

# Just-in-Time Scheduling in Two Stage Flexible Flow Shop

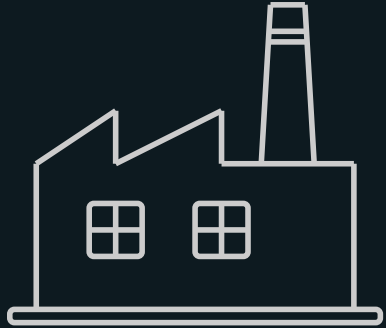
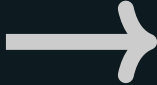
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Klaus Heeger, Danny Hermelin, Yuval Itzhaki, Baruch Schieber, Dvir Shabtay

## Flow Shop



Parts-Plant



Assembly-Plant

# Problem Definition

## Two-Stage Flow Shop Interval Scheduling

$$F2||\sum w_j Z_j$$

Input:

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**Input:** A set of  $n$  jobs, each job  $j$  has:

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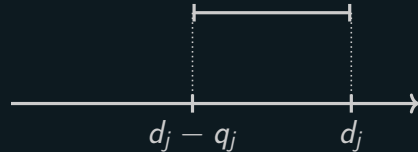
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$$F2|| \sum w_j Z_j$$

**Input:** A set of  $n$  jobs, each job  $j$  has:

- *due date*  $d_j$
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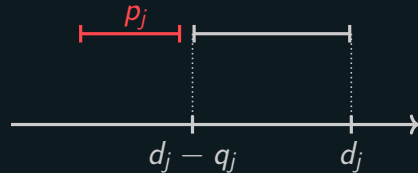
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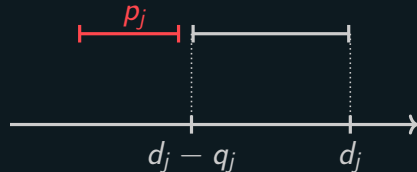
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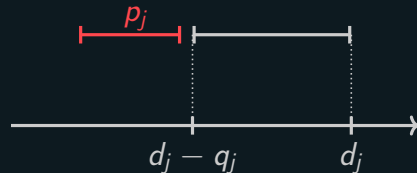
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For the preprocessing we have 1 machine, for the processing we have 1 machine.



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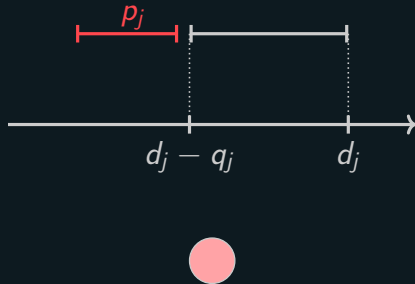
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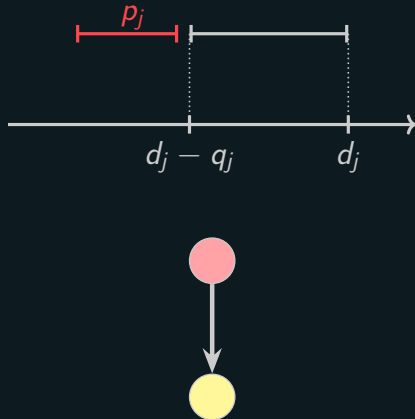
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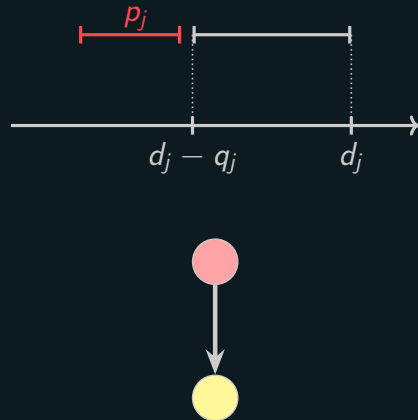
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For the preprocessing we have 1 machine, for the processing we have 1 machine.

**Output:** Maximum weighted JIT schedule.



# Problem Definition

## Two-Stage **Flexible** Flow Shop Interval Scheduling

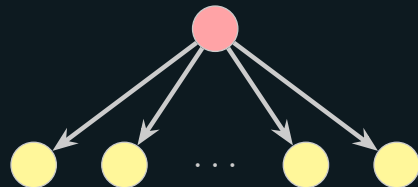
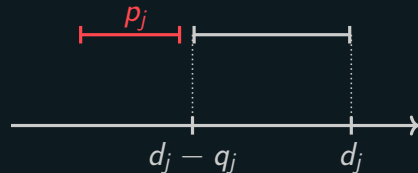
$$F(1, m) || \sum w_j Z_j$$

**Input:** A set of  $n$  jobs, each job  $j$  has:

- due date  $d_j$
- processing time  $q_j$
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- weight  $w_j$

For the preprocessing we have **1 machine**, for the processing we have  **$m$  identical machines**.

**Output:** Maximum weighted JIT schedule.



## Related Work

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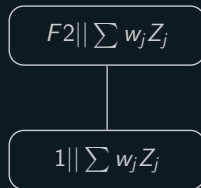
JIT Flow Shop

$$1||\sum w_j Z_j$$



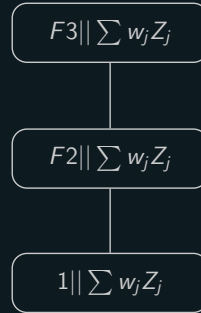
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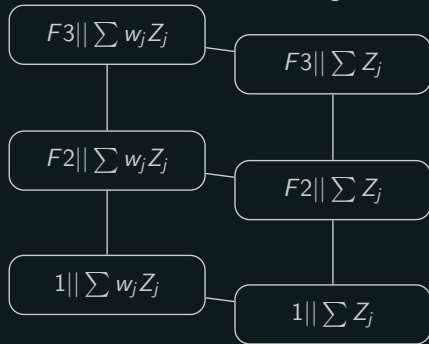
Interval Scheduling

Two-Stage ~~Flexible~~ JIT Flow Shop

Three-Stage ~~Flexible~~ JIT Flow Shop

JIT Flow Shop

Unweighted



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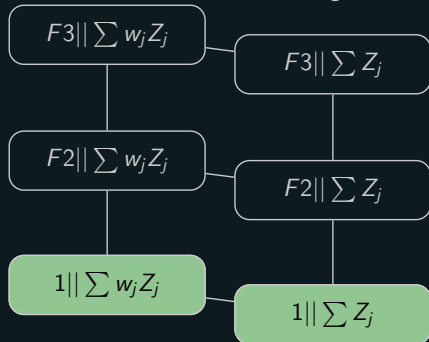
## Interval Scheduling

- $O(n \log n)$  time solvable single machine [Gol88].

## Two-Stage ~~Flexible~~ JIT Flow Shop

## Three-Stage ~~Flexible~~ JIT Flow Shop

### JIT Flow Shop



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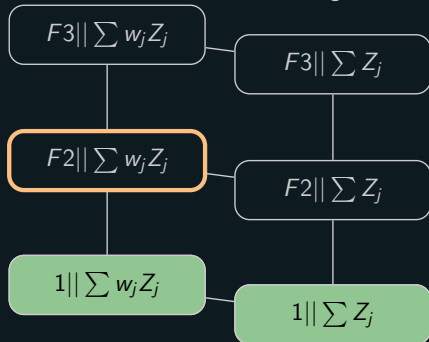
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## Two-Stage ~~Flexible~~ JIT Flow Shop

- NP-hard even when  $q_j = 1$  ( $m = 1$ ) [CY07]

## Three-Stage ~~Flexible~~ JIT Flow Shop

### JIT Flow Shop



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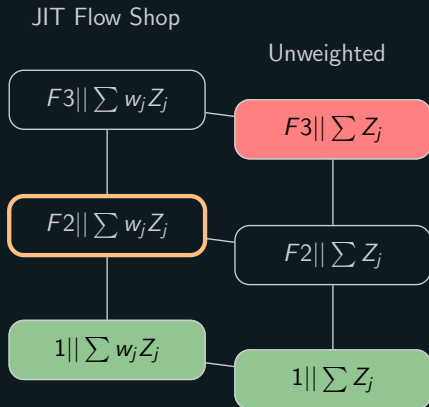
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- Strongly NP-hard even when  $w_j = 1$  [CY07].



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### JIT Flow Shop

$$F3 || \sum w_j Z_j$$

$$F2 || \sum w_j Z_j$$

$$1 || \sum w_j Z_j$$

### Unweighted

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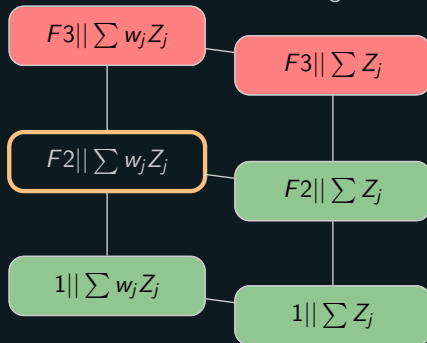
## Two-Stage Flexible JIT Flow Shop

- **NP-hard** even when  $q_j = 1$  ( $m = 1$ ) [CY07]
- When  $w_j = 1$   $O(n^4)$  time solvable [CY07].

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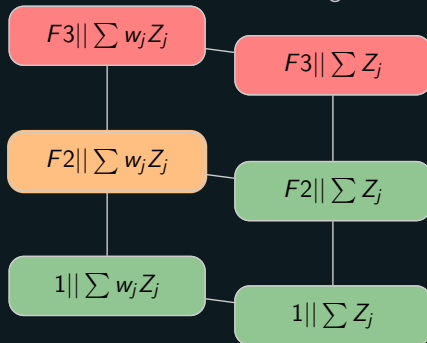
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- **Pseudo-polynomial time solvable** [SB12].
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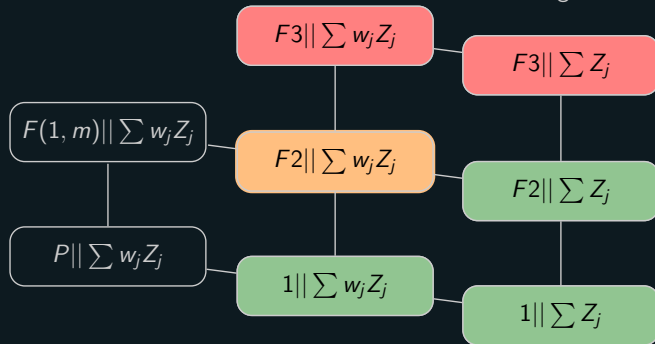
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Flexible

JIT Flow Shop

Unweighted



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## Interval Scheduling

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- $O(n^2 \log n)$  time solvable multiple machines [AS87].

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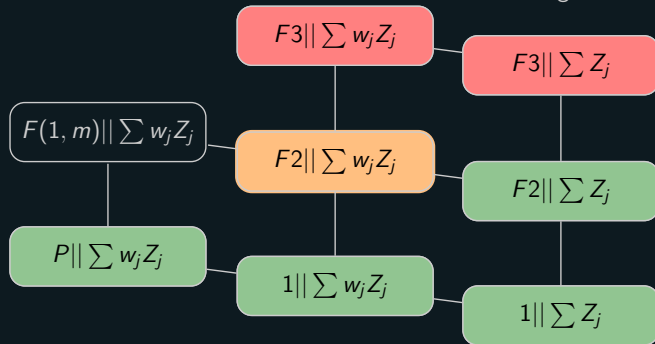
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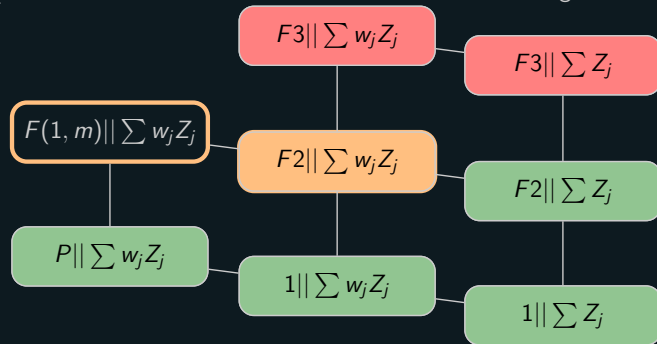
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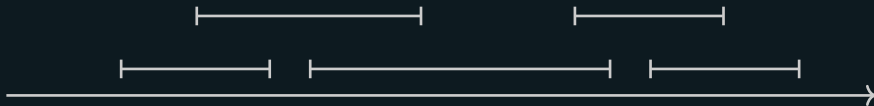
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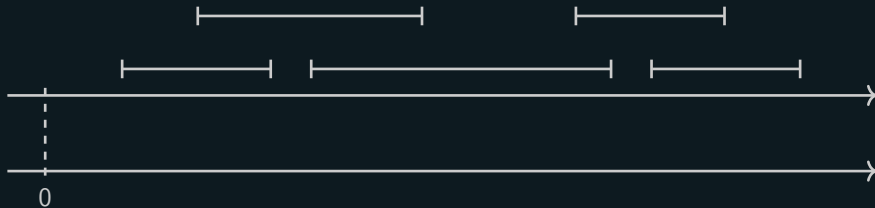
# Key Observations

## Observation 1



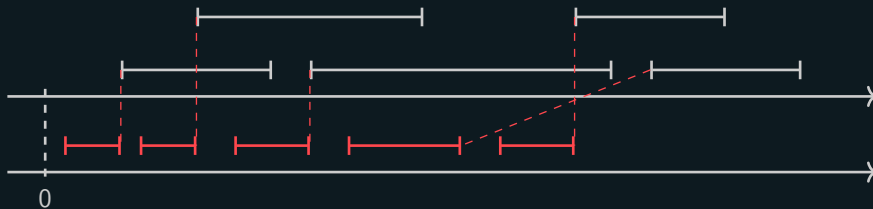
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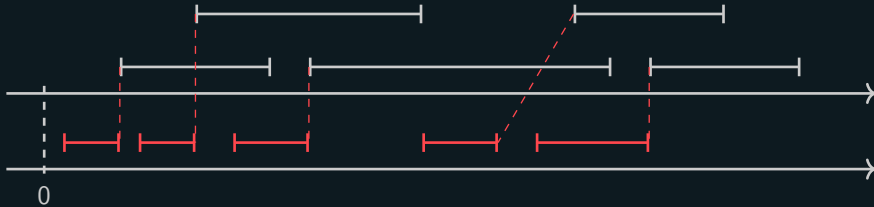
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*The jobs can be preprocessed in ascending order of start times of the second stage.*





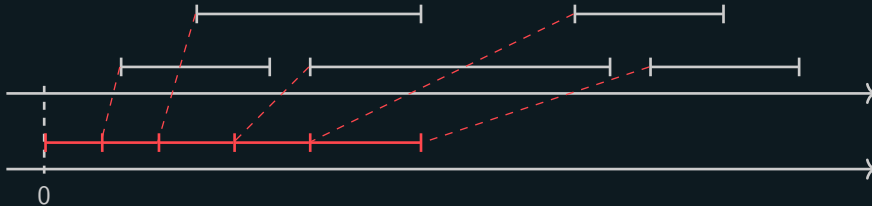
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## Observation 1

*The jobs can be preprocessed in ascending order of start times of the second stage.*

## Observation 2

*Optimally, the first stage machine has no idle time.*



# Hardness

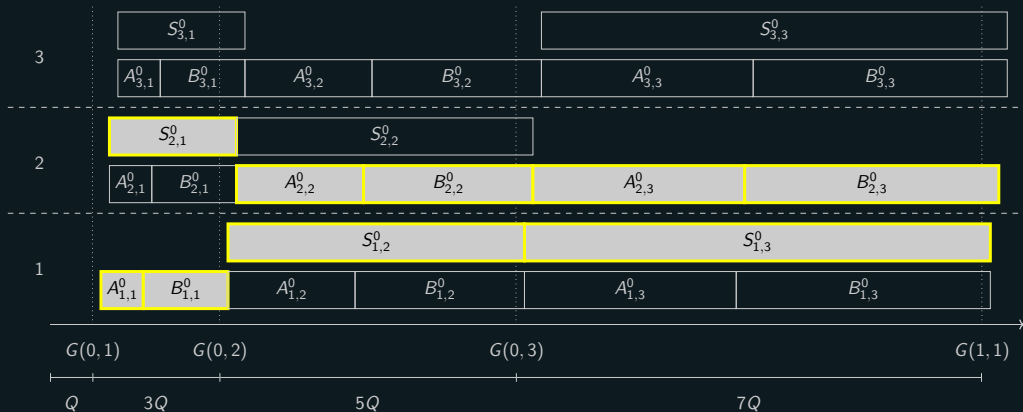
HITTING SET:

Input: A family  $\mathcal{F}$  of  $m$  subsets of a universe  $U = \{1, \dots, n\}$ , and an integer  $k$ .

Question: Is there a set  $H \subseteq U$  with  $|H| = k$  and  $|H \cap F| \geq 1$  for every  $F \in \mathcal{F}$ ?

$$U = \{1, 2, 3\} , \mathcal{F} = \{F_1 = \{2, 3\}, F_2 = \{1, 2\}, F_3 = \{1, 3\}\} , k = 2$$

# Hardness



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# Dynamic Program

## Observation 3

$$T[\vec{s}, W'] = \max \left\{ \begin{array}{l} T[X_1, W'], \\ \min \left\{ \begin{array}{l} T[X_2, W' - w_j] - p_j, \\ s_j - p_j. \end{array} \right. \end{array} \right.$$

# Dynamic Program

## Observation 3

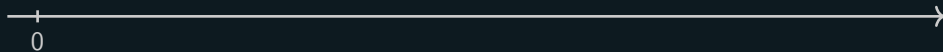
*Partial-schedules (over jobs  $\{j, \dots, n\}$ ) with equal  $W$ ,  $P$  and  $\vec{s}$  are "equivalent".*

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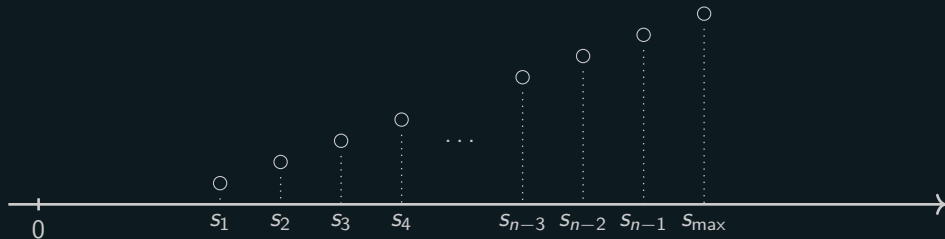


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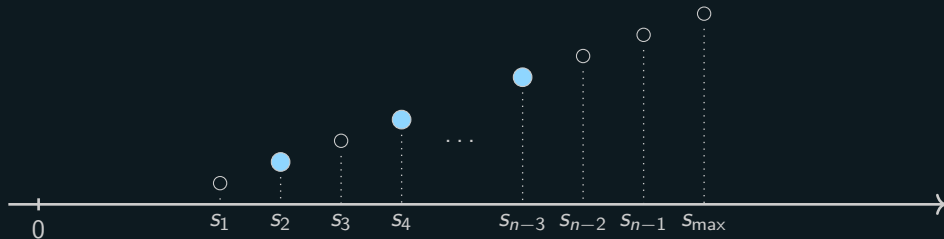


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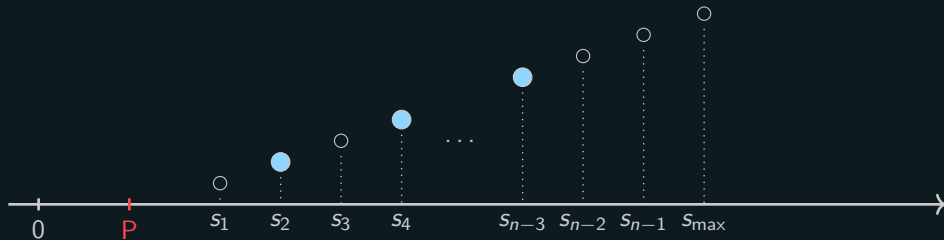
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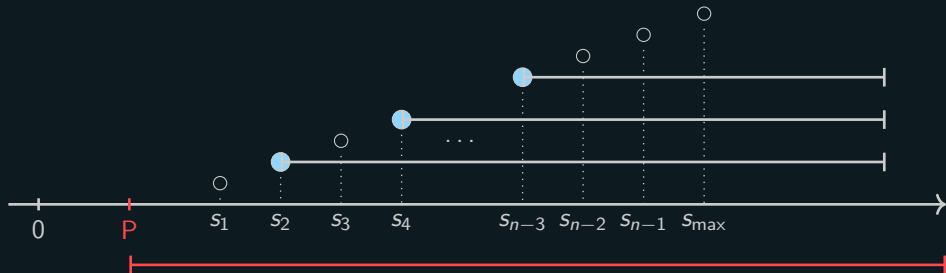


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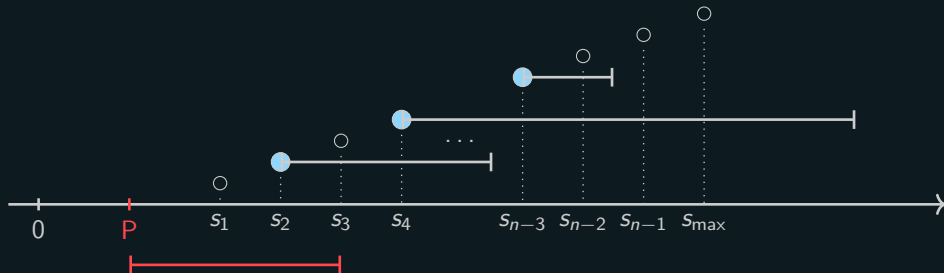


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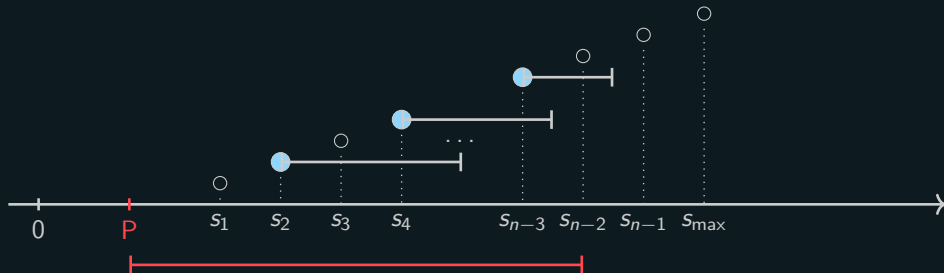


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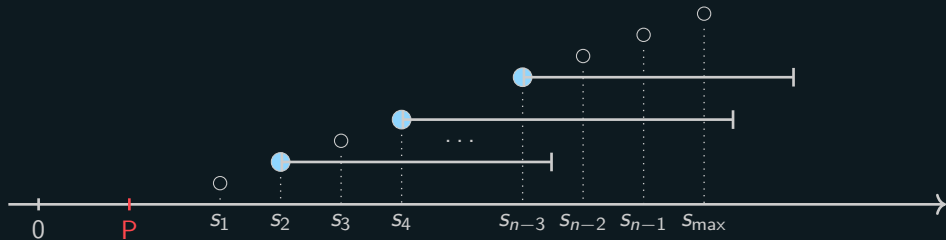


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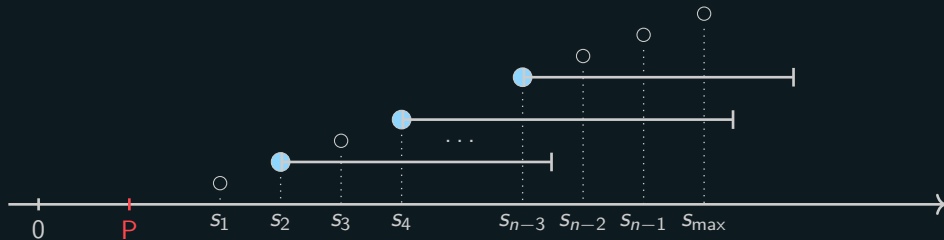


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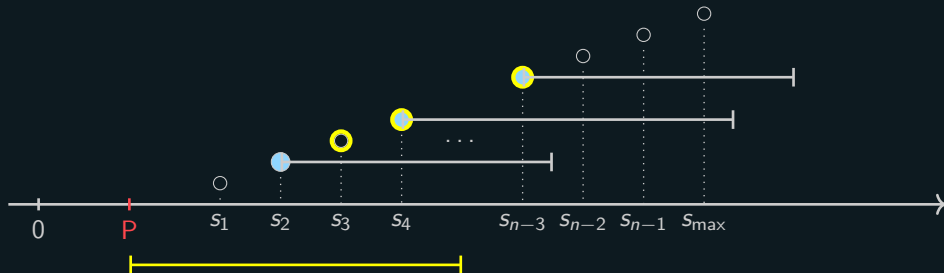


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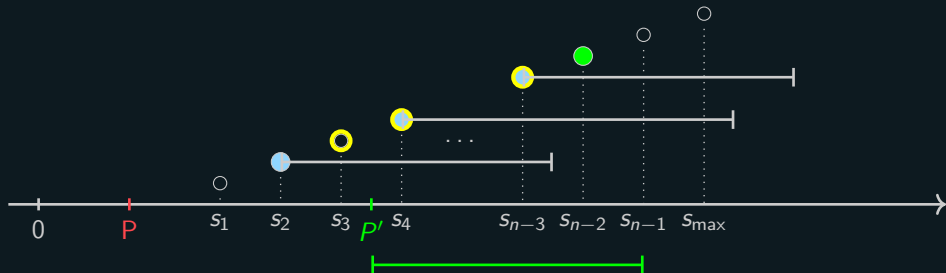


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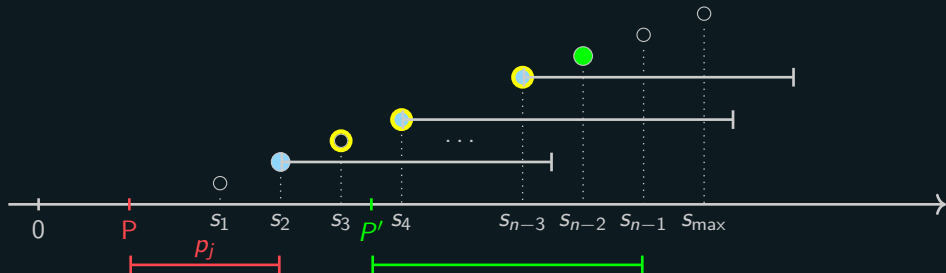
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Partial-schedules (over jobs  $\{j, \dots, n\}$ ) with equal  $W$ ,  $P$  and  $\vec{s}$  are "equivalent".

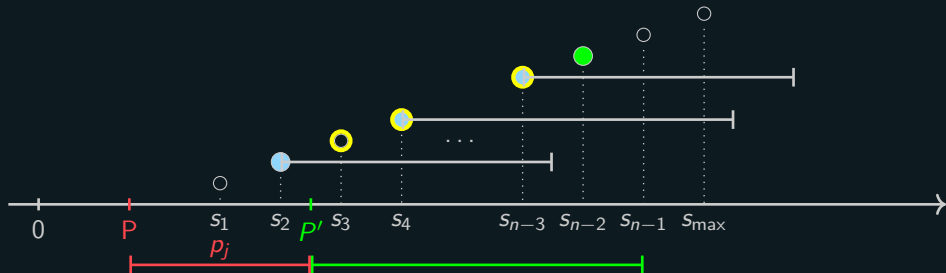


$$T[\vec{s}, W'] = \max \begin{cases} T[X_1, W'], \\ \min \begin{cases} T[X_2, W' - w_j] - p_j, \\ s_j - p_j. \end{cases} \end{cases}$$

# Dynamic Program

## Observation 3

Partial-schedules (over jobs  $\{j, \dots, n\}$ ) with equal  $W$ ,  $P$  and  $\vec{s}$  are "equivalent".



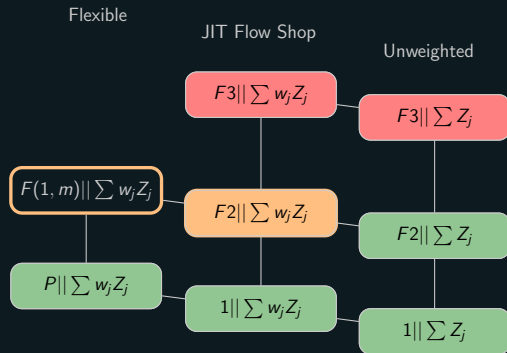
$$T[\vec{s}, W'] = \max \begin{cases} T[X_1, W'], \\ \min \begin{cases} T[X_2, W' - w_j] - p_j, \\ s_j - p_j. \end{cases} \end{cases}$$

# Open Questions

- Is  $F(1, m)|_{q_j = q|w_j Z_j}$  NP-hard?

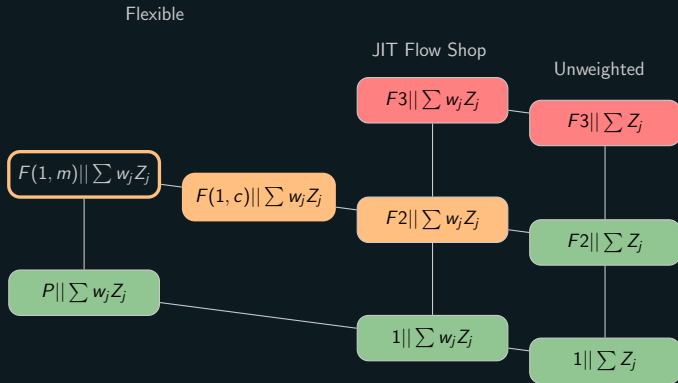
# Open Questions

- Is  $F(1, m) | q_j = q | w_j Z_j$  NP-hard?



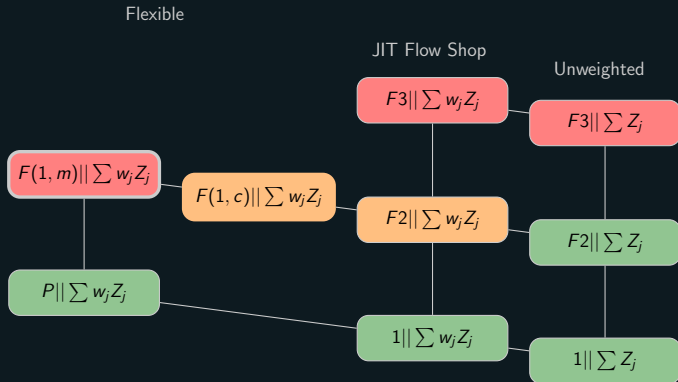
# Open Questions

- Is  $F(1, m) | q_j = q | w_j Z_j$  NP-hard?



# Open Questions

- Is  $F(1, m) | q_j = q | w_j Z_j$  NP-hard?



Thanks!

# References

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