

# Random Spanning trees & MST verification

(Lecture #2)

①

Last time saw algorithms that all use the cut rule + fancy data structures to get improvements on  $m \log n \rightarrow$  down to  $(m \log n)$  and  $m \log^* n$ .

This time: (randomized)  $O(m+n)$  time. Two ingredients

(a) sampling and using the cycle rule to discard a lot of edges. (sparsify)

(b) MST verification

Light & Heavy:

~~Given~~ given a ~~tree~~ tree  $T$  (or a forest  $F$ ) and edge  $e$  is called F-light if  $\text{MSF}(F \cup \{e\})$  contains  $e$ .

An edge is F-heavy otherwise.

Fact: if  $T$  is a MST of  $G$  then  $e$  is  $T$ -light  $\Leftrightarrow e \in T$ .  $\forall e \in E(G)$ .

Magic Black box: given  $G = (V, E)$  and a <sup>spanning</sup> tree  $T = (V, E_T \subseteq E)$ , there exists an algorithm  $\text{Verify}(G, T)$  that returns a list of all  $T$ -light edges of  $E$ . And runs in time  $O(m+n)$ .

N.B.: if the list of  $T$ -light edges is just  $E_T$  then  $T$  is a MST of  $G$ .

So this, in linear time verifies if  $T$  is a MST of  $G$ .

Naively: would need to check if  $\forall e \in E \setminus E_T$  it is the heaviest edge on its fundamental cycle.

2

Karger's Algorithm (~~G~~, ~~E~~) (V, E) |V| = n, |E| = m. m ≥ n.

~~Let H be a random subset of edges of size of E w.p. 1/2.~~  
the graph induced on

(1) Boruvka on G twice, clean up to get G' = (V', E').

# vertices is ≤ n/8.

(2) E<sub>1</sub> ← random subset of E' (with sampling probability 1/2).

(3) + (some fixed spanning tree edges) **drop.**

T<sub>1</sub> ← Karger(V', E<sub>1</sub>)

(4) discard all T<sub>1</sub>-heavy edges from E'. (call this E<sub>2</sub><sup>o</sup>) T<sub>1</sub> light edges of E'.  
← all remainder

(5) return Karger(V', E<sub>2</sub><sup>o</sup>)

Fact 1: E[#edges in E<sub>1</sub>] ≤ 2n'/2 + (n'-1) **drop.** { n' = #V' ≤ n/8, m' = #E' ≤ m.

Fact 2: E[#edges in E<sub>2</sub>] ≤ 2n'.

Say: all rest of work in steps ①, ②, ④ ≤ 2m.

Claim: Let T(m, n) be expected runtime on every possible graph on n nodes then T(m, n) ≤ 2m + n.

Pf: ~~T(m, n)~~ T(m, n) ≤ E[T(|E<sub>1</sub>|, |V'|)] + E[T(|E<sub>2</sub>|, |V'|)] + m edges.

$$\leq E[2|E_1|] + n' + E[2|E_2|] + n' + m$$

$$\leq 2[m/2 + n'] + n' + 2[2n'] + n' + m$$

$$= 2m + 8n' \leq 2m + n.$$



Proofs of Facts:

Fact 1: easy. just uses that each  $e \in E_1$  w.p  $\frac{1}{2}$ . [~~used edge was~~ ~~fixed by tree~~]

Fact 2: two different proofs depending on how  $E_1$  is chosen.

Pf 1: [Karger].  $E_1$  is sampled by picking each edge in  $E'$  w.p  $\frac{1}{2}$  independently.

Recall: want to bound # of  $T_1$ -light edges,  $T_1 \leftarrow$  MST on  $E_1$ .

Build  $T_1$  using Kruskal this way. Sort edges of  $E'$  and look at edges in it.

When looking at  $e \in E'$

- (i) if  $e$  creates a cycle with current forest, ignore it.  $\rightarrow$  even if  $e \in E_1$  it will not be  $T_1$ -light.
- (ii) if not, flip a coin for  $e$ .  $\rightarrow$  if tails, ~~it is~~ not in  $E_1$ , it will be  $T_1$ -light later

$\rightarrow$  if heads, in  $E_1$  and in  $T_1 \Rightarrow$  also  $T_1$ -light, but in  $T_1$ .

$\Rightarrow$  everytime we are in case (ii) we make 1  $T_1$ -light edge.

But w.p  $\frac{1}{2}$  we add an edge to  $T_1 \Rightarrow E[\# \text{times before } T_1 \text{ has } n'-1 \text{ edges}]$   
 $= E[\# \text{flip before see } (n'-1) \text{ heads}] \leq 2(n'-1).$

QED.

Pf 2 [Chan].  $E_1$  is a random subset of  $\frac{r}{2} m'$  edges of  $E'$ . plus a ~~(completely replacement)~~

~~Claim:  $\forall e \in E'$ ,  $e$  is  $T_1$ -light w.p  $\leq \frac{2n'}{m}$ . [ $\Rightarrow$  linearity of exp.]~~

Pf:  $T_1$  is MST of  $E_1$ .

~~if  $e$  is  $T_1$ -light then  $e \in \text{MST}(T_1 \cup \{e\})$ .~~

Claim: Pick a random edge  $e$  of  $E'$ .  $\Pr_{e \in E'}[e \text{ is MST}(E_1)\text{-light}] \leq \frac{n'}{r}$

$\Pr_{e \in E'}[e \text{ in MST}(E_1 \cup e)] = \Pr[\text{one random edge in MST}(E_1) \text{ random edge}]$   
but  $\text{MST}(E_1 \cup e)$  has  $\leq n'-1$  edges.  $\Pr[e \text{ in this MST}] \leq \frac{n-1}{r}$ .

Next: How to prove the Magic Black Box? MST verification.

(4)

(\*) Given  $T$  and pairs  $\{(u_1, v_1), (u_2, v_2), \dots, (u_m, v_m)\}$ . return the  $(w_i)$  weight of the heaviest edge on the path  $T[u_i, v_i]$ . in time  $O(m+n)$ .

If do this, can solve the MST verification problem.

179: Tarjan showed how to do it with  $O(m \alpha(m, n))$  time

~~185~~ 185: Komlos showed how to do it with  $O(m+n)$  comparisons, but not clear how to find out what comparisons to make.

History:

'97 Dixon Rauch Tarjan on RAM machine, '98: Buchsbaum Koplovz Rogers on pointer m/c.

'97: King also on RAM machine.

'09: Hagerup simpler.

Simplifications: given any tree, can assume that  $v_i$  is an ancestor of  $u_i$ .

Idea: find, for each  $(u_i, v_i)$ , the LCA  $l_i = \text{lca}(u_i, v_i)$ .

Create pairs  $(u_i, l_i)$  and  $(v_i, l_i)$  for each original  $(u_i, v_i)$ .

Now given a sol<sup>n</sup> for new instance, just return  $w_i \leftarrow \min\{w_{u_i}, w_{v_i}\}$

How long to find LCAs of  $m$  pairs?

Thm [Harel & Tarjan] '84: Can preprocess a tree  $T$  in  $O(n)$  time so that can answer LCA queries in  $O(1)$  time.

Actually simpler: given  $T$  and all the pairs up front can answer in time  $O(m+n)$ .  $\leftarrow$  easier problem.

May come back at end to give a simple  $O(m \alpha(m, n) + n)$  time algorithm using union-find.

OK: do Tree  $T$ , pairs  $u_i, v_i$  with  $v_i$  ancestor of  $u_i$ .

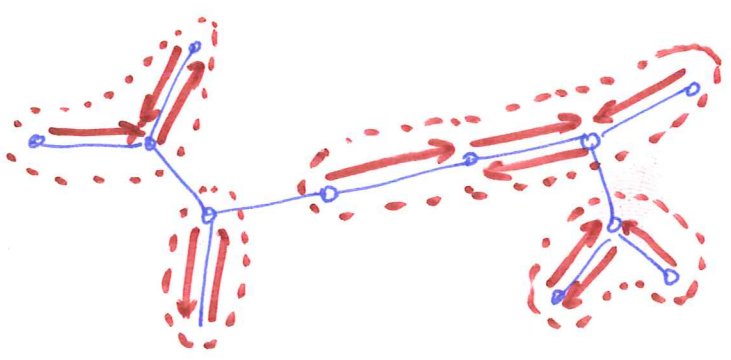
Return  $w_i \leftarrow \max \text{wt edge on } T[u_i, v_i]$ .

Simplification #2:  $T$  is a fully branching tree.

A fully-branching tree  $T$  ~~has~~ is a rooted leveled tree with

- (a) all leaves on some level  $d$ .
- (b) each internal node has at least 2 children.

Claim: take  $T$ , run Boruvka on it. this gives a nice ~~tree~~ laminar structure which defines a tree  $T'$

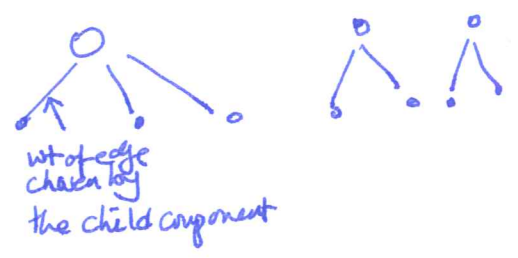


Leaves = vertices of  $T$   
 level one: components after 1 round etc.

• height of  $T' \leq \log_2 n$ .

• Fact:

$$\begin{aligned} \max \text{wt edge on } T'[u_i, v_i] \\ = \max \text{wt edge on } T[u_i, v_i]. \end{aligned}$$



[HW #1]

OK: so do simplification #2, and then #1. gives a fully branching tree  $T$  and pairs  $\{u_i, v_i\}$  st  $v_i$  is an ~~parent~~ ancestor of  $u_i$ , and  $u_i$  is a leaf (by simplification #2).

How to solve max queries @ now!

depth  $0, 1, 2, \dots, D \leq \log_2 n$ .

Komlos: just count # of comparisons for now.

for each edge  $e_0 = (u, p(u) = v)$ , look at all queries starting in  $T_u$  and ending above  $v$ .

Say they go to  $v_1, v_2, \dots, v_k$  st

$$d(v_1) \leq d(v_2) \leq \dots \leq d(v_k).$$

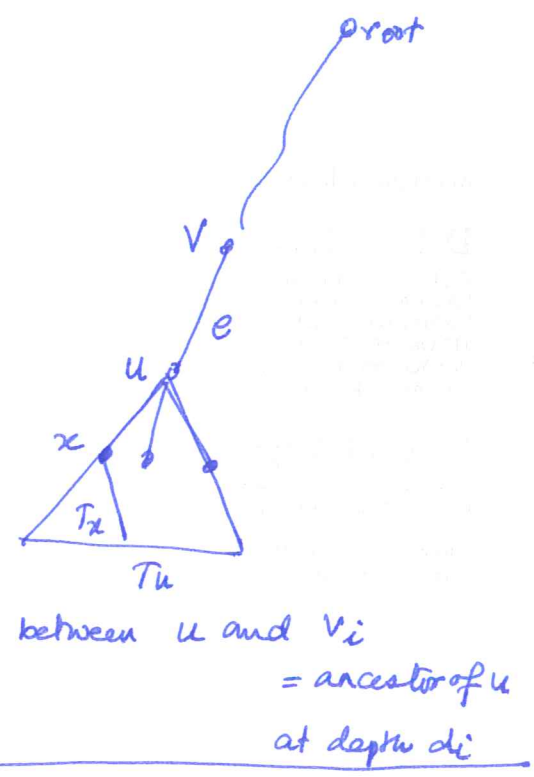
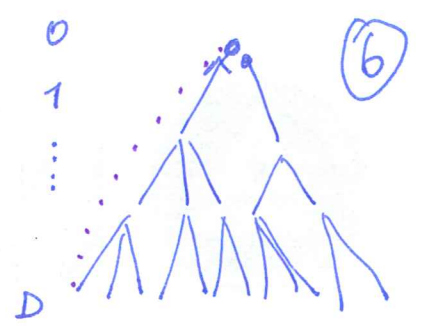
And we have a "query string"

$$Q_u = (d_1, d_2, \dots, d_k).$$

for which we have answer string

$$A_u = (a_1, a_2, \dots, a_k).$$

$\uparrow$   $a_i =$  max wt edge between  $u$  and  $v_i$



Crucial Fact:  $a_1 \geq a_2 \geq \dots \geq a_k$ .

Now: want to extend this to  $Q_x$  and get  $A_x$ .   
  $\rightarrow$  queries starting in  $T_x$  and ending above  $u$ .

Note:  $Q_x \subseteq Q_u \cup \text{depth}(u)$ .

So we know that  $A_u$  consists of

$$\max(a_1, w(x,u)), \max(a_2, w(x,u)), \dots, \max(a_k, w(x,u)).$$

Can we binary search to find the right place after which it is all  $w(x,u)$ .

$$\# \text{comps} = \lceil \log_2(|Q_u| + 1) \rceil$$

$$\Rightarrow \text{total \#comps} \leq \sum_u \log_2(|Q_u| + 1) + n.$$

$\downarrow$  for roundup

Claim:  $\leq O\left(n \log \frac{m+n}{n}\right) \leq O(m)$ .

Pf: let  $n_i$  guys at ~~level~~ <sup>level</sup> depth  $i$  (leaves at level 0).

$$\sum_{\substack{u \in \text{edge} \\ \text{level}}} \log(1 + |Q_u|) \stackrel{=}{=} n_i \text{ Average}(\log_2(1 + |Q_u|))$$

$$\leq n_i \cdot \log_2\left(1 + \frac{\sum_{u \in \text{level } i} |Q_u|}{n_i}\right) \quad \text{Jensen's inequality}$$

$$= n_i \log_2\left(1 + \frac{m}{n_i}\right) \leq n_i \log_2\left(\frac{n+m}{n_i}\right)$$

$$\Rightarrow \sum_{u \in \text{all}} \log(1 + |Q_u|) \leq n \log\left(\frac{n+m}{n}\right) + \sum_i n_i \log\left(\frac{n}{n_i}\right)$$

$n_i \leq \frac{n}{2^i} \Rightarrow \sum_i n_i \log\left(\frac{n}{n_i}\right) \leq n_0 \log \frac{n}{n_0} + n_1 \log \frac{n}{n_1} + \sum_{i \geq 2} n_i \log\left(\frac{n}{n_i}\right)$ 

and  $x \log(x/2)$  is increasing for  $x \leq n/4$ .

$$\leq n_0 + \frac{n}{2} \cdot i$$

$$= O(n).$$

$$\Rightarrow \text{total: } O\left(n + n \log_2\left(\frac{n+m}{n}\right)\right).$$

Remark: It is not surprising that  $\exists$  a proof that ~~can be verified in~~  $O(m)$  compares proving  $T^*$  is MST. can be verified in  $\square$   
 [Just give sorted list of edges, etc.]  
 But that this proof can be found using  $O(m)$  compares. And in  $O(n \log n)$  time.

see  
Zurich's  
notes

Rest of analysis: How to implement all of this in  $O(m)$  time and not just using  $O(m)$  comparisons. ~~Need to do table lookups and where collect~~

High level idea: store the  $Q_u$  as a  $\log_2 n$  bit word.

store answer also as a set of nodes:  $a_k$  is node set. the heaviest edge on  $(u, q_k)$  is one from  $a_k$  to  $p(a_k)$

now carefully do the same operations, but ~~store~~ instead of having to do binary search explicitly, store the solutions on  $\log_2 n$  bitstrings and use them.

Wrap up: MST verification in  $O(m+n)$  time.

Saw details except (a) LCA and (b) lemma from HW1.

$\Rightarrow$  Randomized Algo in  $O(m+n)$  time.

Can we make this deterministic? [Can we get an  $O(m+n)$  comparison decision tree out of this?]

— X —

Postscript: ~~can~~ LCAs in  $O(\max(m,n))$  time? At least when all queries are given up front. "offline"

List  $L$  of queries.

LCA(x)

[Tarjan's '79 paper]

• makeset(x)

• for all children  $y$  of  $x$ .

[ LCA(y)  
union(x,y).  
• ~~memo~~ "head" of find(x)  $\leftarrow$  x.  
find(y)

// say that all guys in this set have head x.

• x. marked

$\forall z$  st  $(x,z) \in List$

if  $z$  marked then  $LCA(x,z) = \text{head of find}(z)$ .

Intuition/Proof:



if  $z$  marked then  $z$  has been explored and we're in another child of the LCA (=  $r$ )  
 $\Rightarrow$  find(z).head =  $r$ .

