

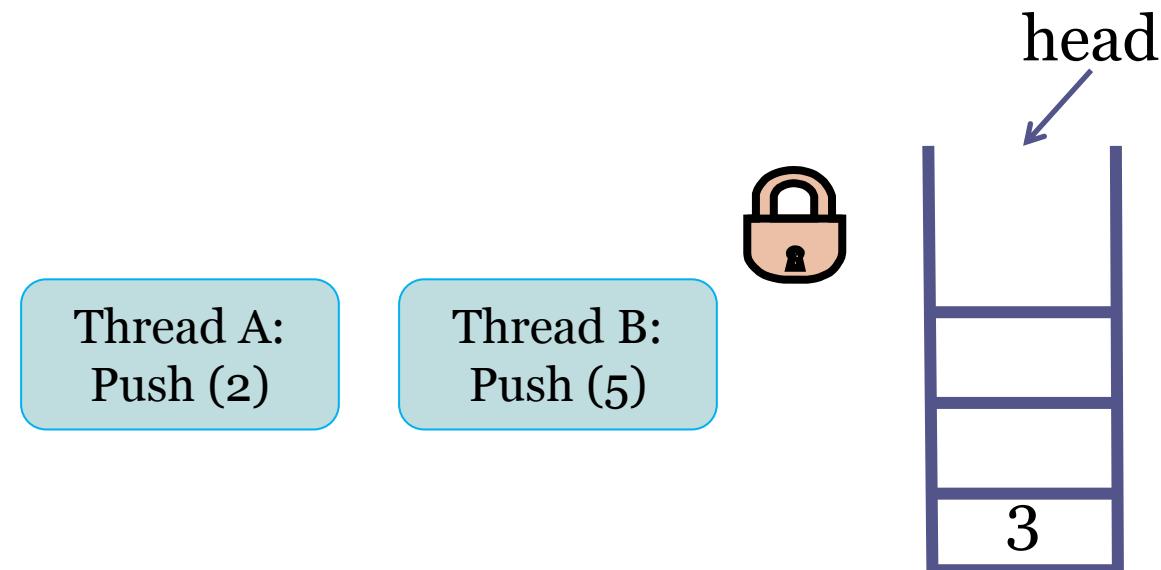
LCD: Local Combining on Demand



Dana Drachsler-Cohen and Erez Petrank
Technion , Israel

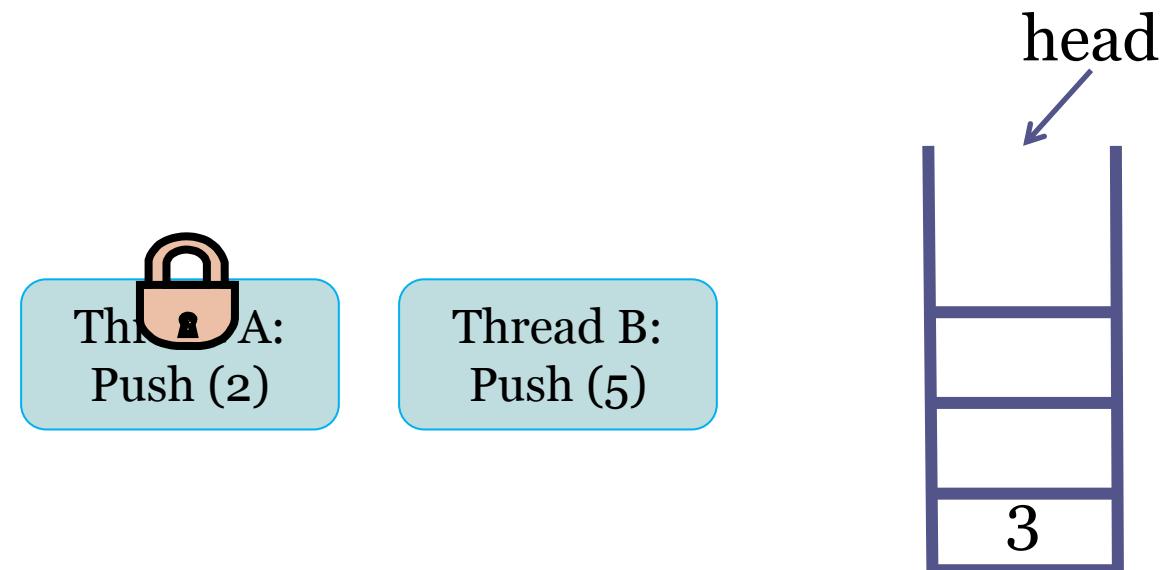
Combining Motivation

- Concurrent data structures are fundamental building blocks in various algorithms
- A common mean of synchronization: locks



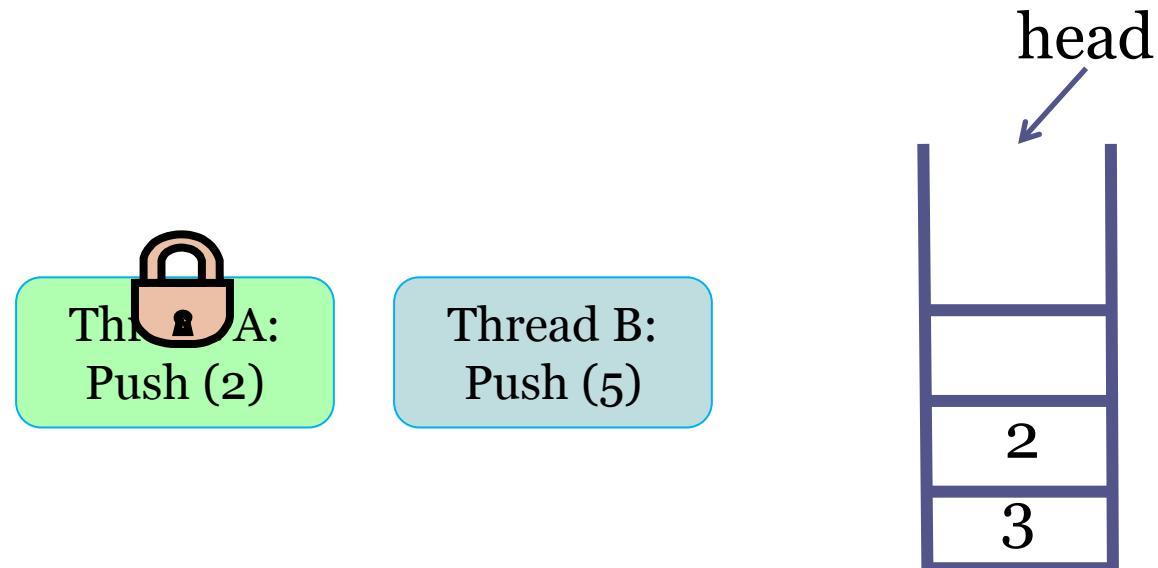
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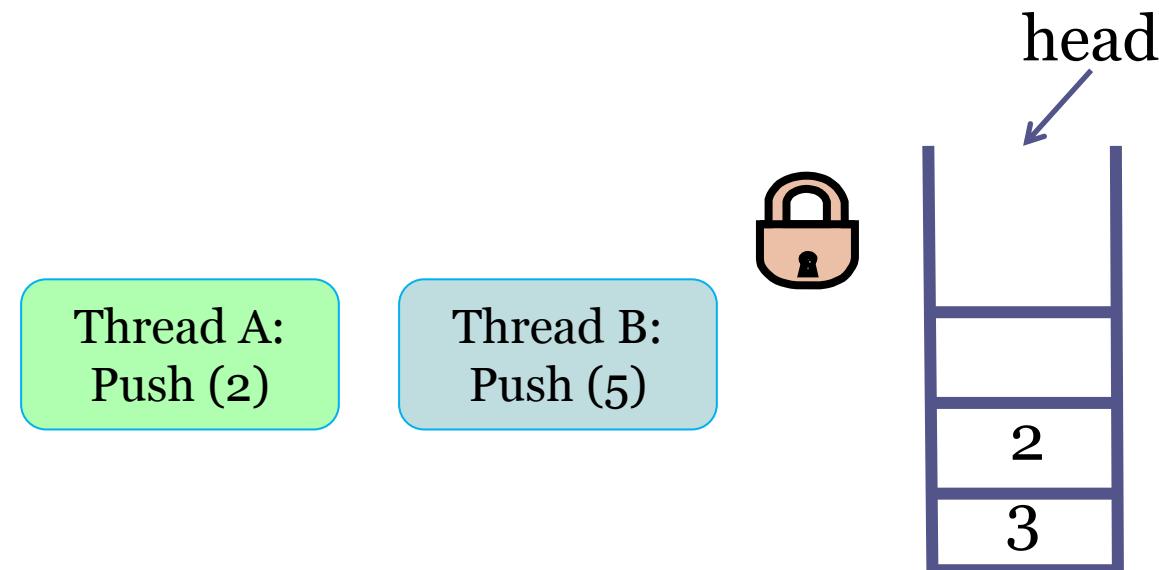
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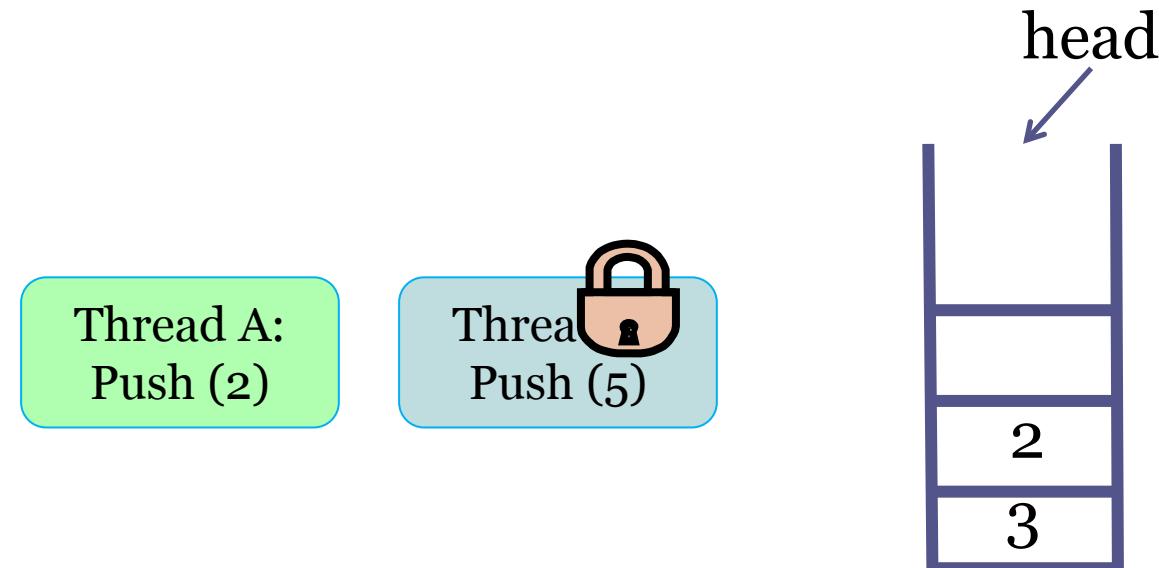
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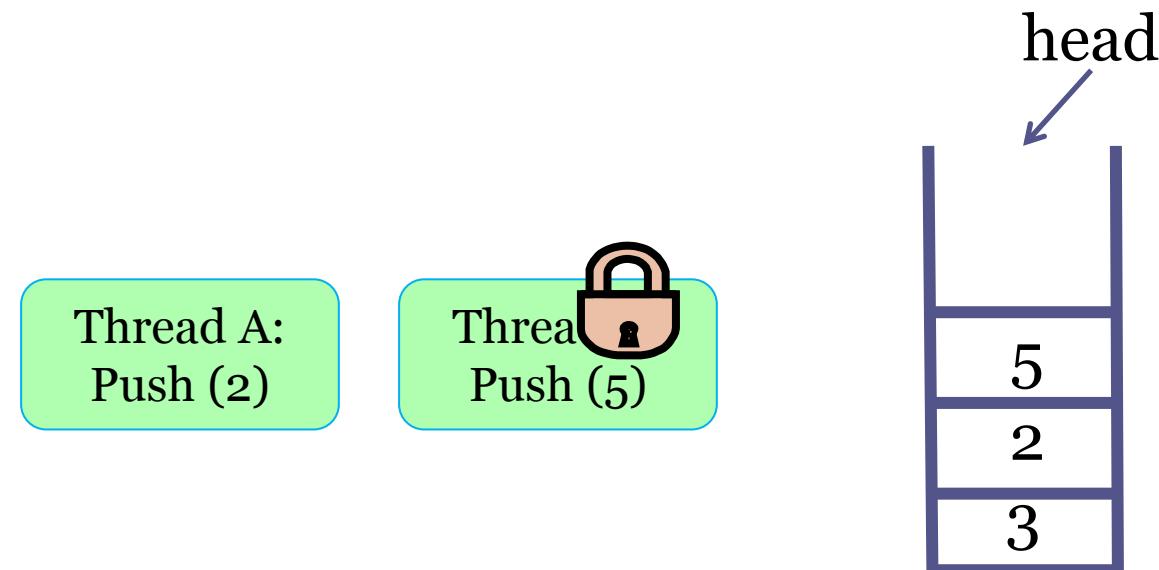
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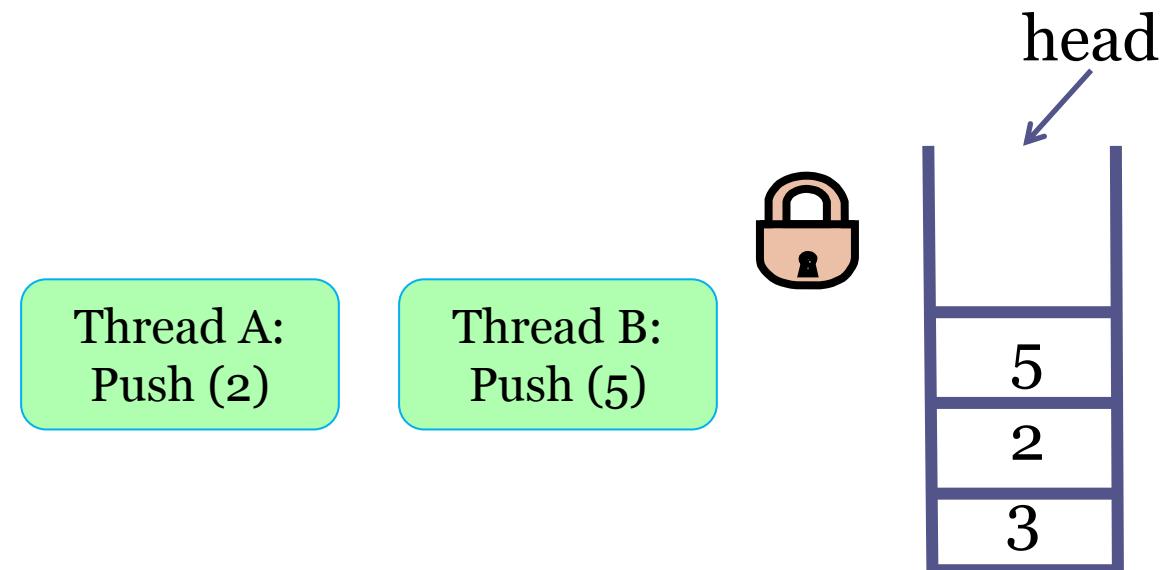
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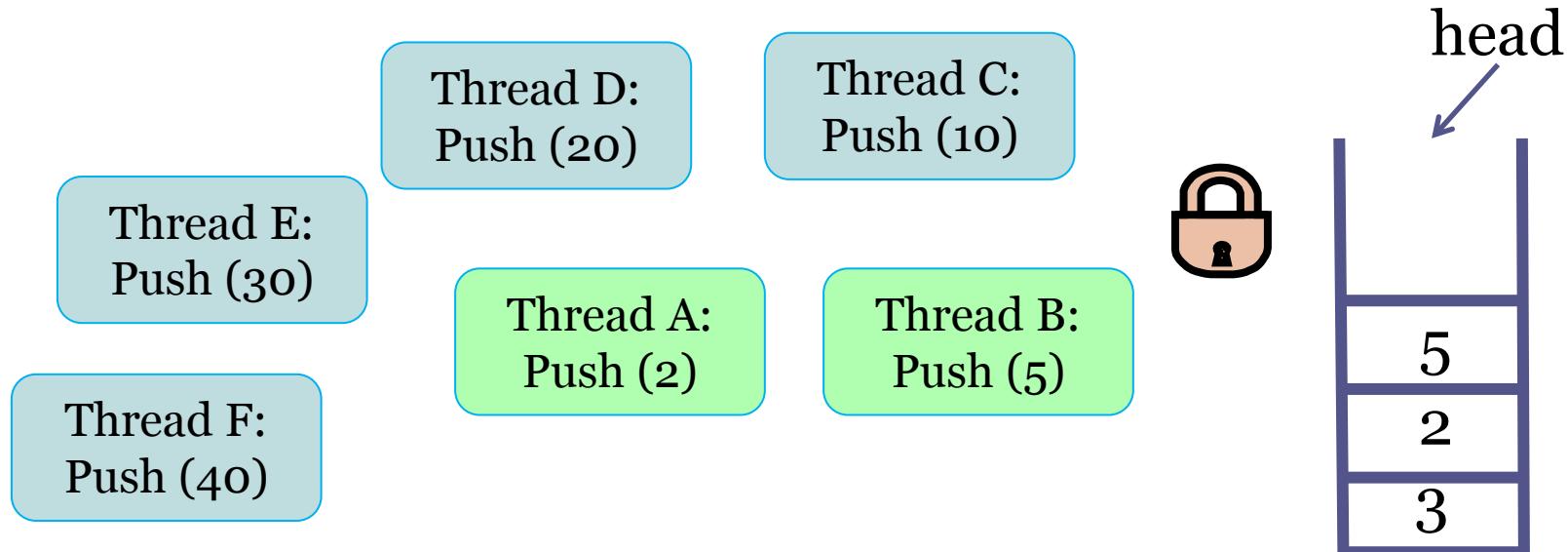
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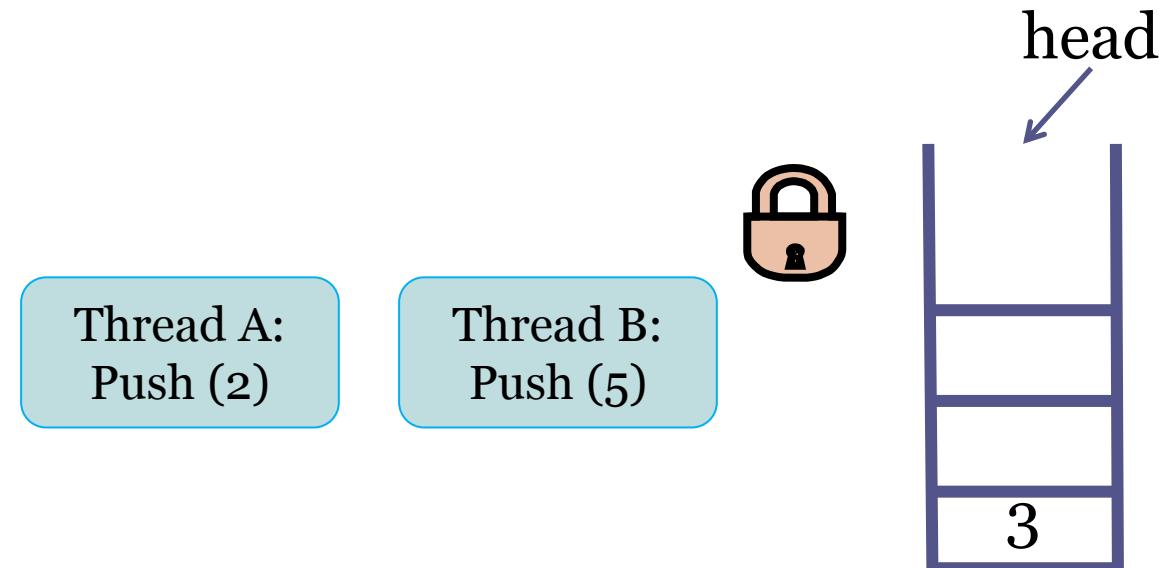
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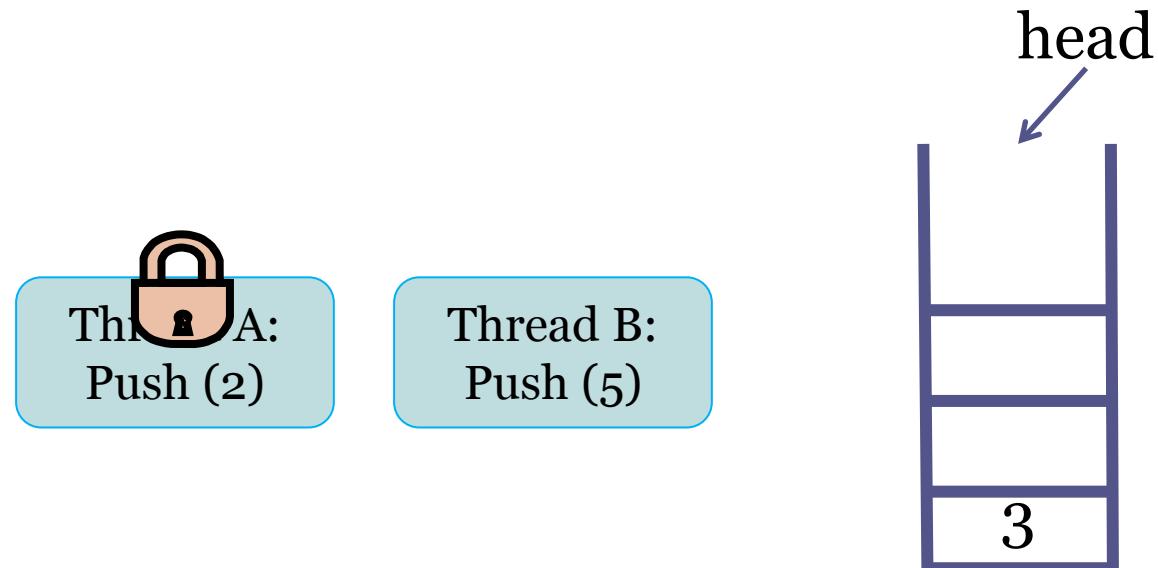
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- In combining, threads help each other
- Common approach: a thread acquires a global lock and executes operations of contending threads



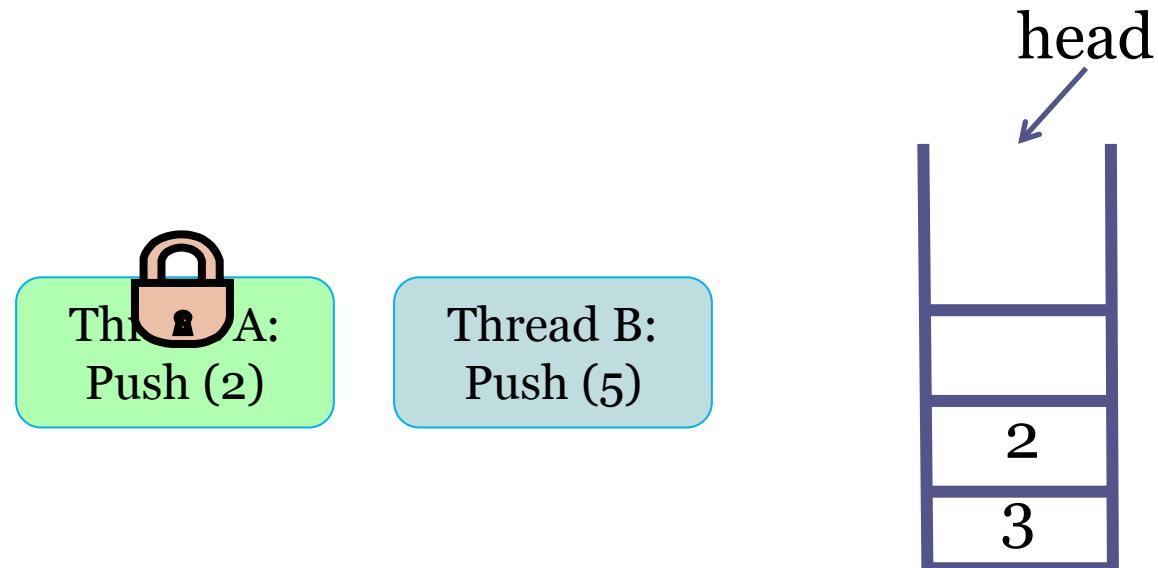
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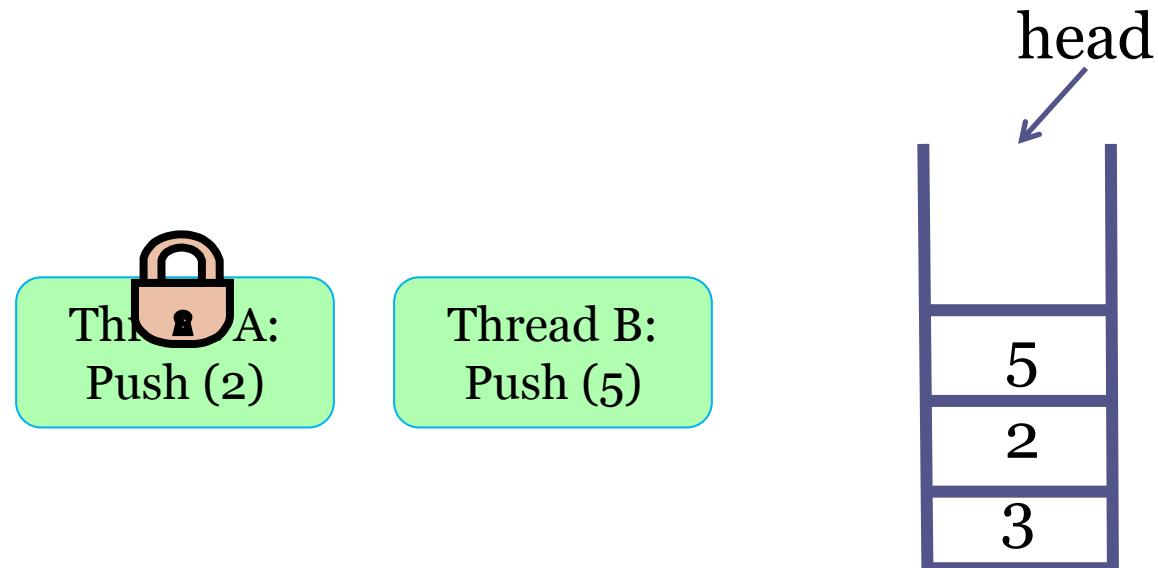
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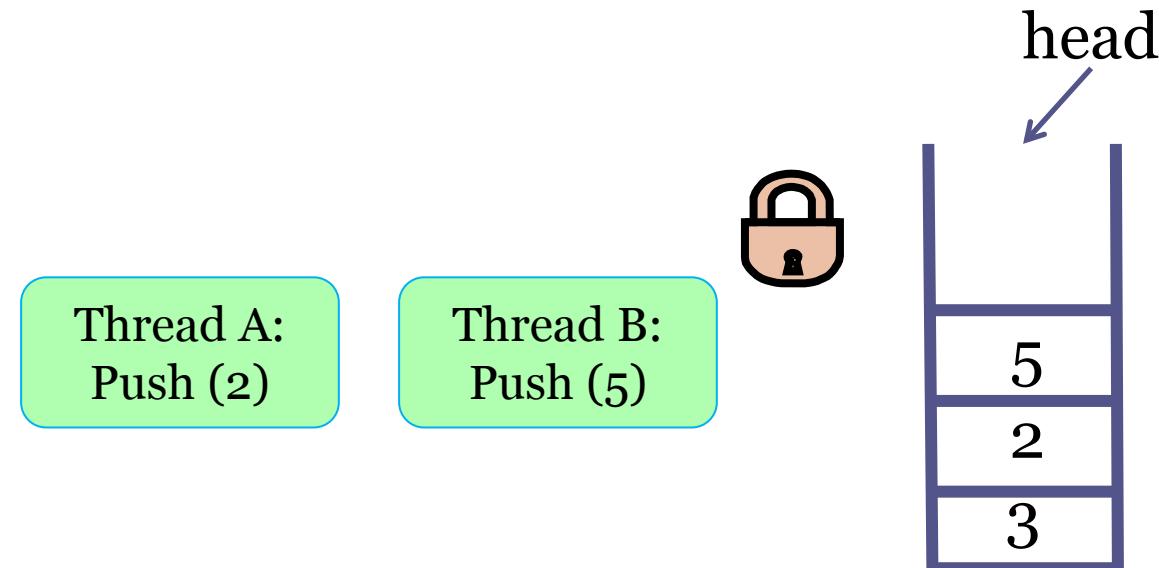
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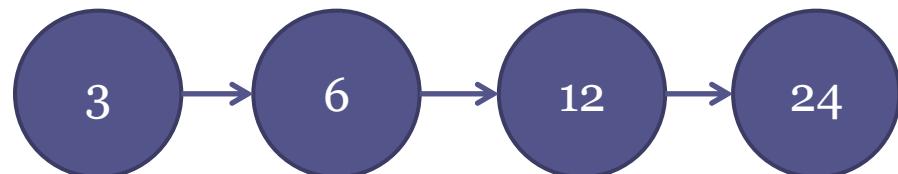
Combining Motivation

- In combining, threads help each other
- Common approach: a thread acquires a global lock and executes operations of contending threads
 - Was shown to improve performance of data structures with 1-2 contention points
 - [Hendler, Incze, Shavit, Tzafrir], [Fatourou, Kallimanis], [Dice, Marathe, Shavit]
- Namely, they were already protected by 1-2 locks
 - The global lock did not reduce scalability

Combining Motivation

- In combining, threads help each other
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 - Was shown to improve performance of data structures with 1-2 contention points
 - [Hendler, Incze, Shavit, Tzafrir], [Fatourou, Kallimanis] [Dice Marathe Shavit]
- What about data structures with unbounded number of contention points (e.g., the linked-list)?

Linked-List

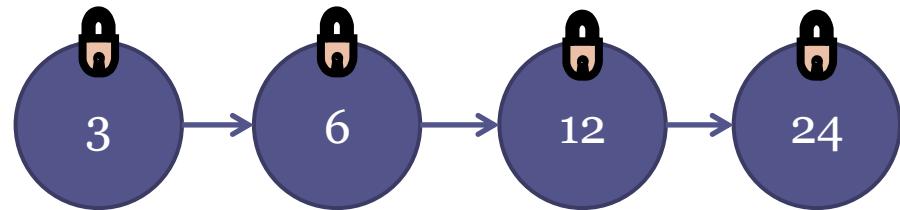


- Consists of nodes each with a unique key
- Sorted by the keys
 - Each node points to its successor in the list
- Supports three operations
 - $\text{Insert}(k)$: insert k if it is not yet present
 - $\text{Remove}(k)$: remove k if present
 - $\text{Contains}(k)$: return true if k is present
- A simple and practical concurrent implementation
 - The Lazy List

The Lazy List

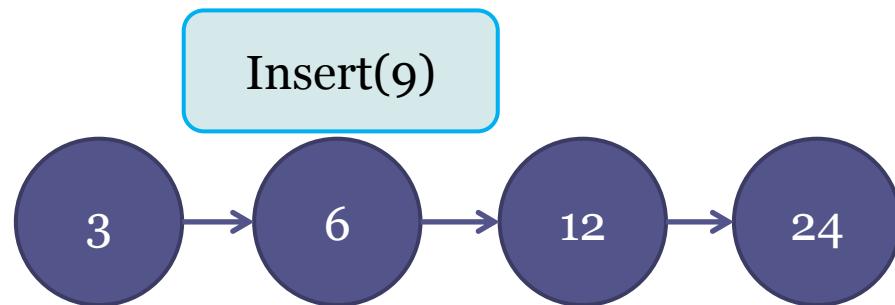
[Heller, Herlihy, Luchangco, Moir, Scherer III, Shavit]

- Lock-based – each node has a lock
 - Insert(k): 1 lock
 - Remove(k): 2 locks
 - Contains(k): no locks
- We focus on combining of locked-based operations
 - Thus, combining only affects insert and remove



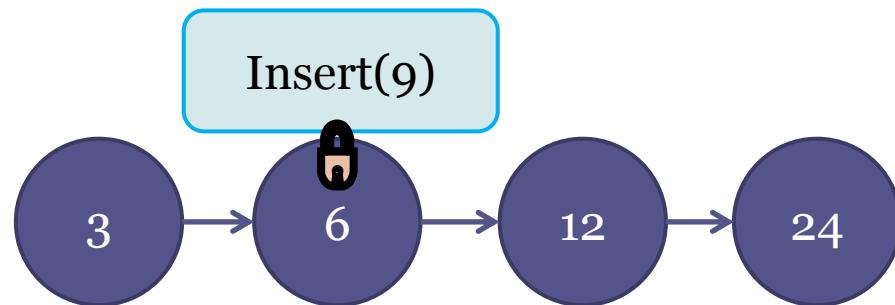
The Lazy List Insert(k)

- Search for a node p s.t.: $p.key < k \leq \text{next}(p).key$



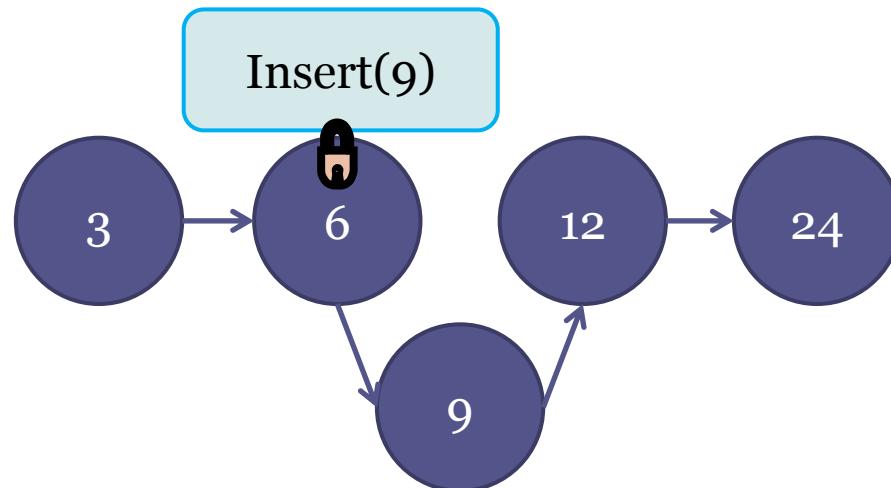
The Lazy List Insert(k)

- Search for a node p s.t.: $p.key < k \leq \text{next}(p).key$
- Lock p



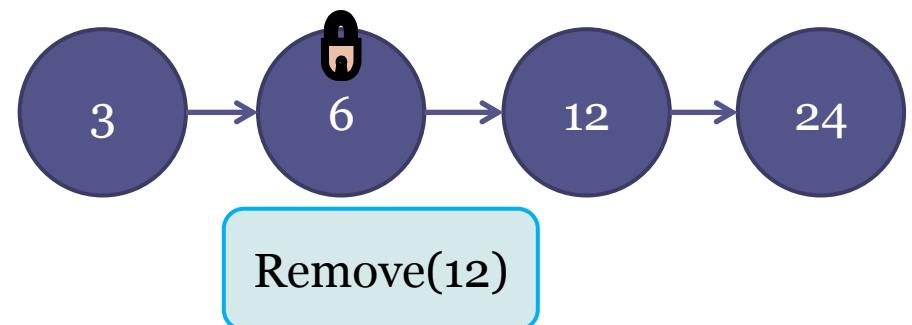
The Lazy List Insert(k)

- Search for a node p s.t.: $p.key < k \leq \text{next}(p).key$
- Lock p
- If the key of p 's successor is k : cannot insert
- Otherwise, add k after p



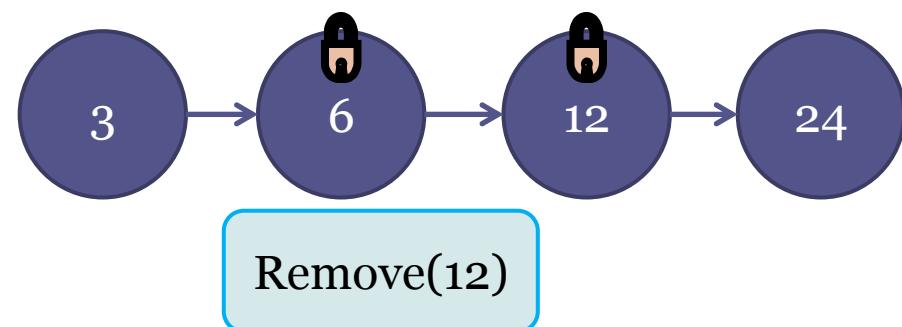
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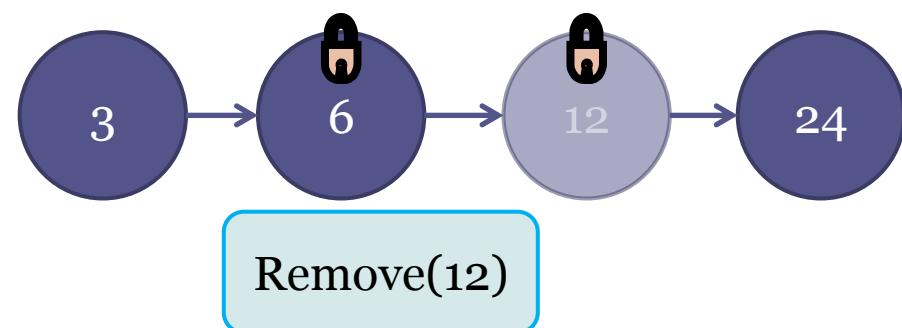
The Lazy List Remove(k)

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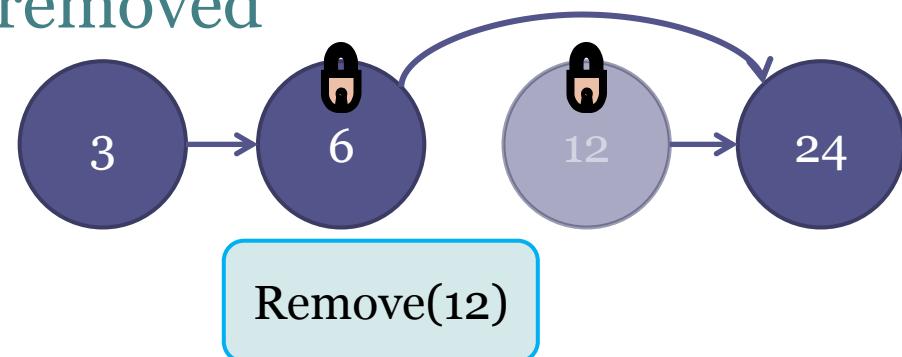
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- Otherwise
 - Lock p 's successor
 - Mark the successor as removed



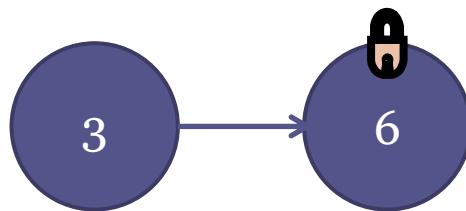
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- Otherwise
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 - Mark the successor as removed
 - Update p 's successor



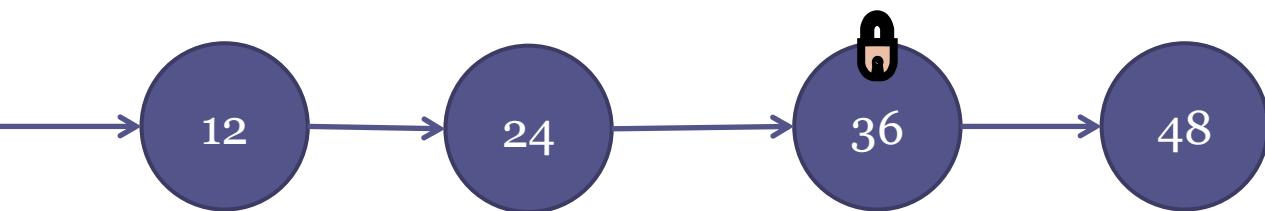
Contention in Linked-Lists

Some locks are highly contended



Thread A:
Insert(9)

Some locks are not contended



Thread D:
Insert(40)

Thread C:
Remove(12)

Most locks are not required at all

Our Contribution:

LCD: Local Combining on Demand

- We present a new combining technique for such data structures which is *Local* and *On demand*
 - *Local* – combine for each lock independently
 - No global lock
 - *On demand* – do not introduce overhead if there is no contention
- We demonstrate it on linked-lists
 - The *LCD-list*
 - An extension of the Lazy List

Key Ideas of LCD

- What are the combining types?
- How does on-demand combining work?
- How does the local combining work?
- How to handle operations requiring multiple locks?
- How to integrate LCD with the Java lock?

What are the combining types?

Combining Types

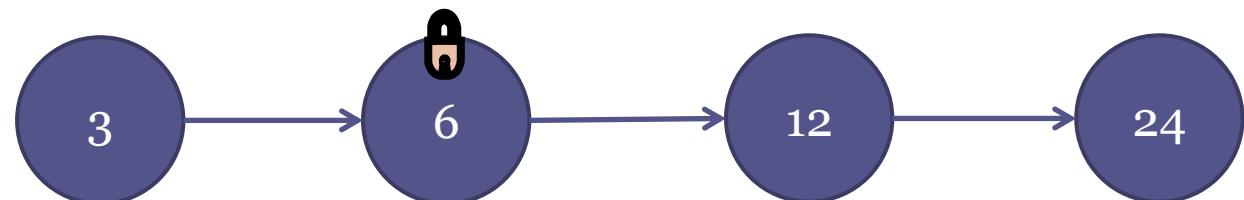
1. Execute other thread operations

Thread A:
Insert(7)

Thread B:
Insert(8)

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Thread D:
Remove(12)



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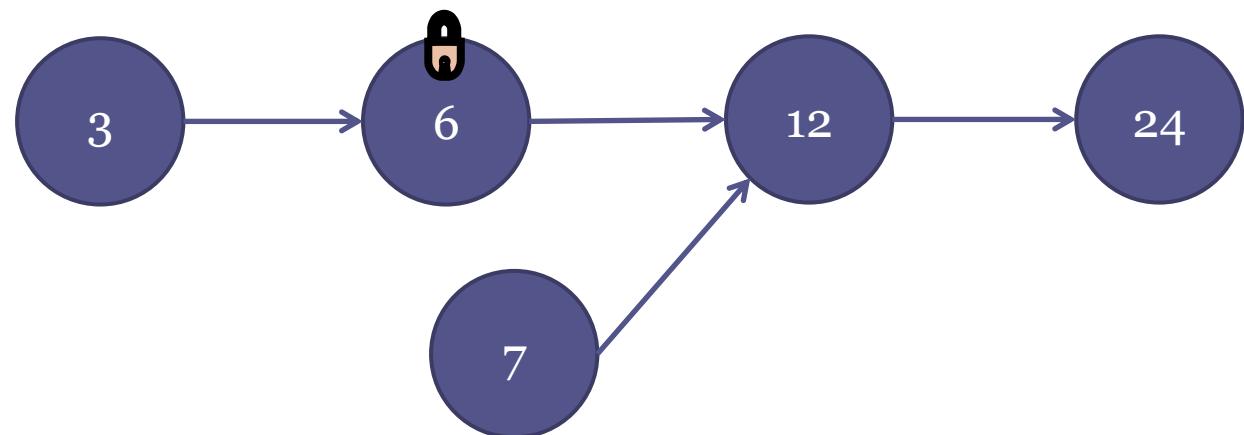
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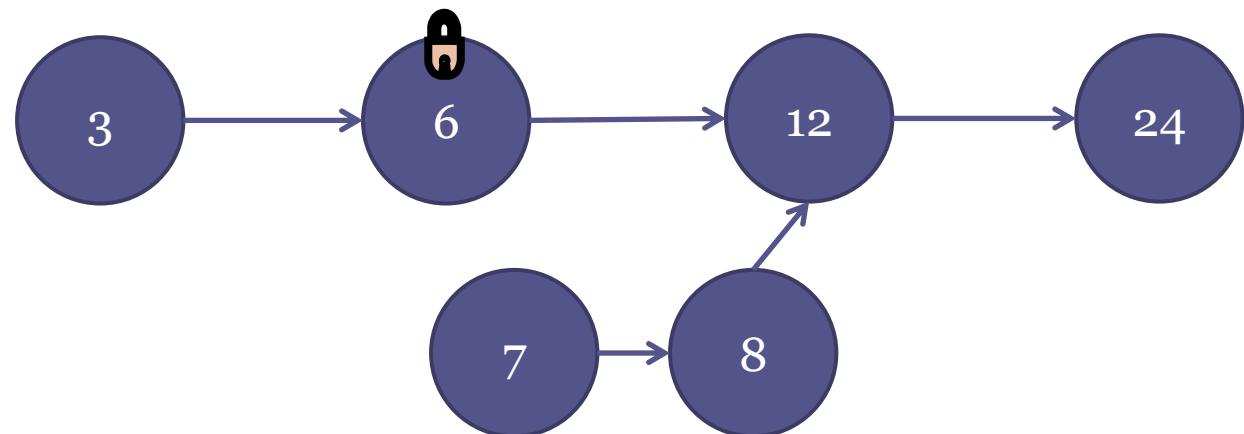
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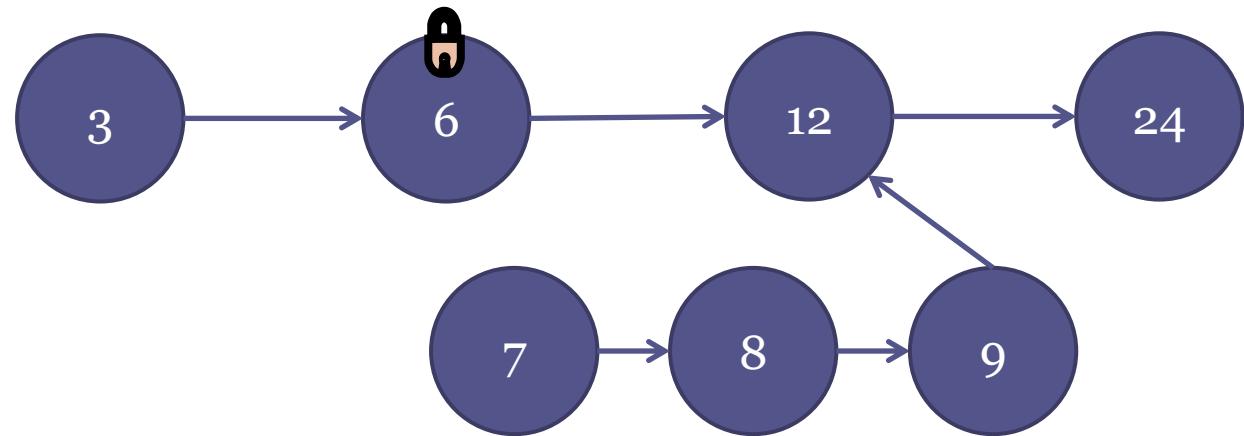
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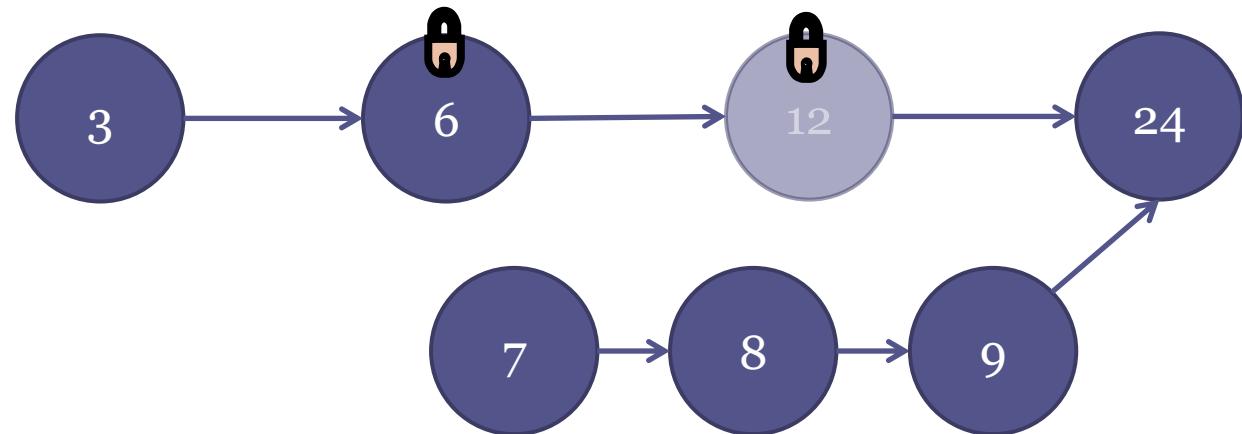
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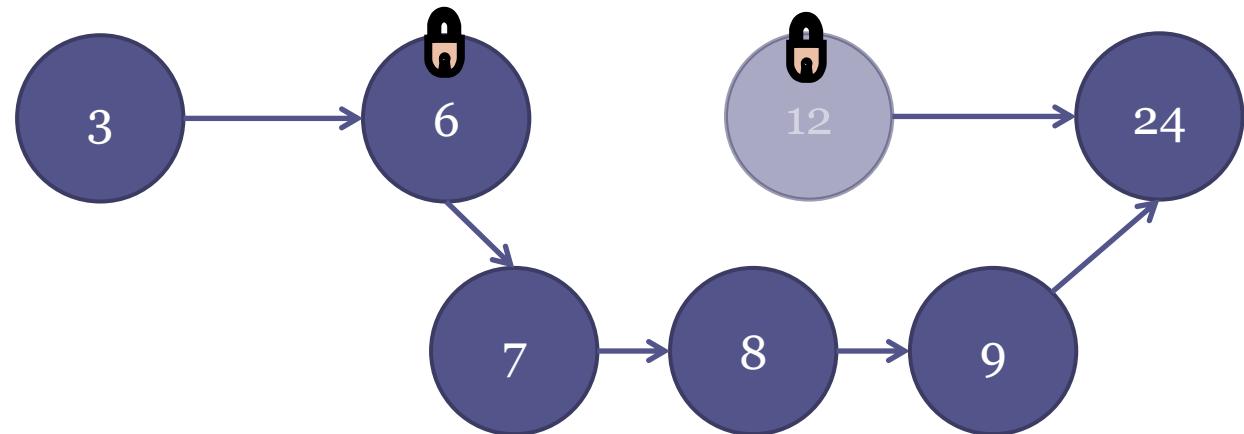
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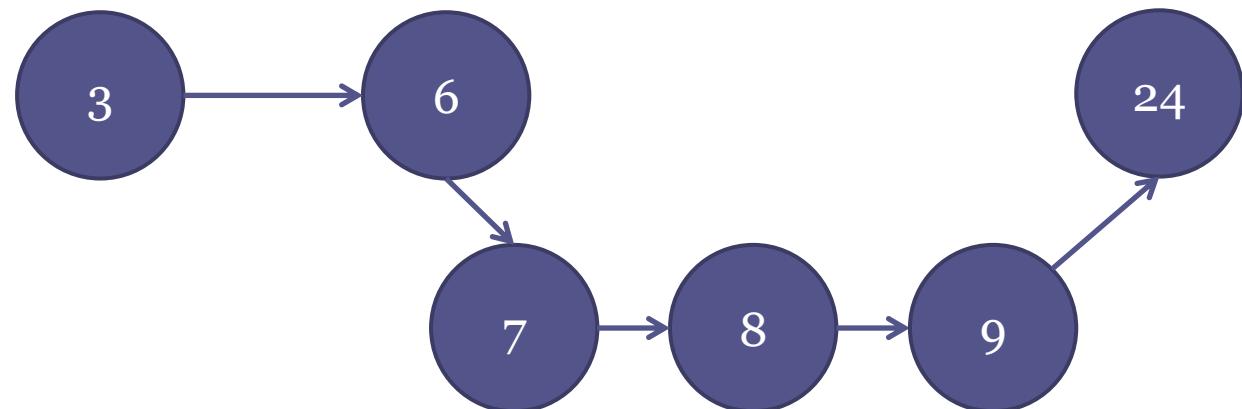
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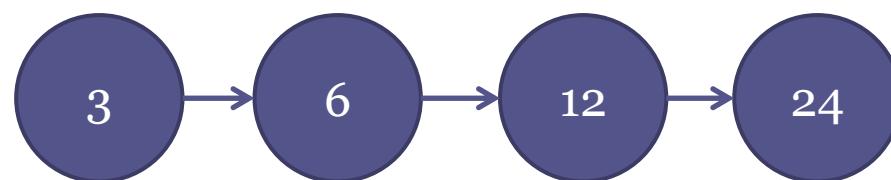


Combining Types

2. Complementary operation elimination

Thread A:
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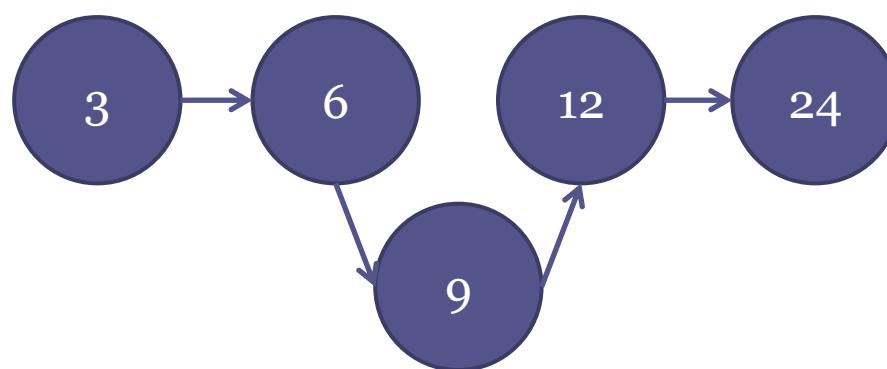


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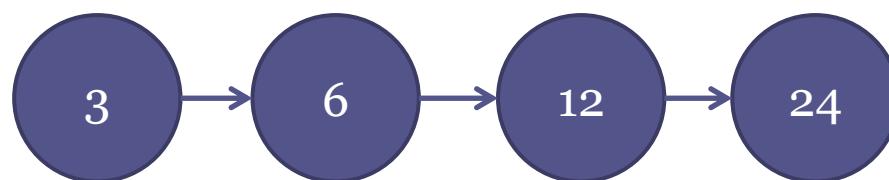


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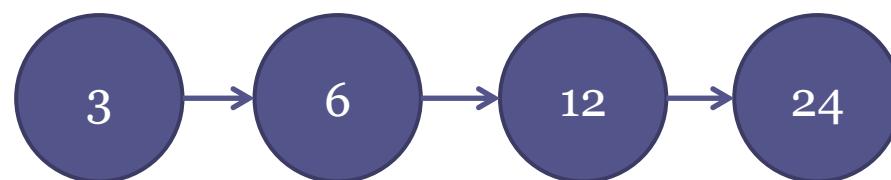


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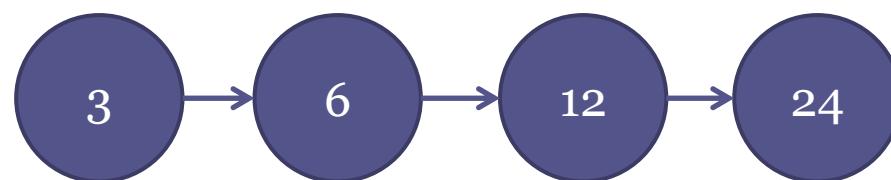


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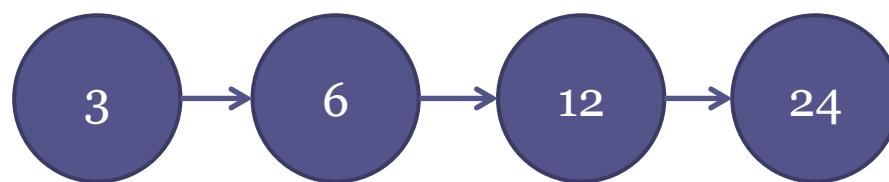
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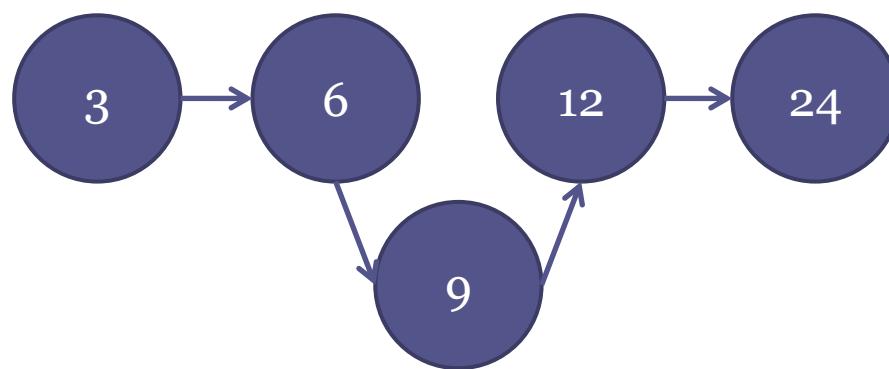
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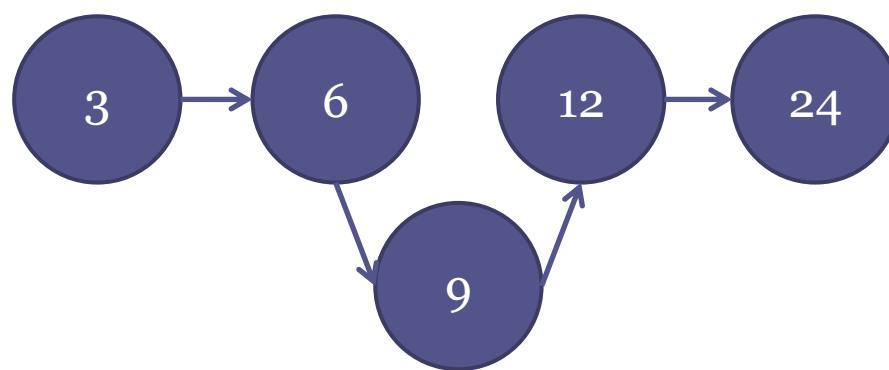
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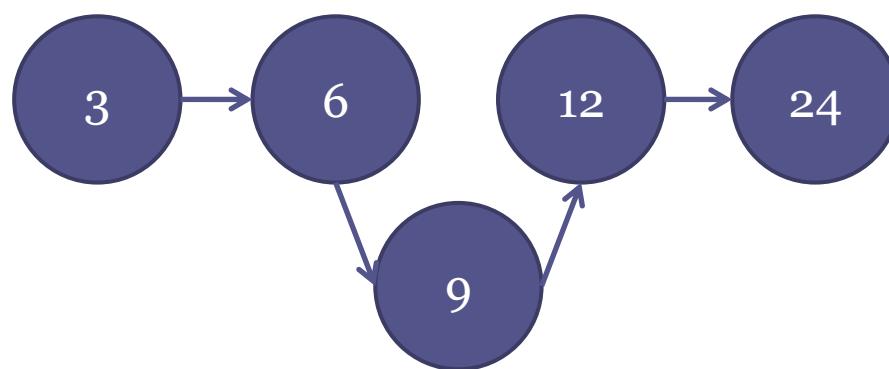
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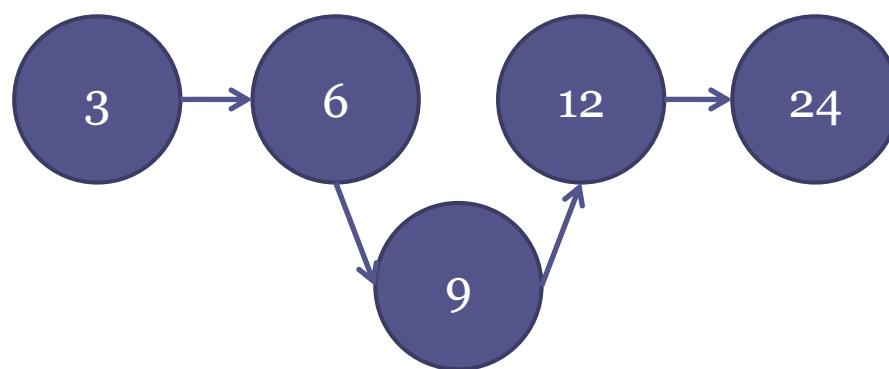
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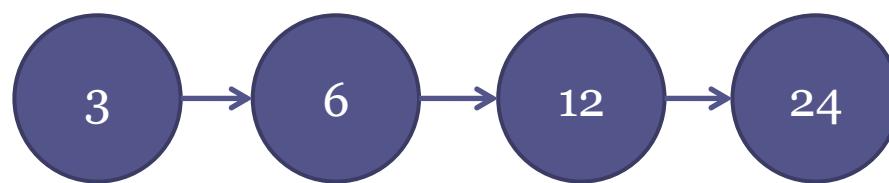
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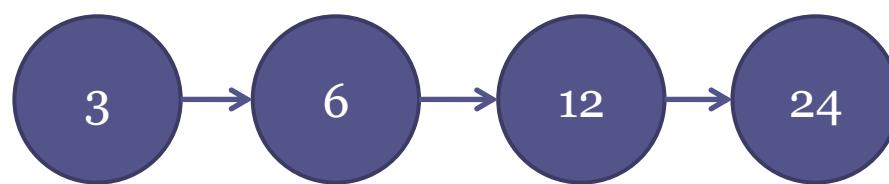
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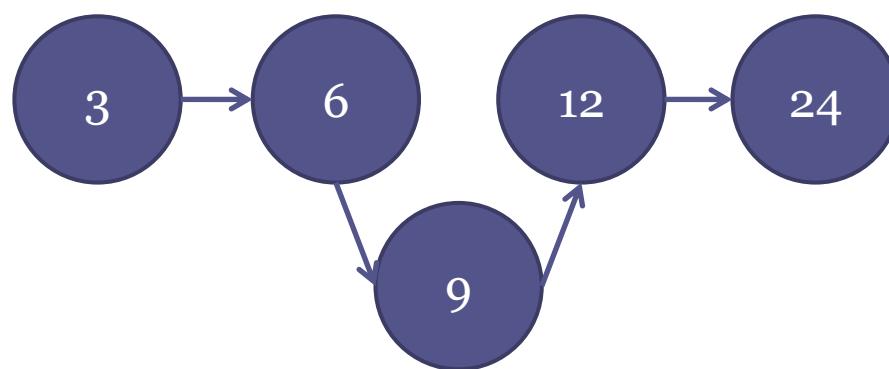
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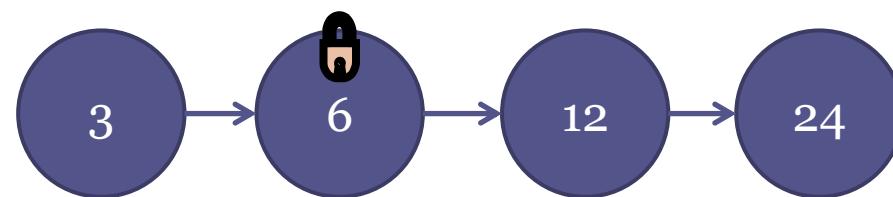
Thread D:
Insert(9)



Combining Types

4. Wrong lock notification

Thread A:
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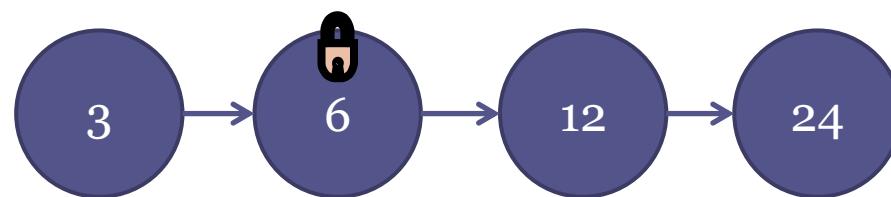
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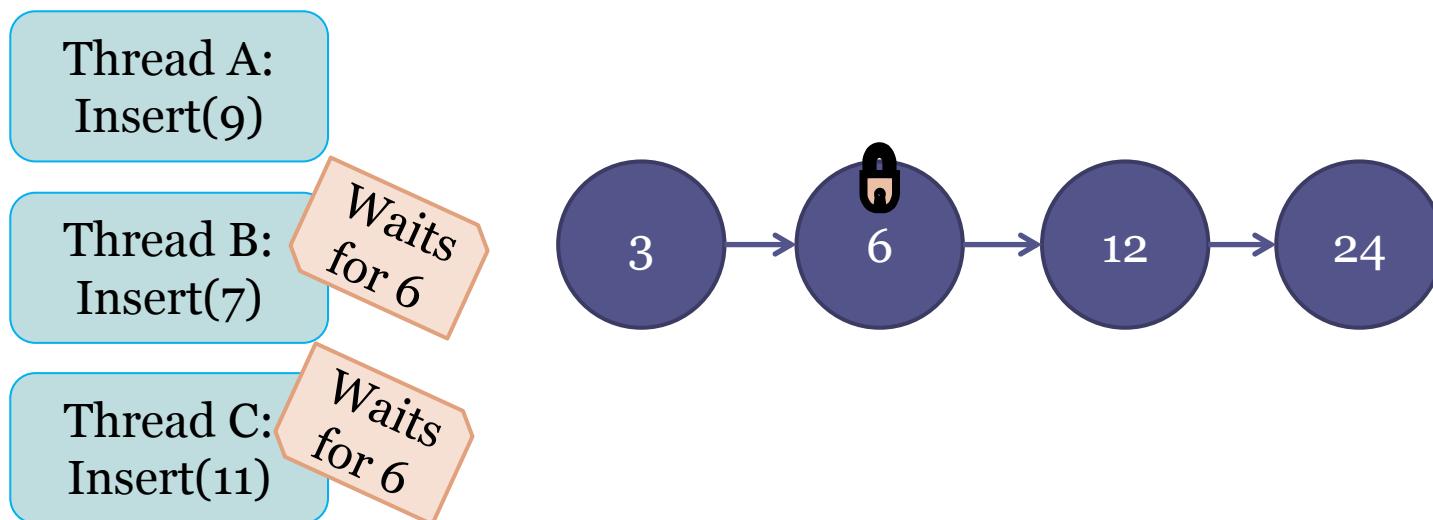
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Thread C:
Insert(11)



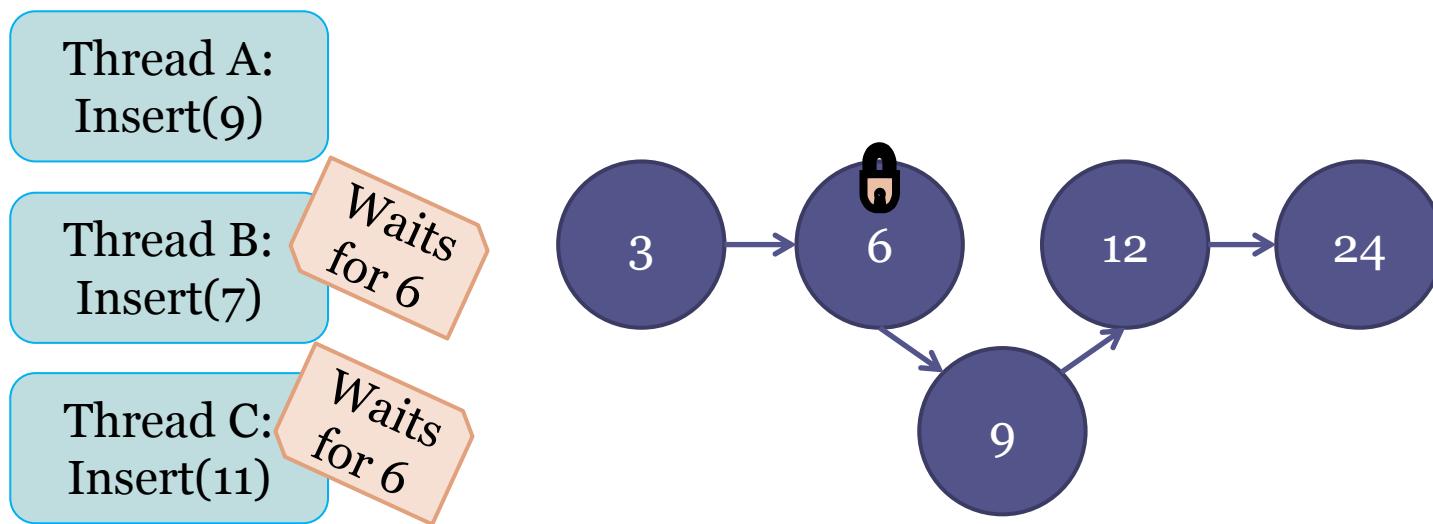
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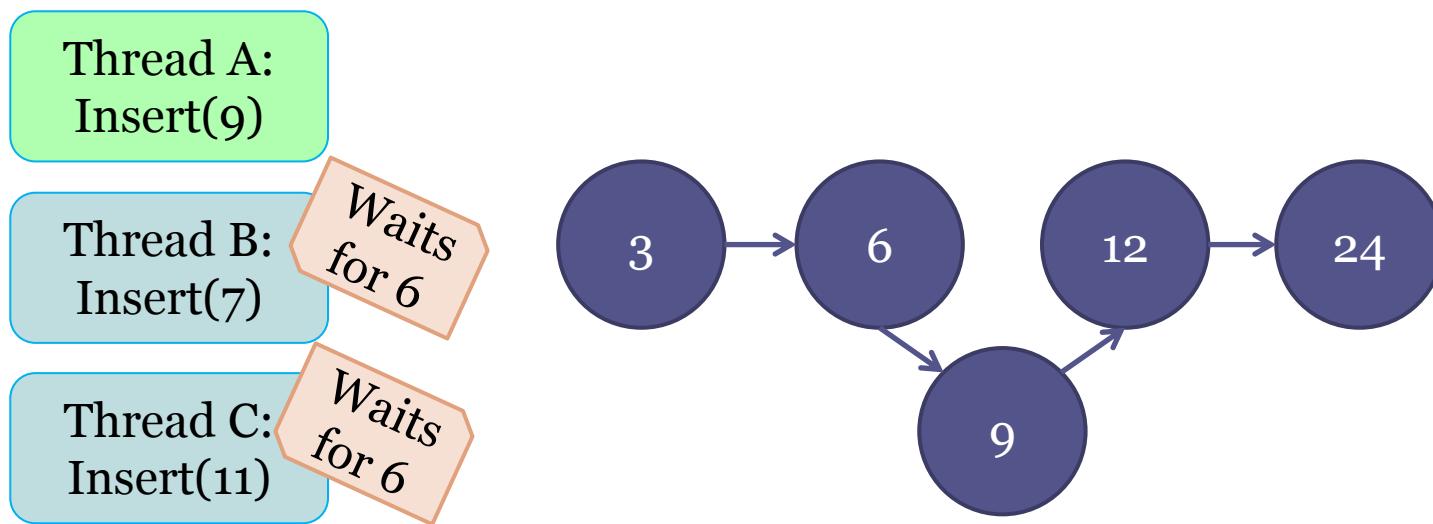
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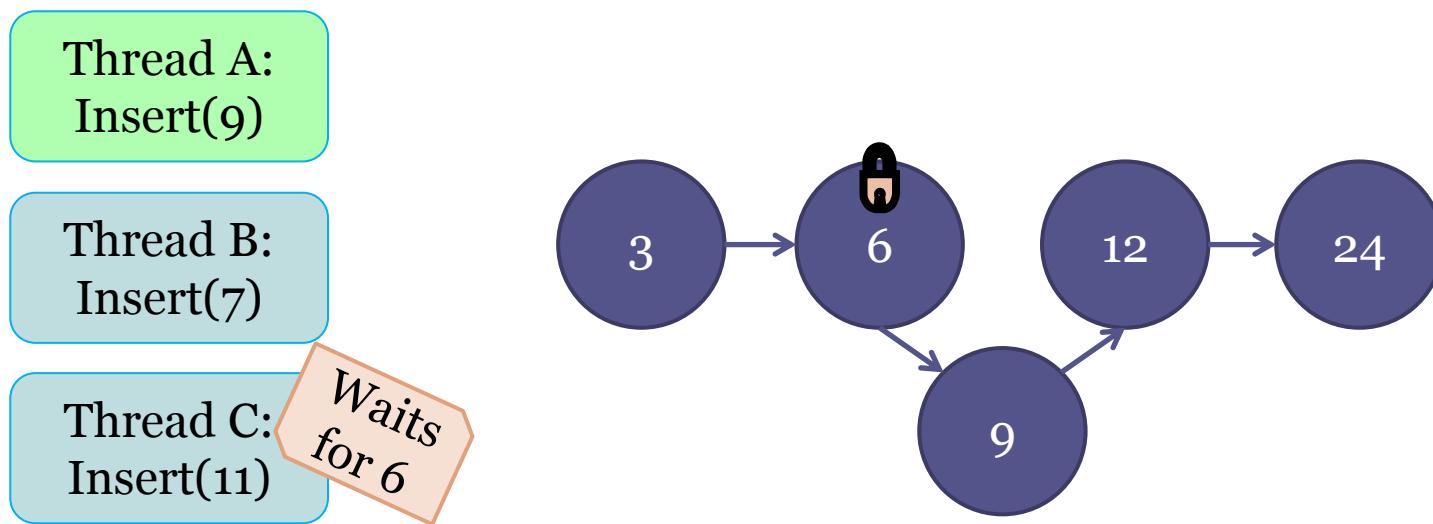
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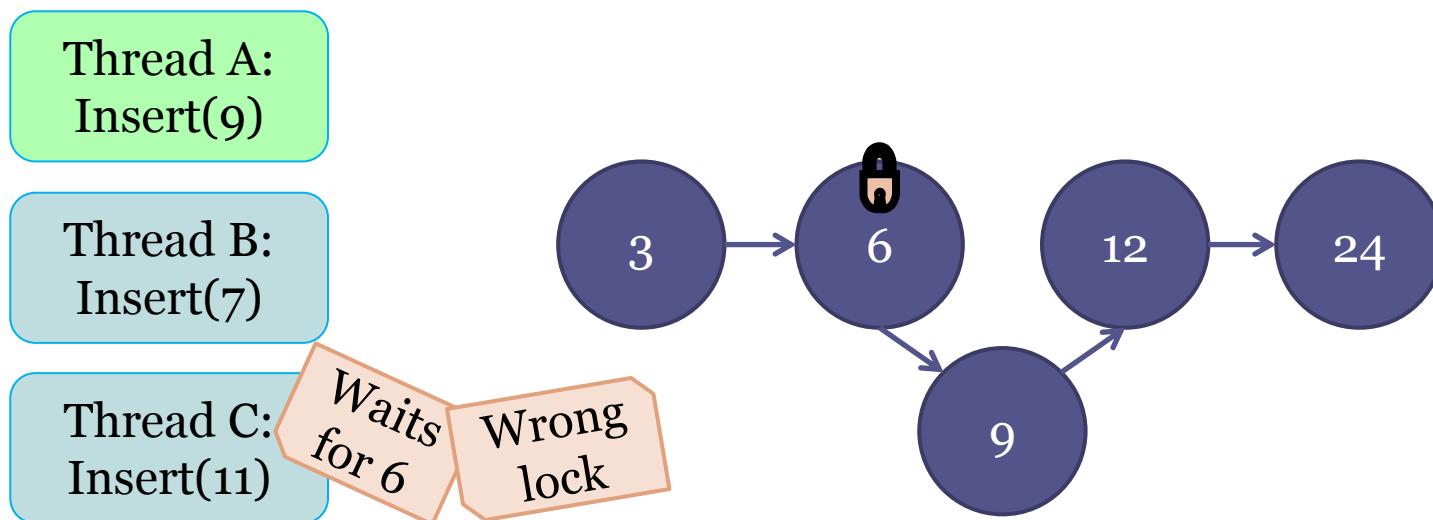
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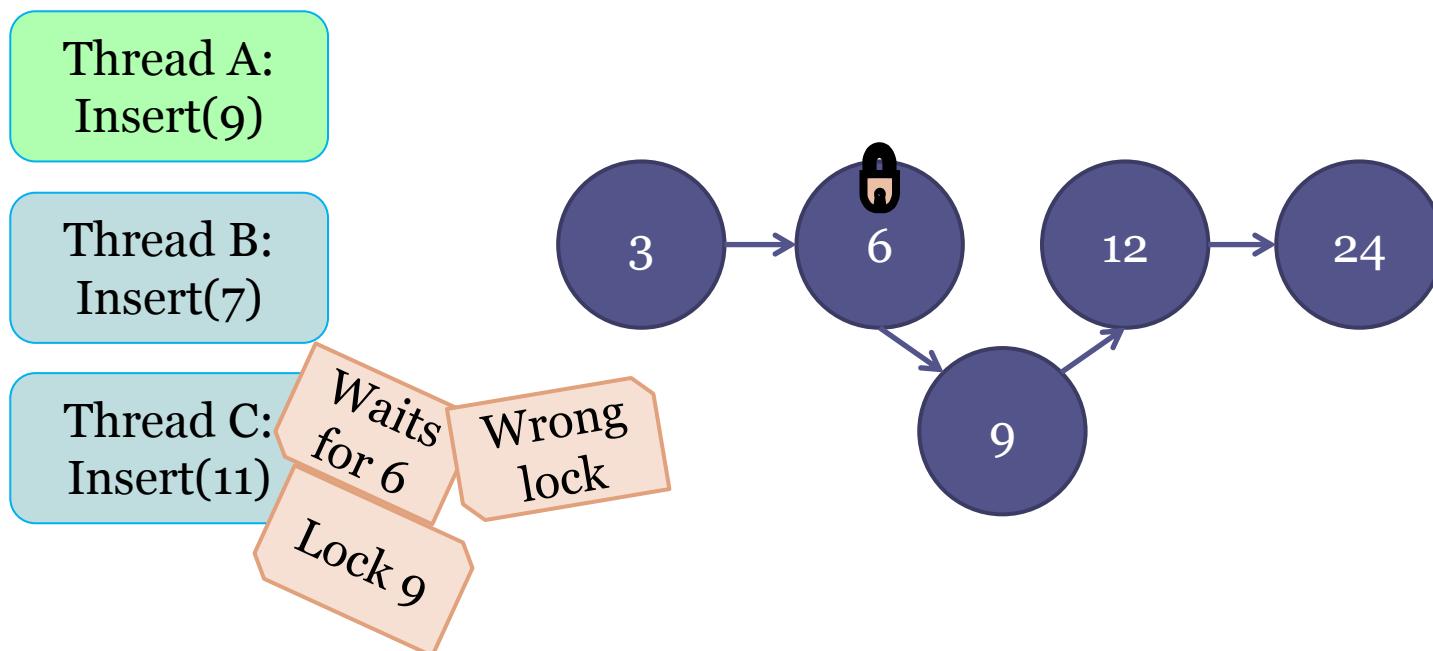
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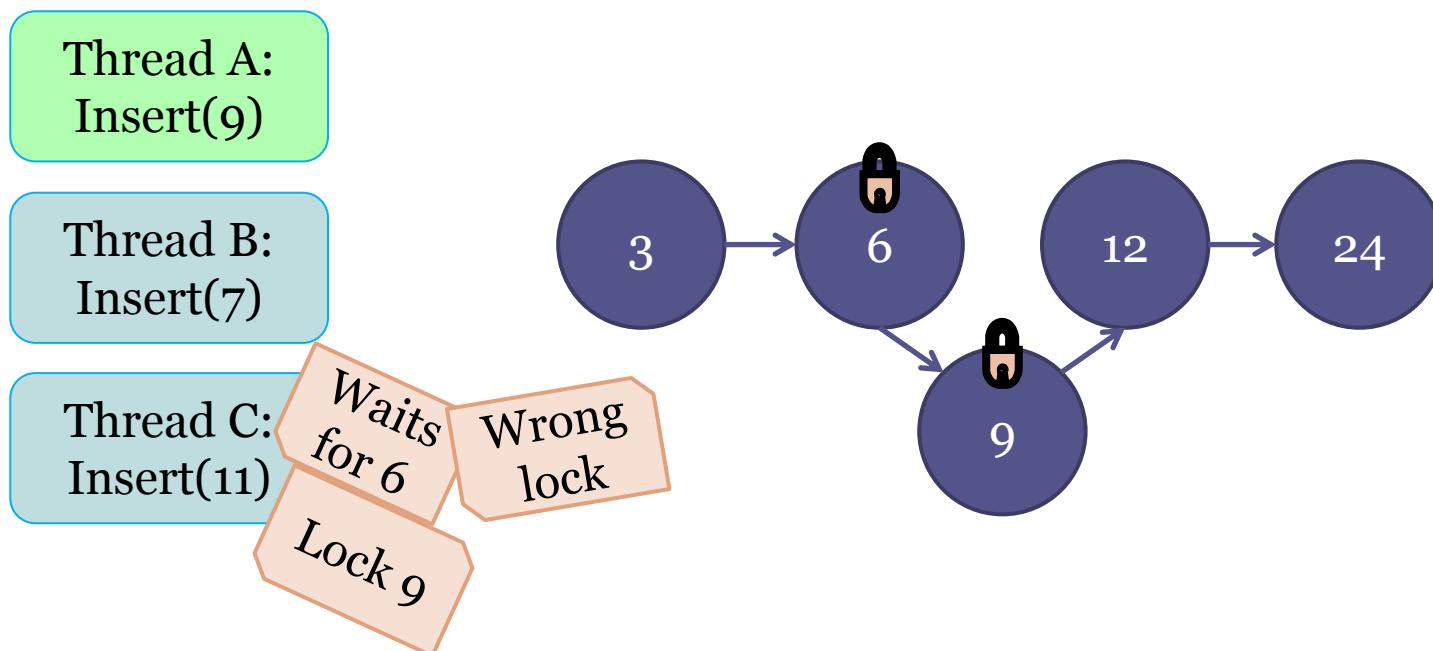
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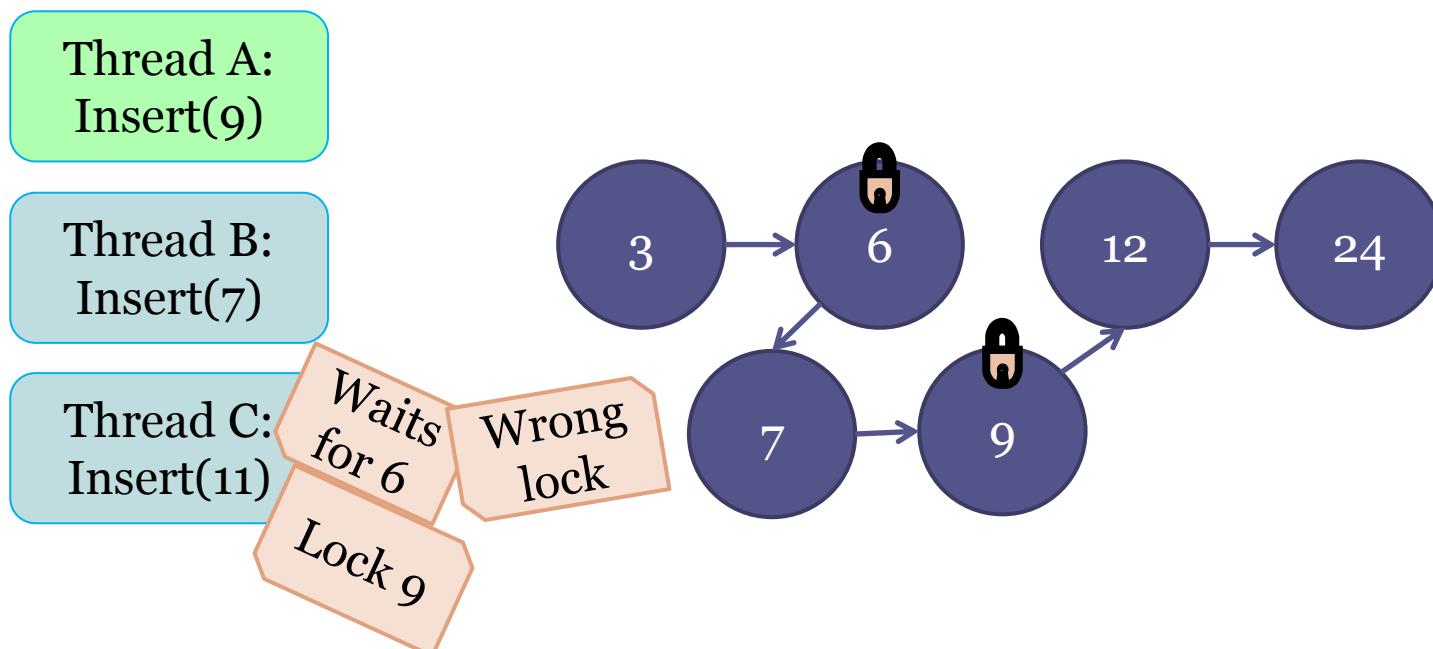
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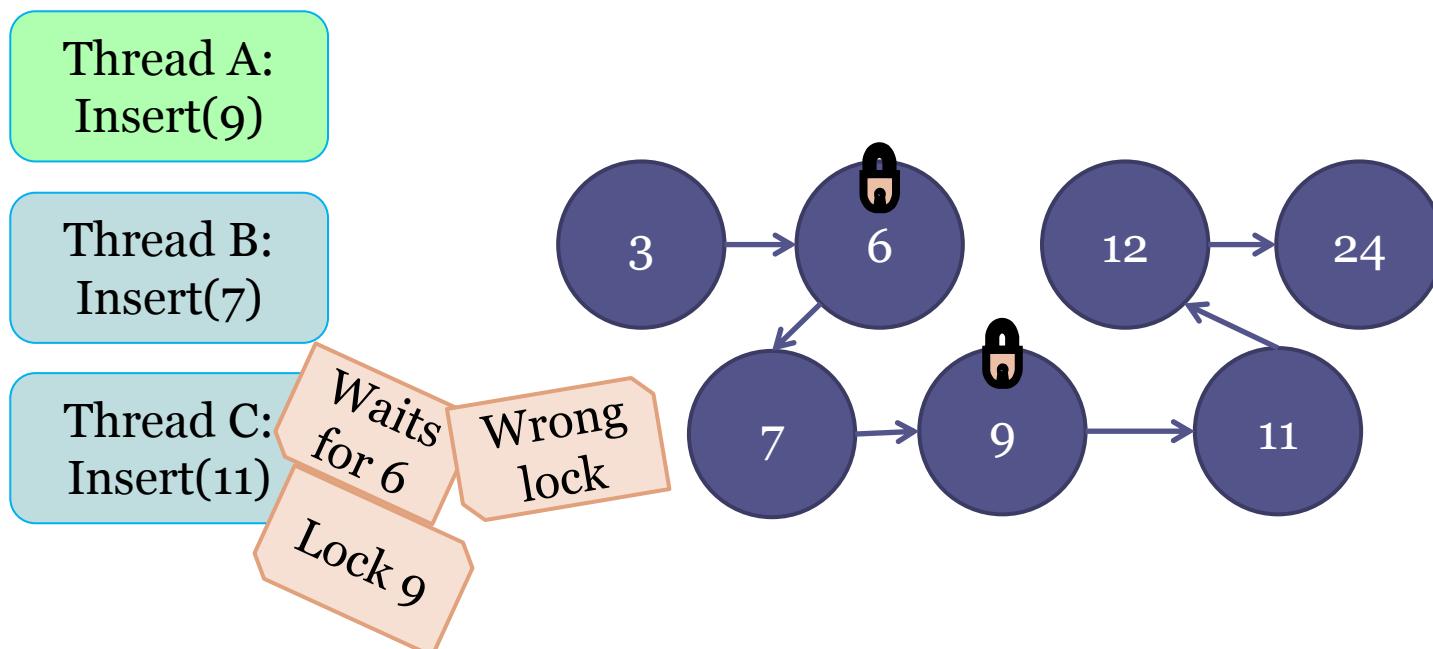
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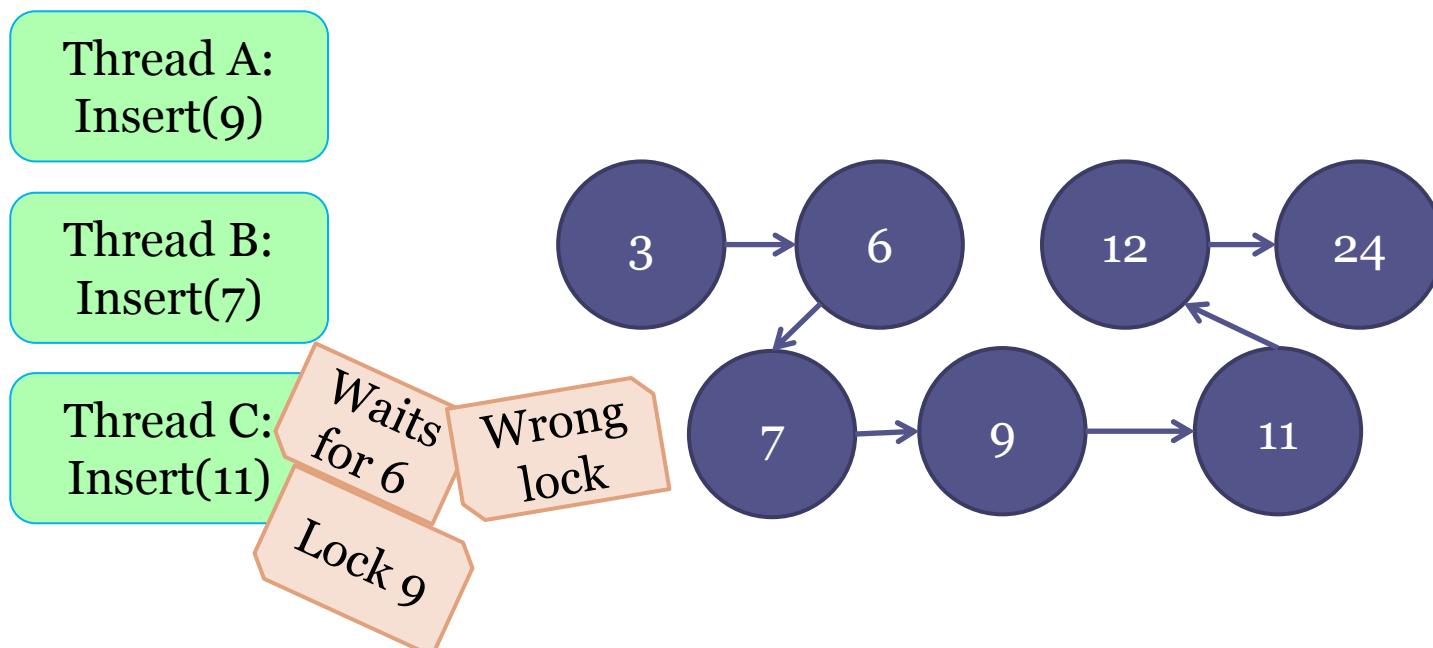
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Combining Types

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How does on-demand combining work?

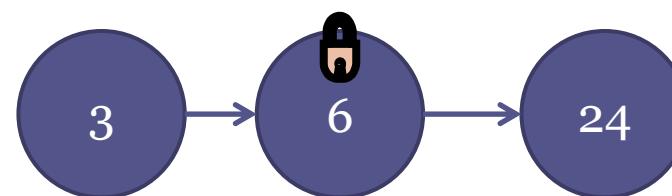
No Combining Demand - No Overhead

- If a thread did not observe contention, it is executed without any combining overhead
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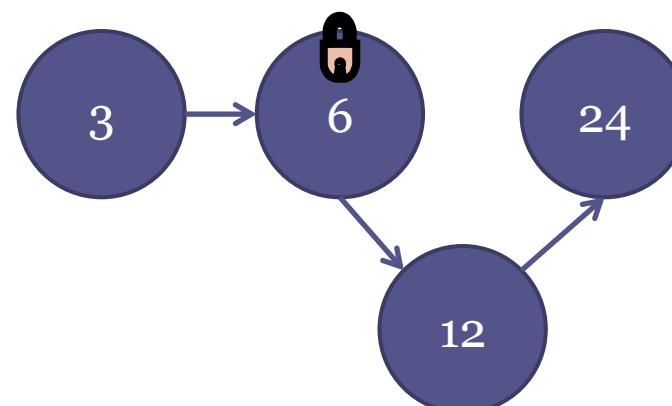
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Insert(12)



No Combining Demand - No Overhead

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Thread A:
Insert(12)



No Combining Demand - No Overhead

- If a thread did not observe contention, it is executed without any combining overhead
 - Thread observes contention if it needs to wait to acquire a lock

Thread A:
Insert(12)

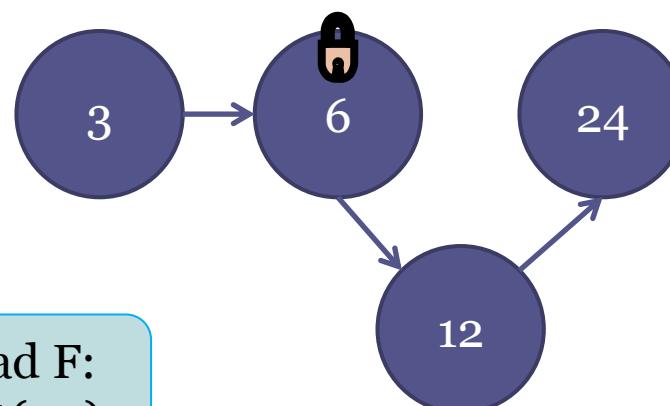
Thread B:
Insert(9)

Thread C:
Insert(9)

Thread D:
Insert(10)

Thread E:
Remove(10)

Thread F:
Insert(20)



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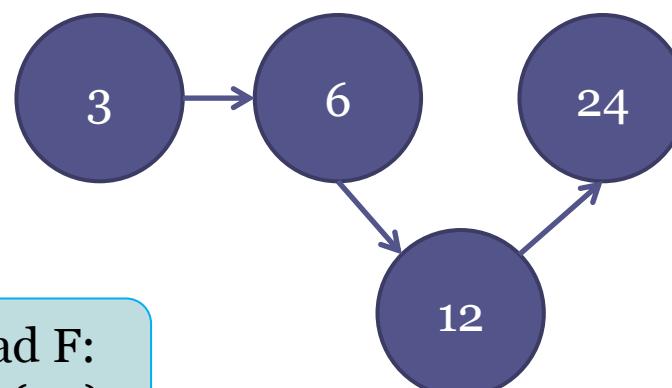
Thread B:
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Thread C:
Insert(9)

Thread D:
Insert(10)

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Thread F:
Insert(20)



How does the local combining work?

Combine Locally

- A thread that locked after observing contention collects operations of contending threads

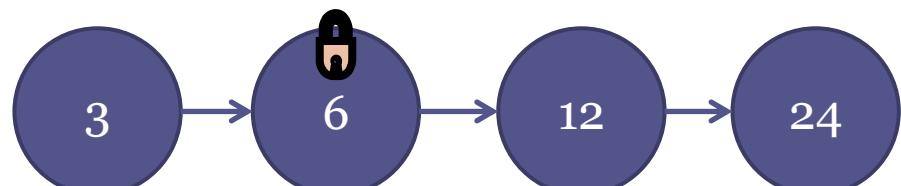
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Combine Locally

- A thread that locked after observing contention collects operations of contending threads
 - Complementary operations are eliminated

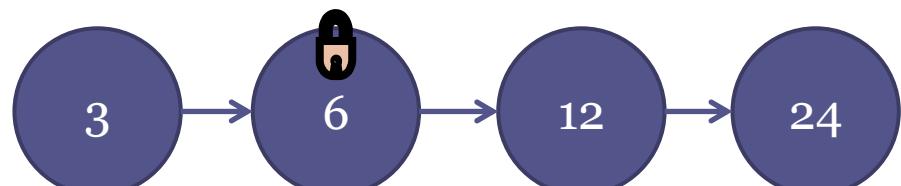
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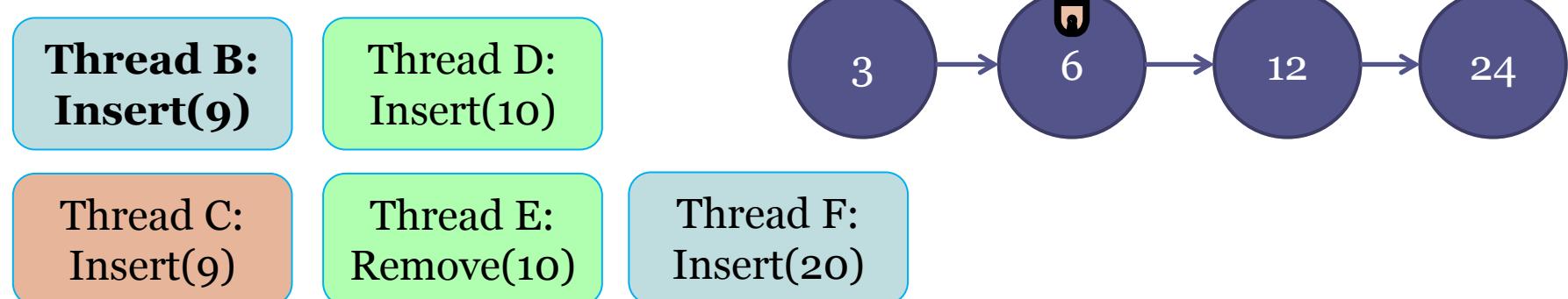
Thread E:
Remove(10)

Thread F:
Insert(20)



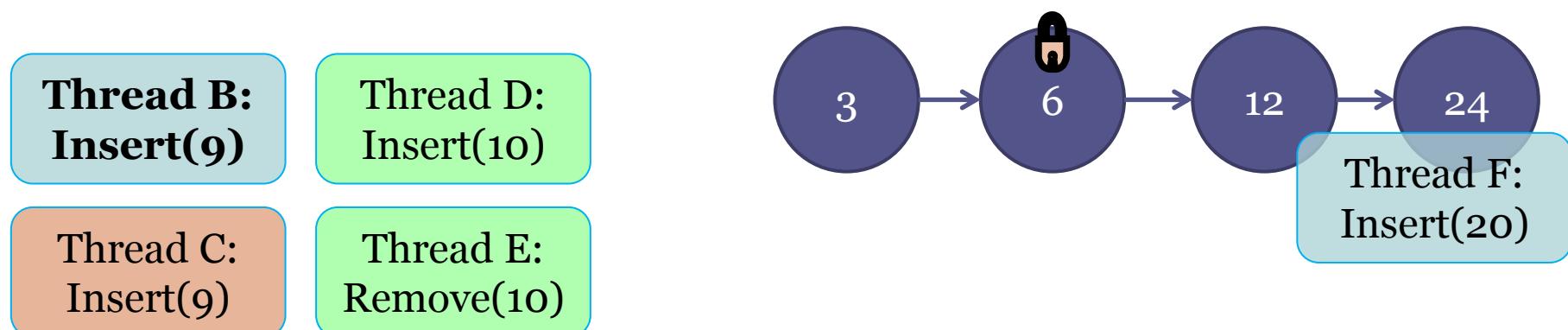
Combine Locally

- A thread that locked after observing contention collects operations of contending threads
 - Complementary operations are eliminated
 - Identical operations are eliminated



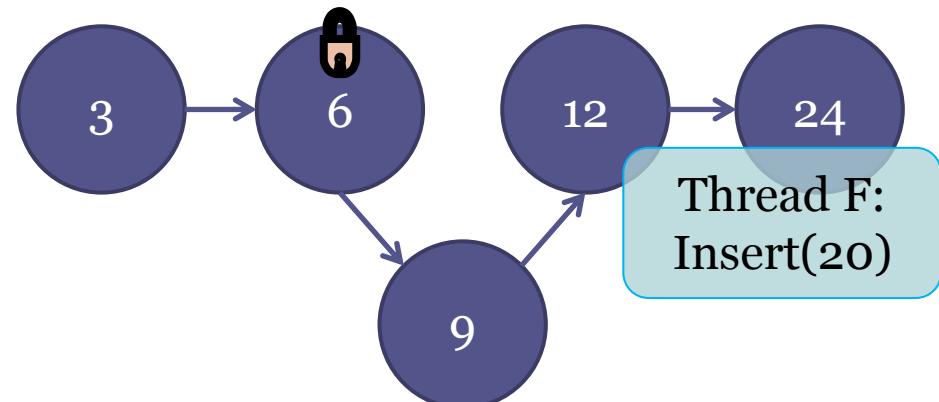
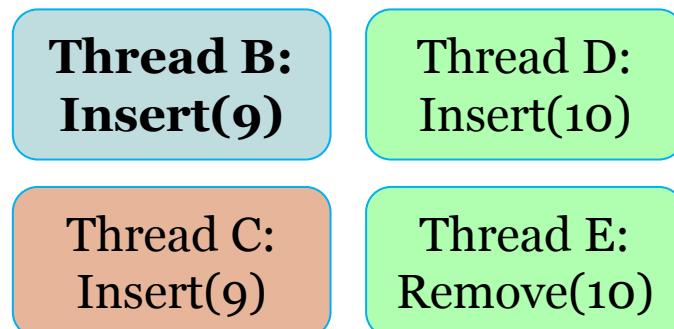
Combine Locally

- A thread that locked after observing contention collects operations of contending threads
 - Complementary operations are eliminated
 - Identical operations are eliminated
 - Operations requiring a different lock are notified



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Combine Locally

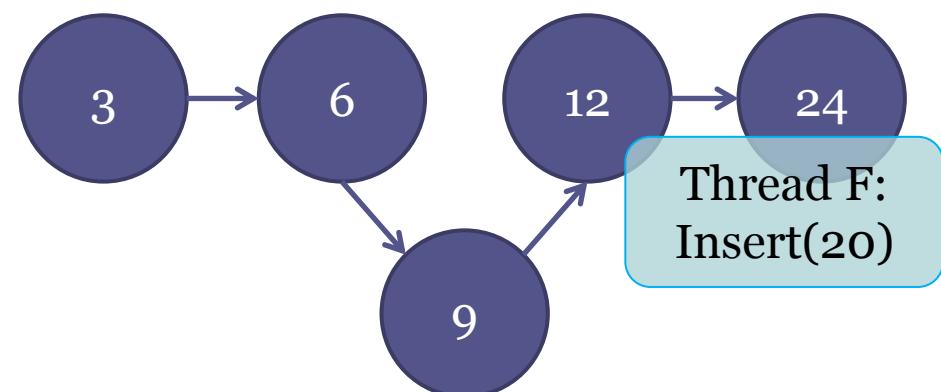
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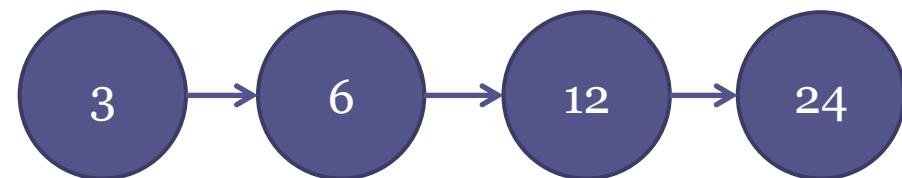
How to handle operations requiring multiple locks?

Operations Requiring Multiple Locks

- LCD is applied independently for each lock
- Operations acquiring multiple locks are split
 - Each sub-operation acquires one lock
 - Each sub-operation may be executed by a different combining thread
- Example: *Remove(k)*

Operations Requiring Multiple Locks

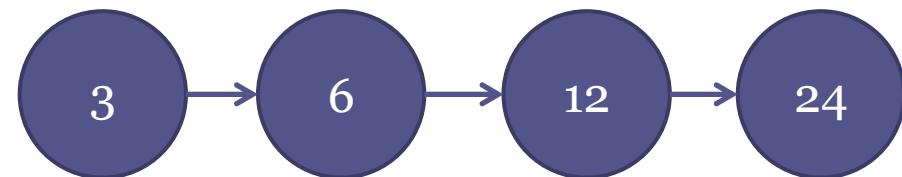
- Example: *Remove(k)*
 - Search for a node p s.t.: $p.key < k \leq \text{next}(p).key$
 - Lock p
 - If the key of p 's successor is k
 - Lock p 's successor
 - Mark the successor
 - Update p 's successor



Thread A:
Remove(12)

Operations Requiring Multiple Locks

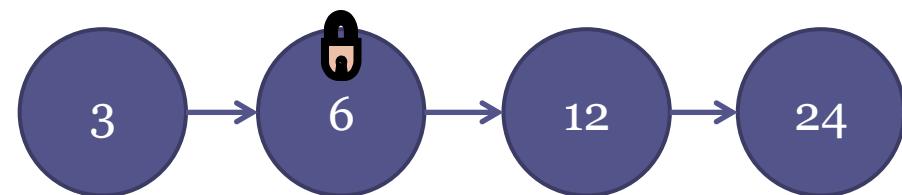
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Operations Requiring Multiple Locks

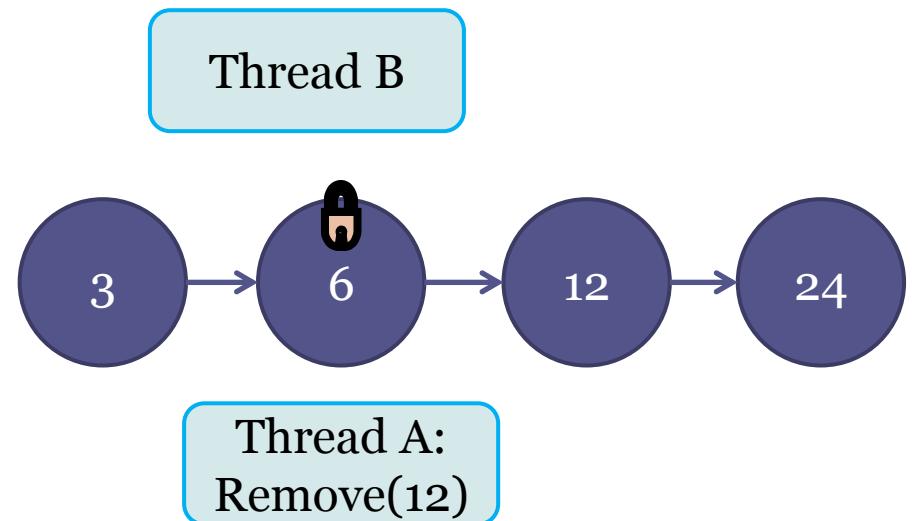
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Thread A:
Remove(12)

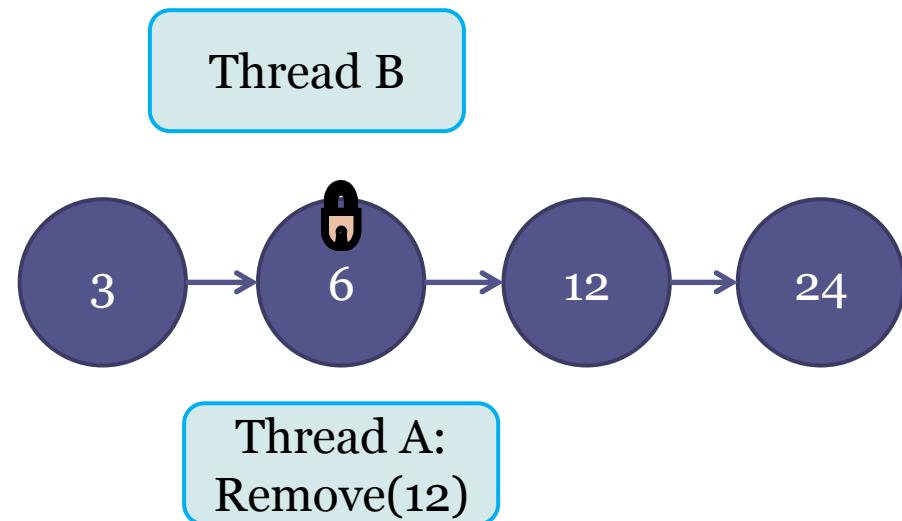
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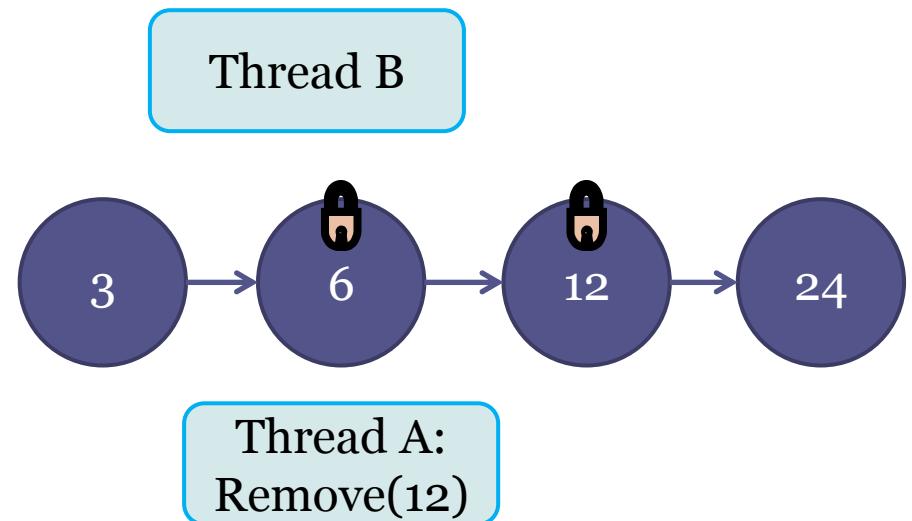
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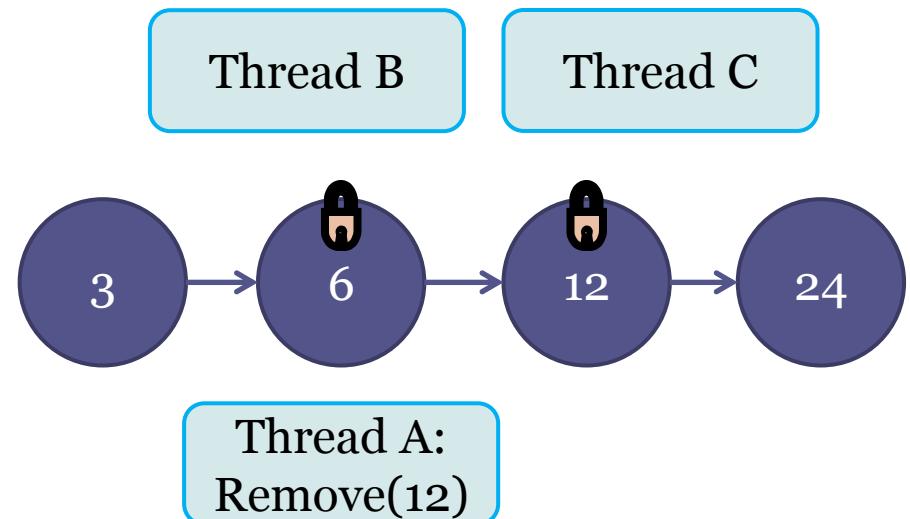
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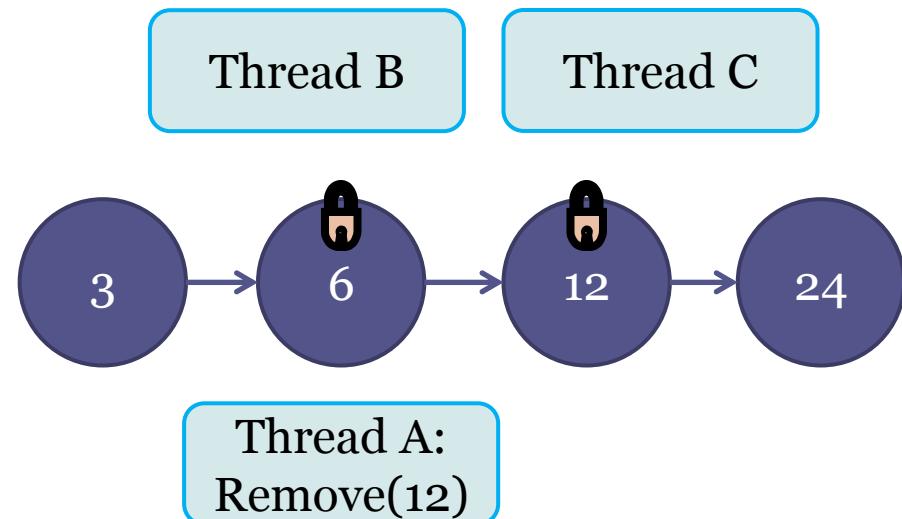
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- New sub-operation:
Mark



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 - Update p 's successor
- New sub-operation:
Mark
-
- ```
graph LR; 3((3)) --> 6((6)); 6 --> 12((12)); 12 --> 24((24));
```
- Thread B
- Thread C
- Thread A: Remove(12)
- Thread B: Mark(12)

# Operations Requiring Multiple Locks

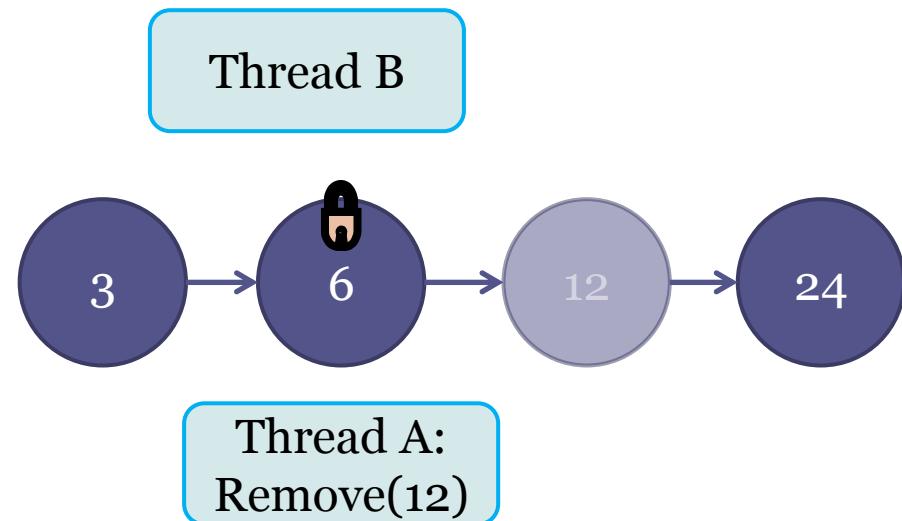
- Example: *Remove(k)*
    - Search for a node  $p$  s.t.:  $p.key < k \leq \text{next}(p).key$
    - Lock  $p$
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      - Lock  $p$ 's successor
      - **Mark the successor**
      - Update  $p$ 's successor
- A red curved arrow points from the "Mark the successor" step to a new sub-operation box labeled "New sub-operation: Mark".
- 
- Thread B
- Thread C
- Thread A: Remove(12)
- Thread B: Mark(12)
- 3 → 6 → 12 → 24

# Operations Requiring Multiple Locks

- Example: *Remove(k)*
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      - **Mark the successor**
      - Update  $p$ 's successor
- A red curved arrow points from the "Mark the successor" step to a new sub-operation box labeled "New sub-operation: Mark".
- The diagram illustrates a linked list of four nodes, each represented by a circle containing a number. The nodes are connected by arrows pointing to the right. The first node contains the value 3. The second node contains the value 6 and has a small padlock icon above it, indicating it is locked. The third node contains the value 12 and also has a small padlock icon above it, indicating it is being marked. The fourth node contains the value 24. To the left of the list, there are two boxes: "Thread B" above the list and "Thread A: Remove(12)" below the list. To the right of the list, there are two boxes: "Thread C" above the list and "Thread B: Mark(12)" below the list.

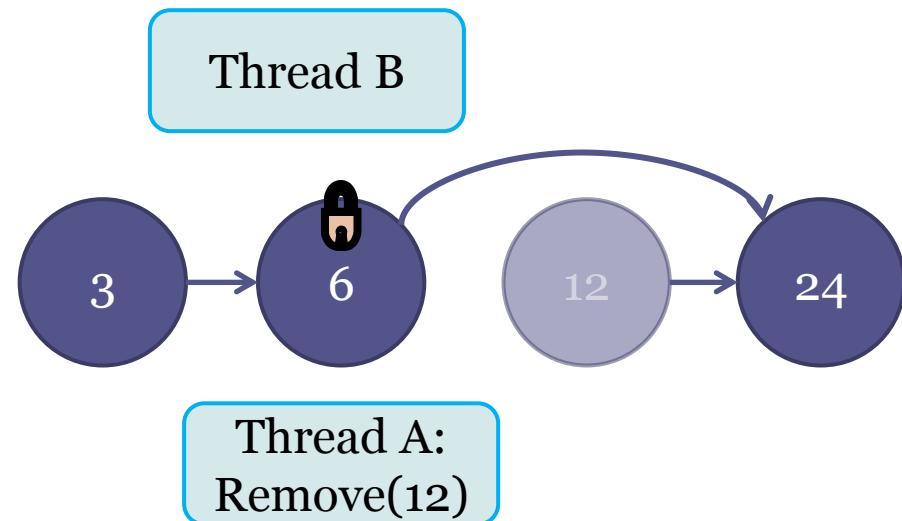
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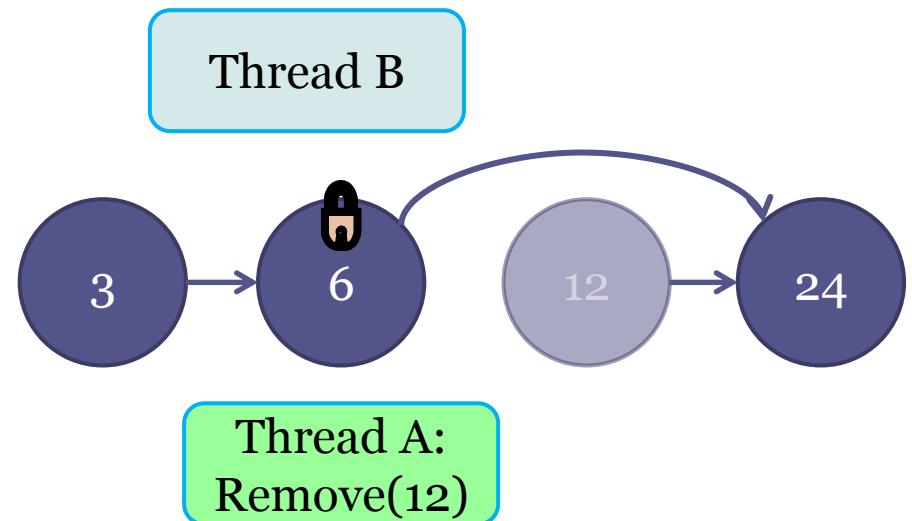
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    - Update  $p$ 's successor



# How to integrate LCD with the Java lock?

# Java Lock Integration

- Most of the LCD mechanism was integrated into the Java lock
- The Java lock maintains a queue of threads waiting to acquire the lock
- The LCD requires the list of contending threads
  - Which is exactly the list of threads waiting to lock
  - We leverage this queue to the LCD purposes

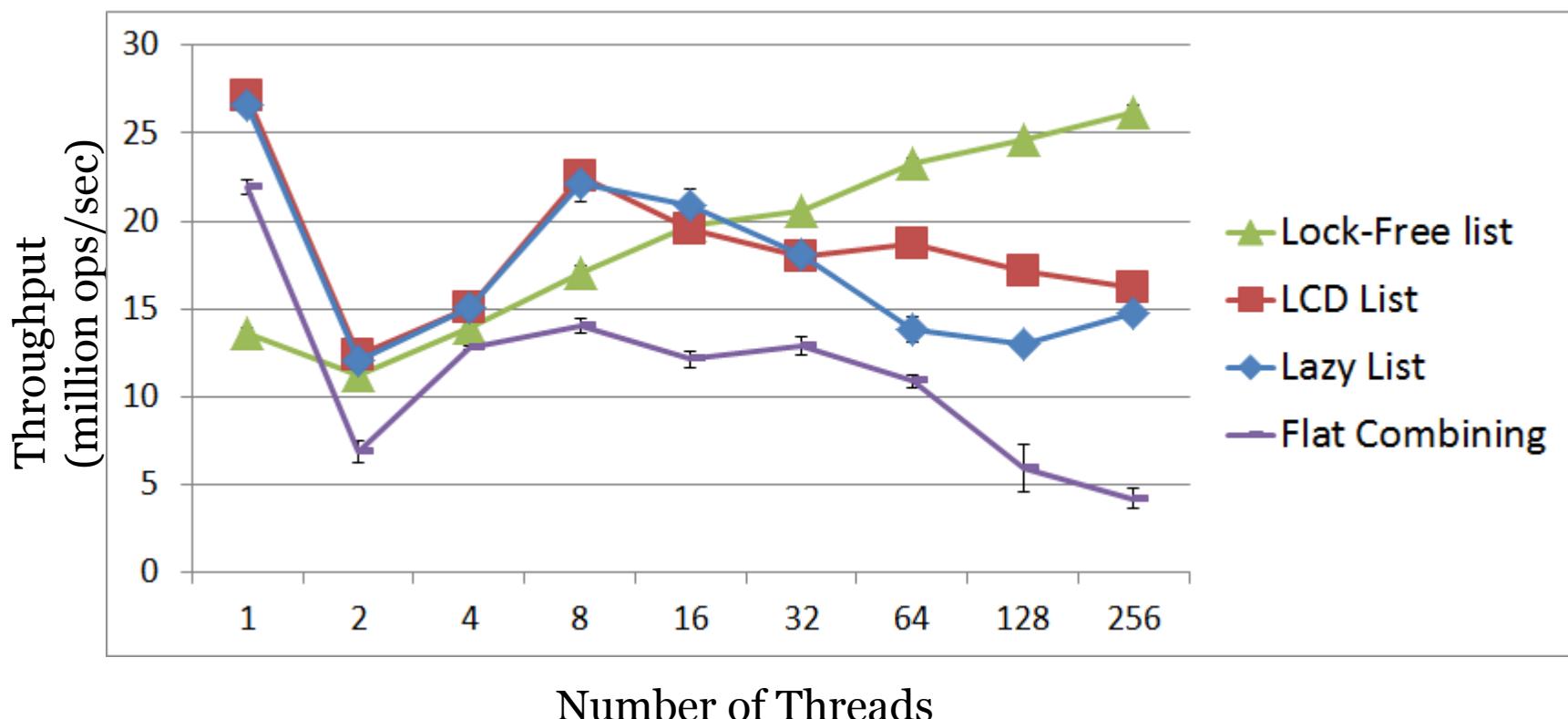
# LCD Evaluation

- LCD list was implemented in Java and compared to state-of-the-art algorithms
  - Linked-list algorithms
    - The Lazy List [Heller, Herlihy, Luchangco, Moir, Scherer III, Shavit]
    - The Lock-free List [Harris]
  - Combining algorithms
    - Flat Combining (global lock) [Hendler, Incze, Shavit, Tzafrir]

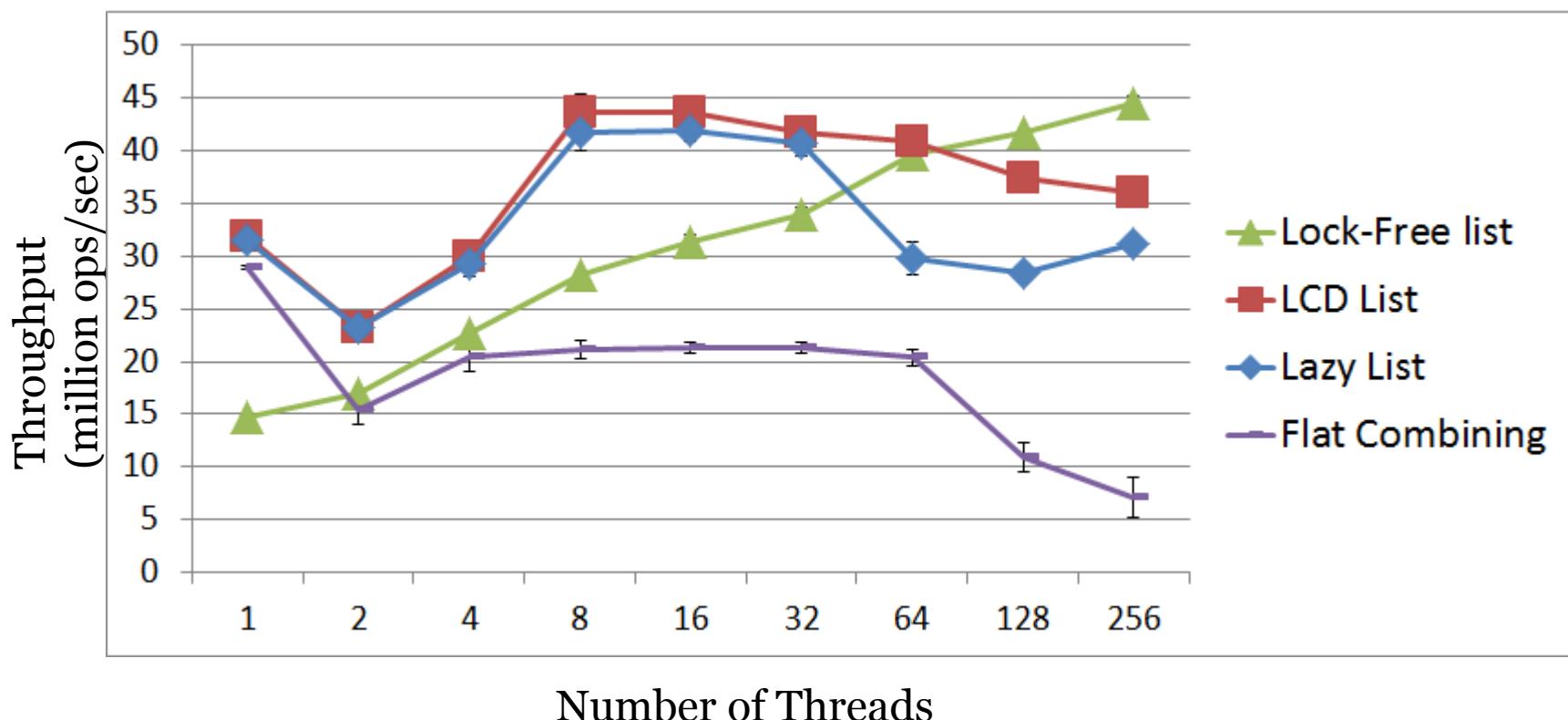
# Benchmarks

- Threads randomly chose operation type and key
  - Different workloads for the operation type
    - 0% contains, 50% insert, 50% remove
    - 60% contains, 20% insert, 20% remove
  - Different key ranges
    - 128, 1024
- List was populated to half of its expected size
  - 64, 512
- AMD Opteron machine with 64 h/w threads

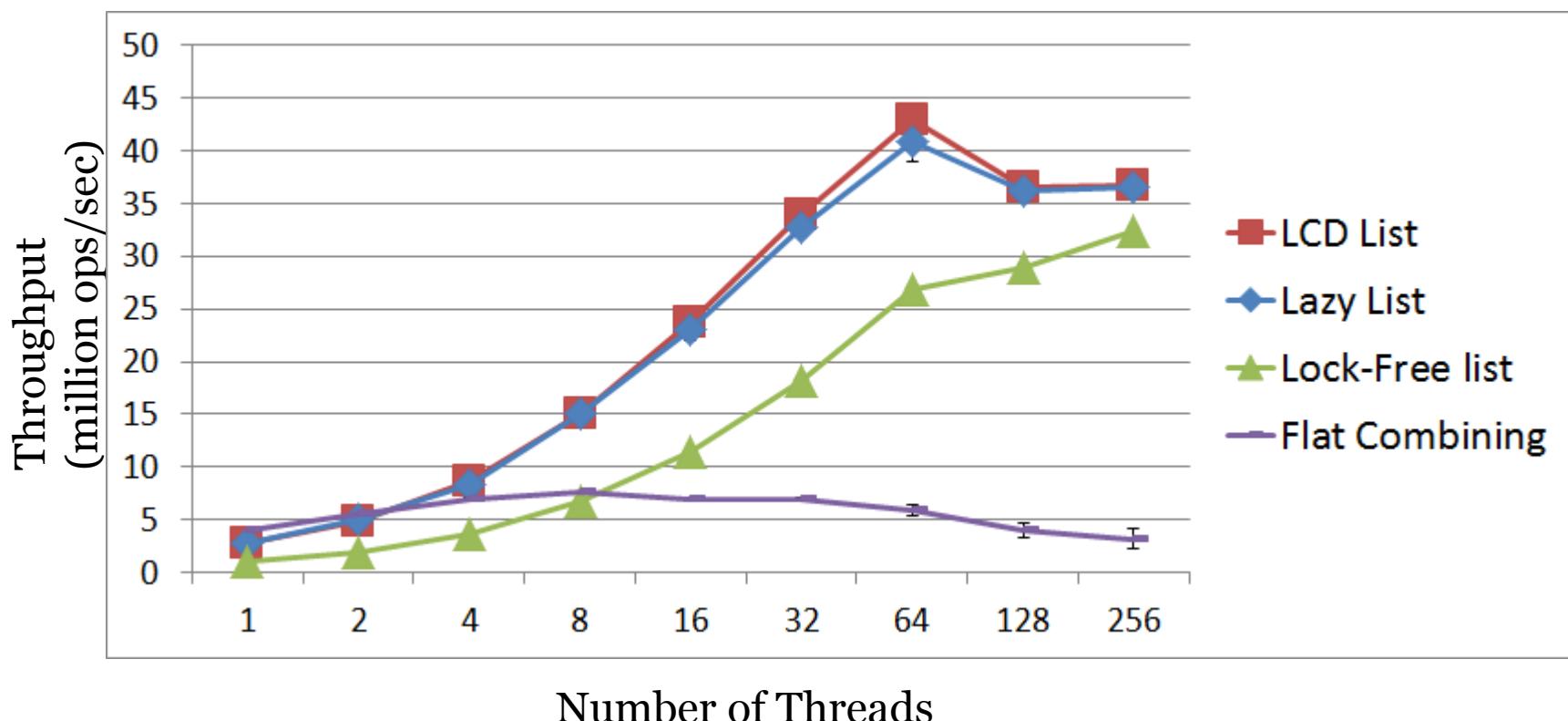
0% contains, 50% insert, 50% remove  
Key range: 128



60% contains, 20% insert, 20% remove  
Key range: 128



60% contains, 20% insert, 20% remove  
Key range: 1024



# Summary

- We presented a new combining technique
  - Local
    - Applied independently for contended resources
  - On-demand
    - No overhead if there is no contention
- We demonstrated it on the linked-list
  - And showed it improves performance