

Tree Data Structures

Data Structures for Computer Professionals

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Why do we need Tree?

- Lists, Stacks, and Queues are linear relationships
 - Accessing time can be super fast $O(1)$
 - But searching for a key takes $O(n)$
 - Some say this is too slow
 - Can you find something that the search is faster than $O(n)$
- Well, Tree can be the answer

What is Tree?

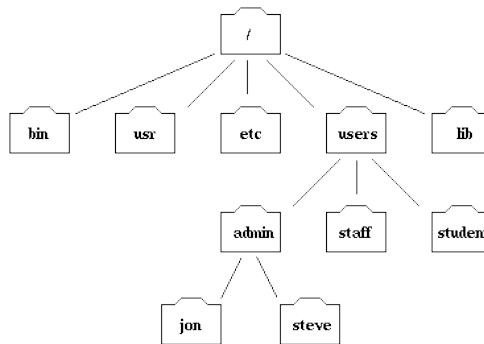
▣ What is Tree

- ▣ Tree consists of nodes that contain data
- ▣ Tree can contain no node (empty)
- ▣ **A node can point to one or more nodes**
- ▣ A node can point to null (leaf node)
- ▣ A node that has no other node point to it; is called **root** node
- ▣ **Tree contains no loop/cycle of nodes**

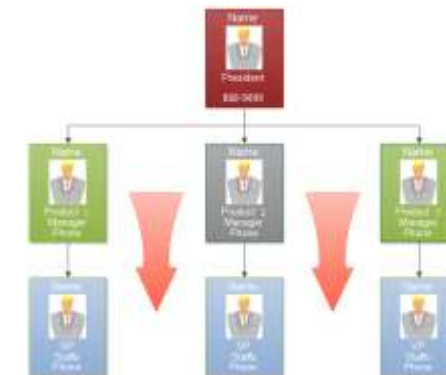
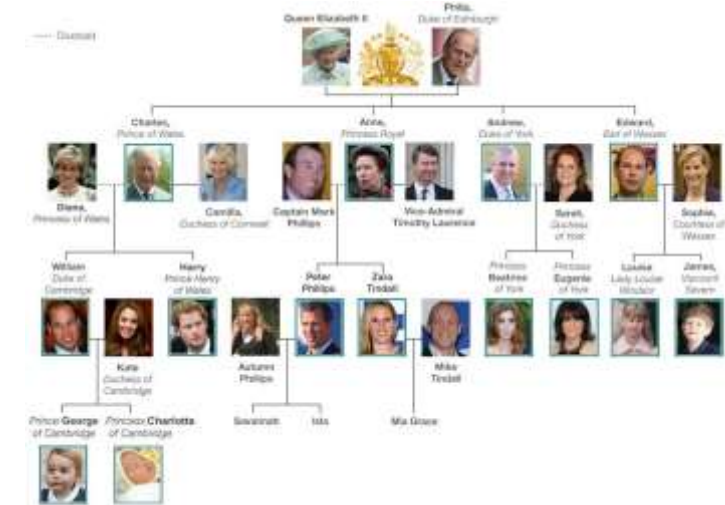
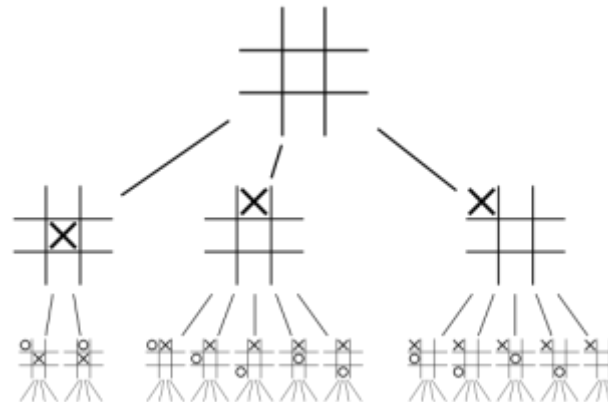
Trees

Information often contains hierarchical relationships

- Family
- File directories or folders
- Moves in game
- Hierarchies in organizations



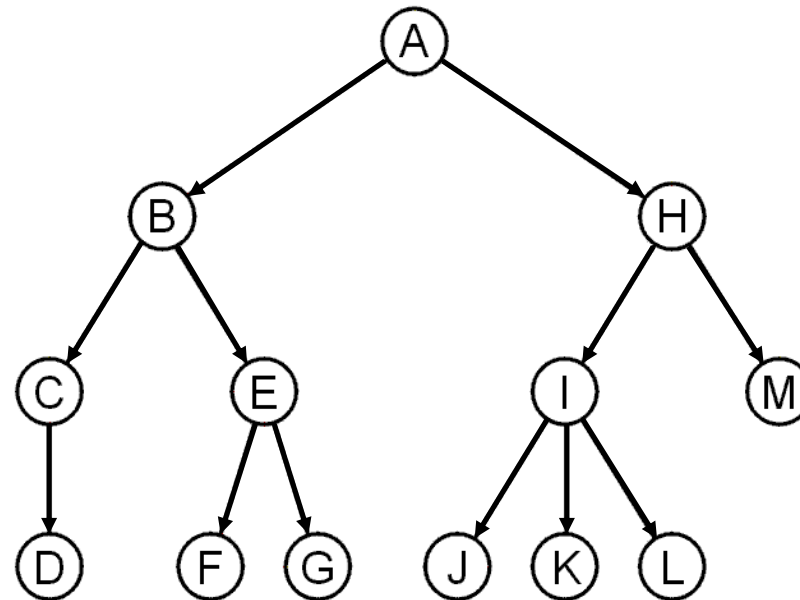
Part of the filesystem tree



Tree Terminology

A tree data structure stores information in *nodes*

- Similar to linked lists:
 - There is a first node, or *root*
 - Each node has variable number of references to successors
 - Each node, other than the root, has exactly one node pointing to it
 - In the diagram, the line that connected between nodes is called edge
 - The edge should be directed (either be unidirected or bidirected)



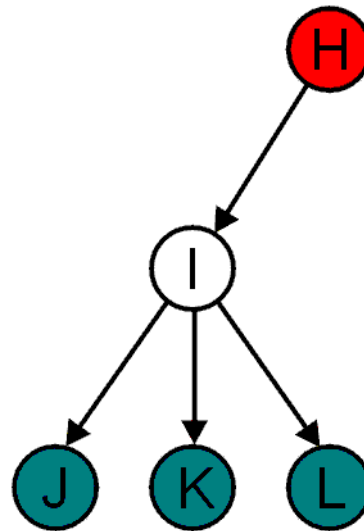
Parent and Child

All nodes will have zero or more child nodes or *children*

- I has three children: J, K and L

For all nodes other than the root node, there is one parent node

- H is the parent I



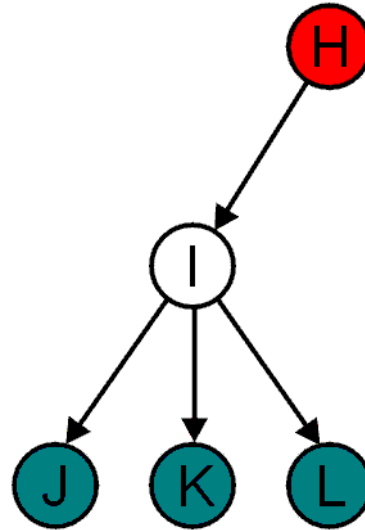
Node Degree

The *degree* of a node is defined as the number of its children:

$$\text{deg}(I) = 3$$

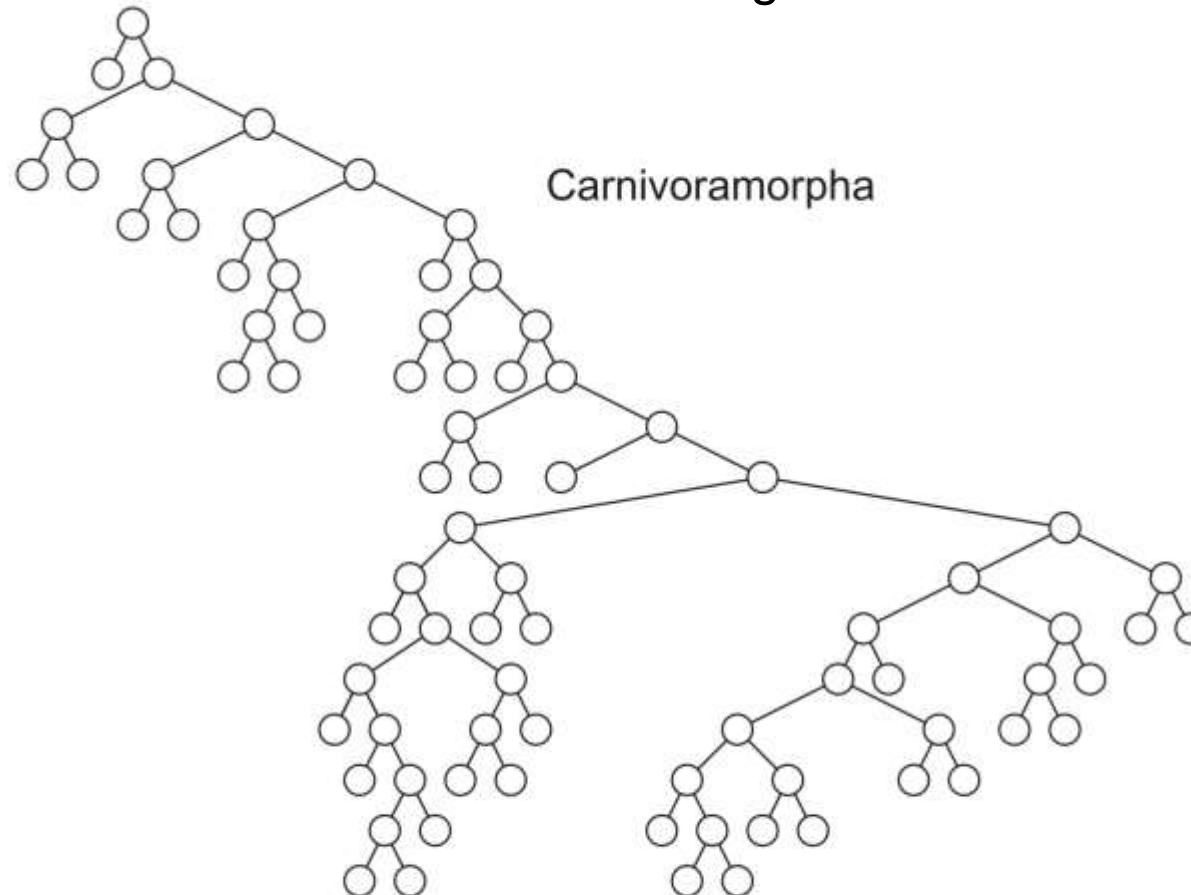
Nodes with the same parent are *siblings*

- J, K, and L are siblings



Phylogenetic tree

Phylogenetic trees have nodes with degree 2 or 0:

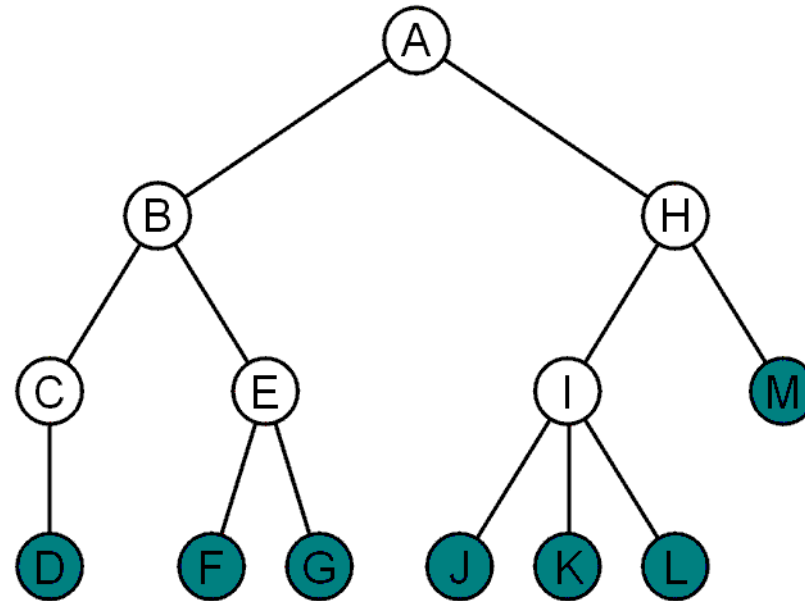


Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Leaf Nodes and Internal Nodes

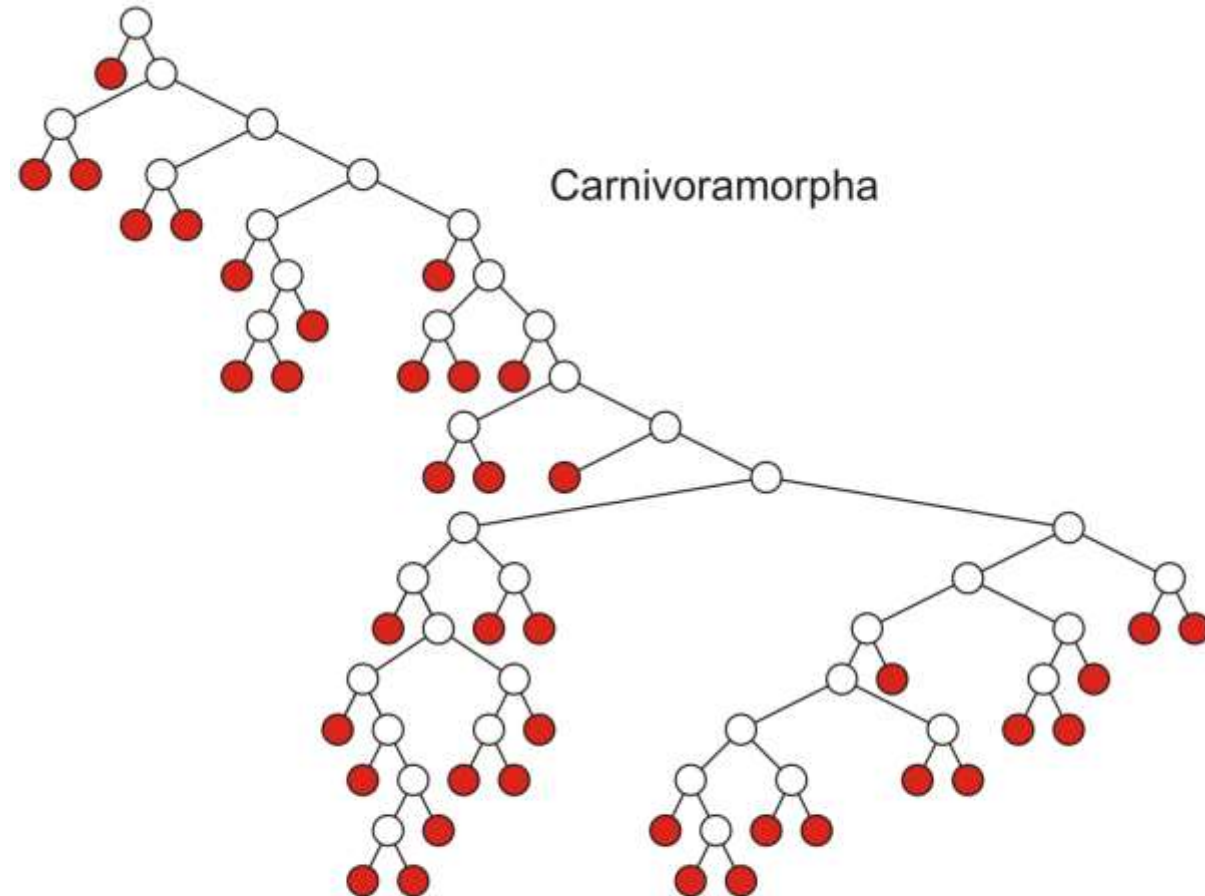
Nodes with degree zero are also called *leaf nodes*

All other nodes are said to be *internal nodes*, that is, they are internal to the tree



Leaf Nodes

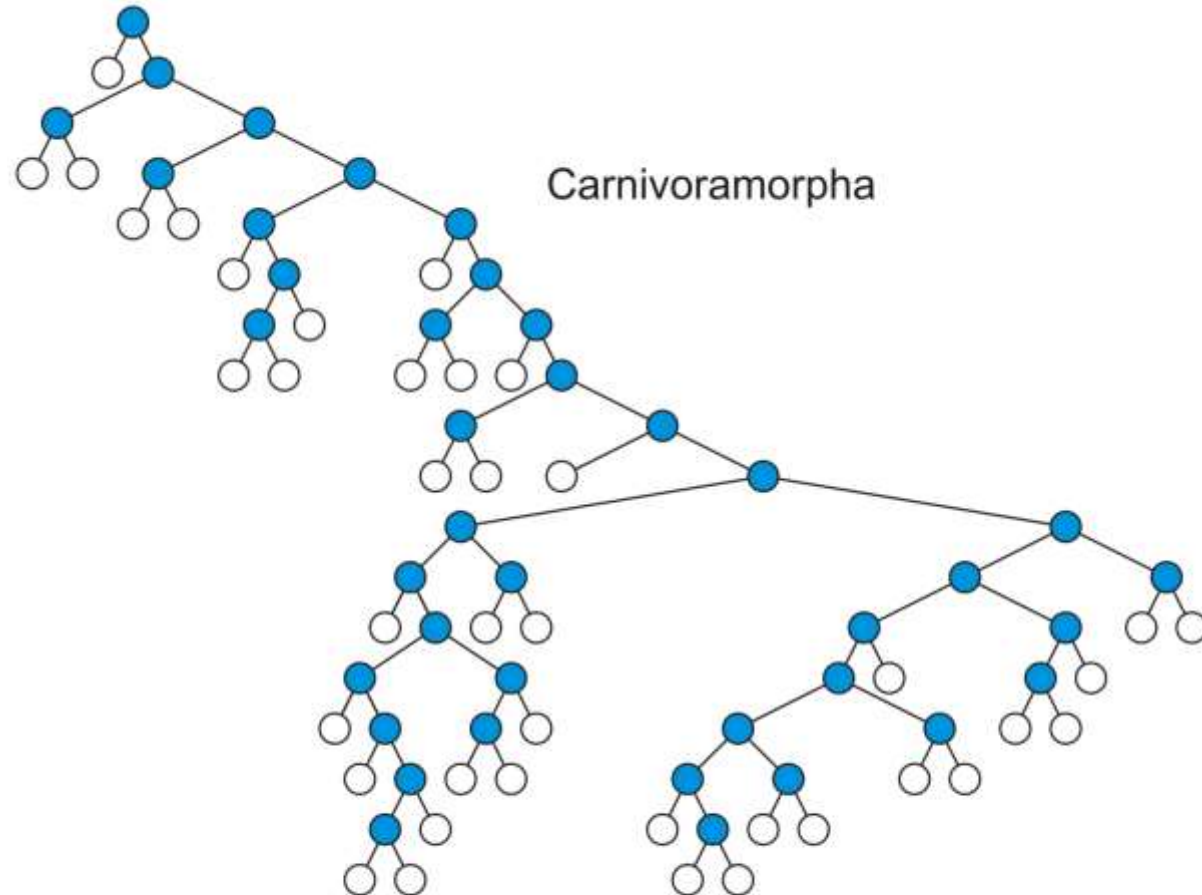
Leaf nodes:



Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Internal Nodes

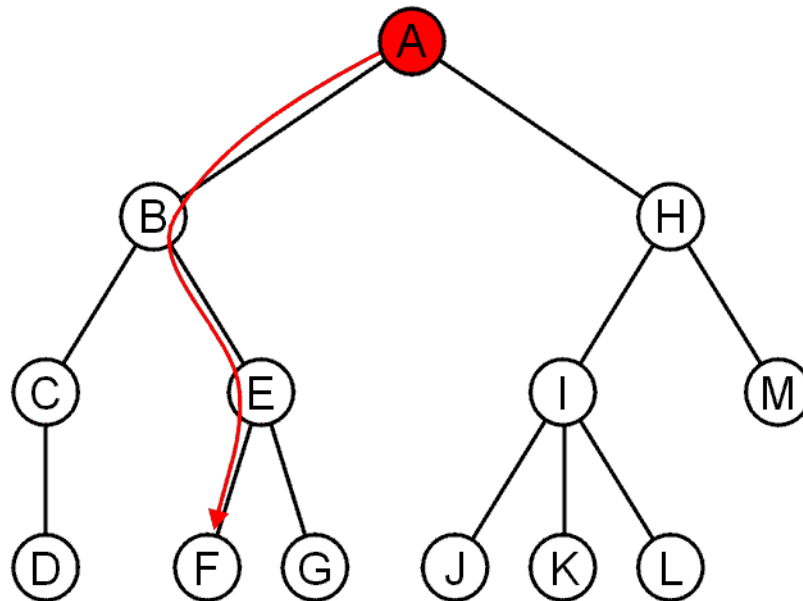
Internal nodes:



Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Root node

- The shape of a rooted tree gives a natural flow from the *root node*, or just *root*
- Every node grows from the root
- Tree in Data Structure grows upside down



Path

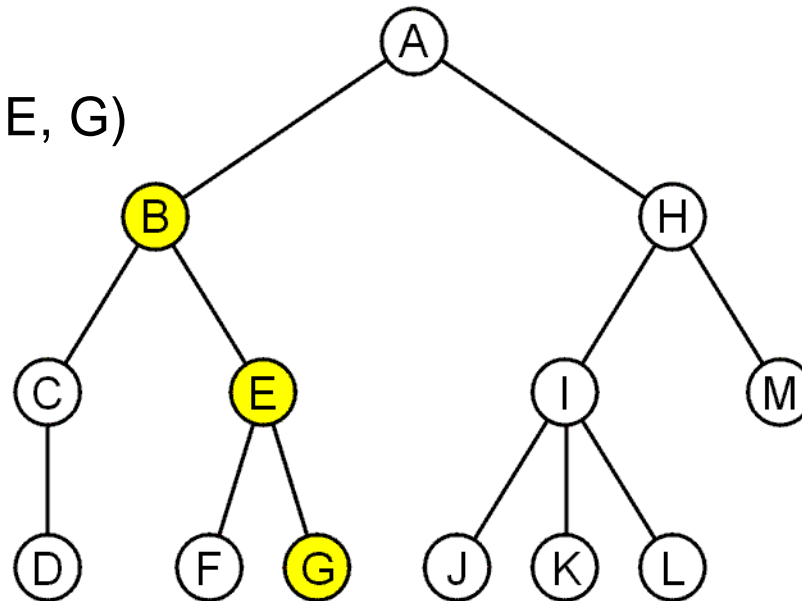
A **path** is a sequence of nodes

(a_0, a_1, \dots, a_n)

where a_{k+1} is a child of a_k is

The **length** of this path is n

E.g., the path (B, E, G)
has length 2

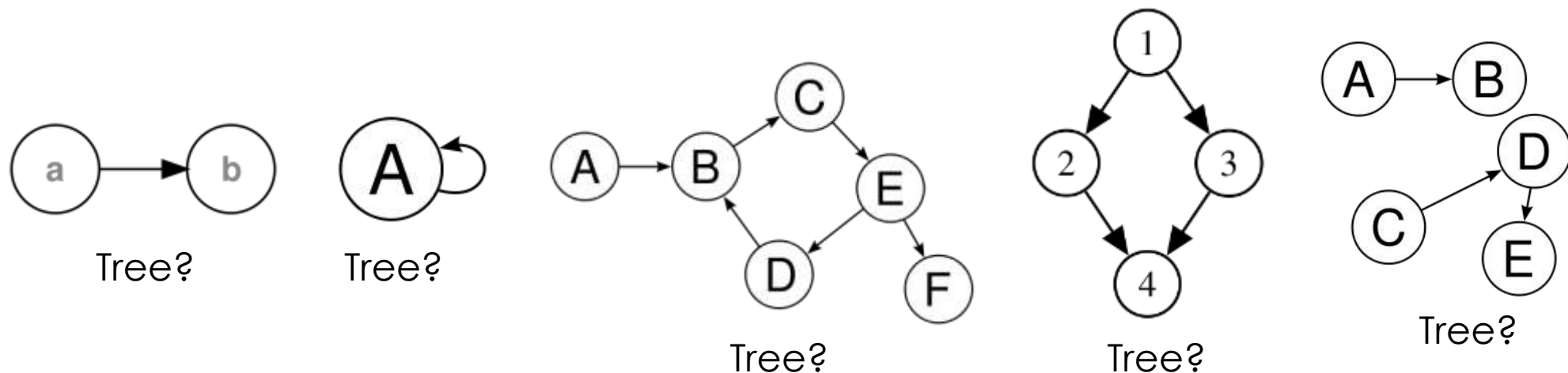


A tree with N nodes always has N-1 edges

Loops in Tree?

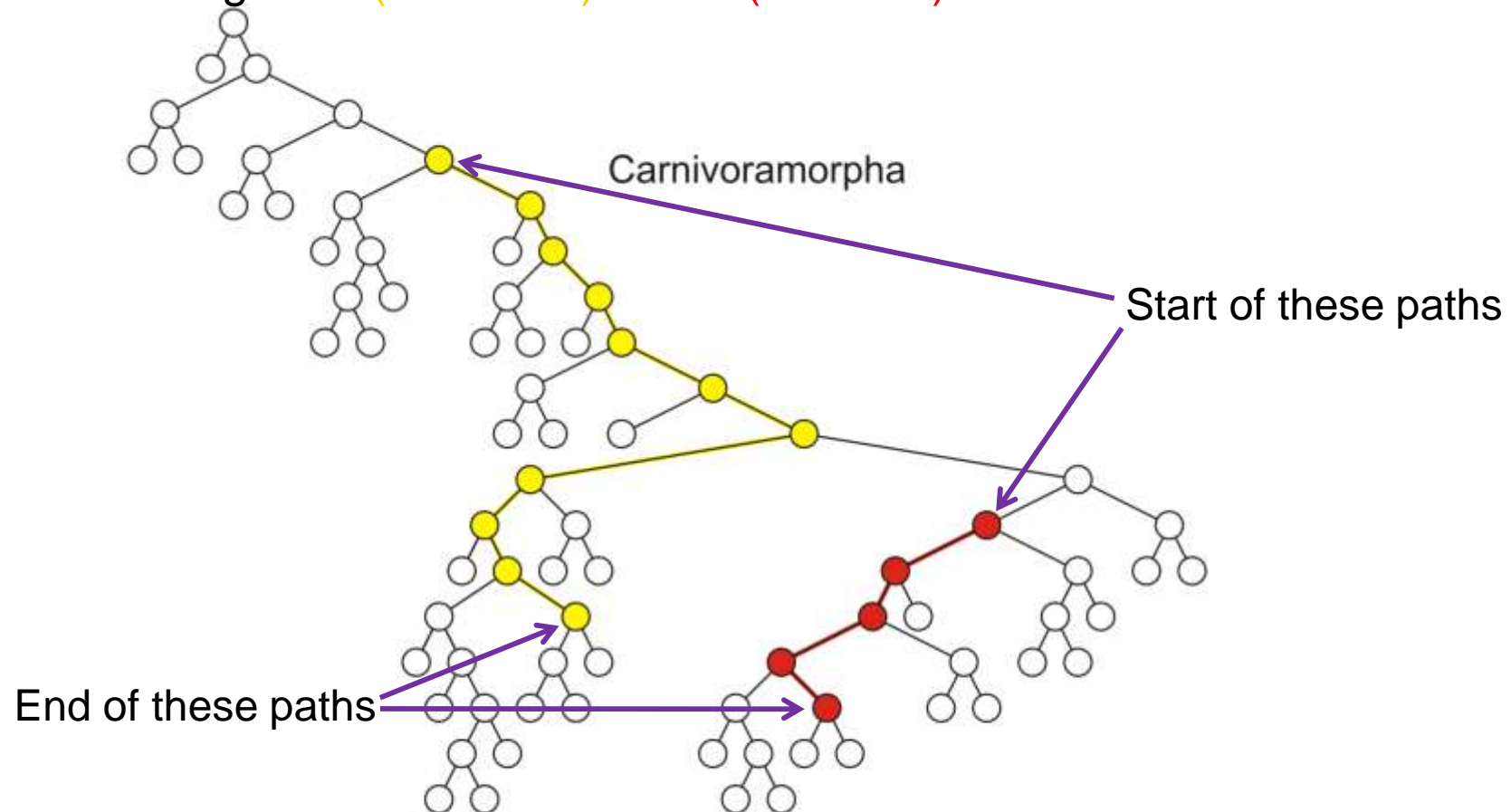
- Two nodes in a tree have at most one path between them
- Can a non-zero path from node N reach node N again?

No. Trees can never have cycles (loops)



Path Example

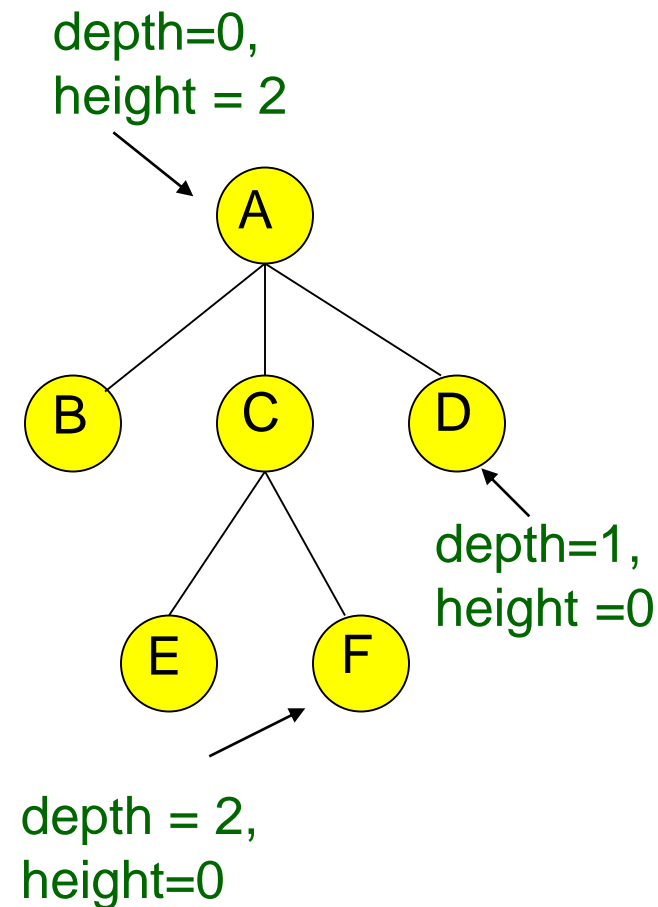
Paths of length 10 (11 nodes) and 4 (5 nodes)



Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorphan, and assessment of the position of 'Miacoidea'"

Distance Measurement

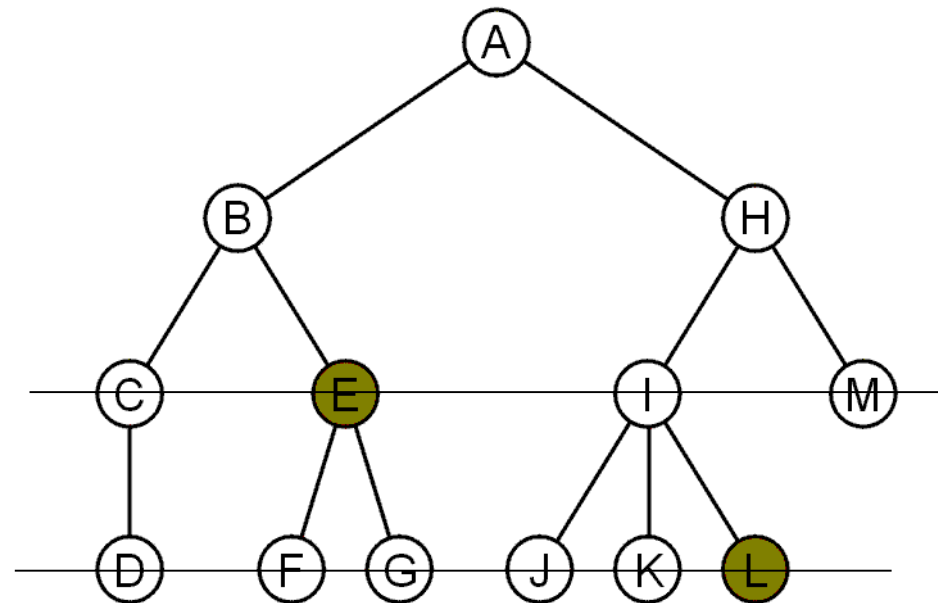
- **Length** of a path = number of edges
- **Depth** of a node N = length of path from root to N
- **Height** of node N = length of longest path from N to a leaf
- **Depth of tree** = depth of deepest node
- **Height of tree** = height of root



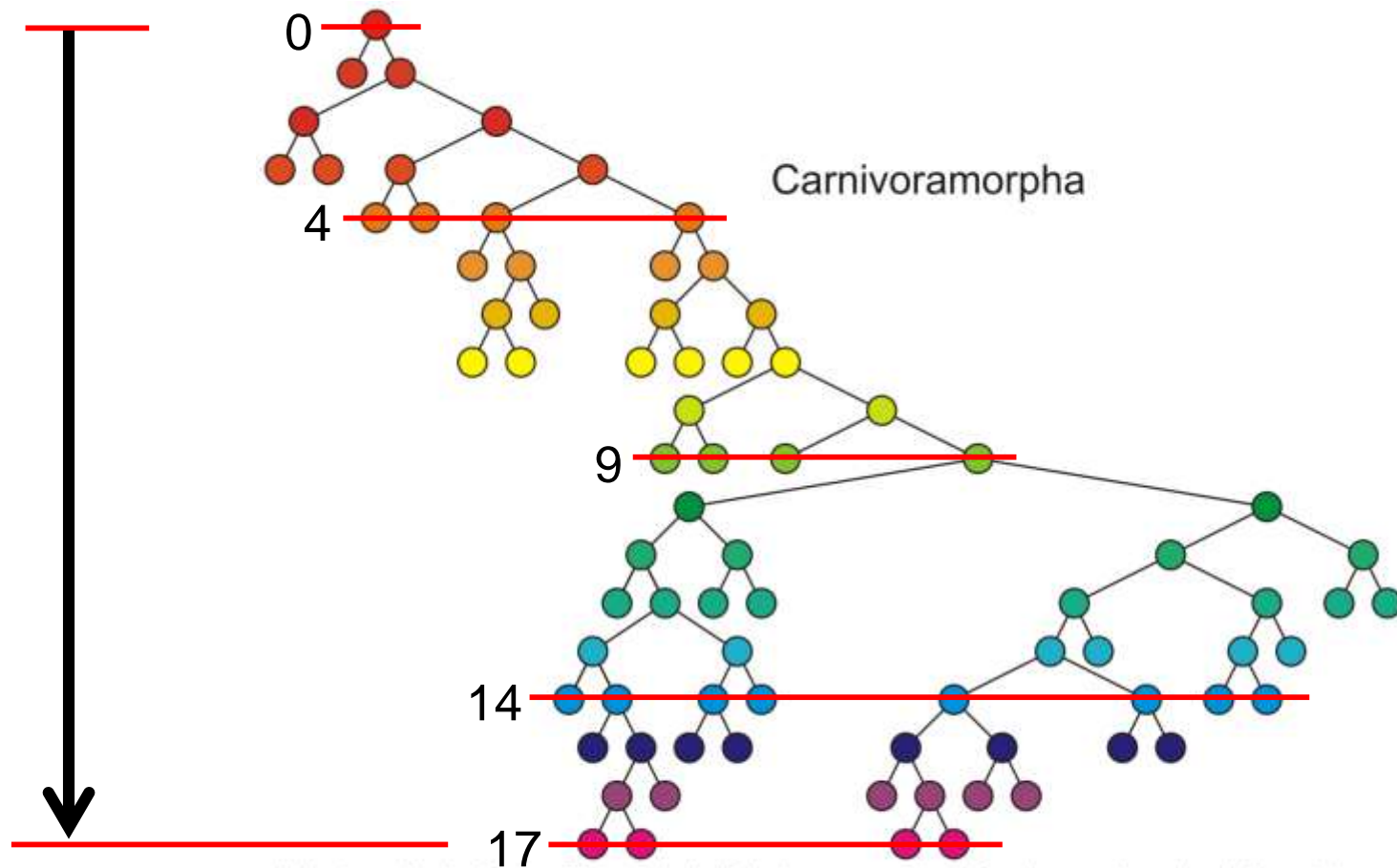
Node Depth

For each node in a tree, there exists a unique ***path from the root node to that node***

- What is depth of the node E?
☐ 2
- What is depth of the node L?
☐ 3



Node Depth and Tree Depth

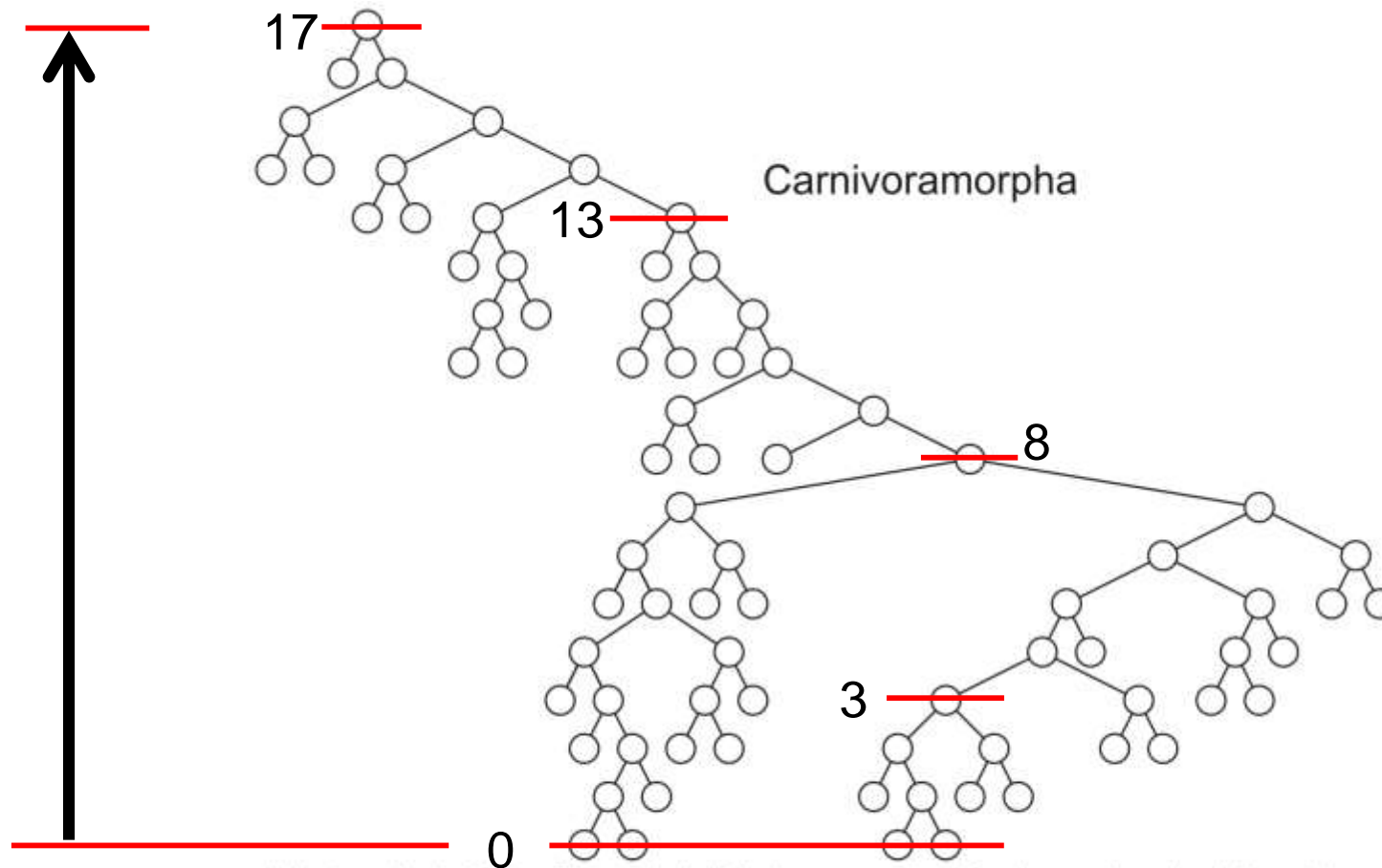


Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Height of Node and Tree

- The height of a node is the path length from the node to the deepest descendant.
- The height of a tree is the path length from root node to the deepest leaf.
- The height of a tree with a single node is 0
- The height of a leaf node is 0
- The height of a tree is equal to the depth of the tree
- For convenience, we define the height of the empty tree to be -1

Node Height vs Tree Height



Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Ancestor and Descendent

If a path exists from node a to node b :

- a is an *ancestor* of b
- b is a *descendent* of a

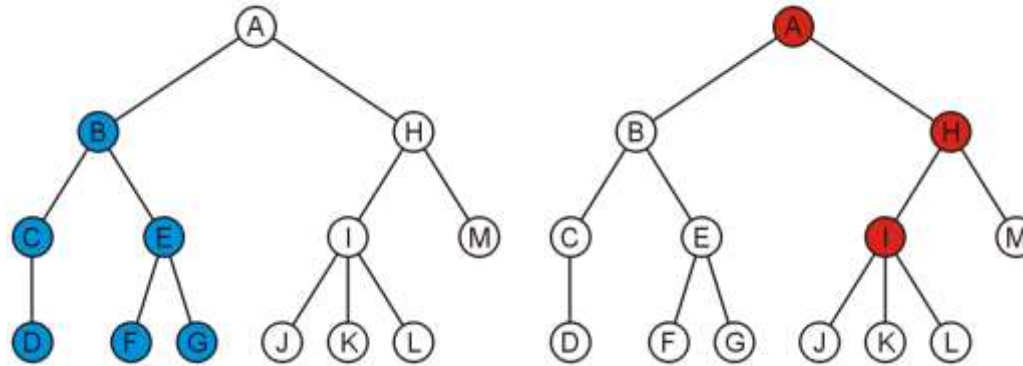
Thus, a node is both an ancestor and a descendant of itself

- We can add the adjective *strict* to exclude equality: a is a *strict descendant* of b if a is a descendant of b but $a \neq b$

The root node is an ancestor of all nodes

Ancestor and Descendent

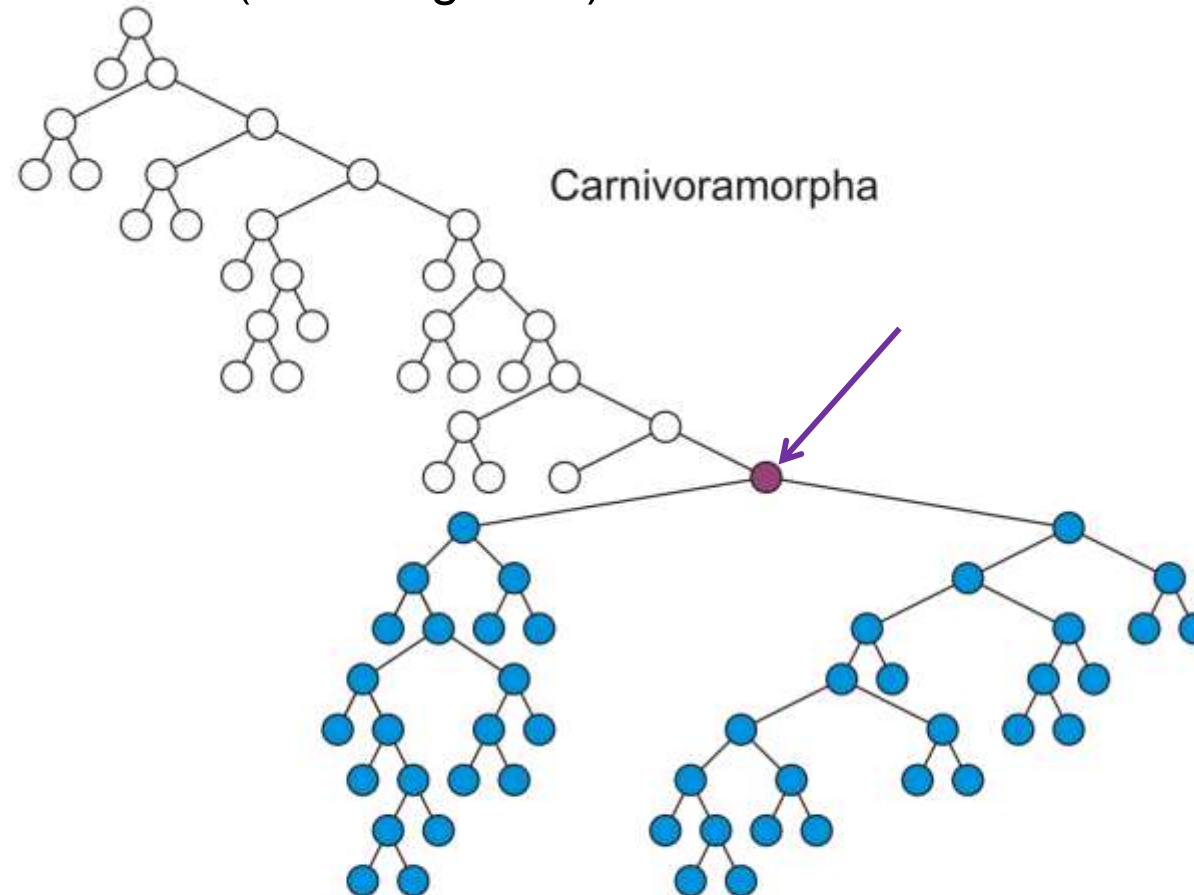
The descendants of node B are B, C, D, E, F, and G:



The ancestors of node I are I, H, and A:

Descendants

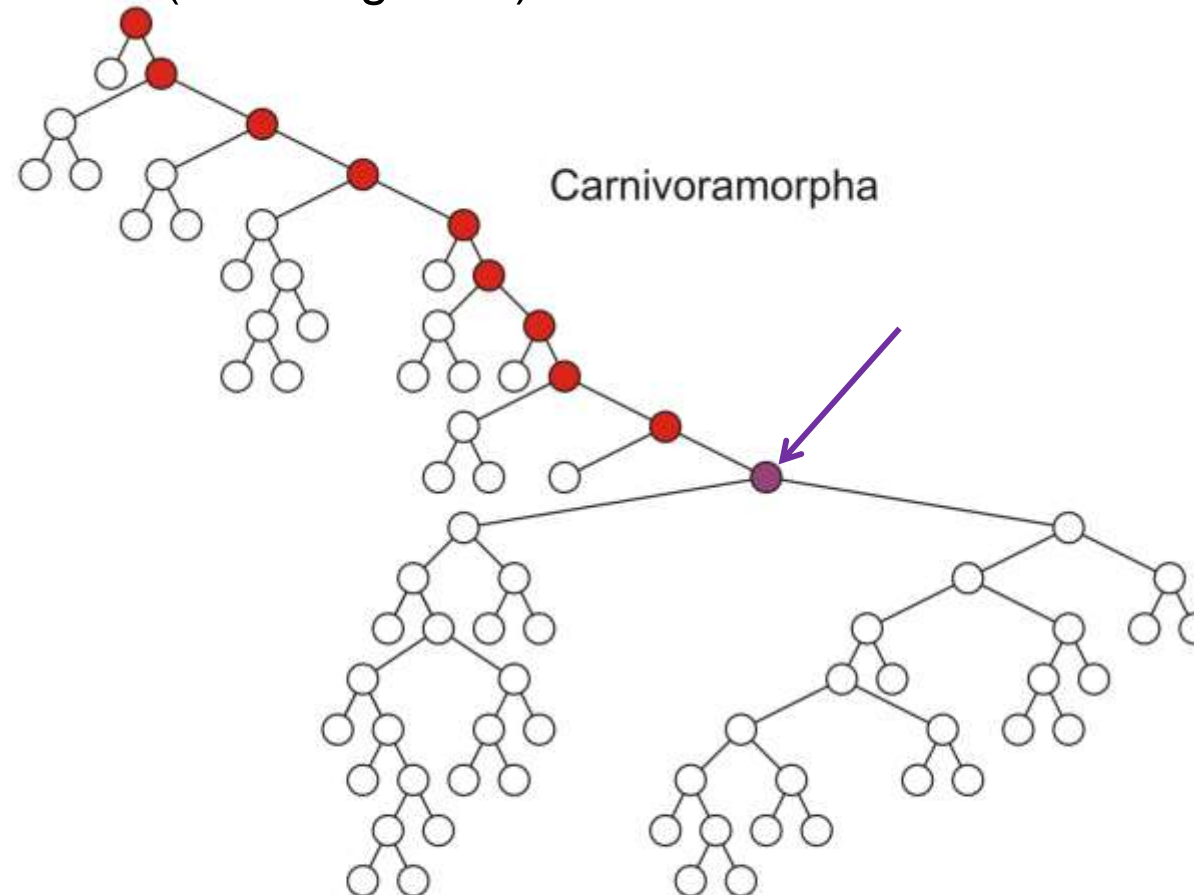
All descendants (including itself) of the indicated node



Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Ancestors

All ancestors (including itself) of the indicated node

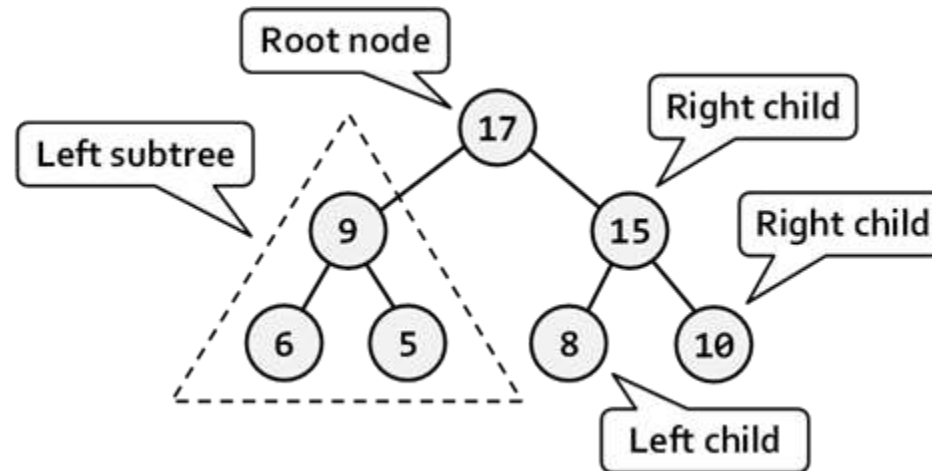


Wesley-Hunt, G. D.; Flynn, J. J. "Phylogeny of the Carnivora: basal relationships among the Carnivoramorpha, and assessment of the position of 'Miacoidea'"

Alternative Definition of Tree

Another approach to a tree is to define the tree recursively:

- A tree can be represented by a root node
- Any node can be a root node
- A child node of a node is also a root node of a tree (sub-tree)



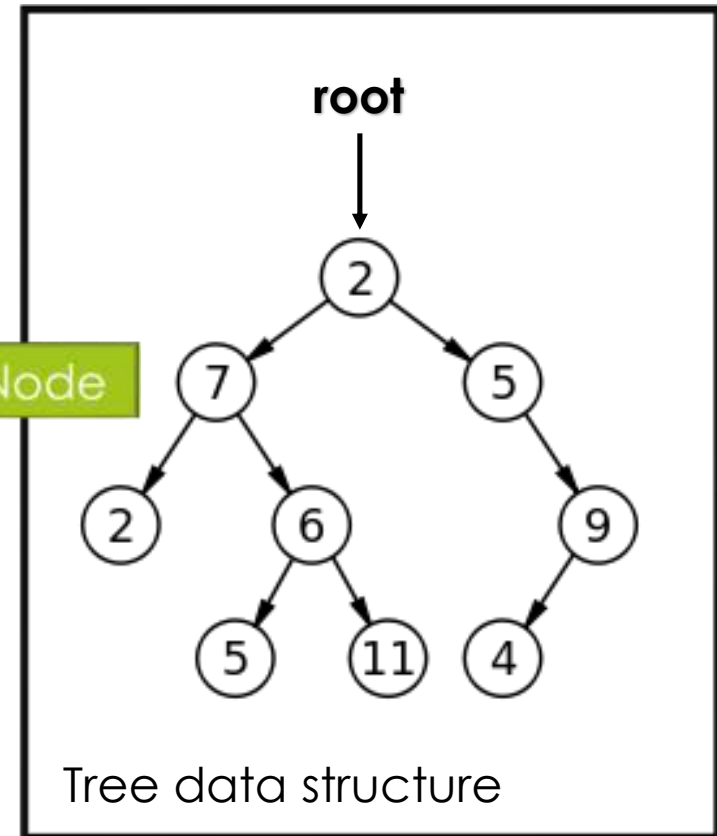
Implementation of Trees (K-ary Tree)

Pointer-based Implementation

class Node

```
// Required:  
Object Key;  
// K-ary Tree  
Node child1, child2, ..., childK
```

```
// Optional:  
// For bidirectional tree  
Node parent;
```

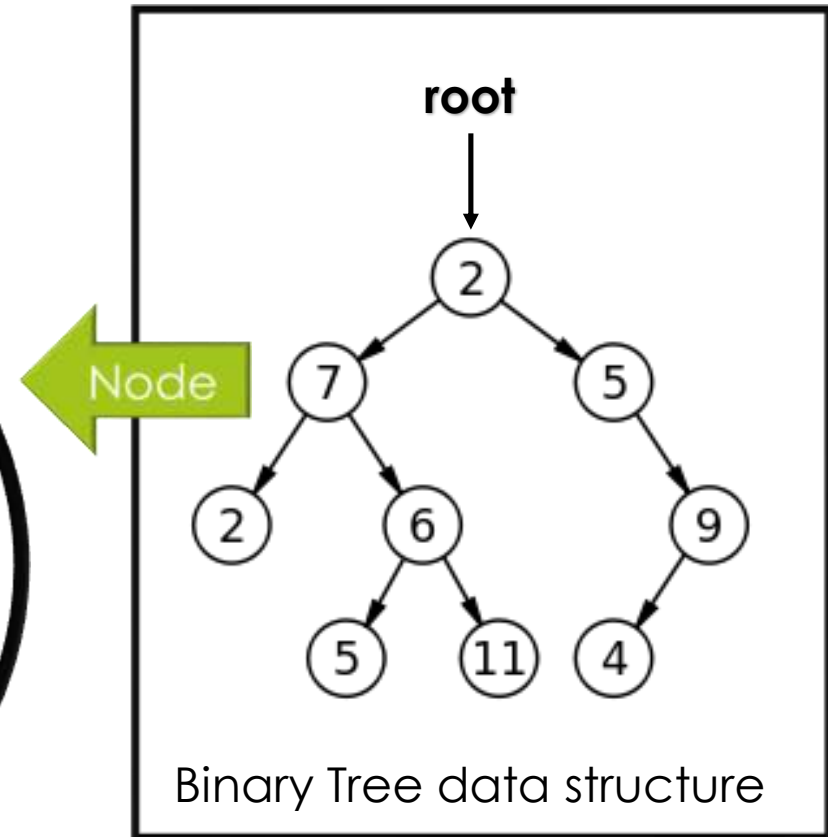
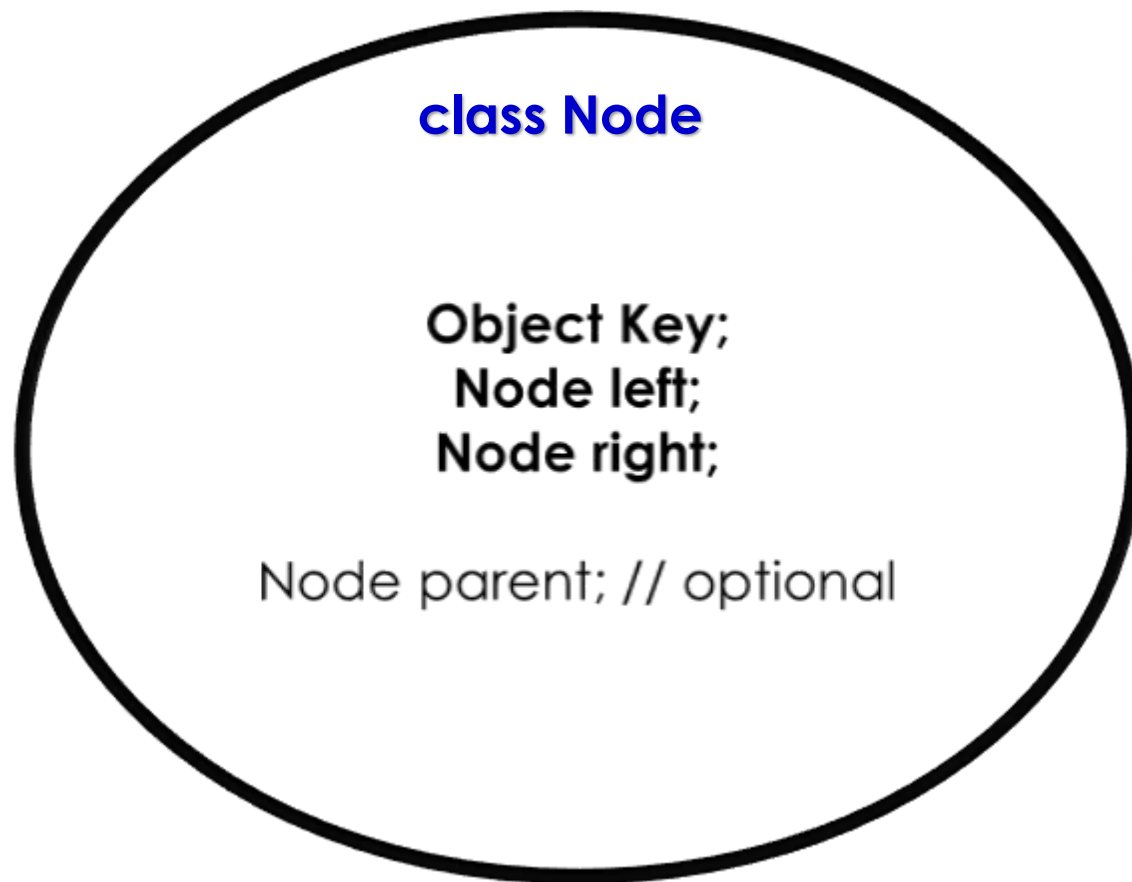


Tree data structure

```
class Tree{  
    Node root  
}
```

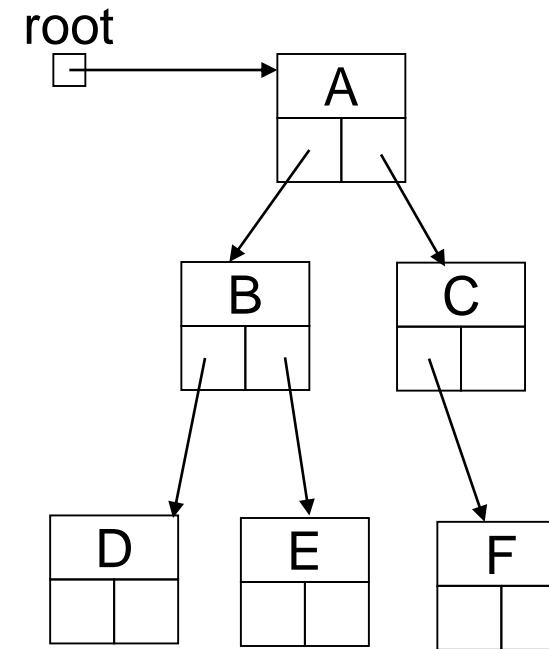
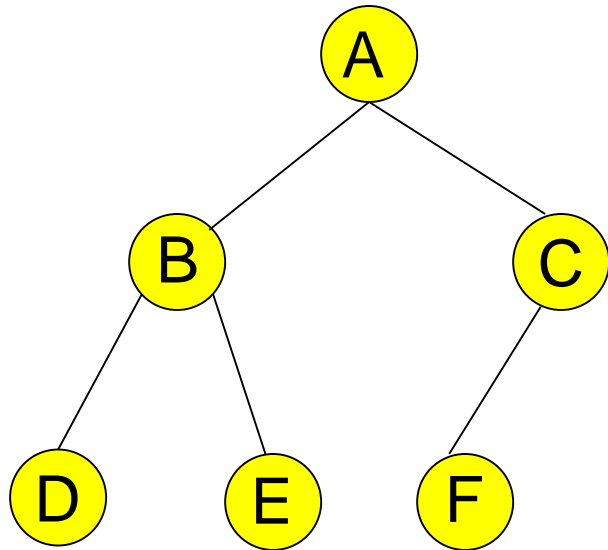
Implementation of Binary Trees

Binary Tree Implementation



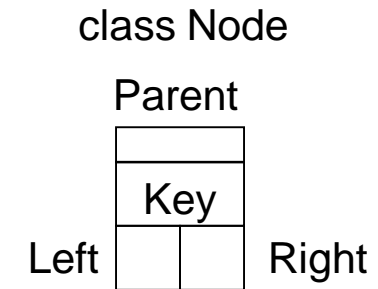
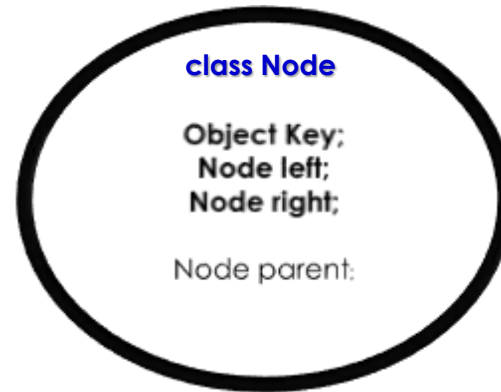
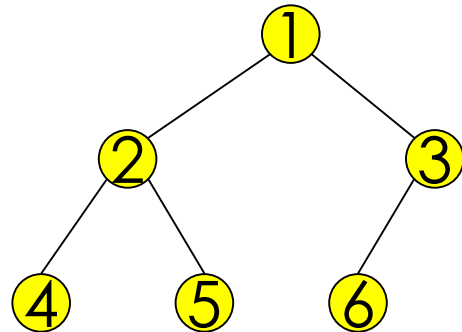
```
class Tree{  
    Node root  
}
```

Binary Tree Structure (applicable to K-nary tree)



class Node
Key
LeftChild

Binary Tree



- Every node has at most two children
- Most popular tree in computer engineering field
- If I do not say otherwise, we will assume that we are talking about Binary Trees for the rest of the course.
- Given a binary tree with depth **d**, what is the possible number of nodes (**N**)?
- Given a number of nodes **N**, what is the minimum depth of a binary tree?

Minimum depth vs Node count

- At depth d , you can have $N = d+1$ to $2^{d+1}-1$ nodes
- minimum depth d is $\Theta(\log N)$

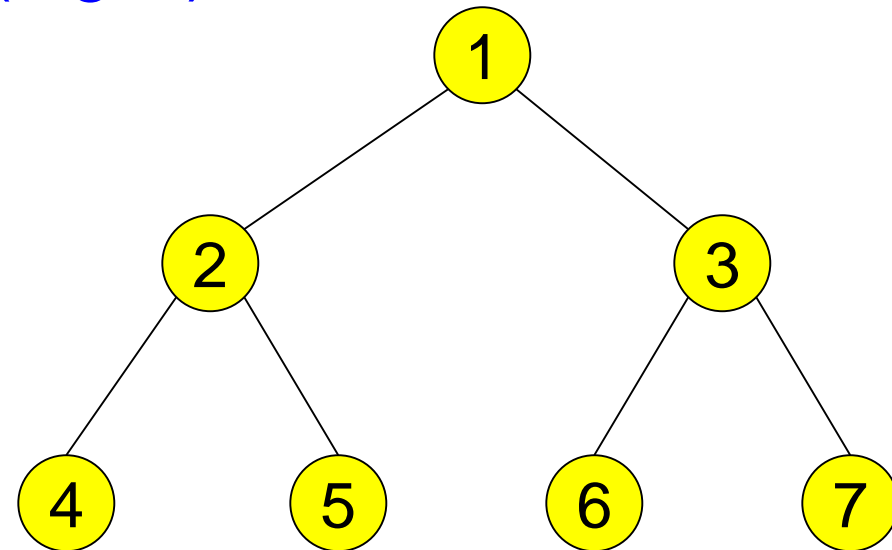
$T(n) = \Theta(f(n))$ means

$T(n) = O(f(n))$ and $f(n) = O(T(n))$,

i.e. $T(n)$ and $f(n)$ have the **same** growth rate

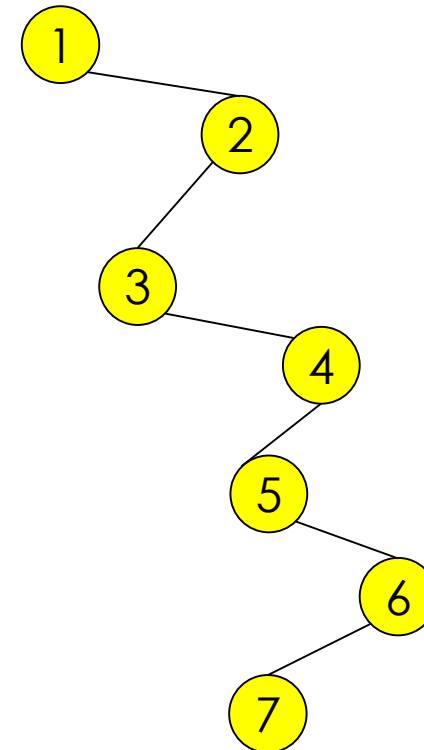
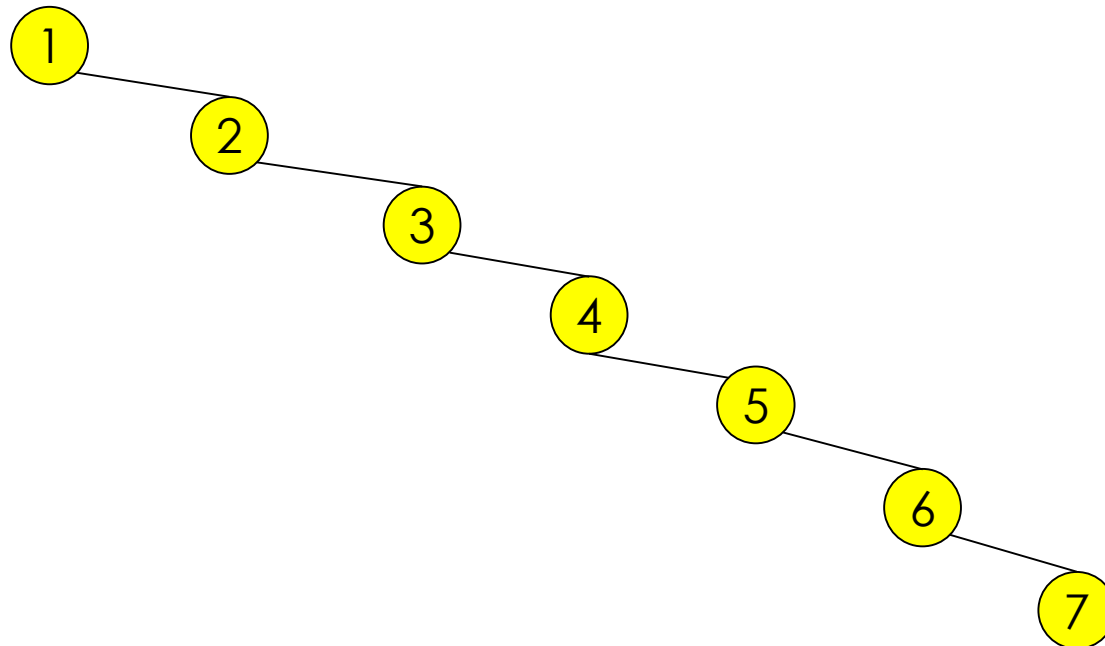
$d=2$

$N = 3$ to 2^3-1 (i.e, 3 to 7 nodes)



Minimum depth vs Node count

- What is the maximum depth of a binary tree?
 - Degenerate case: Tree is a linked list!
 - Maximum depth = $N - 1$



Thought Questions

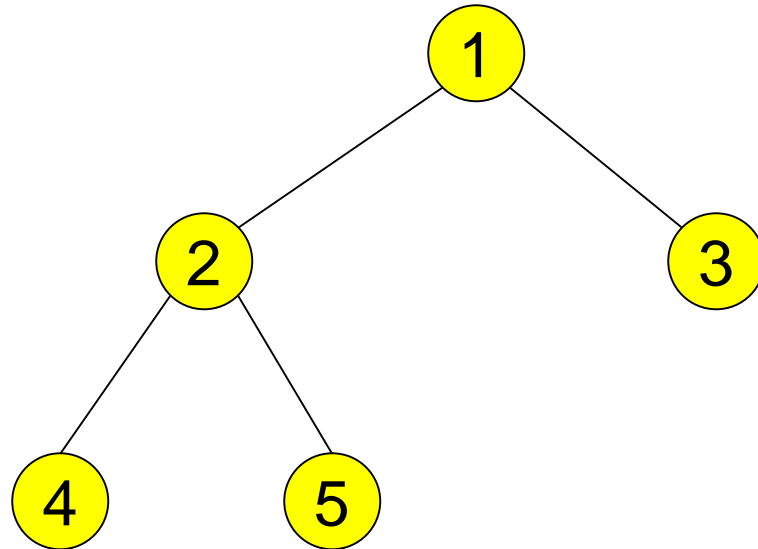
- If a target key is often stored at the leaf nodes
 - What is the complexity of the searching for a key in a tree with the maximum depth (degenerate tree)?
 - What is the complexity of the searching for a key in a tree with the minimum depth (complete tree)?

Height Measurement

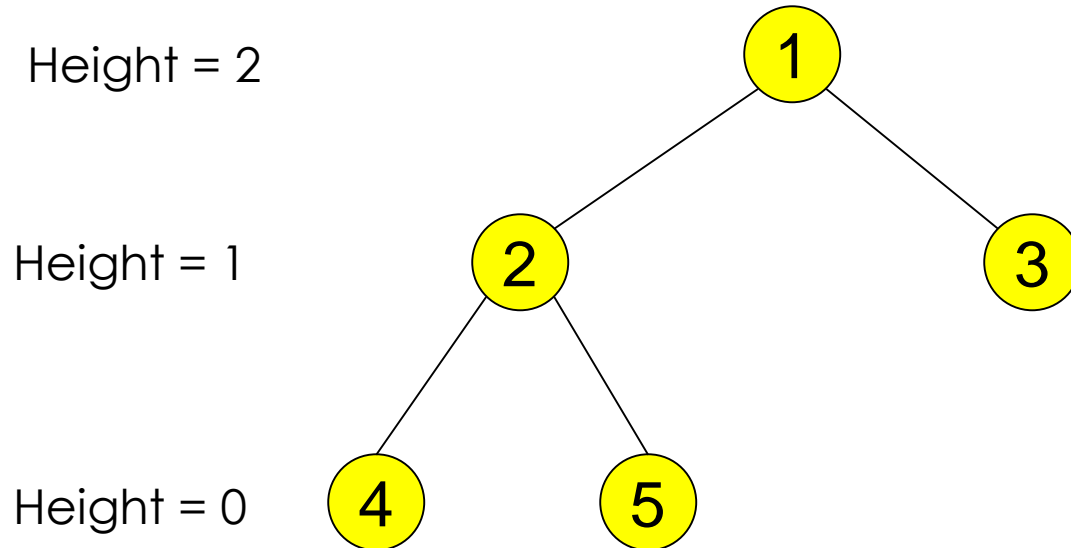
Height = ?

Height = ?

Height = ?



Height Measurement Algorithm



```
int Height( Node node )
```

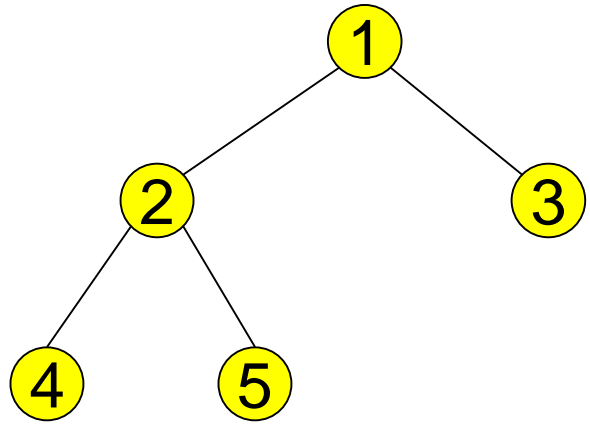
```
if node == null
```

```
    return -1
```

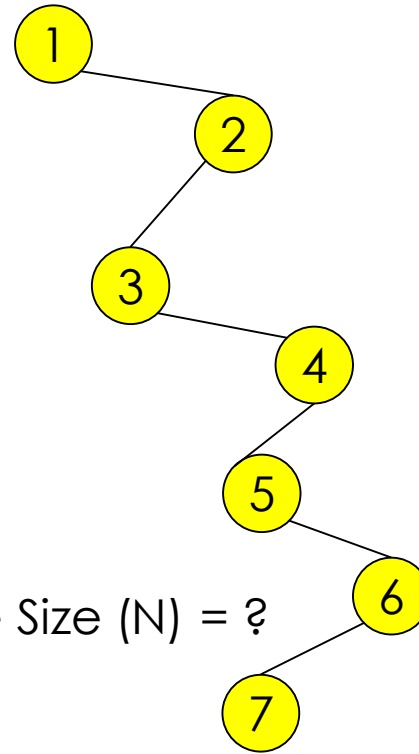
```
else
```

```
    return 1 + max( Height(node.left), Height(node.right) )
```

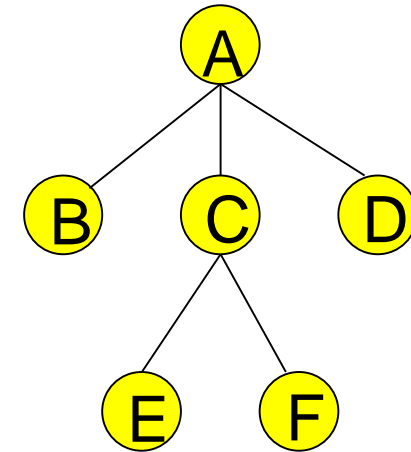
Tree Size Measurement



Tree Size (N) = ?

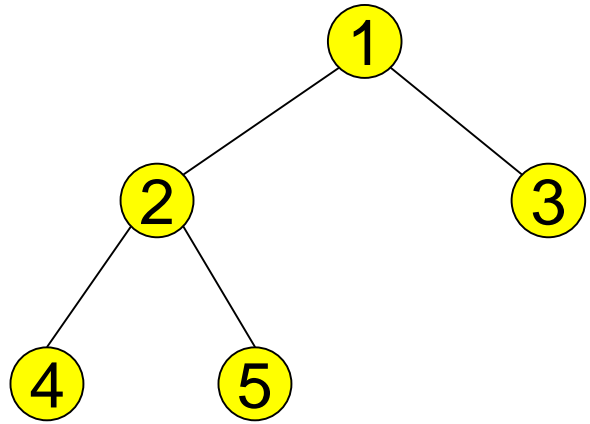


Tree Size (N) = ?

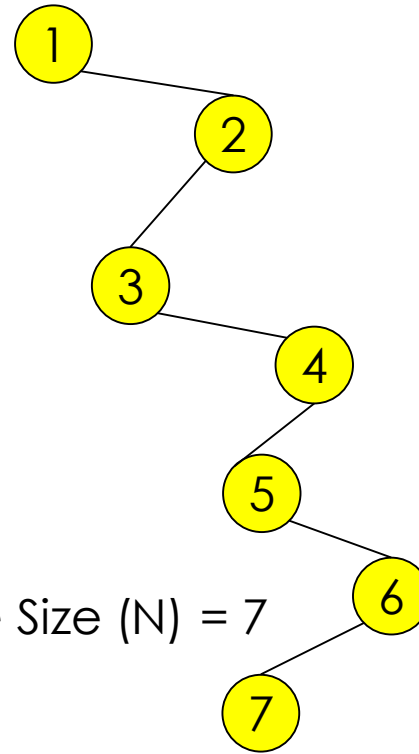


Tree Size (N) = ?

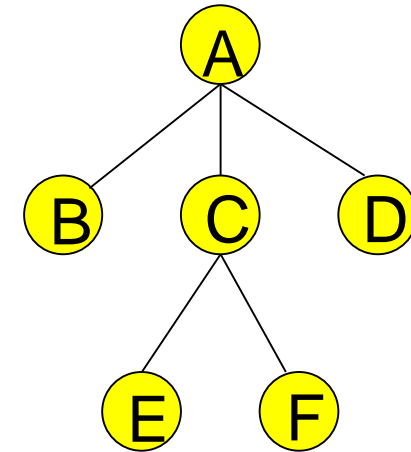
Tree Size Measurement Algorithm



Tree Size (N) = 5



Tree Size (N) = 7



Tree Size (N) = 6

```
int Size( Node node )
```

```
if node == null
```

```
    return 0
```

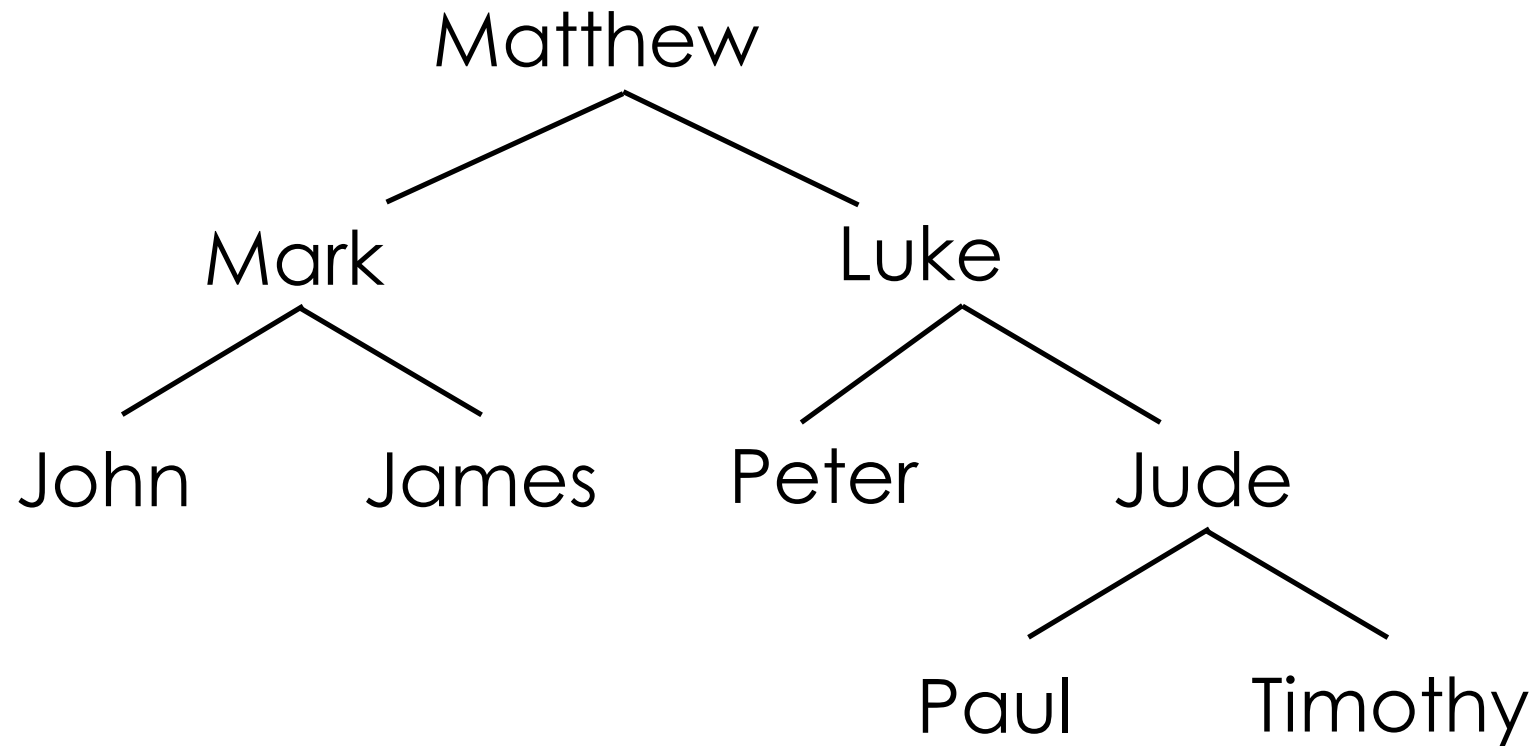
```
else
```

```
    return 1 + Size(node.left) + Size(node.right)
```

Tree Traversal (Walking a Tree)

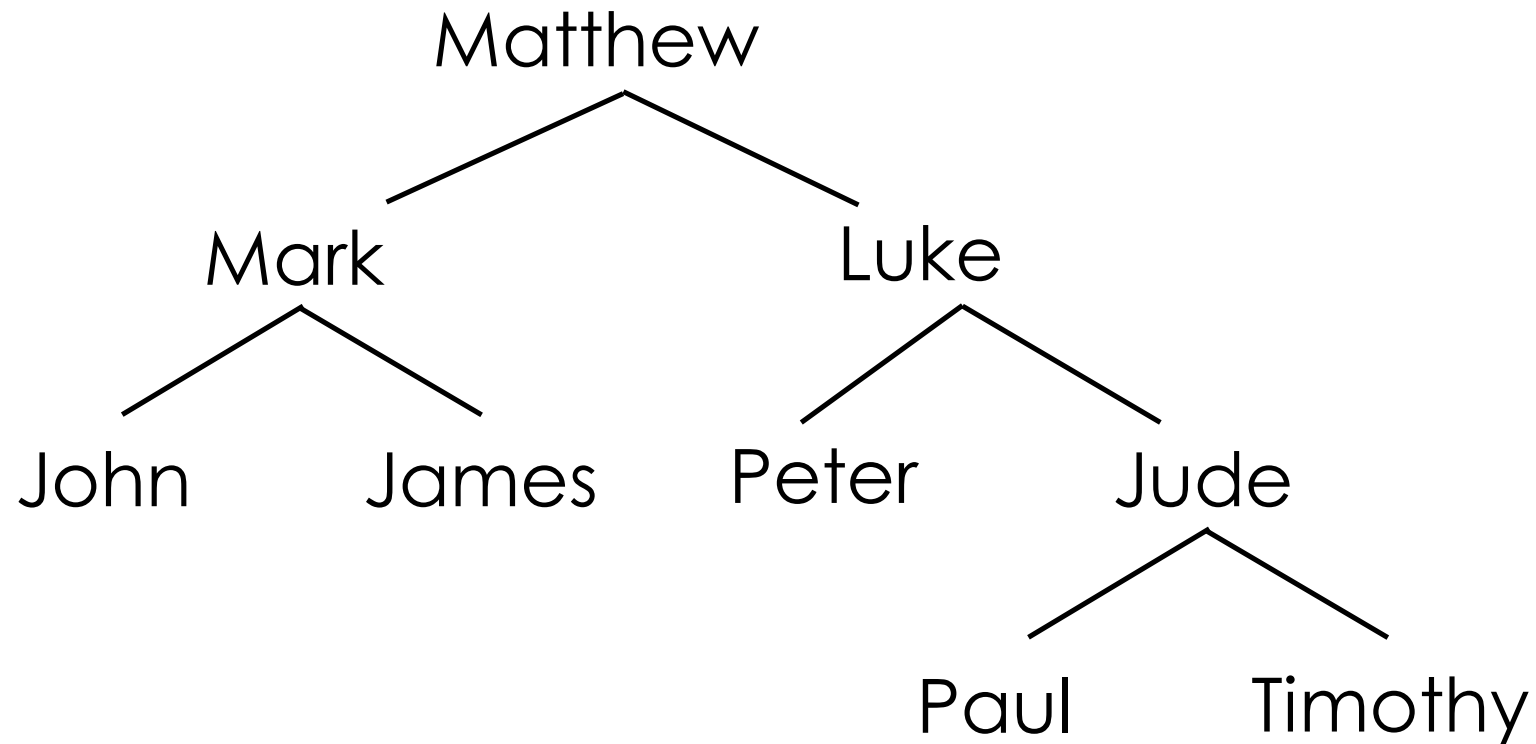
- We want to visit all nodes of the tree
 - Searching for a key in an unordered tree ($O(n)$)
 - Re-evaluate values of one or more nodes
 - Print all the values contains within the tree ($\Theta(n)$)
- Traversal order: Breadth-first and Depth-first
 - **Breadth-first:** We traverse all nodes at one level before progressing to the next level
 - e.g. Users tend to place files are usually places at the earlier folders rather than deeper subfolder
 - **Depth-first:** We completely traverse one sub-tree to before exploring a sibling sub-tree
 - e.g. Important data often stored at the leaves of the tree (such as operands) which should be read first before the internal nodes (operators)

Breadth-first Traversal (Level Traversal)



Output:

Breadth-first Traversal (Level Traversal)



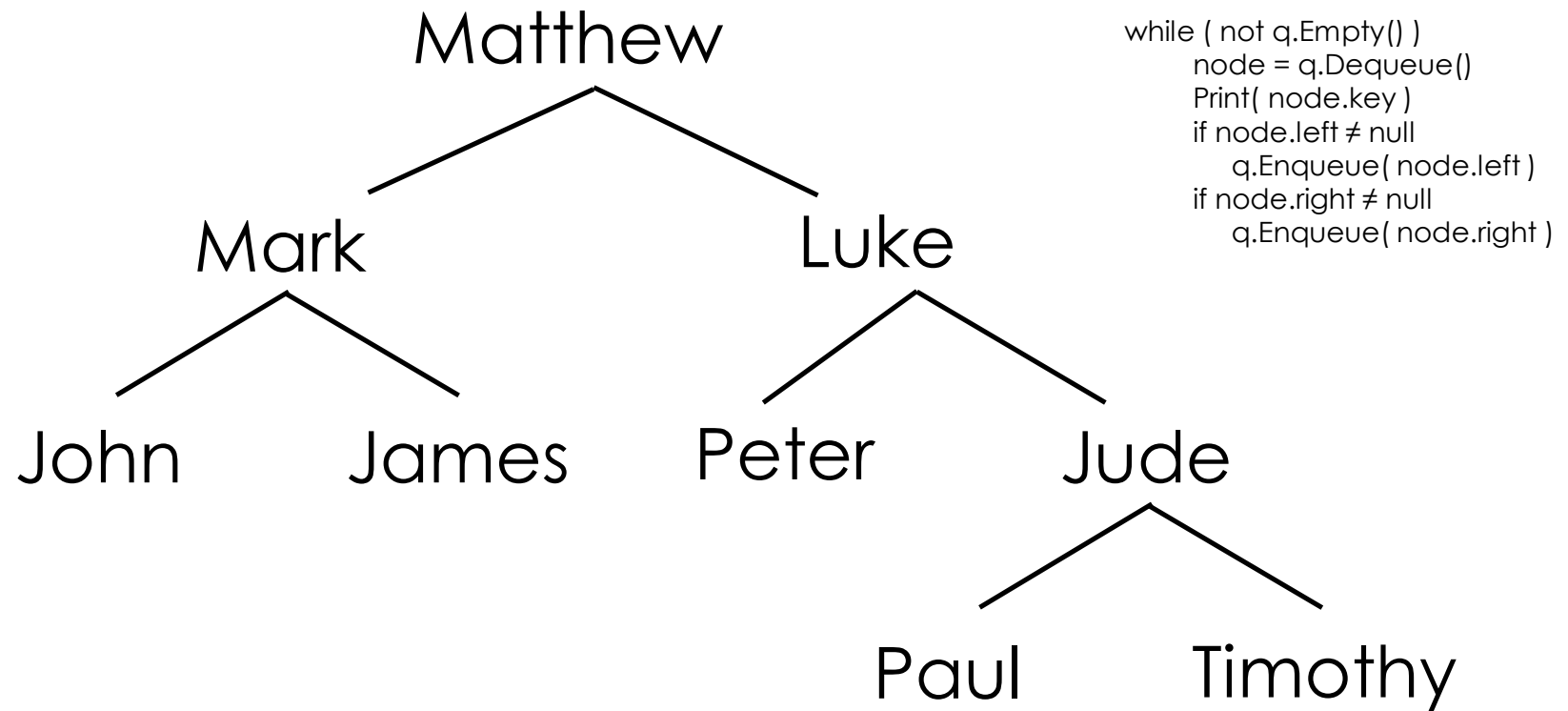
Output: Matthew, Mark, Luke, John, James, Peter, Jude, Paul, Timothy

Breadth-first Traversal implementation using Queue

LevelTraversal (Node node)

```
if node == null
    return
else
    Queue q
    q.Enqueue( node )
    while ( not q.Empty() )
        node = q.Dequeue()
        Print( node.key ) // Do something to the node
        if node.left ≠ null
            q.Enqueue( node.left )
        if node.right ≠ null
            q.Enqueue( node.right )
```


BFT using Q

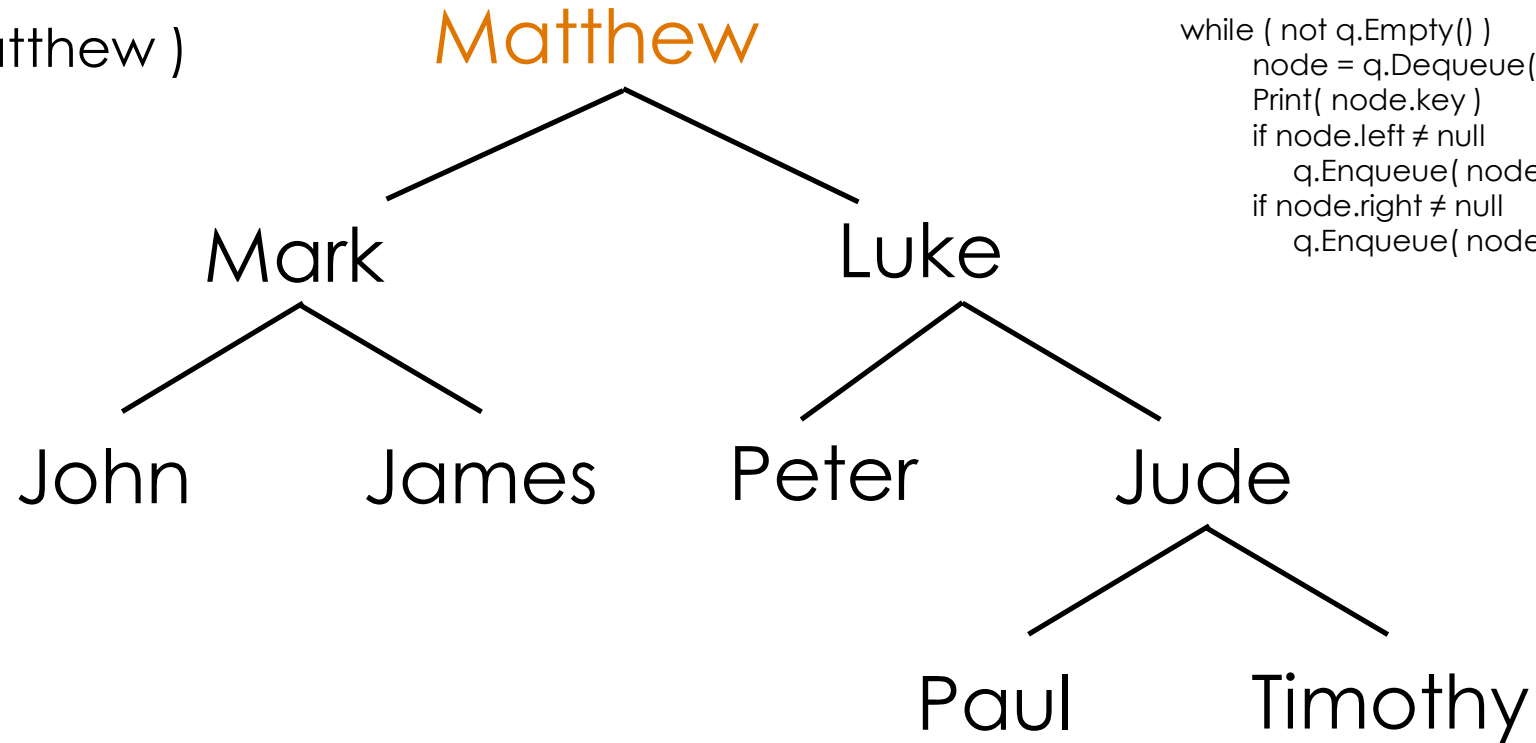


Output:

Queue:

BFT using Q

Enqueue(Matthew)



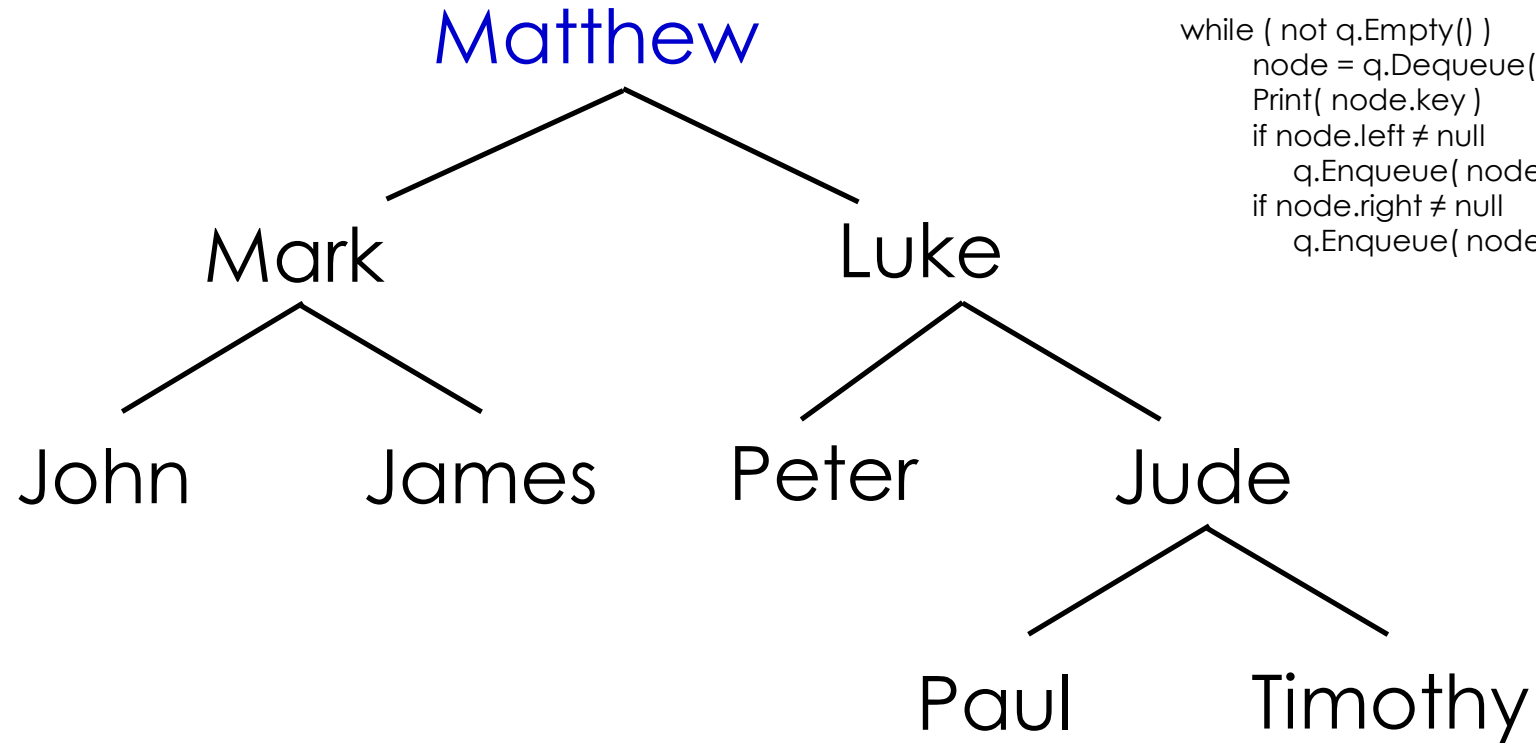
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output:

Queue: Matthew

BFT using Q

Dequeue ()



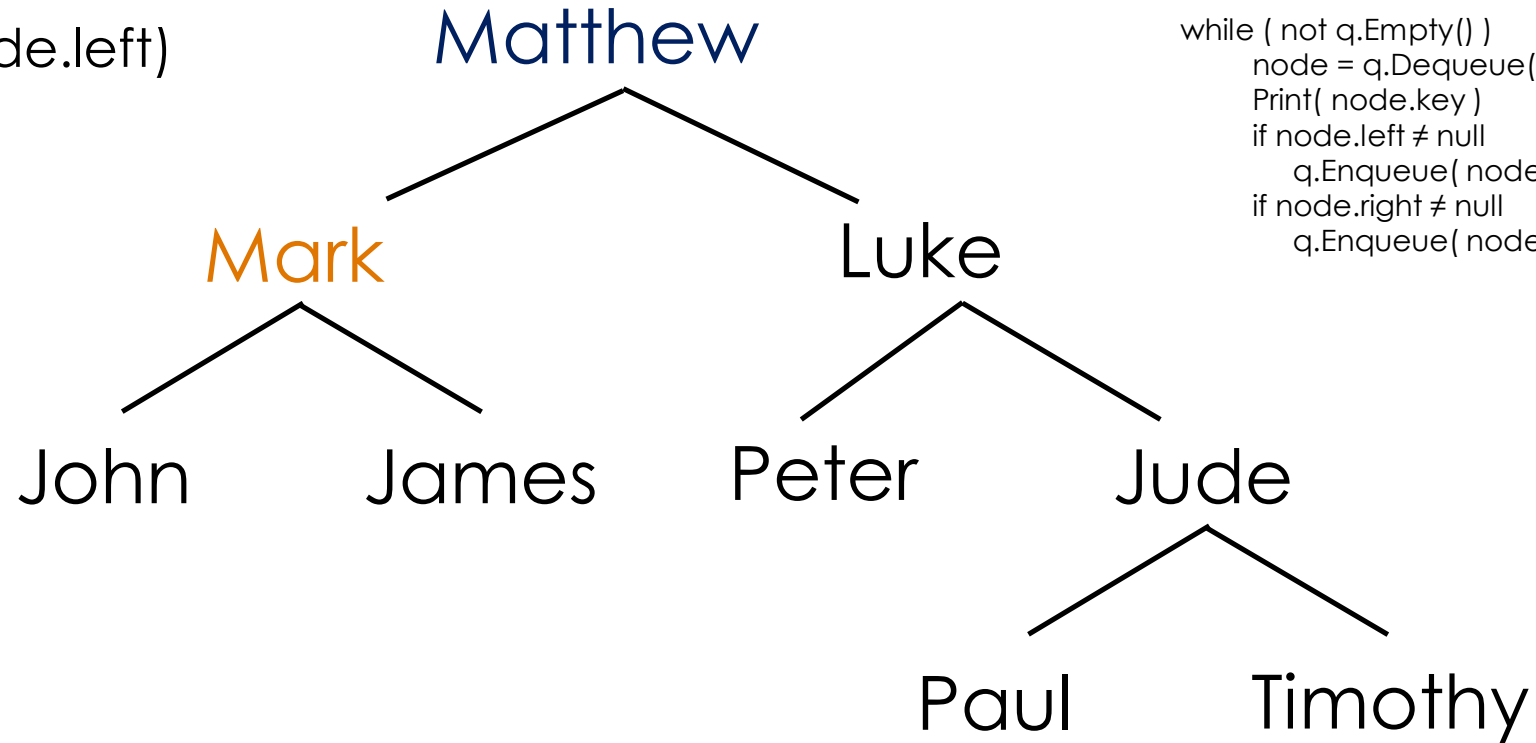
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew
 node

Queue:

BFT using Q

Enqueue (node.left)



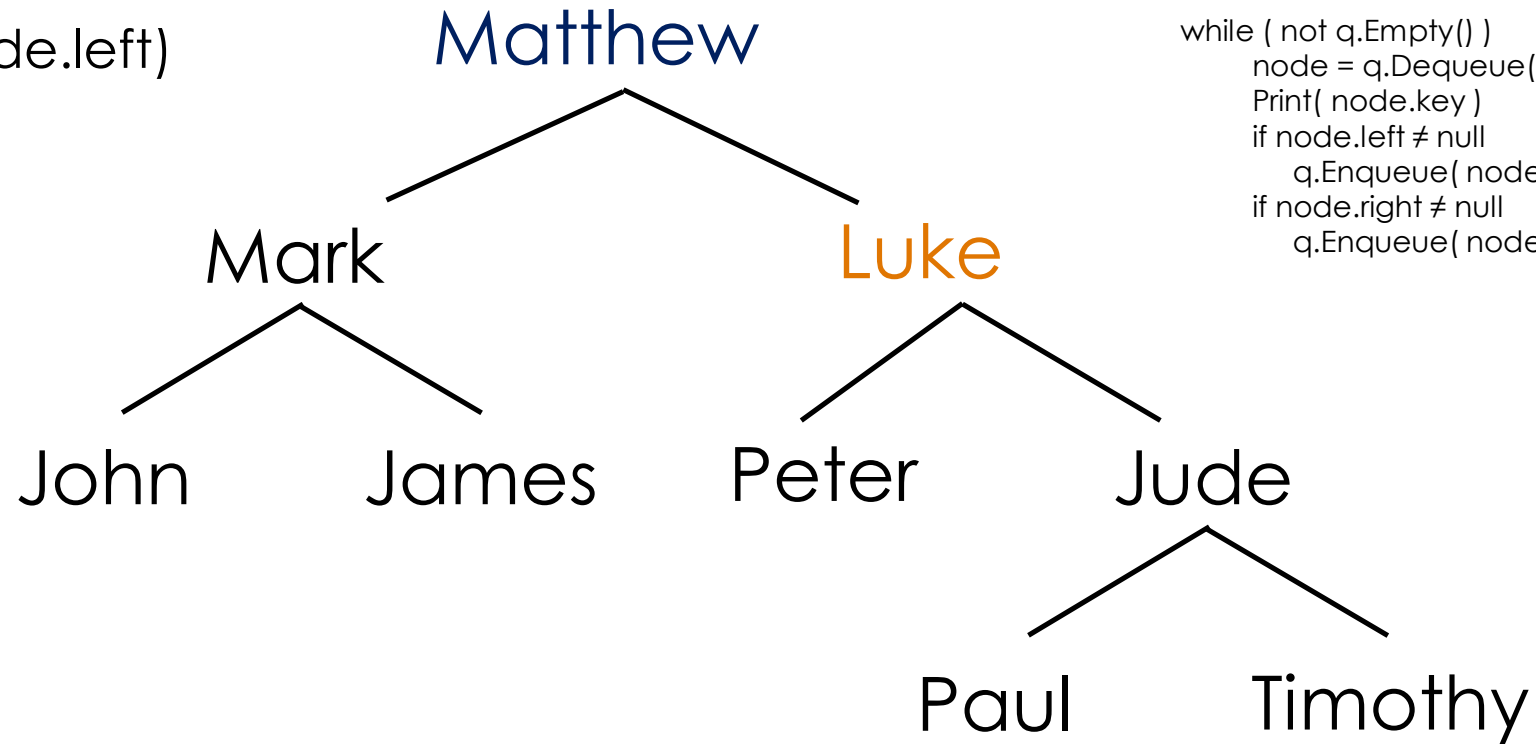
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew
node

Queue: Mark

BFT using Q

Enqueue (node.left)



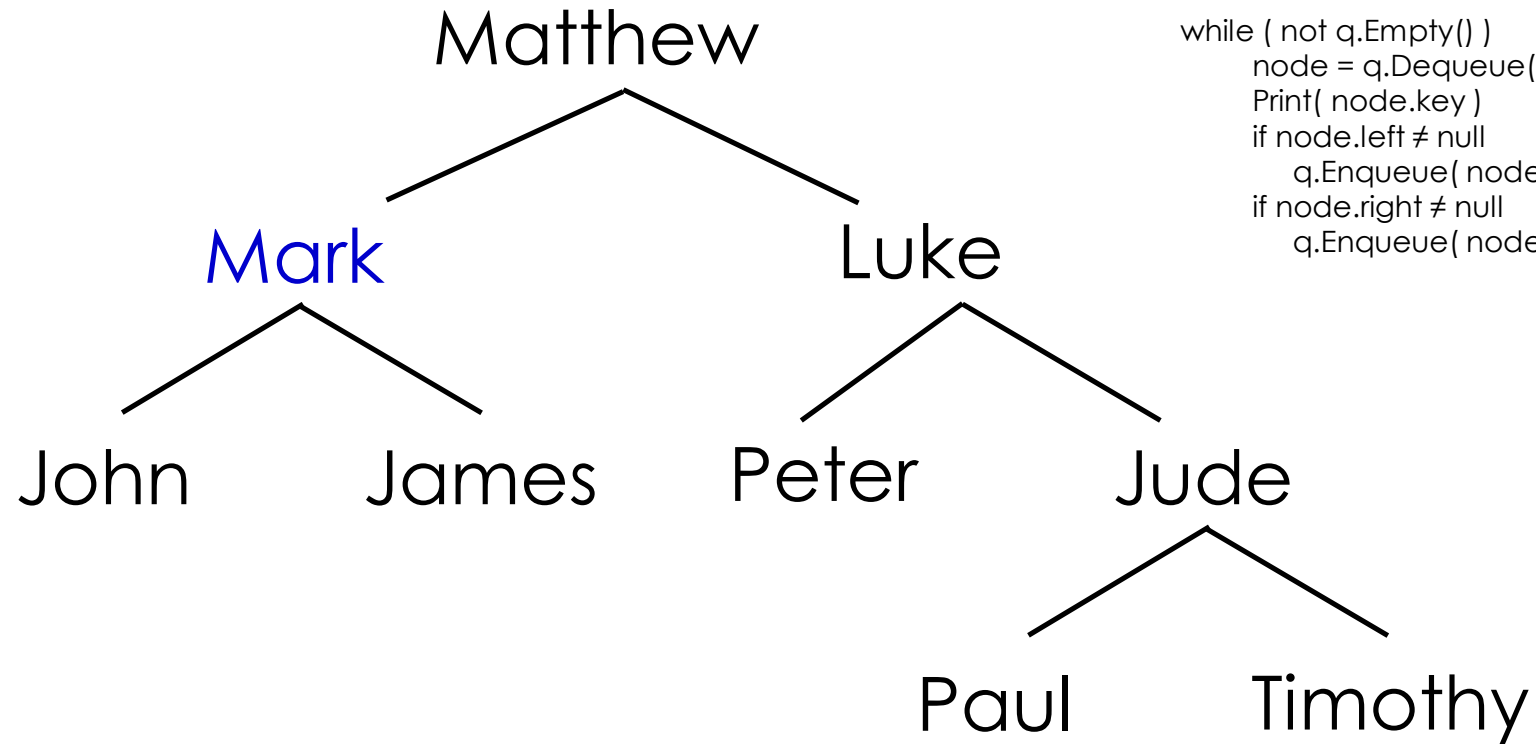
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew
node

Queue: Mark, Luke

BFT using Q

Dequeue ()



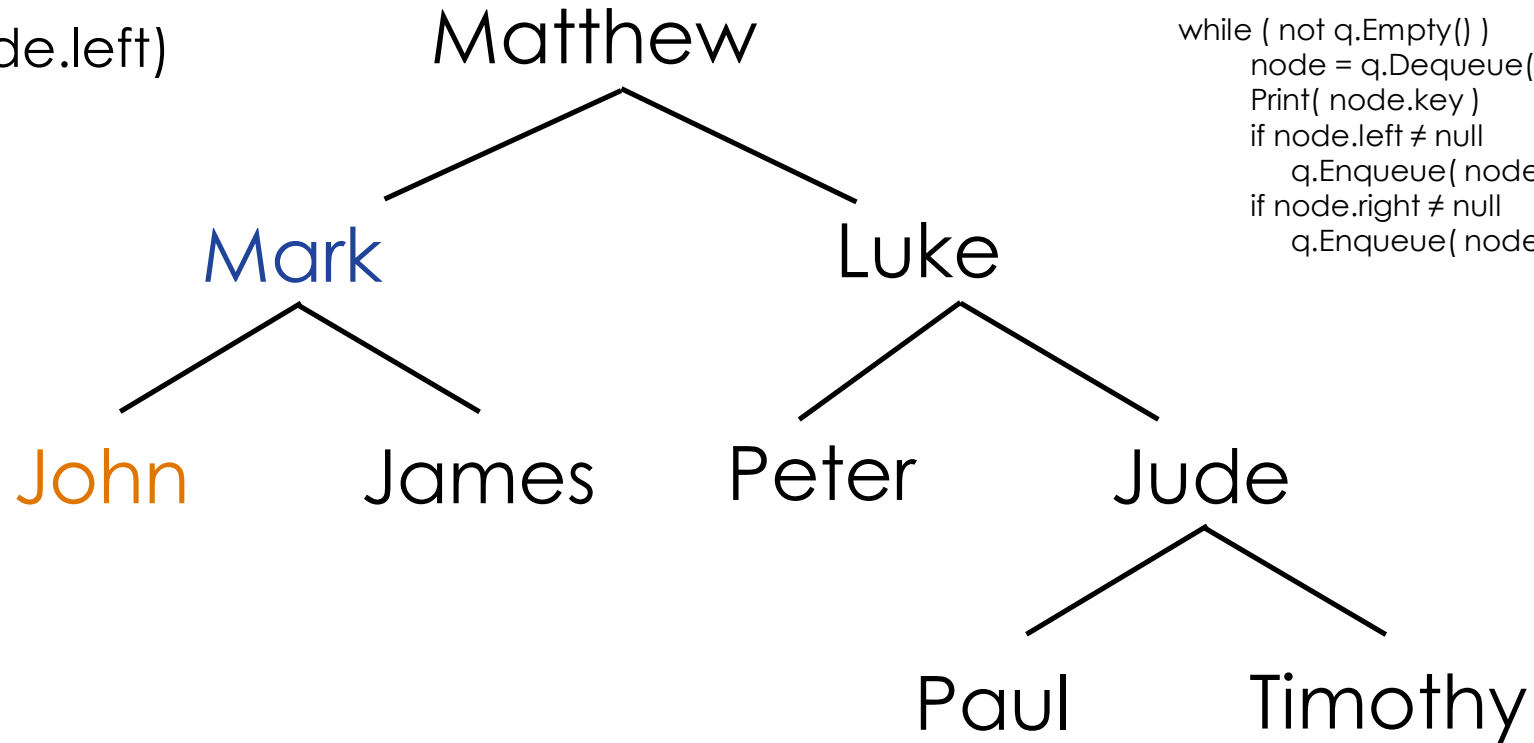
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark
node

Queue: Luke

BFT using Q

Enqueue (node.left)



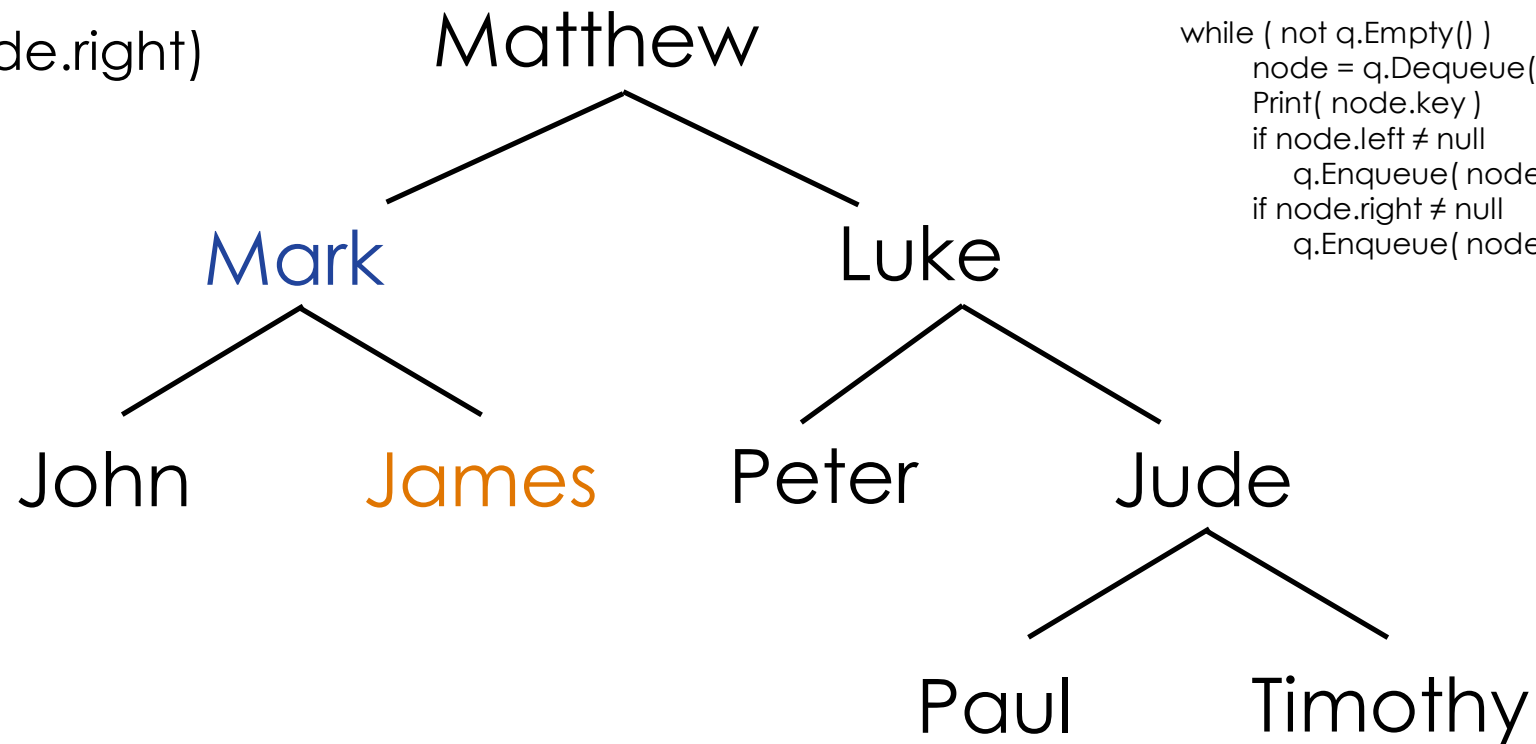
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark
node

Queue: Luke, John

BFT using Q

Enqueue (node.right)



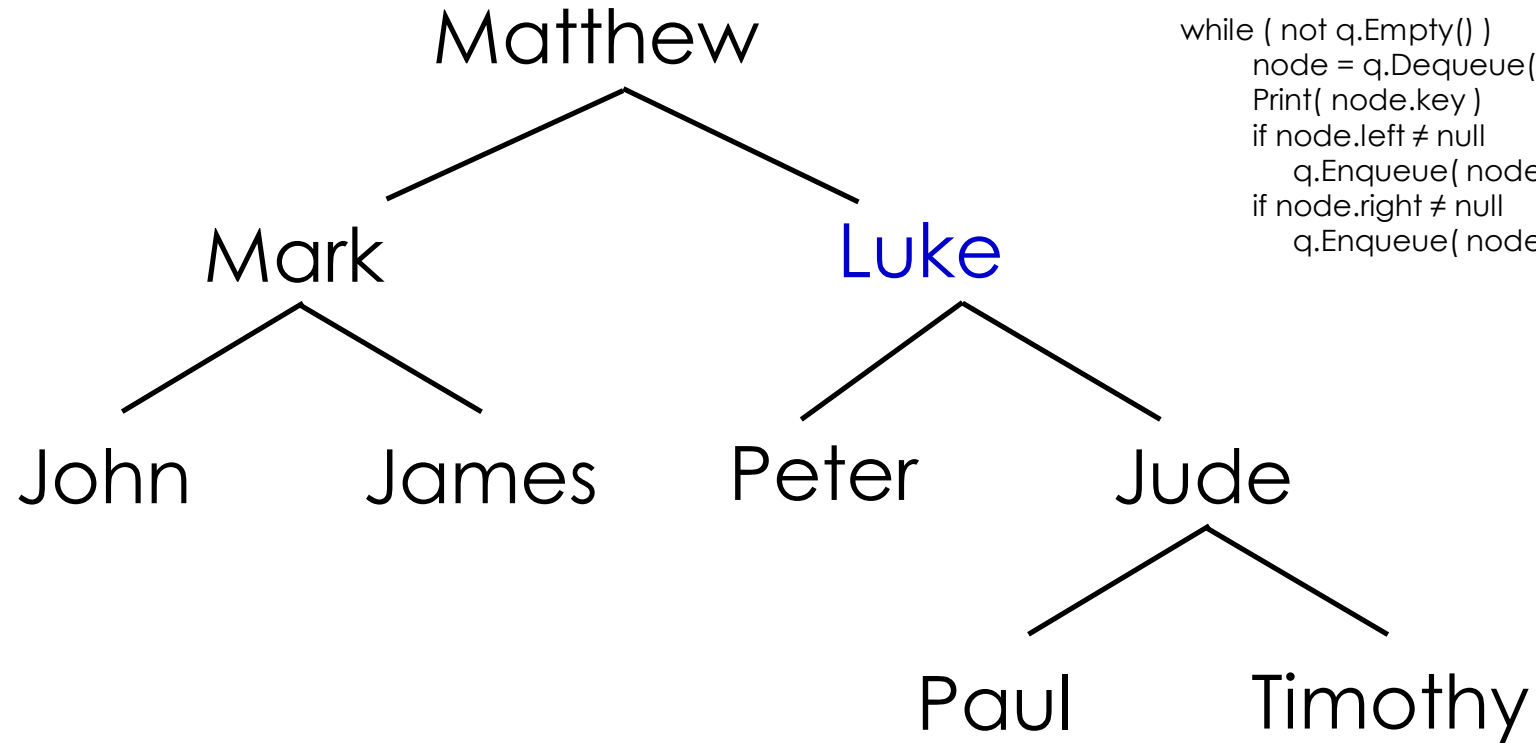
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark
node

Queue: Luke, John, James

BFT using Q

Dequeue ()



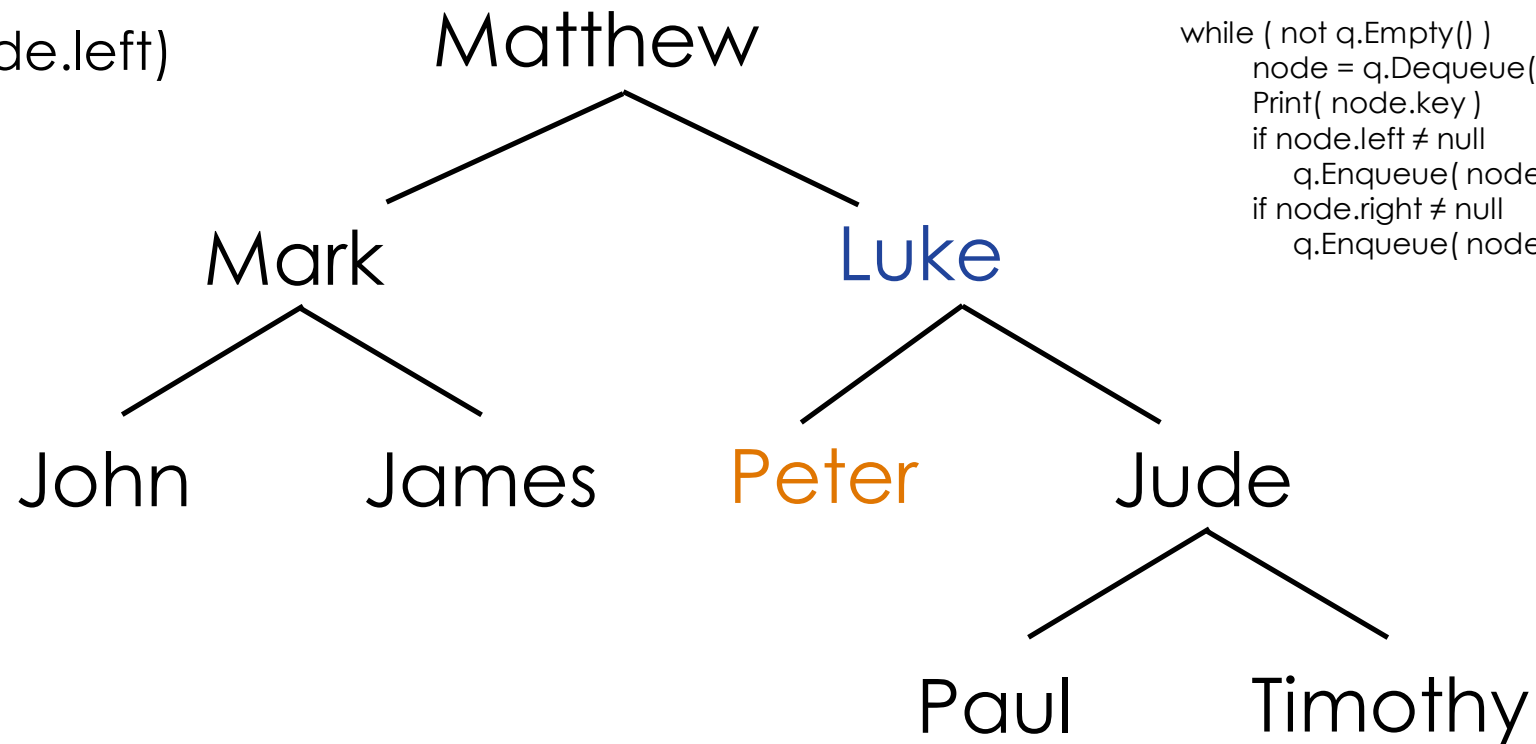
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke
node

Queue: John, James

BFT using Q

Enqueue (node.left)



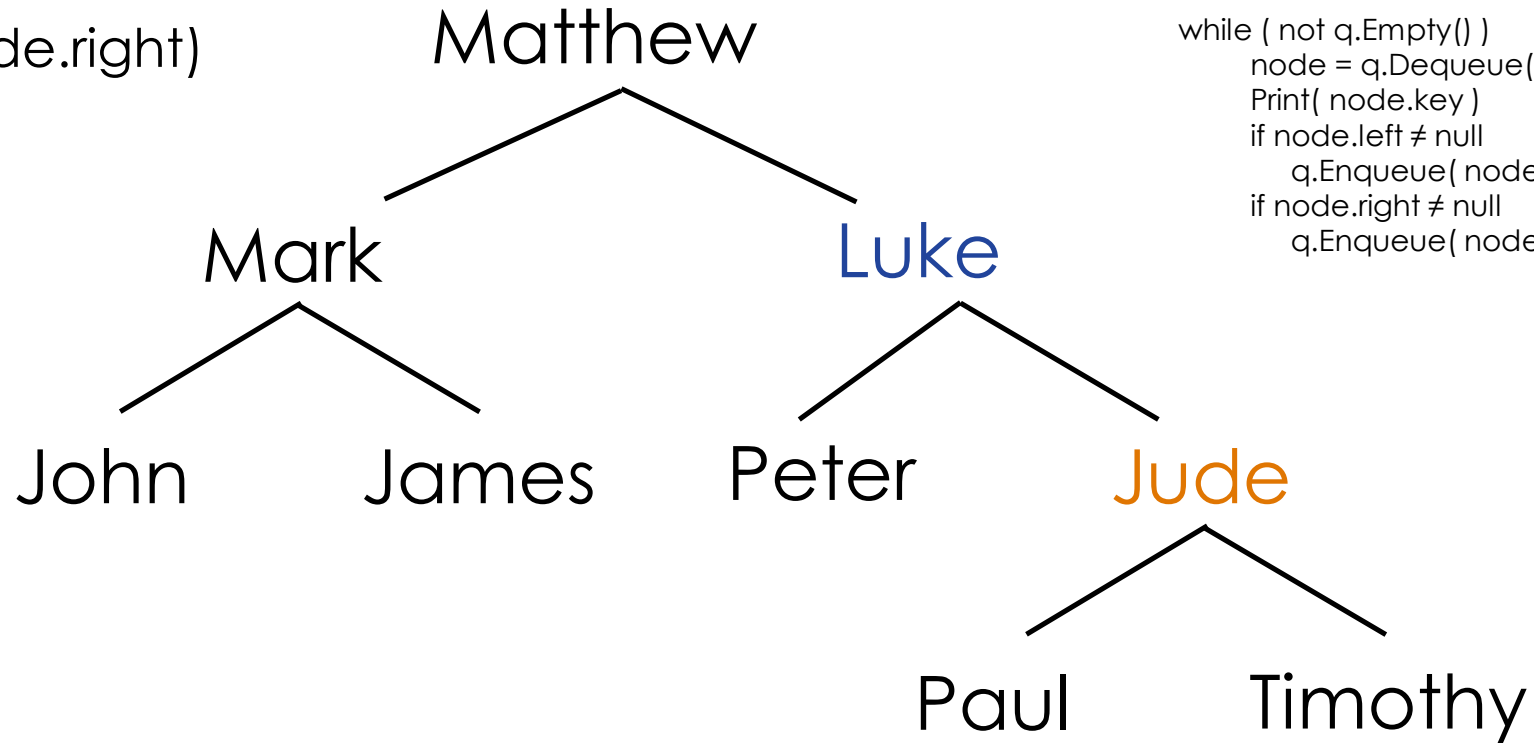
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke
node

Queue: John, James, Peter

BFT using Q

Enqueue (node.right)



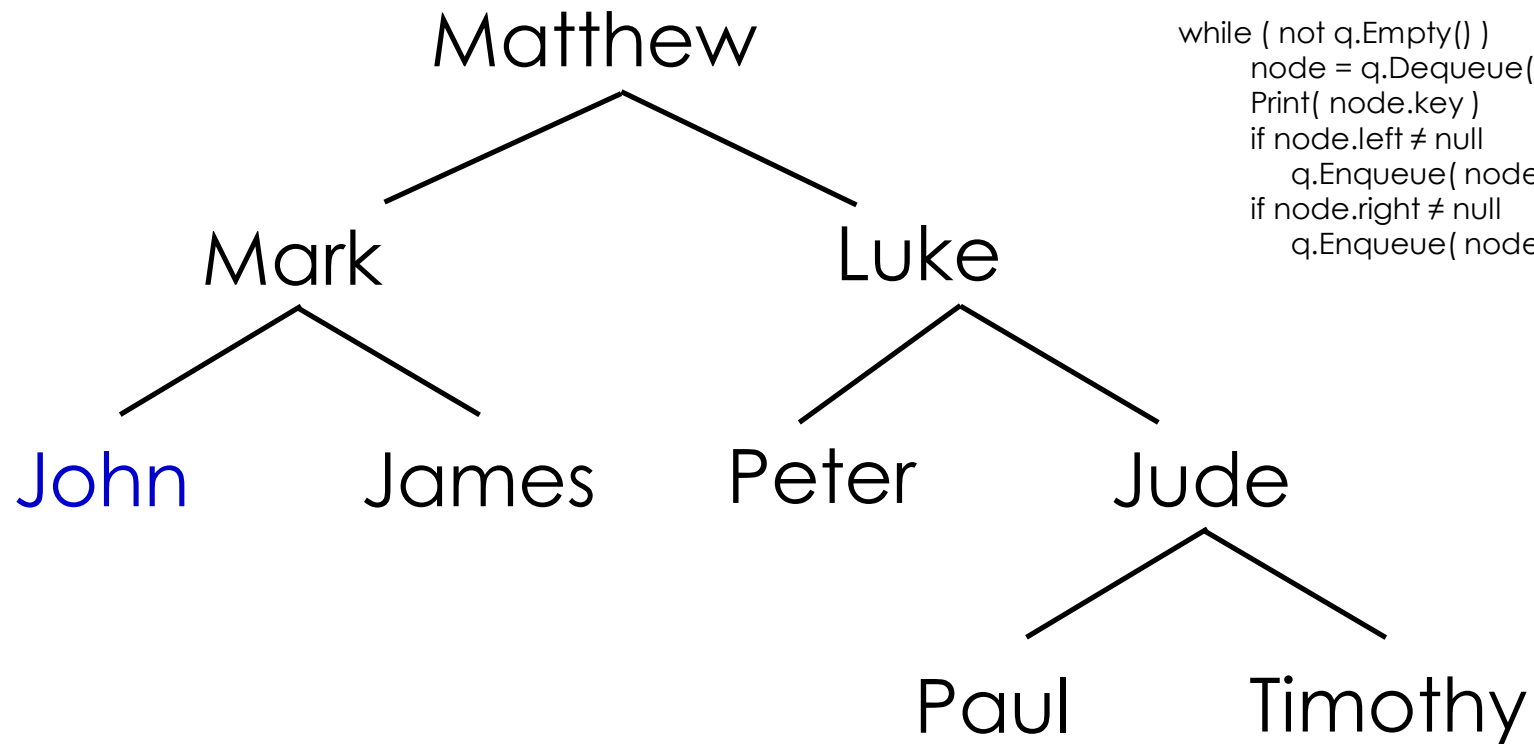
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke
node

Queue: John, James, Peter, Jude

BFT using Q

Dequeue ()



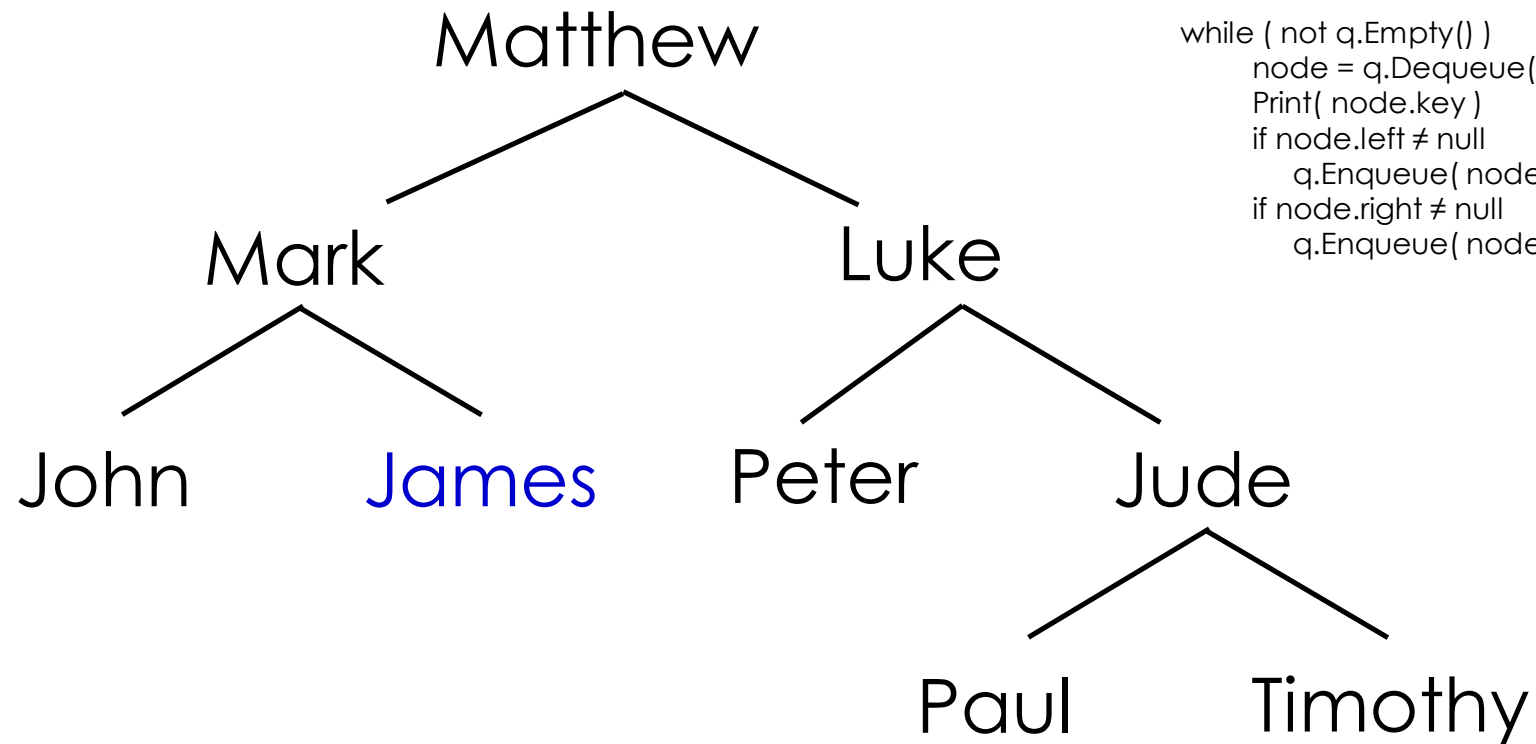
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John
node

Queue: James, Peter, Jude

BFT using Q

Dequeue ()



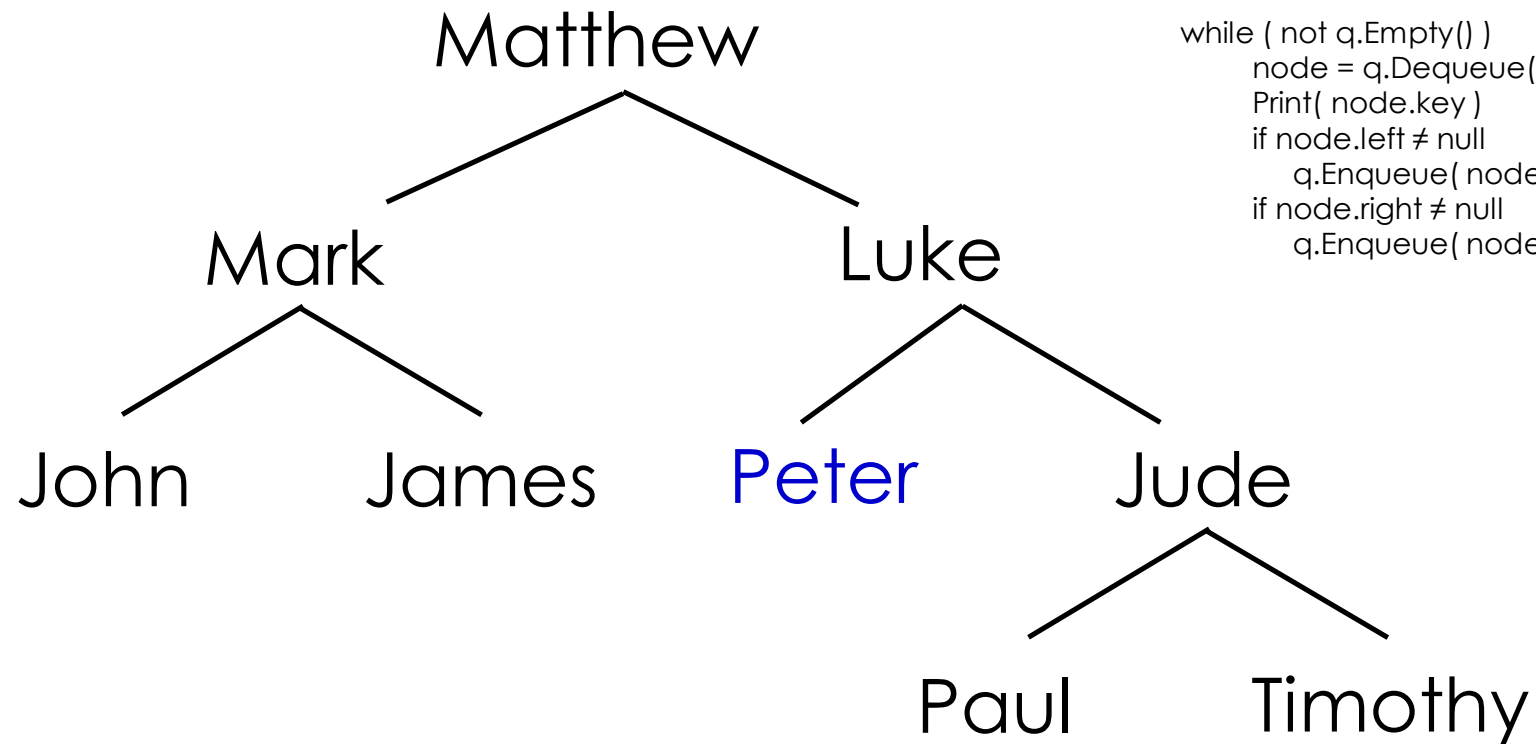
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left ≠ null  
        q.Enqueue( node.left )  
    if node.right ≠ null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John, James
node

Queue: Peter, Jude

BFT using Q

Dequeue ()



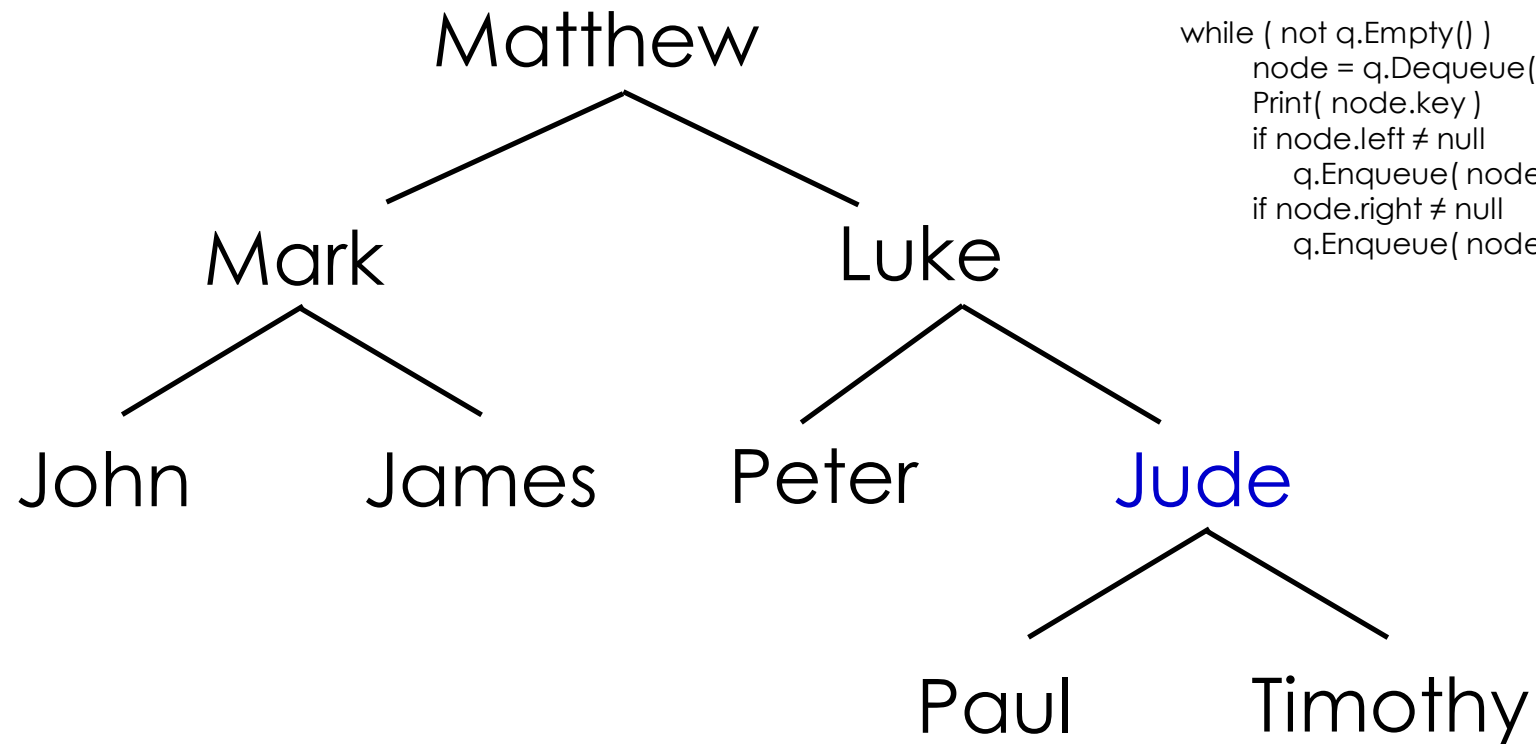
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John, James, Peter
node

Queue: Jude

BFT using Q

Dequeue ()



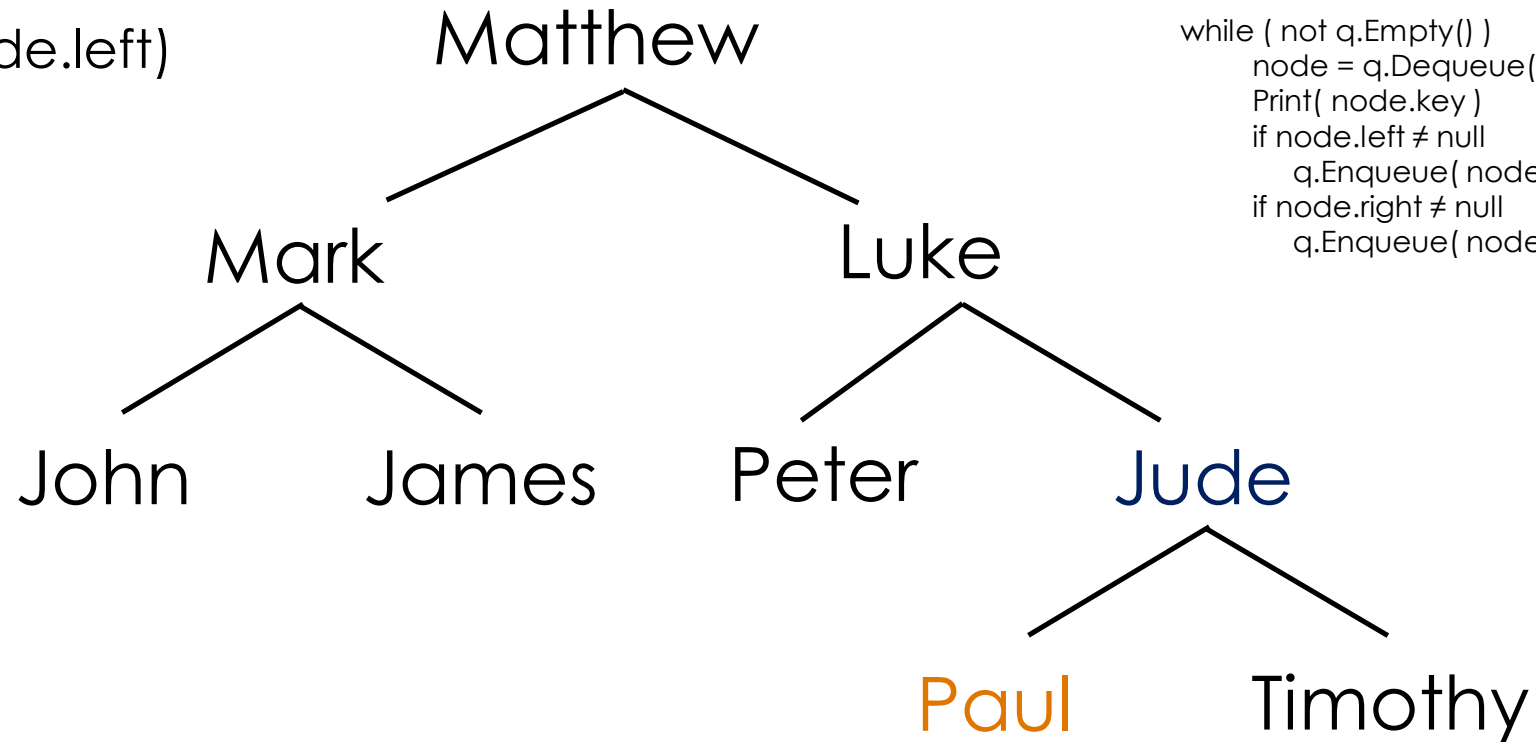
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John, James, Peter,
Jude
node

Queue:

BFT using Q

Enqueue (node.left)



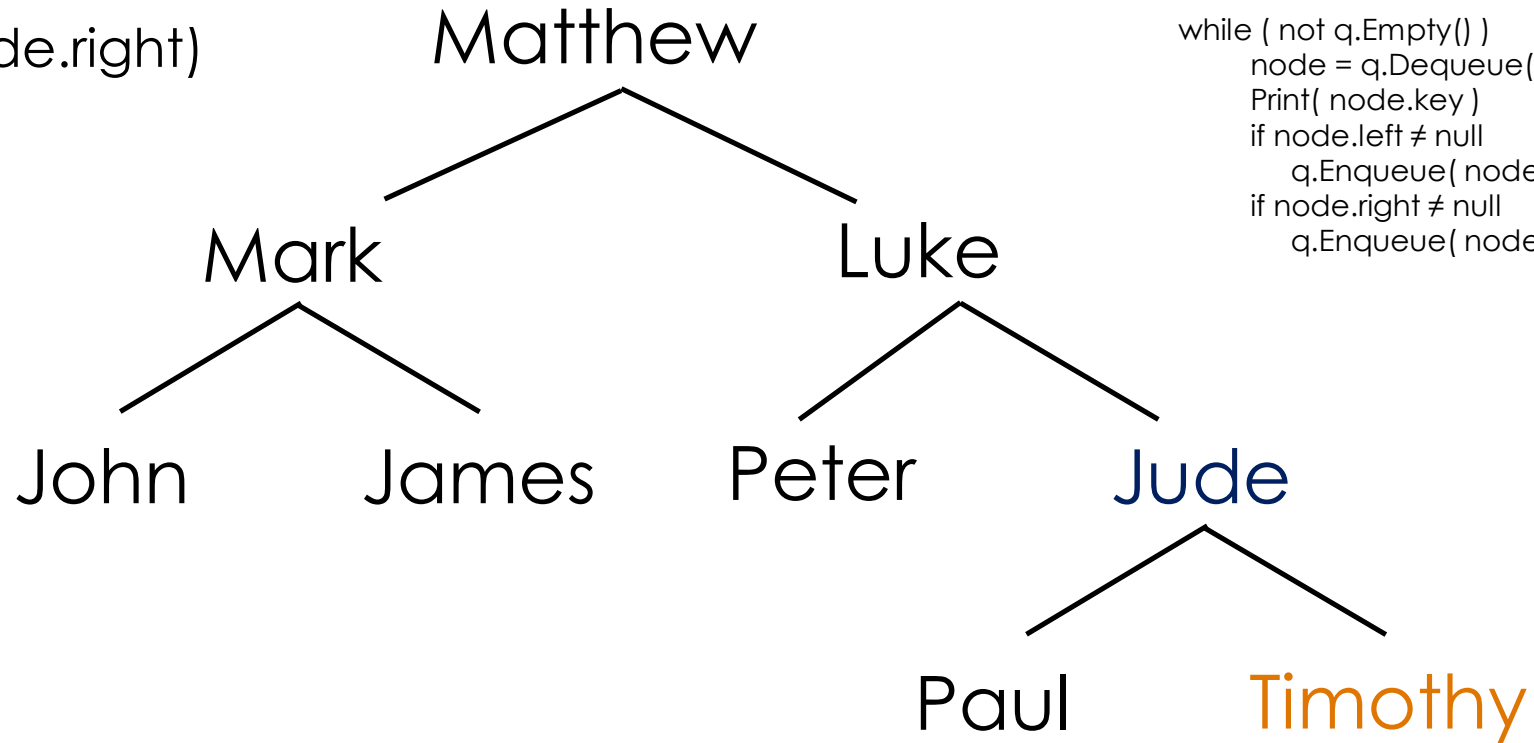
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John, James, Peter,
Jude
node

Queue: Paul

BFT using Q

Enqueue (node.right)



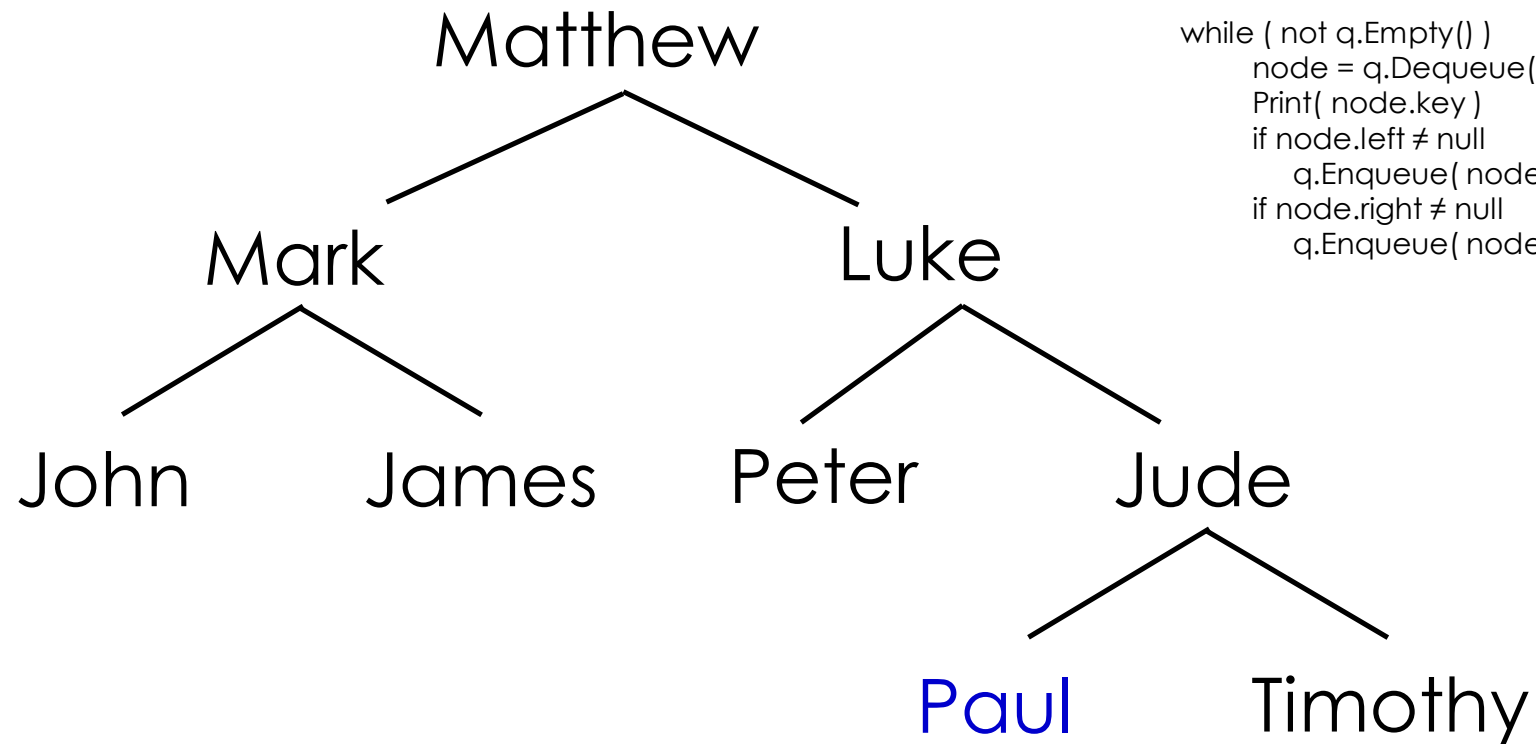
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John, James, Peter,
Jude
node

Queue: Paul, Timothy

BFT using Q

Dequeue ()



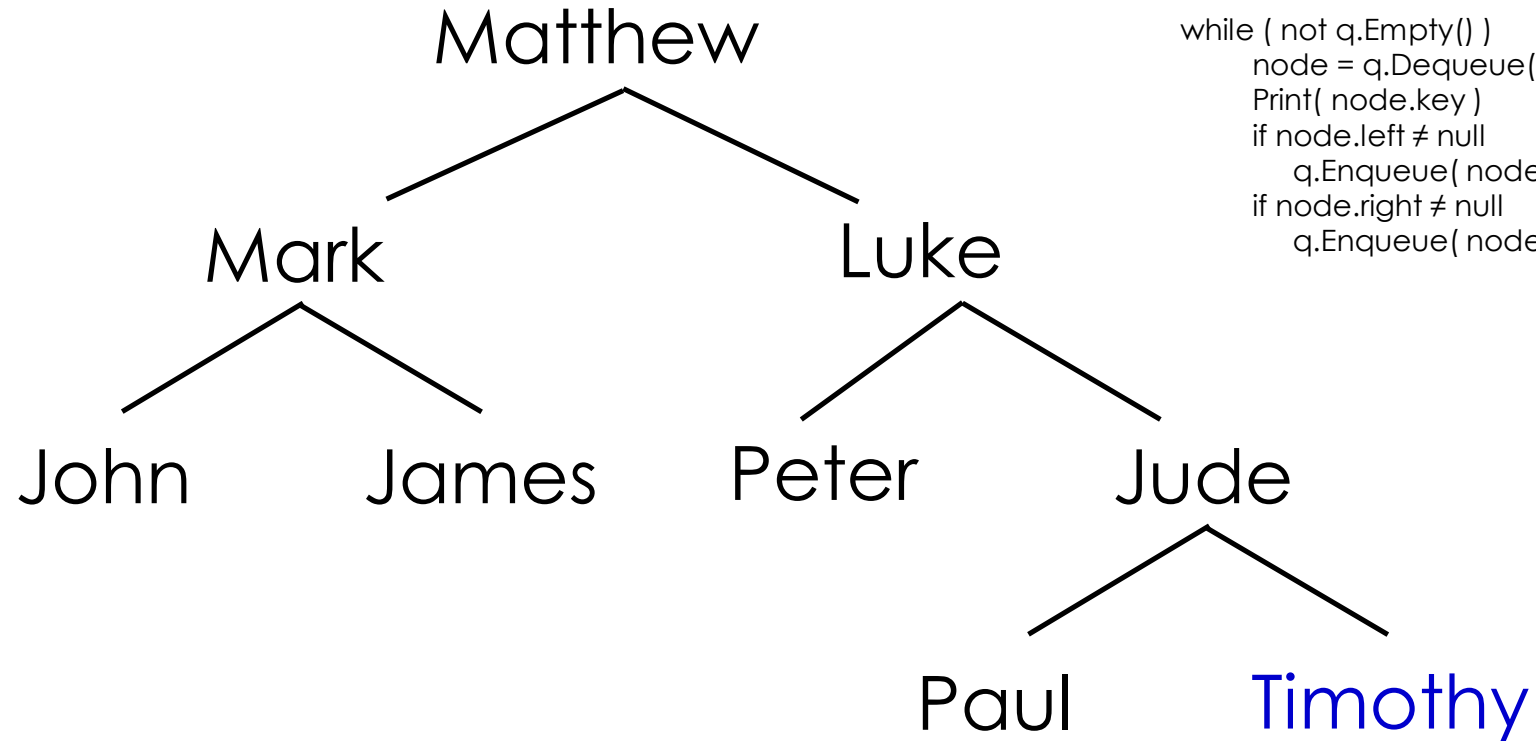
```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

Output: Matthew, Mark, Luke, John, James, Peter, Jude, Paul

Queue: Timothy

BFT using Q

Dequeue ()



```
while ( not q.Empty() )  
    node = q.Dequeue()  
    Print( node.key )  
    if node.left != null  
        q.Enqueue( node.left )  
    if node.right != null  
        q.Enqueue( node.right )
```

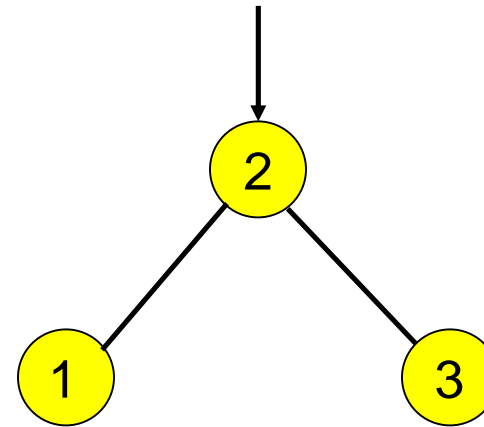
Output: Matthew, Mark, Luke, John, James, Peter,
Jude, Paul, Timothy

Queue:

node

Depth-first Traversal Implementation using Recursion

- We completely traverse one sub-tree before exploring a sibling sub-tree
- We can implement DFT using
 - Stack
 - Recursion
- Three modes of traversal
 - PreOrder, InOrder, PostOrder



PreOrder: 2, 1, 3

InOrder: 1, 2, 3

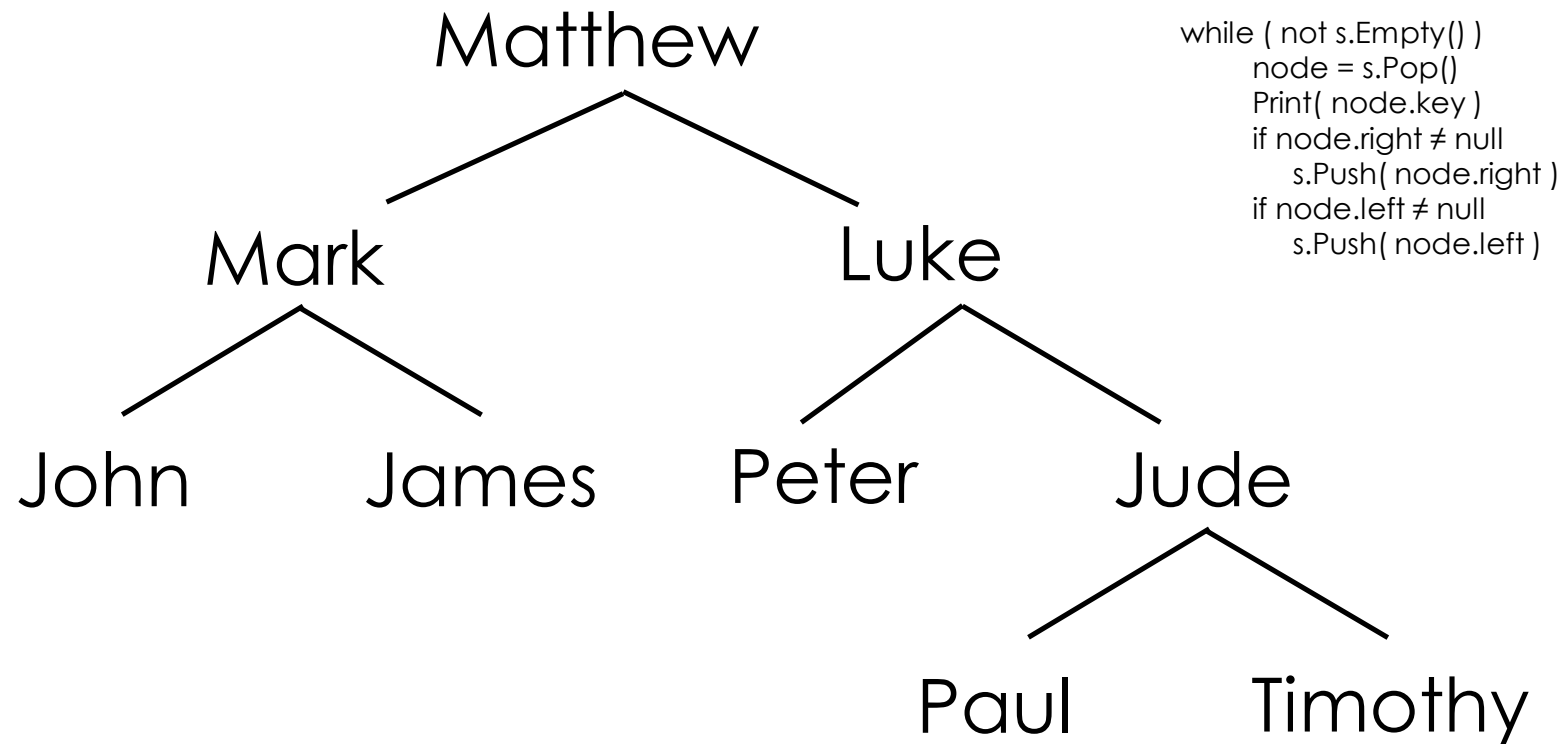
PostOrder: 1, 3, 2

Non-recursive Implementation of Depth-first Traversal

nonRecursiveDFT (Node node)

```
if node == null
    return
else
    Stack s
    s.push( node )
    while ( not s.Empty() )
        node = s.Pop()
        Print( node.key ) // Do something to the node
        if node.right ≠ null
            s.push( node.right )
        if node.left ≠ null
            s.push( node.left )
```

DFT using Stack

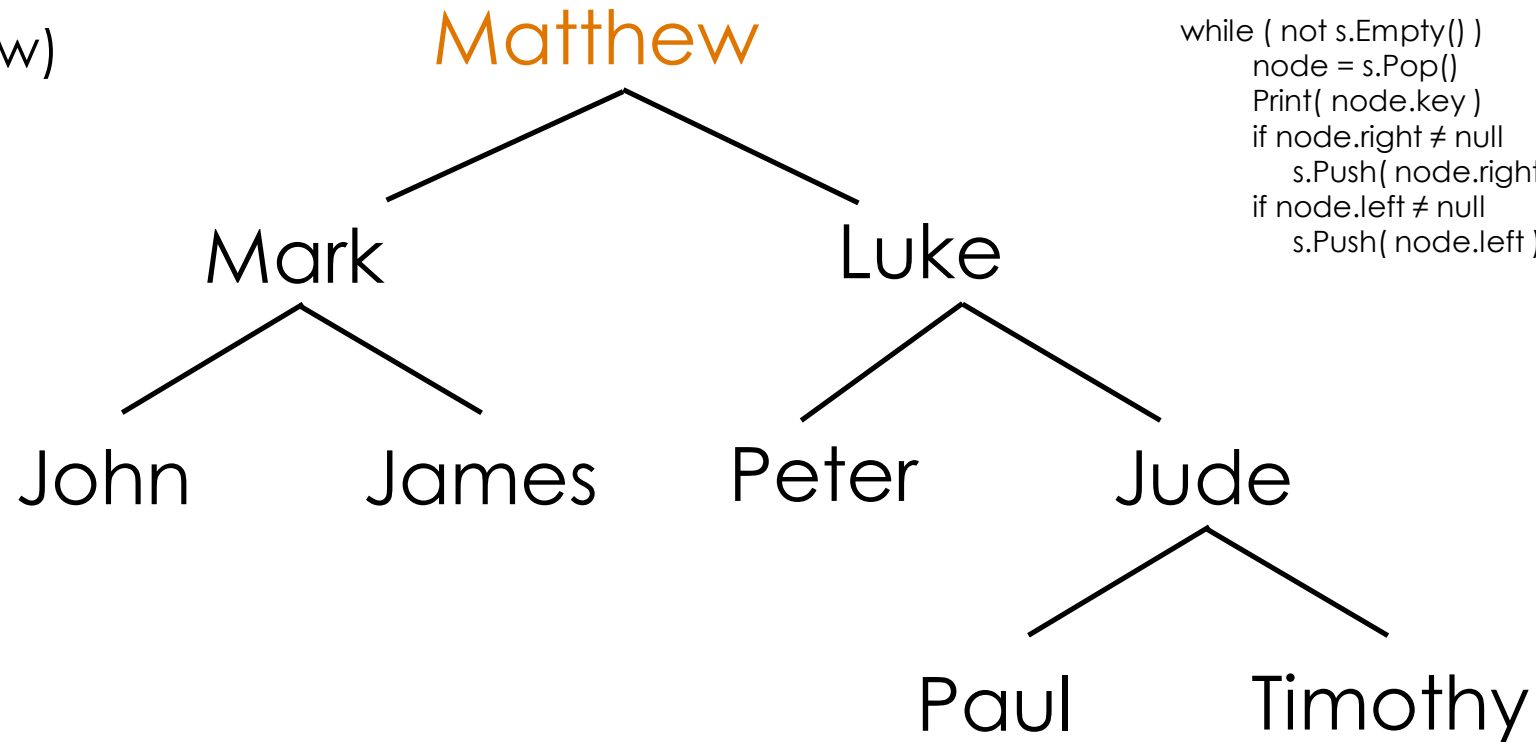


Output:

Stack:

DFT using Stack

Push (Matthew)



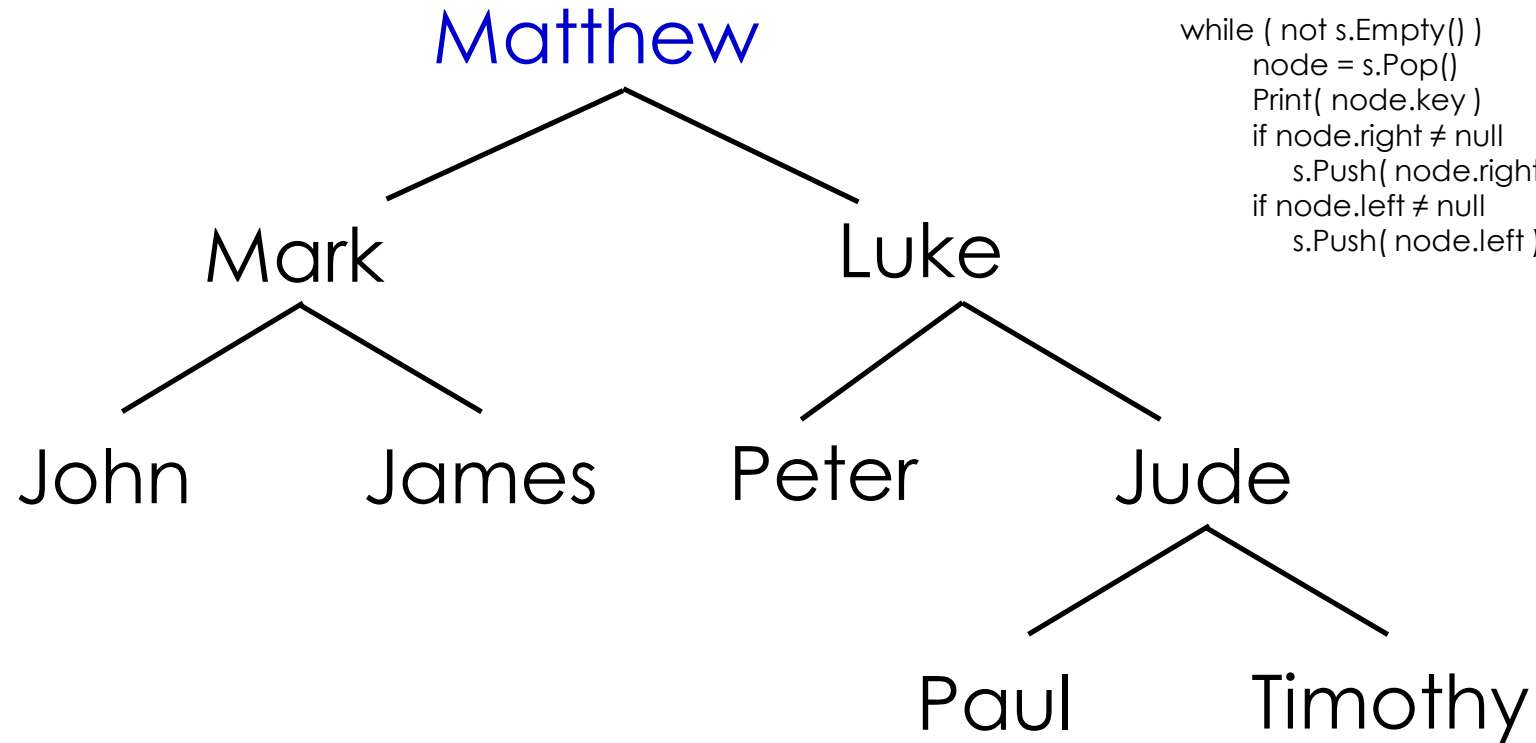
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output:

Stack: Matthew

DFT using Stack

Pop ()



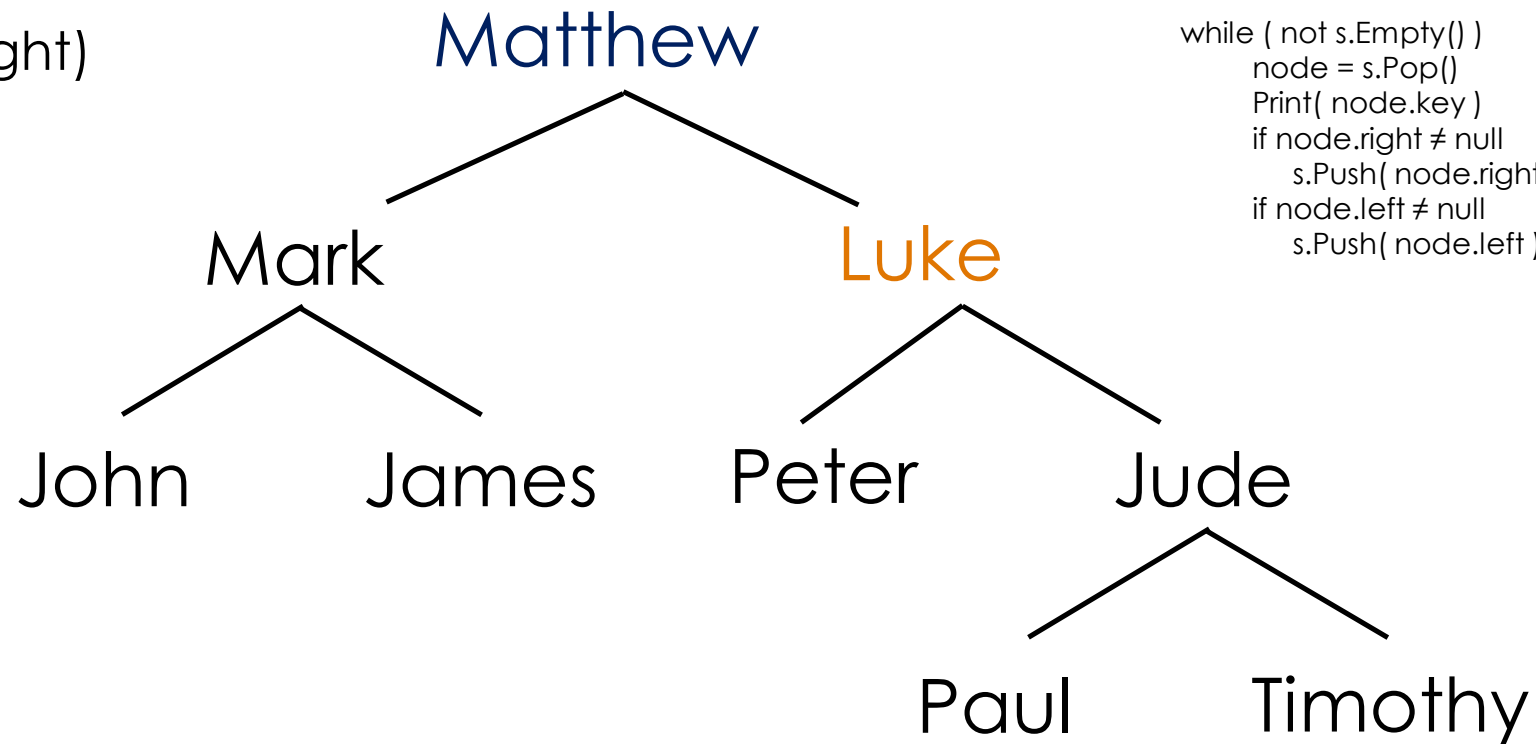
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew
 node

Stack:

DFT using Stack

Push (node.right)



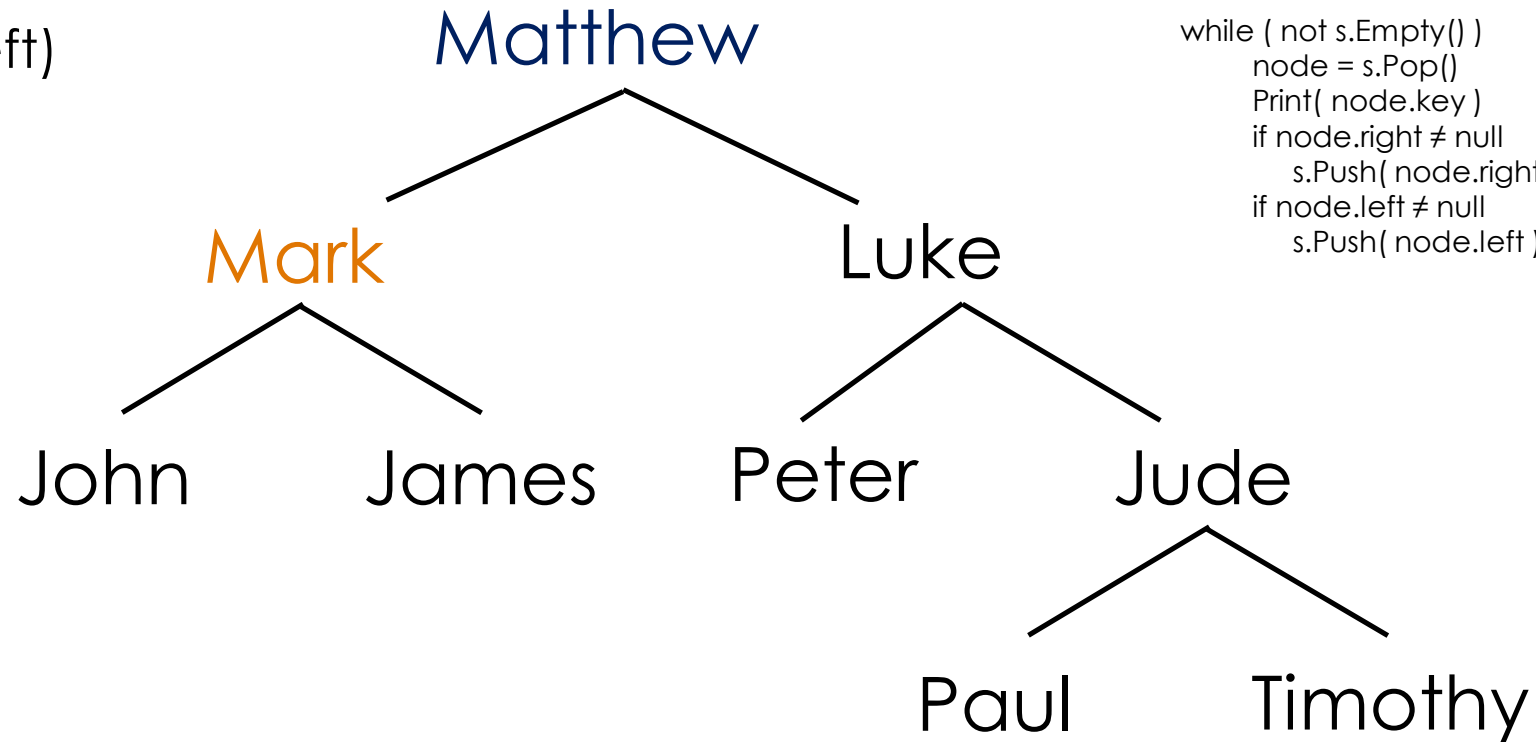
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew
 ^{node}

Stack: Luke

DFT using Stack

Push (node.left)



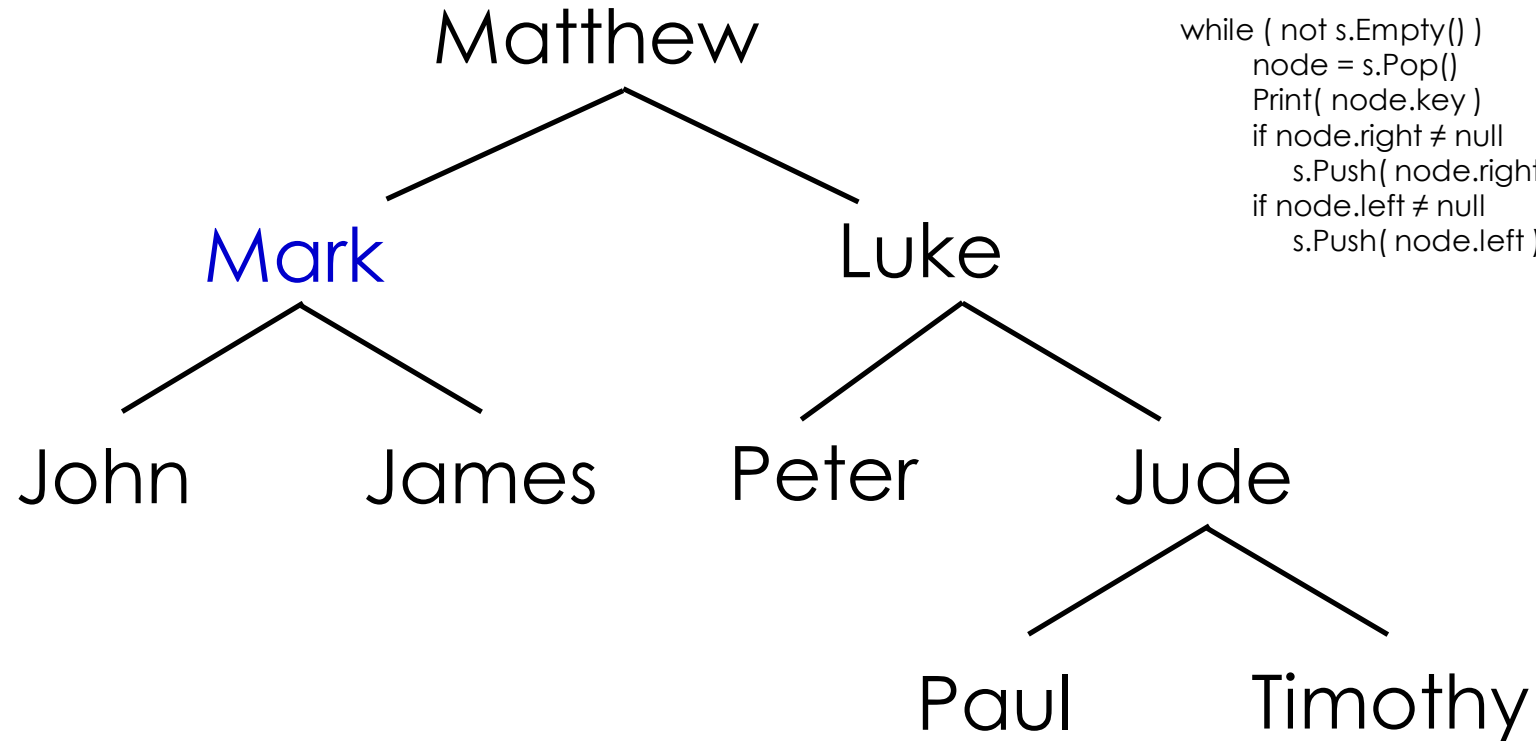
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew
 node

Stack: Luke, Mark

DFT using Stack

Pop ()

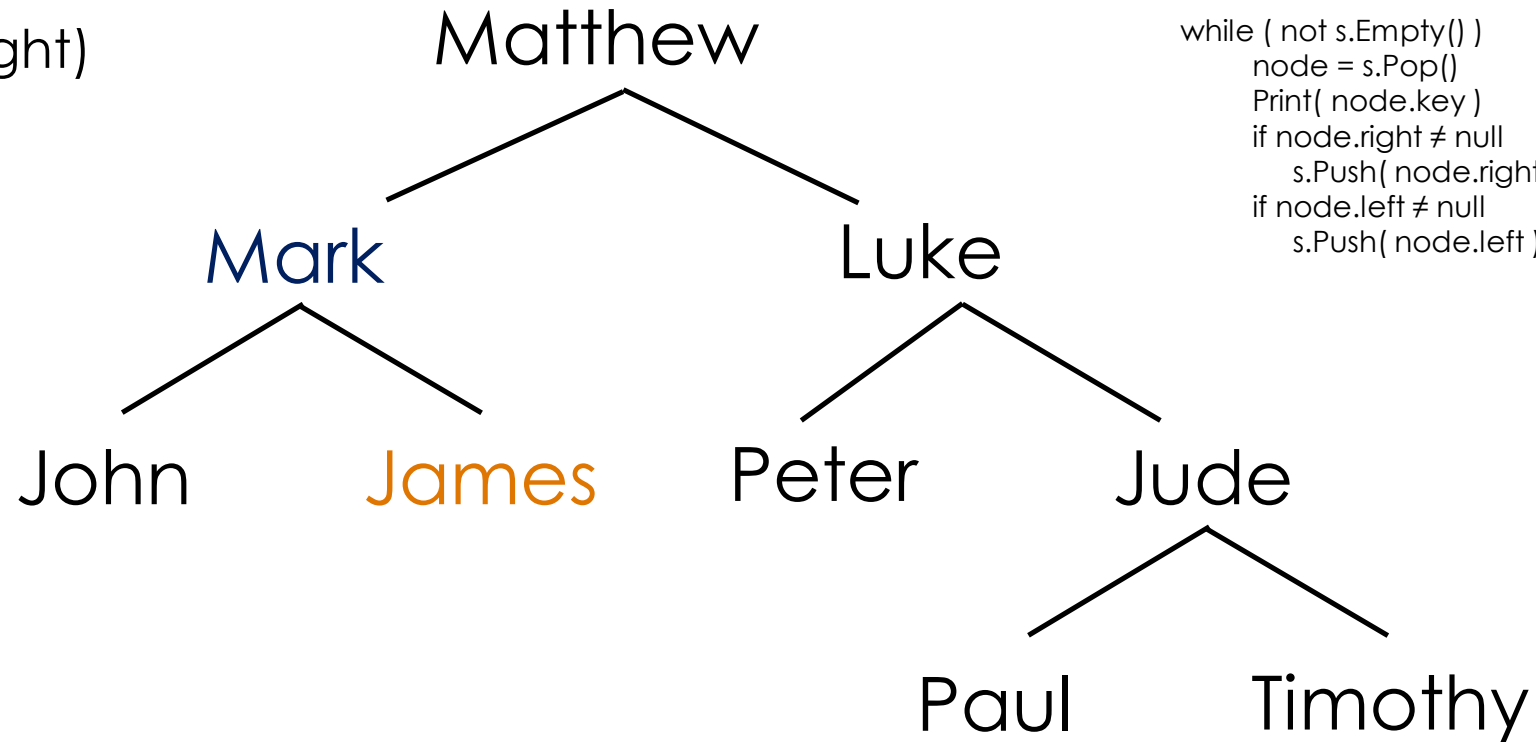


Output: Matthew, Mark
node

Stack: Luke

DFT using Stack

Push (node.right)

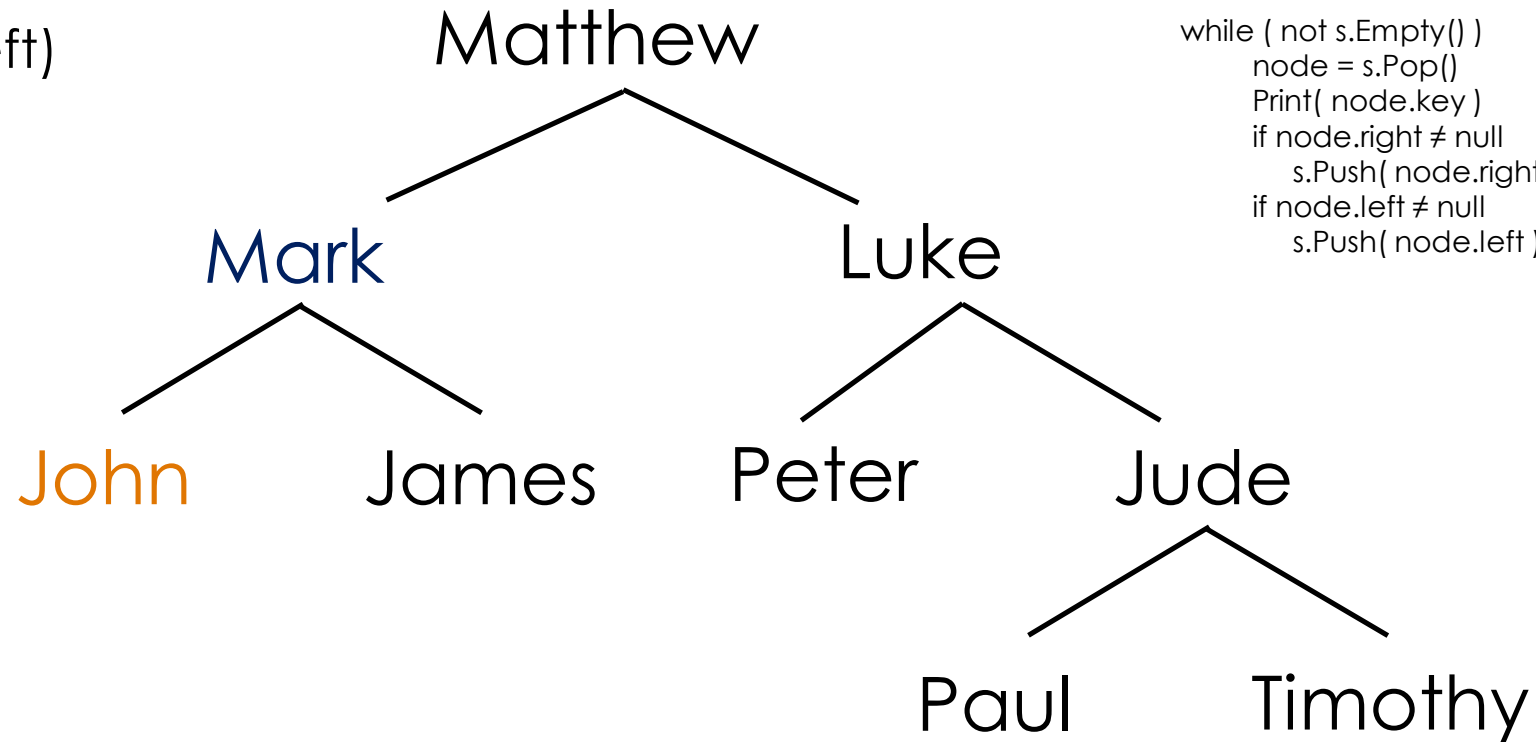


Output: Matthew, Mark
node

Stack: Luke, James

DFT using Stack

Push (node.left)

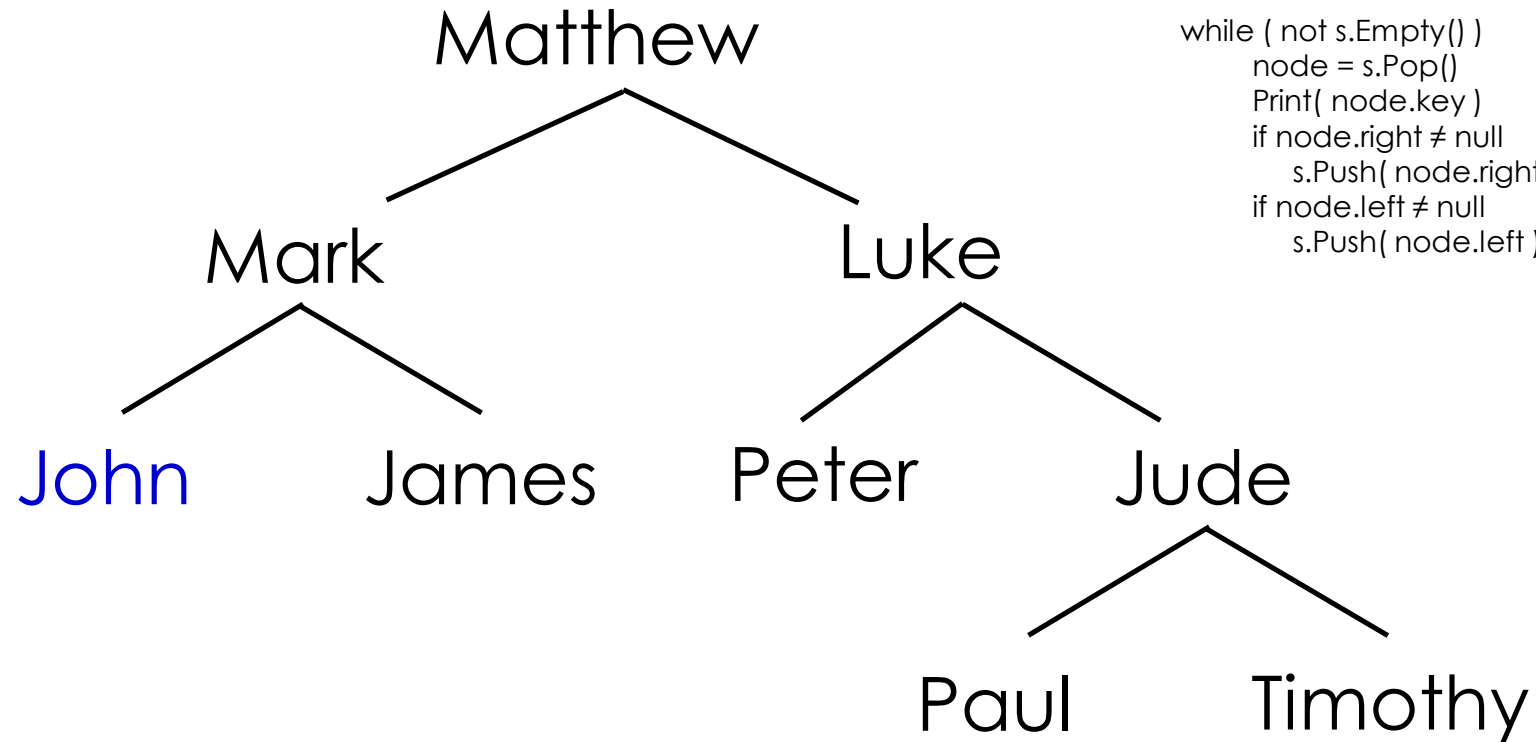


Output: Matthew, Mark
node

Stack: Luke, James, John

DFT using Stack

Pop ()

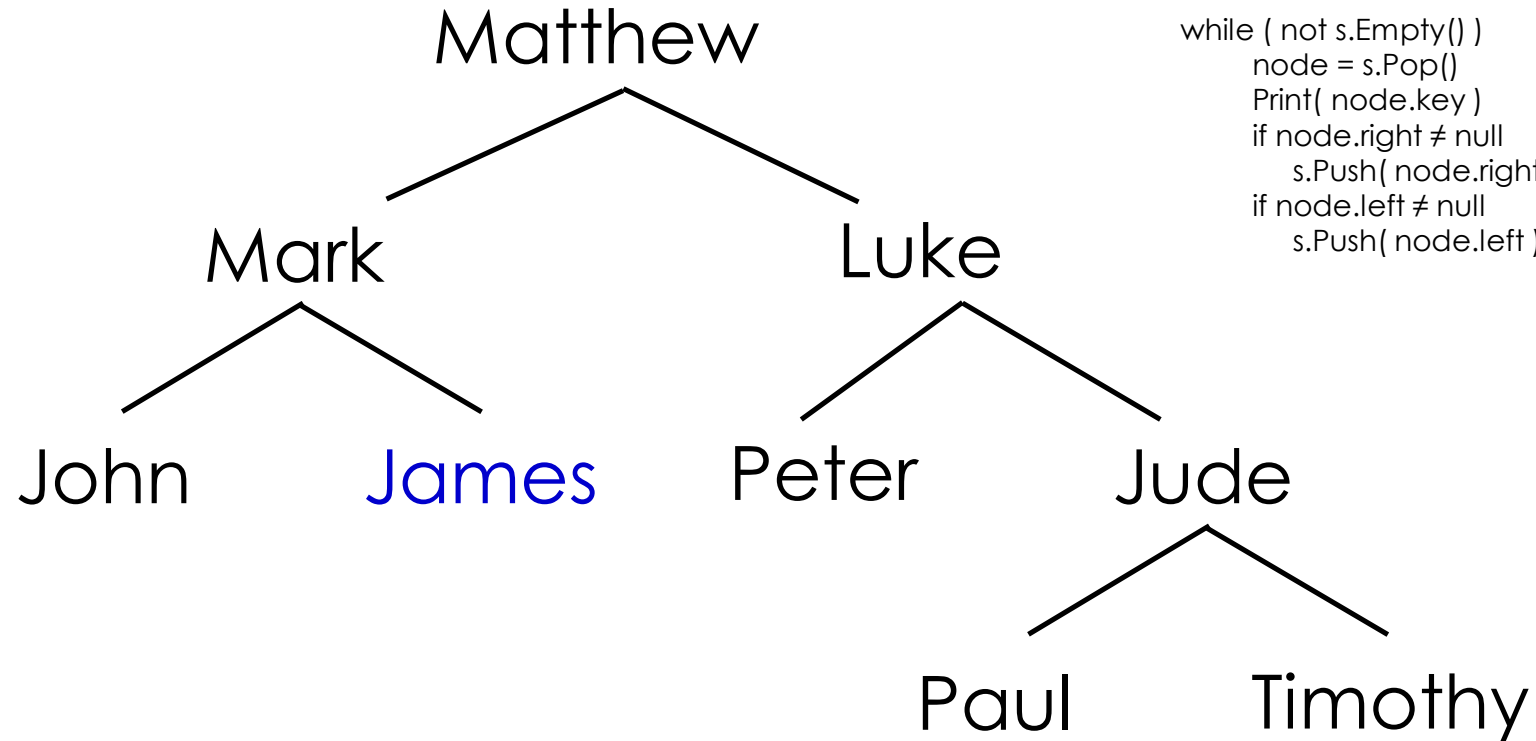


Output: Matthew, Mark, John
node

Stack: Luke, James

DFT using Stack

Pop ()



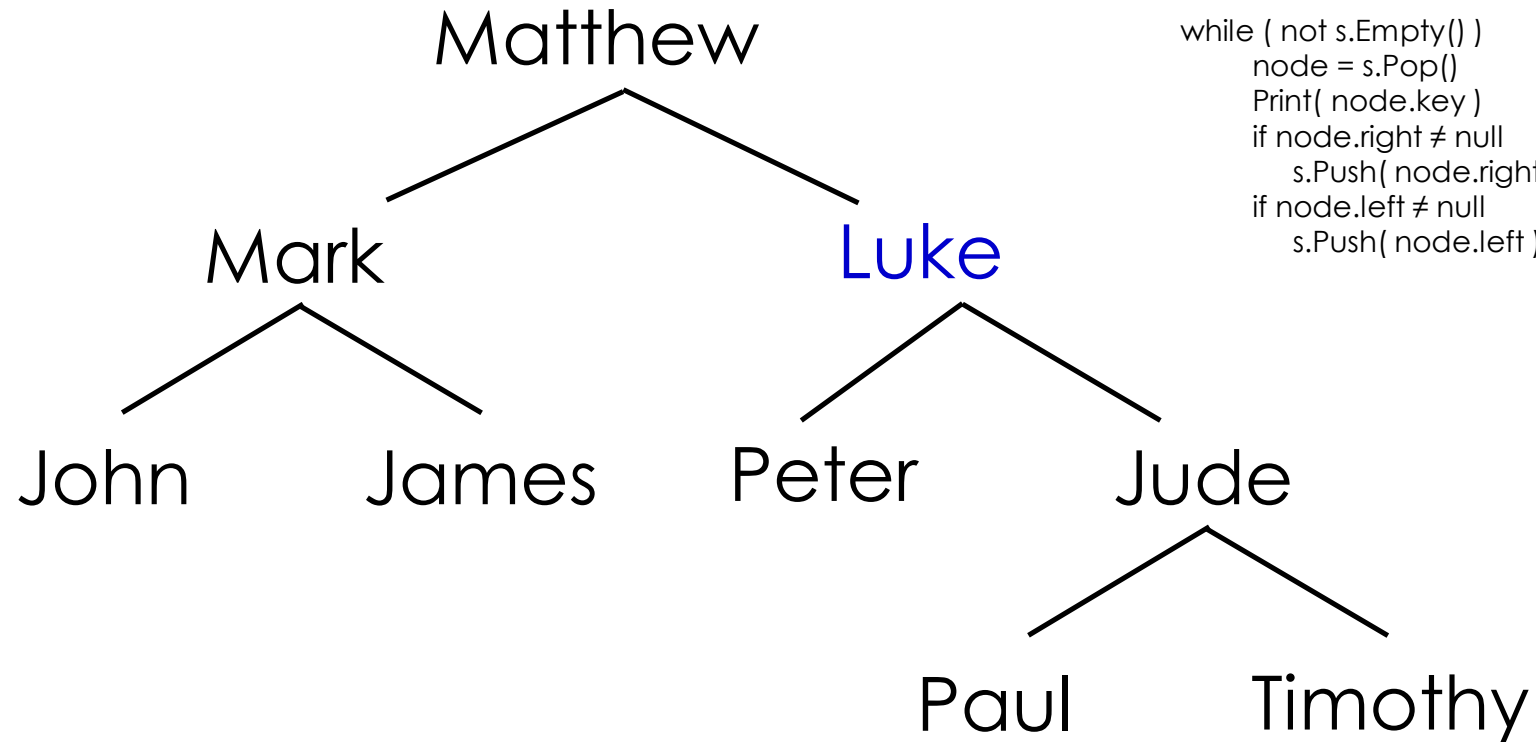
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew, Mark, John, James
node

Stack: Luke

DFT using Stack

Pop ()

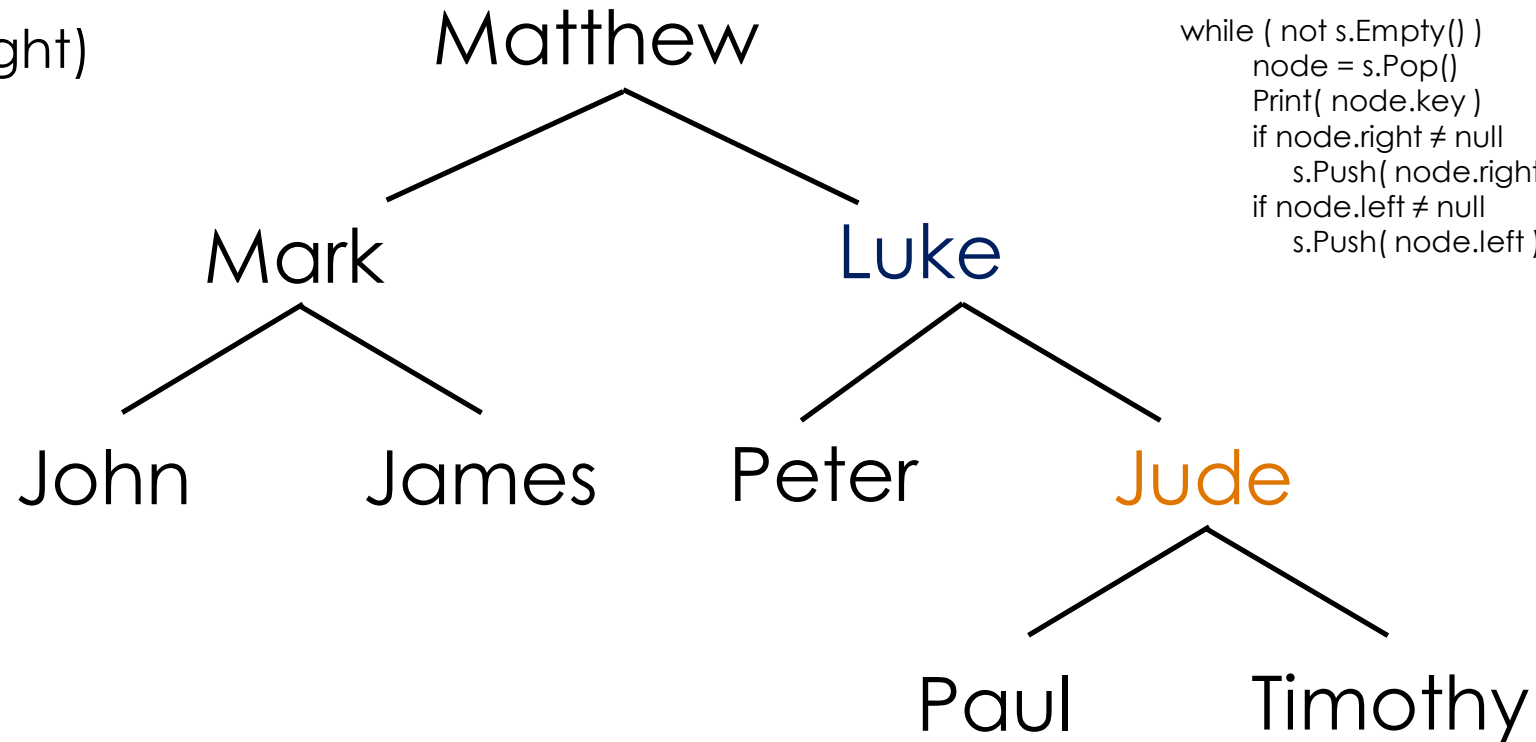


Output: Matthew, Mark, John, James, Luke
node

Stack:

DFT using Stack

Push (node.right)



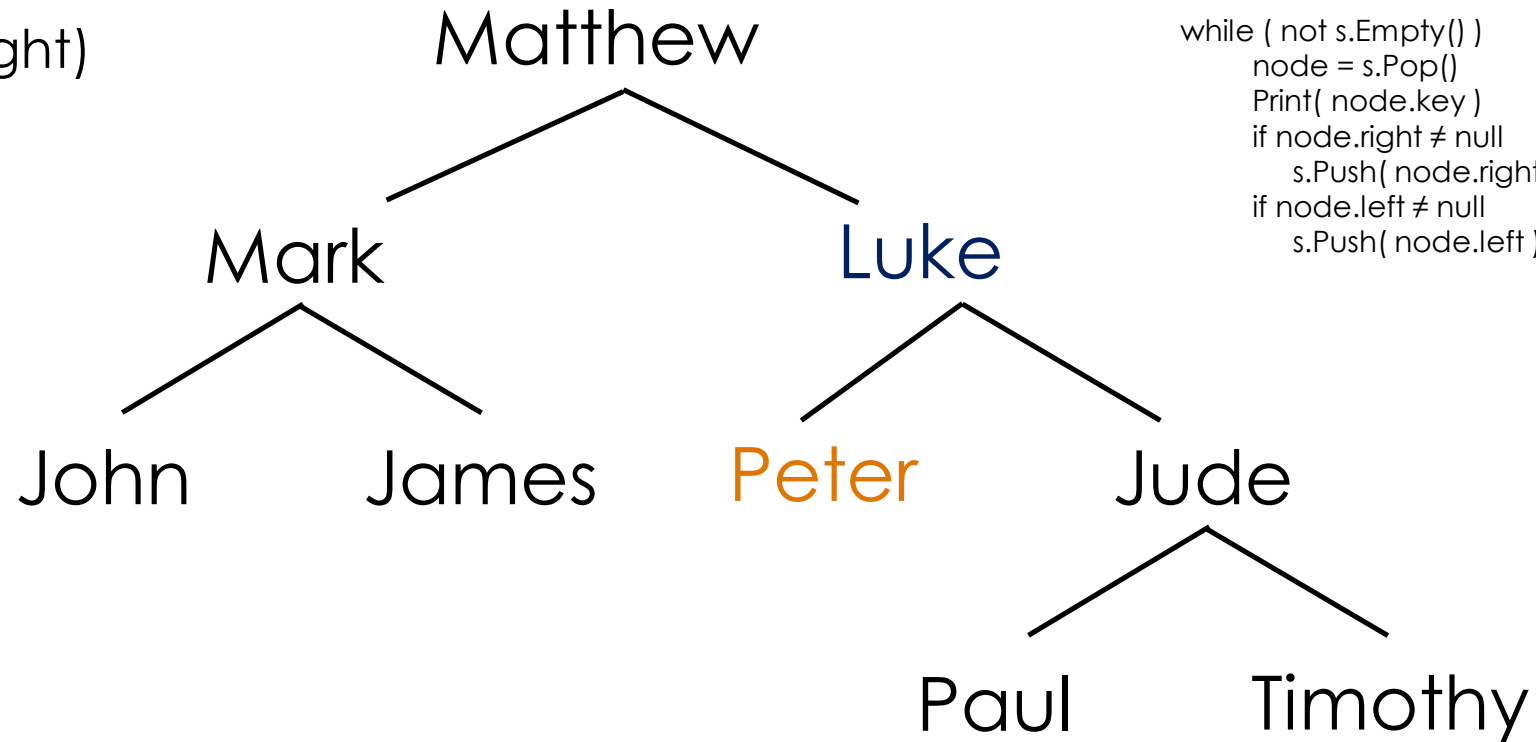
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew, Mark, John, James, Luke
node

Stack: Jude

DFT using Stack

Push (node.right)



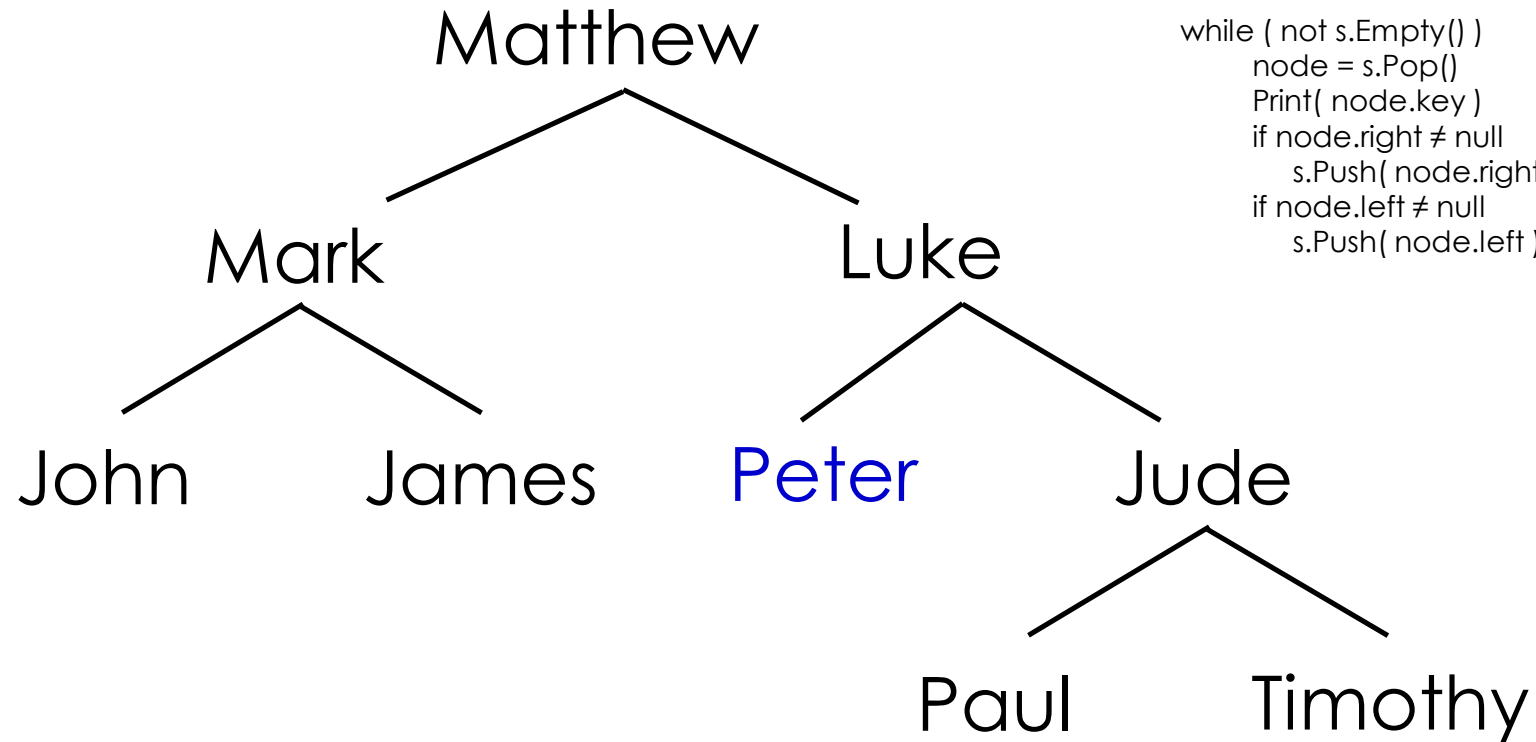
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew, Mark, John, James, Luke
node

Stack: Jude, Peter

DFT using Stack

Pop ()

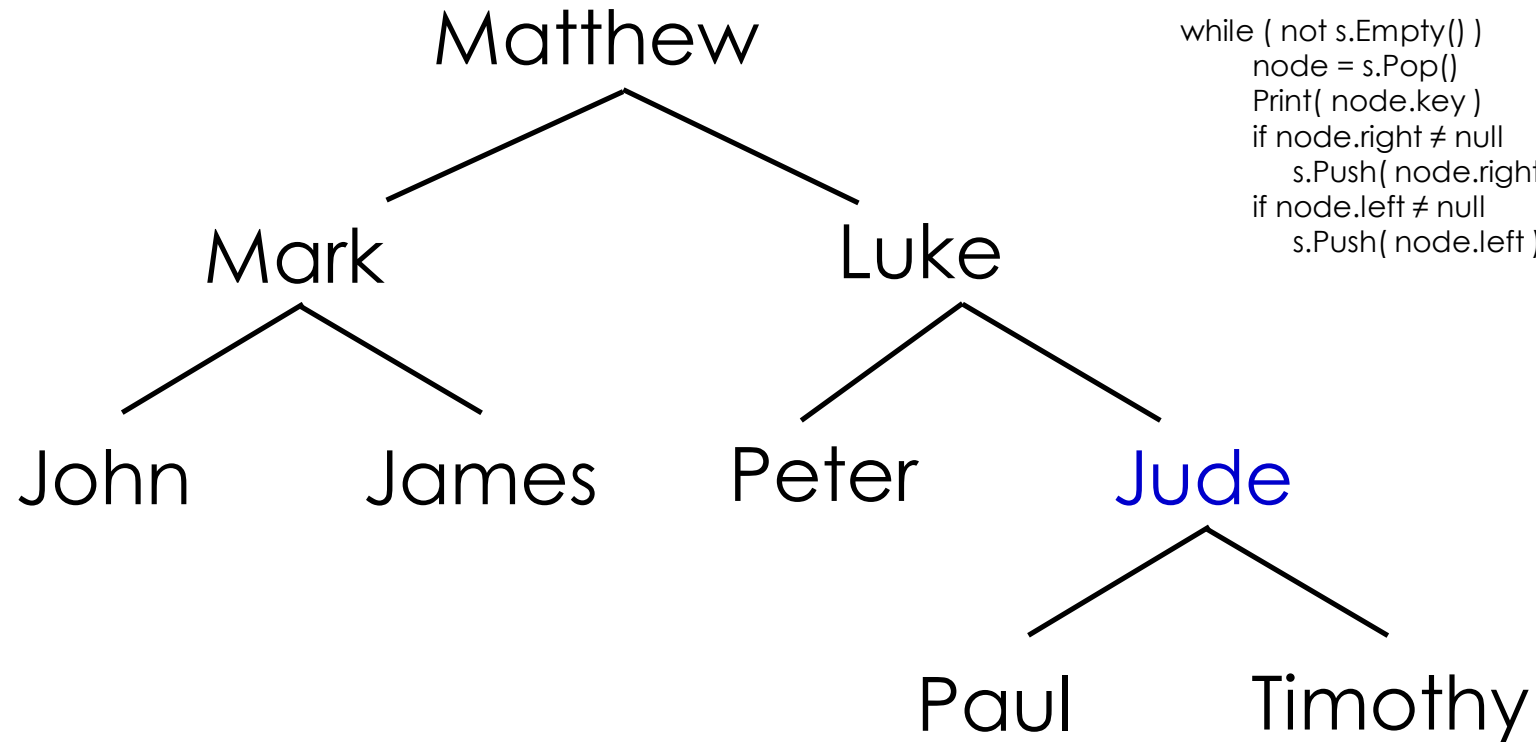


Output: Matthew, Mark, John, James, Luke, Peter
node

Stack: Jude

DFT using Stack

Pop ()

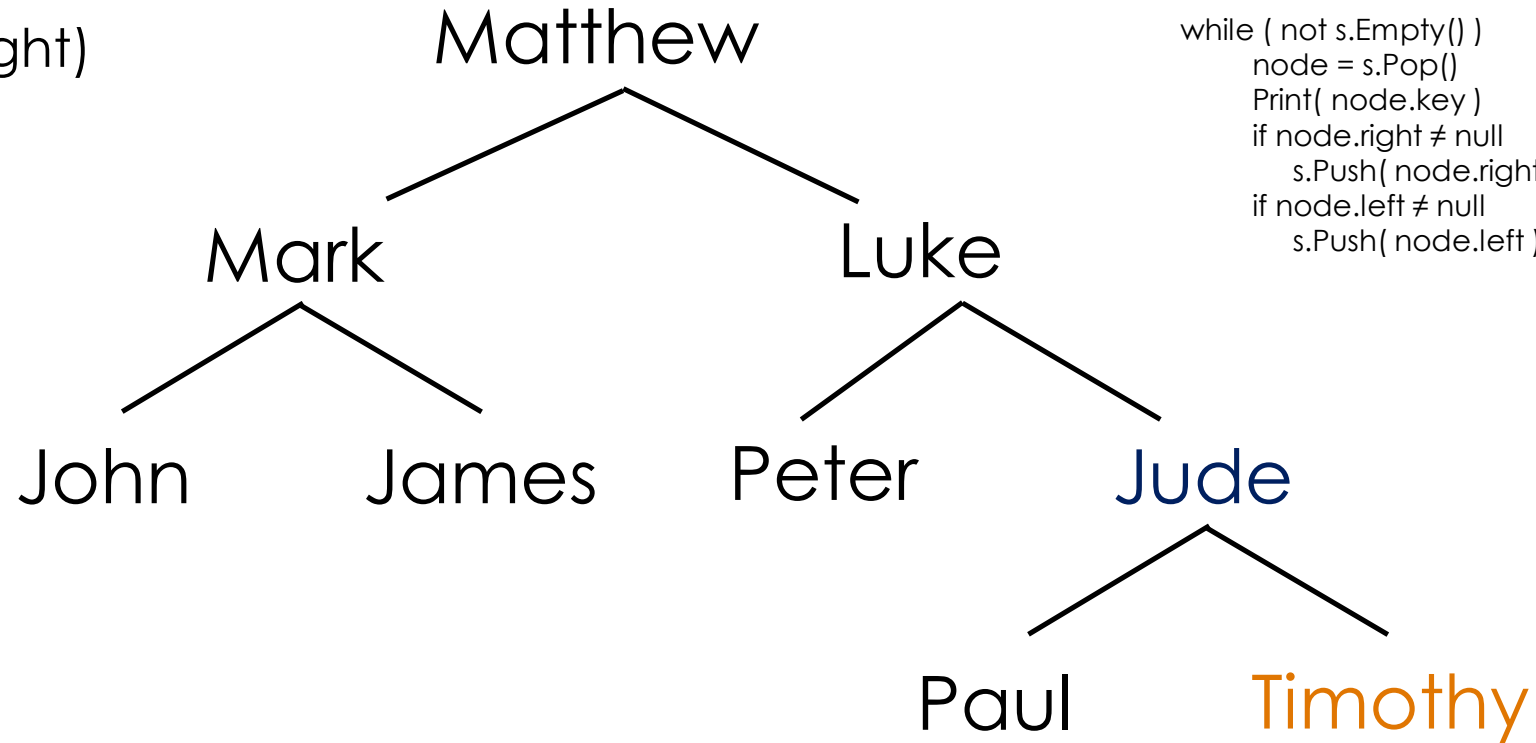


Output: Matthew, Mark, John, James, Luke, Peter, Jude
node

Stack:

DFT using Stack

Push (node.right)



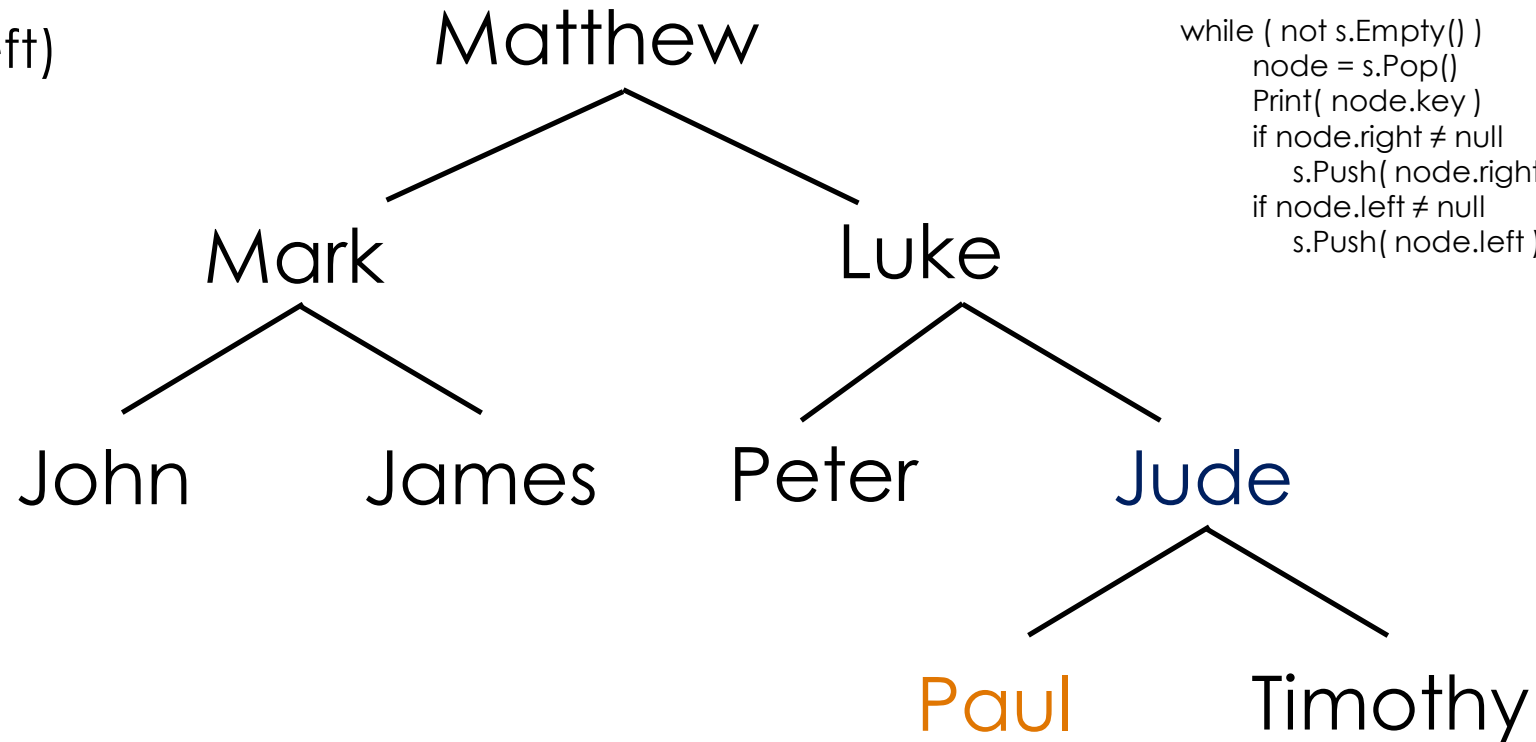
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew, Mark, John, James, Luke, Peter, Jude
node

Stack: Timothy

DFT using Stack

Push (node.left)



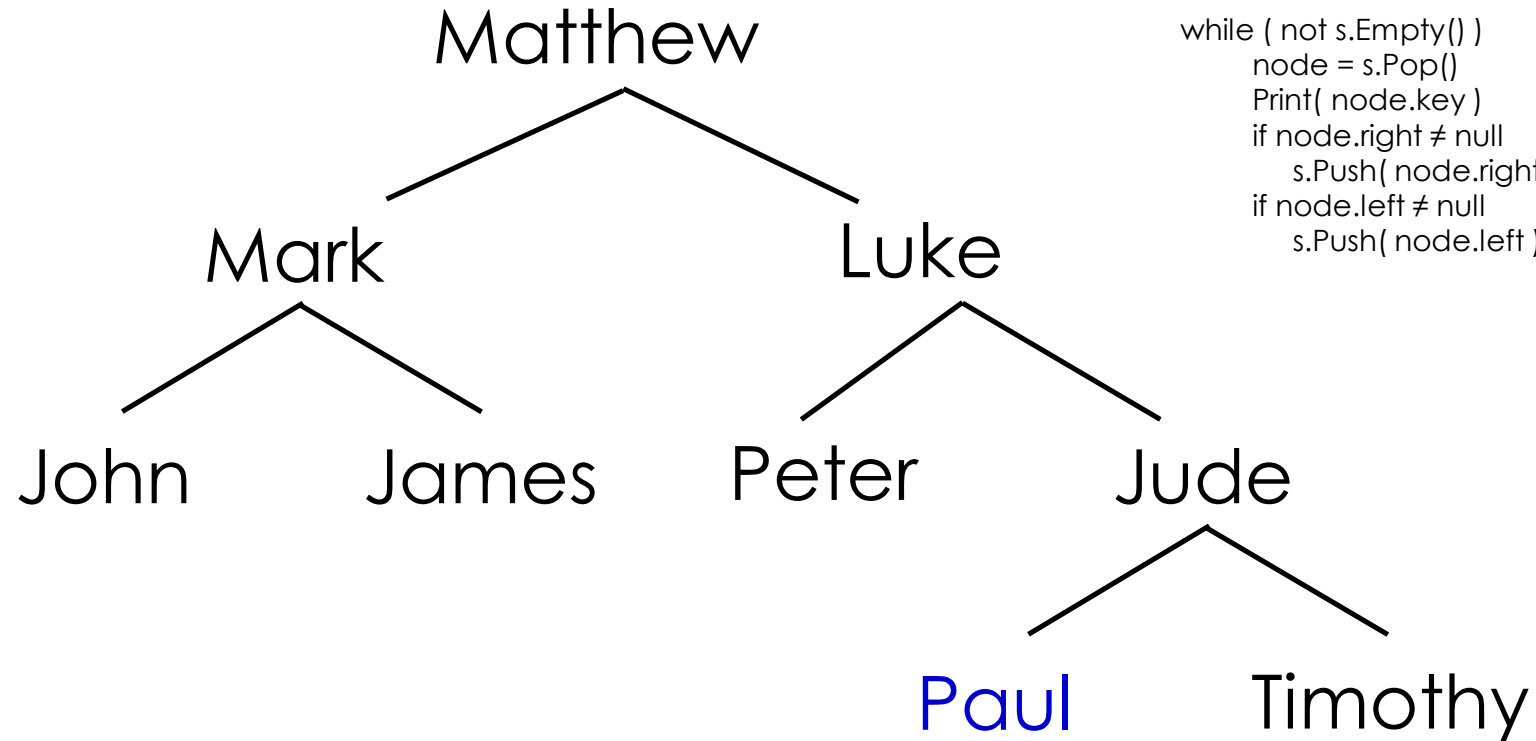
```
while ( not s.Empty() )  
    node = s.Pop()  
    Print( node.key )  
    if node.right != null  
        s.Push( node.right )  
    if node.left != null  
        s.Push( node.left )
```

Output: Matthew, Mark, John, James, Luke, Peter, Jude
node

Stack: Timothy, Paul

DFT using Stack

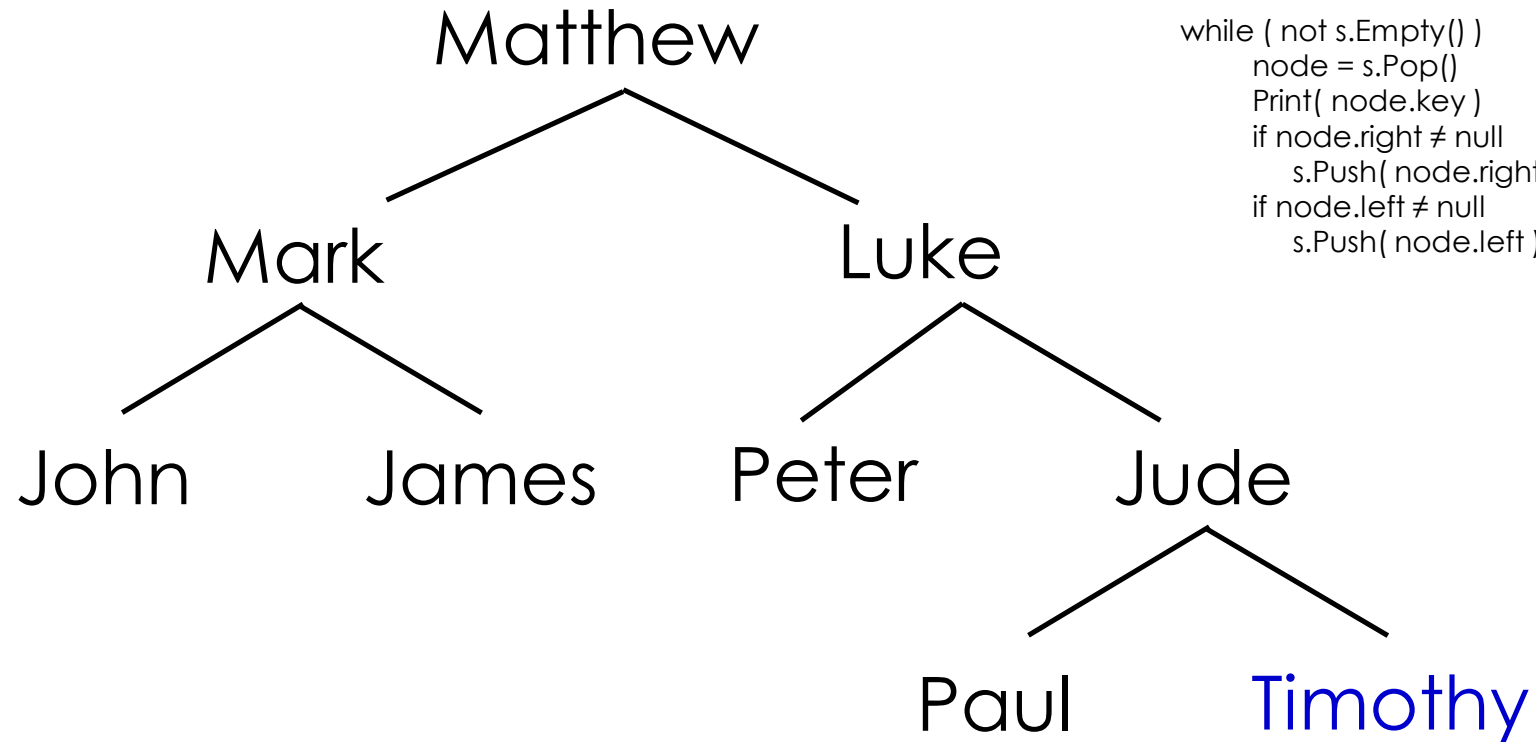
Pop ()



Output: Matthew, Mark, John, James, Luke, Peter, Jude,
Paul
Stack: node
Timothy

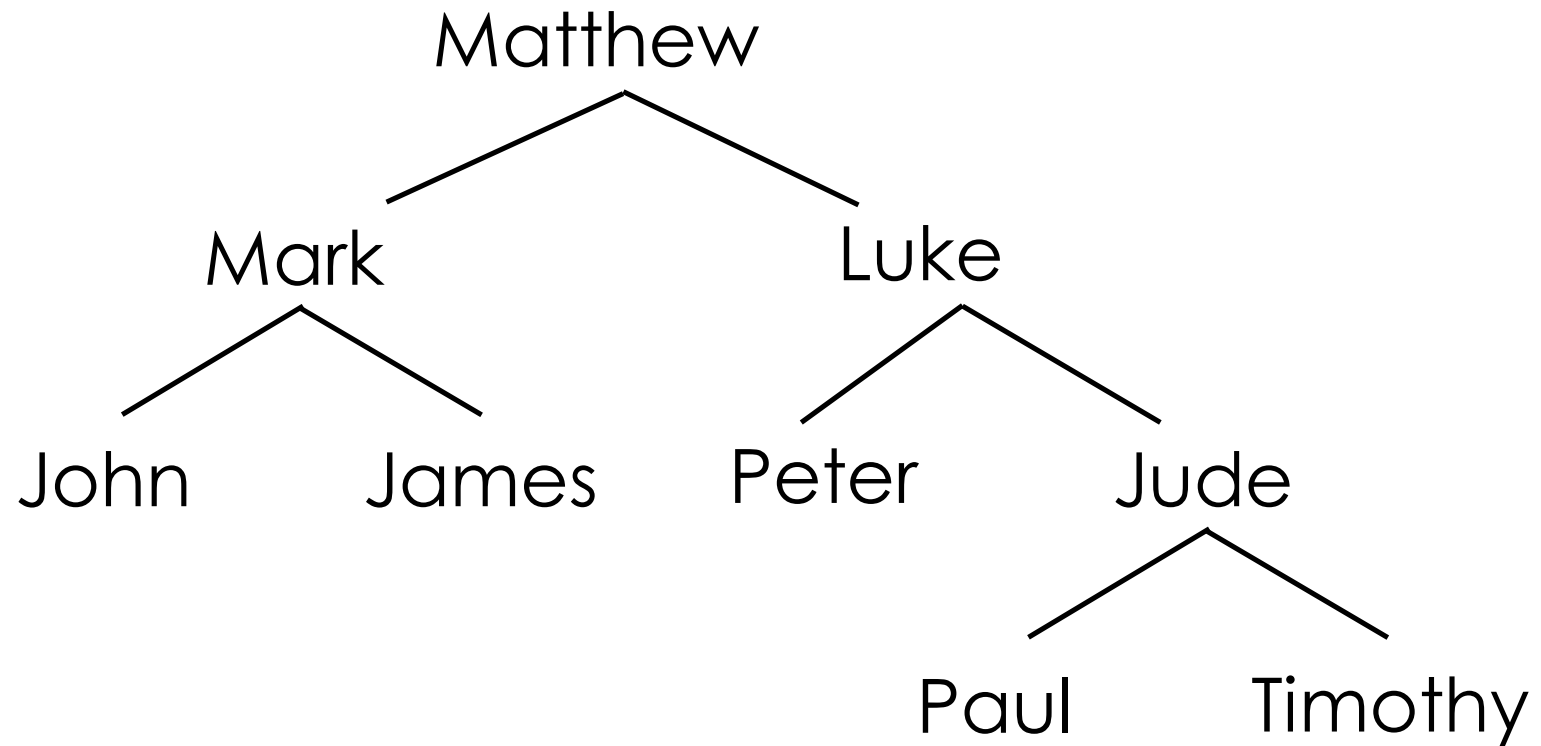
DFT using Stack

Pop ()



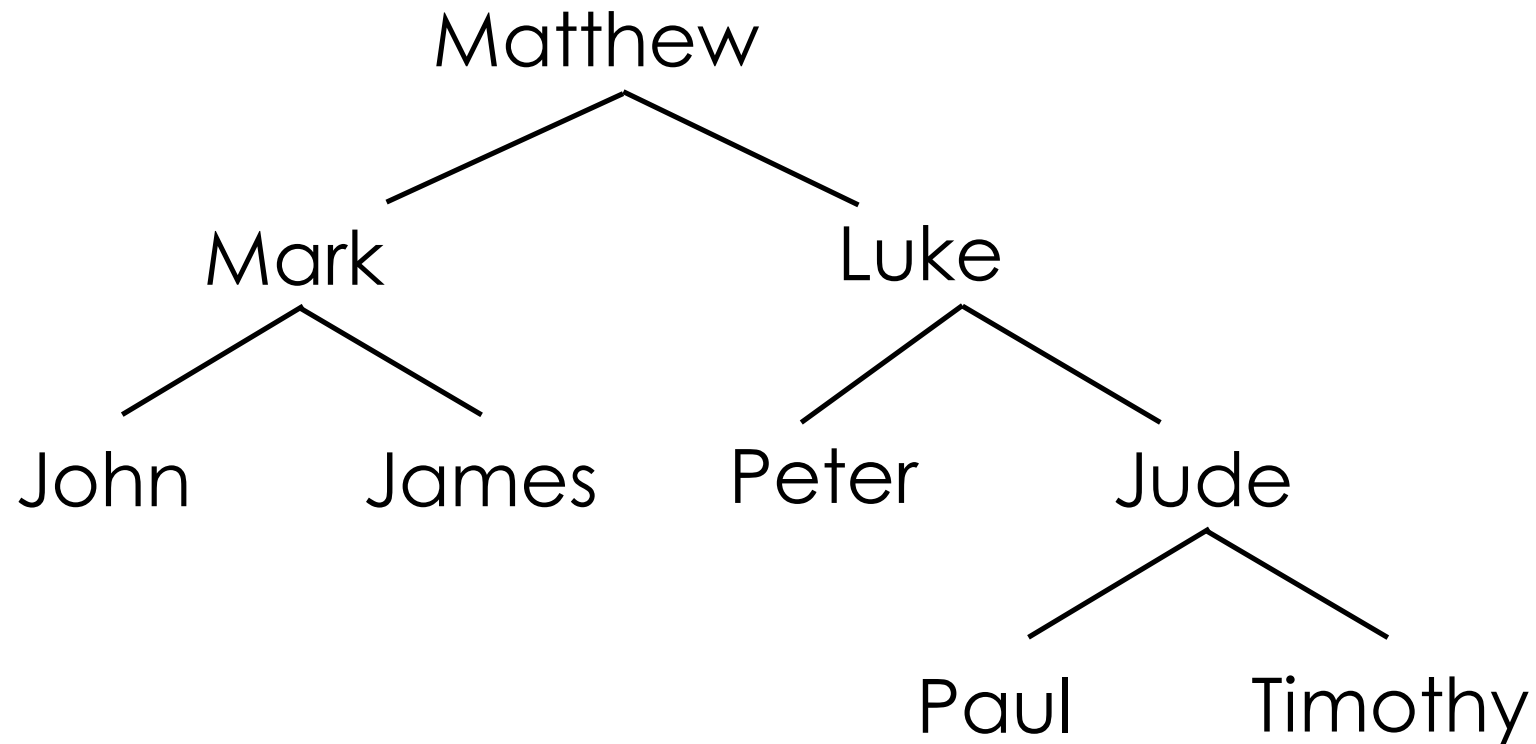
Output: Matthew, Mark, John, James, Luke, Peter, Jude,
Paul, Timothy
Stack: node

Depth-first Traversal (PreOrder) Implementation using Recursion



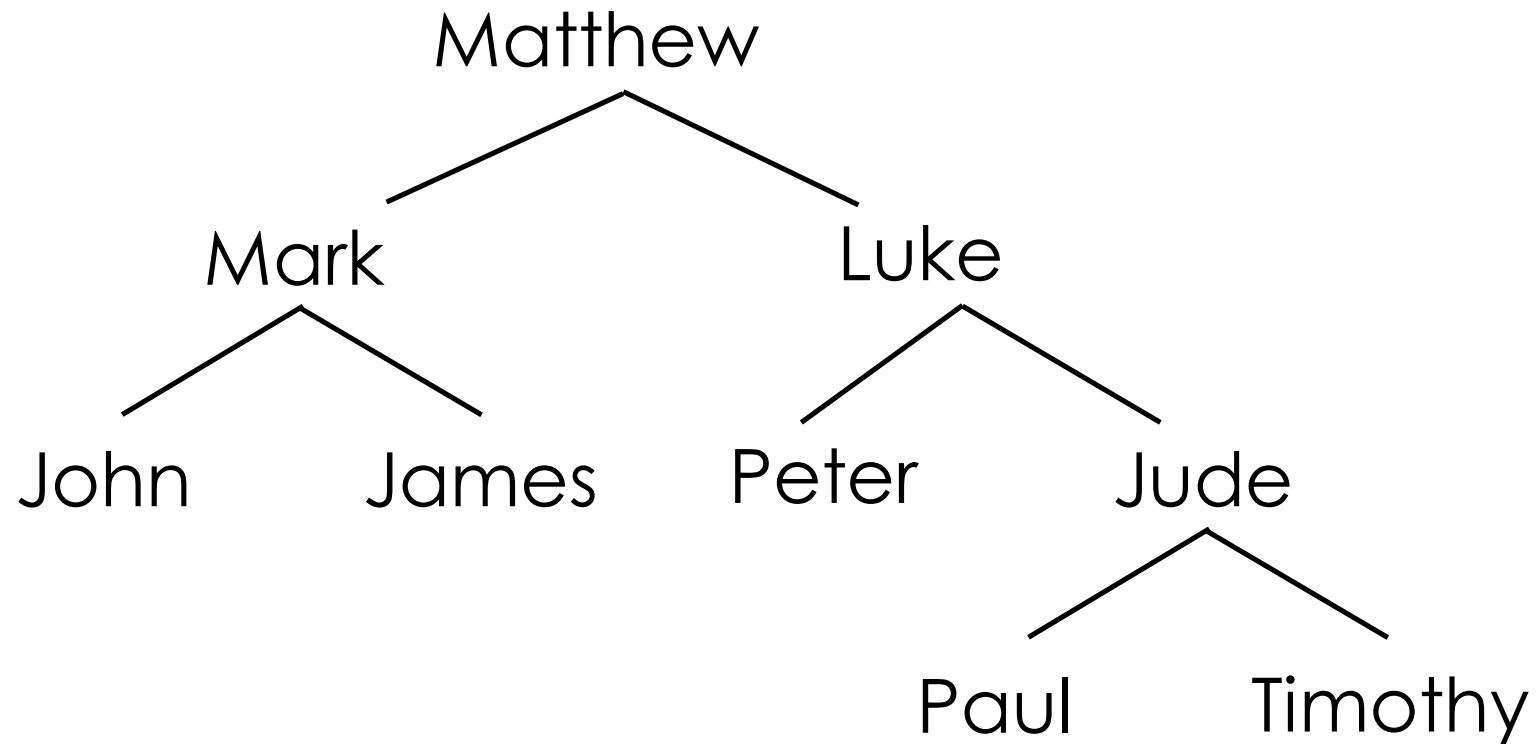
Output:

Depth-first Traversal (PreOrder)



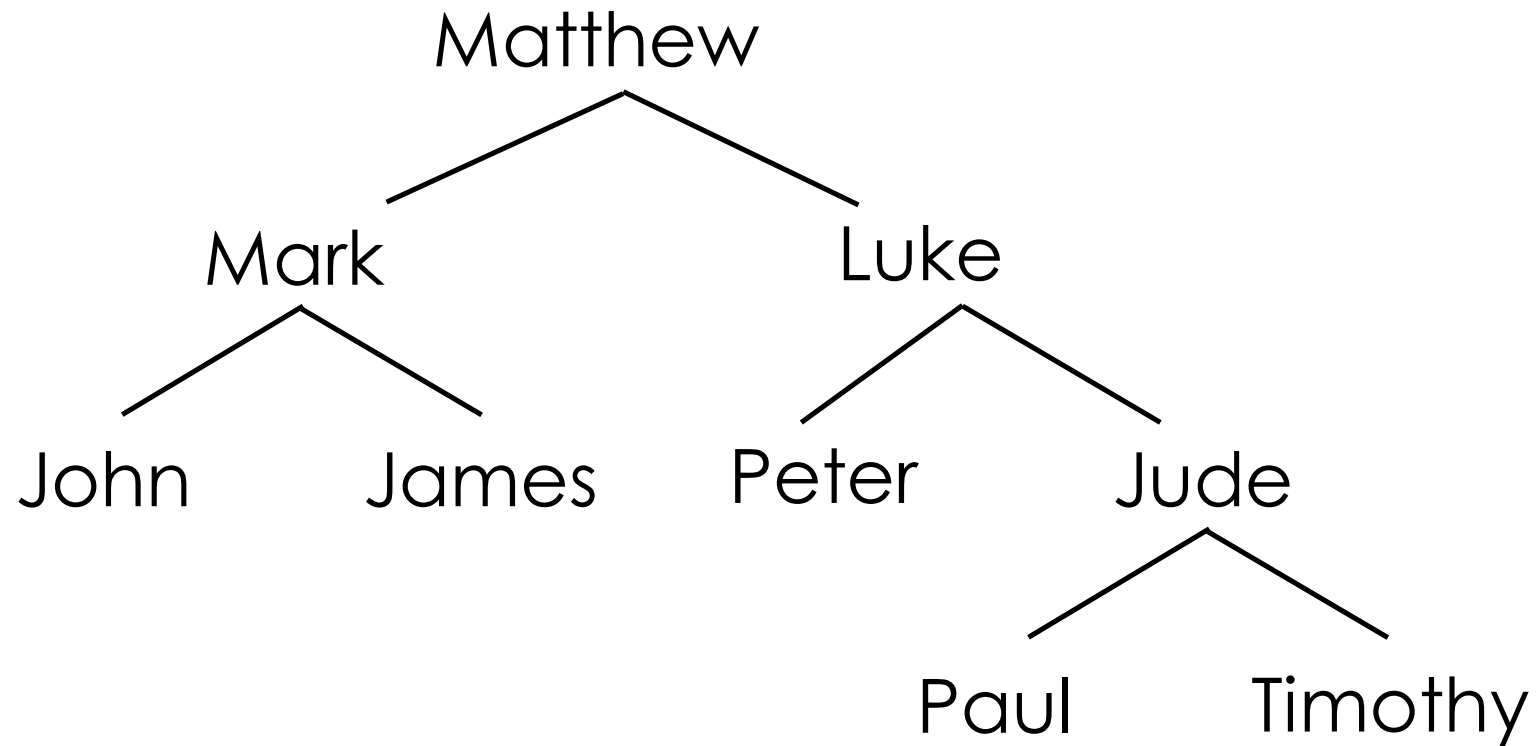
Output: Matthew, Mark, John, James, Luke, Peter, Jude, Paul, Timothy

Depth-first Traversal (InOrder)



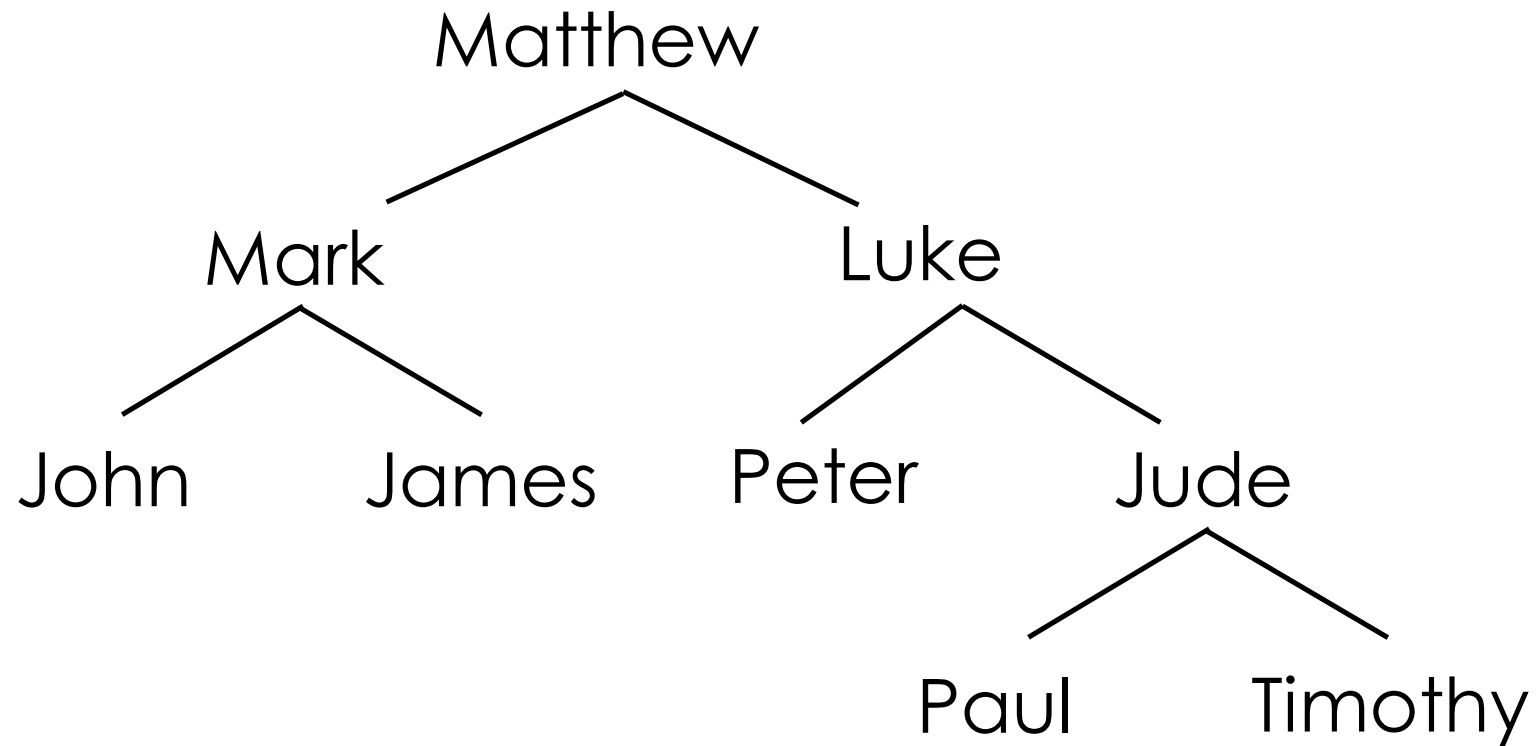
Output:

Depth-first Traversal (InOrder)



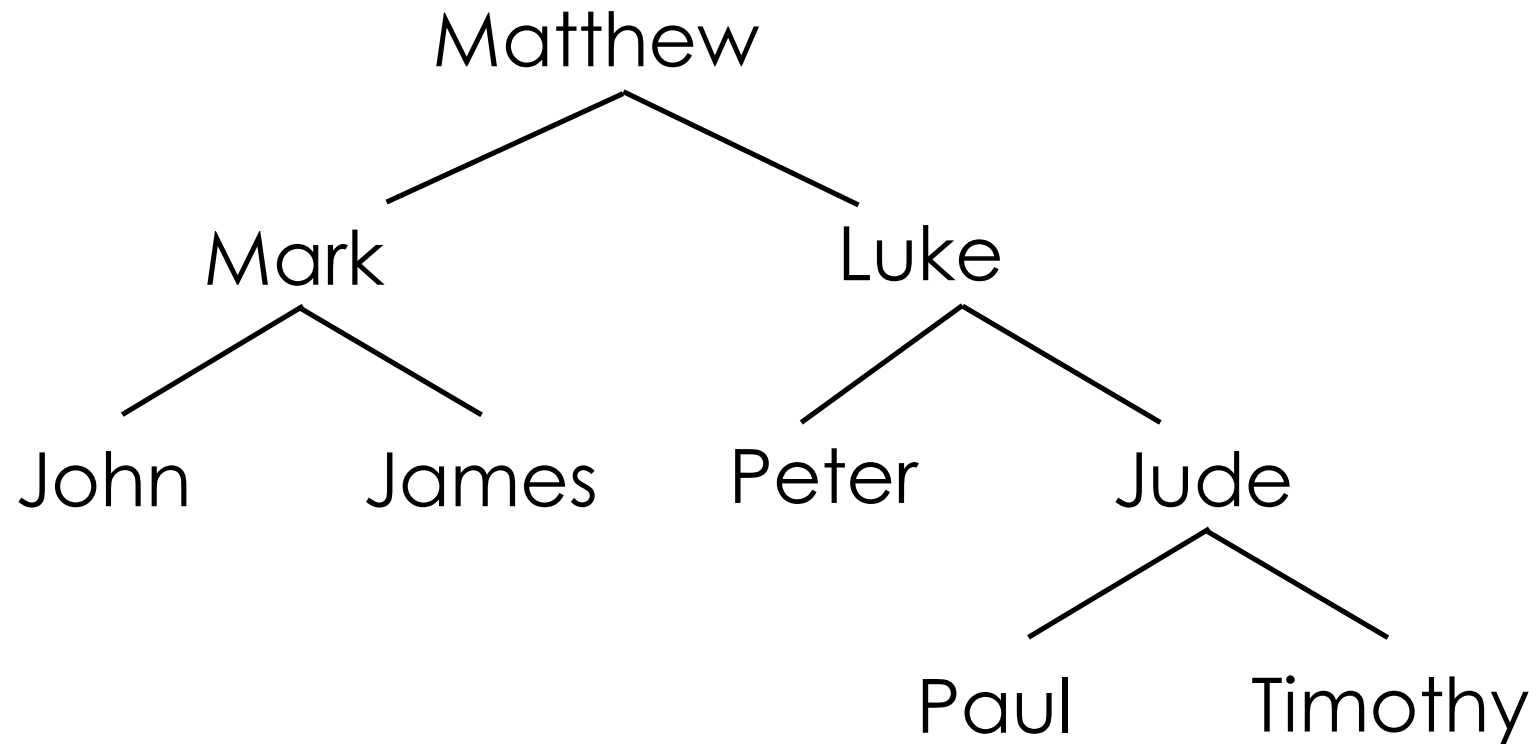
Output: John, Mark, James, Matthew, Peter, Luke, Paul, Jude, Timothy

Depth-first Traversal (PostOrder)



Output:

Depth-first Traversal (PostOrder)



Output: John, James, Mark, Peter, Paul, Timothy,
Jude, Luke, Matthew

Depth-first Traversal (InOrder)

InOrderTraversal (Node node)

```
if node == null
    return
else
    InOrderTraversal (node.left)
    Print (node.key)
    InOrderTraversal (node.right)
```

Depth-first Traversal (PreOrder)

PreOrderTraversal (Node node)

```
if node == null
    return
else
    Print (node.key)
    PreOrderTraversal (node.left)
    PreOrderTraversal (node.right)
```


Depth-first Traversal (PostOrder)

PostOrderTraversal (Node node)

```
if node == null
    return
else
    PostOrderTraversal (node.left)
    PostOrderTraversal (node.right)
    Print (node.key)
```

Unordered Tree Summary

- Tree is Data Structure with a node that can point to multiple nodes
- Searching a key in unordered tree takes $O(n)$
- Degenerate trees look like Linked list which takes $\Theta(n)$ to build
- If the target key tends to be in the earlier nodes, Breadth-first search is the best strategy
- If the target key tends to be in the deeper nodes or leaf nodes, Depth-first search is the best strategy
- Traversal can be: PreOrder, InOrder, or PostOrder
- Traversal implementation can be either recursive or non-recursive
- Non-recursive implementation of BFT is to use Q whileas DFT is to use Stack