

# CS140: Algorithms

Z Sweedyk  
Lecture 3

9/17/01

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## Data Structures

- Elementary data structures
- Heaps
- Binary Search Trees
- Treaps

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## Elementary data structures

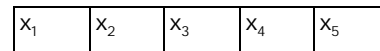
- Arrays and linked lists
- Stacks and queues
- Graphs
- Rooted trees

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## Arrays



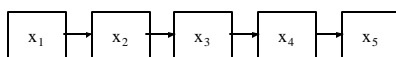
- Read  $i^{\text{th}}$  cell
  - Write  $i^{\text{th}}$  cell
  - Insert  $i^{\text{th}}$  cell
  - Delete  $i^{\text{th}}$  cell
- $O(\text{---})$
  - $O(\text{---})$
  - $O(\text{---})$
  - $O(\text{---})$

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## Linked List



- Read  $i^{\text{th}}$  cell
  - Write  $i^{\text{th}}$  cell
  - Insert  $i^{\text{th}}$  cell
  - Delete  $i^{\text{th}}$  cell
- $O(\text{---})$
  - $O(\text{---})$
  - $O(\text{---})$
  - $O(\text{---})$

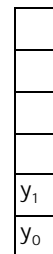
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## Stack

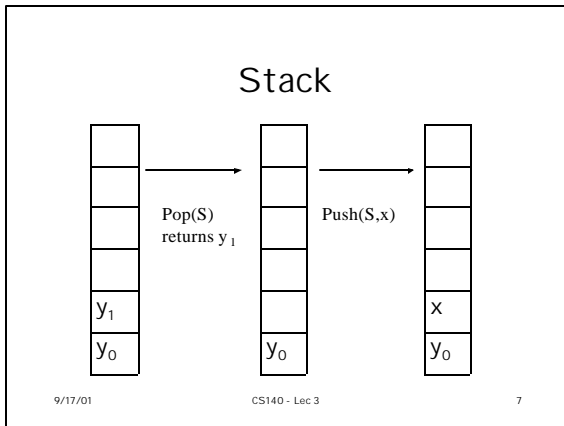
- Push( $x, S$ )
- $x = \text{Pop}(S)$



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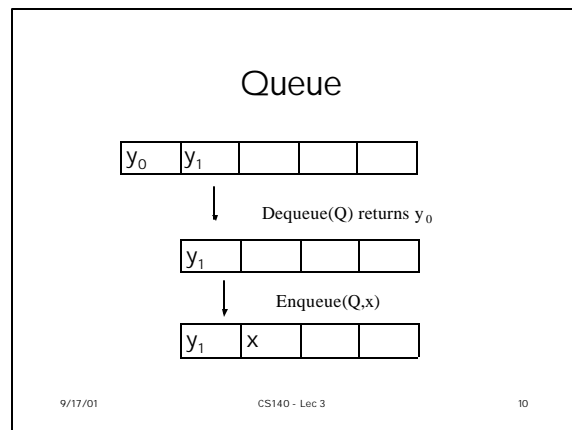
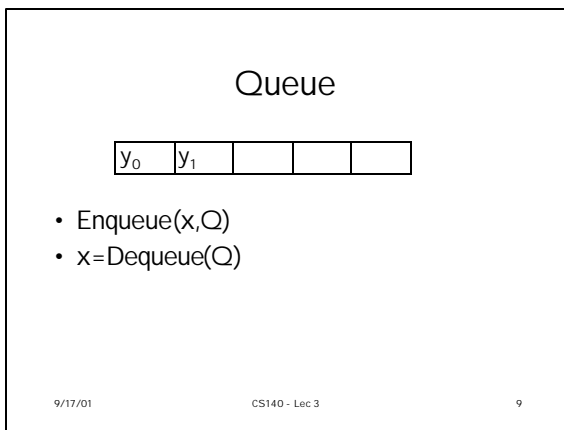


### Stack

Implement with linked lists or arrays to get  $O(\_)$  per operation:

$\text{Push}(x, S)$   
 $x = \text{Pop}(S)$

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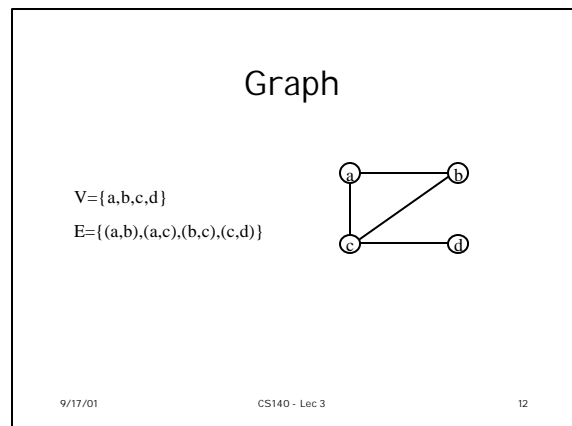


### Queue

Implement with linked list or (circular) array to get  $O(\_)$  time per operation:

- $\text{Enqueue}(x, Q)$
- $x = \text{Dequeue}(Q)$

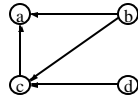
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## Directed Graph

$V = \{a, b, c, d\}$

$E = \{ \langle b, a \rangle, \langle b, c \rangle, \langle c, b \rangle, \langle c, d \rangle \}$

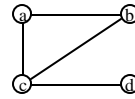


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## Graph - adjacency list



a: b, c

b: a, c

c: a, b, d

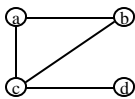
d: c

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## Graph - adjacency matrix



	a	b	c	d
a	0	1	1	0
b	1	0	1	0
c	1	1	0	1
d	0	0	1	0

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## Graphs (n vertices, m edges)

- Is  $(u, v)$  an edge of  $G$ ?
  - Adjacency list:  $O(\text{degree}(u))$
  - Adjacency matrix:  $O(n)$
- What are the neighbors of  $v$  in  $G$ ?
  - Adjacency list:  $O(\text{degree}(v))$
  - Adjacency matrix:  $O(n)$

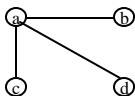
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## Trees

- A tree is a connected, acyclic graph.



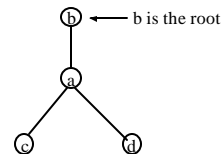
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## Rooted Trees

- A rooted tree is a connected, acyclic graph with one vertex designated as the root.



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## Rooted Trees

Implement with pointers

- What is the root of  $T$ ?  $O(\text{---})$
- What is the parent of  $v$ ?  $O(\text{---})$
- What are the children of  $v$ ?  $O(\text{---})$

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## Heap

- Data structure for a set of integers to facilitate
- 

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## Heaps

A heap is a data-structure for storing integer that supports:

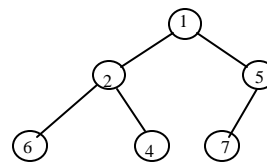
1. Build-heap( $S$ ): Return a heap on the integers in the set  $S$ .
2. Insert( $x, H$ ): Insert the integer  $x$  into the heap  $H$ .
3. Find-min( $H$ ): Return the smallest integer in the heap  $H$ .
4. Extract-min( $H$ ): Remove the smallest integer from the heap  $H$  and return it.

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## Heap: {7,1,5,4,2,6}



1. Rooted, binary tree, filled level by level from the left.
2. (Min) Heap property: the integer stored at a node is no larger than those of its descendants.

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## Heap

A heap is a data-structure for storing integer that supports:

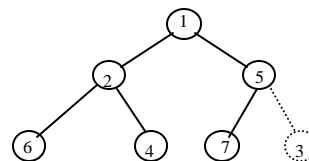
1. Build-heap( $S$ ): Return a heap on the integers in the set  $S$ .
2. Insert( $x, H$ ): Insert the integer  $x$  into the heap  $H$ .
- $O(1)$  3. Find-min( $H$ ): Return the smallest integer in the heap  $H$ .
4. Extract-min( $H$ ): Remove the smallest integer from the heap  $H$  and return it.

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## Insert(3,H) - Step 1 (add)

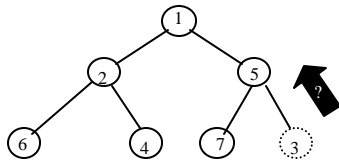


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### Insert(3,H) - Step 2 (bubble up)

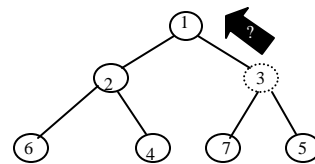


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### Insert(3,H) - Step 2 (bubble up)

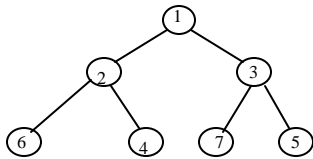


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### Insert(3,H) - return



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### Heap

A heap is a data-structure for storing integer that supports:

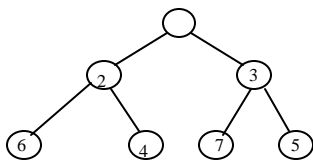
1. Build-heap(S): Return a heap on the integers in the set S.
- $O(\lg n)$  2. Insert(x,H): Insert the integer x into the heap H.
- $O(1)$  3. Find-min(H): Return the smallest integer in the heap H.
4. Extract-min(H): Remove the smallest integer from the heap H and return it.

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### Extract-min(H) - Step 1 (remove)

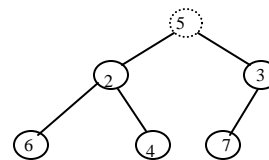


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### Extract-min(H) - Step 2 (move last to root)

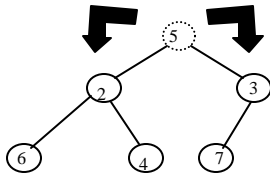


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### Extract-min(H) - Step 3 (bubble down)

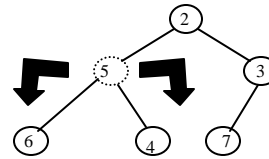


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### Extract-min(H) - Step 3 (bubble down)

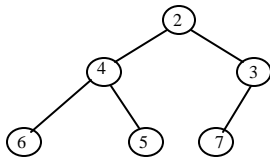


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### Extract-min(H) - return



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### Heap

A heap is a data-structure for storing integer that supports:

1. Build-heap(S): Return a heap on the integers in the set S.
- $O(\lg n)$  2. Insert(x,H): Insert the integer x into the heap H.
- $O(1)$  3. Find-min(H): Return the smallest integer in the heap H.
- $O(\lg n)$  4. Extract-min(H): Remove the smallest integer from the heap H and return it.

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### Heap

A heap is a data-structure for storing integer that supports:

- $O(n)$  1. Build-heap(S): Return a heap on the integers in the set S.
- $O(\lg n)$  2. Insert(x,H): Insert the integer x into the heap H.
- $O(1)$  3. Find-min(H): Return the smallest integer in the heap H.
- $O(\lg n)$  4. Extract-min(H): Remove the smallest integer from the heap H and return it.

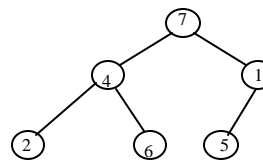
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### Build-heap{7,1,5,4,2,6}

Build rooted tree



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Build-heap{7,1,5,4,2,6}

Fix subtrees

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Build-heap{7,1,5,4,2,6}

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Build-heap{7,1,5,4,2,6}

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Build-heap{7,1,5,4,2,6}

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### Running Time

The leaves are at height 0. Consider the nodes at height  $i$ .

How long does it take to fix a subtree rooted at height  $i$  assuming its children root heaps?

How many nodes are at height  $i$ ?

What is the running time of Build-heap?

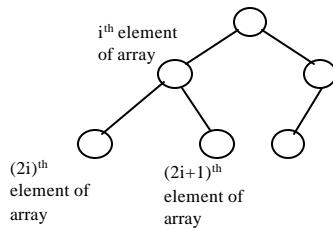
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### Implementing a heap in an array

2	4	3	6	5	7
---	---	---	---	---	---

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## Array Indexing



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## Heap-sort(S)

$H = \text{Build-heap}(S) \rightarrow O(n)$   
 For  $i=1$  to  $n$   
      $S(i) = \text{Extract-min}(H) \rightarrow O(\lg n)$   
 Return

Heap-sort is  
 $O(n \lg n)$

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## Dictionary Data Structure

Data structure that supports add, delete, find for set of keyed records.

Binary search tree

Balanced binary search tree

General search tree

Hash Table

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## Binary Search Tree for S

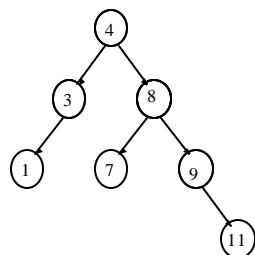
- T is a rooted, binary tree
- Each node in T is assigned a record in S (one-to-one)
- BST Property: For any node X in T
  - If node Y is in the left subtree of X then  $Y.\text{key} \leq X.\text{key}$
  - If node Y in the right subtree of X then  $Y.\text{key} \geq X.\text{key}$

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## BST



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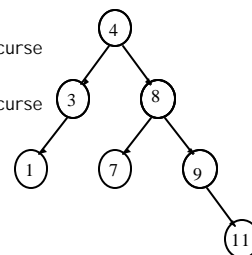
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## BST - Find (x)

If  $\text{root}.\text{key} = x$  return root

If  $x < \text{root}.\text{key}$  recurse on left subtree

If  $x > \text{root}.\text{key}$  recurse on right subtree



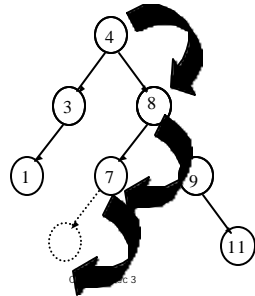
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### Insert (5)

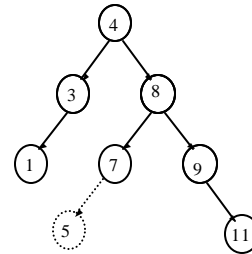


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### Delete(5) (Leaf is easy)

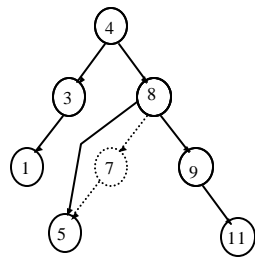


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### Delete(7) (Node with 1 child is easy)

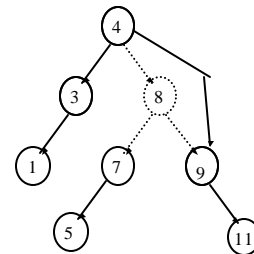


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### Delete(8) - Step 1

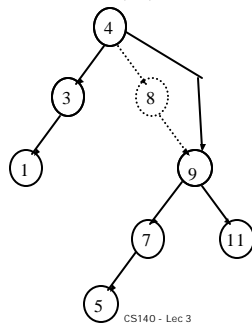


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### Delete(8) - Step 2



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### Operation Run Time

- Search(x) -  $O(h)$
- Insert(x) -  $O(h)$
- Delete(x) -  $O(h)$

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### Keeping a good balance ...

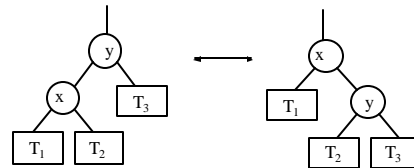
- Search trees:  $O(h)$  time per operation
- “Balanced trees” insure  $O(\log n)$  time per operation.
  - How to balance
  - When and where to balance

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### How: Rotations



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### Keeping a good balance ...

- Search trees:  $O(h)$  time per operation
- “Balanced trees” insure  $O(\log n)$  time per operation.
  - How to balance
  - When and where to balance

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### When to balance?

- Red/black trees
- 2-3 trees
- AVL trees
- Treaps ← Makes the when & where question easy to answer!

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### Red-Black Trees

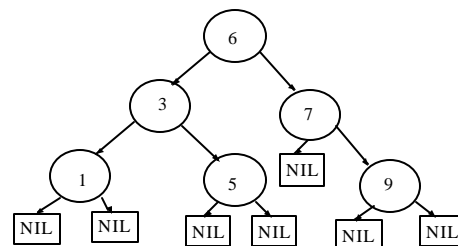
- Binary Search Tree that satisfies the following
  - Each node is colored either red or black
  - Every leaf is NIL and black
  - If a node is red each of its children are black
  - For a node  $x$ , every simple path from  $x$  to a leaf has the same number of black nodes

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### Color this to be a Red-Black Tree

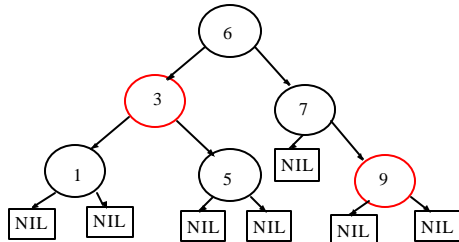


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## Red-Black Tree



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## Claim

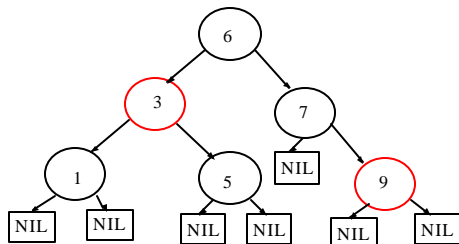
A Red-Black tree with  $n$  internal nodes has height at most  $2 \lg(n+1)$ .

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## Red-Black Tree: Insert 2

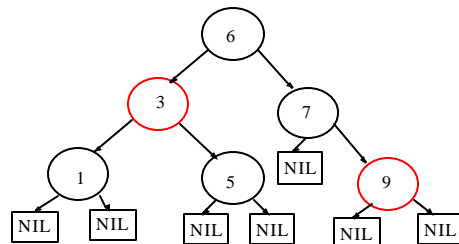


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## Red-Black Tree: Insert 10

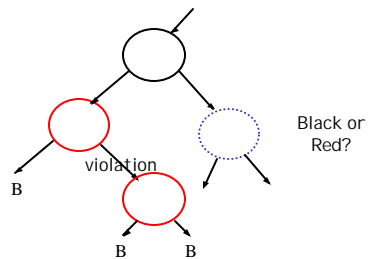


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## Red-Black Fix

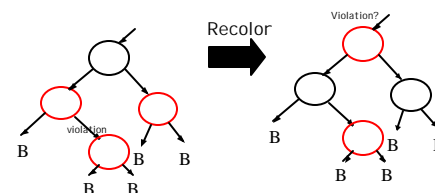


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## Red-Black Fix

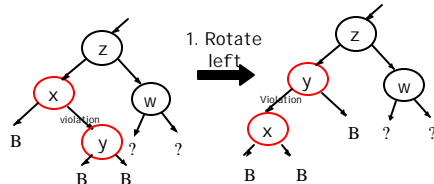


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## Red-Black Fix

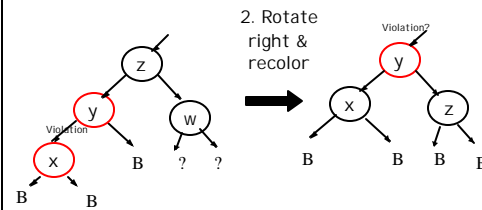


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## Red-Black Fix



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## YUCK

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## Treaps: Step 1

- $S = \{1, 3, 5, 7, 9\}$
- Each element of  $S$  is assigned a unique "heap key":  
 $T = (1, 15), (3, 10), (5, 30), (7, 0), (9, 25)$

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## Treaps: Step 2

- $(1, 15), (3, 10), (5, 30), (7, 0), (9, 25)$
- Build tree where
  - $S$ -key satisfy BST Property
  - $H$ -key satisfy Heap Property

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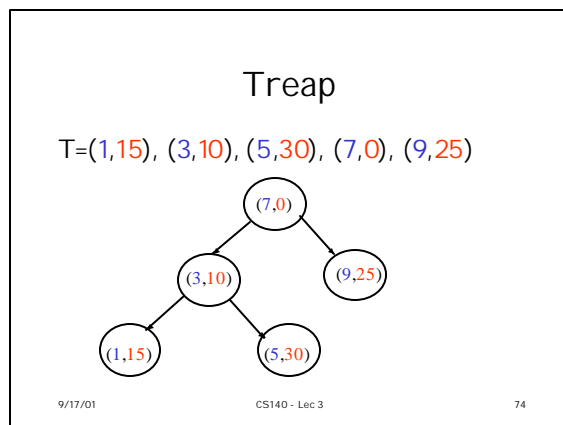
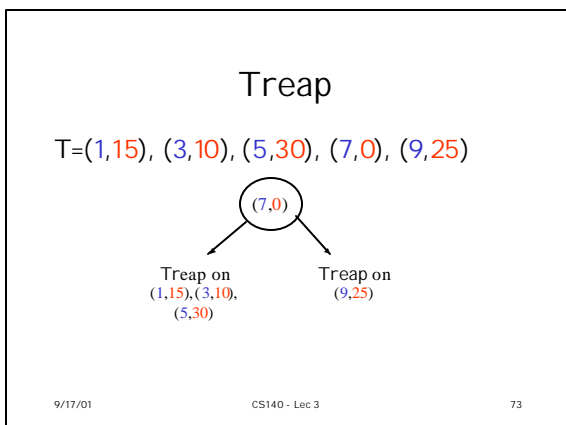
## Treap

- $T = (1, 15), (3, 10), (5, 30), (7, 0), (9, 25)$
- Root:
  - Left subtree:
  - Right subtree:

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### Treaps

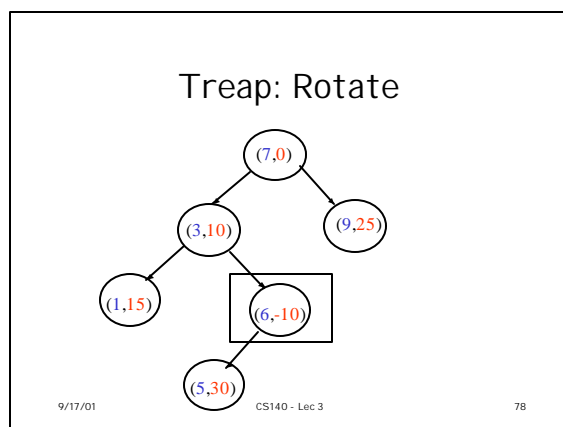
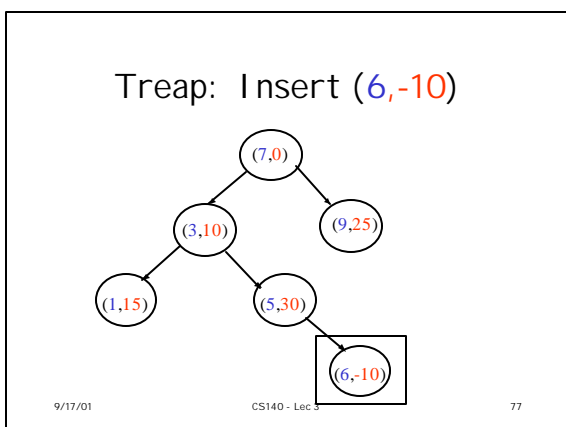
- Claim: If the heap keys are unique then the treap is unique.
- Proof:

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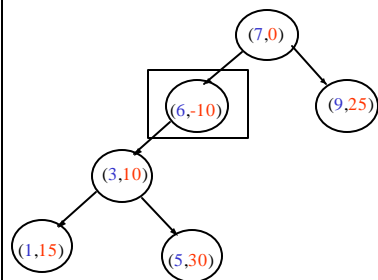
### Binary Tree Operations

- Insert
- Delete

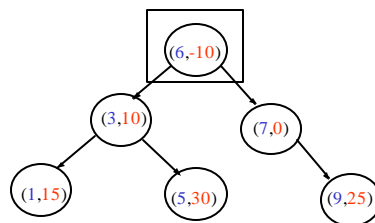
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### Treap: Rotate



### Treap: Rotate



### Treaps

Claim: If the heap keys are chosen uniformly at random from  $[-B, B]$ , where  $B \gg n$ , then

1. With high probability the keys will be unique.
2. The expected height of the treap is  $O(\lg(n))$ .

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