## Lecture 12

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Recap: Abstract Data Type

# Disjoint Set

Maintain a collection  $\mathcal{F} = \{S_1, S_2, \dots, S_k\}$  of disjoint sets. One element from each set serves as a 'representative' for that set.

Disjoint Set supports the following procedures:

- ► MAKESET(x) Creates a singleton set with element x.
- ► UNION(x, y) Performs union on sets containing x and y.
- ► FINDSET(x) Find the set containing x.

## Recap: List Implementation

## Disjoint Set using linked lists:

- For each set *S*, maintain:
  - a node with metadata
  - ightharpoonup a linked list  $L_S$  with the objects in the set.
- ► The "Metadata Node" stores:
  - Head and tail pointers to the linked list.
- Each node in the linked list consists of:
  - ► The value of the element.
  - A pointer to the next element.
  - A pointer to the Metadata Node.

The head of  $L_S$  is the representative of S.

## List Implementation - Union by Rank heuristic

## Disjoint Set using linked lists, union by rank:

- For each set *S*, maintain:
  - a node with metadata
  - ightharpoonup a linked list  $L_S$  with the objects in the set.
- ► The "Metadata Node" stores:
  - Head and tail pointers to the linked list.
  - Size of the set.
- ► Each node in the linked list consists of:
  - ► The value of the element.
  - ► A pointer to the next element.
  - A pointer to the Metadata Node.

The head of  $L_S$  is the representative of S.

# List Implementation - Union by Rank heuristic

# Union(x,y)

Union of sets containing *x* and *y*.

Let  $x \in S$  and  $y \in T$ .

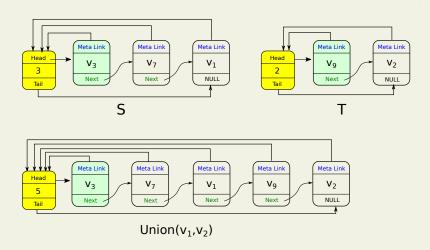
If 
$$|S| \leq |T|$$
,

- ► Append list of *S* to tail end of list of *T*.
- ▶ Representative of new set is same as that of *T*.
- ► Update meta pointers of nodes in *S*
- ▶ Update tail pointer in metadata node of *T*.
- ► Update size of set in the metadata node.

Else, do the opposite.

# Implementation - Union by Rank heuristic

Union of sets  $S = \{v_1, v_3, v_7\}$  and  $T = \{v_2, v_9\}$ .



# Analysis - Union by Rank heuristic

#### Theorem

A sequence of m operations in total, n of which are MAKESET takes  $O(m + n \log n)$  time.

# Analysis - Union by Rank heuristic

#### Observation 1

Updating the meta pointers takes the most time.

#### Observation 2

The meta pointer of a node *x* is updated only when union happens with a bigger set.

## Proof strategy

- Fix an element x.
- Count number of times the meta pointer on node x is updated.

# Analysis - Union by Rank heuristic

### Observation 2 (informal)

If x lived inside a set of size s, and a union operation updated its meta pointer, then x now lives inside a set of size at least 2s.

- ► Initially, *x* starts off as a singleton set.
- After k many updates to its meta pointer, it lives inside a set of size at least  $2^k$ .
- ► Total number of elements is n. So  $2^k \le n$ .
- ▶ This means  $k \le \log n$

Hence, for each element the meta pointer can be updated at most  $k \le \log n$  many times.

Worst case total number of updates to meta pointer across all n elements is  $n \log n$ .

## Implementation - disjoint forests

The disjoint forest implementation:

**Each** set *S* is implemented as a rooted tree.

A node corresponding to an  $x \in S$  contains:

- ► The value (or pointer to) *x*.
- A pointer to its parent.

## Implementation - disjoint forests

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► Each set *S* is implemented as a rooted tree.

## A node corresponding to an $x \in S$ contains:

- ► The value (or pointer to) *x*.
- A pointer to its parent.

#### Note:

- ► There are no pointers to children nodes!
- There is no dedicated metadata node for each set.
- Convention: Parent of root will be itself.
- Root node is also the representative.

# Implementation - disjoint forests

Example picture on whiteboard

MAKESET(x)

MAKESET(x) involves creating a new tree with a single node for x.

MAKESET(x)

White board

# FINDSET(x)

## FINDSET(x):

- Start at node x.
- $\triangleright$  Follow the parent pointer starting from x.
- ▶ Return the root.

# FINDSET(x)

## Union(x, y):

- $ightharpoonup r_x \leftarrow FINDSET(x)$
- ▶  $r_y \leftarrow FINDSET(y)$ .
- ▶ parent $(r_x) \leftarrow r_y$ .



# Analysis – disjoint forests

Worst case running times under disjoint forest implementation:

 $\blacktriangleright$  MakeSet(x) –

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Worst case running times under disjoint forest implementation:

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- ightharpoonup FINDSET(x) -O(n)
- ightharpoonup Union(x, y) –

# Analysis – disjoint forests

Worst case running times under disjoint forest implementation:

- $\blacktriangleright$  MakeSet(x) -O(1)
- ► FINDSET(x) -O(n)
- ightharpoonup Union(x, y) O(n)

where *n* is the number of elements handled.

# Disjoint Forests - Union by Rank heuristic

#### To use the Rank heuristic:

- Each node will contain a "rank".
- ► Every node starts with a rank of 1.
- ► Update rank only when Union is called.

# Disjoint Forests - Union by Rank heuristic

### Union(x, y):

Let  $x \in S$ ,  $y \in T$  with representatives  $r_S$  and  $r_T$  respectively.

If  $rank(r_S) > rank(r_T)$ , then:

▶ parent $(r_T) \leftarrow (r_S)$ .

#### Else:

▶ parent $(r_S) \leftarrow (r_T)$ .

If  $rank(r_S) = rank(r_T)$ , then:

▶ Increment  $rank(r_S)$ .

Note: A set *S* rooted at *x* has at least as many elements as the height of *x*.

#### Theorem

A sequence of m operations in total, n of which are MAKESET takes  $O(m + n \log n)$  time.

#### Observation 1

The rank of a node is exactly the height of the node.

### Proof

Let *x* be a node. Induction on number of updates to rank *x*:

**Base case:** After MakeSet(x), rank is 1.

- **Step:** The rank of *x* is incremented when:
  - ▶ Union is called involving a set (tree) S with root x and T with root y.
  - ightharpoonup rank(x) = rank(y).

#### Observation 1

The rank of a node is exactly the height of the node.

#### Proof

Let *x* be a node. Induction on number of updates to rank *x*:

**Base case:** After MAKESET(x), rank is 1. **Step:** The rank of x is incremented when:

- ► Union is called involving a set (tree) *S* with root *x* and *T* with root *y*.
- $ightharpoonup \operatorname{rank}(x) = \operatorname{rank}(y).$
- From induction rank(y) = height(y).
- $\triangleright$  y's parent becomes x. Hence height(x) increases by one.
- The increment done to rank(x) reflects this change of height.

#### Lemma 1

Every node has rank at most log n

### Proof

Fix a node x. If rank(x) is incremented, then:

- ▶ Union was called on  $S \ni x$  and a set T with root y.
- ▶ Node *x* was the root of the tree representing *S*.
- ▶ We have |S| > height(x) = rank(x) (Obs 1).
- height(y) = rank(y) = rank(x).

#### Lemma 1

Every node has rank at most log n

#### Proof

Fix a node x. If rank(x) is incremented, then:

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- ► Node *x* was the root of the tree representing *S*.
- ▶ We have |S| > height(x) = rank(x) (Obs 1).
- ▶ height(y) = rank(y) = rank(x).
- ▶ So  $|T| \ge \text{height}(y) = \text{rank}(x)$ .
- ► Hence  $|S \cup T| \ge 2 \operatorname{rank}(x)$ .

So after k increments to rank(x), the cardinality of the set in which x lives is at least  $2^k$ 

Since total number of elements in n, the claim follows.

# Disjoint Forests - Path Compression heuristic

## When FINDSET(x) is called:

- Follow the parent pointer from *x* to root.
- Change the parent pointer of every node on this path to directly point to root.

# Disjoint Forests - Path Compression heuristic

Whiteboard

# Analysis - Union by Rank and Path Compression

#### Theorem

A sequence of m operations in total, n of which are MAKESET takes  $O(m\alpha(n))$  time where  $\alpha(n)$  is the inverse Ackermann

## Ackermann function

The Ackermann function A(m, n) is defined as:

- ▶ n + 1 if m = 0
- ► A(m-1,1) if m>0 and n=0
- ► A(m-1, A(m, n-1)) if m > 0 and n > 0

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#### Example values:

- A(0,0)=1
- A(1,1)=3
- A(2,2)=7
- A(3,3) = 61
- $A(4,4) = 2^{2^{65536}} 3$

(That escalated quickly!)

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The inverse Ackermann  $\alpha(n)$  is the smallest k for which n < A(k, k).