# CSL 356: Analysis and Design of Algorithms

Ragesh Jaiswal

CSE, IIT Delhi

Kruskal's Algorithm(G) - S = E;  $T = \{\}$ - While the edge set T does not connect all the vertices - Let e be the minimum weight edge in the set S- If e does not create a cycle in T-  $T = T \cup \{e\}$ -  $S = S - \{e\}$ 

Kruskal's Algorithm(G) - S = E;  $T = \{\}$ - While the edge set T does not connect all the vertices - //Note that G' = (V, T) contains disconnected components - Let e = (u, v) be the minimum weight edge in the set S- If u and v are in different components -  $T = T \cup \{e\}$ -  $S = S - \{e\}$ 

- <u>Union-Find</u>: Used for storing partition of a set of elements. The following two operations are supported.
  - Find(v): Find the partition to which the element v belongs
  - **Union**(u, v): Merge the partition to which u belongs with the partition to which v belongs.
- Consider the following data structure.



- Suppose we start from a full partition (each partition contain one element). How much time do the following operations take:
  - Find(v):
  - Union(u, v):



- Suppose we start from a full partition (each partition contain one element). How much time do the following operations take:
  - Find( $\boldsymbol{v}$ ): O(1)
  - Union(u, v):



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  - Find( $\boldsymbol{v}$ ): O(1)
  - Union(u, v):
    - <u>Claim</u>: Performing k union operations takes  $O(k \log k)$  time in the worst case.



• Kruskal using union-find:

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• What is the running time?

• Kruskal using union-find:

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Kruskal's Algorithm(G)

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- While the edge set T does not connect all the vertices

- //Note that G' = (V, T) contains disconnected components

- Let e = (u, v) be the minimum weight edge in the set S

- If (Find(u) \neq Find(v))

- T = T \cup \{e\}

- Union(u, v)

- S = S - \{e\}
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- What is the running time?
  - $O(|E| \cdot \log |V|)$

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  - <u>Union</u>:
  - <u>Find</u>:



- Suppose we start from a full partition (each partition contain one element). How much time does the following take:
  - <u>Union</u>: whatever find takes + O(1)
  - <u>Find</u>:



- Suppose we start from a full partition (each partition contain one element). How much time does the following take:
  - <u>Union</u>: whatever find takes + O(1)
  - <u>Find</u>:  $O(\log n)$



# End

#### Problems to think about:

 Give an algorithm to find a minimum spanning tree of a weighted graph with minimum multiplicative cost. Multiplicative cost of a spanning tree is the product of edge weights.