#### Lecture 16:

# Implementing Synchronization

Parallel Computer Architecture and Programming CMU 15-418/15-618, Spring 2016

#### Tunes

# Valerie June

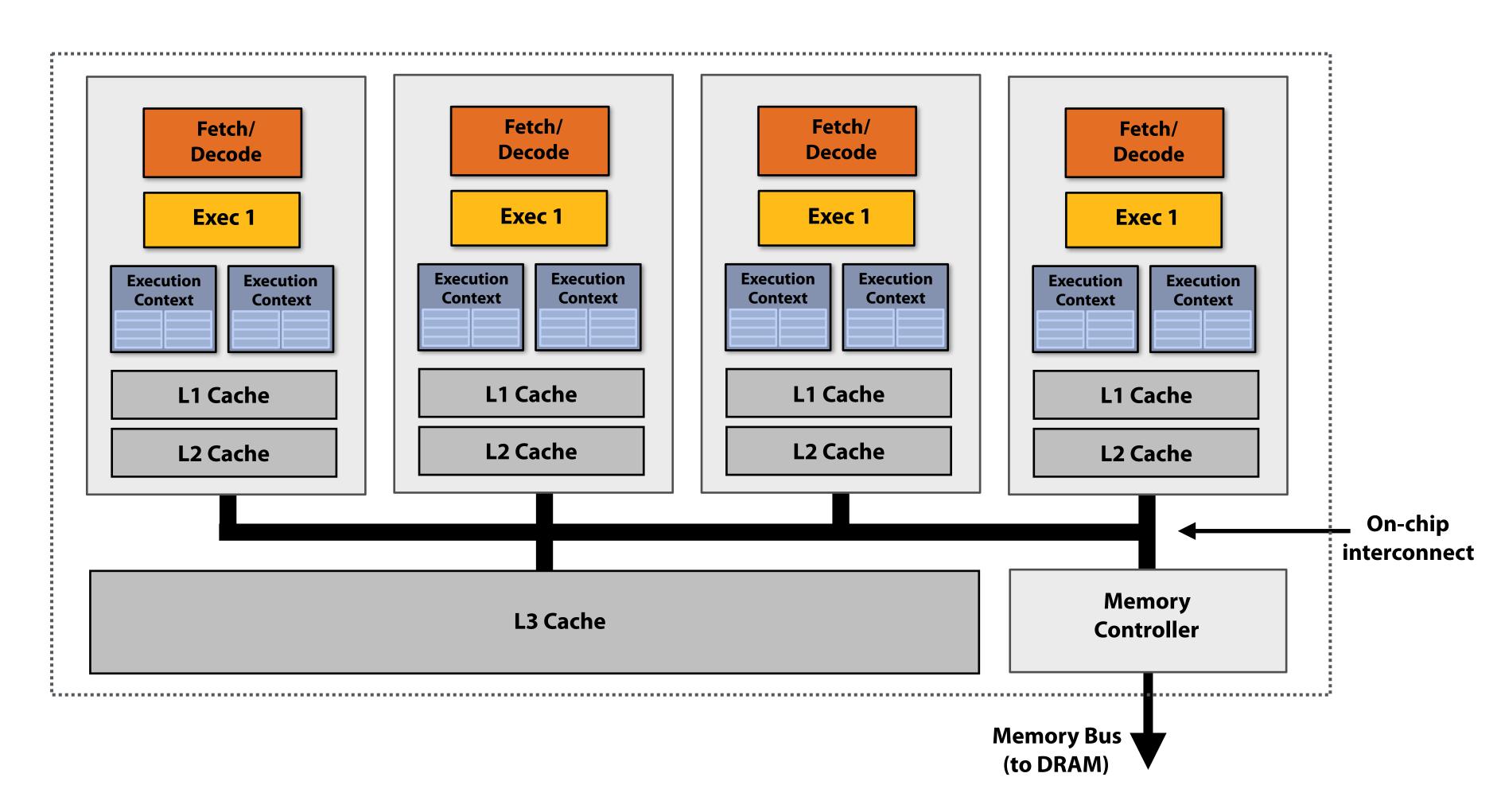
You Can't Be Told (Pushin' Against a Stone)

"The best projects are the projects students come up with on their own."

- Valerie June

## Review: how threads map to cores... again!

Let's say I have a processor with 4 cores, with support for 2 execution contexts per core. In each clock, each core executes one instruction (from one execution context)



# I can run many programs on this computer concurrently

For example, let's take a look at what's running on my Mac.

Process Name	% CPU ~	CPU Time	Threads	Idle Wake Ups	PID	User
kernel_task	9.6	4:18:35.98	132	85	0	root
Activity Monitor	8.5	2.64	7	4	5069	kayvonf
sysmond	2.6	2:52.94	4	1	184	root
WindowServer	1.4	1:21:43.91	4	10	150	_windowserver
loginwindow	1.1	26:01.92	2	49	95	kayvonf
Google Chrome	0.2	1:59:30.59	48	4	247	kayvonf
Keynote	0.2	6:20.06	7	9	4630	kayvonf
Dropbox	0.2	4:02.15	71	1	373	kayvonf
Google Chrome Helper	0.1	4.11	22	4	5052	kayvonf
Google Chrome Helper	0.1	5:19.26	20	0	4749	kayvonf
fseventsd	0.1	1:19.47	9	3	47	root
Dock	0.1	46.59	4	0	255	kayvonf
mds	0.1	4:31.62	6	2	61	root
powerd	0.1	8.96	2	0	54	root
dbfseventsd	0.1	54.82	1	0	430	kayvonf

Many processes, many of which has spawned many logical threads.

Many more logical threads than cores (and more threads than HW execution contexts)

Who is responsible for choosing what threads execute on the processor?

## What does running one thread entail?

- A processor runs a logical thread by executing its instructions within a hardware execution context.
- If the operating system wants thread T of process P to run, it:
  - 1. Chooses a CPU execution context
  - 2. It sets the register values in that context to the last state of the thread (e.g., sets PC to point to next instruction the thread must run, sets stack pointer, VM mappings, etc.)
  - 3. Then the processor starts running... It grabs the next instruction according to the PC, and executes it:
    - If the instruction is: add r0, r1, r2; then the processor adds the contexts of r1 and r2 and stores the result in r0
    - If the instruction is: 1d r0 mem[r1]; then the processor takes contents of r1, translates it to a physical address according to the page tables referenced by the execution context, and loads the value at that address into r0
    - **Etc...**

# The operating system maps logical threads to execution contexts

Process Name	% CPU ~	CPU Time	Threads	Idle Wake Ups	PID	User
kernel_task	9.6	4:18:35.98	132	85	0	root
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# Since there are more threads than execution contexts, the operating system must interleave execution of threads on the processor

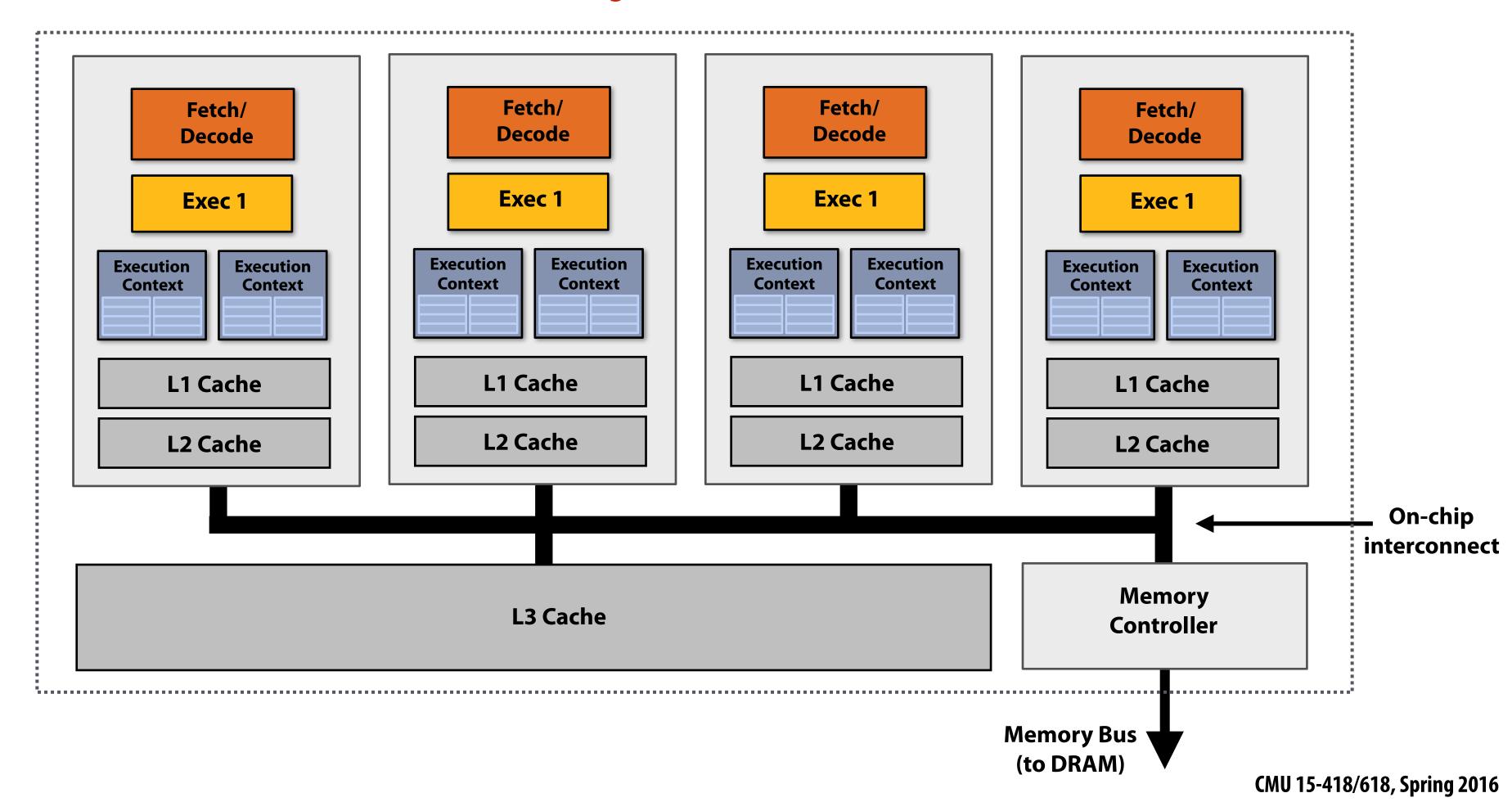
#### Periodically... the OS will:

- 1. Interrupts the processor
- 2. Copies the register state of threads currently mapped to execution contexts to OS data structures in memory
- 3. Copies the register state of other threads it now wants to run onto the processors execution context registers
- 4. Tell the processor to continue
  - Now these logical threads are running on the processor

# But how do 2 execution contexts run on a core that can only run one instruction per clock?

It is the responsibility of the processor (without OS intervention) to choose how to interleave execution of instructions from multiple execution contexts on the resources of a single core.

This is the idea of hardware multi-threading from Lecture 2.



# Output of 'less /proc/cpuinfo' on latedays

- Dual CPU (two socket)
- Six-cores per CPU, two threads per core
- Linux has 24 execution contexts to fill

```
processor
vendor_id
                : Genuine
model
                : Intel(R) Xeon(R) CPU E5-2620 v3 @ 2.40GHz
model name
stepping
cpu MHz
                : 2400.035
cache size
                : 15360 KB
                : 0
physical id
siblings
                : 12
core id
                : 0
                : 6
apicid
                : 0
initial apicid
                : yes
fpu_exception
              : yes
cpuid level
                : fpu vme de pse tsc msr pae mce cx8 apic sep mtrr pge
syscall nx pdpe1gb rdtscp lm constant_tsc arch_perfmon pebs bts rep_gc
cpl vmx smx est tm2 ssse3 fma cx16 xtpr pdcm pcid dca sse4_1 sse4_2 x
lm abm ida arat epb xsaveopt pln pts dts tpr_shadow vnmi flexpriority
bogomips
clflush size : 64
cache_alignment : 64
address sizes : 46 bits physical, 48 bits virtual
power management
processor
                : 1
vendor_id
                : Genui
                        eIntel
cpu family
model
                : Intel(R) Xeon(R) CPU E5-2620 v3 @ 2.40GHz
model name
stepping
                : 2
cpu MHz
                : 2400.035
cache size
                : 15360 KB
physical id
                : 1
siblings
                : 12
                : 0
core id
cpu cores
                : 6
                : 16
               : 16
                : yes
fpu_exception
                : yes
cpuid level
                : 15
wp
                : yes
                : fpu vme de pse tsc msr pae mce cx8 apic sep mtrr pge
syscall nx pdpe1gb rdtscp lm constant_tsc arch_perfmon pebs bts rep_ga
cpl vmx smx est tm2 ssse3 fma cx16 xtpr pdcm pcid dca sse4_1 sse4_2 x;
lm abm ida arat epb xsaveopt pln pts dts tpr_shadow vnmi flexpriority
bogomips
               : 4799.30
clflush size : 64
cache_alignment : 64
address sizes : 46 bits physical, 48 bits virtual
power management:
```

Linux reports it is running on a machine with 24 "logical processors" (corresponding to the 24 execution contexts available on the machine)

```
: 22
processor
vendor_id
                : Genuine Intel
cpu family
model
                : Intel(R) Xeon(R) CPU E5-2620 v3 @ 2.40GHz
model name
                : 2400.035
               : 15360 KB
cache size
               : 0
physical id
siblings
               : 12
core id
                : 5
cpu cores
                : 6
apicid
               : 11
initial apicid
               : 11
fpu_exception
cpuid level
               : 15
               : fpu vme de pse tsc msr pae mce cx8 apic sep mtrr pge mca cmc
syscall nx pdpe1gb rdtscp lm constant_tsc arch_perfmon pebs bts rep_good xtopc
cpl vmx smx est tm2 ssse3 fma cx16 xtpr pdcm pcid dca sse4_1 sse4_2 x2apic mov
lm abm ida arat epb xsaveopt pln pts dts tpr_shadow vnmi flexpriority ept vpic
               : 4800.07
bogomips
clflush size
             : 64
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address sizes : 46 bits physical, 48 bits virtual
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model name
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cpu MHz
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cache size
               : 1
physical id
siblings
                : 12
core id
                : 5
cpu cores
                : 6
apicid
                : 27
initial apicid : 27
fpu_exception
cpuid level
               : 15
flags
                : fpu vme de pse tsc msr pae mce cx8 apic sep mtrr pge mca cmc
syscall nx pdpe1gb rdtscp lm constant_tsc arch_perfmon pebs bts rep_good xtopc
cpl vmx smx est tm2 ssse3 fma cx16 xtpr pdcm pcid dca sse4_1 sse4_2 x2apic mov
lm abm ida arat epb xsaveopt pln pts dts tpr_shadow vnmi flexpriority ept vpic
                : 4799.30
clflush size : 64
cache_alignment : 64
address sizes : 46 bits physical, 48 bits virtual
power management:
```

# A few more words on projects

## Final project expectations

#### Frequently asked questions:

- Q. Do I need to do something that no one has done before?
- A. Nope. However I expect you to take on a challenge where I believe the answer should not be obvious to you based on what you've learned in the course so far.
  - Common Scenario: Student: "I am going to run a cat detector on 1M images from Youtube and parallelize it on a cluster." Prof. Kayvon: convince me why this is hard?
- Q. Can my project be a part of something bigger? (e.g., a project from my research lab)
- A. Absolutely. As long as you carve off a task that is clearly only being done you.
- Q. How much work is expected?
- A. Including the proposal period, the project is 6 weeks of the course. We are expecting proportional effort. (For example, we are expecting at least 2 class assignments worth of work.)
- Q. What if I need special equipment?
- A. Contact the staff soon. We can help you find resources around CMU: high-core count machines, GPUs, Oculus Rifts, FPGAs, Raspberry Pi's, Tegra K1's, etc.

## Final project expectations

- Project proposals are due on April 1 (but you are welcome to submit early to get feedback... often we have to iterate)
- The parallelism competition is on Monday, May 9th during the final exam slot.
- Your grade is independent of the parallelism competition results
  - It is based on the technical quality of your work, your writeup, and your presentation
- You are absolutely encouraged to design your own project
  - This is supposed to be fun (and challenging)
  - There is a list of project ideas on the web site to help (we will be adding to it)

# Today's topic: efficiently implementing synchronization primitives

- Primitives for ensuring mutual exclusion
  - Locks
  - Atomic primitives (e.g., atomic\_add)
  - Transactions (later in the course)
- Primitives for event signaling
  - Barriers
  - Flags

## Three phases of a synchronization event

#### 1. Acquire method

- How a thread attempts to gain access to protected resource

#### 2. Waiting algorithm

- How a thread waits for access to be granted to shared resource

#### 3. Release method

 How thread enables other threads to gain resource when its work in the synchronized region is complete

## Busy waiting

Busy waiting (a.k.a. "spinning")

```
while (condition X not true) {}
logic that assumes X is true
```

- In classes like 15-213 or in operating systems, you have certainly also talked about synchronization
  - You might have been taught busy-waiting is bad: why?

## "Blocking" synchronization

 Idea: if progress cannot be made because a resource cannot be acquired, it is desirable to free up execution resources for another thread (preempt the running thread)

#### pthreads mutex example

```
pthread_mutex_t mutex;
pthread_mutex_lock(&mutex);
```

## Busy waiting vs. blocking

#### Busy-waiting can be preferable to blocking if:

- Scheduling overhead is larger than expected wait time
- Processor's resources not needed for other tasks
  - This is often the case in a parallel program since we usually don't oversubscribe a system when running a performance-critical parallel app (e.g., there aren't multiple CPU-intensive programs running at the same time)
  - Clarification: be careful to not confuse the above statement with the value of multi-threading (interleaving execution of multiple threads/tasks to hiding long latency of memory operations) with other work within the same app.

#### Examples:

```
pthread_spinlock_t spin; int lock;
pthread_spin_lock(&spin); OSSpinLockLock(&lock); // OSX spin lock
```

# Implementing Locks

## Warm up: a simple, but incorrect, lock

```
lock: ld R0, mem[addr] // load word into R0
cmp R0, #0 // compre R0 to 0
bnz lock // if nonzero jump to top
st mem[addr], #1

unlock: st mem[addr], #0 // store 0 to address
```

#### Problem: data race because LOAD-TEST-STORE is not atomic!

Processor 0 loads address X, observes 0
Processor 1 loads address X, observes 0
Processor 0 writes 1 to address X
Processor 1 writes 1 to address X

#### Test-and-set based lock

#### **Atomic test-and-set instruction:**

#### Test-and-set lock: consider coherence traffic

**Processor 1 Processor 2 Processor 3 Invalidate line Invalidate line** BusRdX **Update line in cache (set to 1) Invalidate line** T&S **BusRdX** Attempt to update (t&s fails) **Invalidate line BusRdX** Attempt to update (t&s fails) [P1 is holding lock...] **Invalidate line** BusRdX Attempt to update (t&s fails) **Invalidate line** BusRdX Attempt to update (t&s fails) **BusRdX Invalidate line Update line in cache (set to 0)** T&S **Invalidate line BusRdX** 

**Update line in cache (set to 1)** 

= thread has lock

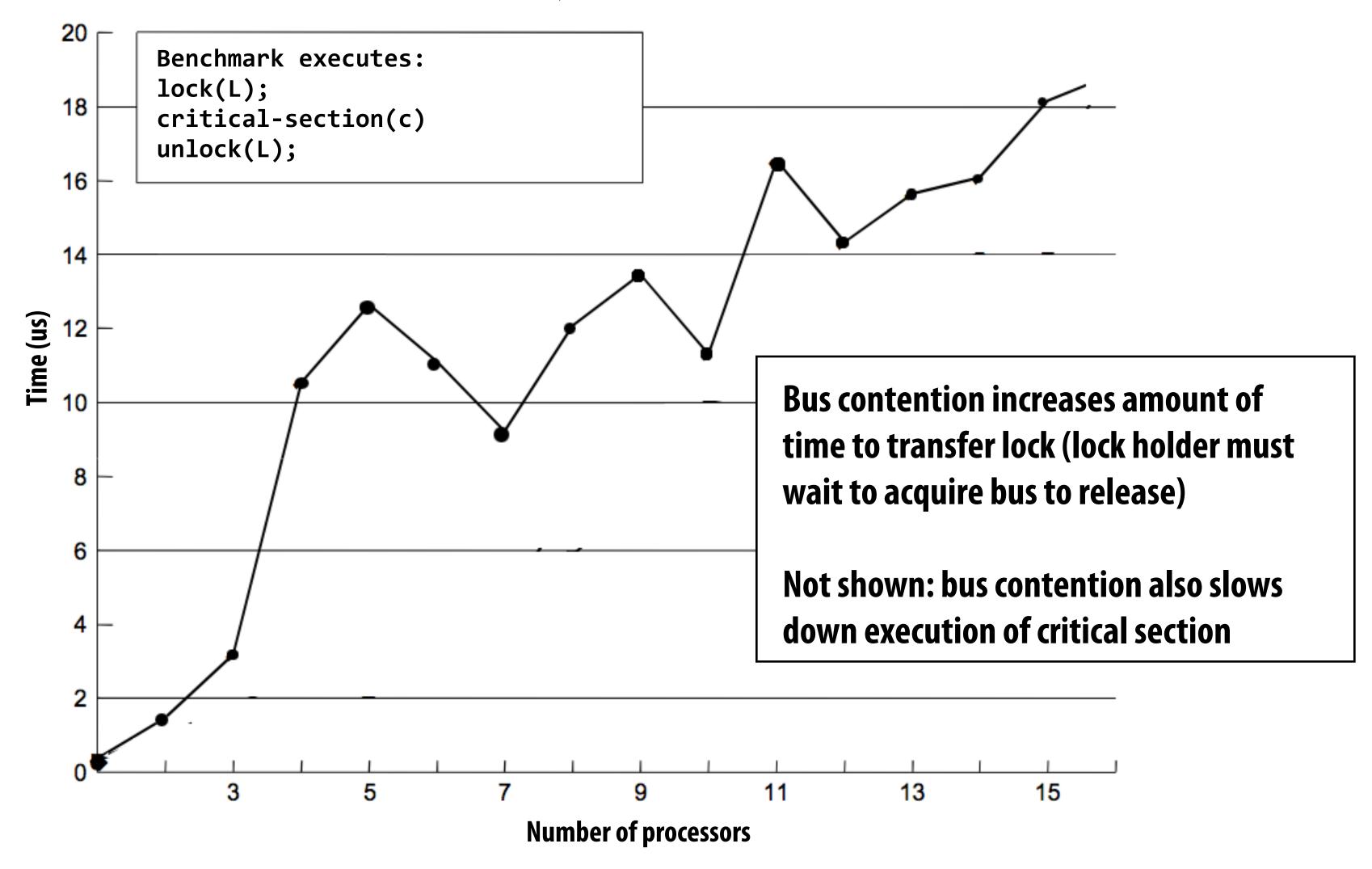
## Check your understanding

On the previous slide, what is the duration of time the thread running on P0 holds the lock?

At what points in time does P0's cache contain a valid copy of the cache line containing the lock variable?

## Test-and-set lock performance

Benchmark: execute a total of N lock/unlock sequences (in aggregate) by P processors Critical section time removed so graph plots only time acquiring/releasing the lock



## x86 cmpxchg

Compare and exchange (atomic when used with lock prefix)

```
lock cmpxchg dst, src

the first control of ten a memory address lock prefix (makes operation atomic)
```

```
if (dst == EAX)

ZF = 1 ← flag register

dst = src

else

ZF = 0

EAX = dst
```

## Self-check: Can you implement ASM for atomic compare-and-swap using cmpxchg?

```
bool compare_and_swap(int* x, a, b) {
   if (*x == a) {
     *x = b;
     return true;
   }
   return false;
}
```

## Desirable lock performance characteristics

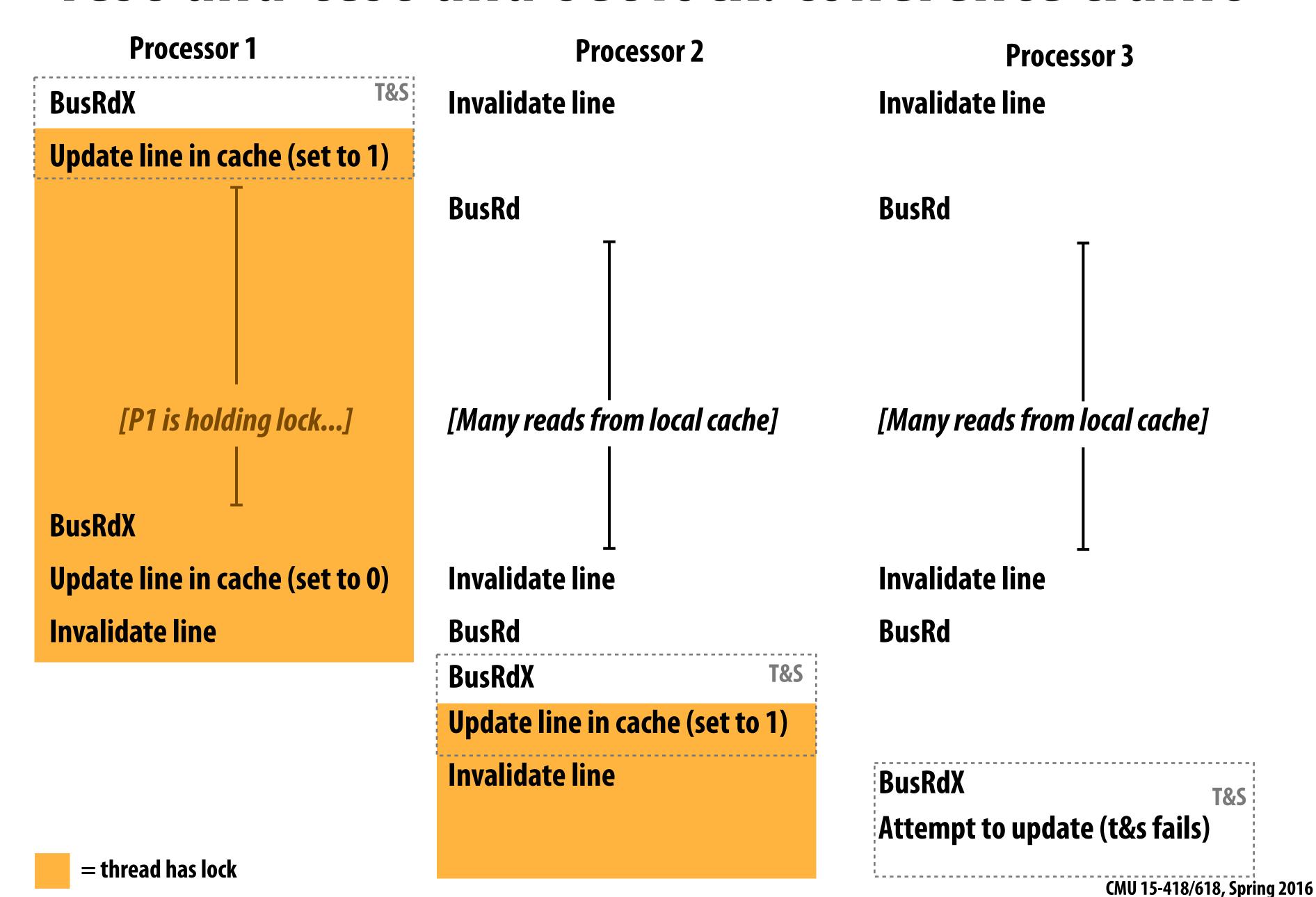
#### Low latency

- If lock is free and no other processors are trying to acquire it, a processor should be able to acquire the lock quickly
- Low interconnect traffic
  - If all processors are trying to acquire lock at once, they should acquire the lock in succession with as little traffic as possible
- Scalability
  - Latency / traffic should scale reasonably with number of processors
- Low storage cost
- Fairness
  - Avoid starvation or substantial unfairness
  - One ideal: processors should acquire lock in the order they request access to it

Simple test-and-set lock: low latency (under low contention), high traffic, poor scaling, low storage cost (one int), no provisions for fairness

#### Test-and-test-and-set lock

#### Test-and-test-and-set lock: coherence traffic



#### Test-and-test-and-set characteristics

- Slightly higher latency than test-and-set in <u>uncontended</u> case
  - Must test... then test-and-set
- Generates much less interconnect traffic
  - One invalidation, per waiting processor, per lock release (O(P) invalidations)
  - This is O(P2) interconnect traffic if all processors have the lock cached
  - Recall: test-and-set lock generated one invalidation per waiting processor per test
- More scalable (due to less traffic)
- Storage cost unchanged (one int)
- Still no provisions for fairness

#### Test-and-set lock with back off

#### Upon failure to acquire lock, delay for awhile before retrying

```
void Lock(volatile int* 1) {
  int amount = 1;
  while (1) {
    if (test_and_set(*1) == 0)
      return;
    delay(amount);
    amount *= 2;
  }
}
```

- Same <u>uncontended</u> latency as test-and-set, but potentially higher latency under contention. Why?
- Generates less traffic than test-and-set (not continually attempting to acquire lock)
- Improves scalability (due to less traffic)
- Storage cost unchanged (still one int for lock)
- Exponential back-off can cause severe unfairness
  - Newer requesters back off for shorter intervals

#### Ticket lock

Main problem with test-and-set style locks: upon release, all waiting processors attempt to acquire lock using test-and-set



No atomic operation needed to acquire the lock (only a read) Result: only one invalidation per lock release (O(P) interconnect traffic)

## Array-based lock

Each processor spins on a different memory address

Utilizes atomic operation to assign address on attempt to acquire

```
struct lock {
  volatile padded_int status[P];  // padded to keep off same cache line
  volatile int head;
};
int my_element;
void Lock(lock* 1) {
 my_element = atomic_circ_increment(&l->head);  // assume circular increment
 while (1->status[my_element] == 1);
void unlock(lock* 1) {
  1->status[my element] = 1;
  1->status[circ_next(my_element)] = 0;
                                                   // next() gives next index
```

O(1) interconnect traffic per release, but lock requires space linear in P Also, the atomic circular increment is a more complex operation (higher overhead)

# Additional primitive atomic operations

### Recall CUDA 7 atomic operations

```
int
      atomicAdd(int* address, int val);
float atomicAdd(float* address, float val);
int
      atomicSub(int* address, int val);
      atomicExch(int* address, int val);
int
float atomicExch(float* address, float val);
      atomicMin(int* address, int val);
int
     atomicMax(int* address, int val);
int
unsigned int atomicInc(unsigned int* address, unsigned int val);
unsigned int atomicDec(unsigned int* address, unsigned int val);
int
      atomicCAS(int* address, int compare, int val);
      atomicAnd(int* address, int val); // bitwise
int
      atomicOr(int* address, int val); // bitwise
int
      atomicXor(int* address, int val); // bitwise
int
```

(omitting additional 64 bit and unsigned int versions)

## Implementing atomic fetch-and-op

```
// atomicCAS:
// atomic compare and swap performs this logic atomically
int atomicCAS(int* addr, int compare, int val) {
   int old = *addr;
   *addr = (old == compare) ? val : old;
   return old;
}
```

- Exercise: how can you build an atomic fetch+op out of atomicCAS()?
  - try: atomic\_min()

```
int atomic_min(int* addr, int x) {
   int old = *addr;
   int new = min(old, x);
   while (atomicCAS(addr, old, new) != old) {
      old = *addr;
      new = min(old, x);
   }
}
```

#### What about these operations?

```
int atomic_increment(int* addr, int x);  // for signed values of x
void lock(int* addr);
```

### Load-linked, store conditional (LL/SC)

- Pair of corresponding instructions (not a single atomic instruction like compare-and-swap)
  - load\_linked(x): load value from address
  - store\_conditional(x, value): store value to x, if x hasn't been written to since corresponding LL
- Corresponding ARM instructions: LDREX and STREX
- How might LL/SC be implemented on a cache coherent processor?

#### C++ 11 atomic<T>

- Provides atomic read, write, read-modify-write of entire objects
  - Atomicity may be implemented by mutex or efficiently by processor-supported atomic instructions (if T is a basic type)
- Provides memory ordering semantics for operations before and after atomic operations
  - By default: sequential consistency
  - See std::memory\_order or more detail

Will be useful if implementing the lock-free programming ideas in the next lecture in C++

# Implementing Barriers

## Implementing a centralized barrier

(Based on shared counter)

```
struct Barrier t {
 LOCK lock;
  int counter; // initialize to 0
  int flag; // the flag field should probably be padded to
                // sit on its own cache line. Why?
};
// barrier for p processors
void Barrier(Barrier_t* b, int p) {
 lock(b->lock);
 if (b->counter == 0) {
   b->flag = 0; // first thread arriving at barrier clears flag
  int num_arrived = ++(b->counter);
  unlock(b->lock);
                                                            Does it work? Consider:
  if (num_arrived == p) { // last arriver sets flag
   b->counter = 0;
   b\rightarrow flag = 1;
                                                            do stuff ...
                                                            Barrier(b, P);
 else {
                                                            do more stuff ...
   while (b->flag == 0); // wait for flag
                                                            Barrier(b, P);
```

#### Correct centralized barrier

```
struct Barrier_t {
  LOCK lock;
  int arrive_counter; // initialize to 0 (number of threads that have arrived)
  int leave_counter;
                      // initialize to P (number of threads that have left barrier)
  int flag;
};
// barrier for p processors
void Barrier(Barrier_t* b, int p) {
  lock(b->lock);
  if (b->arrive_counter == 0) { // if first to arrive...
    if (b->leave counter == P) { // check to make sure no other threads "still in barrier"
       b->flag = 0;
                         // first arriving thread clears flag
   } else {
      unlock(lock);
      while (b->leave_counter != P); // wait for all threads to leave before clearing
      lock(lock);
     b\rightarrow flag = 0;
                                 // first arriving thread clears flag
  int num_arrived = ++(b->arrive_counter);
  unlock(b->lock);
  if (num_arrived == p) { // last arriver sets flag
    b->arrive_counter = 0;
    b->leave_counter = 1;
    b\rightarrow flag = 1;
  else {
   while (b->flag == 0); // wait for flag
    lock(b->lock);
    b->leave_counter++;
    unlock(b->lock);
```

Main idea: wait for all processes to leave first barrier, before clearing flag for entry into the second

#### Centralized barrier with sense reversal

```
struct Barrier_t {
 LOCK lock;
 int counter; // initialize to 0
 int flag; // initialize to 0
};
int local_sense = 0; // private per processor. Main idea: processors wait for flag
                     // to be equal to local sense
// barrier for p processors
void Barrier(Barrier_t* b, int p) {
 local_sense = (local_sense == 0) ? 1 : 0;
 lock(b->lock);
 int num_arrived = ++(b->counter);
 if (b->counter == p) { // last arriver sets flag
   unlock(b->lock);
   b->counter = 0;
   b->flag = local_sense;
 else {
   unlock(b->lock);
   while (b.flag != local_sense); // wait for flag
```

Sense reversal optimization results in one spin instead of two

#### Centralized barrier: traffic

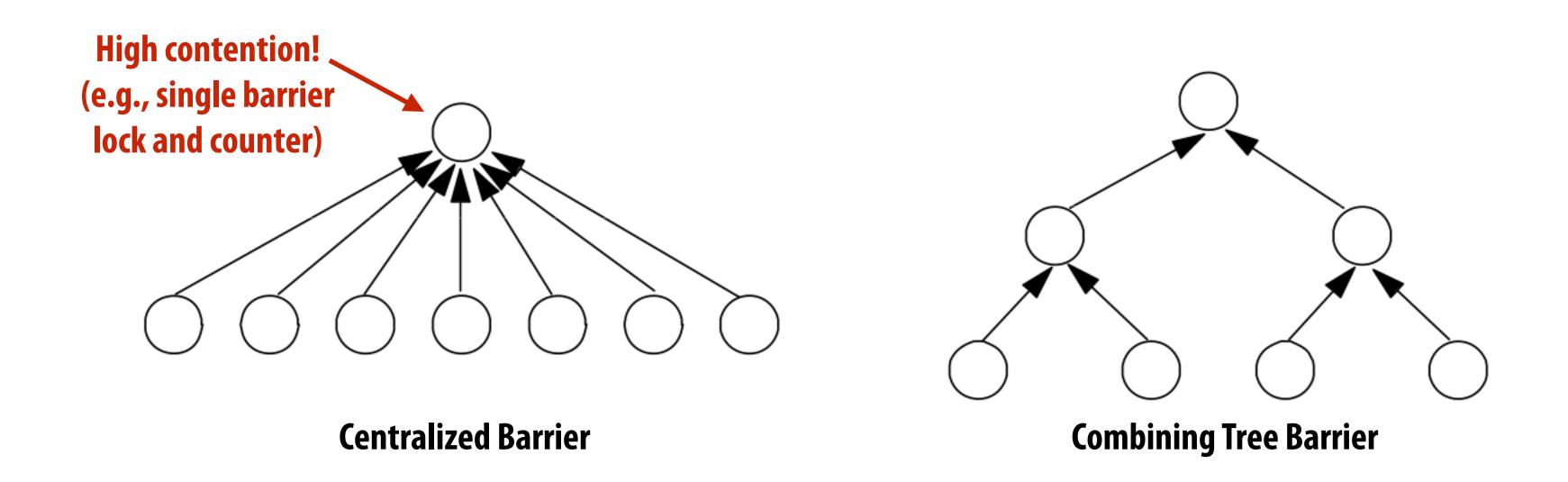
#### O(P) traffic on interconnect per barrier:

- All threads: 2P write transactions to obtain barrier lock and update counter (O(P) traffic assuming lock acquisition is implemented in O(1) manner)
- Last thread: 2 write transactions to write to the flag and reset the counter (O(P) traffic since there are many sharers of the flag)
- P-1 transactions to read updated flag

#### But there is still serialization on a single shared lock

- So span (latency) of entire operation is O(P)
- Can we do better?

## Combining tree implementation of barrier



- Combining trees make better use of parallelism in interconnect topologies
  - Ig(P) span (latency)
  - Strategy makes less sense on a bus (all traffic still serialized on single shared bus)
- Barrier acquire: when processor arrives at barrier, performs increment of parent counter
  - Process recurses to root
- Barrier release: beginning from root, notify children of release

## Coming up...

- Imagine you have a shared variable for which contention is low.
  So it is <u>unlikely</u> that two processors will enter the critical section at the same time?
- You could hope for the best, and avoid the overhead of taking the lock since it is likely that mechanisms for ensuring mutual exclusion are not needed for correctness
  - Take a "optimize-for-the-common-case" attitude
- What happens if you take this approach and you're wrong: in the middle of the critical region, another process enters the same region?

### Preview: transactional memory

```
atomic
{    // begin transaction

    perform atomic computation here ...
}    // end transaction
```

Instead of ensuring mutual exclusion via locks, system will proceed as if no synchronization was necessary. (it speculates!)

System provides hardware/software support for "rolling back" all loads and stores in the critical region if it detects (at run-time) that another thread has entered same region at the same time.