

11.0

Last class started discussing algo for Minimum Spanning Trees

Input: undirected <sup>connected</sup>  $G = (V, E)$ ,  $w: E \rightarrow \mathbb{R}$

Output:  $T$  s.t.  $w(T) := \sum_{e \in T} w(e)$  is minimal and  $T$  a spanning tree

Greedy: at each step we add to our slowly growing tree an edge  $(u, v)$  s.t. its wt is minimal among all "allowed" edges

We call such edge a "safe" edge.

Thm: An edge is safe if when we add it to our set we still hold a subset of an MST

We also proved.

Thm (23.1)  $G = (V, E)$  connected undirected,  $w: E \rightarrow \mathbb{R}$ .  $A \subseteq E$  is included in some MST.  $(s, V \setminus s)$  a cut respecting  $A$  (no edge of  $A$  crosses the cut).  $(u, v)$  light edge for the cut. Then  $(u, v)$  safe for  $A$ .  $\square$

Corollary: Let  $C = (V_C, E_C)$  be a connected component in  $G_A = (V, A)$ . If  $(u, v)$  is a light edge in the  $(V_C, V \setminus V_C)$  cut then it is safe for  $A$ .

This is the basic idea behind MST algo!

Today: MST algo.

Single source shortest path

11.1

We start by giving Kruskal's alg for MST. Then Prim's. The only difference is the rule according to which we find a next edge.

### Kruskal's alg

The idea: Each vertex forms a connected component in  $G_A$  when  $A = \emptyset$ .

We then gradually merge components using lightest available edge.

The alg. uses a data structure that manages <sup>disjoint</sup> sets - think of a c.c. as a set of vertices. For each set  $S$  there will be a representative vertex.

Allowed operations are:

Make-set( $v$ ): creates a set for element  $v$ .

Find-set( $u$ ): given  $u$  it finds the rep. vertex in  $u$ 's set.

Union( $u, v$ ): Merges the sets that contain  $u, v$ .

Not difficult to implement this D.S. with  $O(\log(V))$  cost for basic ops.

### Kruskal's alg

MST-Kruskal( $G, w$ )

1.  $A = \emptyset$
2. For each  $v \in G.V$
3. ~~the~~ Make-set( $v$ )
4. Sort edges in  $E$  in nondecreasing order according to  $w$ .
5. For each  $(u, v) \in E$  (taken according to the sorted order from light to heavy)
6. If Find-set( $u$ )  $\neq$  Find-set( $v$ )
7.  $A = A \cup \{(u, v)\}$
8. Union( $u, v$ )
9. Return( $A$ )

11.2

Run time: lines 2-3  $O(V)$   
line 4  $O(E \lg E)$   
lines 5-8  $O(E \lg V)$   
 $\Rightarrow$  total  $O(E \lg V)$

Correctness by Corollary. We unite two trees by a lightest edge.

Prim's alg.

Main difference: instead of ~~connect~~ starting from many connected components we grow a tree (so only one component). Each step adds a light edge to some isolated vertex.

The idea is to keep for each  $v$  not in our tree the wt of the lightest edge connecting it to the tree and then choose the vertex with min. value.

We implement this with a <sup>min</sup> priority queue.

MST-prim  $(G, w, r)$  -  $r$  is the root.

1. For each  $u \in G.V$
2.  $u.key = \infty$
3.  $u.\pi = NIL$
4.  $r.key = 0$
5.  $Q = G.V$  (min-priority-queue)
6. While  $Q \neq \emptyset$
7.  $u = \text{extract-min}(Q)$
8. For each  $v \in G.Adj[u]$
9. If  $v \in Q$  and  $w(u, v) < v.key$
10.  $v.\pi = u$
11.  $v.key = w(u, v)$

11.3

Run time: 1-4  $O(V)$

5  $O(V)$  (we <sup>should</sup> ~~not~~ it ~~not~~ ...)

6  $O(1)$

7  $O(\log V)$  done  $V$  times so  $O(V \log V)$

8-11 We go over all edges eventually

and step 11 requires fixing  $Q$  so it takes  $O(\log V)$

so overall  $O(E \log V)$

Correctness: At each step  $A$  is a tree and  $v$  key for  $v \in Q$  is lightest edge to  $A$  from  $v$ . (loop inv.) By cor. we get correctness.

Note: if we use a data structure called Fibonacci-heap then run-time improves to  $O(E + V \log V)$  (in Prim's alg.)

11.4

Single source shortest path.

Similar to BFS just now edges have weights (that can be negative...) but later on that

An instance of the problem: A map with road lengths and we wish to find all distances from, say, NYC to all other cities.

As before  $G = (V, E)$ ,  $w: E \rightarrow \mathbb{R}$

for a path  $p = (v_0, v_1, \dots, v_k)$ ,  $w(p) = \sum_{i=1}^k w(v_{i-1}, v_i)$

shortest-path-weight  $\delta(u, v)$  from  $u, v$  is

$$\delta(u, v) = \begin{cases} \min w(p) & p \text{ path from } u \text{ to } v \\ \infty & \text{no such } p \end{cases}$$

Important variants

Single destination shortest path: Find shortest paths to a given destination from all other vertices

(Same as SSS.p by reversing edge directions)

Single pair shortest path: Find s.p. between  $u$  and  $v$  simpler but all known algs. have same run-time as s.p.

All pairs s.p.: Find all s.p. for all pairs. Can run SSS.p  $n$  times but faster alg. known.

11.5

### Optimal substructure

For greedy/dynamic we need to understand this.

Claim: if  $p = \langle v_0, v_1, \dots, v_k \rangle$  s.p. from  $v_0$  to  $v_k$  then for any  $i < j < k$   $\langle v_i, v_{i+1}, \dots, v_j \rangle$  s.p. between  $v_i$  to  $v_j$ .

Pf: o.w. can get a shorter path...  $\square$

### Negative weights

doesn't come up for distances but an important case for some applications.

Notice that if  $G$  contains a cycle whose total wt is negative then

 has wt  $-\infty \dots$

$\square$  so cycles of negative wt ruin the problem.

What about cycles with positive wt? no s.path will contain any such cycle.

### Representing s.s.s.p

By the optimal substructure we can represent it by a tree. (prove to yourself)

Thus our alg will maintain a tree rooted at  $u$ .

How do we build the tree?

First it is empty then we add edges. An important step is modifying the tree when a shorter path is found. This is called relaxation.

11.6

First:

Initialize-Single-Source ( $G, s$ )

1. For each  $v \in G.V$
2.  $v.d = \infty$
3.  $v.\pi = NIL$
4.  $s.d = 0$

Relax( $u, v, w$ )

1. If  $v.d > u.d + w(u, v)$
2.  $v.d = u.d + w(u, v)$
3.  $v.\pi = u$

If it is shorter to first  
get to  $u$  and then to  
 $v$  then update it.

We now give the Bellman-Ford alg. It also says whether there is a Negative cycle (outputs False)

Bellman-Ford( $G, w, s$ )

1. Initialize-Single-Source( $G, s$ )
2. For  $i = 1$  to  $|G.V| - 1$
3. For each edge  $(u, v) \in G.E$
4. Relax( $u, v, w$ )
5. For each edge  $(u, v) \in G.E$
6. If  $v.d > u.d + w(u, v)$
7. Return False
8. Return True

}  $|V|-1$  steps of relaxing  
according to all edges

} checking for a negative  
cycle.

Run time:  $O(V \cdot E)$  by lines 2-4

11.7

Important lemmas:

Lemma (Path-Relaxation-Property):

If  $p = \langle v_0, \dots, v_k \rangle$  is a s.p from  $v_0$  to  $v_k$  and we relax edges of  $p$  in the order  $(v_0, v_1), (v_1, v_2), \dots$  then after those  $k$  relaxations  $v_k.d = \delta(v_0, v_k)$ . This remains true even if other relaxation steps occur.

Pf: By induction on  $k$ . Clear for  $k=0$ . General case follows easily from optimal structure.  $\square$

Thus, since any path is of length  $\leq n-1$  correctness follows, assuming no negative cycle.

If there is a Negative cycle the alg. cannot return true.

If cycle is  $s = v_0 \rightarrow \dots \rightarrow v_k = s$  then

$$\sum_{i=1}^k (v_{i-1}, v_i) < 0.$$

But, if alg. answers true then

$$v_i.d \leq v_{i-1}.d + w(v_{i-1}, v_i) \quad \forall \quad i=1 \dots k$$

$$\text{Thus } \sum_{i=1}^k v_i.d \leq \sum_{i=1}^k v_{i-1}.d + \sum_{i=1}^k w(v_{i-1}, v_i)$$

$\nwarrow$  equal  $\nearrow$  Negative

in contradiction.  $\square$