Announcements

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- Exam grades done (finally)
- Mean ~87%
- Results
 - No significant differences between examiners
 - Some significant differences across problems: #3sorting array using Reverse- was much higher scoring than #1 and #2
 - We are adjusting scores for people who solved #1 and #2 so that the means for the first three problems were the same

Announcements

• Study groups? e-mail me by Friday

CIS 675

Dynamic Programming

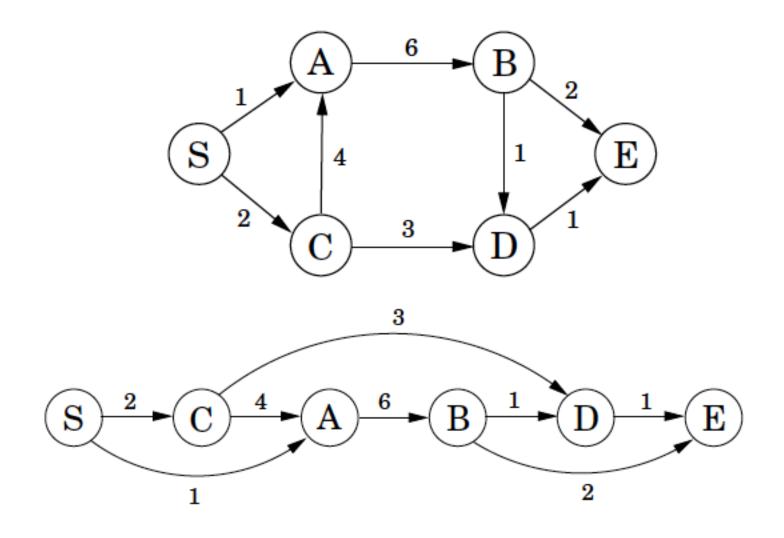
Introduction to Dynamic Programming

 Dynamic programming is a method of solving a problem in which the solution to a large problem is based on the solutions to smaller subproblems

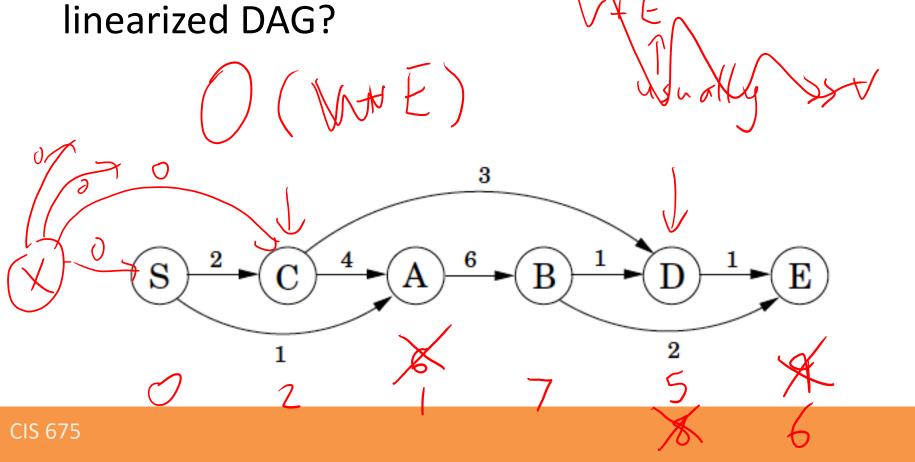
Introduction to Dynamic Programming

- Dynamic programming is a method of solving a problem in which the solution to a large problem is based on the solutions to smaller subproblems
- So far, sounds like divide-and-conquer!

• Linearize this DAG directed acyclic graph



• Suppose we want to find the shortest path from S to . How can we do this in one scan of the



 Suppose we want to find the shortest path from S to D. How can we do this in one scan of the linearized DAG?

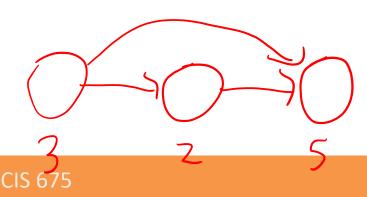
```
\begin{array}{ll} \text{initialize all dist}(\cdot) \text{ values to } \infty \\ \text{dist}(s) = 0 & \text{after s} \\ \text{for each } v \in V \backslash \{s\} \text{, in linearized order:} \\ \text{dist}(v) = \min_{(u,v) \in E} \{ \text{dist}(u) + l(u,v) \} \end{array}
```

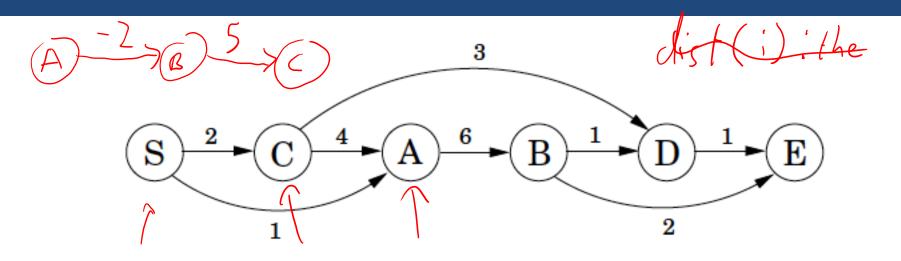
```
initialize all \mathsf{dist}(\cdot) values to \infty
      dist(s) = 0
      for each v \in V \setminus \{s\}, in linearized order:
            \mathtt{dist}(v) = \min_{(u,v) \in E} \{\mathtt{dist}(u) + l(u,v)\}
find s.p. from specific start node to
every other node in a graph with
edge weights
 Same, but for longest paths (replace
Min->Max)
```

```
initialize all dist(·) values to \infty
                                                                  dist(s) = 0
for each v \in V \setminus \{s\}, in linearized order: dist(v) = \min_{\{u,v\} \in E} \{ \text{dist}(u) + l(u,v) \} \}

\max \{0, \max_{v \in V} \{s\}, \text{ in linearized order:} \}
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```
initialize all \operatorname{dist}(\cdot) values to \infty \operatorname{dist}(s) = \emptyset \cup (\zeta) for each v \in V \setminus \{s\}, in linearized order: \operatorname{dist}(v) = \min_{(u,v) \in E} \{\operatorname{dist}(u) + l(u,v)\} node veights instead of edge \cup (\zeta)
```

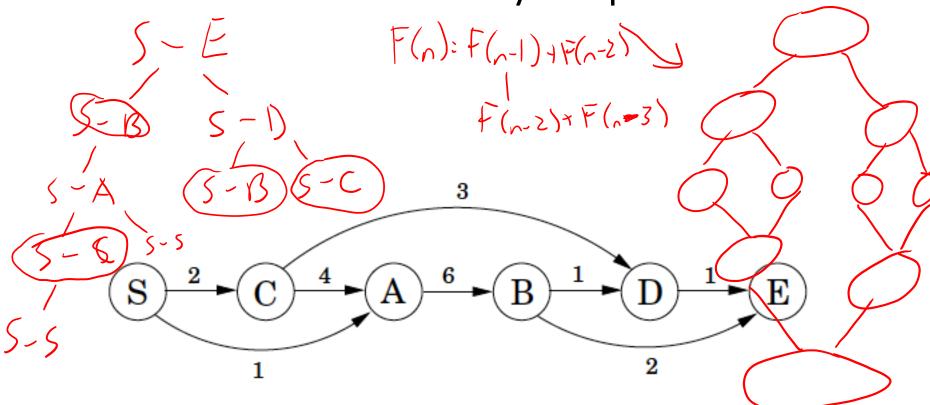




```
\begin{array}{l} \text{initialize all dist}(\cdot) \text{ values to } & & & & \\ \text{dist}(s) = 0 \\ \text{for each } v \in V \backslash \{s\} \text{, in linearized order:} \\ \text{dist}(v) = \min_{(u,v) \in E} \{ \text{dist}(u) + l(u,v) \} \\ \text{Max} \end{array}
```

In-Class Exercise

 Suppose we want to find the longest path from S to D. How would we modify the pseudocode?



Recursion?

 Would it make sense to implement this using recursion/D&C? What is the difference between this and recursion/D&C?

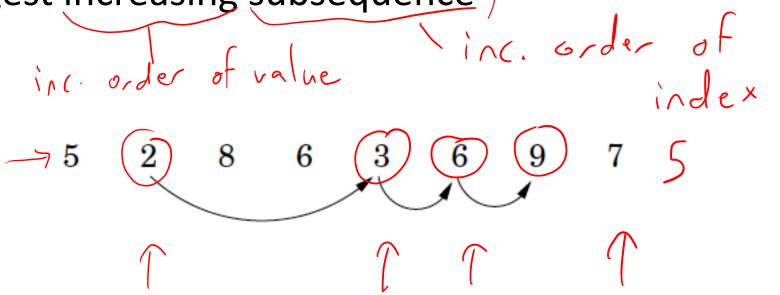
```
1) - C: should not have repeated subproblems
  initialize all dist(\cdot) values to \infty
  dist(s) = 0
  for each v \in V \setminus \{s\}, in linearized order:
       dist(v) = \min_{(u,v) \in E} \{ dist(u) + l(u,v) \}
DP: redundancy is ok (store values)
bottom-up approach
```

Shortest Paths in a DAG

- The problem of finding shortest paths in a DAG is a perfect analogy for dynamic programming!
 - Find solutions to subproblems
 Use subproblems to find solutions to larger problems

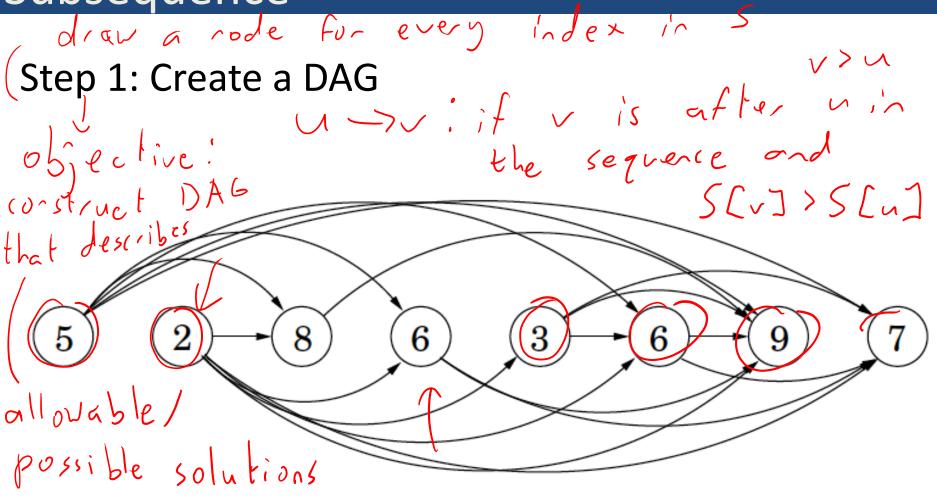
Finding the Longest Increasing Subsequence

• Given a sequence of numbers, we want to find the longest increasing subsequence

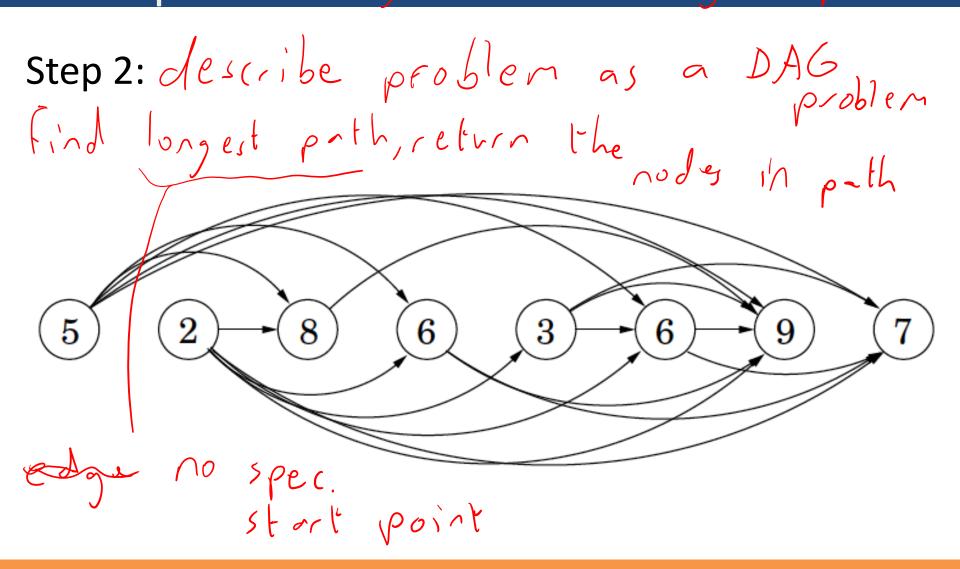


Finding the Longest Increasing

Subsequence



Finding the Longest Increasing Subsequence - Find the longest path



Finding the Longest Increasing Subsequence

```
update equation
L'(j): length of the longest ISS ending
        for j=1,2,\ldots,n:
         L(j) = 1 + \max\{L(i) : \mathcal{C}_j\}
return \max_j L(j)
                                  56:7 < 56,7
```

Solving Problems with Dynamic Programming

Key property:

- linearized
- There is an ordering on the subproblems (DAG!)
- There is a relation between the subproblems that allow you to solve later subproblems using earlier subproblems



Finding the Longest Increasing Subsequence

