

# Set 09: Ordered Dictionary Abstract Data Types: Sorted Arrays and BST

CS240: Data Structures and Data Management

Jérémy Barbay

# Outline

## Introduction to Ordered Dictionary ADTs

### Sorted Arrays

- Motivations

- Binary Search

- One Sided Binary Search

### Binary Search Trees

- Find

- Insert

- Remove

# Introducing Order in Dictionaries

## Motivations

- ▶ What if we access keys uniformly?
- ▶ Use ordering on keys to speed up the `Find` operator.
- ▶ How expensive is it for the operator `Insert`?

# Dictionary ADT

- ▶ Container of key-element pairs,  
where the keys are totally ordered.
- ▶ Required operations (as for general Dictionaries):
  - ▶ `insert( k,e )`,
  - ▶ `remove( k )`,
  - ▶ `find( k )`,
  - ▶ `isEmpty()`
- ▶ Now also supports:
  - ▶ `closestKeyBefore( k )`,
  - ▶ `closestElemAfter( k )`

This corresponds to dictionaries in the Comparison Model.

# Ordered Dictionary ADTs and their DS

- ▶ Array
- ▶ Binary Search Tree (BST)
- ▶ Sequence (Skip Lists)
- ▶ AVL
- ▶ (2,4) Trees
- ▶ *B*-Trees

Diferent solutions to different problems.

References:

- ▶ Goodrich and Tamassia: pp. 140-151
- ▶ Cormen, Leiserson, Rivest, Stein: 253-264

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# Sorted Arrays as Dictionaries

## Motivations

- ▶ Maintain an array **sorted** by keys:
- ▶ Use ordering on keys to speed up the Find operation:
- ▶ How expensive is it for the operators Insert and Remove?

# Binary Search

## Naive Implementation

```
BINARY SEARCH( $x, A, l, r$ )  
  if  $l > r$  then  
    return false  
  else  
     $m \leftarrow \lfloor \frac{l+r}{2} \rfloor$   
    if  $A[m] = x$  then  
      return true  
    else if  $A[m] < x$  then  
      return BINARY SEARCH( $x, A, m, r$ )  
    else  
      return BINARY SEARCH( $x, A, l, m$ )  
    end if  
  end if
```

In the worst case,

- ▶ each recursive call performs      comparisons.
- ▶ the entire search performs      comparisons.



# Binary Search

## Better Implementation

```
BINARY SEARCH( $x, A, l, r$ )  
  if  $l = r$  then  
    return ( $A[l] = x$ )  
  end if  
   $m \leftarrow \lfloor \frac{l+r}{2} \rfloor$   
  if  $A[m] > x$  then  
    return BINARY SEARCH( $x, A, m, r$ )  
  else  
    return BINARY SEARCH( $x, A, l, m$ )  
  end if
```

- ▶ Note that  $l \leq m < r$ .
- ▶ In the worst case, each recursive call performs  $\frac{r-l}{2}$  comparisons, and the entire search performs only  $\log_2(r-l+1)$  comparisons

# Binary Search

## Non Recursive Implementation

BINARY SEARCH( $x, A, l, r$ )

**while**  $l < r$  **do**

$m \leftarrow \lfloor \frac{l+r}{2} \rfloor$

**if**  $A[m] > x$  **then**

$l \leftarrow m$

**else**

$r \leftarrow m$

**end if**

**end while**

**return**  $(A[l] = x)$

- ▶ Note that  $l \leq m < r$ .
- ▶ Removing recursion makes it faster in practice.
- ▶ The Worst Case complexity is still .

# Average Performance of Binary Search

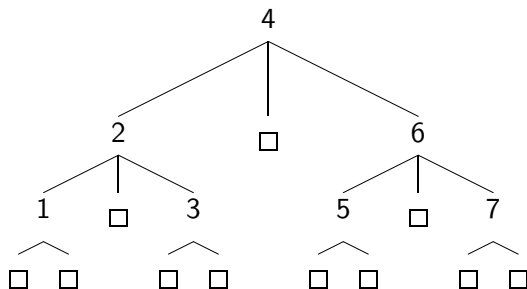
## Exercise:

Consider searching in the array 

1	2	3	4	5	6	7
---	---	---	---	---	---	---

. Suppose that  $x$  takes a value randomly and uniformly chosen among the elements of  $A$ . What is the average number of comparison performed by the first implementation?

## Example:



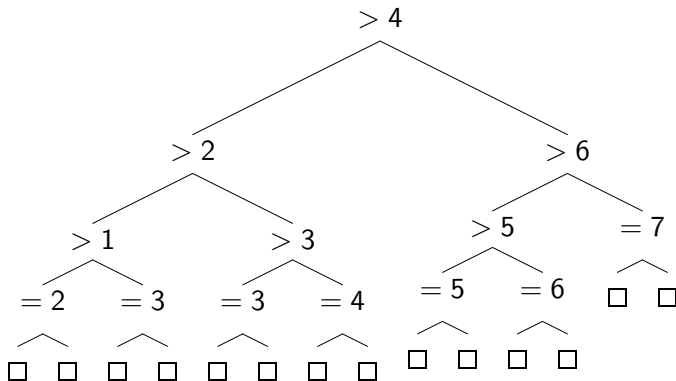
The algorithm performs 2 comparisons per node.

# Average Performance of Binary Search (end)

## Exercise:

What is the average number of comparison performed by the second implementation (exact, not asymptotic)?

## Example:



The algorithm performs **1** comparison per node.

# One Sided Binary Search

What if  $d$  elements have to be searched in the same sorted array?

- ▶ Naive algorithm performs  $d$  binary searches and comparisons.
- ▶ Another possibility is to sort the  $d$  elements in comparisons and search for them using **one sided doubling search** (also called **gallop**, or **doubling search**).

Example:

Consider searching for 18 and 203 in the array

1	4	5	9	15	16	17	...	369210
---	---	---	---	----	----	----	-----	--------

# Complexity of One Sided Binary Search

## Theorem

*Given an element  $x$  and a sorted array  $A$ , One sided binary search finds its insertion rank  $p$  such that  $A[p] \leq x < A[p + 1]$  after  $2\lceil \lg p \rceil + 1$  comparisons.*

## Proof.

- ▶ After the  $i$ th galloping comparison,
  - ▶  $1 + 2 + 4 + \dots + 2^{i-1} = 2^i$  elements have been “eliminated”.
  - ▶ the interval considered is of size  $2^i$ , and a binary search on it would perform  $1 + i$  comparisons.
- ▶ The algorithm finds  $p$  after the  $i = \lceil \lg p \rceil$ th galloping comparison.



# Use of One Sided Binary Search

## Theorem

*Given an increasing sequence of elements  $x_1, \dots, x_d$  and a sorted array  $A$ , there is an algorithm which checks if those elements are in  $A$  in only  $O(d \lg(n/d))$  comparisons.*

## Proof.

Let  $p_0 = 0$ , call  $p_i$  the insertion rank of  $x_i$  in  $A$ , and  $q_i = p_i - p_{i-1}$  the distance to the last one. Using one sided binary search, each  $p_i$  is found using  $2\lceil \lg q_i \rceil + 1$  comparisons, hence a total of

$$2 \sum_i (\lceil \lg q_i \rceil + 1) \leq 4d + \sum_i \lg q_i.$$

We can simplify more using the concativity of the function  $\lg$ :

$$\sum_i \lg q_i \leq d \lg((\sum_i q_i)/d) \leq d \lg(n/d).$$

Hence the result, as  $4d + d \lg(n/d) \in O(d \lg(n/d))$ .



## Short Summary

- ▶ An order on the elements helps.
- ▶ Arrays are not practical for insertion.
- ▶ Many variants of Binary Search, and many implementations.



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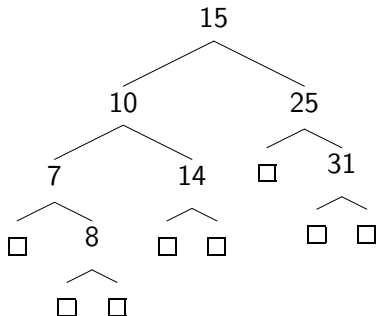
- Find

- Insert

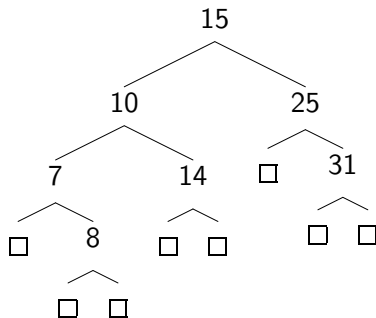
- Remove

## Binary Search Tree

- ▶ A binary tree storing  $(k, e)$  pairs at the internal nodes such that
  - ▶ All keys in nodes of left subtree are  $< k$
  - ▶ All keys in nodes of right subtree are  $> k$
- ▶ A set merely stores the keys (example below)
- ▶ External nodes are only placeholders and often not shown
- ▶  $\Theta(n)$  additional space usage

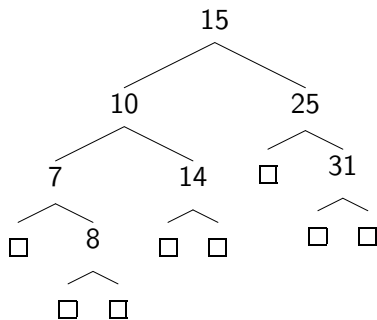


## Find



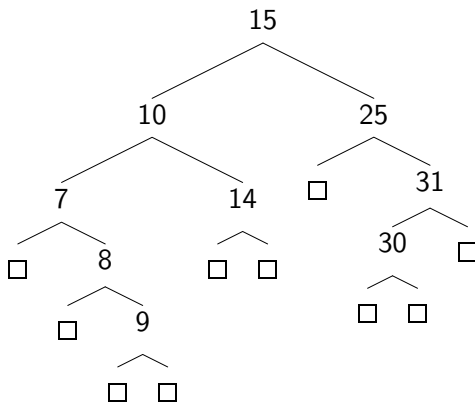
- ▶ Compare root's key to look-up key,  $K$ , and possibly traverse subtree
- ▶ If found return the node (or data associated with it)
- ▶ If not found return the external node where it **would** have been found
- ▶ Worst-case running time?

## Insert



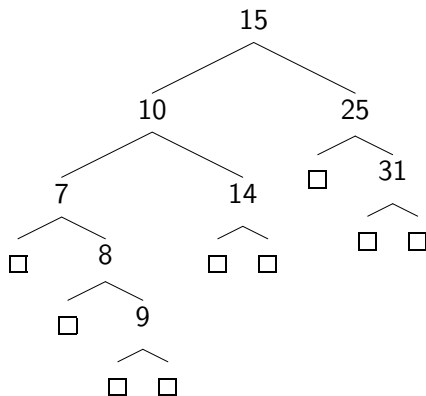
- ▶ Perform a search first
- ▶ Insert at the external node if one is returned
- ▶ **Example:**    Insert( 9 )        and        Insert( 30 )
- ▶ Worst-case running time?

## Remove



- ▶ Perform a search first
- ▶ Remove the internal node if one is returned
- ▶ Three cases:
  - ▶ **2 external children:** `Remove( 30 )`
  - ▶ **1 external child:** `Remove( 7 )`

## Remove



- ▶ If node has two internal children replace contents with in-order predecessor, or in-order successor
- ▶ Remove the emptied node of the in-order predecessor, or in-order successor
- ▶ **Example:** Remove( 15 )
- ▶ Worst-case running time?

## Two Answers

