

Dynamic Programming

All pairs shortest paths

Dijkstra  $O(V^2) \rightarrow O(V^3)$  for all pairs.

$D[i, j]$  = shortest path from  $i$  to  $j$

$D_k[i, j]$  = shortest path from  $i$  to  $j$   
only using vertices  $1, \dots, k$  as  
intermediate nodes

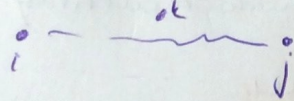
$D_0[i, j] = \infty$  if no edge  $(i, j)$

$d_{ij}$  = length of edge from  $i$  to  $j$  otherwise

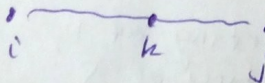
$V = \{1, \dots, n\}$

recurrence for  $D_k[i, j] = \min \left[ D_{k-1}[i, j], D_{k-1}[i, k] + D_{k-1}[k, j] \right]$

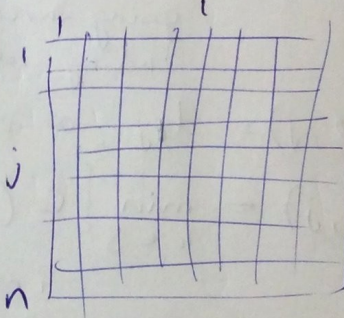
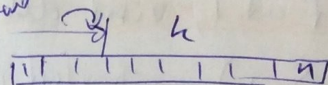
call 1



call 2



kept two  
2D arrays



for  
each  
 $k$   
update  
2D  
array

array  $D = (d_{ij})$

for  $k = 1$  to  $n$  do

for  $i = 1$  to  $n$  do

for  $j = 1$  to  $n$  do

$D_k[i, j] = \min [D_{k-1}[i, j], D_{k-1}[i, k] + D_{k-1}[k, j]$

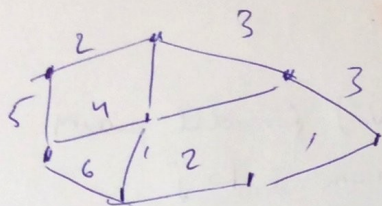
$O(V^3)$  runtime, not better than Dijkstra, but a different  
 $O(V^2)$  space  $\rightarrow$  upto  $O(V)$  formulation



# Traveling Salesman Problem.

NP-complete

vertices = cities



min cost tour:

start at 1, visit all cities and return to 1 at min cost

$(n-1)!$  paths

Stirling for large  $n$

$O(n!)$  in each path compute cost across  $n$  vertices

$$n! \sim \sqrt{2\pi n} \left(\frac{n}{e}\right)^n$$

with DP we get  $O(2^n n^2)$

start at 1, end at 1

reformulate the problem

cycle paths

hard to think recursively

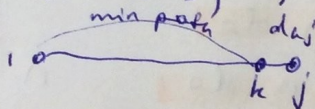
easier to think recursively

start at 1, visit all vertices

$C(S, j)$  = shortest path starting at 1, going through all vertices of  $S$  ending at  $j$

$C(\emptyset, j) = d_{1j}$ ,  $\infty$  if no edge

$$C(S, j) = \min_{k \in S} [C(S - \{k\}, k) + d_{kj}]$$



which node is  $k$ ? try all of them

for all  $(S, j)$  in increasing size of  $S$

$1, j \notin S$

$$C(S, j) = \min_{k \in S}$$

precomputed

from path to cycle done more min operation

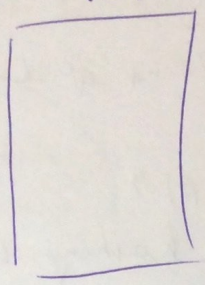
$$OPT = \min_k [C(\{2, \dots, n\} - \{k\}, k) + d_{k1}]$$



array

vertices  $j$

Subsets  
 $S = \{j\}$   
but keep  
all  
subsets of  
 $S$  for simplicity



$O(2^n n)$  ← memory

min op for each cell

$O(n)$

→  $O(2^n n^2)$

← runtime

My Summary

DP for strings:

recurrence on string, cost function  
↗ reconstruction ↖ edit dist.

DP for graphs:

recurrence on sequence of nodes,  
all pair shortest paths  
(subsets of nodes)  
↗ TSP ↖

Pattern matching

lengths

$P$  = pattern

$|P|$

$D$  = document

$|D|$

find pattern in doc.

think as  
base 10 numbers

Braklin

char by char move pattern

$O(P \cdot D)$  ← problem for large patterns

hashing

$O(D)$



Hash pattern (eg. 16 bit)

Hash blocks of dec and compare

① why isn't hashing  $O(P)$ ?

→ convenient "Hash"

↳ can we make hashing  $O(1)$ ?

② False positives?

→ Bound FP<sub>s</sub>

Pick a prime  $p$ . → later discussed, assume as subproblem

hash: number mod  $p$

① hash

17935

6386179352...

$p = 251$

$17935 \bmod 251 = 114$

$63861 \bmod 251 = 107$

$38612 \bmod 251$

$N \rightarrow N'$

$$N' = (N - 10^{1P-1} \cdot a) \cdot 10 + b$$

$$N' = (N - (10^{1P-1} \bmod p) \cdot a) \cdot 10 + b \pmod p$$

const precompute

② Bound FP rate  
pick random prime

$\pi(x) = \# \text{ of primes } \leq x$

$\pi(x) \sim \frac{x}{\ln x}$

$10^{100} \quad \pi(10^{100}) \sim \frac{10^{100}}{100 \ln 10}$

fraction of primes  $\frac{1}{250} \rightarrow$

const. time  
Fingerprinting

Single PP coll

consider  $\begin{cases} a \\ \text{non-padded} \\ \text{FP coll} \end{cases} \pmod p$

$P - D^* = 0 \bmod p$

$D^*$  chunks corresponding to  $P$

$|P - D^*| \leq 10$

each size  $10^{1P}$

$j \leq \log_2 X$  (take  $\log_2$  on both sides)

$\Rightarrow$

Suppose primes  $p_1, p_2, \dots, p_j$  all divide  $X$ , then

$2^j \leq \prod_{i=1}^j p_i \leq X$

each prime is at least 2

? how many primes can get it to 0 mod p

↳ the number must be product of these primes, at least (each prime can contribute as multiple)



$$\# \text{ bad primes} \leq \log_2 X = \log_2 10^{|P|}$$

(3)

# of primes that  
get a non-matching  
pattern to 0 mod p

$$= |P| \log_2 10$$

$$\# \text{ primes (hashing into 64 bits)} = \pi(2^{64})$$

$$P[\text{a bad prime at a single "non-pattern" hashing}] = \frac{|P| \log_2 10}{\pi(2^{64})}$$

single FP call

$$P[\text{FP in doc, } \overbrace{\text{FP across all "non-pattern" hashings in a doc}}] = \frac{|D| |P| \log_2 10}{\pi(2^{64})}$$

with k hashes

(increases work by a constant)  
but lowers FPrate exponentially

$$P[\text{FP in doc}] = \left[ \frac{|D| |P| \log_2 10}{\pi(2^{64})} \right]^k$$