



DISCUSSION CLASS

CS 141 F 20



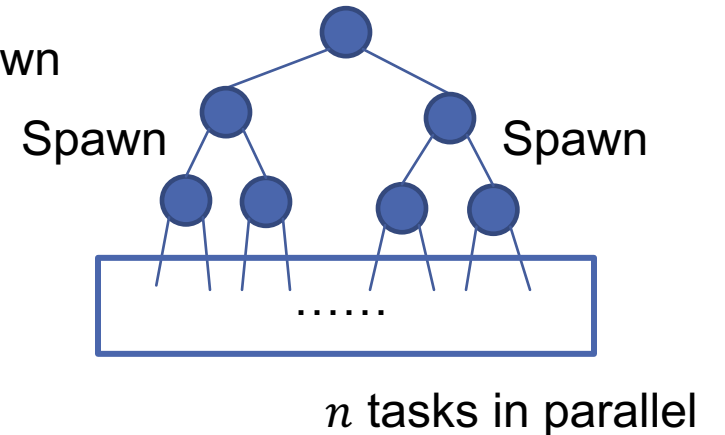
A NEW MODEL TO ANALYZE COMPLEXITY

- For sequential programs, we used RAM model
 - Arithmetic operations, memory access done in constant time
 - Worst case is considered
 - There is only one thread
- Need new model to analyze complexity of parallel programs
 - Incorporate parallel operations/multiple threads: Binary fork-join model!

BINARY FORK-JOIN MODEL

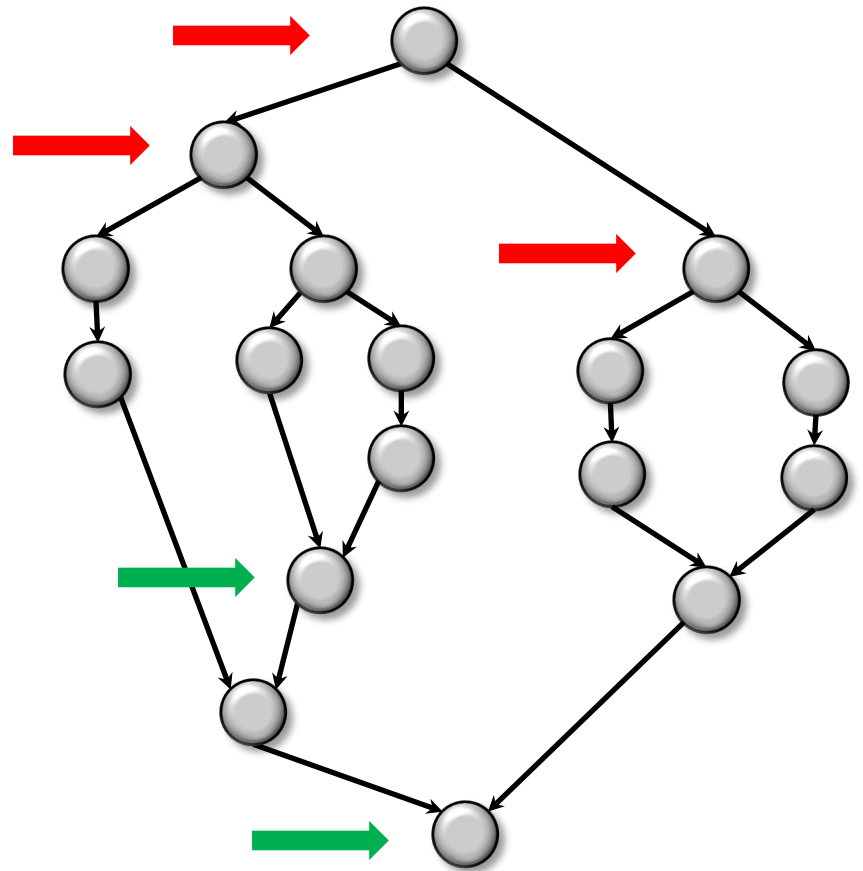
- Computation starts from one thread
- A thread can perform operations, such as:
 - Any sequential programming operations (arithmetic, memory access, etc.)
 - Spawn: start (fork) a new thread working on the next statement
 - Sync: previous forked processors synchronize (join) here
 - Parallel for: can be simulated by using $O(\log n)$ spawns, perform the computation of the for loops in parallel
- No concurrent write to the same memory location (or needs to be specified)

$\log n$ levels of spawn



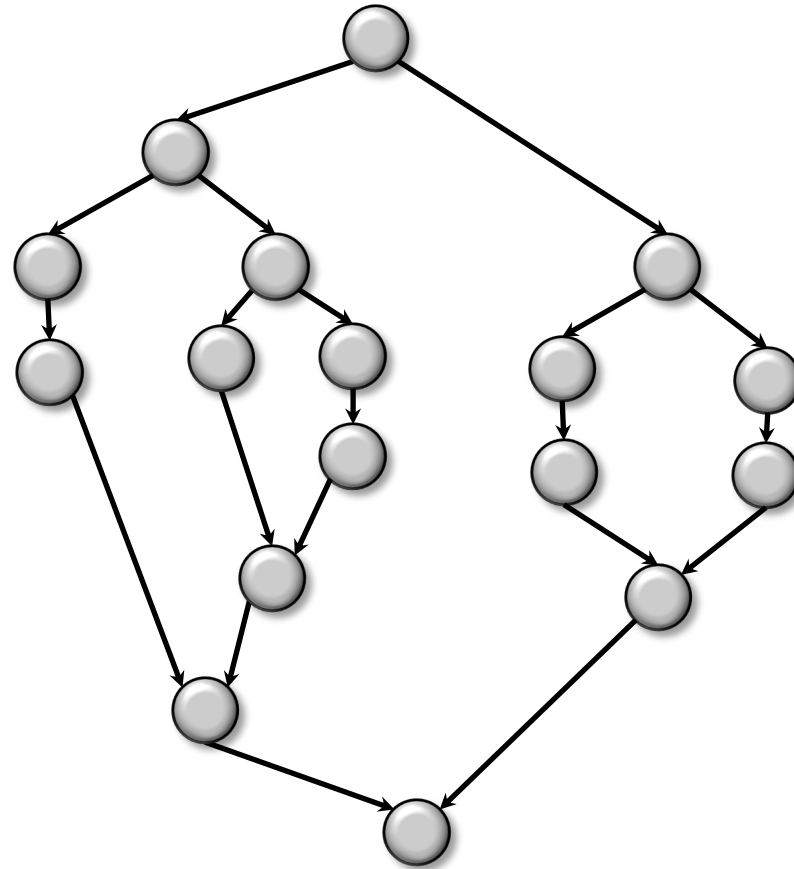
■ spawn 

■ sync 



COST MODEL: WORK-SPAN

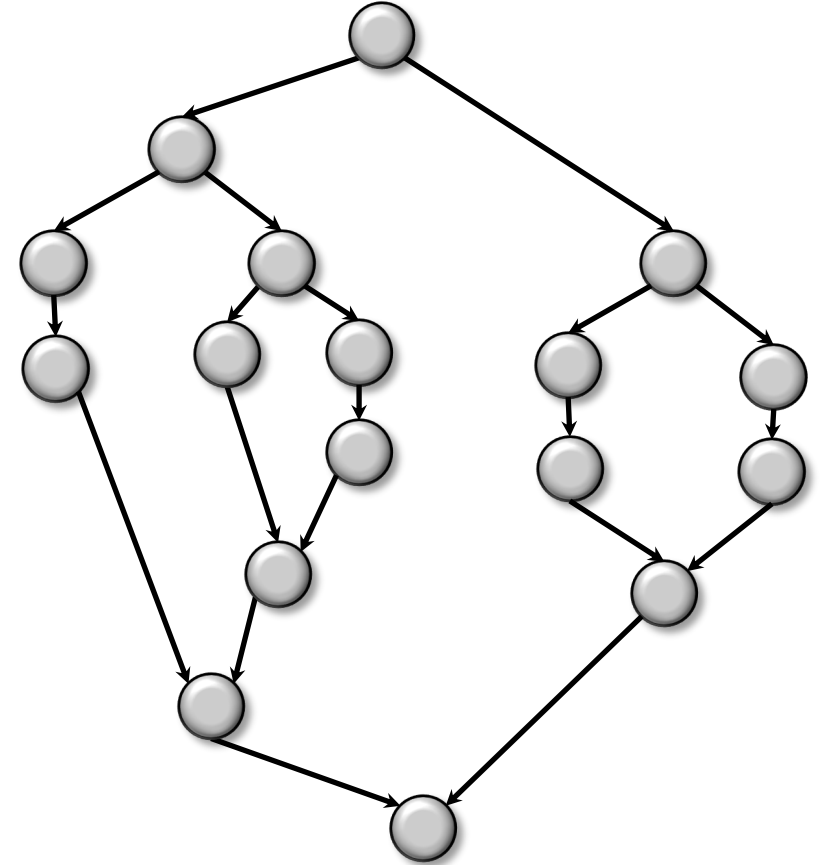
- For all computations, draw a DAG
 - $A \rightarrow B$ means that B can be performed only when A has been finished
- Work: the total number of operations
- Span (depth): the longest length of chain



DAG shows dependencies in the algorithm

WORK

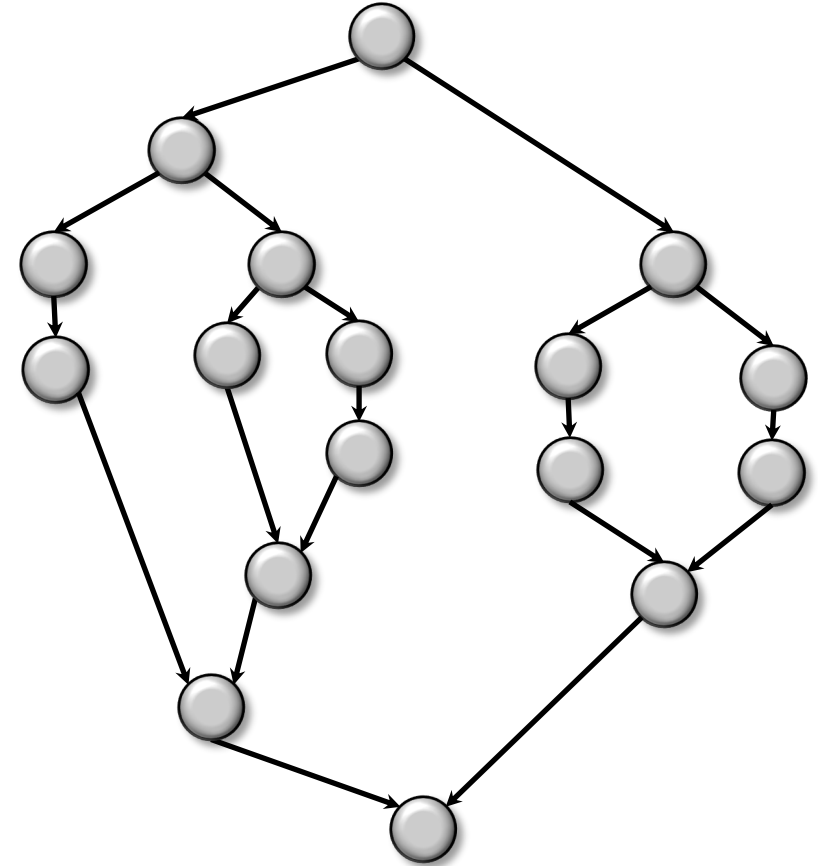
- Work: total number of operations
 - Sequential running time when the algorithm runs on one processor
 - Work-efficiency: work no more than the best sequential algorithm
 - Goal: make the parallel algorithm efficient when a small number of processor are available



We include all the nodes in the tree

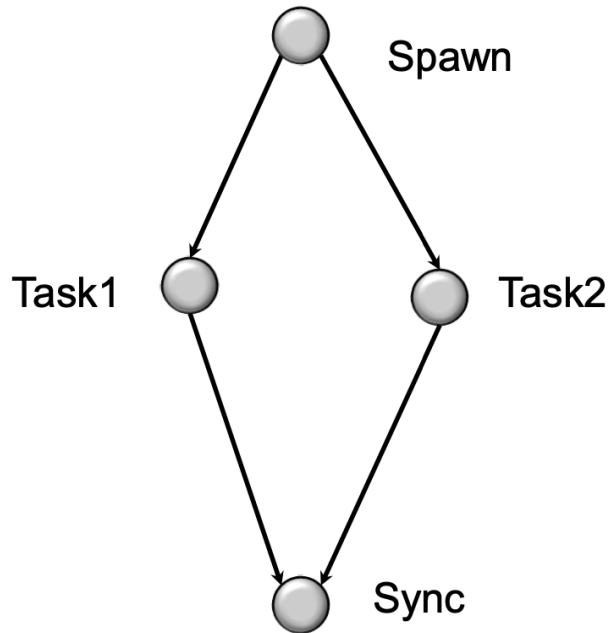
SPAN

- Span(depth): The longest dependency chain
 - Total time required if there are infinite number of processors
 - Make span polylogarithmic (in most of the cases)
 - Goal: make the parallel algorithm faster and faster when more and more processors are available - scalability



Include the depth of the tree (length of the longest path from root to leaf)

COMPUTE WORK AND SPAN



- Assume we have an algorithm in the following form:

spawn *Task1*

Task2

sync

- Work = work of Task1 + work of Task2
- Span = max(span of Task1, span of Task2)

SCHEDULING A PARALLEL ALGORITHM

- A DAG with work W and span D can be executed using p processors in time $O(W/p+D)$
- Both W and D matter!
 - For small p , W is more important
 - For large p , D is more important

MERGE SORT (SEQUENTIAL)

```
MergeSort(int *A, int n)
```

```
1  if (n<=1) return
```

```
2  MergeSort(A, n/2)
```

```
3  MergeSort(A + n/2, n-n/2)
```

```
4  A = merge(A, n/2, A + n/2, n-n/2)
```

```
    return
```

MERGE SORT (PARALLEL)

```
MergeSort(int *A, int n)
1  if (n<=1) return
2  spawn MergeSort(A, n/2)
3  MergeSort(A + n/2, n-n/2)
4  sync
5  A = merge(A, n/2, A + n/2, n-n/2)
   return
```

TIME COMPLEXITY

- Sequential Algorithm
 - $W(n) = 2W(n/2) + O(n) = O(n \log n)$
- Parallel Algorithm
 - $W(n) = 2W(n/2) + O(n) = O(n \log n)$
 - $S(n) = S(n/2) + O(n) = O(n)$

LONGEST PALINDROME

- Given a string, find the length of the longest palindrome
 - madam = 5
 - babad = 3 (bab, aba)
 - dbabad = 3 (bab, aba)
 - cbbd = 2 (bb)
 - a = 1
 - ac = 1 (a, c)

NAÏVE SOLUTION (SEQUENTIAL)

```
int longestPalindrome(String str)
1  n = str.length, ans = 1
2  for i = 1 to n
3      for j = i+1 to n
4          if (isPalindrome(str, i, j))
5              ans = max(ans, j-i+1)
    return ans
```

NAÏVE SOLUTION (PARALLEL)

```
int longestPalindrome(String str)
1  n = str.length, ans = 1
2  parallel for i = 1 to n
3      parallel for j = i+1 to n
4          if (isPalindrome(str, i, j))
5              ans = max(ans, j-i+1)
    return ans
```

TIME COMPLEXITY OF NAÏVE SOLUTION

- Sequential Algorithm
 - $W(n) = O(n^3)$
- Parallel Algorithm
 - $W(n) = O(n^3)$
 - $S(n) = (O(\log n) + O(\log n)) * O(n) = O(n \log n)$

DP ALGORITHM (SEQUENTIAL)

```
int longestPalindrome(string str)
1  n = str.length, ans = 1
2  mem[n][n] = {0} // 2d array initialized
3  for i = 1 to n
4      mem[i][i] = 1
5  for i = 2 to n
6      if str[i] == str[i-1]
7          mem[i-1][i] = 1
8  for len = 3 to n
9      for i = 1 to n-len
10         j = i + len - 1
11         if (str[i] == str[j] && mem[i+1][j-1])
12             mem[i][j] = 1
13             ans = len
    return ans
```

DP ALGORITHM (PARALLEL)

```
int longestPalindrome(string str)
1  n = str.length, ans = 1
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10         j = i + len - 1
11         if (str[i] == str[j] && mem[i+1][j-1])
12             mem[i][j] = 1
13             ans = len
return ans
```

TIME COMPLEXITY OF DP ALGORITHM

- Sequential Algorithm

- $W(n) = O(n) + O(n) + O(n^2) = O(n^2)$

- Parallel Algorithm

- $W(n) = O(n) + O(n) + O(n)*O(n) = O(n^2)$

- $S(n) = O(\log n) + O(\log n) + O(n)*O(\log n) = O(n \log n)$