#### **CSE113: Parallel Programming** April 13, 2021

- Topic: Introduction to Mutual Exclusion
  - Reasoning about concurrent programs
  - Mutual exclusion properties
  - Multiple mutexes



#### Announcements

- No more asynchronous lectures planned
- Homework 1 is posted:
  - Due April 22
- My office hours are on Wednesday, 3 5 PM
  - TAs have office hours daily
  - They are more helpful with tool flows (docker, VSCode)
- New module: Mutual Exclusion!

#### Lecture Schedule

- Canvas Quiz
- Notes on homework
- Reasoning about concurrency
- Mutual exclusion
- Multiple Mutexes

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# Quiz

- Publishing quiz on canvas:
  - Open for 5 minutes

# Quiz

- Publishing quiz on canvas:
  - Open for 5 minutes
- Go over questions

#### Lecture Schedule

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#### Homework

• Demo on terminal

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#### **Embarrassingly parallel**

From Wikipedia, the free encyclopedia

In parallel computing, an **embarrassingly parallel** workload or problem (also called **embarrassingly parallelizable**, **perfectly parallel**, **delightfully parallel** or **pleasingly parallel**) is one where little or no effort is needed to separate the problem into a number of parallel tasks.<sup>[1]</sup> This is often the case where there is little or no dependency or need for communication between those parallel tasks, or for results between them.<sup>[2]</sup>

# For this class: A multithreaded program is *embarrassingly parallel* if there are no *data- conflicts.*

A *data conflict* is where one thread writes to a memory location that another thread reads or writes to concurrently and without sufficient *synchronization*.

• Consider the following program:

There are 3 arrays: a, b, c. We want to compute c[i] = a[i] + b[i]











- The different parallelization strategies will probably have different performance behaviors.
- But they are both embarrassingly parallel solutions to the problem
- There is lots of research into making these types of programs go fast!
  but this module will focus on programs that require synchronization

• Next Program

There are 3 arrays: a, b, c. We want to compute c[i] = a[<mark>0</mark>] + b[i]







• Next Program

There are 2 arrays: b, c We want to compute  $c[0] = b[0] + b[1] + b[2] \dots$ 







Conflict because multiple threads write to the same location!

Note: Reductions have some parallelism in them, as seen in your homework.



*Conflict because multiple threads write to the same location!* 

• Most applications are not embarrassingly parallel

• Bank



My account: \$\$

• Bank



• Bank







• Graph algorithms



Examples: Ranking pages on the internet information spread in social media

• Graph algorithms

Examples:



• Graph algorithms

Examples:


• Graph algorithms



Examples: Ranking pages on the internet information spread in social media

• Machine Learning



Lots of machine learning is some form of matrix multiplication

image from: https://www.mathsisfun.com/

• Machine Learning



Lots of machine learning is some form of matrix multiplication

image from: https://www.mathsisfun.com/

### User interfaces

#### Run Tests

Ran 0 tests out of 366 Local iterations: 0 Killed Tests: 0 Time (seconds): 0.000000

#### Cance

Clear Test Log

Save to File

Action Log:

Test Log:

background process that provides progress updates to the UI.

UI updates must be synchronized!!

#### Run Tests

Ran 2 tests out of 366 Local iterations: 89 Killed Tests: 0 Time (seconds): 0.000000

Cance

Clear Test Log

#### Save to File

Action Log: using device Apple A12 GPU

Test Log: Running Test: round\_robin3t\_4i\_99 Finished killed: 0 Success: 100 Running Test: round\_robin3t\_4i\_95 Finished killed: 0 Success: 100 Running Test: round\_robin3t\_4i\_94

# Dangers of conflicts

• We will illustrate using a running bank account example

## Sequential bank scenario

- UCSC deposits \$1 in my bank account after every hour I work.
- I buy a cup of coffee (\$1) after each hour I work.
- I work 1M hours (which is actually true).
- I should break even
- C++ code

# Concurrent bank scenario

- UCSC contracts me to work 1M hours.
- My bank is so impressed with my contract that they give me a line of credit. i.e. I can overdraw as long as I pay it back.
- UCSC deposits \$1 in my bank account after every hour I work.
- I budget \$1M to spend on coffee **during** work.
- C++ code

# Concurrent bank scenario

This sets up a scheme where I buy coffee concurrently with working



## Reasoning about concurrency

- What is going on?
- We need to be able to reason more rigorously about concurrent programs

### *Tyler's coffee addiction:*

```
for (int i = 0; i < HOURS; i++) {
    tylers_account -= 1;
}</pre>
```

### Tyler's employer

```
for (int j = 0; j < HOURS; j++) {
   tylers_account += 1;
}</pre>
```

```
Tyler's coffee addiction:
for (int i = 0; i < HOURS; i++) {
  tylers_account -= 1;
}
Tyler's employer
for (int j = tylers_account -= 1; }
```

```
for (int j = 0; j < HOURS; j++) {
    tylers_account += 1;
}</pre>
```

### The execution of a program gives rise to events Important distinction between program and events



### Tyler's employer

```
for (int j = 0; j < HOURS; j++) {
   tylers_account += 1;
}</pre>
```









consider just one loop iteration



Concurrent execution



one possible execution

#### Concurrent execution











Another possible execution

Concurrent execution







Another possible execution

Concurrent execution







Another possible execution

#### Concurrent execution





Concurrent execution

time



time

Another possible execution

This time my account isn't ever negative





How many possible interleavings? Combinatorics question:

if Thread 0 has N events if Thread 1 has M events

 $\frac{(N+M)!}{N!M!}$ 

j = 0
check(j < HOURS)
tylers\_account += 1
j++ (j == 1)
check(j < HOURS)</pre>

time

### Concurrent execution

time

in our example there are 252 possible interleavings!



# Reasoning about concurrency

- Not feasible to think about all interleavings!
  - Lots of interesting research in pruning, testing interleavings (Professor Flanigan)
  - Very difficult to debug
- Think about smaller instances of the problem, reason about the problem as a whole.
  - Tyler spends a total of \$1M on coffee
  - Tyler gets paid a total of \$1M
  - The balance should be 0!
- **Reduce the problem**: If there's a problem we should be able to see it in a single loop iteration.



Lets get to the bottom of our money troubles:

For any interleaving, both of the increase and decrease must happen in some order. So there isn't an interleaving that will explain the issue.

concurrent execution



j = 0	
<pre>check(j &lt; HOURS)</pre>	
tylers_account +=	1
j++ (j == 1)	
<pre>check(j &lt; HOURS)</pre>	

concurrent execution

tylers\_account -= 1

time

tylers\_account += 1

Remember 3 address code...

concurrent execution



this line of code needs to be expanded

Remember 3 address code...

concurrent execution

tylers\_account += 1



Remember 3 address code...

concurrent execution



<pre>T1_load = *tylers_account</pre>
T1_load+-= 1
<pre>*tylers_account = T1_load</pre>

What if we interleave these instructions?

concurrent execution

time



T1\_load = \*tylers\_account  $T1_load + - = 1$ \*tylers\_account = T1\_load

concurrent execution

T0\_load = \*tylers\_account

T1\_load = \*tylers\_account

T0\_load -= 1

T1\_load+-= 1 \*tyl

\*tylers\_account = T1\_load

\*tylers\_account = T0\_load



T1\_load = \*tylers\_account  $T1_load+=1$ \*tylers\_account = T1\_load

tylers\_account has -1 at the end of this interleaving!

concurrent execution

T0\_load = \*tylers\_account

T1\_load = \*tylers\_account

T0 load -= 1

\*tylers\_account = T1\_load T1 load+-= 1

\*tylers\_account = T0\_load

# What now?

- Data conflicts lead to many different types of issues, not just strange interleavings.
  - Data tearing
  - Instruction reorderings
  - Compiler optimizations
- Rather than reasoning about data conflicts, we will protect against them using *synchronization*.

# Synchronization

- A scheme where several actors agree on how to safely share a resource during concurrent access.
- Must define what "safely" means.
- Example:
  - Two neighbors sharing a yard between a dog and cat
  - Sharing refrigerator with roommates
  - An account balance that is written to and read from
  - Chapter 1 in text book

### Lecture Schedule

- Canvas Quiz
- Notes on homework
- Reasoning about concurrency
- Mutual exclusion
- Multiple mutexes
• A Synchronization object to protect against data conflicts

Simple API:

lock()
unlock()

- Before a thread accesses the shared memory, it should call lock()
- When a thread is finished accessing the shared data, it should call unlock()

*Tyler's coffee addiction:* 

tylers\_account -= 1;

Tyler's employer

tylers\_account += 1;

assume a global mutex object m protect the account access with the mutex

Tyler's coffee addiction:

m.lock();
tylers\_account -= 1;
m.unlock();

Tyler's employer

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m.lock();

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```

mutex request
mutex acquire

time

### Tyler's employer



### Tyler's employer

Tyler's coffee addiction:

```
m.lock();
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m.unlock();
```

	mutex request
	mutex acquire
time	tylers_account -= 1
	mutex release

Tyler's employer

```
Tyler's coffee addiction:
    m.lock();
    tylers_account -= 1;
    m.unlock();
        mutex request
        mutex acquire
time
        tylers_account -= 1
        mutex release
```

#### Tyler's employer





concurrent execution



#### concurrent execution

mutex request



at this point, thread 0 holds the mutex. another thread cannot acquire the mutex until thread 0 releases the mutex also called the **critical section.** 

concurrent execution

mutex request mutex acquire



### Allowed to request

concurrent execution

mutex acquire

mutex request

mutex request





concurrent execution

mutex request

mutex acquire mutex request

est mutex acquire

#### disallowed!



#### Thread 0 has released the mutex

concurrent execution

mutex request

mutex acquire mutex request

tylers\_account -= 1 mutex release



Thread 1 can take the mutex and enter the critical section

#### concurrent execution

mutex request

mutex acquire mutex request

tylers\_account -= 1 | mute

mutex release mutex acquire



A mutex restricts the number of allowed interleavings Critical section are mutually exclusive: i.e. they cannot interleave

Thread 1 can take the mutex and enter the critical section

concurrent execution

mutex request

mutex acquire mutex request

tylers account -= 1

mutex release mutex acquire

tylers\_account += 1

mutex release



It means we don't have to think about 3 address code

Thread 1 can take the mutex and enter the critical section

concurrent execution

mutex request m

mutex acquire mutex request

tylers\_account -= 1

mutex release mutex acquire

tylers\_account += 1

mutex release

### Make sure to unlock your mutex!



time	mutex request	mutex request
	mutex acquire	mutex acquire
	tylers_account -= 1	<pre>tylers_account += 1</pre>
	<pre>printf("warning!\n");</pre>	mutex release
Ļ		

concurrent execution

Thread 1 is stuck!

time

mutex request

mutex acquire

tylers\_account -= 1 mutex request

printf("warning!\n")

• C++ provides a mutex. Example

### Make sure to unlock your mutex!



time	mutex request	mutex request
	mutex acquire	mutex acquire
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concurrent execution

Thread 1 is stuck!

time

mutex request

mutex acquire

tylers\_account -= 1 mutex request

printf("warning!\n")

time	mutex request	mutex request	
	mutex acquire	mutex acquire	time
	tylers_account -= 1	<pre>tylers_account += 1</pre>	
	<pre>printf("warning!\n");</pre>	mutex release	
•	$\checkmark$		

Example

concurrent execution

mutex request

mutex acquire

mutex request

tylers\_account -= 1

printf("warning!\n")

Thread 1 is stuck!

1

• What about timing?

- What about timing?
  - Overhead of acquiring/releasing mutex
  - Cache flushing (heavier weight than coherence)
  - Reduces parallelism

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  - Overhead of acquiring/releasing mutex
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### in a parallel system without the mutex



- What about timing?
  - Overhead of acquiring/releasing mutex
  - Cache flushing (heavier weight than coherence)
  - Reduces parallelism

in a parallel system with the mutex



Long periods of waiting in the threads

Three properties

• **Mutual exclusion** - Only 1 thread can hold the mutex at a time. Critical sections cannot interleave

> Other threads are allowed to request, but not acquire until the thread that has acquired the mutex releases it.

concurrent execution

mutex request

mutex acquire mutex request

uest mutex acquire

### disallowed!

Three properties

• **Mutual exclusion** - Only 1 thread can hold the mutex at a time. Critical sections cannot interleave

> Other threads are allowed to request, but not acquire until the thread that has acquired the mutex releases it.

concurrent execution



Three properties

• **Deadlock Freedom** - If a thread has requested the mutex, and no thread currently holds the mutex, the mutex must be acquired by one of the requesting threads

concurrent execution

mutex request mutex request

Three properties

 Deadlock Freedom - If a thread has requested the mutex, and no thread currently holds the mutex, the mutex must be acquired by one of the requesting threads

> Program cannot hang here Either thread 0 or thread 1 must acquire the mutex

concurrent execution

mutex request mutex request

Three properties

 Deadlock Freedom - If a thread has requested the mutex, and no thread currently holds the mutex, the mutex must be acquired by one of the requesting threads

> Program cannot hang here Either thread 0 or thread 1 must acquire the mutex

concurrent execution

mutex request mutex request mutex acquire

allowed

Three properties

• **Deadlock Freedom** - If a thread has requested the mutex, and no thread currently holds the mutex, the mutex must be acquired by one of the requesting threads

Program cannot hang here Either thread 0 or thread 1 must acquire the mutex

concurrent execution

mutex request mutex request mutex acquire

also allowed

Three properties

• Starvation Freedom (*Optional*) - A thread that requests the mutex must eventually obtain the mutex.

Thread 1 (yellow) requests the mutex but never gets it

concurrent execution



Three properties

• Starvation Freedom (*Optional*) - A thread that requests the mutex must eventually obtain the mutex.

Thread 1 (yellow) requests the mutex but never gets it

concurrent execution



Difficult to provide in practice and timing variations usually provide this property naturally
## Properties of mutexes

Recap: three properties

- Mutual Exclusion: Two threads cannot be in the critical section at the same time
- **Deadlock Freedom**: If a thread has requested the mutex, and no thread currently holds the mutex, the mutex must be acquired by one of the requesting threads
- Starvation Freedom (*optional*): A thread that requests the mutex must eventually obtain the mutex.

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- Mutual exclusion
- Multiple mutexes

Lets say I have two accounts:

- Business account
- Personal account
- Need to protect both of them using a mutex
  - Easy, we can just the same mutex
  - Show implementation

Lets say I have two accounts:

- Business account
- Personal account
- No reason individual accounts can't be accessed in parallel

Lets say I have two accounts:

- Business account
- Personal account
- No reason individual accounts can't be accessed in parallel



Long periods of waiting in the threads

Mutexes are objects. We can create multiple versions of them to protect different shared data.

MutexP for personal account MutexB for business account



Mutexes are objects. We can create multiple versions of them to protect different shared data.

MutexP for personal account MutexB for business account



Mutexes are objects. We can create multiple versions of them to protect different shared data.

MutexP for personal account MutexB for business account



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Mutexes are objects. We can create multiple versions of them to protect different shared data.

MutexP for personal account MutexB for business account

Critical sections across different mutexes can overlap

**Code example** 

# Managing multiple mutexes

Consider this increasingly elaborate scheme

My accounts start being audited by two agents:

- UCSC
- IRS
- They need to examine the accounts at the same time. They need to acquire both locks

# Managing multiple mutexes

Consider this increasingly elaborate scheme

My accounts start being audited by two agents:

- UCSC
- IRS
- Code example

• Our program deadlocked! What happened?



UCSC

mutexP request











• Our program deadlocked! What happened?

IRS has the personal mutex and won't release it until it acquires the business mutex. UCSC has the business mutex and won't release it until it acquires the personal mutex.

This is called a deadlock!



- Our program deadlocked! What happened?
- Fix: Acquire mutexes in the same order
- Proof sketch by contradiction
  - Thread 0 is holding mutex X waiting for mutex Y
  - Thread 1 is holding mutex Y waiting for mutex X

Assume the order that you acquire mutexes is X then Y Thread 1 cannot hold mutex Y without holding mutex X. Thread 1 cannot hold mutex X because thread 0 is holding mutex X Thus the deadlock cannot occur

- Our program deadlocked! What happened?
- Fix: Acquire mutexes in the same order

#### **Double check with testing**

- Proof sketch by contradiction
  - Thread 0 is holding mutex X waiting for mutex Y
  - Thread 1 is holding mutex Y waiting for mutex X

Assume the order that you acquire mutexes is X then Y Thread 1 cannot hold mutex Y without holding mutex X. Thread 1 cannot hold mutex X because thread 0 is holding mutex X Thus the deadlock cannot occur

## Introducing mutual exclusion

Today isn't about performance, but try to keep mutual exclusion sections small!

Code example with overhead

### Programming with mutexes is HARD!

make sure all data conflicts are protected with a mutex

keep critical sections small

balance between having many mutexes (provides performance) but gives the potential for deadlocks

We haven't even talked about implementations!

### Atomic RMWs

Other ways to implement accounts?

Atomic Read-modify-write (RMWs): primitive instructions that implement a read event, modify event, and write event indivisibly, i.e. it cannot be interleaved.

```
atomic_fetch_add(atomic_int * addr, int value) {
    int tmp = *addr; // read
    tmp += value; // modify
    *addr = tmp; // write
}
```

other operations: max, min, etc.

```
Tyler's coffee addiction:
```

```
m.lock();
tylers_account -= 1;
m.unlock();
```

Tyler's employer

```
m.lock();
tylers_account += 1;
m.unlock();
```

time

```
Tyler's coffee addiction:
```

```
m.lock();
tylers_account -= 1;
m.unlock();
```

Tyler's employer

```
m.lock();
tylers_account += 1;
m.unlock();
```

time

Tyler's coffee addiction:

Tyler's employer

tylers\_account -= 1;

tylers\_account += 1;

time

*Tyler's coffee addiction:* 

atomic\_fetch\_add(&tylers\_account, -1);

Tyler's employer

atomic\_fetch\_add(&tylers\_account, 1);

time

*Tyler's coffee addiction:* 

atomic\_fetch\_add(&tylers\_account, -1);

Tyler's employer

atomic\_fetch\_add(&tylers\_account, 1);

atomic\_fetch\_add(&tylers\_account, -1);

time

time

atomic\_fetch\_add(&tylers\_account, 1);

Tyler's coffee addiction:

atomic\_fetch\_add(&tylers\_account, -1);

Tyler's employer

atomic\_fetch\_add(&tylers\_account, 1);

atomic\_fetch\_add(&tylers\_account, -1);

time

time

atomic\_fetch\_add(&tylers\_account, 1);

Two indivisible events. Either the coffee or the employer comes first either way, account is 0 afterwards.

Tyler's coffee addiction:

atomic\_fetch\_add(&tylers\_account, -1);

Tyler's employer

atomic\_fetch\_add(&tylers\_account, 1);

atomic\_fetch\_add(&tylers\_account, -1);

time

atomic\_fetch\_add(&tylers\_account, 1);

Code example

#### Atomic RMWs

Pros? Cons?

#### Atomic RMWs

Pros? Cons?

Not all architectures support RMWs (although more common with C++11)

Limits critical section (what if account needs additional updating?)

atomic types need to propagate through the entire application

# Finish

- Next two classes: Implementing mutexes
  - Reasoning about correctness
  - Reasoning about fairness
  - Reasoning about performance
- Final class in module:
  - specialized mutexes