

# Lecture #9

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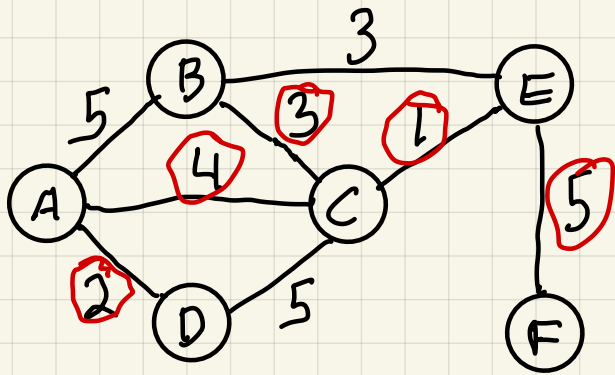
CS 170  
Spring 2021

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# Introduction to Minimum Spanning Trees (MSTs)



Given an undirected graph  $G = (V, E)$  with edge weights  $w(e) \geq 0$

Find a subset  $T \subseteq E$  such that

①  $(V, T)$  connected

② sum of weights of  $T = \sum_{e \in T} w(e)$  minimized

Fact:  $T$  has no cycles, i.e. a tree

What would be a greedy algorithm?

add cheapest edge to  $T$  as long as no cycle

# Properties of Trees

Def: An undirected graph  $T(V, E)$  is a tree if

- 1)  $T$  is connected, and
- 2)  $T$  has no cycles

Note: Any vertex could be root

Claim: Any 2 of following 3 properties implies the 3<sup>rd</sup>:

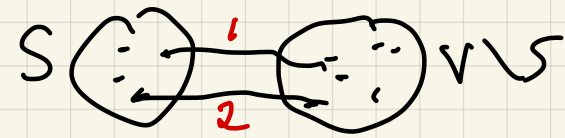
- 1)  $T$  is connected
- 2)  $T$  has no cycles
- 3)  $|E| = |V| - 1$

Proof: 1) and 2)  $\Rightarrow$  3)

pick any vertex to be root, run DFS,  
every vertex has one parent, except root  
 $\Rightarrow |E| = |V| - 1$

2) + 3)  $\Rightarrow$  1) start with no edges,  $|V|$  disconnected  
vertices  $\Rightarrow |V|$  connected comps. Add an edge  
either # comp drops by 1, or get a cycle  $\Rightarrow |E| = |V| - 1$  2

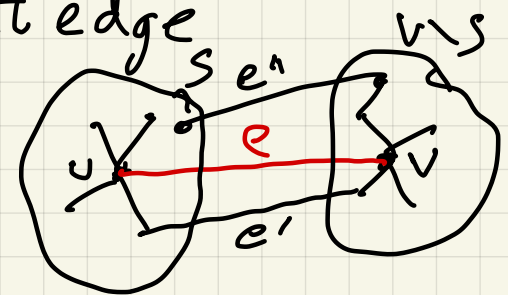
# Cuts in a graph



Def: A cut in  $G(V, E)$  is a partition  $V = S \cup (V \setminus S)$   
 Also refers to edges connecting  $S$  and  $V \setminus S$

Claim: Lightest edge (smallest  $w(e)$ ) in a cut appears in some MST

Proof: Let  $T$  be a MST,  $e = (u, v)$  be light edge connecting  $S$  and  $V \setminus S$



$e' \in T$  connects  $S$  and  $V \setminus S$   
 but  $e' \neq e$  ( $e'$  not unique)

Want MST containing  $e$ :  $T \cup \{e\} \Rightarrow$  too many edges  $\Rightarrow$  cycle  
 $e' =$  be edge in cycle in  $T$  connecting  $S$  and  $V \setminus S$

$T' = T \cup \{e\} \setminus \{e'\}$ : claim  $T'$  is a tree (right # edges connected)

$$w(T') = \sum_{e \in T'} w(e) = w(T) + w(e) - w(e')$$

$\Rightarrow T'$  a MST  $\leq w(T)$  since  $w(e) \leq w(e')$

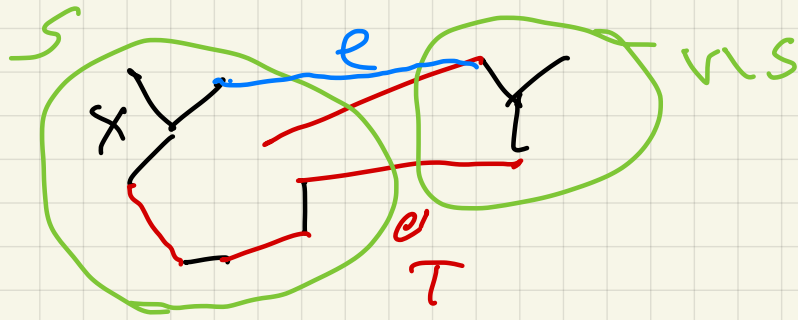
How to add one more edge to a partial MST

Claim: Suppose  $X \subseteq E$  and  $X \subseteq T$  where  $T$  is some MST.

Suppose  $X$  has no edges connecting  $S$  and  $V \setminus S$  and  $e$  is lightest edge connecting  $S$  and  $V \setminus S$ .

Then  $X \cup \{e\} \subseteq T'$  where  $T'$  is some MST.

Proof:



$$T' = \underbrace{T \cup \{e\}}_{\text{has cycle}} \setminus \underbrace{\{e'\}}_{\text{breaks cycle}}$$

is MST by  
same argument

# MST Algorithm

Meta-Algorithm:

$$X = \emptyset$$

repeat

pick cut  $(S, V \setminus S)$  s.t.  $X$  doesn't cross cut

add edge  $e$  with smallest weight in cut to  $X$

until  $|V|-1$  edges added (or graph connected)

Kruskal

$$X = \emptyset$$

sort all  $e$  by  $w(e)$

for all  $e$  in increasing order

if  $X \cup \{e\}$  has no cycle,  $X = X \cup \{e\}$

# Kruskal's Algorithm is Correct

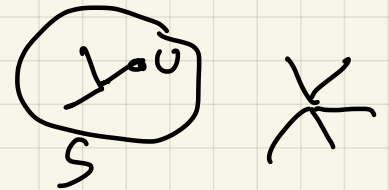
$X = \emptyset$   
sort all  $e \in E$  by  $w(e)$   
for all  $e \in E$  in increasing order  
if  $X \cup \{e\}$  has no cycle,  $X = X \cup \{e\}$

Claim: At any point  
 $X$  is a subset  
of some MST  $T$

Proof: Induction base case: adding first edge ok  
(Slide 3)

If Kruskal adds  $e = (u, v)$  to  $X$ ,  
no cycle in  $X \cup \{e\}$

$S$  = connected comp. of  $u$  in  $X$



Can there be a lighter edge  $e'$  connecting  $S$  and  $V \setminus S$ ?  
If there were, would have been considered already  
and not chosen it, contradiction, because it  
also would not have created cycle  $\Rightarrow w(e') \geq w(e)$

by Slide 4,  $X \cup \{e\} \subseteq$  some MST  $T$

# Implementing Kruskal (1) Cost

$X = \emptyset$ , sort all  $e \in E$  by  $w(e)$

for all  $e \in E$  in increasing order

if  $X \cup \{e\}$  has no cycle,  
 $X = X \cup \{e\}$

$$O(|E| \log |E|) = O(|E| \log |V|)$$

Naive: DFS  $O(|V|)$  per bop  
 $\Rightarrow O(|E| \cdot |V|) = O(|V|^3)$

$X = \emptyset$ , sort  $e$

for all  $v \in V$ , makeset( $v$ ) ... each set is a conn. comp

for all  $e$  in order ...  $e = (u, v)$

if find( $u$ )  $\neq$  find( $v$ ) ... find( $u$ ) = name of  $u$ 's conn. comp  
 union( $u, v$ ) ... merge conn. comps of  $u$  and  $v$

Cost:  $|V| \cdot \text{cost}(\text{makeset}) = O(|V|)$

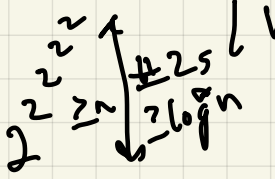
$|E| \cdot \text{cost}(\text{find}) = O(|E| \log |V|)$

$|V| \cdot \text{cost}(\text{union}) = O(|V| \log |V|)$

} or  $O(|E| \cdot \log^* |V|)$

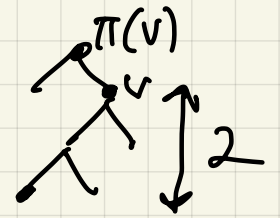
dominated by sorting  $\rightarrow$

$\log \dots \log \log n \leq 1$   $\log^*(n) = \# \log s$





# Implementing Kruskal (2)



For each  $v \in V$  add

$\pi(v)$  = "parent of  $v$ " = pointer to parent in tree

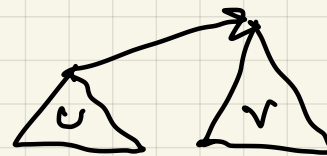
defining connected component to which  $v$  belongs

$\text{rank}(v)$  = height of subtree rooted at  $v$

$\forall v \in V$   $\text{makeset}(v)$ :  $\pi(v) = v$ ,  $\text{rank}(v) = 0$

$\text{find}(v)$  while  $\pi(v) \neq v$ ,  $v = \pi(v)$ , return  $v$

$\text{union}(u, v)$



make root of shorter tree

point to root of taller tree

$\Rightarrow$  all trees have depth  $O(\log |V|)$

$\Rightarrow$  find, union each cost  $O(\log |V|)$

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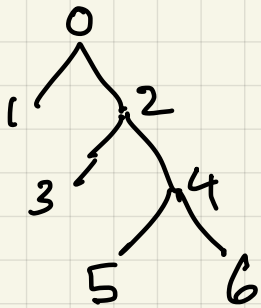
ranks all fit in in some set

$\{1\}, \{2\}, \{3, 4\}, \{5, \dots, 16\}, \{17, \dots, 2^{16}\}, \{2^{16}+1, \dots, 2^{2^6}\}, \dots$

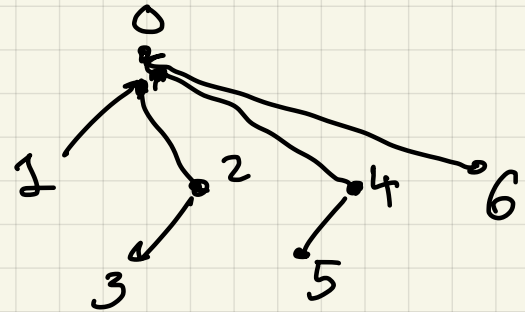
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# Implementing Kruskal (3)

Even better: when doing find, make all vertices on path to root point to root



$$\text{find}(6) = 0$$



$\text{find}(v)$

if  $v \neq \pi(v)$   $\pi(v) = \text{find}(\pi(v))$

return  $\pi(v)$

all paths to root keep getting shorter

$\Rightarrow O(|E| \cdot \log^* |V|)$  cost of all finds and unions

# MST Algorithm

Meta-Algorithm:

$X = \emptyset$

repeat

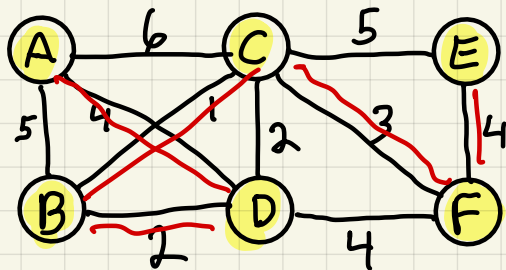
pick cut  $(S, V \setminus S)$  s.t.  $X$  doesn't cross cut

add edge  $e$  with smallest weight in cut to  $X$

until  $|V|-1$  edges added (or graph connected)

Prim:  $S =$  vertices touched by  $X$

{Kruskal:  $S$  connected comp of  $v$  in  $X$ }



S	A	B	C	D	E	F
{ }	0/nil	$\infty$ /nil	$\infty$ /nil	$\infty$ /nil	$\infty$ /nil	$\infty$ /nil
A		5/A	6/A	4/A add	$\infty$ /nil	$\infty$ /nil
A, D		2/D add	2/D		$\infty$ /nil	4/ <sup>D</sup> nil
A, D, B			1/B add		$\infty$ /nil	4/ <sup>D</sup> nil 0

# Implementing Prim

for all  $v \in V$

$cost(v) = \infty$ ,  $prev(v) = nil$

pick any initial  $u_0$ ,  $cost(u_0) = 0$

$H = makequeue(V) \dots$  priority queue, based on  $cost()$

while  $H \neq \emptyset$

$v = deletemin(H) \dots$  pick  $v$  with lowest  $cost()$

for each  $(v, u) \in E$

if  $cost(u) > w(v, u)$

$cost(u) = w(v, u)$

$prev(u) = v$

$cost(Prim) = cost(Dijkstra)$

only difference is value used by  
priority queue