

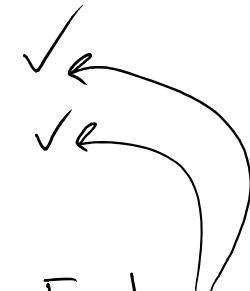
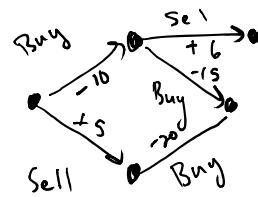
Dijkstra

Good: v. fast!  $O(m \log n)$  run time

Bad:

- Not good if have distributed graph like internet because need to maintain global heap
- Not good if have negative weights

e.g.  
financial  
transaction  
graph:



New Approach: Dynamic Programming - Bellman Ford

(actually used for internet routing!)

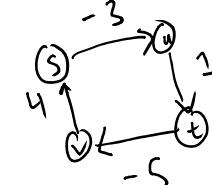
Problem: What to do when  $G$  has negative weight cycle?

def: Cycle is a path from  $v \in V$  back to  $v \in V$ , and doesn't repeat other vertices

A) Return  $-\infty$

B) Should return shortest cycle free path

↳ NP-complete problem. Best known algorithm is exponential in  $n, m$

Bellman Ford:

Input: directed graph  $G = (V, E)$ , edge costs  $l_e$ , vertex  $s \in V$

Output: Negative cycle in  $G$   
or (if no negative cycle)

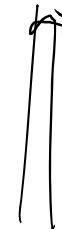
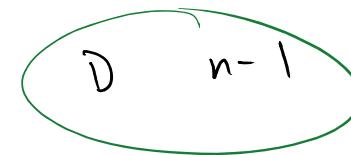
Shortest paths from  $s$  to all other  $v \in V$

For now, assume no neg. wt. cycle in  $G$  (but neg. wt. edges ok!)

Q: If a graph  $G$  has no negative weight cycles, what is an upper bound on the number of edges in a shortest path?

A) no bound    B)  $m$

c)  $n$



Proof: • For contradiction, suppose <sup>shortest</sup> path has  $>n-1$  edges.

- Then must visit same vertex twice  $\Rightarrow$  cycle
- All cycles have non-negative weight, so if remove, get shorter path, a contradiction!

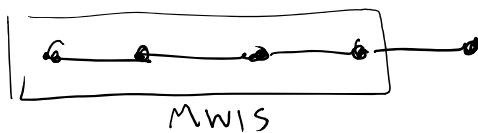
## To Create D.P. (dynamic programming) algorithm:

1. Think of form of optimal solution.

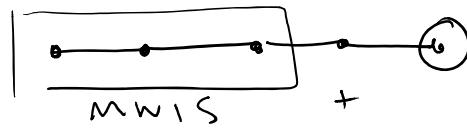
- WMIS on line:  $v_n \in S$  or  $n \notin S_n$

2. How do you write in terms of optimal solution to smaller problem?

(i)

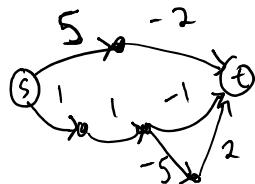


(ii)



Problem: on general graphs, hard to order subproblems

Q:



What is shortest path from s to t with at most 2 edges? at most 3 edges?

- A) 3, 1
- B) 2, 0
- C) 3, -1
- D) 2, 1

We'll use max # of edges in path to order our subproblems

Let  $P_{i,v}$  = shortest  $s-v$  path with at most  $i$  edges  
 (or if no  $s-v$  path) (assume unique  $\forall v, i$ )

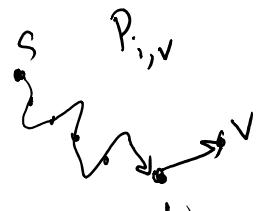
Case 1: If  $P_{i,v}$  has  $\leq (i-1)$  edges,

$$P_{i,v} = P_{i-1,v}$$

Case 2: If  $P_{i,v}$  has  $i$  edges, then

$$P_{i,v} = P_{i-1,w} + (w,v)$$

for some  $w: (w,v) \in E$



Pf: Case 1:  $\therefore l(P_{i,v}) \leq l(P_{i-1,v})$  since extra edge can only help

- If  $l(P_{i,v}) < l(P_{i-1,v})$ , then there is a shorter path than  $P_{i-1,v}$  with  $\leq (i-1)$  edges, a contradiction
- $$\Rightarrow l(P_{i,v}) = l(P_{i-1,v})$$
- by uniqueness,  $P_{i,v} = P_{i-1,v}$

Case 2: Suppose  $P_{i,v} = p + (w,v)$  where  $p$  is a path from  $s$  to  $w$ ,  $p \neq P_{i-1,v}$

- $p$  longer  $\Rightarrow P_{i,v}$  is not optimal
- $p$  can't be less than  $P_{i-1,v}$  by def

$$\Rightarrow P_{i,v} = P_{i-1,w} + (w,v) \text{ for some } w.$$

Q: How many subproblems must be evaluated to calculate  $P_{i,v}$ ?

- A)  $n+1$     B)  $n$     C)  $1 + |\{u : (u,v) \in E\}|$     D)  $|\{u : (u,v) \in E\}|$

Case 1:  $1 \rightarrow P_{i-1,v}$

Case 2:  $P_{i-1,w}$ , for each  $w \in \{u : (u,v) \in E\}$

→ Cycles permitted b/c  $i$  keeps from infinite cycling around

### 3 (Dynamic Programming) Create recurrence relation

Let  $L_{i,v}$  be length of path  $P_{i,v}$  (so if no path)

Q. Base Case:  $L_{0,s} = 0$      $L_{0,v} = \infty \quad \forall v \in V - s$

Recurrence:  $L_{i,v} = \min \begin{cases} L_{i-1,v} \\ \min_{(w,v) \in E} L_{i-1,w} + c_{(w,v)} \end{cases}$

Correctness: Using proof on previous page,  $P_{i,v}$  must be related to one of  $1 + |\{w : (w,v) \in E\}|$  subproblems. We took at all (exhaustive search)