

Learning Algorithm: Application of Union Find in Undirected Graph Problems

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Structure

- Union Find
 - Naïve Version
 - Optimized Version
- Cycle Detection
- Kruskal's algorithm



Structure

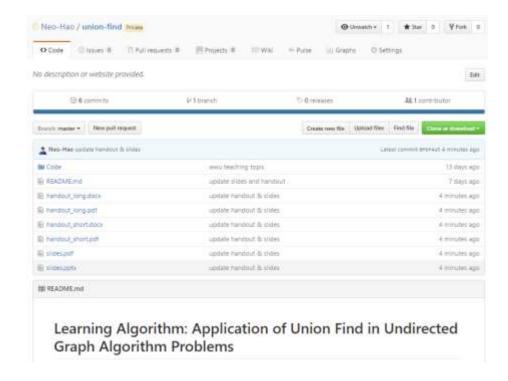
- Union Find
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Structure

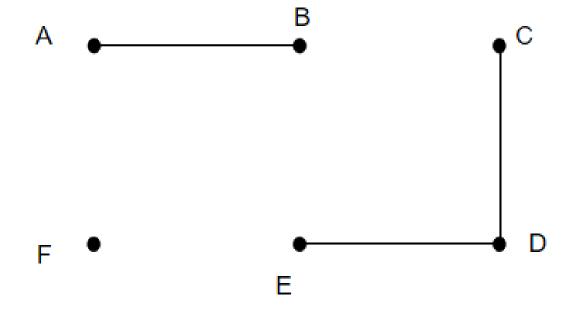
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https://github.com/Neo-Hao/union-find



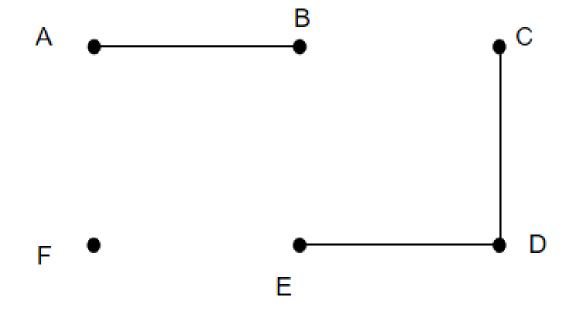


Data Structure





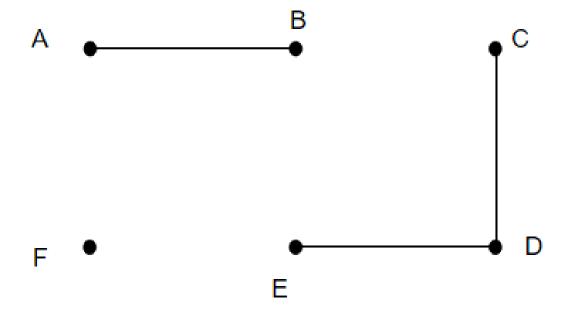
Data Structure



- makeSet
- union
- findSet



Data Structure

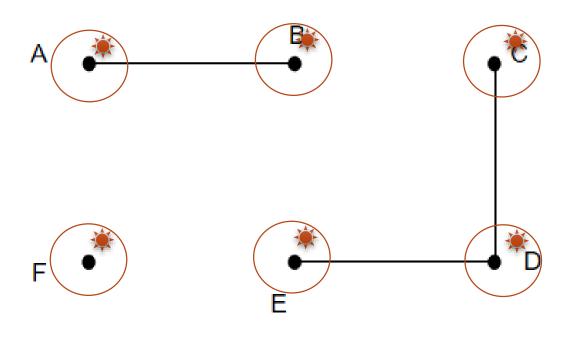


- 1. makeSet(A)
- 2. makeSet(B)
- makeSet(C)
- 4. makeSet(D)
- 5. makeSet(E)
- 6. makeSet(F)
- 7. union(A, B)
- 8. union(C, D)
- 9. union(E, D)
- 10. findSet(A) == findSet(D)





Data Structure



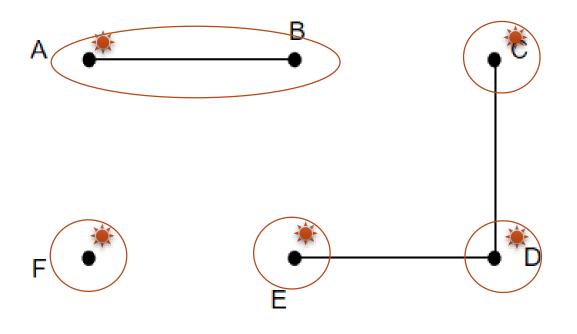
Given a graph, determine whether two vertices are somehow connected.

1. makeSet(A)

- 7. union(A, B)
- 8. union(C, D)
- 9. union(E, D)
- 10. findSet(A) == findSet(D)



Data Structure



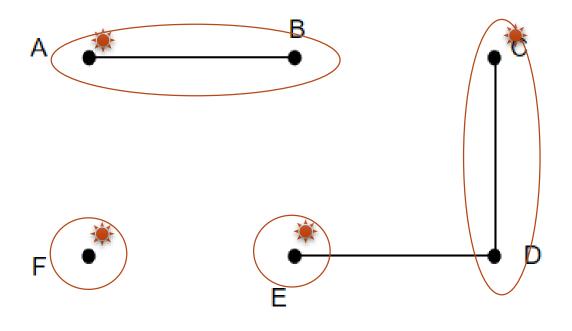
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Data Structure



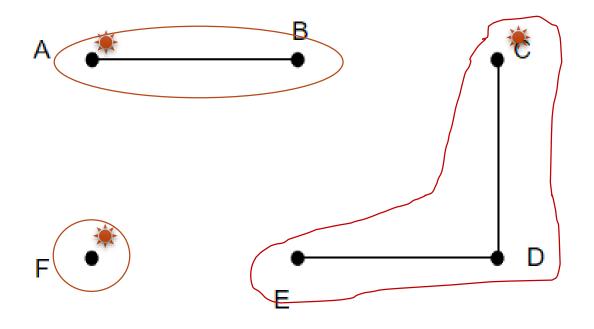
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Data Structure



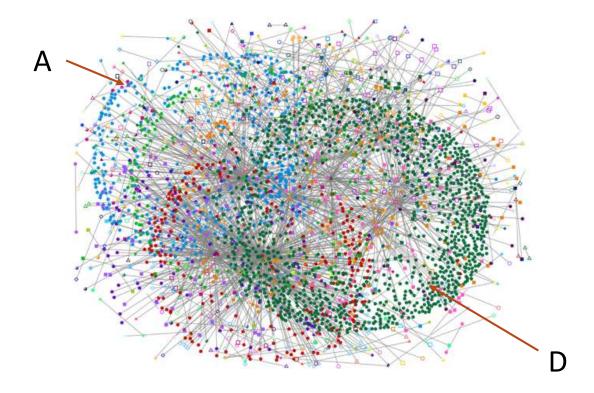
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1. makeSet(A)

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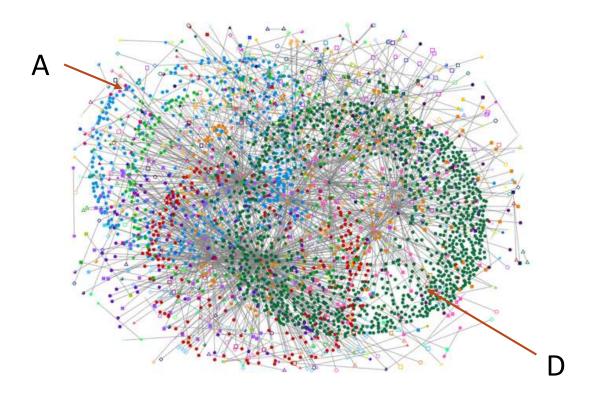


Data Structure





Data Structure



Given a graph, determine whether two vertices are somehow connected.

Application:

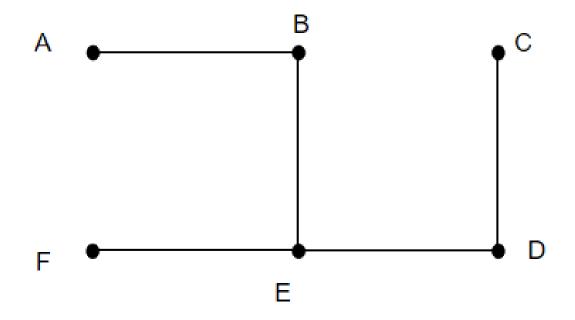
- Network security
- Social network analysis
- Image Processing



Approaches

- Naïve Union Find
- Optimized Union Find



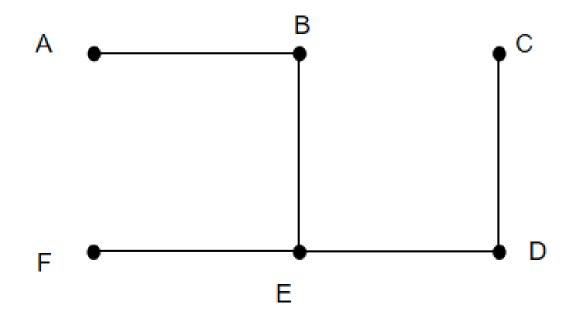


- makeSet
- union
- findSet

Node:

val parent





If the parent of a node is equal to itself, the node is a representative of a set.

- makeSet
- union
- findSet

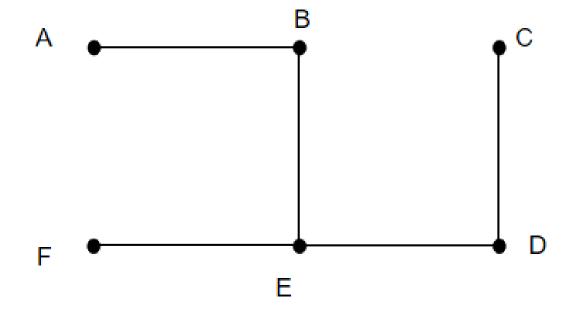
Node:

val

parent



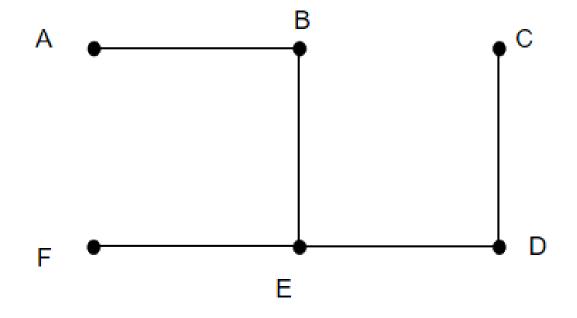
makeSet



```
makeSet(v):
    n = Node(v)
    n.parent = n
```



makeSet



n.parent = n

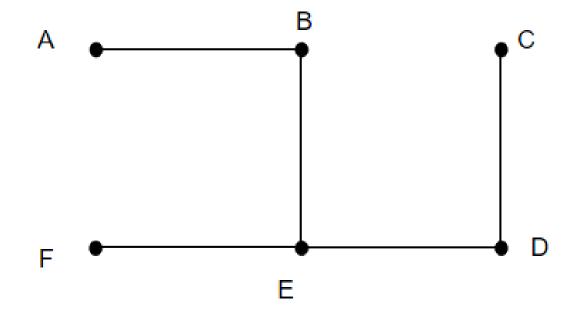
n = Node(v)

makeSet(v):

If the parent of a node is equal to itself, the node is a representative of a set.



makeSet

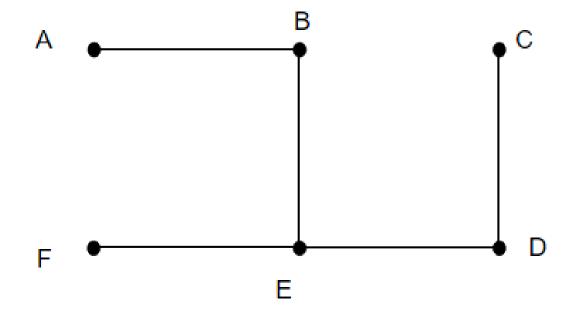


```
makeSet(v):
    n = Node(v)
    n.parent = n
```

Time Complexity ???



makeSet

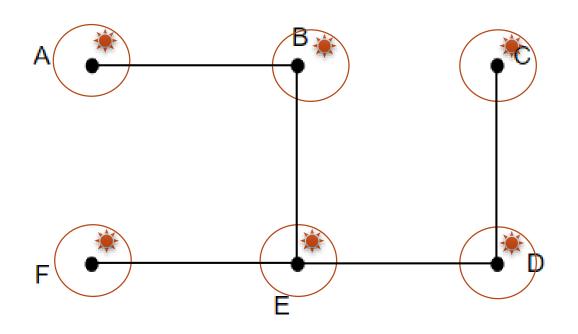


```
makeSet(v):
    n = Node(v)
    n.parent = n
```

Time Complexity O(1)



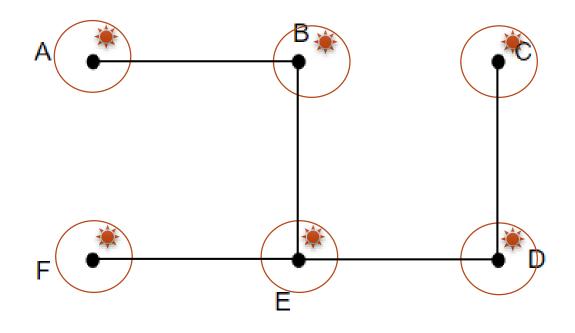
makeSet



```
makeSet(v):
    n = Node(v)
    n.parent = n
```

Time Complexity O(1)

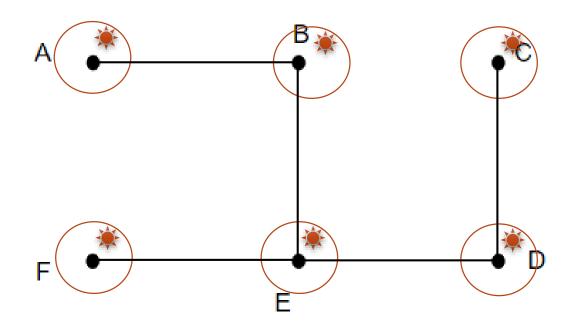




```
union(n1, n2):
    i = findSet(n1)
    j = findSet(n2)
    if i == j:
        return
    else:
        j.parent = i
```



union

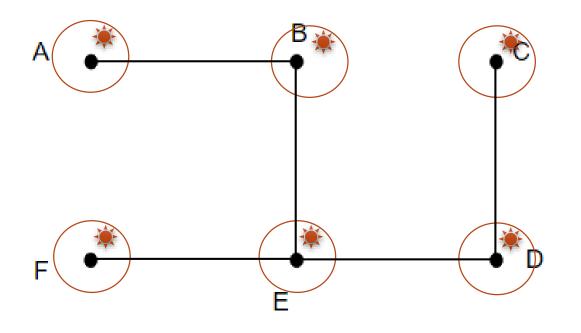


```
union(n1, n2):
    i = findSet(n1)
    j = findSet(n2)
    if i == j:
        return
    else:
        j.parent = i
```

What does it mean if i is equal to j?



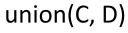
union



```
i = findSet(n1)
       j = findSet(n2)
       if i == j:
              return
       else:
              j.parent = i
union(A, B)
                    C.parent?
union(C, D)
union(F, E)
                    D.parent?
                    E.parent?
union(D, E)
union(B, E)
```

union(n1, n2):

union(A, B)

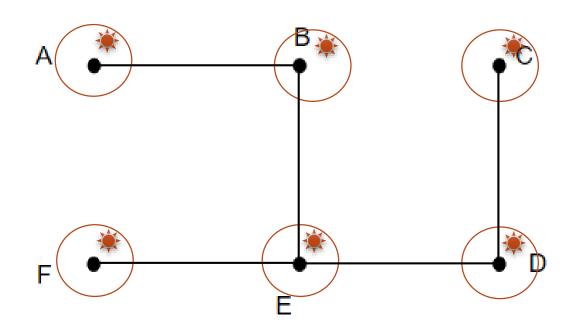


union(F, E)

union(D, E)

union(B, E)

Union Find – Naïve Version



```
union(n1, n2):
    i = findSet(n1)
    j = findSet(n2)
    if i == j:
        return
    else:
        j.parent = i
```



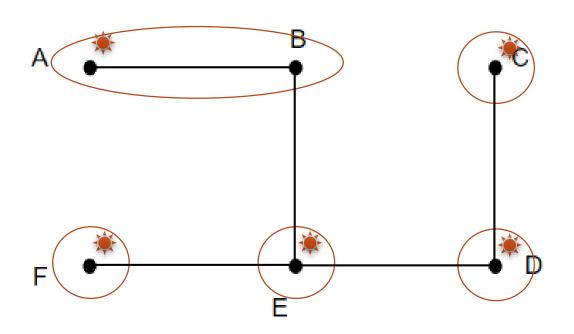
union(A, B)

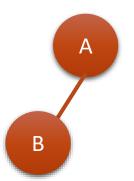
union(C, D)

union(F, E)

union(D, E)

union(B, E)







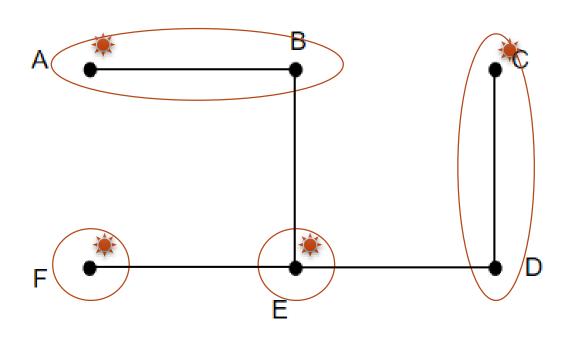


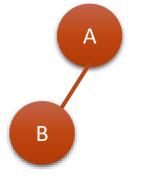
union(A, B)
union(C, D)

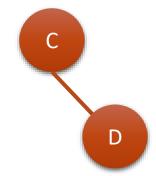


union(F, E)
union(D, E)

union(B, E)

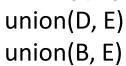




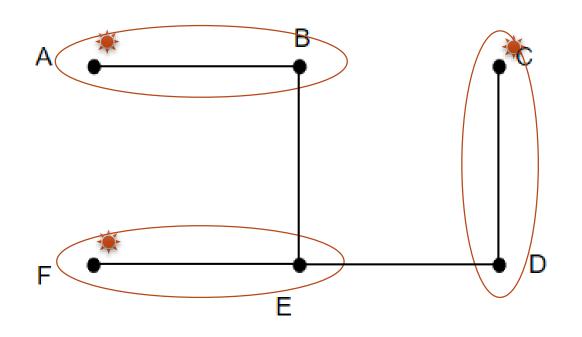


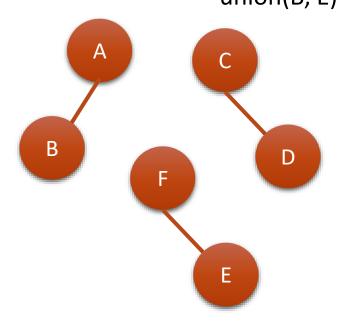


union(A, B) union(C, D) union(F, E)



A, B) C, D) F, E)

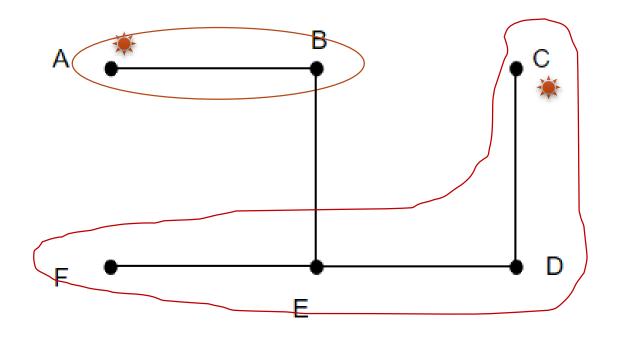


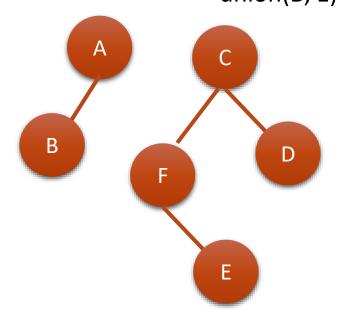




union(A, B)
union(C, D)
union(F, E)
union(D, E)
union(B, E)



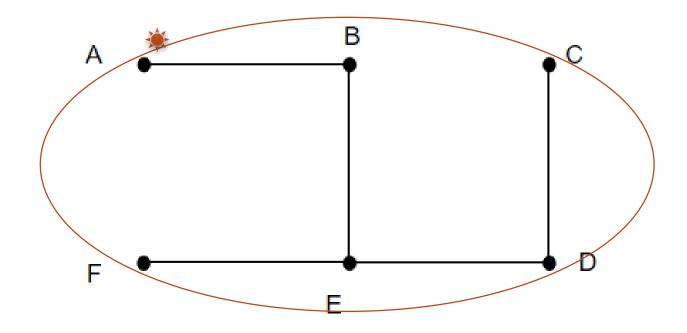


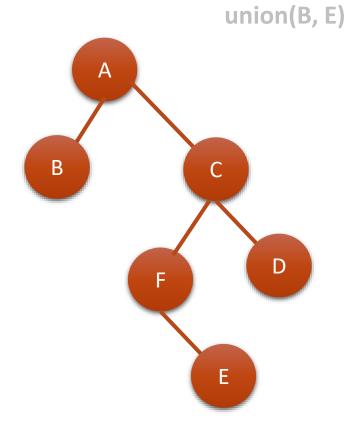




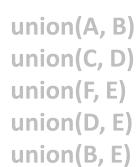
union(A, B)
union(C, D)
union(F, E)
union(D, E)



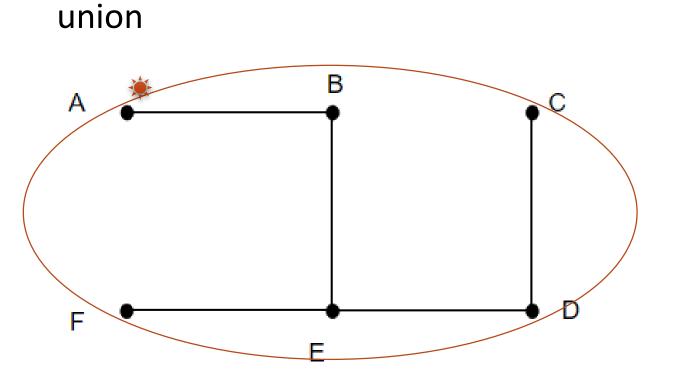


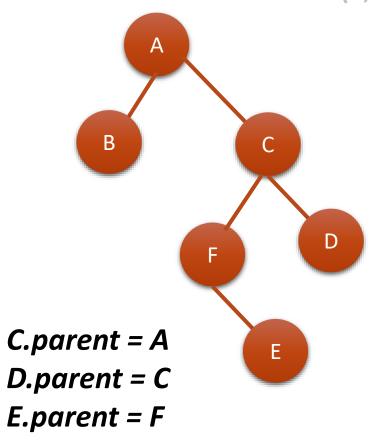




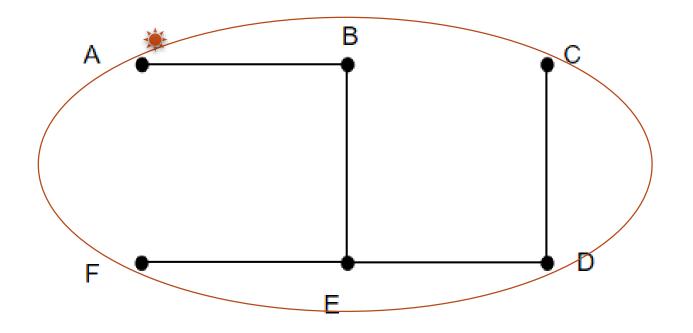








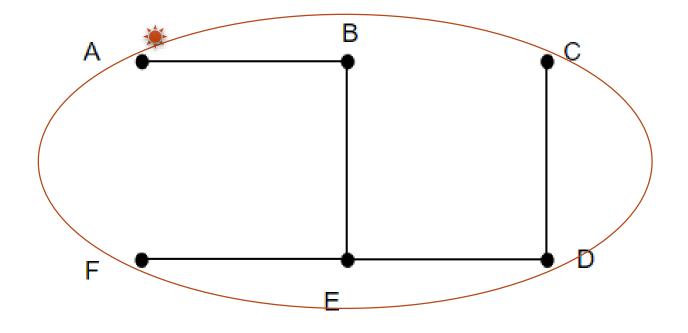




```
union(n1, n2):
    i = findSet(n1)
    j = findSet(n2)
    if i == j:
        return
    else:
        j.parent = i
```

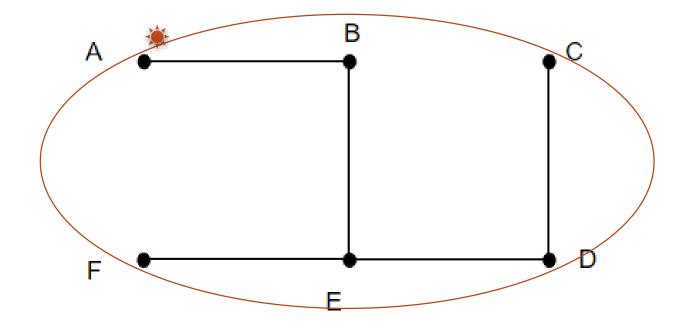
```
Time Complexity ???
```



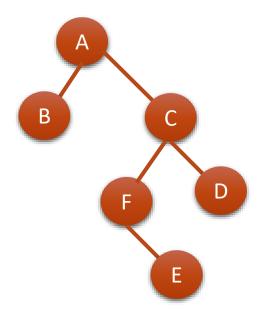


```
findSet(n):
    if n.parent == n:
        return n
    return findSet(n.parent)
```

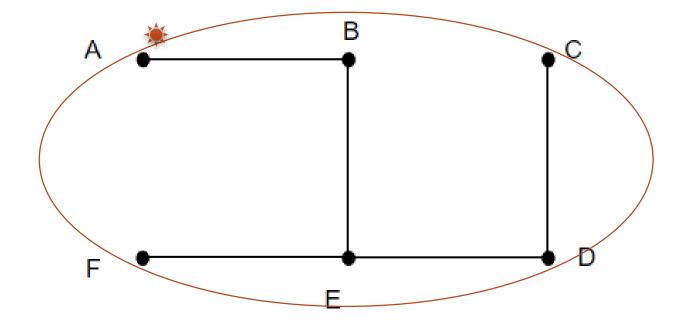




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findSet(n):
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    return findSet(n.parent)
```



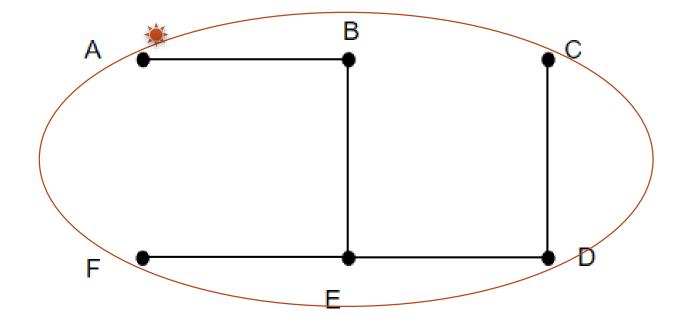




```
findSet(n):
    if n.parent == n:
        return n
    return findSet(n.parent)
```

```
Time Complexity ???
```





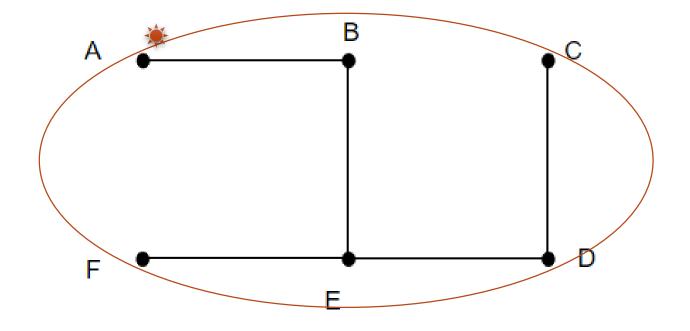
```
findSet(n):
    if n.parent == n:
        return n
    return findSet(n.parent)
```

```
Time Complexity O(n)
```



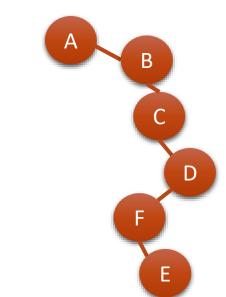
Union Find – Naïve Version

findSet



```
findSet(n):
    if n.parent == n:
        return n
    return findSet(n.parent)
```

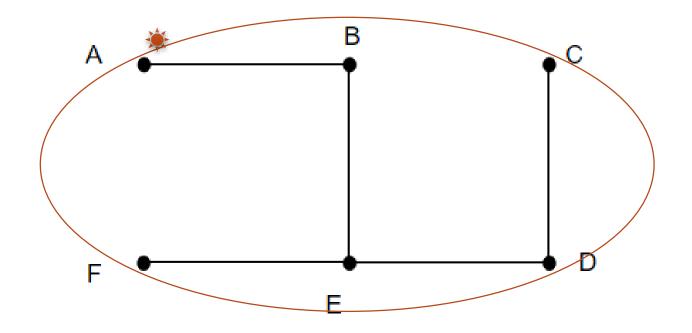
Time Complexity O(n)





Union Find – Naïve Version

union



```
union(n1, n2):
    i = findSet(n1)
    j = findSet(n2)
    if i == j:
        return
    else:
        j.parent = i
```

Time Complexity O(n)



Union Find

Approaches

- Naïve Union Find
 - makeSet O(1)
 - union O(n)
 - findSet O(n)

O(mn), where m stands for the number of operations



Structure

- Union Find
 - Naïve Version
 - Application
 - Optimized Version
- Cycle Detection
- Kruskal's algorithm





Given n nodes labeled from 0 to n - 1 and a list of undirected edges (each edge is a pair of nodes), write a function to find the number of connected components in an undirected graph.

Example 1:

Given n = 5 and edges = [[0, 1], [1, 2], [3, 4]], return 2.





Given n nodes labeled from 0 to n - 1 and a list of undirected edges (each edge is a pair of nodes), write a function to find the number of connected components in an undirected graph.

Example 2:

```
0 4
| | |
1-2-3
```

Given n = 5 and edges = [[0, 1], [1, 2], [2, 3], [3, 4]], return 1



Given n nodes labeled from 0 to n - 1 and a list of undirected edges (each edge is a pair of nodes), write a function to find the number of connected components in an undirected graph.

```
Example 2:
```

```
0 4
| |
1-2-3
```

```
def countComponents(n, edges):
    """
    :type n: int
    :type edges: List[List[int]]
    :rtype: int
    """
```

Given n = 5 and edges = [[0, 1], [1, 2], [2, 3], [3, 4]], return 1



```
Class Union(object):
    def __inint__(self):
        # ... ...
        self.count = 0

    def makeSet(self, v):
        # ... ...
        self.count += 1

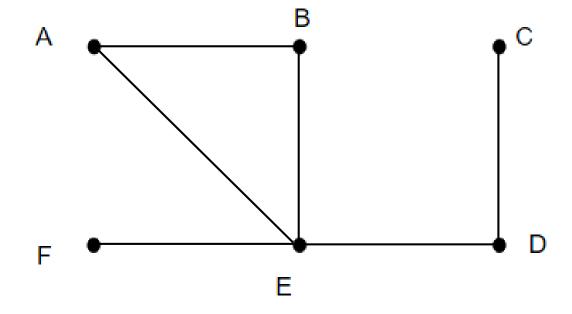
    def union(self, n1, n2):
        # ... ...
        self.count -= 1
```



```
Class Union(object):
       def __inint__(self):
              # ... ...
              self.count = 0
       def makeSet(self, v):
              # ... ...
                                              union(self, n1, n2):
              self.count += 1
                                                     i = findSet(n1)
                                                     j = findSet(n2)
       def union(self, n1, n2):
                                                     if i == j:
              # ... ...
              self.count -= 1
                                                            return
                                                     else:
                                                            j.parent = I
                                                     self.count -= 1
```



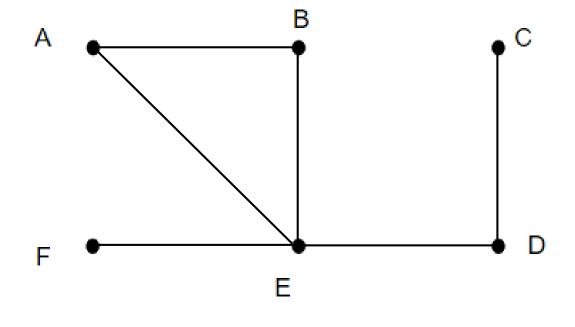




Input







Input

```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

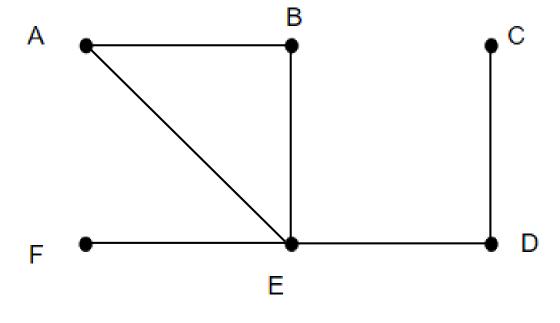
Part 1

```
makeSet(A)
makeSet(B)
.....
makeSet(F)
```

```
union(A, B)
union(B, E)
union(A, E)
```





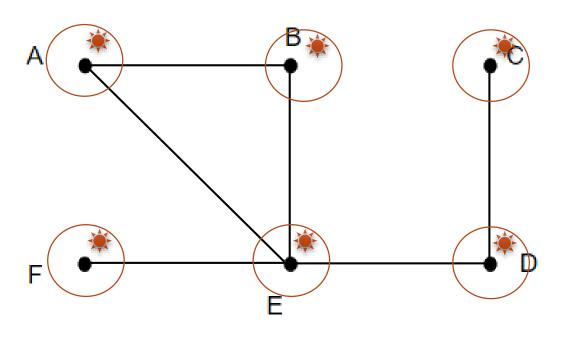


```
Input
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

```
Part 1
   makeSet(A)
   makeSet(B)
   makeSet(F)
                            Count = ?
Part 2
   union(A, B)
   union(B, E)
   union(A, E)
```







Input

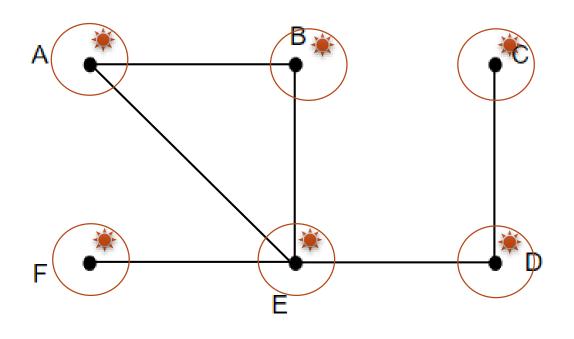
```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

Part 1

```
union(A, B)
union(B, E)
union(A, E)
```



Example of count



Input

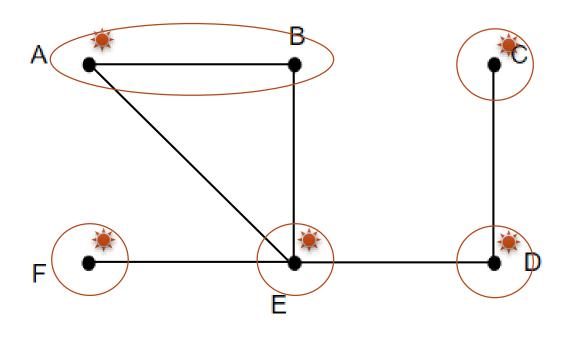
```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

Part 1

```
union(A, B) ——— Count = ?
union(B, E)
union(A, E)
```



Example of count



Input

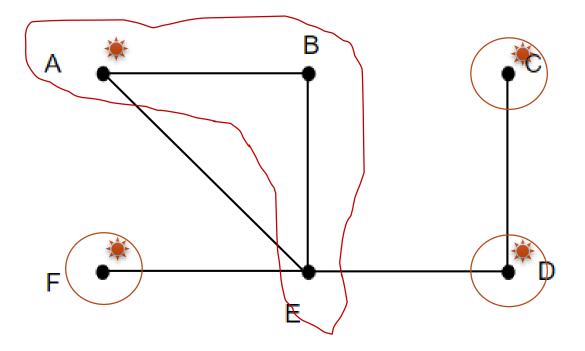
```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

Part 1

```
union(A, B) — Count = 5
union(B, E)
union(A, E)
```



Example of count



Input

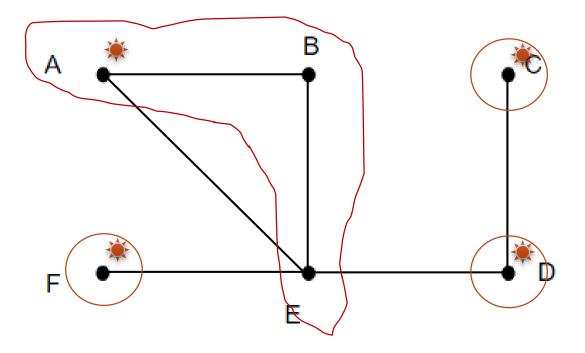
```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

Part 1

union(A, B)
$$\longrightarrow$$
 Count = 5
union(B, E) \longrightarrow Count = 4
union(A, E)



Example of count



Input

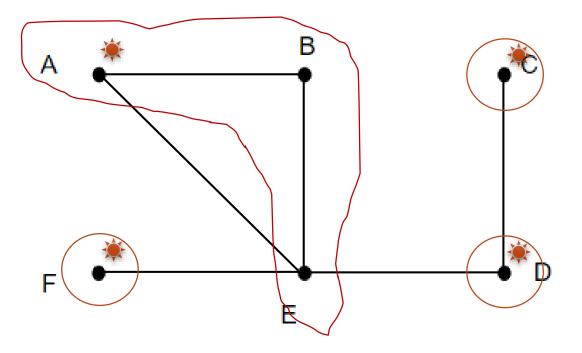
```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

Part 1

union(A, B)
$$\longrightarrow$$
 Count = 5
union(B, E) \longrightarrow Count = 4
union(A, E) \longrightarrow Count = ?



Example of count



Input

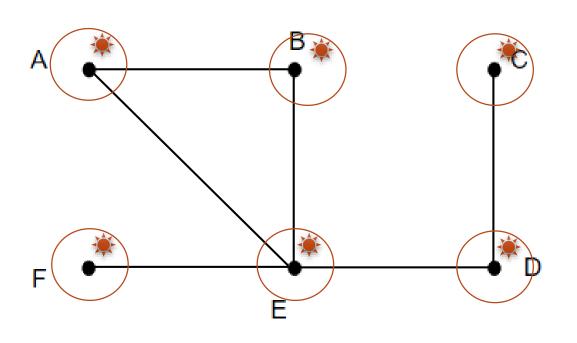
```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

Part 1

```
union(A, B) \longrightarrow Count = 5
union(B, E) \longrightarrow Count = 4
union(A, E) \longrightarrow Count = 4
```







Input

```
n = 6
[[A, B], [B, E], [A, E], [F, E], [E, D], [C, D]]
```

```
union(A, B)
union(B, E)
union(A, E)
union(F, E)
union(E, D)
union(C, D) 	count = 1
```



```
def countComponents(n, edges):
   # Step 1: initialize a union class obj
    union = Union()
   # Step 2: apply makeSet on every vertex
    for i in range(n):
        union.makeSet(i)
   # Step 3: apply union on every edge
    for i, j in edges:
        union.union(i, j)
    return union.count
```



Structure

- Union Find
 - Naïve Version
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 - Optimized Version
- Cycle Detection
- Kruskal's algorithm



Union Find

Approaches

Naïve Union Find – O(n)

O(mn), where m stands for the number of operations

Graph: 5000 vertices

Naïve union find: 5 operations

Max steps: 25000

A

Optimized Union Find – O(c)

O(m* a(n)), where m stands for the number of operations

Graph: 5000 vertices

Optimized union find: 5 operations

Max steps: 25

D



Goals:

- makeSet O(1)
- union O(n)
- findSet $O(n) \longrightarrow O(X)$

where x is a constant

O(X)



Optimizations:

- Union by rank
- Path compression



Optimizations:

Union by rank

```
Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:

merge A into B
```



Optimizations:

Union by rank

```
Rule for merging set A and B:

if A is larger or equal to B:

merge B into A
```

else:

merge A into B

Time Complexity:

- findSet(v) O(lg n)
- union(v) O(lg n)



Optimizations:

Union by rank

A, B, C, D, E, F, G, H

```
Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:
```

merge A into B



Optimizations:

Union by rank

Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:

merge A into B





Optimizations:

Union by rank

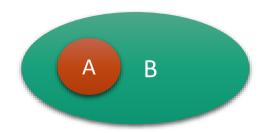
Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:

merge A into B





Optimizations:

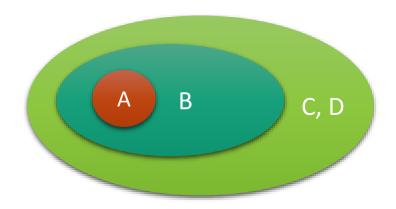
Union by rank

Rule for merging set A and B: if A is larger or equal to B:

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Optimizations:

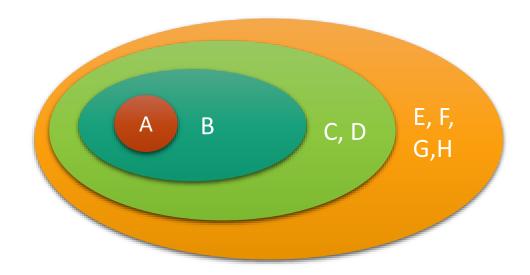
Union by rank

Rule for merging set A and B: if A is larger or equal to B:

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merge A into B





Optimizations:

Union by rank

Rule for merging set A and B:

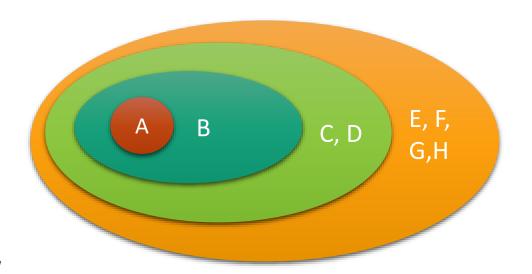
if A is larger or equal to B:

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A, B, C, D, E, F, G, H



How many times can a number starting from 1 double itself before reaching n? --- O(lg n)



Optimizations:

Union by rank

Rule for merging set A and B:

if A is larger or equal to B:

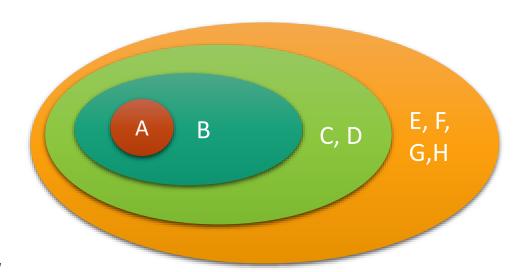
merge B into A

else:

merge A into B

How many times can a number starting from 1 double itself before reaching n? --- O(lg n)

A, B, C, D, E, F, G, H



findSet(v) - O(lg n) union(v) - O(lg n)



Optimizations:

Union by rank

```
Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:

merge A into B
```



Optimizations:

Union by rank

Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:

merge A into B

Node:

val parent

rank

makeSet(v):

n = Node(v)

n.parent = n

n.rank = 0



Optimizations:

Union by rank
 Rule for merging set A and B:

if A is larger or equal to B:

merge B into A

else:

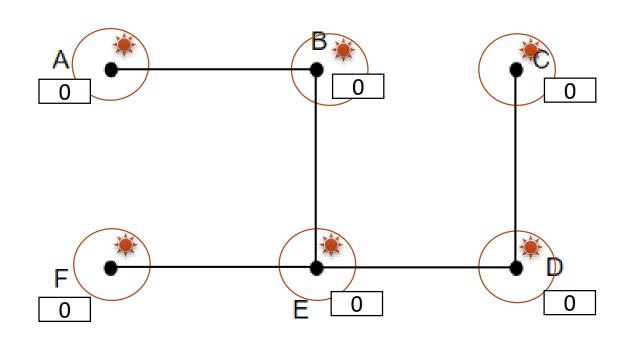
merge A into B

```
union(n1, n2):
    i = findSet(n1)
    j = findSet(n2)
    if i == j: return

if i.rank > j.rank:
        j.parent = i
    elif i.rank < j.rank:
        i.parent = j
    else:
        j.parent = i
    i.rank += 1</pre>
```



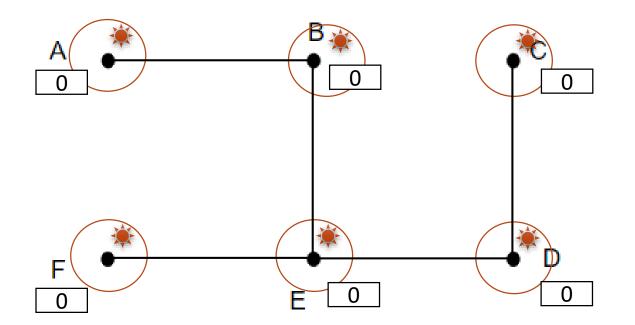
union



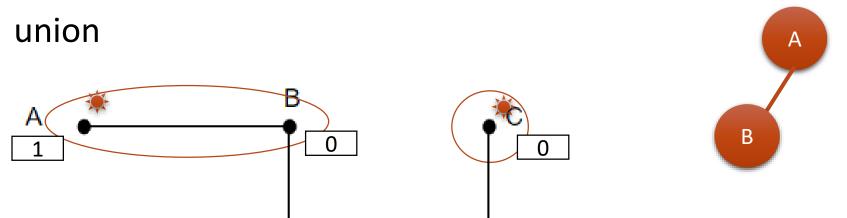
union(A, B) union(C, D) union(F, E) union(D, E) union(B, E)

n(A, B) n(C, D)

union



union(A, B) union(C, D) union(F, E) union(D, E) union(B, E)



union(A, B)

union(C, D) union(F, E) union(D, E) union(B, E)

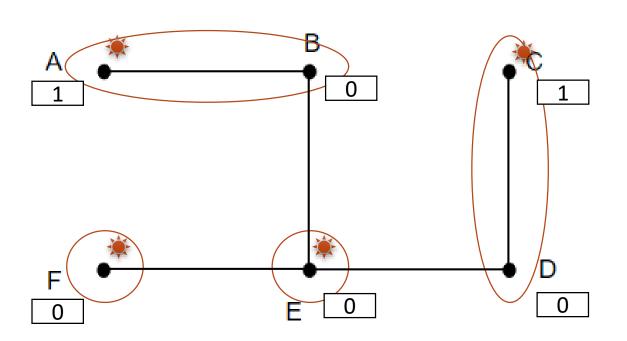


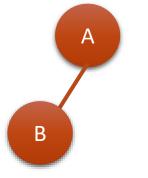
union(A, B)
union(C, D)

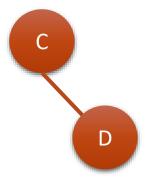


union(F, E) union(D, E) union(B, E)

union







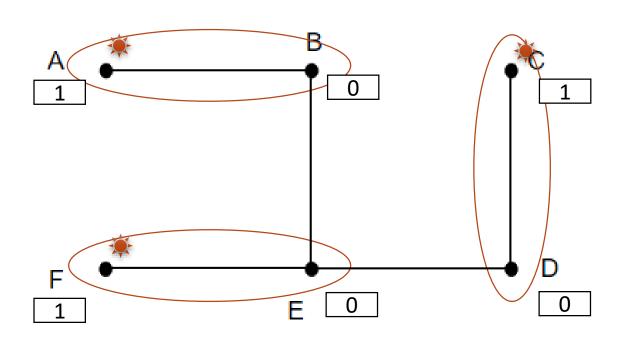


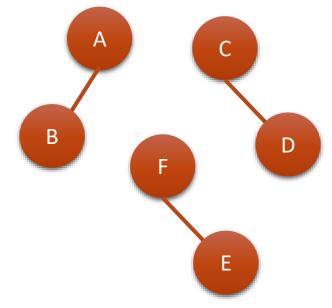
union(A, B) union(C, D) union(F, E)

union(D, E)

union(B, E)

union





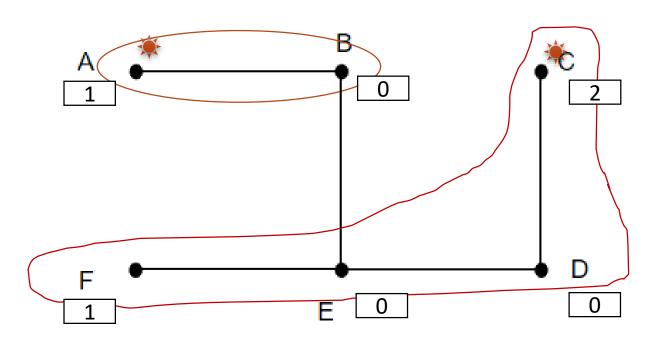


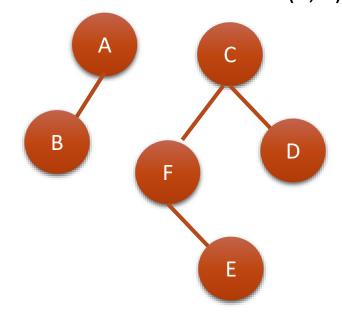


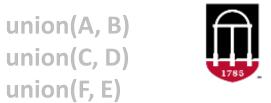
union(A, B) union(C, D) union(F, E) union(D, E) union(B, E)





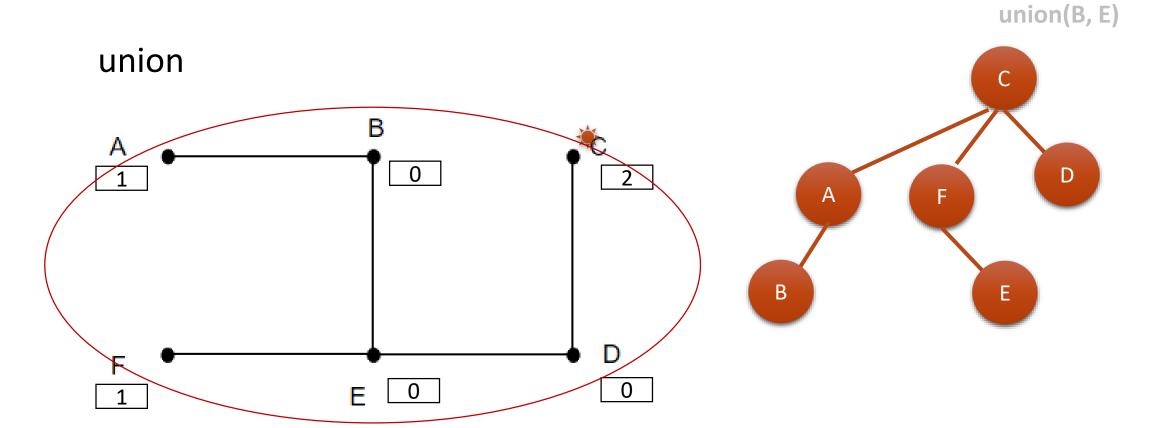






union(D, E)

Union Find – Optimized Version

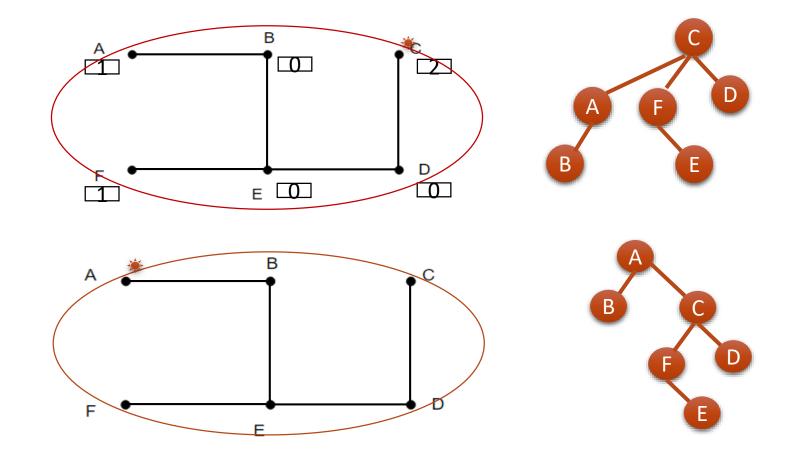




union(A, B)
union(C, D)
union(F, E)
union(D, E)
union(B, E)



union





Optimizations:

- Union by rank
- Path compression



Optimizations:

- Union by rank
- Path compression

Flatten the structure of the tree whenever *findSet* is used.



Optimizations:

- Union by rank
- Path compression

Flatten the structure of the tree whenever *findSet* is used.

```
findSet(n):
    if n.parent == n:
        return n
    return findSet(n.parent)

findSet(n):
    if n.parent != n:
        n.parent = findSet(n.parent)
    return n.parent
```



Amortized time per operation:

- O(a(n)), where a(n) is the inverse of the function n = f(x, x)
- f(x, x) is Ackermann function
- a(n) is less than 5 for all remotely practical values of n.

$$A(m,n) = egin{cases} n+1 & ext{if } m=0 \ A(m-1,1) & ext{if } m>0 ext{ and } n=0 \ A(m-1,A(m,n-1)) & ext{if } m>0 ext{ and } n=0 \end{cases}$$



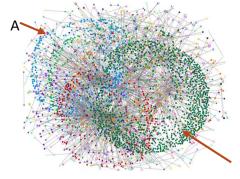
Union Find

Approaches

- Naïve Union Find
- Optimized Union Find

O(mn), where m stands for the number of operations

O(m* a(n)), where m stands for the number of operations



Graph: 5000 vertices

Naïve union find: 5 operations

Max steps: 25000

A

Graph: 5000 vertices

Optimized union find: 5 operations

Max steps: 25

В

Е



Structure

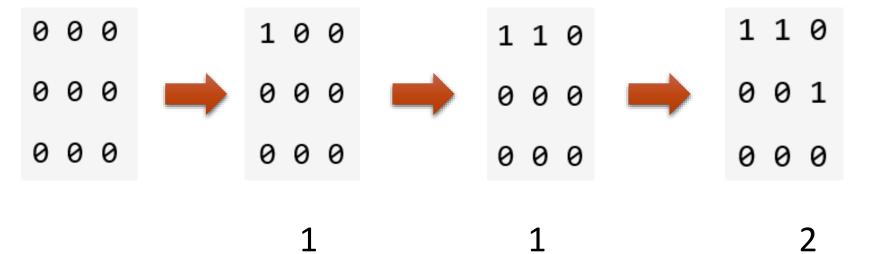
- Union Find
 - Naïve Version
 - Application
 - Optimized Version
 - Application
- Cycle Detection
- Kruskal's algorithm



A 2d grid map of m rows and n columns is initially filled with water. We may perform an *addLand* operation which turns the water at position (row, col) into a land. Given a list of positions to operate, count the number of islands after each *addLand* operation. An island is surrounded by water and is formed by connecting adjacent lands horizontally or vertically. You may assume all four edges of the grid are all surrounded by water.



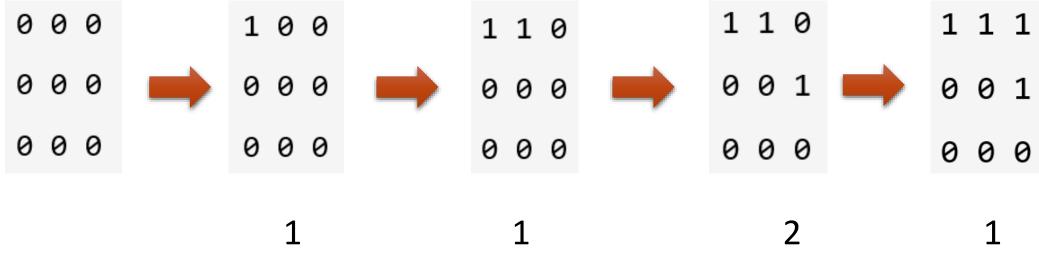
Given m = 3, n = 3, positions = [[0,0], [0,1], [1,2], [2,1]].



Return [1, 1, 2]



Given m = 3, n = 3, positions = [[0,0], [0,1], [1,2], [2,1]].



Return [1, 1, 2, 1]



	1	
0	1	1
	0	

(1, 1)



	1	
0	1	1
	0	

(1, 1) Neighbors: (0, 1), (2, 1), (1, 0), (1, 2)



	1	
0	1	1
	0	

(1, 1)
Neighbors: (0, 1), (2, 1), (1, 0), (1, 2)
(x, y)



	1	
0	1	1
	0	

(1, 1)

Neighbors: (0, 1), (2, 1), (1, 0), (1, 2)

(x, y)

Neighbors: (x-1, y), (x+1, y), (x, y+1), (x, y-1)



```
def numIslands2(self, m, n, positions):
       islands = Union()
       result = []
       for i, j in positions:
              islands.makeSet((i,j))
              neighbors = [(i+1,j), (i-1,j), (i,j+1), (i,j-1)]
              for x, y in neighbors:
                   if (x,y) in islands.table:
                        islands.union((x,y),(i,j))
              result.append(islands.count)
        return result
```



Structure

- Union Find
 - Naïve Version
 - Application
 - Optimized Version
 - Application
- Cycle Detection
- Kruskal's algorithm

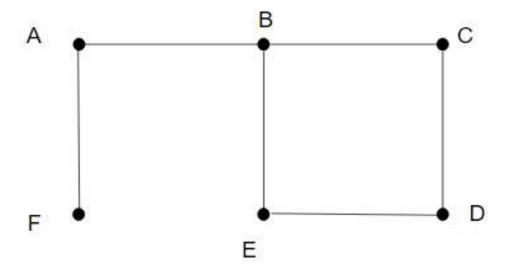




Cycle detection refers to the algorithmic problem of finding a cycle in a sequence of iterated function values.



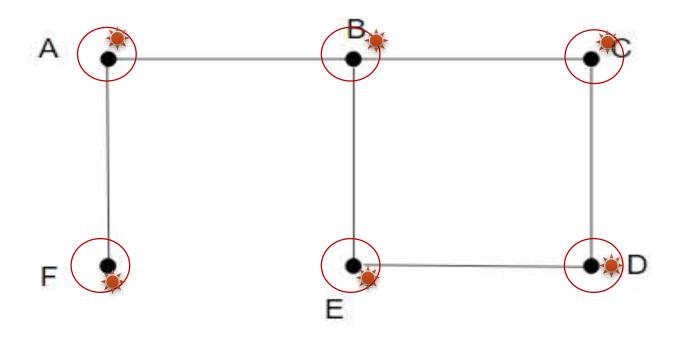
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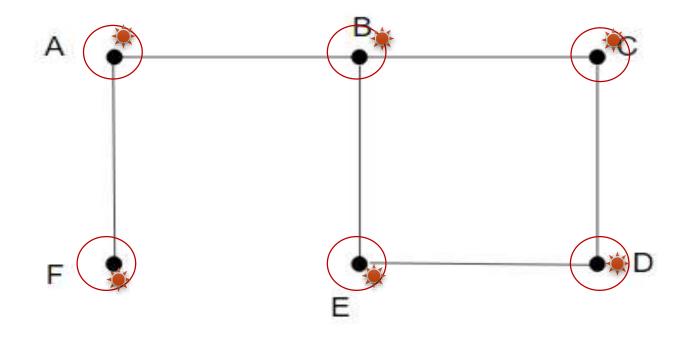
```
cycleDetect(G):
    foreach v ∈ G.V:
        MAKE-SET(v)
    foreach (u, v) in G.E:
        if FIND-SET(u) ≠ FIND-SET(v):
            UNION(u, v)
        else:
            return True
    return False
```





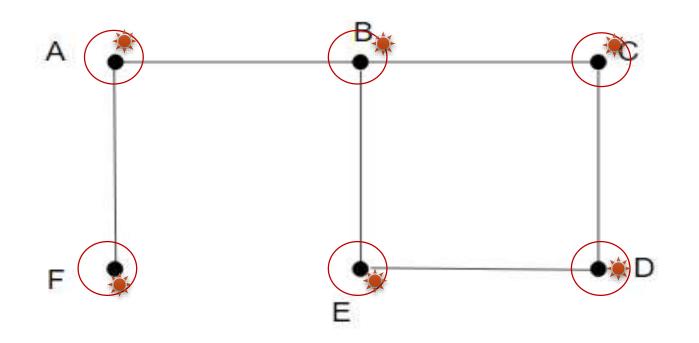


AF, AB, CD, DE, BC, BE





AF, AB, CD, DE, BC, BE

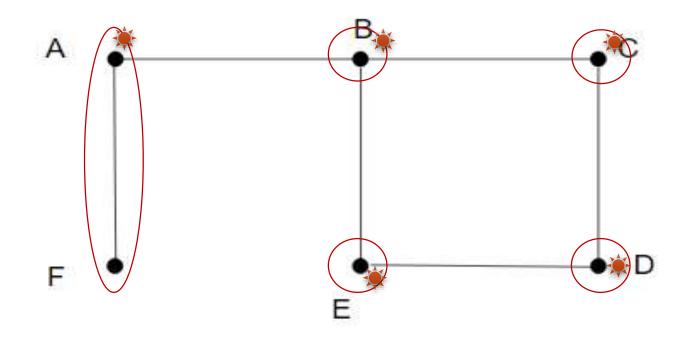


findSet(A) findSet(F)

AF



AF, AB, CD, DE, BC, BE

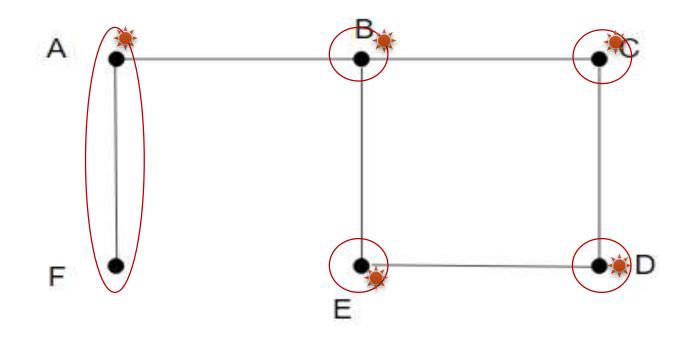


findSet(A) findSet(F)

AF



AF, AB, CD, DE, BC, BE

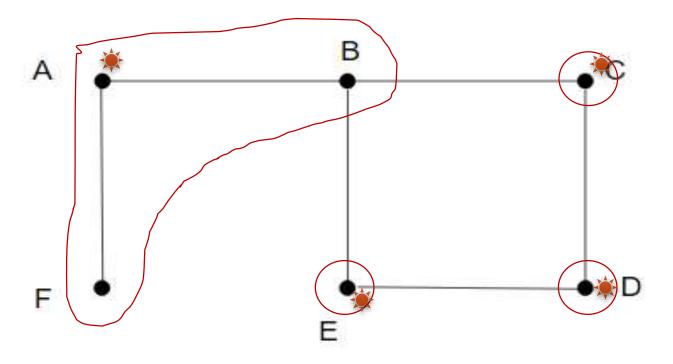


AB

findSet(A) findSet(B)



AF, AB, CD, DE, BC, BE

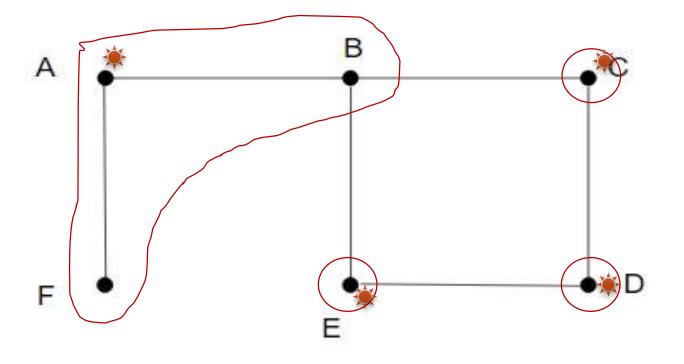


AB

findSet(A) findSet(B)



AF, AB, CD, DE, BC, BE

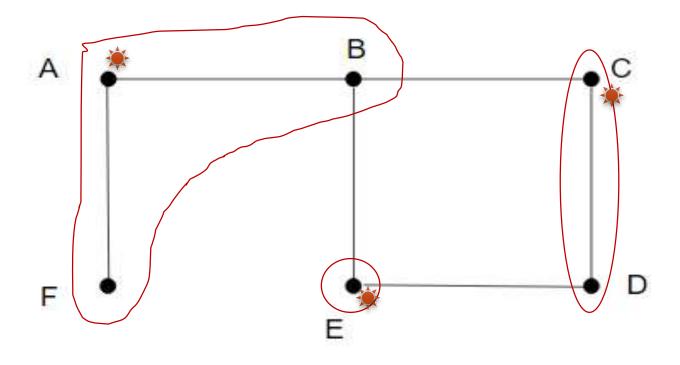


CD

findSet(C) findSet(D)



AF, AB, CD, DE, BC, BE

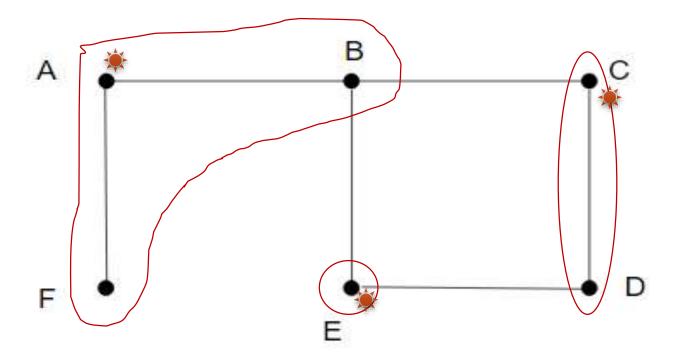


CD

findSet(C) findSet(D)



AF, AB, CD, DE, BC, BE

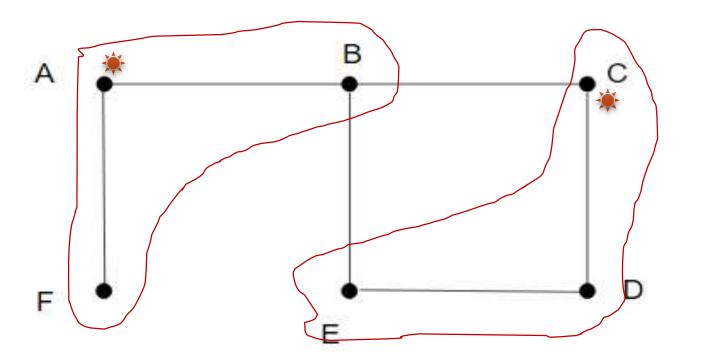


DE

findSet(D) findSet(E)



AF, AB, CD, DE, BC, BE

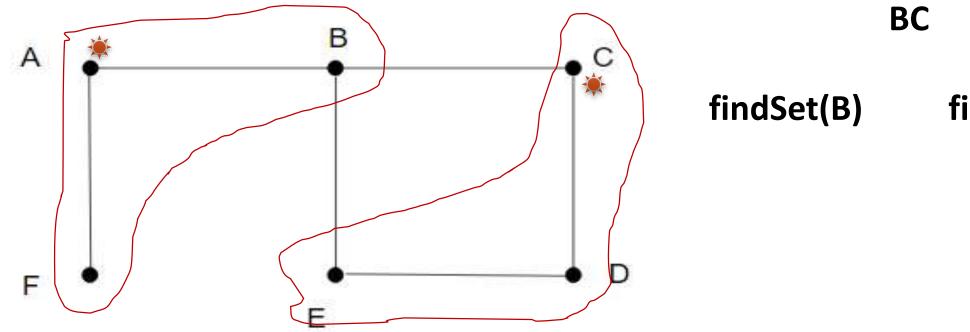


DE

findSet(D) findSet(E)



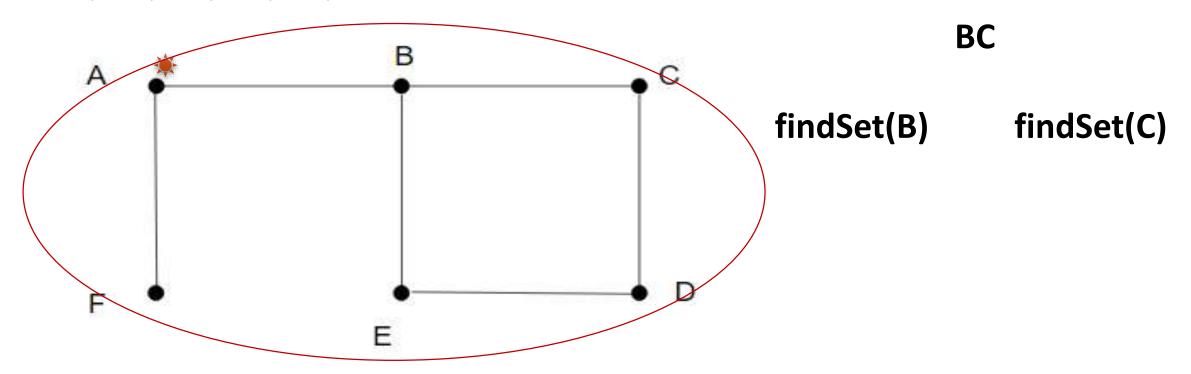
AF, AB, CD, DE, BC, BE



findSet(C)

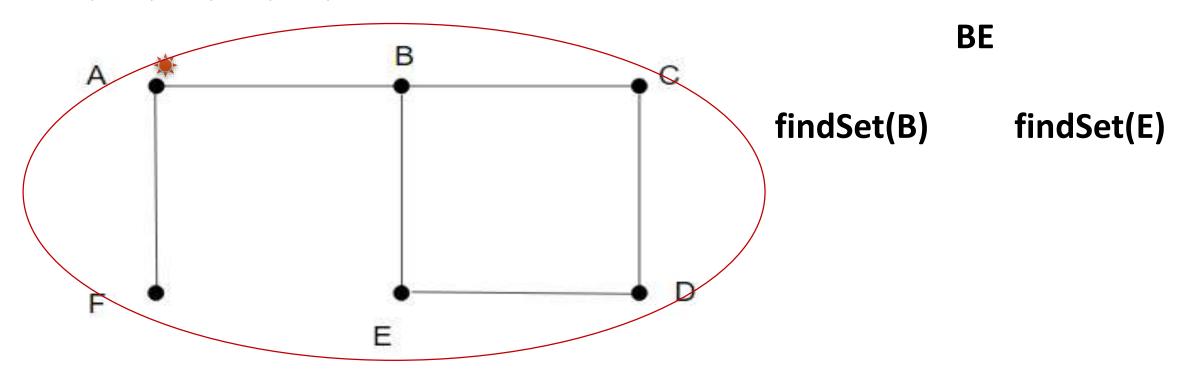


AF, AB, CD, DE, BC, BE



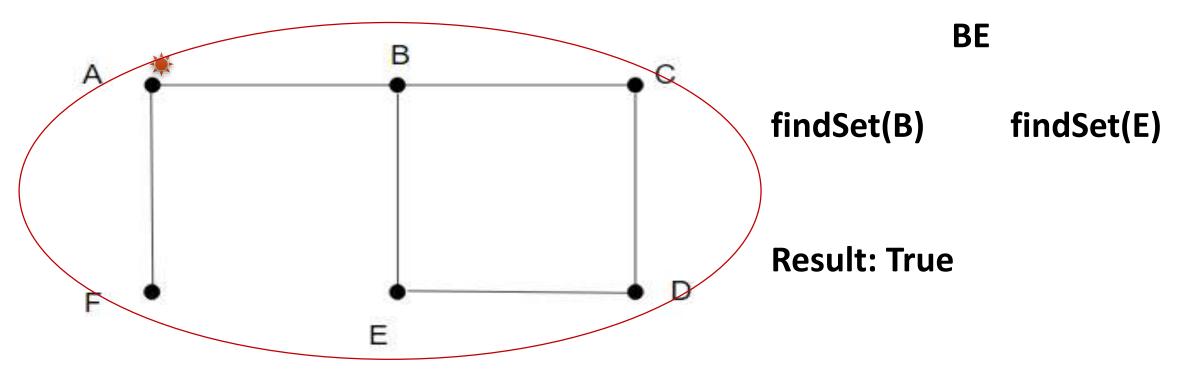


AF, AB, CD, DE, BC, BE





AF, AB, CD, DE, BC, BE





Cycle Detection – Time Complexity

```
cycleDetect(G):
   foreach v \in G.V:
       MAKE-SET(v)
   foreach (u, v) in G.E:
       if FIND-SET(u) ≠ FIND-SET(v):
           UNION(u, v)
       else:
           return True
   return False
```



Cycle Detection – Time Complexity

```
cycleDetect(G):
   foreach v \in G.V:
       MAKE-SET(v)
                                                                      O(V)
   foreach (u, v) in G.E:
                                                                      O(E)
       if FIND-SET(u) ≠ FIND-SET(v):
           UNION(u, v)
       else:
           return True
                                                                      TOTAL:
   return False
                                                                      O(V) + O(E)
```



Cycle Detection – Time Complexity

```
cycleDetect(G):
   foreach v \in G.V:
       MAKE-SET(v)
                                                                      O(V)
   foreach (u, v) in G.E:
                                                                      O(E)
       if FIND-SET(u) ≠ FIND-SET(v):
           UNION(u, v)
       else:
           return True
                                                                      TOTAL:
   return False
                                                                      O(V)
```



Structure

- Union Find
 - Naïve Version
 - Application
 - Optimized Version
 - Application
- Cycle Detection
 - Application
- Kruskal's algorithm



Given n nodes labeled from 0 to n - 1 and a list of undirected edges (each edge is a pair of nodes), write a function to check whether these edges make up a valid tree.

For example:

Given n = 5 and edges = [[0, 1], [0, 2], [0, 3], [1, 4]], return true.

Given n = 5 and edges = [[0, 1], [1, 2], [2, 3], [1, 3], [1, 4]], return false.



Given n nodes labeled from 0 to n - 1 and a list of undirected edges (each edge is a pair of nodes), write a function to check whether these edges make up a valid tree.

For example:

```
Given n = 5 and edges = [[0, 1], [0, 2], [0, 3], [1, 4]], return true.
```

Given n = 5 and edges = [[0, 1], [1, 2], [2, 3], [1, 3], [1, 4]], return false.

```
def validTree(self, n, edges):
    """
    :type n: int
    :type edges: List[List[int]]
    :rtype: bool
    """
```



Valid Tree:

- 1. If there are n nodes, there must be n-1 edges.
- 2. There is no loop.



```
def validTree(self, n, edges):
    if len(edges) != n-1: return False
    union = Union()
    for u, v in edges:
        union.makeSet(u)
        union.makeSet(v)
    for u, v in edges:
        if union.findSet(u) == union.findSet(v):
            return False
        else:
            union.union(u, v)
    return True
```



Structure

- Union Find
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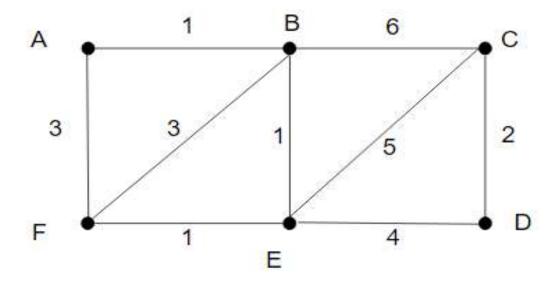
Weighted Graph:

A weighted graph refers to an edge-weighted graph, where edges have weights or values.



• Weighted Graph:

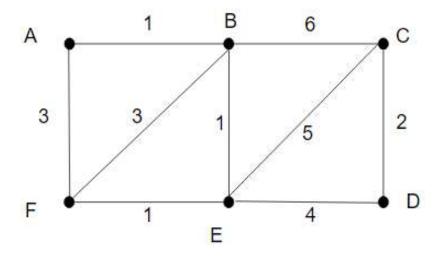
A weighted graph refers to an edge-weighted graph, where edges have weights or values.





Minimum Spanning Tree:

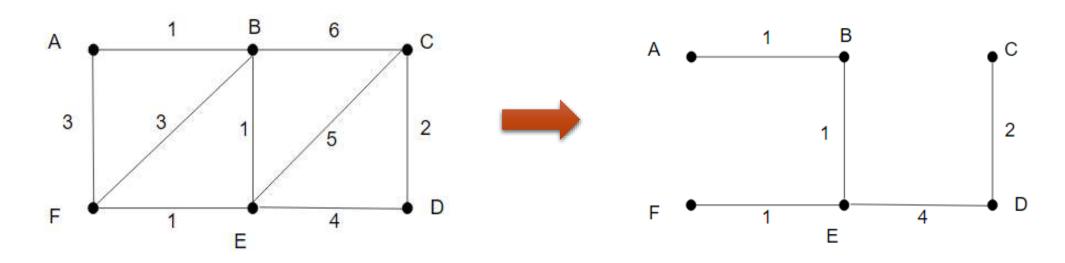
A minimum spanning tree is a subset of the edges of a connected, edgeweighted graph that connects all the vertices together, without any cycles and with the minimum possible total edge weight.





Minimum Spanning Tree:

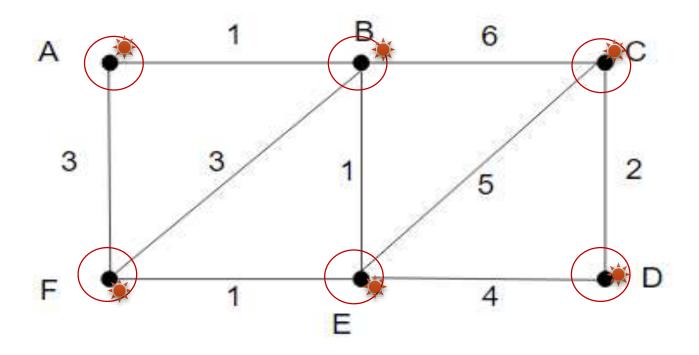
A minimum spanning tree is a subset of the edges of a connected, edgeweighted graph that connects all the vertices together, without any cycles and with the minimum possible total edge weight.





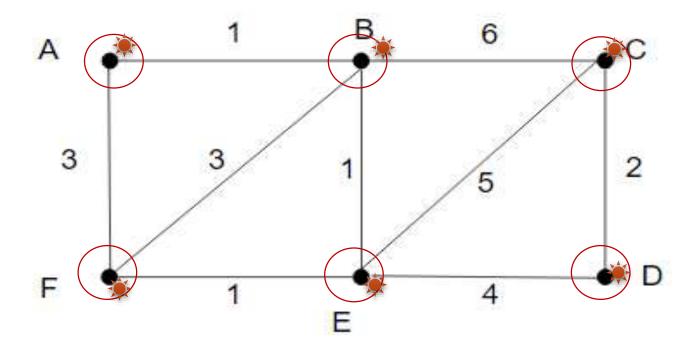
```
KRUSKAL(G):
    Result = \emptyset
    foreach v \in G.V:
        MAKE-SET(v)
    foreach (u, v) in G.E ordered by increasing order of weight(u, v):
        if FIND-SET(u) \neq FIND-SET(v):
            Result = Result \cup \{(u, v)\}
            UNION(u, v)
    return Result
```





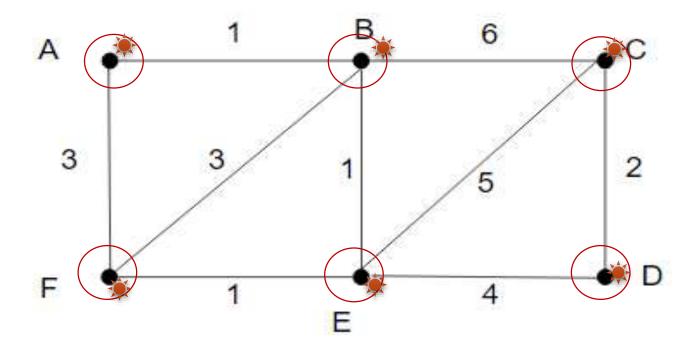


AB, BE, EF, CD, BF, DE, CE, BC



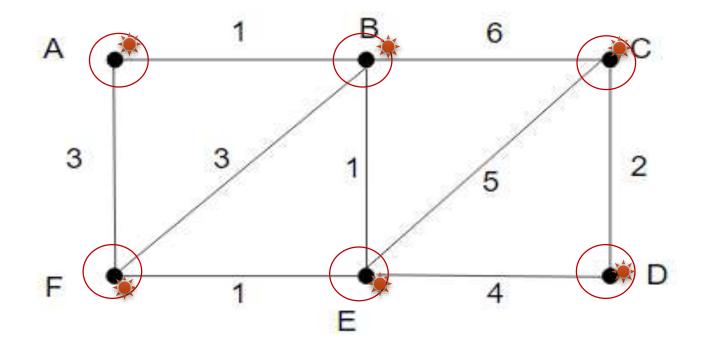


AB, BE, EF, CD, BF, DE, CE, BC





AB, BE, EF, CD, BF, DE, CE, BC

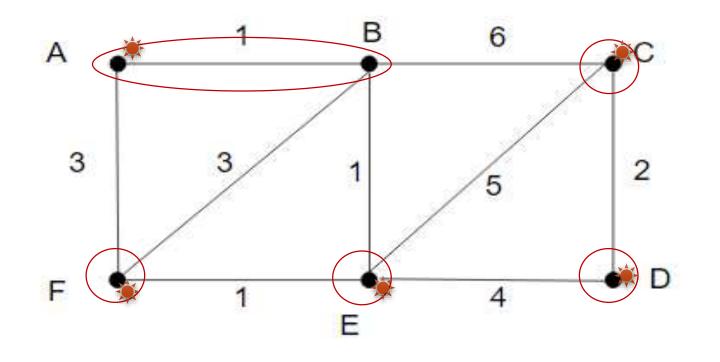


AB

findSet(A) findSet(B)



AB, BE, EF, CD, BF, DE, CE, BC



AB

findSet(A) findSet(B)

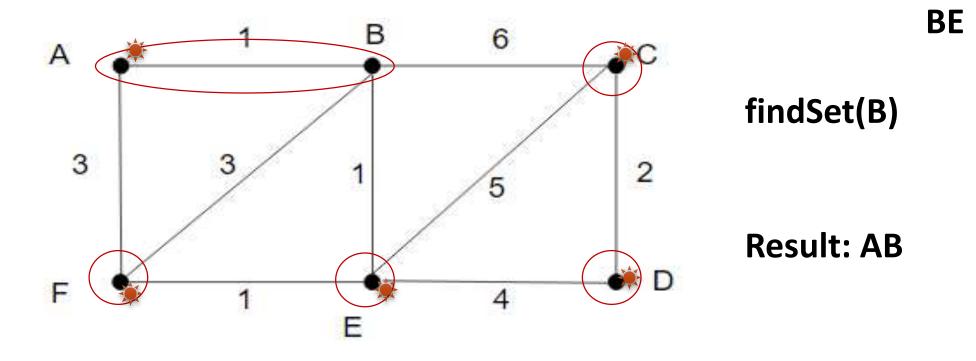
Result: AB



findSet(E)

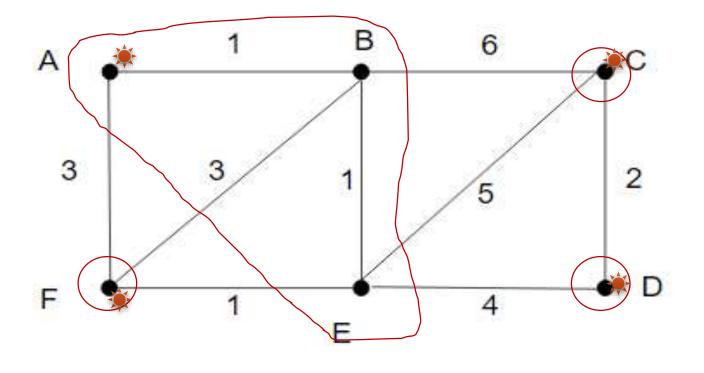
Kruskal's algorithm – Step 3

AB, BE, EF, CD, BF, DE, CE, BC





AB, BE, EF, CD, BF, DE, CE, BC



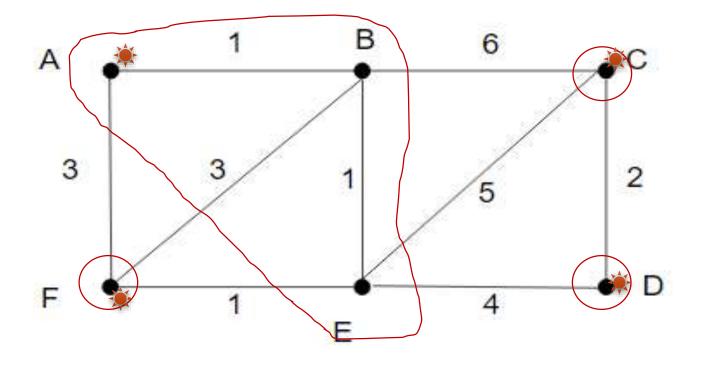
BE

findSet(B) findSet(E)

Result: AB, BE



AB, BE, EF, CD, BF, DE, CE, BC



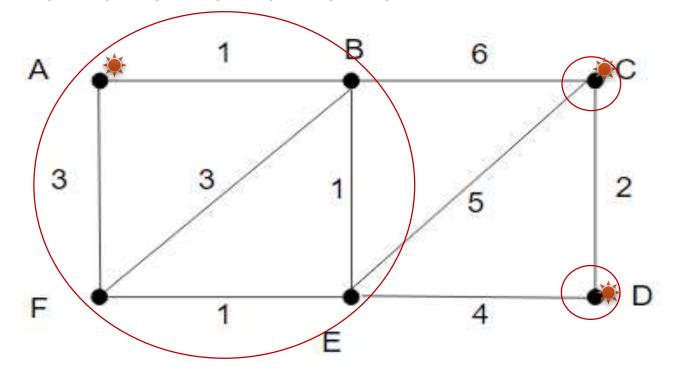
EF

findSet(E) findSet(F)

Result: AB, BE



AB, BE, EF, CD, BF, DE, CE, BC



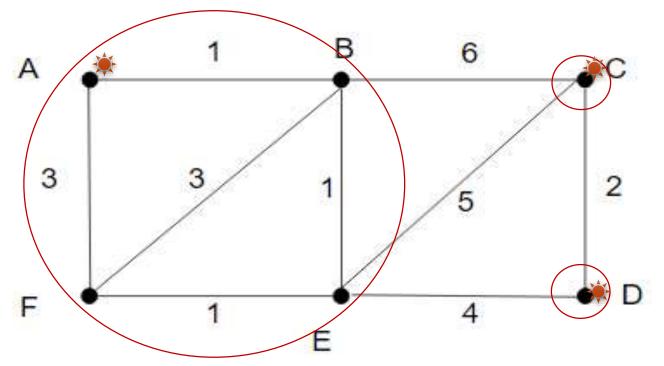
EF

findSet(E) findSet(F)

Result: AB, BE, EF



AB, BE, EF, CD, BF, DE, CE, BC



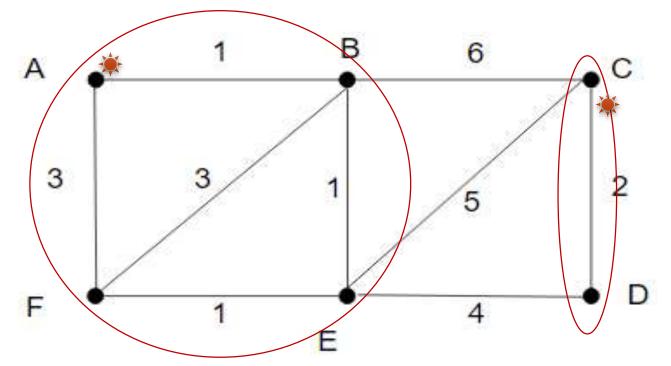
CD

findSet(C) findSet(D)

Result: AB, BE, EF



AB, BE, EF, CD, BF, DE, CE, BC



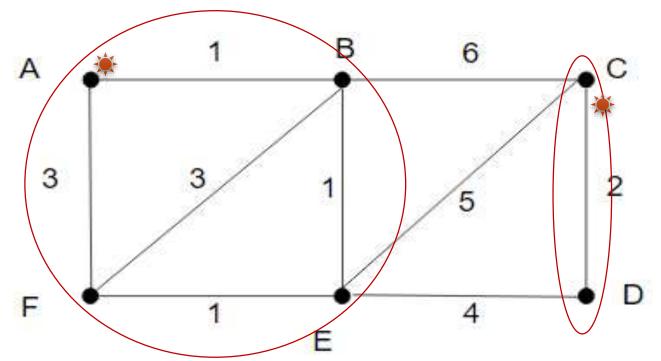
CD

findSet(C) findSet(D)

Result: AB, BE, EF, CD



AB, BE, EF, CD, BF, DE, CE, BC



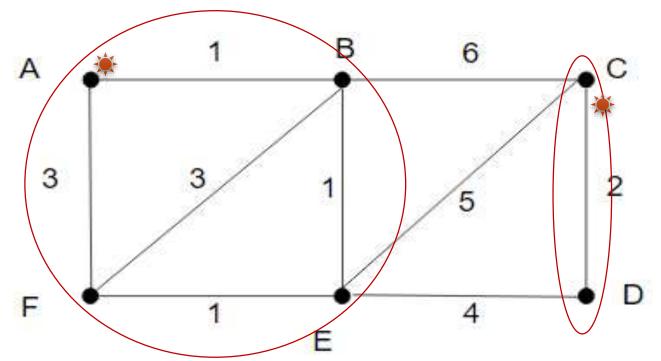
BF

findSet(B) findSet(F)

Result: AB, BE, EF, CD



AB, BE, EF, CD, BF, DE, CE, BC



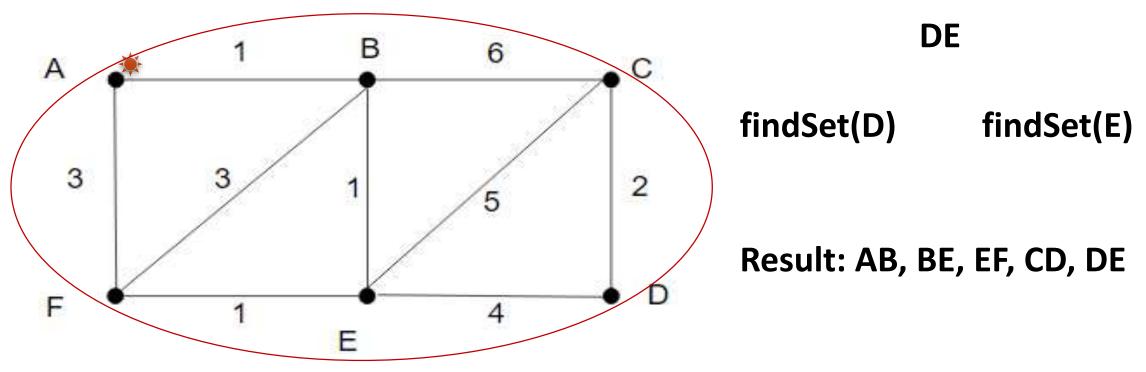
DE

findSet(D) findSet(E)

Result: AB, BE, EF, CD

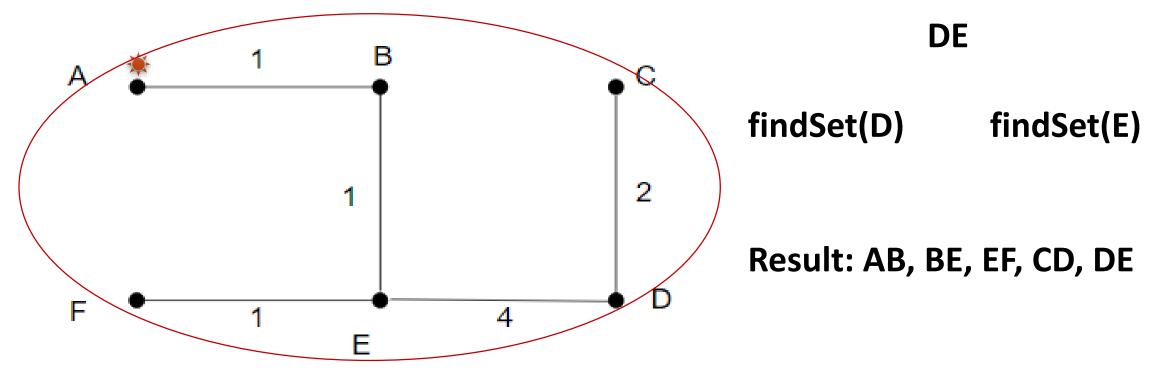


AB, BE, EF, CD, BF, DE, CE, BC





AB, BE, EF, CD, BF, DE, CE, BC





Kruskal's algorithm – Time Complexity

```
KRUSKAL(G):
    Result = \emptyset
    foreach v \in G.V:
        MAKE-SET(v)
    foreach (u, v) in G.E ordered by increasing order of weight(u, v):
       if FIND-SET(u) ≠ FIND-SET(v):
           Result = Result \cup {(u, v)}
            UNION(u, v)
    return Result
```



Kruskal's algorithm – Time Complexity

```
KRUSKAL(G):
    Result = \emptyset
    foreach v \in G.V:
                                                                           O(V)
        MAKE-SET(v)
    foreach (u, v) in G.E ordered by increasing order of weight(u, v): O(E log E)
       if FIND-SET(u) ≠ FIND-SET(v):
                                                                          O(E)
            Result = Result \cup {(u, v)}
            UNION(u, v)
                                                                           TOTAL:
    return Result
                                                                           O(V) + O(E \log E) + O(E)
```



Kruskal's algorithm – Time Complexity

```
KRUSKAL(G):
    Result = \emptyset
    foreach v \in G.V:
                                                                          O(V)
       MAKE-SET(v)
   foreach (u, v) in G.E ordered by increasing order of weight(u, v):
                                                                          O(E log E)
       if FIND-SET(u) ≠ FIND-SET(v):
                                                                          O(E)
           Result = Result \cup {(u, v)}
            UNION(u, v)
                                                                           TOTAL:
    return Result
                                                                          O(E log E)
```



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Thanks!