

## Shortest Paths

Digraph with edge weights (costs, distances)

Shortest path from  $s$  to  $t$ : path of minimum total wt.

Problems:

single pair: given  $s, t$ , find a shortest path from  $s$  to  $t$

single source: given  $s$ , find shortest paths from  $s$  to all reachable vertices

all pairs: find shortest paths between all pairs

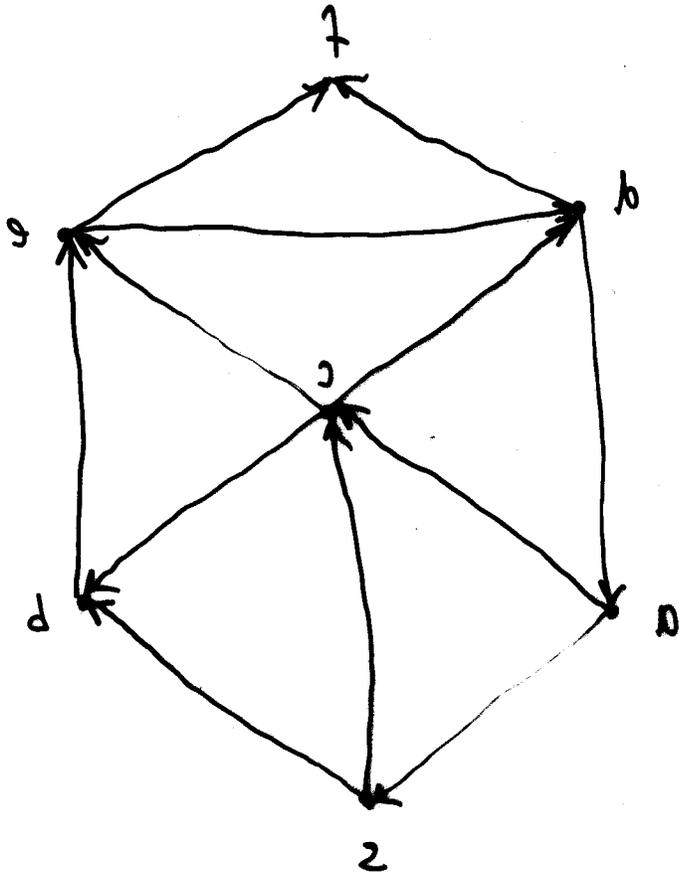
Cases:

acyclic

no negative wts

general

(planar, etc.)



Properties:

$\exists$  a shortest path from  $s$  to  $t$  iff there is no negative (total wt.) cycle on a path from  $s$  to  $t$ .

If there is no such cycle, there is a shortest path that is simple (no repeated vertex).

If no neg cycle reachable from  $s$ , then  $\exists$  shortest path tree: rooted at  $s$ , contains all vertices reachable from  $s$ , all tree paths are shortest paths in graph.

New goal: find a negative cycle or construct a shortest path tree.

(single-source problem is central)

Given a spanning tree  $T$  rooted at  $s$ ,

$d(v)$  = tree wt from  $s$  to  $v$ , is  $T$  a  
shortest path tree?

Yes, iff there is ~~no~~ <sup>edge</sup>  $(v, w)$  with  $d(v) + c(v, w) < d(w)$

Edge relaxation algorithm to find a shortest  
path tree:

$d(s) = 0$ ,  $d(v) = \infty$  for  $v \neq s$

while  $\exists$  edge  $(v, w)$  with  $d(v) + c(v, w) < d(w)$   
do  $\{ d(w) = d(v) + c(v, w); p(w) = v \}$

$d(v)$  is always the wt of some  $s-v$  path

if algorithm stops and  $p$  defines a tree,  
must be a shortest path tree

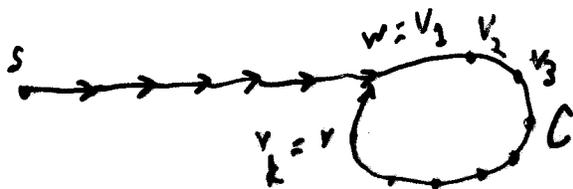
stops iff no neg cycle

(alg maintains  $d(w) \geq d(v) + c(v, w)$  if  $v = p(w)$ )

Suppose  $T$  not a sp tree. Let  $x$  be such that  $d(x) > s-x$  distance. Let  $P$  be a shortest path from  $s$  to  $x$ ,  $d'(v) = P$ -distance from  $s$ ,  $(v, w)$  first edge along  $P$  such that  $d'(w) < d(w)$ . Then  $d(v) + c(v, w) = d'(v) + c(v, w) = d'(w) < d(w)$ . (This gives the hard direction of sp tree test.)

Suppose edge relaxation algorithm creates a cycle.

Then it must be a negative cycle.



$$d(v) + c(v, w) < d(w) \Rightarrow d(v) - d(w) + c(v, w) < 0$$

$$\text{Sum around cycle: } \sum_{i=1}^k d(v_i) - d(v_{i+1}) + c(v_i, v_{i+1}) < 0$$

$$\sum_i c(v_i, v_{i+1})$$

Labeling and scanning algorithm:

$L = \{s\}$ ;  $d(s) = 0$ ;  $d(v) = \infty$  for  $v \neq s$ ;

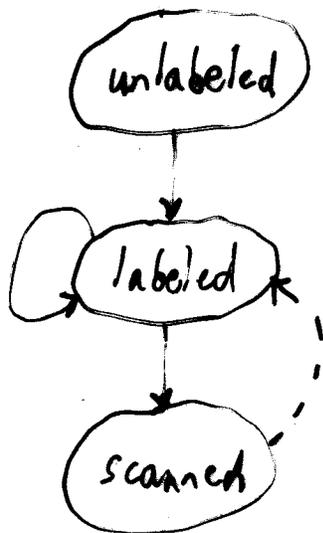
while  $L \neq \emptyset$  do {

  remove  $v$  from  $L$ ;

  scan( $v$ ): for each  $(v, w)$  do

    if  $d(v) + c(v, w) < d(w)$  then

      {  $d(w) = d(v) + c(v, w)$ ;  $p(w) = v$ ; add  $w$  to  $L$  }



Acyclic: topological scanning order

$$O(m)$$

Non-negative weights: shortest-first scanning order  
(Dijkstra)

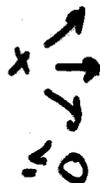
$O(n^2)$  original     $O(m \log n)$  standard heap

$O(n \log n + m)$  Fibonacci heap

No vertex scanned more than once:

Invariant  $d(s) \leq d(L) \leq d(u)$

  
smallest x

  
 $\leq 0$

General case: FIFO scanning order

Maintain  $L$  as an (ordinary) queue

Phases:

phase 0 = scan of  $s$

phase  $k$  = scan of vertices added to  $L$   
during phase  $k-1$

After phase  $k$ , all distances for shortest paths  
of  $k+1$  or fewer edges are correct

$\Rightarrow n-1$  or fewer phases

$\Rightarrow O(nm)$  time

## Negative cycle detection:

Method 1: Count phases, stop after first scan of  $n^{\text{th}}$  phase. Parent ptrs will define a (negative) cycle.

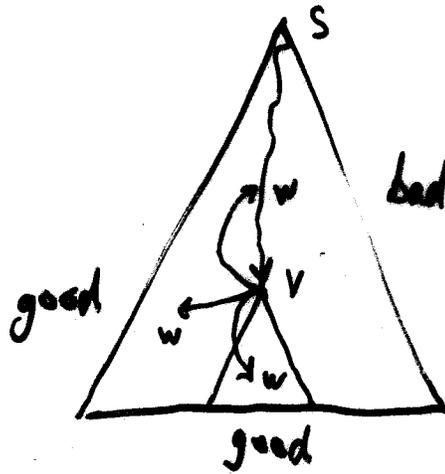
Method 2 (early detection): Maintain a preorder list of vertices in tentative shortest path tree. When relabeling  $w$  using  $(v, w)$ , explore the subtree rooted at  $w$ , disassembling it and looking for  $v$ .

Both methods take  $O(nm)$  time total.

(Theoretically) inferior methods:

Method 3: When relabeling  $v$  using  $(v, w)$ , follow parent pointers from  $v$  looking for  $w$ .

Method 4: Maintain tentative shortest path tree as a dynamic tree.



bad (negative cycle)

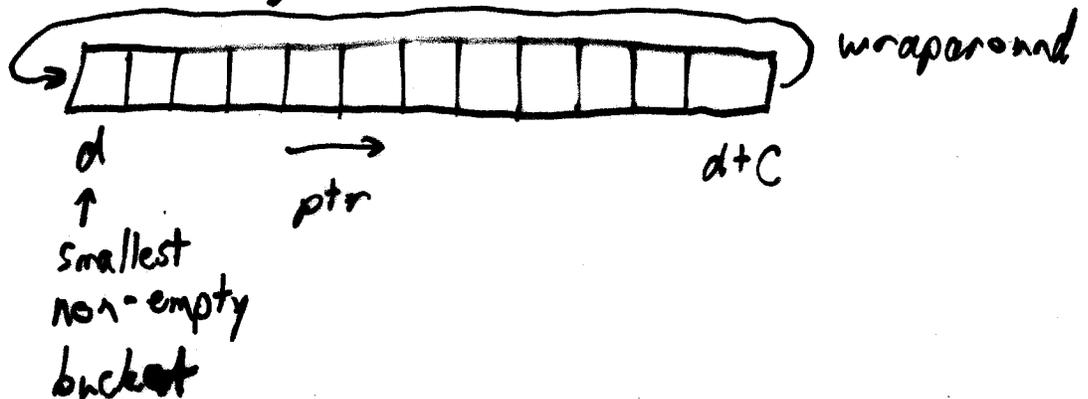
# Dijkstra algorithm:

heap is monotone: vertices are removed in increasing order by tentative distance

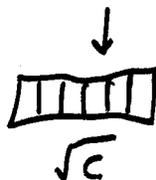
Can exploit this if edge wts are (small) integers

Dial: buckets for tentative distances  
# buckets = max edge wt. ( $C$ ) + 1

$O(m + Cn)$  time



Refinement: Use multiple levels of buckets



$O(m + \sqrt{C}n) \rightarrow O(m + n \log C)$   
(binary levels)

n single sources

→ Dijkstra:  $O(nm + n^2 \log n)$

↓ Bellman-ford → eliminate neg edge costs

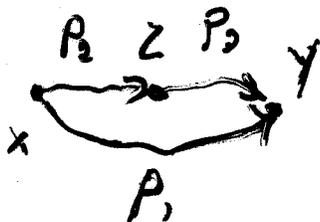
$p(v)$

$$c'(v, w) = c(v, w) + p(v) - p(w) \geq 0$$



All pairs:

Dynamic prog.



$$d(x, x) = 0$$

$$d(x, y) = \infty \text{ for } x \neq y \text{ if } (x, y) \notin E$$

$$d(x, y) = c(x, y) \text{ if } x \neq y \text{ and } (x, y) \in E$$

for z

for x

for y

if  $d(x, z) + d(z, y) < d(x, y)$  then

$$d(x, y) = d(x, z) + d(z, y)$$

$$O(n^3)$$

Heuristic Search: Let  $e(v)$  be an estimate of the distance from  $v$  to the goal  $t$ .

Use Dijkstra's algorithm with  $d(v) + e(v)$  as the selection criterion.

The method works if

$$e(v) \leq L(v, w) + e(w) \text{ for all } v, w$$

(Estimate  $e$  is a consistent lower bound on the actual distance.)

In Euclidean graphs the distance "as the crow flies" works.

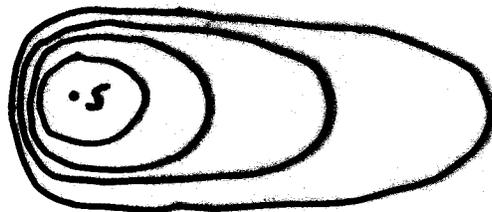
Hart, Nilsson, Rafael (1968)

# Dijkstra's algorithm



t

# Heuristic search



t

Bidirectional Search: Search forward from  $s$   
and backward from  $t$  concurrently.

⇒ Getting the stopping rule correct is  
tricky, especially for bidirectional  
heuristic search.