



Design and Analysis
of Algorithms I

Data Structures

Binary Search
Tree Basics

BST are designed so that you can search easily. Heaps are designed so that you can find min/max easily
That's exactly the "invariant" each node in a BST/heap aims to enable
You can think of your own DS trying to achieve some objective motivated by this

Balanced Search Trees: Supported Operations

Raison d'être : like sorted array + fast (logarithmic) inserts + deletes !

OPERATIONS

SEARCH

SELECT

MIN/MAX

PRED/SUCC given pointer to element, find
the next or previous

RANK how many keys are > given value. Like binary search

OUTPUT IN SORTED ORDER

INSERT
Insert and delete are $O(n)$ time in sorted array

DELETE

RUNNING TIME

Also
supported
by hash
tables

Also
supported
by heaps

$\theta(\log(n))$
 $O(\log(n))$
 $O(\log(n))$
 $O(\log(n))$
 $O(\log(n))$
 $O(n)$
 $O(\log(n))$
 $O(\log(n))$

Up from $O(1)$

new

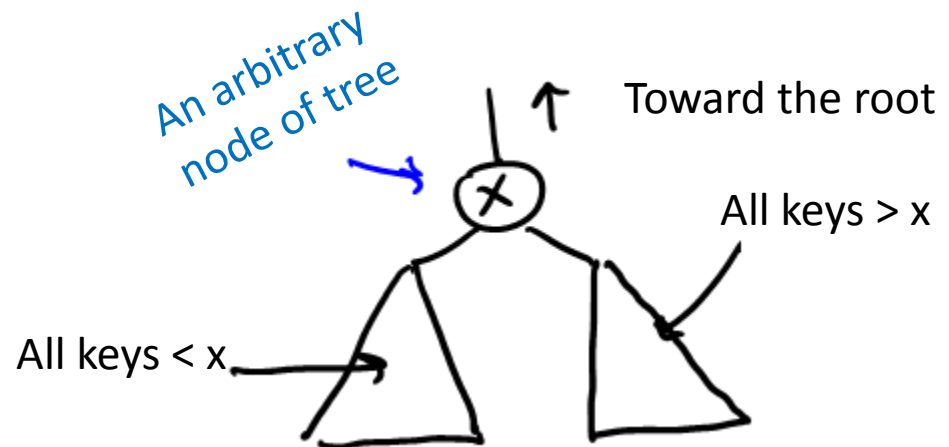
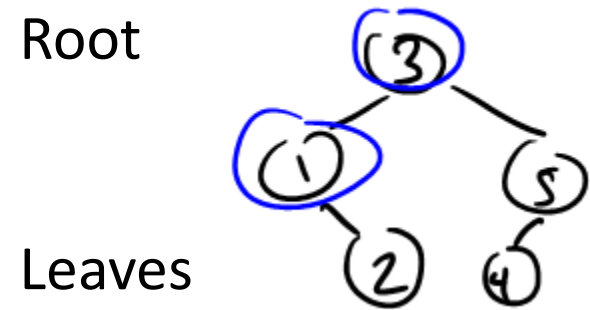
heap has better constant factors in time and space complexity wrt BST. also heap only does min or max but not both
hashing has better constant factors wrt BST. if only insert, delete, search needed, BST is overkill; use hash (similar argument for heap above)

Binary Search Tree Structure

- exactly one node per key
- most basic version :
 - each node has
 - left child pointer
 - right child pointer
 - parent pointer

SEARCH TREE PROPERTY :
(should hold at every node of the search tree)

The above assumes all keys are distinct
To handle duplicates, slightly modify your convention.
Let the left subtree hold "all keys $\leq x$ ".
Everything that follows shall be true for it



The Height of a BST

Note : many possible trees for a set of keys.

Note : height could be anywhere from

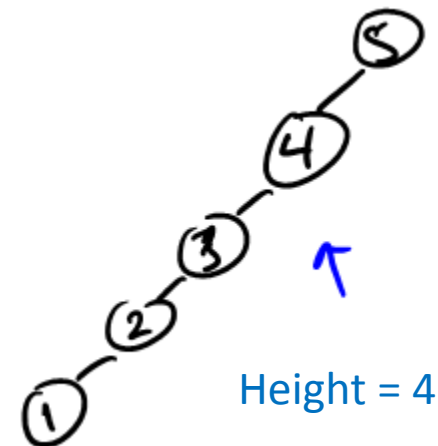
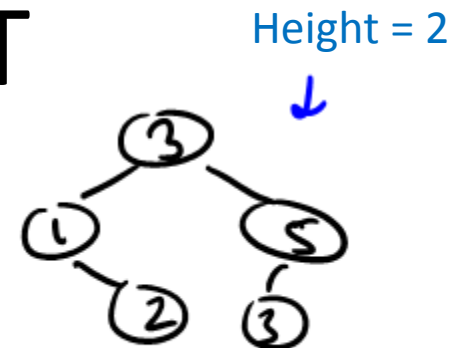
$\sim \log_2 n$

to $\sim n$

Worst case,
a chain

Best case,
perfectly
balanced

(aka depth) longest
root-leaf path

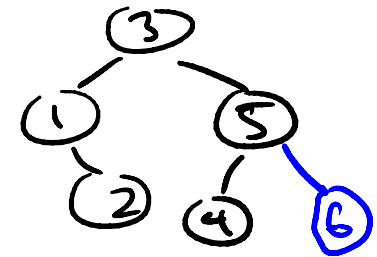


Searching and Inserting

To Search for key k in tree T

- start at the root
- traverse left / right child pointers as needed

If $k < \text{key at current node}$ If $k > \text{key at current node}$



- return node with key k or NULL, as appropriate

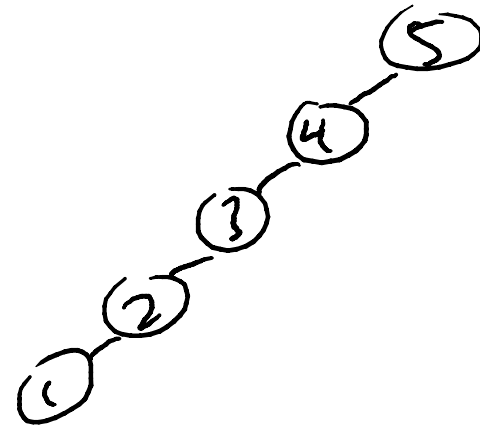
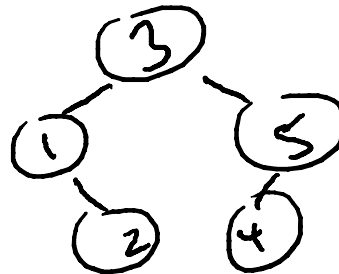
To Insert a new key k into a tree T

- search for k (unsuccessfully)
- rewire final NULL ptr to point to new node with key k

Exercise :
preserves
search tree
property!

The worst-case running time of Search (or Insert) operation in a binary search tree containing n keys is...?

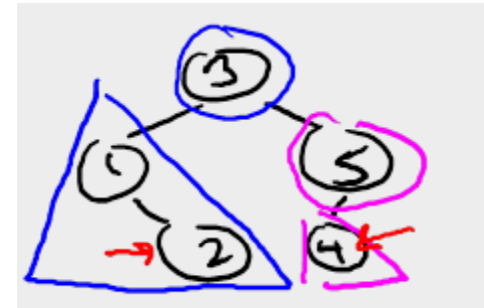
- ☐ $\theta(1)$
- ☐ $\theta(\log_2 n)$
- ☒ $\theta(\text{height})$
- ☐ $\theta(n)$



Min, Max, Pred, And Succ

To compute the minimum (maximum) key of a tree

- Start at root
- Follow left child pointers (right ptrs, for maximum) until you can't anymore (return last key found)



To compute the predecessor of key k

- Easy case : If k's left subtree nonempty, return max key in left subtree
- Otherwise : follow parent pointers until you get to a key less than k.

Happens first time you "turn left"

Exercise :
prove this
works

You will get to key less than k the first time you take left turn

Think: How to get to Pred of 4?

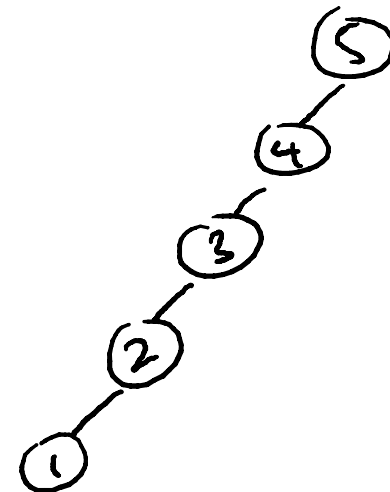
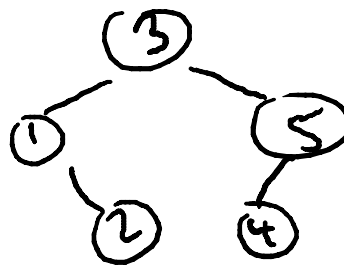
Based on this, what's pred of 1? Parent of 1 never turns left. That's a property of min element of BST

Based on this, what the Succ of 5? Parent of 5 never turns right. That's a property of max element of BST

Tim Roughgarden

The worst-case running time of the Max operation in a binary search tree containing n keys is...?

- ☐ $\theta(1)$
- ☐ $\theta(\log_2 n)$
- ☒ $\theta(\text{height})$
- ☐ $\theta(n)$



In-Order Traversal

TO PRINT OUT KEYS IN INCREASING ORDER

-Let r = root of search tree, with subtrees TL and TR

- recurse on TL

[by recursion (induction) prints out keys of TL
in increasing order]

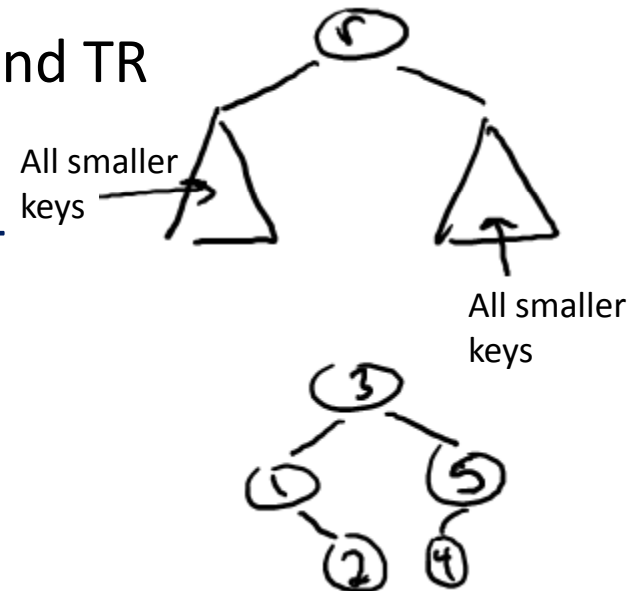
-Print out r 's key

-Recurse on TR

[prints out keys of TR in increasing order]

RUNNING TIME

$O(1)$ time, n recursive
calls $\Rightarrow O(n)$ total



The magic here is , that the recursive calls are called in the order of "in order traversal" we want

In general, whatever way you modify a tree (any DS), the BST (DS) property must be maintained
Here, BST property is that for every node; everything to the left is smaller than the node, and everything to the right is bigger than the node

Deletion

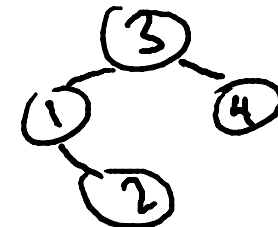
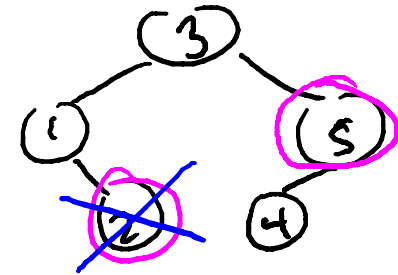
TO DELETE A KEY K FROM A SEARCH TREE 3 cases

- SEARCH for k

EASY CASE (k's node has no children)

-Just delete k's node from tree, done

MEDIUM CASE (k's node has one child)
(unique child assumes position
previously held by k's node)



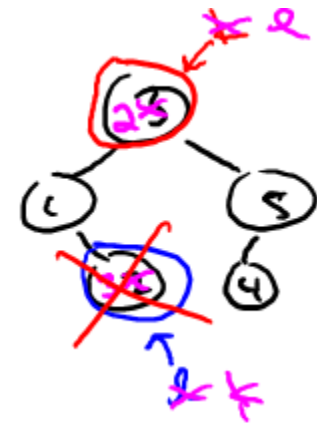
If you bring in 1 from left or 5 from right, it won't work. Think !
Why was it easier in heap?
Coz the BST invariant is much stronger, and need to work harder to maintain it

Deletion (con'd)

DIFFICULT CASE (k's node has 2 children)

- Compute k's predecessor l
[i.e., traverse k's (non-NULL) left child ptr, then
right child ptrs until no longer possible]
- SWAP k and l !

NOTE : in it's new position, k has no right child !
=> easy to delete or splice out k's new node



it may have a left
child; but that also
is the easy case
we say on last
slide

RUNNING
TIME :
 $\theta(\text{height})$

Exercise : at end, have a valid search tree !

Select and Rank

Idea : store a little bit of extra info at each tree node about the tree itself (i.e., not about the data)

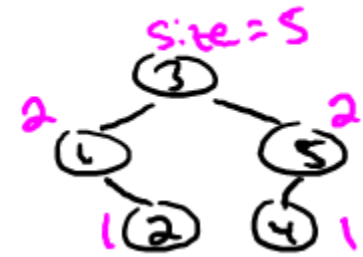
Example Augmentation : $\text{size}(x)$ = # of tree nodes in subtree rooted at x .

Note : if x has children y and z ,
then $\text{size}(y) + \text{size}(z) + 1 = \text{size}(x)$

Population in
left subtree

Right subtree

x itself

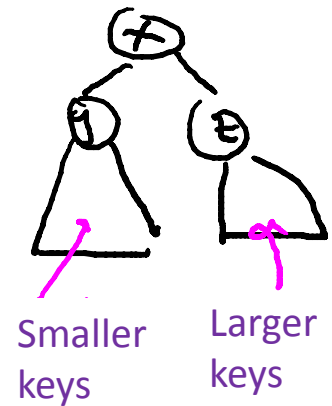


Also : easy to keep sizes up-to-date during an Insertion or Deletion (you check!) \longrightarrow Not so in red black trees.
Keeping up to date when we modify red black tree is hard

Select and Rank (con'd)

HOW TO SELECT i^{th} ORDER STATISTIC FROM AUGMENTED SEARCH TREE (with subtree sizes)

- start at root x , with children y and z
- let $a = \text{size}(y)$ [$a = 0$ if x has no left child]
- if $a = i-1$, return x 's key
- if $a \geq i$, recursively compute i^{th} order statistic of search tree rooted at y
- if $a < i-1$ recursively compute $(i-a-1)^{\text{th}}$ order statistic of search tree rooted at z



RUNNING TIME = $\theta(\text{height})$.

[EXERCISE : how to implement RANK ?