

# Lecture 10

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More Dynamic Programming

# Travelling Salesperson Problem (TSP)

Graph (complete weighted)

Goal: Visit every vertex once and only once

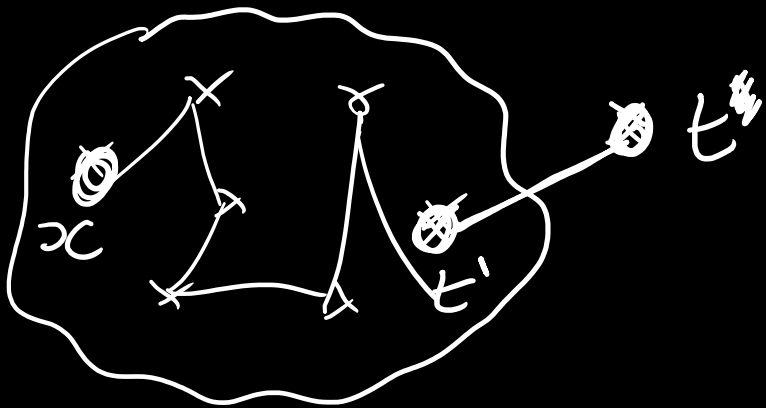
NP-hard !! (find shortest distance)

(and come back to start)

Naive algorithm: Try all  $n!$  orders  $\rightarrow O(n! \cdot n)$

# Substructure

Attempt: Subsets of vertices?  $\swarrow$



Add more information? Arbitrary start point  $x$

Consider paths that end at a particular vertex  $t$

$C(S, t) =$  Min-cost path starts at  $x$ , goes  
 through all  $v \in S$ , ends at  $t$   
 $\uparrow \quad \uparrow$   
Subst   end point

Recurrence

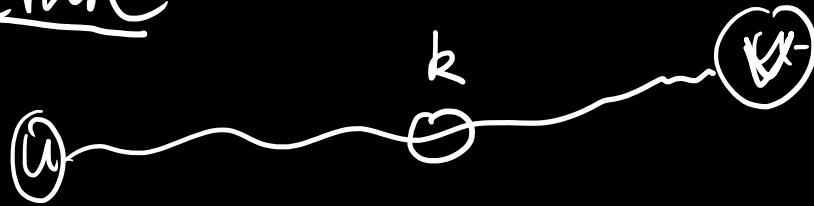
$$C(S, t) = \begin{cases} w(x, t) & \text{if } S = \{x, t\} \\ \min_{\substack{t' \in S \\ t' \neq x, t}} C(S - \{t'\}, t') + w(t', t) \end{cases}$$

Analysis.  $O(2^n \cdot n)$  subproblems.  $O(n)$  time per sub.  $O(2^n \cdot n^2)$

# All-pairs shortest paths

Directed weighted graph  $G$ .

## Optimal substructure



## Subproblems

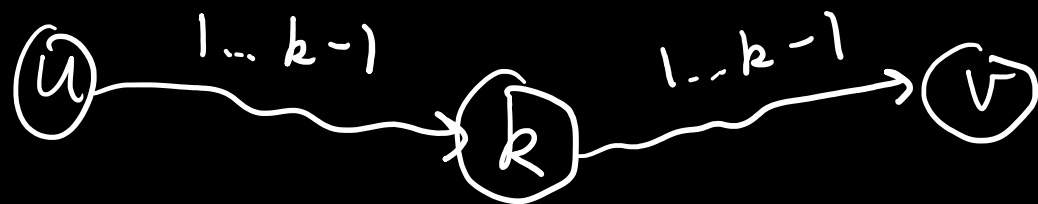
$D[u][v][k]$  = distance from  $u$  to  $v$  if the path uses only  $\{1, 2, \dots, k\}$  as intermediate

# Recurrence

don't use k  
↓

do use k  
↓

$$D[u][v][k] = \min \left\{ D[u][v][k-1], D[u][k][k-1] + D[k][v][k-1] \right\}$$



$$DP[u][v][0] = \begin{cases} 0 & \text{if } u=v \\ w(u,v) & \text{if } (u,v) \in E \\ \infty & \text{otherwise} \end{cases}$$

Analysis:  $O(n^3)$  problems,  $O(1)$  per,  $O(n^3)$  time.

# Optimize Space (Floyd-Warshall)

DP[u][v][k] required DP[...][...][k-1]

Only store current & previous value for k

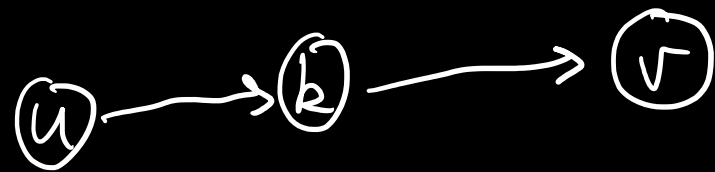
2<sup>nd</sup> idea: Forget about k.

for k = 1 to n do

for u = 1 to n do

for v = 1 to n do

$$DP[u][v] = \min(DP[u][v], \overbrace{DP[u][k]} + \overbrace{DP[k][v]})$$



$O(n^2)$  space

# Longest Increasing Subsequence

Given  $a_1, a_2, \dots, a_n$ .

Increasing subsequence is  $a_{i_1} < a_{i_2} < \dots < a_{i_k}$

Goal Find longest one

1 x x x    2 x x    5 x x 10    x x 12



## Optimal Substructure

1 x x x 2 x x x 5 x x 10 x x 12 x



## Subproblems

$LIS[i] =$  length of LIS of  $a_1, \dots, a_i$   
that ends at  $a_i$

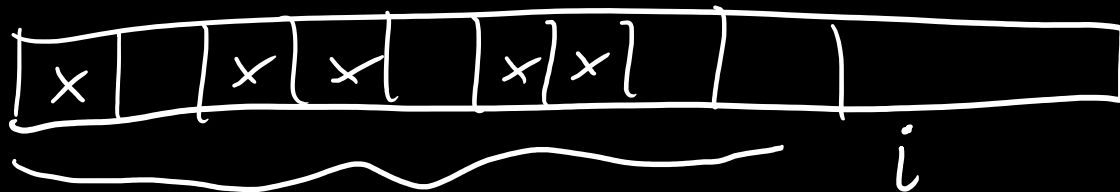
## Recurrence

$$LIS[i] = \begin{cases} 0 \\ 1 + \max_{\substack{0 \leq j < i \\ a_j < a_i}} LIS[j] \end{cases}$$

If  $i=0$

Analysis is  $O(n^2)$  time

Q: Can we do better?



Idea: What if  $a$  was sorted?

$n := \text{size}(a)$   $O(n \log n)$  time

$b := \text{sorted}(a)$

LIS : SegTree = (array(int))(n+1, 0)

for  $i$  in 0 to  $n-1$  do {

    rank = binary\_search(b, a[i])

    LIS.Assign(rank, 1 + LIS.RangeMax(0, rank))

}  
return LIS.RangeMax(0, n-1)