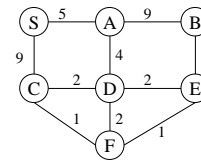


## More Graph Algorithms: Minimum Spanning Trees

CS211  
Fall 2000

## Dijkstra's Algorithm

- Intuition
  - Edges are threads; vertices are beads
  - Pick up at  $s$ ; mark each node as it leaves the table
- Note: Negative edge-costs are *not allowed*



- $s$  is the start vertex
- $c(i,j)$  is the cost from  $i$  to  $j$
- Initially, vertices are unmarked
- $\text{dist}[v]$  is length of  $s$ -to- $v$  path
- Initially,  $\text{dist}[v] = \infty$ , for all  $v$

```

dijkstra(s):
  dist[s] = 0;
  while (some vertices are unmarked) {
    v = unmarked vertex with
      smallest dist;
    Mark v; // v leaves "table"
    for (each w adj to v) {
      dist[w] = min
        [ dist[w], dist[v] + c(v,w) ];
    }
  }
    
```

2

## Greedy Algorithms

- Dijkstra's Algorithm is an example of a Greedy Algorithm
- The Greedy Strategy is an algorithm design technique
  - Like Divide & Conquer
- The Greedy Strategy is used to solve optimization problems
  - The goal is to find the *best* solution
- Works when the problem has the *greedy-choice property*
  - A global optimum can be reached by making locally optimum choices
- Problem: Given an amount of money, find the smallest number of coins to make that amount
- Solution: Use a Greedy Algorithm
  - Give as many large coins as you can
- This greedy strategy produces the optimum number of coins for the US coin system
- Different money system  $\Rightarrow$  greedy strategy may fail
  - For example: suppose the US introduces a 4¢ coin

3

## Minimum Spanning Trees

### Definition

A *spanning tree* of an undirected graph  $G$  is a *tree* whose nodes are the vertices of  $G$  and whose edges are a subset of the edges of  $G$

- Alternately, an MST can be defined as the least-cost set of edges so that all the vertices are connected
  - This has to be a tree... Why?

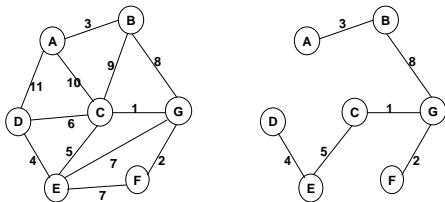
### Definition

A *Minimum Spanning Tree (MST)* for a weighted graph  $G$  is the spanning tree of least cost (sum of edge-weights)

- A greedy strategy works for this problem
  - Add vertices one at a time
  - Always add the one that is closest to the current tree
  - This is called Prim's Algorithm

4

## An Example Graph and Its MST



5

## Prim's Algorithm

- $s$  is the start vertex
- $c(i,j)$  is the cost from  $i$  to  $j$
- Initially, vertices are unmarked
- $\text{dist}[v]$  is length of smallest tree-to- $v$  edge
- Initially,  $\text{dist}[v] = \infty$ , for all  $v$

```

prim(s):
  dist[s] = 0;
  while (some vertices are unmarked) {
    v = unmarked vertex with
      smallest dist;
    Mark v;
    for (each w adj to v) {
      dist[w] = min[ dist[w], c(v,w) ];
    }
  }
    
```

- Runtime analysis
  - $O(v^2)$  for adj matrix
    - While-loop is executed  $v$  times
    - For-loop takes  $O(v)$  time
  - $O(e + v \log v)$  for adj list
    - Use a PQ
    - Regular PQ produces time  $O(v + e \log e)$
    - Can improve to  $O(e + v \log v)$  by using fancier heap

6

## Similar Code Structures

```
while (some vertices are unmarked) {
  v = best of unmarked vertices;
  Mark v;
  for (each w adj to v)
    Update w;
}
```

- bfsDistance
  - best: next in queue
  - update:  $\text{dist}[w] = \text{dist}[v] + 1$
- dijkstra
  - best: next in PQ
  - update:  $\text{dist}[w] = \min [\text{dist}[w], \text{dist}[v] + \text{cost}(v,w)]$
- prim
  - best: next in PQ
  - update:  $\text{dist}[w] = \min [\text{dist}[w], \text{cost}(v,w)]$

7

## Remembering Your Choices

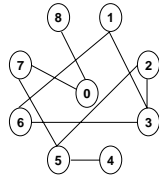
```
while (some vertices are unmarked) {
  v = best of unmarked vertices;
  Mark v;
  for (each w adj to v)
    Update w;
    if (w changed) parent[w] = v;
}
```

- How can you remember which choices were made?
  - Whenever  $\text{dist}[w]$  is updated we can remember the current  $v$  by using  $\text{parent}[w] = v$ ;
  - Can use the parent info to construct the *bfs tree*, the *shortest path tree*, or the *minimum spanning tree*

8

## New Problem: Connectivity

- Given a set of integer pairs  $(p,q)$ , determine if  $p'$  and  $q'$  are connected
- Example:
  - Given pairs (1,3) (2,3) (5,4) (6,3) (7,5) (1,6) (7,0) (0,8) (5,2)
  - Are 4 and 6 connected?
- How can a computer resolve this for a large set?



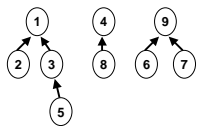
9

## Union and Find

- We break this problem into two operations
  - Union: Combine two sets
  - Find: Given an item, determine the "name" of the set that contains it
- Many applications
  - Checking components of a dynamic graph
  - Computers in a network: Can  $p$  communicate with  $q$ ?
  - Minimum Spanning Trees

10

## Union/Find using Reverse Trees



The root is the "name" of the set

- Find
  - Follow links to root
  - Time  $O(n)$  in the worst case
- Union
  - Link root of one tree to the root of the other
  - Time  $O(1)$  in the worst case

11

## An Improvement: Union by Size

- Note: Every union takes one tree and moves everything in it one step farther from the root
- Implement using arrays
  - Initially, all items have no parent and size 1
- Idea: Make the *smaller* tree be the one that moves down
- Can show
  - Time for union is  $O(1)$
  - Time for find is  $O(\log n)$

	parent	size
0		
1		
2		
⋮		
⋮		
⋮		
⋮		
⋮		
n		

12

## Union-by-Size Lemma

### Lemma

A tree with height  $h$  contains at least  $2^h$  nodes

### Proof

- The only way in which a node can change its level is when it is within the *smaller* of two trees participating in a union
- Thus, when any node  $x$  drops a level, the tree that it is within doubles in size (or more)

- If a node is at level  $h$  then it is within a tree of size at least  $2^h$

### Corollary

Worst-case time for find is  $O(\log n)$  where  $n$  is the total number of items

### Proof

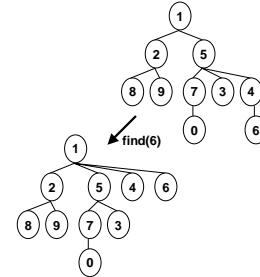
- The largest possible tree contains  $n$  nodes, so the deepest node is at level  $\log n$

13

## Union-by-Size + Path Compression

- Idea: Every time we "find" something, we update every item we touch so that it points at the root

- This is *almost* free since we have to touch these items anyway
- Intuition: next time we find one of these items it will be quicker



- Does this help?

14

## Yes, It Helps

### Theorem (Tarjan)

Using weighted union and path compression, a sequence of  $n$  union/find operations takes time  $O(n \alpha(n))$

- The function  $\alpha(n)$  is the inverse of Ackerman's function and it grows *very* slowly

### Definition (Ackerman's function)

$$A(p,q) = \begin{cases} 2q & \text{if } p = 0 \\ 0 & \text{if } q = 0, p > 0 \\ 2 & \text{if } q = 1, p > 0 \\ A(p-1, A(p, q-1)) & \text{if } q > 1, p > 0 \end{cases}$$

This definition is a bit different from the text's version, but both have similar properties

15

## Ackerman's Function

$$\blacksquare A(0,q) = 2 + \dots + 2 = 2q$$

$$\blacksquare \text{Thus } A(2,4) = 2^{16} = 65,536$$

$$\blacksquare A(1,q) = 2 * \dots * 2 = 2^q$$

■ Each level does the operation from the previous level  $q$  times

$$\blacksquare A(2,q) = \underbrace{2^{2^{\dots^2}}}_q \text{ (a height-} q \text{-stack of 2's)}$$

■ What is  $A(3,4)$ ?

■ So  $A(4,4)$  must be *extremely* large

16

## Definition for $\alpha(n)$

### Definition (inverse Ackerman's function)

$\alpha(n) =$  least  $x$  such that  $A(x,x) \geq n$

Note that  $\alpha(n) \leq 4$  for any integer  $n$  that we are *ever* likely to encounter

- Is the  $\alpha(n)$  factor really necessary?

- Yes: Tarjan showed a *lower* bound of  $\Omega(n \alpha(n))$  for union/find
- Claim: the inverse Ackerman's function is not just an artifact of this one problem

17