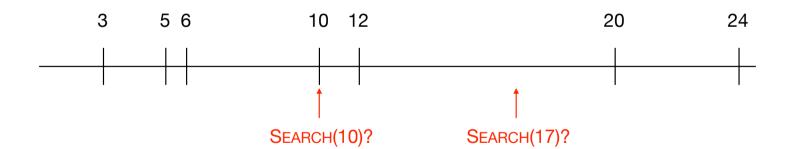
- Dynamic Ordered Sets
- Binary Search Trees
- Balanced Search Trees

- Dynamic Ordered Sets
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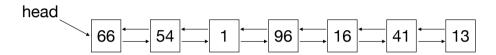
- Dynamic Ordered Sets. Maintain dynamic set S supporting the following operations. Each element x has key x.key and satellite data x.data.
  - SEARCH(k): return element x such that x.key = k if it exists. Otherwise return null.
  - INSERT(x): add x to S (assume x.key is not already in S).
  - DELETE(x): remove x from S.
- We want to maintain elements ordered by the keys. Allows efficient support for many other important operations and other features.



- · Applications.
  - · Dictionaries.
  - · Indexes.
  - · Filesystem.
  - · Databases.
  - •

· Challenge. How can we solve problem with current techniques?

Solution 1: linked list. Maintain S in a doubly-linked list.



- SEARCH(k): linear search for k.
- INSERT(x): insert x in the front of list.
- DELETE(x): remove x from list.
- · Time.
  - SEARCH in O(n) time (n = |S|).
  - INSERT and DELETE in O(1) time.
- · Space.
  - · O(n).

Solution 2: sorted array. Maintain S in an sorted array according to keys.

	1	2	3	4	5	6	7
I	1	13	16	41	54	66	96

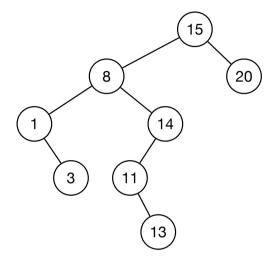
- SEARCH(k): binary search for k.
- INSERT(x): find index using SEARCH(x.key). Build new array of size +1 with x inserted.
- DELETE(x): build new array of size -1 with element with key k removed.
- Time.
  - SEARCH in O(log n) time.
  - INSERT and DELETE in O(n) time.
- · Space.
  - · O(n).

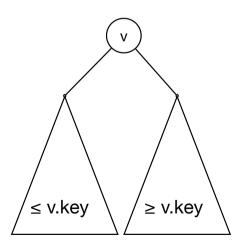
Data structure	SEARCH	INSERT	DELETE	Space
linked list	O(n)	O(1)	O(1)	O(n)
sorted array	O(log n)	O(n)	O(n)	O(n)

· Challenge. Can we do significantly better?

- Dynamic Ordered Sets
- Binary Search Trees
- Balanced Search Trees

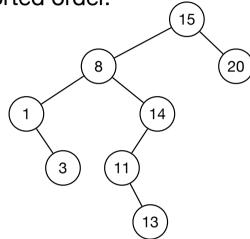
- Binary tree.
  - Rooted tree
  - Each internal node has a left child and/or a right child.
- Binary search tree.
  - · All nodes store an element.
  - Elements are in symmetric order.
- Symmetric order. For each vertex v:
  - all vertices in left subtree are ≤ v.key.
  - all vertices in right subtree are ≥ v.key.





Symmetric order ~ inorder traversal outputs the keys in sorted order.

- Inorder traversal.
  - Visit left subtree recursively.
  - Visit vertex.
  - · Visit right subtree recursively.
- Preorder traversal.
  - Visit vertex.
  - Visit left subtree recursively.
  - Visit right subtree recursively.
- Postorder traversal.
  - Visit left subtree recursively.
  - · Visit right subtree recursively.
  - Visit vertex.

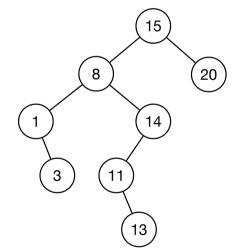


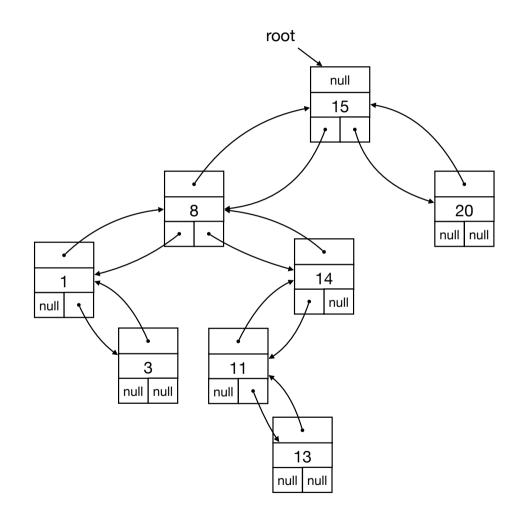
Inorder: 1, 3, 8, 11, 13, 14, 15, 20

Preorder: 15, 8, 1, 3, 14, 11, 13, 20

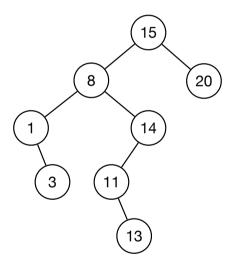
Postorder: 3, 1, 13, 11, 14, 8, 20, 15

- Representation. Each node x stores
  - x.key
  - x.left
  - x.right
  - x.parent
  - · (x.data)
- · Space. O(n)

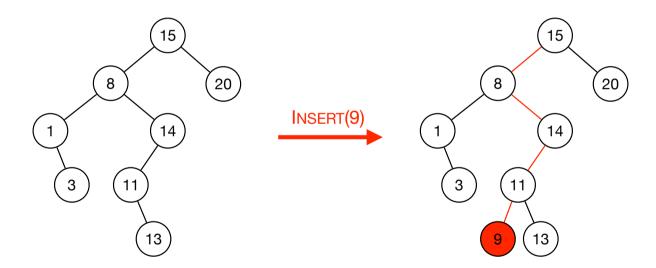


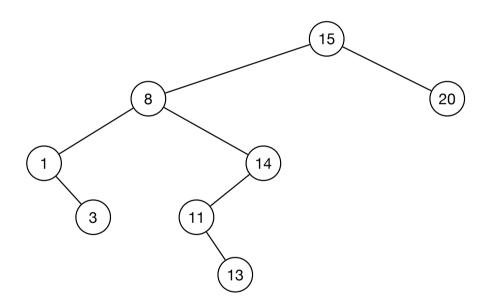


- · SEARCH(k): traverse tree top-down.
  - · Compare key k against key in node.
  - · If equal return element. If less go left. If greater go right.
  - If we reach bottom, return null.
- · Time. O(h)



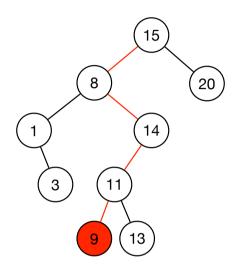
- INSERT(x): traverse tree top-down and compare keys.
  - search for x.
  - · add x at leaf.
- · Time. O(h)





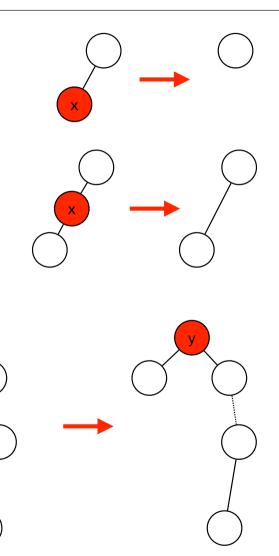
- INSERT(x): traverse tree top-down and compare keys.
  - if less go left; if greater go right; if equal, return node.
  - · if null, insert x.
- Exercise. Insert following sequence in binary search tree: 6, 14, 3, 8, 12, 9, 34, 1, 7

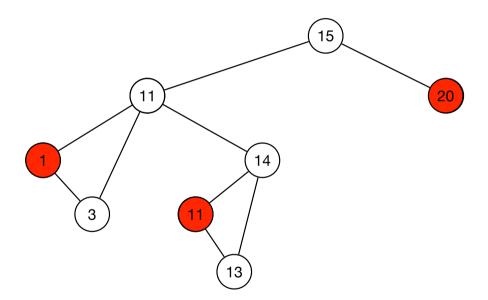
```
INSERT(x,v)
if (v == null) return x
if (x.key ≤ v.key)
   v.left = INSERT(x, v.left)
if (x.key > v.key)
   v.right = INSERT(x, v.right)
```



· Time. O(h)

- DELETE(x):
  - 0 children: remove x.
  - 1 child: splice x.
  - 2 children: find y = node with smallest key > x.key. Splice y and replace x by y.





- DELETE(x):
  - 0 children: remove x.
  - 1 child: splice x.
  - 2 children: find y = node with smallest key > x.key. Splice y and replace x by y.

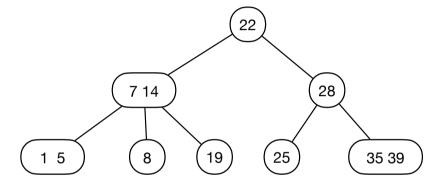
· Time. O(h)

Data structure	SEARCH	INSERT	DELETE	Space
linked list	O(n)	O(1)	O(1)	O(n)
sorted array	O(log n)	O(n)	O(n)	O(n)
binary search tree	O(h)	O(h)	O(h)	O(n)

- Height. Depends on sequence of operations.
  - $h = \Omega(n)$  worst-case and  $h = \Theta(\log n)$  on average.
- · Challenge. Can we maintain height at O(log n) worst-case?

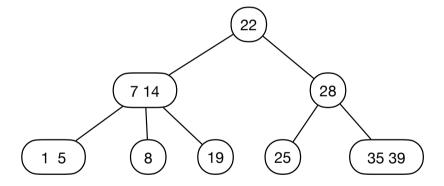
- Dynamic Ordered Sets
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- 2-3 Tree.
  - · Rooted tree.
  - Each internal node has 2 or 3 children.
    - 2-node: 2 children and 1 key
    - 3-node: 3 children and 2 keys.
  - Symmetric order.
    - Inorder traversal outputs the keys in sorted order.
  - Perfect balance.
    - Every path from root to a leaf has the same length
  - $\Rightarrow$  height of tree is  $\Theta(\log n)$



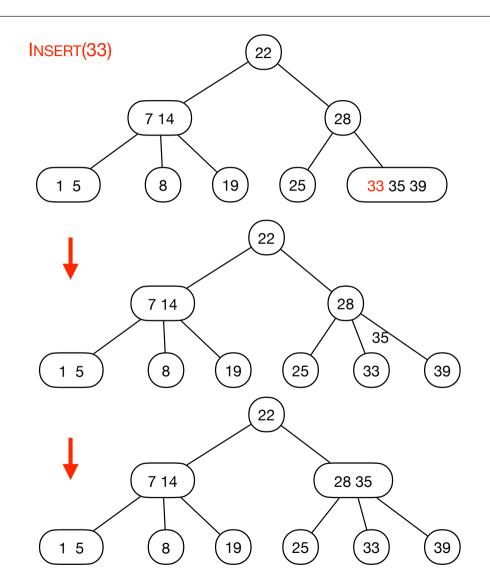
- SEARCH(k): traverse tree top-down.
  - · Compare key k against keys in node.
  - If equal return element. Otherwise, recurse in child with interval containing k and recurse.
  - · If we reach bottom, return null.

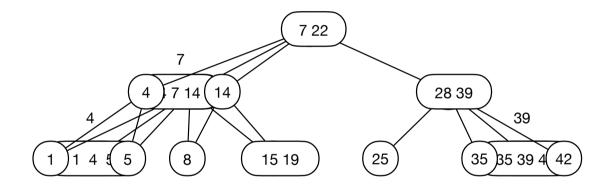
· Time. O(log n)



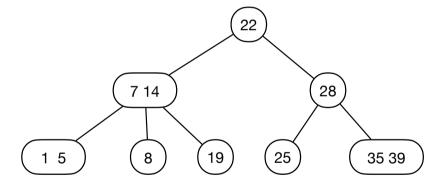
- INSERT(x):
  - · Search for x.
  - · Add x at leaf.
  - If too large, move middle key to parent.
    Repeat if necessary.

· Time. O(log n)





- DELETE(x):
  - · Search for x.
  - If x is a not a leaf, find node with smallest key > x.key, swap with x, and delete it.
  - If too small, take from parent. Repeat if necessary.
- · Time. O(log n)



Data structure	SEARCH	INSERT	DELETE	Space
linked list	O(n)	O(1)	O(1)	O(n)
sorted array	O(log n)	O(n)	O(n)	O(n)
binary search tree	O(h)	O(h)	O(h)	O(n)
2-3 tree	O(log n)	O(log n)	O(log n)	O(n)

#### Can we do better?

- Many variants of balanced search trees supporting many different operations.
- Many efficient practical solutions.
- Optimal time bounds for comparison-based data structures.
- Even better bounds possible with more advanced techniques.

- Dynamic Ordered Sets
- Binary Search Trees
- Balanced Search Trees