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# COMP 322: Fundamentals of Parallel Programming

## Lecture 2: Computation Graphs, Ideal Parallelism

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# Async and Finish Statements for Task Creation and Termination (Recap)

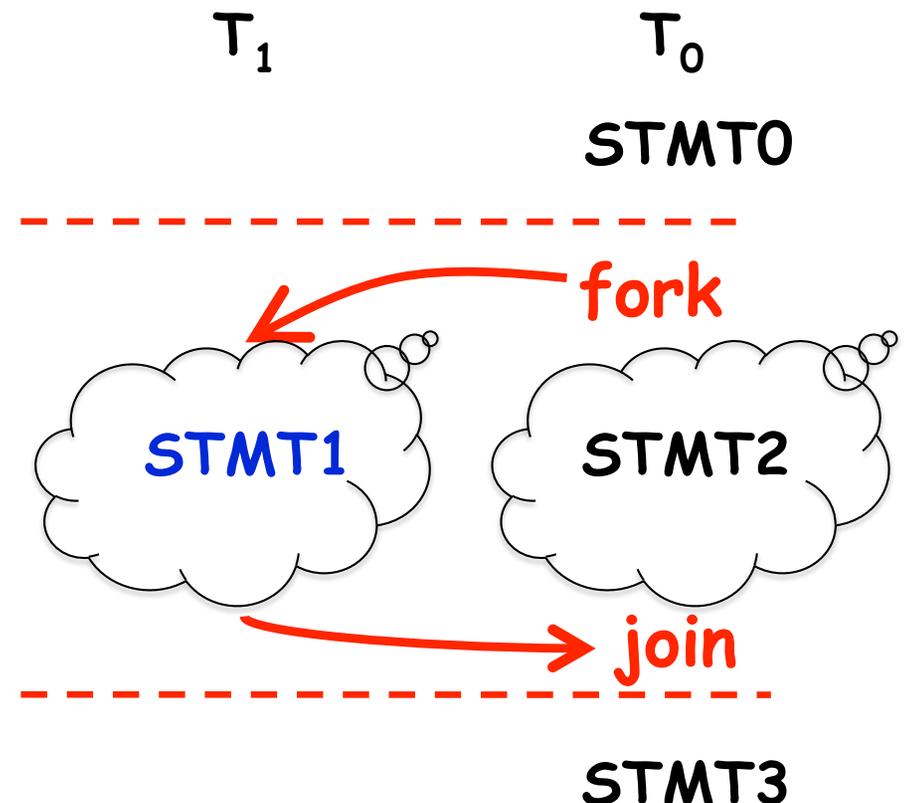
## async S

- Creates a new child task that executes statement S

```
// T0 (Parent task)
STMT0;
finish { //Begin finish
  async {
    STMT1; //T1 (Child task)
  }
  STMT2; //Continue in T0
           //Wait for T1
} //End finish
STMT3; //Continue in T0
```

## finish S

- Execute S, but wait until *all* asyncs in S's scope have terminated.



# One possible solution to Problem #1 in Worksheet 1 (without statement reordering)

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```
1. finish {
2.     async { Watch COMP 322 video for topic 1.2 by 1pm on Wednesday
3.         Watch COMP 322 video for topic 1.3 by 1pm on Wednesday
4.     }
5.     async Make your bed
6.     async { Clean out your fridge
7.         Buy food supplies and store them in fridge }
8.     finish { async Run load 1 in washer
9.             async Run load 2 in washer }
10.    async Run load 1 in dryer
11.    async Run load 2 in dryer
12.    async Call your family
13. }
14. Post on Facebook that you're done with all your tasks!
```



# Another possible solution to Problem #1 in Worksheet 1 (with statement reordering)

---

1. `finish {`
2.     `async Make your bed`
3.     `async { Clean out your fridge`
4.         `Buy food supplies and store them in fridge }`
5.     `async { Run load 1 in washer`
6.         `Run load 1 in dryer }`
7.     `async { Run load 2 in washer`
8.         `Run load 2 in dryer }`
9.     `Watch COMP 322 video for topic 1.2 by 1pm on Wednesday`
10.    `Watch COMP 322 video for topic 1.3 by 1pm on Wednesday`
11.    `Call your family`
12.    `}`
13. `Post on Facebook that you're done with all your tasks!`



# Is this a correct solution for Problem #2 in Worksheet 1?

---

```
1. finish {
2.   for (int i = 0 ; i < N ; i++)
3.     for (int j = 0 ; j < N ; j++)
4.       for (int k = 0 ; k < N ; k++)
5.         async {
6.           C[i][j] = C[i][j] + A[i][k] * B[k][j];
7.         } // async
8.} // finish
```

**Data race bug! Reads and writes can occur in parallel on the same  $C[i][j]$  location, in this example!**



# One Possible Solution to Problem #2 in Worksheet 1 (Parallel Matrix Multiplication)

---

```
1. finish {
2.   for (int i = 0 ; i < N ; i++)
3.     for (int j = 0 ; j < N ; j++)
4.       async {
5.         for (int k = 0 ; k < N ; k++)
6.           C[i][j] = C[i][j] + A[i][k] * B[k][j];
7.       } // async
8.} // finish
```

*This program generates  $N^2$  parallel async tasks, one to compute each  $C[i][j]$  element of the output array. Additional parallelism can be exploited within the inner  $k$  loop, but that would require more changes than inserting `async` & `finish`.*



# Another Possible Solution to Problem #2 in Worksheet 1 (Parallel Matrix Multiplication)

---

```
1. finish {
2.   for (int i = 0 ; i < N ; i++)
3.     async finish for (int j = 0 ; j < N ; j++)
4.       async finish for (int k = 0 ; k < N ; k++)
5.         C[i][j] = C[i][j] + A[i][k] * B[k][j];
6. } // finish
```

*What is the impact of finish in lines 3 and 4? Compare with:*

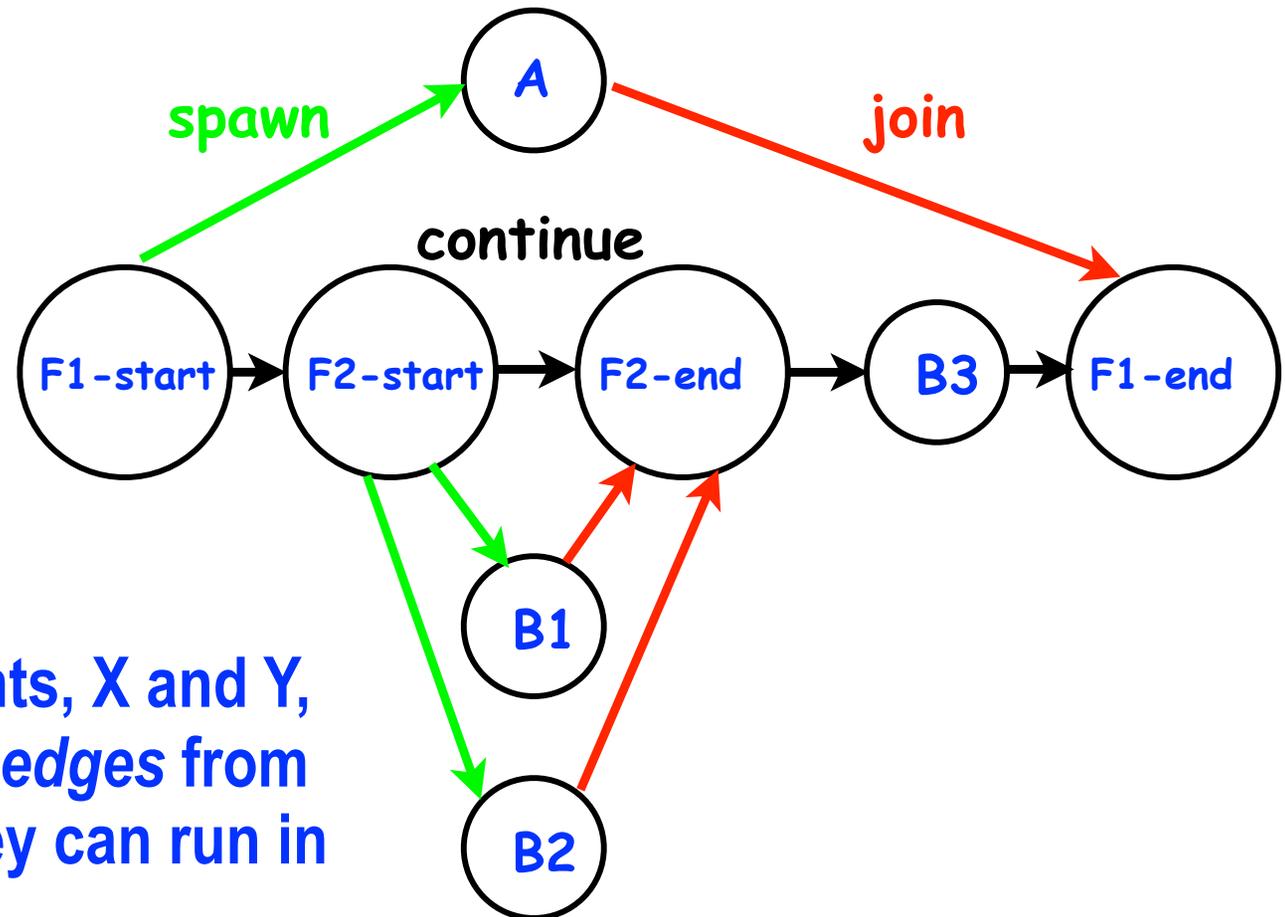
```
7. finish {
8.   for (int i = 0 ; i < N ; i++)
9.     async for (int j = 0 ; j < N ; j++)
10.      async for (int k = 0 ; k < N ; k++)
11.        C[i][j] = C[i][j] + A[i][k] * B[k][j];
12. } // finish
```



# Which statements can potentially be executed in parallel with each other?

```
1.  finish { // F1
2.    async A;
3.  finish { // F2
4.    async B1;
5.    async B2;
6.  } // F2
7.  B3;
8. } // F1
```

## Computation Graph



**Key idea:** If two statements, X and Y, have *no path of directed edges* from one to the other, then they can run in parallel with each other.



# Computation Graphs

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- **A Computation Graph (CG) captures the dynamic execution of a parallel program, for a specific input**
- **CG nodes are “steps” in the program’s execution**
  - **A step is a sequential subcomputation without any async, begin-finish and end-finish operations**
- **CG edges represent ordering constraints**
  - **“Continue” edges define sequencing of steps within a task**
  - **“Spawn” edges connect parent tasks to child async tasks**
  - **“Join” edges connect the end of each async task to its IEF’s end-finish operations**
- **All computation graphs must be acyclic**
  - **It is not possible for a node to depend on itself**
- **Computation graphs are examples of “directed acyclic graphs” (dags)**



# Complexity Measures for Computation Graphs

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## Define

- $\text{TIME}(N)$  = execution time of node  $N$
- $\text{WORK}(G)$  = sum of  $\text{TIME}(N)$ , for all nodes  $N$  in CG  $G$ 
  - $\text{WORK}(G)$  is the total work to be performed in  $G$
- $\text{CPL}(G)$  = length of a longest path in CG  $G$ , when adding up execution times of all nodes in the path
  - Such paths are called *critical paths*
  - $\text{CPL}(G)$  is the length of these paths (critical path length, also referred to as the *span* of the graph)
  - $\text{CPL}(G)$  is also the smallest possible execution time for the computation graph



# What is the critical path length of this parallel computation?

```
1. finish { // F1
2.   async A; // Boil water & pasta (20)
3.   finish { // F2
4.     async B1; // Chop veggies (5)
5.     async B2; // Brown meat (10)
6.   } // F2
7.   B3; // Make pasta sauce (5)
8. } // F1
```

Step B1



Step B2



Step B3



Step A

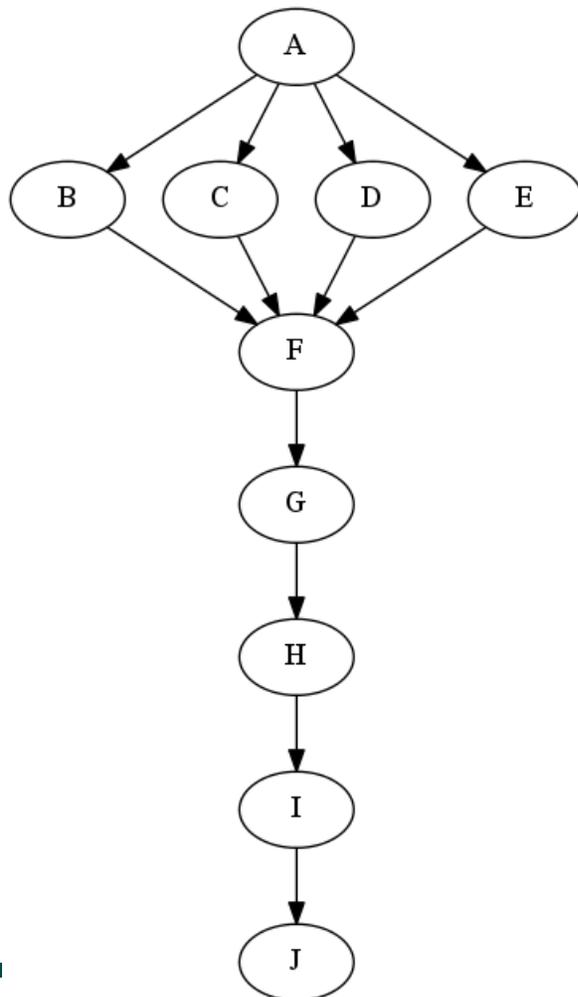




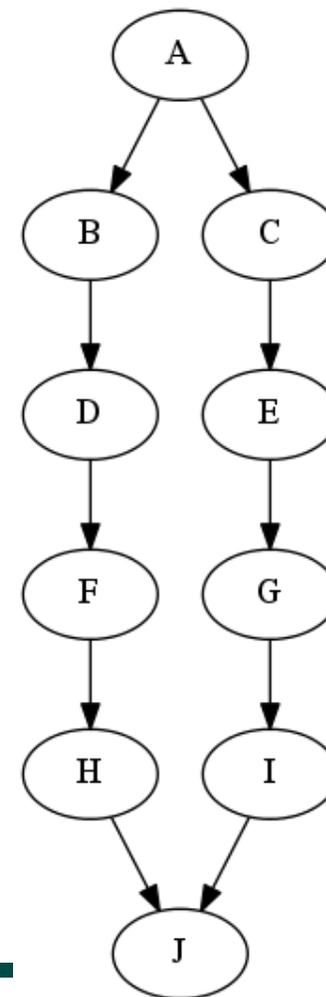
# Which Computation Graph has more ideal parallelism?

Assume that all nodes have  $\text{TIME} = 1$ , so  $\text{WORK} = 10$  for both graphs.

Computation Graph 1



Computation Graph 2



# Data Races

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A data race occurs on location  $L$  in a program execution with computation graph  $CG$  if there exist steps (nodes)  $S1$  and  $S2$  in  $CG$  such that:

1.  $S1$  does not depend on  $S2$  and  $S2$  does not depend on  $S1$ , i.e.,  $S1$  and  $S2$  can potentially execute in parallel, and
  2. Both  $S1$  and  $S2$  read or write  $L$ , and at least one of the accesses is a write.
- A data-race is an error. The result of a read operation in a data race is undefined. The result of a write operation is undefined if there are two or more writes to the same location.
  - Above definition includes all “potential” data races i.e., we consider it to be a data race even if  $S1$  and  $S2$  end up executing on the same processor.



# Data Race Example: Buggy Matrix Multiply with $N = 2$

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```
1. finish {
2.   for (int i = 0 ; i < N ; i++)
3.     for (int j = 0 ; j < N ; j++)
4.       for (int k = 0 ; k < N ; k++)
5.         async {
6.           C[i][j] = C[i][j] + A[i][k] * B[k][j];
7.         } // async
8.} // finish
```

**No directed edge in computation graph between  $S6(i=0,j=0,k=0)$  and  $S6(i=0,j=0,k=1)$ , but both read and write  $C[0][0]$ .**



# Reminders

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- **IMPORTANT:**
  - Send email to [comp322-staff@rice.edu](mailto:comp322-staff@rice.edu) if you do not have access to Piazza site (otherwise use Piazza for class communications, as far as possible)
  - Bring your laptop to today's lab at 7pm on Wednesday (Section A01: DH 1064, Section A02: DH 1070)
  - Watch videos for topic 1.4 for next lecture on Friday
- **Complete each week's assigned quizzes on edX by 11:59pm that Friday. This week, you should submit quizzes for lecture & demonstration videos for topics 1.1, 1.2, 1.3, 1.4**
- **HW1 will be assigned on Jan 15th and be due on Jan 28th**
- **See course web site for syllabus, work assignments, due dates, ...**
  - <http://comp322.rice.edu>

