

# Spanning trees (Lecture 1)

MST: Classical Algorithms:

Kruskal	'56	$O(m \log m)$
Prim (Jarník / Dijkstra)	'57	$O(m \log n)$
Boruvka	'26	$O(m \log n)$

Modern:

- Yao '75  $O(m \log \log n)$
- Fredman & Tayan '84  $O(m \log^* n)$
- Gabow Galil Spencer Tayan '85?  $O(m \log^2 \log n)$
- Karger (Karger Klein Tayan) '94 [Randomized]
- Chazelle '97  $O(m \alpha(m) \log n)$  inverse Ackermann fn.

↓ all use blue rule

Basic Idea of MST algorithms: Given  $G = (V, E)$ , edge weights can be any in  $O(1)$  time (don't use facts about edge wts.)

Cut rule:

$m$  edges,  $n$  nodes, connected.

- can assume no parallel edges
- assume nodes are numbered  $1 \dots n$ .
- assume all edge wts are distinct.

Cut rule: take a ~~the~~ cheapest edge across some cut. this is in an MST. (color it blue)

Cycle rule: take any cycle and drop the heaviest edge on the cycle (color it red).

Thm: Repeatedly apply cut and cycle rules in any order. get the MST.

Most of simpler algorithms (all the ones in lect #1) just use the cut rule.

These facts also extend to "matroids" [See HW 1] where we can define the notion of a cut and cycle analogously. But also often use more of the graphs.

②

Algo #1: Kruskal. Sort edges. Add next edge if it does not create cycle (if it decreases # of components) (if it crosses a cut in the current graph).

How to check if edge crosses a cut? Disjoint set union (aka Union-find) data structure.

Operations: create set.

find(e) ← returns "root" of the set containing e

Union(r<sub>1</sub>, r<sub>2</sub>) ← unites the sets whose roots are r<sub>1</sub>, r<sub>2</sub>.

Use union-by-rank and path compression: -

any set of  $k$  operations takes time  $O(n + k \log n)$  (on a universe of size  $n$ )

at most  $O(n)$  operations  
 $O(n + k \log n)$   
 $\downarrow$   
 $O(n + k \alpha(k, n))$

$A(m, n) = \begin{cases} 2n & \text{for } m=0 \\ A(m-1, 1) + 2n & \text{for } m>0 \end{cases}$

m \ n	0	1	2	3	4	5	...
0	0	1	2	3	4	5	...
1	1	2	3	4	5	6	...
2	3	5	7	9	11	...	...
3	5	13	29	...	...	...	...

Various def's but all essentially this:

$A(m, n) = \begin{cases} 2n & \text{for } m=0 \\ 2 & \text{for } n=0 \\ A(m-1, A(m, n-1)) \end{cases}$

	1	2	3	4	5	
1	2	4	6	8	10	
2	2	4	8	16		$2^n$
3	2	$4^{2^2}$	$2^{2^2}$	$2^{2^{2^2}}$		tower.
4	2	4	$2^{2^{2^2}}$			power tower

Runtime:  $O(m \log m) + O(n + m \alpha(m, n)) = O(m \log m)$

↑  
sort

③

Prim's Algorithm: Pick a root vertex: Maintain some root component.  $C$

Pick smallest edge wt edge out of root component and add it in. (Blue rule)

So want to maintain: for each vertex  $v$  not in  $C$ , the length of shortest edge from  $C$  to  $v$ . (if any). And quickly want to find min.

BinH any	FibH	Priority queue: each element has a key. ← node ← wt of edge.
$\log n$	$O(1)$	• insert( $e, k$ )
$\log n$	$O(\log n)$	• delete <del>find</del> min (return element with smallest key, remove from queue)
$\log n$	$O(1)$	• decreasekey( $e, k'$ )
$\log n$	$O(\log n)$	• delete (dkey + del min)
$n$	$O(1)$	• Meld [take 2 qqs and combine them into 1]
$O(1)$	$O(1)$	• findmin <del>[del min + insert]</del>

↑  
 $n = \#$  elements in queue at anytime

How fast?: usual: heap. "binary" Fredman + Targem: better Fibonacci heaps.  
[Amortized bounds]

So: for each vertex in hbrhood maintain the wt of edge out (cheapest) of  $C$

~~total~~ 1 determine for each vertex  $v$

now: update with ~~best~~ all edges from  $v$  to rest:  $d(v)$ .  
decreasekeys

⇒ total time:  $O(n \log n) + O(m)$ .

Using binary heaps:  $O(m \log n)$ .

Boruvka: For each vertex, pick cheapest edge out.

// Unique edge its ensure will pick a forest. (also undirected)  
F.

Contract the edges in F to get new graph G'. Repeat.

Fact: # of components in (G, F) = # vertices of G'  $\leq \frac{|V(G)|}{2}$ .

$\Rightarrow$  # rounds =  $O(\log n)$ .

time per round: scan all the edges in  $G_i$ : time  $O(m_i)$ . to get  $F_i$

Contract  $G_i \rightarrow G_{i+1}$ : time  $O(n_i + m_i)$  [HW 1].

$\Rightarrow O(m \log n)$ .  $\leftarrow$  could be worse than Prim + FibHeap? Yes.

$\leftarrow$  could be ~~worse than~~  $O(n^2 \log n)$ ?  $\downarrow$   
~~excess~~

[HW 1]: Boruvka  $\leq O(n^2)$  time.

$\leq O(m(\log(n^2/m) + 1))$ .  $\leftarrow$  ~~# edges  $m = n^2$~~

Fredman + Teyan:  $O(m \log^* n)$   $\rightarrow$  "better than sorting"  $\leftarrow$  Yao's  $O(m \log \log n)$  in HW.   
 Actually  $O(m \beta(m, n))$  where

Very simple idea. When graph is ~~dense~~ <sup>sparse</sup>  
the  $O(m + n \log n)$  of Prim is doing a lot of  
more work in  $n \log n$  than on the  $O(m)$ . so  
"balance it out"?

$$\beta(m, n) = \min \{i: \log^{(i)} n \leq \frac{m}{n}\} \\ \approx \log^* n - \log^*(\frac{m}{n}).$$

- for dense graphs  $\beta(m, n) = O(1)$ .
- for sparse graphs  $\beta(m, n) \approx \log^* n$ .

Start a Prim at vertex. if heap gets "too big", stop.

Recall: main bottleneck is delete min  $O(\log \#size \text{ of heap})$ .

So if heap size  $\leq K$  then pay  $O(\log K)$  per extract min

total cost if we keep doing this :-

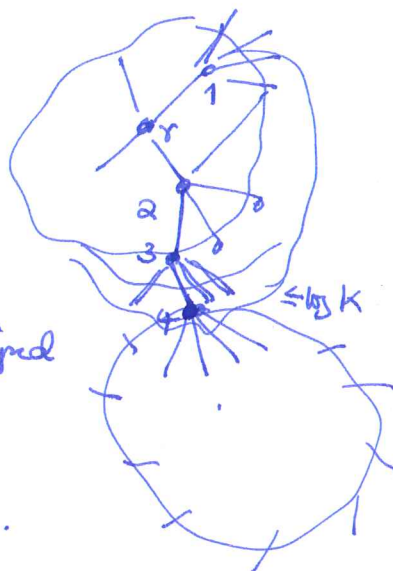
- each ~~tree~~ edge explored  $\leq 2$  times (from each end)  $\leftarrow O(m_i)$  decreases by  $\log K$
- each ~~tree~~ tree does determine ~~as~~ by use of heap  $\leq K$   
 $\Rightarrow$  total # extractions  $\leq O(n) \times \log K$ .

N.b. { may merge heaps together if they meet  $O(1)$  time.

in this case stop the process.

even if the size of neighborhood has dipped below  $K$ .

Crucial fact: each ~~tree~~ determine pays  $O(\log K)$ .



• How many trees eventually? Bdy of each component  $\geq K \Rightarrow$  # trees  $\leq \frac{2m}{K}$ .

So from  $G_i$  with  $m_i$  edges,  $n_i$  nodes

↓

$G_{i+1}$  with  $m_{i+1}$  edges.  $n_{i+1} \leq \frac{2m_i}{K_i}$

What is  $K_i$ ? set  $K_i$  st  $O(m_i) = O(n_i \log K_i) \Rightarrow K_i \approx 2^{\frac{2m_i}{n_i}}$

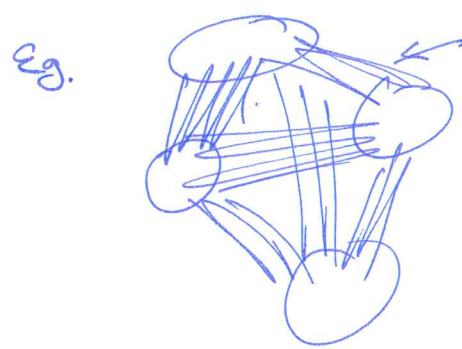
$2m_i = n_i \log K_i \leftarrow O(m)$  work per round.

$\Rightarrow n_i$  nodes, now  $n_{i+1} \leq \frac{2m_i}{2^{\frac{2m_i}{n_i}}} \Rightarrow K_{i+1} = \frac{2m_{i+1}}{n_{i+1}} \geq 2^{K_i}$

$\Rightarrow K_i$  increases exponentially  $\Rightarrow \log \rightarrow \beta(m, n)$ .  
 $\frac{2m}{n} \rightarrow 2 \rightarrow 2^2 \dots$  in  $\log^* n$  rounds  $K \geq n$ .

Q: what about mifolly ; can we use that to get improvements?

Just by greedy we may not remove edges fast enough.



very heavy edges here. All the work happens in the components, not across it.

We should use the red rule (cycle rule) to kill some of the edges. But that is next time.

Can save another  $\log$  , and get  $O(n \log \beta(m,n))$  runtime, but write it here.

History after this: KKT, (randomized) and then

Chazelle (97)  $O(m \alpha(m,n))$  ← initially with an extra log. uses [soft heaps] ← may corrupt some of the keys in the heap!

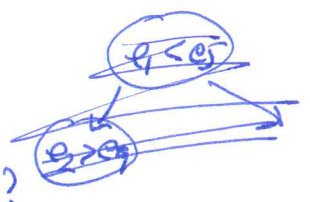
(2000) Pettie & Ramachandran: an optimal MST algorithm.

Shows that if  $MST^*(m,n)$  is optimal decision tree complexity of MST on  $m$  edge  $n$  node graphs, then explicit algorithm that takes  $O(MST^*(m,n))$  time on the pointer machine model. on all  $m$  edge  $n$  vertex graphs.

Big Q: does there exist a deterministic  $O(m \alpha(m))$  time MST algorithm?

Enough to show that  $MST^*(m,n) = O(m)$ .

just a tree that says just counts # of comparisons of edges done by algo?



Aside: (a) models of computation.

(7)

(b) is amortization necessary for (i) set union find  
(ii) Fibonacci heaps?

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Union find: a lower bound in the cell probe model that  
need  $\max(m, n)$  time for  $m$  finds over  $n$  elements  
[Alstrup et al.]

Also if worst case complexity, can get  $\Omega(\log^2 \log n)$  in cell probe model  $w = \log n$ .  
[Fredman (Sales)].

Fibonacci Heaps: [Brodal Logothetis Tarjan STOC 12] bounds match Fib heaps  
but in the worst case [and pointer machine]. improving complicated  
RAM-machine sol<sup>n</sup> of Brodal [SODA 96].

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~~And End of Book pointer machine~~

• Cell probe: memory cells, size  $w$ , we pay only for memory accesses.

• Transdichotomous RAM. words of size  $w$  (typically  $\geq \log n$ ). Each operation  
manipulates  $O(1)$  words at a time; finite set of operations. Based on what OPs:  
allowed

- Word RAM: ops standard to C: +, -, \*, /, mod, shift etc.

- AC<sup>0</sup> ram: all ops implementable in AC<sub>0</sub> (constant depth circuits)

Pointer Machine: Memory is a giant DAG. ~~is~~ with constant branching factor.

Input to operations is a pointer. No pointer arithmetic allowed.