

# CSE 421 Introduction to Algorithms

Richard Anderson  
Lecture 16

Shortest Paths with Dynamic Programming

1

## Announcements

- Dynamic Programming Reading:
  - 6.8 Shortest Paths (Bellman-Ford)
- Network Flow Reading
  - 7.1-7.3, Network Flow Problem and Algorithms
  - 7.5-7.12, Network Flow Applications

2

## Shortest Path Problem

- Dijkstra's Single Source Shortest Paths Algorithm
  - $O(m \log n)$  time, positive cost edges
- Directed Acyclic Graphs
  - $O(n + m)$ , Topological Sort + DP
- Bellman-Ford Algorithm
  - $O(mn)$  time for graphs which can have negative cost edges

3

## Lemma

- If a graph has no negative cost cycles, then the **shortest** paths are **simple** paths
- Shortest paths have at most  $n-1$  edges

4

## Shortest paths with a fixed number of edges

- Find the shortest path from  $s$  to  $w$  with exactly  $k$  edges

5

## Express as a recurrence

- Compute distance from starting vertex  $s$
- $\text{Opt}_k(w) = \min_x [\text{Opt}_{k-1}(x) + c_{xw}]$
- $\text{Opt}_0(w) = 0$  if  $w = s$  and infinity otherwise

6

## Algorithm, Version 1

```

foreach w
  M[0, w] = infinity;
M[0, s] = 0;
for i = 1 to n-1
  for each w
    M[i, w] = minx(M[i-1, x] + cost[x, w]);
  
```

7

## Algorithm, Version 2

```

foreach w
  M[0, w] = infinity;
M[0, s] = 0;
for i = 1 to n-1
  for each w
    M[i, w] = min(M[i-1, w], minx(M[i-1, x] + cost[x, w]));
  
```

8

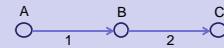
## Algorithm, Version 3

```

foreach w
  M[w] = infinity;
M[s] = 0;
for i = 1 to n-1
  for each w
    M[w] = min(M[w], minx(M[x] + cost[x, w]));
  
```

9

## Example:



A	B	C

A	B	C

A	B	C

A	B	C

10

## Correctness Proof for Algorithm 3

- Key lemma – at the end of iteration  $i$ , for all  $w$ ,  $M[w] \leq M[i, w]$ ;

11

## Algorithm, Version 4

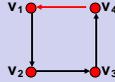
```

foreach w
  M[w] = infinity;
M[s] = 0;
for i = 1 to n-1
  for each w
    for each x
      if (M[w] > M[x] + cost[x, w])
        P[w] = x;
        M[w] = M[x] + cost[x, w];
  
```

12

## Theorem

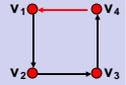
If the pointer graph has a cycle, then the graph has a negative cost cycle



13

If the pointer graph has a cycle, then the graph has a negative cost cycle

- If  $P[w] = x$  then  $M[w] \geq M[x] + \text{cost}(x, w)$ 
  - Equal when  $w$  is updated
  - $M[x]$  could be reduced after update
- Let  $v_1, v_2, \dots, v_k$  be a cycle in the pointer graph with  $(v_k, v_1)$  the last edge added
  - Just before the update
    - $M[v_j] \geq M[v_{j+1}] + \text{cost}(v_{j+1}, v_j)$  for  $j < k$
    - $M[v_k] > M[v_1] + \text{cost}(v_1, v_k)$
  - Adding everything up
    - $0 > \text{cost}(v_2, v_1) + \text{cost}(v_3, v_2) + \dots + \text{cost}(v_1, v_k)$



14

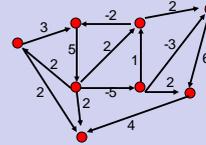
## Negative Cycles

- If the pointer graph has a cycle, then the graph has a negative cycle
- Therefore: if the graph has no negative cycles, then the pointer graph has no negative cycles

15

## Finding negative cost cycles

- What if you want to find negative cost cycles?



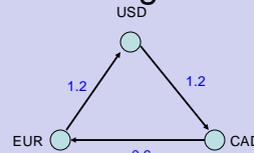
16

## What about finding Longest Paths

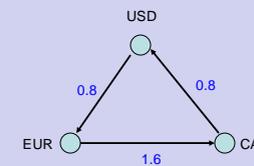
- Can we just change Min to Max?

17

## Foreign Exchange Arbitrage



	USD	EUR	CAD
USD	-----	0.8	1.2
EUR	1.2	-----	1.6
CAD	0.8	0.6	-----



18