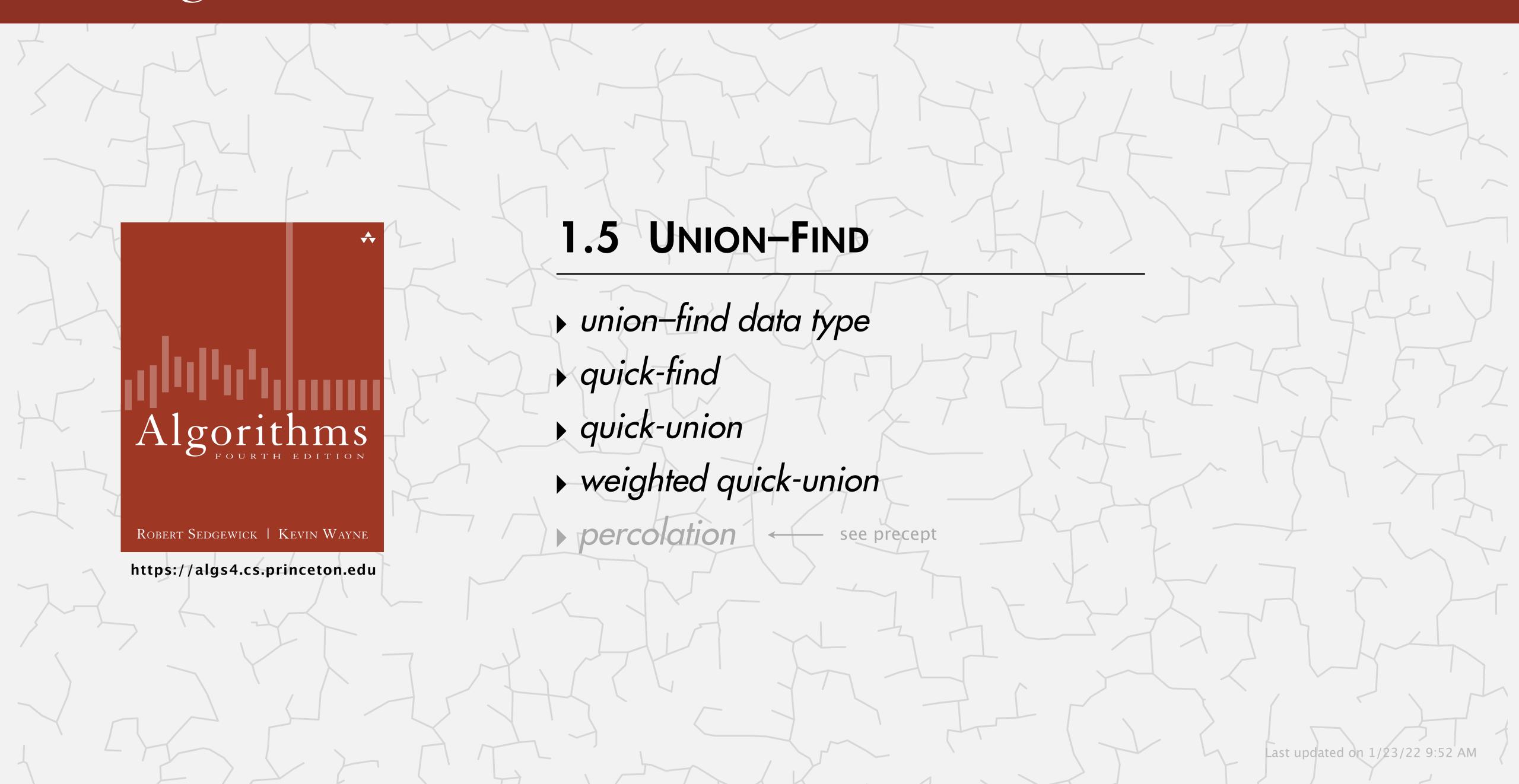
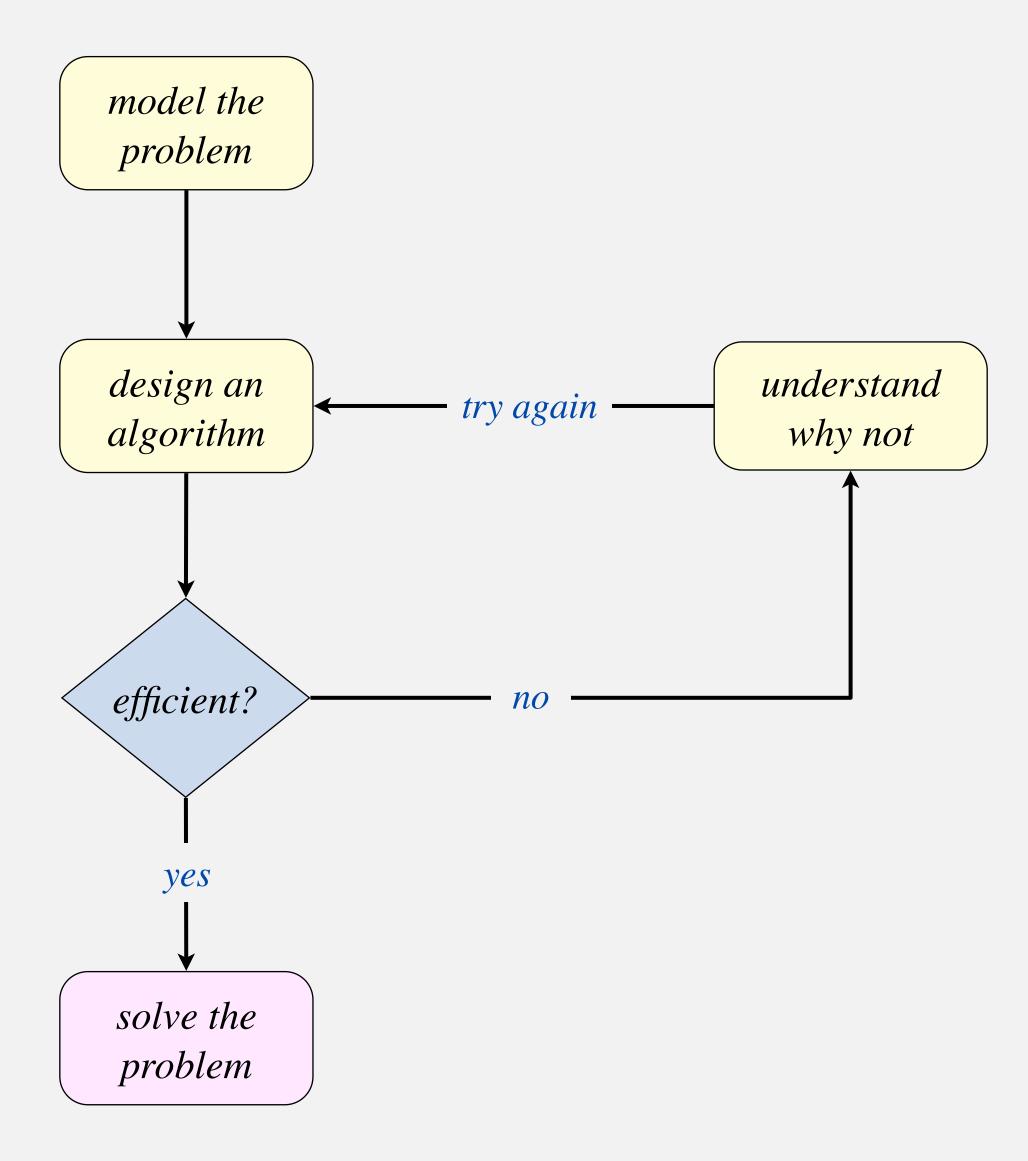
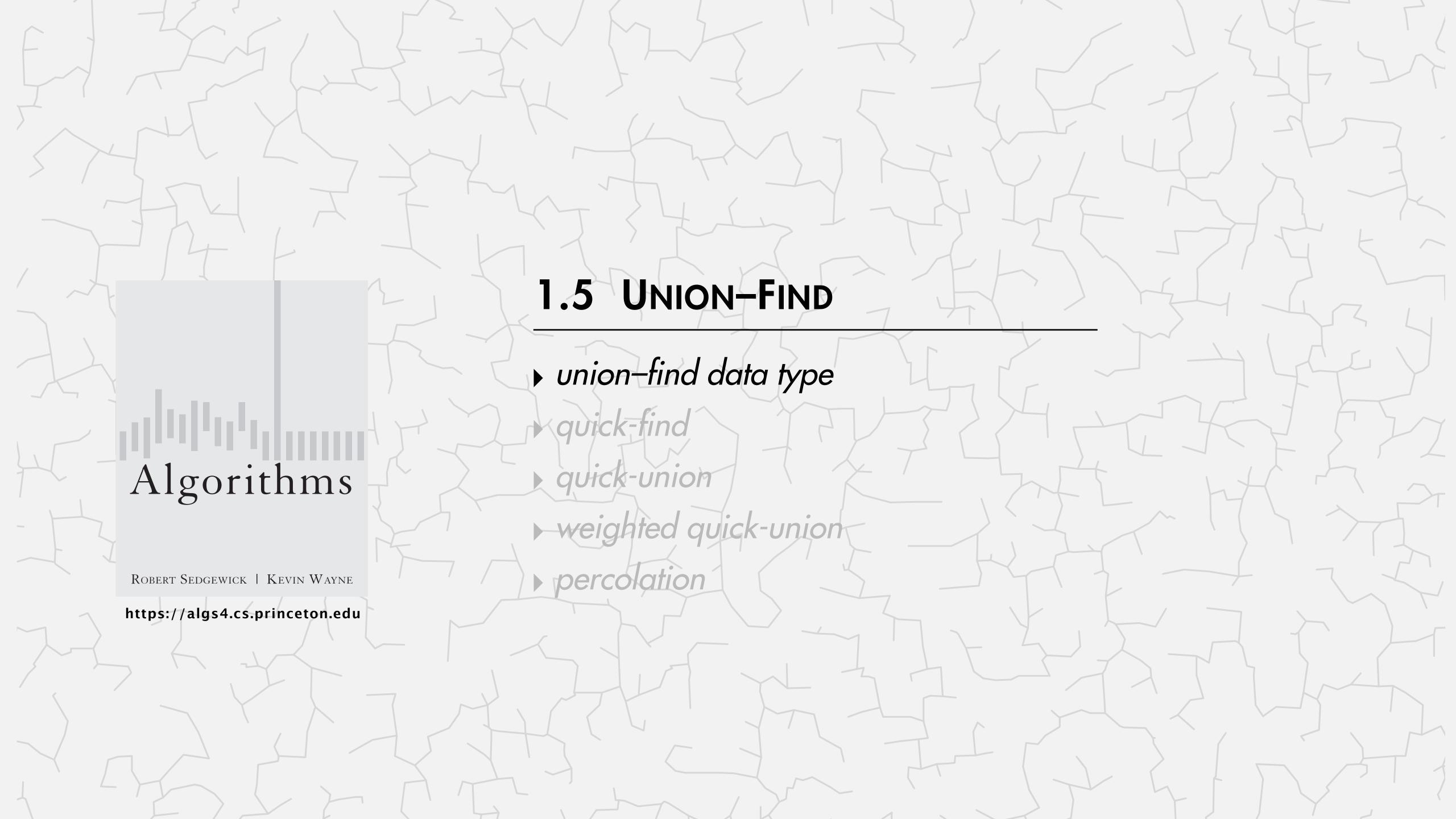
# Algorithms



# Subtext of today's lecture (and this course)

Steps to develop a usable algorithm to solve a computational problem.





## Union-find data type

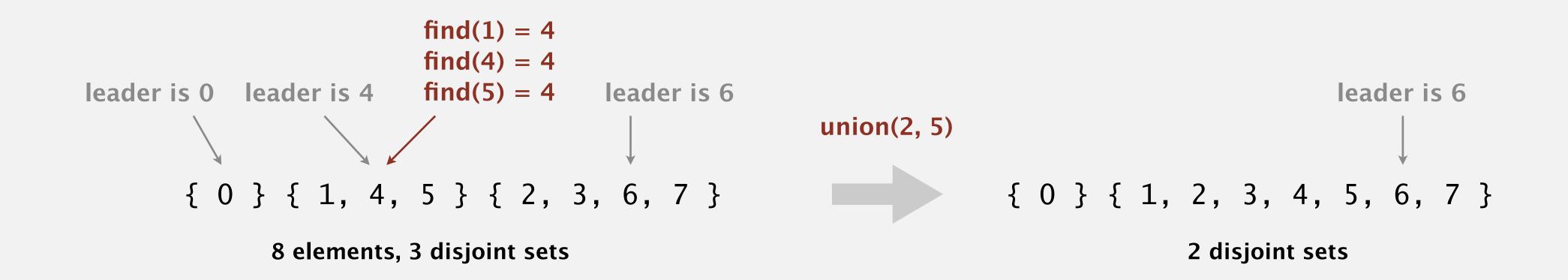
Disjoint sets. A collection of sets containing n elements, with each element in exactly one set.

Leader. Each set designates one of its elements as leader to uniquely identify the set.

no restriction on which element (but leader of set can't change unless the set changes)

Find. Return the leader of the set containing element p.  $\leftarrow$  typical use case: are two elements in the same set?

Union. Merge the set containing element p with the set containing element q.



# Union-find data type: API

Goal. Design an efficient union-find data type.

- Number of elements *n* can be huge.
- Number of operations *m* can be huge.
- The union() and find() operations can be intermixed.

```
public class UF

UF(int n)

initialize with n singleton sets (0 to n - 1)

void union(int p, int q)

merge sets containing elements p and q

int find(int p)

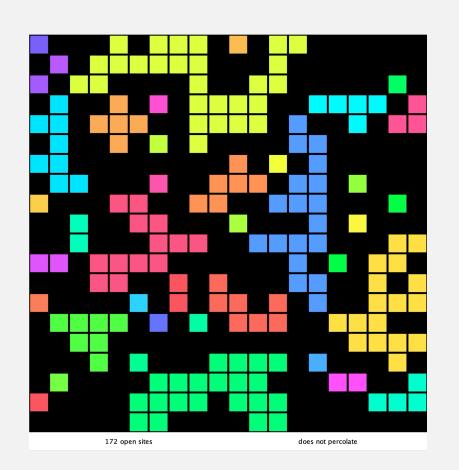
return the leader of set containing element p
```

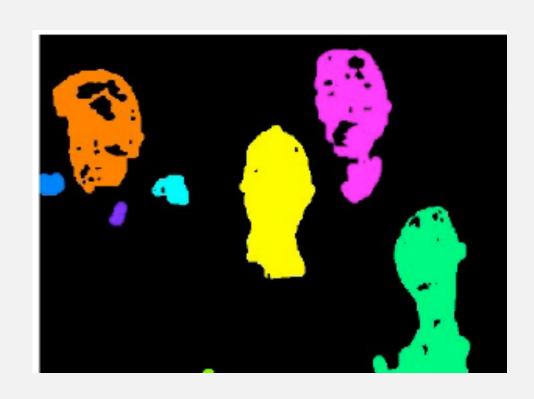
Simplifying assumption. The n elements are named 0, 1, ..., n-1.

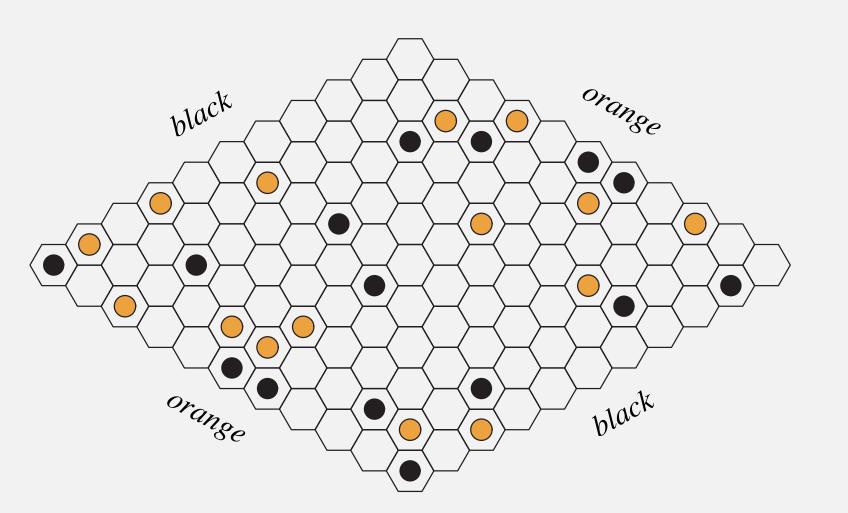
### Union-find data type: applications

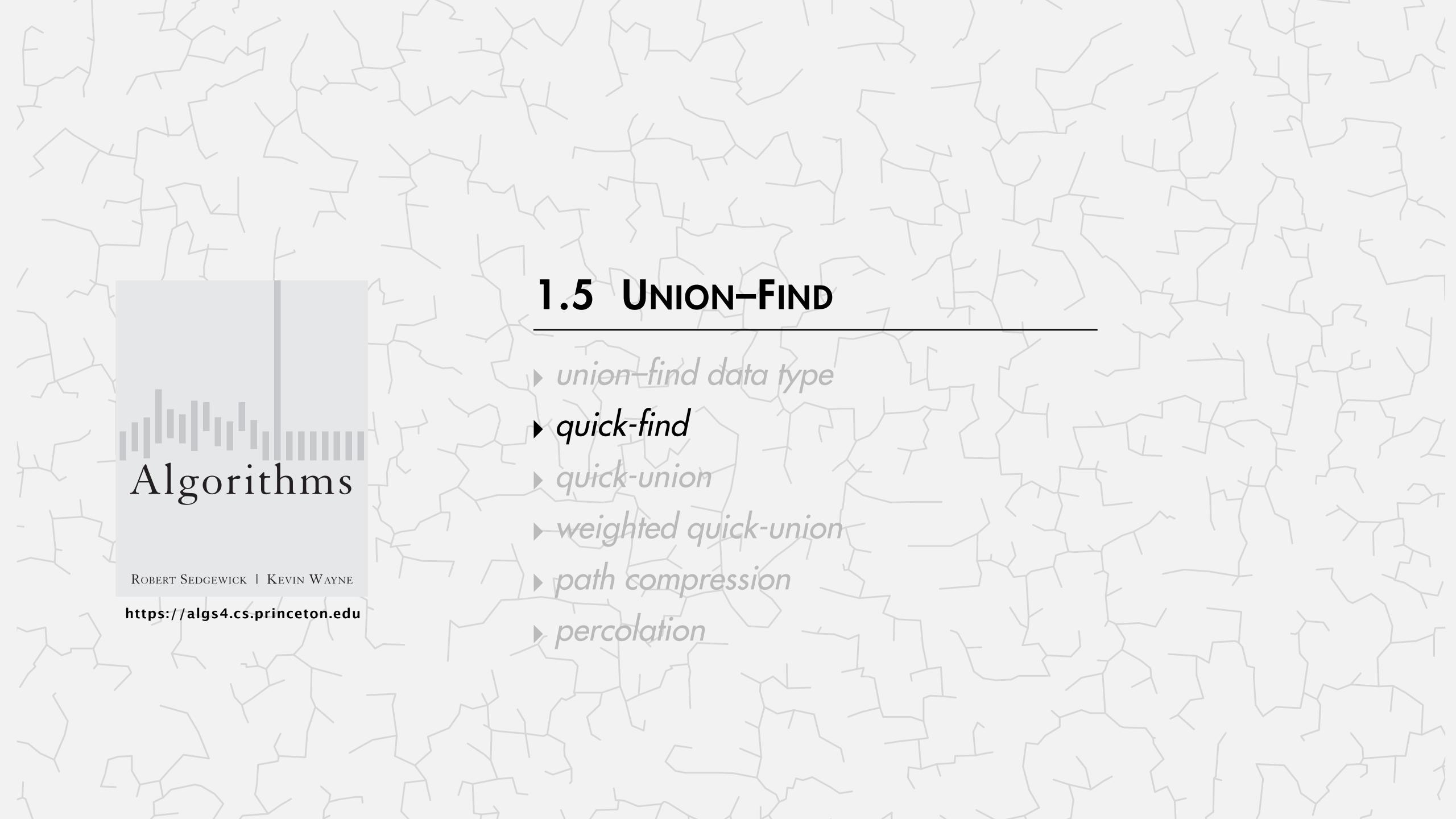
#### Disjoint sets can represent:

- Clusters of conducting sites in a composite system. ← See Assignment 1 (Percolation)
- Connected components in a graph.
- Interlinked friends in a social network.
- Interconnected devices in a mobile network.
- Equivalent variable names in a Fortran program.
- Contiguous pixels of the same color in a digital image.
- Adjoining stones of the same color in the game of Hex.





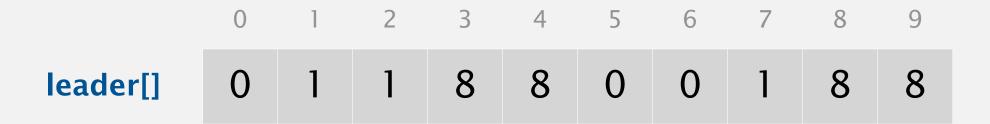


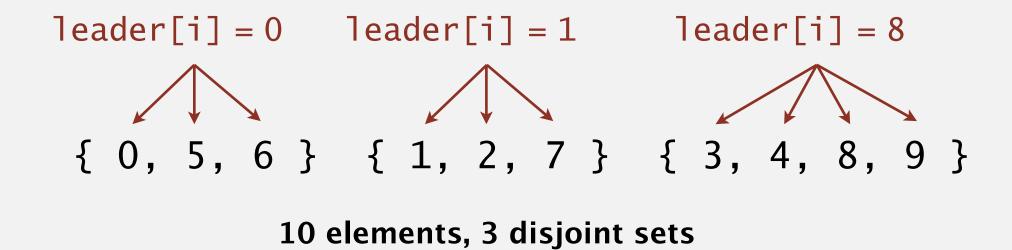


### Quick-find

#### Data structure.

- Integer array leader[] of length n.
- Interpretation: leader[i] is the leader of the set containing element i.



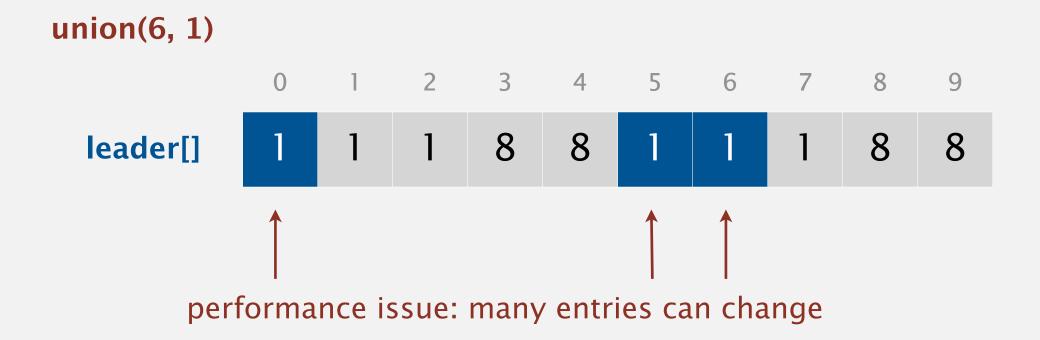


- Q. How to implement find(p)?
- A. Easy, just return leader[p].

### Quick-find

#### Data structure.

- Integer array leader[] of length n.
- Interpretation: leader[i] is the leader of the set containing element i.



- Q. How to implement union(p, q)?
- A. Change all array entries whose value is leader[p] to leader[q].

or vice versa

# Quick-find: Java implementation

```
public class QuickFindUF
   private int[] leader;
   public QuickFindUF(int n)
       leader = new int[n];
                                                                  set leader of each element to itself
      for (int i = 0; i < n; i++)
                                                                  (n array accesses)
          leader[i] = i;
                                                                  return the leader of p
   public int find(int p)
                                                                  (1 array access)
   { return leader[p]; }
   public void union(int p, int q)
      int pLeader = leader[p];
      int qLeader = leader[q];
                                                                  change all array entries whose value
      for (int i = 0; i < leader.length; i++) 	
                                                                  is leader[p] to leader[q]
          if (leader[i] == pLeader)
                                                                  (\geq n \text{ array accesses})
              leader[i] = qLeader;
         https://algs4.cs.princeton.edu/15uf/QuickFindUF.java.html
```

### Quick-find is too slow

Cost model. Number of array accesses (for read or write).

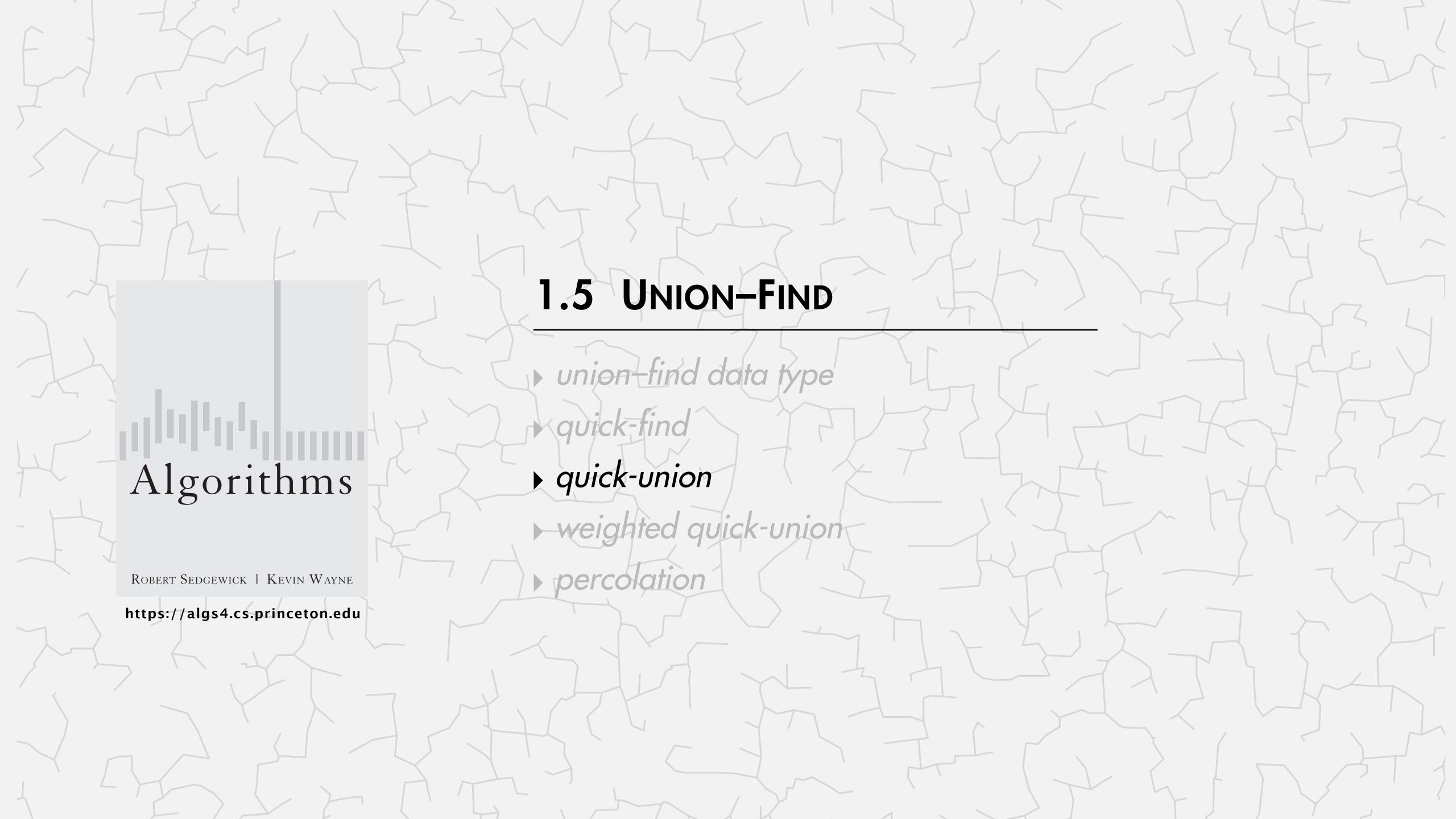
algorithm	initialize	union	find
quick-find	n	n	1

worst-case number of array accesses (ignoring leading coefficient)

Union is too expensive. Processing any sequence of m union() operations on n elements takes  $\geq mn$  array accesses.



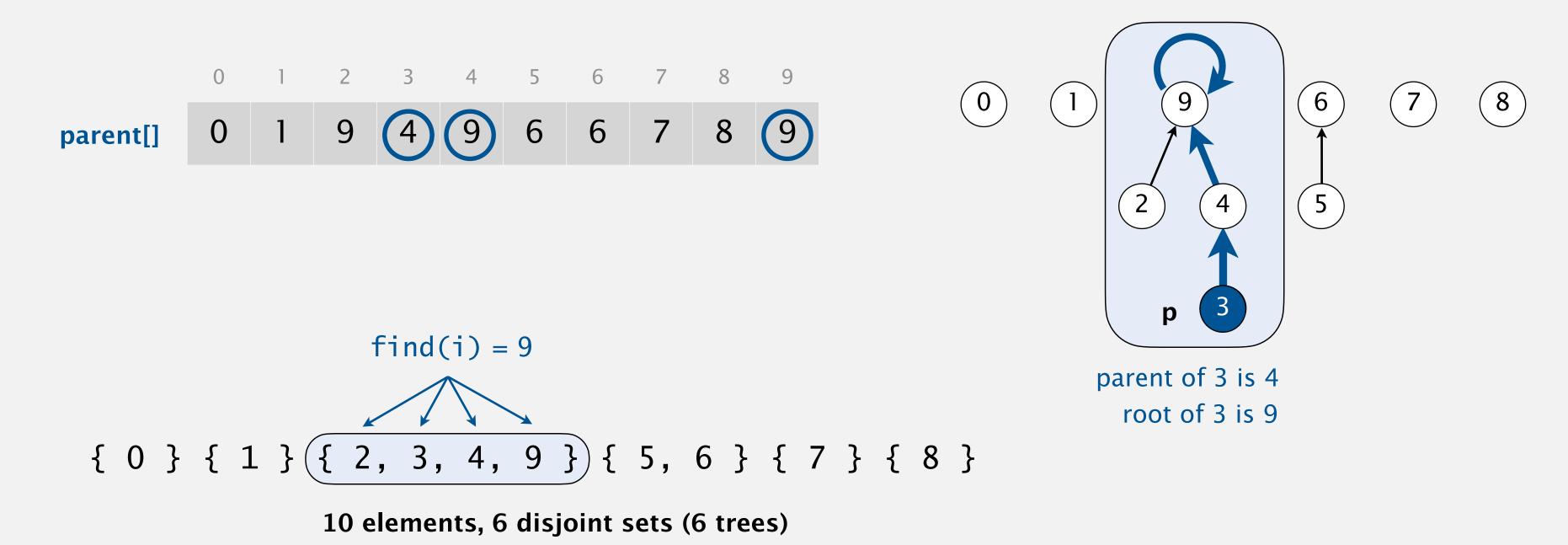
Ex. Performing 10<sup>9</sup> union() operations on 10<sup>9</sup> elements might take 30 years.



### Quick-union

#### Data structure: Forest-of-trees.

- Interpretation: elements in one rooted tree correspond to one set.
- Integer array parent[] of length n, where parent[i] is parent of element i in tree.



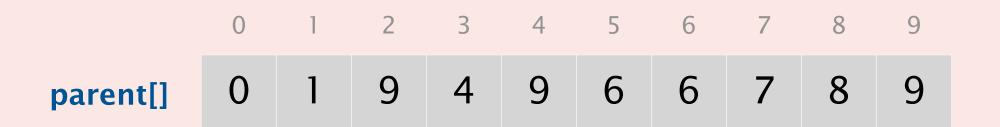
- Q. How to implement find(p)?
- A. Use tree roots as leaders  $\Rightarrow$  return root of tree containing p.

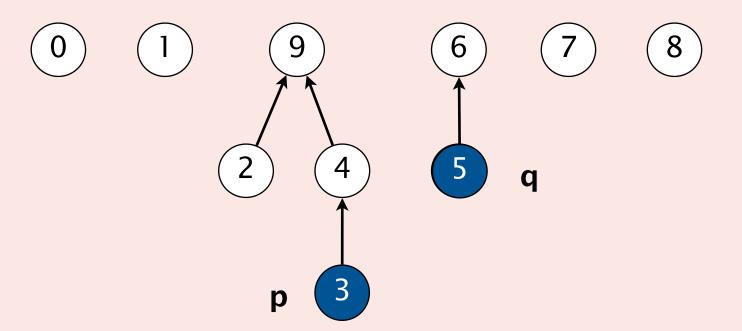
# Union-find quiz 1



#### Data structure: Forest-of-trees.

- Interpretation: elements in one rooted tree correspond to one set.
- Integer array parent[] of length n, where parent[i] is parent of element i in tree.





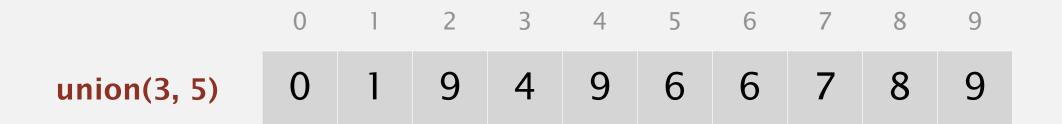
#### Which is not a valid way to implement union(3, 5)?

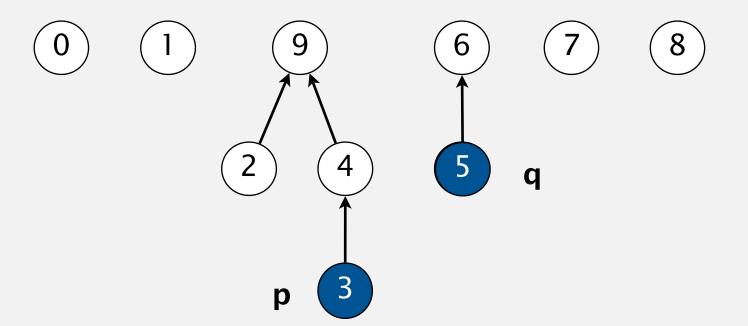
- A. Set parent [6] = 9.
- B. Set parent [9] = 6.
- C. Set parent[2] = parent[3] = parent[4] = parent[9] = 6.
- D. Set parent [3] = 5.

#### Quick-union

#### Data structure: Forest-of-trees.

- Interpretation: elements in one rooted tree correspond to one set.
- Integer array parent[] of length n, where parent[i] is parent of element i in tree.



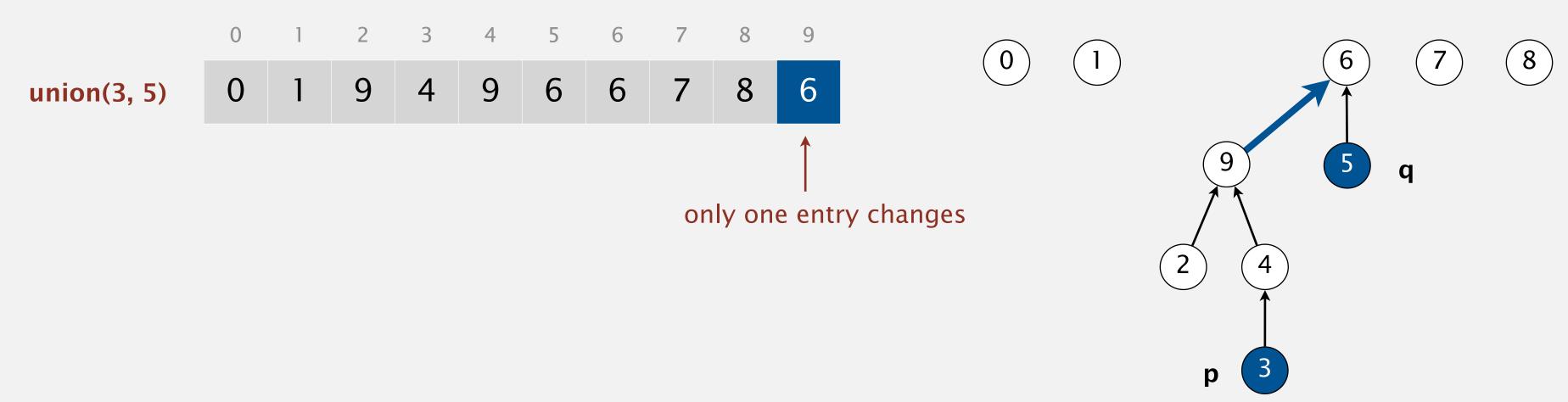


- Q. How to implement union(p, q)?
- A. Set parent[p's root] = q's root.  $\leftarrow$  or vice versa

### Quick-union

#### Data structure: Forest-of-trees.

- Interpretation: elements in one rooted tree correspond to one set.
- Integer array parent[] of length n, where parent[i] is parent of element i in tree.



- Q. How to implement union(p, q)?
- A. Set parent[p's root] = q's root.  $\leftarrow$  or vice versa

# Quick-union demo



### Quick-union: Java implementation

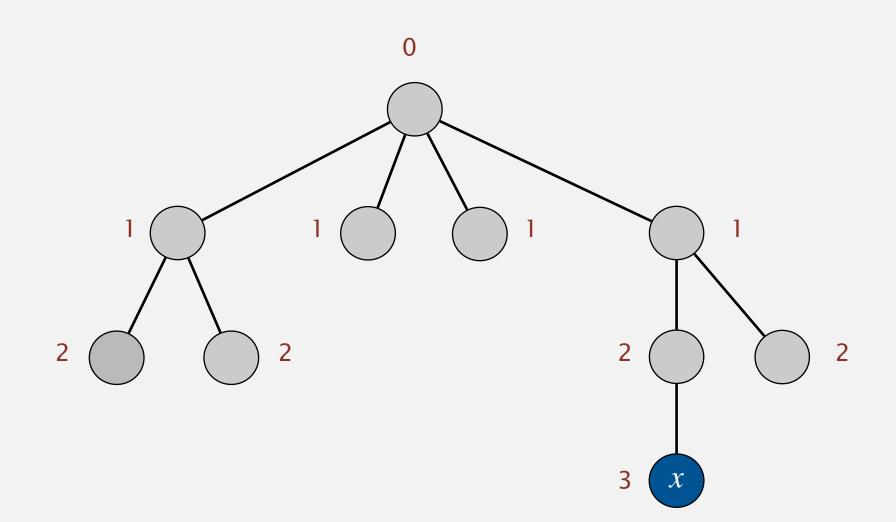
```
public class QuickUnionUF
   private int[] parent;
   public QuickUnionUF(int n)
      parent = new int[n];
                                                  set parent of each element to itself
      for (int i = 0; i < n; i++)
                                                  (to create forest of n singleton trees)
           parent[i] = i;
   public int find(int p)
                                                  follow parent pointers until reach root;
      while (p != parent[p])
                                                  return resulting root
           p = parent[p];
      return p;
   public void union(int p, int q)
      int root1 = find(p);
                                                  link root of p to root of q
      int root2 = find(q);
      parent[root1] = root2;
```

# Quick-union analysis

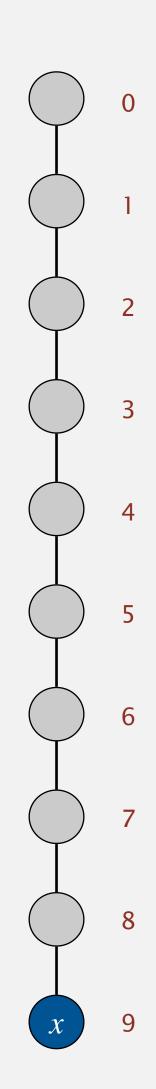
Cost model. Number of array accesses (for read or write).

#### Running time.

- union() takes constant time, given two roots.
- find() takes time proportional to depth of node in tree.



depth(x) = 3



worst-case depth = n-1

### Quick-union analysis

Cost model. Number of array accesses (for read or write).

#### Running time.

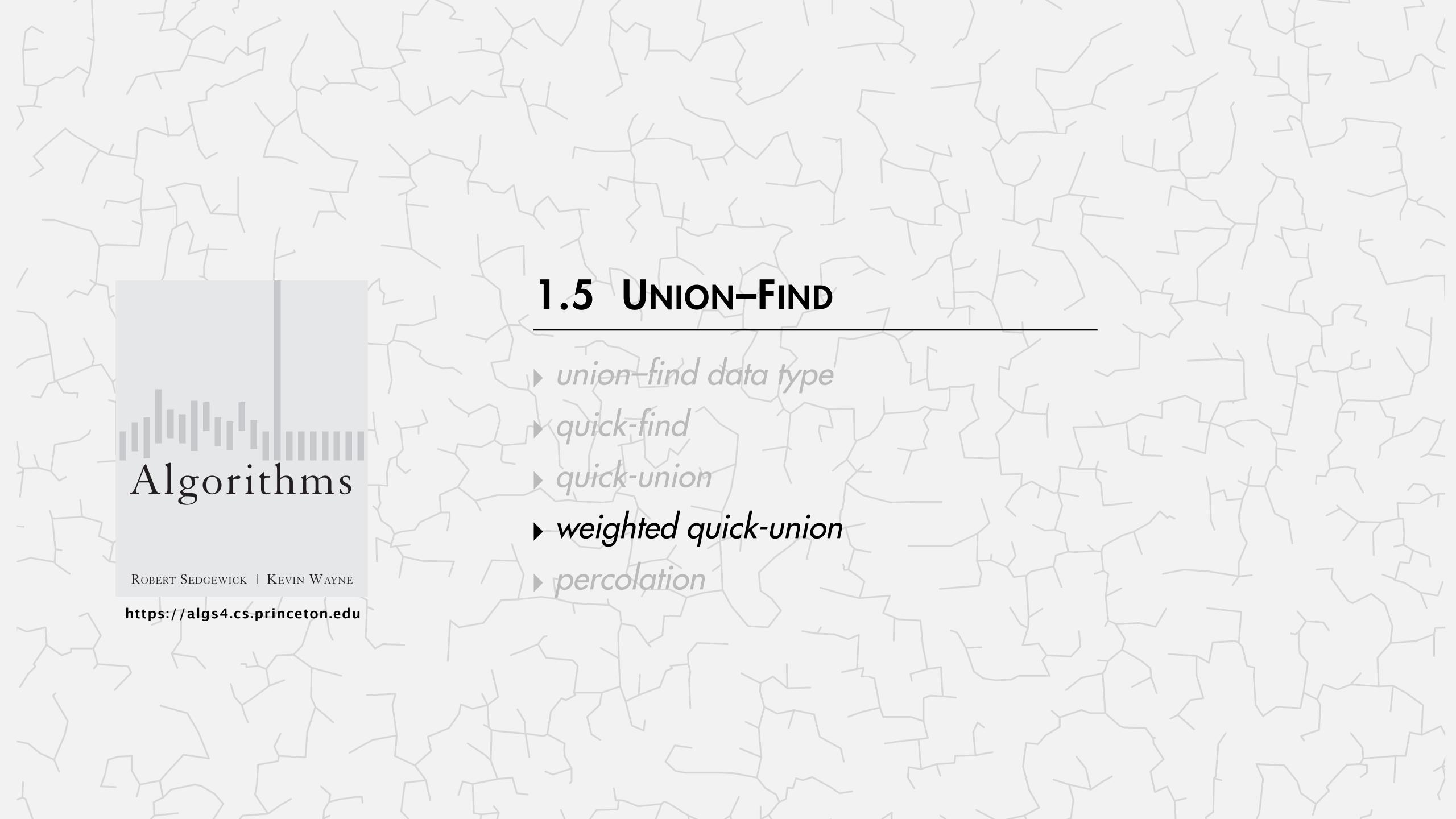
- union() takes constant time, given two roots.
- find() takes time proportional to depth of node in tree.

algorithm	initialize	union	find
quick-find	n	n	1
quick-union	n	n	n

worst-case number of array accesses (ignoring leading coefficient)

Too expensive (if trees get tall). Processing some sequences of m union() and find() operations on n elements takes  $\geq mn$  array accesses.



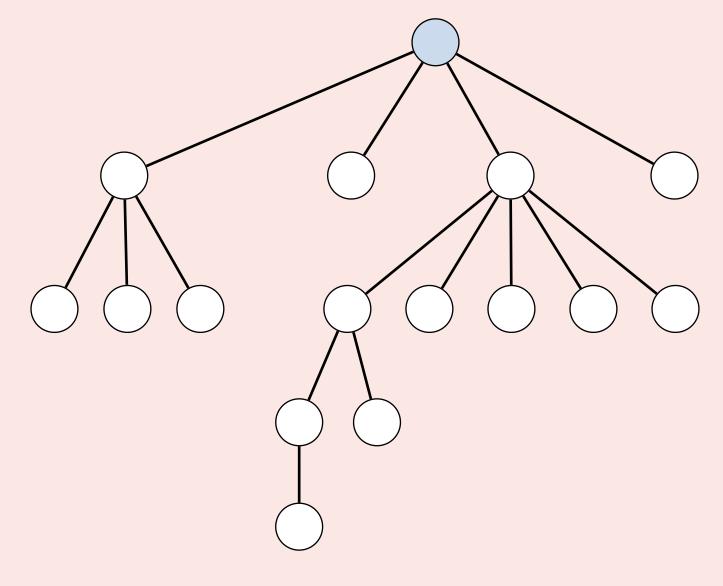


# Union-find quiz 2

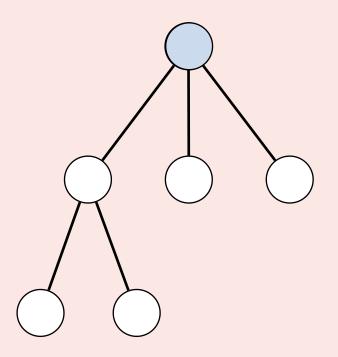


#### When linking two trees, which strategy is most effective?

- **A.** Link the root of the *smaller* tree to the root of the *larger* tree.
- B. Link the root of the *larger* tree to the root of the *smaller* tree.
- C. Flip a coin; randomly choose between A and B.
- D. All of the above.



larger tree (size = 16, height = 4)

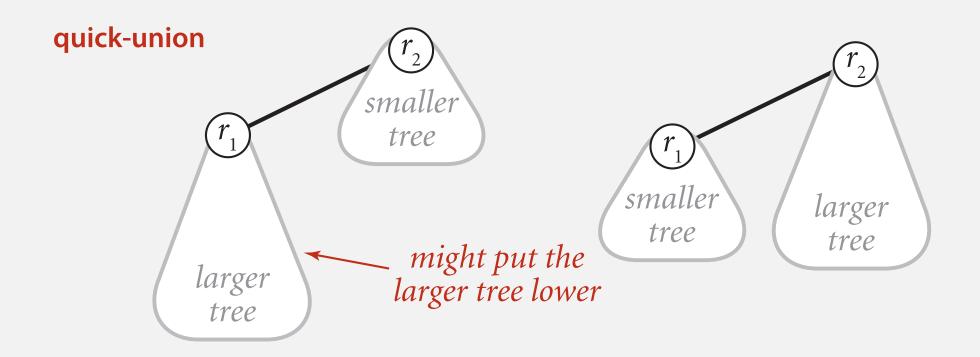


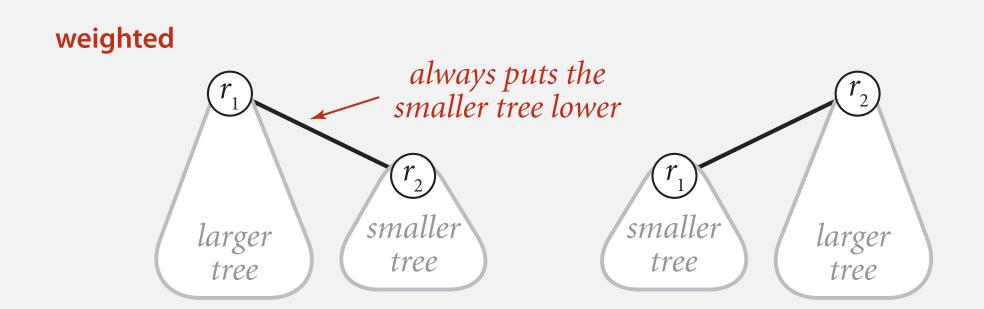
smaller tree (size = 6, height = 2)

# Weighted quick-union (link-by-size)

- Modify quick-union to avoid tall trees.
- Keep track of size of each tree = number of elements.
- Always link root of smaller tree to root of larger tree.

fine alternative: link-by-height





### Weighted quick-union: Java implementation

Data structure. Same as quick-union, but maintain extra array size[i] to count number of elements in the tree rooted at i, initially 1.

- find(): identical to quick-union.
- union(): link root of smaller tree to root of larger tree; update size[].

```
public void union(int p, int q)
{
  int root1 = find(p);
  int root2 = find(q);
  if (root1 == root2) return;

  if (size[root1] >= size[root2])
  { int temp = root1; root1 = root2; root2 = temp; }

  parent[root1] = root2;
  size[root2] += size[root1];

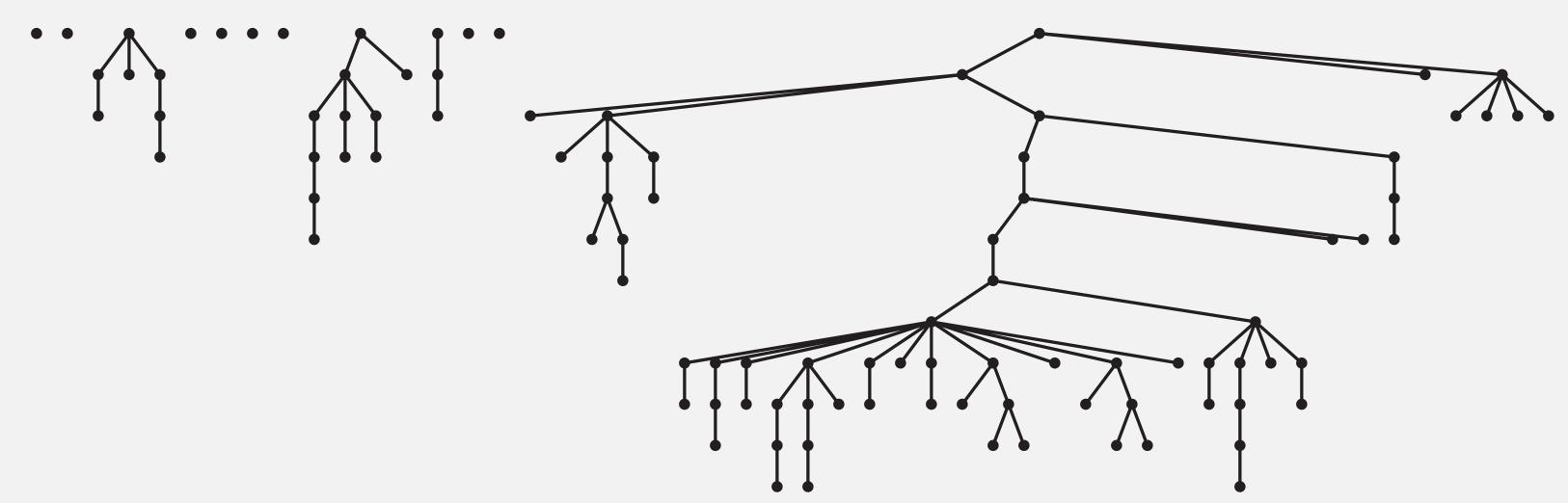
  update size

  link root of smaller tree
  to root of larger tree
```

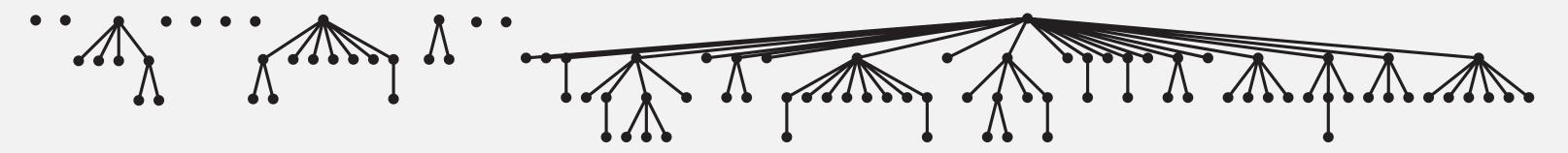
https://algs4.cs.princeton.edu/15uf/WeightedQuickUnionUF.java.html

# Quick-union vs. weighted quick-union: larger example

#### quick-union

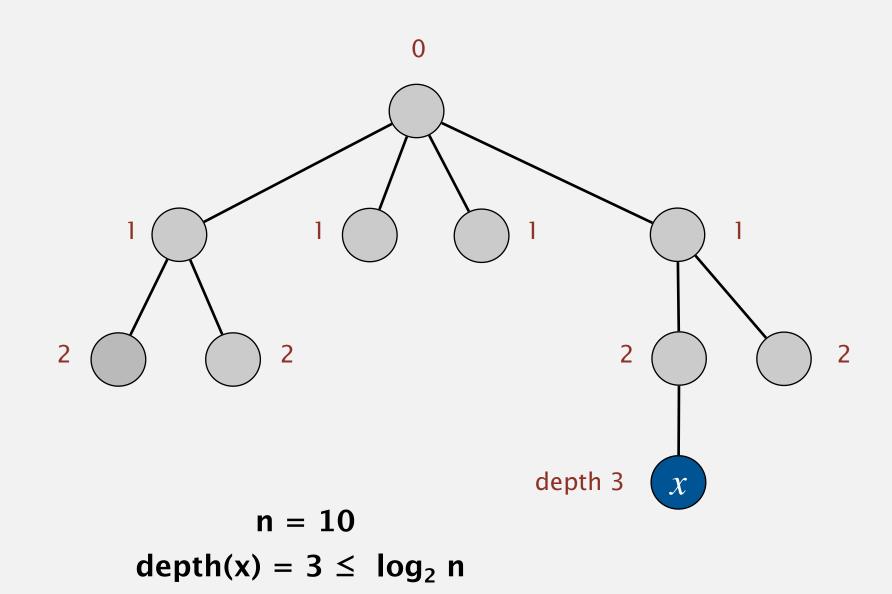


#### weighted



# Weighted quick-union analysis

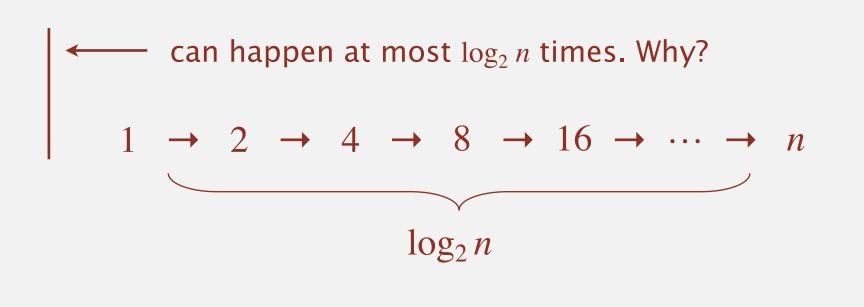
Proposition. Depth of any node  $x \le \log_2 n$ .

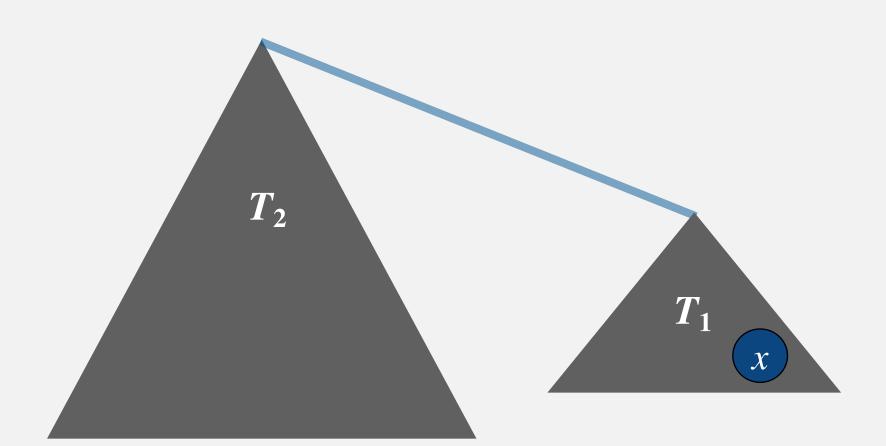


## Weighted quick-union analysis

Proposition. Depth of any node  $x \le \log_2 n$ . Pf.

- Depth of x does not change unless root of tree  $T_1$  containing x is linked to the root of a larger tree  $T_2$ , forming a new tree  $T_3$ .
- when this happens:
- depth of x increases by exactly 1
- size of tree containing x at least doubles because  $size(T_3) = size(T_1) + size(T_2)$  $\geq 2 \times size(T_1)$ .





# Weighted quick-union analysis

Proposition. Depth of any node  $x \le \log_2 n$ .

#### Running time.

- union() takes constant time, given two roots.
- find() takes time proportional to depth of node in tree.

algorithm	initialize	union	find
quick-find	n	n	1
quick-union	n	n	n
weighted quick-union	n	$\log n$	$\log n$

worst-case number of array accesses (ignoring leading coefficient)

### Summary

Key point. Weighted quick-union empowers us to solve problems that could not otherwise be addressed.

algorithm	worst-case time
quick-find	m n
quick-union	m n
weighted quick-union	$m \log n$
quick-union + path compression	$m \log n$
weighted quick-union + path compression	$m \alpha(m,n) \leftarrow$

order of growth for  $m \ge n$  union-find operations on a set of n elements

# Ex. [109 union-find operations on 109 elements]

- Efficient algorithm reduces time from 30 years to 6 seconds.
- Supercomputer won't help much.

"The goal is to come up with algorithms that you can apply in practice that run fast, as well as being simple, beautiful, and analyzable." — Bob Tarjan



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