

---

# Kruskal's MST and Find-Union Data Structure

CS4102

Tom Horton and Mark Floryan



# Topics

# Topics in this slide-deck:

---

- ▶ **Motivating Problem: Minimum Spanning Trees**
  - ▶ This is a graph problem, and you've seen it
- ▶ **One solution**
  - ▶ Kruskal's Algorithm (Uses a find-union structure)
- ▶ **Define and design the find-union to support Kruskal's Algorithm**
  - ▶ Will require some clever implementation details

# Minimum Spanning Trees

# Spanning Tree

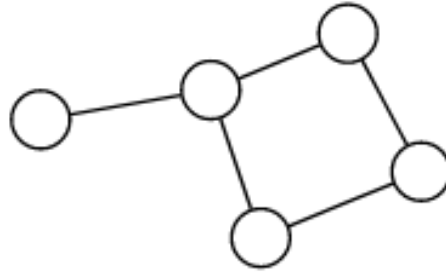
---

- ▶ A **spanning tree** of a graph  $G$  is a subgraph of  $G$  that contains every vertex in  $G$  and is also a **tree** (i.e., it has no cycles)
  - ▶ All connected graphs have spanning tree(s)
  - ▶ All spanning trees have the same number of nodes (all of them)
  - ▶ You can construct a spanning tree by arbitrarily remove edges from cycles

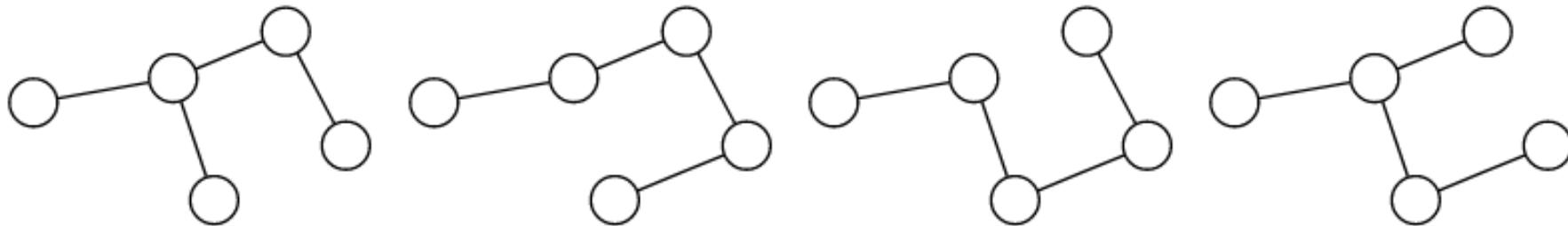
# Spanning Tree: Example

---

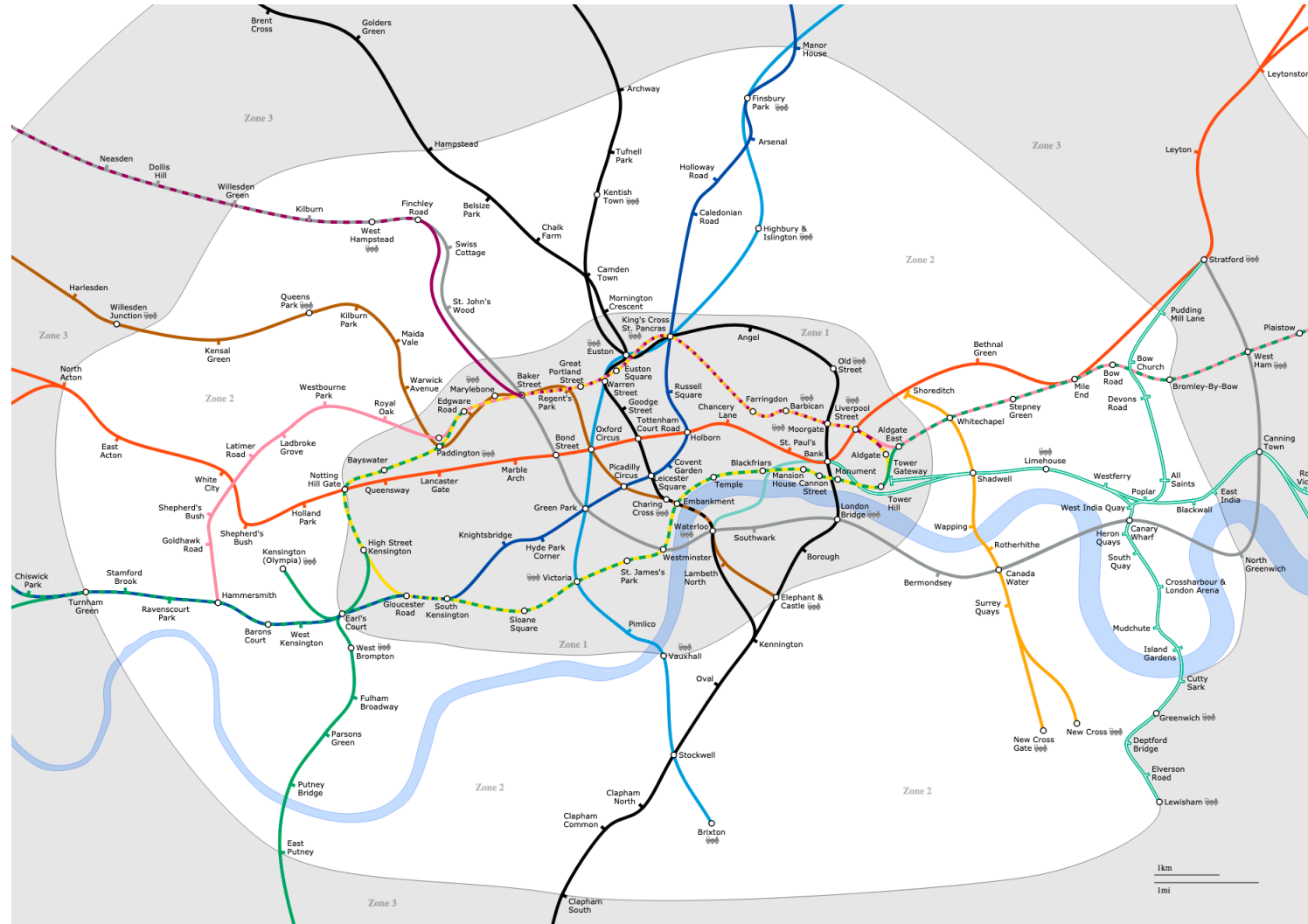
- ▶ Original Graph:



- ▶ Possible spanning trees:



# Spanning Tree: Example (almost)



# Minimum Spanning Tree

---

- ▶ Just constructing any spanning tree is simple
- ▶ Suppose edges have costs!
  - ▶ Cost of building tracks between two stations
  - ▶ Length of wire between boxes in a house
- ▶ Each spanning tree has a different total cost (sum of edges included in tree)
- ▶ The ***Minimum Spanning Tree*** is the spanning tree with lowest overall cost



# Minimum Spanning Tree

---

- ▶ Given a connected and undirected graph  $G=(V, E)$
- ▶ Find a graph  $G' = (V, E')$  such that:
  - ▶  $E'$  is a subset of  $E$
  - ▶  $|E'| = |V| - 1$
  - ▶  $G'$  is connected (assuming  $G$  was connected)
  - ▶ Sum of cost of edges in  $E'$  is minimum
- ▶  $G'$  is then the minimum spanning tree

# Kruskal's Algorithm

# Kruskal's MST Algorithm

---

- ▶ Prim's approach:

- ▶ Build one tree. Make the one tree bigger and as good as it can be.

- ▶ Kruskal's approach

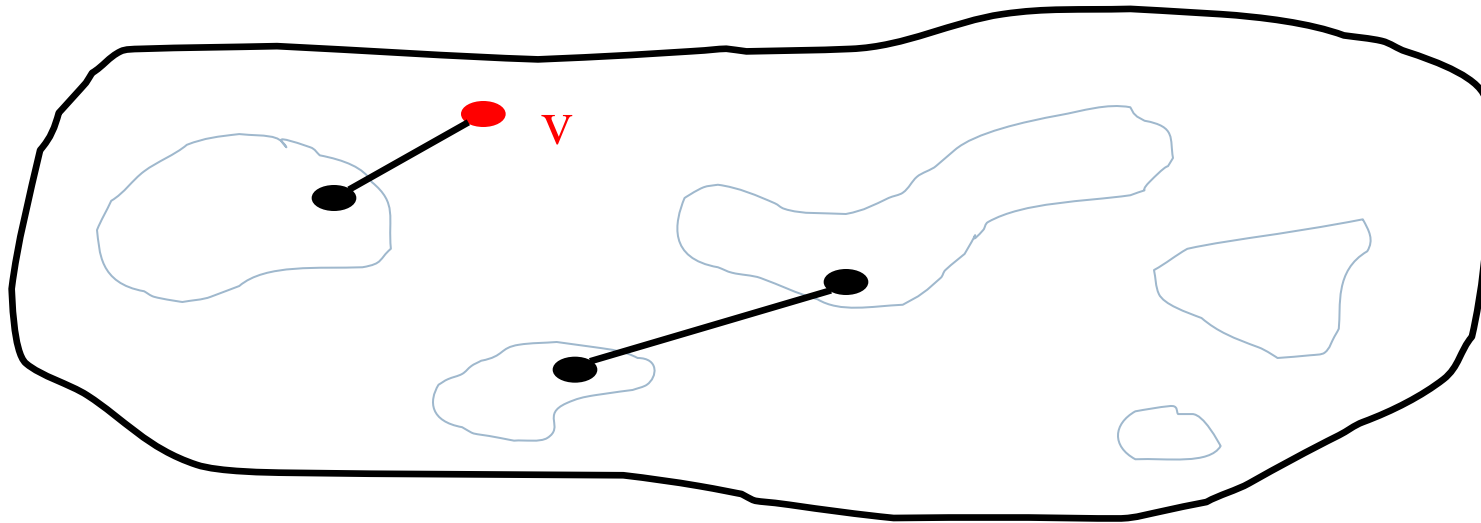
- ▶ Choose the best edge possible: smallest weight
  - ▶ Not one tree – maintain a forest!
  - ▶ Each edge added will connect two trees.  
Can't form a cycle in a tree!
  - ▶ After adding  $n-1$  edges, you have one tree, the MST

# Kruskal's MST Algorithm

---

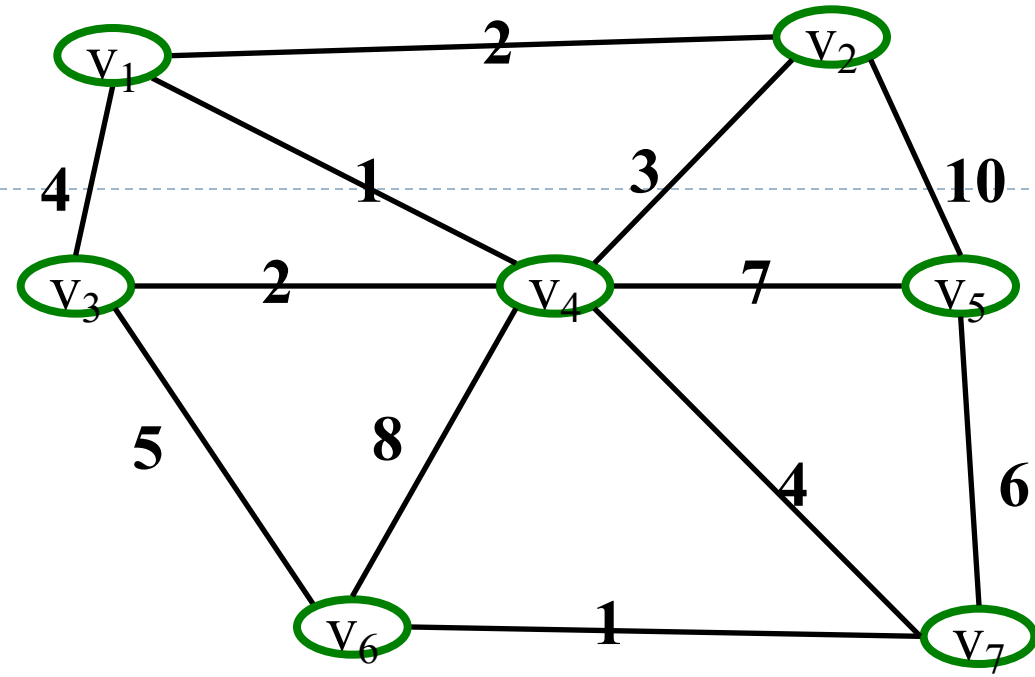
- Idea: Grow a **forest** out of edges that do not create a cycle. Pick an edge with the smallest weight.

$G=(V,E)$



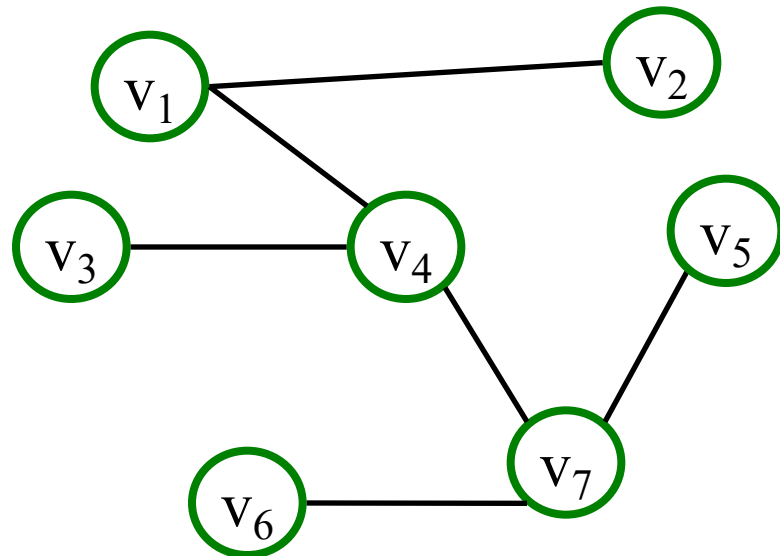
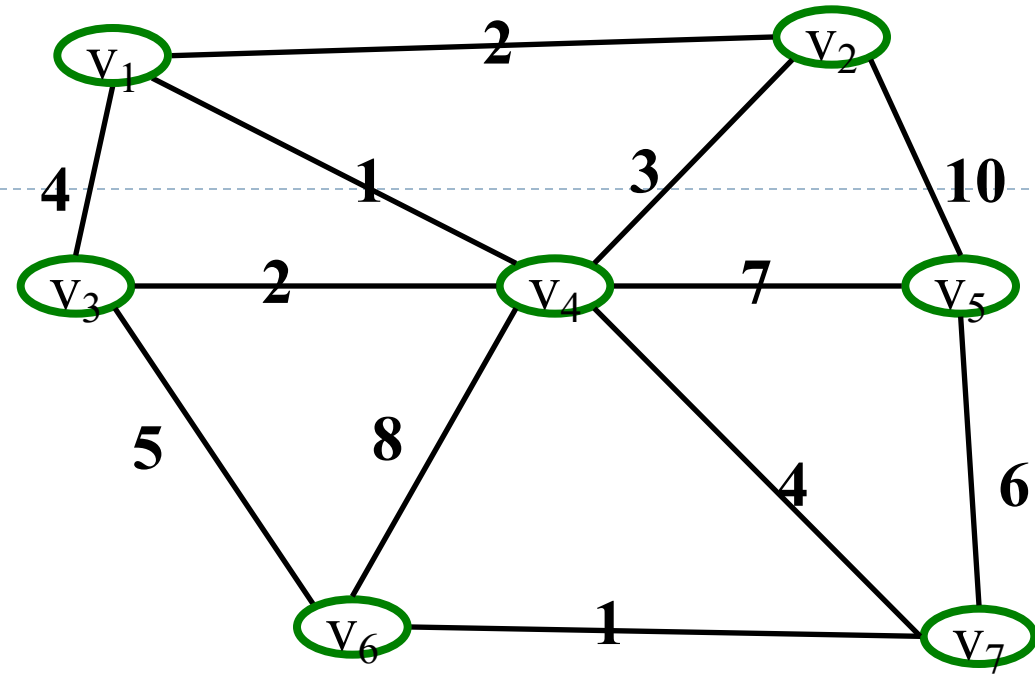
MST

---



MST

---



# Kruskal code

---

```
void Graph::kruskal() {
    int edgesAccepted = 0;
    DisjSet s(NUM_VERTICES);

    while (edgesAccepted < NUM_VERTICES - 1) {
        e = smallest weight edge not deleted yet;
        // edge e = (u, v)
        uset = s.find(u);
        vset = s.find(v);
        if (uset != vset) {
            edgesAccepted++;
            s.unionSets(uset, vset);
        }
    }
}
```

$|E|$  heap ops

$2|E|$  finds

$|V|$  unions

# Runtime of Kruskal's

---

- ▶ Every edge is placed on priority queue once and removed once
  - ▶  $\Theta(E * \log(E)) = \Theta(E * \log(V))$
- ▶ For each edge you do 2 set finds and one set union.
  - ▶ Let  $f(V)$  be time of find, and  $u(V)$  be time of union.
  - ▶  $\Theta(E * (2f(V) + u(V)))$
  - ▶ If find and union are linear time, then  $\Theta(E * (2V + V)) = \Theta(E * V) = O(V^3)$
- ▶ Overall:  $\Theta(E * \log(V) + E * V) = \Theta(E * V) = \mathbf{O(V^3)}$  //Assumes find and union linear time



# Strategy for Kruskal's

---

- ▶ EL = sorted set of edges ascending by weight
- ▶ Foreach edge  $e$  in EL
  - ▶  $T1$  = tree for  $\text{head}(e)$
  - ▶  $T2$  = tree for  $\text{tail}(e)$
  - ▶ If ( $T1 \neq T2$ )
    - ▶ add  $e$  to the output (the MST)
    - ▶ Combine trees  $T1$  and  $T2$
- ▶ Seems simple, no?
  - ▶ But, how do you keep track of what trees a node is in?
  - ▶ Trees are sets. Need to find  $\text{findset}(v)$  and “union” two sets

# Find-Union Data Structure

# Union/Find and Disjoint Sets

---

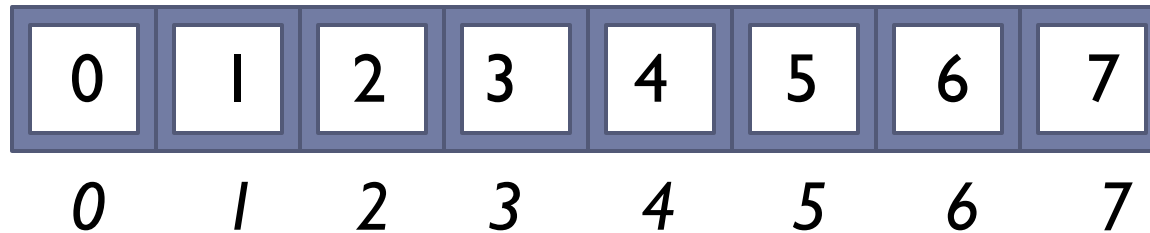
- ▶ Needs to support the following operations

- ▶ `void makeSet(int n)`      `//construct n independent sets`
- ▶ `int findSet(int i)`      `//given i, which set does i belong to?`
- ▶ `void union(int i, int j)`      `//merge sets containing i and j`

# Union/Find and Disjoint Sets

---

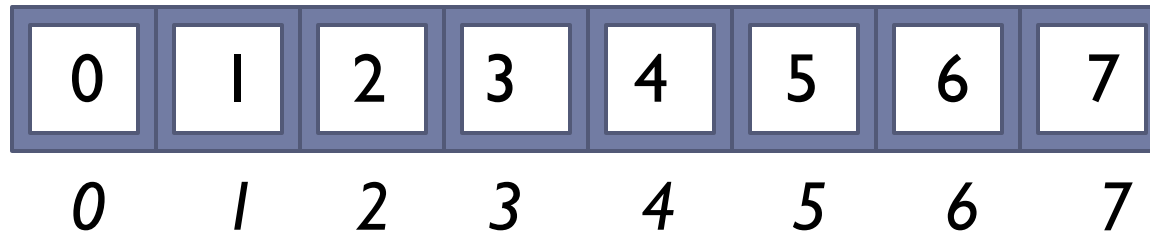
- ▶ Needs to support the following operations
  - ▶ `void makeSet(int n)`      `//construct n independent sets`
- ▶ Solution:
  - ▶ Store as array of size n. Each location stores label for that set.



# Union/Find and Disjoint Sets

---

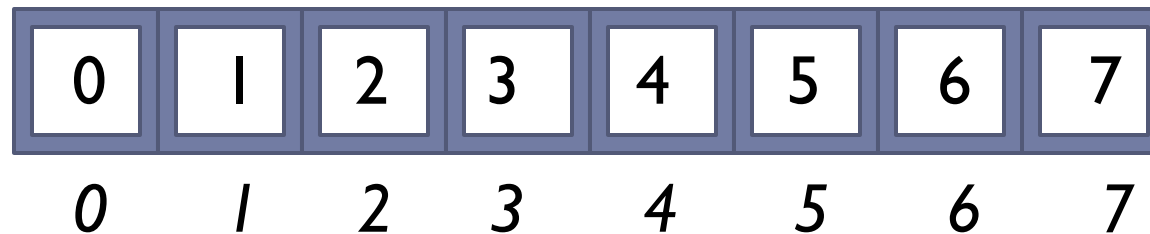
- ▶ Needs to support the following operations
  - ▶ `int findSet(int i)` //given i, which set does i belong to?
- ▶ Solution: Trace around array until we find place where index and contents match
  - ▶ Start at index i and repeat:
    - ▶ If `a[i] == i` then return i
    - ▶ Else set `i = a[i]`



# Union/Find and Disjoint Sets

---

- ▶ Needs to support the following operations
  - ▶ `void union(int i, int j)` //merge sets i and j
- ▶ Solution: find label for each set (call `find()` method), then set one label to point to other
  - ▶ `Label1 = find(i); Label2 = find(j)`
  - ▶ `a[Label1] = Label2` //OR `a[Label2] = Label1`

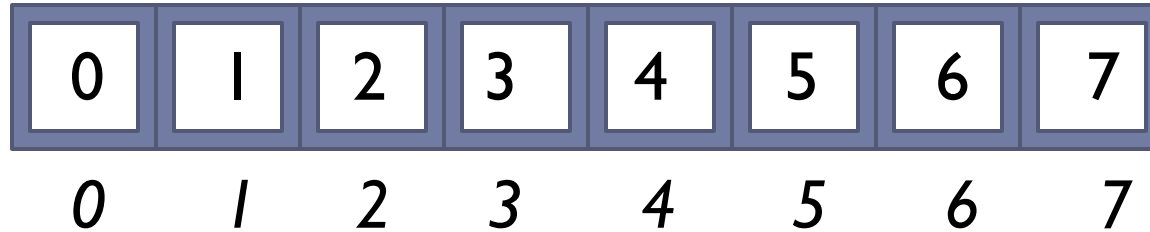


# Union/Find and Disjoint Sets

---

▶ **Example:**

- ▶ merge(4,5)
- ▶ merge(6,7)
- ▶ merge(1,2)
- ▶ merge(5,6)
- ▶ find(1); find(4); find(6)



# Union/Find and Disjoint Sets

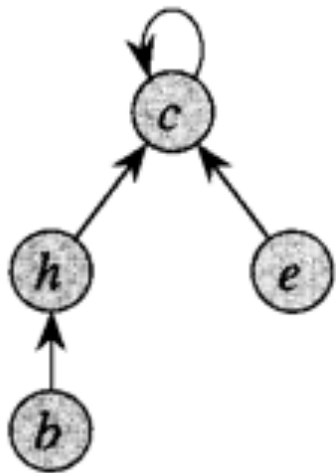
---

- ▶ Time-complexity if where  $n$  is size of array?
- ▶ `makeSet()`
  - ▶ Linear: just create array and fill it with values
- ▶ `find()`
  - ▶ Linear if have to trace a long way to get to label
  - ▶ Constant if lucky and label given as input
- ▶ `union()`
  - ▶ Constant to change the label BUT...
  - ▶ Could be linear to find the two labels first.

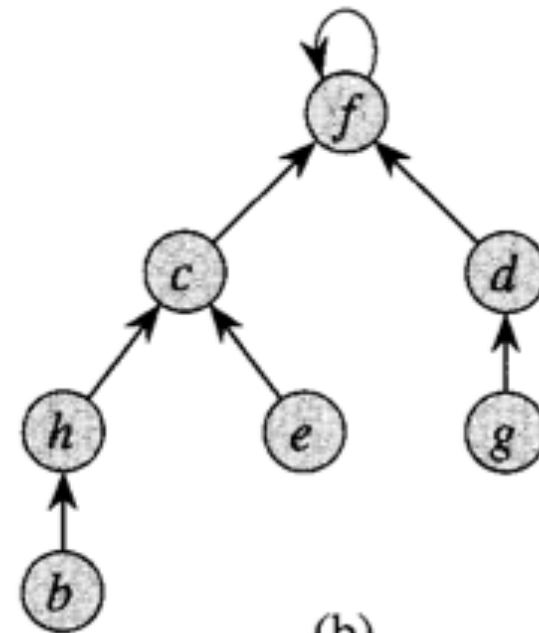


# Optimization 1: Union by rank

---



(a)



(b)

# Optimization 1: Union by rank

---

- Easy to implement!!

MAKE-SET( $x$ )

```
1   $x.p = x$   
2   $x.rank = 0$ 
```

UNION( $x, y$ )

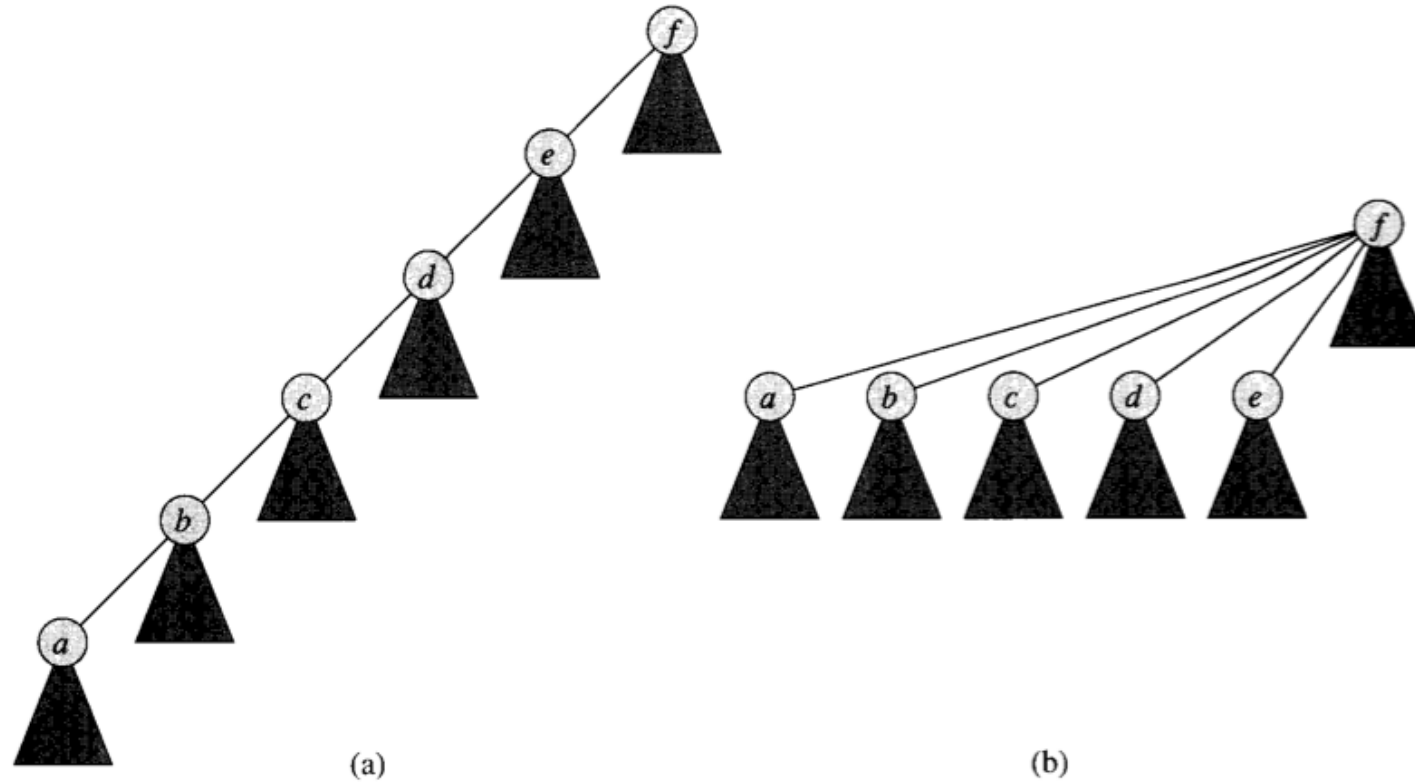
```
1  LINK(FIND-SET( $x$ ), FIND-SET( $y$ ))
```

LINK( $x, y$ )

```
1  if  $x.rank > y.rank$   
2       $y.p = x$   
3  else  $x.p = y$   
4      if  $x.rank == y.rank$   
5           $y.rank = y.rank + 1$ 
```

## Optimization 2: Path Compression

---



## Optimization 2: Path Compression

---

- ▶ Also easy to implement

FIND-SET( $x$ )

1   **if**  $x \neq x.p$

2          $x.p = \text{FIND-SET}(x.p)$

3   **return**  $x.p$

# Complexity for Kruskal's

---

- ▶ Union-by-rank and path compression yields  $m$  operations in  $\Theta(m * \alpha(n))$ 
  - ▶ where  $\alpha(n)$  a VERY slowly growing function. (See textbook for details)
  - ▶  $m$  is the number of times you run the operation. So constant time, for each operation
- ▶ So Kruskal's overall:
  - ▶  $\Theta(E * \log(V) + E * 1) = \Theta(E * \log(V))$  //now the heap is slowest part



# Summary

# What did we learn?

---

- ▶ **Minimum Spanning Trees**
  - ▶ Review!
- ▶ **Kruskal's Algorithm**
  - ▶ Review again!
- ▶ **Find-union**
  - ▶ How to implement
  - ▶ How to optimize
  - ▶ How it affects runtime of Kruskal's algorithm.