Algorithms \& Models of Computation

## CS/ECE 374, Fall 2020

19.3

Scheduling Jobs to Minimize Average Waiting Time

## The Problem

- $\boldsymbol{n}$ jobs $J_{1}, J_{2}, \ldots, J_{\boldsymbol{n}}$.
- Each $\boldsymbol{J}_{\boldsymbol{i}}$ has non-negative processing time $\boldsymbol{p}_{\boldsymbol{i}}$
- One server/machine/person available to process jobs.
- Schedule/order jobs to min. total or average waiting time
- Waiting time of $\boldsymbol{J}_{\boldsymbol{i}}$ in schedule $\boldsymbol{\sigma}$ : sum of processing times of all jobs scheduled before $\boldsymbol{J}_{\boldsymbol{i}}$

|  | $J_{1}$ | $J_{2}$ | $J_{3}$ | $J_{4}$ | $J_{5}$ | $J_{6}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| time | 3 | 4 | 1 | 8 | 2 | 6 |

Example: schedule is $J_{1}, J_{2}, J_{3}, J_{4}, J_{5}, J_{6}$. Total waiting time is


Optimal schedule: Shortest Job First. $J_{3}, J_{5}, J_{1}, J_{2}, J_{6}, J_{4}$.

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Optimal schedule: Shortest Job First. $J_{3}, J_{5}, J_{1}, J_{2}, J_{6}, J_{4}$.

## Optimality of Shortest Job First (SJF)

## Theorem 19.1.

Shortest Job First gives an optimum schedule for the problem of minimizing total waiting time.

Proof strategy: exchange argument
Assume without loss of generality that job sorted in increasing order of processing time and hence $p_{1} \leq p_{2} \leq \ldots \leq p_{n}$ and SJF order is $J_{1}, J_{2}, \ldots, J_{n}$.

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## Optimality of SJF: Proof by picture



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## Inversions

Definition 19.2.
A schedule $\boldsymbol{J}_{i_{1}}, J_{i_{2}}, \ldots, J_{i_{n}}$ has an inversion if there are jobs $J_{a}$ and $J_{\boldsymbol{b}}$ such that $S$ schedules $J_{a}$ before $J_{b}$, but $\boldsymbol{p}_{a}>p_{b}$.

Claim 19.3.
If a schedule has an inversion then there is an inversion between two adjacent scheduled jobs.

Proof: exercise.

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A schedule $\boldsymbol{J}_{\boldsymbol{i}_{1}}, \boldsymbol{J}_{\boldsymbol{i}_{2}}, \ldots, \boldsymbol{J}_{\boldsymbol{i}_{\boldsymbol{n}}}$ has an inversion if there are jobs $\boldsymbol{J}_{\boldsymbol{a}}$ and $\boldsymbol{J}_{\boldsymbol{b}}$ such that $\boldsymbol{S}$ schedules $J_{a}$ before $J_{b}$, but $\boldsymbol{p}_{a}>p_{b}$.

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Proof: exercise.

## Proof of optimality of SJF

SJF = Shortest Job First
Recall SJF order is $J_{1}, J_{2}, \ldots, J_{\boldsymbol{n}}$.

- Let $J_{i_{1}}, J_{i_{2}}, \ldots, J_{i_{n}}$ be an optimum schedule with fewest inversions.
- If schedule has no inversions then it is identical to SJF schedule and we are done.
- Otherwise there is an $1 \leq \boldsymbol{\ell}<\boldsymbol{n}$ such that $\boldsymbol{i}_{\ell}>\boldsymbol{i}_{\ell+1}$ since schedule has inversion among two adjacent scheduled jobs

Claim 19.4.
The schedule obtained from $\boldsymbol{J}_{\boldsymbol{i}_{1}}, \boldsymbol{J}_{\boldsymbol{i}_{2}}, \ldots, \boldsymbol{J}_{\boldsymbol{i}_{n}}$ by exchanging/swapping positions of jobs $J_{i_{\ell}}$ and $J_{i_{\ell+1}}$ is also optimal and has one fewer inversion.

Assuming claim we obtain a contradiction and hence optimum schedule with fewest inversions must be the SJF schedule.

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Assuming claim we obtain a contradiction and hence optimum schedule with fewest inversions must be the SJF schedule.

## Exercise: A Weighted Version

- $n$ jobs $J_{1}, J_{2}, \ldots, J_{n}$. $\boldsymbol{J}_{\boldsymbol{i}}$ has non-negative processing time $\boldsymbol{p}_{\boldsymbol{i}}$ and a non-negative weight $w_{i}$
- One server/machine/person available to process jobs.
- Schedule/order the jobs to minimize total or average waiting time
- Waiting time of $\boldsymbol{J}_{\boldsymbol{j}}$ in schedule $\boldsymbol{\sigma}$ : sum of processing times of all jobs scheduled before $J_{i}$
- Goal: minimize total weighted waiting time.
- Formally, compute a permutation $\boldsymbol{\pi}$ that minimizes $\sum_{i=1}^{n}\left(\sum_{j=1}^{i-1} \boldsymbol{p}_{\boldsymbol{\pi}(j)}\right) \boldsymbol{w}_{\boldsymbol{\pi}(i)}$.

|  | $J_{1}$ | $J_{2}$ | $J_{3}$ | $J_{4}$ | $J_{5}$ | $J_{6}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| time | 3 | 4 | 1 | 8 | 2 | 6 |
| weight | 10 | 5 | 2 | 100 | 1 | 1 |

## THE END

(for now)

