

# Minimum Spanning Trees

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- Minimum Spanning Trees
- Kruskal's Algorithm
- Prim's Algorithm
- Sidetrack: Priority Queues
- Other MST Algorithms

## ❖ Minimum Spanning Trees

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Reminder: **Spanning tree**  $ST$  of graph  $G=(V,E)$

- **spanning** = all vertices, **tree** = no cycles
- $ST$  is a subgraph of  $G$  ( $G'=(V,E')$  where  $E' \subseteq E$ )
- $ST$  is **connected** and **acyclic**

**Minimum spanning tree**  $MST$  of graph  $G$

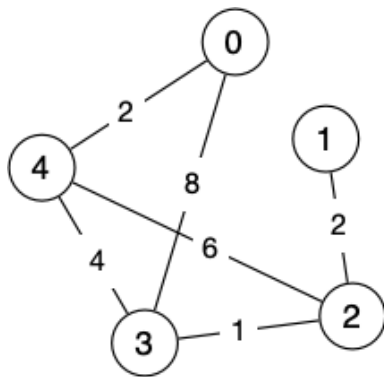
- $MST$  is a spanning tree of  $G$
- sum of edge weights is no larger than any other  $ST$

Applications:

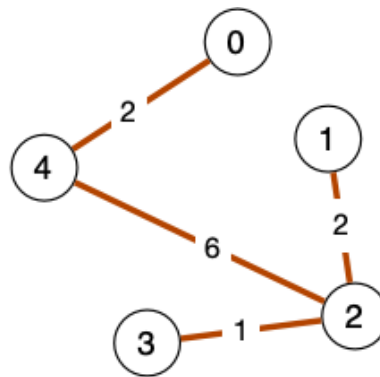
- Computer networks, Electrical grids, Transportation networks ...

## ❖ ... Minimum Spanning Trees

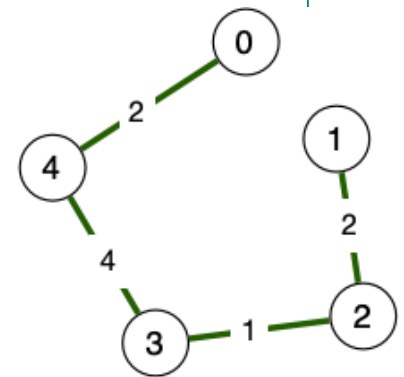
Example:



*Original Graph*



*A Spanning Tree*



*Minimum Spanning Tree*

## ❖ ... Minimum Spanning Trees

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**Problem:** how to (efficiently) find MST for graph  $G$ ?

One possible strategy:

- generate all spanning trees
- calculate total weight of each
- MST = ST with lowest total weight

Note that MST may not be unique

- e.g. if all edges have same weight, then all STs are MSTs

## ❖ ... Minimum Spanning Trees

Brute force solution (using generate-and-test strategy):

```
findMST(G):  
|   Input   graph G  
|   Output  a minimum spanning tree of G  
|  
|   bestCost=∞  
|   for all spanning trees t of G do  
|   |   if cost(t) < bestCost then  
|   |   |   bestTree=t  
|   |   |   bestCost=cost(t)  
|   |   end if  
|   end for  
|   return bestTree
```

Not useful in general because **#spanning trees** is potentially large  
(e.g.  $n^{n-2}$  for a complete graph with  $n$  vertices)

## ❖ ... Minimum Spanning Trees

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Simplifying assumption:

- edges in  $G$  are not directed (MST for digraphs is harder)

If edges are not weighted

- there is no real notion of *minimum* spanning tree

Our MST algorithms apply to

- weighted, non-directional, connected graphs

## ❖ Kruskal's Algorithm

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One approach to computing MST for graph  $G$  with  $V$  nodes:

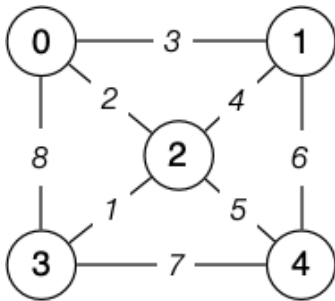
1. start with empty MST
2. consider edges in increasing weight order
  - add edge if it does not form a cycle in MST
3. repeat until  $V-1$  edges are added

Critical operations:

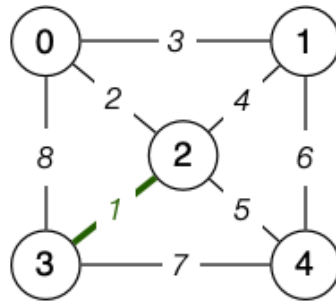
- iterating over edges in weight order
- checking for cycles in a graph

## ❖ ... Kruskal's Algorithm

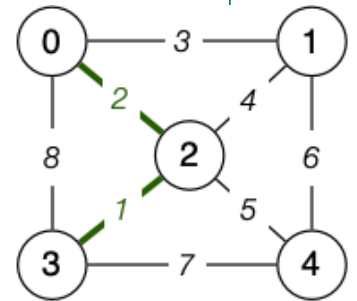
Execution trace of Kruskal's algorithm:



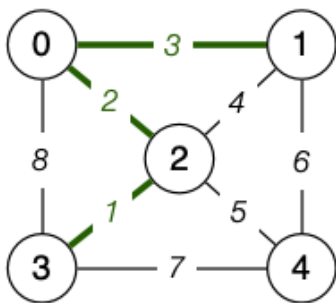
Original



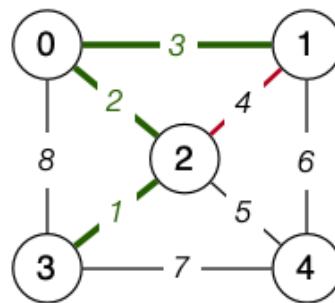
After step 1



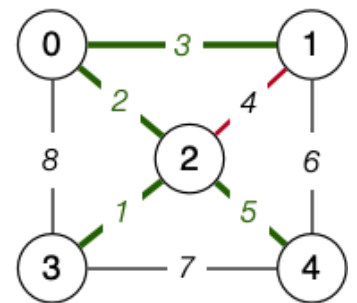
After step 2



After step 3



After step 4a



After step 4b

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## ❖ ... Kruskal's Algorithm

Pseudocode:

```
KruskalMST(G):  
|   Input   graph G with n nodes  
|   Output  a minimum spanning tree of G  
  
|   MST=empty graph  
|   sort edges(G) by weight  
|   for each e ∈ sortedEdgeList do  
|   |   MST = MST ∪ {e}  // add edge  
|   |   if MST has a cycle then  
|   |   |   MST = MST \ {e}  // drop edge  
|   |   end if  
|   |   if MST has n-1 edges then  
|   |   |   return MST  
|   |   end if  
|   end for
```

## ❖ ... Kruskal's Algorithm

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Rough time complexity analysis ...

- sorting edge list is  $O(E \cdot \log E)$
- at least  $V$  iterations over sorted edges
- on each iteration ...
  - getting next lowest cost edge is  $O(1)$
  - checking whether adding it forms a cycle: cost =  $O(V^2)$

Possibilities for cycle checking:

- use DFS ... too expensive?
- could use *Union-Find data structure* (see Sedgewick Ch.1)

## ❖ Prim's Algorithm

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Another approach to computing MST for graph  $G=(V,E)$ :

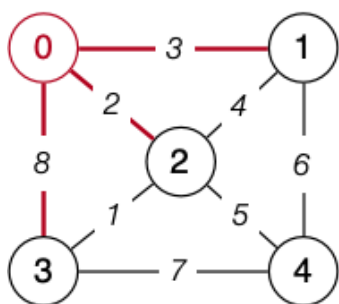
1. start from any vertex  $v$  and empty MST
2. choose edge not already in MST to add to MST; must be:
  - incident on a vertex  $s$  already connected to  $v$  in MST
  - incident on a vertex  $t$  not already connected to  $v$  in MST
  - minimal weight of all such edges
3. repeat until MST covers all vertices

Critical operations:

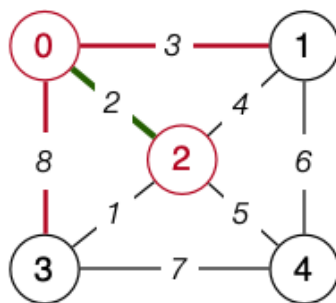
- checking for vertex being connected in a graph
- finding min weight edge in a set of edges

## ❖ ... Prim's Algorithm

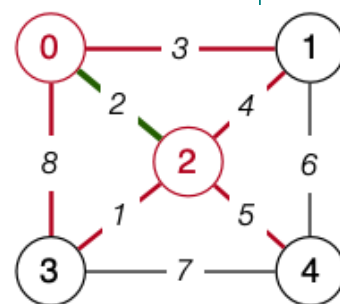
Execution trace of Prim's algorithm (starting at  $s=0$ ):



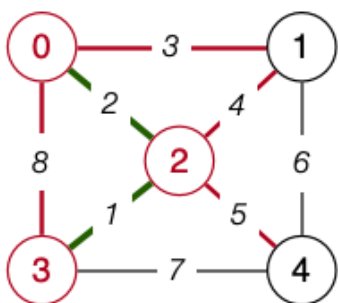
Start of step 1



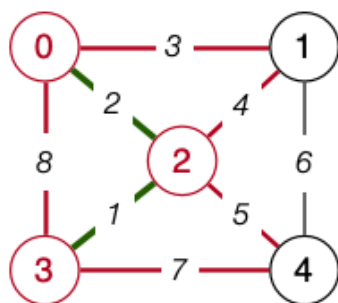
End of step 1



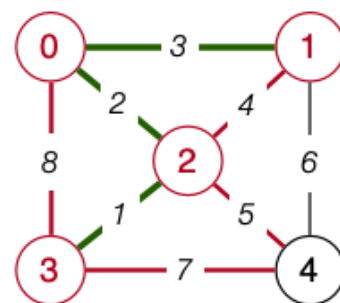
Start of step 2



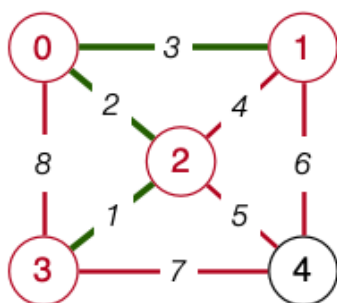
End of step 2



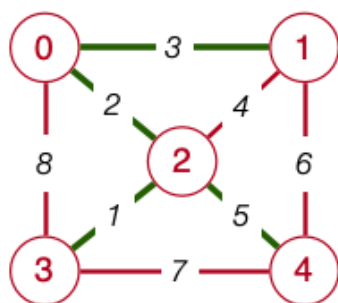
Start of step 3



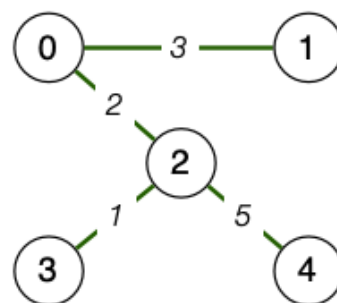
End of step 3



Start of step 4



End of step 4



MST

## ❖ ... Prim's Algorithm

Pseudocode:

**PrimMST(G):**

```
| Input   graph G with n nodes
| Output  a minimum spanning tree of G
|
| MST=empty graph
| usedV={0}
| unusedE=edges(g)
| while |usedV| < n do
| |   find  $e=(s,t,w) \in \text{unusedE}$  such that {
| |        $s \in \text{usedV} \wedge t \notin \text{usedV}$ 
| |        $\wedge w$  is min weight of all such edges
| |   }
| |   MST = MST  $\cup \{e\}$ 
| |   usedV = usedV  $\cup \{t\}$ 
| |   unusedE = unusedE  $\setminus \{e\}$ 
| end while
| return MST
```

Critical operation: finding best edge

## ❖ ... Prim's Algorithm

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Rough time complexity analysis ...

- $V$  iterations of outer loop
- in each iteration, finding min-weighted edge ...
  - with set of edges is  $O(E) \Rightarrow O(V \cdot E)$  overall
  - with **priority queue** is  $O(\log E) \Rightarrow O(V \cdot \log E)$  overall

Note:

- have seen stack-based (DFS) and queue-based (BFS) traversals
- using a *priority queue* gives another non-recursive traversal

## ❖ Sidetrack: Priority Queues

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Some applications of queues require

- items processed in order of "key"
- rather than in order of entry (FIFO – first in, first out)

Priority Queues (PQueues) provide this via:

- **join**: insert item into PQueue (replacing **enqueue**)
- **leave**: remove item with largest key (replacing **dequeue**)

Will discuss priority queues in more detail in another video

## ❖ Other MST Algorithms

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Boruvka's algorithm ... complexity  $O(E \cdot \log V)$

- the oldest MST algorithm
- start with  $V$  separate components
- join components using min cost links
- continue until only a single component

Karger, Klein, and Tarjan ... complexity  $O(E)$

- based on Boruvka, but non-deterministic
- randomly selects subset of edges to consider
- for the keen, here's [the paper](#) describing the algorithm



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