

## Shop Scheduling

### Applications

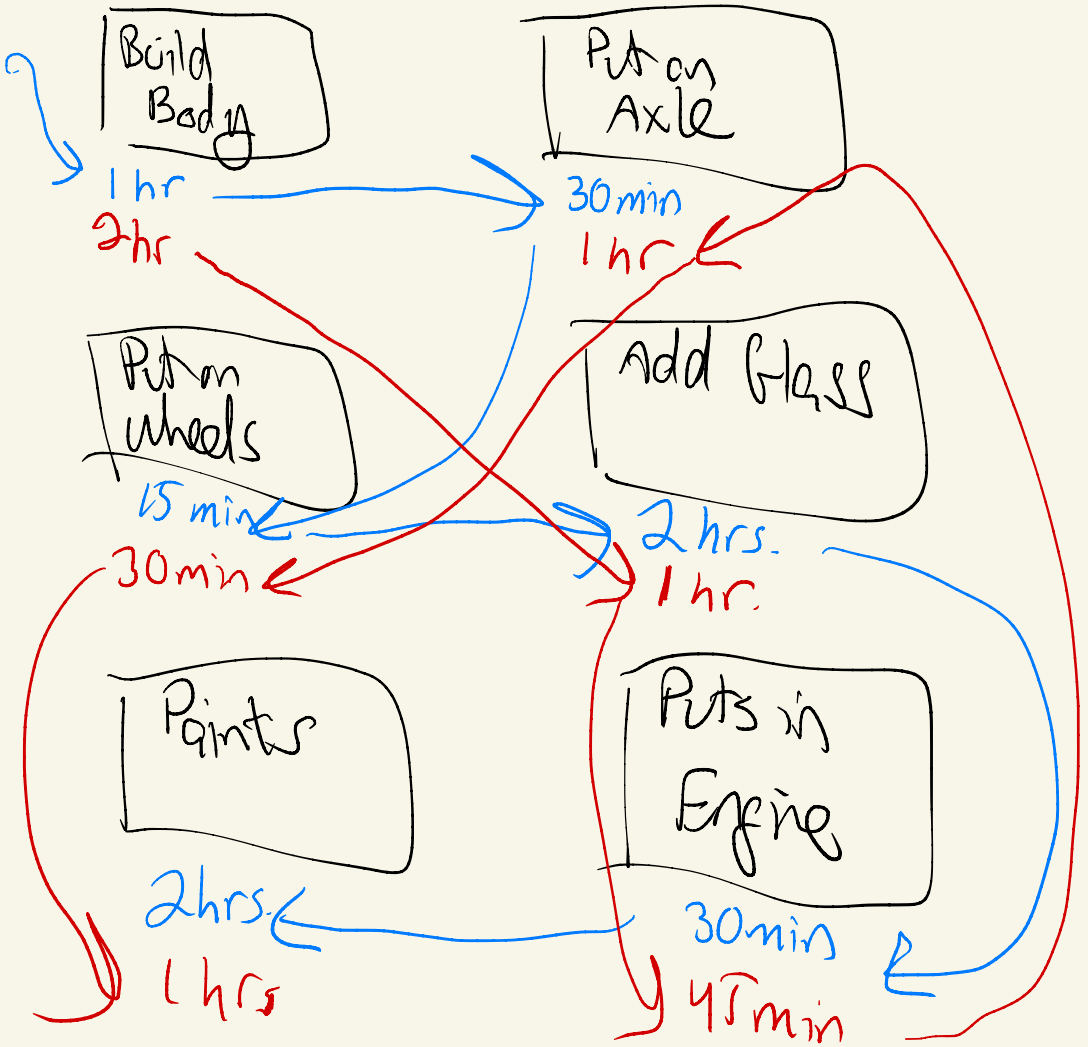
- Model Factory-like Settings
- Also models packet routing
- ...

**Basic Model:** Multiple machines. A jobs consist of **operations**, each operations has a

- processing time  $p_{ij}$
- Machine on which to run  $M_{ij}$

# Car Factory

Job 1 = make a car 1  
Job 2 = make car 2  
...



## Shop Scheduling

### Applications

- Model Factory-like Settings
- Also models packet routing
- ...

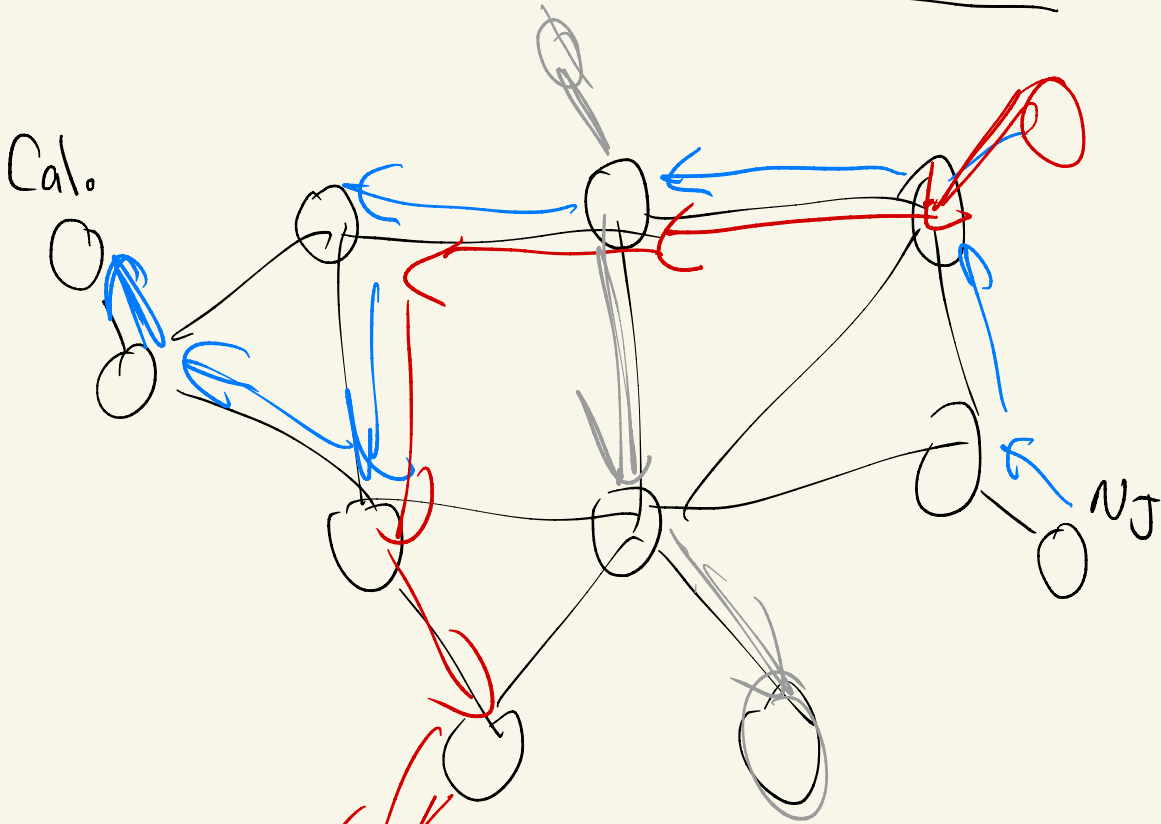
**Basic Model:** Multiple machines. A jobs consist of **operations**, each operations has a

- processing time  $p_{ij}$
- Machine on which to run  $M_{ij}$

• ordering information about the operations of a job

# Packet Routing in Internet

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routers  $\equiv$  machines

jobs  $\equiv$  communication  $\equiv$  sequence of machines  
(e.g. email, zoom call)

# Flow Shop



## Variants of Shop Scheduling

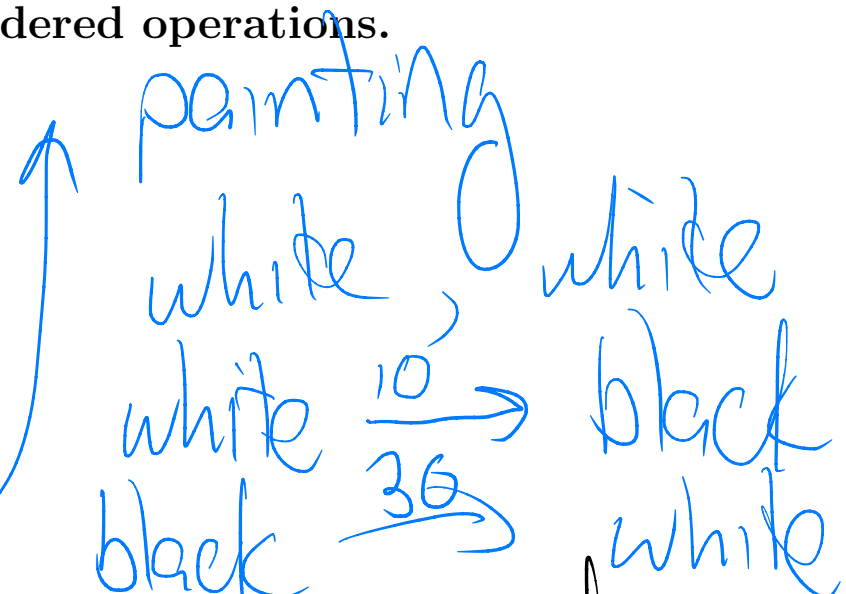
### Basic Types

- Job shop. Each job consist of operations in a linear order
- Flow shop. Job shop, but the linear order is the same for each job. (assembly line)
- Open shop. Each job consists of unordered operations.

job is not a machine

### Other Constraints

- time between operations
  - minimum time (e.g. cooling)
  - maximum time (e.g. hot potato)
- setup at machines (e.g. paint color)
- limited storage between machines



machine is not fixed, & jobs

Graduating

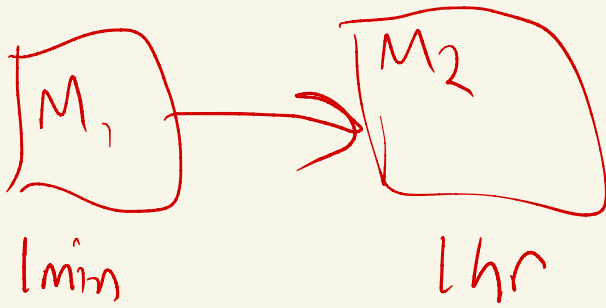
(idea of unordered tasks)

Complete Major Req.

Pass Phys. Ed.

Pay tuition

Get enough non-tech credits



After 1 hr  
1min

1 car proc. of $M_1$	58 cars sitting between $M_1$ & $M_2$	1 car processed on $M_2$	1 car finished
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slow down the rate which  
jobs come at  $M_1$



idle = machine waiting for a job  
 waiting time = jobs waiting for a machine

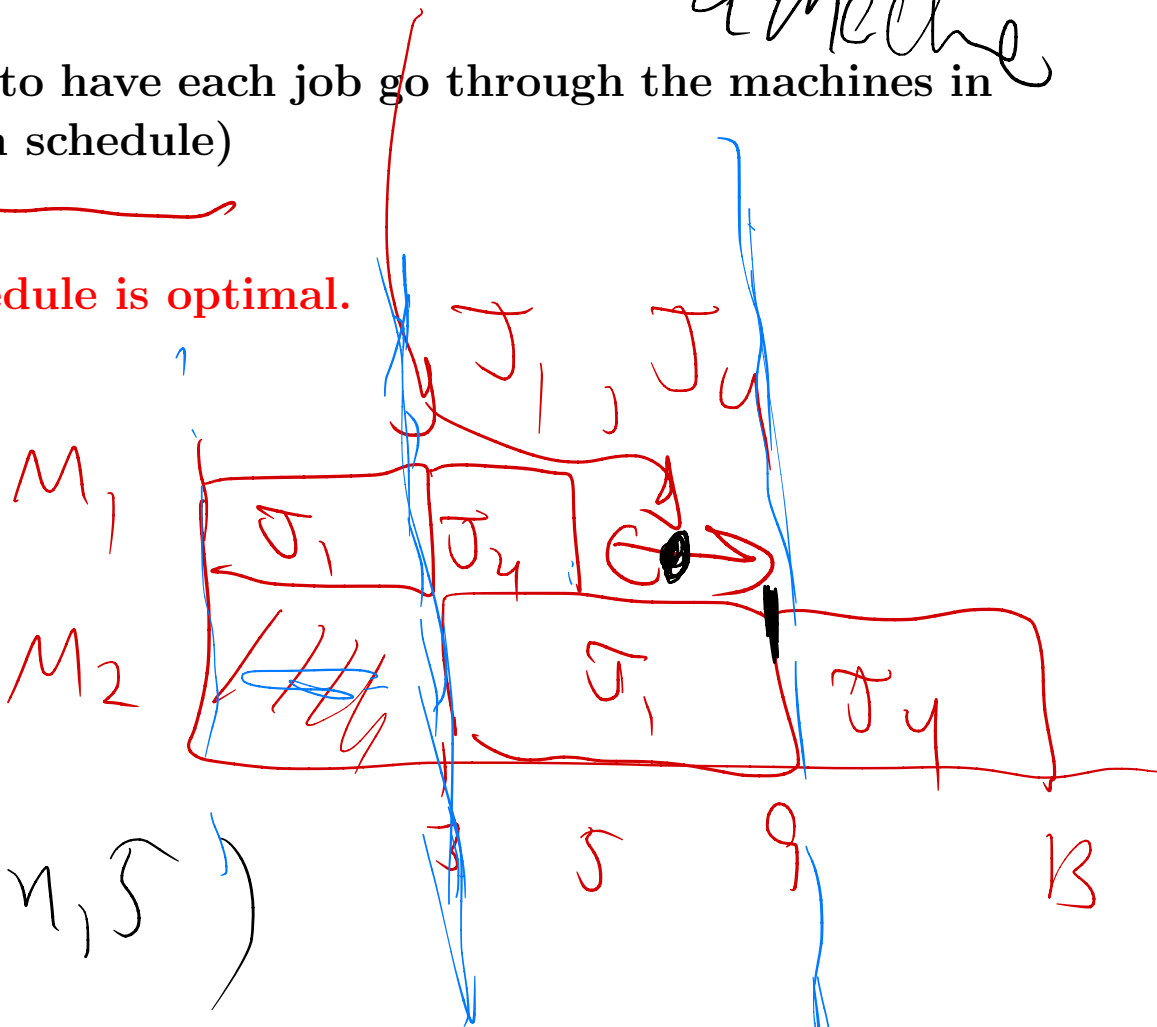
$F || C_{max}$

**First Question:** Is it optimal to have each job go through the machines in the same order? (permutation schedule)

**2 machines. Permutation schedule is optimal.**

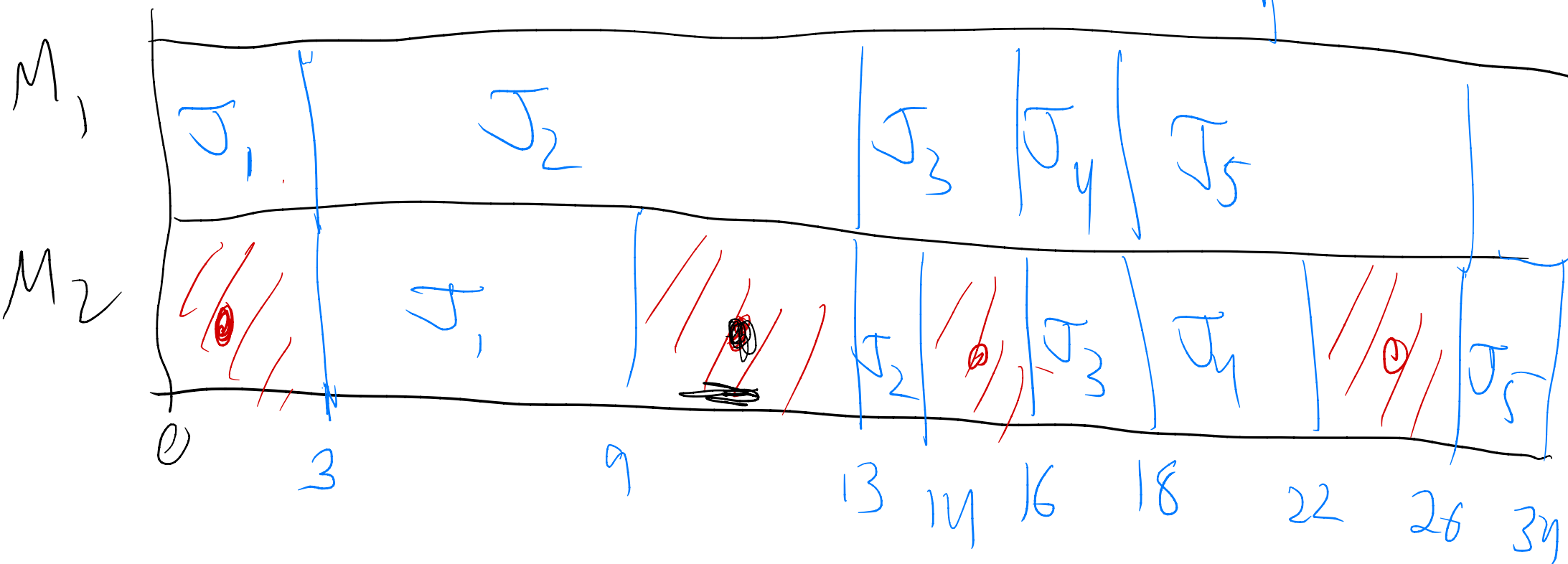
**Example**

$j$	$p_{1j}$	$p_{2j}$
1	3	6
2	10	1
3	3	2
4	2	4
5	8	8

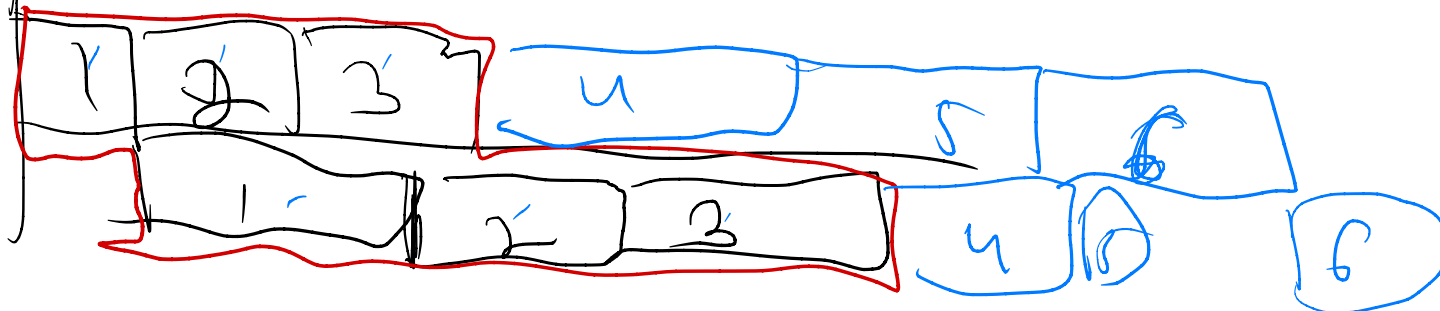


**What is the right algorithm?**

Schedule in  $(1, 2, 3, 4, 5)$



different ex.



## SPT(I)- LPT(II)

### Example

$j$	$p_{1j}$	$p_{2j}$
1	3	6
2	10	1
3	3	2
4	2	4
5	8	8

### Algorithm:

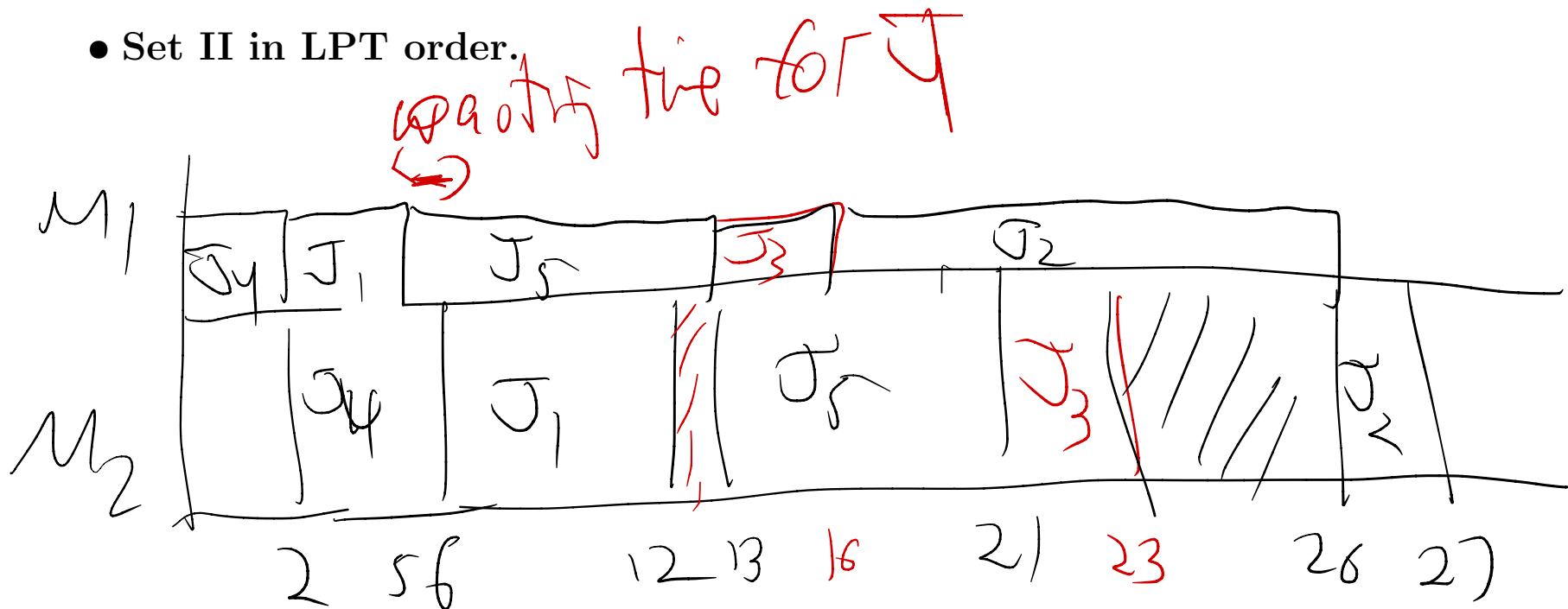
- Partition into two sets:
  - Set I has  $p_{1j} \leq p_{2j}$  (1,4,5)
  - Set II has  $p_{1j} > p_{2j}$  (2,3)
- Run Set I in SPT order by  $p_{1j}$
- Run Set II in LPT order by  $p_{2j}$

good to put early  
good to put late

For this problem: 4,1,5,3,2

Can use interchange arguments to show that this is optimal

- Set I before Set II
- Set I in SPT order
- Set II in LPT order.





## More general flow shop

- 3 machines. There is an optimal permutations schedule.
- 4 machines. Optimal schedule may not be a permutation schedule.

~~The~~ permutation schedules

$$\approx n!$$

$$n = 10 \\ m = 10$$

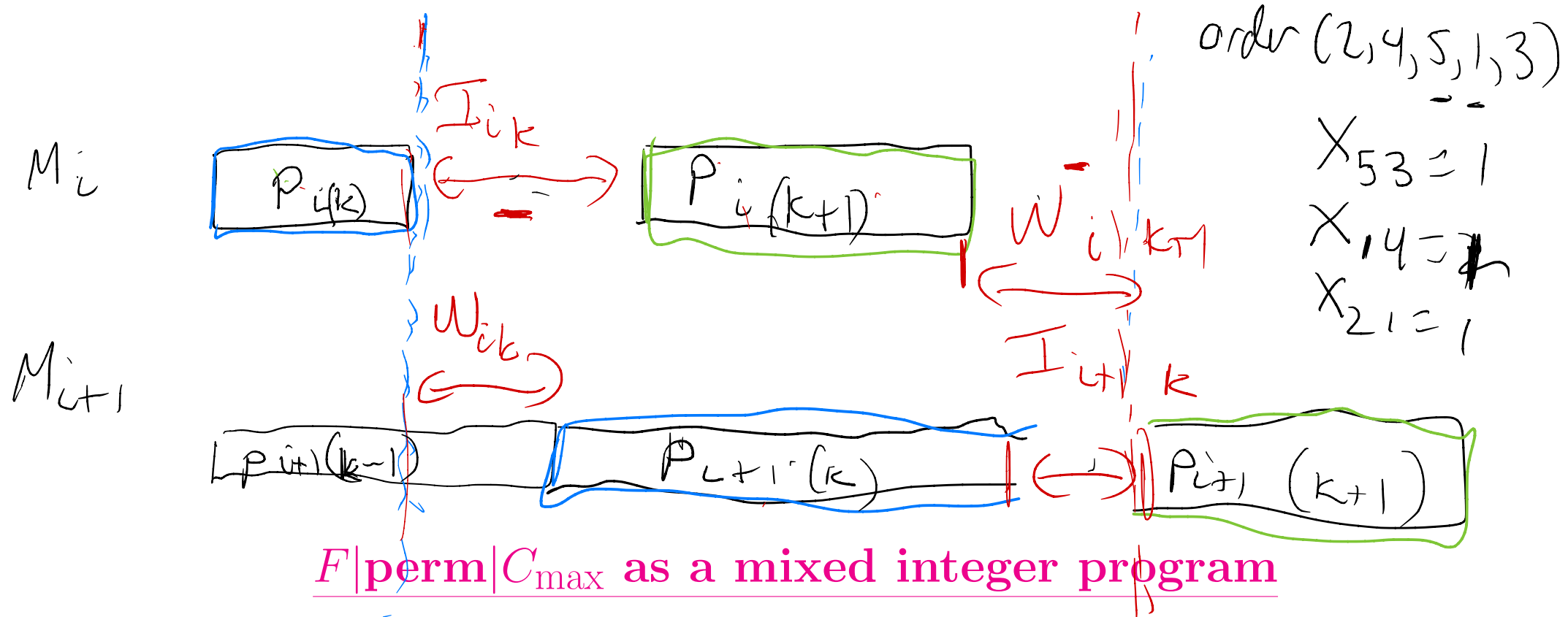
# schedules  $\approx$

$$(n!)^m$$

$$n! = 10!$$

$$\approx 10^8$$

$$(n!)^m = 10^{16}$$



**Decision variables:**  $x_{jk} = 1$  if job  $j$  is  $k$  th in sequence

processing time  
of the  $j$ th job  
to run on ~~the~~  
 $M_i$

**Extra Variables:**

- $I_{ik}$  : idle time on machine  $i$  between jobs in positions  $k$  and  $k+1$ .
- $W_{ik}$  : waiting time of job in position  $k$  between machines  $i$  and  $i+1$ .

**Ideas**

- Makespan is sum of
  - Processing time of first job on all machines
  - processing time of all jobs on machine  $m$
  - Idle time on machine  $m$
- Matching constraints to ensure that each job is in one position and each position has one job
- Relationship between idle time and waiting time constraints.
- Way to map variables so you can talk about  $k$  th job to run, rather than job indexed by  $j$ .

$$P_{q(3)} = x_{13} p_{q_1} + x_{23} p_{q_2} + x_{33} p_{q_3} + x_{43} p_{q_4} + x_{53} p_{q_5}$$

processing time of  $q$ -jobs to run on  $M_3$

$$= p_{q_5}$$

## MIP

$n$  jobs  
 $\sim n^2 \times$  vars  
 polynomial size

Processing time of  $k$  th job to run on machine  $i$ :

$$p_{i(k)} = \sum_{j=1}^n x_{jk} p_{ij}$$

job / machine

Objective

$$\sum_{i=1}^{m-1} p_{i(1)} + \sum_{j=1}^n p_{mj} + \sum_{j=1}^{n-1} I_{mj}$$

machine idle times

Matching Constraints

$$\sum_{j=1}^n x_{jk} = 1 \quad k = 1 \dots n$$

$$\sum_{k=1}^n x_{jk} = 1 \quad j = 1 \dots n$$

- each position has 2 jobs  
 each job has 2 position

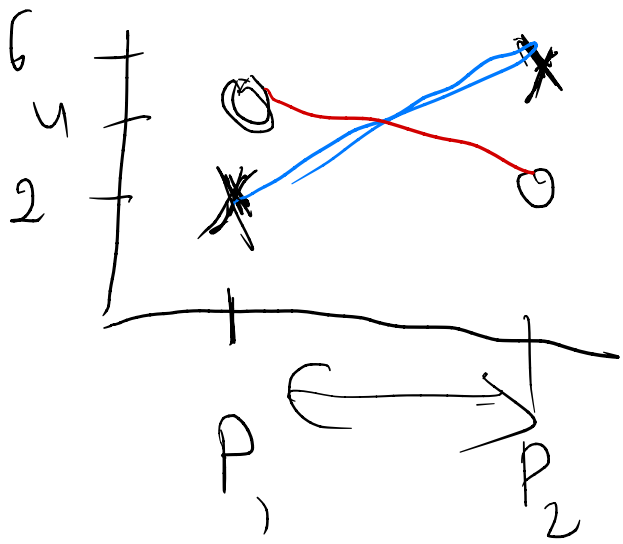
Constraints relating idle and waiting time

$$I_{ik} + p_{i(k+1)} + W_{i,k+1} = W_{ik} + p_{i+1(k)} + I_{i+1,k} \quad \forall k, i$$

$$W_{i1} = 0 \forall i, \quad I_{1k} = 0 \forall k$$

## Other Facts

- $F3||C_{\max}$  is NP-complete.
- $F3|perm|C_{\max}$  is NP-complete.
- Easy case: all operations are the same size. Then flowshop with many objectives is easy.



$X = J_1 (2, 6)$  + slope  
 $O = J_2 (4, 2)$  - slope

$$\begin{pmatrix} -1 & +1 \end{pmatrix} \cdot \begin{pmatrix} P_1 & P_2 \end{pmatrix}$$

### Slope Heuristic

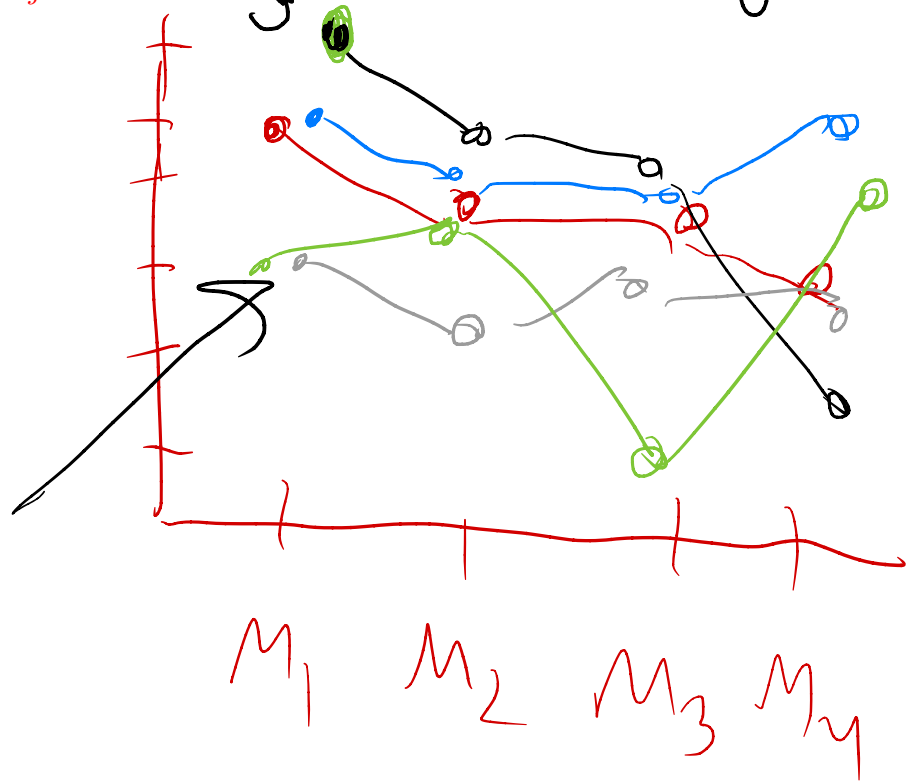
**Motivation:** Think about SPT(I)-LPT(II).

- Early jobs should be small on  $M_1$  and large on  $M_2$ .
- Late jobs should be large on  $M_1$  and small on  $M_2$ .
- Generalize to "slope". Larger slope should go earlier.
- Slope  $A_j = -\sum_{i=1}^m (m - (2i - 1))p_{ij}$

alg slope

### Example

	$J_1$	$J_2$	$J_3$	$J_4$	$J_5$
$M_1$	5	5	3	6	3
$M_2$	4	4	2	4	4
$M_3$	4	4	3	4	1
$M_4$	3	6	3	2	5



slope of  $J_1$

slope  $\approx 0$

$$\begin{pmatrix} -3 & -1 & +1 & +3 \end{pmatrix} \cdot \begin{pmatrix} 5 & 4 & 4 & 3 \end{pmatrix}$$

## Example

### Example

	$J_1$	$J_2$	$J_3$	$J_4$	$J_5$
$M_1$	5	5	3	6	3
$M_2$	4	4	2	4	4
$M_3$	4	4	3	4	1
$M_4$	3	6	3	2	5

### Example: Compute Slopes

	$J_1$	$J_2$	$J_3$	$J_4$	$J_5$
$M_1$	5	5	3	6	3
$M_2$	4	4	2	4	4
$M_3$	4	4	3	4	1
$M_4$	3	6	3	2	5
$A_j$	-6	3	1	-12	3

