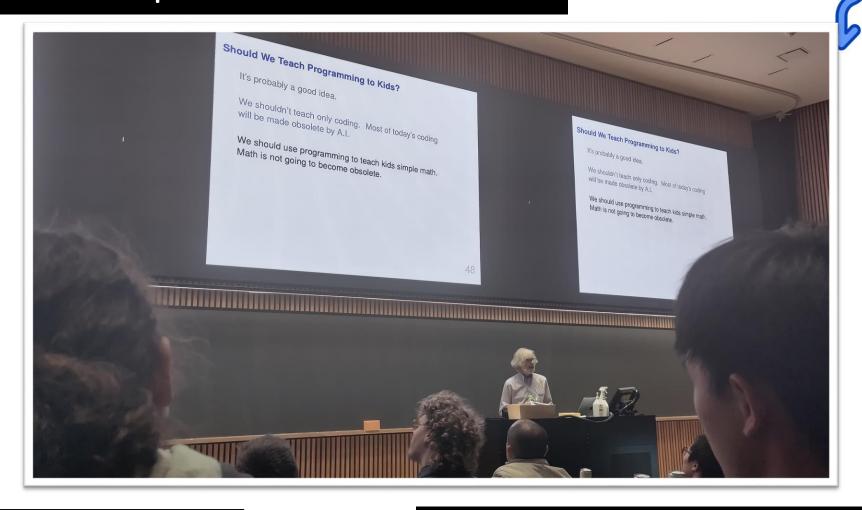


Practical Concurrent and Parallel Programming VIII

Linearizability

Raúl Pardo

Leslie Lamport at DTU – Oct 2023



Previously on PCPP...



- Compare-And-Swap (CAS)
 - Lock-free atomic integer
 - Lock-free number range
 - Atomic libraries
 - CAS based lock implementation
 - Scalability of CAS

Agenda



- Lock-free stack
- ABA problem
- Lock-free queue
- Linearizability
 - Sequential consistency
 - Definition of Linearizability
 - Linearizable concurrent objects
- Work-stealing queues

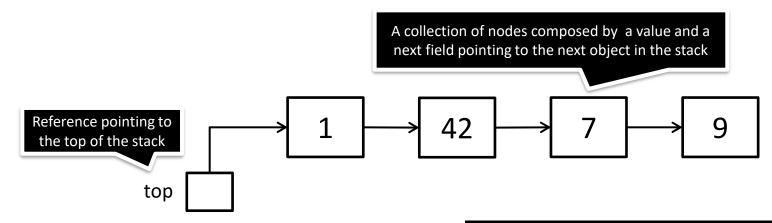


Lock-free data structures: Stack

Sequential Stack Specification



- A stack is a data structure following a LIFO (last-in-first-out) policy
 - push() Adds an element to the top of the stack
 - pop() Removes the top of the stack if the stack is not empty.
 Otherwise, it returns null.
- It is typically implemented as a linked list

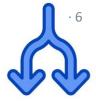


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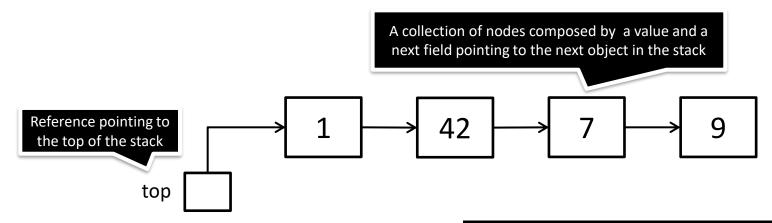
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Sequential Stack

How do we model an empty stack?



- A stack is a data structure following a LIFO (last-in-first-out) policy
 - push() Adds an element to the top of the stack
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 Otherwise, it returns null.
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Lock-free Stack

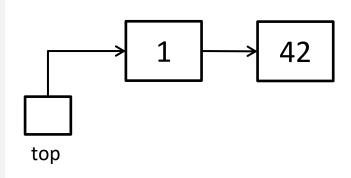
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
         new AtomicReference<Node<T>>();
   public void push(T value) {
        Node<T> newHead = new Node<T>(value);
        Node<T> oldHead;
        do {
         oldHead
                      = top.get();
        newHead.next = oldHead;
        } while (!top.compareAndSet(oldHead,newHead));
   public T pop() {
       Node<T> newHead;
       Node<T> oldHead;
        do {
         oldHead = top.get();
         if(oldHead == null) { return null; }
         newHead = oldHead.next;
        } while (!top.compareAndSet(oldHead,newHead));
        return oldHead.value;
             See TestLockFreeStack.java
```

Introduced by Treiber in 1986



```
private static class Node {
  private final T item;
  private Node<T> next;

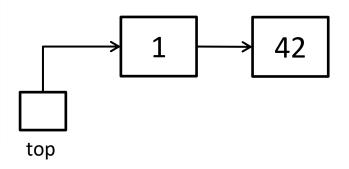
public Node(T item) {
    this.item = item;
    this.next = null;
  }
}
```



```
**
```

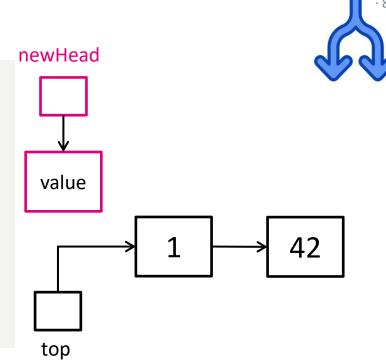
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

public void push(T value) {
    Node<T> newHead = new Node<T>(value);
    Node<T> oldHead;
    do {
        oldHead = top.get();
        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



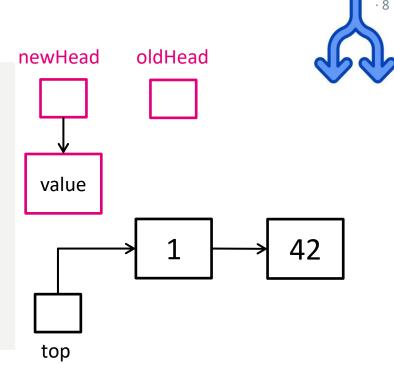
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public void push(T value) {
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    Node<T> oldHead;
    do {
        oldHead = top.get();
        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



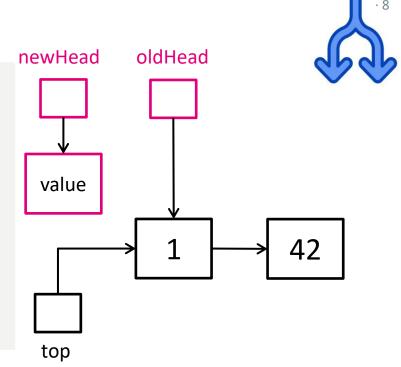
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    Node<T> oldHead;
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    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



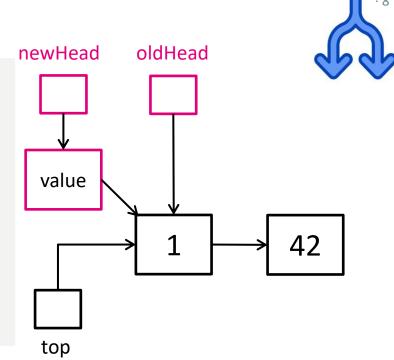
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    Node<T> oldHead;
    do {
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        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



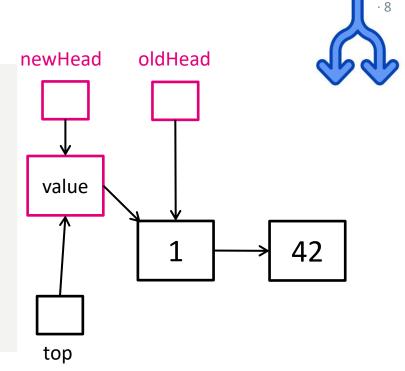
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    do {
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        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



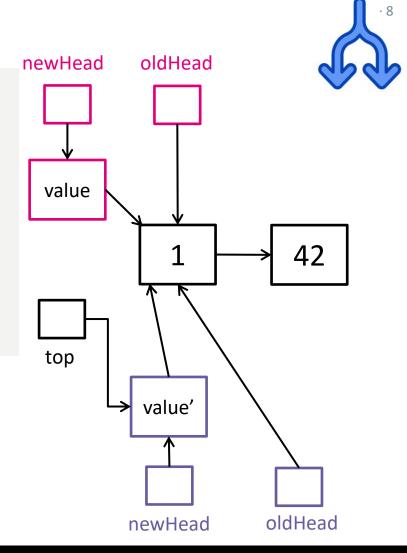
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public void push(T value) {
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    do {
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        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
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        do {
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```

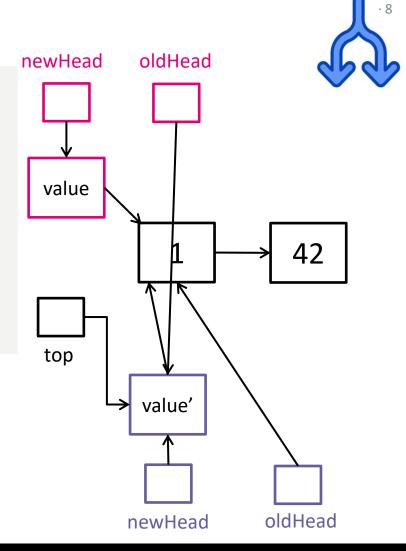
If before the pink thread executes CAS another thread had pushed concurrently, then CAS fails and push restarts



```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
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public void push(T value) {
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    Node<T> oldHead;
    do {
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        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```

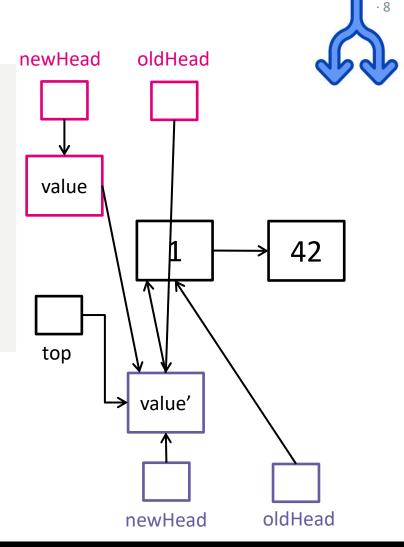
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    do {
        oldHead = top.get();
        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```

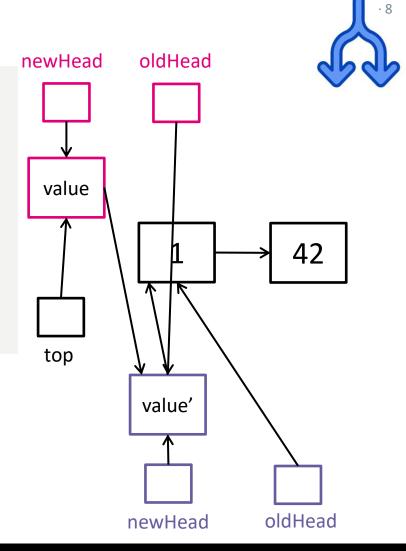
If before the pink thread executes CAS another thread had pushed concurrently, then CAS fails and push restarts



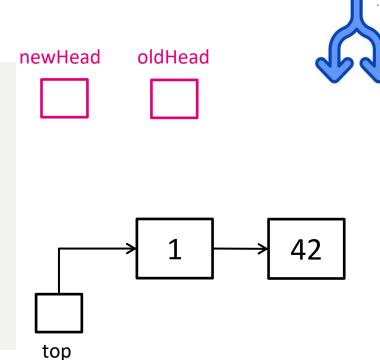
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
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public void push(T value) {
    Node<T> newHead = new Node<T>(value);
    Node<T> oldHead;
    do {
        oldHead = top.get();
        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```

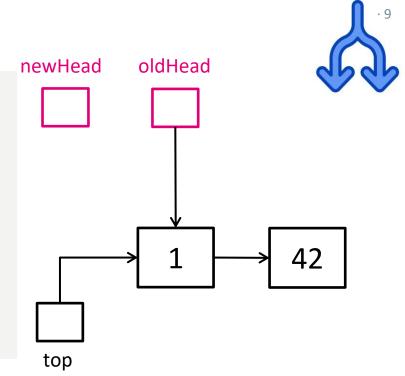
If before the pink thread executes CAS another thread had pushed concurrently, then CAS fails and push restarts



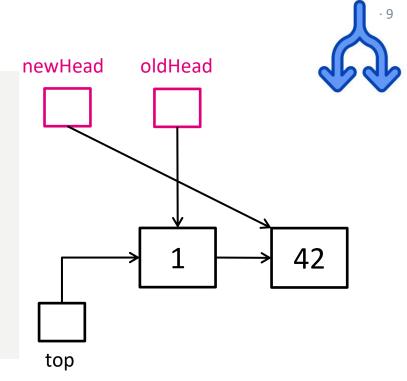
```
class LockFreeStack<T> {
...
    public T pop() {
        Node<T> newHead;
        Node<T> oldHead;
        do {
            oldHead = top.get();
            if(oldHead == null) { return null; }
                  newHead = oldHead.next;
            } while (!top.compareAndSet(oldHead,newHead));
            return oldHead.value;
        }
}
```

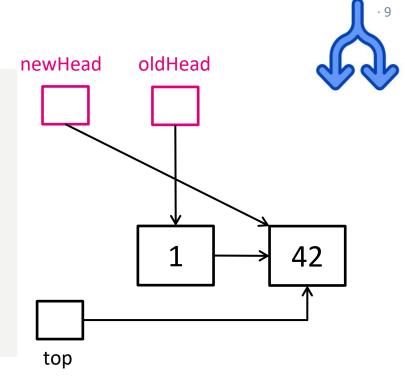


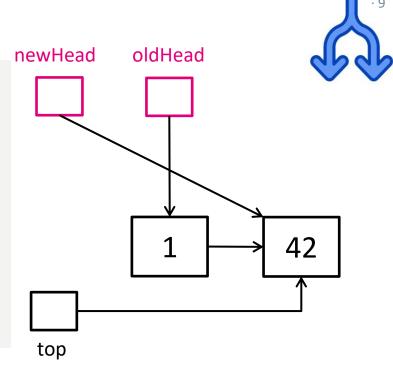
```
class LockFreeStack<T> {
...
    public T pop() {
        Node<T> newHead;
        Node<T> oldHead;
        do {
            oldHead = top.get();
            if(oldHead == null) { return null; }
              newHead = oldHead.next;
        } while (!top.compareAndSet(oldHead,newHead));
        return oldHead.value;
    }
}
```



```
class LockFreeStack<T> {
...
    public T pop() {
        Node<T> newHead;
        Node<T> oldHead;
        do {
            oldHead = top.get();
            if(oldHead == null) { return null; }
                  newHead = oldHead.next;
            } while (!top.compareAndSet(oldHead,newHead));
            return oldHead.value;
        }
}
```







Would the re be any problem if another thread is executing pop() concurrently?

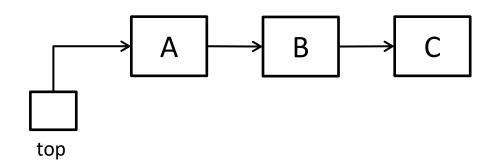


The ABA Problem

ABA Problem



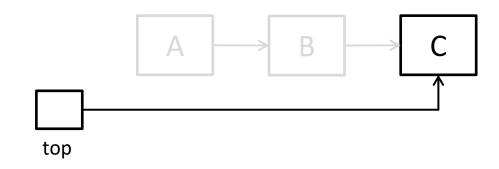
1. Thread 1 starts popping A



ABA Problem



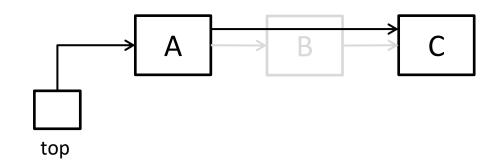
- 1. Thread 1 starts popping A
- 2. Before thread 1 finishes, thread 2 pops A and B



ABA Problem

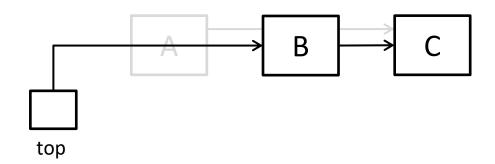


- Thread 1 starts popping A
- 2. Before thread 1 finishes, thread 2 pops A and B
- 3. Thread 2 pushes A back // recovered from memory (same as thread 1 was popping)





- Thread 1 starts popping A
- 2. Before thread 1 finishes, thread 2 pops A and B
- 3. Thread 2 pushes A back // recovered from memory (same as thread 1 was popping)
- 4. Thread 1 finishes popping A
 - Incorrectly, as it thinks that A is the same as before thread 2 operations





- It is a memory allocation issue which affects mainly languages without garbage collection (e.g., C and C++)
- Languages such as Java do not have this problem because garbage collection ensures that newly created objects are fresh
 - Step 3 in the previous slides would have created a new A object

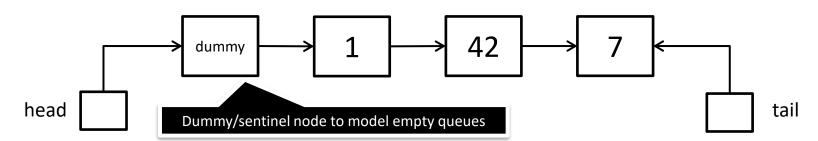


Lock-free data structures: Queue

Sequential Queue Specification



- A queue is a data structure following a FIFO (first-in-first-out)
 policy
 - enqueue() Adds an element to the tail of the queue.
 - dequeue() Removes the element at the head of the queue if the queue is not empty. Otherwise, it returns null.
- It is typically implemented as a linked list



Lock-free queue

- Michael-Scott lock free queue, introduced in 1996 (see optional readings)
- Implemented in ConcurrentLinkedQueue in java.concurrent.* by Doug Lea et. al. (see <u>here</u>)
 - The version on the right is not the JDK implementation

```
private static class Node<T> {
   final T item;
   final AtomicReference<Node<T>> next;

public Node(T item, Node<T> next) {
   this.item = item;
   this.next = new AtomicReference<Node<T>>(next);
}
```

```
class MSQueue<T> implements UnboundedQueue<T> {
   private final AtomicReference<Node<T>> head, tail;
   public MSQueue() {
        Node<T> dummy = new Node<T>(null, null);
        head = new AtomicReference<Node<T>>(dummy);
        tail = new AtomicReference<Node<T>>(dummy);
   public void enqueue(T item) {
        Node<T> node = new Node<T>(item, null);
        while (true) {
            Node<T> last = tail.get(), next = last.next.get();
            if (last == tail.get()) {
                 if (next == null) {
                     // In quiescent state, try inserting new node
                     if (last.next.compareAndSet(next, node)) {
                          // Insertion succeeded, try advancing tail
                          tail.compareAndSet(last, node);
                         return:
                 } else
                     // Queue in intermediate state, advance tail
                     tail.compareAndSet(last, next);
   public T dequeue() {
        while (true) {
            Node<T> first = head.get(), last = tail.get(), next = first.next.get();
            if (first == head.get()) {
                 if (first == last) {
                     if (next == null)
                         return null;
                     else
                          tail.compareAndSet(last, next);
                 } else {
                     T result = next.item;
                     if (head.compareAndSet(first, next))
                          return result;
```

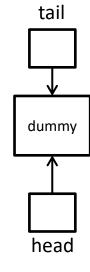
See TestMSQueue.java

Lock-free queue | initialization

```
•19
```

```
class MSQueue<T> implements UnboundedQueue<T> {
    private final AtomicReference<Node<T>> head, tail;

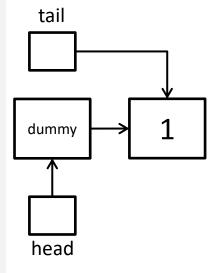
public MSQueue() {
    Node<T> dummy = new Node<T>(null, null);
    head = new AtomicReference<Node<T>>(dummy);
    tail = new AtomicReference<Node<T>>(dummy);
}
...
}
```



Lock-free queue | enqueue

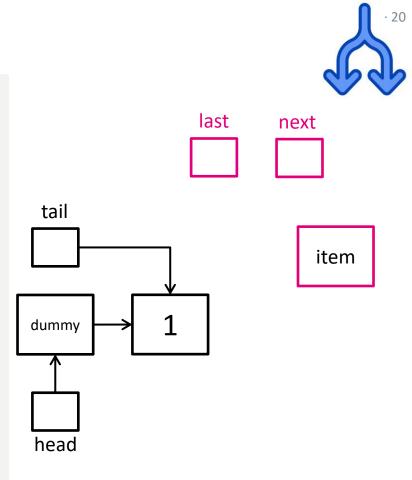
```
•20
```

```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next, node)) {
                // Insertion succeeded, try advancing tail
                tail.compareAndSet(last, node);
                return;
           } else
               // Queue in intermediate state, advance tail
               tail.compareAndSet(last, next);
```



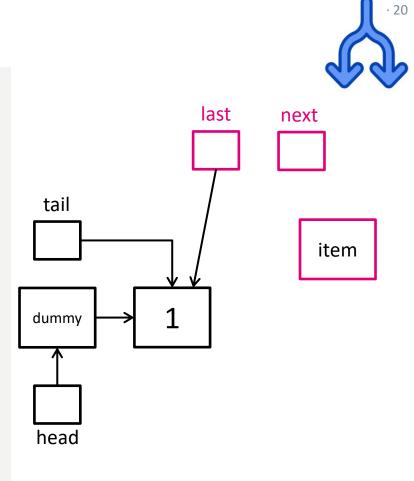
Lock-free queue | enqueue

```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
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                return;
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```

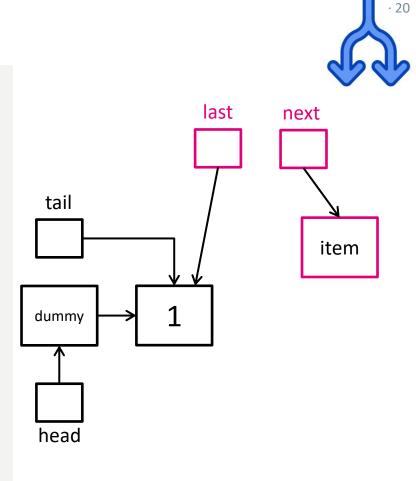


Lock-free queue | enqueue

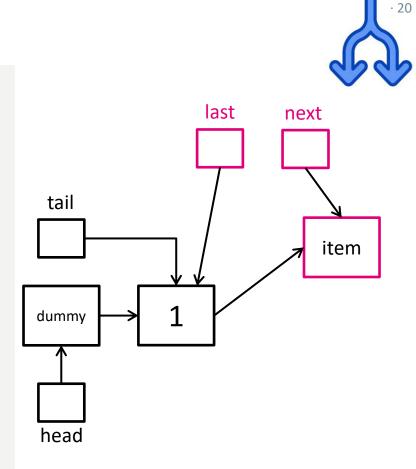
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     while (true) {
         Node<T> last = tail.get();
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```



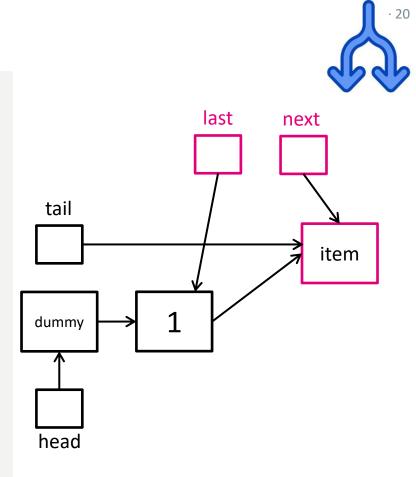
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```



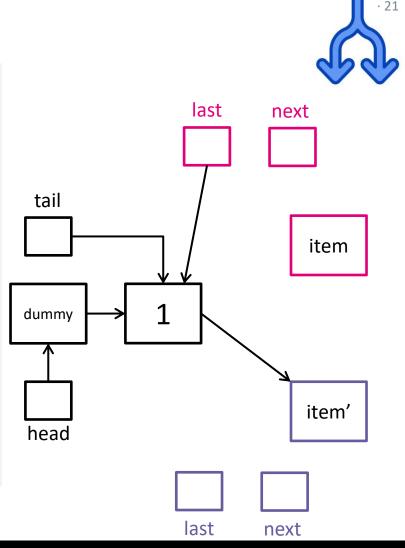
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```



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```

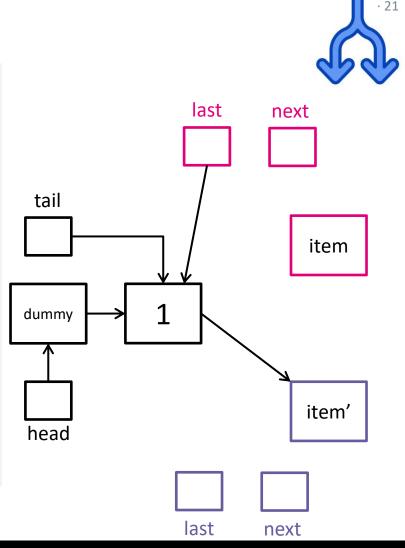


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                // Insertion succeeded, try advancing tail
                tail.compareAndSet(last, node);
                return;
           } else
               // Queue in intermediate state, advance tail
               tail.compareAndSet(last, next);
```

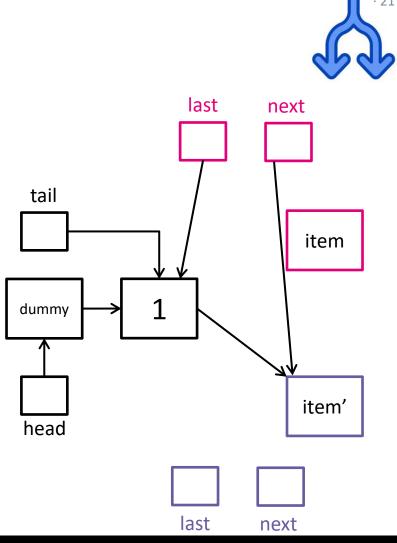


```
class MSQueue<T> implements UnboundedQueue<T> {
                                                   How can this state
                                                                                   last
                                                                                            next
public void enqueue(T item) {
                                                       be reached?
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
                                                                 tail
         if (last == tail.get()) {
          if (next == null) {
              // In quiescent state, try inserting new node
                                                                                                item
              if (last.next.compareAndSet(next, node)) {
                // Insertion succeeded, try advancing tail
                tail.compareAndSet(last, node);
                return;
                                                                dummy
          } else
              // Queue in intermediate state, advance tail
              tail.compareAndSet(last, next);
                                                                                                item'
                                                                head
                                                                                  last
                                                                                           next
```

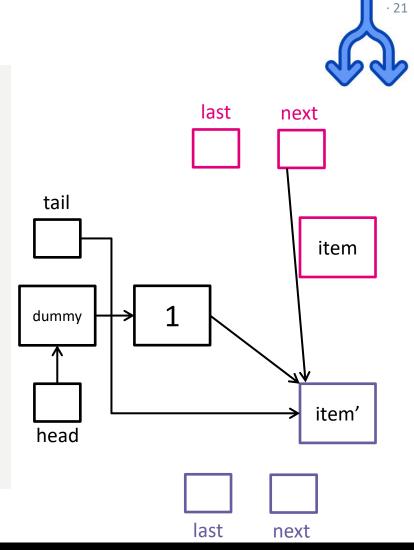
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         if (last == tail.get()) {
          if (next == null) {
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                // Insertion succeeded, try advancing tail
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                return;
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               tail.compareAndSet(last, next);
```



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           } else
               // Queue in intermediate state, advance tail
               tail.compareAndSet(last, next);
```



```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next, node)) {
                // Insertion succeeded, try advancing tail
                tail.compareAndSet(last, node);
                return;
           } else
               // Queue in intermediate state, advance tail
               tail.compareAndSet(last, next);
```

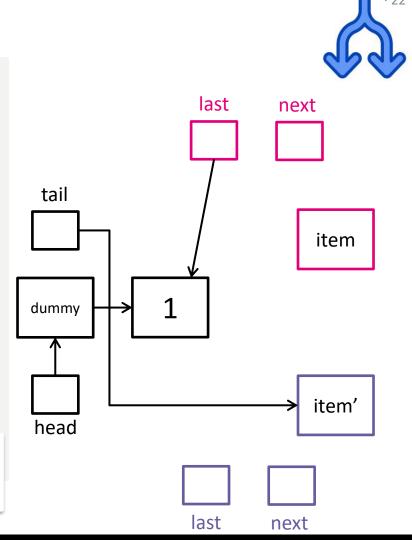


```
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     Node<T> node = new Node<T>(item, null);
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         if (last == tail.get()) {
           if (next == null) {
               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next, node)) {
                // Insertion succeeded, try advancing tail
                tail.compareAndSet(last, node);
                return;
           } else
               // Queue in intermediate state, advance tail
               tail.compareAndSet(last, next);
                       In case another thread is enqueuing, and
                       didn't update the tail, the current thread
```

helps by advancing the tail

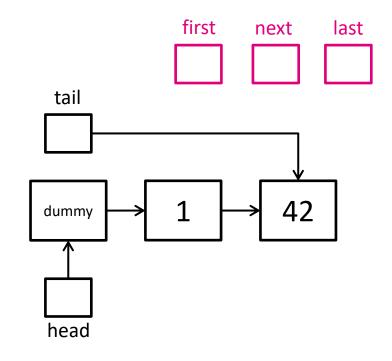
```
last
                               next
 tail
                                    item
dummy
                                    item'
head
                    last
                              next
```

```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
           if (next == null) {
               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next, node)) {
                // Insertion succeeded, try advancing tail
                tail.compareAndSet(last, node);
                return;
           } else
               // Queue in intermediate state, advance tail
               tail.compareAndSet(last, next);
                     If the tail has been changed, then the thread
                                 restarts right away
```



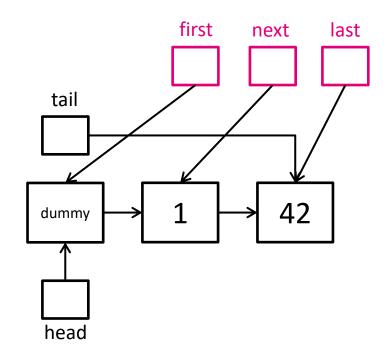
```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```





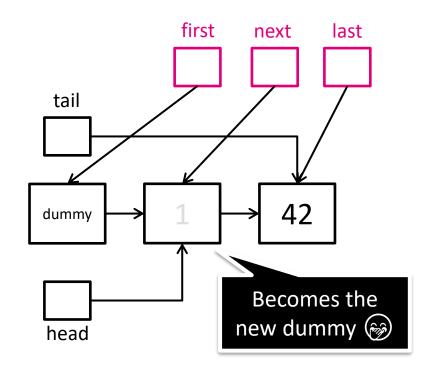
```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
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         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```





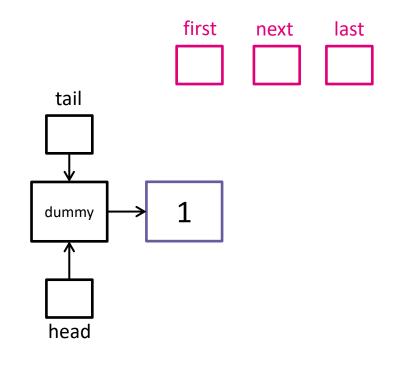
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   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```





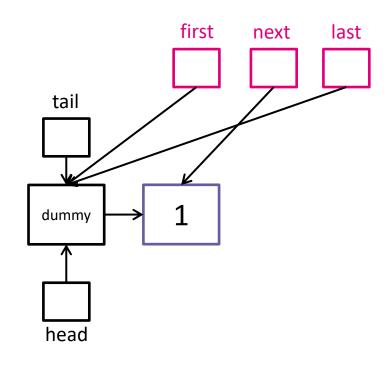
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   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```





```
• 24
```

```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```



```
• 24
```

last

```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null:
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```

tail dummy 1

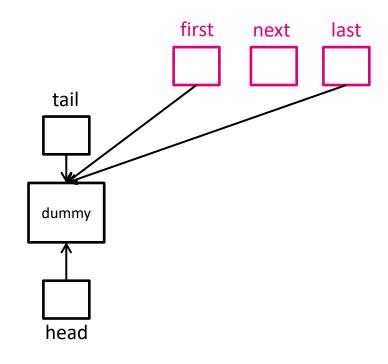
first

next

If the next field of the head is not null (because another thread push in the meantime), then the calling thread helps advancing the tail and tries to dequeue again.

```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```

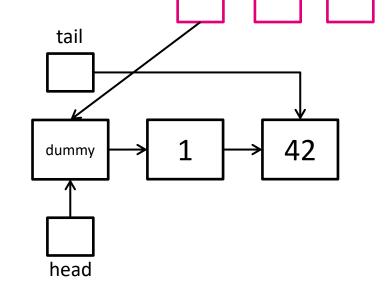




```
• 26
```

last

```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next == null)
                return null;
               else
                tail.compareAndSet(last, next);
           } else {
               T result = next.item;
               if (head.compareAndSet(first, next))
                return result;
```



first

next

How can a state where first != head.get()
be reached?



- We have seen several implementations of lock-free data structures today and last week
- However, we have not seen any techniques to reason about their correctness...
 - How do we even write the concurrent specification of the lock-free queue we have seen?



Linearizability



- Defining correctness of (non-blocking) concurrent objects is tricky
 - Recall correctness is defined by a specification
- The motivation behind linearizability is to use specifications of sequential objects as a basis for the correctness of concurrent objects
 - Specifications of sequential objects are typically expressed as pre- and post-conditions for method calls

Wait Free Queue

```
•30
```

```
class WaitFreeQueue<T> {
  int head = 0, tail = 0;
  T[] items;
 public WaitFreeQueue(int capacity) {
    items = (T[]) new Object[capacity]
 public void enq(T x) throws Exception {
    if (tail - head == items.length)
      thrown new Exception();
    items[tail % items.length] = x;
    tail++;
 public void deg() throws Exception {
    if (tail - head == 0)
      thrown new Exception();
    T x = items[head % items.length];
   head++;
    return x;
```

 Informally, we would like concurrent operations to happen as if they were executed sequentially

 The specification of a concurrent queue is the sequential behaviour of queues

Herlihy p. 52

Wait Free Queue



```
class WaitFreeQueue<T> {
  int head = 0, tail = 0;
  T[] items;
 public WaitFreeQueue(int capacity) {
    items = (T[]) new Object[capacity]
 public void enq(T x) throws Exception {
    if (tail - head == items.length)
      thrown new Exception();
    items[tail % items.length] = x;
    tail++;
 public void deq() throws Exception {
    if (tail - head == 0)
      thrown new Exception();
    T x = items[head % items.length];
   head++;
    return x;
```

This is pseudo-code for illustration purposes. Assume all variables have volatile semantics and each program line is atomic.

Are there any problems with this implementation?

Herlihy p. 52



q.enq(x)
q.deq(x)
p.enq(y)
p.deq(y)

When executed sequentially, these are possible orderings for execution:

```
--- q.enq(x) - p.enq(y) - q.deq(x) - p.deq(y) ---

--- p.enq(y) - q.enq(x) - p.deq(y) - q.deq(x) ---

--- q.enq(x) - p.deq(y) - q.deq(x) ----

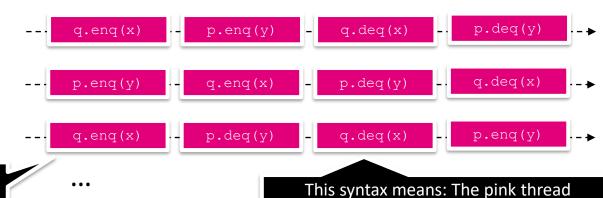
--- q.enq(x) - p.deq(y) - q.deq(x) -----
```

Sequential consistency



 Recall that, <u>in sequential programs</u>, the compiler and CPU are allowed to re-order instructions as long as they produce a valid result (according to the specification of the object)

q.enq(x) q.deq(x) p.enq(y) p.deq(y) When executed sequentially, these are possible orderings for execution:



This syntax means: The pink thread enqueues x on queue q successfully

dequeues x from queue q successfully



q.enq(x)
q.deq(x)
p.enq(y)
p.deq(y)

When executed sequentially, these are possible orderings for execution:

```
--- q.enq(x) -- p.enq(y) -- q.deq(x) -- p.deq(y) -- +
--- p.enq(y) -- q.enq(x) -- p.deq(y) -- q.deq(x) -- +
--- q.enq(x) -- p.deq(y) -- q.deq(x) -- +
```



q.enq(x)
q.deq(x)
p.enq(y)
p.deq(y)

 When executed sequentially, these are possible orderings for execution:

```
--- q.enq(x) - p.enq(y) - q.deq(x) - p.deq(y) -->
--- p.enq(y) - q.enq(x) - p.deq(y) - q.deq(x) -->
--- q.enq(x) - p.deq(y) - q.deq(x) -->
```



q.enq(x)
q.deq(x)
p.enq(y)
p.deq(y)

 When executed sequentially, these are possible orderings for execution:

```
--- q.enq(x) -- p.enq(y) - q.deq(x) -- p.deq(y) -->
--- p.enq(y) -- q.enq(x) -- p.deq(y) -- q.deq(x) -->
--- q.enq(x) -- p.deq(y) -- q.deq(x) -- p.enq(y) -->
```



q.enq(x)
q.deq(x)
p.enq(y)
p.deq(y)

 When executed sequentially, these are possible orderings for execution:

```
q.enq(x) - p.enq(y) - q.deq(x) - p.deq(y)
--- p.enq(y) - q.enq(x) - p.deq(y) - q.deq(x)
--- q.enq(x) - p.deq(y) - q.deq(x) - p.enq(y)
```



- For concurrent executions, we must define the conditions asserting that every thread is behaving consistently w.r.t. a sequential execution
- For executions of concurrent objects, an execution is <u>sequential consistency</u> iff
 - Method calls appear to happen in a one-at-a-time, sequential order
 - Method calls should appear to take effect in program order



- For concurrent executions, we must define the conditions asserting that every thread is behaving consistently w.r.t. a sequential execution
- For executions of concurrent objects, an execution is <u>sequential consistency</u> iff
 - 1. Method calls appear to happen in a one-at-a-time, sequential order Requires memory commands to be executed in order
 - 2. Method calls should appear to take effect in program order



- For concurrent executions, we must define the conditions asserting that every thread is behaving consistently w.r.t. a sequential execution
- For executions of concurrent objects, an execution is <u>sequential consistency</u> iff
 - 1. Method calls appear to happen in a one-at-a-time, sequential order Requires memory commands to be executed in order
 - 2. Method calls should appear to take effect in program order Requires sequential program order for each thread

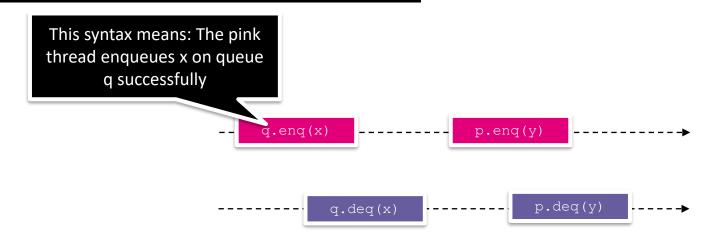
Sequential consistency



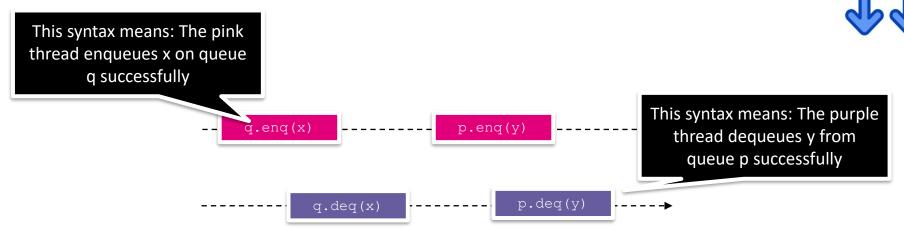
- Operations happen one-at-a-time
- 2. Program order is preserved (for each thread)
- 3. The execution satisfies the specification of the object

Sequential consistency

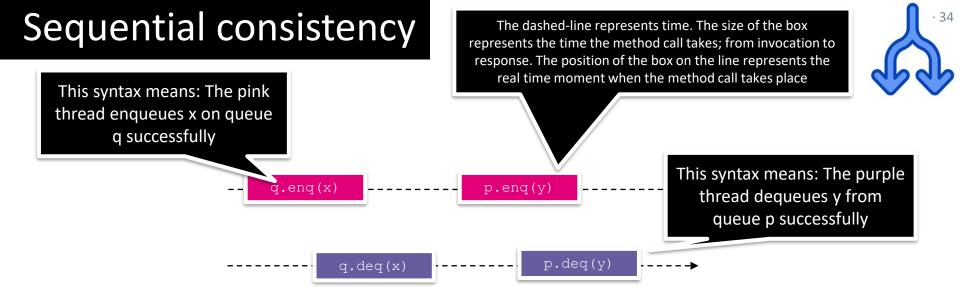




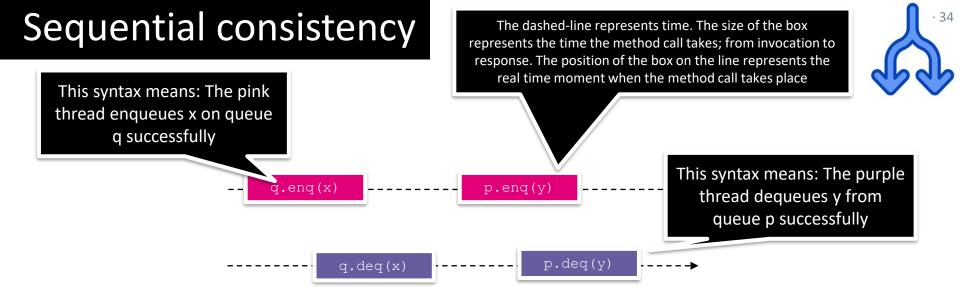
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- Program order is preserved (for each thread)
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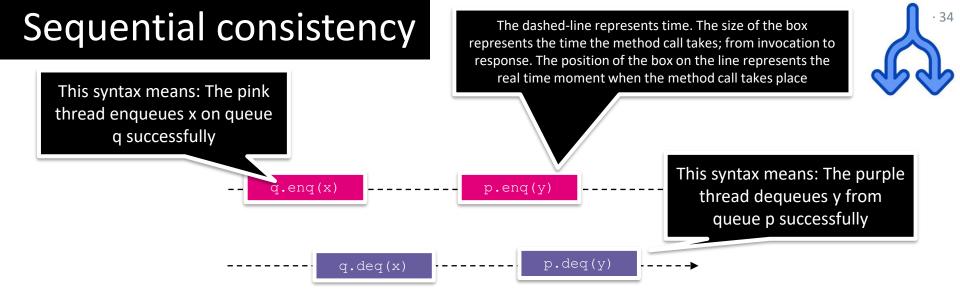
- 1. Operations happen one-at-a-time
- Program order is preserved (for each thread)
- 3. The execution satisfies the specification of the object



A concurrent execution is sequentially consistent iff there exists <u>a</u> reordering of operations producing a sequential execution where:

- 1. Operations happen one-at-a-time
- Program order is preserved (for each thread)
- 3. The execution satisfies the specification of the object





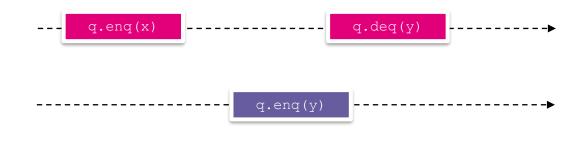
A concurrent execution is sequentially consistent iff there exists <u>a</u> reordering of operations producing a sequential execution where:

- 1. Operations happen one-at-a-time
- 2. Program order is preserved (for each thread)
- These are instantaneous executions, and the line only represents execution order (not real time)

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Sequential consistency





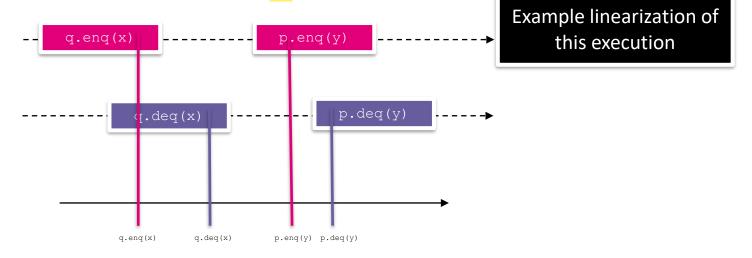
Is this concurrent execution sequentially consistent? (Recall we are working with a FIFO queue)



- Linearizability extends sequential consistency by requiring that the real time order of the execution is preserved
- Linearizability extends sequential consistency with the following condition:
 - Each method call should appear to take effect instantaneously at some moment between its invocation and response

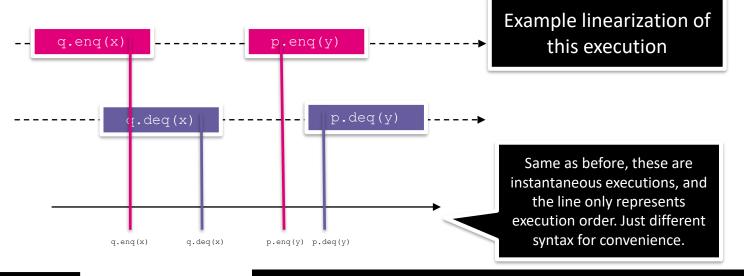


- To show that a concurrent execution is linearizable, we must define linearization points within each method call, which map to sequential execution that satisfy the specification of the object
 - A linearization point defines the instant in the execution when the method call "takes effect"



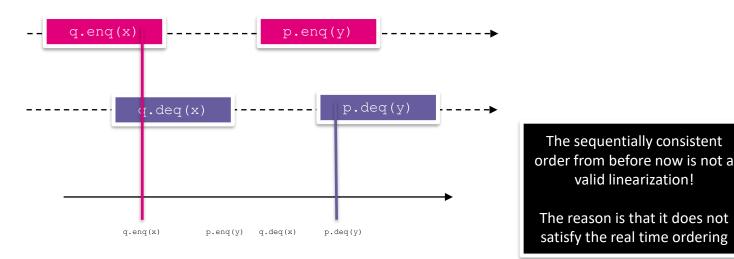


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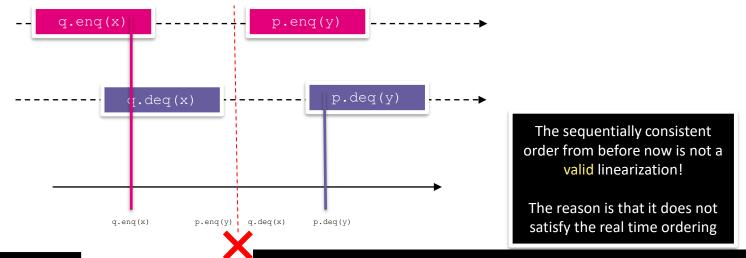


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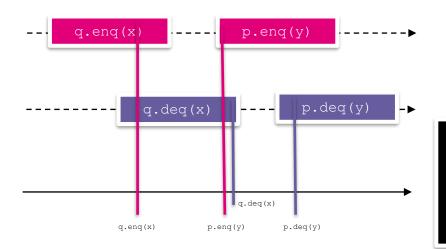


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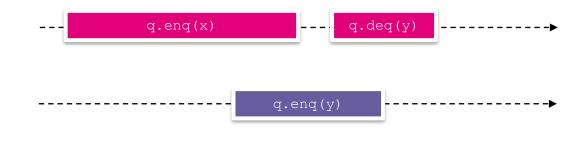
- To show that a concurrent execution is linearizable, we must define linearization points within each method call, which map to sequential execution that satisfy the specification of the object
 - A linearization point defines the instant in the execution when the method call "takes effect"



If q.deq(x) and p.enq(y)
overlap, then the
sequentially consistent
order is a valid linearization

Sequential consistency





Is this concurrent execution linearizable? (Recall we are working with a FIFO queue)



- Until now, linearizability is presented as a property of executions, not concurrent objects
- A concurrent object is linearizable iff
 - All executions are linearizable, and
 - All linearizations satisfy the sequential specification of the object
- To show that an object is linearizable first we must select its linearization points in the source code of the object class
 - Very often linearization points correspond to CAS operations



```
class WaitFreeQueue<T> {
  int head = 0, tail = 0;
  T[] items;
 public WaitFreeQueue(int capacity) {
    items = (T[]) new Object[capacity]
 public void enq(T x) throws Exception {
    if (tail - head == items.length) // E1
      thrown new Exception(); // E2
    items[tail % items.length] = x; // E3
    tail++; // E4
 public void deq() throws Exception {
    if (tail - head == 0) // D1
      thrown new Exception(); // D2
    T x = items[head % items.length]; // D3
    head++; // D4
    return x;
                   Recall to assume all variables have volatile
```

Linearization points for enqueue

- E4 is the point when an enqueue is completed if the queue is not full
- E1 is the point when an enqueue is completed if the queue is full

Linearization points in dequeue

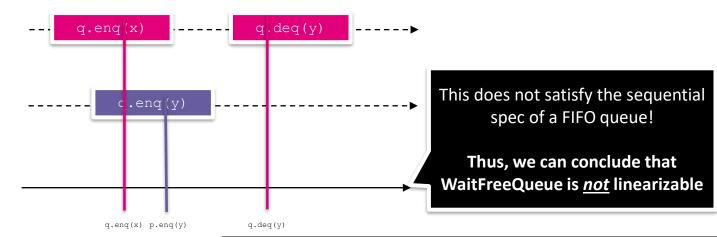
- D4 is the point when a dequeue is completed if the queue is not empty
- D1 is the point when a dequeue is completed when queue is empty

Recall to assume all variables have volatile semantics and each program line is atomic.

Linearizable Concurrent Objects



- Finding linearizable points in the object class is not enough to show correctness
 - Consider this interleaving: E1,E2,E3,E1,E2,E3,E4,E4
 - It corresponds to a linearization of this kind:





```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
    Node<T> node = new Node<T>(item, null);
    while (true) {
      Node<T> last = tail.get();
     Node<T> next = last.next.get();
      if (last == tail.get()) { // E7
        if (next == null) { // E8
          // In quiescent state, try inserting new node
          if (last.next.compareAndSet(next, node)) { // E9
             // Insertion succeeded, try advancing tail
             tail.compareAndSet(last, node);
             return;
        } else
        // Queue in intermediate state, advance tail
        tail.compareAndSet(last, next);
```

- Enqueue has one linearization point:
 - E9 if successfully executed, the element has been enqueued
- Correctness (informal but systematic, tries to cover all branches):
 - If two threads execute enqueue concurrently before tail and next are updated, then only one of them succeeds in executing E9 (and possible update the tail). The other fails and repeats the enqueuing
 - If a thread executes enqueue after another thread updated the tail, then E7 fails and it repeats the enqueue
 - If a thread executes enqueue after another thread updated next, then E8 fails, the thread tries to advance the tail, and it restarts the enqueue

Consult this slide for exercise 8.2.1



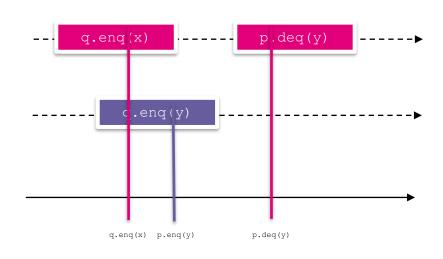
```
class MSQueue<T> implements UnboundedQueue<T> {
 public T dequeue() {
   while (true) {
     Node<T> first = head.get();
      Node<T> last = tail.get();
     Node<T> next = first.next.get(); // D3
      if (first == head.get()) { // D5
        if (first == last) { // D6
          if (next == null) // D7
            return null;
          else
            tail.compareAndSet(last, next);
        } else {
          T result = next.item;
          if (head.compareAndSet(first, next)) // D13
            return result;
```

- Dequeue has two linearization points
 - D3 if the queue is empty. After its execution, the evaluation of D7 is determined and whether the method will return null.
 - D13 if successfully executed, the element has been dequeued
- Correctness (informal but systematic, tries to cover all branches):
 - If two threads execute dequeue concurrently before the head is updated (D5 succeeds for both) and the queue is not empty (D6 fails), then D13 succeeds for only one of them. The other restarts the dequeue
 - If a thread executes dequeue after another thread updated the head, then D5 fails and it restarts the dequeue
 - If a thread execute dequeue while another thread executed enqueue (E9) and before the enqueuing thread updates the tail, then D7 fails, the dequeuing thread tries to update the tail and restarts the dequeue

Linearizability of MS Queue



- The correctness arguments in the previous slides increase our confidence that all linearizations satisfy the FIFO queue spec
- This linearization is impossible in the MS Queue
- If pink executes E9 before purple, then either:
 - Purple restart the enqueue due to CAS failure when updating next
 - Purple restart the enqueue because the tail was updated by pink
 - Updates the tail due to pink not having done so yet
- Note that in no case y is enqueued before x (or replaced)





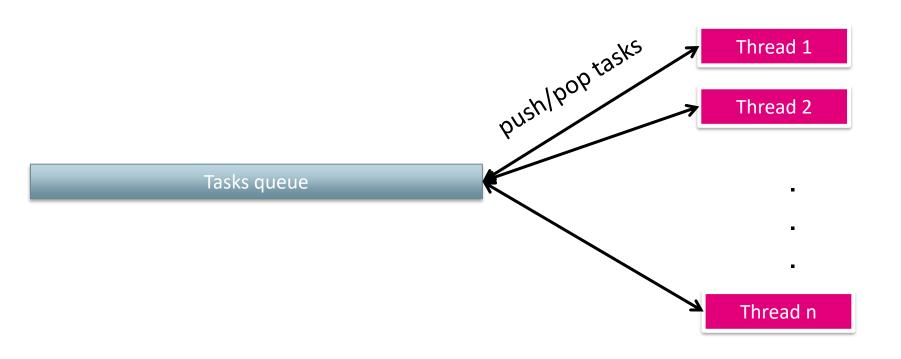
- It re-uses sequential specifications
 - Specifying the sequential behaviour of an object is rather intuitive
- It is a compositional property
 - If two objects are linearizable, any concurrent execution involving the two objects remains linearizable
 - Correctness proofs can be split into single objects that later can be safely composed
- It is a non-blocking property
 - It can be used to reason about objects that do not use locks



Work-stealing queues

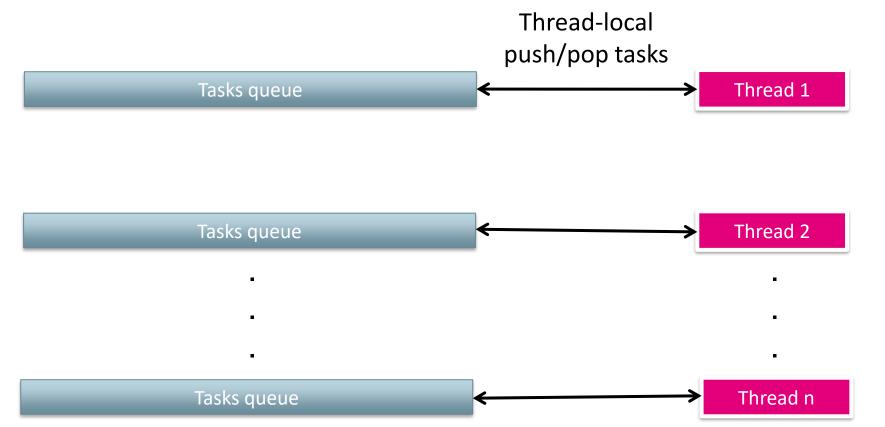
Recall the executor framework





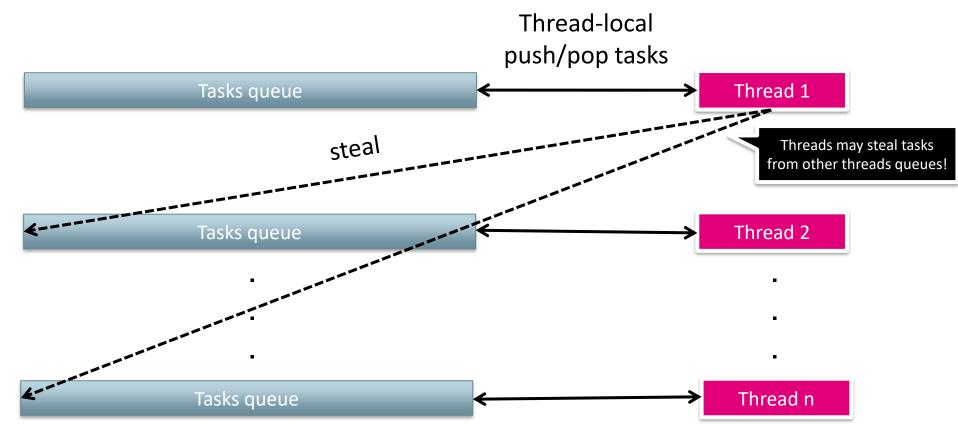
Executor framework work-stealing task queue



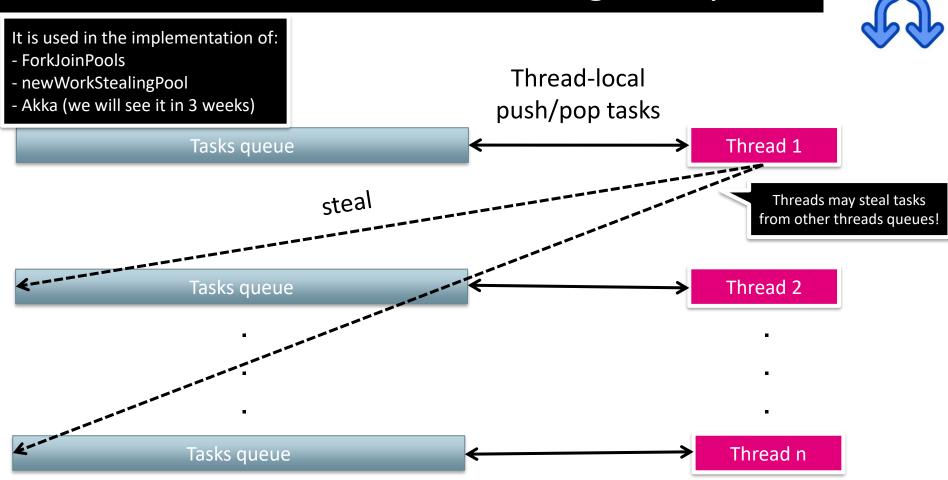


Executor framework work-stealing task queue





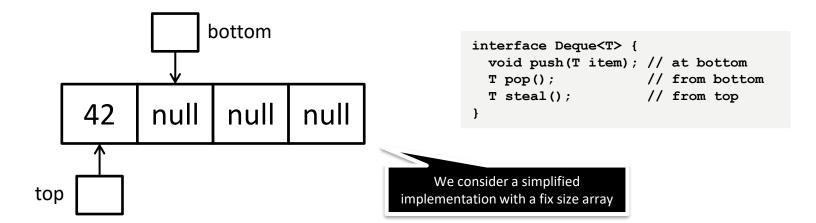
Executor framework work-stealing task queue



Work-stealing queues



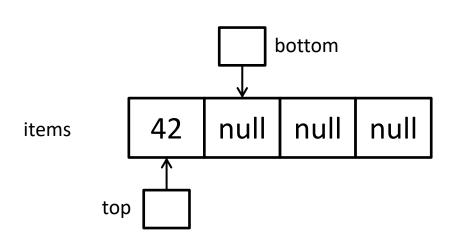
- A work-stealing queue has the following methods
 - Push adds an element at the bottom of the queue (thread-local)
 - Pop removes an element from the bottom of the queue (thread-local)
 - Steal removes an element from the top of the queue (concurrent)



Chase-Lev work-stealing queue - state



```
class ChaseLevDeque<T> implements Deque<T> {
  private volatile long bottom = 0;
  private final AtomicLong top = new AtomicLong();
  private final T[] items;
...
}
```



- The variable bottom is thread-local
 - Only the thread assigned to the queue can write it (other threads may read it)
- Any thread can read/write the variable top
 - We need an atomic variable to prevent data races
- For simplicity, we consider a fix-size array to store the elements of the queue
 - The array is used as a circular buffer

Chase-Lev work-stealing queue - state

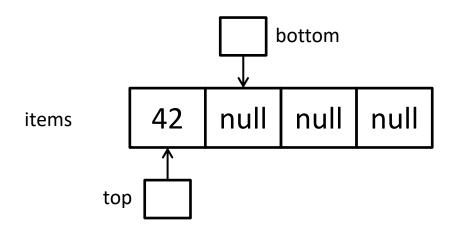


```
class ChaseLevDeque<T> implements Deque<T> {
 private volatile long bottom = 0;
 private final AtomicLong top = new AtomicLong();
 private final T[] items;
         Why is volatile enough
                for bottom?
                                bottom
                  42
                                  null
                                          null
                          null
     items
             top
```

- The variable bottom is thread-local
 - Only the thread assigned to the queue can write it (other threads may read it)
- Any thread can read/write the variable top
 - We need an atomic variable to prevent data races
- For simplicity, we consider a fix-size array to store the elements of the queue
 - The array is used as a circular buffer



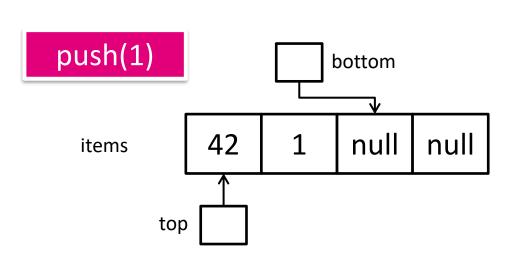
```
public void push(T item) { // at bottom
  final long b = bottom, t = top.get(), size = b - t;
  if (size == items.length)
    throw new RuntimeException("queue overflow");
  items[index(b, items.length)] = item;
  bottom = b+1;
}
```



- Thread-safe because it is assumed to be threadlocal
 - Always the same thread executes this method
 - Only writes bottom



```
public void push(T item) { // at bottom
  final long b = bottom, t = top.get(), size = b - t;
  if (size == items.length)
    throw new RuntimeException("queue overflow");
  items[index(b, items.length)] = item;
  bottom = b+1;
}
```



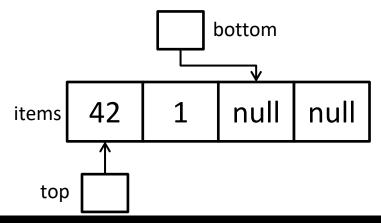
- Always the same thread executes this method
- Thread-safe because only writes bottom are threadlocal (see other methods)

Chase-Lev work-stealing queue - steal



```
public T steal() { // from top
  final long t = top.get();
  final long b = bottom;
  final long size = b - t;
  if (size <= 0)
    return null;
  else {
    T result = items[index(t, items.length)];
    if (top.compareAndSet(t, t+1))
       return result;
    else
       return null;
  }
}</pre>
```

- It is executed by multiple threads
- Only reads bottom
- Performs a CAS on top to steal the top element
 - Only if not empty



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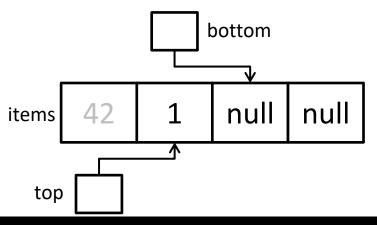
Chase-Lev work-stealing queue - steal



```
public T steal() { // from top
  final long t = top.get();
  final long b = bottom;
  final long size = b - t;
  if (size <= 0)
    return null;
  else {
    T result = items[index(t, items.length)];
    if (top.compareAndSet(t, t+1))
      return result;
    else
      return null;
  }
}</pre>
```

steal() -> 42

- It is executed by multiple threads
- Only reads bottom
- Performs a CAS on top to steal the top element
 - Only if not empty



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Chase-Lev work-stealing queue - steal



```
public T steal() { // from top
                                                      It is executed by multiple threads
  final long t = top.get();
                                                      Only reads bottom
  final long b = bottom;
  final long size = b - t;
                                                      Performs a CAS on top to steal the
  if (size <= 0)
    return null;
                                                      top element
  else {
    T result = items[index(t, items.length)];
                                                          Only if not empty
    if (top.compareAndSet(t, t+1))
      return result;
    else
                                            This becomes a
      return null;
                                          deprecated value that
                                                                      bottom
                                           will be overwritten
   steal() -> 42
                                                                                null
                                                                        null
                                                 items
```

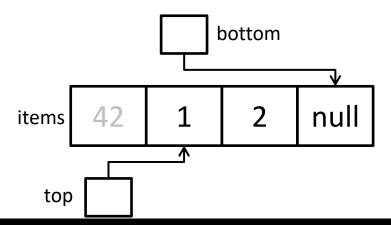
IT UNIVERSITY OF COPENHAGEN © Raúl Pardo Jimenez and Jørgen Staunstrup – F2023

top



```
public T pop() { // from bottom
  final long b = bottom - 1;
  bottom = b;
  final long t = top.get(),
  final long afterSize = b - t;
  if (afterSize < 0) {</pre>
    bottom = t;
    return null;
  } else {
    T result = items[index(b, items.length)];
    if (afterSize > 0)
      return result;
    else {
      if (!top.compareAndSet(t, t+1))
          result = null;
      bottom = t+1;
      return result;
```

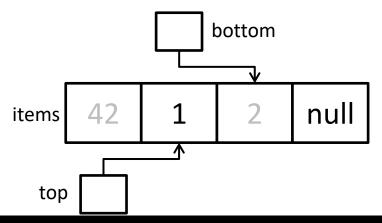
- Thread-local but more subtle than push
- It updates bottom (thread-local) and possibly top (concurrent)





```
public T pop() { // from bottom
  final long b = bottom - 1;
  bottom = b;
  final long t = top.get(),
  final long afterSize = b - t;
  if (afterSize < 0) {</pre>
    bottom = t;
    return null;
  } else {
    T result = items[index(b, items.length)];
    if (afterSize > 0)
      return result;
    else {
      if (!top.compareAndSet(t, t+1))
          result = null;
      bottom = t+1;
      return result;
                    pop() -> 2
```

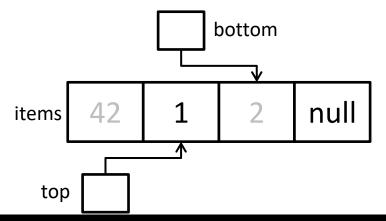
 When only the assign thread executes, then we simply update bottom and return the element





```
public T pop() { // from bottom
  final long b = bottom - 1;
  bottom = b;
  final long t = top.get(),
  final long afterSize = b - t;
  if (afterSize < 0) {</pre>
    bottom = t;
    return null;
  } else {
    T result = items[index(b, items.length)];
    if (afterSize > 0)
      return result;
    else {
      if (!top.compareAndSet(t, t+1))
          result = null;
      bottom = t+1;
      return result;
```

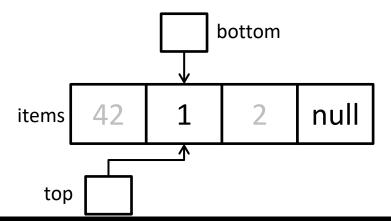
 What if we had pop() and steal() concurrently?





```
public T pop() { // from bottom
  final long b = bottom - 1;
  bottom = b;
  final long t = top.get(),
  final long afterSize = b - t;
  if (afterSize < 0) {</pre>
    bottom = t;
    return null;
  } else {
    T result = items[index(b, items.length)];
    if (afterSize > 0)
      return result;
    else {
      if (!top.compareAndSet(t, t+1))
          result = null;
      bottom = t+1;
      return result;
                             pop() -> ?
```

 What if we had pop() and steal() concurrently?



Chase-Lev

bottom = b;

} else {

else {

bottom = t;return null;

```
public T steal() { // from top
                         final long t = top.get();
                         final long b = bottom;
                         final long size = b - t;
                         if (size \leq 0)
                           return null;
                         else {
                          T result = items[index(t, items.length)];
                           if (top.compareAndSet(t, t+1))
                            return result;
public T pop() { /
                            return null;
  final long b = b
  final long t = t.......
  final long afterSize = b - t;
  if (afterSize < 0) {</pre>
     T result = items[index(b, items.length)];
     if (afterSize > 0)
       return result;
       if (!top.compareAndSet(t, t+1))
            result = null;
       bottom = t+1;
```

pop() -> ?

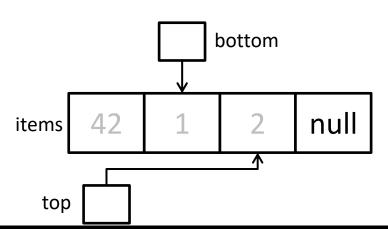
steal() -> ?

ue - pop



What if we had pop() and steal() concurrently?

Whatever thread succeeds in the CAS operation gets the element



return result;

Chase-Lev

```
final long t = top.get();
                        final long b = bottom;
                        final long size = b - t;
                        if (size \leq 0)
                         return null;
                        else {
                         T result = items[index(t, items.length)];
                         if (top.compareAndSet(t, t+1))
                           return result;
public T pop() { /
                           return null:
  final long b = k
  bottom = b;
  final long t = t.......
  final long afterSize = b - t;
  if (afterSize < 0) {</pre>
    bottom = t;
    return null;
  } else {
     T result = items[index(b, items.length)];
     if (afterSize > 0)
       return result;
    else {
       if (!top.compareAndSet(t, t+1))
           result = null;
       bottom = t+1;
       return result;
                                  pop() -> ?
                                 steal() -> ?
```

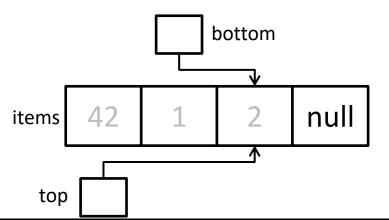
public T steal() { // from top

ue - pop



What if we had pop() and steal() concurrently?

- Whatever thread succeeds in the CAS operation gets the element
- Afterwards, pop always fixes the bottom variable



Guest lecture next week!



Agenda



- Lock-free stack
- ABA problem
- Lock-free queue
- Linearizability
 - Sequential consistency
 - Definition of Linearizability
 - Linearizable concurrent objects
- Work-stealing queues