



## CSE 421 Algorithms

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Lecture 8 – Greedy Algorithms II

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## Announcements

- Today's lecture
  - Kleinberg-Tardos, 4.2, 4.3
- Next week
  - Kleinberg-Tardos, 4.4, 4.5

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## Scheduling Intervals

- Given a set of intervals
  - What is the largest set of non-overlapping intervals
  - What is the minimum number of processors required to schedule all intervals
- Suppose the  $n$  intervals are “random”
  - What is the expected number of independent intervals
  - What is the expected depth

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## Generating a random set of intervals

- Method 1:
  - Each interval assigned random start position in  $[0.0, 1.0]$
  - Each interval assigned a random length in  $[0.0, 1.0]$
- Method 2:
  - Start with the array  $[1, 1, 2, 2, 3, 3, 4, 4, 5, 5]$
  - Randomly permute it  $[2, 1, 4, 2, 3, 4, 5, 1, 3, 5]$
  - Index of the first  $j$  is the start of interval  $j$ , and the index of the second  $j$  is the end of interval  $j$

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## Greedy Algorithms

- Solve problems with the simplest possible algorithm
- The hard part: showing that something simple actually works
- Today's problems (Sections 4.2, 4.3)
  - Homework Scheduling
  - Optimal Caching
  - Subsequence testing

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## Homework Scheduling

- Tasks to perform
- Deadlines on the tasks
- Freedom to schedule tasks in any order
- Can I get all my work turned in on time?
- If I can't get everything in, I want to minimize the maximum lateness

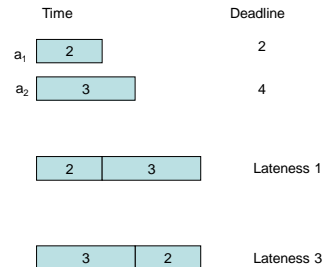
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## Scheduling tasks

- Each task has a length  $t_i$  and a deadline  $d_i$
- All tasks are available at the start
- One task may be worked on at a time
- All tasks must be completed
- Goal minimize maximum lateness
  - Lateness:  $L_i = f_i - d_i$  if  $f_i \geq d_i$

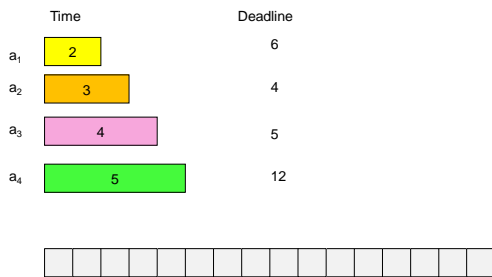
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## Example



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## Determine the minimum lateness



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## Greedy Algorithm

- Earliest deadline first
- Order jobs by deadline
- This algorithm is optimal

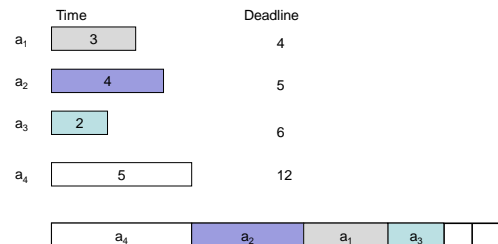
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## Analysis

- Suppose the jobs are ordered by deadlines,  $d_1 \leq d_2 \leq \dots \leq d_n$
- A schedule has an *inversion* if job  $j$  is scheduled before  $i$  where  $j > i$
- The schedule  $A$  computed by the greedy algorithm has no inversions.
- Let  $O$  be the optimal schedule, we want to show that  $A$  has the same maximum lateness as  $O$

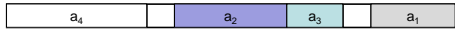
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## List the inversions



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### Lemma: There is an optimal schedule with no idle time

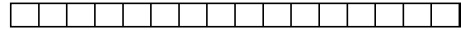


- It doesn't hurt to start your homework early!
- Note on proof techniques
  - This type of can be important for keeping proofs clean
  - It allows us to make a simplifying assumption for the remainder of the proof

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### Lemma

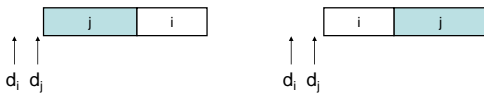
- If there is an inversion  $i, j$ , there is a pair of adjacent jobs  $i', j'$  which form an inversion



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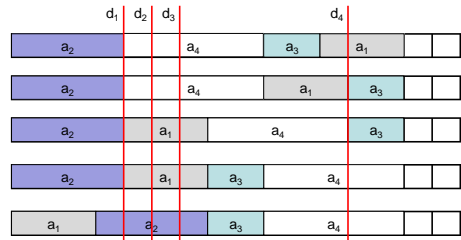
### Interchange argument

- Suppose there is a pair of jobs  $i$  and  $j$ , with  $d_i \leq d_j$ , and  $j$  scheduled immediately before  $i$ . Interchanging  $i$  and  $j$  does not increase the maximum lateness.



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### Proof by Bubble Sort



Determine maximum lateness

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### Real Proof

- There is an optimal schedule with no inversions and no idle time.
- Let  $O$  be an optimal schedule  $k$  inversions, we construct a new optimal schedule with  $k-1$  inversions
- Repeat until we have an optimal schedule with 0 inversions
- This is the solution found by the earliest deadline first algorithm

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### Result

- Earliest Deadline First algorithm constructs a schedule that minimizes the maximum lateness

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## Homework Scheduling

- How is the model unrealistic?

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## Extensions

- What if the objective is to minimize the sum of the lateness?
  - EDF does not work
- If the tasks have release times and deadlines, and are non-preemptable, the problem is NP-complete
- What about the case with release times and deadlines where tasks are preemptable?

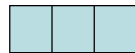
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## Optimal Caching

- Caching problem:
  - Maintain collection of items in local memory
  - Minimize number of items fetched

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## Caching example



A, B, C, D, A, E, B, A, D, A, C, B, D, A

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## Optimal Caching

- If you know the sequence of requests, what is the optimal replacement pattern?
- Note – it is rare to know what the requests are in advance – but we still might want to do this:
  - Some specific applications, the sequence is known
    - Register allocation in code generation
  - Competitive analysis, compare performance on an online algorithm with an optimal offline algorithm

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## Farthest in the future algorithm

- Discard element used farthest in the future



A, B, C, A, C, D, C, B, C, A, D

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## Correctness Proof

- Sketch
- Start with Optimal Solution  $O$
- Convert to Farthest in the Future Solution F-F
- Look at the first place where they differ
- Convert  $O$  to evict F-F element
  - There are some technicalities here to ensure the caches have the same configuration . . .

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## Subsequence Testing

- Is  $a_1 a_2 \dots a_m$  a subsequence of  $b_1 b_2 \dots b_n$  ?
  - e.g. is T,R,E,E a subsequence of S,T,U,A,R,T,R,E,G,E,S

T	R	E	E
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S	T	U	A	R	T	R	E	G	E	S
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## Next week



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