## CSE113: Parallel Programming

 April 29, 2021- Topic: Concurrent Objects 2
- More SC examples!
- Linearizability
- A concurrent set



## Announcements

- Midterm will be released today by midnight (probably earlier)
- No discussions, only private clarifying questions to teach staff.
- We will keep a running discussion on Canvas for clarifying questions
- Give yourself time to do both homework 2 and midterm
- We are working on grades for HW1, hopefully by next week.


## Announcements

## Homework

- We can start sharing results next week (throughput, variance)
- Is variance a good metric for part 1? Maybe not the best. Have a look at @76
- coefficient of variation
- changing results to percentages
- What does fairness mean in \#2?
- You can do it with sleeps, yields
- You can also do it logically.
- Try both! (next year I will require both $)$ )
- Part 3:
- You do not need to "upgrade" the lock from reader to writer atomically! You do need to perform the swap atomically though.


## Announcements

- Guest lecture on May 20!
- Hugues Evrard (Google) will talk about message passing concurrency
- Alastair Donaldson (Imperial College London) will talk about testing GPU compilers


## Quiz

- Thank you! Quiz numbers almost exactly matched attendance last time


## Quiz

- Discuss answers
- Question using non-thread safe objects: Java has finally blocks, C++ has destructors

```
void foo() {
    m.lock();
    x = vector.at(120);
    m.unlock();
}
```

```
void foo() {
    lock_guard<mutex> lock(m);
    x = vector.at(120);
}
```


## Lecture schedule

- Revisiting sequential consistency
- Linearizablity
- Progress Properties
- Implementing a set


## Lecture schedule

- Revisiting sequential consistency
- Linearizablity
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## More SC examples!!

To make up for my mistake last lecture

## Global variable: <br> CQueue<int> q;

```
Thread 0:
q.enq(6);
q.enq(7);
```

```
Thread 1:
int t0 = q.dec();
int t1 = q.dec();
```

Is it possible for t0 to contain 7 and t1 to contain 6?

## Global variable: <br> CQueue<int> q;

```
Thread 0:
q.enq(6);
q.enq(7);
```

```
Thread 1:
int t0 = q.dec();
int t1 = q.dec();
```

q.enq(6);
Is it possible for t0 to contain
7 and t1 to contain 6?
q.enq(7);
int to $=$ q. $\operatorname{dec}()$;
int t1 = q. dec();

## Global variable: <br> CQueue<int> q;

```
Thread 0:
q.enq(6);
q.enq(7);
```


## Thread 1: <br> int to $=$ q.dec (); <br> int t1 $=$ q.dec();



Is it possible for t0 to contain 7 and t1 to contain 6?

## Global variable:

```
Thread 0:
s.push(6);
s.push(7);
```

```
Thread 1:
int t0 = s.pop();
int t1 = s.pop();
```

Is it possible for t0 to contain 7 and t1 to contain 6?

## Global variable:

CStack<int> s; FILO object

```
Thread 0:
s.push(6);
s.push(7);
```

```
Thread 1:
int t0 = s.pop();
int t1 = s.pop();
```

s.push(6);

Is it possible for t0 to contain 7 and t1 to contain 6?

```
int t0 = s.pop();
```

```
int t1 = s.pop();
```


## Global variable:

CStack<int> s;
FILO object

## Thread 0: <br> s.push(6); <br> s.push(7);



## Thread 1: <br> int t0 = s.pop(); <br> int t1 = s.pop();

Is it possible for t0 to contain 7 and t1 to contain 6?

## Global variable:

CStack<int> s;
FILO object

## Thread 0: <br> s.push(6); <br> s.push(7);



## Thread 1: <br> $$
\text { int t0 }=\text { s.pop(); }
$$ <br> $$
\text { int } \text { t1 }=\text { s.pop(); }
$$

Is it possible for t0 to contain 7 and t1 to contain 0 ?

## Global variable:

## CStack<int> s;

 FILO object
## Thread 0: <br> s.push(6); <br> s.push(7);

## Thread 1: <br> int t0 = s.pop(); <br> int t1 = s.pop();

Is it possible for t0 to contain 7 and t1 to contain 0 ?

## Global variable:

```
Thread 0:
p.enq(1);
int t0 = q.dec();
```

```
Thread 1:
q.enq(1);
int t1 = p.dec();
```

Is it possible for t 0 and t 1 to contain 0 at the end of this program?

```
Global variable:
CQueue<int> q,p;
```

```
Thread 0:
```

Thread 0:
p.enq(1);
p.enq(1);
int t0 = q.dec();

```
int t0 = q.dec();
```

```
```

Thread 1:

```
```

Thread 1:
q.enq(1);
q.enq(1);
int $t 1=p . d e c() ;$

```
```

int $t 1=p . d e c() ;$

```
```

q.enq(1);
int t1 = p.dec();
int to $=$ q. $\operatorname{dec}()$;
p.enq(1);

Is it possible for t 0 and t 1 to contain 0 at the end of this program?

## Global variable: <br> CQueue<int> q,p;

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Thread 0:
p.enq(1);
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Thread 1:
q.enq(1);
int t1 = p.dec();
```



Is it possible for t 0 and t 1 to contain 0 at the end of this program?

## Global variable:

```
Thread 0:
int t0 = q.dec();
p.enq(1);
```

```
Thread 1:
int t1 = p.dec();
q.enq(1);
```

Is it possible for t 0 and t 1 to both contain 1 at the end of this program?

## Global variable:

```
Thread 0:
int t0 = q.dec();
p.enq(1);
```

```
Thread 1:
int t1 = p.dec();
q.enq(1);
```

```
q.enq(1);
```

```
int t1 = p.dec();
```

Is it possible for t 0 and t 1 to both contain 1 at the end of this program?


```
Thread 1:
int t1 = p.dec();
q.enq(1);
```

Is it possible for t 0 and t 1 to both contain 1 at the end of this program?

Remember the issue with sequential const.

## Sequential consistency and real time

- Add in real time:

This timeline seems strange...

Thread 0


Thread 1


## Sequential consistency and real time

- Add in real time:

Thread 0


This execution is allowed in sequential consistency!

SC doesn't care about real time, only if it can construct its virtual sequential timeline

Thread 1

real time line

## Sequential consistency and real time

- Add in real time:

Thread 0


This execution is allowed in sequential consistency!

SC doesn't care about real time, only if it can construct its virtual sequential timeline


## Sequential consistency and real time

- Add in real time:

$$
\text { q.enq ( } 6 \text { ) }
$$

Thread 0

Thread 1

$$
q \cdot e n q(7) ; \quad q \cdot \operatorname{deq}()==6
$$

real time line

This execution is allowed in sequential consistency!

SC doesn't care about real time, only if it can construct its virtual sequential timeline

## Sequential consistency and real time

- Add in real time:

Thread 0


Thread 1


## Sequential consistency and real time

- Add in real time:

Why might this actually happen?
asynchronous calls (like printf), e.g. it buffers the value before publishing it? Lazy publishing (e.g. cache values in registers)?

Thread 0


Thread 1


## Sequential consistency and real time

- Add in real time:

Why might this actually happen?
asynchronous calls (like printf), e.g. it buffers the value before publishing it? Lazy publishing (e.g. cache values in registers)?

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## Sequential consistency and real time

- Add in real time:

$$
\text { q.enq ( } 6 \text { ) }
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Thread 1

$$
q \cdot \operatorname{enq}(7) ; \quad q \cdot \operatorname{deq}()==6
$$

real time line

This execution is allowed in sequential consistency!

SC doesn't care about real time, only if it can construct its virtual sequential timeline


## Sequential consistency and real time

- Add in real time:

2 objects now: p and q


## Sequential consistency and real time

- Add in real time:

2 objects now: p and q
Consider each object in isolation


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## Sequential consistency and real time

- Add in real time:

2 objects now: p and q
Consider each object in isolation


## Sequential consistency and real time

- Add in real time:

Now consider them all together


## Global variable: <br> CQueue<int> p,q;

Thread 0:
p.enq $(11)$
$q \cdot \operatorname{enq}(2)$
$p \cdot \operatorname{deq}()==12$
Thread 1:
q.enq( 1)
p.enq ( 12 )
$q \cdot \operatorname{deq}()==2$

## Global variable: <br> CQueue<int> p,q;

Thread 0:
p.enq $(11)$
$q \cdot \operatorname{enq}(2)$
$p \cdot \operatorname{deq}()==12$
Thread 1:
q.enq (1)
p.enq $(12)$
$q \cdot \operatorname{deq}()==2$
p.deq()== 12;

## Global variable: <br> CQueue<int> p,q;

Thread 0:
p.enq $(11)$
$q \cdot \operatorname{enq}(2)$
$p \cdot \operatorname{deq}()==12$

$$
\text { p.deq }()==12 ;
$$

| Thread 1: |
| :--- |
| $q \cdot \operatorname{enq}(1)$ |
| $p \cdot \operatorname{enq}(12)$ |
| $q \cdot \operatorname{deq}()==2$ |

## Global variable: <br> CQueue<int> p,q;

Thread 0:
p.enq $(11)$
$q \cdot \operatorname{enq}(2)$
$p \cdot \operatorname{deq}()==12$

$$
\text { p.deq }()==12 ;
$$

$$
q \cdot \operatorname{deq}()==2 ;
$$

| Thread 1: |
| :--- |
| $q \cdot \operatorname{enq}(1)$ |
| $p \cdot \operatorname{enq}(12)$ |
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## Global variable: <br> CQueue<int> p,q;

Thread 0:
p.enq $(11)$
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$p \cdot \operatorname{deq}()==12$

$$
\text { p.deq }()==12 ;
$$

$$
q \cdot \operatorname{deq}()==2 ;
$$

| Thread 1: |
| :--- |
| $q \cdot \operatorname{enq}(1)$ |
| $p \cdot \operatorname{enq}(12)$ |
| $q \cdot \operatorname{deq}()==2$ |

## Global variable: <br> CQueue<int> p,q;

q.enq(1);

| Thread 0: |
| :--- |
| $p \cdot \operatorname{enq}(11)$ |
| $q \cdot \operatorname{enq}(2)$ |
| $p \cdot \operatorname{deq}()==12$ |

where to put this?

| Thread 1: |
| :--- |
| q.enq ( 1 ) |
| $p \cdot \operatorname{enq}(12)$ |
| $q \cdot \operatorname{deq}()==2$ |

$$
\begin{gathered}
\text { p.deq }()==12 ; \\
\\
q \cdot \operatorname{deq}()==2 ;
\end{gathered}
$$

## Global variable: <br> CQueue<int> p,q;

Thread 0:
p.enq ( 11 )
$q \cdot \operatorname{enq}(2)$
$p \cdot \operatorname{deq}()==12$

Thread 0:
p.enq(11)
q.enq(2)
p. $\operatorname{deq}()==12$

## What does this mean?

- Even if objects in isolation are sequentially consistent
- Programs composed of multiple objects might not be!
- We would like to be able to use more than 1 object in our programs!


## Lecture schedule

- Revisiting sequential consistency
- Linearizablity
- Progress Properties
- Implementing a set


## Linearizability

- Linearizability
- Defined in term of real-time histories
- We want to ask if an execution is allowed under linearizability
- Slightly different game:
- sequential consistency is a game about stacking lego bricks
- linearizability is about sliders



## Linearizability

each operation has a linearizability point

- does not overlap with other with other linearizability points
- indivisible computation (critical section, atomic RMW, atomic load, atomic store)
- object update (or read) occurs exactly at this point


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## Linearizability

each command gets a linearization point.

You can place the point any where between its innovation and response!

Thread 0


Thread 1


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## Linearizability

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Project the linearization points to a global timeline

Thread 0


## Linearizability

each command gets a linearization point.

You can place the point any where between its innovation and response!

Project the linearization points to a global timeline

Thread 0


## Linearizability


slider game!
each command gets a linearization point.

You can place the point any where between its innovation and response!

Project the linearization points to a global timeline

Thread 0

Thread 1
global timeline


## Linearizability

Thread 0


Thread 1


## Linearizability

Thread 0


Thread 1


## Linearizability



Thread 0


## Linearizability

Thread 0


Thread 1


## Linearizability

Thread 0

allowed!
Guaranteed?

Thread 1


## Linearizability

Thread 0

guaranteed?

Thread 1


## Linearizability



Thread 0

guaranteed?

Thread 1


## Linearizability

- We spent a bunch of time on SC... did we waste our time?
- No!
- Linearizability is strictly stronger than SC. Every linearizable execution is SC, but not the other way around.
- If a behavior is disallowed under SC, it is also disallowed under linearizability.
- Overall strategy:
- Write our objects to be linearizable: need to identify linearizable points
- Reason about our programs using SC: no need for timelines, just need code


## Linearizability

- How do we write our programs to be linearizable?
- Identify the linearizability point
- One indivisible region (e.g. an atomic store, atomic load, atomic RMW, or critical section) where the method call takes effect. Modeled as a point.


## Linearizability

- Locked data structures are linearizable.


```
class bank_account {
    public:
        bank_account() {
            balance = 0;
        }
    void buy_coffee() {
        m.lock();
        balance -= 1;
        m.unlock();
        }
    void get_paid() {
            m.lock();
            balance += 1;
            m.unlock();
        }
    private:
        int balance;
        mutex m;
};
```


## Linearizability

- Locked data structures are linearizable.
typically modeled as the point the lock is acquired or released


```
class bank_account {
    public:
        bank_account() {
            balance = 0;
        }
    void buy_coffee() {
        m.lock();
        balance -= 1;
        m.unlock();
        }
    void get_paid() {
        m.lock();
        balance += 1;
        m.unlock();
        }
    private:
        int balance;
        mutex m;
};
```


## Linearizability

- Locked data structures are linearizable.
typically modeled as the point the lock is acquired or released lets say released.


```
class bank_account {
    public:
        bank_account() {
            balance = 0;
        }
    void buy_coffee() {
        m.lock();
        balance -= 1;
        m.unlock();
        }
    void get_paid() {
            m.lock();
        balance += 1;
        m.unlock();
        }
    private:
        int balance;
        mutex m;
};
```


## Linearizability

- Our lock-free bank account is linearizable:
- The atomic operation is the linearizable point

```
class bank_account {
    public:
        bank_account() {
        balance = 0;
    }
    void buy_coffee() {
        atomic_fetch_add(&balance, -1);
        }
        void get_paid() {
        atomic_fetch_add(&balance, 1);
        }
    private:
        atomic_int balance;
};
```


object state: M
atomic_fetch_add object state: $\mathrm{M}^{\prime}$

## Lecture schedule

- Revisiting sequential consistency
- Linearizablity
- Progress Properties
- Implementing a set


## Progress properties

## - Going back to specifications:

Recall the mutex



## Progress properties

## - Going back to specifications:

Recall the mutex
Thread 0 is stopping Thread 1 from making progress. If delays in one thread can cause delays in other threads, we say that it is blocking
what is stopping this?

## Progress properties

## - Going back to specifications:

Recall the mutex
Thread 0 is stopping Thread 1 from making progress. If delays in one thread can cause delays in other threads, we say that it is blocking

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## Progress properties

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Thread 0 is stopping Thread 1 from making progress. If delays in one thread can cause delays in other threads, we say that it is blocking

## Progress properties

## - Going back to specifications:

Recall the mutex
Thread 0 is stopping Thread 1 from making progress. If delays in one thread can cause delays in other threads, we say that it is blocking

## Linearizability

Two unfinished commands.


| Thread 1 | q.push (7) |
| :--- | :--- |
|  |  |

## Linearizability

Two unfinished commands.
Linearizability does not dictate that one needs to wait for another

```
Thread 0
```



Thread 1


## Linearizability

Two unfinished commands.
Linearizability does not dictate that one needs to wait for another

Thread 0


Thread 1


## Linearizability

Two unfinished commands.
Linearizability does not dictate that one needs to wait for another

Thread 0


Thread 1

for mutexes, the specification required that the system hang.

## Linearizability

Two unfinished commands.
Linearizability does not dictate that one needs to wait for another

Thread 0


Thread 1

for mutexes, the specification required that the system hang. no such specification here.

## Linearizability

Non-blocking specification:
Every thread is allowed to continue executing
REGARDLESS of the behavior of other threads

Thread 0


Thread 1

for mutexes, the specification required that the system hang. no such specification here.

## Linearizability

Non-blocking specification:
Every thread is allowed to continue executing
REGARDLESS of the behavior of other threads

Thread 0

Thread 1


This is a specification property, not an implementation property! You can implement your concurrent objects with locks and have a "blocking implementation".

But that is because of implementation choice, not because of specification requirements.

## Terminology overview

- Thread-safe object:
- Lock-free object:
- Blocking specification:
- Non-blocking specification:
- (non-)blocking implementation:


## Terminology overview

- Sequential consistency:
- Linearizability:
- Linearizability point:


## Lecture schedule

- Revisiting sequential consistency
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- Progress Properties
- Implementing a set


## An example

- A sorted list:

Slides change style: I borrowed slides (with permission) from Roberto Palmieri (Lehigh University). They are based off slides by the book author

## Set Interface

- Unordered collection of items
- No duplicates


## Set Interface

- Unordered collection of items
- No duplicates
- Methods
- add (x) put $\mathbf{x}$ in set
- remove (x) take $\mathbf{x}$ out of set
- contains (x) tests if $\mathbf{x}$ in set


## List Node

```
class Node {
    public:
        Value v;
        int key;
        Node *next;
}
```


## The List-Based Set



Sorted with Sentinel nodes
(min \& max possible keys)

## Sequential List Based Set

add(b)

remove(b)
$\square \rightarrow a \longrightarrow \square \rightarrow \square$

## Sequential List Based Set

 add(b)
remove(b)


## Coarse-Grained Locking



Coarse-Grained Locking


## Coarse-Grained Locking



## Fine-grained Locking

- Requires careful thought
- Split object into pieces
- Each piece has own lock
- Methods that work on disjoint pieces need not exclude each other

Hand-over-Hand locking


Hand-over-Hand locking


Hand-over-Hand locking


Hand-over-Hand locking


Hand-over-Hand locking


## Removing a Node



## Removing a Node



## Removing a Node



## Removing a Node



## Removing a Node



## Removing a Node



## Removing a Node



## Concurrent Removes



## Concurrent Removes



## Concurrent Removes



## Concurrent Removes



## Concurrent Removes



## Concurrent Removes



## Concurrent Removes



## Concurrent Removes



Uh, Oh


Uh, Oh
Bad news, c not removed


## Problem

- To delete node c
- Swing node b's next field to d
- Problem is,
- Data conflict:
- Someone deleting b concurrently could direct a pointer to $\mathbf{C}$



## Insight

- If a node is locked
- No one can delete node's successor
- If a thread locks
- Node to be deleted
- And its predecessor
- Then it works

Hand-Over-Hand Again


Hand-Over-Hand Again


Hand-Over-Hand Again


Hand-Over-Hand Again


Hand-Over-Hand Again


Hand-Over-Hand Again


## Removing a Node



## Removing a Node



## Removing a Node



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## Removing a Node



Removing a Node


## Removing a Node



## Removing a Node



## Removing a Node



## Removing a Node



Removing a Node


## Adding Nodes

- To add node e
- Must lock predecessor
- Must lock successor
- Neither can be deleted
- Is successor lock actually required?


## Drawbacks

- Better than coarse-grained lock
- Threads can traverse in parallel
- Still not ideal
- Long chain of acquire/release
- Inefficient


## Linearizability point

- The double node critical section:
- In parallel, other threads can update other parts of the list (ahead or behind)
- But when we release the double locks, our update is complete


```
void remove(Value v) {
    Node* pred = NULL, *Curr = NULL;
    head.lock();
    pred = head;
    curr = pred.next();
    curr.lock();
    while (curr.value != v) {
        pred.ulock();
        pred = curr;
        curr = curr.next();
        curr.lock();
    }
    pred.next = curr.next;
    curr.unlock();
    pred.unlock();
}
```

void remove(Value v) \{
Node* pred = NULL, *Curr = NULL;
head.lock();
pred = head;
curr $=$ pred.next();
curr.lock();
while (curr. value ! = v) \{
pred.ulock();
pred = curr;

curr $=$ curr.next();
curr.lock();
\}
pred.next $=$ curr.next;
curr.unlock();
pred.unlock();
\}









```
void remove(Value v) {
    Node* pred = NULL, *curr = NULL;
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    while (curr.value != v) {
        pred.ulock();
        pred = curr;
        curr = curr.next();
        curr.lock();
    }
    pred.next = curr.next;
    curr.unlock();
    pred.unlock();
}
```



```
void remove(Value v) {
    Node* pred = NULL, *Curr = NULL;
    head.lock();
    pred = head;
    curr = pred.next();
    curr.lock();
    while (curr.value != v) {
        pred.ulock();
        pred = curr;
        curr = curr.next();
        curr.lock();
    }
    pred.next = curr.next;
    curr.unlock();
    pred.unlock();
}
```



## Next week

- Reduce the locking even more!
- We will make the list completely lock free!
- Concurrent Queues
- ABA problem
- Specialized Queues

