

# COL702: Advanced Data Structures and Algorithms

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# Kruskal using DSDS

- Kruskal's algorithm uses a sequence of DSDS operations.
- The usual strategy for calculating the running time:
  - Count the number of each operation and multiply it with the worst-case times for these operations.
- Advantage: Easy
- Disadvantage: Pessimistic estimate
  - Each Find/Union operation may not take the same time.
  - Even more serious for data structures that get **dynamically restructured**.

# Amortized Analysis

- Starting from a base configuration of the dynamic data structure, we are interested in finding the time for a sequence of  $m$  operations.
- Amortized analysis: Instead of computing the worst-case running time of an operation, compute the **amortized time** (*how much does a “typical” operation cost instead of the worst-case time*).
  - Averaging method: Let  $T$  be the total time for a sequence of  $m$  operations. Then, the amortized time for an operation is  $\frac{T}{m}$ .
  - Accounting method: Distribute the cost of a few time-taking operations among many fast operations.

# Amortized analysis: Accounting method

- Accounting method:
  - Open a bank account at the very beginning.
  - Every operation has an associated payment. Every basic computational step is charged one unit of money.
  - If the payment exceeds the computational steps involved in the operation, the extra money goes to the bank account (to be used later).
  - On the other hand, if the steps involved are more than the payment, one can pay the difference from the bank account.
  - The bank balance should be  $\geq 0$  at every step.
  - The payment associated with an operation is the amortized time for that operation.
  - As long as the bank balance does not become negative, the sum of amortized time is an upper bound on the sum of real times of the operations.

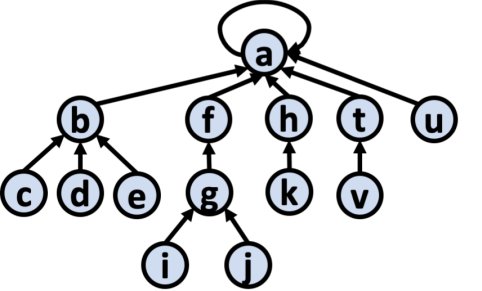
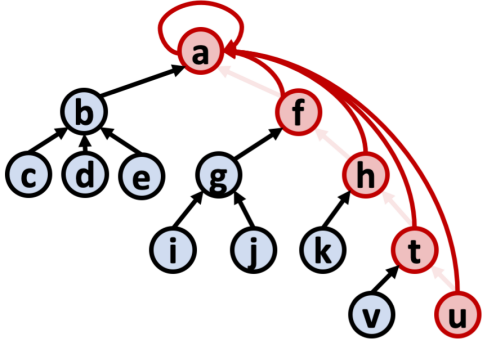
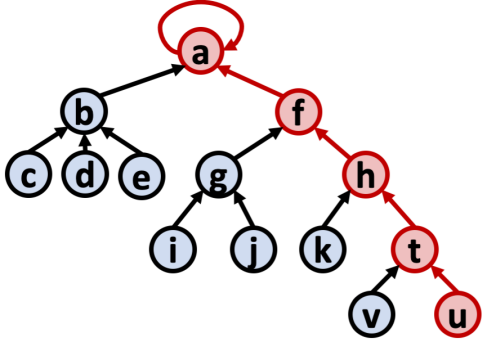
# DSDS with path compression

MakeSet( $S$ )  
· For every  $u \in S$ :  
·  $parent[u] = u; rank[u] = 0$

Union( $u, v$ )  
·  $ru = Find(u); rv = Find(v)$   
· Union-by-rank( $ru, rv$ )

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· if ( $rank[ru] > rank[rv]$ )  
·  $parent[rv] = ru$   
· if ( $rank[ru] < rank[rv]$ )  
·  $parent[ru] = rv$   
· if ( $rank[ru] = rank[rv]$ )  
·  $parent[rv] = ru$   
·  $rank[ru] = rank[ru] + 1$

Find( $u$ )  
· if ( $parent[u] = u$ ) return( $u$ )  
·  $parent[u] = Find(parent[u])$   
· return( $parent[u]$ )



# Accounting for path-compression

- The bank account money is stored in the tree nodes.
- *Money restructuring*: When the parent  $ru$  is made the parent of root  $rv$ , half the money in  $rv$  is moved to  $ru$ . Rounding is done using one unit of extra payment.
- Makeiset( $u$ ):
  - *Payment: 3 units*. One unit is used to pay for setting up the node. Two units are stored in the node.
- Union-by-rank( $ru, rv$ ):
  - *Payment: 2 units*. One unit for changing pointer. One unit for rounding.
- Find( $u$ ): Pull out one unit of money stored at all nodes whose pointer changes on executing the Find( $u$ ) operation.
  - *Payment: Number of “broke” nodes*.

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  - *Payment*: **Number of “broke” nodes**.
- Amortized time for Find and Union:  $O(\text{number of broke nodes})$

# Number of broke nodes

- Note 1: rank[u] does not necessarily store the depth of the tree rooted at  $u$ .
- Lemma 1: A root node with rank  $r$  holds at least  $2 \cdot \left(\frac{3}{2}\right)^r$  units of money.
- Note 2: Rank of a non-root node does not change.
- Corollary of Lemma 1: At the time when a node with rank  $r$  becomes a non-root, it has accumulated at least  $\left(\frac{3}{2}\right)^r$  amount of money.



# Number of broke nodes

- Lemma 2: The following three properties hold:
  - a)  $rank[parent[u]] > rank[u]$  for any non-root node  $u$ .
  - b) Every time a node  $u$  spends one unit of money, the rank of its parent increases.
  - c) If a node  $v$  of rank  $r$  has gone broke,  $rank[parent[v]] \geq \left(\frac{3}{2}\right)^r$ .

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- Theorem 1: The number of broke vertices in the path from any node to the root of its tree is  $O(\log_{\frac{3}{2}}^* n)$ .
- Running time of Kruskal's algorithm using DSDS with path-compression:  $|E| \cdot O(\log^* |V|)$ .