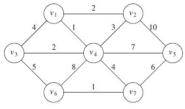




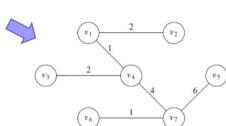


### The problem

- A Minimum Spanning Tree (MST) of an undirected connected weighted graph G is a tree formed from graph edges that connects all the vertices of G at lowest total cost.
- Example:



The original Graph



The Minimum Spanning Tree

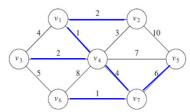
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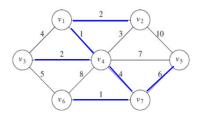
### The problem (more formally)

- Given an undirected graph G = <V,E>, find a graph G\*=<V,E\*> such that:
  - $\ \square \ E^* \subseteq E$
  - $\Box |E^*| = |V| 1$
  - □ G\* is connected
  - ☐ **G\*** is a **ST** (or **Spanning Tree**)
- Note that:
  - $\Box$  For any spanning tree T, if an edge e that is not in T is added, a cycle is created.









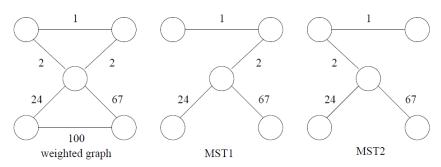
- If as a spanning tree is created, then
  - $\hfill\Box$  the edge that is added is the one of minimum cost that avoids creation of a cycle, then
    - the cost of the resulting spanning tree cannot be improved, because any replacement edge would have cost at least as much as an edge already in the spanning tree.

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## The MST may be not unique!



Example:





### **Application of Minimum-cost Spanning Trees**



Minimum-cost spanning trees have many applications.

### **Examples:**

- Building cable networks that join n locations with minimum cost.
- Building a road network that joins n cities with minimum cost.
- Obtaining an independent set of circuit equations for an electrical network.
- In pattern recognition minimal spanning trees can be used to find noisy pixels.

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### **Prim's Algorithm\***



- Based on expanding cloud of known vertices (greedy strategy)
- Basic ideas:
  - **Prim's algorithm** finds a **MST** by selecting edges from the graph one-by-one as follows:
    - □ It starts with a tree, T, consisting of the starting vertex, v, (v is **any vertex** in V)
    - ☐ Then, it adds the shortest edge (= edge with a **minimum-cost**) emanating from v that connects T to the rest of the graph.
    - □ It then moves to the added vertex and repeats the process.

\*The algorithm was developed in 1930 by Czech mathematician **Vojtěch Jarník** and later rediscovered and republished by computer scientists **Robert C. Prim** in 1957 and **Edsger W. Dijkstra** in 1959.

### Prim's Algorithm

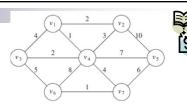


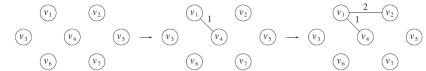
□ General Pseudocode:

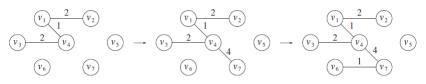
```
Consider a graph G = (V,E,W);
T: a tree consisting of only the starting vertex v;
while (T has fewer than |V| vertices)
{
    e ← find a smallest edge connecting T to G\T;
    add e to T;
}
```

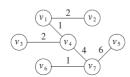
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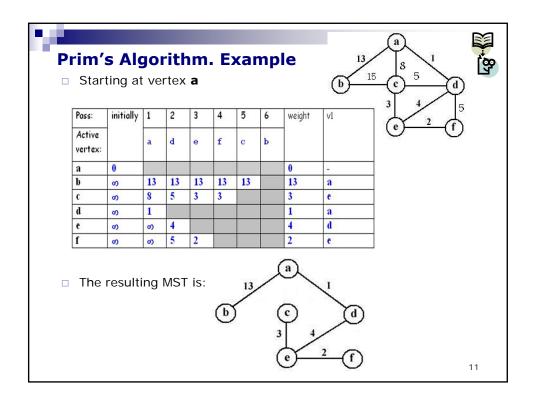
# Prim's Algorithm. Example













# £83,

### Pseudocode of Prim's Algorithm.

1. For each vertex **v**, set:

 $v.cost = \infty$  and v.known = false

- Choose any vertex v
  - a) Mark **v** as known
  - For each edge (v,u) with weight w, set:

u.cost=w and u.prev=v

- 2. While there are unknown vertices in G
  - Select the unknown vertex **v** with lowest cost
  - b) Mark **v** as known and add the edge (**v**, **v.prev**) to output
  - c) For each edge (v,u) with weight w,

```
if(w < u.cost)
{
    u.cost = w;
    u.prev = v;
}</pre>
```

The **running time** is  $O(|V|^2)$  without **heaps**, which is optimal for **dense graphs**, and  $O(|E|\log|V|)$  using binary heaps, which is good for **sparse graphs**.



### Kruskal's Algorithm\*.



- As a Prim's algorithm this method is based on expanding cloud of known vertices (greedy strategy)
- The Basic idea of the **Kruskal's algorithm** is:
  - □ Continually to select the edges in order of smallest weight
  - □ Accept an edge if it does not cause a cycle.

\*This algorithm first appeared in *Proceedings of the American Mathematical Society*, pp. 48–50 in 1956, and was written by **Joseph Kruskal**.

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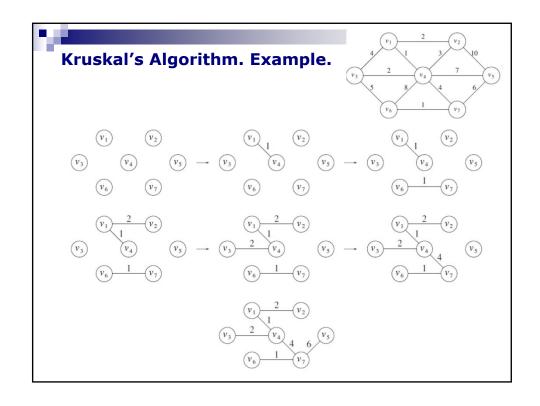
### Kruskal's Algorithm.

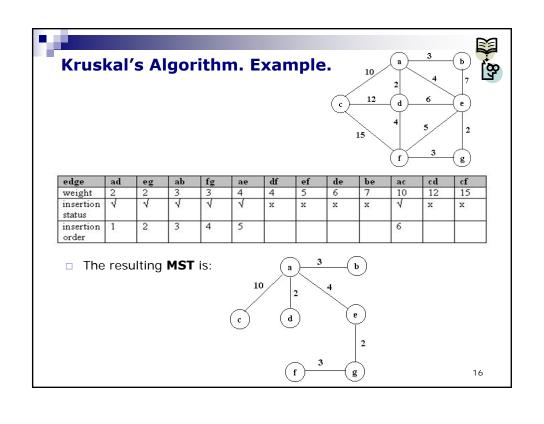


General Pseudocode:

```
Sort edges by weight (better: put in min-heap)
T = empty
While output size < |V|-1
{
    Consider next smallest edge, e = (u,v)
    if(e does not create a cycle with edges in T)
        add e to T
}</pre>
```

The worst-case running time of this algorithm is  $O(|E|\log|E|)$ , which is dominated by the heap operations.







### Kruskal's Algorithm. Check for cycles.



- How to **check** for **cycles**?
- Observations:
  - □ At each step of the **Kruskal's algorithm** T is acyclic.
  - □ If u and v are previously in T, then adding the edge (u,v) to T creates a cycle.
- Question:
  - ☐ How to test whether u and v are in the same set?
- Answer:
  - □ Trivial algorithm: **O(|V|)**.
  - Non-trivial:
    - Use a disjoint-set data structure! Vertices in T are considered to be in same set.
    - Test if Find-set(u) = Find-set(v)??
    - Find-set(u) is O(log n), where n is the size of the set.

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### Java implementations.



■ For a full version of the Prim's algorithm implementation please consult:

http://algs4.cs.princeton.edu/43mst/PrimMST.java.html

(Authors: Robert Sedgewick and Kevin Wayne)

For a full version of the Kruskal's algorithm implementation please consult:

http://algs4.cs.princeton.edu/43mst/KruskalMST.java.html

(Authors: Robert Sedgewick and Kevin Wayne)

