Set Data Structure

- Operations:
 - Add an element
 - Remove an element
 - Answer question about containment
- Implemented as a singly linked list

- Adding threads should not lower throughput
 - Contention effects
 - Fixed by queue locks
- Should increase throughput
 - Not possible if inherently sequential
 - But surprising things are parallelizable

- Coarse-Grained synchronization
 - Each method locks the object
 - Avoid contention using queue locks
 - Easy to reason about
 - But "Sequential Bottleneck"
 - Threads stand in line
 - So adding more threads does not improve throughput
 - In fact, could make things worse

- Instead of using a single lock:
 - Use fine-grained synchronization
 - Split object into
 - independently synchronized components
 - Methods conflict only:
 - When they access the same component at the same time

- Use optimistic synchronization
 - Search without locking
 - If you find it, lock, and check that it did not change
- In general, optimistic synchronization
 - Is good when it works
 - But mistakes are expensive

- Lazy synchronization
 - Postpone hard work
 - Removing components is tricky
 - So use *logical* removal:
 - Mark the component as deleted instead of deleting it
 - Followed by *physical* removal:
 - Delete the component

- Lock-free Synchronization
 - Don't use locks at all
 - Use Compare-And-Set and relatives
 - Needs no scheduler assumptions or support
 - But is complex and can have high overhead

- Singly linked list:
 - Use a List Node class

public class Node {
public T item;
public int key;
public volatile Node next;

• Use Sentinel Nodes



• Operations involve pointer chasing



Linked List add() a d С remove() b С

Coarse Grained Locking

- Coarse Grained Locking
 - Single hotspot + bottleneck leads to convoys



- Fine-grained locking
 - Requires care
 - Split object into pieces
 - Each piece has its own lock
 - Methods that work on disjoint set of pieces do not exclude each other

Hand-over-Hand locking



Hand-over-Hand locking



• Hand-over-Hand locking



Hand-over-Hand locking



- Implementing remove
 - Problem arise when other threads try to access an adjacent node



 Hand-to-hand locking assures that a thread that tries a competitive operation has a lock conflict







• Why lock the victim node?



- Another thread might want to add after b
 - Homework 3



















Concurrent removal undoes one threads work



• Node c has not been removed



- Problem
 - To delete node C, we swing its predecessor's next-field to its successor



• But someone could create another pointer to C
































```
public boolean remove(T item) {
  int key = item.hashCode();
  Node pred, curr;
  try {
    ...
  } finally {
    curr.unlock();
    pred.unlock();
```

} }

Key used to order nodes

```
public boolean remove(T item) {
  int key = item.hashCode();
  Node pred, curr;
  try {
    ...
  } finally {
    curr.unlock();
    pred.unlock();
  }
}
```

```
public boolean remove(T item) {
  int key = item.hashCode();
  Node pred, curr;
  try {
    ...
  } finally {
    Curr.unlock();
    pred.unlock();
  }
}
```

```
public boolean remove(T item) {
  int key = item.hashCode();
  Node pred, curr;
  try {
    ...
  } finally {
    curr.unlock();
    pred.unlock();
  }
}
```

Remove

```
try {
  pred = head;
  pred.lock();
  curr = pred.next;
  curr.lock();
  ...
} finally { ... }
```

```
try {
  pred = head;
  pred.lock();
  curr = pred.next;
  curr.lock();
 ...
} finally { ... }
```



```
try {
  pred = head;
  pred.lock();
  curr = pred.next;
  curr.lock();
  ...
} finally { ... }
```



```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Searching

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Loop Invariant: At start of while, pred and curr are locked

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Loop Invariant: At start of while, pred and curr are locked

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

If item found, delete node



```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Unlock predecessor

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Move right

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Acquire next node

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Acquire next node

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Lock next node

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Loop invariant restored

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

Otherwise, return false

- Execution history is **Linearizable**:
 - Equivalent to a sequential history
- To argue something is linearizable:
 - Can find "linearization points"

- Invariants:
 - All items in the set are in nodes reachable from head
 - All nodes are arranged in order
- We show that invariants are maintained by methods

- Why remove is linearizable
 - Case 1: Item is in the list

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```
- Why remove is linearizable
 - Case 1: Item is in the list
 - Then pred.next = curr.next is a linearization point
- Invariants:
 - pred is reachable from head
 - curr is pred.next
 - curr is in the set
- No other thread can access either pred or curr during assignment

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
</pre>
```

```
return false;
```

- Why remove is linearizable
 - After removal:
 - curr is no longer reachable: item is removed
 - pred is reachable from head
 - old curr.next is reachable
 - for all other nodes, reachability has not changed

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

- Why remove is linearizable
 - Case 2: Item is not in the list

```
lacksquare
```

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

- Why remove is linearizable
 - Case 2: Item is not in the list
 - return false is linearization point

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

- Why remove is linearizable
 - Invariants are not changed
 - Need to show correctness:
 - Use induction to argue that item is not in the set

```
while (curr.key <= key) {
    if (item == curr.item) {
        pred.next = curr.next;
        return true;
    }
    pred.unlock();
    pred = curr;
    curr = curr.next;
    curr.lock();
    }
    return false;</pre>
```

- Only lock when you are ready
 - Traverse list to find insertion / removal point
 - Then lock needed nodes after validation!







• Why we need validation

Thread 1: Add d



Threads: Delete b and c



Thread 1: Add d, locks found nodes



Thread 1: Add d, locks found nodes



- What can go wrong?
 - Nodes might no longer be there











Need to validate

• What else can go wrong?



Optimistic Locking A A d b а e add(b') h add(c)





• Need to validate while holding locks



- Need to validate while holding locks
- Linearization point



- Optimistic locking:
 - Search without acquiring locks
 - Lock the nodes found
 - Confirm that locked nodes are correct
 - For inserting a node between Node A and Node B:
 - Node A is reachable from head
 - Node B is still the successor of Node A

- Validation:
 - Reachability of Node A
 - No operation changes reachability with exception of the Node being removed
 - Verify that!
 - Therefore: we do not need locks to verify reachability

• Addition: Phase 1: searching

```
public boolean add(T item) {
    int key = item.hashCode();
    while (true) {
        Node pred = head;
        Node curr = pred.next;
        while (curr.key <= key) {
            pred = curr; curr = curr.next;
        }
    }
}
```

• Addition: Phase 2: Locking

pred.lock(); curr.lock();

Addition: Phase 3: Validation and Update

```
try {
   if (validate(pred, curr)) {
      if (curr.key == key) {
          return false;
      } else {
            Node node = new Node (item);
             node.next = curr;
            pred.next = node;
             return true;
      }
  finally {
     pred.unlock();
     curr.unlock();
}
```

Remove

```
public boolean remove(T item) {
    int key = item.hashCode();
    while( true ) {
        Node pred = head;
        Node curr = pred.next;
        while (curr.key < key) {
            pred = curr;
            curr = curr.next;
        }
    }
}</pre>
```

• Remove: Lock phase

pred.lock();
curr.lock();

Remove: Validation and deletion phase

```
try {
   if (validate(pred, curr)) {
      if (curr.key == key) {
         pred.next = curr.next;
         return true;
       else {
         return false;
   }
  finally {
           pred.unlock(); curr.unlock();
          }
} }
```

- On exit from loop and in the absence of synchronization problems:
 - If item is present:
 - curr holds item
 - pred just before curr
 - If item is absent:
 - curr has higher key
 - pred just before curr

```
public boolean remove(T item) {
    int key = item.hashCode();
    while( true ) {
        Node pred = head;
        Node curr = pred.next;
        while (curr.key < key) {
            pred = curr;
            curr = curr.next;
        }
    }
</pre>
```

• Remove: Validation and deletion phase

```
try {
                                   Check for
  if (curr.key == key) {
                                 synchronization
        pred.next = curr.next;
                                    problems
        return true;
      else {
        return false;
   }
  finally {
          pred.unlock(); curr.unlock();
} }
```

- Limited hot-spots:
 - Targets of add, remove, contains
- No contention on traversals
- Traversals are wait-free

- Optimistic locking:
 - Traverses list twice
 - Contains locks
- Lazy locking:
 - Make validation simpler
 - By marking deleted nodes

- Add to each node a Boolean marked field
- Traversals no longer need to validate that a node is reachable:
 - New invariant:
 - Every unmarked node is reachable

- Contains:
 - Just traverse the list, including nodes marked deleted
 - If the item is in the list and the node is not marked deleted, then it is in the set

• Lazy removal


Lazy removal



Lazy removal





• Lazy removal



- Why do we need to validate?
 - Thread I removes b



• Thread 1 finds b



• Before Thread 1 acquires the lock, another thread logically and physically removes the predecessor



• Thread 1 now acquires the lock



• Thread I marks b as deleted



• And then removes it physically



- Another scenario:
 - Thread I tries to remove c



• Thread I finds them



• But before locking, another thread adds a node b



• Thread I now locks



And virtually and physically removes node c



- Validation:
 - Check that pred is not marked
 - Check that curr is not marked
 - Check that pred.next == curr

• Validation

```
private boolean
  validate(Node pred, Node curr) {
  return
    !pred.marked &&
    !curr.marked &&
    pred.next == curr);
}
```

Validation

```
private boolean
 validate(Node pred, Node curr)
 return
   !pred.marked &&
   !curr.marked &&
   pred.next == curr);
 }
```

predecessor not logically deleted

ł

Validation

```
private boolean
  validate(Node pred, Node curr) {
  return
    !pred.marked &&
    !curr.marked &&
    pred.next == curr);
}
```

• Validation

```
private boolean
  validate(Node pred, Node curr) {
  return
    !pred.marked &&
    !curr.marked &&
    pred.next == curr);
  }
}
```

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

lock both nodes

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

validate

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

key found

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

logic delete

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

logic delete

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

physical delete

done

Removal

```
try {
 pred.lock(); curr.lock();
  if (validate(pred, curr) {
   if (curr.key == key) {
    curr.marked = true;
    pred.next = curr.next;
    return true;
   } else {
    return false;
   } } finally {
  pred.unlock();
  curr.unlock();
```

```
public boolean contains(Item item) {
    int key = item.hashCode();
    Node curr = this.head;
    while (curr.key < key) {
        curr = curr.next;
    }
    return curr.key == key && !curr.marked;
}</pre>
```

```
public boolean contains(Item item) {
    int key = item.hashCode();
    Node curr = this.head;
    while (curr.key < key) {
        curr = curr.next;
    }
    return curr.key == key && !curr.marked;
}</pre>
```

```
public boolean contains(Item item) {
  int key = item.hashCode();
  Node curr = this.head;
                                           traverse list
  while (curr.key < key) {</pre>
                                         without locking
    curr = curr.next;
  return curr.key == key && !curr.marked;
}
                       Nodes might be
                          deleted
```

```
public boolean contains(Item item) {
  int key = item.hashCode();
  Node curr = this.head;
  while (curr.key < key) {</pre>
    curr = curr.next;
  return curr.key == key && !curr.marked;
}
                        Present and
                        undeleted?
```

• Summary





• Combine mark bit and list ordering

- Lazy adds and removes
- Wait-free contains

- Good:
 - Contains is wait-free
 - Uncontended calls do not re-traverse
- Bad:
 - Contended add / removes require re-traversion

CAS

- CAS instruction: Compare And Set
 - Boolean register.CAS(expected, update)
 - Atomic operation
 - If register value is equal to expected then its value becomes update and returns true
 - If register value is not equal to expected, returns false, but does not change the value
- Example: Consensus protocol for *n* threads 0, ..., *n*-1
- AtomicInteger class has a CAS method

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
            return proposed[r.get()];
    }
}
```

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
            return proposed[r.get()];
    }
}
```

Load r with First

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
        return proposed[r.ret()];
    }
}
```

Each thread loads global array proposed with a value

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
        return proposed[r.get()];
    }
```

Try whether there is still the original value in r

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
        return proposed[r.get()];
    }
}
```

If it is, exchange with thread-number

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
            return proposed[r.get()];
    }
}
```

This happens for only one thread, who gets to update the value of r with its thread number

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
            return proposed[r.get()];
    }
}
```

All other threads will find the value different

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
            return proposed[r.get()];
    }
}
```

All other threads will find the value different: The value is the number of the winning thread Therefore, they return its proposed value

```
class CASConsensus extends ConsensusProtocol {
    private final int FIRST = -1;
    private AtomicInteger r = new AtomicInteger(FIRST);
    public Object decide(Object value) {
        propose(value);
        int i = ThreadID.get();
        if (r.compareAndSet(FIRST, i)) // I won
            return proposed[i];
        else // I lost
        return proposed[r.get()];
    }
```

The one and only thread to win will get its value as the consensus

 A register with CAS and get has an infinite consensus number

Bit-Stealing

- C++ has pointers
 - To atomically mark a pointer with a boolean value:
 - Observe that pointers to objects never have the least significant two bit set
 - In fact, alignment is usually in multiples of 16, so 4 least significant bits are zero
 - Use one of these bits as a marker
 - Can still recover the original pointer

Bit-Stealing

- In Java:
 - java.util.concurrent.atomic has an object
 - AtomicMarkableReference<T>:
 - Reference to an object of type T
 - Boolean mark field
 - Can be updated atomically together or individually

Bit Stealing

• Interface:

public T get(boolean[] marked);

returns the encapsulated reference and stores mark at position 0 in the array

- First attempt:
 - Use compareAndSet to change the next field
- Example:



- Thread I: add b
- Thread II: remove a

- Thread A applies CAS to a.next
- Thread B applies CAS to -∞.next
- Both succeed regardless of who comes first:





• We must prevent manipulation of a removed node!