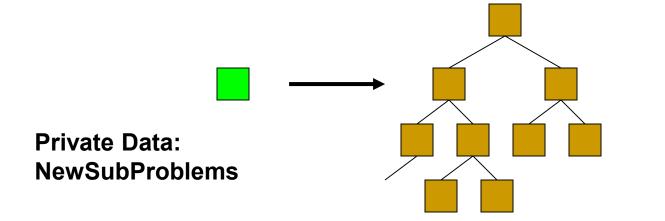
### ACS Performance Tradeoffs

#### Fewer parallel threads vs. accelerated critical sections

- Accelerating critical sections offsets loss in throughput
- As the number of cores (threads) on chip increase:
  - Fractional loss in parallel performance decreases
  - Increased contention for critical sections makes acceleration more beneficial
- Overhead of CSCALL/CSDONE vs. better lock locality
  - ACS avoids "ping-ponging" of locks among caches by keeping them at the large core
- More cache misses for private data vs. fewer misses for shared data

### Cache Misses for Private Data

#### PriorityHeap.insert(NewSubProblems)



Shared Data: The priority heap

**Puzzle Benchmark** 

### ACS Performance Tradeoffs

#### Fewer parallel threads vs. accelerated critical sections

- Accelerating critical sections offsets loss in throughput
- As the number of cores (threads) on chip increase:
  - Fractional loss in parallel performance decreases
  - Increased contention for critical sections makes acceleration more beneficial

#### Overhead of CSCALL/CSDONE vs. better lock locality

 ACS avoids "ping-ponging" of locks among caches by keeping them at the large core

# More cache misses for private data vs. fewer misses for shared data

Cache misses reduce if shared data > private data

This problem can be solved

# ACS Comparison Points

Small	Small	Small	Small
core	core	core	core
Small	Small	Small	Small
core	core	core	core
Small	Small	Small	Small
core	core	core	core
Small	Small	Small	Small
core	core	core	core

Lar	Large		Small core
СО	re	Small core	Small core
Small	Small	Small	Small
core	core	core	core
Small	Small	Small	Small
core	core	core	core

Large core		Small core	Small core
		Small core	Small core
Small	Small	Small	Small
core	core	core	core
Small	Small	Small	Small
core	core	core	core

#### **SCMP**

Conventional locking

#### **ACMP**

- Conventional locking
- Large core executes
   Amdahl's serial part

#### **ACS**

Large core executes
 Amdahl's serial part
 and critical sections

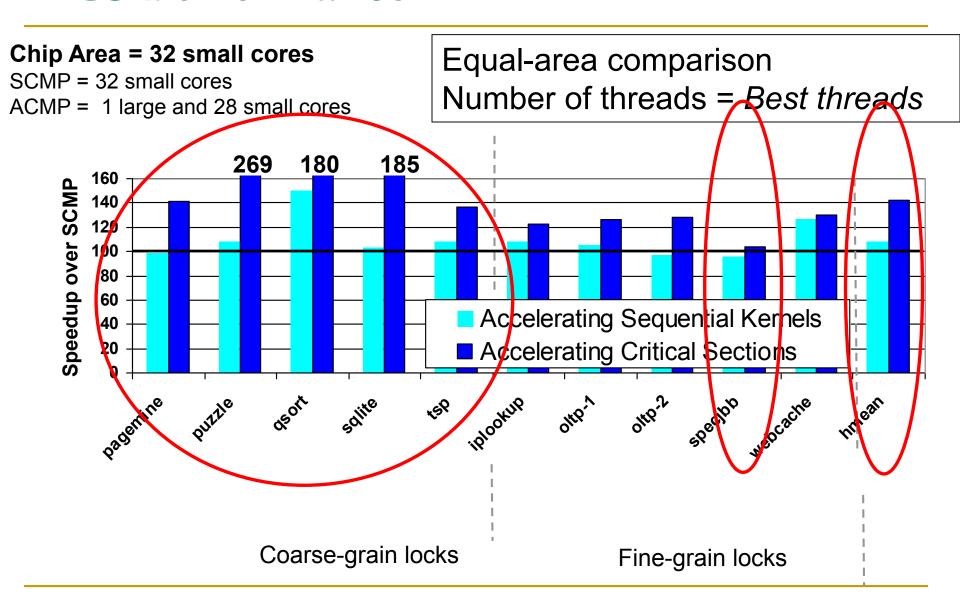
# Accelerated Critical Sections: Methodology

- Workloads: 12 critical section intensive applications
  - Data mining kernels, sorting, database, web, networking
- Multi-core x86 simulator
  - 1 large and 28 small cores
  - Aggressive stream prefetcher employed at each core

#### Details:

- Large core: 2GHz, out-of-order, 128-entry ROB, 4-wide, 12-stage
- Small core: 2GHz, in-order, 2-wide, 5-stage
- Private 32 KB L1, private 256KB L2, 8MB shared L3
- On-chip interconnect: Bi-directional ring, 5-cycle hop latency

### ACS Performance

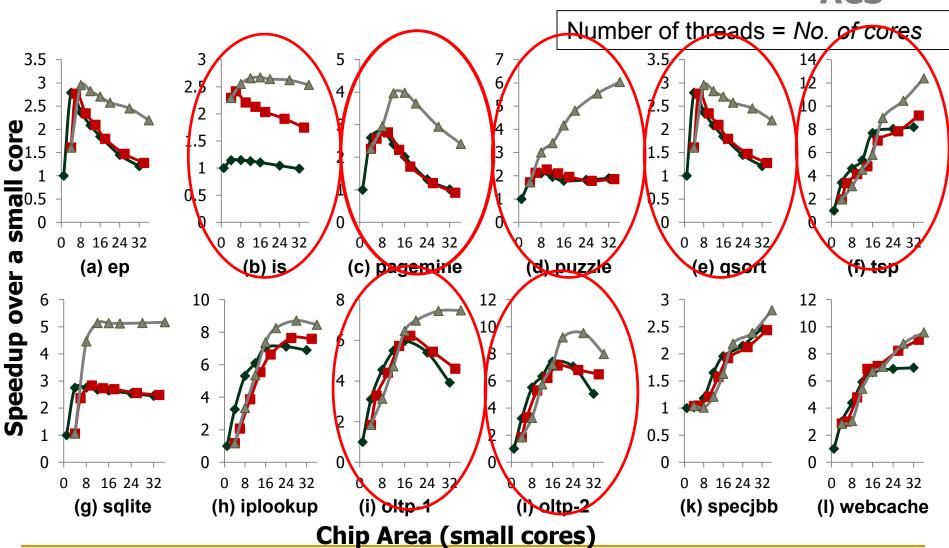


### Equal-Area Comparisons

----- SCMP

----- ACMP

----- ACS



### ACS Summary

- Critical sections reduce performance and limit scalability
- Accelerate critical sections by executing them on a powerful core
- ACS reduces average execution time by:
  - 34% compared to an equal-area SCMP
  - 23% compared to an equal-area ACMP
- ACS improves scalability of 7 of the 12 workloads
- Generalizing the idea: Accelerate all bottlenecks ("critical paths") by executing them on a powerful core