# CS528 Scheduling of Dependent Tasks

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### **Outline**

- P<sub>m</sub> | p<sub>i</sub> pmtn | C<sub>max</sub> : Linear time solution
- Q<sub>m</sub> | p<sub>j</sub>, pmtn | C<sub>max</sub> : Poly time solution
- Q<sub>m</sub> | ptmn | ΣC<sub>i</sub> Optimal Solution
- $P_m | p_j | C_{max}$ 
  - ILP Solution : Exponential
  - 2 Approx, 2-1/m approx.
  - LPT: 3/2 and 4/3 Approx
- $P_m|p_i=1|\Sigma w_iU_i$  Optimal Solution
- $P_m|p_i|\Sigma U_i$  NPC, Heuristic and Counter example
- $P_m | pmtn, p_j | \Sigma U_j$  in NPC
- P<sub>m</sub> | prec, p<sub>j</sub> = 1 | C<sub>max</sub> in NPC
   2 Approx

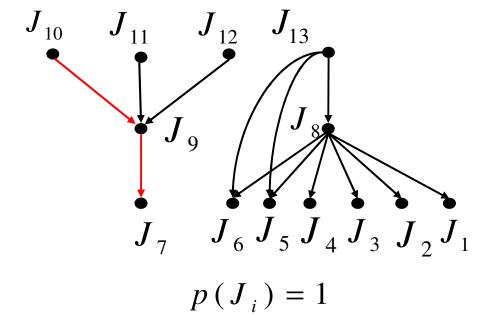
## Scheduling of Dependent Tasks

## Precedence constraints (prec)

Before certain jobs are allowed to start processing, one or more jobs first have to be completed.

### Definition

- Successor
- Predecessor
- Immediate successor
- Immediate predecessor
- Transitive Reduction

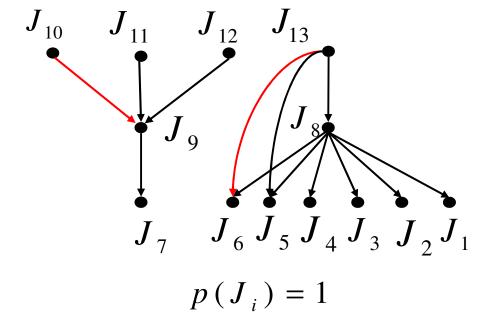


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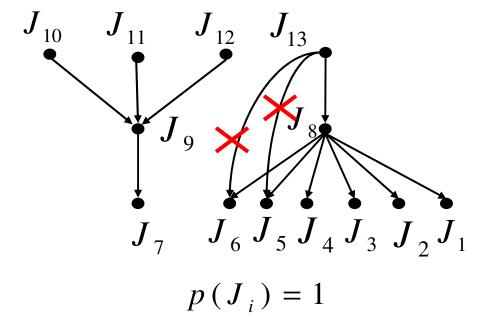


## Precedence constraints (prec)

One or more job have to be completed before another job is allowed to start processing. *Prec : Arbitrary acyclic graph* 

### Definition

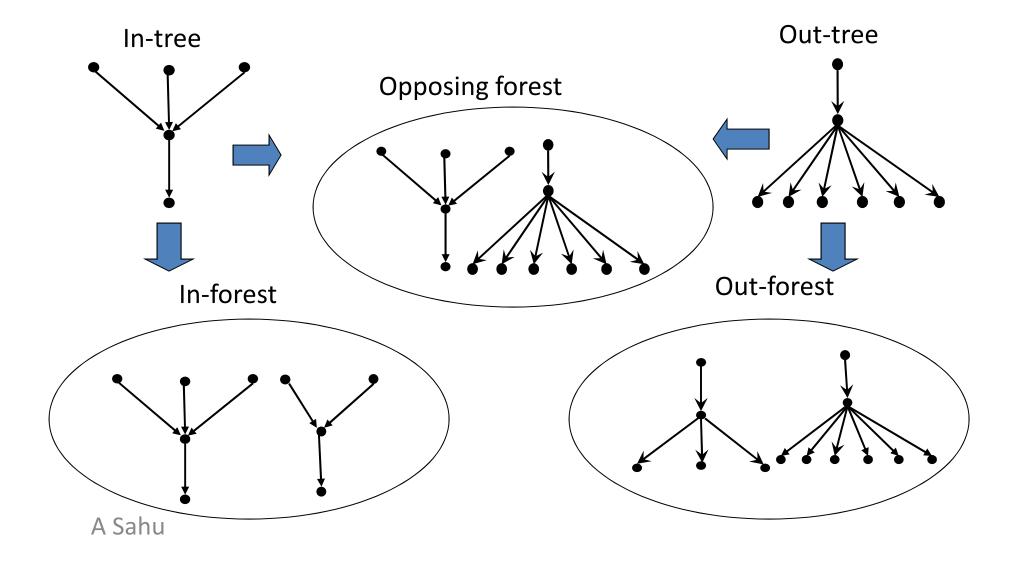
- Successor
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- Immediate successor
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- Transitive Reduction



### Special precedence constraints

- In-tree (Out-tree)
- In-forest (Out-forest)
- Opposing forest
- Interval orders
- Series-parallel orders
- Level orders

### Special precedence constraints



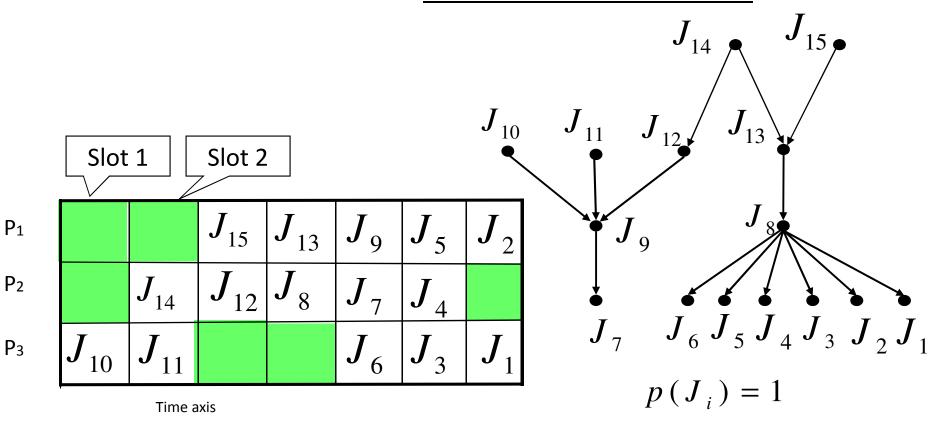
## $P_{m} | prec, p_{j} = 1 | C_{max} (m \ge 1)$

- Processor Environment
  - m identical processors are in the system.
- Job characteristics
  - Precedence constraints are given by a precedence graph;
  - Preemption is not allowed;
  - The release time of all the jobs is 0.
- Objective function
  - $-C_{max}$ : the time the last job finishes execution.
  - If  $c_j$  denotes the finishing time of  $J_j$  in a schedule  $S_j$

$$C_{max} = max_{1 \le j \le n} c_j$$

### **Gantt Chart**

A Gantt chart indicates the time each job spends in execution, as well as the processor on which it executes of some Schedule



## $P_m | prec, p_j = 1 | C_{max}$

#### **Theorem 1**

Pm | prec,  $p_j = 1 | C_{max}$  is NP-complete.

1. Ullman (1976)

$$3SAT \le Pm \mid prec, p_j = 1 \mid C_{max}$$

2. Lenstra and Rinooy Kan (1978)

k-clique 
$$\leq$$
 Pm | prec,  $p_j = 1 | C_{max}$ 

 $P_m$  prec, pj = 1 |  $C_{max}$  is NP-complete.

**Proof: out of Syllabus** 

## $P_m | prec, p_j = 1 | C_{max}$

Mayr (1985)

Theorem 2

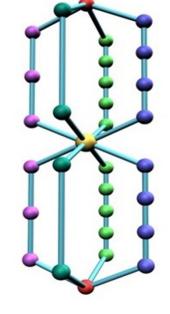
Pm | 
$$p_j = 1$$
, SP |  $C_{max}$  is NP-complete.  
SP: Series - parallel

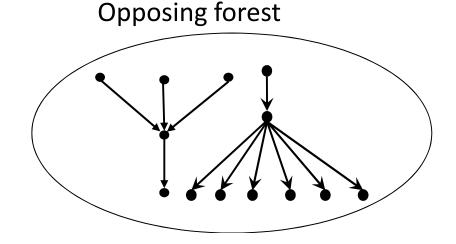
Theorem 3

Pm | 
$$p_i = 1$$
, OF |  $C_{max}$  is NP-complete.

OF: Opposing - forest

**Proof: out of Syllabus** 

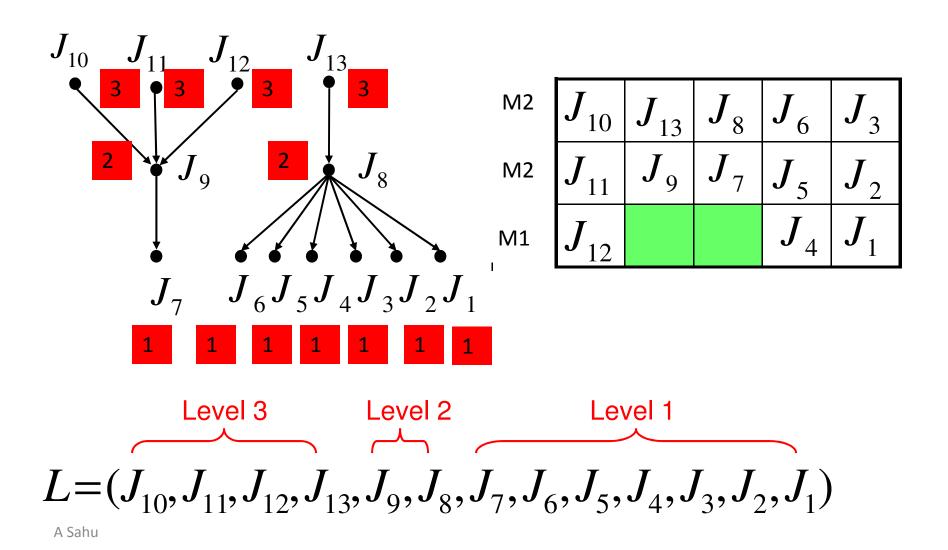




### Hu's HLF/CP Algorithm

- T. C. Hu (1961), Critical Path/Highest Level First
- Assign a level h to each job.
  - If job has no successors, h(j) equals 1.
  - Otherwise, h(j) equals one plus the maximum level of its immediate successors.
- Set up a priority list L by nonincreasing order of the jobs' levels.
- Execute the list scheduling policy on this level based priority list L.

### **HLF/CP** algorithm: Example



### **HLF/CP** algorithm

Time complexity

O(|V|+|E|) (|V| is the number of jobs and |E| is the number of edges in the precedence graph)

- Theorem (Hu, 1961): HLF/CP for Tree
  - The HLF algorithm is optimal for  $P_m \mid p_j = 1$ , in-tree (out-tree)  $\mid C_{max}$ .
  - The HLF algorithm is optimal for  $P_m \mid p_j = 1$ , inforest (out-forest)  $\mid C_{max}$ .



### **HLF/CP** algorithm

N.F. Chen & C.L. Liu (1975)

The approximation ratio of HLF algorithm for the problem with general precedence constraints:

If 
$$m = 2$$
,  $\delta_{HLF} \le 4/3$ .  
If  $m \ge 3$ ,  $\delta_{HLF} \le 2 - 1/(m-1)$ .

### PTAS Algorithms: Pm | prec, $p_j = 1 | C_{max}$

- PTAS : Polynomial Time Approximation Scheme
- Approximation List scheduling policies
  - Graham's list algorithm/Greedy List
    - Discussed in Cilk Lectures: T ≤ 2T\*, Also proved
    - CLR Book Chapter 27, Multi-threaded Algorithm
  - HLF algorithm
  - MSF algorithm

## $P_m | prec, p_j = 1 | C_{max}$

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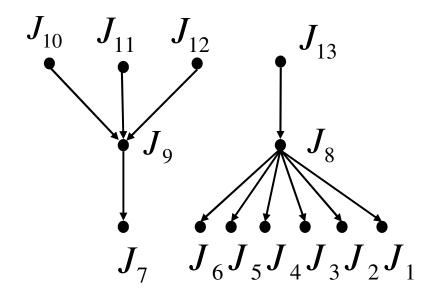
k-clique 
$$\leq$$
 Pm | prec,  $p_j = 1 | C_{max}$ 

 $P_m$  prec, pj = 1 |  $C_{max}$  is NP-complete.

**Proof: out of Syllabus** 

### List scheduling policies

- Set up a priority list L of jobs.
- When a processor is idle, assign the first ready job to the processor and remove it from the list L.



$J_{11}$	$J_9$	$J_8$	$J_6$	$J_3$
$oldsymbol{J}_{10}$	$J_{13}$	$m{J}_7$	$J_{5}$	$J_2$
$oldsymbol{J}_{12}$			$oldsymbol{J}_4$	$J_1$

First job of the list may not be ready

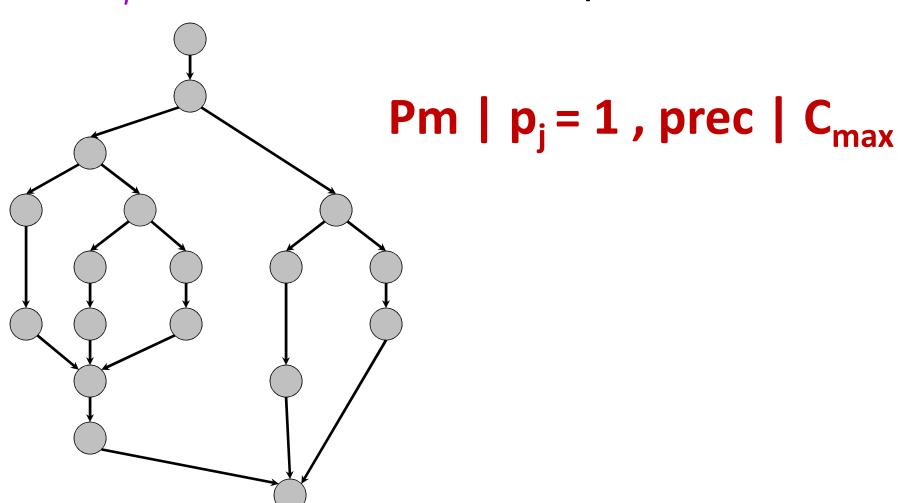
$$L=(J_9,J_8,J_7,J_6,J_5,J_{11},J_{10},J_{12},J_{13},J_4,J_3,J_2,J_1)$$

### Graham's list algorithm

- Graham first analyzed the performance of the simplest list scheduling algorithm.
- List scheduling algorithm with an arbitrary job list is called Graham's list algorithm.
- Approximation ratio for Pm | prec,  $p_j = 1 | C_{max}$   $\delta = 2-1/m$ . (Tight bound!)
  - •Approximation ratio is  $\delta$  if for each input instance, the makespan produced by the algorithm is at most  $\delta$  times of the optimal makespan.

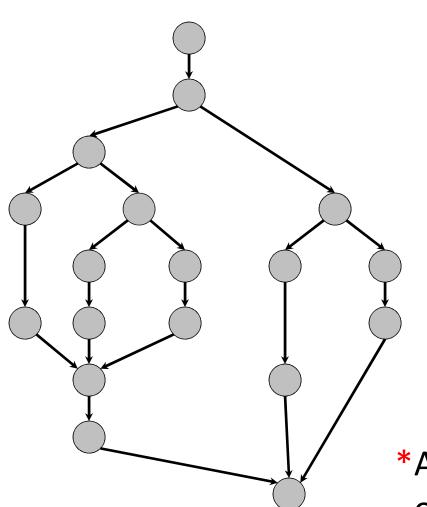
## CP Algo: CLR Book Page 779-783

 $T_P$  = execution time on P processors



### **CP Algorithms**

 $T_P$  = execution time on P processors



$$T_1 = work$$

$$T_{\infty} = span^*$$

### **LOWER BOUNDS**

• 
$$T_P \ge T_1/P$$

$$\bullet T_P \ge T_{\infty}$$

\*Also called *critical-path length* or *computational depth*.

### **CP:** Greedy-Scheduling Theorem

Theorem [Graham '68 & Brent '75].

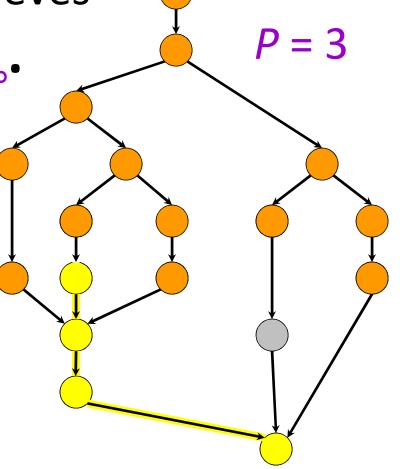
Any greedy scheduler achieves

 $T_P \leq T_1/P + T_{\infty}$ .

### Proof.

# complete steps ≤ T<sub>1</sub>/P, since each complete step performs P work.

# incomplete steps ≤ T<sub>∞</sub>, since each incomplete step reduces the span of the unexecuted dag by 1.



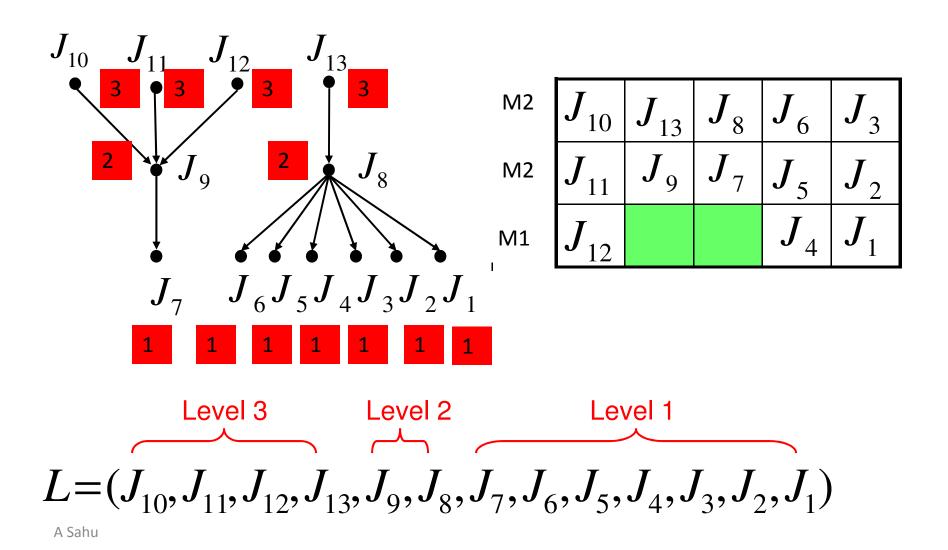
### **CP: Optimality of Greedy**

Corollary. Any greedy scheduler achieves within a factor of 2 of optimal.

*Proof.* Let  $T_P^*$  be the execution time produced by the optimal scheduler. Since  $T_P^* \ge \max\{T_1/P, T_\infty\}$  (lower bounds), we have

$$T_P \le T_1/P + T_{\infty}$$
  
 $\le 2 \cdot \max\{T_1/P, T_{\infty}\}$   
 $\le 2T_P^*$ .

### **HLF/CP** algorithm: Example



### **HLF/CP** algorithm

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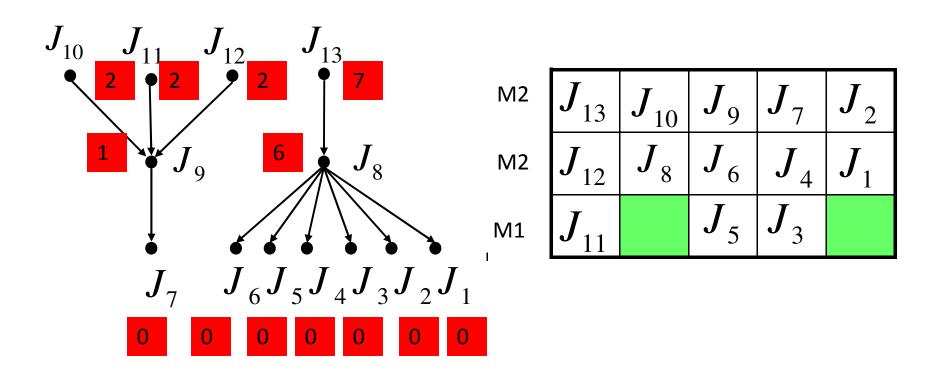
If 
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### **Most Successors First (MSF)**

### Algorithm:

- Set up a priority list L by nonincreasing order of the jobs' successors numbers.
  - (i.e. the job having more successors should have a higher priority in L than the job having fewer successors)
- Execute the list scheduling policy based on this priority list L.

### **Most Successors First algorithm**



$$L = (J_{13}, J_8, J_{12}, J_{11}, J_{10}, J_9, J_7, J_6, J_5, J_4, J_3, J_2, J_1)$$

# **Energy/Power/Temp Aware**Scheduling of Tasks

### **Outline**

- Power Aware
- Task with Hard Deadlines
- Energy Efficiency
- Energy Efficient Scheduling
- Real Time Tasks

# Power Aware Scheduling Vs Energy Aware Scheduling

- Power Budget should not exceed
  - Minimized
  - Monthly Expenses: CAP ===> Solution is EMI
  - Power CAP: If your system have 100W design, at any instance of time you should not run things above 100W
    - Suppose you have 3KW wiring in your home, you have 3 AC with each of 1.5KW rating, At a given time, you can run maximum of 2 AC.
- Total energy budget should not exceed
  - Battery capacity, mah (mobile), AH (UPS)
  - Minimized: EC
  - Power and Time