

CSE 332:
Disjoint Set Union/Find
(part 2)

Richard Anderson, Steve Seitz
Winter 2014

Data structure for disjoint sets?

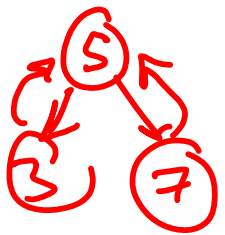
- Represent: $\{3, \underline{5}, 7\}$, $\{4, 2, \underline{8}\}$, $\{\underline{9}\}$, $\{\underline{1}, 6\}$
- Support: find(x), union(x,y)

bunch of ^{balanced} trees: find $O(\log n)$ union $O(n \log n)$

hash values \rightarrow trees find $O(1)$ union $O(n)$

hashtable value \rightarrow set id

(find $O(1)$
 \rightarrow + array maps id \rightarrow list
union $O(n)$)



Union/Find Trade-off

- Known result:
 - Find and Union cannot *both* be done in worst-case $O(1)$ time with any data structure.
- We will instead aim for good *amortized* complexity.
- For m operations on n elements:
 - Target complexity: $O(m)$ *i.e.* $O(1)$ amortized

Tree-based Approach

Each set is a tree

- Root of each tree is the set name.

$\{3, 5, 7\}$

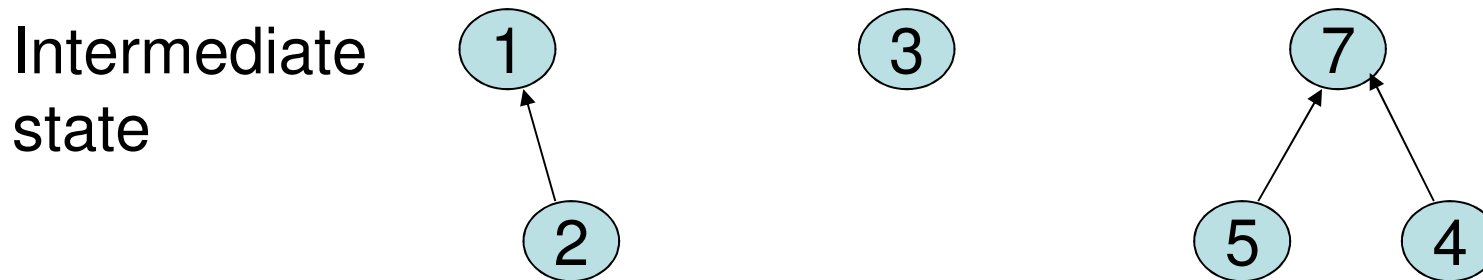


- Allow large fanout (why?)

Up-Tree for DS Union/Find

Observation: we will only traverse these trees upward from any given node to find the root.

Idea: *reverse* the pointers (make them point up from child to parent). The result is an **up-tree**.



Roots are the names of each set.

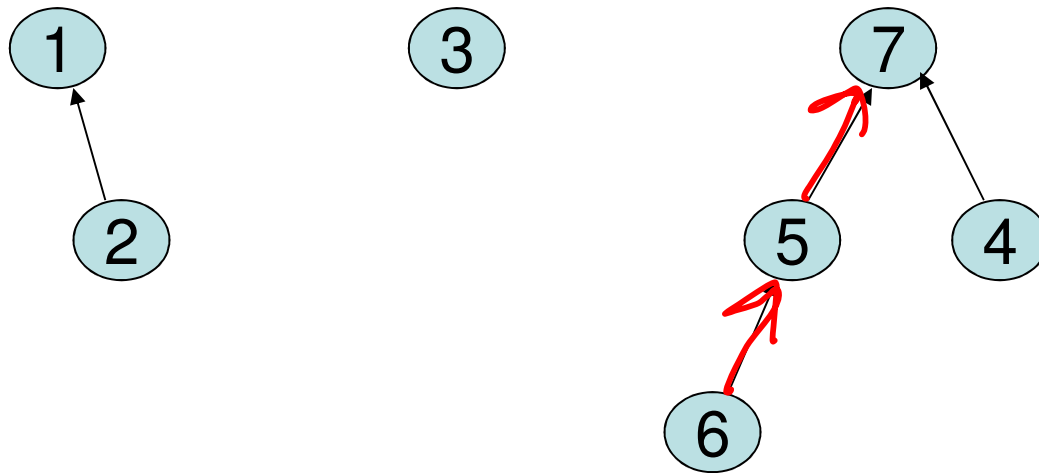


Find Operation

Find(x) follow x to the root and return the root.

"forest" of trees

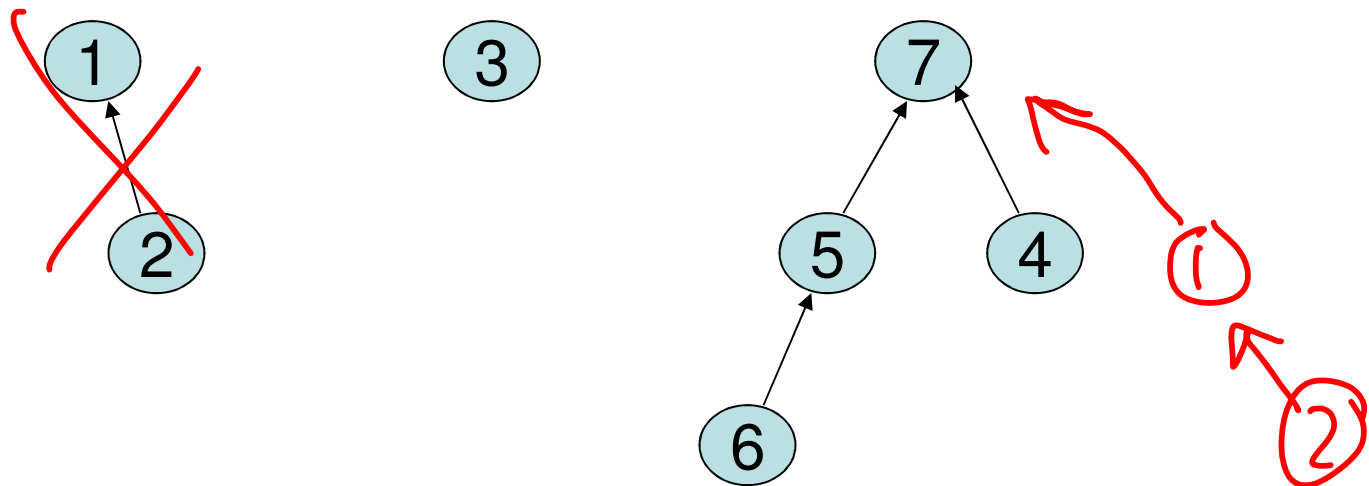
$\text{find}(6) = 7$



Union Operation

Union(i, j) - assuming i and j roots, point i to j .

union(1, 7)

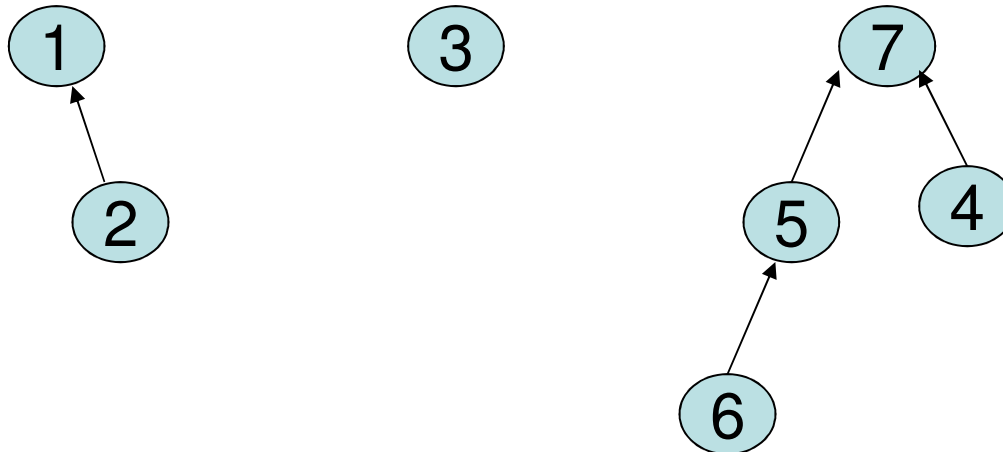


Simple Implementation

- Array of indices

	1	2	3	4	5	6	7
up	-1	1	-1	7	7	5	-1

up[x] = -1 means
x is a root.



Implementation

```
void Union(int x, int y) {  
    assert(up[x]<0 && up[y]<0);  
    up[x] = y;  
}
```

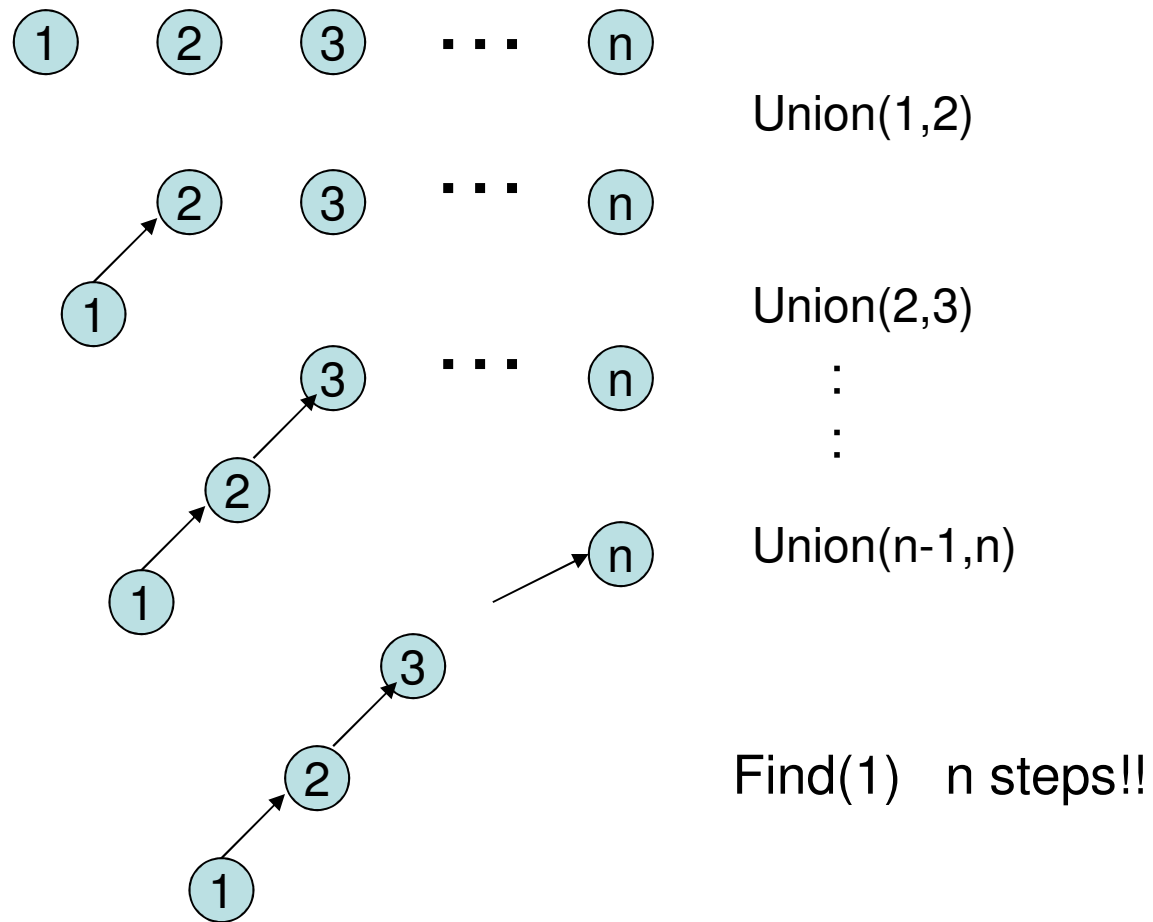
```
int Find(int x) {  
    while(up[x] >= 0) {  
        x = up[x];  
    }  
    return x;  
}
```

runtime for Union: $O(1)$

runtime for Find: $O(n)$

Amortized complexity is no better.

A Bad Case



after find: make found node point to root
union \rightarrow point to top
make shorter tree point to taller root

Two Big Improvements

Can we do better? *Yes!*

1. Union-by-size

- Improve **Union** so that *Find* only takes worst case time of $\Theta(\log n)$.

2. Path compression

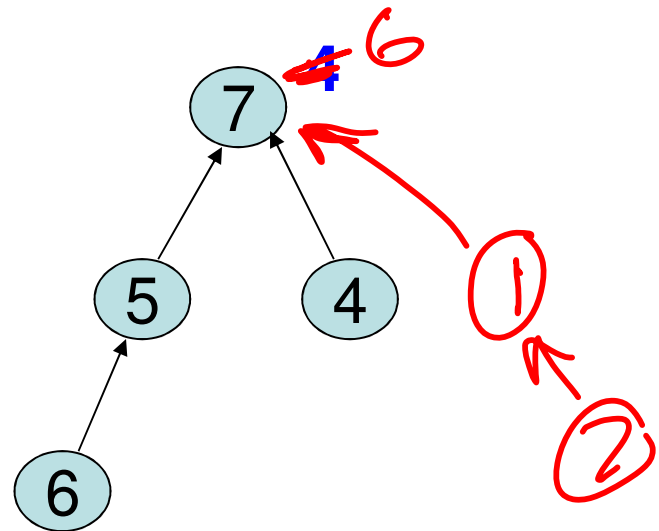
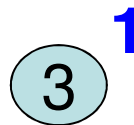
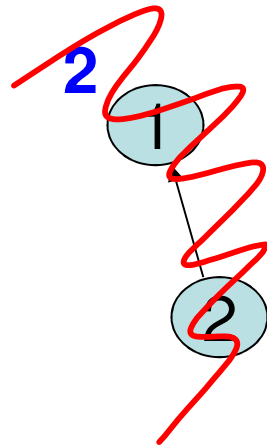
- Improve **Find** so that, with Union-by-size, **Find** takes amortized time of almost $\Theta(1)$.

Union-by-Size

Union-by-size

- Always point the smaller tree to the root of the larger tree

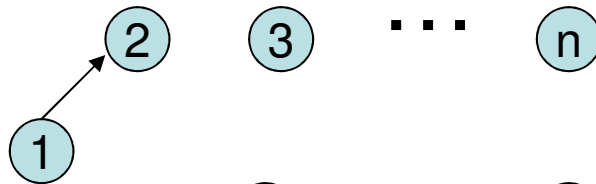
S-Union(7,1)



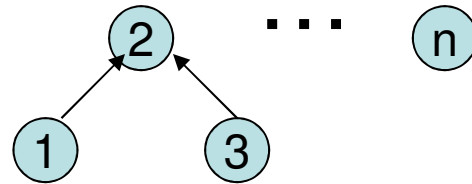
Example Again



S-Union(1,2)

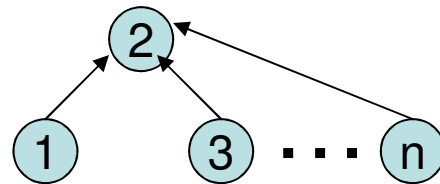


S-Union(2,3)



⋮

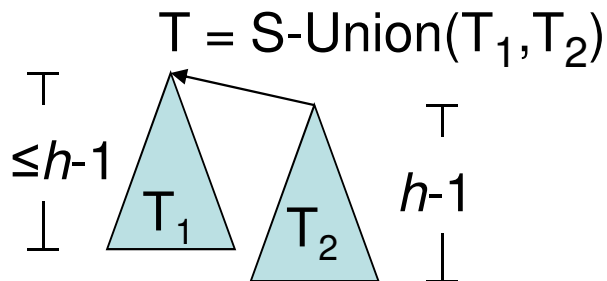
S-Union(n-1,n)



Find(1) constant time

Analysis of Union-by-Size

- Theorem: With union-by-size an up-tree of height h has size at least 2^h .
- Proof by induction
 - Base case: $h = 0$. The up-tree has one node, $2^0 = 1$
 - Inductive hypothesis: Assume true for $h-1$
 - Observation: tree gets taller only as a result of a union.



$$\begin{aligned} S(T) &= S(T_1) + S(T_2) \\ &\geq 2^{h-1} + 2^{h-1} \\ &= 2^h \end{aligned}$$

Analysis of Union-by-Size

- What is worst case complexity of Find(x) in an up-tree forest of n nodes?

worst: all nodes in one tall tree of height h

$$\text{Thm: } n \geq 2^h$$

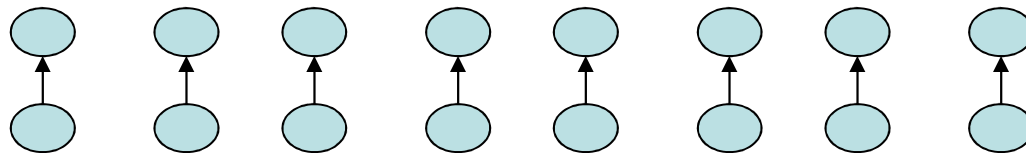
$$\Rightarrow \log_2 n \geq h$$

$$\text{Find } O(\log n)$$

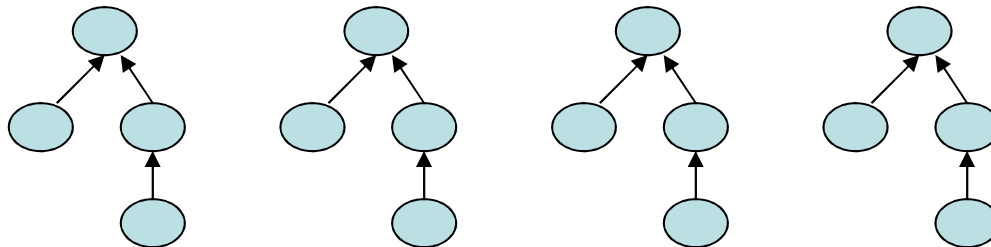
- (Amortized complexity is no better.)

Worst Case for Union-by-Size

$n/2$ Unions-by-size

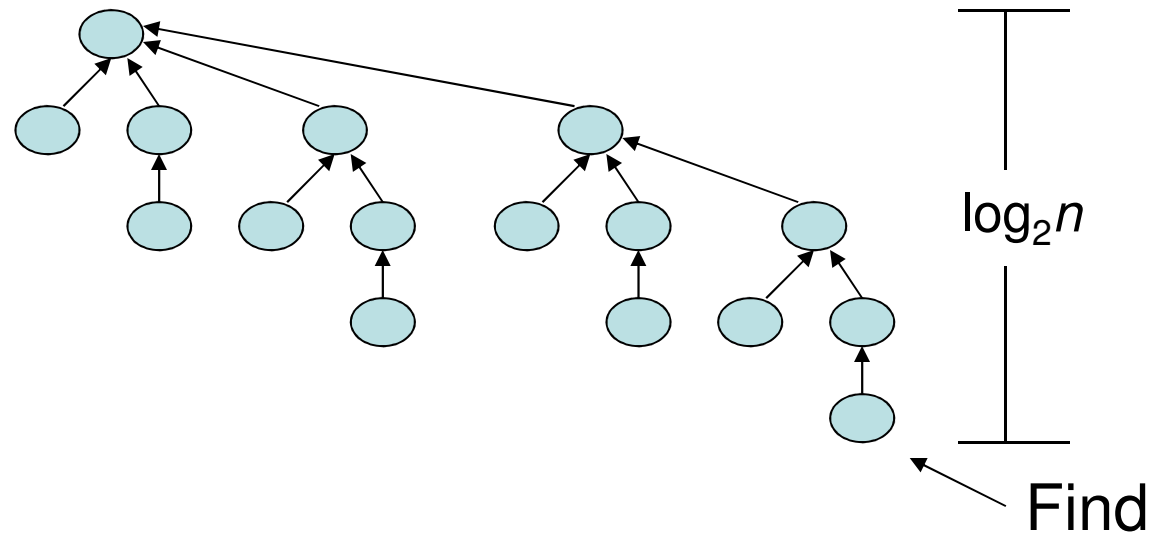


$n/4$ Unions-by-size



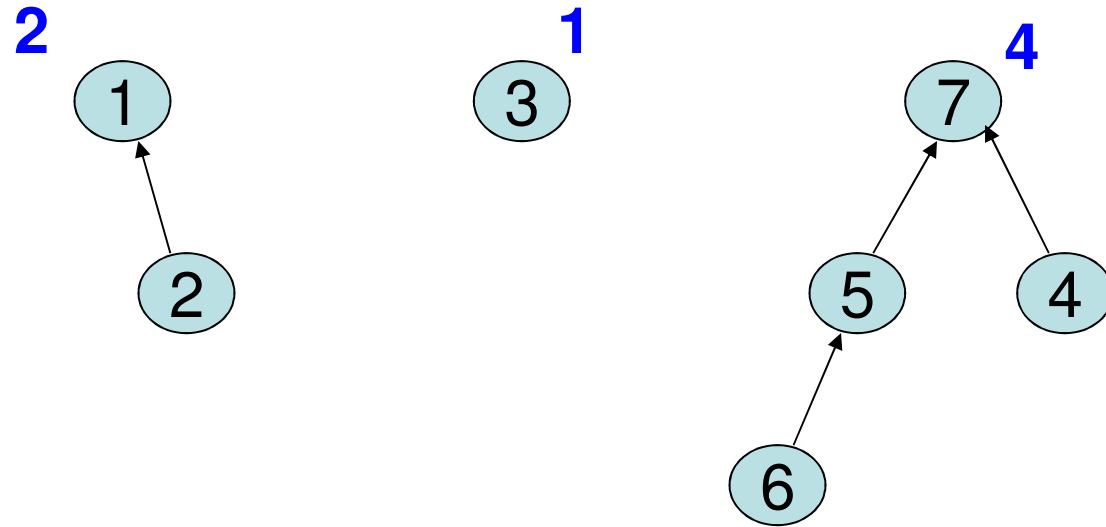
Example of Worst Cast (cont')

After $n - 1 = n/2 + n/4 + \dots + 1$ Unions-by-size



If there are $n = 2^k$ nodes then the longest path from leaf to root has length k .

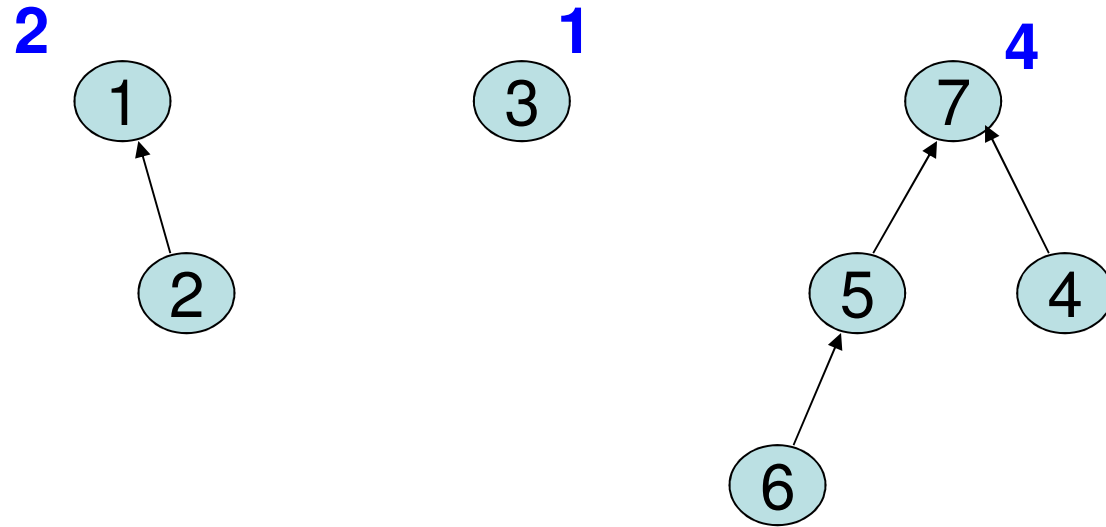
Array Implementation



Can store separate size array:

	1	2	3	4	5	6	7
up	-1	1	-1	7	7	5	-1
size	2		1				4

Elegant Array Implementation



Better, store sizes in the up array:

	1	2	3	4	5	6	7
up	-2	1	-1	7	7	5	-4

Negative up-values correspond to sizes of roots.

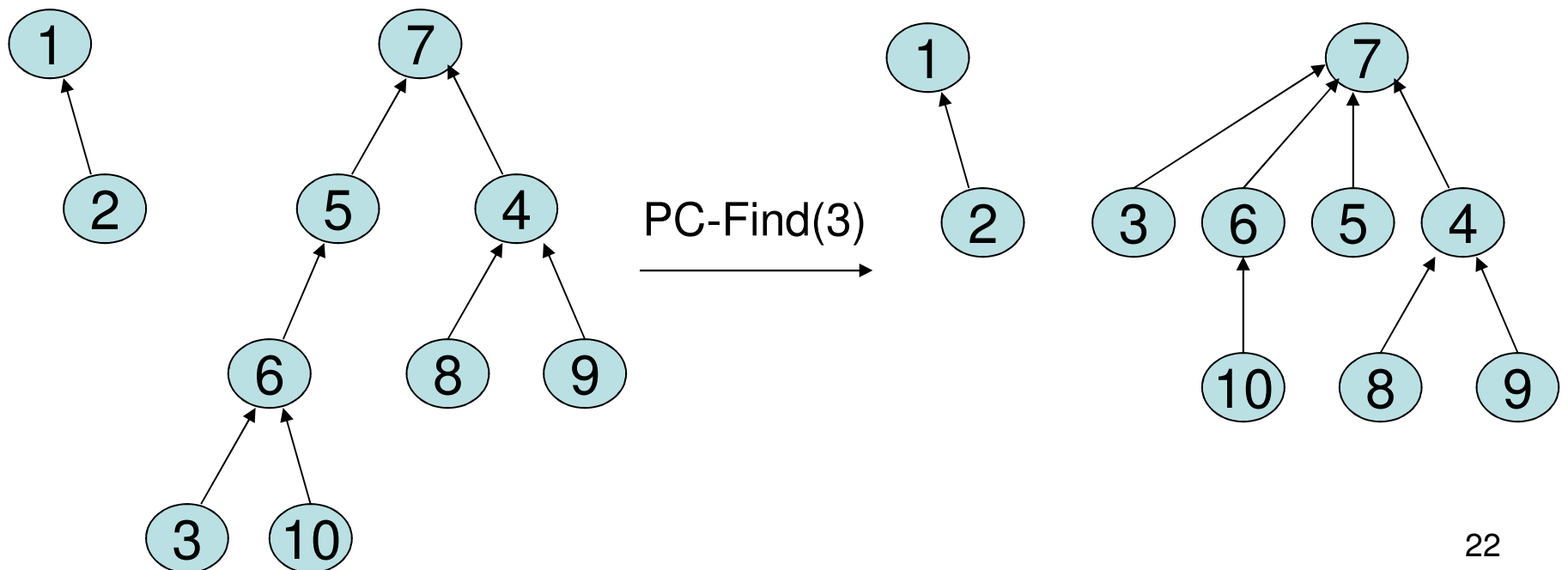
Code for Union-by-Size

```
S-Union(i, j) {
    // Collect sizes
    si = -up[i];
    sj = -up[j];

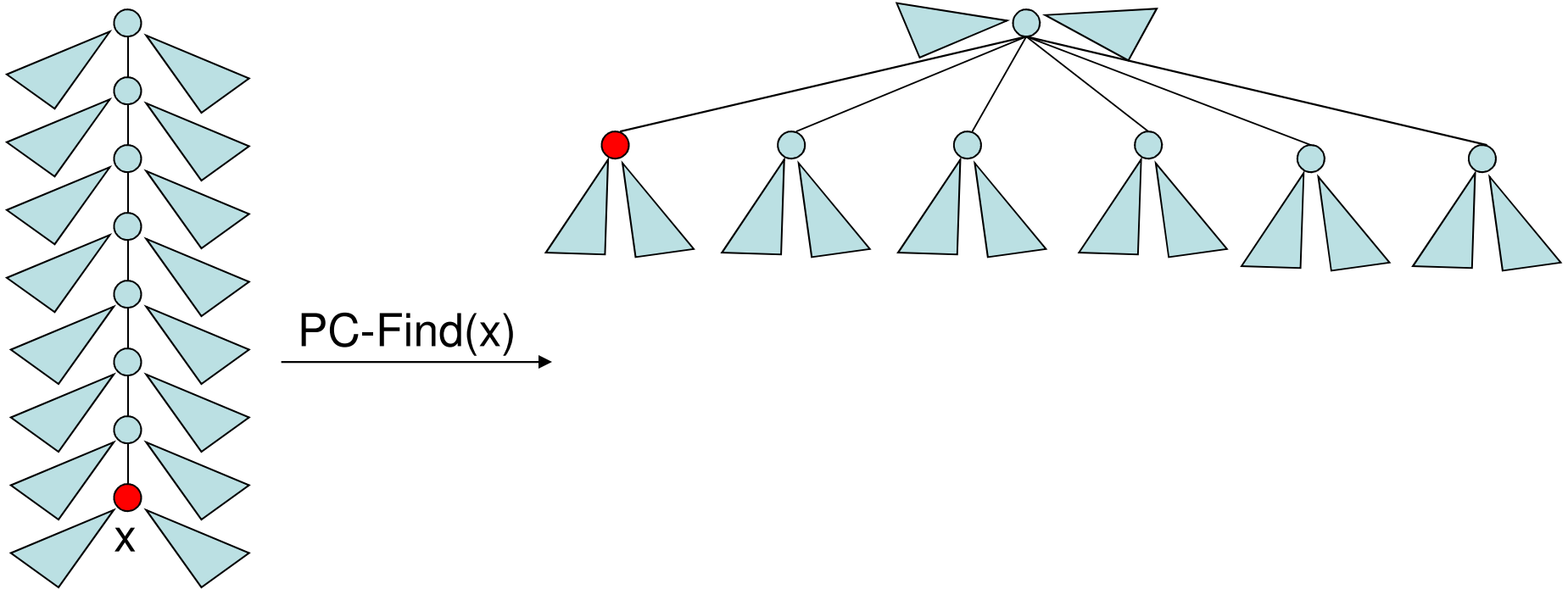
    // verify i and j are roots
    assert(si >=0 && sj >=0)
    // point smaller sized tree to
    // root of larger, update size
    if (si < sj) {
        up[i] = j;
        up[j] = -(si + sj);
    }
    else {
        up[j] = i;
        up[i] = -(si + sj);
    }
}
```

Path Compression

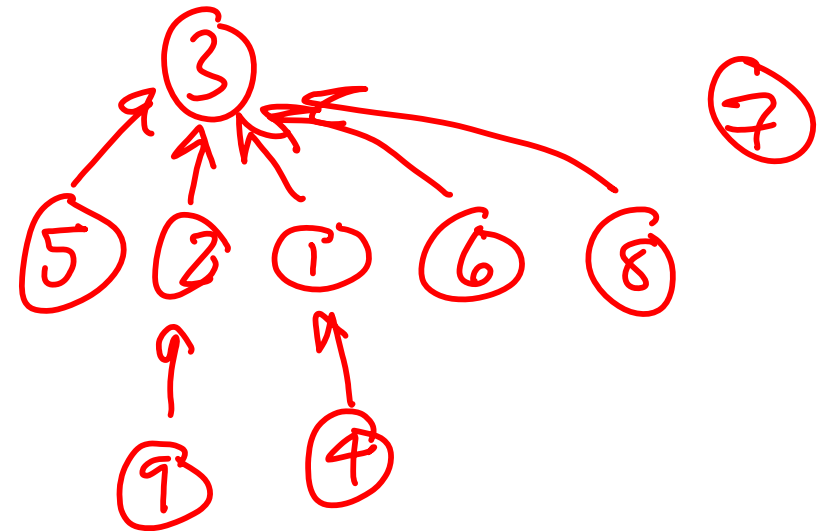
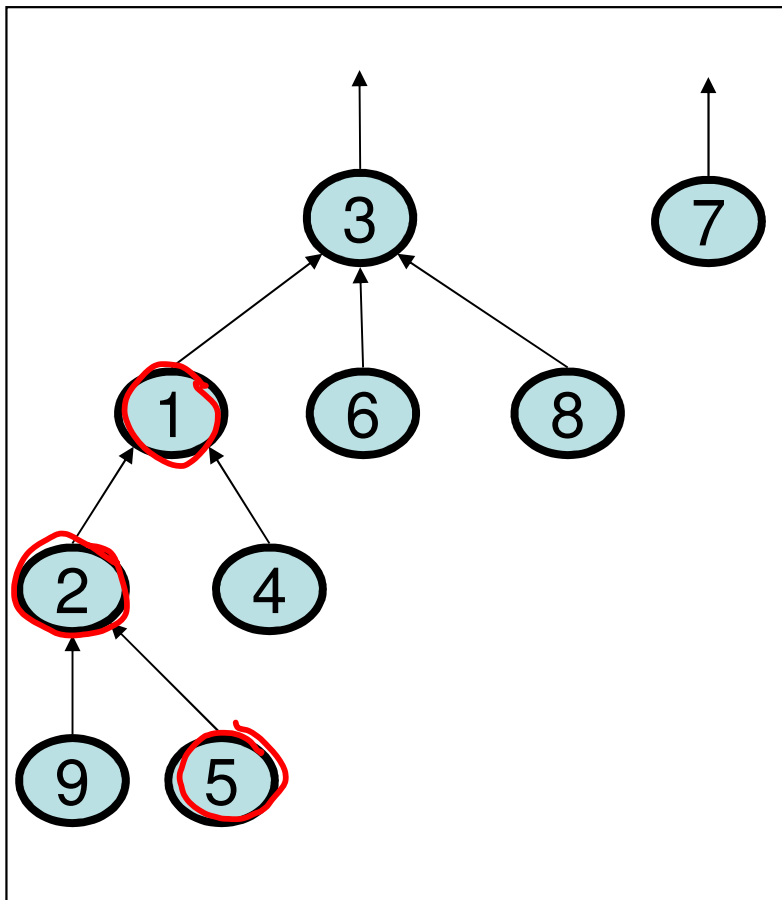
- To improve (amortized) complexity:
 - when going up the tree, *improve nodes on the path!*
- On a Find operation point all the nodes on the search path directly to the root. This is called “path compression.”



Self-Adjustment Works



Draw the result of Find(5):



Code for Path Compression Find

```
PC-Find(i) {
    //find root
    j = i;
    while (up[j] >= 0) {
        j = up[j];
    }
    root = j;

    //compress path
    if (i != root) {
        parent = up[i];
        while (parent != root) {
            up[i] = root;
            i = parent;
            parent = up[parent];
        }
    }
    return (root)
}
```

Complexity of Union-by-Size + Path Compression

- Worst case time complexity for...
 - ...a single Union-by-size is: $O(i)$
 - ...a single PC-Find is: $O(\log n)$
- Time complexity for $m \geq n$ operations on n elements has been shown to be $O(m \log^* n)$.
[See Weiss for proof.]
 - Amortized complexity is then $O(\log^* n)$
 - What is \log^* ?

$\log^* n$

**$\log^* n$ = number of times you need to apply
log to bring value down to at most 1**

$$\log^* 2 = 1$$

$$\log^* 4 = \log^* 2^2 = 2$$

$$\log^* 16 = \log^* 2^{2^2} = 3 \quad (\log \log \log 16 = 1)$$

$$\log^* 65536 = \log^* 2^{2^{2^2}} = 4 \quad (\log \log \log \log 65536 = 1)$$

$$\log^* 2^{65536} = \dots \approx \log^* (2 \times 10^{19,728}) = 5$$

$\log^* n \leq 5$ for all reasonable n .

The Tight Bound

In fact, Tarjan showed the time complexity for $m \geq n$ operations on n elements is:

$$\Theta(m \alpha(m, n))$$

Amortized complexity is then $\Theta(\alpha(m, n))$.

What is $\alpha(m, n)$?

- Inverse of Ackermann's function.
- For reasonable values of m, n , grows even slower than $\log^* n$. So, it's even "more constant."

Proof is beyond scope of this class. A simple algorithm can lead to incredibly hardcore analysis!