



Algorithms: Design  
and Analysis, Part II

## Exact Algorithms for NP-Complete Problems

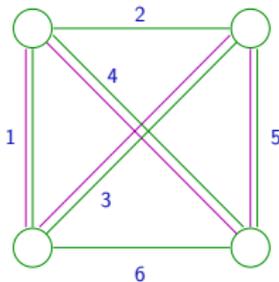
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The Traveling  
Salesman Problem

# The Traveling Salesman Problem

**Input:** A complete undirected graph with nonnegative edge costs.

**Output:** A minimum-cost tour (i.e., a cycle that visits every vertex exactly once).



*OPT* = 13

**Brute-force search:** Takes  $\approx n!$  time  
[tractable only for  $n \approx 12, 13$ ]

**Dynamic Programming:** Will obtain  $O(n^2 2^n)$  running time  
[tractable for  $n$  close to 30]

# A Optimal Substructure Lemma?

**Idea:** Copy the format of the Bellman-Ford algorithm.

**Proposed subproblems:** For every edge budget  $i \in \{0, 1, \dots, n\}$ , destination  $j \in \{1, 2, \dots, n\}$ , let

$L_{ij}$  = length of a shortest path from 1 to  $j$  that uses at most  $i$  edges.

**Question:** What prevents using these subproblems to obtain a polynomial-time algorithm for TSP?

- A) There is a super-polynomial number of subproblems
- B) Can't efficiently compute solutions to bigger subproblems from smaller ones
- C) Solving all subproblems doesn't solve original problem
- D) Nothing!

# A Optimal Substructure Lemma II?

**Proposed subproblems:** For every edge budget  $i \in \{0, 1, \dots, n\}$ , destination  $j \in \{1, 2, \dots, n\}$ , let  $L_{ij}$  = length of shortest path from 1 to  $j$  that uses exactly  $i$  edges.

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- D) Nothing!

# A Optimal Substructure Lemma III?

**Proposed subproblems:** For every edge budget  $i \in \{0, 1, \dots, n\}$ , destination  $j \in \{1, 2, \dots, n\}$ , let  $L_{ij}$  = length of shortest path from 1 to  $j$  with exactly  $i$  edges and no repeated vertices

**Question:** What prevents using these subproblems to obtain a polynomial-time algorithm for TSP?

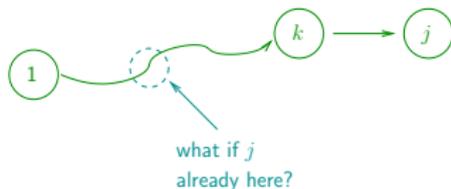
- A) There is a super-polynomial number of subproblems
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- D) Nothing!

# A Optimal Substructure Lemma III? (con'd)

**Hope:** Use the following recurrence:  $L_{ij} = \min_{k \neq 1, j} \{ L_{i-1, k} + c_{kj} \}$

shortest path from 1 to  $k$ ,  $(i-1)$  edges no repeated vertices

cost of final hop



**Problem:** What if  $j$  already appears on the shortest  $1 \rightarrow k$  path with  $(i-1)$  edges and no repeated vertices?

$\Rightarrow$  Concatenating  $(k_{ij})$  yields a second visit to  $j$  (not allowed)

**Upshot:** To enforce constraint that each vertex visited exactly once, need to remember the identities of vertices visited in subproblem.