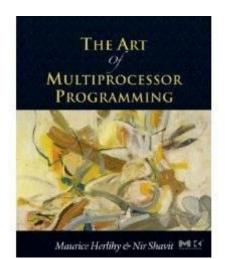
# Introduction to Multiprocessor Synchronization

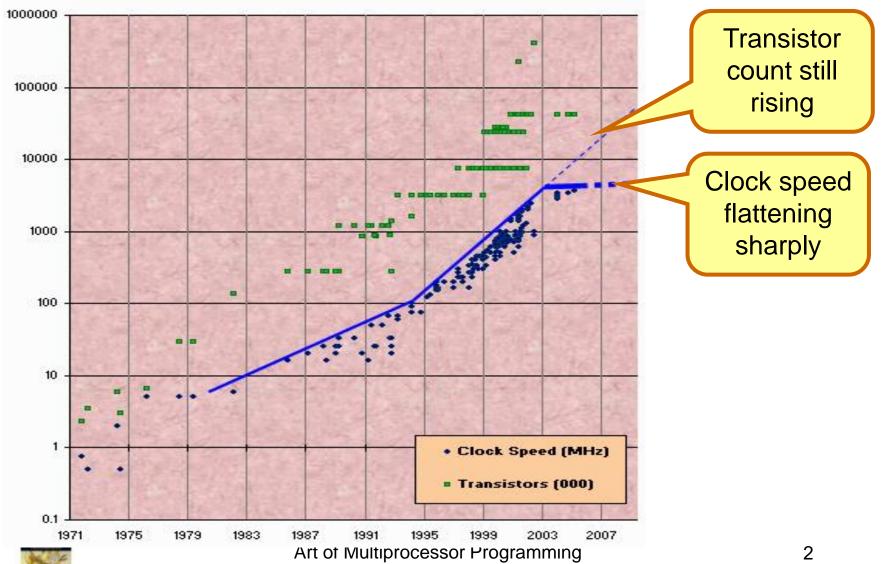




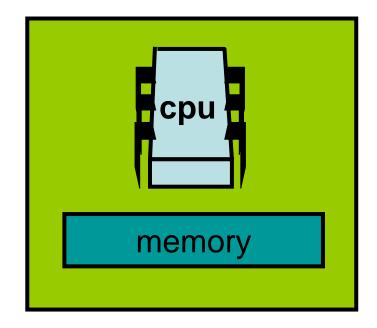
#### **Maurice Herlihy**

http://cs.brown.edu/courses/cs176/lectures.shtml

#### Moore's Law

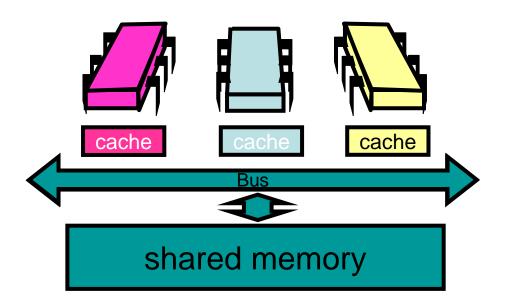


# Once roamed the Earth: the Uniprocesor





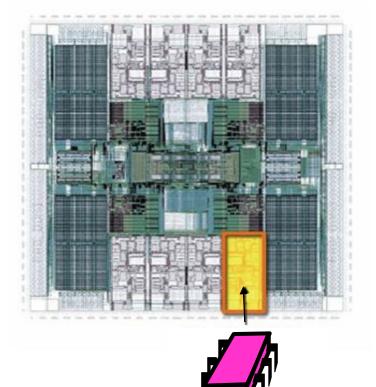
#### Endangered: The Shared Memory Multiprocessor (SMP)





#### Meet he New Boss: The Multicore Processor (CMP)





Oracle Niagara Chip



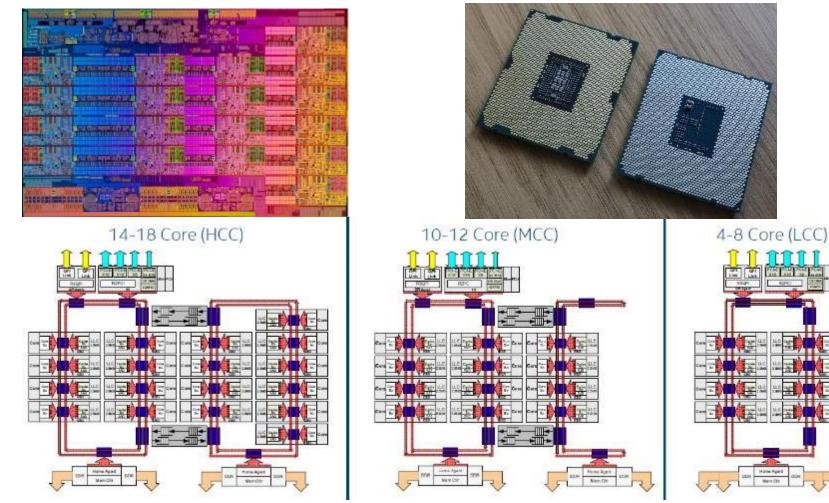
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# **Turing Cluster**

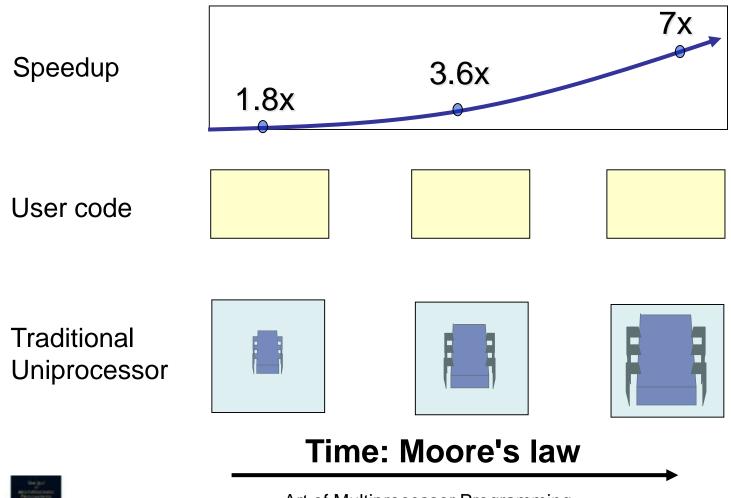
- 24 Compute Nodes in two 12 node 3U blades. Each node has one 8-core AMD Opteron 3380 processor @
   2.6GHz, 32GB RAM, 2TB HDD, Gigabit Ethernet port
- I Head Node with one 6-core Intel Xeon E5-2620 v3 processor @ 2.40GHz, 48GB RAM, 1+4TB HDD, Gigabit Ethernet ports
- One 24 port L2 Gigabit Ethernet switch
- Running CentOS, MPI, PBS and Apache Hadoop/Yarn
- Mounted on a 24U Rack
- http://cds.iisc.ac.in/internal-resources/computing-resources/

#### Turing Cluster: Xeon E5-2620 v3



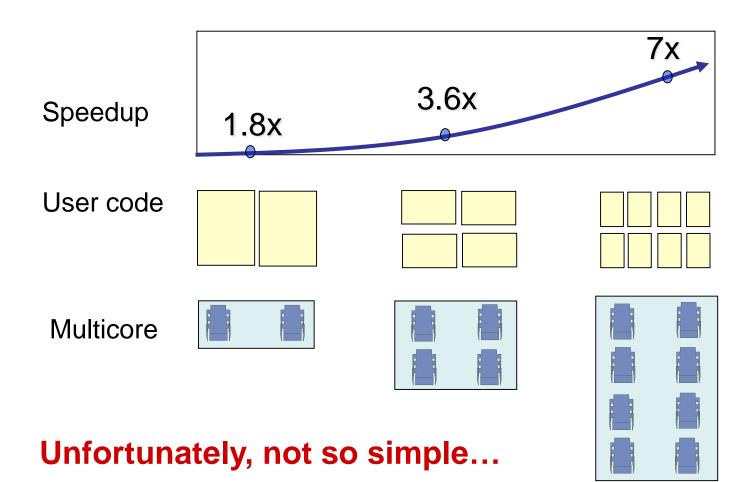
http://2eof2j3oc7is20vt9q3g7tlo5xe.wpengine.netdna-cdn.com/wp-content/uploads/2014/09/intel-xeon-e5-v3-block-diagram-detailed.jpg http://www.enterprisetech.com/wp-content/uploads/2014/09/intel-xeon-e5-v3-die-shot.jpg

# **Traditional Scaling Process**



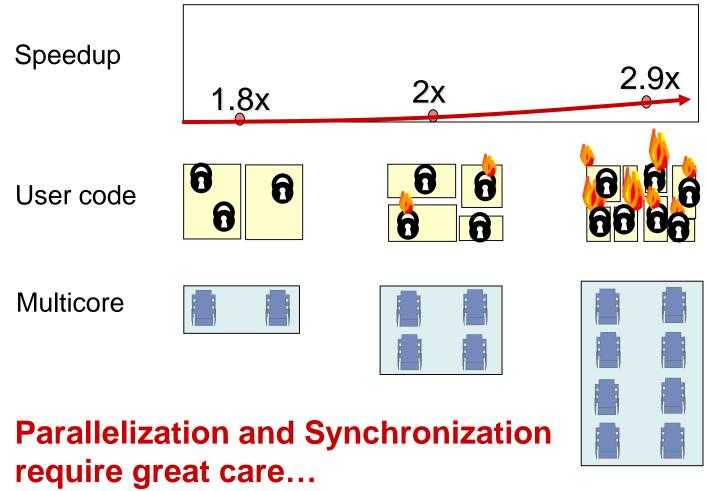


# Ideal Multicore Scaling Process

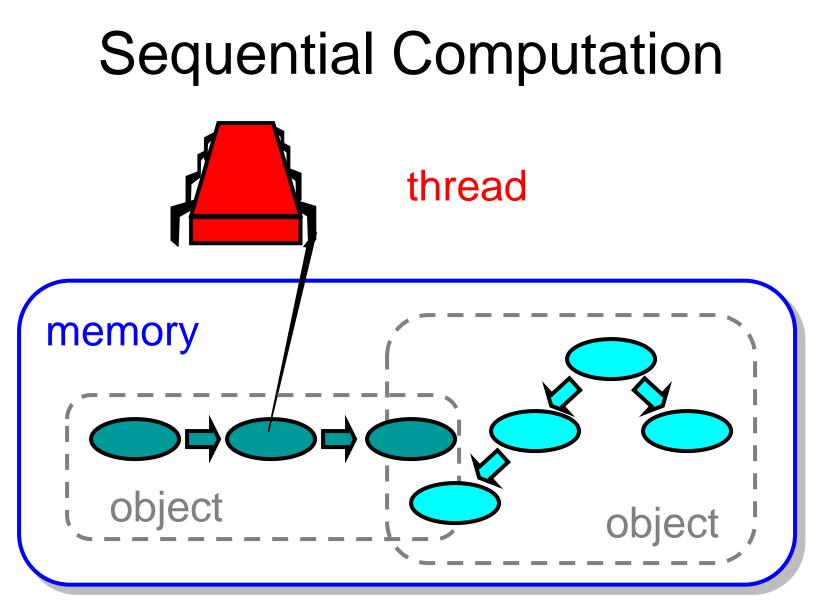




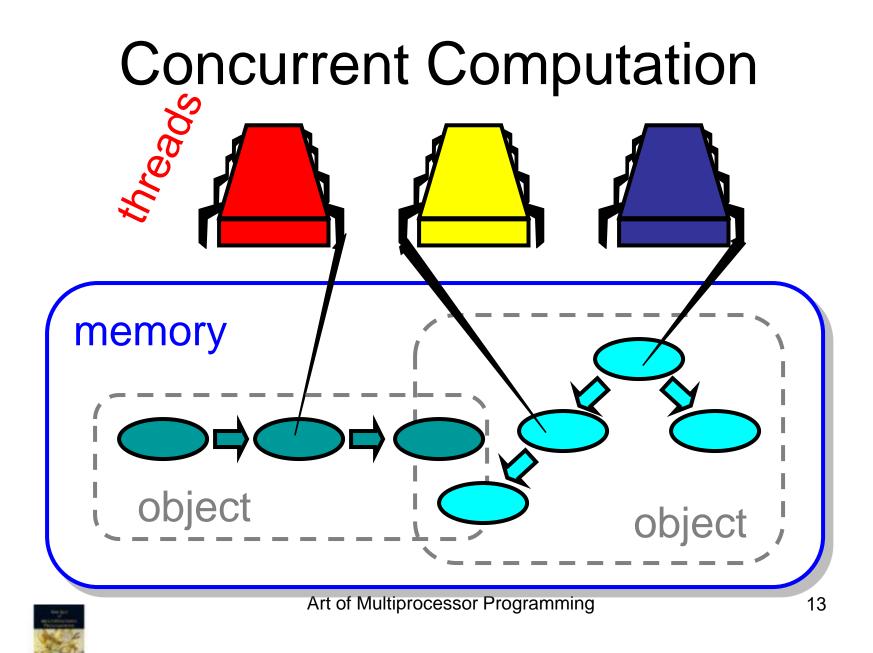
# **Actual Multicore Scaling Process**

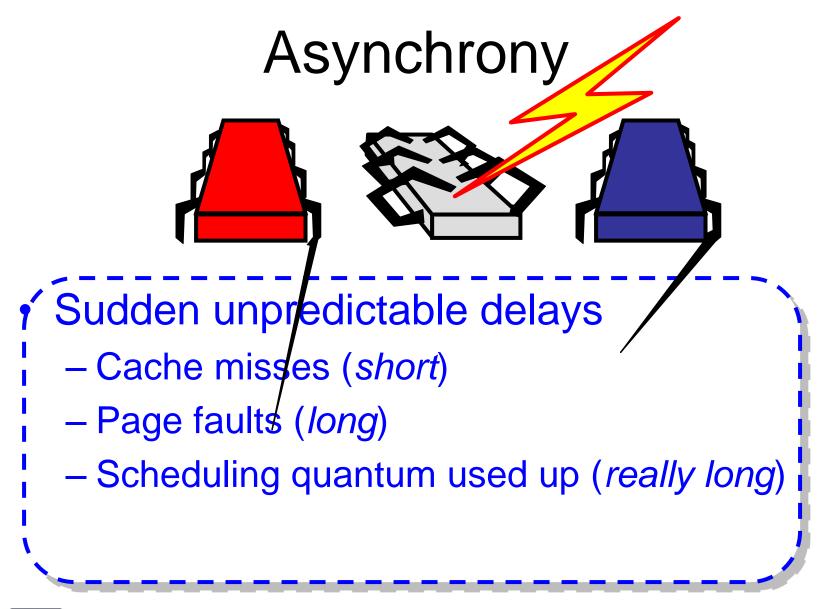














# Model Summary

- Multiple threads
- Single shared memory
- Objects live in memory
- Unpredictable asynchronous delays



# **Concurrency Jargon**

- Hardware
  - Processors
- Software
  - Threads, processes
- Sometimes OK to confuse them, sometimes not.



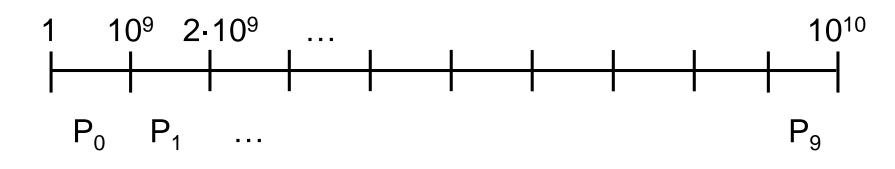
# **Parallel Primality Testing**

- Challenge
  - Print primes from 1 to  $10^{10}$
- Given
  - Ten-processor multiprocessor
  - One thread per processor
- Goal

- Get ten-fold speedup (or close)



# Load Balancing



- Split the work evenly
- Each thread tests range of 10<sup>9</sup>



#### Procedure for Thread i

```
void primePrint {
    int i = ThreadID.get(); // IDs in {0..9}
    for (j = i*10<sup>9</sup>+1, j<(i+1)*10<sup>9</sup>; j++) {
        if (isPrime(j))
            print(j);
        }
}
```



#### Issues

- Higher ranges have fewer primes
- Yet larger numbers harder to test
- Thread workloads
  - Uneven
  - Hard to predict

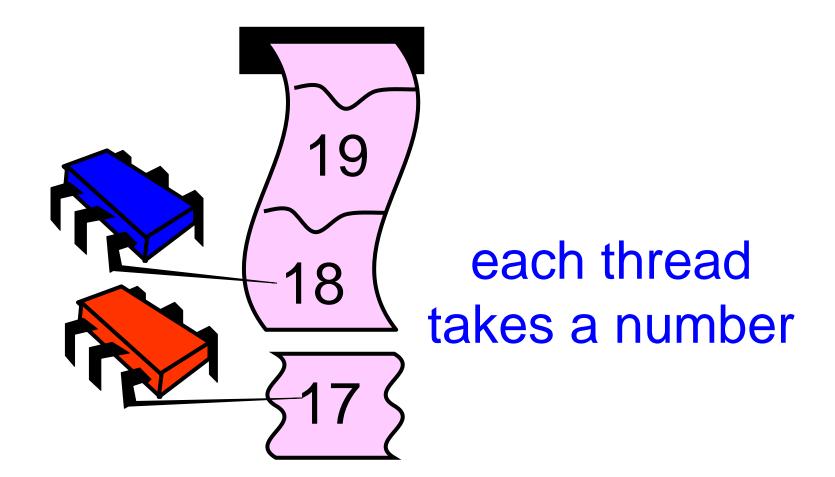


#### Issues

- Higher ranges have fewer primes
- Yet larger numbers harder to tee eiect
- Thread workloads
  - Uneven
  - Hard to predict
- Need dynamic load balancing



#### **Shared Counter**





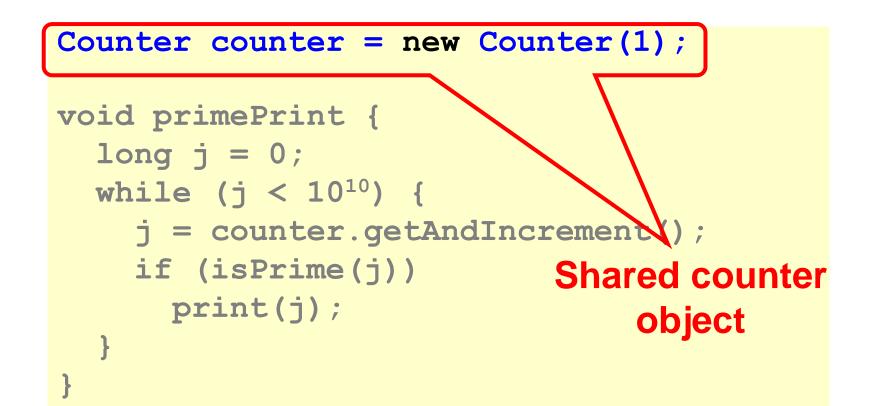
#### Procedure for Thread i

```
int counter = new Counter(1);
void primePrint {
   long j = 0;
   while (j < 10<sup>10</sup>) {
      j = counter.getAndIncrement();
      if (isPrime(j))
        print(j);
   }
```



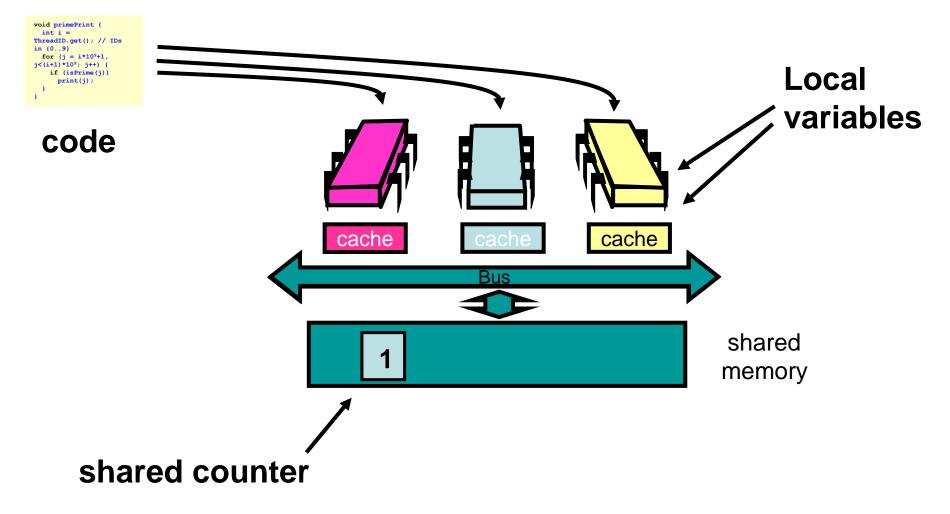
}

#### Procedure for Thread i



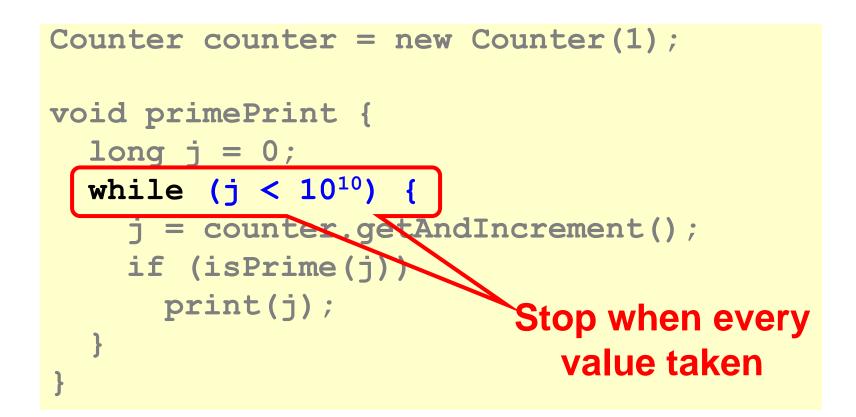


### Where Things Reside



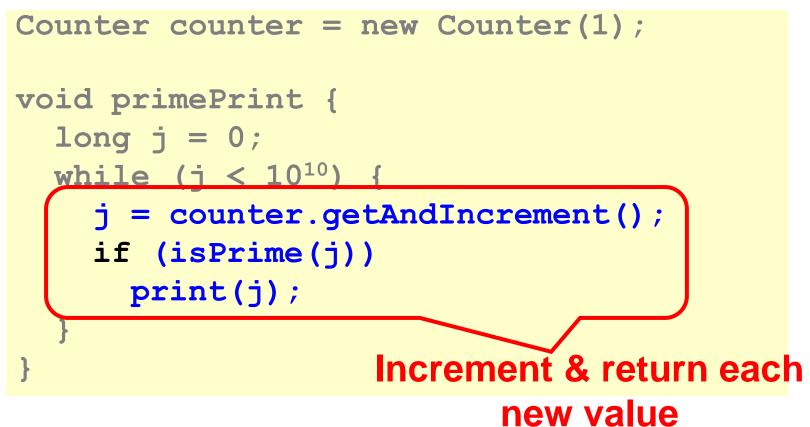


#### Procedure for Thread i





### Procedure for Thread i





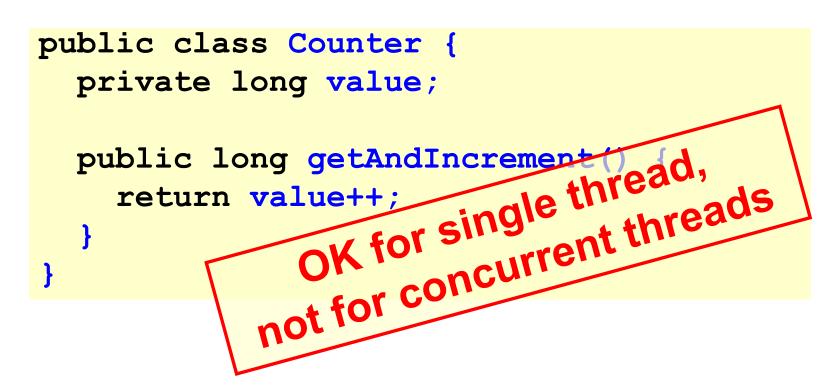
#### **Counter Implementation**

```
public class Counter {
    private long value;
```

```
public long getAndIncrement() {
   return value++;
```



#### **Counter Implementation**





#### What It Means

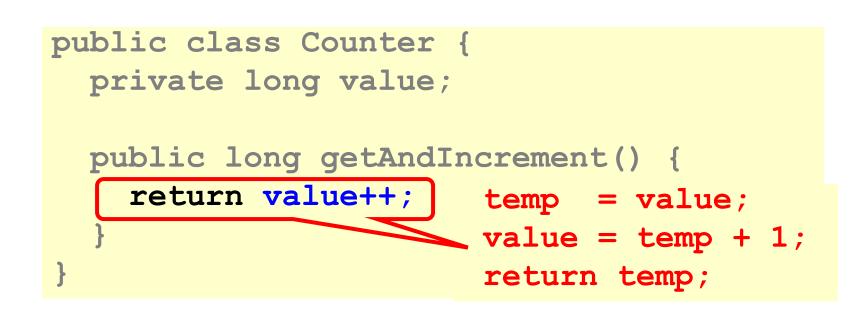
```
public class Counter {
    private long value;
```

```
public long getAndIncrement() {
   return value++;
```



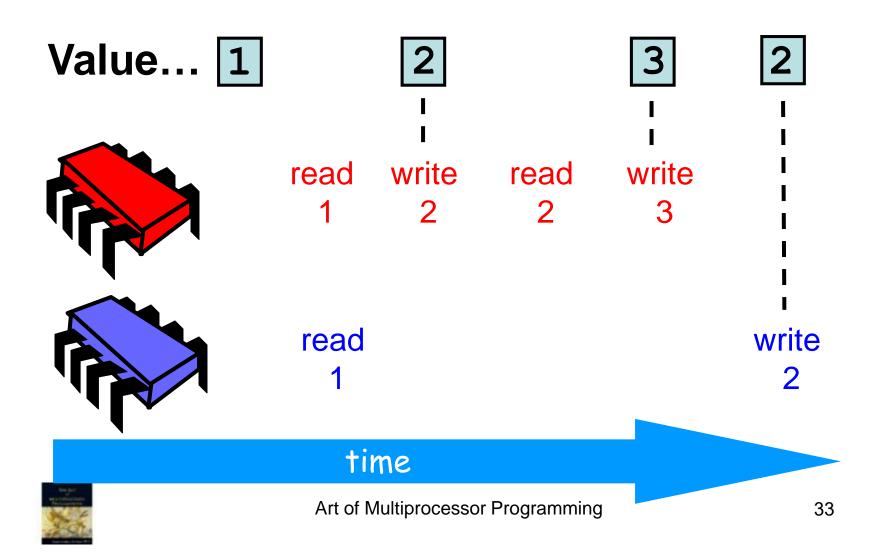
}

#### What It Means





### Not so good...



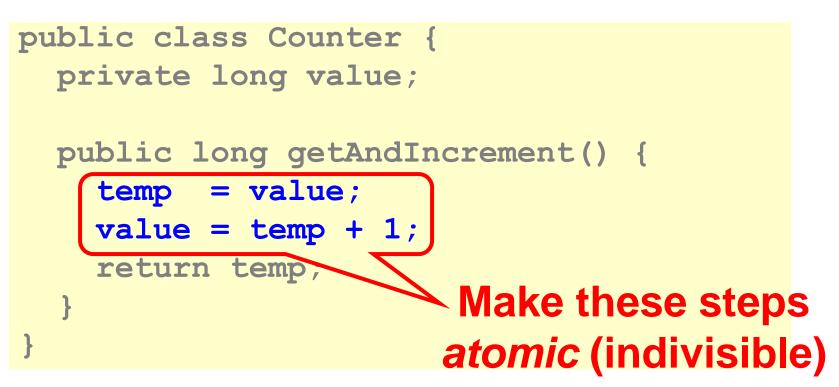
# Challenge

```
public class Counter {
   private long value;

   public long getAndIncrement() {
     temp = value;
     value = temp + 1;
     return temp;
   }
}
```

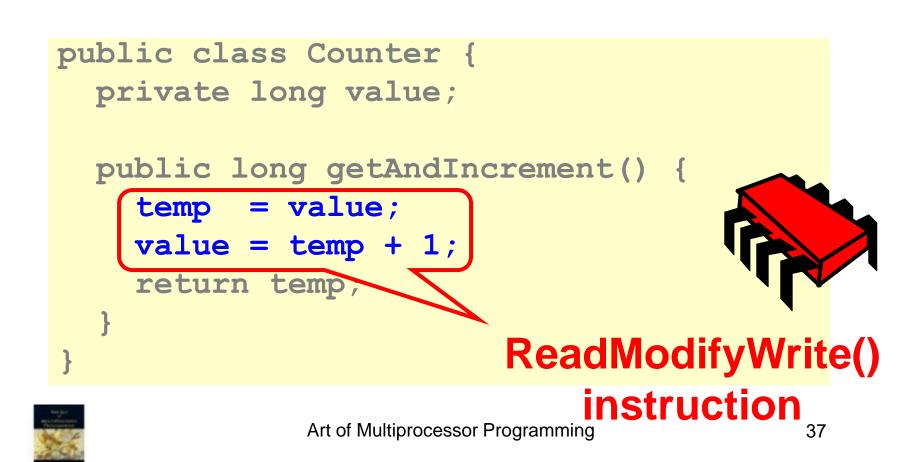


# Challenge





#### Hardware Solution



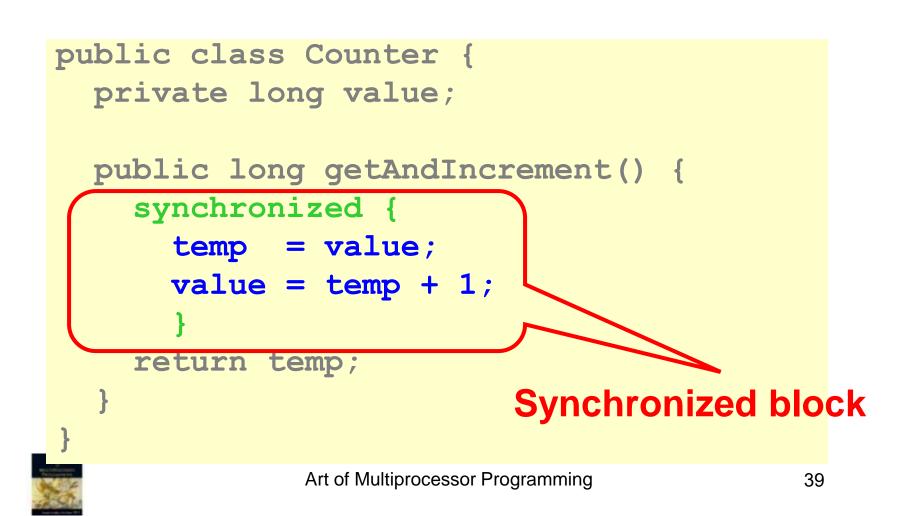
#### An Aside: Java™

```
public class Counter {
   private long value;

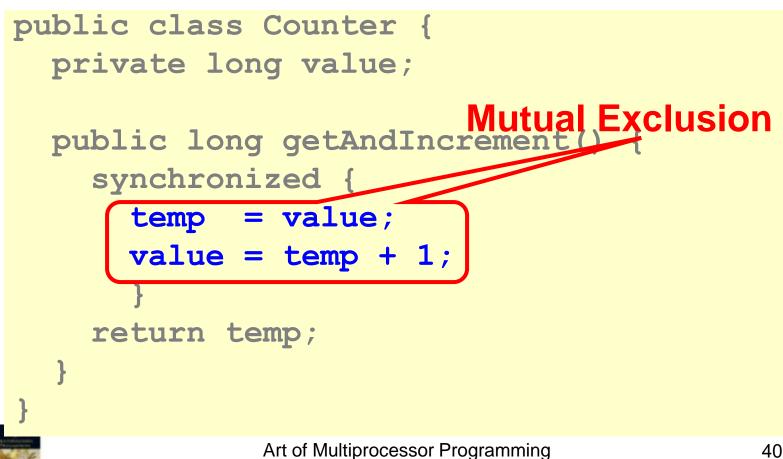
   public long getAndIncrement() {
      synchronized {
      temp = value;
      value = temp + 1;
      }
      return temp;
```



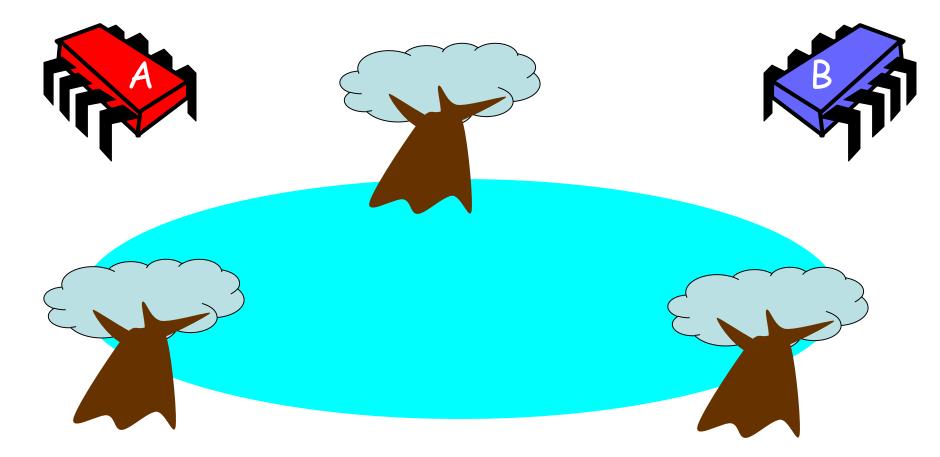
#### An Aside: Java™



#### An Aside: Java™



#### Mutual Exclusion, or "Alice & Bob share a pond"





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#### Alice has a pet



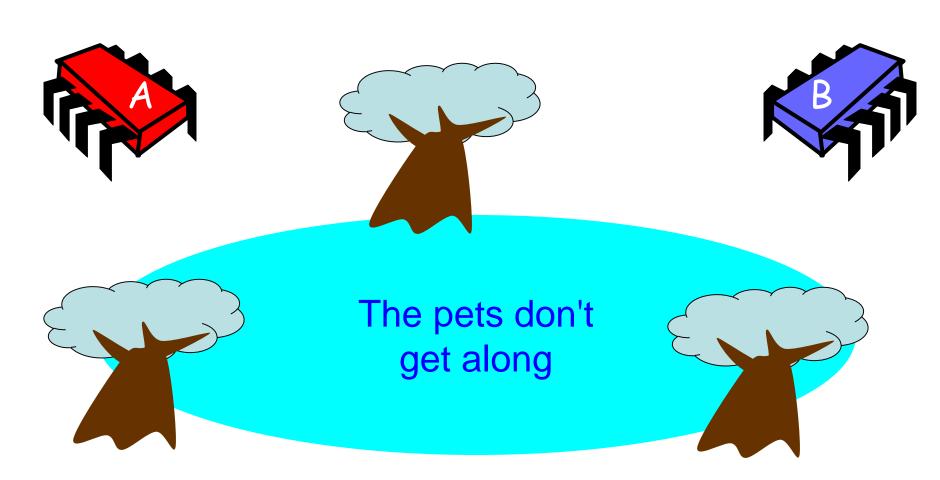


#### Bob has a pet





#### The Problem





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# Formalizing the Problem

- Two types of formal properties in asynchronous computation:
- Safety Properties
  - Nothing bad happens ever
- Liveness Properties

- Something good happens eventually



# Formalizing our Problem

- Mutual Exclusion
  - Both pets never in pond simultaneously
  - This is a safety property
- No Deadlock
  - if only one wants in, it gets in
  - if both want in, one gets in
  - This is a *liveness* property



# Simple Protocol

- Idea
  - Just look at the pond
- Gotcha
  - Not atomic
  - Trees obscure the view



# Interpretation

- Threads can't "see" what other threads are doing
- Explicit communication required for coordination



# **Cell Phone Protocol**

- Idea
  - Bob calls Alice (or vice-versa)
- Gotcha
  - Bob takes shower
  - Alice recharges battery
  - Bob out shopping for pet food ...

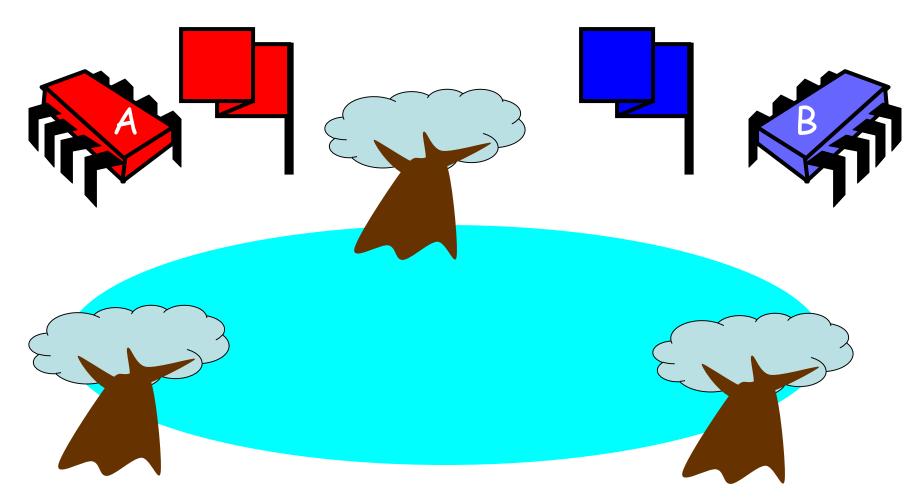


# Interpretation

- Message-passing doesn't work
- Recipient might not be
  - Listening
  - There at all
- Communication must be
  - Persistent (like writing)
  - Not transient (like speaking)



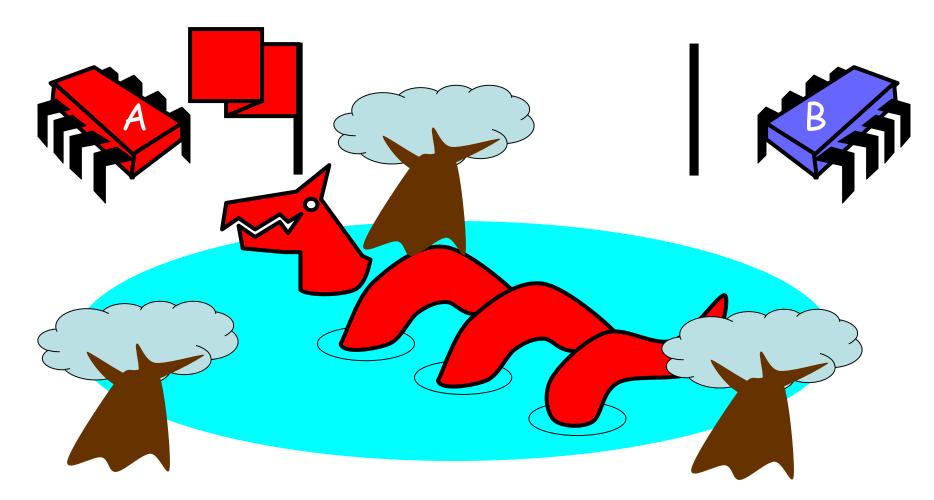
# Flag Protocol





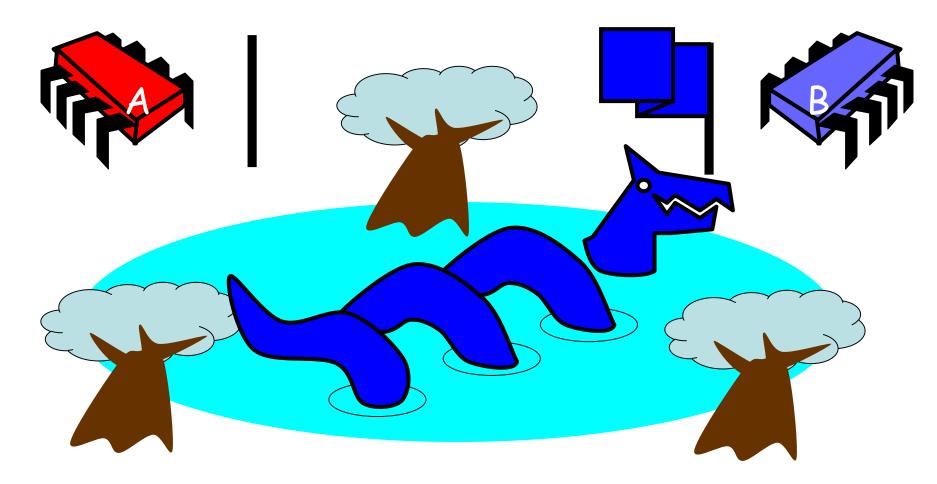
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#### Alice's Protocol (sort of)





### Bob's Protocol (sort of)





# Alice's Protocol

- Raise flag
- Wait until Bob's flag is down
- Unleash pet
- Lower flag when pet returns



# **Bob's Protocol**

- Raise flag
- Wait until Alice's flag is down
- Unleash pet
- Lower flag when pet returns





# Bob's Protocol (2<sup>nd</sup> try)

- Raise flag
- While Alice's flag is up
  - Lower flag
  - Wait for Alice's flag to go down
  - Raise flag
- Unleash pet
- Lower flag when pet returns



# **Bob's Protocol**

**Bob defers**  Raise flag to Alice While Alice's flag is up – Lower flag - Wait for Alice's flag to go down - Raise flag Unleash pet Lower flag when pet returns



# The Flag Principle

- Raise the flag
- Look at other's flag
- Flag Principle:
  - If each raises and looks, then
  - Last to look must see both flags up



# Remarks

- Protocol is unfair
  - Bob's pet might never get in
- Protocol uses waiting
  - If Bob is eaten by his pet, Alice's pet might never get in

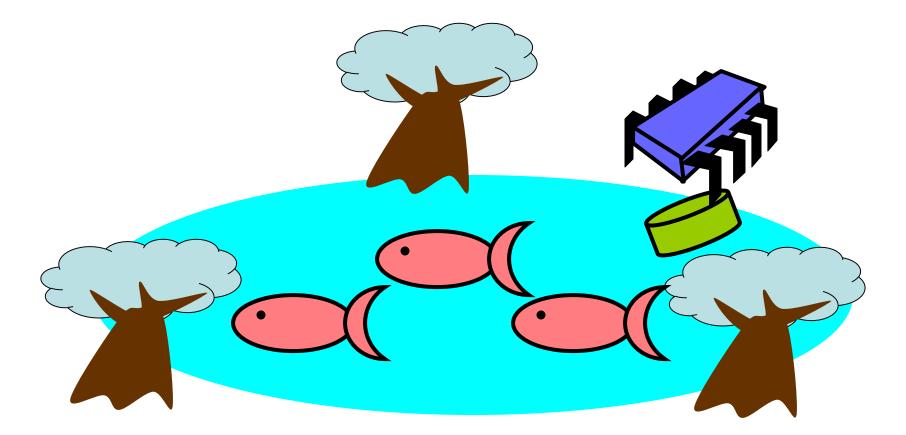




# The Fable Continues

- Bob falls ill, cannot tend to the pets
- She gets the pets
  - Pets get along fine ③
- But Bob has to feed them
- Producer-Consumer Problem

### Bob Puts Food in the Pond





#### Alice releases her pets to Feed







# Producer/Consumer

#### Alice and Bob can't meet

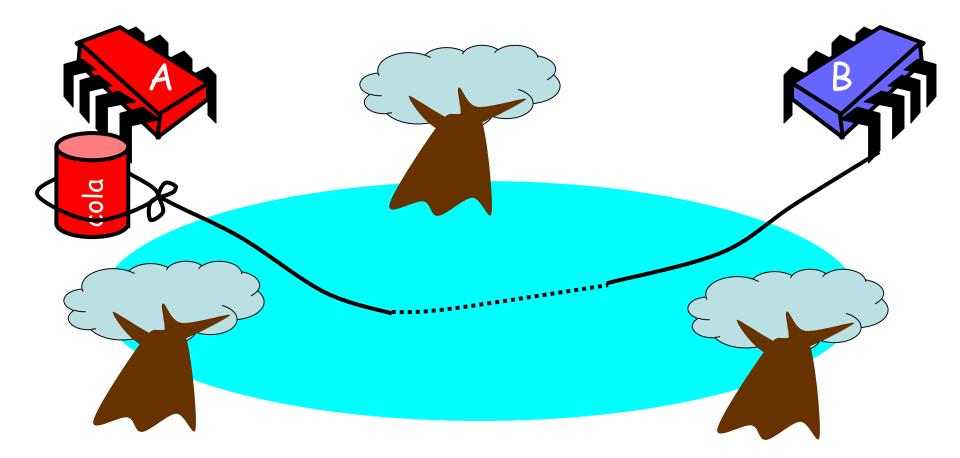
- Bob's disease is contagious
- So he puts food in the pond
- And later, she releases the pets
- Avoid
  - Releasing pets when there's no food
  - Putting out food if uneaten food remains

# Producer/Consumer

- Need a mechanism so that
  - Bob lets Alice know when food has been put out
  - Alice lets Bob know when to put out more food



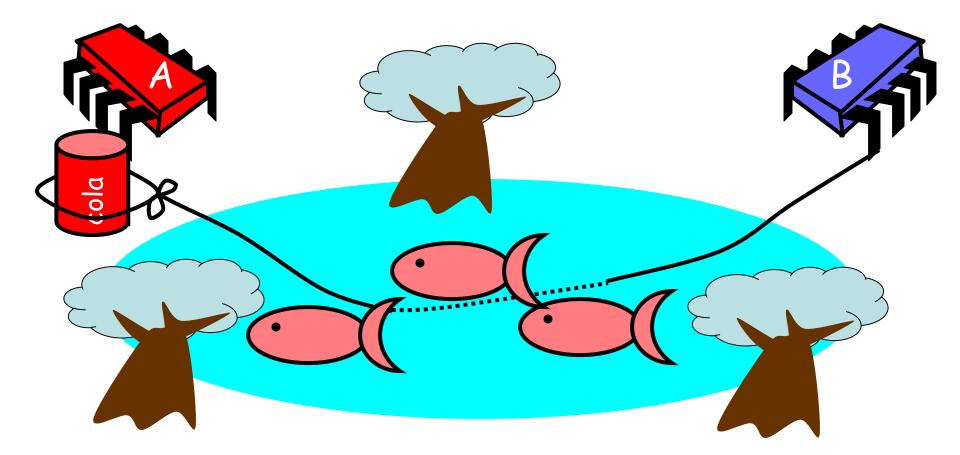
#### "Can" Solution





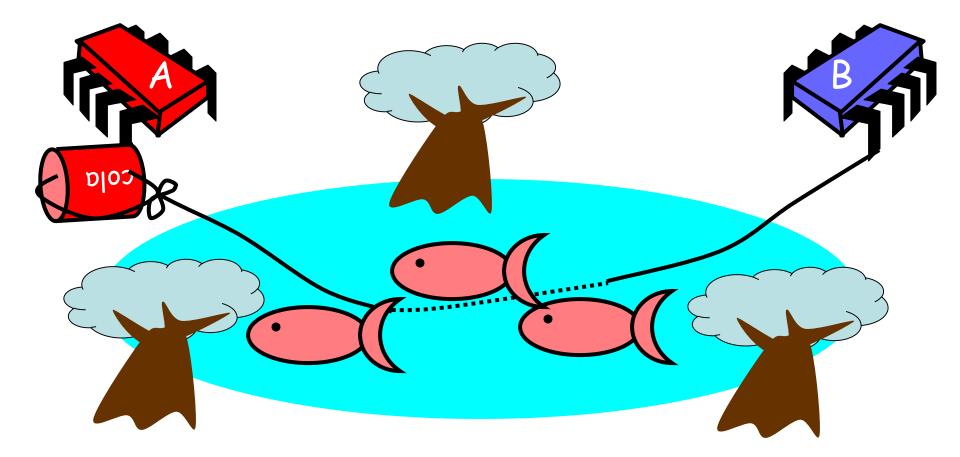
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### Bob puts food in Pond





#### Bob knocks over Can



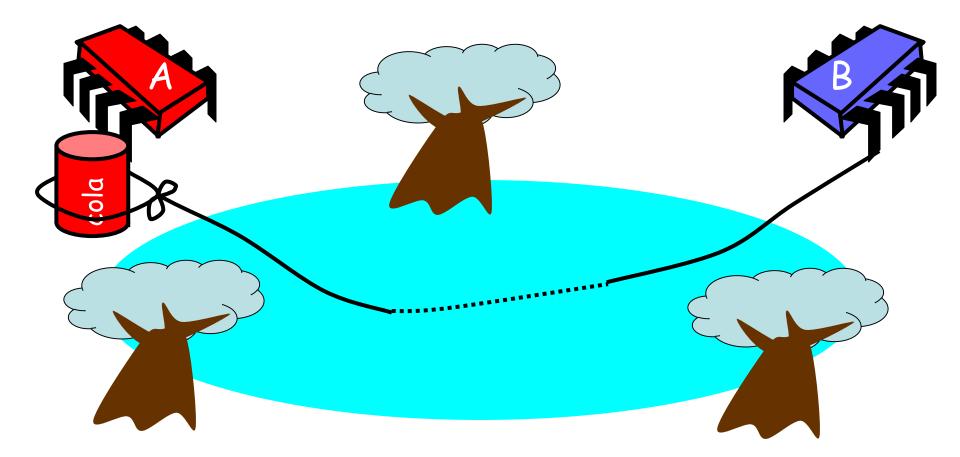


#### Alice Releases Pets





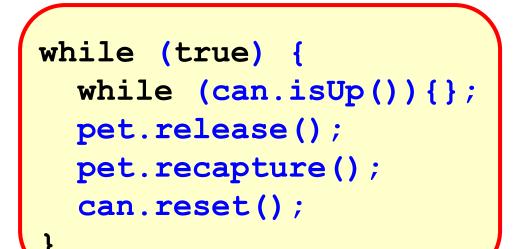
# Alice Resets Can when Pets are Fed





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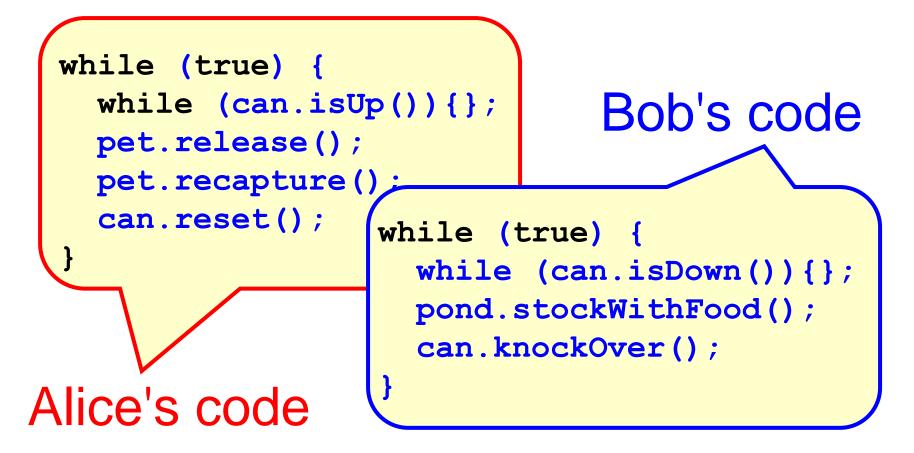
#### Pseudocode



#### Alice's code



#### Pseudocode





#### Correctness

Mutual Exclusion

- Pets and Bob never together in pond

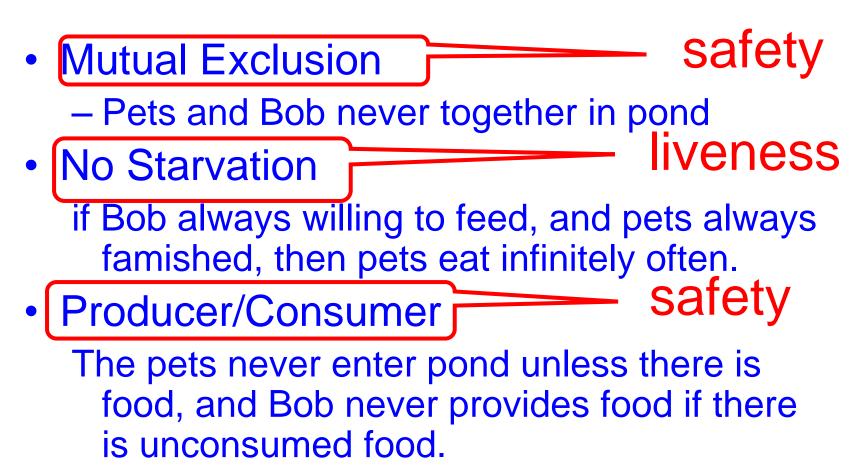


#### Correctness

- Mutual Exclusion
  - Pets and Bob never together in pond
- No Starvation
  - if Bob always willing to feed, and pets always famished, then pets eat infinitely often.



#### Correctness

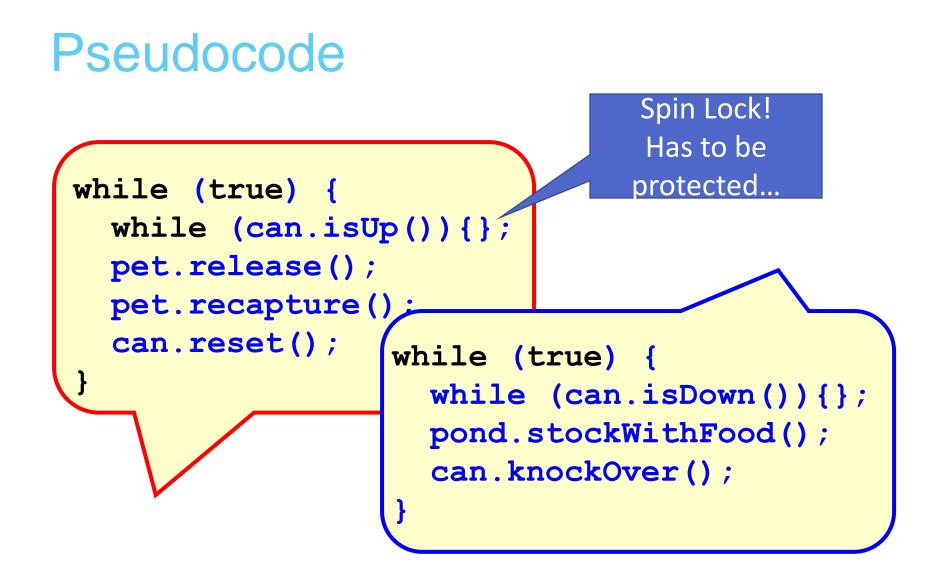






# Spin Locks Aside

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# What Should you do if you can't get a lock?

- Keep trying
  - "spin" or "busy-wait"
  - Good if delays are short
- Give up the processor
  - Good if delays are long
  - Always good on uniprocessor

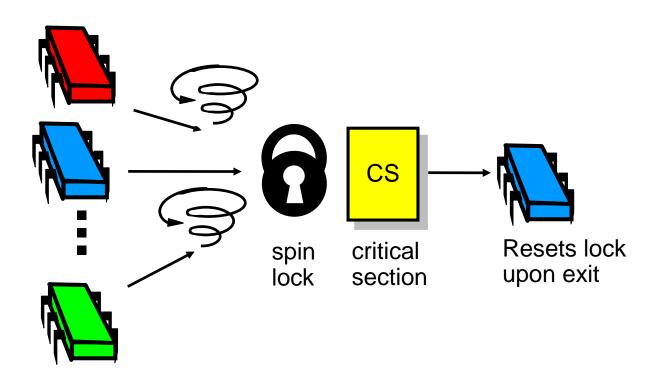


# What Should you do if you can't get a lock?

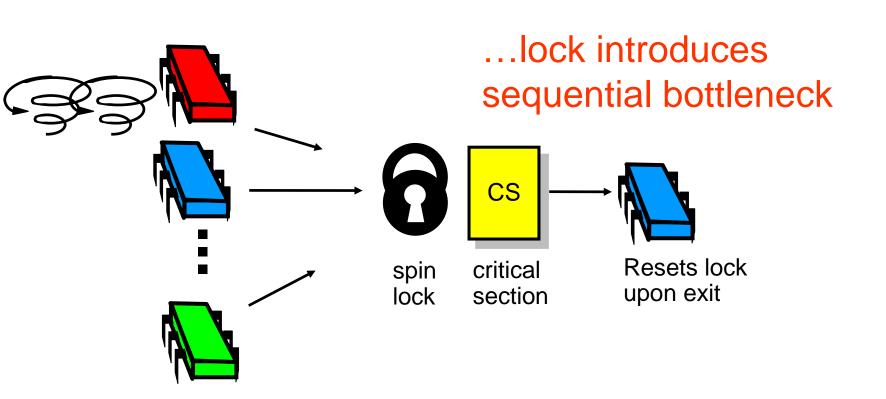
"spin" or "busy-wait" Good if delays are short Give up the processor - Good if delays are long Always good on uniprocessor



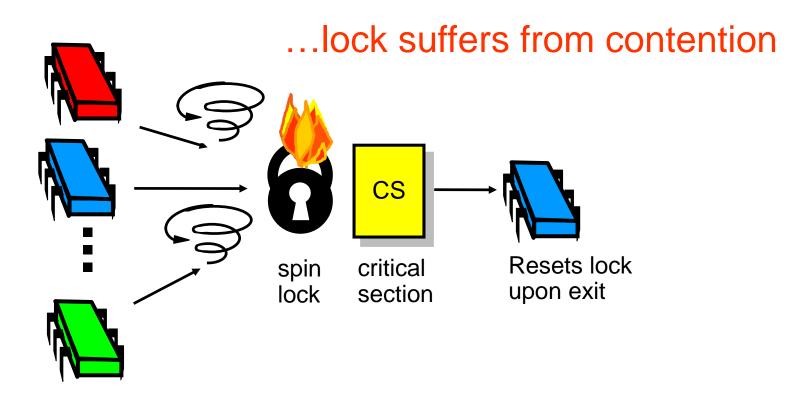
our focus



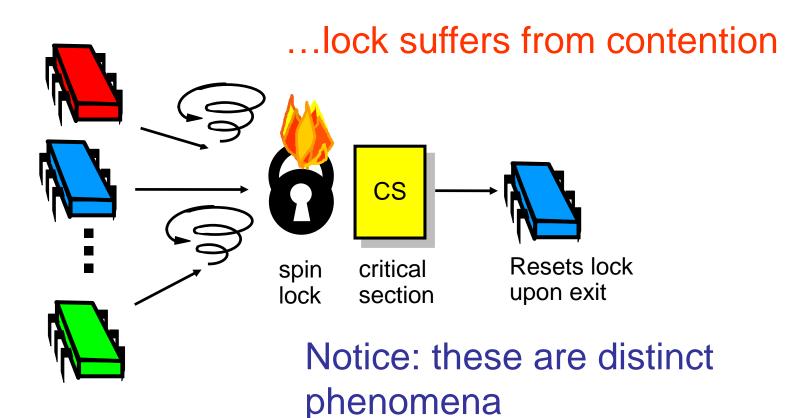




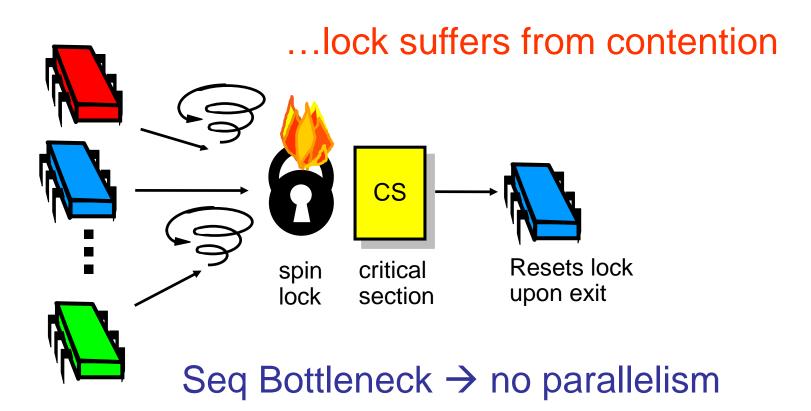






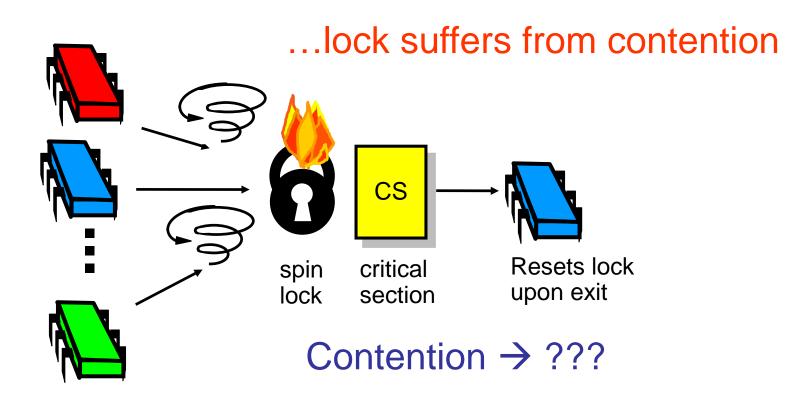








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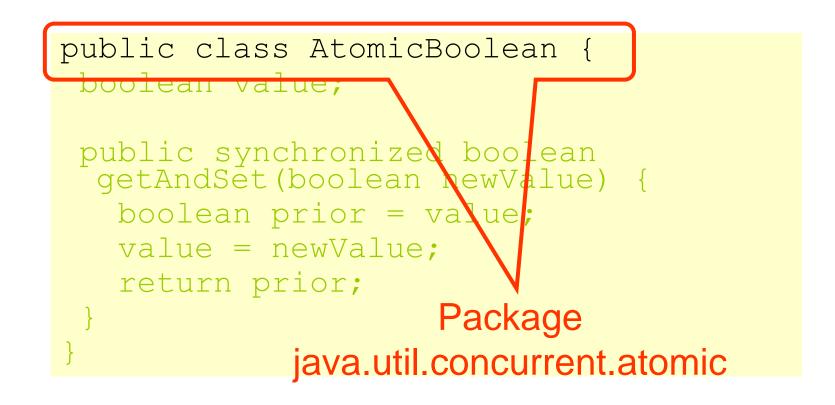
- Boolean value
- Test-and-set (TAS)
  - Swap true with current value
  - Return value tells if prior value was true or false
- Can reset just by writing false
- TAS aka "getAndSet"



```
public class AtomicBoolean {
  boolean value;
```

```
public synchronized boolean
getAndSet(boolean newValue) {
   boolean prior = value;
   value = newValue;
   return prior;
}
```







public class AtomicBoolean {
 boolean value;

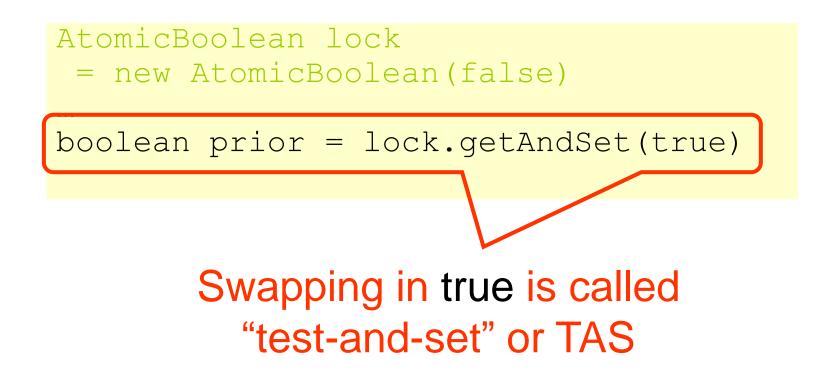
public synchronized boolean
getAndSet(boolean newValue) {
 boolean prior = value;
 value = newValue;
 return prior;

# Swap old and new values



```
AtomicBoolean lock
    = new AtomicBoolean(false)
...
boolean prior = lock.getAndSet(true)
```





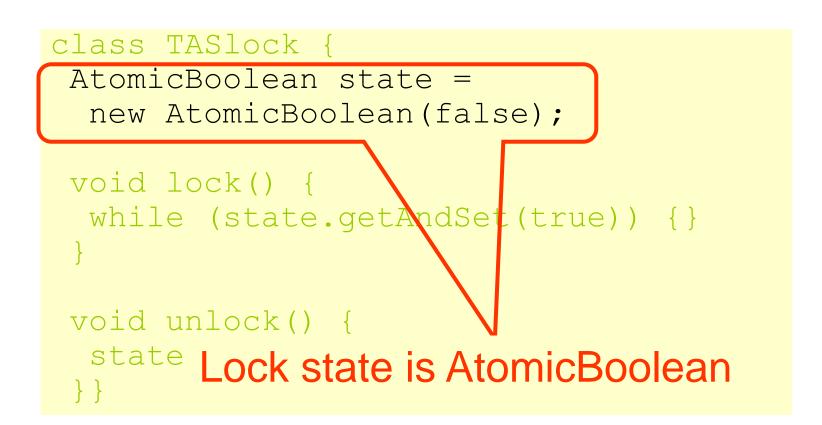


- Locking
  - Lock is free: value is false
  - Lock is taken: value is true
- Acquire lock by calling TAS
  - If result is false, you win
  - If result is true, you lose
- Release lock by writing false



```
class TASlock {
AtomicBoolean state =
  new AtomicBoolean(false);
 void lock() {
 while (state.getAndSet(true)) {}
 }
 void unlock() {
  state.set(false);
 } }
```





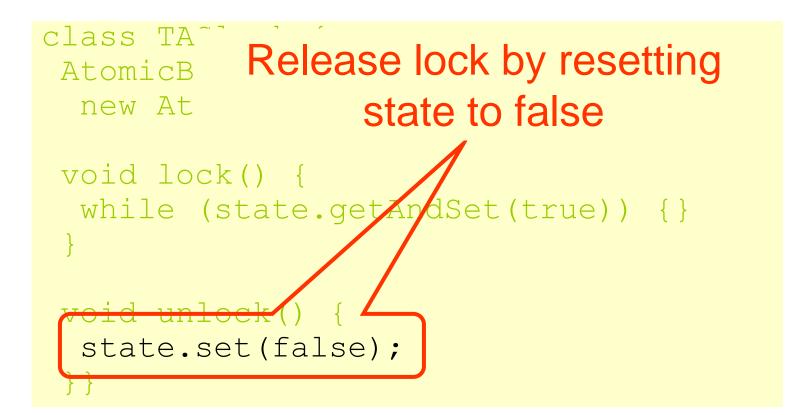


class TASlock {
 AtomicBoolean state =
 new AtomicBoolean(false);

void lock() {
 while (state.getAndSet(true)) {}

void unlock() {
 sta Keep trying until lock acquired
}







### Space Complexity

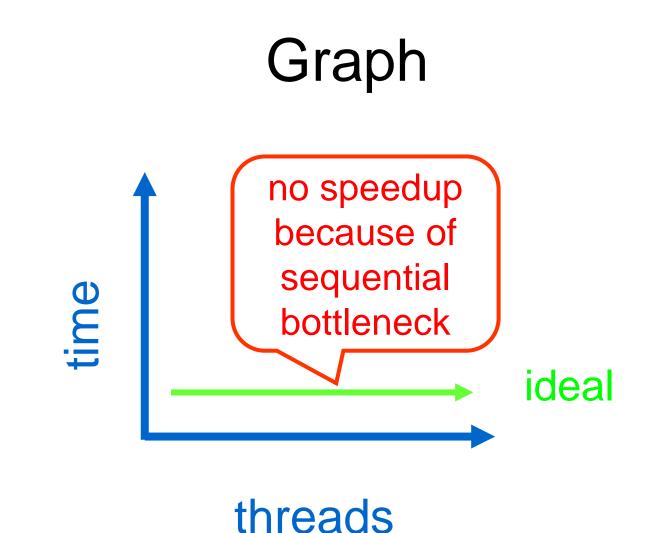
- TAS spin-lock has small "footprint"
- N thread spin-lock uses O(1) space
- As opposed to O(n) Peterson/Bakery
- How did we overcome the  $\Omega(n)$  lower bound?
- We used a RMW operation...



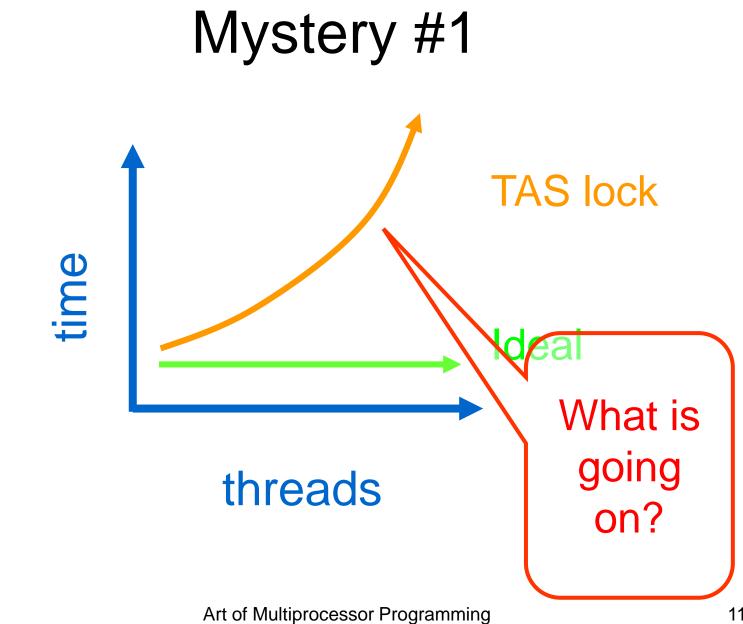
#### Performance

- Experiment
  - n threads
  - Increment shared counter 1 million times
- How long should it take?
- How long does it take?











#### Test-and-Test-and-Set Locks

- Lurking stage
  - Wait until lock "looks" free
  - Spin while read returns true (lock taken)
- Pouncing state
  - As soon as lock "looks" available
  - Read returns false (lock free)
  - Call TAS to acquire lock
  - If TAS loses, back to lurking

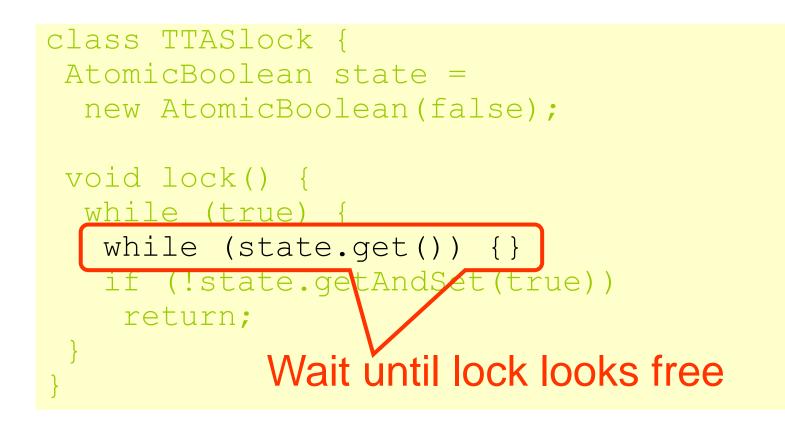


#### Test-and-test-and-set Lock

```
class TTASlock {
AtomicBoolean state =
  new AtomicBoolean(false);
void lock() {
  while (true) {
   while (state.get()) {}
   if (!state.getAndSet(true))
    return;
```

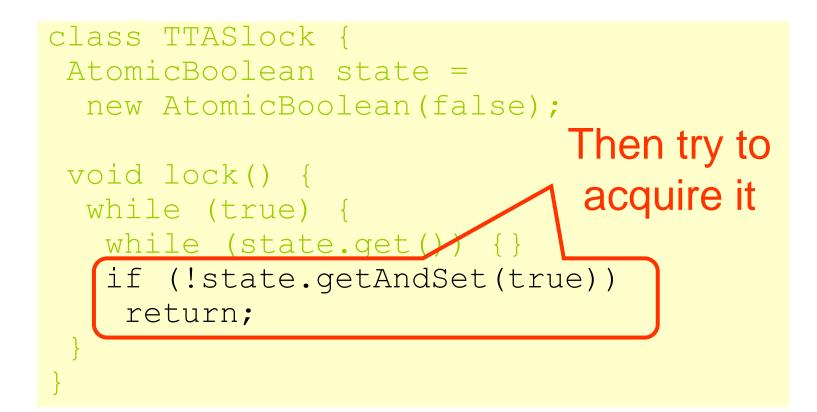


#### Test-and-test-and-set Lock

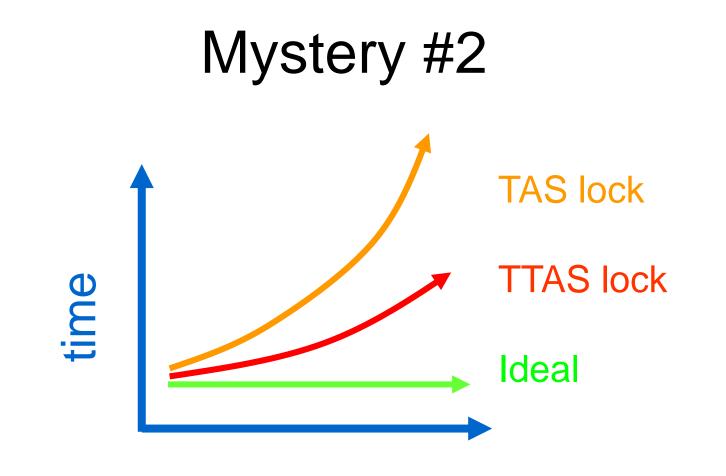




#### Test-and-test-and-set Lock







#### threads



### Mystery

- Both
  - TAS and TTAS
  - Do the same thing (in our model)
- Except that
  - TTAS performs much better than TAS
  - Neither approaches ideal



## Opinion

- Our memory abstraction is broken
- TAS & TTAS methods
  - Are provably the same (in our model)
  - Except they aren't (in field tests)
- Need a more detailed model ...



#### Simple TASLock

- TAS invalidates cache lines
- Spinners
  - Miss in cache
  - Go to bus
- Thread wants to release lock

- delayed behind spinners

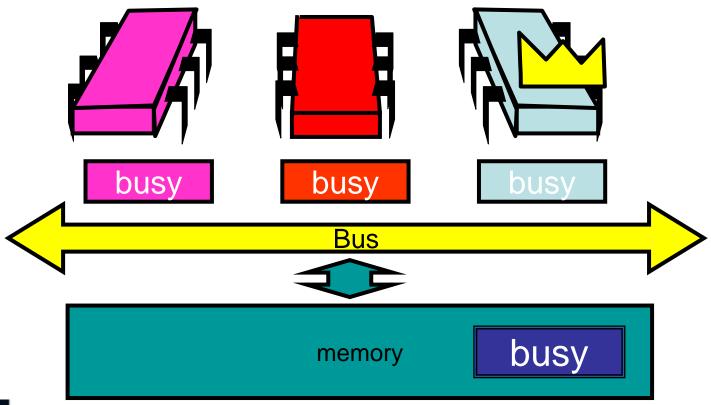


#### Test-and-test-and-set

- Wait until lock "looks" free
  - Spin on local cache
  - No bus use while lock busy
- Problem: when lock is released
  - Invalidation storm ...

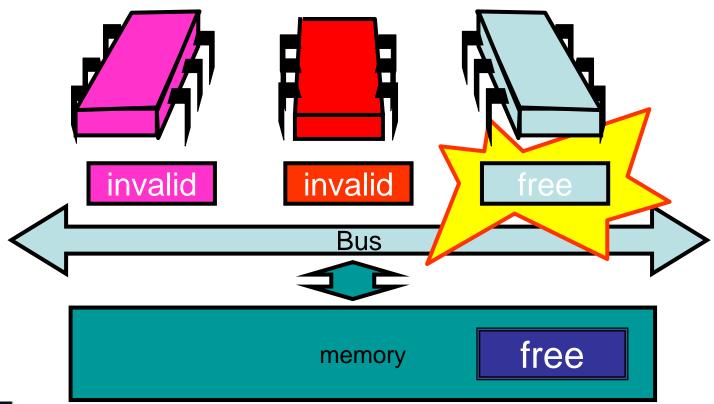


#### Local Spinning while Lock is Busy

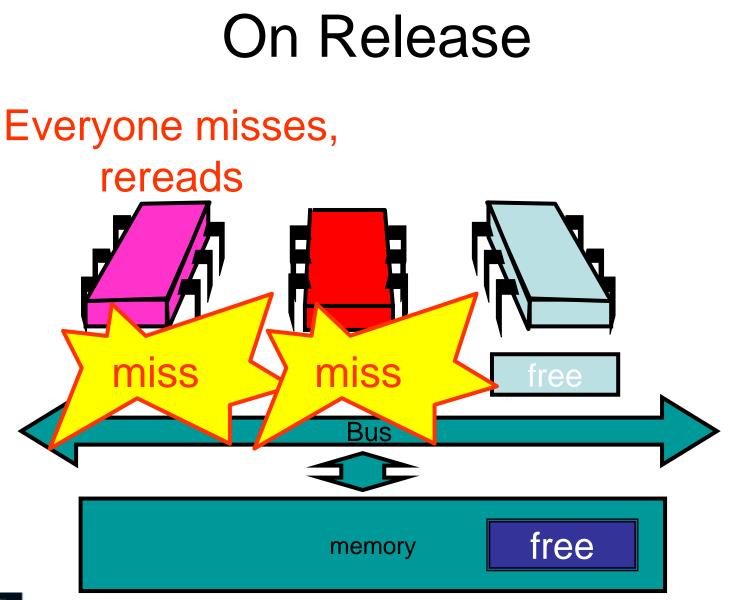




#### On Release



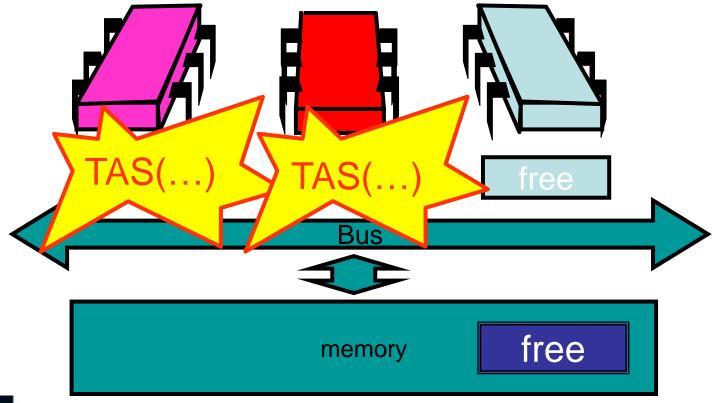






#### On Release

#### **Everyone tries TAS**





### Problems

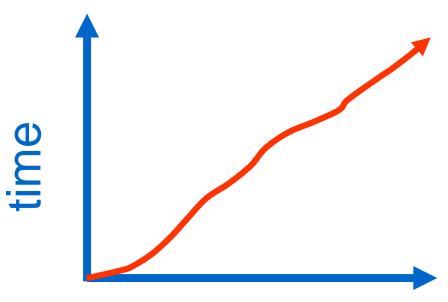
- Everyone misses

   Reads satisfied sequentially
- Everyone does TAS

   Invalidates others' caches
- Eventually quiesces after lock acquired
   How long does this take?



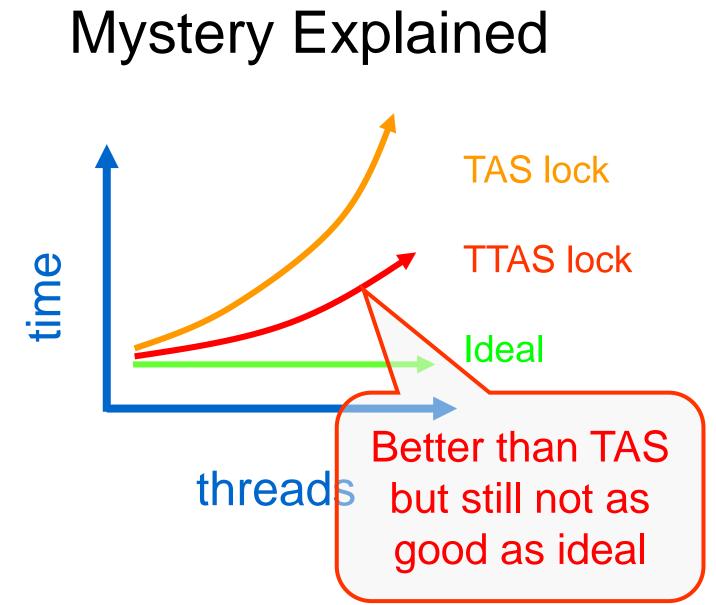
#### **Quiescence** Time



Increses linearly with the number of processors for bus architecture

#### threads

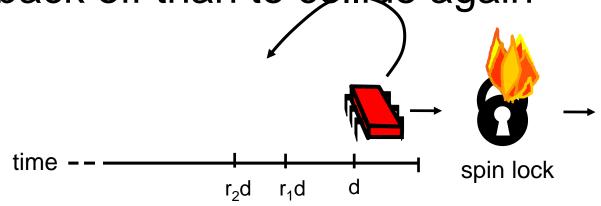






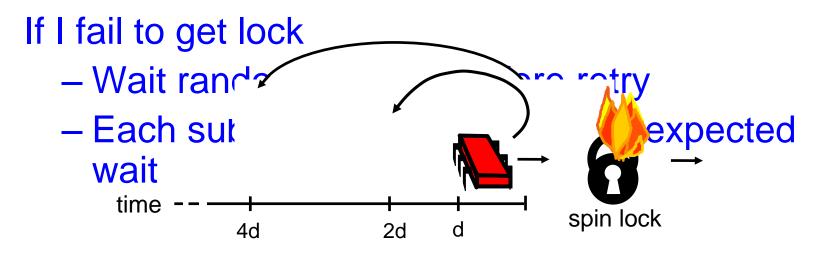
## Solution: Introduce Delay

- If the lock looks free
  - But I fail to get it
- There must be contention
  - Better to back off than to collide again





#### Dynamic Example: Exponential Backoff





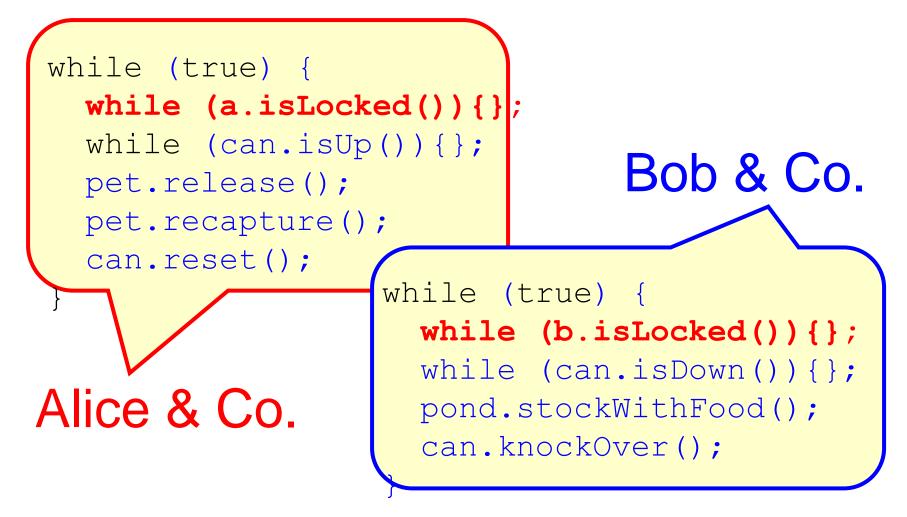


## Concurrent Data Structures



**CDS.IISc.ac.in** | **Department of Computational and Data Sciences** 

## What if you had multiple producers, consumers?



## Does this improve performance?

Sequential bottleneck!

# Why do we care About Sequential Bottlenecks?

- We want as much of the code as possible to execute in parallel
- A larger sequential part implies reduced performance
- Amdahl's law: this relation is not linear...



Eugene Amdahl



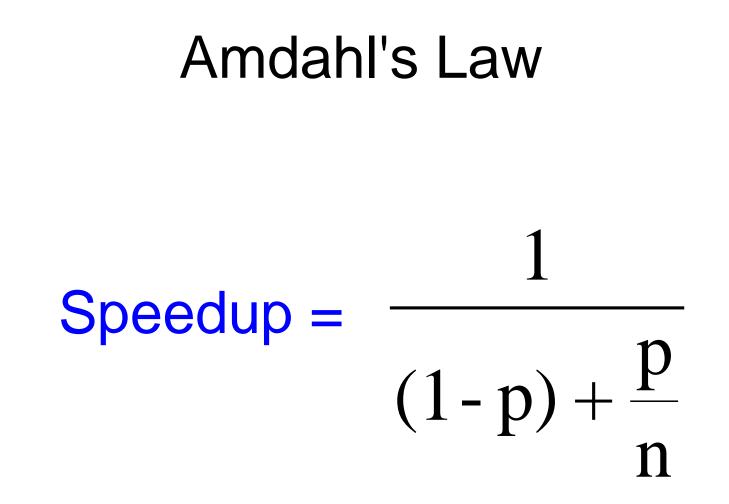
#### Amdahl's Law

#### 1 thread execution time

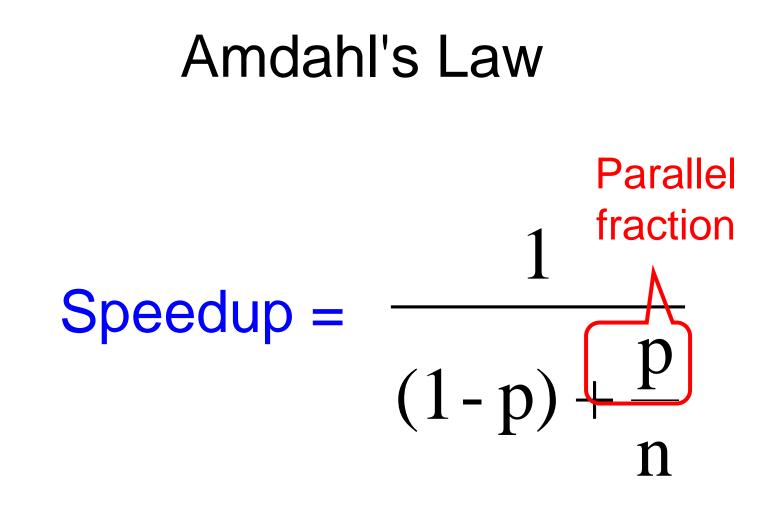
#### Speedup =

#### N thread execution time



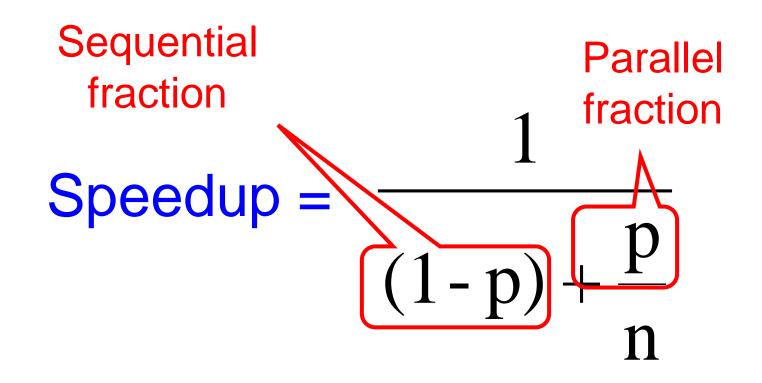






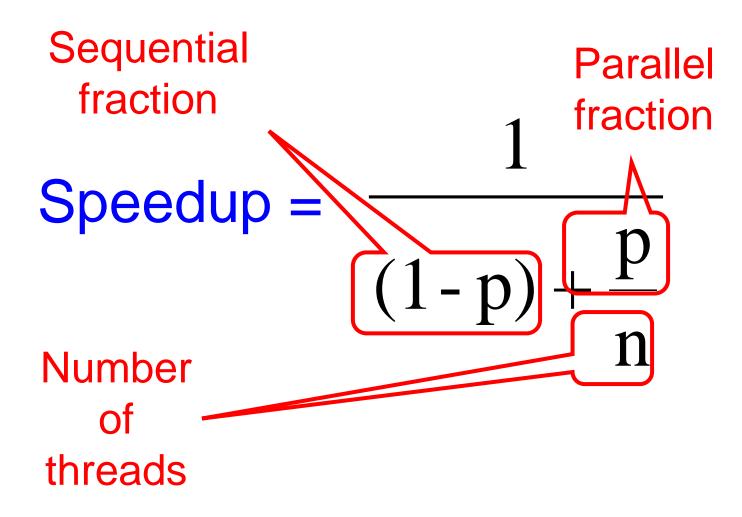


#### Amdahl's Law





#### Amdahl's Law





### Amdahl's Law (in practice)





- Ten processors
- 60% concurrent, 40% sequential
- How close to 10-fold speedup?



- Ten processors
- 60% concurrent, 40% sequential
- How close to 10-fold speedup?

Speedup = 2.17 = 
$$\frac{1}{1 - 0.6 + \frac{0.6}{10}}$$



- Ten processors
- 80% concurrent, 20% sequential
- How close to 10-fold speedup?



- Ten processors
- 80% concurrent, 20% sequential
- How close to 10-fold speedup?

Speedup = 3.57 = 
$$\frac{1}{1 - 0.8 + \frac{0.8}{10}}$$



- Ten processors
- 90% concurrent, 10% sequential
- How close to 10-fold speedup?



- Ten processors
- 90% concurrent, 10% sequential
- How close to 10-fold speedup?

Speedup = 5.26 = 
$$\frac{1}{1 - 0.9 + \frac{0.9}{10}}$$



- Ten processors
- 99% concurrent, 01% sequential
- How close to 10-fold speedup?

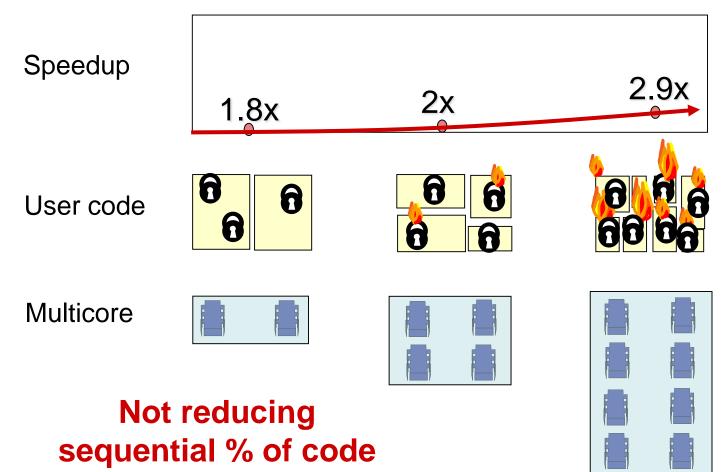


- Ten processors
- 99% concurrent, 01% sequential
- How close to 10-fold speedup?

Speedup = 9.17 = 
$$\frac{1}{1 - 0.99 + \frac{0.99}{10}}$$

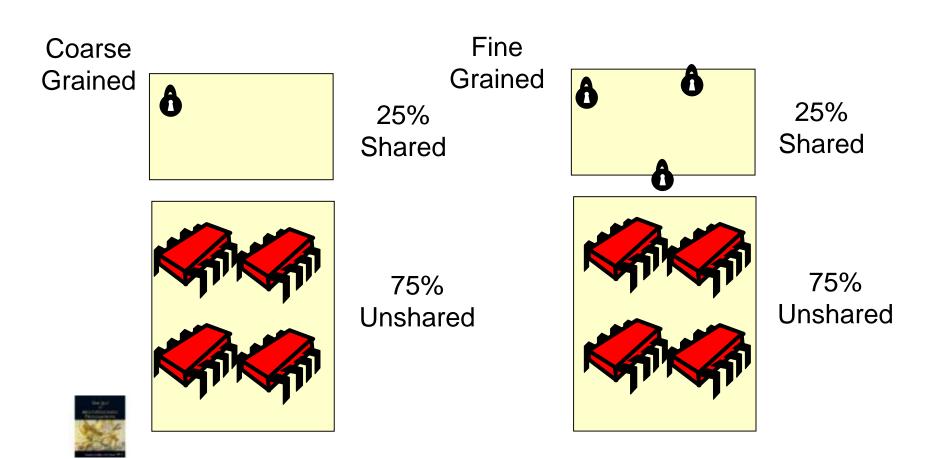


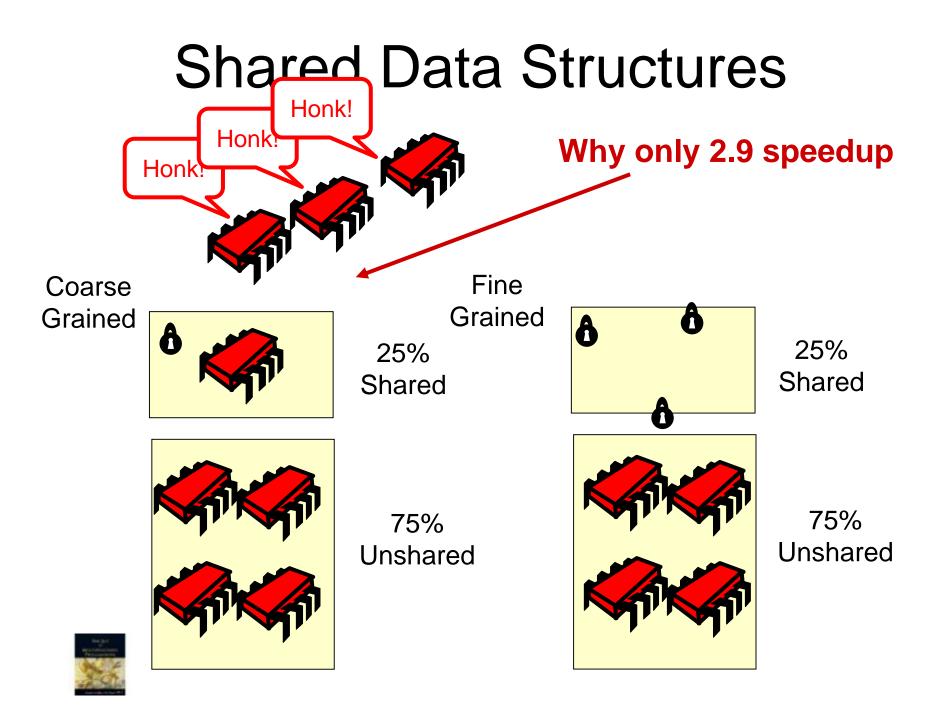
### Back to Real-World Multicore Scaling

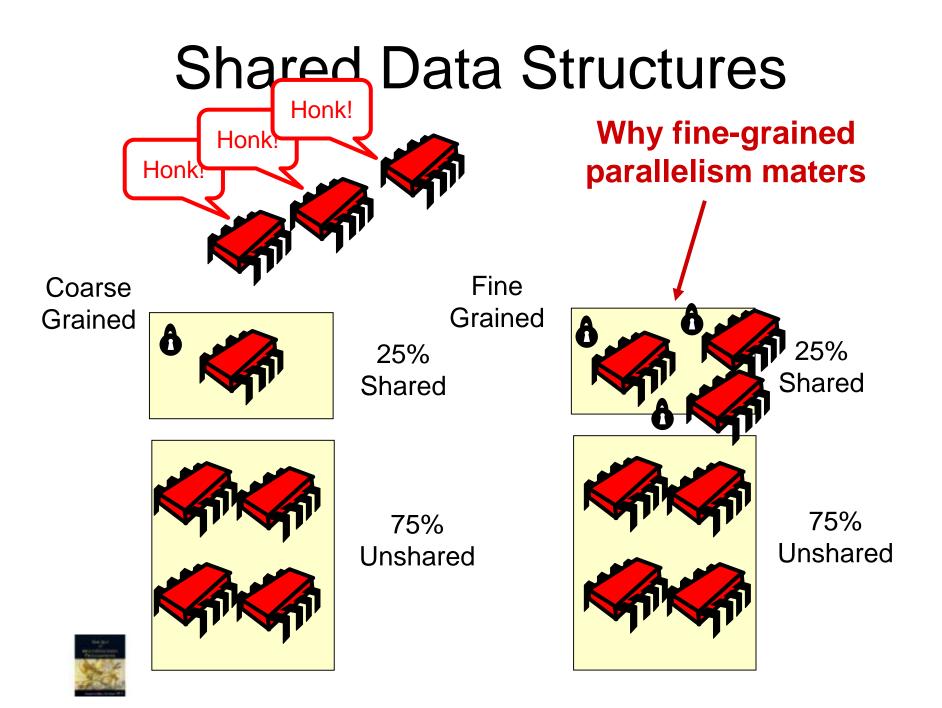




#### **Shared Data Structures**





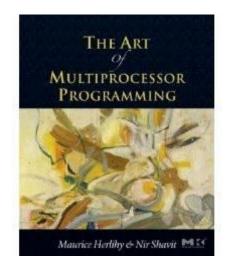




#### Need for Concurrent Queues

- Avoid sequential bottleneck by introducing a buffer between the producers and consumers
- Producers add item to queue
- Consumers consume from queue
- Neither wait as long as queue is not full or empty

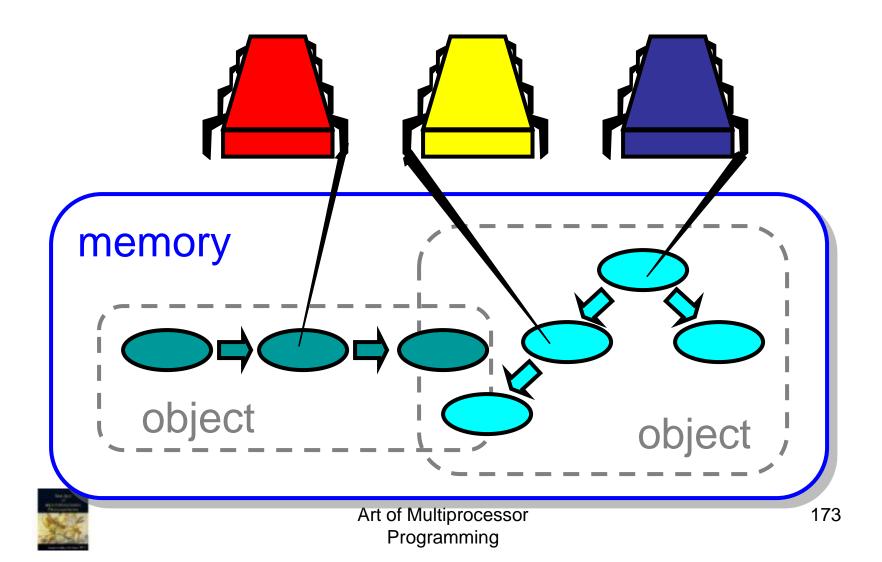
#### **Concurrent Objects**



#### Companion slides for

The Art of Multiprocessor Programming by Maurice Herlihy & Nir Shavit

#### **Concurrent Computation**



## Objectivism

- What is a concurrent object?
  - How do we describe one?
  - How do we implement one?
  - How do we tell if we're right?

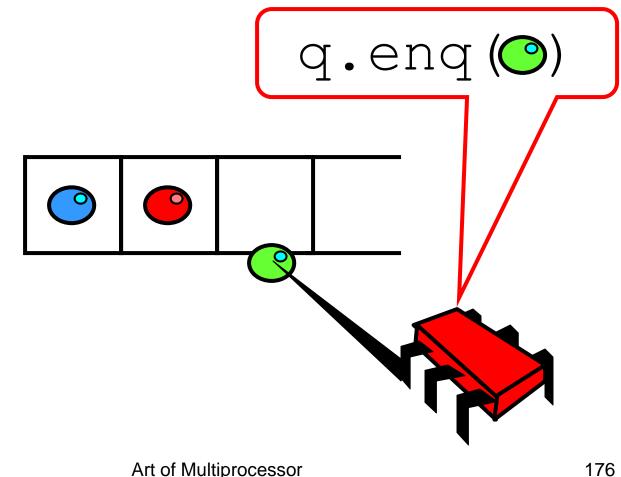


### Objectivism

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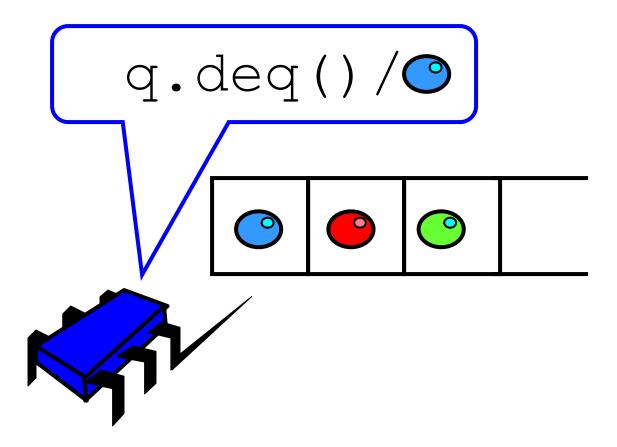


#### FIFO Queue: Enqueue Method



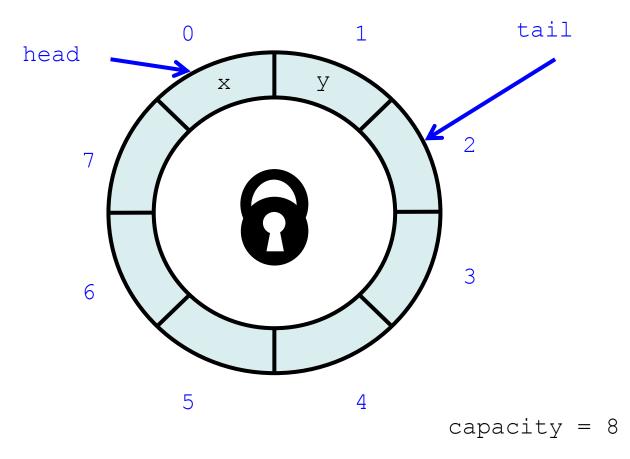


#### FIFO Queue: Dequeue Method



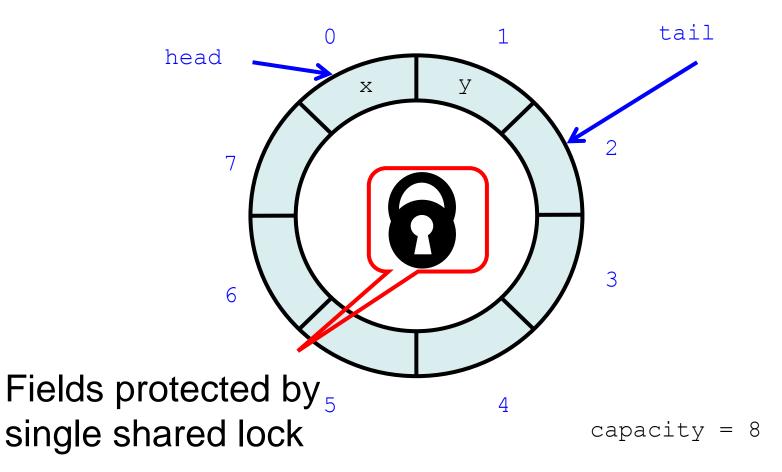


#### Lock-Based Queue





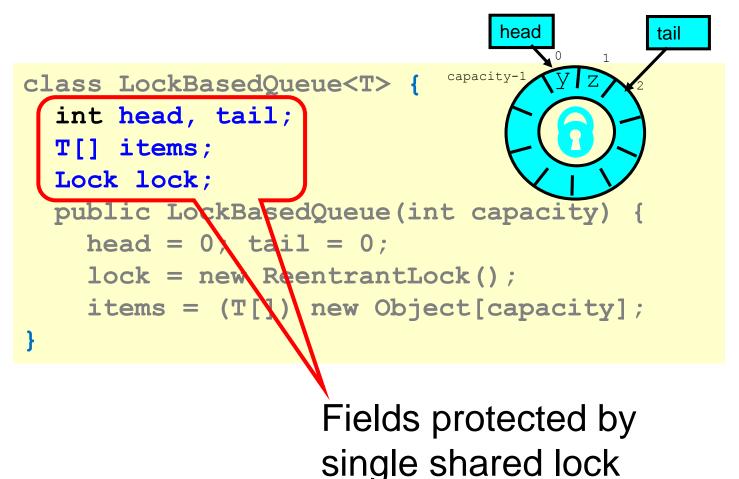
#### Lock-Based Queue



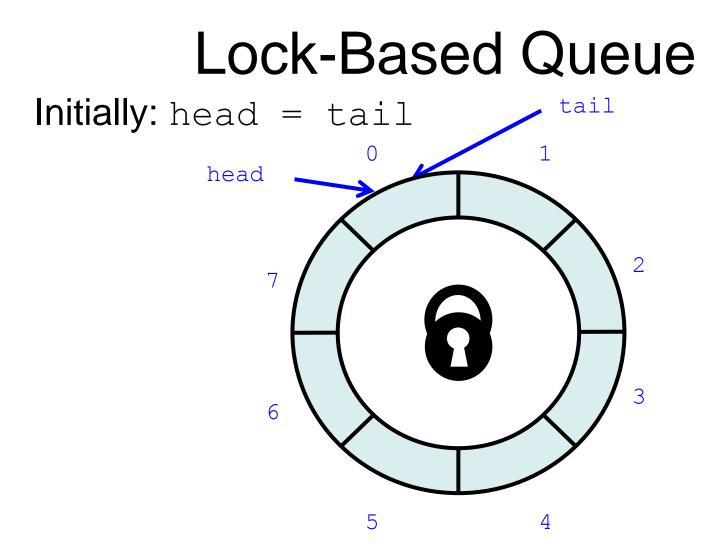


Art of Multiprocessor Programming

## A Lock-Based Queue



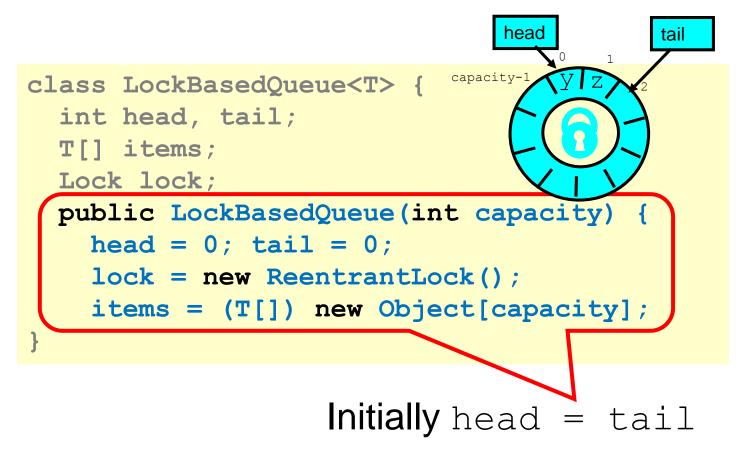






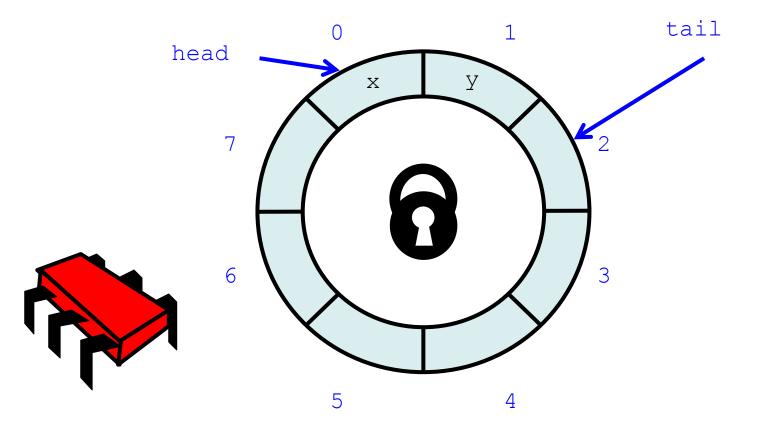
Art of Multiprocessor Programming 181

### A Lock-Based Queue





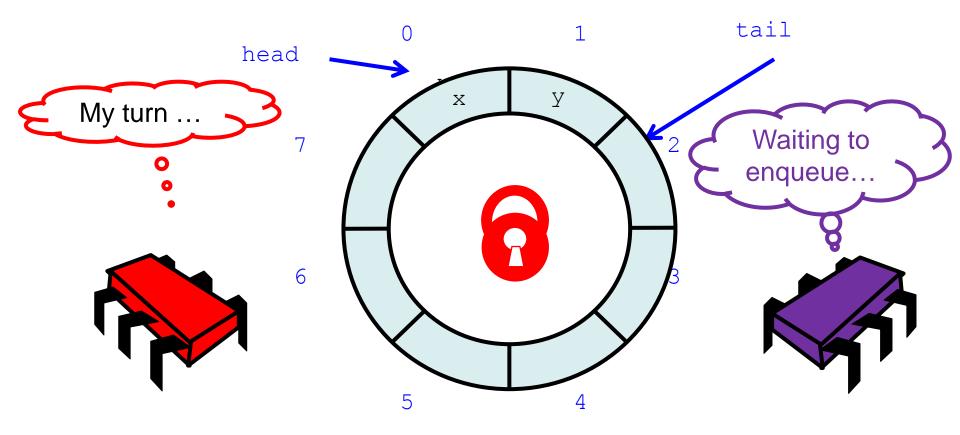
#### Lock-Based deq()



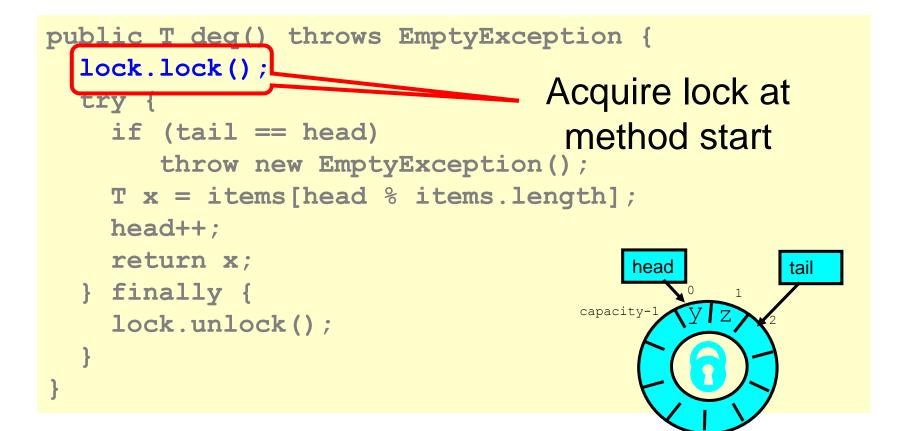


Art of Multiprocessor Programming

#### Acquire Lock



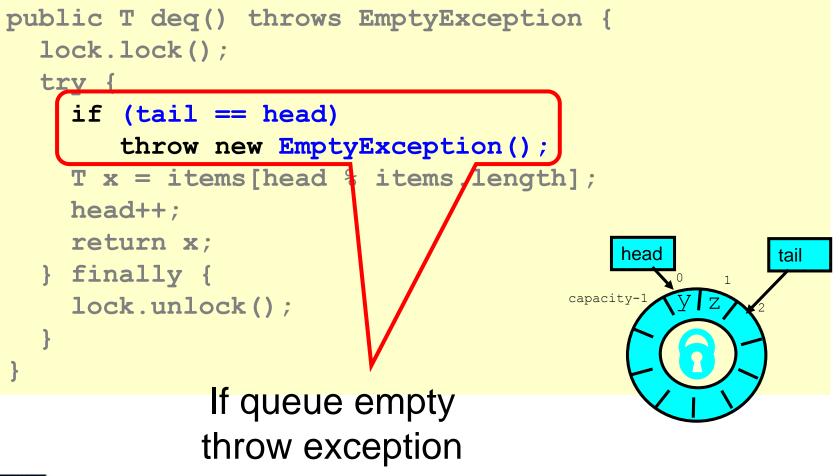




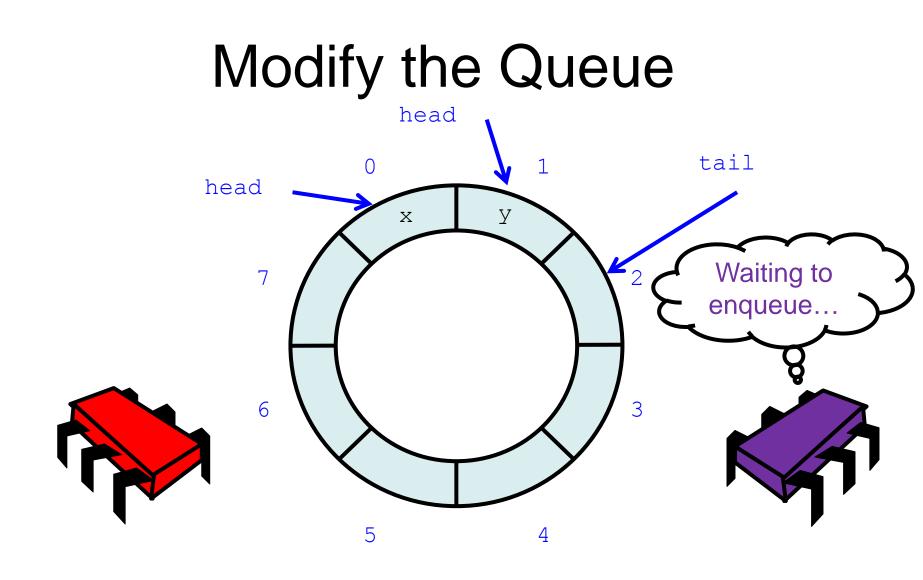


#### Check if Non-Empty tail 1 0 head Not Х equal? Waiting to 2 enqueue... 2 6 5 4

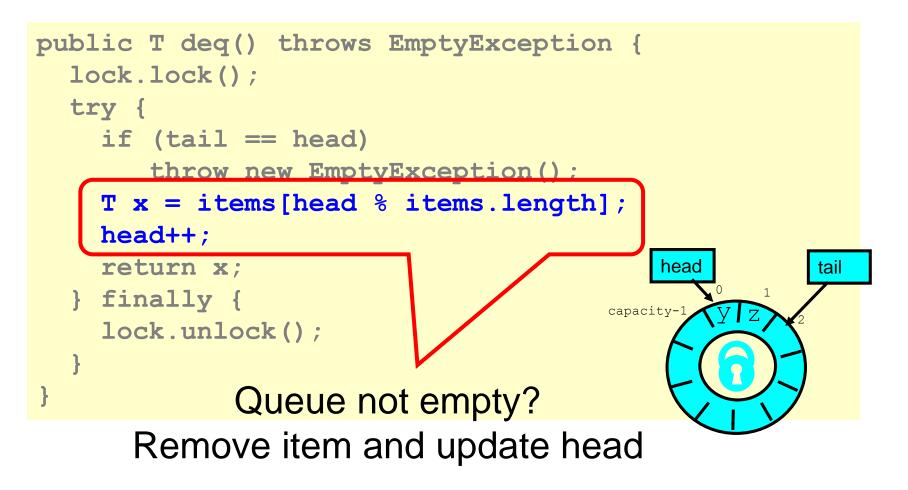








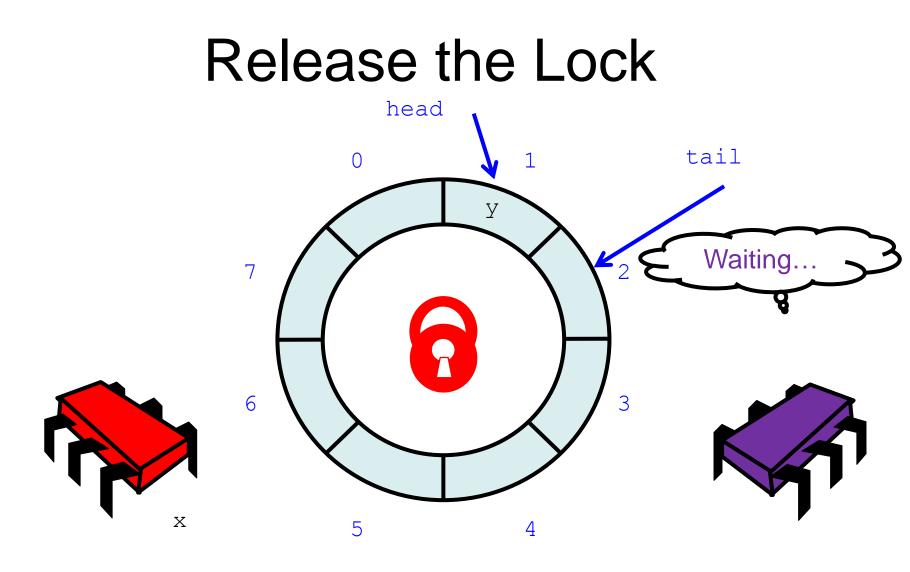




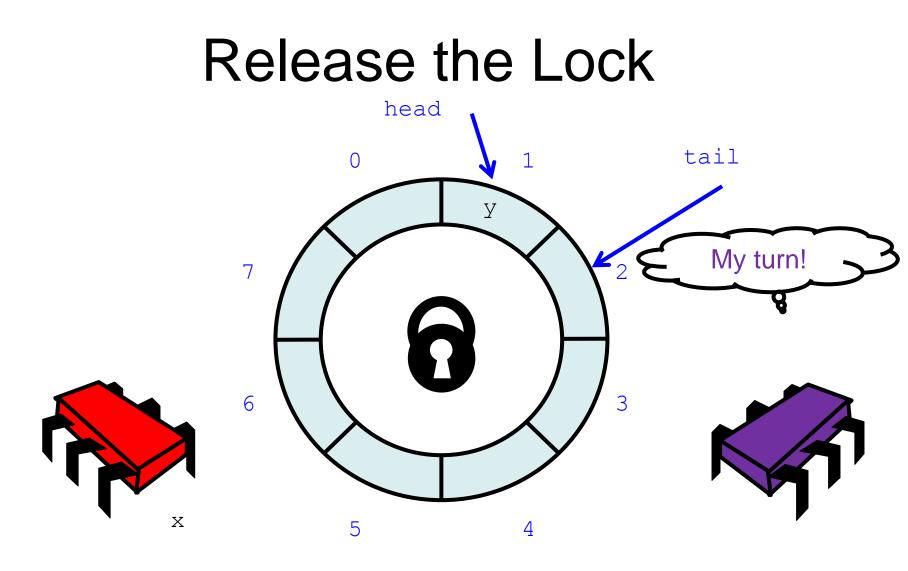


```
public T deq() throws EmptyException {
  lock.lock();
  try {
    if (tail == head)
       throw new EmptyException();
    T x = items[head % items.length];
    head++;
    return x;
                                          head
                                                     tail
    finally
                                      capacity-1
    lock.unlock();
}
              Return result
```











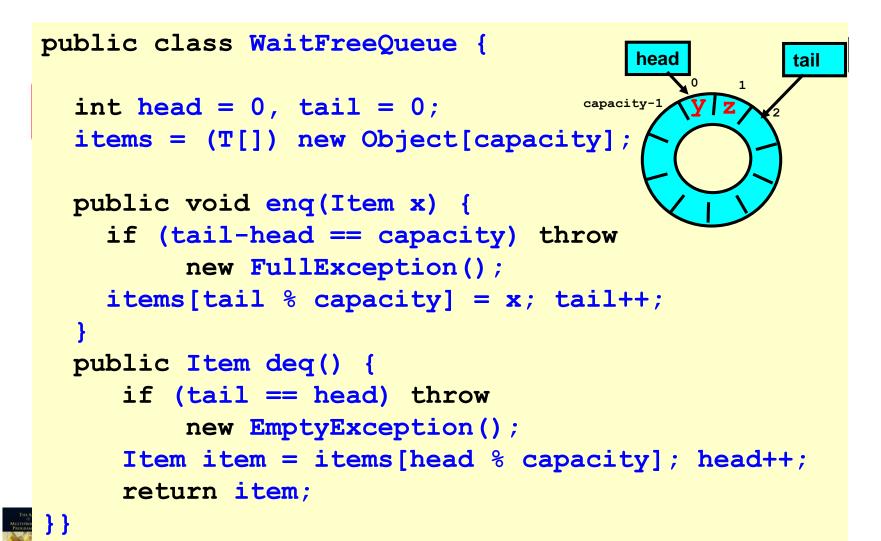
```
public T deq() throws EmptyException {
  lock.lock();
  try {
    if (tail == head)
       throw new EmptyException();
    T x = items[head % items.length];
    head++;
                                                   tail
                                         head
    return x;
                                     capacity-1
    finally {
    lock.unlock();
}
            Release lock no
               matter what!
```



```
public void enq(Item ) throws EmptyException {
  lock.lock();
  try {
    if (tail-head == capacity) throw
         new FullException();
    items[tail % capacity] = x;
    tail++;
                                         head
                                                    tail
  } finally {
                                     capacity-1
    lock.unlock();
```



#### Wait-free Queue?

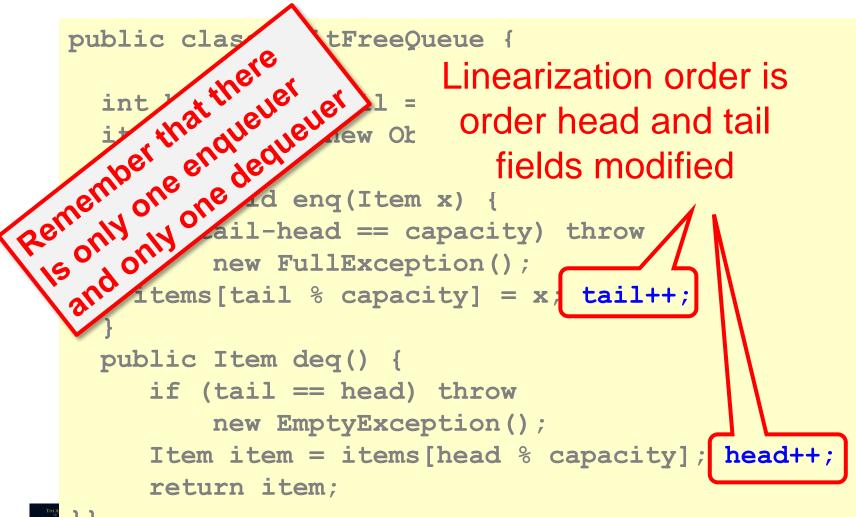


# Linearizability

- Each method should
  - "take effect"
  - Instantaneously
  - Between invocation and response events
- Object is correct if this "sequential" behavior is correct
- Any such concurrent object is
  - Linearizable™
- A linearizable object: one all of whose possible executions are linearizable



#### Wait-free Queue?





# Reasoning About Linearizability: Locking

