

# **Foundations of Computer Science**

## **Lecture 7:**

# **Dictionaries and Functional Arrays**

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22nd October 2021

# Warmup

```
# type 'a tree =  
  | Br of 'a * 'a tree * 'a tree  
  | ??
```

What's the missing definition here to make a binary tree?

# Warmup

```
# type 'a tree =  
  | Br of 'a * 'a tree * 'a tree  
  | Lf
```

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What is the term when '**a**' is present in the type definition?

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*polymorphic*

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What is the term when the type definition refers to itself?

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What is the term when '**a**' is present in the type definition?

*polymorphic*

What is the term when the type definition refers to itself?

*recursive*

# Dictionaries

- A dictionary attaches **values** to identifiers (known as **keys**).
- Define the **operations** we want over the dictionary:
  - **lookup** : find an item in the dictionary
  - **update** / `insert` : replace / store an item in the dictionary
  - `delete` : remove an item from the dictionary
  - `empty` : the null dictionary with no keys
  - **Missing** : exception for errors in lookup and delete



# Implementing a dictionary

- Simplest representation for a dictionary is an **association list** (a list of key/value tuples).

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  | (x, y) :: pairs, a ->
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    else
      lookup (pairs, a)
val lookup : ('a * 'b) list * 'a -> 'b = <fun>
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Lookup is O(n)

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Lookup is  $O(n)$

Update is  $O(1)$

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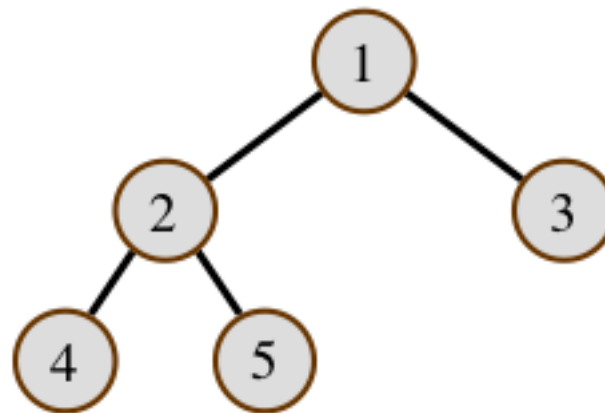
Lookup is  $O(n)$

Update is  $O(1)$

But what is the  
space usage?

# Binary Search Trees

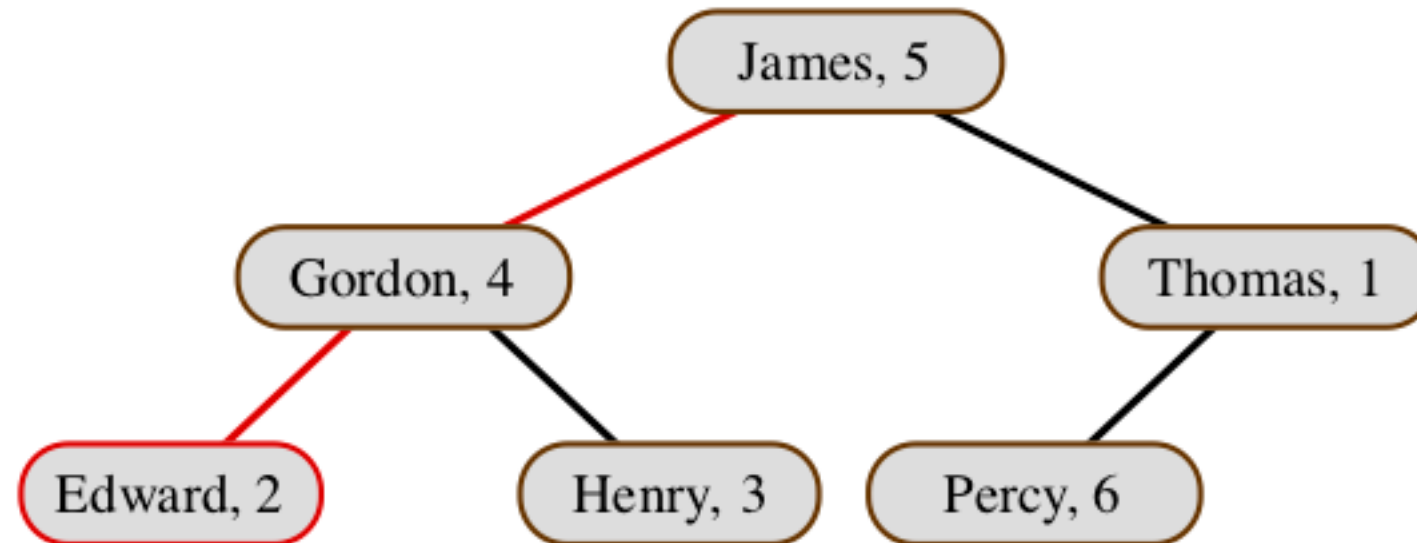
- Use **binary trees** as a more efficient representation than a list to get a better lookup complexity.



```
# type 'a tree =  
  Lf  
  | Br of 'a * 'a tree * 'a tree
```

# Binary Search Trees

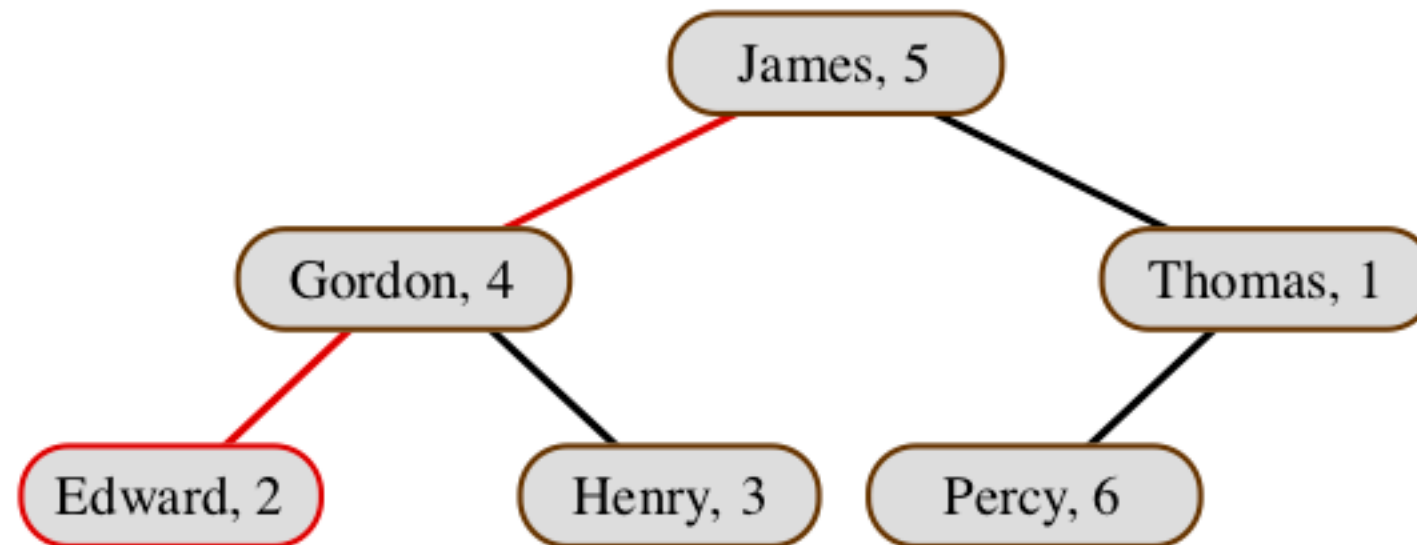
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# Binary Search Trees

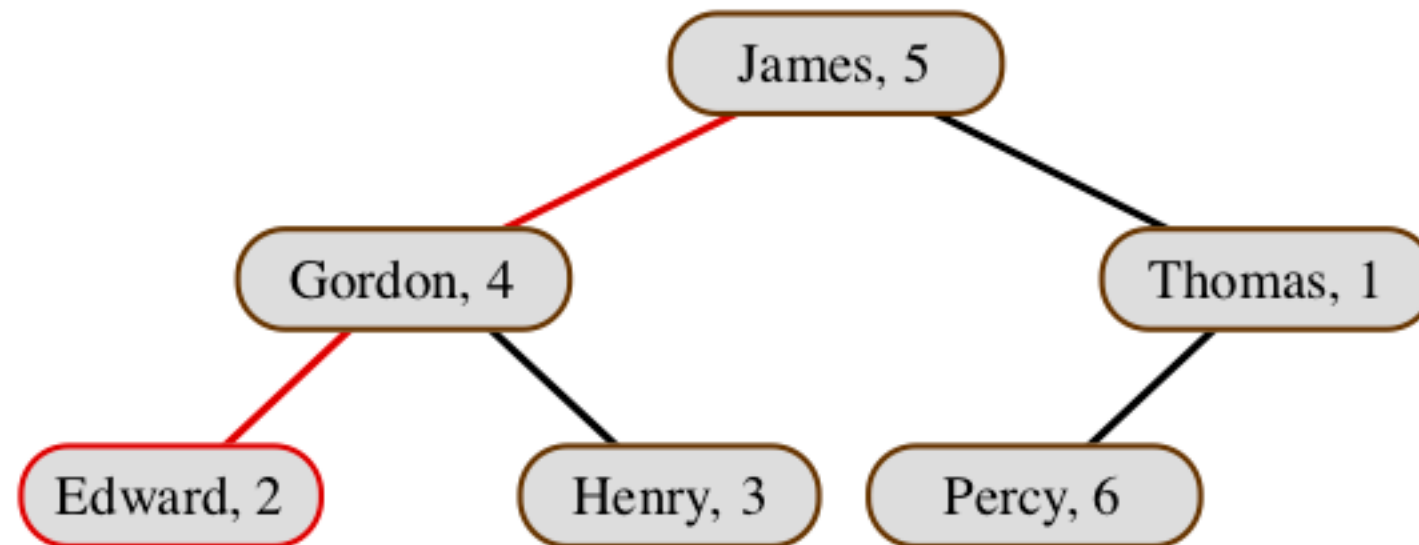
- Use **binary trees** as a more efficient representation than a list to get a better lookup complexity.



- Each node holds a (key, value) with a total ordering for the keys
- The *left* subtree holds smaller keys and the *right* subtree holds larger keys

# Binary Search Trees

- Use **binary trees** as a more efficient representation than a list to get a better lookup complexity.

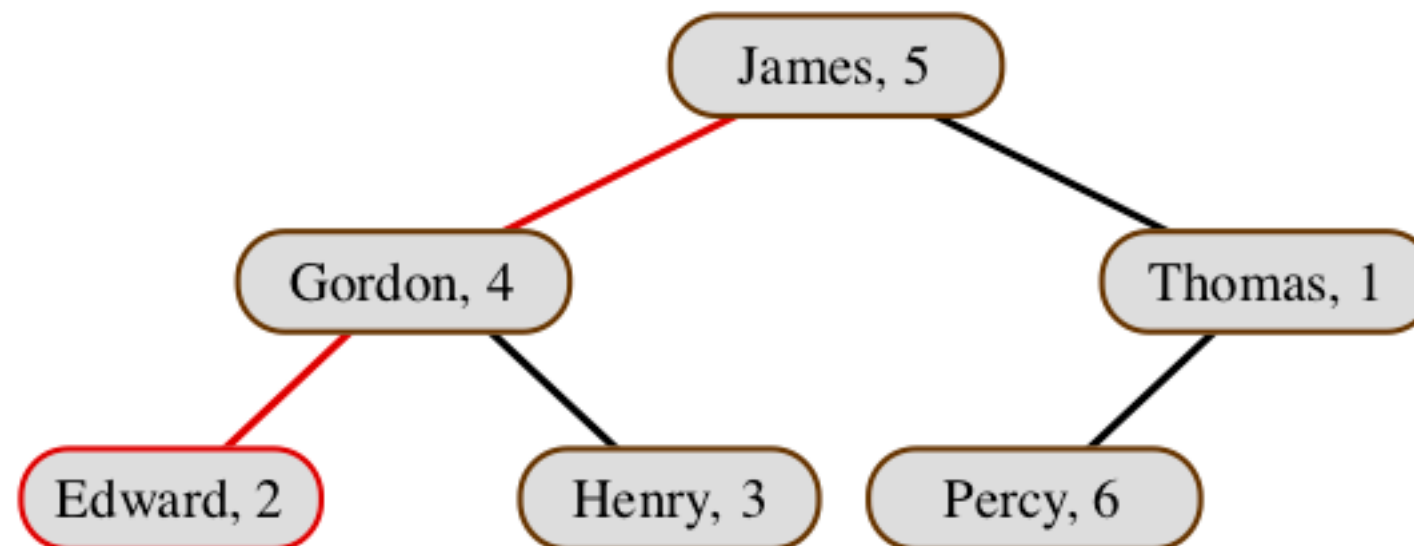


- If *balanced* then lookup is  $O(\log n)$
- If *unbalanced* then lookup can be  $O(n)$

# Binary Search Trees

```
# exception Missing of string
exception Missing of string

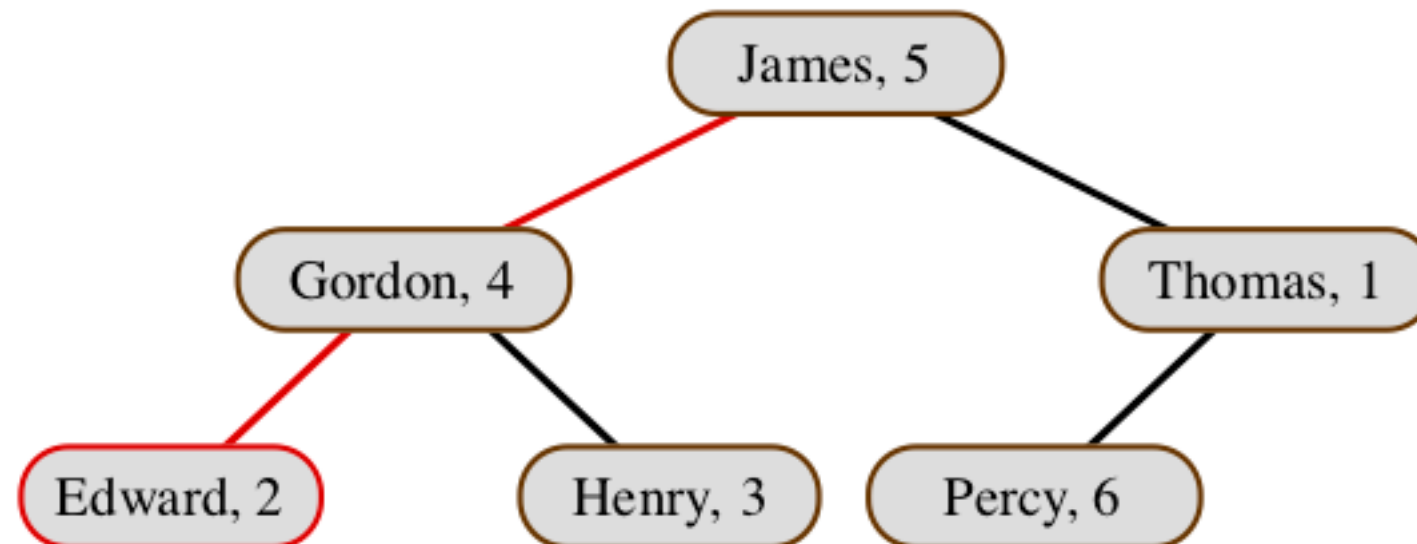
# let rec lookup = function
  | Br ((a, x), t1, t2), b ->
    if b < a then
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    else
      x
  | Lf, b -> raise (Missing b)
val lookup : (string * 'a) tree * string -> 'a = <fun>
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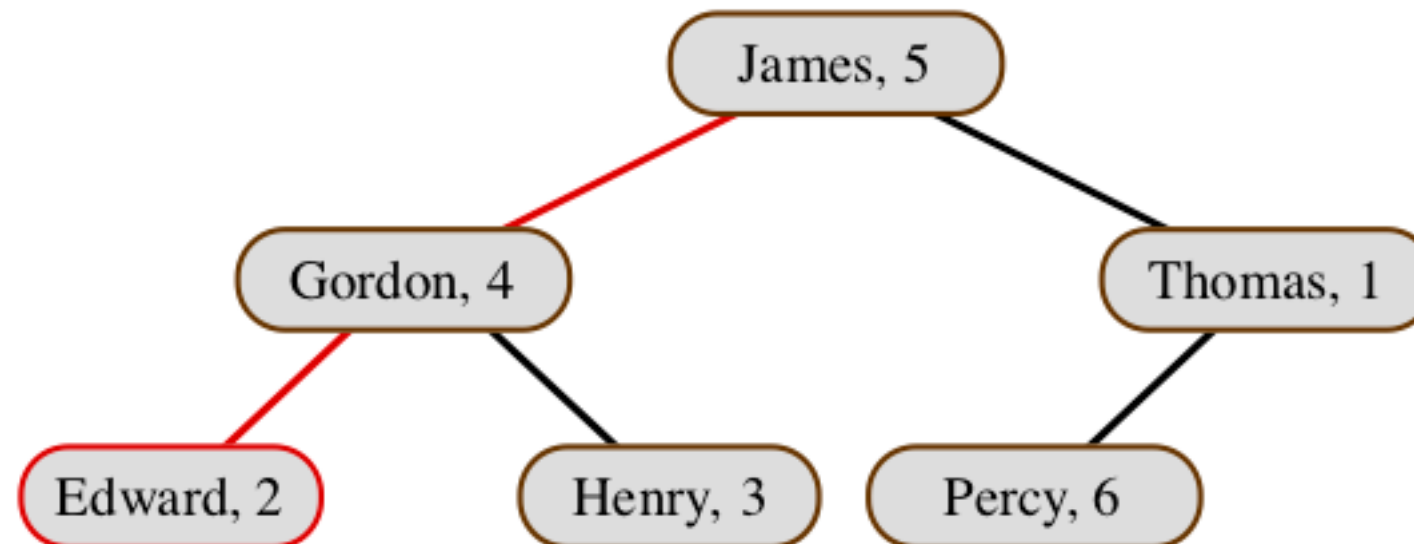


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$O(\log n)$  if  
the tree is  
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# Binary Search Trees

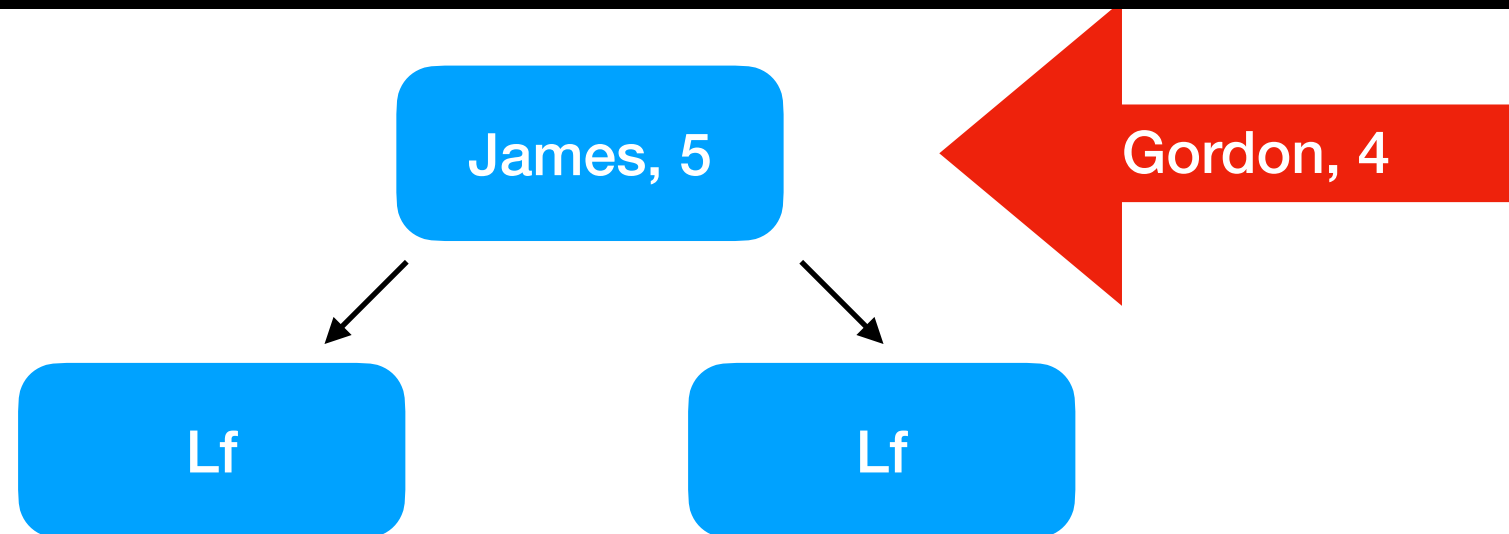
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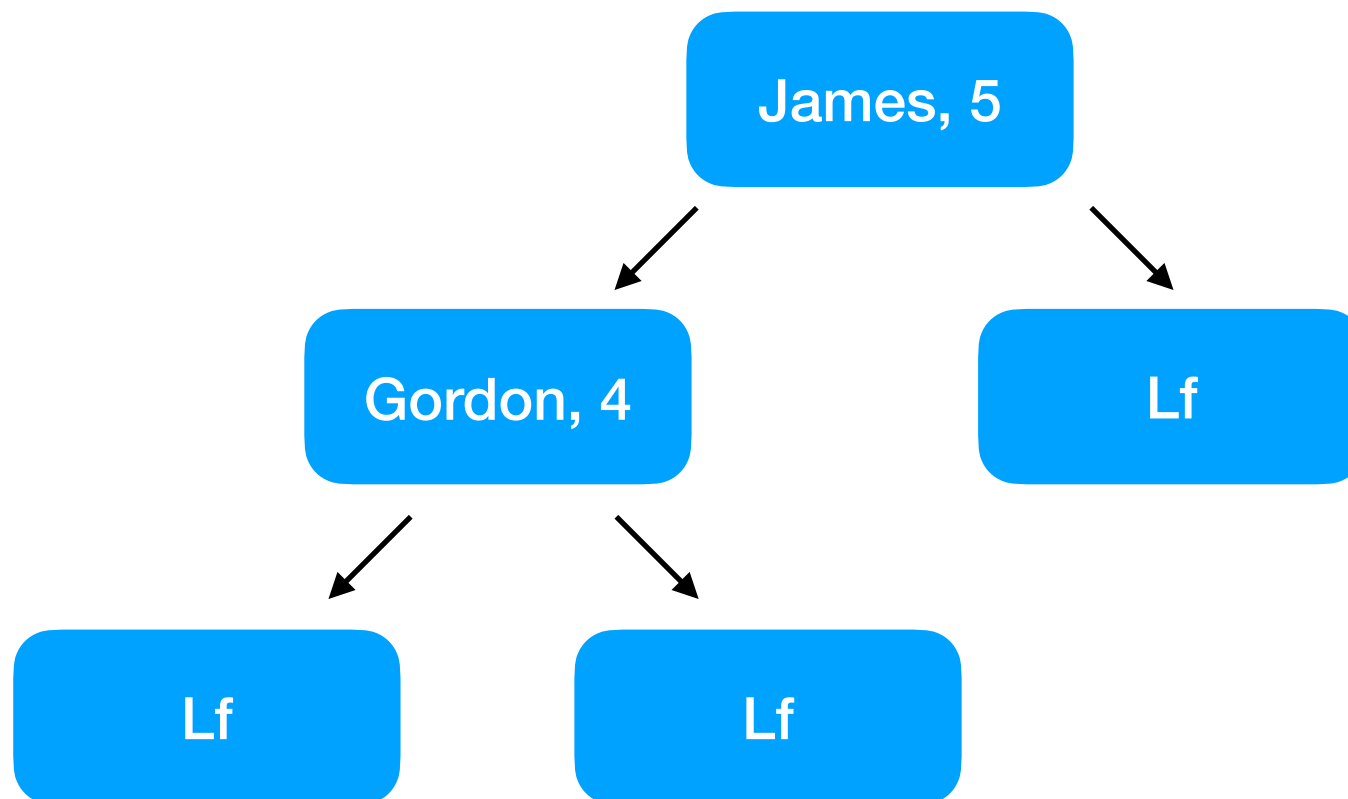
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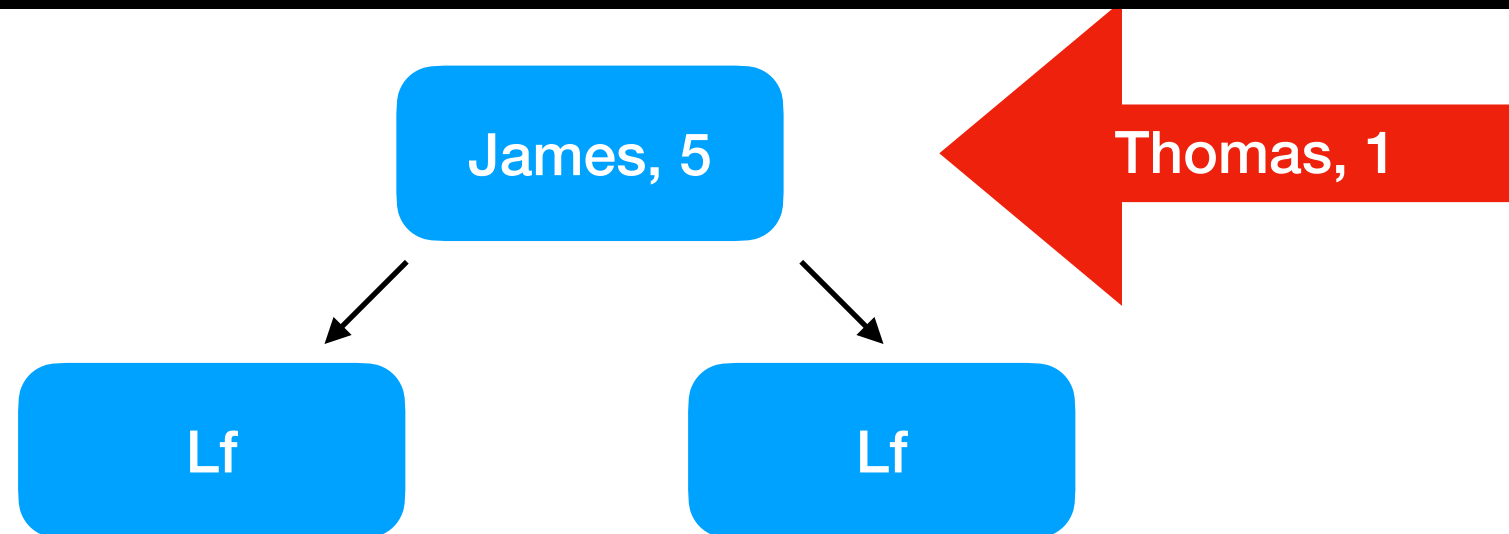




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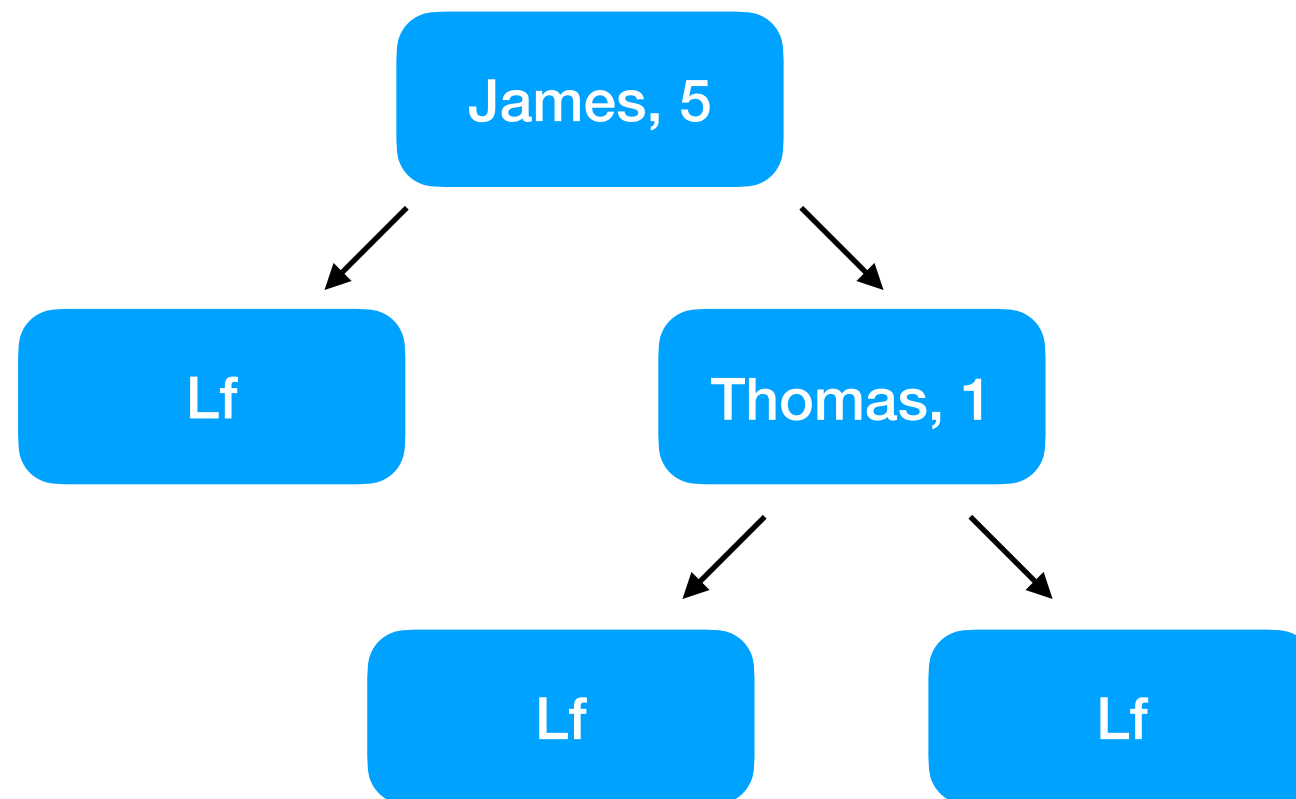
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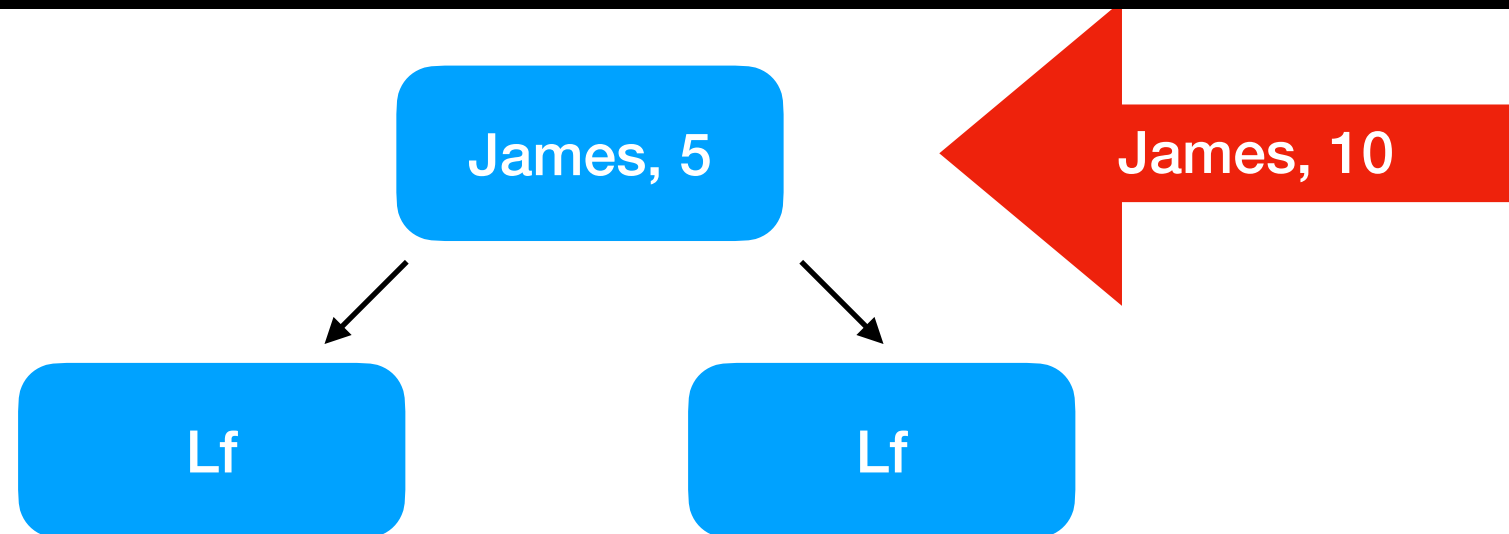
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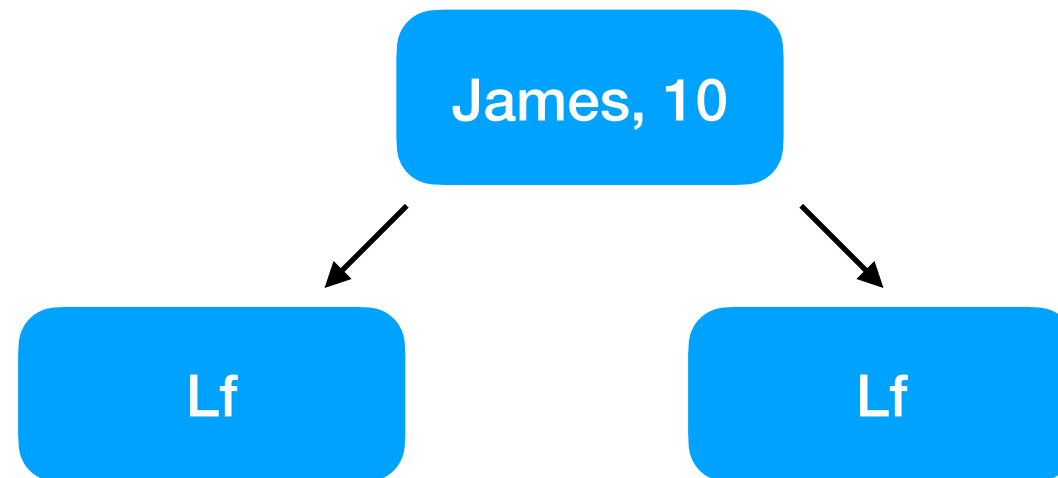
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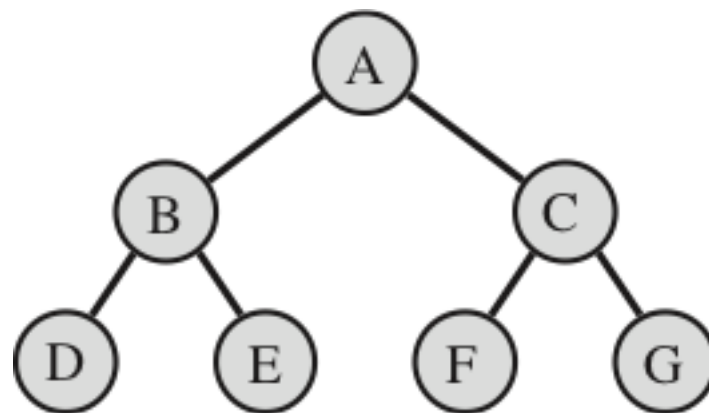
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```

- We *reconstruct* the part of the structure that has changed and return the *updated* version.
- OCaml *shares* the original structure, and values pointing to the original remain unchanged.
- This is also known as a *persistent data structure*.

# Traversing Trees

**Tree traversal refers to visiting the nodes of each tree in a well-defined order.**

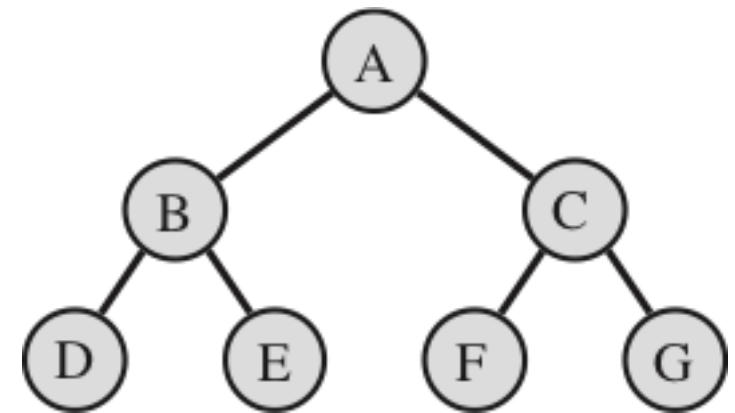
- **preorder** visits the label first (ABDECFG)
- **inorder** visits the label midway (DBEAFCG)
- **postorder** visits the label last (DEBFGCA)



# Traversing Trees: preorder

- **preorder** visits the label first (ABDECFG)

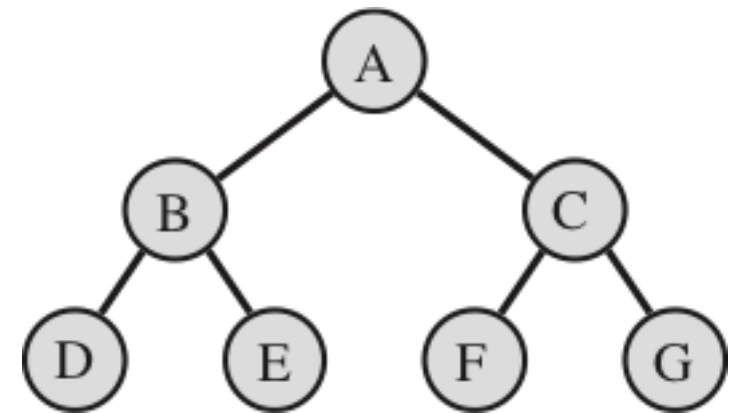
```
# let rec preorder = function
  | Lf -> []
  | Br (v, t1, t2) ->
      [v] @ preorder t1 @ preorder t2
val preorder : 'a tree -> 'a list = <fun>
```



# Traversing Trees: inorder

- **inorder** visits the label midway (DBEAF'CG)

```
# let rec inorder = function
  | Lf -> []
  | Br (v, t1, t2) ->
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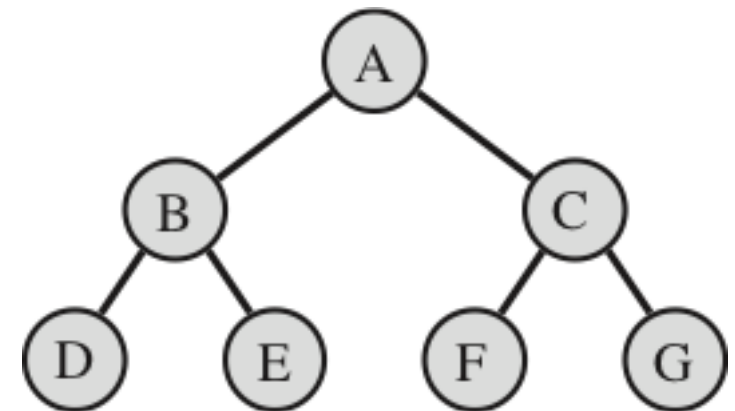




# Traversing Trees: inorder

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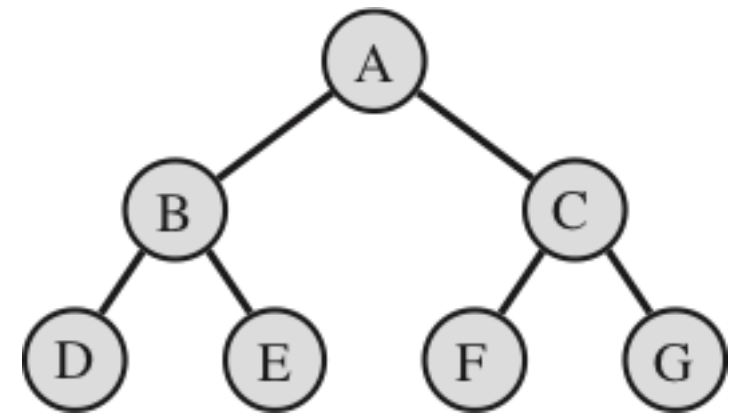
For binary search trees, this order respects the sorting constraint (left key < right key)

Also imaginatively known as a **treesort**.

# Traversing Trees: postorder

- **postorder** visits the label last (DEBFGCA)

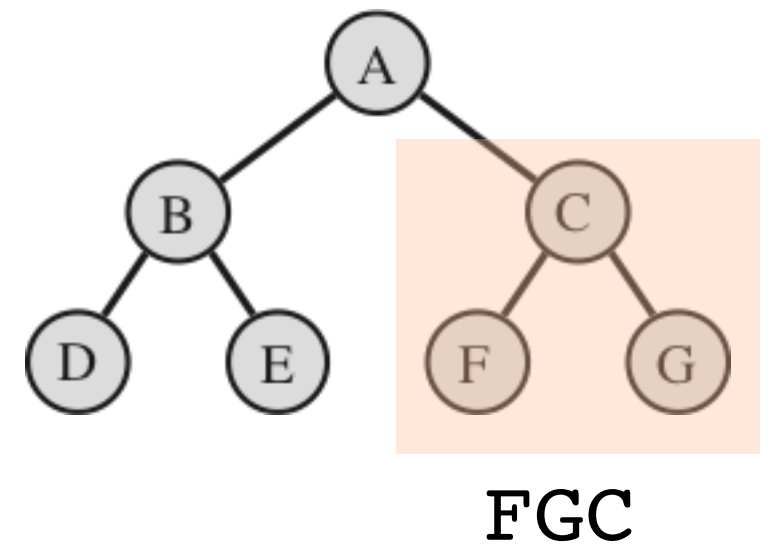
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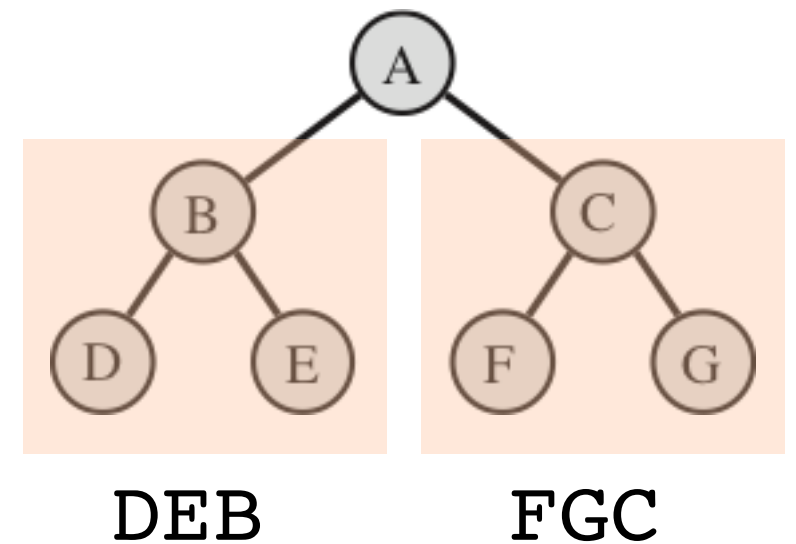
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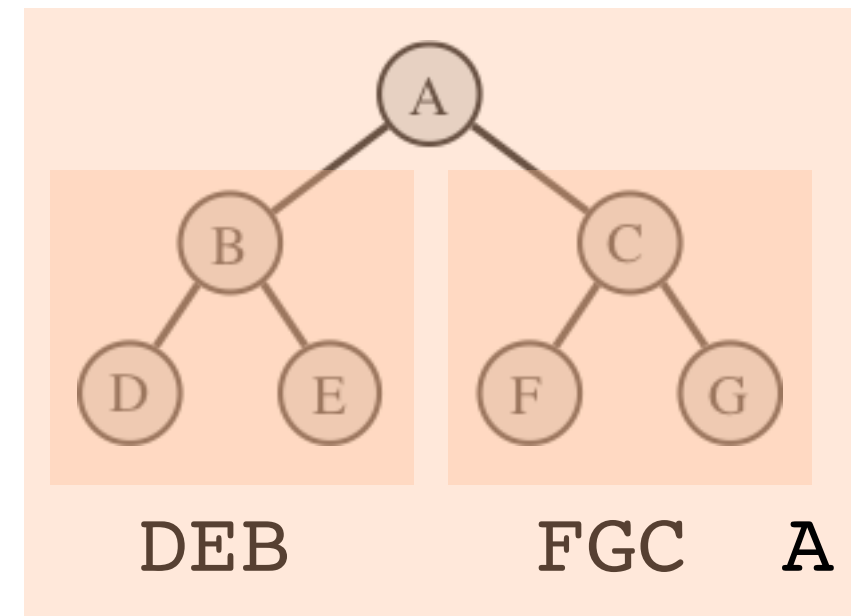
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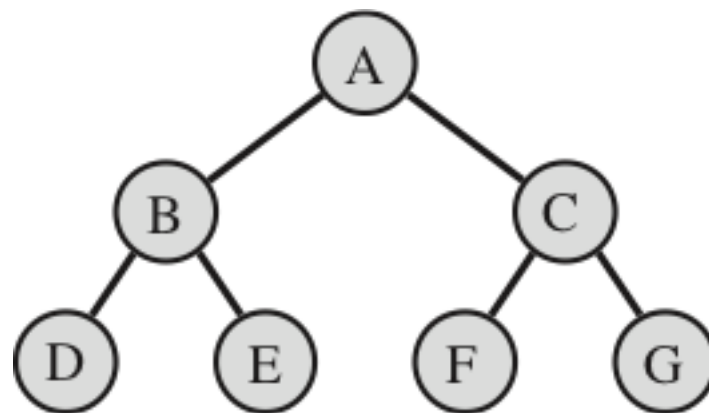
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# Traversing Trees

**Tree traversal refers to visiting the nodes of each tree in a well-defined order.**

- preorder, inorder and postorder are **depth-first** traversal algorithms.
- The other possibility is **breadth-first** by going across the levels of the tree.



# Arrays

**Arrays are an indexed storage area for values**

- Very common data structure alongside lists and trees in most languages.
- Arrays are usually updated *in-place* and are *imperative* or *mutable* data structures.
- Are used in many classic algorithms such as the original Hoare in-place partition-sort.

# Arrays

**Arrays are an indexed storage area for values**

- Elements of a list can only be reached by counting from the head of the list.
- Elements of a tree can be reached by following a path from the root.
- Elements of an array are uniformly designated by number (the "subscript").



# Functional Arrays

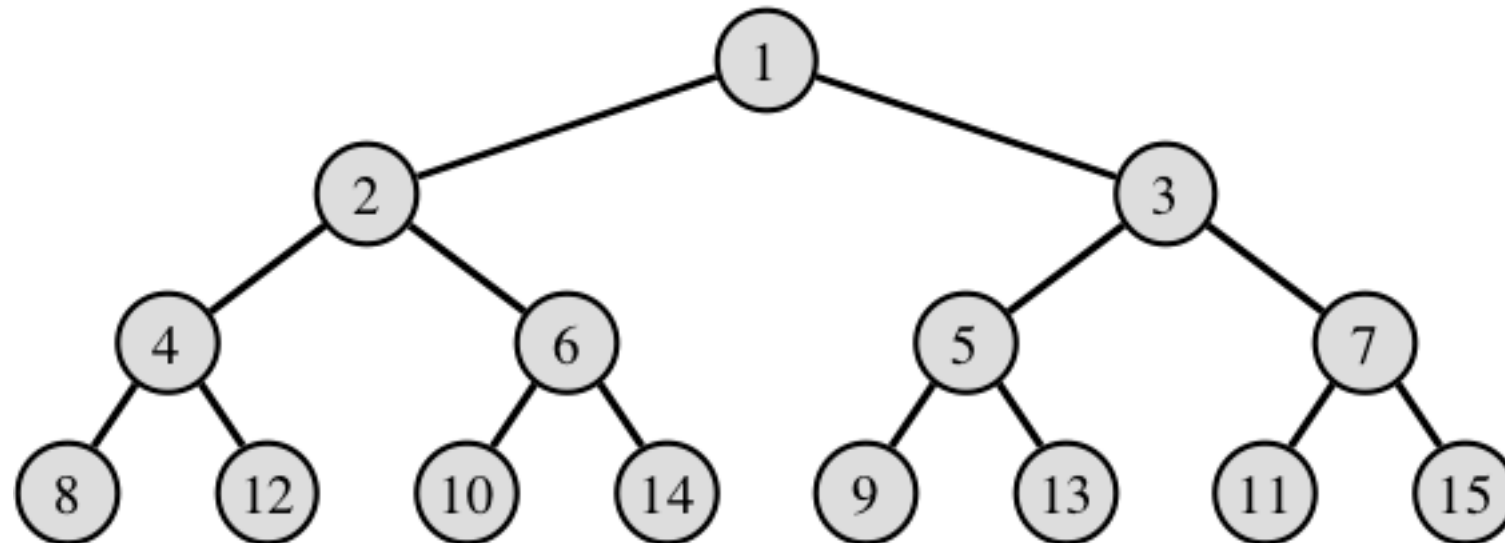
**Arrays are an indexed storage area for values**

**Let's first consider an immutable array**

- This is known as a *functional array* that is a finite map from integers to data.
- Updating implies copying the array to return a new version, but pointers to old copies remain.
- Can updates be efficient?

# Functional Trees

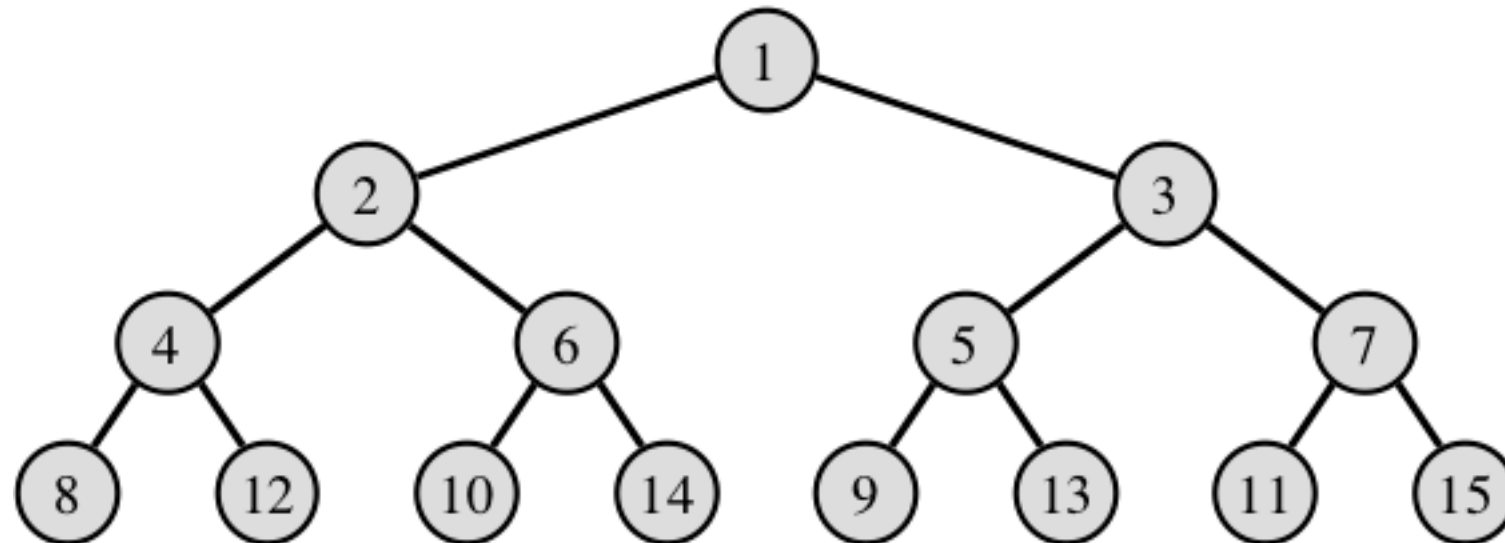
The path to element  $i$  follows the **binary code** for  $i$  (the "subscript")



- The numbers above are not the values, but the positions of array elements.
- Complexity of access to this is always  $O(\log n)$  as the tree is always balanced.

# Functional Trees

The path to element  $i$  follows the **binary code** for  $i$  (the "subscript")

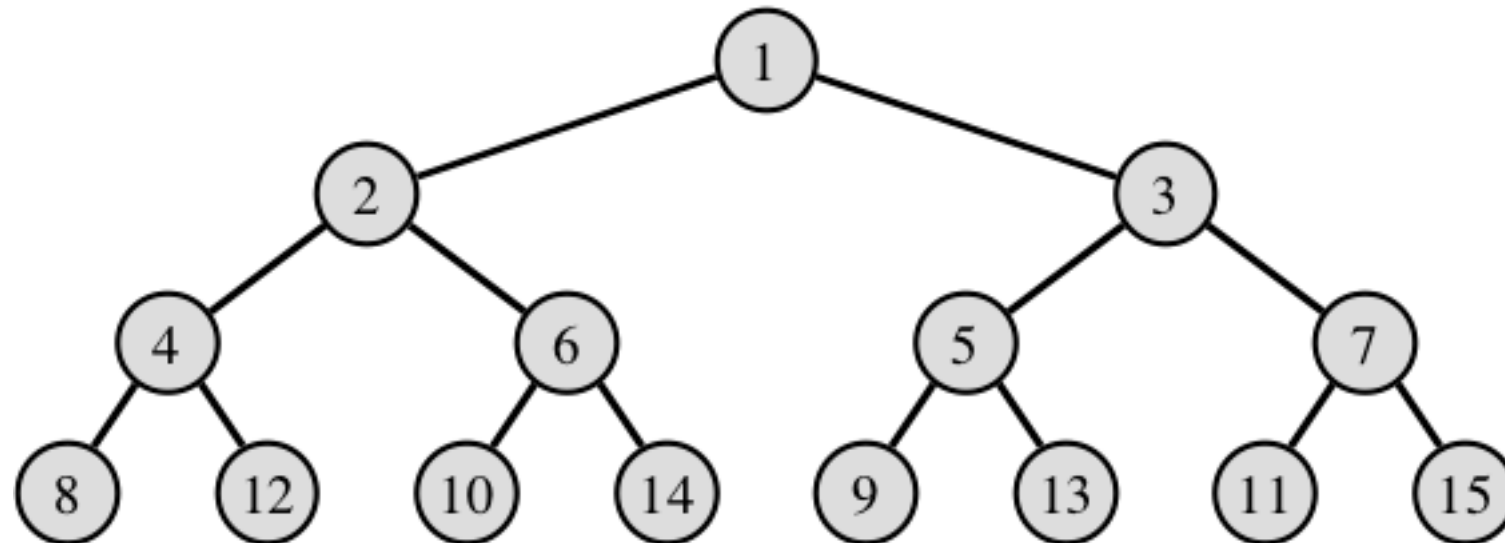


```
# exception Subscript

# let rec sub = function
| Lf, _ -> raise Subscript
| Br (v, t1, t2), k ->
  if k = 1 then v
  else if k mod 2 = 0 then
    sub (t1, k / 2)
  else
    sub (t2, k / 2)
```

# Functional Trees

The path to element  $i$  follows the **binary code** for  $i$  (the "subscript")



```
# exception Subscript

# let rec sub = function
| Lf, _                -> raise Subscript
| Br (v, t1, t2), 1    -> v
| Br (v, t1, t2), k when k mod 2 = 0 -> sub (t1, k / 2)
| Br (v, t1, t2), k    -> sub (t2, k / 2)
```

# Functional Trees

The path to element  $i$  follows the **binary code** for  $i$  (the "subscript")

```
# let rec update = function
| Lf, k, w ->
  if k = 1 then
    Br (w, Lf, Lf)
  else
    raise Subscript (* Gap in tree *)
| Br (v, t1, t2), k, w ->
  if k = 1 then
    Br (w, t1, t2)
  else if k mod 2 = 0 then
    Br (v, update (t1, k / 2, w), t2)
  else
    Br (v, t1, update (t2, k / 2, w))
```

# Functional Trees

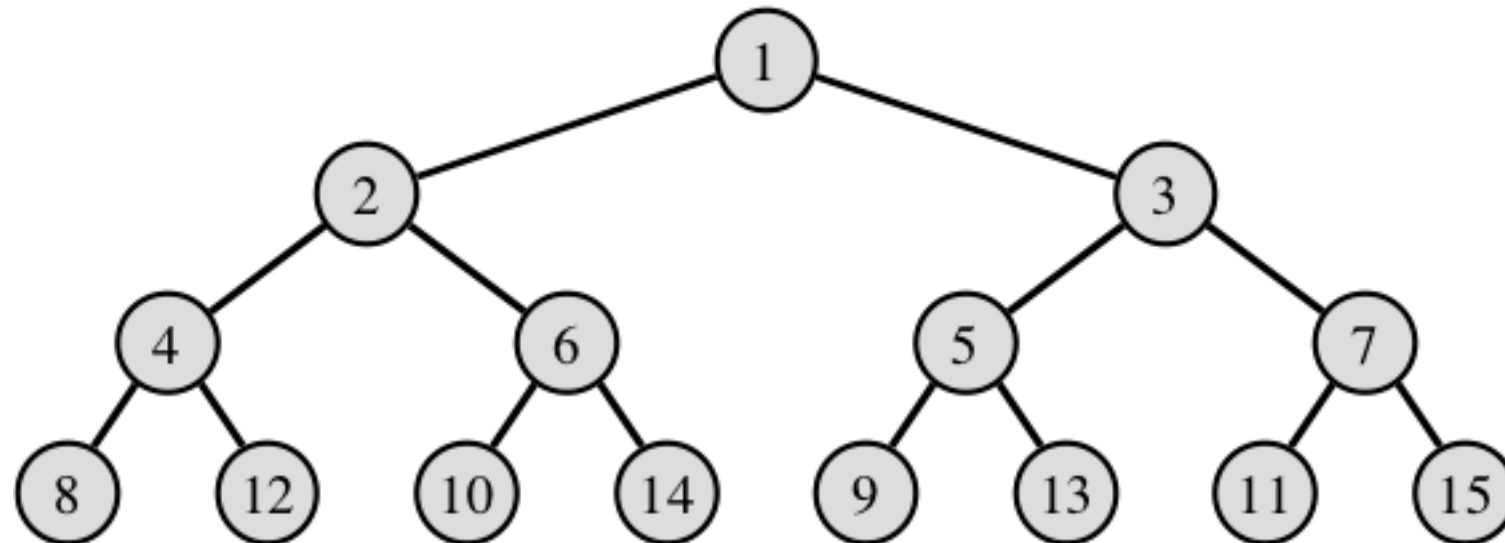
The path to element  $i$  follows the **binary code** ("Subscript")

$O(\log n)$  if  
the tree is  
balanced

```
# let rec update = function
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    else
        raise Subscript (* Gap in tree *)
| Br (v, t1, t2), k, w ->
    if k = 1 then
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    else if k mod 2 = 0 then
        Br (v, update (t1, k / 2, w), t2)
    else
        Br (v, t1, update (t2, k / 2, w))
```

# Functional Trees

The path to element  $i$  follows the **binary code** for  $i$  (the "subscript")



$$15 = 0b1111$$

$$12 = 0b1100$$

$$11 = 0b1011$$

# Complexity of Dictionary Data Structures

- **Linear search:** Most general, needing only equality on keys, but inefficient (linear time).
- **Binary search:** Needs an ordering on keys.  $O(\log n)$  in the average case, binary search trees are  $O(n)$  in the worst case.
- **Array subscripting:** Least general, requiring keys to be integers, but even worst-case time is  $O(\log n)$ .