

$A \Rightarrow B$
 $\neg B \Rightarrow \neg A$

$= \checkmark \quad r \approx \frac{1}{2} \log n$
 $O\left(\frac{n}{r} \log n\right)$ pts of S .

\Rightarrow in each iter.
 $|R| = O\left(r + 3 * \frac{n}{r} \log n\right)$

Set $r = \sqrt{n} \Rightarrow O(\sqrt{n} \log n)$

$\Rightarrow T(n) \leq 4 T(\underbrace{\sqrt{n} \log n}_{\text{ignore}}) + O(n)$

$\Rightarrow O\left(n + 4\sqrt{n} + 16n^{1/4} + \dots\right)$
 $= \boxed{O(n)}$

Rmk: generalizes to min enclos. ball in d dims or LP in d vars

$T(n) \leq (d+2) T(d\sqrt{n}) + O(d^2 n)$

base case: $T(d^2) = O((d^2)^{O(d)})$

$\Rightarrow T(n) = O\left(\frac{d^2 n}{d} + d^{O(d)}\right)$
 linear for any const d .

(improves to $O(d^2 n + 2^{\tilde{O}(d)})$ rand.
 current record for "combinatorial algs" ...)

deterministic? Megiddo $2^{2^d} n$ time
 Chazelle-Motwani '93 / C. '16 $d^{O(d)} n$ time

idea - derandomize Clarkson
 ϵ -nets can be constructed in $\sim n^d$ time by greedy hitting set algm

new idea. divide into small groups of size $\frac{d}{\epsilon}$... of each group

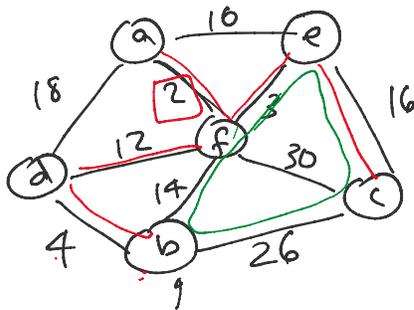
new idea. divide into groups of size d (or) compute ϵ -net of each group take union of ϵ -nets $\epsilon \sim \frac{1}{2d^2}$

$$T(n) \approx (d+2) T\left(\frac{n}{2d}\right) + O(d^2 n)$$

$$\Rightarrow O(\log n) \dots$$

Min Spanning Tree (MST)

Given weighted undir. graph $G=(V,E)$, $n=|V|$, $m=|E|$
 $n-1 \leq m \leq n^2$
 find min-weight spanning tree $MST(G)$



uses all vertices

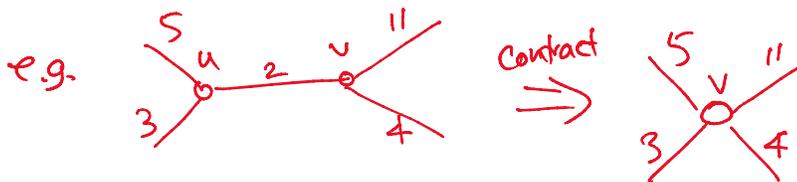
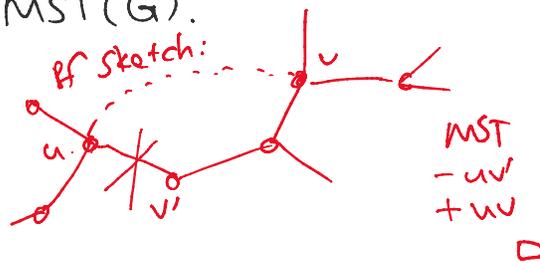
connected & acyclic
 (if wts > 0 , min spanning tree \Rightarrow acyclic)
 $2+3+4+4+16 = 29$

(assume wts are distinct) \Rightarrow MST unique

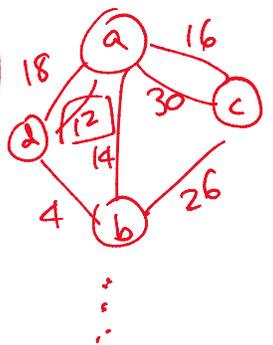
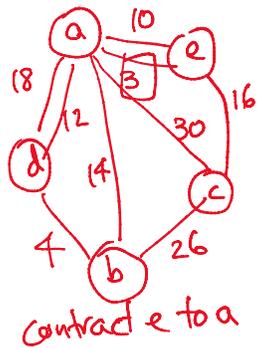
Inclusion Rule

If u 's nearest neighbor is v , then $uv \in MST(G)$.

So, can output uv & contract u to v in G .



Prim: $s=a$
 contract f to a



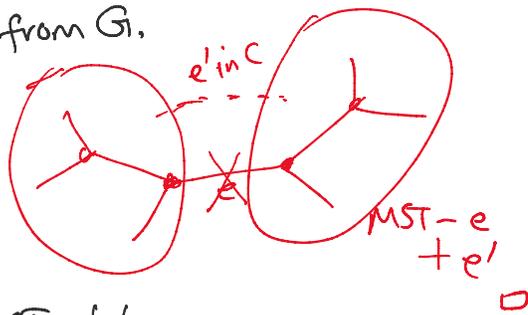
Exclusion Rule

If a cycle C 's heaviest edge is e ,

then $e \notin MST(G)$.

then $e \notin \text{MST}(G)$,
 So, can delete e from G .

pf sketch:



Rmk: all classical MST alg's use only these two rules.

eg. Kruskal's Alg'm ('56):

repeat {

take lightest edge uv ← by inclusion rule

output uv
 contract u, v

}

implementation:

Sorting + Union-find data structure
 $\Rightarrow O(m \log n)$ time

*inverse Ack.
 $m \alpha(n)$*

Prim's Alg'm ('57):

fix $s \in V$

repeat {

find s 's nearest neighbor v

contract v to s

}

implementation: heap $\Rightarrow O(m \log n)$ time

"Fibonacci heap" $\Rightarrow O(n \log n + m)$ time
 (linear if not too sparse)

decrease-key

Borůvka's Alg'm ('26):

repeat {

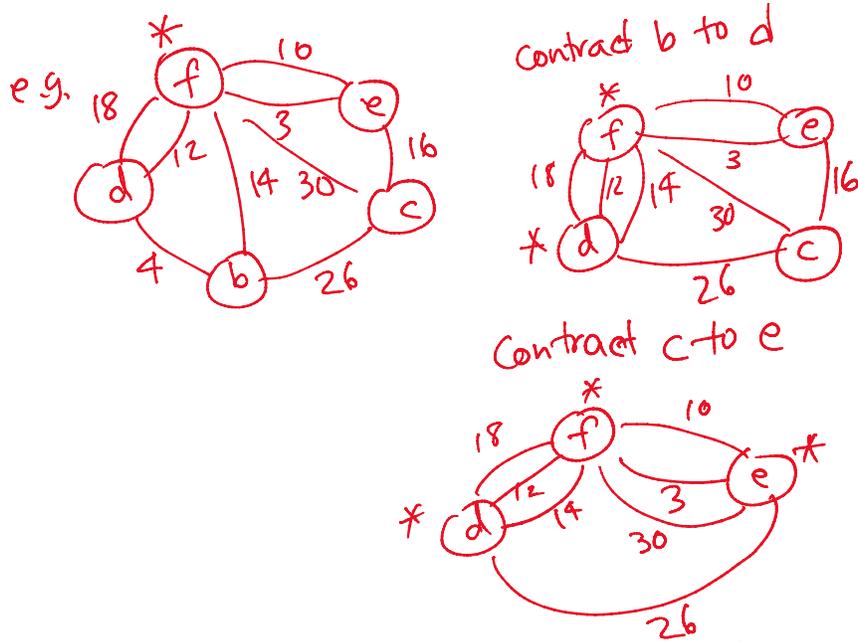
BorůvkaStep()

}

BorůvkaStep():

1. unmark all vertices

1. unmark all vertices
 2. for each $u \in V$
 3. if u unmarked
 4. find u 's nearest neighbor v
 5. output uv
 6. Contract u to v
 7. mark v



end of one Boruvka Step

Implementation: no data structures
(just linked lists)

line 4 $O(\deg(u))$ time

line 6 $O(\deg(u))$ time

\Rightarrow time for one Boruvka Step

$$= O\left(\sum_{u \in V} \deg(u)\right)$$

$$= O(m)$$

after one Boruvka Step,

vertices $\leq n/2$

because each marked vertex
is a contraction of ≥ 2 vertices

$$\Rightarrow T(m, n) \leq T(m, \frac{n}{2}) + O(m)$$

$$\Rightarrow \boxed{O(m \log n)} \text{ time}$$

A "hybrid" alg'm:

för $i = 1$ to r do BoruvkaStep()

Prim()

$$\Rightarrow \text{time } O(rm + \left(\frac{n}{2^r} \log n + m \right))$$

$O(n)$

Set $r = \log \log n$

$$\Rightarrow \boxed{O(m \log \log n)} \text{ time !!}$$

o
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