# CS 341: Algorithms Module 7: Graph Algorithms

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Based on lecture notes by many previous CS 341 instructors

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# Single-source shortest path

- $d(\ell,j) = \text{Length of shortest path from } s \text{ to } j \text{ that uses at most } \ell \text{ edges.}$
- d(0,j) = 0 if j = s and  $\infty$  otherwise.
- $\bullet \ d(\ell,j) = min\bigg\{d(\ell-1,j), min_k\{d(\ell-1,k)+w_{kj}\}\bigg\}$

# Single-source shortest path

• This gives rise to an obvious DP algorithm:

```
for i = 1..n: d[i] = \infty

d[s] = 0

for \ell = 1..n - 1:

for j = 1..n:

for k = 1..n:

d[j] = min(d[j], d(k) + w_{kj})
```

• Which runs in  $\Theta(n^3)$  time.

## Single-source shortest path

- Runtime can be improved by only looking at the (j, k) pairs corresponding to edges; this makes  $\Theta(n|E|)$  runtime.
- Worse than Dijkstra, but works for negative-length edges.
- This is the Bellman-Ford algorithm (Chapter 24.1; the book explains it different and before APSP)
- (From the 1950's ...)

#### All-pairs shortest path

- Given a directed graph with edge lengths  $w_{i,j}$ , for each ordered pair of vertices (u, v), compute  $\delta(u, v)$  (shortest path from u to v)
- If edge lengths are nonnegative, can use Dijkstra's algorithm n times (treat each vertex as source)
- This costs  $\Theta(n(m + n \log n))$  with best possible implementation of Dijkstra's algorithm
- What if we permit negative lengths?

## First try

- If a graph has a negative cycle, then shortest paths are not well-defined
- The shortest path from u to v with at most one edge is the edge (u, v) of length  $w_{u,v}$
- Define distfirst(u, v, k) to be the length of the shortest path from u to v with at most k edges
- Can we come up with a recurrence?

#### First try recurrence

$$extit{distfirst}(u,v,k) = egin{cases} w_{u,v} & k=1 \ min_t \{ extit{distfirst}(u,t,k-1) + w_{t,v} \} & k>1 \end{cases}$$

- This works since optimal k-edge path contains an optimal (k-1)-edge path
- Answers are distfirst(u, v, n 1)
- ullet Order of computation is by increasing k
- Each entry takes  $\Theta(n)$  time to compute, and there are  $\Theta(n^3)$  entries
- Total running time is  $\Theta(n^4)$  not very good

## Second try: find middle

- A shortest k-edge path from u to v has some middle vertex m
- The sections of the paths from u to m and from m to v are  $\lfloor k/2 \rfloor$ -edge shortest paths
- Define distmid(u, v, j) to be the length of the shortest path from u to v with at most  $2^j$  edges
- Can define distmid(u, v, j) in terms of distmid(\*, \*, j 1)

## Second try recurrence

$$\textit{distmid}(u,v,j) = \begin{cases} w_{u,v} & j = 0 \\ \min_{m} \Big\{ \textit{distmid}(u,m,j-1) + \textit{distmid}(m,v,j-1) \Big\} & j > 0 \end{cases}$$

- Answers are  $distmid(u, v, [\log n])$
- $\bullet$  Order of computation is by increasing j
- Each entry takes  $\Theta(n)$  time to compute, and there are  $\Theta(n^2 \log n)$  entries
- Total running time is  $\Theta(n^3 \log n)$  better

## Third try: add a vertex

- Use idea from Dijkstra (and Prim) of adding one vertex at a time to a set and maintaining shortest paths within that set
- Consider a shortest path P from u to v whose internal vertices are in the set  $\{1, 2, \dots, k\}$
- If vertex k is in the path, it splits P into paths from u to k and from k to v
- ullet Both of these have internal vertices from  $\{1,2,\cdots,k-1\}$
- Define distset(u, v, k) to be the length of the shortest path P mentioned above

## Third try recurrence

$$\mathit{distset}(u,v,k) = \left\{ \begin{aligned} w_{u,v} & k = 0 \\ \min \left\{ & \mathit{distset}(u,k,k-1) + \mathit{distset}(k,v,k-1), \\ & \mathit{distset}(u,v,k-1) \end{aligned} \right\} & k > 0 \end{aligned} \right.$$

- Answers are distset(u, v, n)
- $\bullet$  Order of computation is by increasing k
- Each entry takes  $\Theta(1)$  time to compute, and there are  $\Theta(n^3)$  entries
- Total running time is  $\Theta(n^3)$  best
- Can be implemented in  $n^2$  space

#### Pseudocode for Floyd-Warshall

```
egin{aligned} D \leftarrow W \ & 	ext{for } k \leftarrow 1 \ & 	ext{to } n \ & 	ext{do} \ & 	ext{for } i \leftarrow 1 \ & 	ext{to } n \ & 	ext{do} \ & 	ext{for } j \leftarrow 1 \ & 	ext{to } n \ & 	ext{do} \ & 	ext{D}[i,j] = min(D[i,j],D[i,k] + D[k,j]) \end{aligned}
```