

Practical Concurrent and Parallel Programming VII

Lock-Free Data Structures

Raúl Pardo

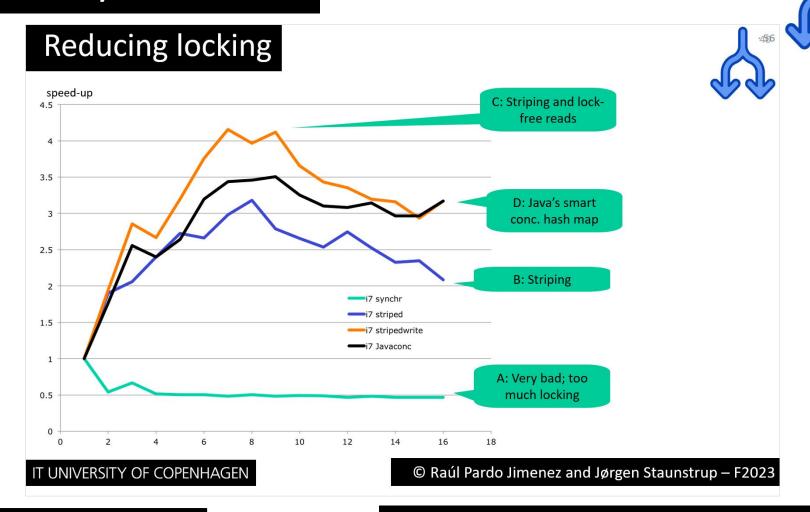
Troubles running Gradle?

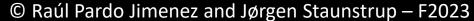


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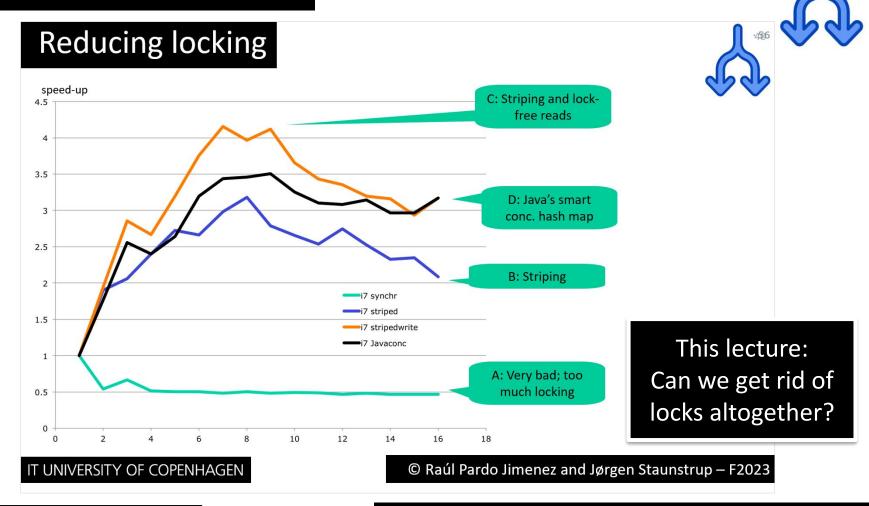


Previously on PCPP...





Previously on PCPP...



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Agenda



- Compare-And-Swap (CAS)
 - Lock-free atomic integer
 - Lock-free number range
 - Atomic libraries
 - CAS based lock implementation
- Lock-free stack
- ABA problem
- Lock-free queue

HW support for atomic compound operations



- Early processors had atomic compound operations to implement mutexes
 - test-and-set
 - Not suitable for implementing advanced lockfree data structures
 See Herlihy Sections 5.1 – 5.8 (outside the scope of the course)
- Modern processors provide special instructions to for managing concurrent access to shared variables
 - store-conditional, compare-and-swap (CAS)





HW support for Compare-And-Swap (Intel)



- Intel® 64 and IA-32 Architectures Software Developer's Manual
 - "The CMPXCHG [...] If the values contained in the destination operand and the EAX register are equal, the destination operand is replaced with the value of the other source operand (the value not in the EAX register).

 [...]

For multiple processor systems, CMPXCHG can be combined with the LOCK prefix to perform the compare and exchange operation atomically."

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 [...]

For multiple processor systems, CMPXCHG can be combined with the LOCK prefix to perform the compare and exchange operation atomically."

• Intel 64 and IA-32 processors provide a LOCK# signal [...] While this output signal is asserted, requests from other processors or bus agents for control of the bus are blocked [...]

Compare-And-Swap (CAS)



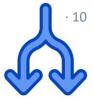
- At the programming language level, most languages support an operation: val.compareAndSwap(a,b)
 - Compares the value of val and a, and, if they are equal val is set to b, otherwise it does nothing. In either case, it returns the current value in val, i.e., the value when CAS was executed
 - This instruction is translated to CMPXCHG (or similar) by the compiler or runtime environment

CAS pseudo-code

```
class MyAtomicInteger {
    private int value;
                           // Visibility ensured by locking
    public synchronized int compareAndSwap(int oldValue, int newValue) {
         int valueInRegister = this.value;
                                                       Illustrative implementation of CAS
         if (this.value == oldValue)
             this.value = newValue;
         return valueInRegister;
    public synchronized boolean compareAndSet(int oldValue, int newValue) {
         return oldValue == this.compareAndSwap(oldValue,newValue);
                                                                     Common alternative.
    public synchronized int get() { return this.value; }
                                                                    Also abbreviated as CAS
                                                                    (optional exercise: implement
```

- Only to *illustrate* CAS semantics
 - CAS is implemented via a HW operation (e.g., CMPXCHG in Intel architectures)
 - In fact, locks are implemented using CAS

natively compareAndSet)



- Standard AtomicInteger operations can now be implemented using the CAS operations without blocking
- This is an example of *optimistic* concurrency (or non-blocking computation)
 - In a nutshell, trying several times until the operation succeeds

```
class MyAtomicInteger {
 public int addAndGet(int delta) {
     int oldValue, newValue;
     do {
         oldValue = get();
         newValue = oldValue + delta;
     } while (!compareAndSet(oldValue, newValue));
     return newValue;
 public int getAndAdd(int delta) {
     int oldValue, newValue;
     do {
         oldValue = get();
         newValue = oldValue + delta;
     } while (!compareAndSet(oldValue, newValue));
     return oldValue;
```



- Standard AtomicInteger operations can now be implemented using the CAS operations without blocking
- This is an example of optimistic concurrency (or non-blocking computation)
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```
class MyAtomicInteger {
 public int addAndGet(int delta) {
    int oldValue, newValue;
    do {
        oldValue = get();
        newValue = oldValue + delta;
     } while (!compareAndSet(oldValue, newValue));
    return newValue;
 public int getAndAdd(int delta) {
    int oldValue, newValue;
    do {
        oldValue = get();
        newValue = oldValue + delta;
     } while (!compareAndSet(oldValue, newValue));
    return oldValue;
                            Is this the same
                             as busy-wait?
```

A note on busy-wait



- <u>Busy-wait</u> is an <u>alternative to blocking</u> a thread to wait until some condition holds or to enter the critical section
- The main difference with lock() or await() is that the thread does not transition to the "blocked" state
- Generally, busy-wait is a bad idea,
 - Threads may consume computing resources to check a condition that has not been updated
 - In this course, we will never ask you to use busywait
 - Exercise solutions using busy-wait will be rejected
- Very rarely busy-wait may be preferred over blocking the thread
 - When the thread waits for a very short time it might be more efficient to use busy-wait
 - However, as we have discussed, reasoning about how it takes for a thread to do anything is pointless in concurrency

```
// state variables
int i = 0;
Lock 1 = new ReentrantLock();
// method example
public void method(...) {
    1.lock()
    try{
         // busy-wait
         while(i>0) {
             // do nothing
    catch (InterruptedException e) {...}
    finally {1.unlock();}
```

There exist 3 main notions of progress in non-blocking data structures/computation

- 1. <u>Wait-free</u>: A method of an object implementation is wait-free if every call finishes its execution in a finite number of steps
 - My operations are guaranteed to complete in a bounded number of steps (no matter what other threads do)

Progress conditions for non-blocking DS

There exist 3 main notions of progress in non-blocking data structures/computation

- 1. <u>Wait-free</u>: A method of an object implementation is wait-free if every call finishes its execution in a finite number of steps
 - My operations are guaranteed to complete in a bounded number of steps (no matter what other threads do)
- 2. <u>Lock-free</u>: A method of an object implementation is lock-free if executing the method guarantees that some method call (including concurrent) finishes in a finite number of steps
 - Somebody's operations are guaranteed to complete in a bounded number of my steps
 - Most non-blocking data structures are lock-free, e.g., Treabor's stack (see next slides)

Progress conditions for non-blocking DS

There exist 3 main notions of progress in non-blocking data structures/computation

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 - Somebody's operations are guaranteed to complete in a bounded number of my steps
 - Most non-blocking data structures are lock-free, e.g., Treabor's stack (see next slides)
- Obstruction-free: A method of an object implementation is obstruction-free if, from any point after which it executes in isolation, it finishes in a finite number of steps;
 - My operations are guaranteed to complete in a bounded of steps (if I get to execute them)

- 1. <u>Wait-free</u>: A method of an object implementation is wait-free if every call finishes its execution in a finite number of steps
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- 3. <u>Obstruction-free</u>: A method of an object implementation is obstruction-free if, from any point after which it executes in isolation, it finishes in a finite number of steps;
 - My operations are guaranteed to complete in a bounded of steps (if I get to execute them)

$$wait_{free} \Rightarrow lock_{free} \Rightarrow obstruction_{free}$$

Herlihy, Section 3.8 | slide from Michael Scott's presentation: https://www.youtube.com/watch?v=9XAx279s7gs



- Threads cannot wait forever because other thread finished incorrectly
 - Even in obstruction-free, completion must be guaranteed when the thread runs in isolation
- All progress definitions for non-blocking programs are part of an algorithm composed by multiple threads
 - Threads collaborate with each other



 Standard AtomicInteger operations can now be implemented using the CAS

What type of non-blocking progress applies to this AtomicInteger?

 In a nutshell, trying several times until the operation succeeds

```
class MyAtomicInteger {
 public int addAndGet(int delta) {
     int oldValue, newValue;
     do {
         oldValue = get();
         newValue = oldValue + delta;
     } while (!compareAndSet(oldValue, newValue));
     return newValue;
 public int getAndAdd(int delta) {
     int oldValue, newValue;
     do {
         oldValue = get();
         newValue = oldValue + delta;
     } while (!compareAndSet(oldValue, newValue));
     return oldValue;
```



- In Java, CAS and similar operations are accessed through
 AtomicXX objects
 - These classes support atomic lock-free operations for single variables
 - See package <u>java.util.concurrent.atomic</u>
- AtomicXX CAS operations have the same memory semantics as volatile read/write
 - "The memory effects for accesses and updates of atomics generally follow the rules for volatiles" [java.util.concurrent.atomic]
 - Unlike in Atomicxx, recall that volatile reads/writes are not atomic!



- The volatile visibility semantics of AtomicXX objects allow us to reason about safe-publication
- However, operations on Atomicxx are not explicitly part of the Java memory model
 - We cannot use them to reason about correctness or threadsafety
- In this lecture (and exercises), we use specifications to establish correctness (à la week 4)
- In two weeks, we will see a finer-grained definition of correctness for concurrent objects, Linearizability

What if we have to update multiple fields?



```
public class NumberRange {
  private final AtomicInteger lower = new AtomicInteger(0);
  private final AtomicInteger upper = new AtomicInteger(0);
  public int getLower() { return lower.get();}
  public int getUpper() { return upper.get();}
  public void setLower(int i) {
    if (i > getUpper()) {
      throw new IllegalArgumentException (
          "Can't set lower to " + i +" > upper");
    lower.set(i);
 public void setUpper(int i) {
    if (i < getLower()) {</pre>
      throw new IllegalArgumentException (
          ("Can't set upper to " + i +" < lower");
    upper.set(i);
```

<u>Specification</u>: For any concurrent execution of setLower() and setUpper(), it must always hold that <u>lower ≤ upper</u>

What if we have to update multiple fields?

```
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```

```
public class NumberRange {
  private final AtomicInteger lower = new AtomicInteger(0);
  private final AtomicInteger upper = new AtomicInteger(0);
  public int getLower() { return lower.get();}
  public int getUpper() { return upper.get();}
  public void setLower(int i) {
    if (i > getUpper()) {
      throw new IllegalArgumentException (
          "Can't set lower to " + i +" > upper");
    lower.set(i);
 public void setUpper(int i) {
    if (i < getLower()) {</pre>
      throw new IllegalArgumentException (
          ("Can't set upper to " + i +" < lower");
    upper.set(i);
```

<u>Specification</u>: For any concurrent execution of setLower() and setUpper(), it must always hold that <u>lower ≤ upper</u>

Does this implementation of setLower and setUpper satisfy the specification?

What if we have to update multiple fields?



```
public class NumberRange {
  private final AtomicInteger lower = new AtomicInteger(0);
  private final AtomicInteger upper = new AtomicInteger(0);
  public int getLower() { return lower.get();}
  public int getUpper() { return upper.get();}
  public void setLower(int i) {
    if (i > getUpper()) {
      throw new IllegalArgumentException (
          "Can't set lower to " + i +" > upper");
    lower.set(i);
 public void setUpper(int i) {
    if (i < getLower()) {</pre>
      throw new IllegalArgumentException (
          ("Can't set upper to " + i +" < lower");
    upper.set(i);
                               Goetz p. 67, Don't do this
```

<u>Specification</u>: For any concurrent execution of setLower() and setUpper(), it must always hold that <u>lower ≤ upper</u>

```
public class CasNumberRange {
  private final AtomicReference<IntPair> values =
    new AtomicReference<IntPair>(new IntPair(0,0));
  public int getLower() { return values.get().lower;}
  public int getUpper() { return values.get().upper;}
  public void setLower(int i) {
    while(true) {
      IntPair oldv = values.get();
      if (i > oldv.upper) {
        throw new IllegalArgumentException(
          "Can't set lower to " + i +" > upper");
      IntPair newv = new IntPair(i, oldv.upper);
      if (values.compareAndSet(oldv,newv))
        return;
  ... // Similarly for setUpper();
```

```
// Immutable class
private static class IntPair {
 private final int lower;
  private final int upper;
 public IntPair(int lower,
                 int upper) {
    this.lower = lower;
    this.upper = upper;
```

Specification: For any concurrent execution of setLower() and setUpper(), it must always hold that **lower** ≤ **upper**

```
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```

```
public class CasNumberRange {
  private final AtomicReference<IntPair> values =
    new AtomicReference<IntPair>(new IntPair(0,0));
  public int getLower() { return values.get().lower;}
  public int getUpper() { return values.get().upper;}
  public void setLower(int i) {
    while(true) {
      IntPair oldv = values.get();
      if (i > oldv.upper) {
        throw new IllegalArgumentException(
          "Can't set lower to " + i +" > upper");
      IntPair newv = new IntPair(i, oldv.upper);
      if (values.compareAndSet(oldv,newv))
        return;
  ... // Similarly for setUpper();
```

Why is it important that IntPair is immutable?

<u>Specification</u>: For any concurrent execution of setLower() and setUpper(), it must always hold that **lower ≤ upper**



CAS based Lock implementation



1. Simple TryLock

- Non-blocking tryLock, the lock may be acquired only once
- Regular unlock

2. Reentrant TryLock

- Non-blocking tryLock, the lock may be acquired repeatedly by the same thread
- Regular (reentrant) unlock

3. Simple Lock

- Blocking lock, the lock may be acquired only once
- Regular unlock

4. Reentrant Lock

- Block lock, the lock may be acquired repeatedly by the same thread
- Regular (reentrant) unlock

See TestCasLocks.java



```
class SimpleTryLock {
    // Refers to holding thread, null iff unheld
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    public boolean tryLock() {
                                                              If the lock is free (holder value equals
      final Thread current = Thread.currentThread();
                                                              null), takes it and return true.
       return holder.compareAndSet(null, current);
                                                              Otherwise, holder is unmodified and
                                                              returns false.
    public void unlock() {
       final Thread current = Thread.currentThread();
       if (!holder.compareAndSet(current, null))
           throw new RuntimeException("Not lock holder");
                                                              Sets holder value to null. If CAS returns
                                                              false throws an exception indicating
                                                              that this thread is not holding the lock.
```



```
class SimpleTryLock {
    // Refers to holding thread, null iff unheld
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    public boolean tryLock() {
                                                              If the lock is free (holder value equals
      final Thread current = Thread.currentThread();
                                                              null), takes it and return true.
       return holder.compareAndSet(null, current);
                                                              Otherwise, holder is unmodified and
                                                              returns false.
    public void unlock() {
       final Thread current = Thread.currentThread();
       if (!holder.compareAndSet(current, null))
           throw new RuntimeException("Not lock holder");
                                                              Sets holder value to null. If CAS returns
                     How is CAS used here to
                                                              false throws an exception indicating
                determine that the lock is not held
                                                              that this thread is not holding the lock.
                 by the thread executing unlock?
```

```
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```

```
class ReentrantTryLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    private volatile int holdCount = 0;
    public boolean tryLock() {
     final Thread current = Thread.currentThread();
     if (holder.get() == current) {
         holdCount++;
         return true;
     } else if (holder.compareAndSet(null, current)) {
         holdCount = 1;
         return true;
     return false;
    public void unlock() {
     final Thread current = Thread.currentThread();
     if (holder.get() == current) {
         holdCount--;
         if (holdCount == 0)
           holder.compareAndSet(current, null);
         return;
     } else
         throw new RuntimeException("Not lock holder");
```

```
. 23
```

```
class ReentrantTryLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    private volatile int holdCount = 0;
    public boolean tryLock() {
                                                                  If the calling thread already holds
     final Thread current = Thread.currentThread();
                                                                   the lock, we increase the counter
     if (holder.get() == current) {
         holdCount++;
         return true;
     } else if (holder.compareAndSet(null, current)) {
         holdCount = 1:
                                                                If not, we try to acquire the lock
         return true;
                                                                and set the count to 1
     return false;
    public void unlock() {
     final Thread current = Thread.currentThread();
     if (holder.get() == current) {
         holdCount--;
         if (holdCount == 0)
           holder.compareAndSet(current, null);
         return;
     } else
         throw new RuntimeException("Not lock holder");
```

```
. 23
```

```
class ReentrantTryLock {
    private
                                                      ew AtomicReference<Thread>();
               Do we have a race condition in
    private
              this branch of the if-statement?
    public h
                                                                  If the calling thread already holds
     final rnread cu. - rnread.currentrnread();
                                                                  the lock, we increase the counter
     if (holder.get() == current) {
         holdCount++;
         return true;
     } else if (holder.compareAndSet(null, current)) {
         holdCount = 1:
                                                               If not, we try to acquire the lock
         return true;
                                                               and set the count to 1
     return false;
    public void unlock() {
     final Thread current = Thread.currentThread();
     if (holder.get() == current) {
         holdCount--;
         if (holdCount == 0)
           holder.compareAndSet(current, null);
         return;
     } else
         throw new RuntimeException("Not lock holder");
```

```
. 23
```

```
class ReentrantTryLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    private volatile int holdCount = 0;
    public boolean tryLock() {
                                                                   If the calling thread already holds
     final Thread current = Thread.currentThread();
                                                                    the lock, we increase the counter
     if (holder.get() == current) {
          holdCount++;
          return true;
      } else if (holder.compareAndSet(null, current)) {
         holdCount = 1:
                                                                 If not, we try to acquire the lock
          return true;
                                                                 and set the count to 1
     return false;
    public void unlock() {
                                                                 If the calling thread holds the hold we
     final Thread current = Thread.currentThread();
                                                                 decrement the counter
     if (holder.get() == current) {
          holdCount--;
          if (holdCount == 0)
                                                                If the counter is 0 then we release the
           holder.compareAndSet(current, null);
                                                                 lock
          return;
      } else
                                                                 If the calling thread does not hold the
          throw new RuntimeException ("Not lock holder")
                                                                lock we throw an exception
```

```
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```

```
class SimpleLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    // The FIFO queue of threads waiting for this lock
    private final Queue<Thread> waiters = new ConcurrentLinkedQueue<Thread>();
    public void lock() {
     final Thread current = Thread.currentThread();
     waiters.add(current);
     while (waiters.peek() != current || !holder.compareAndSet(null, current)) {
         LockSupport.park(this);
     waiters.remove();
   public void unlock() {
     final Thread current = Thread.currentThread();
     if (holder.compareAndSet(current, null))
         LockSupport.unpark(waiters.peek());
     else
         throw new RuntimeException("Not lock holder");
```

```
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```

```
class SimpleLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    // The FIFO queue of threads waiting for this lock
    private final Queue<Thread> waiters = new ConcurrentLinkedQueue<Thread>();
    public void lock() {
     final Thread current = Thread.currentThread();
                                                              First we add the thread to a waiting queue
     waiters.add(current);
     while (waiters.peek() != current || !holder.compareAndSet(null, current)) {
         LockSupport.park(this);
                                                                  We check whether the current thread is at the
                                                                 head of the queue and try to take the lock
     waiters.remove();
                                      If not successful, we put the thread to wait (see Javadoc LockSupport)
       Finally, we remove the
       thread from the waiting list
    public void unlock() {
     final Thread current = Thread.currentThread();
     if (holder.compareAndSet(current, null))
         LockSupport.unpark(waiters.peek());
     else
         throw new RuntimeException("Not lock holder");
```

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class SimpleLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    // The FIFO queue of threads waiting for this lock
    private final Queue<Thread> waiters = new ConcurrentLinkedQueue<Thread>();
    public void lock() {
     final Thread current = Thread.currentThread();
                                                               First we add the thread to a waiting queue
     waiters.add(current);
     while (waiters.peek() != current || !holder.compareAndSet(null, current)) {
          LockSupport.park(this);
                                                                   We check whether the current thread is at the
                                                                   head of the queue and try to take the lock
     waiters.remove();
                                       If not successful, we put the thread to wait (see Javadoc LockSupport)
       Finally, we remove the
       thread from the waiting list
    public void unlock() {
                                                                       We simply try to release the lock
     final Thread current = Thread.currentThread();
     if (holder.compareAndSet(current, null))
          LockSupport.unpark(waiters.peek());
                                                                        If successful, we wake up one of
     else
                                                                       the waiting threads, if any
          throw new RuntimeException("Not lock holder");
        As before, we throw an exception if the calling thread is not the thread holding the lock
```

```
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```

```
class SimpleLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    // The FIFO queue of threads waiting for this lock
    private final Queue<Thread> waiters = new ConcurrentLinkedOueue<Thread>();
    public void lock() {
      final Thread current = Thread.currentThread();
                                                            We use a flag to record whether the thread
      boolean wasInterrupted = false;
                                                            has been interrupted during execution
      waiters.add(current);
      while (waiters.peek() != current || !holder.compareAndSet(null, current)) {
         LockSupport.park(this);
         if (Thread.interrupted())
          wasInterrupted = true;
                                               Immediately after taking the lock, we check if
                                               the thread was interrupted
     waiters.remove();
     if (wasInterrupted)
         current.interrupt();
                                    If the thread was interrupted, we call interrupt
                                    to propagate the interruption.
```



```
class MyReentrantLock {
    private final AtomicReference<Thread> holder = new AtomicReference<Thread>();
    private final Queue<Thread> waiters = new ConcurrentLinkedQueue<Thread>();
    private volatile int holdCount = 0;
    public void lock() {
                                                          Here we simply combine what we have
     final Thread current = Thread.currentThread();
                                                          seen in threads 2 and 3
     if (holder.get() == current)
         holdCount++;
     else {
         boolean wasInterrupted = false;
         waiters.add(current);
         while (waiters.peek() != current || !holder.compareAndSet(null, current)) {
          LockSupport.park(this);
          if (Thread.interrupted())
               wasInterrupted = true;
         holdCount = 1;
         waiters.remove();
         if (wasInterrupted)
          current.interrupt();
```



Scalability of CAS



- Pros
 - A CAS operation is faster than acquiring a lock
 - An unsuccessful CAS operation does not cause thread de-scheduling (blocking)
- Cons
 - CAS operations result in high memory overhead

Will CAS based implementations always scale well? (that is, better than lock based)

```
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```

```
// Lock-based implementation
class LockingRandom implements MyRandom {
  private long seed;
  // Recipe from java.util.Random.next(int bits) documentation
 public synchronized int nextInt() {
    seed = (seed * 0 \times 5 D E E C E 6 6 D L + 0 \times B L) & ((1L << 48) - 1);
    return (int) (seed >>> 16);
// CAS based implementation
class CasRandom implements MyRandom {
  private final AtomicLong seed;
  public int nextInt() {
    long oldSeed, newSeed;
    do {
      oldSeed = seed.get();
      newSeed = (oldSeed * 0x5DEECE66DL + 0xBL) & ((1L << 48) - 1);
    } while (!seed.compareAndSet(oldSeed, newSeed));
    return (int) (newSeed >>> 16);
```

- We use a different implementations of a simple Pseudo-Random Number Generator (PRNG) to test the <u>scalability</u> of <u>CAS vs Locks vs Thread Local</u> (see next slide)
- Example execution with seed = 10
 - 3847489, 1334288366,
 1486862010, 711662464,
 -1453296530, -775316920,
 1157481928, 294681619, ...

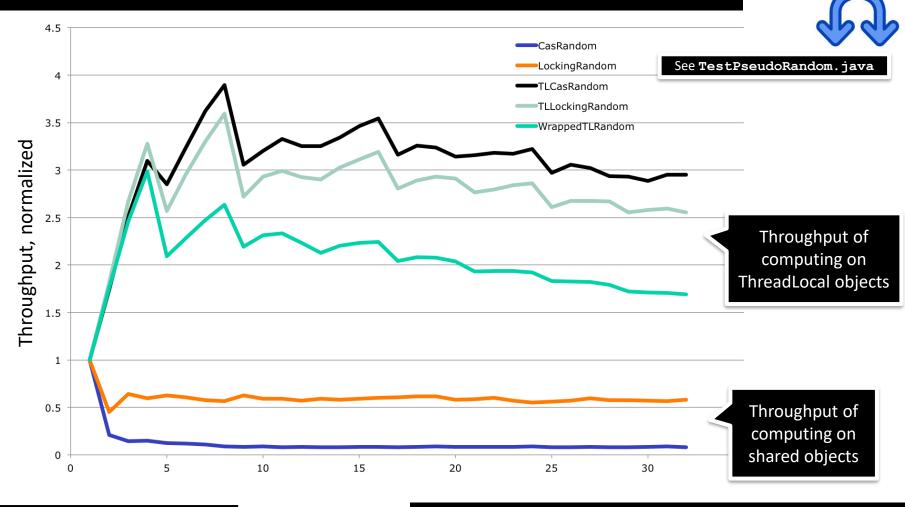
```
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```

```
// Lock-based implementation
class LockingRandom implements MyRandom {
  private long seed;
  // Recipe from java.util.Random.next(int bits) documentation
 public synchronized int nextInt() {
    seed = (seed * 0 \times 5 D E E C E 6 6 D L + 0 \times B L) & ((1L << 48) - 1);
    return (int) (seed >>> 16);
// CAS based implementation
class CasRandom implements MyRandom {
  private final AtomicLong seed;
  public int nextInt() {
    long oldSeed, newSeed;
    do {
      oldSeed = seed.get();
      newSeed = (oldSeed * 0x5DEECE66DL + 0xBL) & ((1L << 48) - 1);
    } while (!seed.compareAndSet(oldSeed, newSeed));
    return (int) (newSeed >>> 16);
```

- We use a different implementations of a simple Pseudo-Random Number Generator (PRNG) to test the <u>scalability</u> of <u>CAS vs Locks vs Thread Local</u> (see next slide)
- Example execution with seed = 10
 - 3847489, 1334288366,
 1486862010, 711662464,
 -1453296530, -775316920,
 1157481928, 294681619, ...

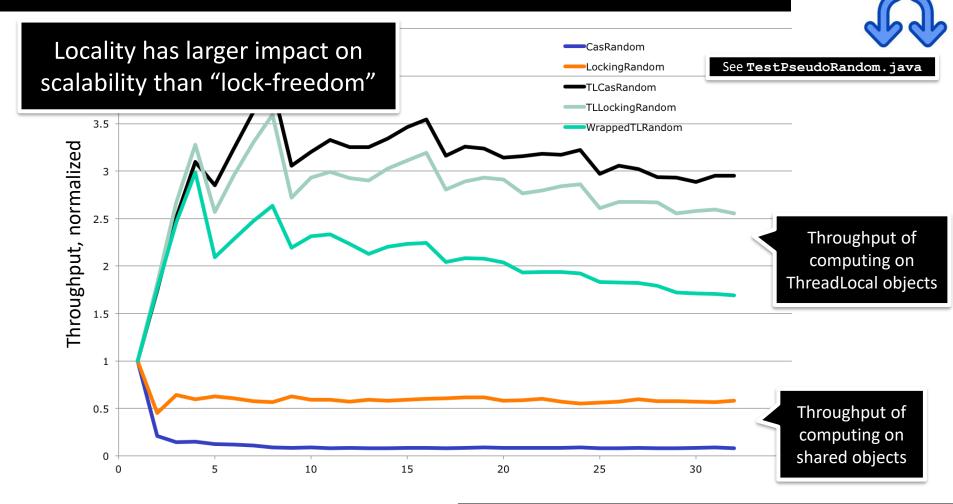
Could we have an implementation using volatile?

Scalability of PRNGs (unrealistic contention)



. 30

Scalability of PRNGs (unrealistic contention)



. 30

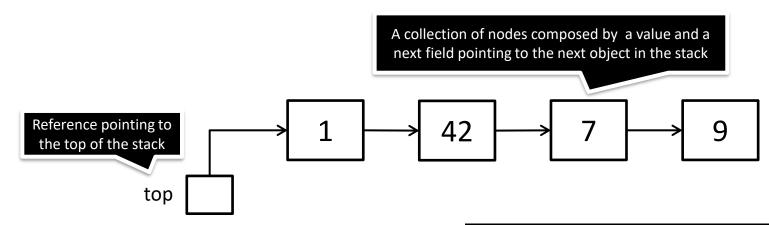


Lock-free data structures: Stack

Stacks



- 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
- It is typically implemented as a linked list



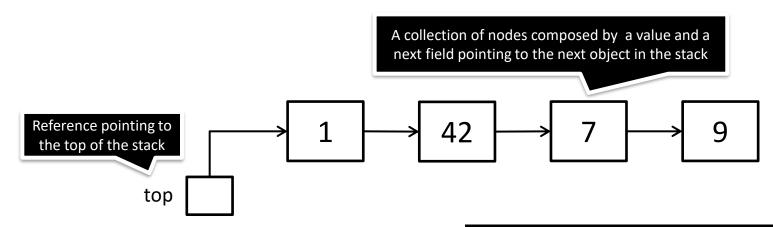
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How do we model an empty stack?



- A stack is a data structure following a LIFO (last-in-first-out)
 policy
 - push() adds an element to the top of the stack
 - pop() removes the top of the stack
- It is typically implemented as a linked list



Lock-free Stack

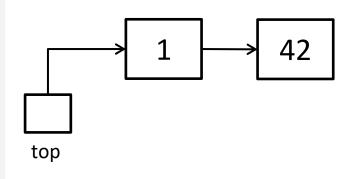
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
         new AtomicReference<Node<T>>();
   public void push(T value) {
        Node<T> newHead = new Node<T>(value);
        Node<T> oldHead;
        do {
         oldHead
                      = top.get();
        newHead.next = oldHead;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

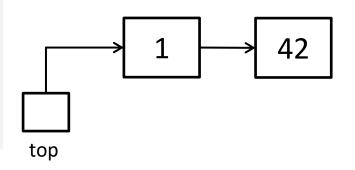
public Node(T item) {
    this.item = item;
    this.next = null;
  }
}
```



```
•34
```

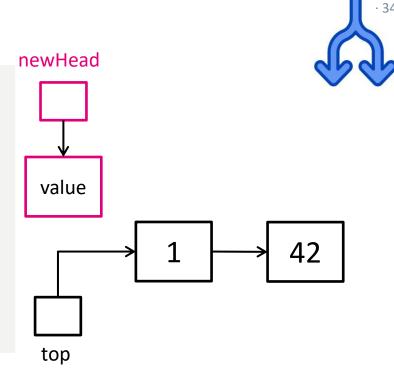
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

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));
    }
...
}
```



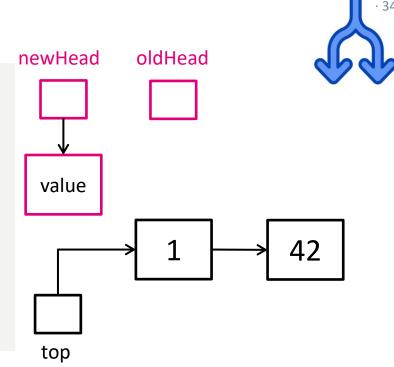
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

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));
}
...
}
```



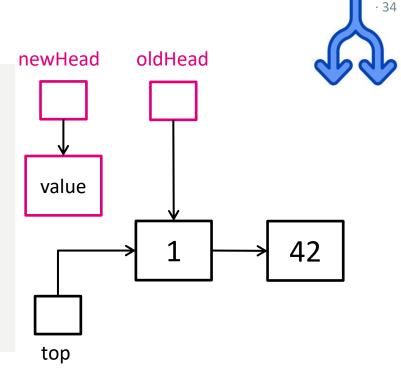
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

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));
}
...
}
```



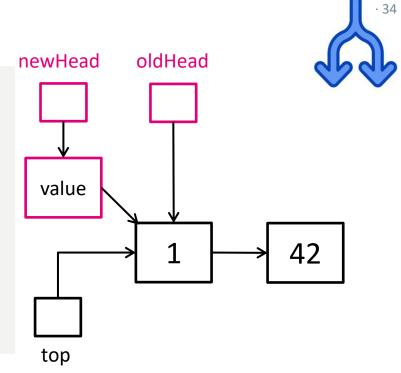
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
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public void push(T value) {
    Node<T> newHead = new Node<T>(value);
    Node<T> oldHead;
    do {
        oldHead = top.get();
        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));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



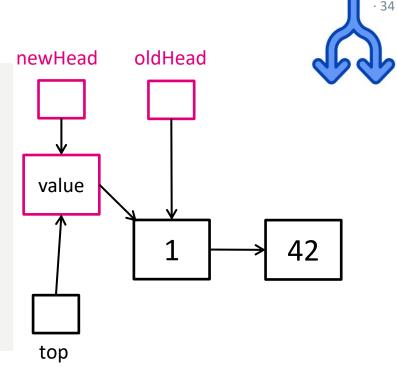
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    AtomicReference<Node<T>> top =
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public void push(T value) {
    Node<T> newHead = new Node<T>(value);
    Node<T> oldHead;
    do {
        oldHead = top.get();
        newHead.next = oldHead;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



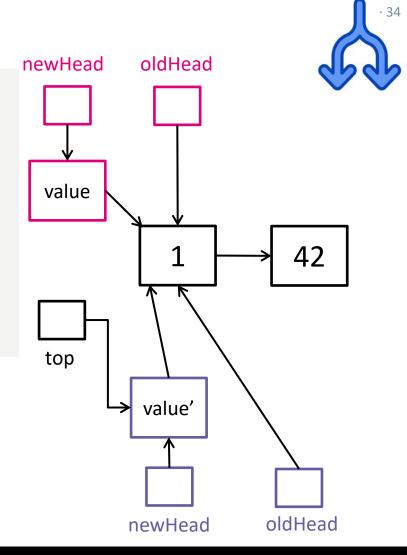
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class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
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public void push(T value) {
    Node<T> newHead = new Node<T>(value);
    Node<T> oldHead;
    do {
        oldHead = top.get();
     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



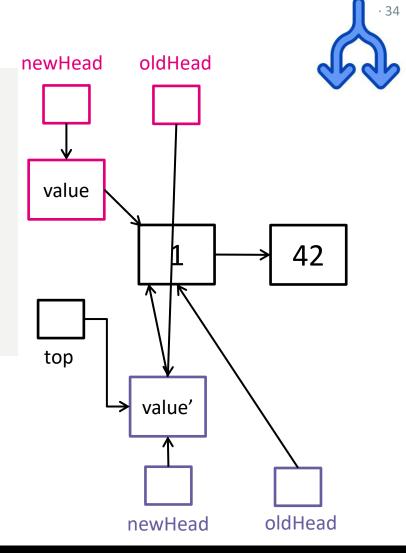
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    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

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



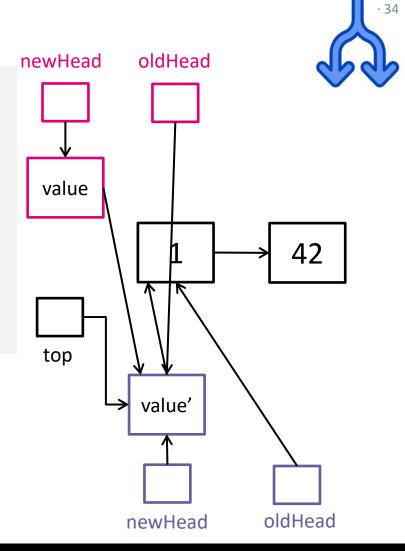
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

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));
    }
...
}
```



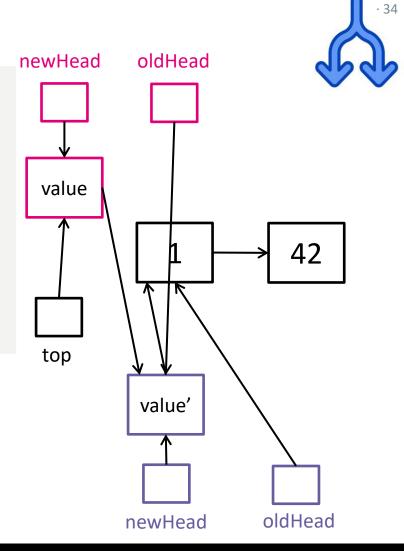
```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

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));
}
...
}
```

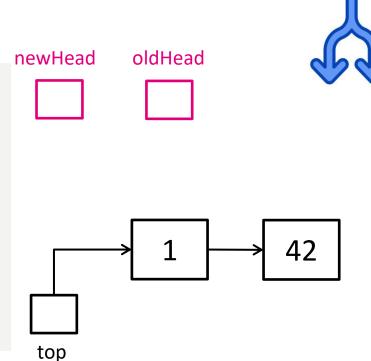


```
class LockFreeStack<T> {
    AtomicReference<Node<T>> top =
        new AtomicReference<Node<T>>();

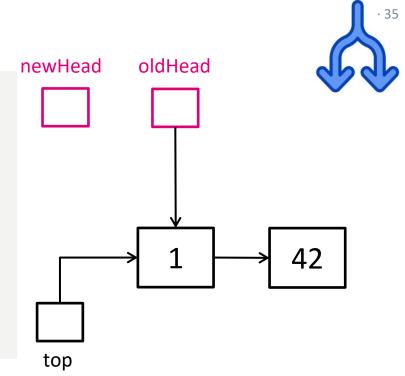
public void push(T value) {
    Node<T> newHead = new Node<T>(value);
    Node<T> oldHead;
    do {
        oldHead = top.get();
        newHead.next = oldHead;
    } while (!top.compareAndSet(oldHead,newHead));
}
...
}
```



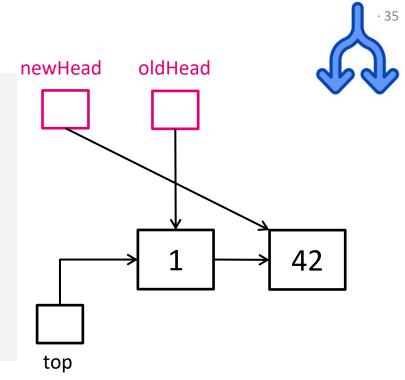
```
class LockFreeStack<T> {
...
    public T pop() {
        Node<T> newHead;
        Node<T> oldHead;
        do {
            oldHead = top.get();
            if(oldHead == null) { return null; }
                  newHead = oldHead.next;
            } while (!top.compareAndSet(oldHead,newHead));
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

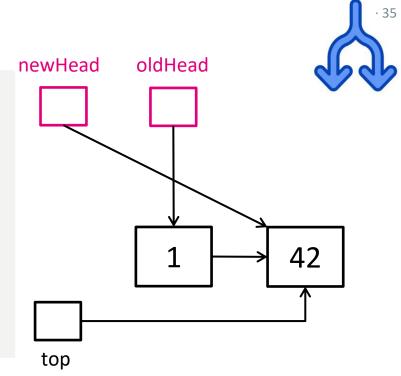


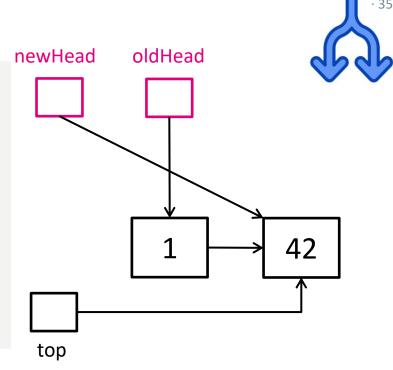
```
class LockFreeStack<T> {
...
    public T pop() {
        Node<T> newHead;
        Node<T> oldHead;
        do {
            oldHead = top.get();
            if(oldHead == null) { return null; }
                  newHead = oldHead.next;
            } while (!top.compareAndSet(oldHead,newHead));
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







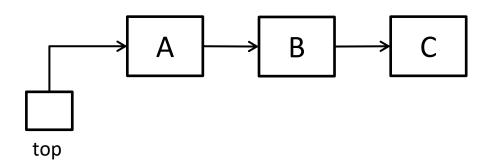
Would there be any problem if another thread is executing pop() concurrently?



The ABA Problem

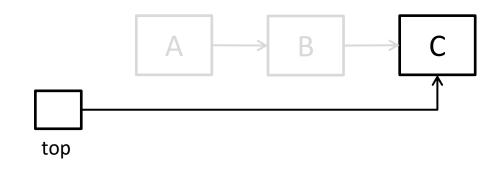


1. Thread 1 starts popping A



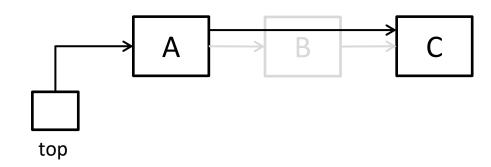


- 1. Thread 1 starts popping A
- 2. Before thread 1 finishes, thread 2 pops A and B



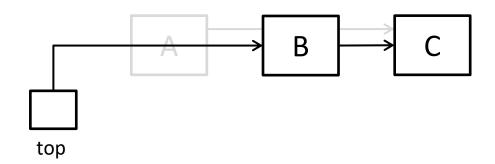


- Thread 1 starts popping A
- 2. Before thread 1 finishes, thread 2 pops A and B
- 3. Thread 2 pushes A back // recovered from memory (same as thread 1 was popping)





- 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

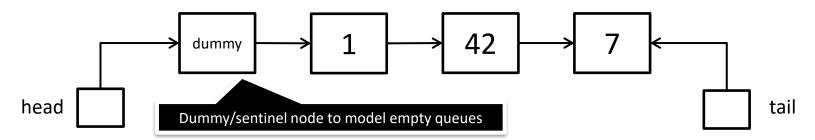


Lock-free data structures: Queue

Queues



- 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 an element from the head of the queue
- 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;
```

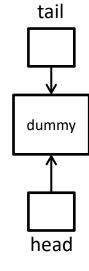
See TestMSQueue.java

Lock-free queue | initialization

```
.45
```

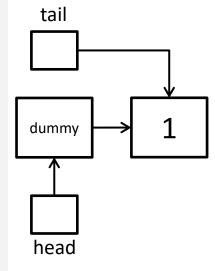
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class MSQueue<T> implements UnboundedQueue<T> {
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public MSQueue() {
    Node<T> dummy = new Node<T>(null, null);
    head = new AtomicReference<Node<T>>(dummy);
    tail = new AtomicReference<Node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

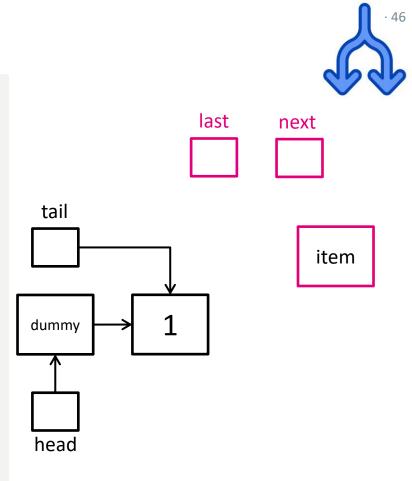


```
•46
```

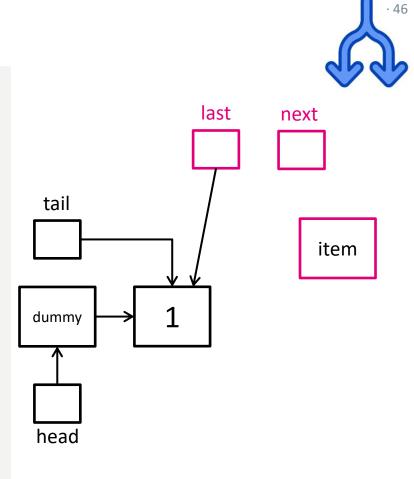
```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
           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



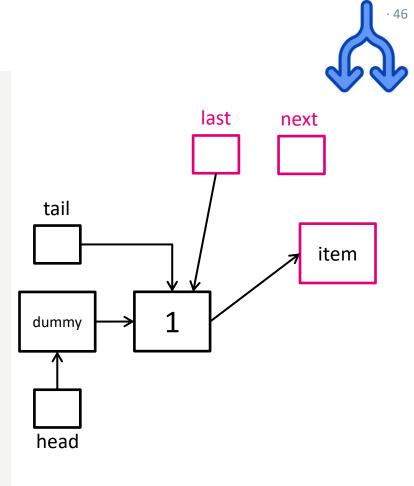
```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
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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



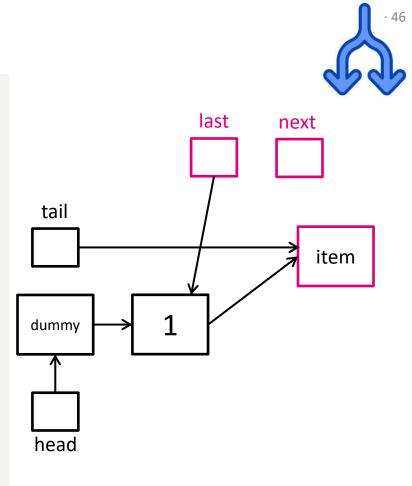
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public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
          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



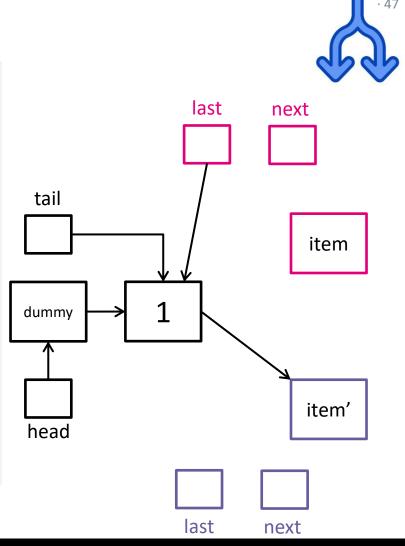
```
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public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
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         if (last == tail.get()) {
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                // Insertion 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> {
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               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next, node)) {
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                tail.compareAndSet(last, node);
                return;
           } else
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```

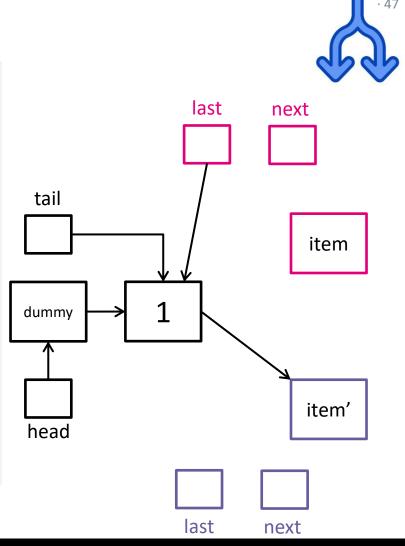


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public void enqueue(T item) {
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         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
               // In quiescent state, try inserting new node
               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);
```

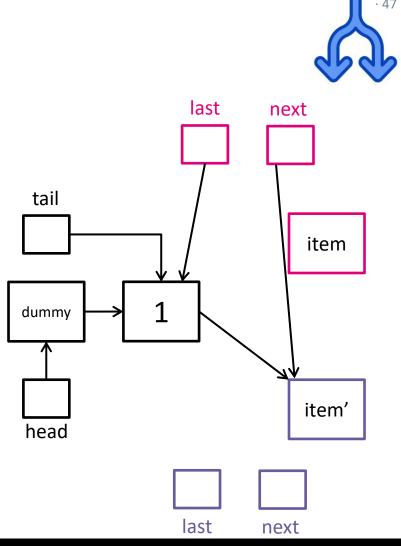


```
class MSQueue<T> implements UnboundedQueue<T> {
                                                   How can this state
                                                                                   last
                                                                                            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
```

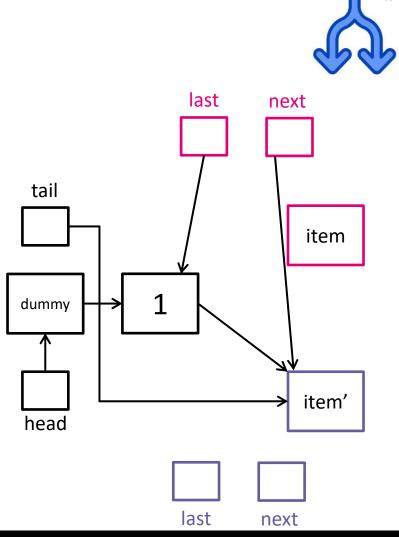
```
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     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next,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



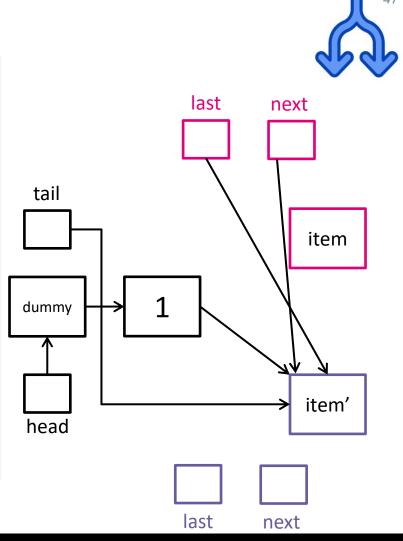
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public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
          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

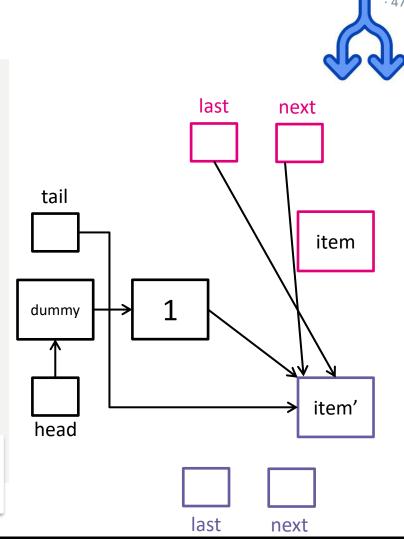


```
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     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
          if (next == null) {
               // In quiescent state, try inserting new node
               if (last.next.compareAndSet(next,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

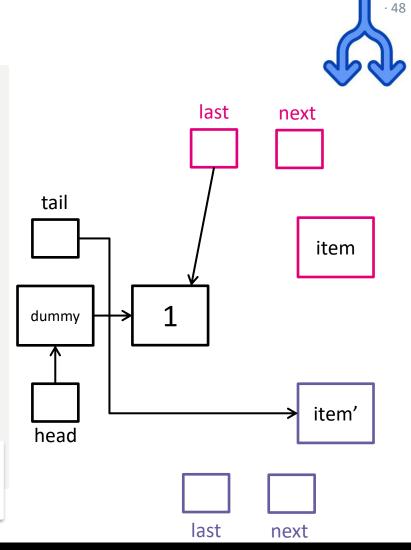


```
class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
     while (true) {
         Node<T> last = tail.get();
         Node<T> next = last.next.get();
         if (last == tail.get()) {
           if (next == null) {
               // 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);
                       In case another thread is enqueuing, and
```

didn't update the tail, the current thread helps by advancing the tail

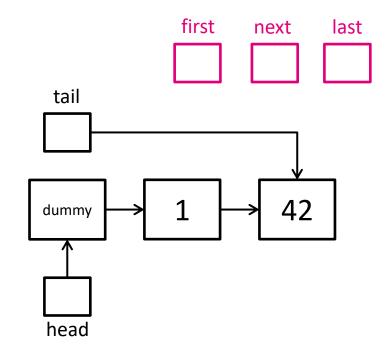


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class MSQueue<T> implements UnboundedQueue<T> {
public void enqueue(T item) {
     Node<T> node = new Node<T>(item, null);
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         Node<T> last = tail.get();
         Node<T> next = last.next.get();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



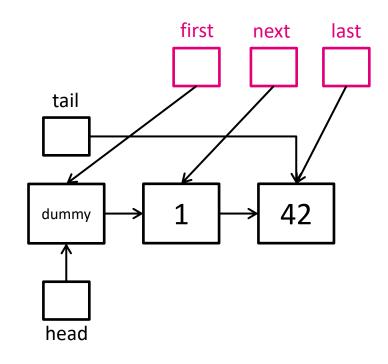
```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next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





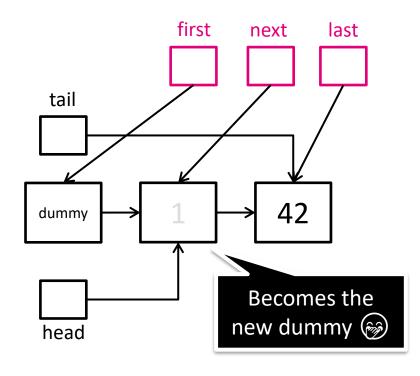
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class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           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;
```





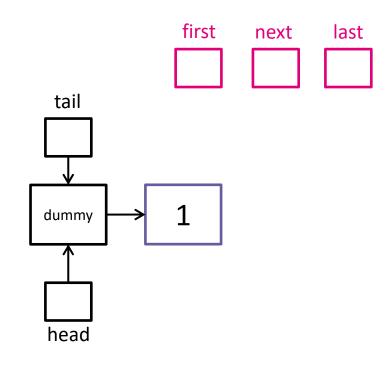
```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next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





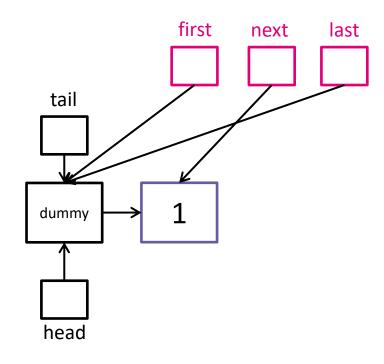
```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next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





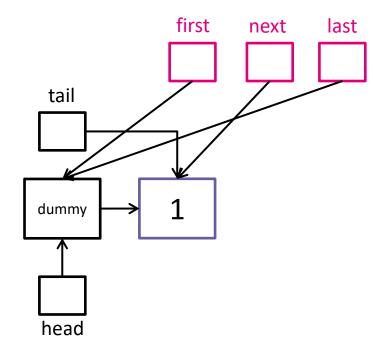
```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next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





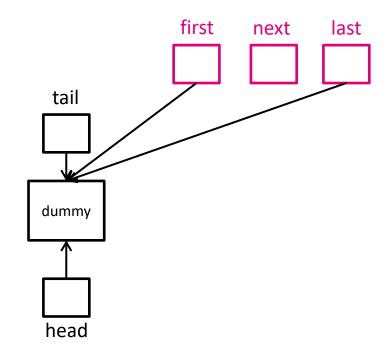
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class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           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;
        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 pop 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;
```

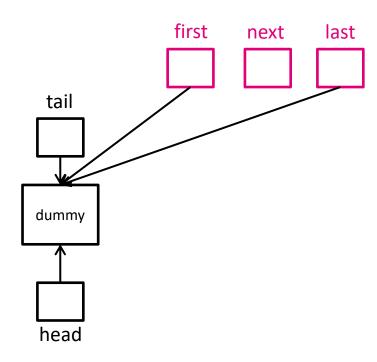




```
class MSQueue<T> implements UnboundedQueue<T> {
   public T dequeue() {
     while (true) {
         Node<T> first = head.get();
         Node<T> last = tail.get();
         Node<T> next = first.next.get();
         if (first == head.get()) {
           if (first == last) {
               if (next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

If the next field of the head is pointing to null, then we return null. Why is this correct?

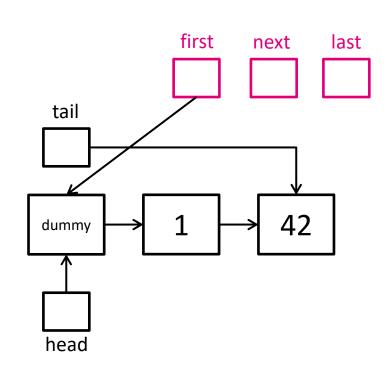




```
.52
```

```
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;
```

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



What about correctness?



- We have seen several implementations of lock-free data structures today
- However, we have not seen any techniques to reason about their correctness
 - In two weeks -> Linearizability



Enjoy a well-deserved Autumn break!

Agenda



- Compare-And-Swap (CAS)
 - Lock-free atomic integer
 - Lock-free number range
 - Atomic libraries
 - CAS based lock implementation
- Lock-free stack
- ABA problem
- Lock-free queue