# CS 603: Scheduling to Minimize Lateness

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#### Outline

1 Recap of Greedy Algorithms

2 Another Scheduling Problem: Minimizing Lateness

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  - Any optimal solution can be exchanged step-by-step into a greedy solution.
     (This is what we will use today!)

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## Scheduling Problem Description

- There is a single resource (say, a printer) that must be used to complete n tasks, each with different time lengths  $t_1, t_2, \ldots, t_n$
- This resource is available to all tasks at a single start time, but may be used for only one task at a time.
- The resource must be used continuously on a task until that task is completed.
- Each task has a deadline  $d_1, d_2, \ldots, d_n$ .
- How do we schedule the task to minimize the maximum lateness?

#### Notation

$$d_{i}$$

$$s(i)$$

$$f(i) = s(i) + t_{i}$$

$$\ell_{i} = f(i) - d_{i}$$

$$L = \max_{i=1,...,n} {\{\ell_{i}\}}$$

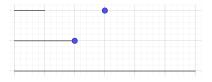
the times it takes to complete item *i* the deadlines for item *i* the assigned start time for item *i* the corresponding finish time for item *i* the corresponding lateness for item *i* the maximum lateness

Since we want to minimize L, we can assume there is no idle time (that is, that the finish time for one item is the start time for the following item).

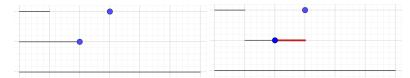
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One *incorrect* greedy option: Choose shortest jobs first: order by  $t_i$ .

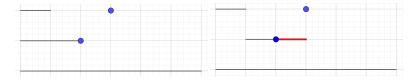
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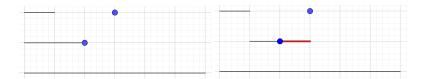


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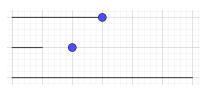


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Problem:

$$t_1 = 3, d_1 = 3$$

$$t_2 = 1, d_2 = 2$$



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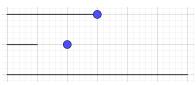


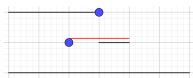
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#### Answer:

- To show you that finding a greedy option that works may not be obvious or easy!
- To keep you skeptical when approaching greedy algorithms, and remind you that you need to prove a greedy algorithm works.

# Greedy solution to Scheduling to Minimize Lateness

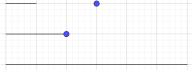
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#### Example

$$t_1 = 1, d_1 = 3$$
  $t_2 = 2, d_2 = 2$ 



$$t_1=3, d_1=3$$
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$$t_2 = 1, d_2 = 2$$



#### Proof that this greedy algorithm works

Re-number the indices of each interval so that they are ordered by deadline (ties broken arbitrarily):

$$d_1 \leq d_2 \leq \cdots d_n$$

First suppose that we have another different ordering that breaks the ties differently. That is, the ordering is still increasing by deadline, but elements with the same deadline may be swapped.

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Note that, among all elements with the same deadline, the last one is the latest. Re-ordering those elements doesn't change the lateness. Thus, re-ordering elements with the same deadline among themselves produces an ordering with the same maximum lateness.

$$i_1, i_2, i_3, \ldots, i_n$$

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We shall use the idea of an *inversion*. An inversion occurs when j < k (so that  $i_j$  occurs before  $i_k$  in the ordering) but yet  $d_{i_j} > d_{i_k}$ . If this optimal solution is not a greedy ordering, we must have some positive number of inversions I.

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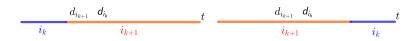
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We must also have an *adjacent inversion*: a case where  $d_{i_k} > d_{i_{k+1}}$ . Suppose we swap those intervals.



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Hence, we can swap any adjacent inversions in an optimal solution without increasing maximum lateness, decreasing the total number of inversions *I* by 1. Thus, any optimal solution can be eventually exchanged (by swapping adjacent inversions) into a greedy solution without increasing maximum lateness.

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