



Algorithm Design XI

Dynamic Programming II

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Past Exam

2. (15 分) 考虑三分问题 (3-Partition problem): 给定整数集合 $\{a_1, a_2, \dots, a_n\}$, 判断是否可以将其分割为三个相互不相交的子集 I, J, K , 使得

$$\sum_{i \in I} a_i = \sum_{j \in J} a_j = \sum_{k \in K} a_k = \frac{1}{3} \sum_{i=1}^n a_i$$

6. (20 分) 在一条河上有一座独木桥，长度为 L ，上面分布着一些石子，为了简单起见，我们假设桥为 $0-L$ 的一段线段，而石子都分布在整数坐标上，也就是有一个函数 $stone(x)$ ，表示在坐标 x 上是否有石子，比如 $stone(0) = 1$ 表示在桥头有一个石子， $stone(2) = 0$ 表示在坐标为 2 的位置没有石子。

现在有一个小朋友站在桥头的位置想要过桥（站在桥尾或者跨过桥尾均为过了桥），但他不想踩到石子，他每跨出一步的步长是 $[S, T]$ 区间中的任何整数（包括 S 和 T ）。设计算法求小朋友要过河，必须踩到的最少的石子数。

(1) (15 分) 写出动态规划范式，注意边界条件，并详细说明动态规划范式所代表的意思。

(2) (5 分) 根据动态规划范式，给出时间空间复杂度分析。

Shortest Reliable Paths

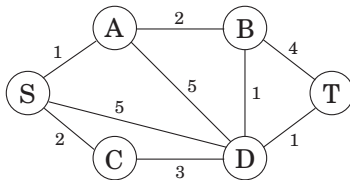
Shortest Reliable Paths



In a network, even if edge lengths faithfully reflect transmission delays, there may be **other considerations** involved in choosing a path.

For instance, each extra edge in the path might be an extra “**hop**” fraught with uncertainties and dangers of packet loss.

We would like to avoid paths with too many edges.



Shortest Reliable Paths



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Suppose then that we are given a graph G with lengths on the edges, along with two nodes s and t and an integer k , and we want the shortest path from s to t that uses at most k edges.

Dynamic programming will work!



For each vertex v and each integer $i \leq k$, let

$dist(v, i) =$ the length of the shortest path from s to v that uses i edges

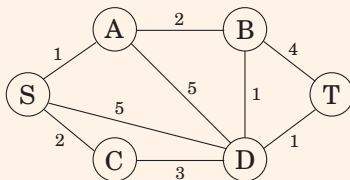
The starting values $dist(v, 0)$ are ∞ for all vertices except s , for which it is 0.

$$dist(v, i) = \min_{(u,v) \in E} \{dist(u, i-1) + l(u, v)\}$$

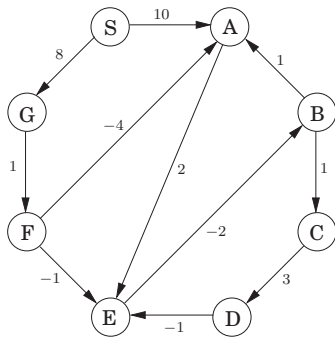
Shortest Reliable Paths



Find out the shortest reliable path from S to T , when $k = 3$.



Bellman-Ford Algorithm



Node	Iteration							
	0	1	2	3	4	5	6	7
S	0	0	0	0	0	0	0	0
A	∞	10	10	5	5	5	5	5
B	∞	∞	∞	10	6	5	5	5
C	∞	∞	∞	∞	11	7	6	6
D	∞	∞	∞	∞	∞	14	10	9
E	∞	∞	12	8	7	7	7	7
F	∞	∞	9	9	9	9	9	9
G	∞	8	8	8	8	8	8	8

All-Pairs Shortest Path

All-Pairs Shortest Path



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What if we want to find the shortest path not just between s and t but between **all pairs of vertices**?

One approach would be to execute **Bellman-Ford-Moore algorithm** $|V|$ times, once for each starting node.

The total running time would then be $O(|V|^2|E|)$.

We'll now see a better alternative, the $O(|V|^3)$, named **Floyd-Warshall** algorithm.

Floyd-Warshall Algorithm



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Dynamic programming again!

The Subproblems



Number the vertices in V as $\{1, 2, \dots, n\}$, and let

$dist(i, j, k)$ = the length of the shortest path from i to j in which only nodes $\{1, 2, \dots, k\}$ can be used as intermediates.

Initially, $dist(i, j, 0)$ is the length of the direct edge between i and j , if it exists, and is ∞ otherwise.

For $k \geq 1$

$$dist(i, j, k) = \min\{dist(i, j, k-1), dist(i, k, k-1) + dist(k, j, k-1)\}$$

The Program



```
for  $i = 1$  to  $n$  do
  for  $j = 1$  to  $n$  do
    |  $dist(i, j, 0) = \infty$ ;
  end
end
for all  $(i, j) \in E$  do
  |  $dist(i, j, 0) = l(i, j)$ ;
end
for  $k = 1$  to  $n$  do
  for  $i = 1$  to  $n$  do
    for  $j = 1$  to  $n$  do
      |  $dist(i, j, k) = \min\{dist(i, j, k - 1), dist(i, k, k - 1) + dist(k, j, k - 1)\}$ ;
    end
  end
end
end
```

Traveling Salesman Problem

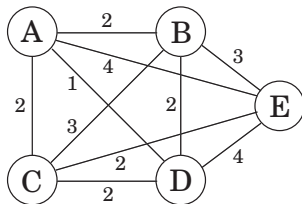
The Traveling Salesman Problem



A traveling salesman is getting ready for a big sales tour. Starting at his hometown, he will conduct a journey in which each of his target cities is visited exactly once before he returns home.

Q: Given the pairwise distances between cities, what is the best order in which to visit them, so as to minimize the overall distance traveled?

The **brute-force approach** is to evaluate every possible tour and return the best one. Since there are $(n - 1)!$ possibilities, this strategy takes $O(n!)$ time.



The Traveling Salesman Problem



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Denote the cities by $1, \dots, n$, the salesman's hometown being 1, and let $D = (d_{ij})$ be the matrix of intercity distances.

The goal is to design a tour that starts and ends at 1, includes all other cities exactly once, and has minimum total length.

The Subproblems



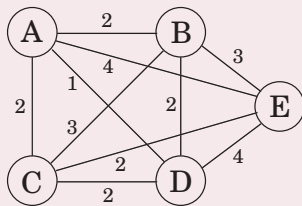
For a subset of cities $S \subseteq \{1, 2, \dots, n\}$ that includes 1, and $j \in S$, let $C(S, j)$ be the length of the shortest path visiting each node in S exactly once, starting at 1 and ending at j .

When $|S| > 1$, we define $C(S, 1) = \infty$.

For $j \neq 1$ with $j \in S$ we have

$$C(S, j) = \min_{i \in S: i \neq j} C(S \setminus \{j\}, i) + d_{ij}$$

Exercise



The Program



```
 $C(1, 1) = 0;$ 
for  $s = 2$  to  $n$  do
  for all subsets  $S \subseteq \{1, 2, \dots, n\}$  do
     $C(S, 1) = \infty;$ 
    for all  $j \in S$  and  $j \neq 1$  do
       $C(S, j) = \min_{i \in S: i \neq j} C(S \setminus \{j\}, i) + d_{ij};$ 
    end
  end
end
return  $(\min_j C(\{1, 2, \dots, n\}, j) + d_{j1});$ 
```

There are at most $2^n \cdot n$ subproblems, and each one takes linear time.

The total running time is therefore $O(n^2 \cdot 2^n)$.

Independent Sets in Trees

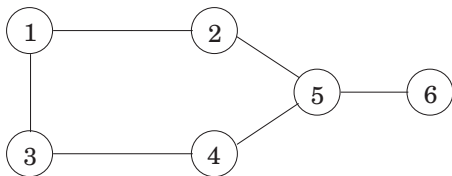
The Problem



A subset of nodes $S \subseteq V$ is an independent set of graph $G = (V, E)$ if there are no edges between them.

Finding the largest independent set in a graph is believed to be intractable.

However, when the graph happens to be a tree, the problem can be solved in linear time, using dynamic programming.



The Subproblems



$I(u)$ = size of largest independent set of subtree hanging from u .

$$I(u) = \max\left\{1 + \sum_{\text{grandchildren } w \text{ of } u} I(w), \sum_{\text{children } w \text{ of } u} I(w)\right\}$$