

## Lecture 6: Binary Trees I

### Previously and New Goal

Sequence Data Structure	Container	Operations $O(\cdot)$		
		Static	Dynamic	
	build(X)	get_at(i) set_at(i, x)	insert_first(x) delete_first()	insert_last(x) delete_last()
Array	n	1	n	n
Linked List	n	n	1	n
Dynamic Array	n	1	n	1 <sub>(a)</sub>
<b>Goal</b>	n	log n	log n	log n

Set Data Structure	Container	Operations $O(\cdot)$			Order
		Static	Dynamic	Order	
	build(X)	find(k)	insert(x) delete(k)	find_min() find_max()	find_prev(k) find_next(k)
Array	n	n	n	n	n
Sorted Array	n log n	log n	n	1	log n
Direct Access Array	u	1	1	u	u
Hash Table	n <sub>(e)</sub>	1 <sub>(e)</sub>	1 <sub>(a)(e)</sub>	n	n
<b>Goal</b>	n log n	log n	log n	log n	log n

### How? Binary Trees!

- Pointer-based data structures (like Linked List) can achieve **worst-case** performance
- Binary tree is pointer-based data structure with three pointers per node
- Node representation: node.{item, parent, left, right}
- **Example:**

1	_____<A>_____	node   <A>   <B>   <C>   <D>   <E>   <F>
2	__<B>_____ <C>	item   A   B   C   D   E   F
3	__<D> _____ <E>	parent   -   <A>   <A>   <B>   <B>   <D>
4	<F>	left   <B>   <C>   -   <F>   -   -
5		right   <C>   <D>   -   -   -   -

## Terminology

- The **root** of a tree has no parent (**Ex:**  $\langle A \rangle$ )
  - A **leaf** of a tree has no children (**Ex:**  $\langle C \rangle$ ,  $\langle E \rangle$ , and  $\langle F \rangle$ )
  - Define **depth**( $\langle X \rangle$ ) of node  $\langle X \rangle$  in a tree rooted at  $\langle R \rangle$  to be length of path from  $\langle X \rangle$  to  $\langle R \rangle$
  - Define **height**( $\langle X \rangle$ ) of node  $\langle X \rangle$  to be max depth of any node in the **subtree** rooted at  $\langle X \rangle$
  - **Idea:** Design operations to run in  $O(h)$  time for root height  $h$ , and maintain  $h = O(\log n)$
  - A binary tree has an inherent order: its **traversal order**
    - every node in node  $\langle X \rangle$ 's left subtree is **before**  $\langle X \rangle$
    - every node in node  $\langle X \rangle$ 's right subtree is **after**  $\langle X \rangle$
  - List nodes in traversal order via a recursive algorithm starting at root:
    - Recursively list left subtree, list self, then recursively list right subtree
    - Runs in  $O(n)$  time, since  $O(1)$  work is done to list each node
    - **Example:** Traversal order is ( $\langle F \rangle$ ,  $\langle D \rangle$ ,  $\langle B \rangle$ ,  $\langle E \rangle$ ,  $\langle A \rangle$ ,  $\langle C \rangle$ )
  - Right now, traversal order has no meaning relative to the stored items
  - Later, assign semantic meaning to traversal order to implement Sequence/Set interfaces
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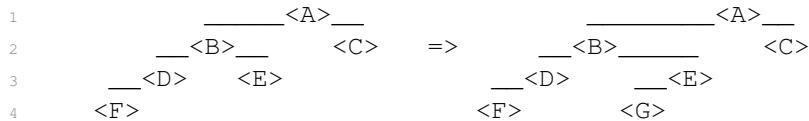
## Tree Navigation

- **Find first** node in the traversal order of node  $\langle X \rangle$ 's subtree (last is symmetric)
  - If  $\langle X \rangle$  has left child, recursively return the first node in the left subtree
  - Otherwise,  $\langle X \rangle$  is the first node, so return it
  - Running time is  $O(h)$  where  $h$  is the height of the tree
  - **Example:** first node in  $\langle A \rangle$ 's subtree is  $\langle F \rangle$
- **Find successor** of node  $\langle X \rangle$  in the traversal order (predecessor is symmetric)
  - If  $\langle X \rangle$  has right child, return first of right subtree
  - Otherwise, return lowest ancestor of  $\langle X \rangle$  for which  $\langle X \rangle$  is in its left subtree
  - Running time is  $O(h)$  where  $h$  is the height of the tree
  - **Example:** Successor of:  $\langle B \rangle$  is  $\langle E \rangle$ ,  $\langle E \rangle$  is  $\langle A \rangle$ , and  $\langle C \rangle$  is None

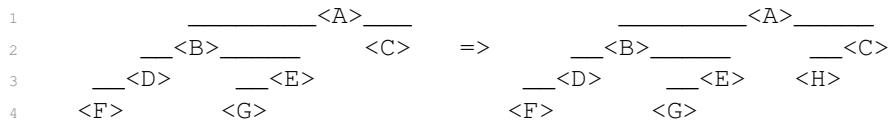
## Dynamic Operations

- Change the tree by a single item (only add or remove leaves):
    - add a node after another in the traversal order (before is symmetric)
    - remove an item from the tree
  - **Insert** node  $\langle Y \rangle$  after node  $\langle X \rangle$  in the traversal order
    - If  $\langle X \rangle$  has no right child, make  $\langle Y \rangle$  the right child of  $\langle X \rangle$
    - Otherwise, make  $\langle Y \rangle$  the left child of  $\langle X \rangle$ 's successor (which cannot have a left child)
    - Running time is  $O(h)$  where  $h$  is the height of the tree

- **Example:** Insert node `<G>` before `<E>` in traversal order



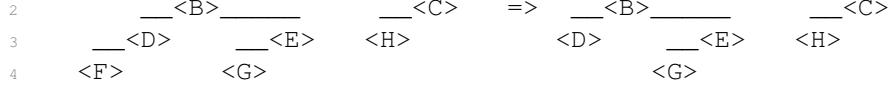
- **Example:** Insert node  $\langle H \rangle$  after  $\langle A \rangle$  in traversal order



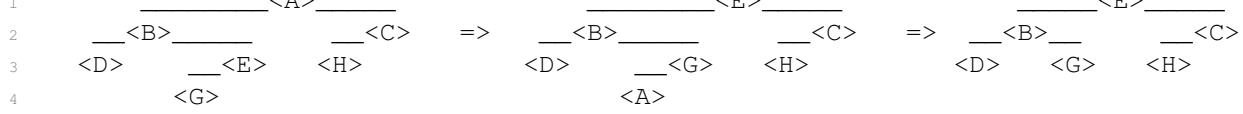
- Delete the item in node  $\langle x \rangle$  from  $\langle x \rangle$ 's subtree

- If  $\langle x \rangle$  is a leaf, detach from parent and return
  - Otherwise,  $\langle x \rangle$  has a child
    - \* If  $\langle x \rangle$  has a left child, swap items with the predecessor of  $\langle x \rangle$  and recurse
    - \* Otherwise  $\langle x \rangle$  has a right child, swap items with the successor of  $\langle x \rangle$  and recurse
  - Running time is  $O(h)$  where  $h$  is the height of the tree
  - **Example:** Remove  $\langle F \rangle$  (a leaf)

\_\_\_\_\_ <A> \_\_\_\_\_



- **Example:** Remove `<A>` (not a leaf, so first swap down to a leaf)



## Application: Set

- **Idea! Set Binary Tree** (a.k.a. **Binary Search Tree / BST**):  
Traversal order is sorted order increasing by key
    - Equivalent to **BST Property**: for every node, every key in left subtree  $\leq$  node's key  $\leq$  every key in right subtree
  - Then can find the node with key  $k$  in node  $\langle x \rangle$ 's subtree in  $O(h)$  time like binary search:
    - If  $k$  is smaller than the key at  $\langle x \rangle$ , recurse in left subtree (or return `None`)
    - If  $k$  is larger than the key at  $\langle x \rangle$ , recurse in right subtree (or return `None`)
    - Otherwise, return the item stored at  $\langle x \rangle$
  - Other Set operations follow a similar pattern; see recitation
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## Application: Sequence

- **Idea! Sequence Binary Tree**: Traversal order is sequence order
- How do we find  $i^{\text{th}}$  node in traversal order of a subtree? Call this operation `subtree_at(i)`
- Could just iterate through entire traversal order, but that's bad,  $O(n)$
- However, if we could compute a subtree's **size** in  $O(1)$ , then can solve in  $O(h)$  time
  - How? Check the size  $n_L$  of the left subtree and compare to  $i$
  - If  $i < n_L$ , recurse on the left subtree
  - If  $i > n_L$ , recurse on the right subtree with  $i' = i - n_L - 1$
  - Otherwise,  $i = n_L$ , and you've reached the desired node!
- Maintain the size of each node's subtree at the node via **augmentation**
  - Add `node.size` field to each `node`
  - When adding new leaf, add  $+1$  to `a.size` for all ancestors  $a$  in  $O(h)$  time
  - When deleting a leaf, add  $-1$  to `a.size` for all ancestors  $a$  in  $O(h)$  time
- Sequence operations follow directly from a fast `subtree_at(i)` operation
- Naively, `build(x)` takes  $O(nh)$  time, but can be done in  $O(n)$  time; see recitation

## So Far

Set Data Structure	Operations $O(\cdot)$				
	Container	Static	Dynamic	Order	
	build(x)	find(k)	insert(x) delete(k)	find_min() find_max()	find_prev(k) find_next(k)
Binary Tree	$n \log n$	$h$	$h$	$h$	$h$
<b>Goal</b>	$n \log n$	$\log n$	$\log n$	$\log n$	$\log n$

Sequence Data Structure	Operations $O(\cdot)$				
	Container	Static	Dynamic		
	build(x)	get_at(i) set_at(i, x)	insert_first(x) delete_first()	insert_last(x) delete_last()	insert_at(i, x) delete_at(i)
Binary Tree	$n$	$h$	$h$	$h$	$h$
<b>Goal</b>	$n$	$\log n$	$\log n$	$\log n$	$\log n$

## Next Time

- Keep a binary tree **balanced** after insertion or deletion
- Reduce  $O(h)$  running times to  $O(\log n)$  by keeping  $h = O(\log n)$

TODAY: Binary Trees I

- binary tree & traversal order
- subtree ops: first, successor, insert, delete
- set binary tree (Binary Search Tree / BST)
- sequence bin. tree via subtree-size augmentation

Goal: one roughly best data structure

$O(1)$  or  $O(\lg n)$  ↪ up to log factors

- linked list good only for insert/delete-first/last()
- (dynamic) array good only for with 2 doubly
  - seq.: get/set-at() & insert/delete-(first)/last()
  - set: find(), find-next/prev/min/max() [If sorted]
- hash table good only for insert/delete/find()
- no seq. DS good for insert/delete-at()
- no set DS good for insert/delete() +  
 $O(\lg n)$  ↪ find-next/prev()
- AVL trees [L7] are good for all these ops.
- binary trees [TODAY] are first step, achieve  $O(h)$

How? we'll build a pointer-based data structure

- problem with linked lists is that most nodes have depth  $\Theta(n)$

↳ distance from root node (head+tail)

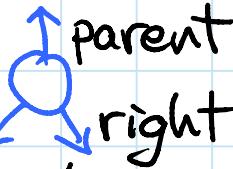
- saw how depth  $\Theta(\lg n)$  is possible: decision tree [L4 & L5]

(rooted)

Binary tree: pointer data structure (like linked list)

- each node has 3 pointers:

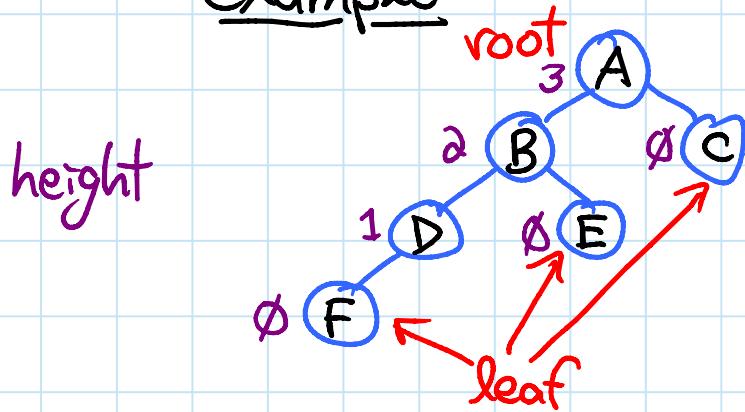
& 1 item left right



- invariant: node = node.left.parent

& node = node.right.parent

- example:



node	A	B	C	D	E	F
item	A	B	C	D	E	F
parent	/	A	A	B	B	C
left	B	D	/	F	/	/
right	C	E	/	/	/	/

- root has no parent (unique)

- leaf has no children

- depth(X) = length of path from X up to root  
↳ # edges unique

ancestors

- depth Ø ⇔ root

- Subtree(X) = tree of X & its descendants  
if we cut X from its parent  $\Rightarrow$  root is X

- Subtree(root) = entire tree

- Subtree(leaf) = just itself

- height(X) = max. depth of node within  
Subtree(X) = length of longest downward path

- height Ø ⇔ leaf

- h = height(root) = max. depth of node (leaf)  
"height of tree"

Traversal order of binary tree: for every node  $X$

- every node in  $X$ 's left subtree is before  $X$
- every node in  $X$ 's right subtree is after  $X$

iter-traversal(tree): subtree\_iter(tree.root)

subtree\_iter(node):

↓  
traversal order  
of subtree(node)

- subtree\_iter(node.left)
- output node
- subtree\_iter(node.right)

$O(n)$   
time

- example: F, D, B, E, A, C

- we'll use traversal order to represent either sequence order or set sorted order

Traversal ops: all  $O(h)$  time

subtree-first(node): first node in subtree\_iter order

- go left ( $node = node.left$ )

until this would "fall off tree" (hit None)

- return last node

subtree-last(node): ditto. right  $\Rightarrow$  last in order

not necc. within subtree

successor(node): next node in traversal order

- if  $node.right$ : subtree-first( $node$ )

- else: - go up ( $node = node.parent$ )

until  $node$  is  $node.parent.left$

- return node



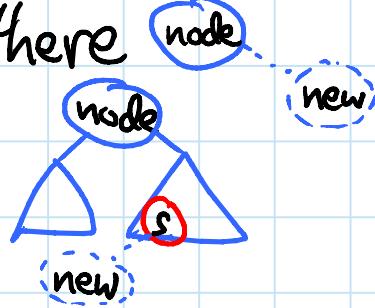
predecessor(node): ditto. left, last, right  $\Rightarrow$  previous

## Dynamic ops:

subtree\\_insert\\_after(node, new): add new node in traversal order immediately after node

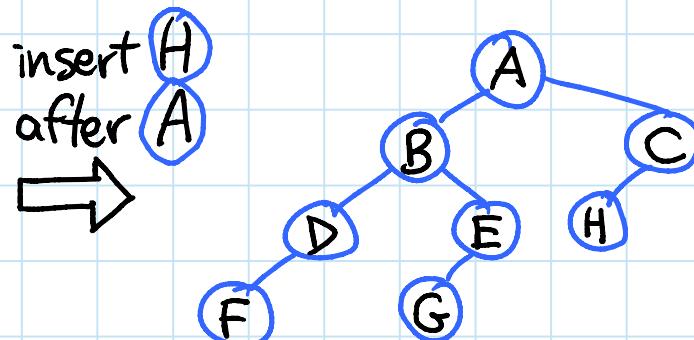
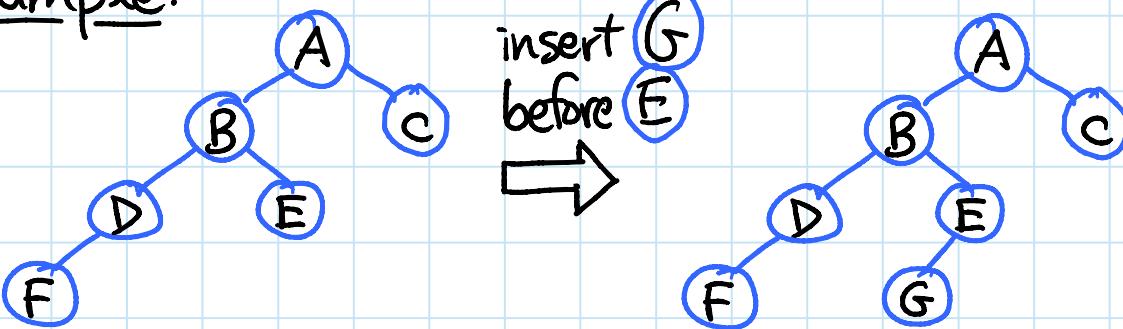
- if  $\text{node.right}$  empty: put new there
- else: -  $s = \text{successor}(\text{node})$ 
  - put new in  $s.\text{left}$  which is empty because first in  $\text{subtree}(\text{node.right})$

⇒ always adding new as leaf



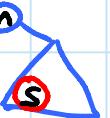
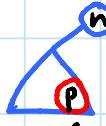
subtree\\_insert\\_before(node, new): Symmetric

## Example:

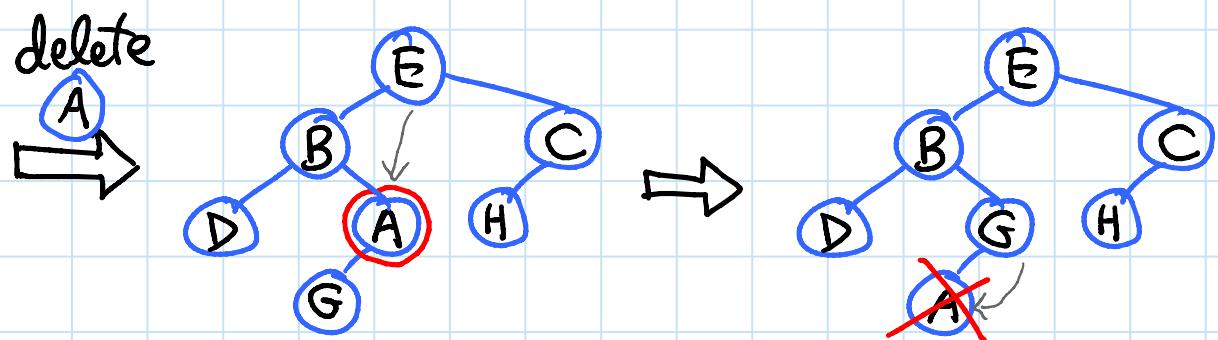
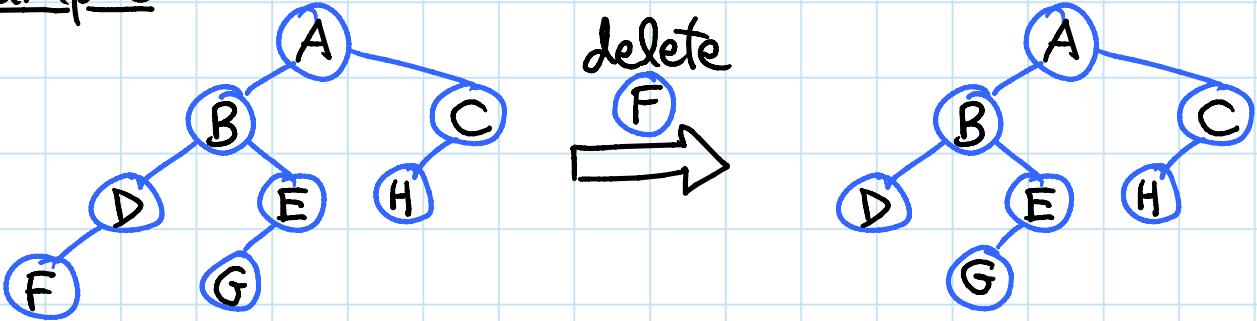


## Subtree-delete(node):

- if node is leaf: detach from parent
  - else: node has  $\geq 1$  child
    - if node.left:
      - Swap node.item  $\leftrightarrow$  predecessor(node).item  
→ preserves traversal order of all  
but the to-be-deleted item
      - subtree-delete(predecessor(node))  
⇒ continually go down in tree  $\Rightarrow O(h)$
      - if node.right: ditto with successor
- ⇒ always detaching a leaf

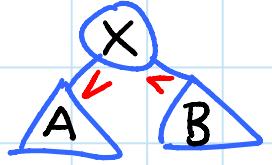


## Example:



Application: set binary tree  
("Binary Search Tree" / BST)

- traversal order = increasing key
- BST property: for every node:
  - < keys in subtree(node.left) → A
  - < node.item.key → X.key
  - < keys in subtree(node.right) → B



find(k): subtree\_find(root, k)

subtree-find(node, k): Like binary search  $O(h)$

- if node = None: return None (no match)
- if  $k < node.item.key$ : recurse on node.left
- if  $k = node.item.key$ : return node
- if  $k > node.item.key$ : recurse on node.right

find-next(k): find(k) until would fall off tree

⇒ node is adjacent (next or prev) to where k fits

- if  $k < node.item.key$ : return node.item
- else: return successor(node)

$O(h)$

find-prev(k): ditto, predecessor & >

find\_min(): root.subtree-first()

find\_max(): root.subtree-last()

Application: sequence binary tree

- Suppose we knew size of every subtree 

$\hookrightarrow \# \text{ nodes}$

Subtree-at(node, i): *i*th node in traversal order of subtree(node)

- $n_L = \text{size}(\text{node.left})$

- if  $i < n_L$ : subtree-at(node.left, i)
- if  $i = n_L$ : return node
- if  $i > n_L$ : subtree-at(node.right,  $i - n_L - 1$ )

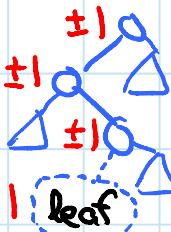
get-at(i): subtree-at(root, i).item

for node

set-at(i, x): subtree-at(root, i).item = x

Augment binary tree to store subtree sizes

- each node stores node.size
- whenever insert a leaf, set its size = 1 & increment size of its ancestors
- whenever delete a leaf, decrement size of its ancestors
- additive  $O(h)$  overhead



Augmentation is a more general, powerful idea that we'll see more of in L7

Next: keep tree balanced i.e.  $h = O(\lg n)$   
 $\Rightarrow$  all ops. in  $O(\lg n)$  time