



Paolo Camurati
Dip. Automatica e Informatica
Politecnico di Torino



- Solve the following problem
  - Given a set of N objects
  - Union command
    - Connects two objects
  - Find query
    - Finds connected couples
- We do not want to know the path which connect two objects but only whether such a path exists or not
- N objects (whatever they are) can be mapped on N integers (from 0 to N-1)



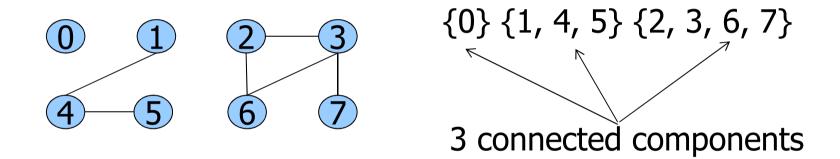
- Input: sequence of integer pairs (p, q)
  - Interpretation: p is connected to q
- Output
  - Null if p and q are already connected (directly or indirectly)
  - Else (p, q)



- Connectivity is an equivalence relation
  - Reflexive: p is connected to p
  - Symmetrical: if p is connected to q, q is connected to p
  - Transitive: if p is connected to q and q is connected to r, then p is connected to r



- Connected component
  - Maximal subset of mutually reachable nodes



- There are no elements connecte to an element outside its connected component
  - Find is checking connected component
  - Union is replacing connected component with their union



#### **Applications**

- Computer networks
  - Integers p and q represent computers
  - (p, q) connections between computers
- Electrical networks
  - Integers p and q represent contact points
  - (p, q) wires
- Programming environments
  - Integers p and q represent variables
  - (p, q) declarations of equivalent variables
- Social network

• ...



- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1

#### Graph:

structure representing nodes (vertices) and their connections (edges)

(1)

8

2

7

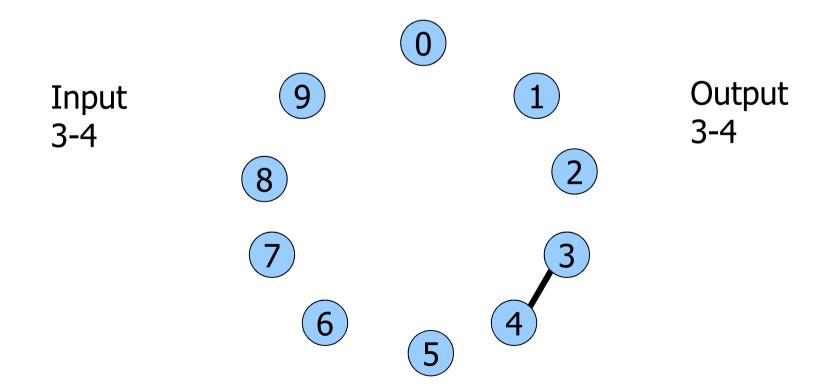
(3)

(6)

(4

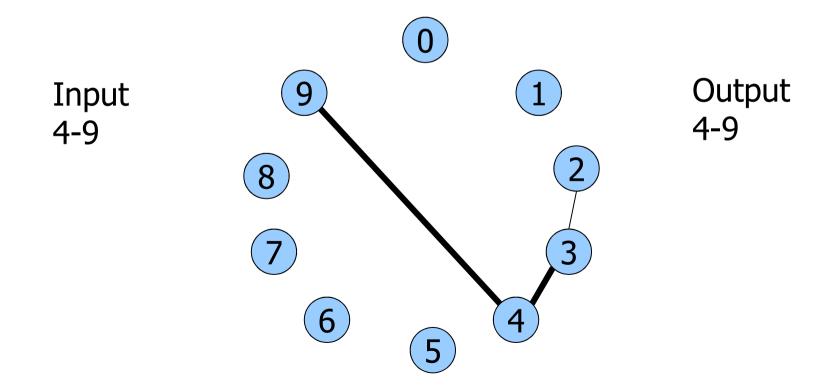


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1



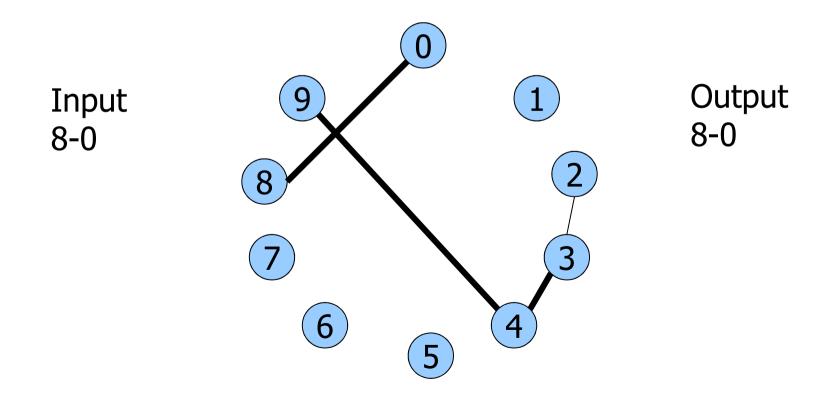


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1



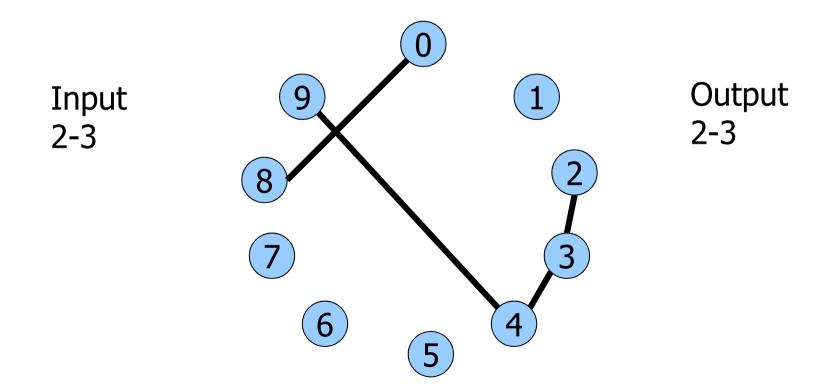


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1



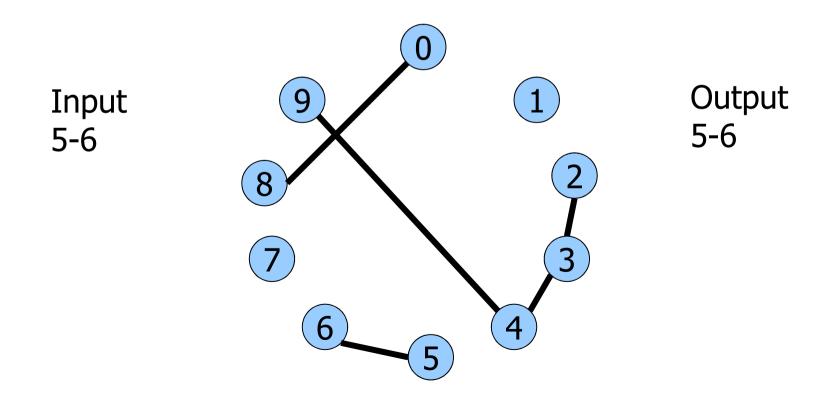


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1



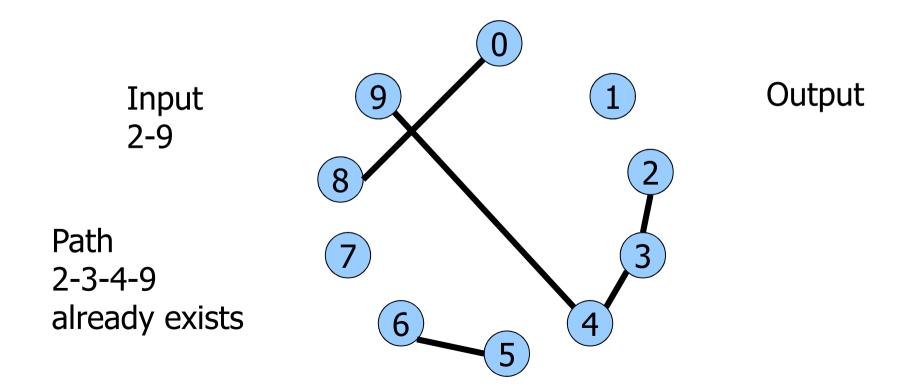


- Pairs
  - 3-4, 4-9, 8-0, 2-3, <del>5-6</del>, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1



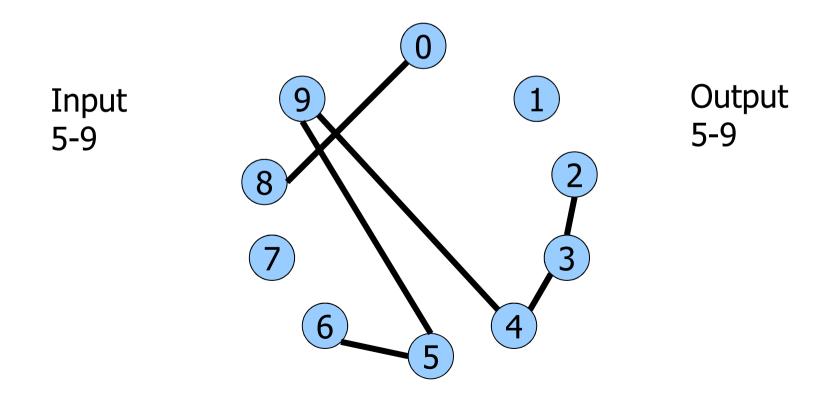


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1



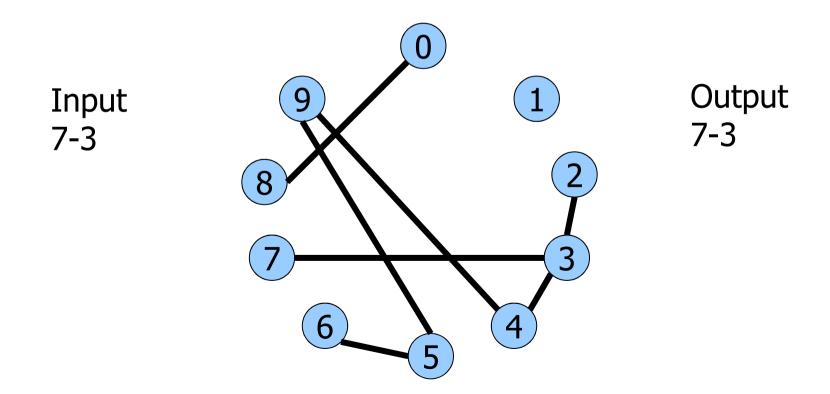


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, **5-9**, 7-3, 4-8, 5-6, 0-2, 6-1



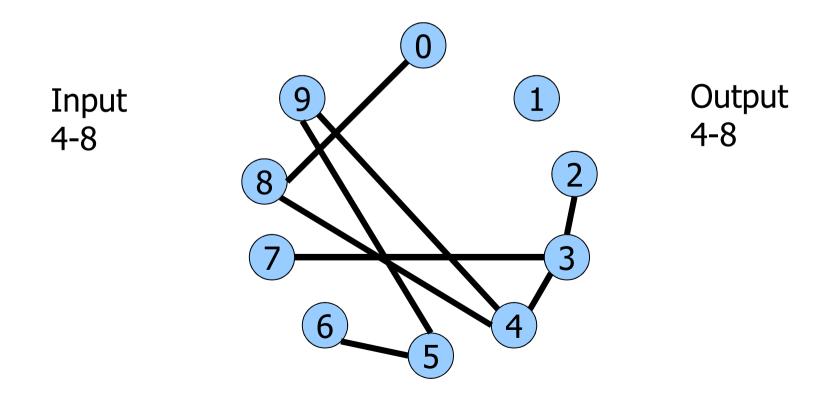


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, <del>7-3</del>, 4-8, 5-6, 0-2, 6-1



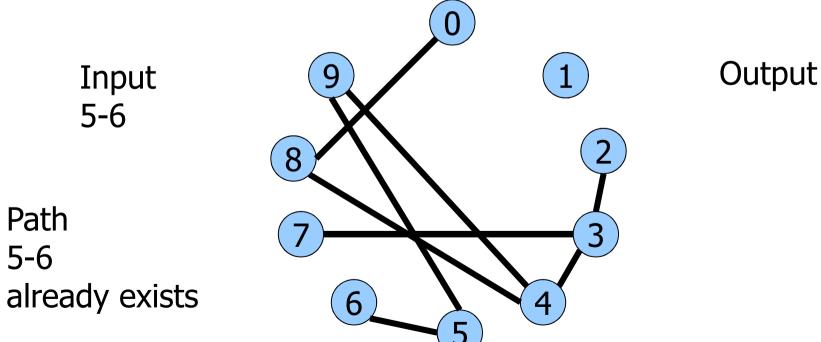


- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1





- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, **5-6**, 0-2, 6-1



Path 5-6



- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1

Output Input

Path 0-8-4-3-2 already exists

0-2



- Pairs
  - 3-4, 4-9, 8-0, 2-3, 5-6, 2-9, 5-9, 7-3, 4-8, 5-6, 0-2, 6-1

Input 6-1 Output 6-1 7 3

# **Approach**

#### Hypothesis

- We do not have the graph
- We work pair by pair
  - We keep and update information necessary to find out connectivity
  - Sets S<sub>i</sub> of connected pairs, initially as many sets as nodes, each node being connected just with itself
- Abstract operations
  - find: find the set an object belongs to
  - union: merge two sets



- Algorithm: repeat for all pairs (p, q)
  - Read the pair (p, q)
  - Execute find on p: find an S<sub>p</sub> such that p∈ S<sub>p</sub>
  - Execute find on q: find an  $S_q$  such that  $q \in S_q$
  - If S<sub>p</sub> and S<sub>q</sub> coincide
    - Consider the next pair
    - Otherwise execute union on S<sub>p</sub> and S<sub>q</sub>



#### Quick find

- Represent sets S<sub>i</sub> of connected pairs with array id
  - Initially id[i] = i (no connection)

If p and q are connected, id[p] = id[q]

6 and 8 are connected



#### Quick find

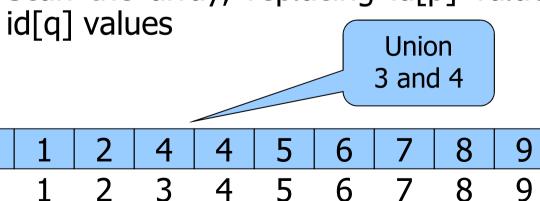
Repeat for all pairs (p, q)

- Read pair (p, q)
- Find

0

- Check if (id[p] = id[q])
- Do nothing and move to the next pair
- Else Union

Scan the array, replacing id[p] values with



id



#### Tree representation

- Some objects represent the set they belong to
- Other objects point to the object that represents the set they belong to





(8

**Initially** 

$$S_0 = \{0\}, S_1 = \{1\}, S_2 = \{2\}, S_3 = \{3\}, S_4 = \{4\}$$
  
 $S_5 = \{5\}, S_6 = \{6\}, S_7 = \{7\}, S_8 = \{8\}, S_9 = \{9\}$ 



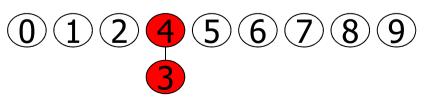
- 0
- 1
- 2
- 3—4

- **(5)**
- **(6)**
- (7)
- 8

$$p q = 3 4$$

$$id[p]=3 \neq id[q]=4$$
  
replace all  $id[p]$  values with  $id[q]$  values

$$S_0 = \{0\}, S_1 = \{1\}, S_2 = \{2\}, S_{3-4} = \{3,4\}, S_5 = \{5\}, S_6 = \{6\}, S_7 = \{7\}, S_8 = \{8\}, S_9 = \{9\}$$





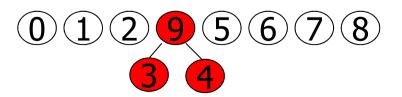
- 0
- 1
- 2
- 3-4

- **(5)**
- **(6)**
- (7)
- 8
- 9

$$pq = 49$$

$$id[p]=4 \neq id[q]=9$$
  
replace all  $id[p]$  values with  $id[q]$  values

$$S_0 = \{0\}, S_1 = \{1\}, S_2 = \{2\}, S_{3-4-9} = \{3,4,9\}, S_5 = \{5\}, S_6 = \{6\}, S_7 = \{7\}, S_8 = \{8\}$$







$$p q = 8 0$$

$$id[p]=8 \neq id[q]=0$$
  
replace all  $id[p]$  values with  $id[q]$  values

$$S_{0-8} = \{0,8\}, S_1 = \{1\}, S_2 = \{2\}, S_{3-4-9} = \{3,4,9\},$$

$$S_5 = \{5\}, S_6 = \{6\}, S_7 = \{7\}$$











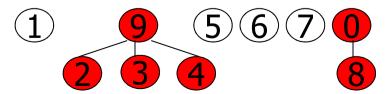


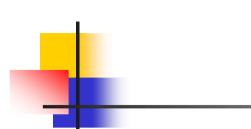
- **(5)**
- )

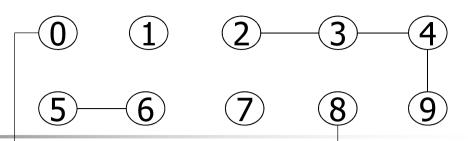
$$pq = 2 3$$

$$id[p]=2 \neq id[q]=9$$
  
replace all  $id[p]$  values with  $id[q]$  values

$$S_{0-8} = \{0,8\}, S_1 = \{1\}, S_{2-3-4-9} = \{2,3,4,9\}, S_5 = \{5\}, S_6 = \{6\}, S_7 = \{7\}$$



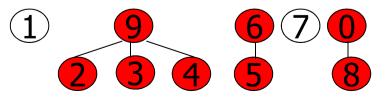


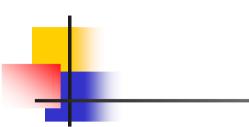


$$pq = 56$$

$$id[p]=5 \neq id[q]=6$$
  
replace all  $id[p]$  values with  $id[q]$  values

$$S_{0-8} = \{0,8\}, S_1 = \{1\}, S_{2-3-4-9} = \{2,3,4,9\}, S_{5-6} = \{5,6\}, S_7 = \{7\}$$



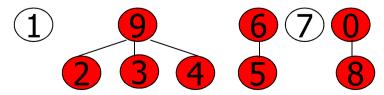


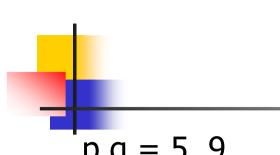
<u> </u>	1	2	_3_	-4
5	<u>6</u>	7	8	9

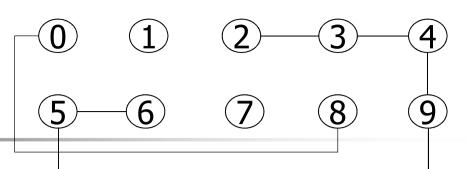
$$pq = 29$$

$$id[p]=9 = id[q]=9$$
  
no change

$$S_{0-8} = \{0,8\}, S_1 = \{1\}, S_{2-3-4-9} = \{2,3,4,9\}, S_{5-6} = \{5,6\}, S_7 = \{7\}$$



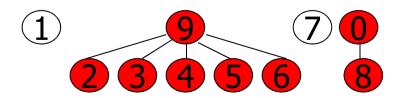


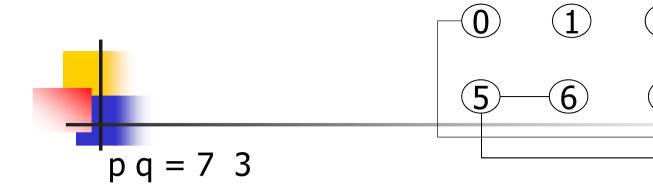


$$pq = 59$$

$$id[p]=6 \neq id[q]=9$$
  
replace all  $id[p]$  values with  $id[q]$  values

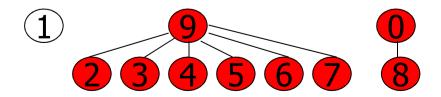
$$S_{0-8} = \{0,8\}, S_1 = \{1\}, S_{2-3-4-5-6-9} = \{2,3,4,5,6,9\}, S_7 = \{7\}$$

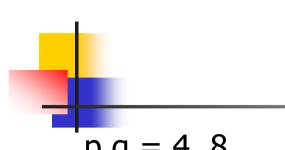




id[p]=7 ≠ id[q]=9
replace all id[p] values with id[q] values

$$S_{0-8} = \{0,8\}, S_1 = \{1\}, S_{2-3-4-5-6-7-9} = \{2,3,4,5,6,7,9\}$$



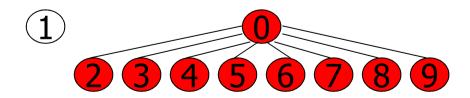


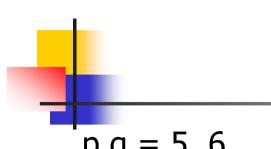
<u>(0)</u>	<u>(1)</u>	2	_(3)_	4
5	6	7	8	9

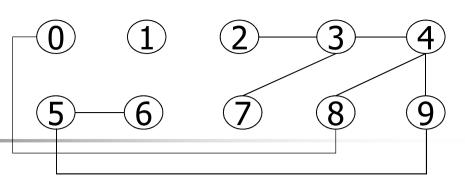
$$p q = 4 8$$

$$id[p]=9 \neq id[q]=0$$
  
replace all  $id[p]$  values with  $id[q]$  values

$$S_1 = \{1\}, S_{0-2-3-4-5-6-7-8-9} = \{0,2,3,4,5,6,7,8,9\}$$



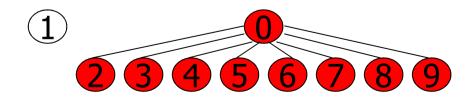


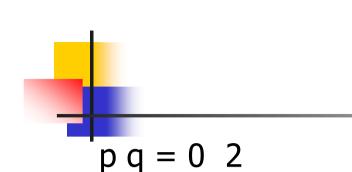


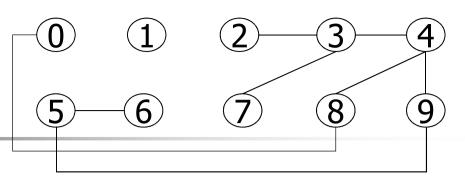
$$pq = 56$$

$$id[p]=0 = id[q]=0$$
  
no change

$$S_1 = \{1\}, S_{0-2-3-4-5-6-7-8-9} = \{0,2,3,4,5,6,7,8,9\}$$

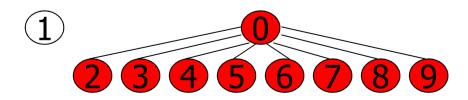




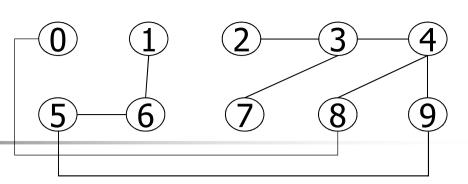


$$id[p]=0 = id[q]=0$$
  
no change

$$S_1 = \{1\}, S_{0-2-3-4-5-6-7-8-9} = \{0,2,3,4,5,6,7,8,9\}$$



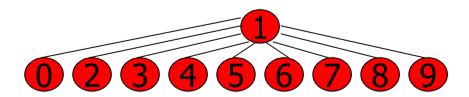




$$pq = 61$$

id[p]=0 = id[q]=1
replace all id[p] values with id[q] values

$$S_{0-1-2-3-4-5-6-7-8-9} = \{0,1,2,3,4,5,6,7,8,9\}$$





```
#include <stdio.h>
#define N 10000
main() {
  int i, t, p, q, id[N];
  for(i=0; i<N; i++)
    id[i] = i;
  printf("Input pair p q: ");
 while (scanf("%d %d", &p, &q) ==2) {
    if (id[p] == id[q])
      printf("%d %d already connected\n", p,q);
    else {
      for (t = id[p], i = 0; i < N; i++)
        if (id[i] == t)
          id[i] = id[q];
        printf("pair %d %d not yet connected\n", p, q);
      printf("Input pair p q: ");
```



## Performance

### Find

 Simple reference to cell in array id[index], unit cost

### Union

- Scan array to replace p values with q values, cost linear in array size
- overall number of operations related to

# pairs ' array size

Quadratic

Too slow

# Quic

# Quick union

- Represent sets S<sub>i</sub> of connected pairs with an array id
  - Initially all the objects point to themselves id[i] = i (no connection)
  - Each object points either to an object to which it is connected or to itself (no loops)
     Writing (id[i])\* for id[id[id[... id[i]]]]
     if objects i are j connected
     (id[i])\* = (id[j])\*



# Quick union

- Each object points either to an object to which it is connected or to itself (no loops)
   Writing (id[i])\* for id[id[id[... id[i]]]]
   if objects i are j connected
   (id[i])\* = (id[j])\*
- Example

Keep going until it doesn't change

id

0	1	9	4	9	6	6	7	8	9	019678
0	1	2	3	4	5	6	7	8	9	019678

# Quick union

# Algorithm

- Repeat for all the pairs (p, q)
  - Read pair (p, q)
  - If(id[p])\* = (id[q])\*
    - Do nothing (the pair is already connected)
       and move on to the next pair
    - Else id[(id[p])\*] = (id[q])\* (connect the pair)





5 6

7) 8

9

**Initially** 

0123456789



- 3-4

- (7)

$$p q = 3 4$$

$$id[p]=3 \neq id[q]=4$$

p points to q: id[p]=4



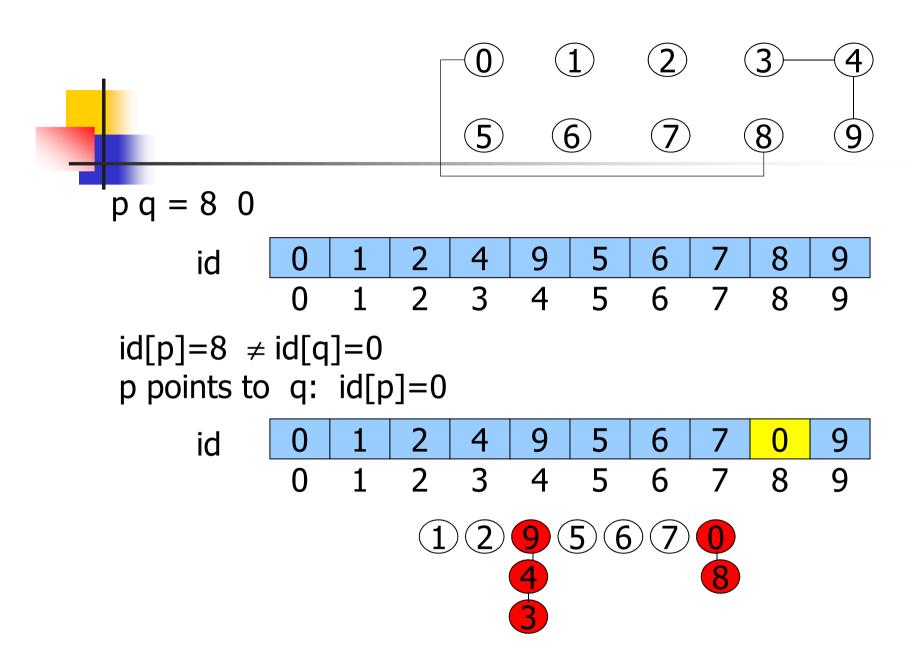


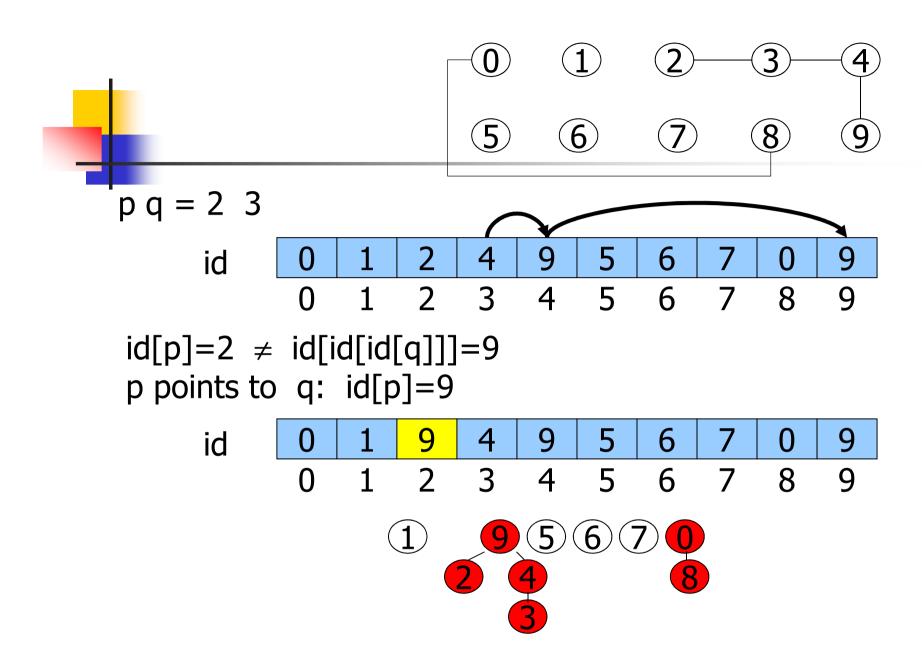
- **(5)**

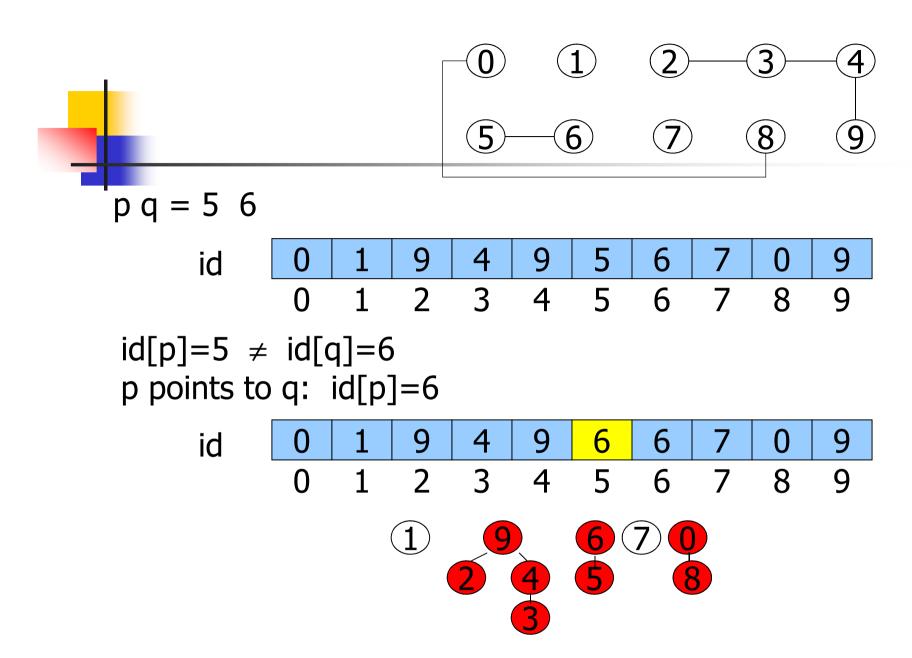
$$p q = 4 9$$

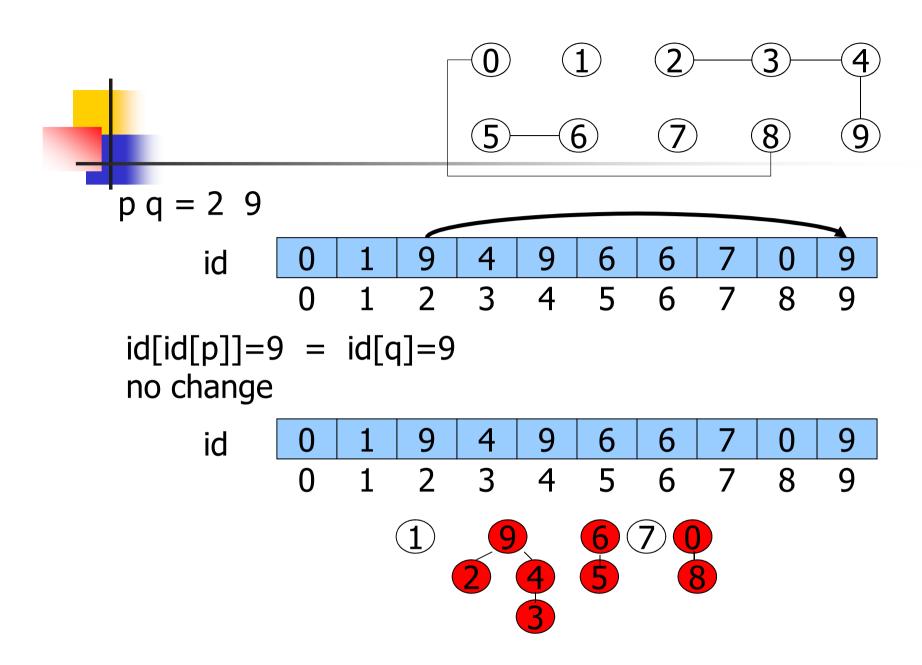
$$id[p]=4 \neq id[q]=9$$

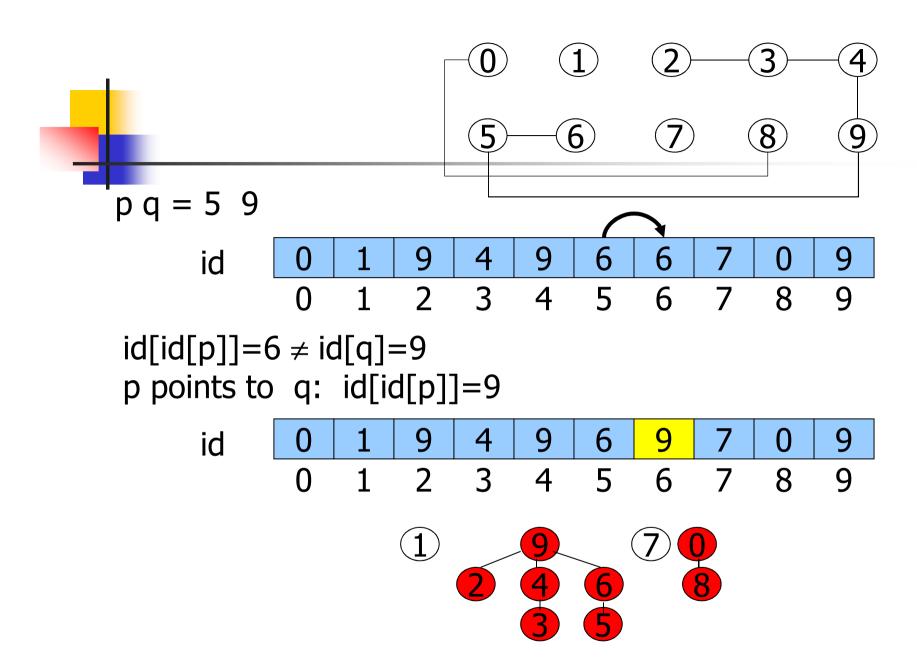
- p points to q: id[p]=9
  - id

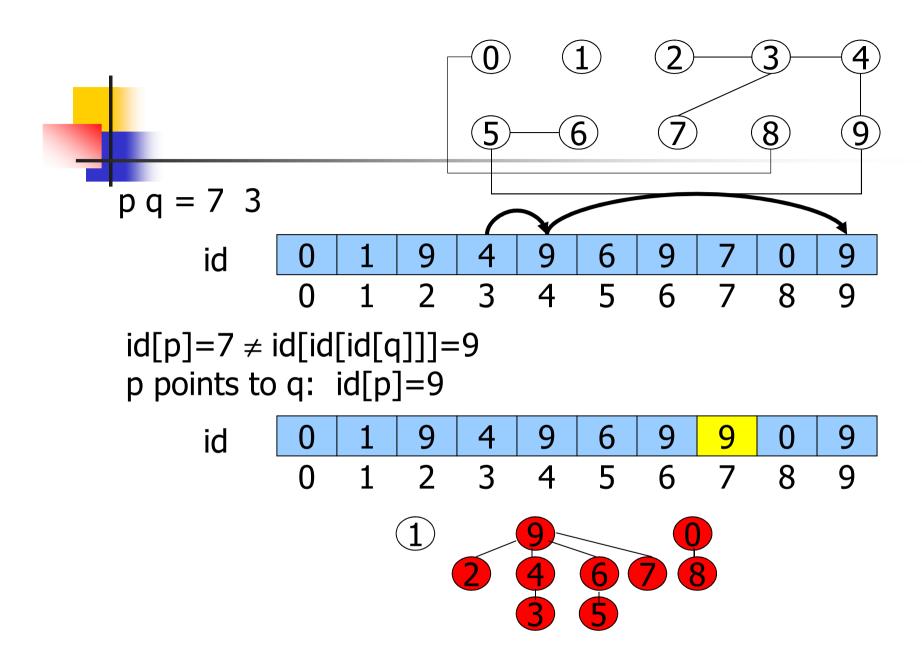


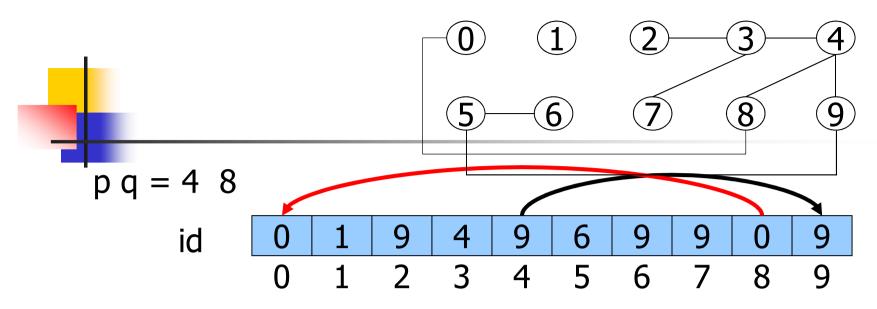




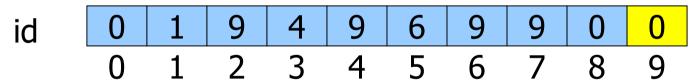


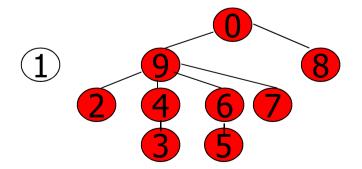


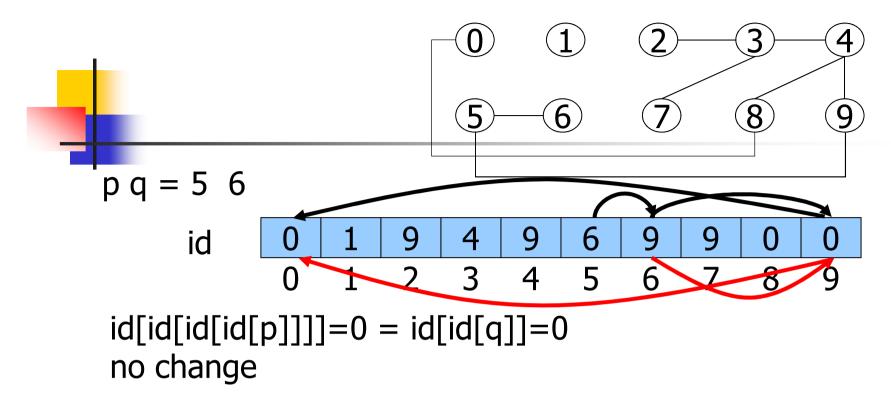


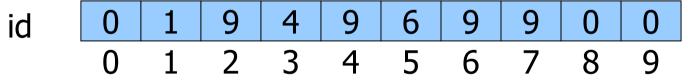


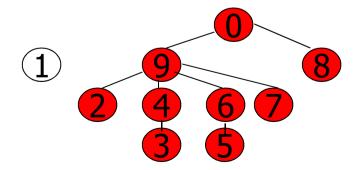
 $id[id[p]]=9 \neq id[id[q]]=0$ p points to q: id[id[p]]=0

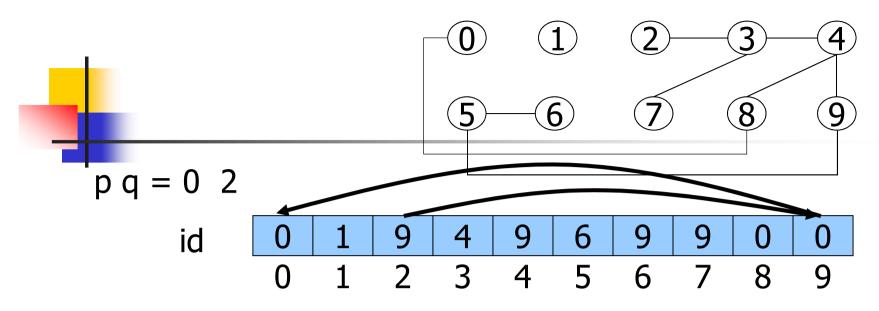






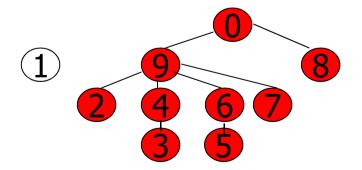


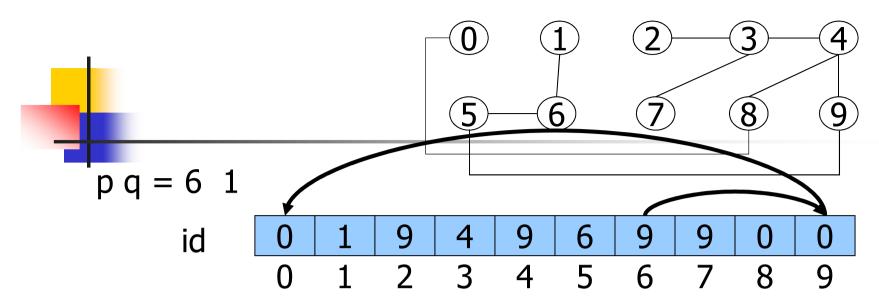




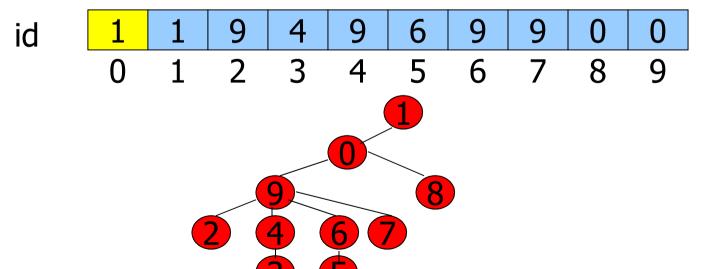
id[p]=0 = id[id[id[q]]]=0no change







 $id[id[id[p]]]=0 \neq id[q]=1$ p points to q: id[id[id[p]]]=1



```
#include <stdio.h>
#define N 10000
main() {
  int i, j, p, q, id[N];
  for(i=0; i<N; i++)
    id[i] = i:
  printf("Input pair p q: ");
 while (scanf("%d %d", &p, &q) == 2) {
    for (i = p; i!= id[i]; i = id[i]);
    for (j = q; j!= id[j]; j = id[j]);
    if (i == j) {
      printf("pair %d %d already connected\n", p,q);
    } else {
      id[i] = j;
      printf("pair %d %d not yet connected\n", p, q);
    printf("Input pair p q: ");
```



# Performance

### Find

 Scan a "chain" of objects, upper bound linear cost in the number of objects, in general well below upper bound

#### Union

- Simple, as it is enough that an object points to another object, unit cost
- Overall number of operations related to

Still too slow

# pairs 'chain length



# Quick union optimizations

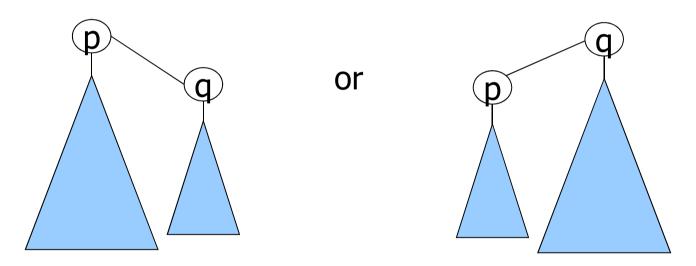
# Weighted quick union

■ To shorten the chain length, keep track of the number of elements in each tree (array sz) and connect the smaller tree to the larger one

Union by height or "rank", i.e., always link the root of smaller tree to root of lager tree



According to which one is the larger, there might be 2 solutions



It is irrelevant if p appears at the right or at the left of q







Initially

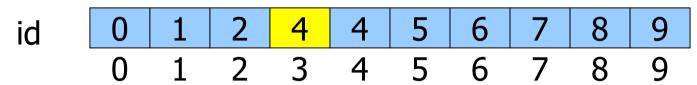


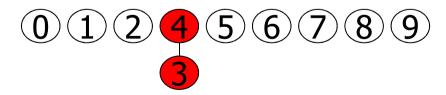
- 3—4

- (7)

$$p q = 3 4$$

$$id[p]=3 \neq id[q]=4$$
  
p points to q:  $id[p]=4$ 





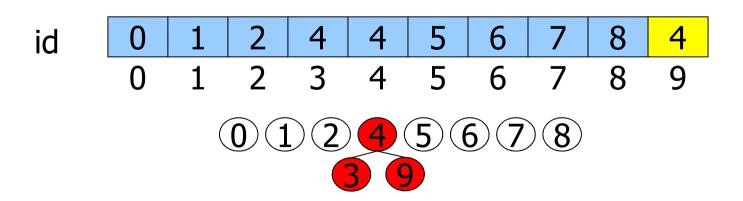


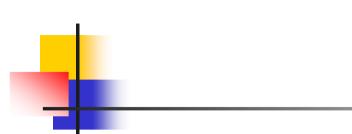


$$p q = 4 9$$

$$id[p]=4 \neq id[q]=9$$

the smaller tree q points to the larger one p: id[q]=4





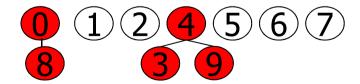
) (

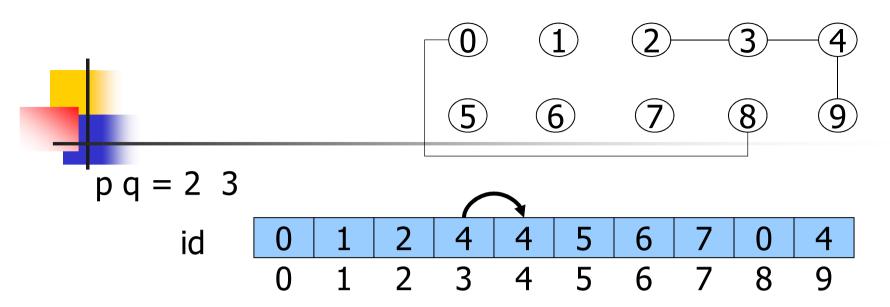
- 3-4

- 3 9

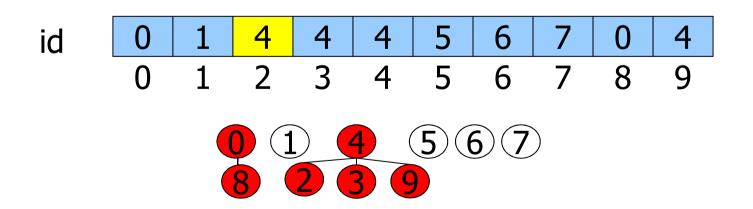
$$p q = 8 0$$

$$id[p]=8 \neq id[q]=0$$
  
p points to q:  $id[p]=0$ 

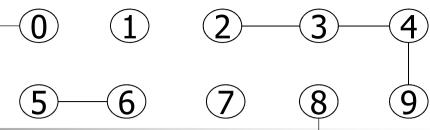




 $id[p]=2 \neq id[id[q]]=4$ the smaller tree p points to the larger one q: id[p]=4

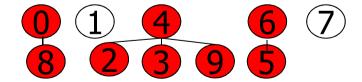


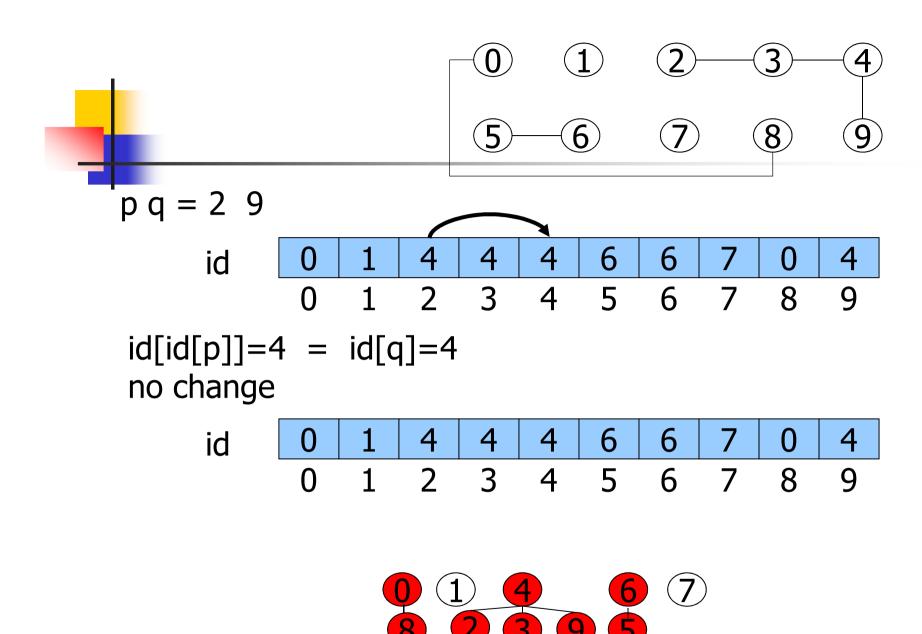


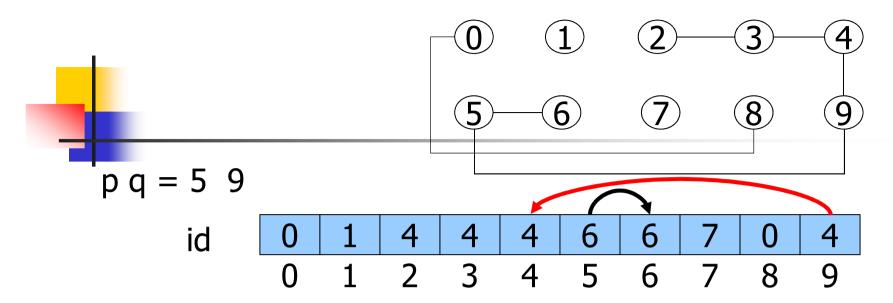


$$pq = 56$$

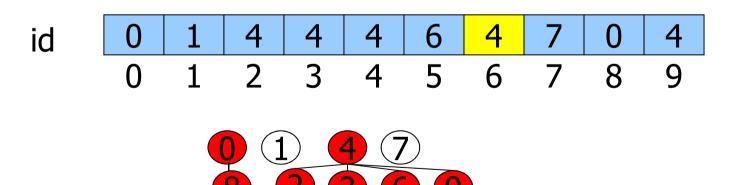
$$id[p]=5 \neq id[q]=6$$
  
p points to q:  $id[p]=6$ 

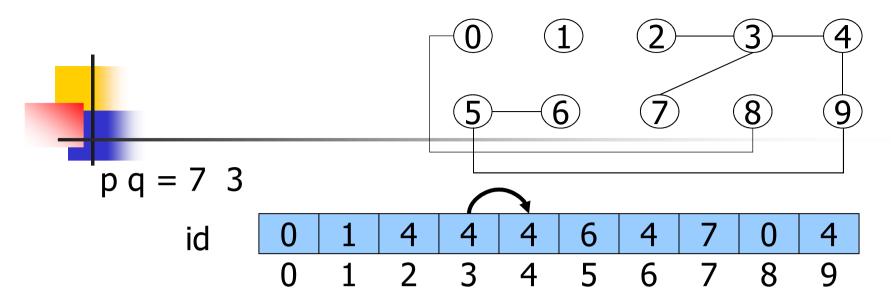




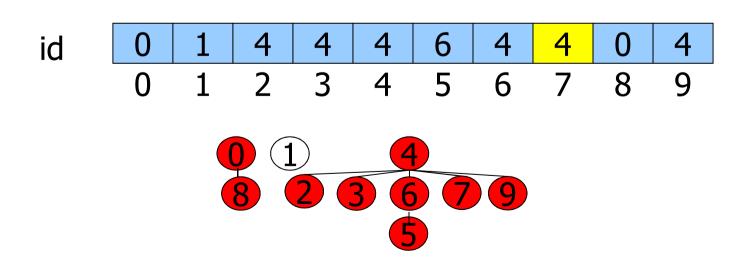


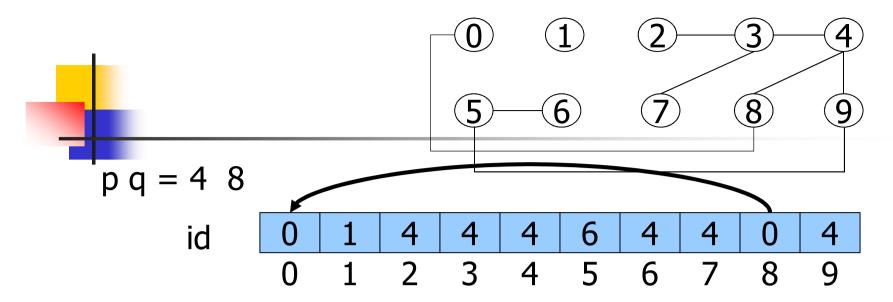
 $id[id[p]]=6 \neq id[id[q]]=4$ the smaller tree p points to the larger one q: id[id[p]]=4





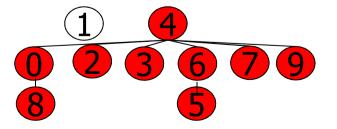
 $id[p]=7 \neq id[id[q]]=4$ the smaller tree p points to the larger one q: id[p]=4

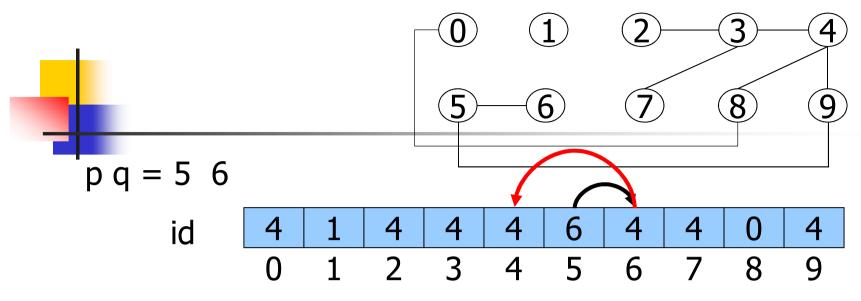




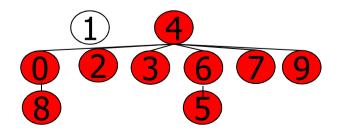
 $id[p]=4 \neq id[id[q]]=0$ the smaller tree q points to the larger one p: id[id[q]]=4

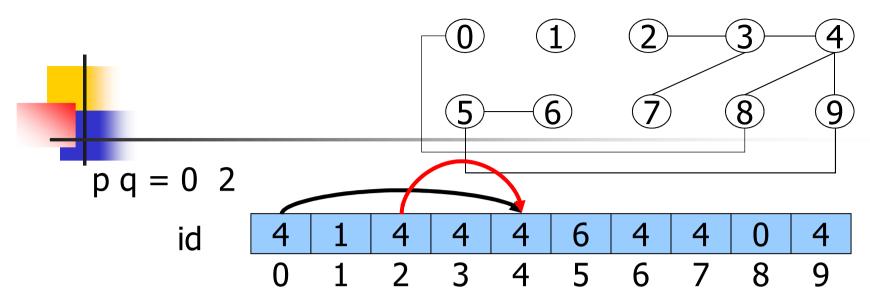


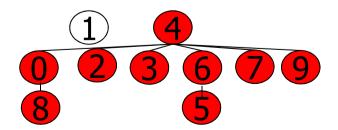


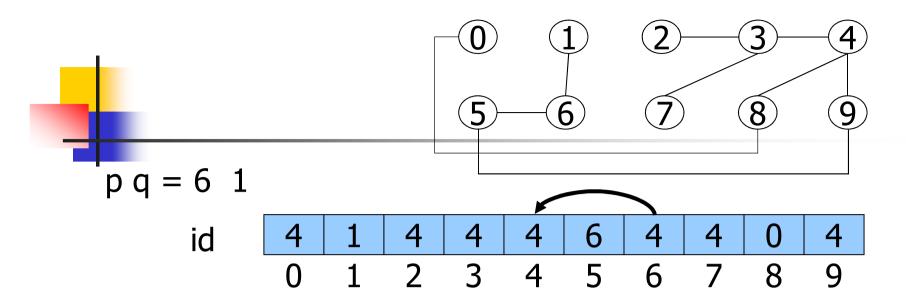


id[id[id[p]]]=4 = id[id[q]]=4
no change

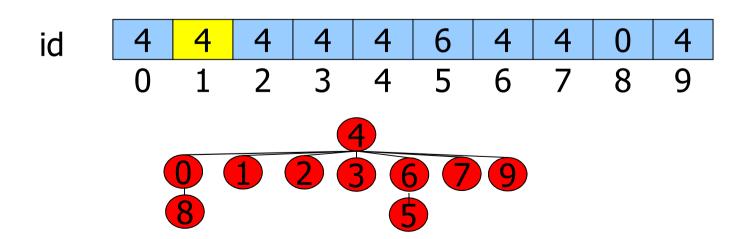








 $id[id[p]]=4 \neq id[q]=1$ the smaller tree q points to the larger one p: id[q]=4



```
int i, j, p, q, id[N], sz[N];
  for(i=0; i<N; i++) {
    id[i] = i: sz[i] = 1:
  printf("Input pair p q: ");
 while (scanf("%d %d", &p, &q) ==2) {
    for (i = p; i!= id[i]; i = id[i]);
    for (j = q; j!= id[j]; j = id[j]);
    if (i == j)
      printf("pair %d %d already connected\n", p,q);
    else {
       printf("pair %d %d not yet connected\n", p, q);
       if (sz[i] < sz[j]) {</pre>
         id[i] = j; sz[j] += sz[i];
       else {
          id[j] = i; sz[i] += sz[j];
```



### Find

 Scanning a "chain" of objects, cost at most logarithmic in the number of objects

#### Union

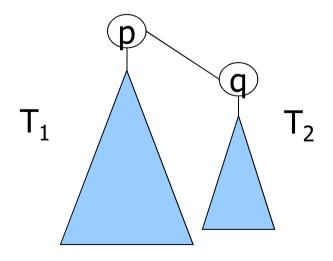
- Simple, because it is enough that an object points to another object, unit cost
- Globally the number of operations is bounded by

numb. of pairs \* "chain" length but chain length grows logarithmically!



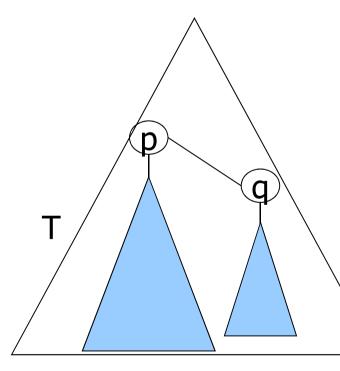
Why logarithmically?

What matters is the maximum distance between a node and the root. The distance increases by 1 when we connect a smaller tree (whose size is  $T_2$ ) to a larger tree (whose size is  $T_1$ ).



4

But if  $T_1 \ge T_2$  each time we connect a smaller tree to a larger one we generate a tree whose size T is at least twice as big as  $T_2$ .



If at each step the number of elements increases by at least a factor 2 and if there are N elements, after i steps there will be at least  $2^i$  elements.  $2^i \le N$  must, hold, thus  $i \le \log_2 N$