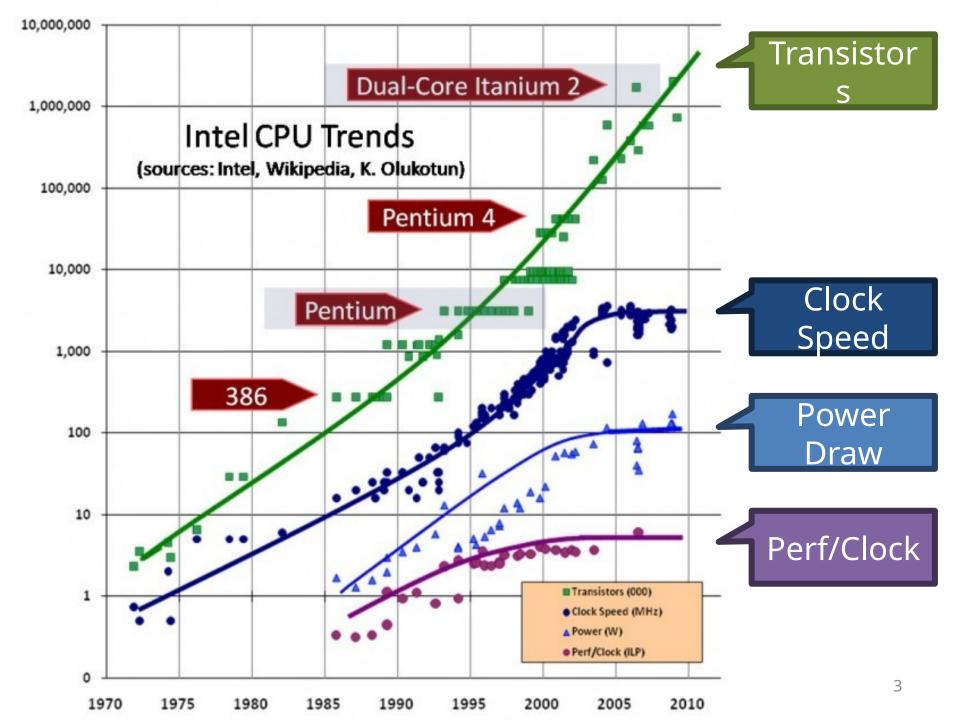
CS 5600 Computer Systems

Lecture 5: Synchronization, Deadlock, and Lock-free Data Structures

- Motivating Parallelism
- Synchronization Basics
- Types of Locks and Deadlock
- Lock-Free Data Structures



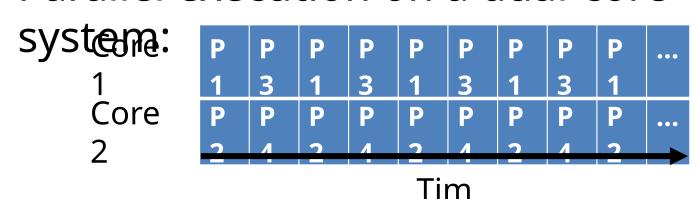
Implications of CPU Evolution

- Increasing transistor count/clock speed
 - Greater number of tasks can be executed concurrently
- However, clock speed increases have essentially stopped in the past few years
 - Instead, more transistors = more CPU cores
 - More cores = increased opportunity for parallelism

Concurrency vs. Parallelism

Concurrent execution on a single-core system:

Parallel execution on a dual-core



Two Types of Parallelism

- Data parallelism
 - Same task executes on many cores
 - Different data given to each task
 - Example: MapReduce
- Task parallelism
 - Different tasks execute on each core
 - Example: any high-end videogame
 - 1 thread handles game AI
 - 1 thread handles physics
 - 1 thread handles sound effects
 - 1+ threads handle rendering

Amdahl's Law

- Upper bound on performance gains from parallelism
 - If I take a single-threaded task and parallelize it over N CPUs, how much more quickly will my task complete?
- Definition:
 - S is the fraction of processing time that is serial (sequential)
 - N is the number of CPU cores

Speedup
$$\leq \frac{1}{S + \frac{(1-S)}{N}}$$

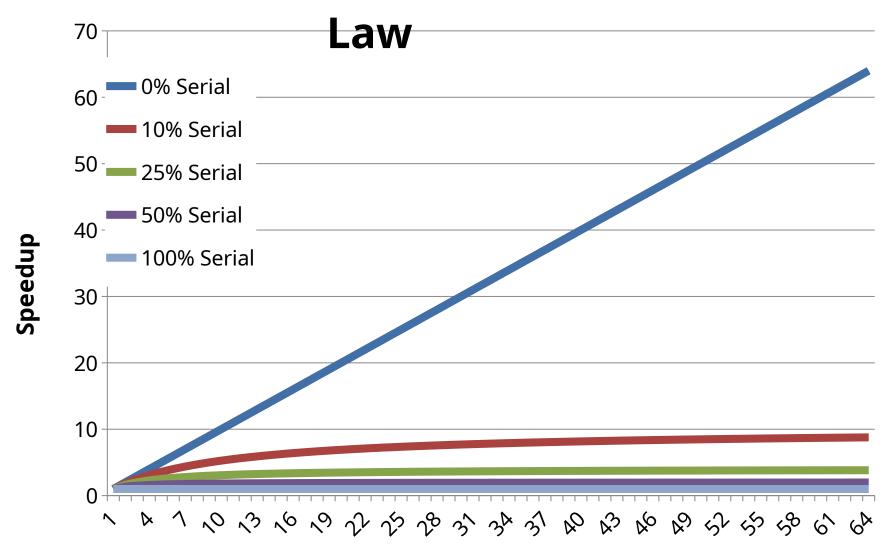
Example of Amdahl's Law

Suppose we have an application that is 75% parallel and 25% serial

```
1 core: 1/(.25+(1-.25)/1) ? obviously)
2 core: 1/(.25+(1-.25)/2) ?
4 core: 1/(.25+(1-.25)/4) ?
```

- What happens as $N \rightarrow \infty$?
 - Speedup approaches 1/S
 - The serial portion of the process has a disproportionate effect on performance improvement

Amdahl's



Limits of Parallelism

- Amdahl's Law is a simplification of reality
 - Assumes code can be cleanly divided into serial and parallel portions
 - In other words, trivial parallelism
- Real-world code is typically more complex
 - Multiple threads depend on the same data
 - In these cases, parallelism may introduce errors
- Real-world speedups are typically < what is predicted by Amdahl's Law

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The Bank of Lost Funds

- Consider a simple banking application
 - Multi-threaded, centralized architecture
 - All deposits and withdrawals sent to the central server

```
class account {
   private money_t balance;
   public deposit(money_t sum) {
     balance = balance + sum;
   }
}
```

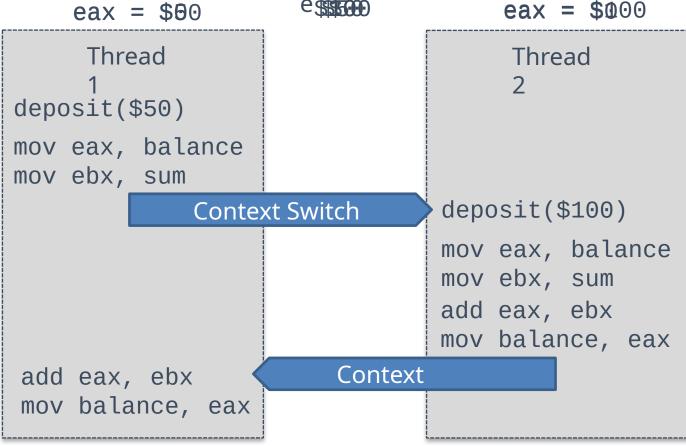
 What happens if two people try to deposit money into the same account at the same time?

```
balance = balance + sum;

mov eax, balance
mov ebx, sum
add eax, ebx
mov balance, eax

eax = $50

Thread
1
```



Race Conditions

- The previous example shows a race condition
 - Two threads "race" to execute code and update shared (dependent) data
 - Errors emerge based on the ordering of operations, and the scheduling of threads
 - Thus, errors are nondeterministic

Example: Linked List

```
push(&list, elem):
    elem->next = list
    list = elem
```

NUL

- What happens if n tmp
 one thread calls
 pop(), and
 3. li
 - another calls
 - push() at the

1. tmp = list

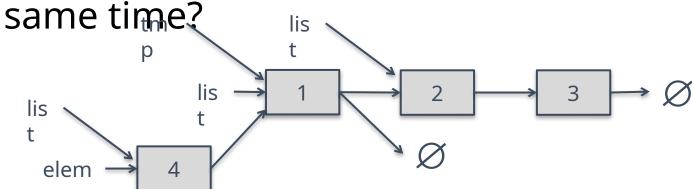
3. list = list->next

Thread 1

5. tmp->next = NULL

Thread 2

- 2. elem->next = list
- 4. list = elem

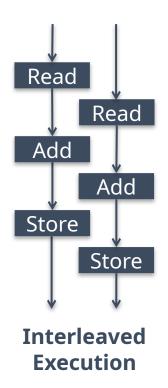


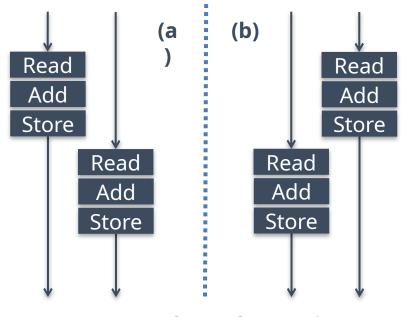
Critical Sections

- These examples highlight the critical section problem
- Classical definition of a critical section:
 "A piece of code that accesses a shared resource that must not be concurrently accessed by more than one thread of execution."
- Unfortunately, this definition is misleading
 - Implies that the piece of code is the problem
 - In fact, the <u>shared resource</u> is the root of the problem

Atomicity

- Race conditions lead to errors when sections of code are interleaved
- These errors can be prevented by ensuring code executes atomically

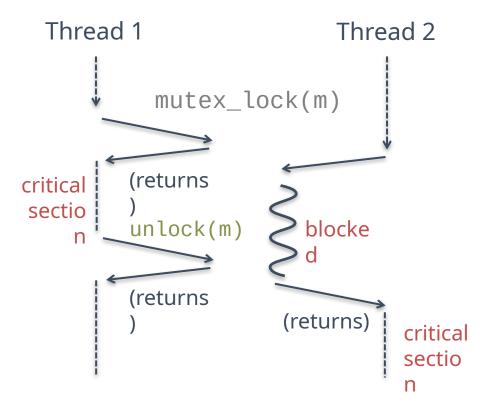




Mutexes for Atomicity

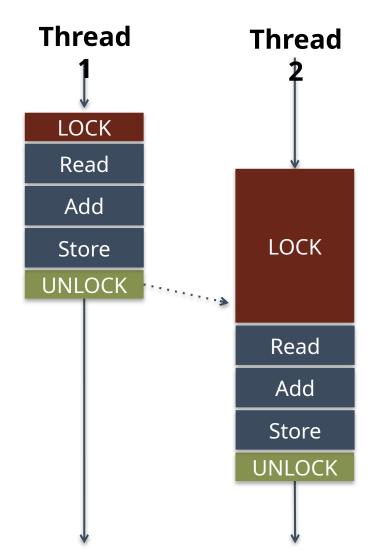
 Mutual exclusion lock (mutex) is a construct that can enforce atomicity in code

```
m =
mutex_create();
...
mutex_lock(m);
// do some stuff
mutex_unlock(m);
```



Fixing the Bank Example

```
class account {
  mutex m;
  money_t balance
  public deposit(money_t sum) {
    m.lock();
    balance = balance + sum;
    m.unlock();
```



Implementing Mutual Exclusion

- Typically, developers don't write their own locking-primitives
 - You use an API from the OS or a library
- Why don't people write their own locks?
 - Much more complicated than they at-first appear
 - Very, very difficult to get correct
 - May require access to privileged instructions
 - May require specific assembly instructions
 - Instruction architecture dependent

Mutex on a Single-CPU System

```
void lock_acquire(struct lock *
lock) {
    sema_down(&lock-
>semaphore);
    lock->holder = thread_current();
}
```

```
void sema_down(struct semaphore *
sema) {
    enum intr_level old_level;
    old_level = intr_disable();
    while (sema->value == 0) { /* wait */ }
    sema->value--;
    intr_level(old_level);
}
```

- On a single-CPU system, the only preemption mechanism is interrupts
 - If are interrupts are disabled, the currently executing code is guaranteed to be atomic
- This system is concurrent, but not narallel

The Problem With Multiple CPUs

- In a multi-CPU (SMP) system, two or more threads may execute in parallel
 - Data can be read or written by parallel threads, even if interrupts are disabled

sema->value = ?

```
cPU 1 -
sema_down() {
  while (sema->value == 0) { ... }
  sema->value--;
}
```

```
sema_down() {
    while (sema->value == 0) { ... }
    sema->value--;
}
```

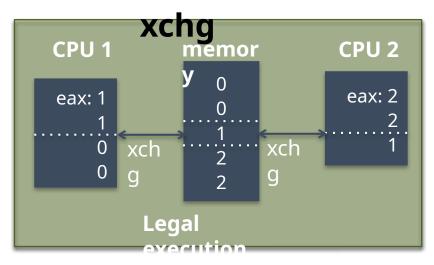
Instruction-level Atomicity

- Modern CPUs have atomic instruction(s)
 - Enable you to build high-level synchronized objects
- On x86:
 - The lock prefix makes an instruction atomic lock inc eax; atomic increment lock dec eax; atomic decrement
 - Only legal with some instructions
 - The xchg instruction is guaranteed to be atomic xchg eax, [addr]; swap eax and the value in memory

Behavior of xchg

Non-Atomic

Atomic



 Atomicity ensures that each xchg occurs before or after xchg's from other CPUs

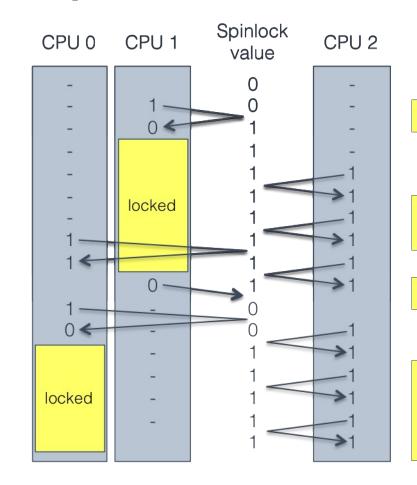
Building a Spin Lock with xchg

spin_lock:

mov eax, 1
xchg eax,
[lock_addr]
test eax, eax
jnz spinlock

spin_unlock:

mov [lock_addr], 0



CPU 1 locks.

CPUs 0 and 2 both try to lock, but cannot.

CPU 1 unlocks.

CPU 0 locks, simply because it requested it *slightly* before CPU 2.

Building a Multi-CPU Mutex

```
typedef struct mutex_struct {
   int spinlock = 0; // spinlock variable
   int locked = 0;  // is the mutex locked? guarded by spinlock
   queue waitlist; // waiting threads, guarded by spinlock
} mutex;
void mutex_unlock(mutex * m) {
    spin_lock(&m->spinlock);
    if (m->waitlist.empty()) {
        m->locked = 0;
        spin_unlock(&m->spinlock);
    else {
        next_thread = m->waitlist.pop_from_head();
        spin_unlock(&m->spinlock);
        wake(next_thread);
```

Compare and Swap

- Sometimes, literature on locks refers to compare and swap (CAS) instructions
 - CAS instructions combine an xchg and a test
- On x86, known as compare and exchange spin_lock:

```
mov ecx, 1
mov eax, 0
lock cmpxchg ecx, [lock_addr]
jnz spinlock
```

- cmpxchg compares eax and the value of lock_addr
- If eax == [lock_addr], swap ecx and [lock_addr]

The Price of Atomicity

- Atomic operations are very expensive on a multi-core system
 - Caches must be flushed
 - CPU cores may see different values for the same variable if they have out-of-date caches
 - Cache flush can be forced using a memory fence (sometimes called a memory barrier)
 - Memory bus must be locked
 - No concurrent reading or writing
 - Other CPUs may stall
 - May block on the memory bus or atomic instructions

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Other Types of Locks

- Mutex is perhaps the most common type of lock
- But there are several other common types
 - Semaphore
 - Read/write lock
 - Condition variable
 - Used to build monitors

Semaphores

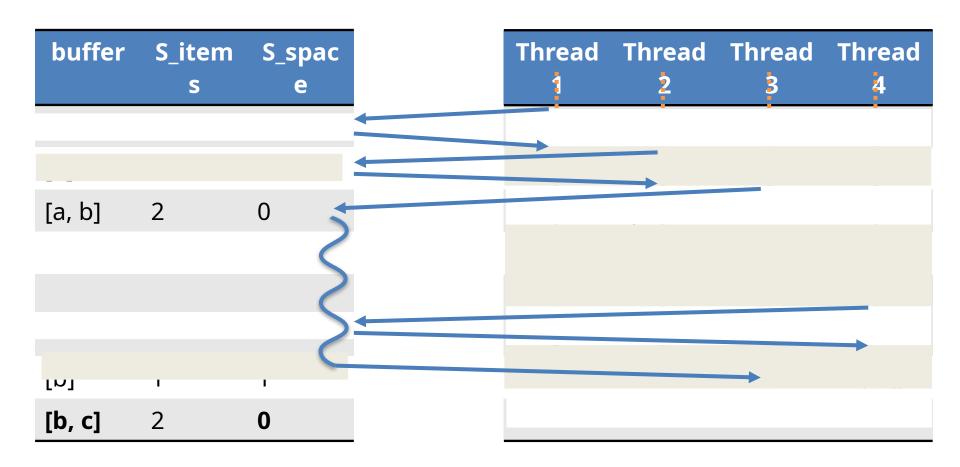
- Generalization of a mutex
 - Invented by Edsger Dijkstra
 - Associated with a positive integer N
 - May be locked by up to N concurrent threads
- Semaphore methods
 - wait() if N > 0, N--; else sleep
 - signal() if waiting threads > 0, wake one up;else N++

The Bounded Buffer Problem

- Canonical example of semaphore usage
 - Some threads produce items, add items to a list
 - Some threads consume items, remove items from the list
 - Size of the list is bounded

```
class semaphore_bounded_buffer:
 mutex
  list buffer
  semaphore S_space = semaphore(N)
  semaphore S_items = semaphore(0)
                                       get():
  put(item):
                                           S_items.wait()
      S_space.wait()
                                           m.lock()
      m.lock()
                                           result = buffer.remove_head()
      buffer.add_tail(item)
                                           m.unlock()
      m.unlock()
                                           S_space.signal()
      S_items.signal()
                                            return result
                                                                     33
```

Example Bounded Buffer

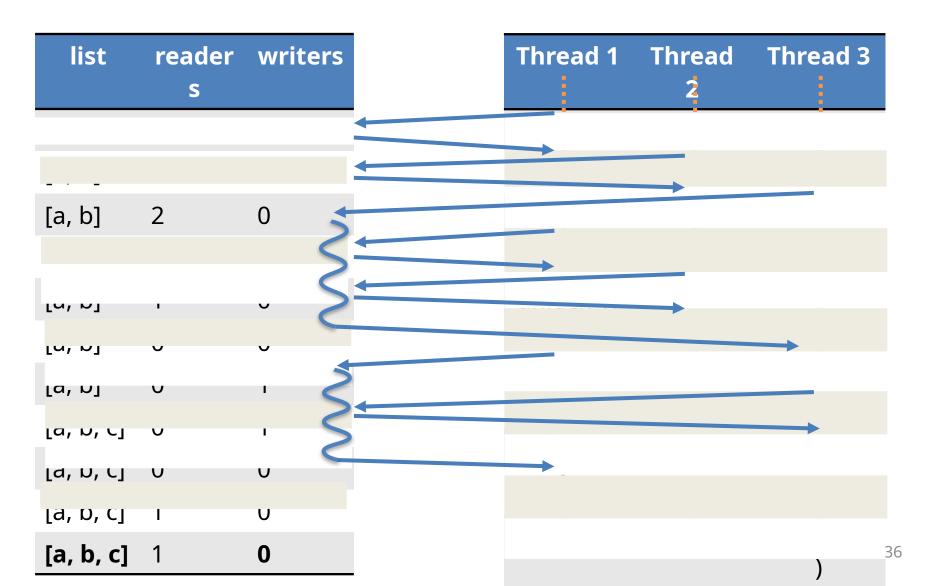


Read/Write Lock

- Sometimes known as a shared mutex
 - Many threads may hold the read lock in parallel
 - Only one thread may hold the write lock at a time
 - Write lock cannot be acquired until all read locks are released
 - New read locks cannot be acquired if a writer is waiting
- Ideal for cases were updates to shared data are rare

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Example Read/Write Lock



When is a Semaphore Not Enough?

```
class weighted_bounded_buffer
 mutex
            buffer
  list
            totalweight
  int
get(weight):
 while (1):
    m.lock()
    if totalweight >= weight:
      result = buffer.remove_head()
      totalweight -= result.weight
      m.unlock()
      return result
    else:
      m.unlock()
      yield()
```

```
put(item):
    m.lock()
    buffer.add_tail(item)
    totalweight += item.weight
    m.unlock()
```

- No guarantee the condition will be satisfied when this thread wakes up
- Lots of useless looping
- In this case, semaphores are not sufficient
 - weight is an unknown parameter
 - After each put(), totalweight must be checked

Condition Variables

- Construct for managing control flow amongst competing threads
 - Each condition variable is associated with a mutex
 - Threads that cannot run yet wait() for some condition to become satisfied
 - When the condition is satisfied, some other thread can signal() to the waiting thread(s)

Condition variables are not locks

- They are control-flow managers
- Some APIs combine the mutex and the condition variable, which makes things slightly easier

Condition Variable Example

```
class weighted_bounded_buffer:
 mutex
  condition c
  list
            buffer
  int
            totalweight = 0
            neededweight = 0
  int
get(weight):
 m.lock()
  if totalweight < weight:</pre>
    neededweight += weight
    c.wait(m)
  neededweight -= weight
  result = buffer.remove_hea
  totalweight -= result.weight
 m.unlock()
  return result
```

```
put(item):
    m.lock()
    buffer.add_tail(item)
    totalweight += item.weight
    if totalweight >= neededweight
        and neededweight > 0:
        c.signal(m)
    else:
        m.unlock()
```

- signal() hands the locked mutex to a waiting thread
- Walt() Unlocks the mutex and blocks the thread
- When wait() returns,
- In essence, we have built a construct of the form:
 wait_until(totalweight >= weight)

Monitors

- Many textbooks refer to monitors when they discuss synchronization
 - A monitor is just a combination of a mutex and a condition variable
- There is no API that gives you a monitor
 - You use mutexes and condition variables
 - You have to write your own monitors
 - In OO design, you typically make some user-defined object a monitor if it is shared between threads
- Monitors enforce mutual exclusion
 - Only one thread may access an instance of a monitor at any given time
 - synchronized keyword in Java is a simple monitor

Be Careful When Writing Monitors Modified

Original

```
get(weight Code
  m.lock()
  if totalweight < weight:</pre>
    neededweight += weight
    c.wait(m)
  neededweight -= weight
  result = buffer.remove_head()
  totalweight -= result.weight
  m.unlock()
  return result
put(item):
  m.lock()
  buffer.add_tail(item)
  totalweight += item.weight
  if totalweight >= neededweight
          and neededweight > 0:
    c.signal(m)
  else:
    m.unlock()
```

```
get(weight Gode
  m.lock()
  if totalweight < weight:</pre>
    neededweight += weight
    c.wait(m)
  result = buffer.remove_head()
  totalweight -= result.weight
  m.unlock()
  return result
```

Incorrect! The mutex is not locked at this point in the

```
code
if totalweight >=
                          eight
        and needed
  c.signal(m)
  neededweight -= item.weight
else:
  m.unlock()
                              41
```

Pthread Synchronization API

Mute

```
pthread_mutexXt m;
pthread_mutex_init(&m, NULL);
pthread_mutex_lock(&m);
pthread mutex trylock(&m);
pthread_mutex_unlock(&m);
pthread_mutex_destroy(&m);
```

Read/Write

```
pthread_rwldcockrwl;
pthread_rwlock_init(&rwl, NULL);
pthread_rwlock_rdlock(&rwl);
pthread_rwlock_wrlock(&rwl);
pthread_rwlock_tryrdlock(&rwl);
pthread_rwlock_trywrlock(&rwl);
pthread_rwlock_unlock(&rwl);
pthread_rwlock_destroy(&rwl);
```

Condition

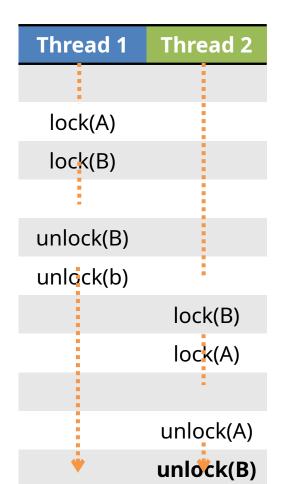
```
pthread Variable
pthread_cond_init(&c, NULL);
pthread_cond_wait(&c &m);
pthread_cond_signal(&c);
pthread_cond_broadcast(&c);
pthread_cond_destroy(&c);
```

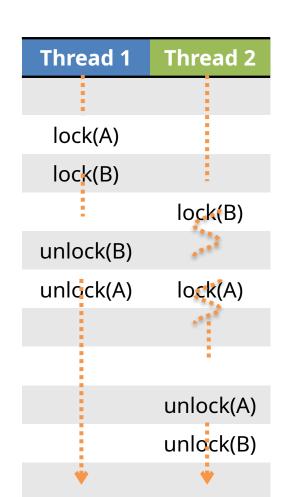
POSIX

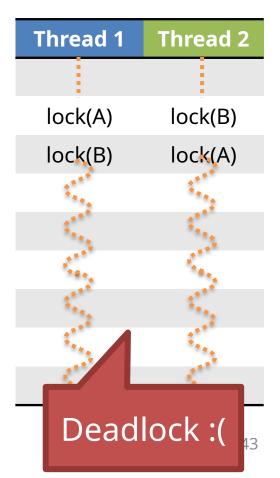
```
sem_t Semaphore
sem_init(&s, NULL, <value>);
sem_wait(&s);
sem_post(&s);
sem_getvalue(&s, &value);
sem_destroy(&s);
```

Layers of Locks

mutex A mutex B lock A lock B lock A // do something unlock B unlock A unlock B



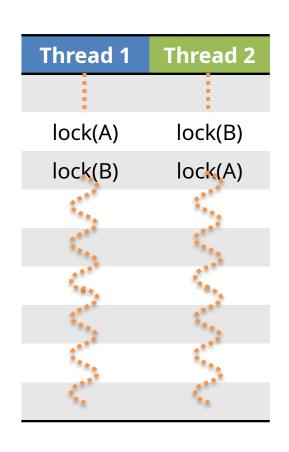




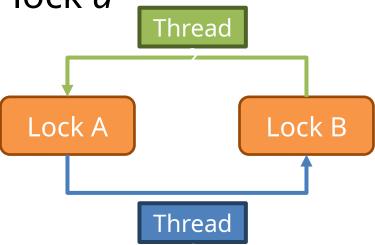
When Can Deadlocks Occur?

- Four classic conditions for deadlock
 - 1. Mutual exclusion: resources can be exclusively held by one process
 - 2. Hold and wait: A process holding a resource can block, waiting for another resource
 - 3. No preemption: one process cannot force another to give up a resource
 - 4. Circular wait: given conditions 1-3, if there is a circular wait then there is potential for deadlock
- One more issue:
 - 5. Buggy programming: programmer forgets to release one or more resources

Circular Waiting



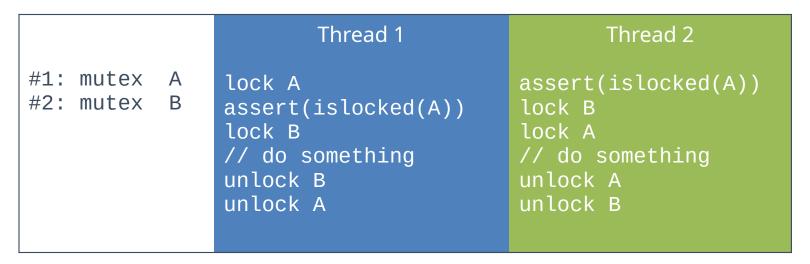
- Simple example of circular waiting
 - Thread 1 holds lock α, waits
 on lock b
 - Thread 2 holds lock b, waits
 on lock a



Avoiding Deadlock

- If circular waiting can be prevented, no deadlocks can occur
- Technique to prevent circles: lock ranking
 - 1. Locate all locks in the program
 - 2. Number the locks in the order (rank) they should be acquired
 - 3. Add assertions that trigger if a lock is acquired out-of-order
- No automated way of doing this analysis
 - Requires careful programming by the developer(s)

Lock Ranking Example



- Rank the locks
- Add assertions to enforce rank ordering
- In this case, Thread 2 assertion will fail at runtime

When Ranking Doesn't Work

- In some cases, it may be impossible to rank order locks, or prevent circular waiting
- In these cases, eliminate the hold and wait condition using trylock()

Example: Thread Safe

```
List
class SafeList {
method append(SafeList more_items){
    lock(self)
    lock(more_items)
```

Proble

```
Mafelist A, B
Thread 1:
A.append(B)
Thread 2:
```

Solution! (Replace lock() with

```
httyle kappend(SafeList more_items){
   while (true) {
    lock(self)
    if (trylock(more_items) == locked_OK)
        break
    unlock(self)
   }
   // now both lists are safely locked
```

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Beyond Locks

- Mutual exclusion (locking) solves many issues in concurrent/parallel applications
 - Simple, widely available in APIs
 - (Relatively) straightforward to reason about
- However, locks have drawbacks
 - Priority inversion and deadlock only exist because of locks
 - Locks reduce parallelism, thus hinder performance

Lock-Free Data Structures

- Is it possible to build data structures that are thread-safe without locks?
 - YES
- Lock-free data structures
 - Include no locks, but are thread safe
 - However, may introduce starvation
 - Due to retry loops (example in a few slides)

Wait-Free Data Structures

- Wait-free data structures
 - Include no locks, are thread safe, and avoid starvation
 - Wait-free implies lock-free
 - Wait-free is much stronger than lock-free
- Wait-free structures are <u>very</u> hard to implement
 - Impossible to implement for many data structures
 - Often restricted to a fixed number of threads

Advantages of Going Lock-Free

- Potentially much more performant than locking
 - Locks necessitate waits, context switching,
 CPU stalls, etc...
- Immune to thread killing
 - If a thread dies while holding a lock, you are screwed
- Immune to deadlock and priority inversion
 - You can't deadlock/invert when you have no locks :)

Caveats to Going Lock-Free

- Very few standard libraries/APIs implement these data structures
 - Implementations are often platformdependent
 - Rely on low-level assembly instructions
 - Many structures are very new, not widely known
- Not all data structures can be made lockfree
 - For many years, nobody could figure out how to make a lock-free doubly linked list
- Buyer beware if implementing yourself
 - Very difficult to get right

Lock-free Queue Example: Enqueue

• Usage: one reader, one write Node * next;

```
int data;
void enqueue(int& t) {
                                                 };
  last->next = new Node(t);
                                                 // Queue pointers
  last = last->next;
                                                 volatile Node * first;
                                                 volatile Node * last;
  // garbage collect dequeued nodes
                                                 volatile Node * divider;
  while (first != divider) {
    Node * tmp = first;
                                                  lock_free_queue() {
    first = first->next;
                                                    // add the dummy node
                                                    first = last = divider
    delete tmp;
                                                      = new Node(0);
                     Node
                                 Node
         Node
                                             Node
                    divide
         first
                                              last
                                                                      55
```

Lock-free Queue Example: Dequeue

• Usage: one reader, one write Node * next;

```
int data;
bool dequeue(int& t) {
                                                 };
  if (divider != last) {
                                                 // Queue pointers
    t = divider->next->value;
                                                 volatile Node * first;
    divider = divider->next;
                                                 volatile Node * last;
    return true;
                                                 volatile Node * divider;
  return false;
                                                 lock_free_queue() {
                                                   // add the dummy node
                                                   first = last = divider
                                                     = new Node(0);
                                 Node
         Node
                    Node
                                            Node
                    divide
                                             last
```

Lock-free Queue Example: Enqueue

• Usage: one reader, one write Node * next;

```
int data;
void enqueue(int& t) {
                                                 };
  last->next = new Node(t);
                                                 // Queue pointers
  last = last->next;
                                                 volatile Node * first;
                                                 volatile Node * last;
  // garbage collect dequeued nodes
                                                 volatile Node * divider;
  while (first != divider) {
    Node * tmp = first;
                                                  lock_free_queue() {
    first = first->next;
                                                    // add the dummy node
                                                    first = last = divider
    delete tmp;
                                                      = new Node(0);
                     Node
                                 Node
                                                         Node
         Node
                                             Node
                    divide
         first
                                              last
                                                                      57
```

Why Does This Work?

- The enqueue thread and dequeue thread write different pointers
 - Enqueue: last, last->next, first, first->next
 - Dequeue: divider, divider->next
 - Enqueue operations are independent of dequeue operations
 - If these pointers overlap, then no work needs to be done
- The queue always has >1 nodes (starting with the dummy node)

More Advanced Lock-Free Tricks

 Many lock-free data structures can be built using compare and swap (CAS)

```
bool cas(int * addr, int oldval, int newval) {
   if (*addr == oldval) { *addr = newval; return true; }
   return false;
}
```

- This can be done atomically on x86 using the cmpxchg instruction
- Many compilers have built in atomic swap functions
 - GCC: __sync_bool_compare_and_swap(ptr, oldval, newval)
 - MSVC: InterlockedCompareExchange(ptr,oldval,newval)

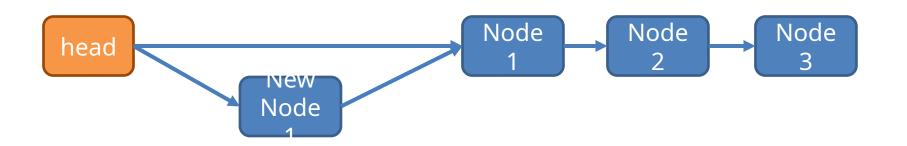
Lock-free Stack Example: Push

Usage: any number of readers and writers

```
class Node {
  Node * next;
  int data;

// Root of the stack
volatile Node * head;

void push(int t) {
  Node* node = new Node(t);
  do {
    node->next = head;
  } while (!cas(&head, node->next, node));
}
```



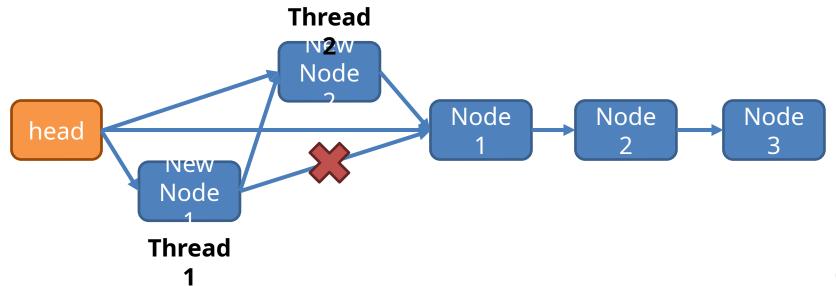
Lock-free Stack Example: Push

Usage: any number of readers and writers

```
class Node {
  Node * next;
  int data;

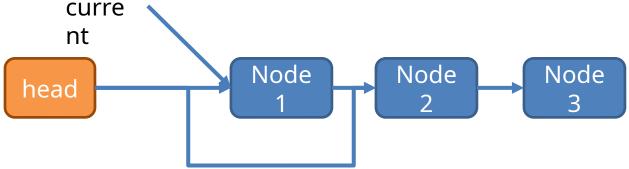
// Root of the stack
volatile Node * head;

void push(int t) {
  Node* node = new Node(t);
  do {
    node->next = head;
  } while (!cas(&head, node->next, node));
}
```



Lock-free Stack Example: Pop

```
bool pop(int& t) {
                                                 class Node {
 Node* current = head;
                                                   Node * next;
                                                   int data;
 while(current) {
                                                 };
    if(cas(&head, current, current->next)) {
      t = current->data;
                                                 // Root of the stack
      delete current;
                                                 volatile Node * head;
      return true;
    current = head;
  return false;
```



Retry Looping is the Key

- Lock free data structures often make use of the retry loop pattern
 - 1. Read some state
 - 2. Do a useful operation
 - 3. Attempt to modify global state if it hasn't changed (using CAS)
- This is similar to a spinlock
 - But, the assumption is that wait times will be small
 - However, retry loops may introduce starvation
- Wait-free data structures remove retry loops
 - But are much more complicated to implement

Many Reads, Few Writes

- Suppose we have a map (hashtable) that is:
 - Constantly read by many threads
 - Rarely, but occasionally written
- How can we make this structure lock free?

```
class readmap {
 mutex mtx;
  map<string, string> map;
  string lookup(const string& k) {
    lock l(mtx);
    return map[k];
  void update(const string& k,
                const string& v) {
    lock lock(mtx);
    map[k] = v;
```

Duplicate and Swap

```
class readmap {
  map<string, string> * map;
  readmap() { map = new map<string, string>(); }
  string lookup(const string& k) {
    return (*map)[k];
  }
  void update(const string& k, const string& v) {
    map<string, string> * new_map = 0;
    do {
      map<string, string> * old_map = map;
      if (new_map) delete new_map;
      // clone the existing map data
      new_map = new map<string, string>(*old_map);
      (*new_map)[k] = v;
      // swap the old map for the new, updated map!
    } while (cas(&map, old_map, new_map));
```

Memory Problems

- What is the problem with the previous code?
 while (cas(&map, old_map, new_map));
- The old map is not deleted (memory leak)
- Does this fix things?

```
} while (cas(&map, old_map, new_map));
delete old_map;
```

- Readers may still be accessing the old map!
 - Deleting it will cause nondeterministic behavior
- Possible solution: store the old_map pointer, delete it after some time has gone by

Hazard Pointers

- Construct for managing memory in lockfree data structures
- Straightforward concept:
 - Read threads publish hazard pointers that point to any data they are currently reading
 - When a write thread wants to delete data:
 - If it is not associated with any hazard pointers, delete it
 - If it is associated with a hazard pointer, add it to a list
 - Periodically go through the list and reevaluate the data
- Of course, this is tricky in practice
 - You need lock-free structures to:
 - Enable publishing/updating hazard pointers
 - Store the list of data blocked by hazards

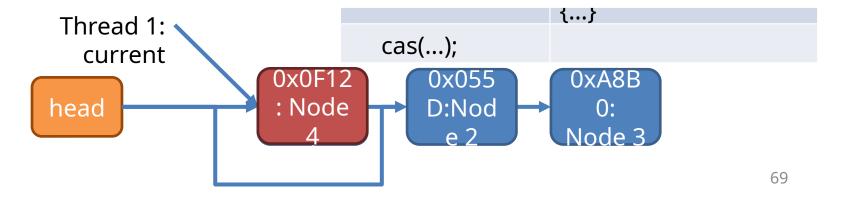
The ABA Problem

- Subtle problem that impacts many lockfree algorithms
- Compare and swap relies on the uniqueness of pointers
 - Example: cas(&head, current, current->next)
- However, sometimes the memory manager will reuse pointers

```
item * a = stack.pop();
free a;
item * b = new item();
stack.push(b);
assert(a != b); // this assertion may fail!
```

ABA Example

```
bool pop(int& t) {
  Node* current = head;
  while(current) {
    if(cas(&head, current, current->next)) {
        t = current->data;
        delete current;
        return true;
    }
    current = head;
}
current = head;
}
return false;
}
```



Applications of Lock-Free Structures

- Stack
- Queue
- Deque
- Linked list
- Doubly linked list
- Hash table
- Many variations on each
 - Lock free vs. wait free

- Memory managers
 - Lock free malloc() and free()
- The Linux kernel
 - Many key structures are lock-free

References

- Geoff Langdale, Lock-free Programming
 - http://www.cs.cmu.edu/~410-s05/lectures/L31_LockFree.pdf
- Herb Sutter, Writing Lock-Free Code: A Corrected Queue
 - http://www.drdobbs.com/parallel/writing-lock-free-code-a-corrected-queue/210604448