

NPTEL MOOC, JAN-FEB 2015  
Week 6, Module 4

# **DESIGN AND ANALYSIS OF ALGORITHMS**

**Greedy algorithms: Minimizing lateness**

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# Minimizing lateness

- \* A single resource,  $n$  request to use this resource
- \* Request  $i$  requires time  $t(i)$  to complete and has a deadline  $d(i)$
- \* All requests will be scheduled
  - \* Request  $j$  starts at  $s(j)$  and ends at  $f(j) = s(j) + t(j)$
  - \* If  $f(j) > d(j)$ , request  $j$  is late by  $l(j) = d(j) - f(j)$

**Goal:** Minimize maximum lateness

- \* Minimize the maximum value of  $l(j)$  over all  $j$



# Greedy strategies

## Greedy Strategy 1

- \* Choose jobs in increasing order of length —  $t(j)$

## Counterexample

- \* Two jobs
  - \*  $t(1) = 1, d(1) = 100$
  - \*  $t(2) = 10, d(2) = 10$



# Greedy strategies

## Greedy Strategy 2

- \* Choose job with smaller **slack times**,  $d(j) - t(j)$ , first

## Counterexample

- \* Two jobs
  - \*  $t(1) = 1, d(1) = 2$
  - \*  $t(2) = 10, d(2) = 10$



# Greedy strategies

## Greedy Strategy 3

- \* Choose job with earliest deadline  $d(j)$  first
- \* This strategy is correct
- \* How do we prove it?



# Correctness

- \* Assume all jobs are sorted by deadline
  - \* Renumber so that  $d(1) \leq d(2) \leq \dots \leq d(n)$
- \* Schedule is simple: 1, 2, ..., n
  - \* Job 1 starts at  $s(1) = 0$  and ends at  $f(1) = t(1)$
  - \* Job 2 starts at  $s(2) = f(1)$  and ends at  $f(2) = s(2) + t(2)$
  - \* ...



# Correctness ...

- \* Our schedule has no gaps — idle time
  - \* The resource is continuously in use from  $s(1)$  to  $f(n)$

## Claim:

There is an optimum schedule with no idle time

- \* Shifting jobs earlier to remove idle time can only reduce lateness



# Exchange argument

- \* Suppose  $O$  is some other optimal schedule
- \* Transform  $O$  step by step until it becomes identical to the schedule  $A$  found by the greedy algorithm



# Inversions

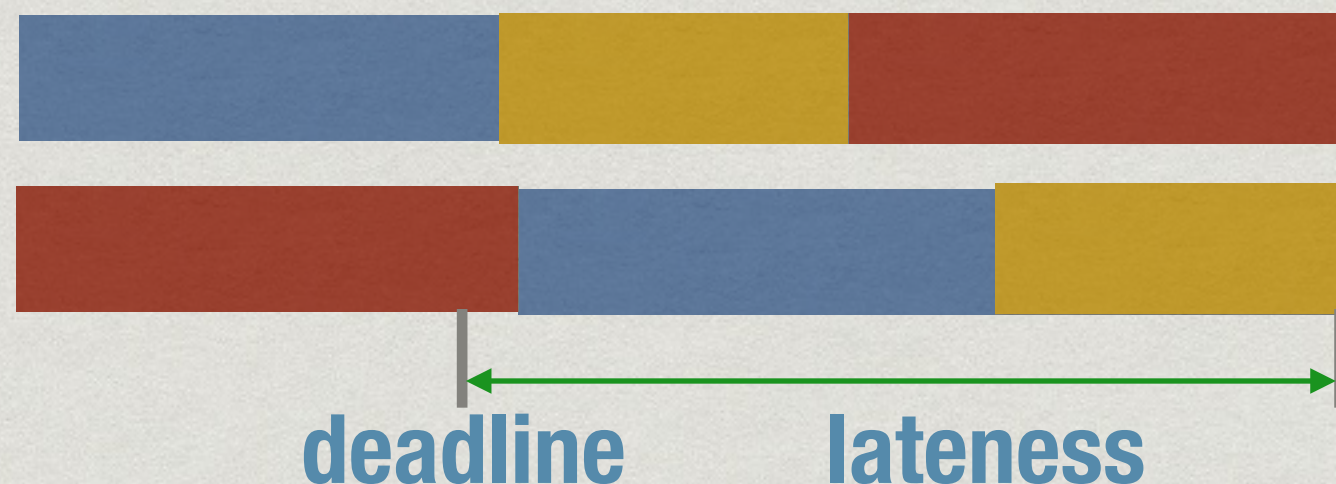
- \* A schedule  $O$  has an inversion if  $i$  appears before  $j$  in  $O$  but  $d(j) < d(i)$
- \* By construction, the greedy solution has no inversions



# Inversions ...

**Claim:** Any two schedules with no inversions and no idle time produce the same lateness

- \* No inversions, no idle time means the only difference can be in order of jobs with same deadline
- \* Any reordering of jobs with the same deadline produces the same lateness





# Optimality ...

**Claim:** There is an optimal schedule with no inversions and no idle time.

- \* Let  $O$  be an optimal solution with no idle time
- \* (A) If  $O$  has an inversion, then there is a pair of jobs  $i$  and  $j$  such that  $j$  is scheduled immediately after  $i$  and  $d(j) < d(i)$ 
  - \* Find the first point where deadline decreases



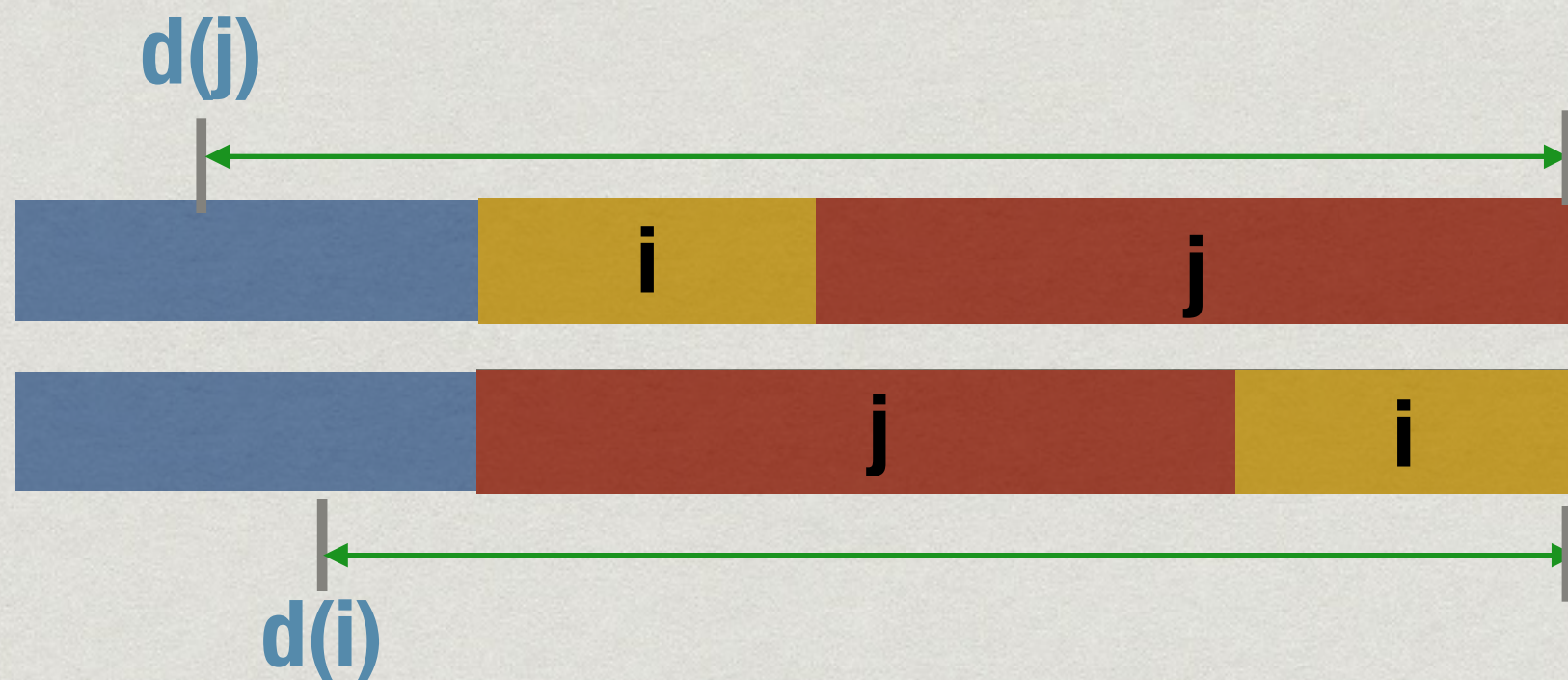
# Optimality ...

- \* (B) After swapping  $i$  and  $j$  we get a solution with one less inversion
  - \* Obvious
- \* (C) After swapping  $i$  and  $j$  we get a solution whose maximum lateness is no larger than that of  $O$ 
  - \* Not so obvious



# Optimality ...

- \* (C) After swapping  $i$  and  $j$  we get a solution whose maximum lateness is no larger than that of  $O$
- \* Recall that  $d(j) < d(i)$
- \* Lateness of  $i$  after swap cannot be more than lateness of  $j$  before swap





# Optimality ...

**Claim:** There is an optimal schedule with no inversions and no idle time.

- \* From (C) we can remove each adjacent inversion without increasing lateness
- \* At most  $n(n-1)/2$  inversions in  $O$  to begin with
- \* Repeatedly remove adjacent inversions to get an optimal schedule with no inversions, no idle time



# Implementation, complexity

- \* Sort jobs by deadline —  $O(n \log n)$
- \* Read off schedule in same order —  $O(n)$
- \* Overall —  $O(n \log n)$