### Union Find

#### Version of October 11, 2016



- Create-Set(*x*)
  - Create a set containing a single item x.

- Create-Set(x)
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- Find-Set(x)
  - Find the set that contains x

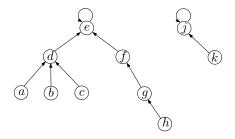
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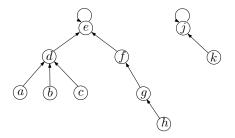
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  - After this operation, we have Find-Set(x) = Find-Set(y).

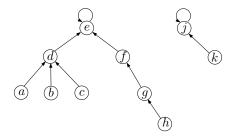
- The Disjoint Set Union-Find data structure
  - The basic implementation
  - An improvement



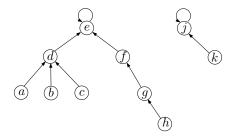
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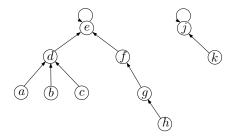
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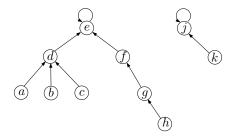
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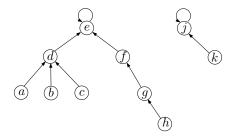
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  - The root element has a pointer pointing to itself.

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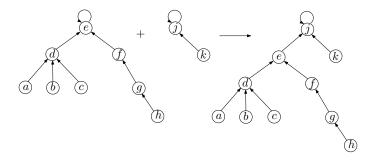
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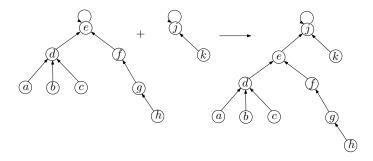
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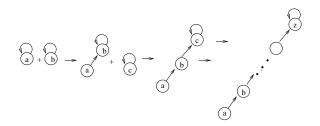
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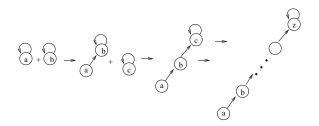


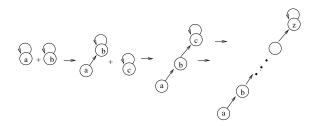
#### Question

Is this a good idea?

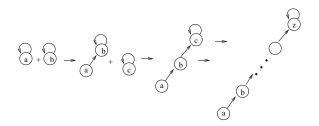
Problem





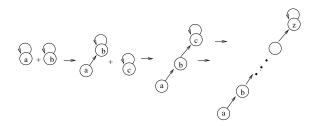


Question	
Can we do better?	





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 when we union two trees together, we always make the root of the taller tree the parent of shorter tree.

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Hence we have  $Find-Set(x) = O(\log n)$ .

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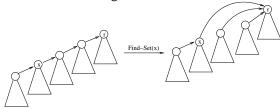
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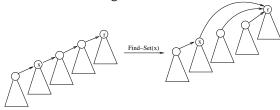
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• This idea is called path compression.

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• e.g.,  
$$|g^* 2 = 1, |g^* 4 = 2, |g^* 16 = 3, |g^* 65536 = 4, |g^* 2^{65536} = 5.$$

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#### Question

What is the running time of Kruskal's algorithm if we employ this implementation of disjoint set Union-Find?