

Minimum spanning tree.

Tree Definitions:

- n-1 edges and connected.
- n-1 edges and no cycles.
- All pairs of vertices connected by unique path.

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Cut property:

Exists MST with minimum weight edge across cut.

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Pointer implementation: $\pi(u)$.

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 $> 2^k$ nodes in rank k root tree. $O(\log n)$ depth structure.

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Start with empty graph with *n* components.

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A = E

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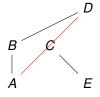
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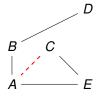
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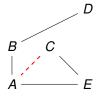
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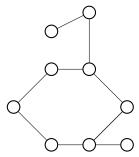
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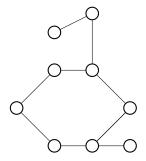
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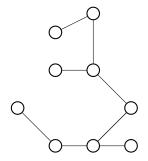


Remove edge on cycle, still connected.

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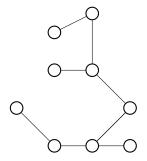


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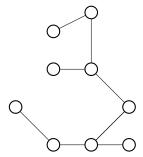


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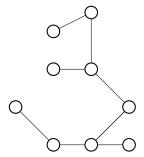


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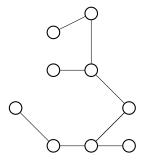


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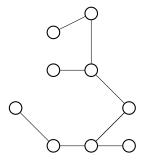


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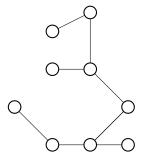


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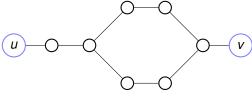
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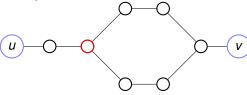
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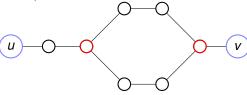


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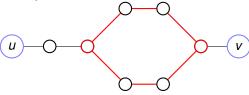
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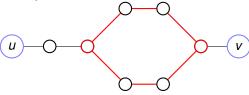
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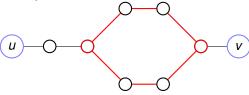
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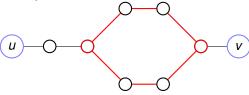
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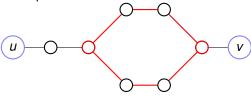
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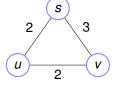
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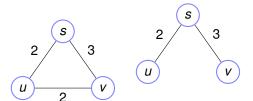
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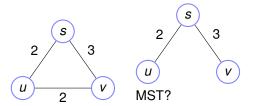
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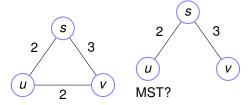
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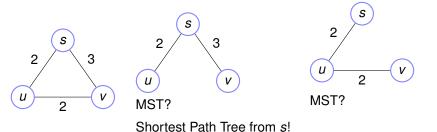


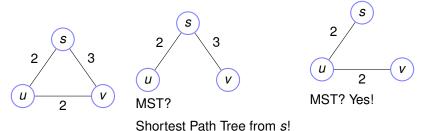


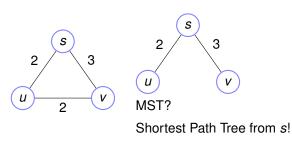


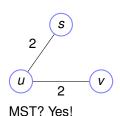


Shortest Path Tree from s!

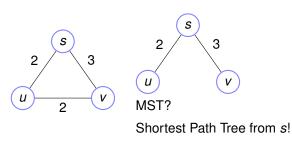


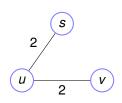




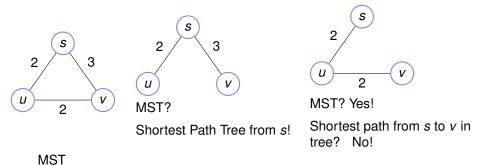


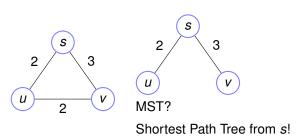
Shortest path from *s* to *v* in tree?



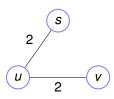


MST? Yes! Shortest path from *s* to *v* in tree? No!



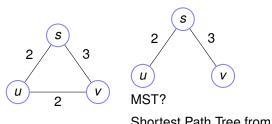


MST - cheapest spanning tree of graph.



MST? Yes!

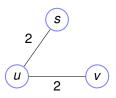
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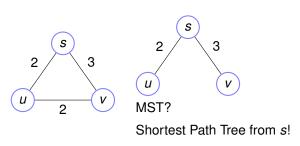
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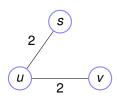
Shortest path tree



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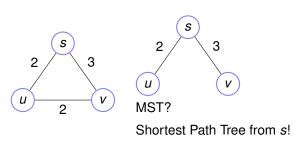
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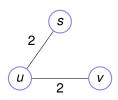
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Shortest path tree

- contains shortest paths from s to other nodes.





MST? Yes!

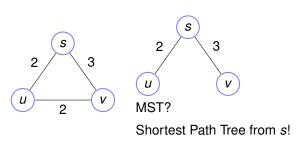
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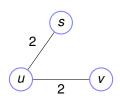
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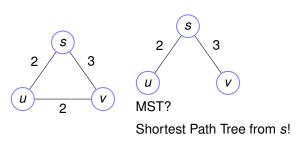
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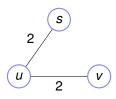
Shortest path tree

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MST -

do not care about shortest paths!





MST? Yes!

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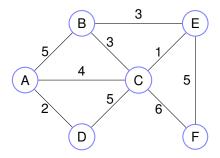
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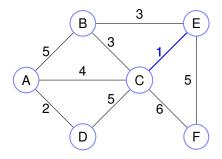
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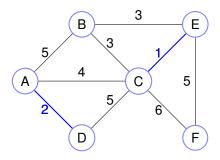
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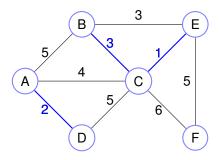
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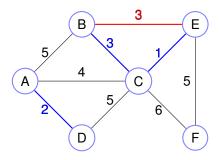
do not care about shortest paths! just lowest weight tree.

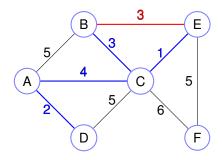


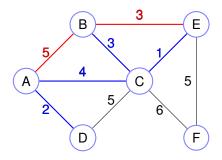


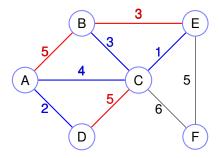


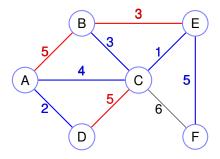


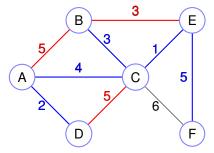








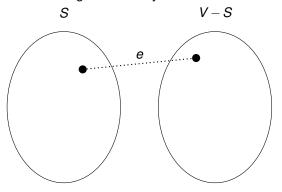




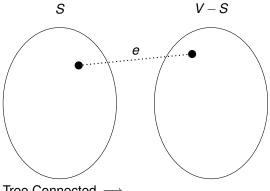
MST: total cost is 2+4+3+1+5=15.

Smallest edge across any cut is in some MST.

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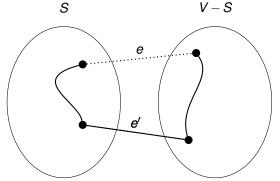


Smallest edge across any cut is in some MST.



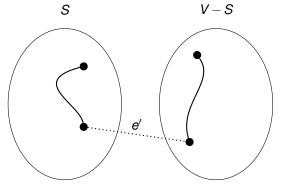
Tree Connected \Longrightarrow

Smallest edge across any cut is in some MST.



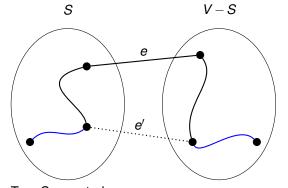
Tree Connected \implies there exists e' across cut! Replace e' with e.

Smallest edge across any cut is in some MST.



Tree Connected \implies there exists e' across cut! Replace e' with e. Every pair remains connected.

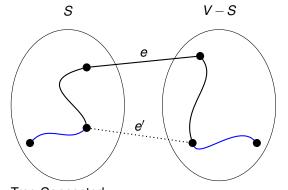
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Tree Connected ⇒ there exists *e'* across cut! Replace *e'* with *e*. Every pair remains connected.

If used *e'* can use path through *e*.

Smallest edge across any cut is in some MST.

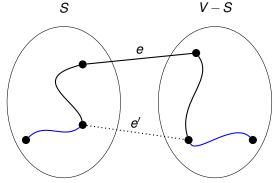


Tree Connected ⇒ there exists *e'* across cut! Replace *e'* with *e*. Every pair remains connected.

If used *e'* can use path through *e*.

and n-1 edges.

Smallest edge across any cut is in some MST.



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there exists e' across cut! Replace e' with e.

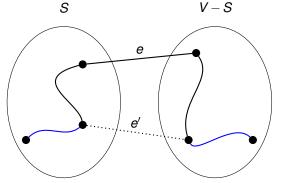
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and n-1 edges.

So still a tree

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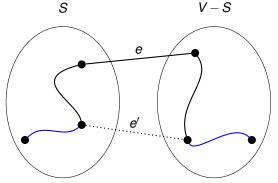
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So still a tree and is no more costly $(w(e) \le w(e'))$.

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```
Sort edges. F = 0. For each edge: e If no cycle, F = F + e.
```

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Sort edges. F = . For each edge: e If no cycle, F = F + e. How to check for cycle for edge (u, v) in F?
```

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Sort edges.
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F =. For each edge: e If no cycle, F = F + e.

How to check for cycle for edge (u, v) in F?

Check for path between u and v in F.

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O(n) time

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How to check for cycle for edge (u, v) in F?

Check for path between u and v in F.

Total Running time?

O(n) time $\rightarrow O(nm)$ for Kruskals.

Sort edges.

F =. For each edge: e = (u, v) If no cycle in F, add edge.

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Main issue: Check for cycle.

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Maintain connected components.

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At beginning each node by itself.

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Edge (u, v) in cycle? u and v in same component.

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makeset(x) - makes singleton set $\{x\}$.

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Maintain pointers: $\pi(x)$ for each x.

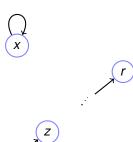
makeset(x)

$$\mathbf{makeset(x)} \ \pi(x) = x.$$



$$\pi(\operatorname{find}(x)) = \operatorname{find}(y)$$

```
\begin{aligned} & \mathbf{makeset(x)} \ \pi(x) = x. \\ & \mathbf{union(x,y)} \\ & \pi(\mathsf{find}(x)) = \mathsf{find}(y) \\ & \mathbf{find(x)} \\ & \mathbf{if} \ \pi(x) == x \\ & \mathbf{return} \ x \\ & \mathbf{else} \\ & \mathbf{find}(\pi(x)) \end{aligned}
```



```
makeset(x) \pi(x) = x.
union(x,y)
   \pi(\operatorname{find}(x)) = \operatorname{find}(y)
find(x)
   if \pi(x) == x
      return x
   else
       find(\pi(x))
  How long does find take?
   (A) O(n)
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   (B) O(1)
   (C) Depends.
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Maintain pointers: $\pi(x)$ for each x.

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Want depth to be small!







Maintain pointers: $\pi(x)$ for each x. **makeset(x)**

Maintain pointers: $\pi(x)$ for each x.

makeset(x) $\pi(x) = x$.

```
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 \mathbf{makeset(x)}\ \pi(x) = x. 
 \mathbf{find(x)} 
 \mathbf{if}\ \pi(x) == x 
 \mathbf{return}\ x 
 \mathbf{else} 
 \mathbf{find}(\pi(x))
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Make a bit less deep: union-by-rank.
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union(x,y)
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union(x,y)
Use roots of x and y.
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"smaller" to "larger"
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Make a bit less deep: union-by-rank.
union(x,y)
Use roots of x and y.
Which points to which?
"smaller" to "larger" ..sort of.
```

Union by rank.

Initially: rank(x) = 0.

Union by rank.

```
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union(x,y)

r_x = find(x)

r_y = find(y)
```

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Initially: rank(x) = 0.

union(x,y)

r_x = \text{find}(x)

r_y = \text{find}(y)

if rank(r_x) < rank(r_y):
```

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Initially: rank(x) = 0.

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if rank(r_x) < rank(r_y):
\pi(r_x) = r_y
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Initially: rank(x) = 0.

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Initially: \operatorname{rank}(x) = 0.

\operatorname{union}(x,y)

r_x = \operatorname{find}(x)

r_y = \operatorname{find}(y)

\operatorname{if} \operatorname{rank}(r_x) < \operatorname{rank}(r_y):

\pi(r_x) = r_y

\operatorname{else:}

\pi(r_y) = r_x

\operatorname{if} \operatorname{rank}(r_x) = \operatorname{rank}(r_y):

\operatorname{rank}(r_x) + 1
```

Lemma: Pop's got a higher rank:

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          rank(x) < rank(\pi(x))
Duh!
Code enforces it.
union(x,y):
  if rank(r_x) < rank(r_y):
         \pi(r_{\mathsf{x}}) = r_{\mathsf{v}}
  else:
         \pi(r_{v})=r_{x}
         if rank(r_x) == rank(r_y):
              rank(r_x) += 1
```

```
Lemma: Pop's got a higher rank:
           rank(x) < rank(\pi(x))
            if x \neq \pi(x).
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         if rank(r_x) == rank(r_y):
               rank(r_x) += 1
Initially?
```



```
union(x,y):

:

:f rank(r_X) < rank(r_y):

\pi(r_X) = r_y

else:

\pi(r_Y) = r_X

if rank(r_X) == rank(r_y):

rank(r_X) + = 1
```

Lemma: Any rank k root node has $\geq 2^k$ nodes in its tree.

```
\begin{aligned} & \mathsf{union}(x,y) \colon \\ & \vdots \\ & \mathsf{if} \ \mathsf{rank}(r_X) < \mathsf{rank}(r_y) \colon \\ & \pi(r_X) = r_y \\ & \mathsf{else} \colon \\ & \pi(r_Y) = r_x \\ & \mathsf{if} \ \mathsf{rank}(r_X) = \mathsf{rank}(r_y) \colon \\ & \mathsf{rank}(r_X) + = 1 \end{aligned}
```

Lemma: Any rank k root node has $\geq 2^k$ nodes in its tree. Induction:

```
union(x,y):

:

if \operatorname{rank}(r_X) < \operatorname{rank}(r_Y):

\pi(r_X) = r_Y

else:

if \operatorname{rank}(r_X) = r_X

if \operatorname{rank}(r_X) = \operatorname{rank}(r_Y):

\operatorname{rank}(r_X) + = 1
```

Lemma: Any rank k root node has $\geq 2^k$ nodes in its tree. Induction: Base Case

```
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if \operatorname{rank}(r_X) < \operatorname{rank}(r_Y):

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```

Lemma: Any rank k root node has $\geq 2^k$ nodes in its tree. Induction:

Base Case?

- (A) $2^0 \ge 1$
- (B) $2^1 \ge 1$

```
union(x,y):

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if \operatorname{rank}(r_x) < \operatorname{rank}(r_y):

\pi(r_x) = r_y

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Α.

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Lemma: Any rank k root node has $\geq 2^k$ nodes in its tree. Induction:

Base Case?

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$$2^0 \ge 1$$

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$$2^1 \ge 1$$

A. Initially rank(x) = 0, 1 node in tree.

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Induction: Base Case ?

base Gase

(A)
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A. Initially rank(x) = 0, 1 node in tree.

Induction step:

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if \operatorname{rank}(r_X) < \operatorname{rank}(r_y):

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Induction:

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A. Initially rank(x) = 0, 1 node in tree.

Induction step:

When rank(x) goes up to k.

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union(x,y):

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When rank(x) goes up to k.

```
rank(x) was k-1
```

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union(x,y):

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rank(x) was k-1 so has \geq 2^{k-1} nodes.
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When rank(x) goes up to k.

 $\operatorname{rank}(x)$ was k-1 so has $\geq 2^{k-1}$ nodes. by ind. hyp.

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union(x,y):

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if \operatorname{rank}(r_X) < \operatorname{rank}(r_y):

\pi(r_X) = r_y

else:

\pi(r_Y) = r_X

if \operatorname{rank}(r_X) = \operatorname{rank}(r_y):

\operatorname{rank}(r_Y) + = 1
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(B)
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Induction step:

When rank(x) goes up to k.

rank(x) was k-1 so has $\geq 2^{k-1}$ nodes. by ind. hyp. gains nodes from rank k-1 node

```
union(x,y):

:

:

if \operatorname{rank}(r_x) < \operatorname{rank}(r_y):

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A. Initially rank(x) = 0, 1 node in tree.

Induction step:

When rank(x) goes up to k.

rank(x) was k-1 so has $\geq 2^{k-1}$ nodes. by ind. hyp. gains nodes from rank k-1 node with $\geq 2^{k-1}$ nodes

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union(x,y):

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if \operatorname{rank}(r_X) < \operatorname{rank}(r_y):

\pi(r_X) = r_y

else:

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Lemma: Any rank k root node has $\geq 2^k$ nodes in its tree. Induction:

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Gains nodes without gaining rank!

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- (A) $O(\log n)$ time.
- (B) O(1) time
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All pairs of vertices connected by unique path.

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 $O(\log n)$ depth structure.

