

# CSEP 521

# Applied Algorithms

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Lecture 3

# Announcements

- Reading
  - For today, sections 4.1, 4.2, 4.4
  - For January 28, sections 4.5, 4.7, 4.8 (Plus additional material from chapter 5)
- No class January 21
- Homework 2 is due January 21

# Highlights from last lecture

- Algorithm runtime
  - Runtime as a function of problem size
  - Asymptotic analysis, (Big Oh notation)
- Graph theory
  - Basic terminology
  - Graph search and breadth first search
  - Two coloring
  - Connectivity
  - Topological search

# Greedy Algorithms



MATT GROENING

# Greedy Algorithms

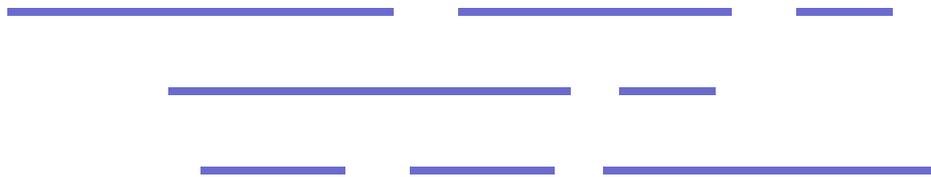
- Solve problems with the simplest possible algorithm
- The hard part: showing that something simple actually works
- Pseudo-definition
  - An algorithm is **Greedy** if it builds its solution by adding elements one at a time using a simple rule

# Scheduling Theory

- Tasks
  - Processing requirements, release times, deadlines
- Processors
- Precedence constraints
- Objective function
  - Jobs scheduled, lateness, total execution time

# Interval Scheduling

- Tasks occur at fixed times
- Single processor
- Maximize number of tasks completed



- Tasks  $\{1, 2, \dots, N\}$
- Start and finish times,  $s(i)$ ,  $f(i)$

# What is the largest solution?

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# Greedy Algorithm for Scheduling

Let  $T$  be the set of tasks, construct a set of independent tasks  $I$ ,  $A$  is the rule determining the greedy algorithm

$I = \{ \}$

While ( $T$  is not empty)

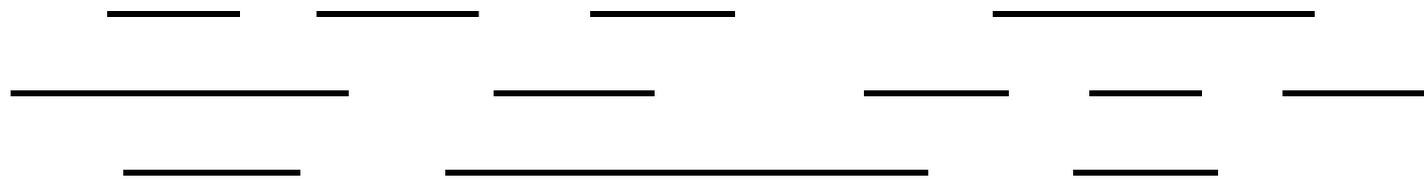
    Select a task  $t$  from  $T$  by a rule  $A$

    Add  $t$  to  $I$

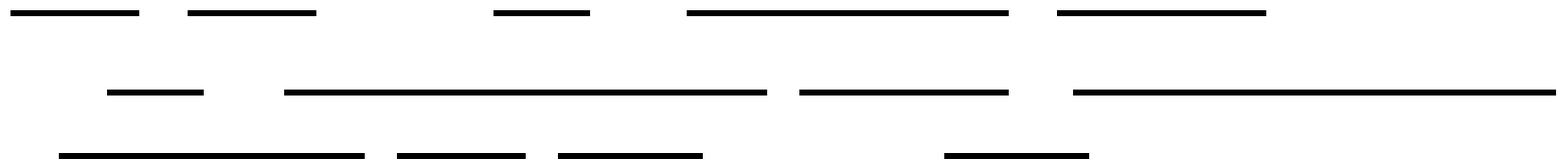
    Remove  $t$  and all tasks incompatible with  $t$  from  $T$

# Simulate the greedy algorithm for each of these heuristics

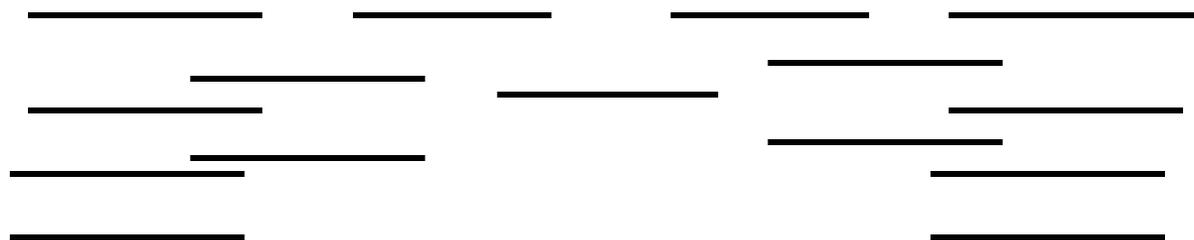
Schedule earliest starting task



Schedule shortest available task

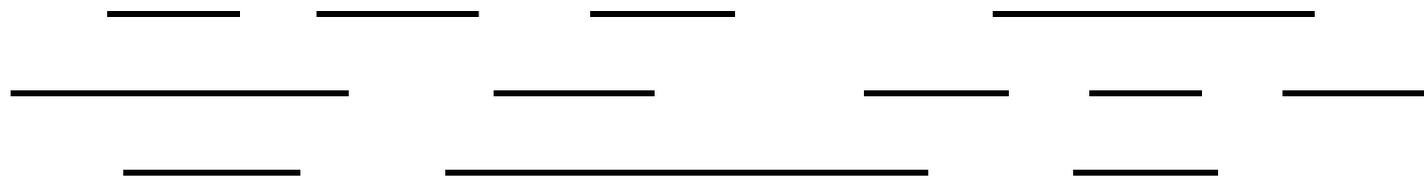


Schedule task with fewest conflicting tasks

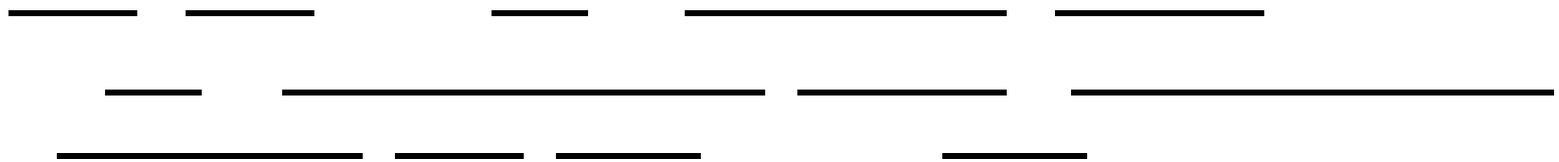


# Greedy solution based on earliest finishing time

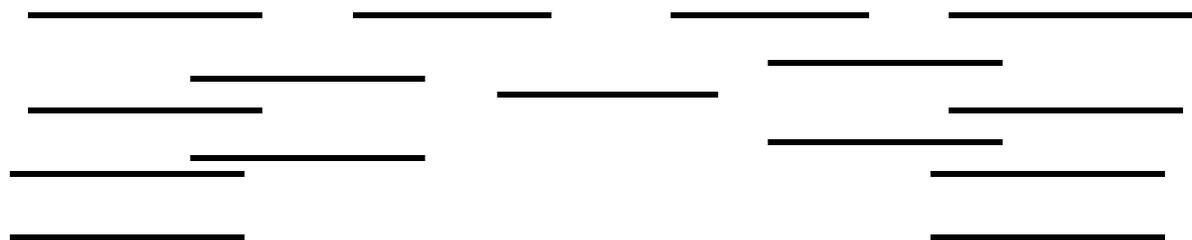
Example 1



Example 2



Example 3



# Theorem: Earliest Finish Algorithm is Optimal

- Key idea: Earliest Finish Algorithm stays ahead
- Let  $A = \{i_1, \dots, i_k\}$  be the set of tasks found by EFA in increasing order of finish times
- Let  $B = \{j_1, \dots, j_m\}$  be the set of tasks found by a different algorithm in increasing order of finish times
- Show that for  $r \leq \min(k, m)$ ,  $f(i_r) \leq f(j_r)$

# Stay ahead lemma

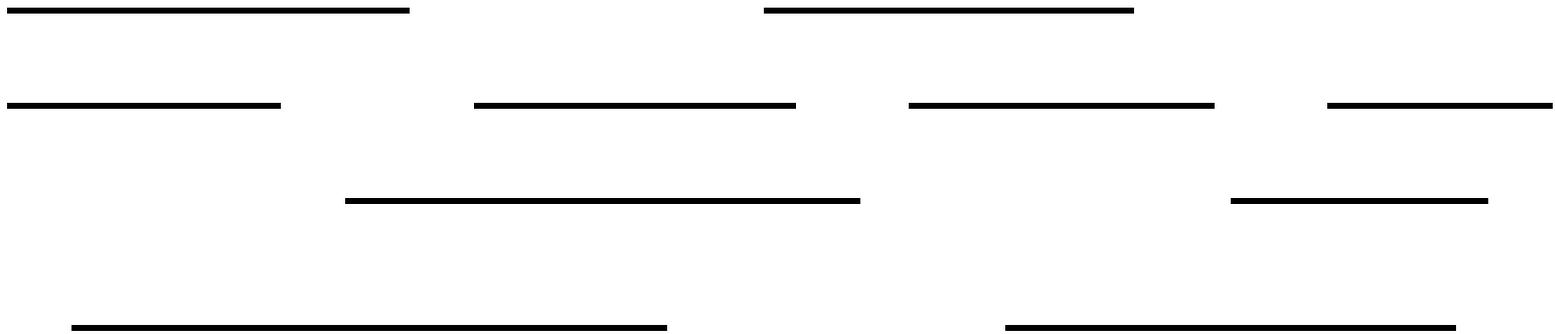
- A always stays ahead of B,  $f(i_r) \leq f(j_r)$
- Induction argument
  - $f(i_1) \leq f(j_1)$
  - If  $f(i_{r-1}) \leq f(j_{r-1})$  then  $f(i_r) \leq f(j_r)$

# Completing the proof

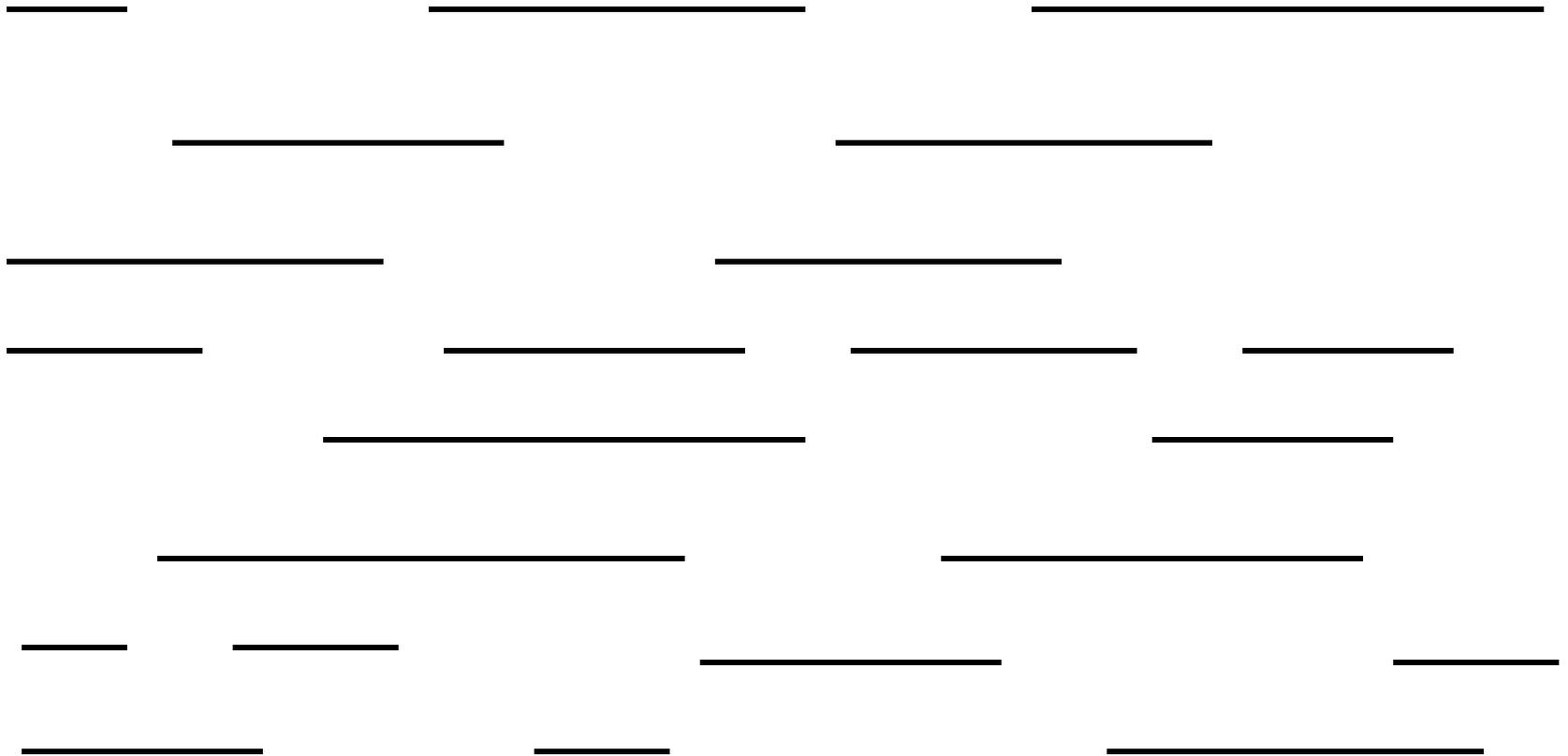
- Let  $A = \{i_1, \dots, i_k\}$  be the set of tasks found by EFA in increasing order of finish times
- Let  $O = \{j_1, \dots, j_m\}$  be the set of tasks found by an optimal algorithm in increasing order of finish times
- If  $k < m$ , then the Earliest Finish Algorithm stopped before it ran out of tasks

# Scheduling all intervals

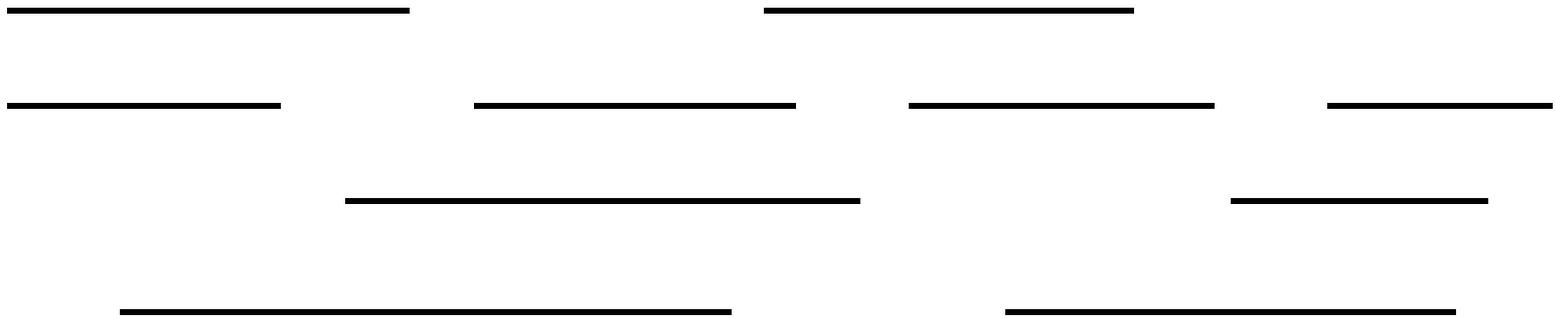
- Minimize number of processors to schedule all intervals



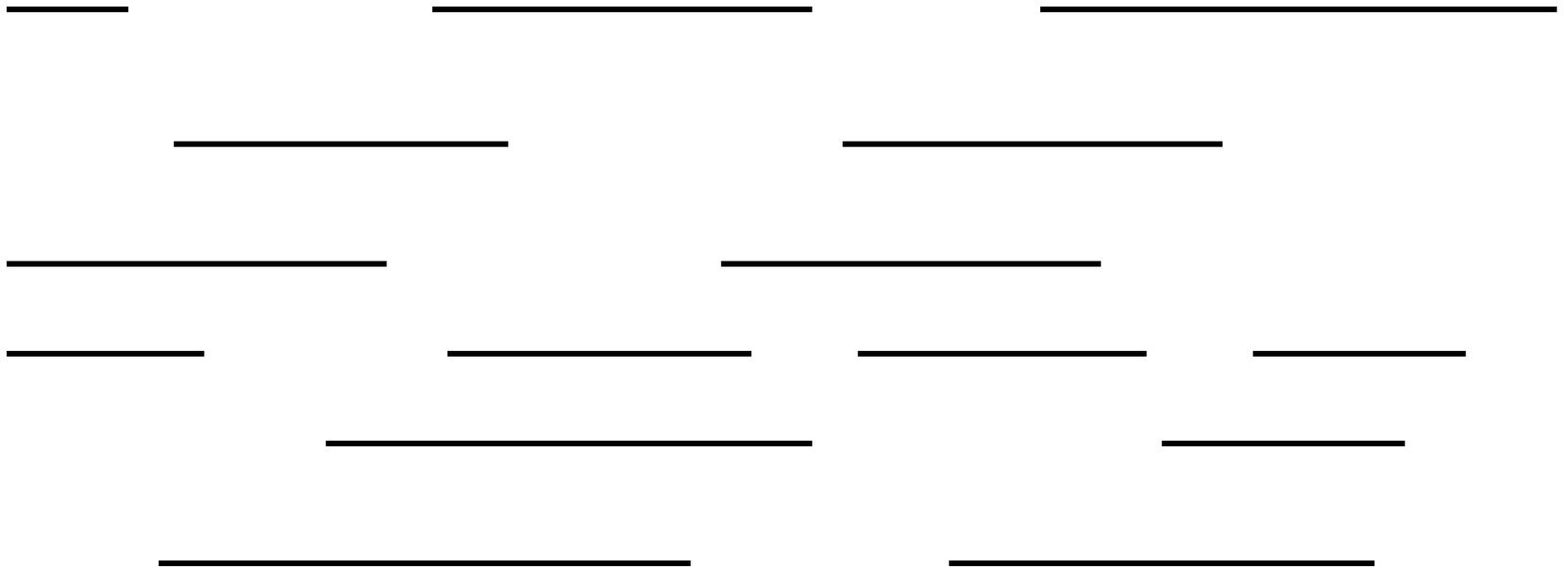
How many processors are needed  
for this example?



Prove that you cannot schedule this set of intervals with two processors



Depth: maximum number of intervals active



# Algorithm

- Sort by start times
- Suppose maximum depth is  $d$ , create  $d$  slots
- Schedule items in increasing order, assign each item to an open slot
- Correctness proof: When we reach an item, we always have an open slot

# 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 =  $f_i - d_i$  if  $f_i \geq d_i$

# Example

Time

Deadline



2



4



Lateness 1

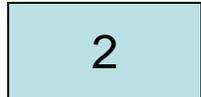


Lateness 3

# Determine the minimum lateness

Time

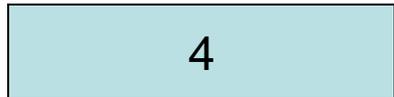
Deadline



6



4



5



12



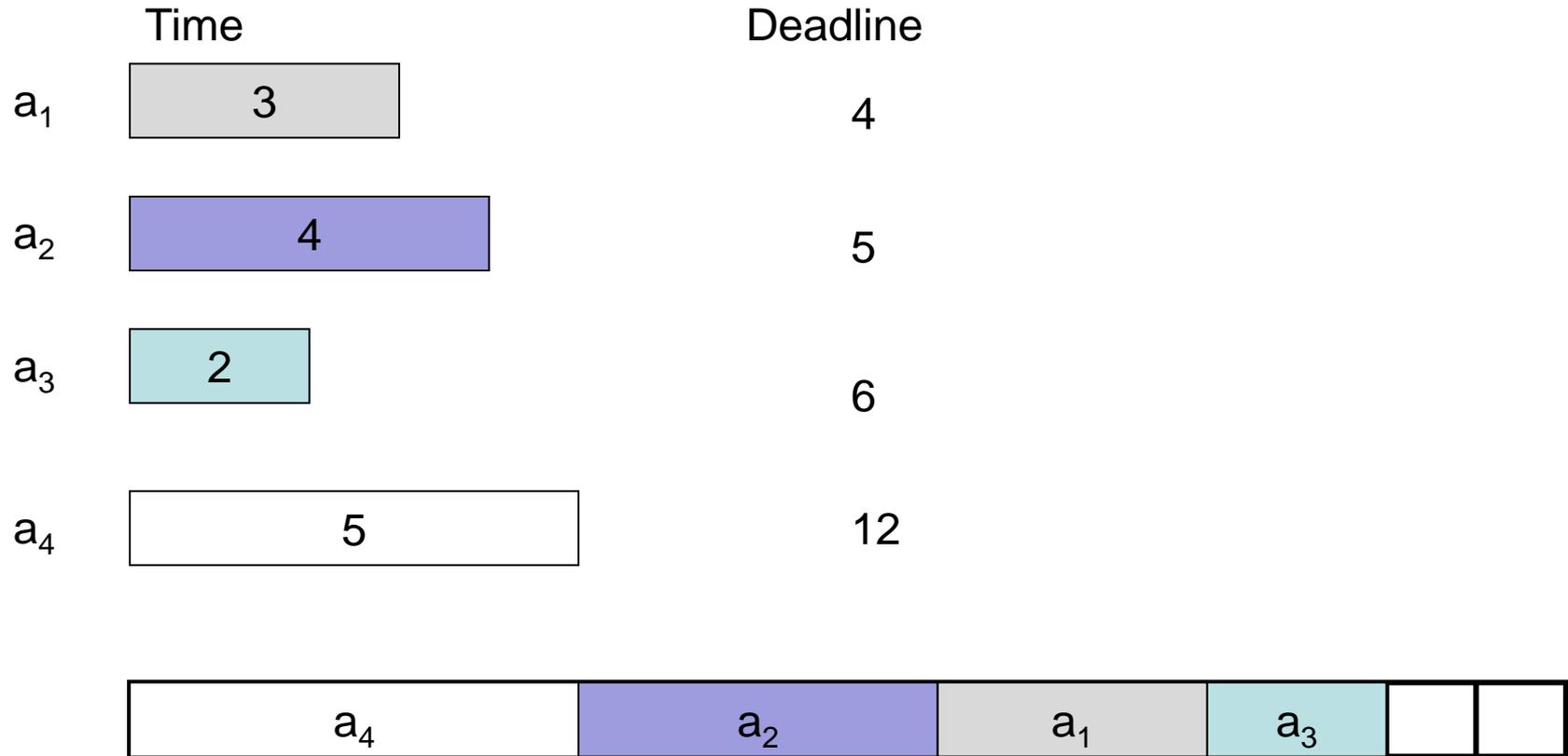
# Greedy Algorithm

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

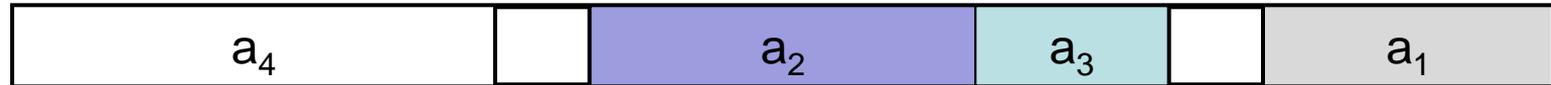
# Analysis

- 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  $O$

# List the inversions



# 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

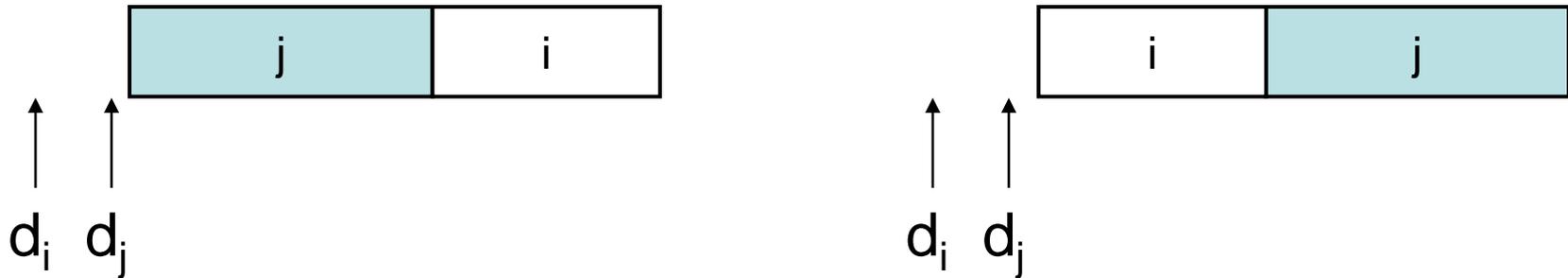
# Lemma

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

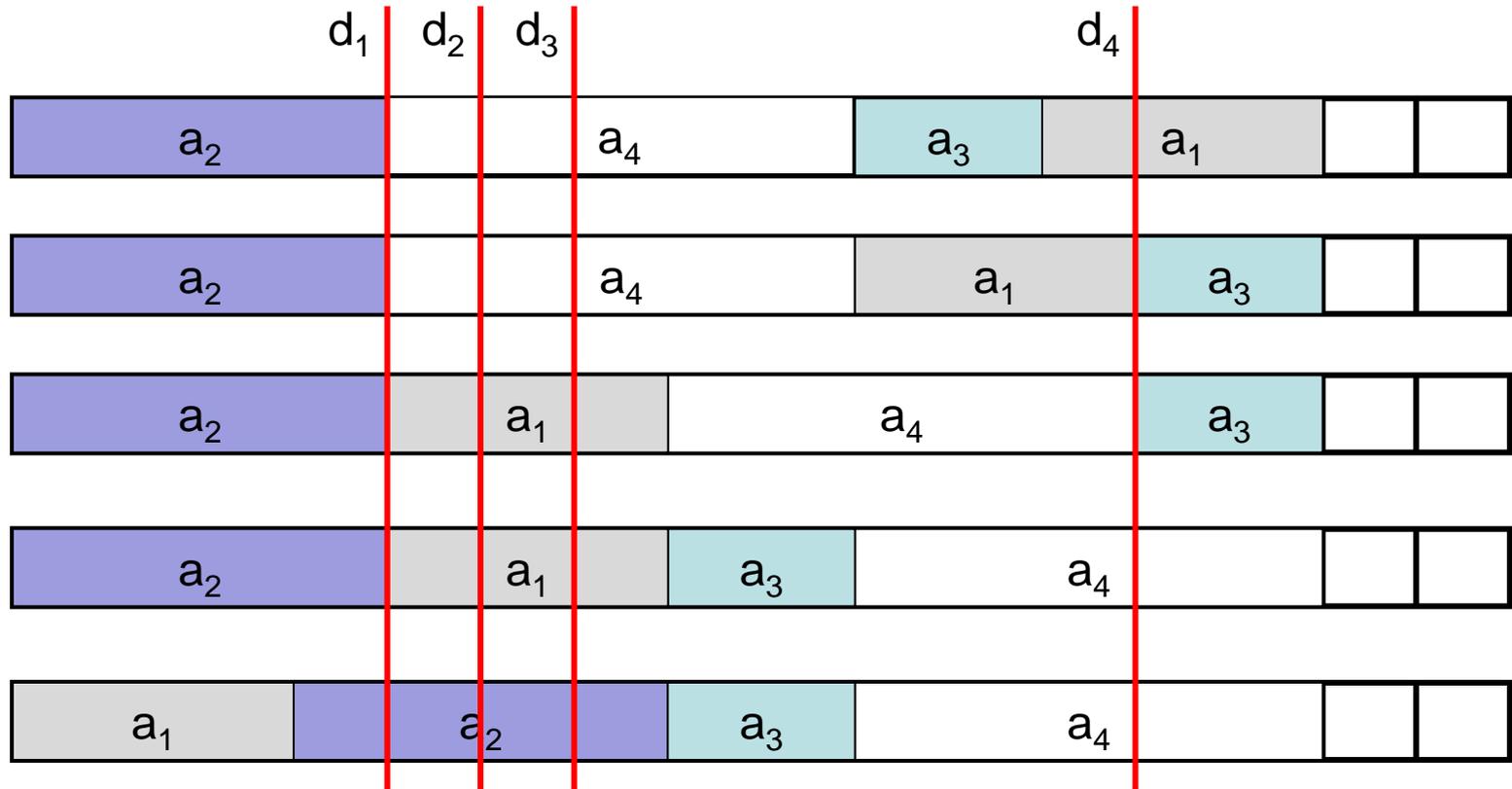


# Interchange argument

- 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.



# Proof by Bubble Sort



Determine maximum lateness

# 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

# Result

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

# Homework Scheduling

- How is the model unrealistic?

# Extensions

- What if the objective is to minimize the sum of the lateness?
  - EDF does not seem to 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?

# Subsequence Testing

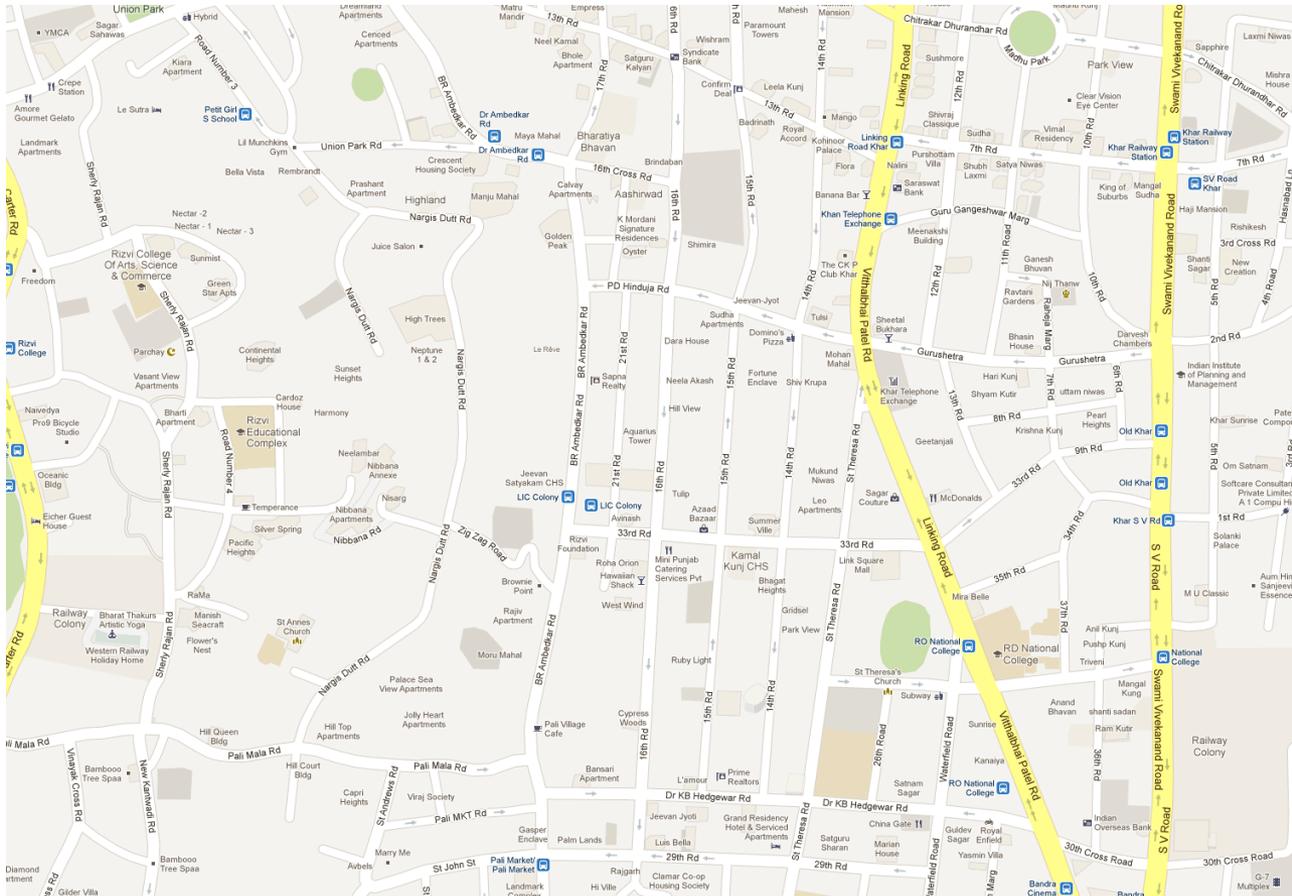
Is  $a_1a_2\dots a_m$  a subsequence of  $b_1b_2\dots b_n$  ?

e.g. A,B,C,D,A is a subsequence of B,A,B,A,B,D,B,C,A,D,A,C,D,A

# Greedy Algorithm for Subsequence Testing

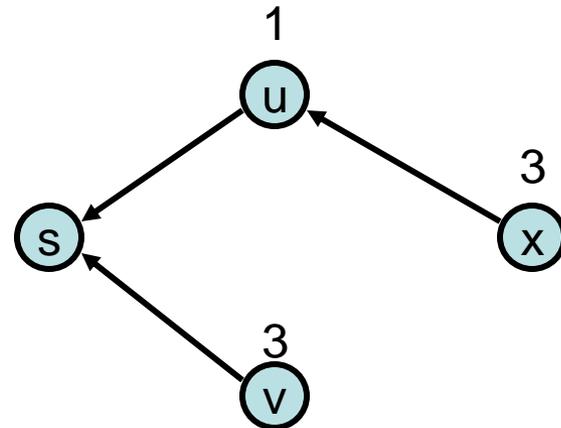
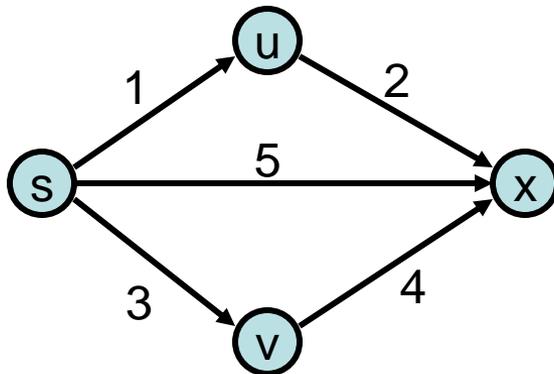


# Shortest Paths

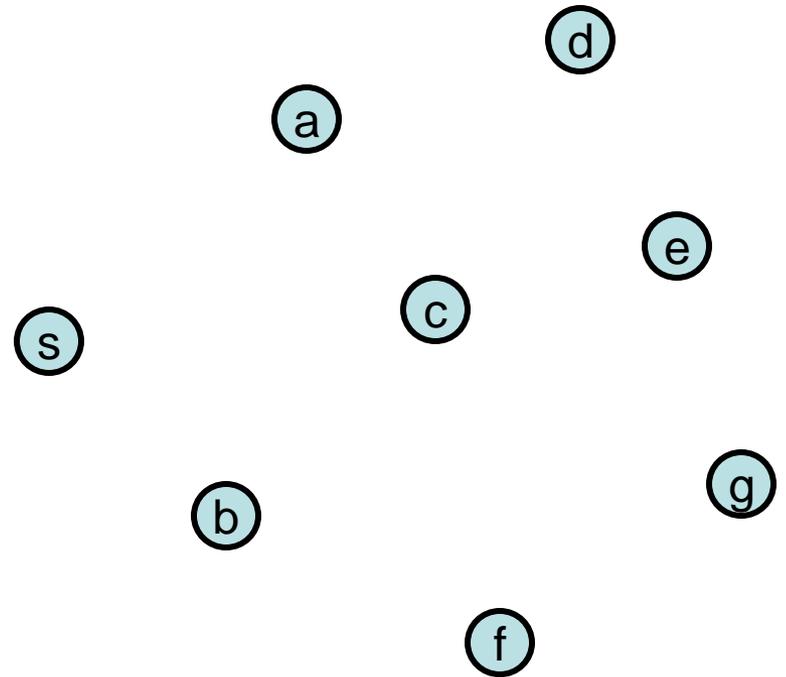
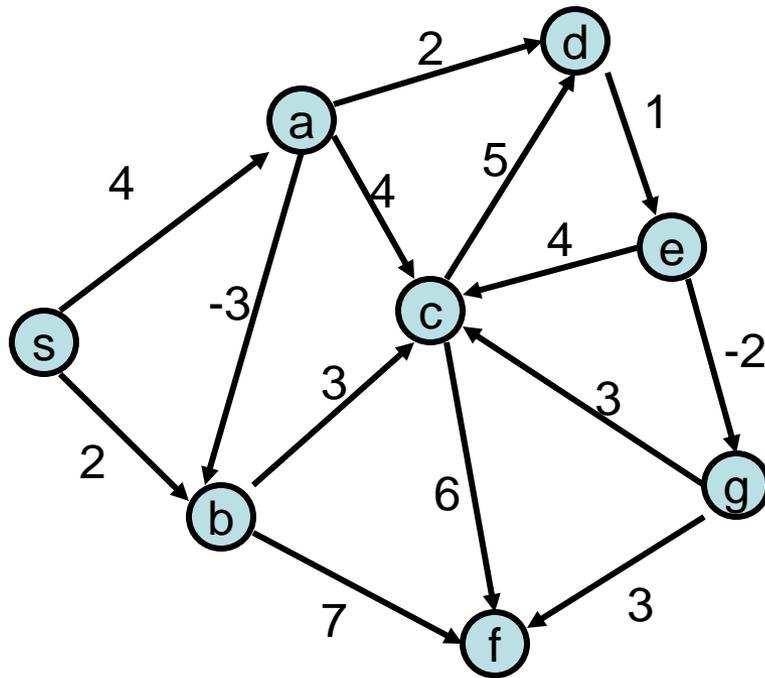


# Single Source Shortest Path Problem

- Given a graph and a start vertex  $s$ 
  - Determine distance of every vertex from  $s$
  - Identify shortest paths to each vertex
    - Express concisely as a “shortest paths tree”
    - Each vertex has a pointer to a predecessor on shortest path

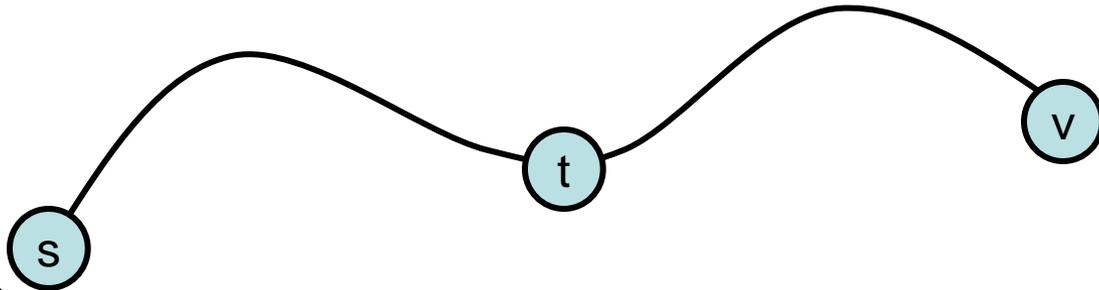


# Construct Shortest Path Tree from s



# Warmup

- If  $P$  is a shortest path from  $s$  to  $v$ , and if  $t$  is on the path  $P$ , the segment from  $s$  to  $t$  is a shortest path between  $s$  and  $t$



- WHY?

Assume all edges have non-negative cost

# Dijkstra's Algorithm

$S = \{ \}$ ;  $d[s] = 0$ ;  $d[v] = \text{infinity}$  for  $v \neq s$

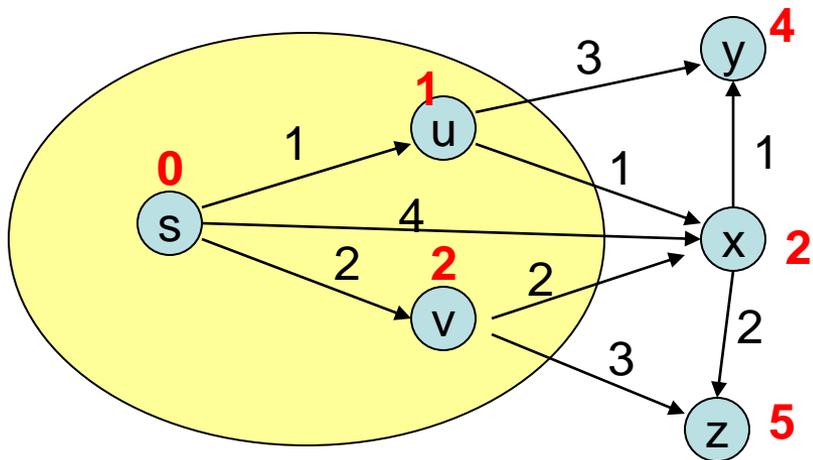
While  $S \neq V$

Choose  $v$  in  $V-S$  with minimum  $d[v]$

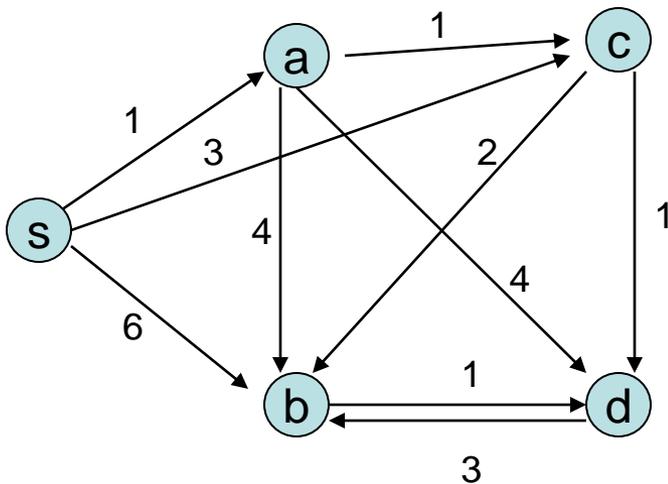
Add  $v$  to  $S$

For each  $w$  in the neighborhood of  $v$

$$d[w] = \min(d[w], d[v] + c(v, w))$$



# Simulate Dijkstra's algorithm (starting from s) on the graph



Round	Vertex Added	s	a	b	c	d
1						
2						
3						
4						
5						

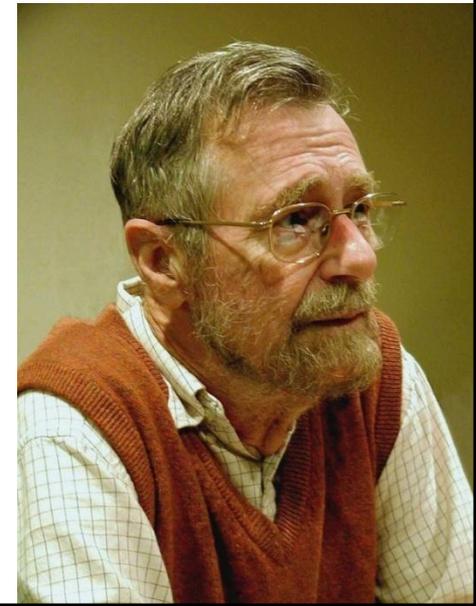
# Who was Dijkstra?



- What were his major contributions?

<http://www.cs.utexas.edu/users/EWD/>

- **Edsger Wybe Dijkstra** was one of the most influential members of computing science's founding generation. Among the domains in which his scientific contributions are fundamental are
  - algorithm design
  - programming languages
  - program design
  - operating systems
  - distributed processing
  - formal specification and verification
  - design of mathematical arguments

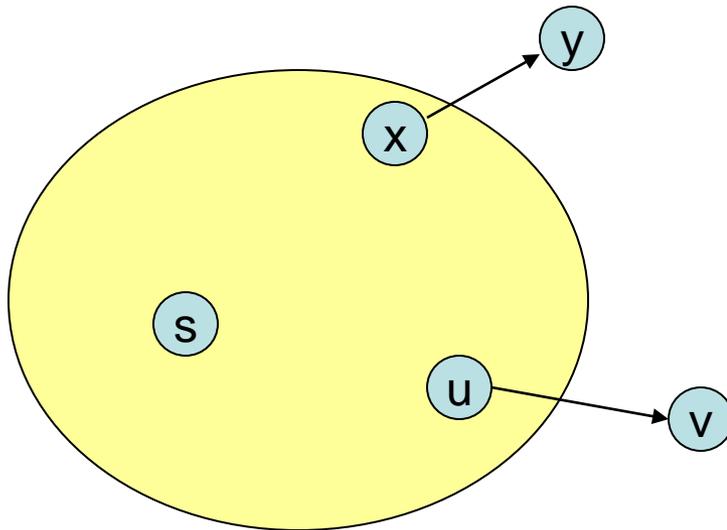


# Dijkstra's Algorithm as a greedy algorithm

- Elements committed to the solution by order of minimum distance

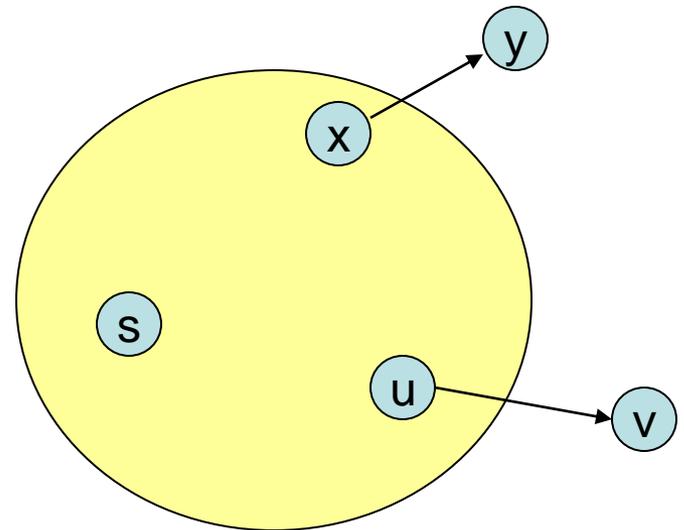
# Correctness Proof

- Elements in  $S$  have the correct label
- Key to proof: when  $v$  is added to  $S$ , it has the correct distance label.



# Proof

- Let  $v$  be a vertex in  $V-S$  with minimum  $d[v]$
- Let  $P_v$  be a path of length  $d[v]$ , with an edge  $(u,v)$
- Let  $P$  be some other path to  $v$ . Suppose  $P$  first leaves  $S$  on the edge  $(x, y)$ 
  - $P = P_{sx} + c(x,y) + P_{yv}$
  - $\text{Len}(P_{sx}) + c(x,y) \geq d[y]$
  - $\text{Len}(P_{yv}) \geq 0$
  - $\text{Len}(P) \geq d[y] + 0 \geq d[v]$

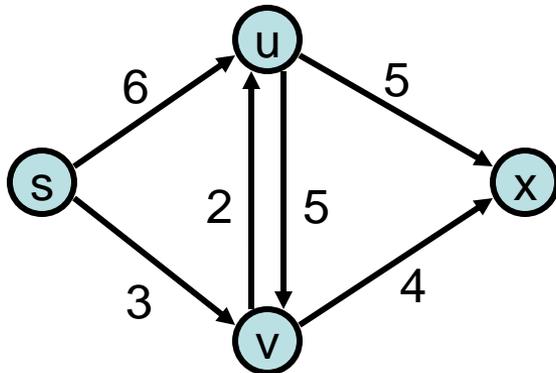


# Negative Cost Edges

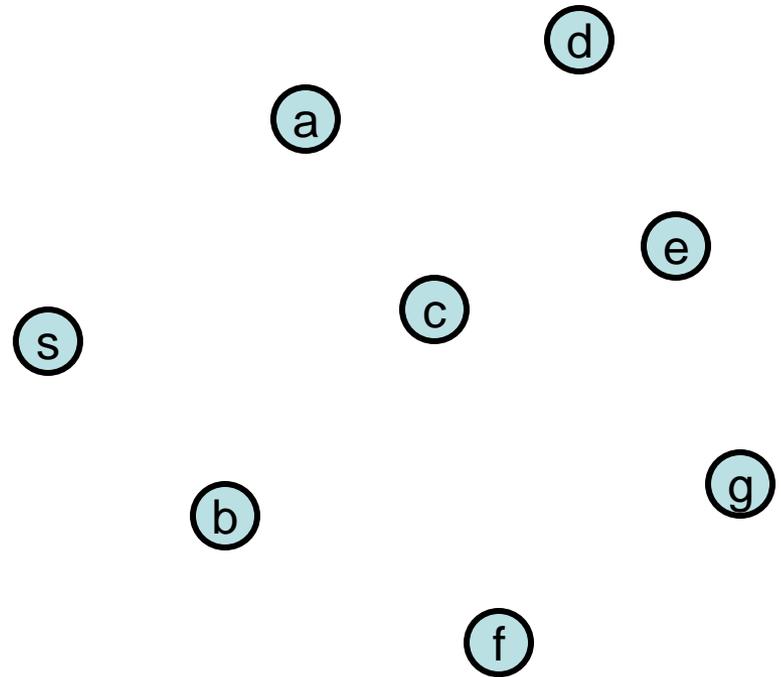
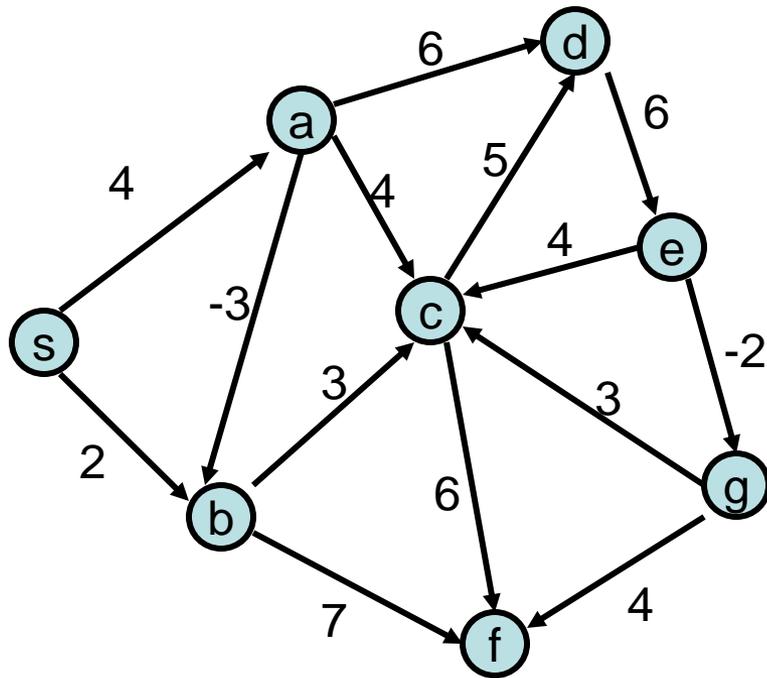
- Draw a small example a negative cost edge and show that Dijkstra's algorithm fails on this example

# Bottleneck Shortest Path

- Define the bottleneck distance for a path to be the maximum cost edge along the path



# Compute the bottleneck shortest paths



# How do you adapt Dijkstra's algorithm to handle bottleneck distances

- Does the correctness proof still apply?