

Linear time MST, Directed MST

Today we see a randomized $O(m+n)$ time MST algorithm by Karger-Klein-Tarjan (1995), called KKT.

Definition: Suppose $F \subseteq G$ is a forest. An edge $e \in E$ is **F-heavy** if e creates a cycle in $F \cup \{e\}$ and it is the heaviest edge in that cycle. Otherwise e is **F-light**.

Observation:

- i) e is **F-light** $\iff e \in \text{MST}(F \cup \{e\})$
- ii) if T is an MST then e is **T-light** $\iff e \in T$
- iii) For any forest F , the **F-light** edges contain MST of G .
i.e. for any **F-heavy** edge e , $\text{MST}(G-e) = \text{MST}(G)$.

- **How to use this?** if F is a forest, we can discard **F-heavy** edges (from G). Goal: find a forest with many **F-heavy** edges (so F is close to an MST!). Then we can recurse on the remaining edges.

Issues: 1) how to find good forest F ?
2) how to quickly determine/classify **F-heavy** edges?

- **Theorem:** Given a forest $F \subseteq G$, there is an algorithm that outputs all **F-heavy** (or **F-light**) edges in $O(m+n)$.
(Komlós 85, Dixon/Randh/Tarjan 92, King 97)

- It is actually used in study of fast MST verification.
- For now let's assume this theorem.
- The idea of KKT is: randomly choose half of the edges and find a min-spanning forest F over them. Find the F -heavy edges & discard them; recurse on the remaining graph.

KKG-Algorithm (G)

1) Run 3 rounds of Borůvka's algorithm on G ,

Contract the edges to find $G'=(V',E')$ with
 $|V'|=n' \leq n/8$ and $|E'|=m' \leq m$

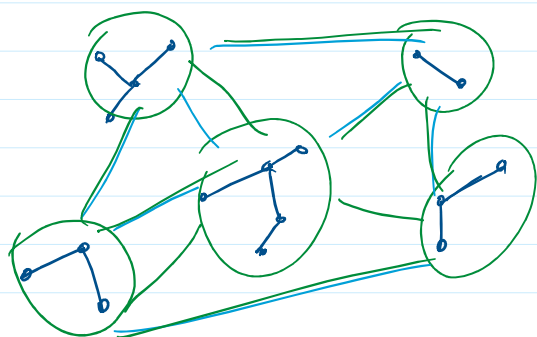
2) let E_1 be a random sample of E' w.p. $\frac{1}{2}$

let $F_1 = \text{KKG}(G_1=(V',E_1))$ (MSF of G_1)

3) let E_2 be all F_1 -light edges of E' using $\otimes$

4) let $F_2 = \text{KKG}(G_2=(V',E_2))$ (i.e. delete F_1 -heavy edges & compute MSF of it)

5) return F_2 and edges found in step one.



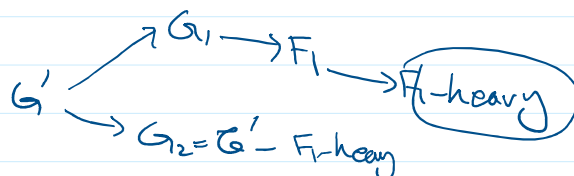
G_1 : random $\frac{1}{2}$ of E'

F_1 : MSF on G_1

delete F_1 -heavy from G'
to get G_2

find MSF F_2 in G_2

G'



Proof of correctness!

- Proof of Borůvka's algorithm shows edges picked

- Proof of Borůvka's algorithm shows edges picked in the first step belong to MST
- Also clearly (using observation (ii)) the F_i -heavy edges discarded cannot be in MST.

Runtime Analysis

We use the following two claims:

Claim 1: $\mathbb{E}[|E_1|] = \frac{m'}{2}$

Claim 2: $\mathbb{E}[|E_2|] \leq 2(n'-1)$

The proof of claim 1 is trivial (random sample).

We show (assuming) Claims 1 & 2, KKG terminates in expected time $O(m+n)$.

Assume that the total time for step 1 & 3 on a graph of order/size m, n takes $c(m+n)$ time.

Define: T_G : expected time of KKG(G)

$$T_{m,n} : \max_{G: |V|=n, |E|=m} \{T_G\}$$

Then: $T_G \leq c(m+n) + \mathbb{E}[T_{G_1} + T_{G_2}]$

$$\leq c(m+n) + T_{m_1, n'} + T_{m_2, n'}$$

$$m_1 = \mathbb{E}[|E_1|] \leq \frac{m'}{2}$$

$$m_2 = \mathbb{E}[|E_2|] \leq 2(n'-1)$$

We use induction to show $T_{m,n} \leq 2c(m+n)$

$$T_G \leq c(m+n) + \mathbb{E}[2c(m_1+n')] + \mathbb{E}[2c(m_2+n')]$$

$$\leq c(m+n) + c(m'+2n') + 2c(2n'+n')$$

$$= c(m+n+m'+8n')$$

$$\leq 2c(m+n)$$

$$\text{Since } n' \leq \frac{n}{8} \quad m' \leq m$$

since
 $\mathbb{E}[m_1] \leq \frac{m'}{2}$
 $\mathbb{E}[m_2] \leq 2n'$

Proof of claim 2:

— need to show the expected # of F_i -light edges

is $\leq 2(n-1)$

— Since F_i is the min-spanning forest of G_i , we can assume (for the sake of this proof) it is obtained by Kruskal's algorithm.

— We also assume the process of randomly selecting edges for E_i is mixed with computing F_i in the following way.

— Sort all edges of G' : $e_1, \dots, e_m$

— When we consider an edge e_i , if it creates

a cycle we clearly ignore it; this will be F_i -heavy

— if not then flip a coin and add to F_i with probability $1/2$.

— **Observation:** this process generates the same distribution for F_i as first choosing G_i and then running Kruskal's.

— The number of F_1 -light edges is bounded by the number of edges we didn't ignore.

these are the edges we tossed a coin for.

— Since F_1 has $\leq n-1$ edges at the end and probability of coin toss = $\frac{1}{2}$, the expected # of edges we tossed a coin for (i.e. light) is $\leq 2(n-1)$. ■

For proof of Theorem * see references.

open problem: Find a deterministic linear time MST alg.

Arborescences : Directed spanning Tree

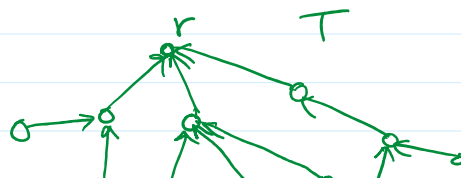
— we will see how a refined greedy algorithm we saw for MST will work for directed MST

— Given a digraph $G(V, A)$ where A is the set of Arcs (directed edges), $w: A \rightarrow \mathbb{R}^+$, a root $r \in V$.

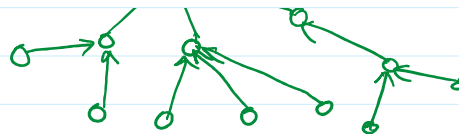
Definition: An r -arborescence is a subgraph

$T = (V, A')$ with $A' \subseteq A$ that is a directed tree rooted at r with each $v \in V$ having a directed path to r .

So ignoring the directions, T



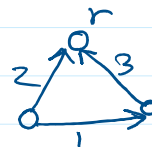
So ignoring the directions, T is a spanning tree.



Question: how to check if G has an r -arborescence?

how to find a min-cost arborescence?

- A greedy like Prim? Fails



- A greedy like Kruskal? Fails

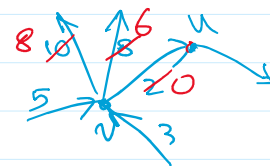
(can you build an example?)

Chu-Liu/Edmonds/Bock Algorithm 1967

$\delta^+(v)$ / $\delta^-(v)$ / $\delta^+(S)$: Arcs going out / into node v ; or set S

- We reduce weights on out-going arcs s.t. for

each v , at least one of them is 0



$M_G(v)$: weight of min-arc going out of v

- $\forall v \in G$ and outgoing arc a : $w'(a) \leftarrow w(a) - M_G(v)$

call this new graph G'

lemma 1: T is a min-cost arborescence in G

$\iff$ it is one in G'

proof: in each arborescence each vertex has one

outgoing edge. So decreasing all outgoing edges

of each node by $M_G(v)$ does not change opt. $\blacksquare$

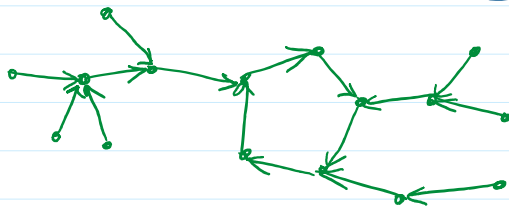
Idea of the algorithm:

- For each $v \in G$, pick one 0-weight outgoing edge.

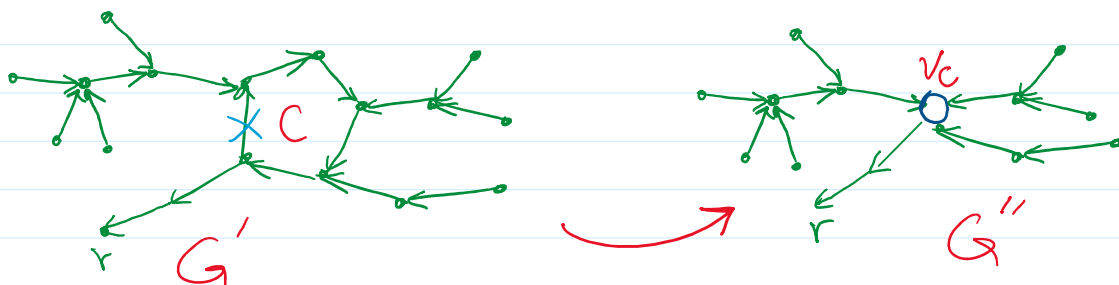
- for each $v \in C$, pick one 0-weight outgoing edge.

- If we find an arborescence it is a minimum.

- Else, each component consists of a cycle and some smaller arborescences with roots being nodes of cycle :



- Contract this 0-weight cycle C into a single node and keep cheapest edge among parallel edges; let the new graph be $G'' = G'/C$



Lemma 2: $\text{opt}(G'') = \text{opt}(G')$.

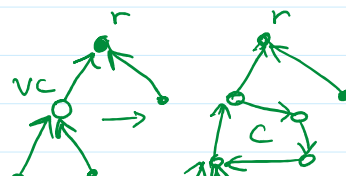
Proof: first show $\text{opt}(G') \leq \text{opt}(G'')$

let T'' a min arborescence for G'' . Consider T' obtained from T'' by expanding v_C (contracted node) to C and removing any of edges of C .

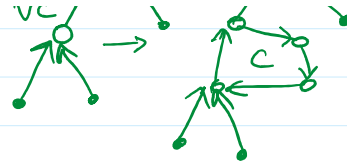
Since C is a 0-weight cycle: $w(T') = w(T'')$

► to show $\text{opt}(G'') \leq \text{opt}(G')$

Suppose T' is a solution for



Suppose T' is a solution for G' . Identify nodes of C into

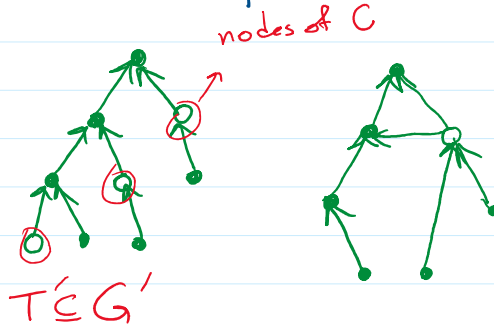


a single node. We still have a dipath from each node to v . We can

remove some edges to

find an arborescence

T'' for G'' ; Cost can only go down.



- We can iteratively run this:

Minimum Arborescence algorithm

- Obtain G' by reducing outgoing weights for each $v \in V$ by $M_G(v)$.
- Take an arbitrary 0-weight edge of each v
- Contract 0-weight cycles to get G''
- recurse on G'' ; let T'' be the solution
- Add back edges of the cycles (except one) to expand T'' to a solution T' for G' .
- return T' .

Time complexity:

- each round # of vertices reduces $\rightarrow O(n)$ iter's

- weight reduction, contraction, and lifting : $O(m)$
- Total time $O(mn)$

Improvements: Best time known $O(m \log \log n)$

open Question: Is there a linear time for this?

We will see later that one can use linear programming for minimum arborescence too.