

# The Minimum Spanning Tree Problem

**Given a connected graph, find a spanning tree of minimum total edge cost.**

**where,**

**$n$  = the number of vertices**

**$m$  = the number of edges**

$$n-1 \leq m \leq \binom{n}{2}$$

# **Applications**

**Network Construction**

**Clustering**

**Minimum Tour Relaxation (Held-Karp 1-trees)**

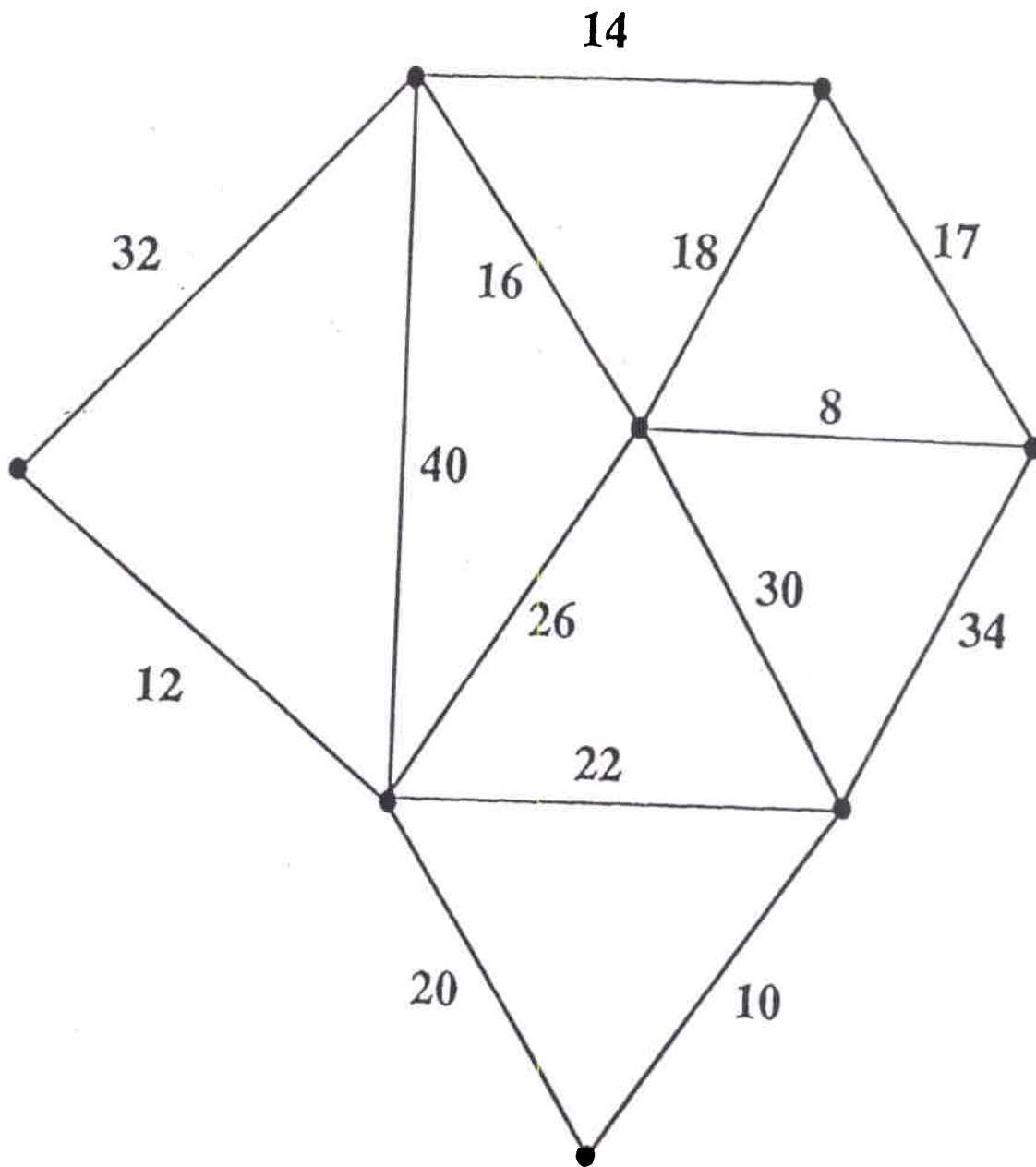
# **A Simple Solution From the 80's**

**(with apologies to Oliver Stone)**

**Gorden Gecko: "Greed is Good"**

**Repeatedly select the cheapest unselected edge  
and add it to the tree under construction if it  
connects two previously disconnected pieces.**

**Kruskal, 1956**



**The greedy method generalizes to matroids.**

**We shall generalize the method rather than  
the domain of application.**

# Generalized Greedy Method

Beginning with all edges uncolored,

sequentially color edges

blue (accepted) or red (rejected).

## Blue Rule:

Color blue any **minimum-cost** uncolored edge crossing a cut with no blue edges crossing.

## Red Rule:

Color red any **maximum-cost** uncolored edge on a cycle with no red edges.

*E MST with all blue, no red*

# **Jarnik's Algorithm**

**Grow a tree from a single start vertex.**

**At each step add a cheapest edge with  
exactly one end in the tree.**

# **Boruvka's Algorithm**

**Repeat the following step until  
all vertices are connected:**

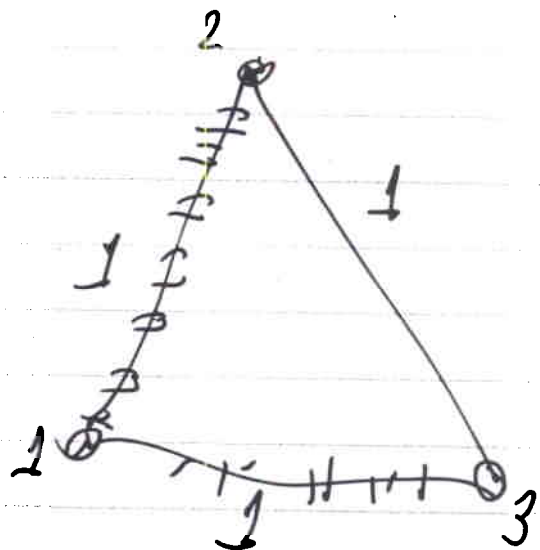
**For each blue component, select a  
cheapest edge connecting to another  
component; color all selected edges blue.**

**For correctness, a tie-breaking rule is needed.**

**Henceforth, assume all edge costs are distinct.**

**Then there is a unique spanning tree.**





# **"Classical" Algorithms**

**(before algorithm analysis)**

**Kruskal's algorithm, 1956**

*O(m log n)* time

**Jarnik's algorithm, 1930**

*O(n<sup>2</sup>)* time

**also Prim, Dijkstra**

**Boruvka's algorithm, 1926**

*O(min{m log n, n<sup>2</sup>})* time

**and many others**

# Selected History

<b>Boruvka, 1926</b>	$O(\min \{m \log n, n^2\})$
<b>Jarnik, 1930</b> <b>Prim, 1957</b> <b>Dijkstra, 1959</b>	$O(n^2)$
<b>Kruskal, 1956</b>	$O(m \log n)$
<b>Williams, Floyd, 1964</b> <b>heaps</b>	$O(m \log n)$
<b>Yao, 1975</b> <b>packets in Boruvka's algorithm</b>	$O(m \log \log n)$
<b>Fredman, Tarjan, 1984</b> <b>F-heaps in:</b> <b>Jarnik's algorithm</b>	$O(n \log n + m)$
<b>a hybrid Jarnik-Boruvka algorithm</b>	$O(m \log^* n)$
<b>Gabow, Galil, Spencer, 1984</b> <b>Packets in F-T algorithm</b>	$O(m \log \log^* n)$

$$\log^* n = \min \{i \mid \log \log \log \dots \log n \leq 1\}$$

where the logarithm is iterated  $i$  times

# Models of Computation

We assume comparison of the two edge costs takes unit time, and no other manipulation of edge costs is allowed.

## Another model:

bit manipulation of the binary representations of edge costs is allowed.

In this model,

Fredman-Willard, 1990, achieved  $O(m)$  time.

(fast small heaps by bit manipulation)

**Goal: An  $O(m)$ -time algorithm**

**without bit manipulation of edge weights**

**Boruvka's algorithm with contraction:**

**If  $G$  contains at least two vertices:**

**select cheapest edge incident to each vertex;**

**Contract all selected edges;**

**Recur on contracted graph.**

**If contraction preserves sparsity ( $m = O(n)$ ),**

**this algorithm runs in  $O(n) = O(m)$  time**

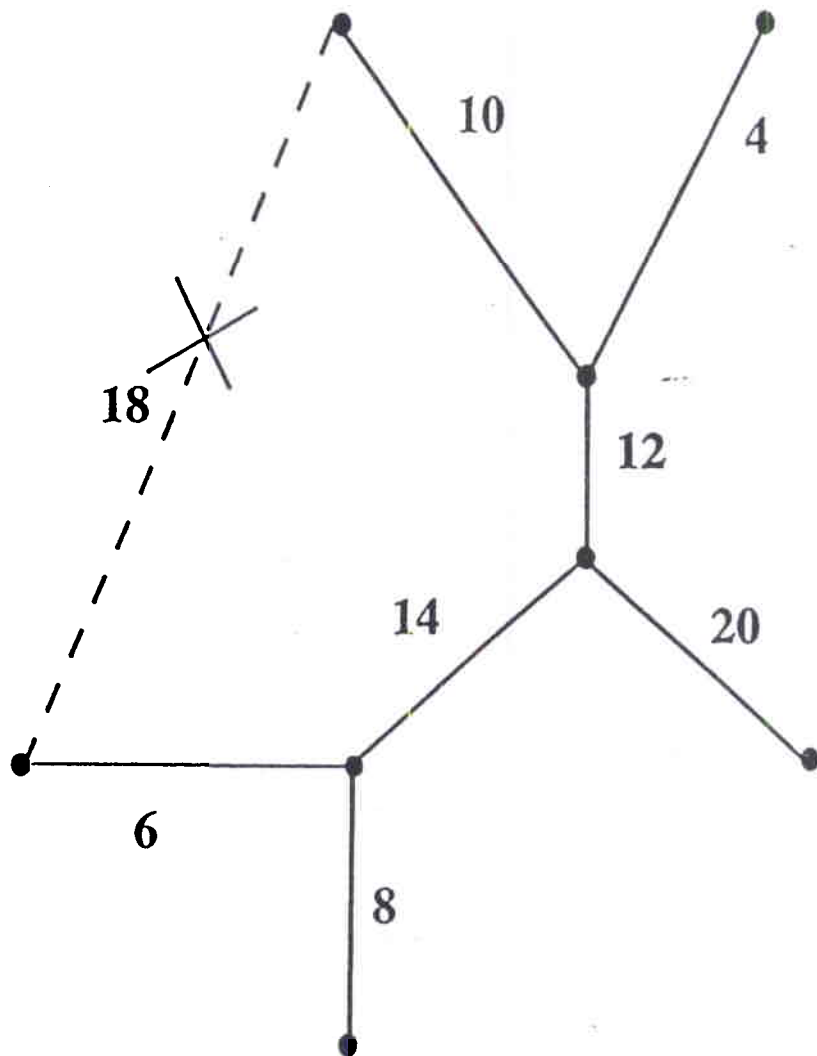
**on sparse graphs.**

**E.g. planar graphs**

## **How to handle non-sparse graphs?**

**Thinning: remove all but  $O(n)$  edges by finding edges that can't be in the minimum spanning tree.**

**How to thin?**



## **Verification:**

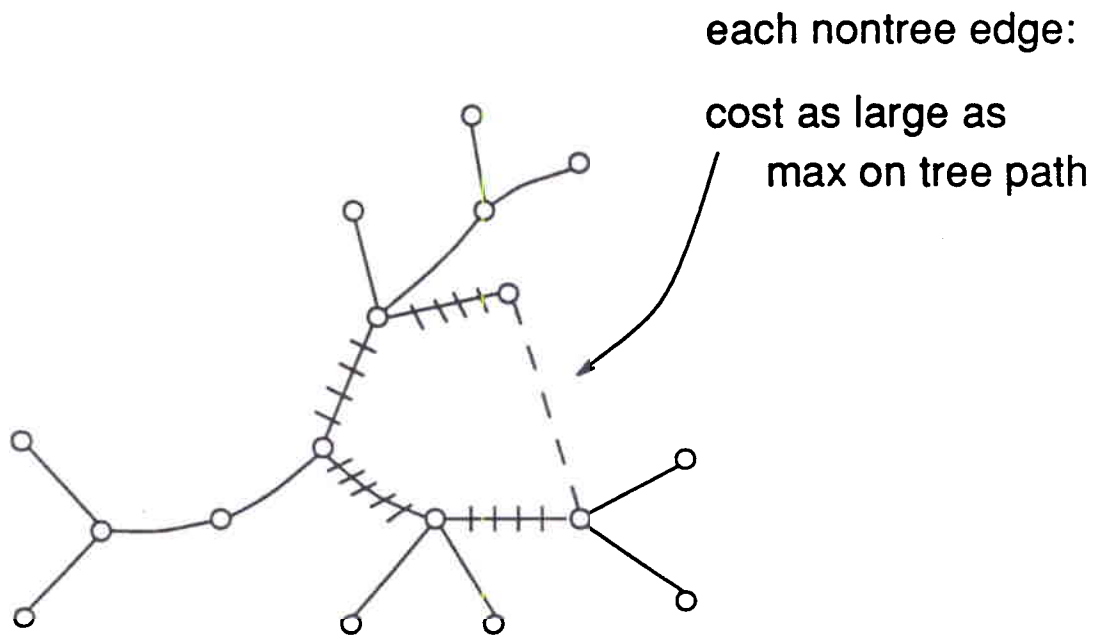
**Given a spanning tree, is it minimum?**

**Thinning: Given a spanning tree, delete any non-tree edge larger than every edge on tree path joining its ends (red rule).**

**If all non-tree edges can be thinned,  
tree is verified.**



# Verification



# History of Verification Algorithms

**Tarjan, 1979**

$O(m \alpha(m,n))$  time

**Komlos, 1984**

$O(m)$  comparisons

**Dixon, Rauch, Tarjan, 1992**

$O(m)$  time

**King, 1993**

$O(m)$  time (simplified)

**All these algorithms will thin.**

# Thinning by Random Sampling (1993)

Select half the edges at random.

Build a minimum spanning forest of the sample.

Thin.

How many edges remain?

Karger:  $O(n \log n)$  on average

Klein, Tarjan:  $< 2n$  on average

# Minimum Spanning Forest Algorithm

**If # edges/ # vertices < 5, then**

**(Boruvka step) Select the cheapest edge incident to each vertex.**

**Contract all selected edges.**

**Recur on contracted graph.**

**Else**

**(Sampling and Thinning Step) Sample the edges, each with probability 1/2.**

**Construct a minimum spanning forest of the sample, recursively.**

**Thin using this forest.**

**Recur on Thinned Graph**

# Analysis

## Boruvka step

$m < 5n$  implies  $m' < 9m/10$  since at least  $n/2$  edges are contracted

$$T(m) = O(m) + T(9m/10)$$

## Thinning Step

$m > 5n$  implies  $2n < 2m/5$

$$T(m) = O(m) + T(m/2) + T(2m/5)$$

where  $T(m/2)$  and  $T(2m/5)$  are expected time

$T(m) = O(m)$  by induction

## **Bound on Number of Edges Not Thinned**

Let  $e_1, e_2, \dots, e_m$  be the edges, in increasing cost.

Run the following variant of Kruskal's algorithm.

Initialize  $F = \emptyset$ .

Process the edges in order.

To process  $e_i$ , flip a coin to see if  $e_i$  is in the sample.

If  $e_i$  forms a cycle with edges in  $F$ , discard it as thinned.

Otherwise, if  $e_i$  is sampled, add  $e_i$  to  $F$ .  
(Whether or not  $e_i$  is sampled, it is not thinned.)

$F$  is the minimum spanning forest of the sample.

## How many edges are not thinned?

The only relevant coin flips are those on unthinned edges, each of which has a chance of  $1/2$  of adding an edge to  $F$  (a success).

There can be at most  $n-1$  successes.

For there to be more than  $k$  unthinned edges, the first  $k$  relevant coin flips must give at most  $n-2$  successes.

The chance of this is at most

$$\left(\frac{1}{2}\right)^k \sum_{i=0}^{n-2} \binom{k}{i} < \left(\frac{1}{2}\right)^k \sum_{i=0}^n \binom{k}{i}$$

In particular, the average number of unthinned edges is at most  $2n$ .

## Further Results

$O(m\alpha(n) \log f)$   $\rightarrow$   $O(m\alpha(n))$  deterministic

Chazelle: "soft" heaps

Optimal to within a constant factor

Pettie + Ramachandran:

Chazelle + optimal on small subproblems



# Open Problems

**Deterministic  $O(m)$ ?**

**Simpler verification?**

**Other applications?**

**directed spanning trees?**

**shortest paths?**