## Union Find

## Version of October 11, 2016



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- Merge the set containing $x$, and another set containing $y$ to a single set.
- After this operation, we have Find-Set $(x)=\operatorname{Find}-\operatorname{Set}(y)$.


## Outline

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


## Up-Tree Implementation



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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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- This idea is called path compression.


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- e.g.,

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\lg ^{*} 2=1, \lg ^{*} 4=2, \lg ^{*} 16=3, \lg ^{*} 65536=4, \lg ^{*} 2^{65536}=5
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A sequence of $m$ Create-Set, Find-Set and Union operations, $n$ of which are Create-Set operations, can be performed on a disjointed-set forest with union by height and path compression in worst-case time $O\left(m \mathrm{lg}^{*} n\right)$.

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The following theorem is stated without proof.

## Theorem

A sequence of $m$ Create-Set, Find-Set and Union operations, $n$ of which are Create-Set operations, can be performed on a disjointed-set forest with union by height and path compression in worst-case time $O\left(m \mathrm{lg}^{*} n\right)$.

## Question

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

