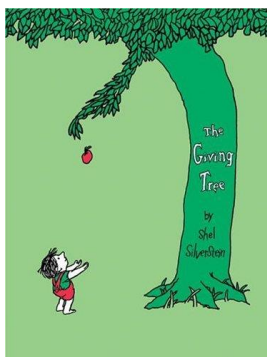


Ma/CS 6a

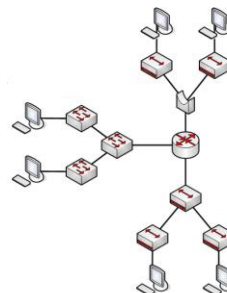
Class 10: Spanning Trees



By Adam Sheffer

Problem: Designing a Network

- **Problem.** We wish to rebuild **Caltech's** communication network.
 - We have a list off all the routers, and the cost of connecting every pair of routers (some connections might be impossible).
 - We wish to obtain a connected network, while minimizing the total cost.

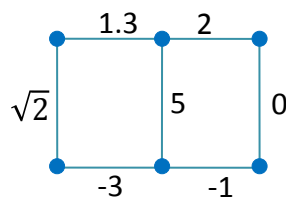


A Solution?

- We wish to build a graph $G = (V, E)$.
What are the **vertices** of V ?
 - A vertex for every router.
- What are the **edges** of E ?
 - An edge between every two routers that can be connected.
- Is the graph **directed**?
 - No.
- Where are the connection **prices** presented in the graph?

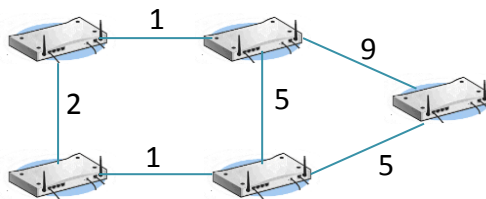
Weighted Graphs

- Given a graph $G = (V, E)$, we can define a **weight function** over the edges
 $w: E \rightarrow \mathbb{R}$.
 - That is, for every edge $e \in E$, the **weight** of e is denote as $w(e)$.



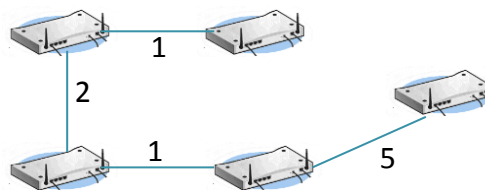
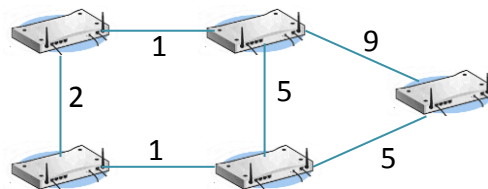
Back to Designing a Network

- We have an undirected graph $G = (V, E)$ whose vertices represent the routers and edges represent possible connections.
- How are the costs related to the graph?
 - The weight of every edge should be the corresponding cost.



Example: Network Design

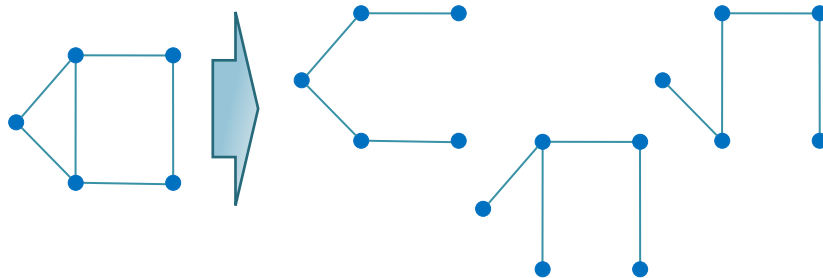
- What's the cheapest solution in this case?



Network cost: 9

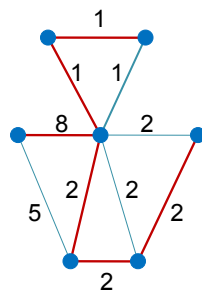
Spanning Trees

- A **spanning tree** is a tree that contains all of the vertices of the graph.
- A graph can contain many distinct spanning trees.

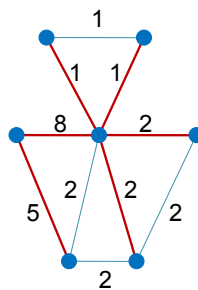


The Weight of a Spanning Tree

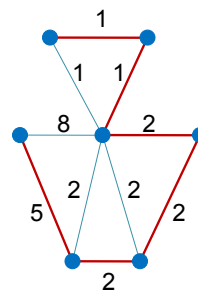
- The **weight $w(T)$** of a spanning tree T is the sum of its edge weights.



$$w(T) = 16$$



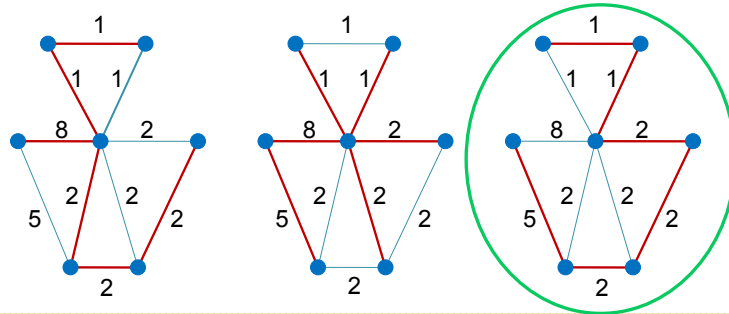
$$w(T) = 19$$



$$w(T) = 13$$

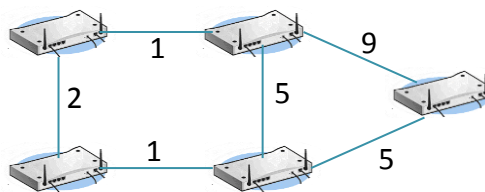
Minimum Spanning Tree

- Given a connected undirected graph $G = (V, E)$ and a weight function $w: E \rightarrow \mathbb{R}$, a *minimum spanning tree* (or, *MST*) is a spanning tree of G of a minimum weight.

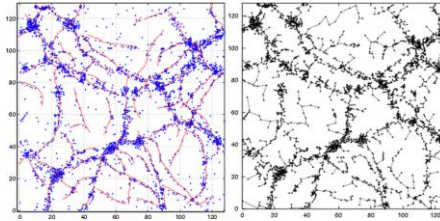


Routers and MSTs

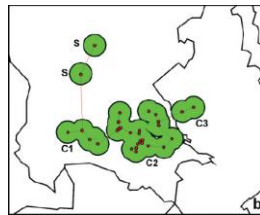
- In the network design problem we are looking for an MST of the graph.



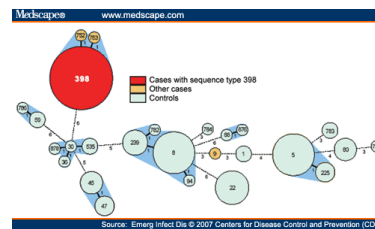
MSTs Are Also Useful For...



Galaxies research



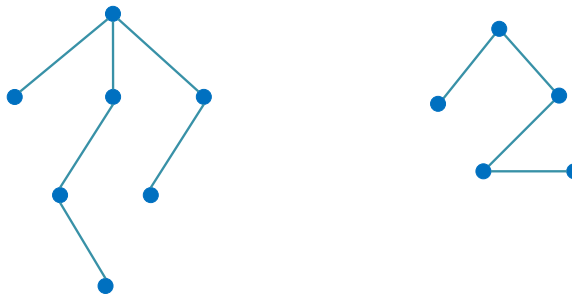
Cacti species in the desert



Genetic research

The Size of a Spanning Tree

- Given a graph $G = (V, E)$, **how many edges** are in each of its spanning trees?
 - Exactly $|V| - 1$.

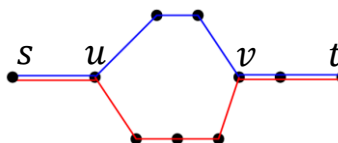


Graphs with $|V| - 1$ Edges

- **Claim.** Consider a graph $G = (V, E)$ containing **no cycles** and with $|E| = |V| - 1$. Then G is a spanning tree.
- **Proof.** By **induction** on $|V|$.
 - **Induction basis.** Obvious when $|V| = 1$.
 - **Induction step.** Since there are no cycles in G , there must be a vertex $v \in V$ of degree 1.
 - Remove v and the edge e adjacent to it. By the **induction hypothesis**, the resulting graph is a spanning tree. After reconnecting v and e , we still have a spanning tree.

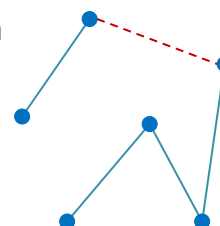
Spanning Trees: Unique Paths

- **Claim.** In any spanning tree T there is **exactly** one path between any two vertices.
 - Assume, **for contradiction**, that there are two paths P, Q in T between vertices s and t .
 - u – the last common vertex before the paths P, Q split (when traveling from s to t).
 - v – the first vertex common to both paths after u .
 - The portions of P and Q between u and v form a cycle. **Contradiction!**



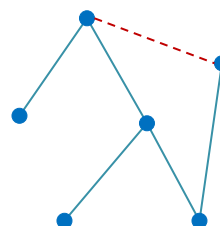
Spanning Trees: Removing an Edge

- **Claim.** Removing any edge of a spanning tree splits it into a forest of two trees.
- **Proof.** $e = (u, v)$ – the removed edge.
 - The edge e was the **unique** path between u and v . After e 's removal there is no path between u and v . Thus, at least two trees.
 - Every vertex whose unique path to u uses (u, v) remains connected to v . Every other vertex remains connected to u . Thus, exactly two trees.



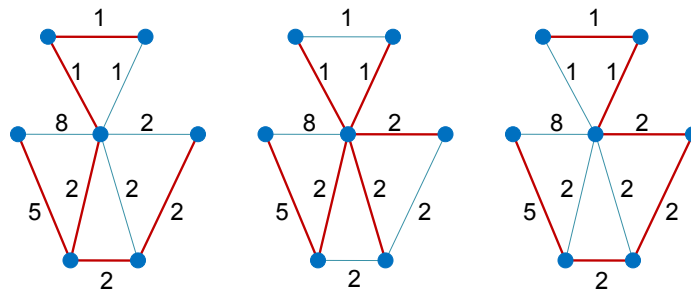
Spanning Trees: Adding an Edge

- **Claim.** Adding an edge to a spanning tree yields **exactly** one cycle.
- **Proof.** Homework exercise.

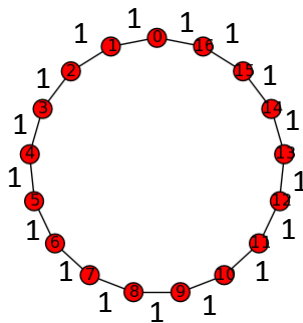


How Many MSTs Are There?

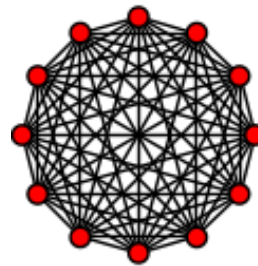
- What is the maximum number of MSTs that a graph can contain?



A Lot of MSTs



$|V|$ MSTs



$|V|^{|V|-2}$ MSTs

(try to prove: at least $(|V| - 1)!$)

(Not so) Comic Relief

- What is the origin of the word *algorithm*?



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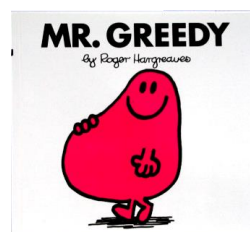
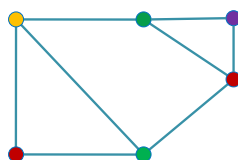
(Not so) Comic Relief

- What other major mathematical concept has a similar origin?
- Al Khwarizmi's book is called
Al-Kitāb al-mukhtaṣar fī hīsāb al-ğabr wa'l-muqābala



Greedy Algorithms

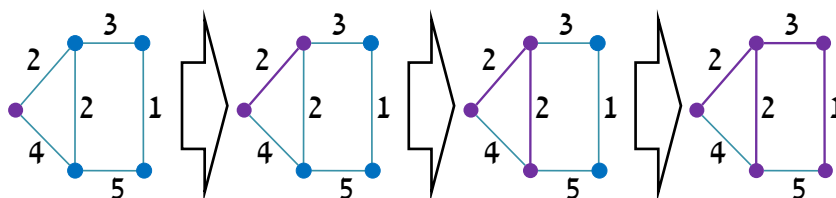
- A **greedy algorithm** makes the locally optimal choice at each stage, without having a long-term strategy.
 - Might not yield the optimal result.
 - **Example.** The coloring algorithm for graphs of maximum degree k .



Prim's MST Algorithm

- Given a **connected** graph $G = (V, E)$, we find an MST by using a greedy approach. We gradually grow a tree T until it becomes an MST.
- Choose an arbitrary vertex $r \in V$ to be the root and set $T \leftarrow r$.
- As long as T is not a spanning tree:
 - Find the lightest edge e that connects a vertex of T to a vertex v not in T . Add v and e to T .

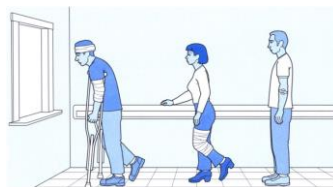
Example: Prim's Algorithm



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Data Structure: Priority Queue

- A **priority queue** stores “objects” (in our case – vertices). Each object has a priority.
- Supports the operations:
 - Enqueue – insert an object to the the queue.
 - Dequeue – remove the object with the **highest priority** from the queue.



Prim's Algorithm in More Detail

```

1  $Q \leftarrow$  an empty priority queue
2 foreach vertex  $v \in V \setminus \{r\}$  do
3    $\lfloor key[v] \leftarrow \infty$ 
4  $key[r] \leftarrow 0$ 
5  $\pi[r] \leftarrow \text{NIL}$ 
6 insert  $V$  to  $Q$  using  $key$  as priorities
7 while  $Q$  is not empty do
8    $u \leftarrow \text{Extract-Min}(Q)$ 
9   foreach neighbor  $v$  of  $u$  do
10    if  $v \in Q$  and  $w(u, v) < key[v]$  then
11       $\pi[v] \leftarrow u$ 
12       $key[v] \leftarrow w(u, v)$ 
13  $A \leftarrow \{(\pi[u], u) \mid u \in V \setminus \{r\}\}$ 
14 return  $(V, A)$ 

```

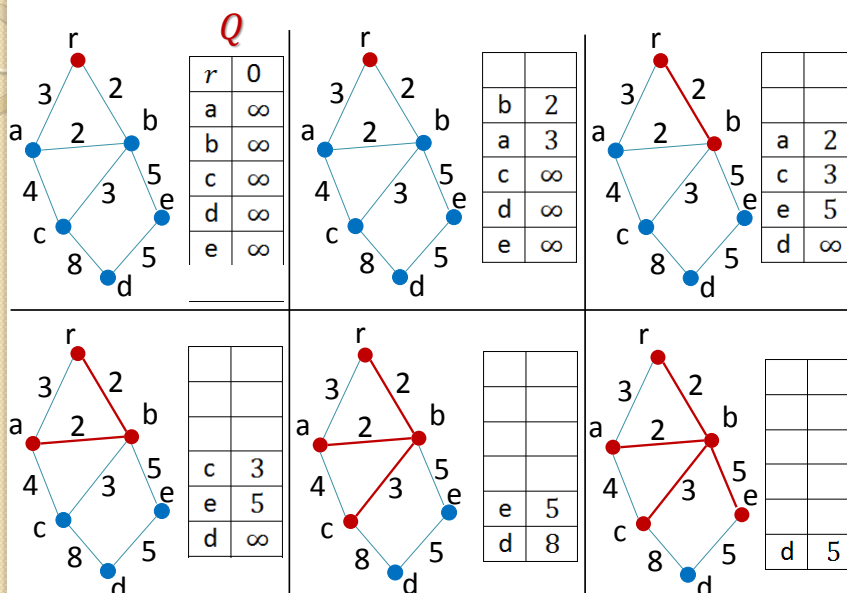
$key[v]$ is the best known weight for connecting v to the tree.

As in BFS, $\pi[v]$ is the parent of v in the tree.

Q - priority queue according to the values of $key[v]$.

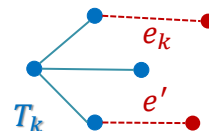
25

Another Prim Run



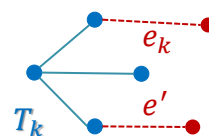
Correctness of Prim

- Let T be a spanning tree that Prim returns. Assume, **for contradiction**, that there exists an MST M such that $w(T) > w(M)$.
- Let e_1, \dots, e_n be the edges of T in their insertion order.
- Let e_k be the first edge of T that is not in M .
- T_k – the tree consisting of e_1, e_2, \dots, e_{k-1} .
- We claim that there exists an edge $e' \in M$ such that $w(e_k) \leq w(e')$ and that e' connects a vertex of T_k with a vertex not in T_k .



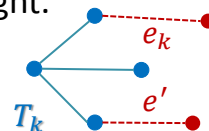
Proving the Claim

- T_k – a tree consisting of e_1, e_2, \dots, e_{k-1} .
- **Claim.** There exists an edge $e' \in M$ such that $w(e_k) \leq w(e')$ and e' connects a vertex of T_k with a vertex not in T_k .
 - Write $e_k = (u, v)$. Let P be the path in M between u and v .
 - Let e' be an edge of P that connects a vertex of T_k with a vertex not in T_k .
 - We have $w(e_k) \leq w(e')$, since otherwise **Prim** would have chosen e' before e_k .



Correctness of Prim (cont.)

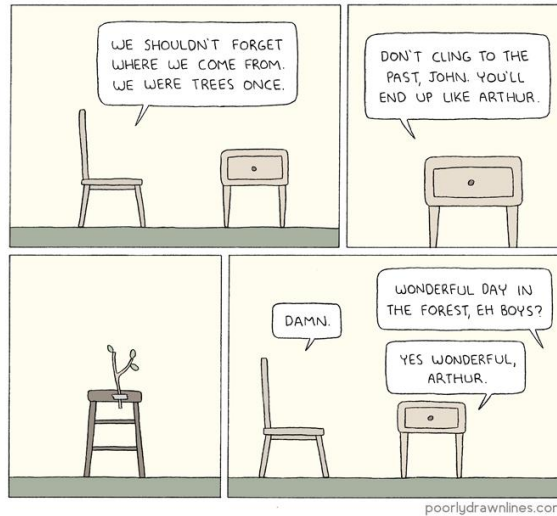
- Let T be a tree that Prim returns.
- Assume, **for contradiction**, that there exists an MST M such that $w(T) > w(M)$.
- Let e_k be the first edge of T that is not in M .
- There exists $e' \in M$ that connects a vertex of T_k with a vertex not in T_k and $w(e_k) \leq w(e')$
- Adding e_k to M creates a cycle that also contains e' . Removing e' results in a spanning tree M' of a smaller or equal weight.
- Thus, M' is another MST.



Correctness of Prim (end)

- Let T be the tree that Prim returns. Let e_1, \dots, e_n be the edges of T in their insertion order.
- We started with an MST that **contains the edges e_1, \dots, e_{k-1} but not e_k** and found an MST that **contains the edges e_1, \dots, e_{k-1}, e_k** .
- Repeating this process, we eventually obtain an MST that contains $e_1, \dots, e_{|V|-1}$.
- That is, T is an MST!

The End: A common Syndrome of Spanning Trees



Can anyone make me a variant of this with spanning trees? ☺