## **Executive Summary**

# **Parallel Programming**

**Recitation Session 5** 

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Matrix Multiplication

■ Data partitioning with parallel matrix multiplication

■ How to manage threads

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Matrix Multiplication

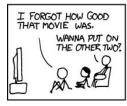
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## Outline

### **Parallel Matrix Multiplication**

### Data partitioning based on

- Output matrix C
- Input matrix **A** and input matrix **B**









Source: http://www.xkcd.com

1 Matrix Multiplication

2 Thread Pools

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Matrix Multiplication Matrix Multiplication

### **Output Partitioning (2 Threads)**

```
// Thread 0
for (i=0; i<N/2; i++) {
  for (j=0; j<N; j++) {
    for (k=0; k<N; k++) {
      c[i][j] += a[i][k] * b[k][j];
    }
  }
}

// Thread 1
for (i=N/2; i<N; i++) {
  for (j=0; j<N; j++) {
    for (k=0; k<N; k++) {
      c[i][j] += a[i][k] * b[k][j];
    }
  }
}</pre>
```

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Matrix Multiplication

## **Input Partitioning: Locking**

```
Object[][] lock; // Lock "matrix"
// Thread 0
for (i=0; i<N; i++) {
    for (j=0; j<N; j++) {
        synchronized(lock[i][j]) {
            for (k=0; k<N/2; k++) {
                c[i][j] += a[i][k] * b[k][j];
            }
        }
    }
}
// Thread 1
for (i=0; i<N; i++) {
    for (j=0; j<N; j++) {
        synchronized(lock[i][j]) {
            for (k=N/2; k<N; k++) {
                c[i][j] += a[i][k] * b[k][j];
            }
        }
    }
}</pre>
```

### Input Partitioning: Error in Last Week's Slides

```
// Thread 0
for (i=0; i<N; i++) {
   for (j=0; j<N; j++) {
      c[i][j] += a[i][k] * b[k][j];
      }
}

From the ad 1

for (i=0; i<N; i++) {
   for (j=0; j<N; j++) {
   for (k=N/2; k<N; k++) {
      c[i][j] += a[i][k] * b[k][j];
   }
}

}
</pre>
```

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#### Overhead?

- A complete row is locked
- Actual lock contention will be moderate to low
- In practice the slow-down with respect to output partitioning is moderate (only a few percent)

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Matrix Multiplication Thread Pools

### **Input Partitioning: Fine-Grain Locking**

#### **Outline**

```
Object[][] lock; // Lock "matrix"
// Thread 0
for (i=0; i<N; i++) {</pre>
  for (j=0; j<N; j++) {</pre>
    for (k=0; k<N/2; k++) {
      synchronized(lock[i][j]) {
        c[i][j] += a[i][k] * b[k][j];
}
// Thread 1
for (i=0; i<N; i++) {</pre>
  for (j=0; j<N; j++) {</pre>
    for (k=N/2; k<N; k++) {
      synchronized(lock[i][j]) {
        c[i][j] += a[i][k] * b[k][j];
 }
}
```

Significant overhead:

About 3 times slower than coarse-grain locking

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2 Thread Pools

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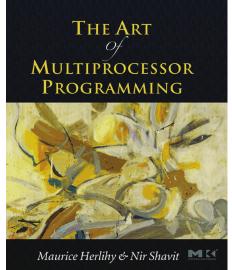
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Thread Pools

#### The Art of Multiprocessor Programming

### **Thread Overhead**

Source of the following material about Thread Pools: "The Art of Multiprocessor Programming" by Maurice Herlihy and Nir Shavit



- Threads require resources
  - Memory for stacks
  - Setup, teardown
- Scheduler overhead
- Worse for short-lived threads

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Thread Pools

#### **Thread Pools**

#### Thread Pool = Abstraction

■ More sensible to keep a pool of long-lived threads

Thread Pools

- Threads assigned short-lived tasks
  - Runs the task
  - Rejoins pool
  - Waits for next assignment

- Insulate programmer from platform
  - Big machine, big pool
  - And vice-versa
- Portable code
  - Runs well on any platform
  - No need to mix algorithm/platform concerns

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Thread Pools		Thread Pools			
ExecutorService Interface		Future <t></t>			

In java.util.concurrent:

- Task = Runnable object
  - If no result value expected
  - Calls run() method.
- Task = Callable<T> object
  - If result value of type T expected
  - Calls T call() method.

```
Callable < T > task = ...;
...
Future < T > future = executor.submit(task);
...
T value = future.get();
```

- Submitting a Callable<T> task returns a Future<T> object
- The Future's get() method blocks until the value is available

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Thread Pools

Runnable task = ...; Future <?> future = executor.submit(task); future.get();

- Submitting a Runnable task returns a Future<?> object
- The Future's get() method blocks until the computation is complete

- Executor Service submissions are purely advisory in nature
- The executor
  - Is free to ignore any such advice
  - And could execute tasks sequentially . . .

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Fibonacci			Disclaimer		

$$F(n) := \begin{cases} 1, & n = 0 \\ 1, & n = 1 \\ F(n-1) + F(n-2), & n > 1 \end{cases}$$

- Potential parallelism
- Dependencies

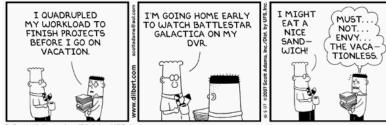
- This Fibonacci implementation is very inefficient
  - So don't deploy it!
- But illustrates our point
  - How to deal with dependencies

Thread Pools Outro

## **Multithreaded Fibonacci**

## **Summary**

# Enjoy your vacation!



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