# CS 4800: Algorithms & Data

Lecture 18 March 23, 2018

## Negative weights?

• What goes wrong with previous proof?



 When v is removed, d(v) < d(y) for all unremoved y so no way shortest path goes from s to v via y

## Infinitely short path?



## Restrict our attention to the case with no negative cycles

#### More dynamic programming

- d(i, v): min distance from s to v using at most i edges
- Without negative cycles, shortest paths use at most V-1 edges

• 
$$d(i, v) = \begin{cases} 0 \text{ for } v = s \\ \infty \text{ for } v \neq s, i = 0 \\ \min_{u \in V} d(i - 1, u) + w(u, v) \end{cases}$$

#### Bellman-Ford algorithm

- Initialize d(0, s) = 0 and  $d(0, v) = \infty$  for all  $v \neq s$
- For i from 1 to V-1
  - Set  $d(i, v) \leftarrow d(i 1, v)$  for all v
  - For all edges  $u \rightarrow v$  in E
    - If d(i, v) > d(i 1, u) + w(u, v)
      - $d(i,v) \leftarrow d(i-1,u) + w(u,v)$
      - $pred(i, v) \leftarrow u$

#### O(VE) time



## All pair shortest paths

- So far, only a single source s
- What if we want shortest paths between all pairs?
  - Non-negative weights: Run Dijkstra's for all s
    - Running time: O(V(V+E)log V)
  - General weights, no negative cycle: Run Bellman-Ford for all s
    - Running time: O(V<sup>2</sup>E)
  - Next: better solution for general weights, no negative cycles

## Floyd-Warshall algorithm

- d(i,j,k): Length of shortest path from i to j if we only use vertices 1...k as intermediate points
- Base cases

$$d(i,j,0) = \begin{cases} 0 \ if \ i = j \\ w(i,j) \ if \ (i,j) \in E \\ \infty \ otherwise \end{cases}$$

#### Recurrence relation

- How to compute d(i, j, k) from d(\*,\*,k-1)?
- Two possibilities:
  - Do not use k as an intermediate point d(i, j, k) = d(i, j, k 1)
  - Use k as an intermediate point d(i, j, k) = d(i, k, k - 1) + d(k, j, k - 1)
- Pick the best of two choices  $d(i, j, k) = \min(d(i, j, k - 1), d(i, k, k - 1) + d(k, j, k - 1))$



#### Floyd-Warshall algorithm

• Initialize 
$$d(i, j, 0) = \begin{cases} 0 \text{ if } i = j \\ w(i, j) \text{ if } (i, j) \in E \\ \infty \text{ otherwise} \end{cases}$$

- For k from 1 to V
  - For i from 1 to V
    - For j from 1 to V

• 
$$d(i,j,k) = \min \begin{cases} d(i,j,k-1) \\ d(i,k,k-1) + d(k,j,k-1) \end{cases}$$

#### Save memory

• Initialize 
$$d(i,j) = \begin{cases} 0 \text{ if } i = j \\ w(i,j) \text{ if } (i,j) \in E \\ \infty \text{ otherwise} \end{cases}$$

- For k from 1 to V
  - For i from 1 to V
    - For j from 1 to V

• 
$$d(i,j) = \min \begin{cases} d(i,j) \\ d(i,k) + d(k,j) \end{cases}$$

 $O(V^3)$  time,  $O(V^2)$  space

## Max flow, min cut

"Consider a rail network connecting two cities by way of a number of intermediate cities, where each link of the network has a number assigned to it representing its capacity. Assuming a steady state condition, find a maximal flow from one given city to the other."

Ford-Fulkerson attributed to T. Harris



Harris-Ross '55

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Assumption:

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Entire network available for east-west traffic (no allowance for civilian or economic traffic)

#### Results:

(a) 163,000 tons per day can be delivered from points of origin to destinations.

(b) 147, 000 tons per day can be delivered without using Austrian lines.

(c) 152,000 tons per day can be delivered into Germany by all lines.

(d) 126, 000 tons per day can be delivered into East Germany without using Austrian lines.

Harris-Ross '55

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network available

---- Internctional boundary

Railway operating division

Capacity: 12 each way per day. Required flow of 9 per day toward destinations (in direction of arrow) with equivalent number of returning trains in opposite direction

12, 52(USSR), and Roumania

Germany

B (Czechoslovavakia); and 2, 3 (Austria)

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