# Minimum Spanning Trees



#### Warmups

A tree is defined to be a connected, undirected, acyclic graph.

<u>Claim</u>: Any tree with at least one edge has at least one vertex with degree 1. <u>Proof</u>: Assume that there is some tree T with at least one edge where all vertices have degree 2 or more. Take a walk in this tree. What must eventually happen?

Claim: Any tree with n vertices contains exactly n-1 edges.

<u>Proof</u>: Math induction on n

How many edges does a tree with 1 vertex have? 0

Assume that all trees with k vertices contain exactly k-1 edges.

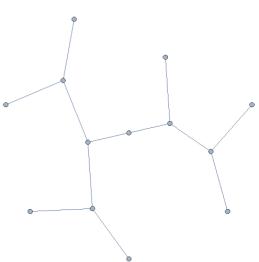
Consider any tree T with k+1 vertices. T must have at least one vertex v with

degree 1. Let  $T' \equiv T$  with v and its adjacent edge removed.

How many vertices does T' have? k

How many edges must T' have? k-1

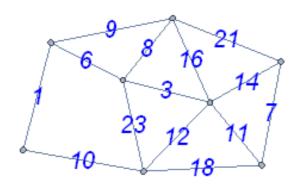
How many edges must T have? k

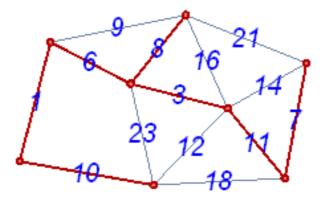


# Minimum Spanning Trees



A minimum spanning tree of a connected, undirected, weighted graph is a subgraph of minimum weight that is both a tree and spans the entire graph (i.e. touches every vertex).





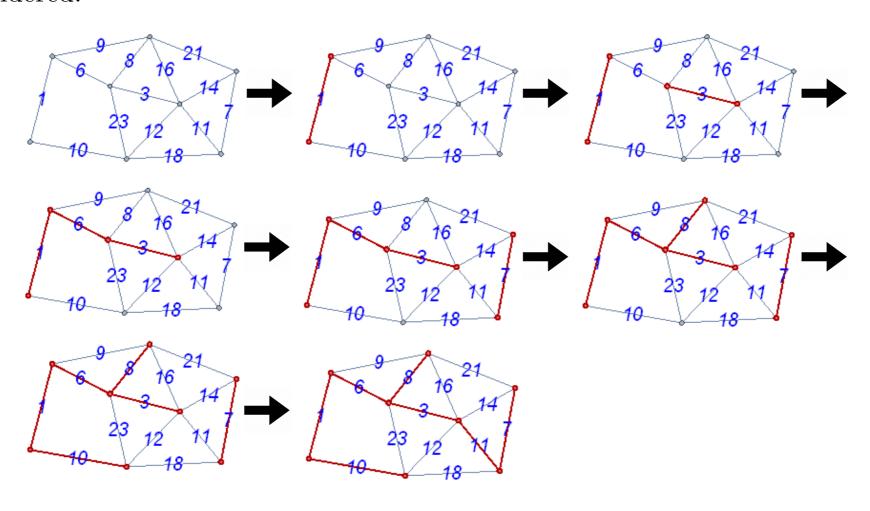
Applications: network design (roads, computers, etc.), broadcasting protocols, subroutine for more complex algorithms (CECS 428)

Note that the MST is *not necessarily* unique. For example, the following graph has 3 distinct solutions for the MST.

# Kruskal's Algorithm



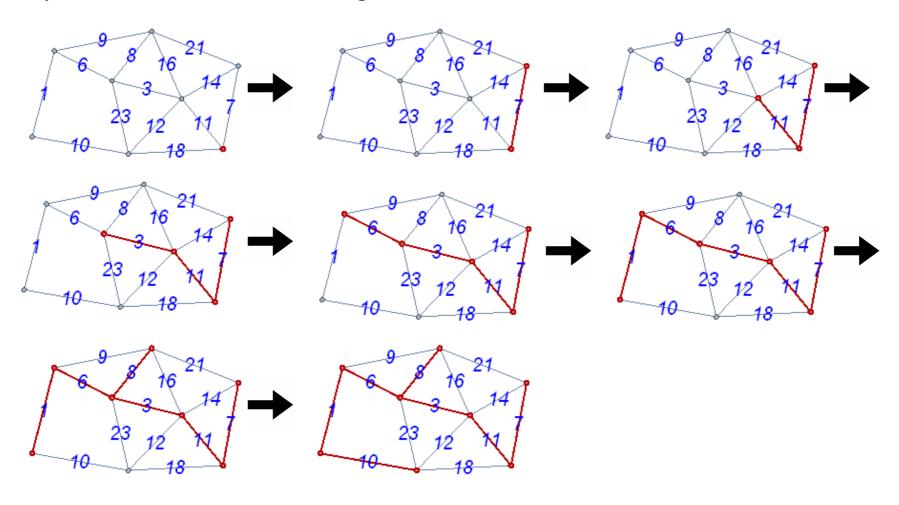
Repeatedly choose to add the minimum weight edge left in the graph that does not create a cycle with the currently chosen edges until all edges have been considered.



# Prim's Algorithm



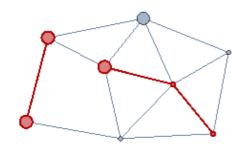
Choose any starting vertex. Repeatedly add the minimum weight edge that is attached to the current tree and doesn't create a cycle with the edges that have already been chosen until all edges have been considered.



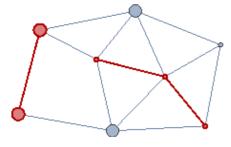
# The Berkeley Lemma



Lemma: Suppose edges X are part of a minimum spanning tree of G = (V, E). Pick any subset of nodes S for which X does not cross between S and V - S, and let e be the lightest edge across this partition. Then  $X \cup \{e\}$  is part of some MST.



Is this a legal selection for S? No



Is this a legal selection for S? Yes



Is this a legal selection for S? Yes

# The Berkeley Lemma



<u>Lemma</u>: Suppose edges X are part of a minimum spanning tree of G = (V, E).

Pick any subset of nodes S for which X does not cross between S and V-S, and let e be the lightest edge across this partition. Then  $X \cup \{e\}$  is part of some MST.



<u>Proof</u>: Let the edges X expand to MST T. If T contains the edge e, we're done. Assume that T does not contain edge e.

Does e add any vertices to T? No.

Can a tree with a fixed number of vertices add an extra edge? No.

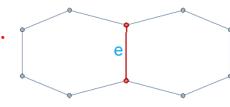
Is it possible for  $T \cup \{e\}$  to be a tree? No.

Which of the requirements for being a tree does  $T \cup \{e\}$  fail?

connected, undirected, acyclic

Can e have created more than one cycle in  $T \cup \{e\}$ ? No.

 $\rightarrow T \cup \{e\}$  has exactly one cycle.

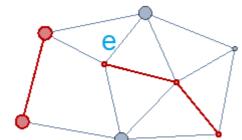


### The Berkeley Lemma



<u>Lemma</u>: Suppose edges X are part of a minimum spanning tree of G = (V, E).

Pick any subset of nodes S for which X does not cross between S and V-S, and let e be the lightest edge across this partition. Then  $X \cup \{e\}$  is part of some MST.



We know that  $T \cup \{e\}$  has exactly one cycle.

If we start at the S vertex of the edge e and walk around the cycle to the other side of e, there must exist at least one edge that crosses from S to V-S (because the other side of e is in V-S).

Let  $e' \equiv$  be any edge that crosses from S to V - S around that walk

Is  $T - \{e'\} \cup \{e\}$  undirected? Yes.

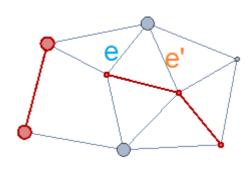
Is  $T - \{e'\} \cup \{e\}$  connected? Yes.

Is  $T - \{e'\} \cup \{e\}$  acyclic? Yes.

 $\rightarrow T - \{e'\} \cup \{e\}$  is a tree.

What can you say about w(e) and w(e')?  $w(e) \leq w(e')$ What can you say about w(T) and  $w(T - \{e'\} \cup \{e\})$ ?  $w(T - \{e'\} \cup \{e\}) \leq w(T) \Rightarrow w(T - \{e'\} \cup \{e\}) = w(T)$ 





#### Kruskal and Prim



Lemma: Suppose edges X are part of a minimum spanning tree of G = (V, E). Pick any subset of nodes S for which X does not cross between S and V - S, and let e be the lightest edge across this partition. Then  $X \cup \{e\}$  is part of some MST.

Kruskal's Algorithm: Repeatedly choose to add the minimum weight edge left in the graph that does not create a cycle with the currently chosen edges until all edges have been considered.

Choice: Consider the minimum weight edge  $\{v_1, v_2\}$  left in the graph that does not create a cycle with the currently chosen edges. Choose to let  $v_1 \in S$ . Are we now required to put  $v_2 \in S$ ? No. HINT: If we are, then by the definition of S,  $\{v_1, v_2\}$  creates a cycle with the currently chosen edges.

Prim's Algorithm: Choose any starting vertex. Repeatedly add the minimum weight edge that is attached to the current tree and doesn't create a cycle with the edges that have already been chosen until all edges have been considered. Choice: Choose S to be all vertices in the current structure.

### **Implementation**



- What data structure would be ideal to hold the weights of the edges remaining to be considered?
- According to the consensus on the internet, a simple CECS 328 implementation of Prim's might run in time  $\sim |V|^2$  and a simple CECS 328 implementation of Kruskal's algorithm might run in time  $\sim |E| \log |E|$ . Thus, if the graph is sparse ( $|E| \sim |V|$ ), Kruskal's algorithm is better, but if the graph is dense ( $|E| \sim |V|^2$ ), Prim's is better.
- There is a randomized algorithm that runs in *linear* time in the number of edges. (This is spooky.)