

T-2

Lecture-20

Graph.

Trans-Form

-Ordered

-Positional

Directed ... V

$E = \text{Set of relations}$

Undirected

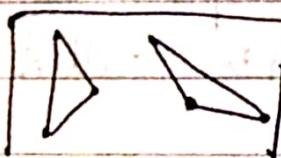
→ no. self loops.

Path, cycle, reachability,

Degree, Connected components

Simple path

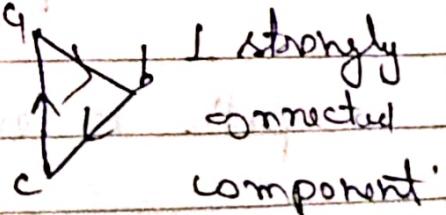
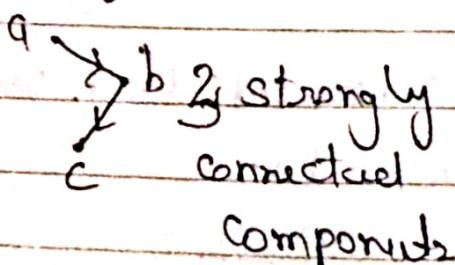
- Length of path → # edges



→ No. of connected component = 2.

Directed

- Strongly connected → $a \rightarrow b$ is 2.



Undirected Graph:

to u :

If there is a path from vertex v

\Rightarrow There is a simple path from v to u

Suppose:

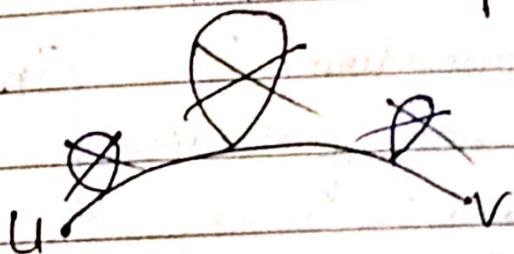
$$v = v_1 - \cdots - v_i - \cdots - v_j - \cdots - v_k = u$$

$\Rightarrow v = v_1 - \cdots - v_{i-1} v_i v_{j+1} \cdots v_k$ is also a path

Similarly,

repeat

- Till no repetitions \Rightarrow Simple path.



* Subgraph:

multigraph } \rightarrow multiple edges between same pair of vertices.

hypergraph } instead pairs of nodes

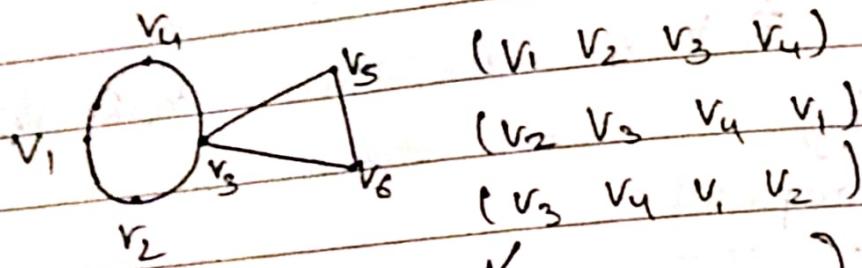
\rightarrow edges

a longer tuple of nodes.

Cycle:

path
 $v = (v_1 - \dots - v_k) = u$
 Some vertex

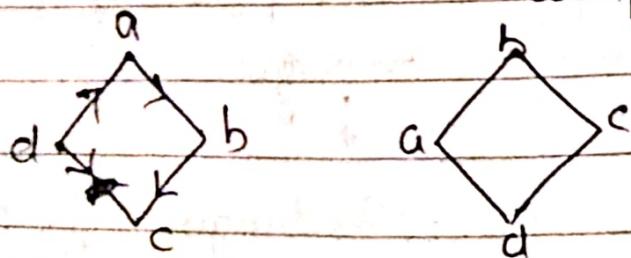
Simple cycle:
 all vertices except v_1 & v_k are distinct



Any cycle obtained
 as a result of reordering/
 rotating the same set of vertices
 is the same cycle.

Directed graph:

↓
 Acyclic as well then it is called Directed Acyclic
 Graph (DAG).



DAG

Similar undirected graph is
 not acyclic

Undirected Graph:

$G \rightarrow$ Undirected Graph

G is a "free tree" if, G is connected & Acyclic.

The following statements are equivalent:

1. G is a free tree.
2. \hookrightarrow If G is a free tree then there is a unique simple path between every pair of vertices.

Proof

Take any (u, v)

free tree \Rightarrow connected

\Rightarrow there is path $u \in v$.

Prove that the path is unique:

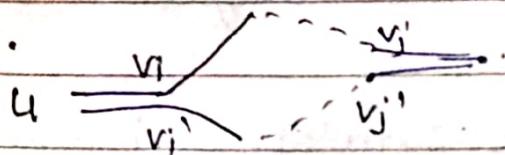
Suppose there are two paths:

$u : v_1, v_2, \dots, v_k, v$

$v : v'_1, v'_2, \dots, v'_k, v$

Assume v_i is the point at which they diverge

v_j is the point at which they converge



path $(v_i, v_{i+1}, \dots, v_j, v_{j-1}, \dots, v_i) \rightarrow$ cycle

cycle $\Rightarrow G$ is not a tree true

↓
contradiction.



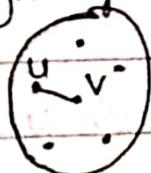
So, no 2 paths possible



\Rightarrow path is unique.

G is an undirected graph, such that there is a unique simple path between every two pair of vertices, then if any edge is removed the graph becomes disconnected

given graph



G is connected.

If $e = (u, v)$ is removed.
Graph is disconnected $G \setminus (u, v)$.

path between $u \& v$.

Suppose it does not get disconnected

if

There was another path between (u, v)

↓

path is not unique.

③ G is connected but

If an edge in G is removed G becomes disconnected

4)

G is an undirected graph such that it is connected and if any edge in G is removed it becomes disconnected then

$$|E| = |V| - 1$$

If G is connected then

$$|E| \geq |V| - 1$$

→ 2 vertices:

extend add 1 or more edge per vertex.

$$|E| \geq |V| - 1$$

Next

prove

$$|E| \leq |V| - 1$$

Edges	Connected components	Inference (No. of edges)
$ E $	1	$ E = m$
$ E - 1$	2	$ E = m - 1$
$ E - 2$	3	$ E = m - 2$
\vdots	\vdots	\vdots
$ E - (V - 1)$	$ V $	0

Hence,

$$|E| - (|V| - 1) = 0 \Rightarrow |E| = |V| - 1$$

1.

④ ~~G is connected &~~

Lecture - 21

Tree

- Theorem

Rooted tree & related terms

Positional & Ordered tree

- Binary tree - Randomly built.

Theorem:

G is an undirected graph. Then the following statements about it are equivalent

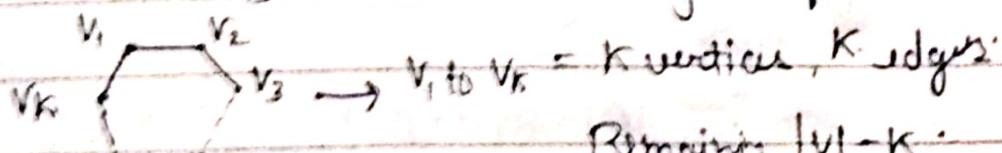
1. G is a tree.
2. Every vertex pair in G has a unique simple path connecting the 2 vertices.
3. There is a unique simple path between any vertex pair but removing an edge disconnects the graph.
4. G is connected &

$$|E| = |V| - 1$$

5. G is acyclic & $|E| = |V| - 1$.

Proof 4 \Rightarrow 5

Assume G has a cycle of k vertices.



$v_1 \rightarrow v_2 \rightarrow v_3 \rightarrow v_k \rightarrow v_1 = k$ vertices, k edges.

Remaining $|V| - k$.

To add v_{k+1} to this graph component atleast 1 edge is needed.

vertices

$k+1$

$k+2$

\vdots

\vdots

$k+|V|-k$

$|V|$

edges (at least)

$k+1$

$k+2$

\vdots

$k+|V|-k$

$|V| \rightarrow$ contradiction

→ assumption was
 \Rightarrow Acyclic

6. G is acyclic but adding any edge creates a cycle in G.

proof $S \Rightarrow G$

Given undirected cycle G with $|E| = |V| - 1$

prove that adding any edge creates a cycle.

Suppose adding an edge (u, v) does not create a cycle then it must have been that ---

u & v belong to different connected components then their must have been more than 1 connected component.

Let k be the no. of connected components in $G \rightarrow$

→ each connected components is a tree, by definition

$1 \Rightarrow 2 \Rightarrow 3 \Rightarrow 4 \Rightarrow S$.

for each of them.

$|E_i| = |V_i| - 1$

G is connected &

Lecture-21

Free tree

- Theorem

Rooted tree & unrelated terms

Positional & Ordered trees

- Binary tree - Randomly built.

Theorem:

G is an undirected graph. Then the following statements above it are equivalent:

G is a free tree.

Every vertex pair in G has a unique simple path connecting the 2 vertices.

There is a unique simple path between any vertex pair but removing an edge disconnects the graph.

G is connected &

$$|E| = |V| - 1$$

G is acyclic & $|E| = |V| - 1$.

Proof $4 \Rightarrow 5$

To add v_{k+1} to this graph component atleast 1 edge is needed.

vertices

$k+1$

$k+2$

\vdots

$k+|V|-k$

$|V|$

edges (at least)

$k+1$

$k+2$

\vdots

$k+|V|-k$

$|V| \rightarrow$ contradiction

\rightarrow assumption was

\Rightarrow Acyclic

6. G is acyclic but adding any edges creates a cycle
proof $5 \Rightarrow 6$

Given undirected cycle G with $|E|=n-1$

prove that adding any edge creates a cycle.

Suppose adding an edge (u, v) does not create a cycle then it must have been that ---

u & v belong to different connected components then there must have been more than 1 connected component.

Let k be the no. of connected components in G \rightarrow

\rightarrow each connected component is a tree by definition

$1 \Rightarrow 2 \Rightarrow 3 \Rightarrow 4 \Rightarrow 5$

for each of them $|E_i| = |V_i| - 1$

sum both sides over all components.

$$|E| = |V| - k.$$

given

$$|K| = |V| - 1$$

$$\Rightarrow K = 1.$$

$$G \Rightarrow 1:$$

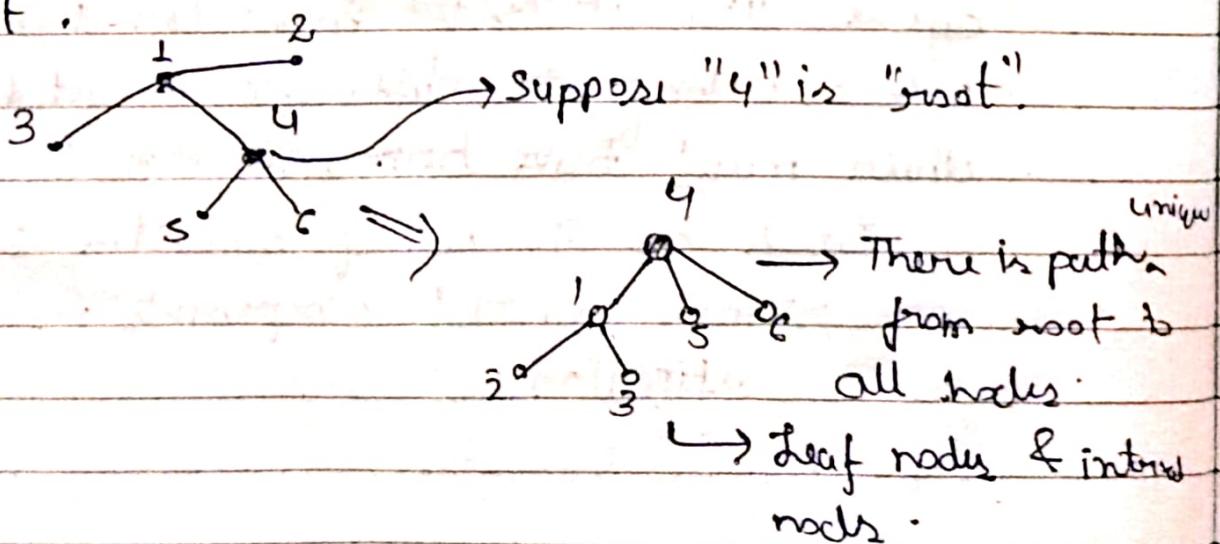
If we add any edge it makes a cycle if none all the components are already connected.

Free Tree:

Degree: No. of adjacent edges do the vertex.

Rooted Tree:

Free tree in which one vertex is 'designated' as "root".



Leaf nodes: Not on path from root to any other node.

Degree in rooted tree:

Child \rightarrow X is a child of y if y is the immediately preceding node in path from root to x.

Parent \rightarrow Y is a parent of x if x is a child of y.

Descendant: X is descendant of y if y belongs to the path from root to x.

Ancestor: Y is ancestor of x, if x is descendant of y.

Siblings: X & Y have same parents.

Degrees: No. of child nodes.

Height of a vertex/Node: X is the length of longest path to a descendant leaf.

Height of the root:

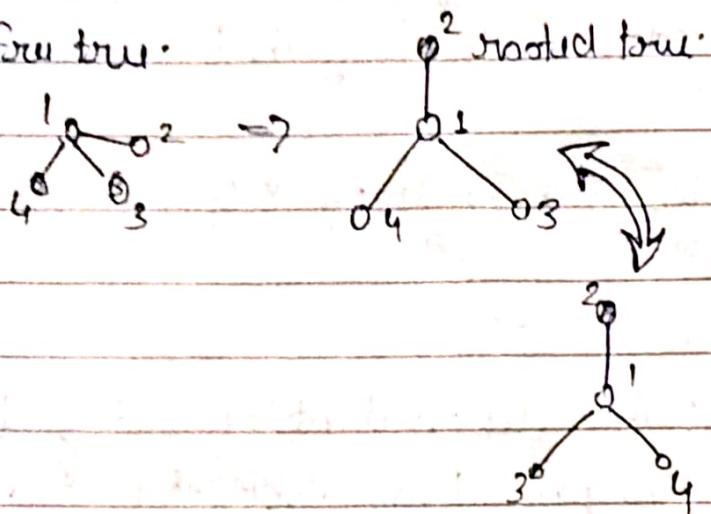
- Longest path to a leaf

Height of the Tree:

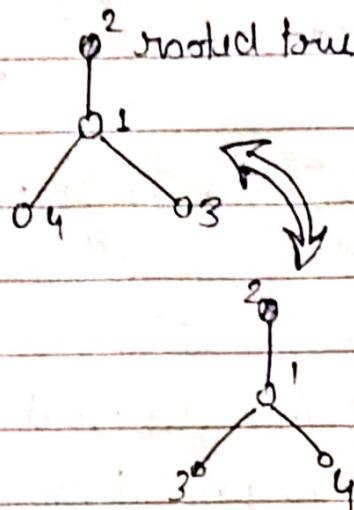
Height of the root.

Depth of a node: Distance from the root.

Ex: Full tree:

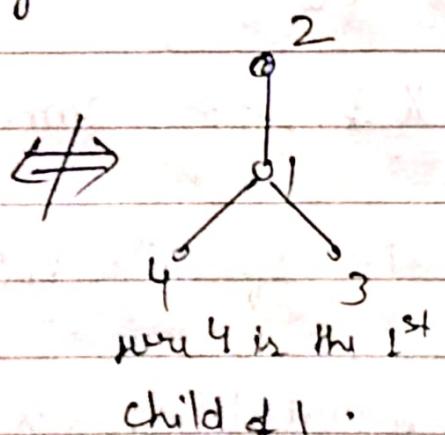
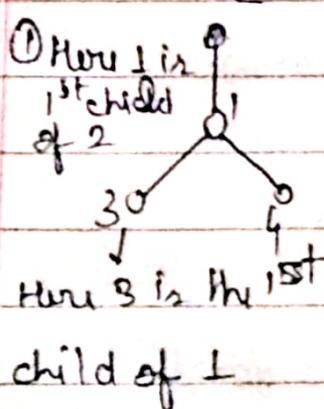


2 rooted tree:



* Ordered tree:

Sequencing or "ordering" on the child nodes of every node.



* Positional tree:

A "position" for every child node.

Lecture: 22

Ordered & Positional trees

Binary tree, BSTs

Balance

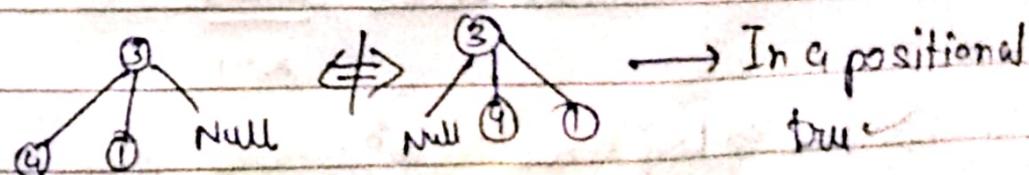
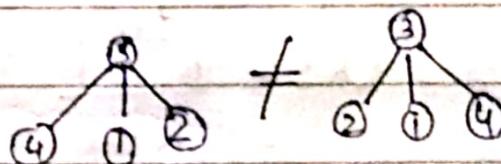
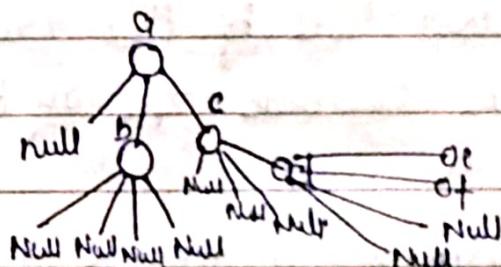
Randomly built binary search trees.

Positional tree:

- Null tree

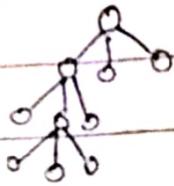
- "arity": Number of child nodes for each non null node.

→ recursive of a k-ary positional tree.

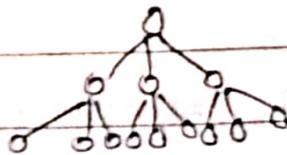


Full Tree: Every node has degree k or 0

Leaf Node



Complete k-ary tree: If a full tree in which all the leaf nodes are at the last level.



Nearly Complete: The last level of the tree could have no nodes towards the right part.

Height - Number of levels in complete k-ary tree

$$\# \text{nodes} = 1 + k + k^2 + \dots + k^h = \frac{k^{h+1} - 1}{k - 1}$$

$$\# \text{internal nodes} = \frac{k^h - 1}{k - 1}$$

$$\# \text{leaf nodes} = k^h$$

Binary: 2-ary positional tree.

left } names for 2 child slots
right }

$$n = 2^{h+1} - 1$$

$$\text{leaf nodes} = 2^h$$

$$\text{internal} = 2^h - 1$$

Dynamic Set: Binary Search Trees:

Key: Unique \rightarrow BST: for every node x

$$x.\text{key} > x.\text{left}.\text{key}$$

$$x.\text{key} < x.\text{right}.\text{key}$$

Worst case height = $n-1$

Search $O(\text{height})$

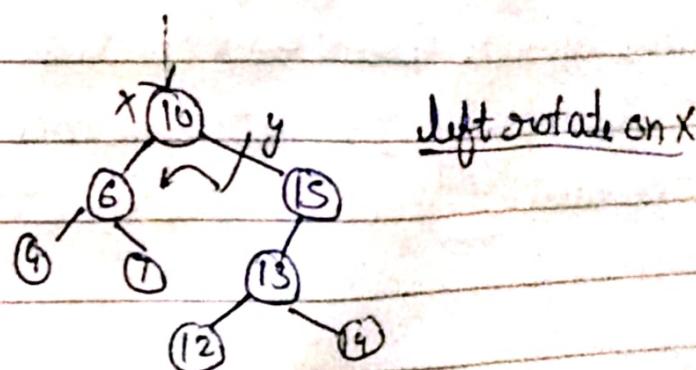
$\rightarrow O(n)$

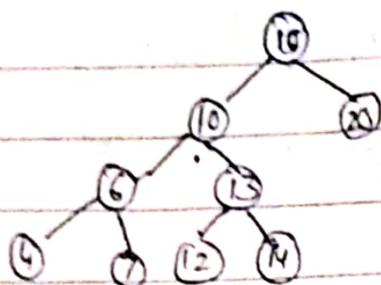
But case height is $O(\log_2 n)$.



Balance binary search tree.

Rotation:



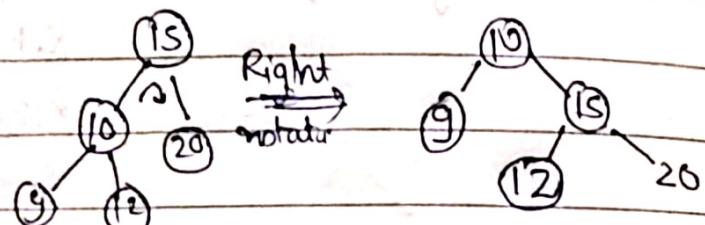


left rotate (x)

$$\begin{aligned} y &= x \cdot \text{right} \\ x \cdot \text{right} &= y \cdot \text{left} \\ y \cdot \text{left} &= x \cdot \\ \text{return } y & \end{aligned}$$

Right rotate (x)

$$\begin{aligned} y &= x \cdot \text{left} \\ x \cdot \text{left} &= y \cdot \text{right} \\ y \cdot \text{right} &= x \\ \text{return } y & \end{aligned}$$



Left rotate (x) # returns a pointer to a rotated subtree of nodes originally contained in subtree of x

Binary Search Tree: → Expected height is $O(\log n)$.
 - Inserts | Input sequence - random
 - No deletes |

Input Sequence:

random variable:

$R_j \rightarrow$ root key of the bst made with j nodes (keys).

$R_n = i, \forall i=1 \text{ to } n \text{ with equal probability}$

$$Z_{n,i} = \begin{cases} 1, & i \text{ is the root of tree made} \\ & \text{with } n \text{ nodes} \\ 0, & \text{otherwise} \end{cases}$$

x_n be the height of the tree made with n nodes

y_n exponential height $= 2^{x_n}$.

$$x_n = 1 + \max(x_{i-1}, x_{n-i})$$

31-01-19 Lecture-23

Randomly built bst \rightarrow Insert \rightarrow Height?

Binary trees

Search

- AVL trees

$\{1 \dots n\} \rightarrow n!$ permutations are equally likely.

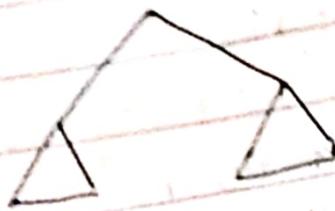
$R_i =$ value of root in a randomly built bst of i nodes.

$x_i =$ height of a randomly built bst of i nodes.

$$y_i = 2^{x_i}$$

$Z_j, i=1 \text{ if the root node of a r.b. bst of } j \text{ nodes}$
 0 otherwise

$R_n = i \rightarrow$ first try:



R.B. brt of
1 to $i-1$
($i-1$ nodes)

R.B. brt of
 $n, n-1, \dots, i+1$
($n-i$ nodes)

$$x_n = 1 + \max(x_{i-1}, x_{n-i})$$

$$y_n = 2^{1 + \max(x_{i-1}, x_{n-i})}$$

$$= 2 \cdot 2^{\max(x_{i-1}, x_{n-i})}$$

$$= 2 \cdot \max(2^{x_{i-1}}, 2^{x_{n-i}})$$

$$= 2 \cdot \max(y_{i-1}, y_{n-i})$$

$$y_n = 2 \cdot \max(y_{i-1}, y_{n-i})$$

$$E(y_n) = 2 \cdot E(\max(y_{i-1}, y_{n-i}))$$

$$= \sum_{i=1}^n P_R(R_n=i) 2 \max(y_{i-1}, y_{n-i}).$$

$$= \frac{2}{n} \sum_{i=1}^n f(\max(y_{i-1}, y_{n-i}))$$

$$\leq \frac{2}{n} \sum_{i=1}^n f(y_{i-1}, y_{n-i})$$

$$\leq \frac{2}{n} \left((y_0 + y_{n-1} + y_1 + y_{n-2} + \dots + y_{n-2} + y_{n-1}) + y_{n-1} + y_0 \right)$$

$$\leq \frac{4}{n} \left(\sum_{i=0}^{n-1} f(y_i) \right)$$

$$E(Y_n) \leq \frac{4}{n} \sum_{i=0}^{n-1} E(Y_i)$$

Find $E(Y_i)$ for each i, j :

Substitution method

$$(guess) E(Y_n) \leq \frac{1}{4} {}^{n+3}C_3$$

base case $n=1$:

$$E(Y_1) = 1 \rightarrow \leq y_4 {}^{1+3}C_3 \leq y_4 \cdot 4$$

Assume it is true for $i=1, 2, 3, \dots, n-1$

Show true for $i=n$:

$${}^{n+3}C_4 = \sum_{i=0}^{n-1} {}^{i+3}C_3$$

$$\begin{aligned} \text{RHS} &= {}^3C_3 + {}^4C_3 + {}^5C_3 + \dots + {}^{n+2}C_3 \\ &= \underbrace{{}^4C_4 + {}^4C_3}_{\substack{\downarrow \\ C_4}} + {}^5C_3 + \dots + {}^{n+2}C_3 \\ &= {}^5C_4 + {}^5C_3 + \dots + {}^{n+2}C_3 \\ &= \dots \\ &= {}^{n+2}C_4 + {}^{n+2}C_3 \\ &= {}^{n+3}C_4. \end{aligned}$$

$$E(Y_n) \leq \frac{4}{n} \sum_{i=0}^{n-1} E(Y_i)$$

$$\leq \frac{1}{n} \sum_{i=0}^{n-1} {}^{i+3}C_3$$

$$\leq \frac{1}{n} {}^{n+3}C_4$$

$$\leq \frac{1}{4} {}^{n+3}C_3$$

$$E(Y_n) \leq {}^{n+3}C_3.$$

$$E(Y_n) = E(2^{X_n}).$$

$$E(2^{X_n}) \leq c \cdot c_3^{n+3}$$

$$E(X_n) \leq \log(E(2^{X_n}))$$

$$\leq \log(c \cdot c_3^{n+3})$$

$$\leq \log(c_1 n^3 + c_2 n^2 + c_3 n + c_4)$$

$E(X_n)$ is $O(\log n)$.

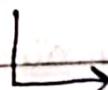


height :

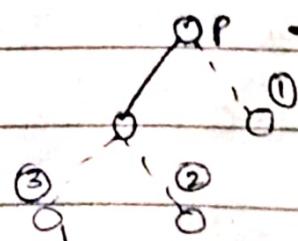
Worst case : $n-1$

- * BST can be improved: to have height $O(\log n)$
ie. "balanced" BSTs always.

* AVL: Adelson, Velski, Landis.



for every node, the heights of left & right subtrees should differ by at most 1.



In case ③ we will apply right rotation at p.



Readjustment to satisfy AVL property.

Self-adjusting data structures

height: h .

$N(h)$: number of nodes in AVL tree of height h .

$$N(h) \geq 1 + N(h-1) + N(h-2)$$

$$N(0) = 1$$

$$N(1) \geq 2$$

$$N(2) \geq 4$$

$$N(3) \geq 7$$

$$N(h) \approx C_1 \left(\frac{\sqrt{5}+1}{2}\right)^h - C_2 \left(\frac{\sqrt{5}-1}{2}\right)^h.$$

$$n \geq C_1 a_1 h + C_2 a_2 b^h$$

$$\text{Hence } h \leq C \log_2 n.$$

1-02-19 Lecture-24

AVL Trees: Heights of child node differ by at most 1.

Min. nodes

$$ht=0$$

1

0

$$ht=1$$

2

$$ht=2$$

4

$N(h)$: min. nodes in ht AVT tree.

$$N(h) = 1 + N(h-1) + N(h-2)$$

$$N(h) \geq C_1 h + C_2 h$$

$$h \leq \log(N(h))$$

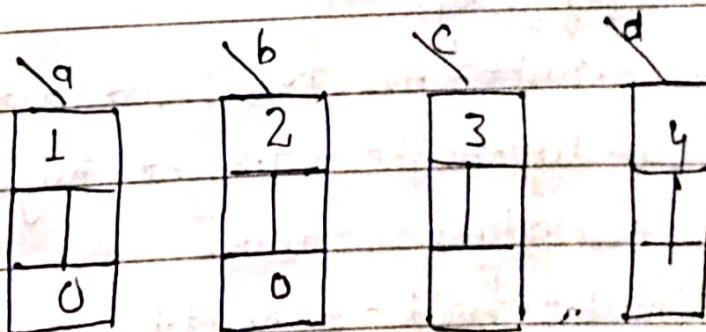
$$h \leq \log n$$

* Balance factor: Height of $x\cdot \text{left}$ - height of $x\cdot \text{right}$.
 ≤ 1 . (Self adjusting tree).

Node Structure:

Key	
l	r
height	

Example:



rotate_left(x)

$y = x\cdot \text{right}$.

if ($y = \text{nil}$)

$x\cdot \text{right} = y\cdot \text{left}$.

$y\cdot \text{left} = x$.

return (y)

else return (x)

rotate_right(x)

$y = x\cdot \text{left}$

if ($y = \text{nil}$)

$x\cdot \text{left} = y\cdot \text{right}$

$y\cdot \text{right} = x$

return (y)

else return (x)

Call from: AVL_Tree_Insert (T.root, x)

Application
x is address of node to be inserted.

AVL_Tree_Insert (n, x)

return an AVL Tree root formed with nodes in the subtree rooted at n (which is AVL) on x.

AVL_Tree_Insert (n, x)

if (n == NIL) return (x)

else

if (x.key < n.key)

n.left = AVL_Tree_Insert (n.left, x)

else if

(x.key > n.key)

n.right = AVL_Tree_Insert (n.right, x)

if (n.left.height - n.right.height) > 1

n = right rotate (n)

if (n.left.height - n.right.height) < -1

n = left rotate (n)

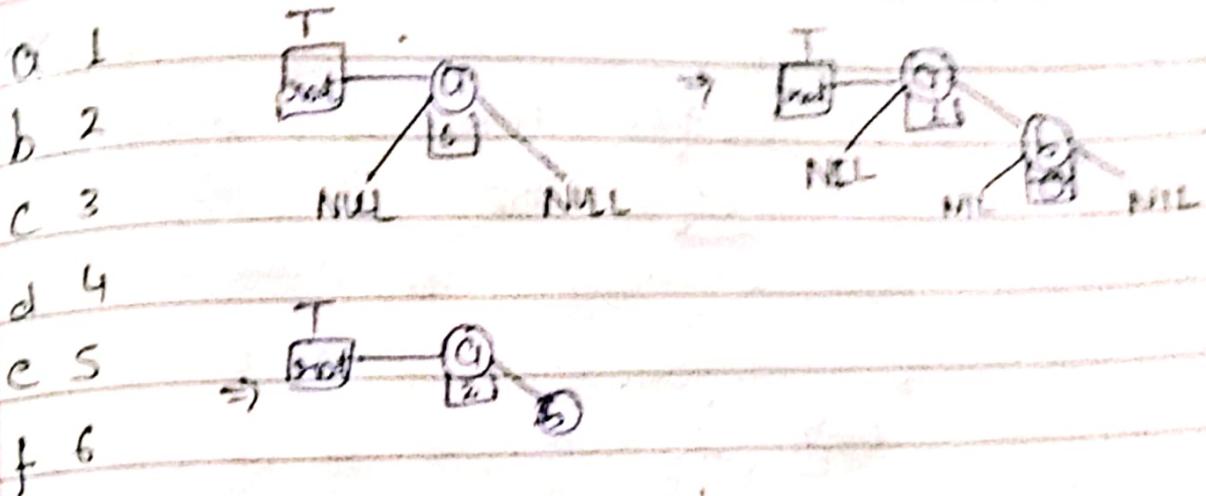
n.height = 1 + max (n.left.height, n.right.height)
return n

$$T(h) \leq T(h-1) + C$$

$$\begin{aligned} T(h) &= O(h) \\ &= O(\log n) \end{aligned}$$

* Distinct keys

* Keys are positive integers



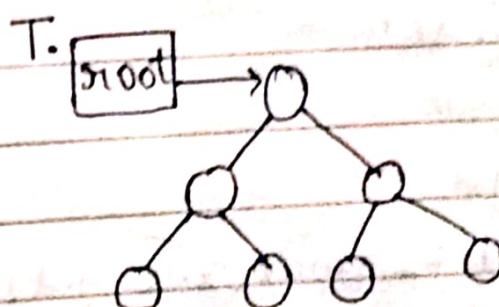
4-2-18 Lecture-25

AVL-Trees:

1. Insert.

2. Deletes.

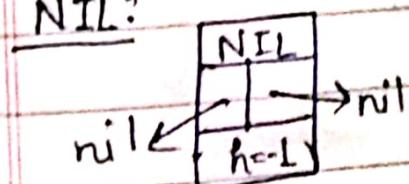
A. $\text{root} = \text{AVLTreeInsert}(\text{root}, \text{key})$

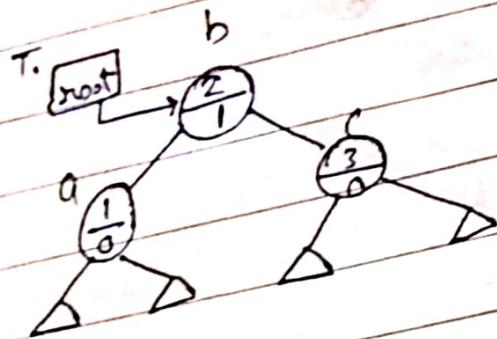
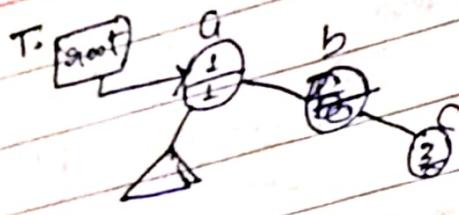


key
1 31

height

NIL:





`left_rotate(x)`

$$y = x.r$$

if ($y == \text{nil}$)

return (x)

else

$$x.r = y.l$$

$$y.r = x.h = 1 + \max(x.l, y.l)$$

$$y.l = x$$

$$y.h = 1 + \max(x, y.r)$$

return (y)

`right_rotate(x)`

$$z = x.l$$

if ($z == \text{nil}$) return (x)

Ans

$$x \cdot L = z \cdot r$$

$$x \cdot h = 1 + \max(x \cdot r, z \cdot r)$$

$$z \cdot r = x$$

$$z \cdot h = 1 + \max(x \cdot h, z \cdot l)$$

return (z)

AVL-Tree-Delte (r, x)

delete x from subtree rooted at r
and return pointer to modified tree

if ($r == \text{NIL}$) return (r)

else

if ($x \neq r$)

if ($x \cdot \text{key} < r \cdot \text{key}$)

$r \cdot \text{left} = \text{AVLTreeDelete}(r \cdot \text{left}, x)$

if $r \cdot \text{left} - r \cdot \text{right} < -1$

$y = \text{left rotate}(r)$

return y

else if ($x \cdot \text{key} > r \cdot \text{key}$)

$r \cdot \text{right} = \text{AVLTreeDelete}(r \cdot \text{right}, x)$

if $r \cdot \text{right} - r \cdot \text{left} < -1$

$y = \text{right rotate}(r)$

return y

else

if ($x \cdot \text{left} == \text{NIL}$) AND ($x \cdot \text{right} == \text{NIL}$)

return NIL.

else if ($x \cdot \text{left} == \text{NIL}$)return ($x \cdot \text{right}$)else if ($x \cdot \text{right} == \text{NIL}$)return ($x \cdot \text{left}$).
 $y = \text{minimum}(x \cdot \text{right})$ $\frac{x}{y} = \text{AVL Tree delete}(x \cdot \text{right}, y)$ $y \cdot \text{right} = z$. $y \cdot \text{left} = x \cdot \text{left}$ $y \cdot \text{height} = 1 + (\text{y} \cdot \text{r.h}, \text{y} \cdot \text{l.h})$

(restore AVL property at y).

return y.

$\text{minimum}(y)$
 returns finds
 minimum # key
 node in subtree
 rooted at y.
 if ($y \cdot \text{left} == \text{nil}$)
 return (y).
 else return
 ($\text{minimum}(y)$)

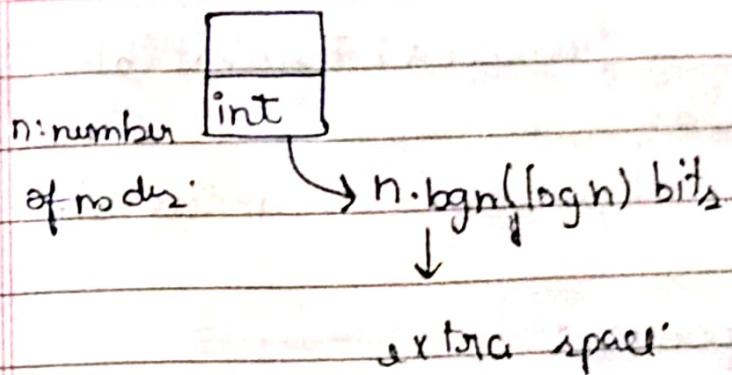
Lecture 26

Disjoint sets

- Application

- Operations

- Implementation



Use to:

BST → dynamic data

: AVL Trees.

One approach to improve the complexity!

Red-Black Tree:

* Disjoint sets: $\{1\}, \{2\}, \{3\}, \{4\}, \{5\}$ different set.

Union : operation $\{1, 2\} \cup \{3\} \cup \{4\}$.

Findset(u): return the representative element.

(for a set there should be only one representative)

Makeset(u): make a set out of a given key (element) & returns the representative i.e. itself.

$\{\{a\}\} \{\{b\}\} \rightarrow \text{findset}(a) \neq \text{findset}(b)$

$\hookrightarrow \{\{a\} \cup \{b\}\}$

$\hookrightarrow \text{findset}(a) = \text{findset}(b)$.

Connected-components:

Built up the sets each connected

component is a different set.

building:

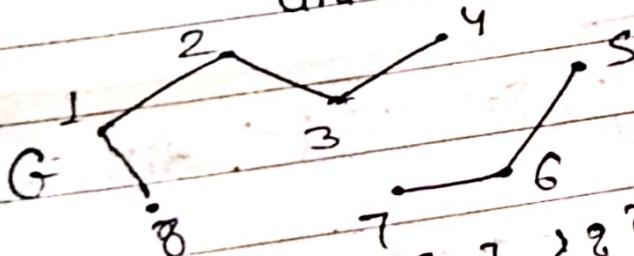
Connected-components(G)

for each vertex $v \in G, v$

markset(v)

for each edge $(u, v) \in G, E$

union(u, v)



$\{\{1, 3, 5, 2\}\} \dots \{\{7\}\} \{\{8\}\}$

$\{\{1, 8\}\}, \{\{2\}\} \dots \{\{7\}\}$

$\{\{1, 2, 8\}\} \dots \{\{7\}\}$

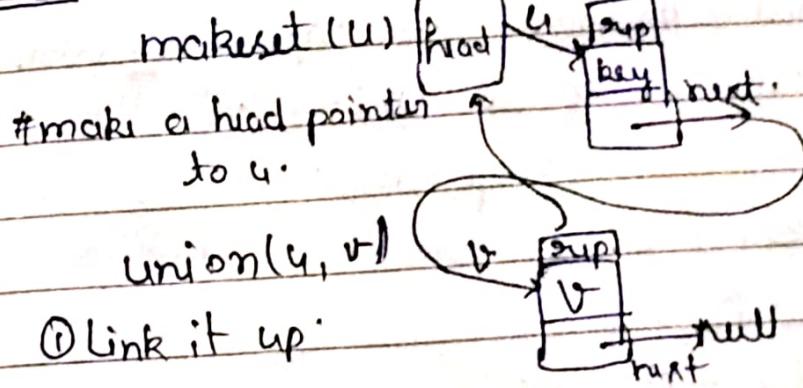
$\{\{1, 1, 3, 8, 4\}\} \{\{5, 6, 7\}\}$

$\{\{1, 1, 3, 8, 4\}\} \{\{5, 6, 7\}\}$

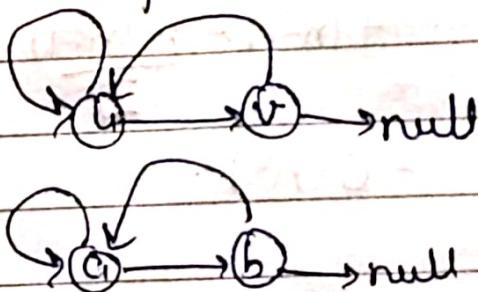
$\{\{1, 1, 3, 8, 4\}\} \{\{5, 6, 7\}\}$

Isconnected(x, y)
return $\{\text{findset}(x) = \text{findset}(y)\}$.

Linked list:



findset(v)
findset(u) → return (rep-value).



union(u, v) # currently our convention merges
2nd to 1st function

1. Traverse to last node of u set.
2. Change its next to 2nd set.
3. Update all the pointers in 2nd list to head of first list.

makeset: O(1)

findset: O(1)

n elements in all:

what is the worst case union union two? p.e.

The total cost of all unions:

(n-1) operations

1 2 : 1

3 1 2 : 2

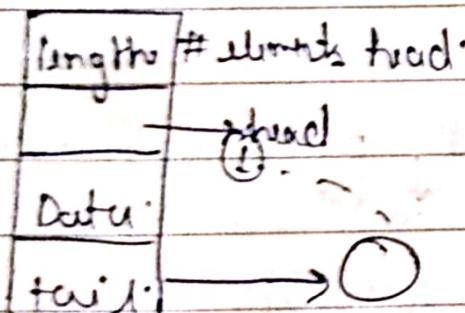
4 3 1 2 : 3

..... n n-1 n-2 ... 1 2 : n-1

$$\text{Total cost} = 1 + 2 + 3 + \dots + (n-1) = \frac{n(n-1)}{2}$$

$$= O(n^2)$$

Head:



makeSet(u):

⎩ allocate a header & put u as first & tail already
 O(1) ⎩ put length = 1.
 ⎩ return (pointer to u)

findSet(u)

return (u · sup)

$\text{union}(u, v)$ weighted union heuristic:

$x = \text{findset}(u)$

$y = \text{findset}(v)$

if ($x == y$)

} did not d.

return ($u \cdot v$)

7-2-19 Lecture: 27

Disjoint sets

Operations

Linked list implementation: Weighted union heuristic

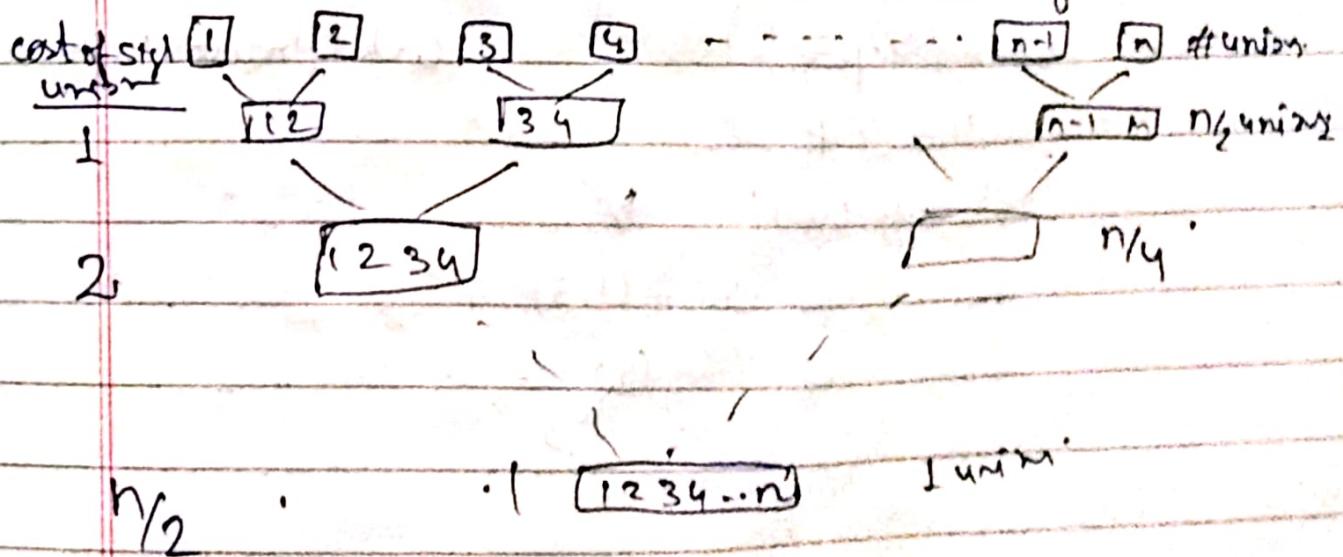
- Analysis
- other methods

Weighted union heuristic:

What is its worst case complexity?

Assume n makes ds.

& then unions result in 1 set of n items:



Total no. of operations:

$$= \frac{n}{2} \times 1 + \frac{n}{4} \times 2 + \frac{n}{8} \times 4 + \dots + 1 \cdot \left(\frac{n}{2}\right)$$

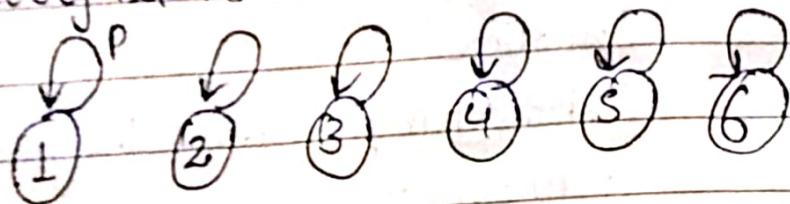
$$= \log_2 n \times \frac{n}{2} = O(n \log n)$$

The average cost $O(\log n)$.

Trees:

DISTINCT FOREST

→ Every set is a tree.



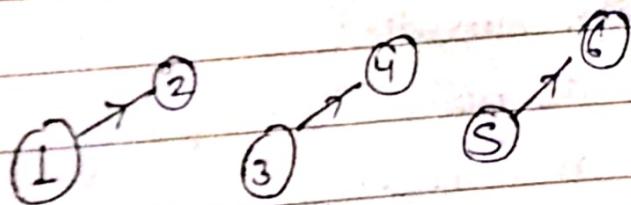
findset(u)

union(u,v)

link(u,v)

link(u,v)

$u.p = v$



findset(u)

while ($u.p \neq u$)

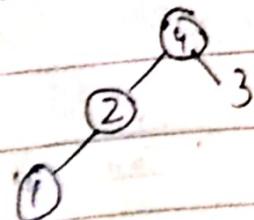
$u = u.p$

out $\text{findset}(u)$

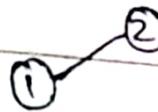
union(u,v)

link($\text{findset}(u), \text{findset}(v)$)

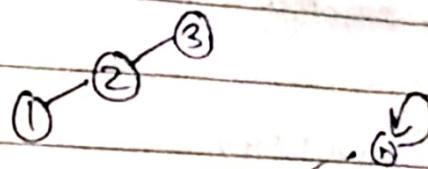
union(1,3)



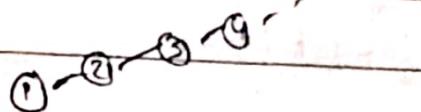
1 union(1, 2)



2 union(1, 3)



$n-1$ union(1, n)



$$1 + 2 + 3 + \dots + (n-1)$$

$$= \frac{n(n-1)}{2}$$

$$= O(n^2).$$

* Disjoint set with Disjoint forest implementation

* Ranked Union Heuristic:

A rank is an upper bound on a node's height

parent
data
rank.

makeSet(u)

$$u.p = u$$

$$u.rank = 0$$

findSet(u)

$$\text{while } u.p \neq u$$

$$u = u.p$$

return(u)

link(u, v)

if $u.rank < v.rank$

$$u.p = v$$

else $v.p = u$

$$\text{if } v.rank = u.rank \text{ then } u.rank = u.rank + 1$$

Union(u, v)

Union with standard Union Hurst.

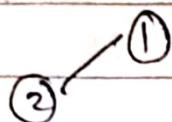
Union (u, v)

$$\text{link } p = \text{findst}(u)$$

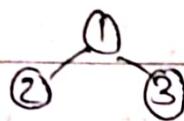
$$q = \text{findst}(v)$$

$$\text{link}(p, q)$$

1. Union (1, 2)



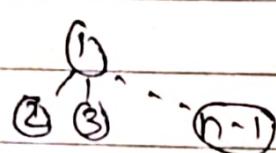
2. Union (1, 3)



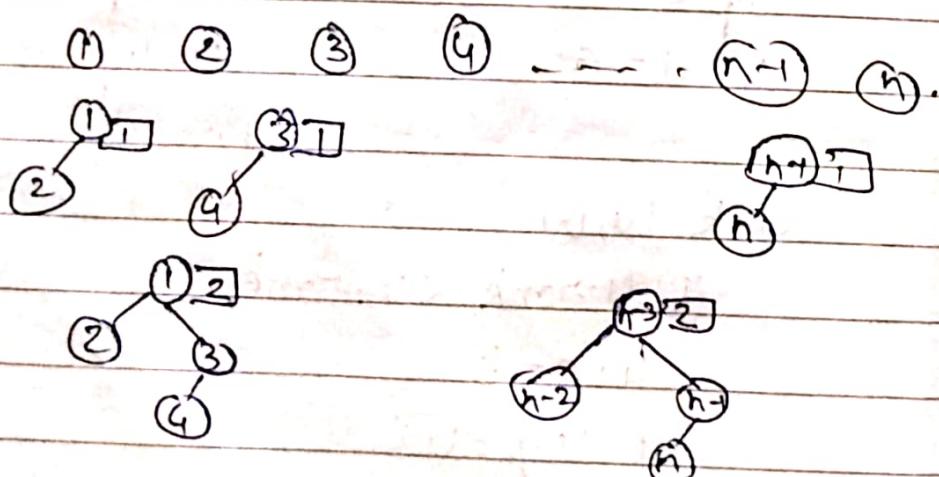
3. Union (1, 4)



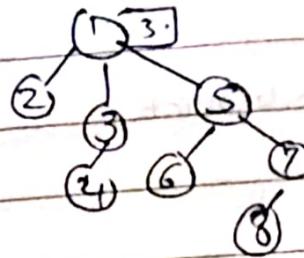
n-1 Union (1, n)



Worst case:



unior(4,8)



Sum-up union costs:

# unions	costs of single union
$n/2$	2×1
$n/4$	2×2
$n/8$	2×3
$n/16$	$n \times 4$

$$\sum \text{cost}_n = O(n \log n)$$

* Path compression Heuristic:

9-2-19 Lecture: 2.8

- Path compression & Ranked union.

- Analysis:

makeset(x)

$$x.rank = 0$$

$$x.p = x$$

Link(x, y)

if $x.rank < y.rank$

$x.p = y$

else

$y.p = x$

if ($x.rank == y.rank$)

$x.rank = x.rank + 1$

Union (a, b)

Link (findset(a), findset(b))

Findset (x)

if ($x.p == x$)

return (x).

else

$x.p = \text{findset}(x.p)$.

return (x.p)

* Analysis: (Potential method):

First study about very fast growing function:

$$A_K(j) = \begin{cases} j+1, & \text{if } k=0 \\ A_{K-1}(j), & \text{if } k>0 \end{cases}$$

$$A_{K-1}(j) = \begin{cases} j+1, & \text{if } k=0 \\ A_{K-2}(j), & \text{if } k>0 \end{cases}$$

$$K \geq 0 \quad j \geq 1.$$

$$A_k^i(j) = A_k(A_k^{i-1}(j))$$

$$A_k^{-1}(j) = A_k(j)$$

$$A_k^{-1}(j) = j$$

$$A_0(1) = 2$$

$$A_1(1) = A_0^2(1) = A_0(1)$$

How fast does $A_k(j)$ grow?
Theorem 1:

$$A_1(j) = A_0^{j+1}$$

$$= A_0(1)$$

$$A_0^i(j) = j^i$$

$$i = 1$$

$$A_0(1) = 1 + 1 \cdot$$

similarly Suppose

$$A_0^{j+1}(j) = A_0$$

Theorem 2:

$$A_2(j) = A_0^5$$

$$A_1^i(j) = 2^i$$

Prove it by

Base $i = 1$

$$A_1(j) = 2^j + 1 \quad (\text{Theorem 1}) \\ = 2^j(j+1) - 1.$$

$$\text{for } i, A_1^i(j) = 2^i(j+1) - 1$$

$$A_1^{i+1}(j) = A_1(A_1^i(j)) = 2(A_1^i(j)) + 1.$$

$$= 2(2^i(j+1) - 1) + 1$$

$$= 2^{i+1}(j+1) - 1.$$

proceed for $\overleftarrow{(i+1)}$.

$$\Rightarrow A_2(j) = A_1^{j+1}(j) = 2^{j+1}(j+1) - 1.$$

$$A_0(1) = 2$$

$$A_1(1) = 3$$

$$A_2(1) = 7$$

$$A_3(1) = A_2^2(1) = A_2(7) = 2^8(8) - 1 = 2047$$

$$A_4(1) = A_3^2(1) = A_3(A_3(1)) = A_3(2047) \\ = A_2^{2048}(2047)$$

$$= A_2^{2047}(A_2(2047))$$

$$= A_2^{2047}(2^{2048}(2048) - 1)$$

$$> 10^{700}$$

& $10^9 \approx \text{no. of atoms in}$

the universe

* A very slow growing function:

$d(n) = \max K$, such that

$$A_K(1) \leq n$$

$$= \max(K, A_K(1) < n)$$

$d(n)$	Θn
0	
1	

13-02-19: $d(n)$: slowly growing function

$$d(n) = \min \{K : A_K(1) \geq n\}.$$

$$n=1 \quad d(n)=0$$

$$n=2 \quad d(n)=0$$

$$n=3 \quad d(n)=1$$

$$n=4, 5, 6, 7 \quad d(n)=2$$

$$n=8, \dots, 2047 \quad d(n)=3$$

$$n=2048, \dots \quad d(n)=4$$

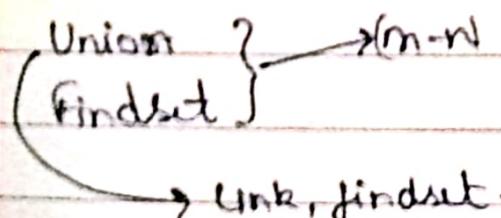
An analysis uses $\alpha(n)$ and proves that

$$\hat{C} = O(\alpha(n))$$

which is practically a constant.

m : Operations, n are makesets.

Makeset



$$\text{Union} = 1 \text{ link} + 2 \text{ findset}$$

m' operations such that they are independent i.e. makeset, link, findset.

$$m' \leq 3m = O(m)$$

m : n makesets + $m-n$ links & findsets.

$$\phi(F) = \sum_{x \in F} \phi(x)$$

$\phi_q(x)$: potential of x after q^{th} operation.

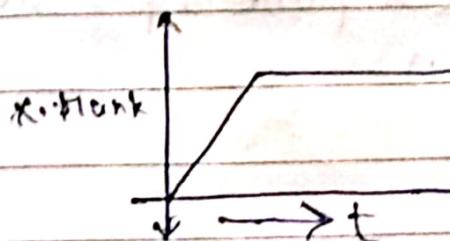
node is a leaf:

$$\phi(n) = d(n) \cdot x \cdot \text{rank}$$

node is a root:

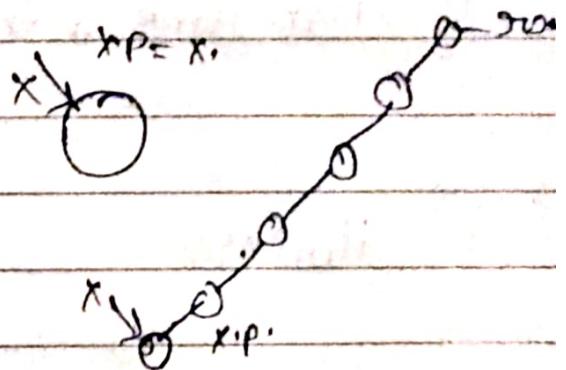
$$\phi(n) = d(n) \cdot x \cdot \text{rank}$$

①



monotonically increasing till it comes to be a root & then remains constant

② As we go on a path from x to the root, rank strictly increases atleast by 1 at a time



③ $x.p.rank$ monotonically increases over time & then remains constant.

* ~~isRoot(x)~~ / level(x):

What is the level (k) of Attr A_k that can be applied to it & still let it remain \leq rank of its parent.

$$\text{level}(A) = \max(k : A_k(x.rank) \leq x.p.rank)$$

* $\text{iter}(x)$: How many times can $A_{\text{ord}}(x)$ be applied to x -rank & still remain $\leq x$ -rank

no leaf nodes

$$\text{iter}(x) : \boxed{0 \leq \text{iter}(x) \leq d(n)}$$

$$\begin{aligned} A_{\text{ord}}(x\text{-rank}) &= x\text{-rank} + \\ &\leq x\text{-rank} + p\text{-rank} \end{aligned}$$

$$A_{\text{ord}}^k(x\text{-rank}) \geq A_{\text{ord}}^k(1)$$

$$\geq n$$

④ Non-rank is (not even with) heuristics:

$\text{iter}(x)$:

$$\boxed{1 \leq \text{iter}(x) \leq x\text{-rank}}$$

$$\text{iter}(x) =$$

$$\max_j : A_{\text{ord}}^j(1) \leq x\text{-rank}$$

$$\leq p\text{-rank}$$

$$A_{\text{adv},j}^k(x\text{-rank}) \leq x\text{-rank}$$

$$A_{\text{adv},j}^k(x\text{-rank}) > a.p.\text{-rank}$$

(by def. of iter)

L.H.S = $\text{Avail}(v)$ (rank) \geq r.rank.

- 14-02-19 - Analysis of D.S. forests with packed Union & path compression
- Mergeable heaps
- Binomial heaps:

non-root with leaf nodes:

$$\phi(v) = (d(n) - \text{Avail}(v)) \cdot \text{rank} - \text{rank}$$

$$\phi_0(F) = 0 \quad m -$$

n-makarū

after n makarū

$$\phi(F) = 0$$

Show that after all subsequent operations $\phi(F) \geq 0$

leaf nodes \rightarrow alive non-root node
root nodes potential non-leaf

As in the previous case, $\text{Avail}(v) = d(n) - 1$

$$\Rightarrow \phi(v) = (d(n) - (n-1)) \cdot \text{rank} - \text{rank}$$

$$= 1 \cdot \text{rank} - \text{rank} \rightarrow \text{when one value is removed}$$

$$\Rightarrow \phi(v) \geq 0 \text{ (Always)}$$

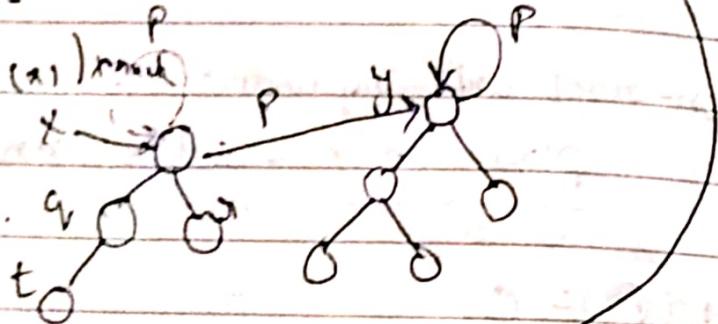
	C	$\Phi_g - \Phi_{g-1}$	\hat{C}
Markst	1	0	1
Link	1	$x: \text{fall in } \Phi \text{ by at least 1.}$ $y: \text{either 0, or } d(n).$ $z, w:$	$1 + (-1) + d(n)$ $= d(n).$

for $x: \Phi_g - \Phi_{g-1}$

$$= (d(n) - \text{level}(x)) \cdot \text{rank}$$

- $\text{iter}(x)$

- $d(n) \cdot \text{rank} \cdot g$



$$= -\text{level}(x) \cdot \text{rank} - \text{iter}(x)$$

either 0, or

if y 's rank changes.

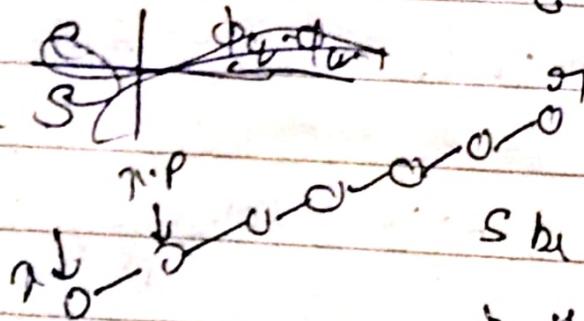
① If level does not change it

- iter changes so -1 or less.

② If level changes

$z \cdot \text{rank}$ or $w \cdot \text{rank}$.

findset: S



S be the number of nodes
in the path from x to n

claim: At least $s - 2 - \alpha(n)$ nodes have a drop in potential, by at least 1.

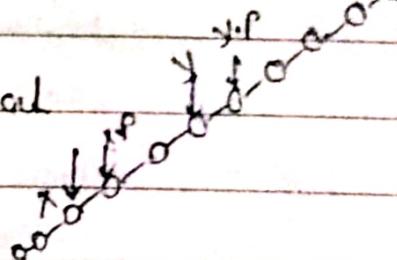
Suppose it was true:

$$\text{findset } \{ s \mid -(s - 2 - \alpha(n)) \leq 2 + \alpha(n) \}$$

Let x be a node such that it has level $\text{level}(x)$ and somewhere higher in the path there is a node y such that level ' x ' is equal to level ' y ', i.e. ($\text{level}(x) = \text{level}(y)$) then x has drop by at least one.

$$x.\text{rank} < x.p.\text{rank} \leq y.\text{rank} < y.p.\text{rank}$$

$$\leq y.\text{rank}'$$



$$\underset{\text{level}(x)}{A_{\text{level}(x)}} \underset{\text{item}(x)}{(x.\text{rank})} \leq x.p.\text{rank} \leq y.\text{rank} < y.p.\text{rank}$$

$$\leq y.\text{rank}'$$

$$\underset{\text{level}(x+1)}{A_{\text{level}(x+1)}} \underset{\text{item}(x+1)}{(x.p.\text{rank})} > x.p.\text{rank}$$

$$\underset{\text{level}(x)}{A_{\text{level}(x)}} \underset{\text{item}(x)}{(y.p.\text{rank})} < \underset{\text{level}(x)}{A_{\text{level}(x)}} \underset{\text{item}(x)}{y.\text{rank}} \leq y.p.\text{rank}$$

$$\leq y.\text{rank}'$$

Mergeable Heaps:

- Binomial heaps
- Fibonacci heaps

Heaps: Priority Queues.

Scheduling:

Mergeable Heaps:

Makeheap(H):

Insert(H, x)

Minimum(H) # return the node with minimum value

Extract min(H) [return x] (x is the minimum element)
 $H = H - \{x\}$

Union(H_1, H_2) → return (H), where H

is $H_1 \cup H_2$:

Decrease Key (H, x, k)

if $k < x.key$

$x.key = k$.

Delete(H, x)

$H = H - \{x\}$

return (H)

Binary Heap:

Make

 $O(1)$

Insert

 $O(\log n)$

Minimum

 $O(1)$

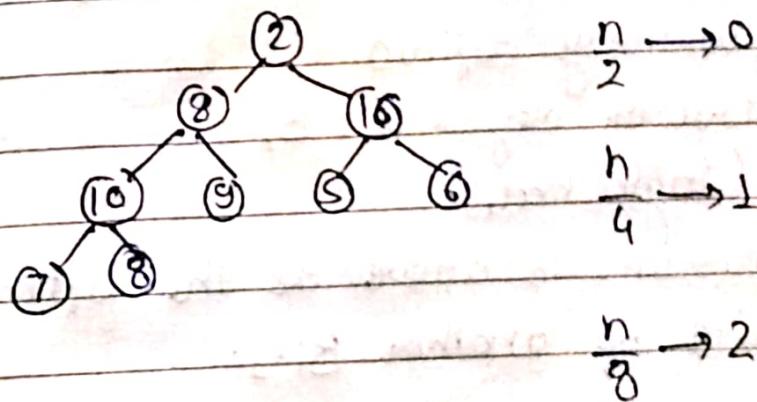
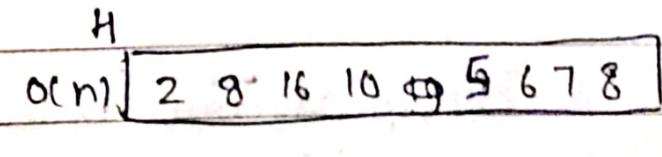
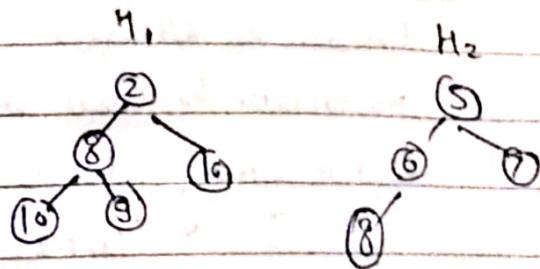
Extract min

 $O(\log n)$

Decrease-key

 $O(\log n)$

Delete

 $O(\log n)$ 

$$\frac{n}{2^{\log_2 n}} (\log n - 1)$$

Total # steps:

$$\begin{aligned}
 & \frac{n}{4} \cdot 1 + \frac{n}{8} \times 2 + \dots + \frac{n}{2^i} (i-1) + \dots + \frac{n}{2^{\log_2 n}} (\log_2 n - 1) \\
 &= \frac{n}{4} \left[1 + \frac{1}{2} + \frac{1}{2^2} + \dots + \frac{1}{2^{\log_2 n}} \right] + \frac{n}{8} \left[1 + \frac{1}{2} + \frac{1}{2^2} + \dots + \frac{1}{2^{\log_2 n-1}} \right] \\
 &\quad + \frac{n}{16} \left[1 + \frac{1}{2} + \dots + \frac{1}{2^{\log_2 n-2}} \right] \\
 &\leq \frac{n}{4} [2] + \frac{n}{8} [2] + \frac{n}{16} [2] + \dots \\
 &\quad , \dots [1 + \frac{1}{2} + \frac{1}{2^2} + \dots] \leq 2n \cdot \frac{1}{2}
 \end{aligned}$$

Binomial Heap:

Union is $O(\log n)$

Minimum is also $O(\log n)$

& everything else is also $O(\log n)$
(context of heap).

* Binomial Tree (basis for a binomial heap)

↳ Ordered tree

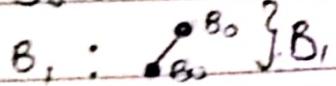
recursively defined

Binomial tree of degree k : B_k

B_0 : • (single node).

B_i : One B_{i-1} is added as the leftmost child of another B_{i-1} .

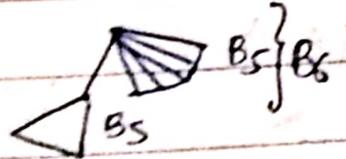
B_1 :



B_2 :



B_3 :



① The number of nodes in B_k is 2^k

- Inductive proof

B_0 : $2^0 = 1$ base

Let $B_i : 2^i$

Then $B_{i+1} : 2^{i+1} = 2^i \cdot 2^1$

(2) Height of B_K = K

B_0 : ht is 0

Let B_i ; height is i

B_{i+1} : because one B_i is connected as child
so: $i+1$

(3) The number of nodes at level i in a B_K tree is ${}^K C_i$.

$$K=0 \quad {}^0 C_0 = 1$$

Assume, true for K

${}^K C_i$: # of nodes in level i of B_K

Then number of nodes in level i of B_{K+1} :

$${}^K C_i + {}^{K+1} C_i$$

(4) Max degree in B_K tree is K & root node has it;

the child nodes are ordered as $K-1, K-2, \dots, 0$
from left to right and each of those is a root
of a B_i tree, where i is its order number

B_0 : trivially true

B_K : let us assume it to true,

prove it for B_{K+1}

\hookrightarrow $K-1$ to 0 satisfy by our assumption.

call leftmost child ' k ' (has degree k).

$\rightarrow B_{K+1}$ tree satisfies

$$\boxed{2^k = n}$$

$$\boxed{k = \log_2 n}$$

height:

19-02-19 Binomial Steps: \rightarrow Mergable steps.

- Binomial Tree

- A binomial heap

- Operation:

Union operation

B_k : Binomial tree of degree k .

\downarrow

$2^k \rightarrow$ height: $\log_2 n$

k

of nodes at level i in $B_k = {}^k C_i$

root: max degree k .

child nodes: $k-1$ to 0 ordered

degrees: also $k-1$ to 0 respectively.

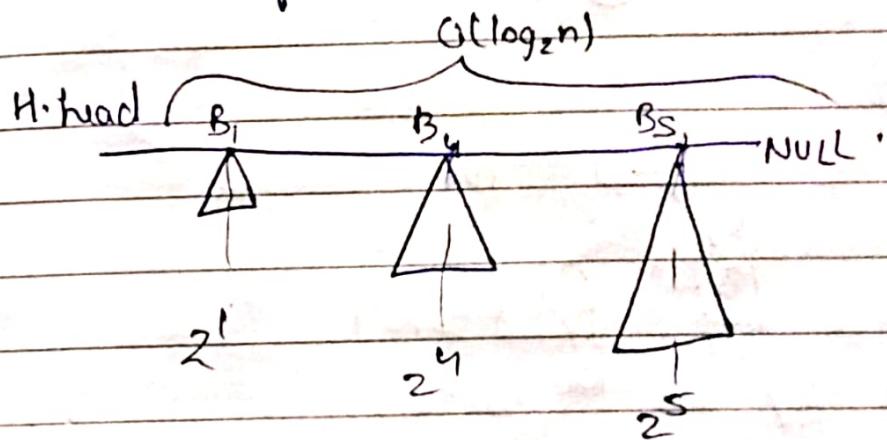
Heap property : (Min)

Every node in the B_k tree satisfies the property that its key is less than or equal to all its child nodes' keys.

$$50 = \begin{bmatrix} 3 & 2 & 10 \\ 1 & 0 & 0.1 & 0 \\ 5 & 4 & 3 & 2 & 1 & 0 \end{bmatrix} \rightarrow \text{length: } [\log_2 n].$$

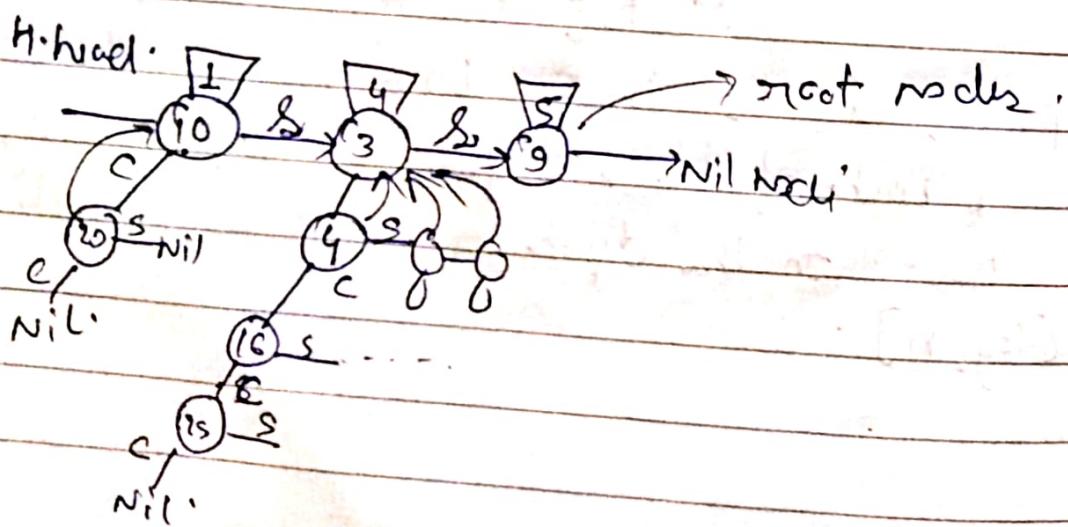
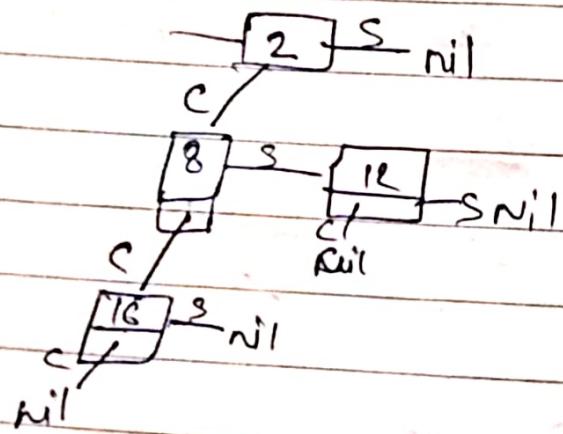
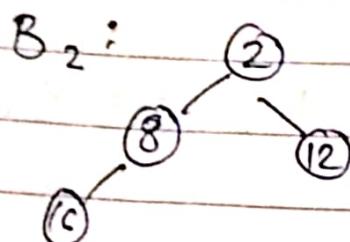
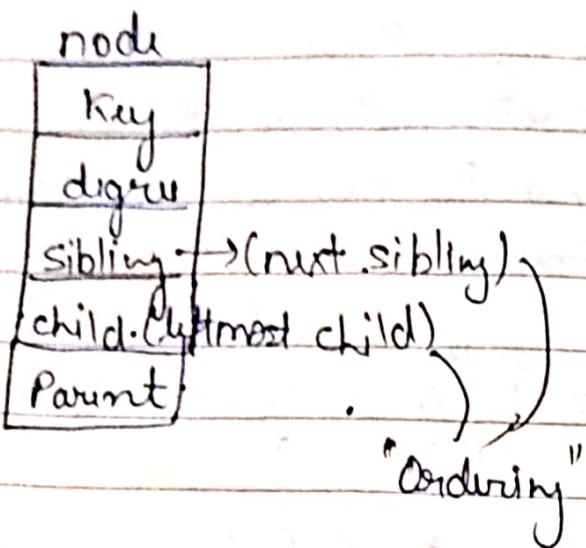
B_5 & B_4 & B_1

linked list of these three binomial trees



Binomial heaps:

Linked list of Binomial tree corresponds to 1's in the binary rep. of n .
Each of them satisfies the heap property.
Bound on the depth of any tree in this list is $[\log_2 n]$.



Heap H : head field \rightarrow nil or points to first root node.

root node list : sorted by degree.

MakeHeap (H)

H·head = NULL.

MakeHeap (H, X) \rightarrow fields of X.

X·S = nil

X·C = nil

X·P = nil

X·deg = 0

H·head = X

rigid structures always preserved.

minimum (H) # returns the min element

Search in the sibling root list

(sibling pointer)

return minimum element.

$O(\log n)$

Binomial link (x, y) # called with root pointers x & y,
 where roots of binomial heaps
 of binomial heaps of degree ($x \cdot \text{deg}$)

return a binomial tree of degree ($x\cdot \text{degree} + 1$)
by linking these 2 trees & heap property retained

Binomial link (x, y)

if ($x \cdot \text{key} \geq y \cdot \text{key}$)

$$x \cdot s = y \cdot c$$

$$y \cdot c = x$$

$$x \cdot p = y$$

$$y \cdot \text{degree} = y \cdot \text{degree} + 1$$

return y .

else

$$y \cdot s = x \cdot c$$

$$x \cdot c = y$$

$$y \cdot p = x$$

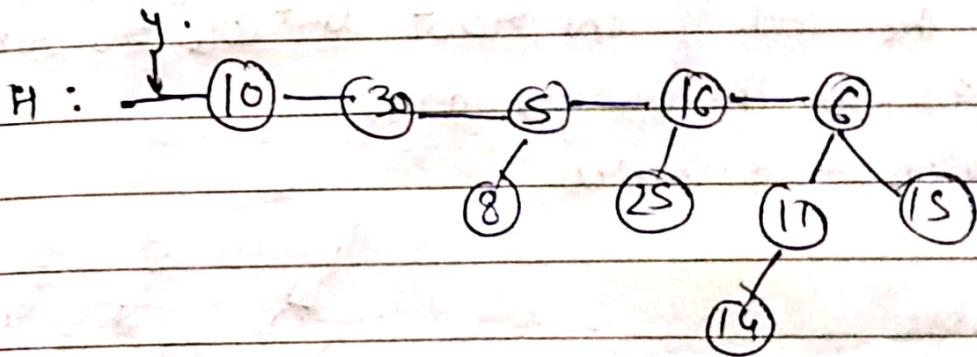
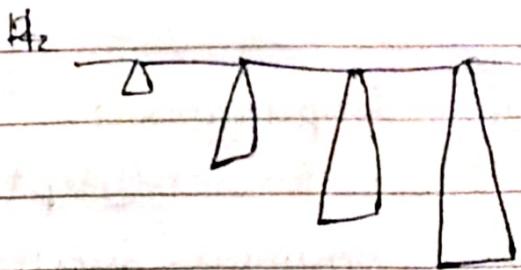
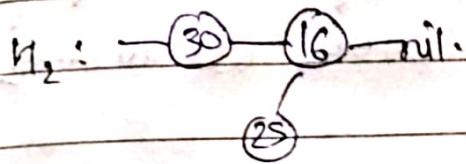
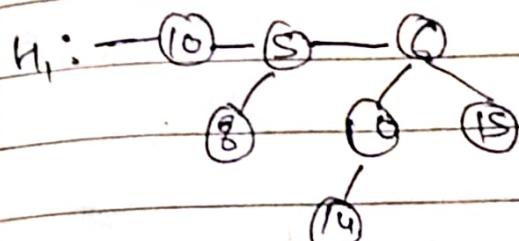
$$x \cdot \text{degree} = y \cdot \text{degree} + 1$$

return y .

Binomial link is going to have a complexity of $O(1)$.

Union (H_1, H_2)

Initialize heap H . Merge the root lists H_1 & H_2 into H . In sorted by degree order.



start traversing from the left & merging 2 trees of equal degree into one of higher degree.

loop invariant: ① All roots upto x are maintained and have degree less than the next tree in correct binomial heap order and have degree less than 11 next tree. ② y is the next node & the root list from y is in the 'merged' order only.

③ $x \cdot \text{degree} \leq y \cdot \text{degree}$.

$n(H_1, H_2)$ $x = \text{nil}$ $H = \text{head}$ $(y = \text{nil})$ $\text{return}(H)$ \dots

invariant:

① Up to node x , heap H is in proper initial heap order & covers all elements up to tree.

the end of the root list are the remaining nodes in the merged order.

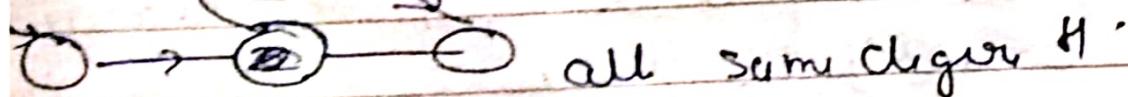
 $\text{y.degree} \leq \text{y.degree}$ 

else

 $z = y.\text{next}$ $\text{while } (z \neq \text{nil})$

$\text{x.degree} = y.degree$, then there can be only ts in y 's list possibly, yet z , with

$\text{degree as } z'$
 z \downarrow $z.\text{next}$



$s.degree = z.degree \& z.next \neq \text{higher degree/nil}$

③ $y \cdot \text{degree} < z \cdot \text{degree}$

$\hookrightarrow x \cdot \text{degree}$ must have been $< y \cdot \text{degree}$

else

- $z = y \cdot \text{next}$

while ($z \neq \text{null}$)

if ($y \cdot \text{degree} < z \cdot \text{degree}$)

advance to the right

$((y \cdot \text{degree} = z \cdot \text{degree}) \text{ if } (z \cdot \text{next} \neq \text{null}))$

$(z \cdot \text{degree} = z \cdot \text{next} \cdot \text{degree})$

$x = y$

$y = z$

$z = z \cdot \text{next}$

else

$q = y$

$r = z$

$t = z \cdot \text{next}$

$b = \text{binomial_int}(y, z)$

$x \cdot s = r$
 $b \cdot s = t$

if ($x == \text{null}$)

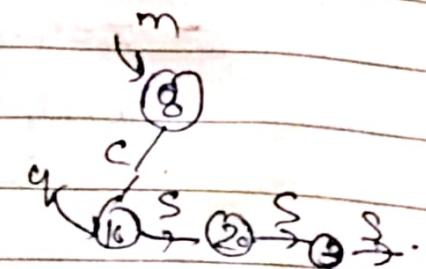
$K \cdot \text{head} = b$

else

$r \cdot s = b$

$y = b$
 $z = b \cdot s$

Extract-Min(H)

1. $m = \text{minimum}(H)$ 2. Remove m from the link list of H . head.
(root node).3. $q = m.c$ 4. Initialise heap H_1 .5. put elements in q into H
in reverse order.6. $H = \text{Union}(H, H_1)$ return (m) $m.c = \text{nil}$, $m.s = \text{nil}$ return (m)Decrease-Key (H, x, k)# give x decrease its key to k .only if $x.key > k$.if ($x.key > k$) $x.key = k$ $y = x.p$ while ($y != \text{nil}$) { if ($y.key > k$) }exchange $y \& x$.

Delete(H, x)

$x.key = -\infty$ (Decrease key($H, x, -\infty$))

Decrease key($H, x, -\infty$) $\rightarrow \log n$

Extract min(H) $\rightarrow \log n$.

20-02-19

Fibonacci Heaps:

Mergeable Heap

Union is efficient.

$O(1)$ for almost all operations except
insertion & delete: $O(\log n)$

Like a binomial heap

\hookrightarrow made of binomial trees in heap

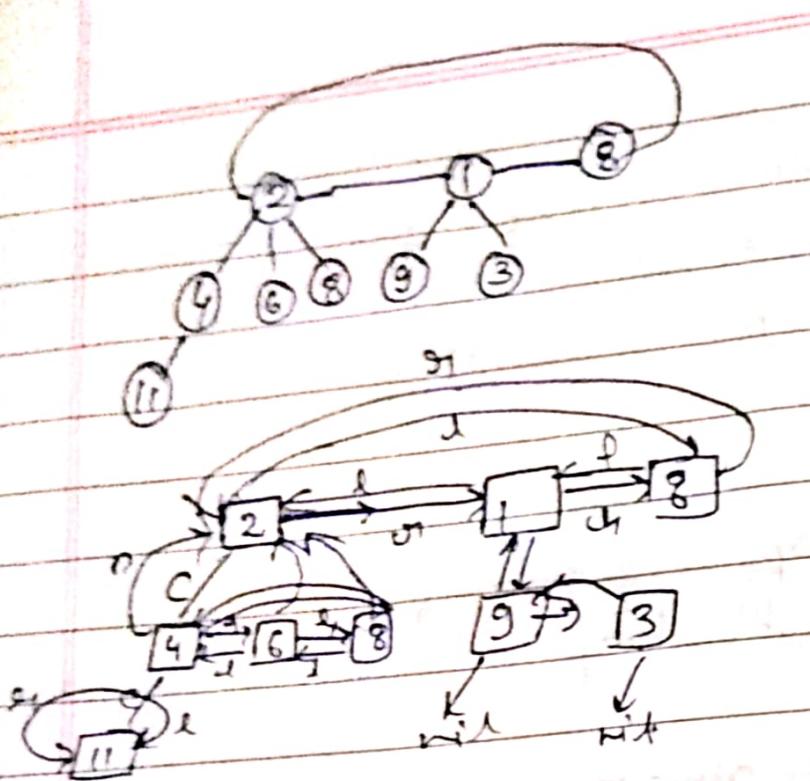
order.

\hookrightarrow Fib. Heap: (relax some of the very strict requirements of the binomial tree heap).

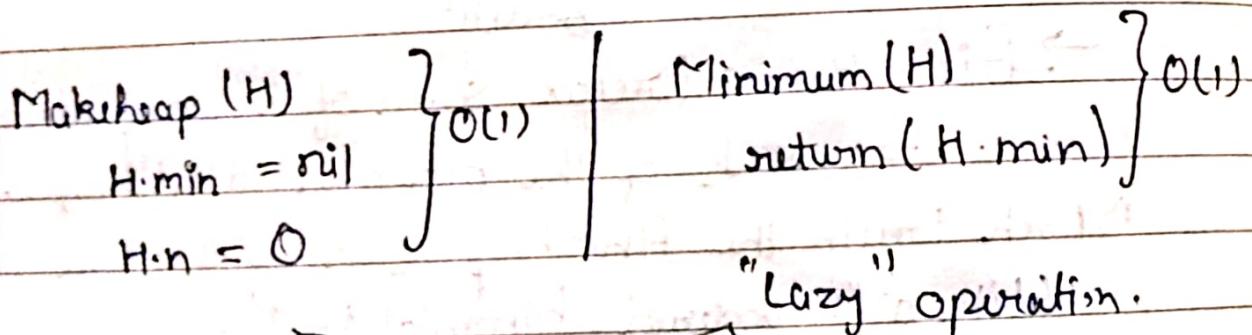
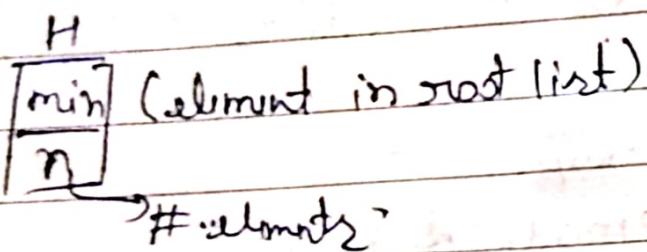
1) Each tree in the Fib. Heap is a rooted tree, not ordered (like a "unordered binomial tree").

2) Each tree is "allowed" to be deficit in some nodes (in a "controlled" manner)

Root list - { Doubly linked circular list
child list of a node - }



key	
child	
left (sibling)	
right (sibling)	
parent	
degree	
mark	"false" (status)



Insert (H, x)

$$x \cdot p = \text{nil}$$

$$x \cdot c = \text{nil}$$

slice $H \cdot \text{min}$, insert x into it

set $H \cdot \text{min}$ to min of $H \cdot \text{min}$ and x (by key value)

$$H \cdot n = H \cdot n + 1$$

Union (H_1, H_2)

slice the 2 just lists & join them } O(1)

$$H_1 \cdot \min = \min(H_1 \cdot \min, H_2 \cdot \min)$$

$$H_1 \cdot \pi = H_1 \cdot \pi + H_2 \cdot \pi$$

Extract-min (H)

remove $H \cdot \min$ and

consolidate the heap

↳ (like a binomial heap).

Potential function:

$$\phi(H) = t(H) + 2m(H)$$

number of trees in
the root list.

No. of "marked" nodes.

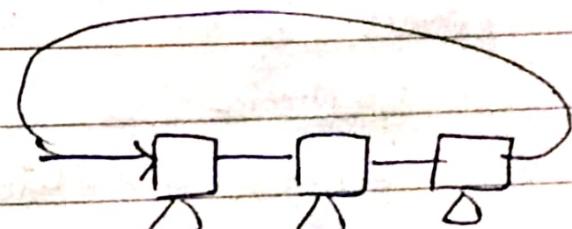
Mark	
1	→ Not marked
0	→ Not marked

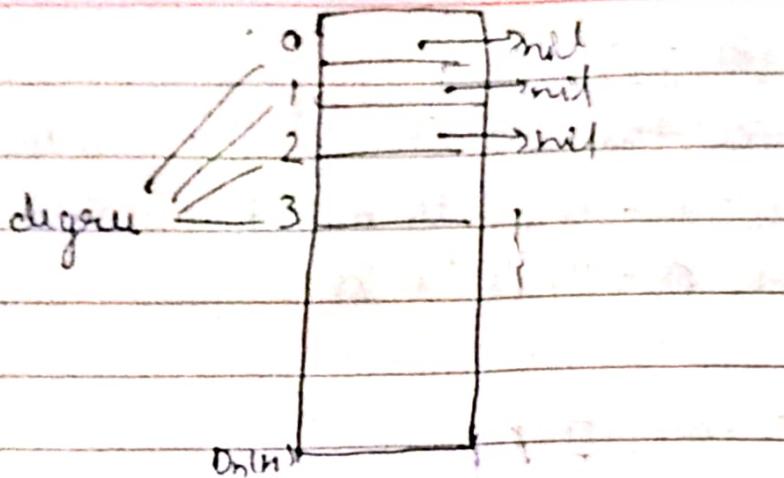
Consolidate (H)

Array $A[0 \dots D_n(H)]$

↳ where $D_n(H)$ is

an upper bound on the degree of a node in
an n node heap.





for every element in root list let K be its degree
 if $A[K] = \text{nil}$
 $A[K] = X$

else

12-19 Fibonacci Heaps \rightarrow lazy paradigm for
 Operations & analysis consolidation

more space (const per node)

Extract_min (H)

$$y = H.\min$$

if ($y == \text{nil}$) return y

else

$$z = y.\text{right}$$

if ($z == y$) $H.\min = \text{nil}$

$$H.n = 0$$

return (z)

else

remove y from root list

$m = \text{consolidate}(z)$

return the new min element.

$H \cdot \min = m$

$H \cdot n = H \cdot n - 1$

return (y)

Consolidate(z)

$\min = \Sigma$

for each element x in the list of z

if ($x \cdot \text{key} < \min \cdot \text{key}$)

$\min = x$

$d = x \cdot \text{degree}$

while ($A[d] \neq \text{nil}$)

$q = A[z]$

if ($x \cdot \text{key} < q \cdot \text{key}$)

fiblink(q, x)

else

exchange(x, q)

fiblink(q, x)

$d = d + 1$

$A[d] = x$

connect all the roots in A in circular chain

Return (min)

fib-link (a, b)
 $e_1 \cdot p = b$, $b \cdot \text{degree} = b \cdot \text{degree} + 1$
all other adjustments

Time complexity: (of consolidate (z))
 $O(D_n(H) + n)$

Amortized Analysis:

potential difference:

$$\phi_{i-1} = t_{i-1}(H) + 2m(H)$$

$$\phi_i \leq D_n(H) + 2m(H)$$

$$\phi_i - \phi_{i-1} \leq O_n(H) - t_{i-1}(H)$$

Actual cost:

for loop: Actual cost = $t_{i-1}(a) + D_n(H)$

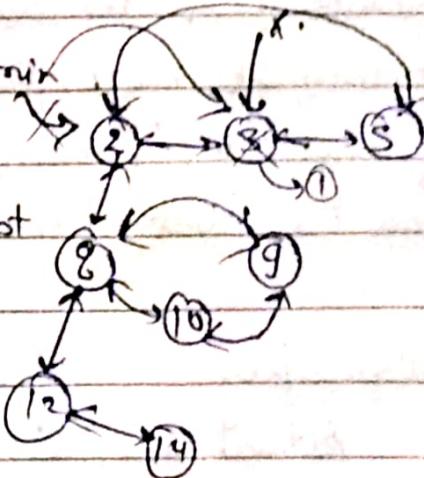
: in each while loop
t falls by 1 & it can't be less than 1.

$$\begin{aligned}\hat{c} &= t_{i-1}(a) + D_n(H) + D_n(H) - t_{i-1}(a) \\ &= O(D_n(H))\end{aligned}$$

Isolate y (Statement in the Extract-min)

Add the child list of y to the root list
setting their parent pointer to nil.

Decrease key (x, k) H-min



when x is a part of root
Just decrease & send
the fl-min if required.

when x is a non-root node

Decrease the key & make the subtree rooted at
 x a part of the root list.

set parent to nil

update the H-min

mark($x.p$) # set $x.p.mwt=1$

if $x.p$ was marked, remove $x.p$'s mwt.

if $x.p$ was a mark node

cut $x.p$ & follow it up with a "cascading cut"

Cascading cut = Cut the node & put in root node loop

if parent is "marked" do the same with
parent.

Till an unmarked node or "end" is reached, keep putting the nodes in rootlist & unmark them.

So, a cascading cut, would result in nodes along "A" pointers from the node x (and subtrees) to either an unmarked node, or root node to become part of rootlist (subtrees). The roots are unmarked. Also the last "unmarked" node is marked.

Decreasing key

Actual key: 'C' nodes were cut & made a part of root list.

$$\phi_{i-1}(n) = f(n) + 2m(n)$$

$$\phi_i(n) = f(n) + c + 2m(n) - 2(c-1)$$

$$\text{Diff. in } \phi = -c + 2$$

$$\text{Actual cost} = c$$

$$c = 2$$

Delete (n, x)

