

Lecture 2: Trees, binary trees, recursion

BE5B33ALG — Algorithms

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Introduction

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Trees

Binary
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Recursion

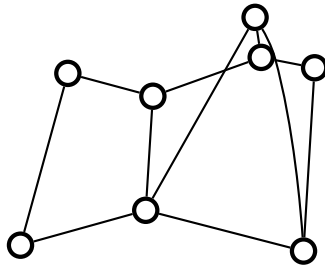
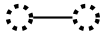
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- Graph $G = (V, E)$
- V is a set of nodes (vertices)
- E is a set of edges (connections between nodes)

- Node (Vertex)



- Edge



Tree

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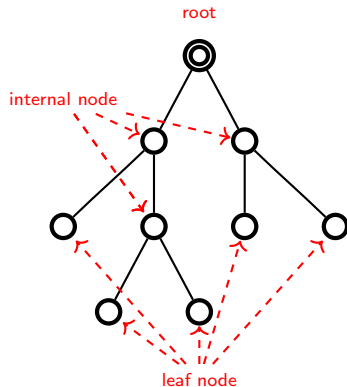
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- Tree is a special type of graph
- **Connected** — there is a path between any two nodes.
- **Acyclic** — there are no cycles (loops).
- There is exactly one path between any of its two nodes.
- Removing any edge disconnects the tree into two graphs.
- Number of edges is always less by one than the number of nodes.



Rooted Tree

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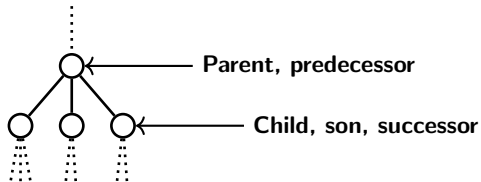
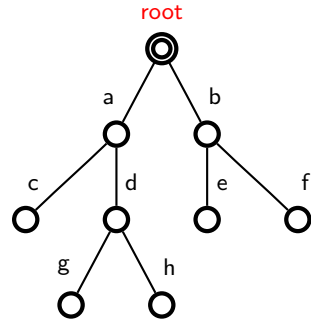
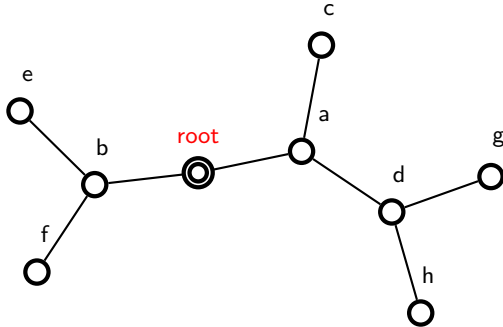
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What can be represented with a tree?

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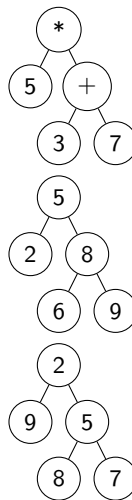
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- Arithmetic expression
- Data structure (BST, heap)
- Decision tree (botanical key)
- Hierarchy of entities (employees, family tree)
- Recursive calls
- State space



Tree Depth of rooted tree

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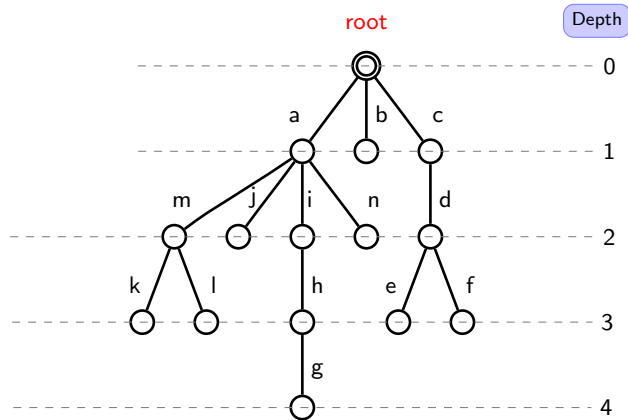
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- Depth of a node is edge-length from root to node.
- Root depth is 0.
- Depth of empty tree is -1.
- Depth of a tree is maximal depth of any node.

Binary tree

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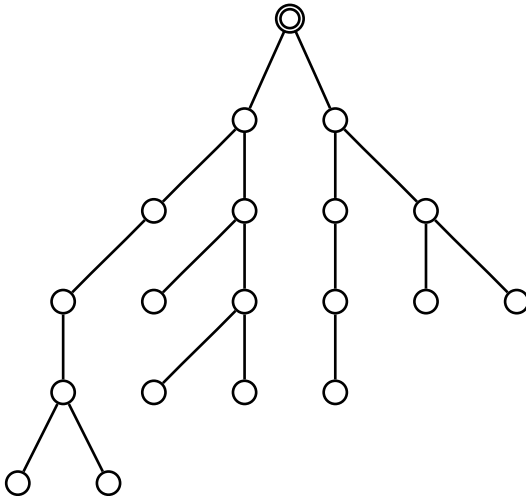
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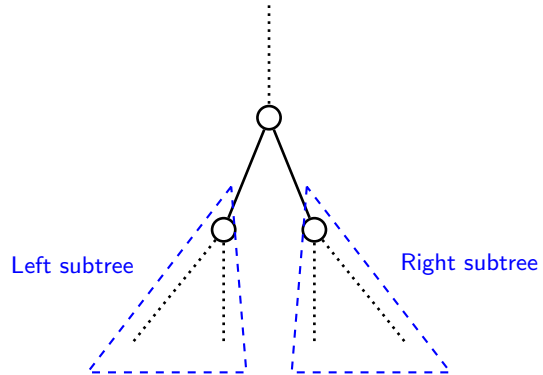
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- Binary tree — each node has at most 2 children (0, 1 or 2).



Regular binary tree and ballanced tree

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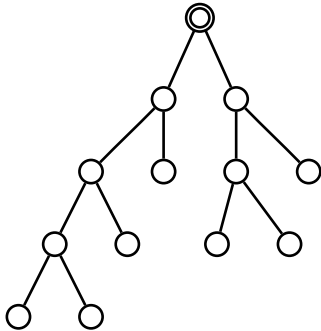
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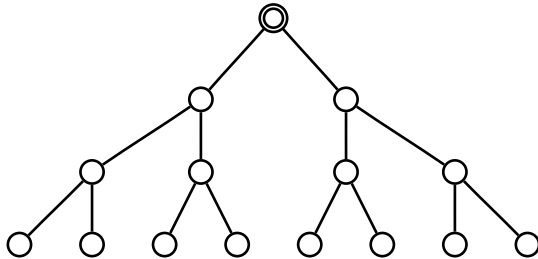
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- In regular binary tree, each node has 0 or 2 children. Not 1 child.

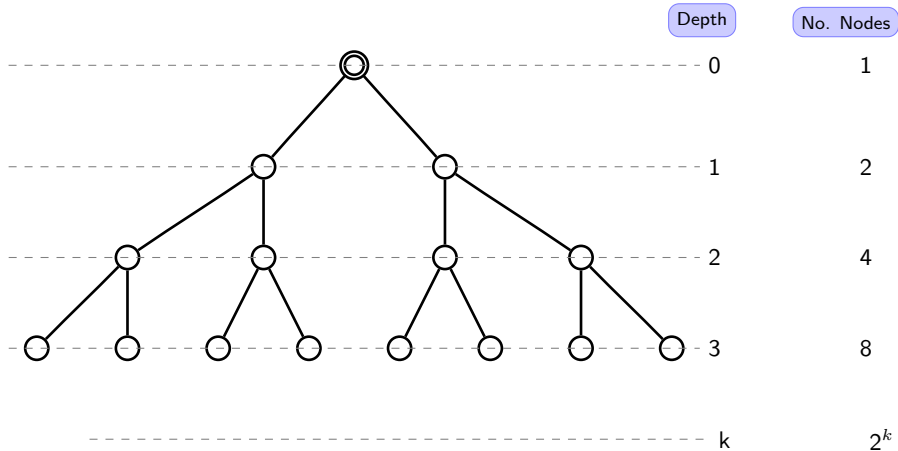


- In balanced tree the depths of all leaves are (approximately) the same.



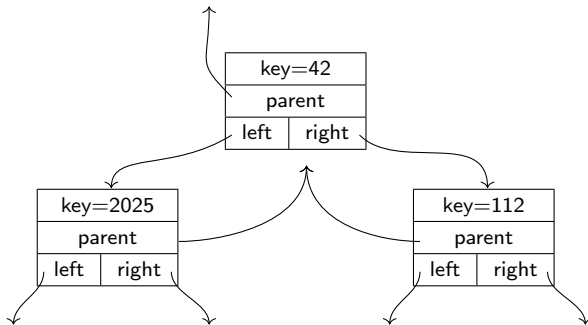
Depth of a balanced regular binary tree

- Number of nodes is $2^{\text{depth}+1} - 1$.
- Depth is $\log_2(|\text{nodes}| + 1) - 1 \approx \log_2(|\text{nodes}|)$



Tree node structure

- Each node contains a key, reference to its left and right children, and reference to its parent.
- Parent might not be necessary in some implementations (depends how the tree is traversed).



```
class Node:
    def __init__(self, key):
        self.left = None
        self.right = None
        self.parent = None
        self.key = key
```

Random tree generation

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- Reference to the parent is not needed for now (no backward traversal).
- The `randrange(n)` returns a pseudorandom integer in the range from 0 to $n-1$.

```
@staticmethod    # Binary tree calls this method
def rndTree(depth):
    if depth <= 0 or random.randrange(10) > 7:
        return None
    newnode = Node(10 + random.randrange(90))
    newnode.left = Node.rndTree(depth - 1)
    newnode.right = Node.rndTree(depth - 1)
    return newnode
```

Random tree generation

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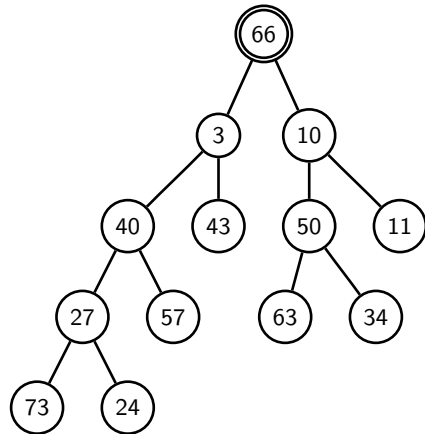
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Example call

```
tree1 = BinaryTree()  
tree1.randomTree(4)
```



Inorder binary tree traversal

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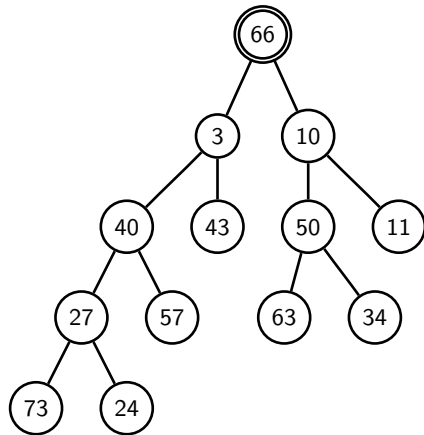
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```
def listInOrder(self, node):  
    if node == None:  
        return  
    self.listInOrder(node.left)  
    print(node.key, end=" ")  
    self.listInOrder(node.right)
```



Output: 73 27 24 40 57 3 43 66 63 50 34 10 11

Inorder binary tree traversal

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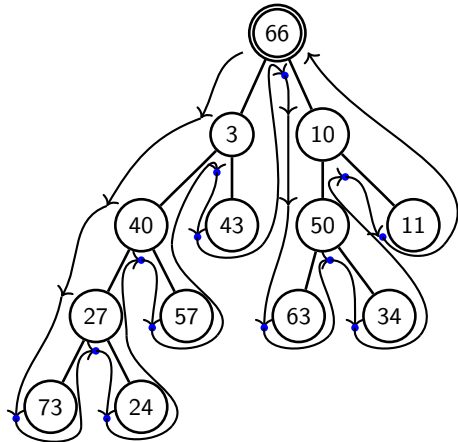
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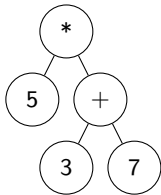
Print point: •

Movement direction: →

```
def listInOrder(self, node):  
    if node == None:  
        return  
    self.listInOrder(node.left)  
    • print(node.key, end=" ")  
    self.listInOrder(node.right)
```



Output: 73 27 24 40 57 3 43 66 63 50 34 10 11



The tree represents the expression:

$$5 * (3 + 7)$$

- **Inorder:** $5 * 3 + 7$

the represented expression cannot be uniquely determined

- **Preorder:** $* 5 + 3 7$

Lisp

- **Postorder:** $5 3 7 + *$

reverse Polish notation, stack calculator

Preorder binary tree traversal

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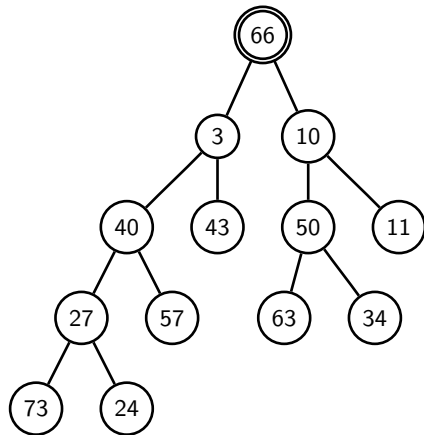
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```
def listPreOrder( self, node ):  
    if node == None:  
        return  
    print( node.key, end = " " )  
    self.listPreOrder( node.left )  
    self.listPreOrder( node.right )
```



Output: 66 3 40 27 73 24 57 43 10 50 63 34 11

Preorder binary tree traversal

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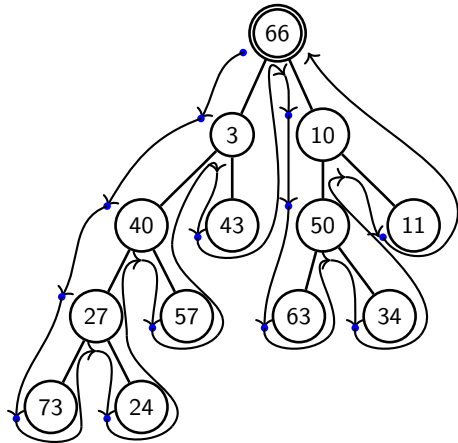
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Print point: •

Movement direction: —————→

```
def listPreOrder( self, node ):  
    if node == None:  
        return  
    • print( node.key, end = " " )  
    self.listPreOrder( node.left )  
    self.listPreOrder( node.right )
```



Output: 66 3 40 27 73 24 57 43 10 50 63 34 11

Postorder binary tree traversal

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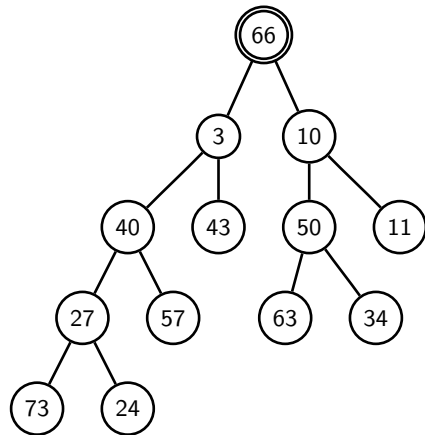
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```
def listPostOrder(self, node):  
    if node == None:  
        return  
    self.listPostOrder(node.left)  
    self.listPostOrder(node.right)  
    print(node.key, end=" ")
```



Output: 73 24 27 57 40 43 3 63 34 50 11 10 66

Postorder binary tree traversal

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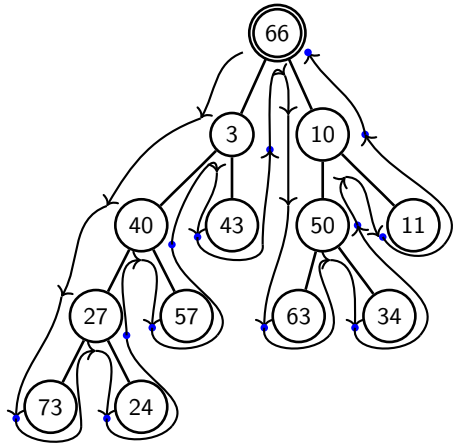
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Print point: •

Movement direction: →

```
def listPostOrder(self, node):  
    if node == None:  
        return  
    self.listPostOrder(node.left)  
    self.listPostOrder(node.right)  
    print(node.key, end=" ")
```

•



Output: 73 24 27 57 40 43 3 63 34 50 11 10 66

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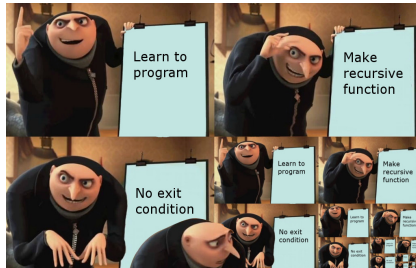
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- Recursion is when a function calls itself in order to solve a problem.
- Instead of solving the whole problem at once, we can break it down into smaller subproblems that are solved recursively.
- It always has to have two key parts:
 - Base case — a simple stopping condition so it does not call itself forever.
 - Recursive step — the function calling itself with a smaller or simpler input.



Source: rabbithole of Reddit u/SingleWalnut

Recursion examples: Tree size (= number of nodes) recursively

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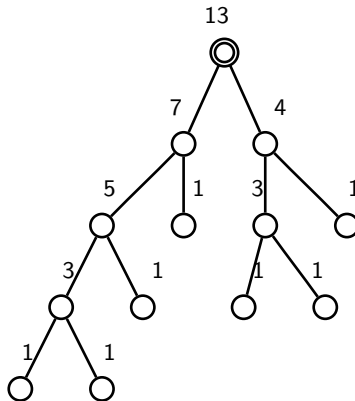
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- We want to count number of nodes in a tree.
- Base case — if the tree is empty, the count is 0.
- Recursive step — the count is 1 (increment for the current node) plus the count of nodes in the left and right subtrees.



```
def count( self, node ):
    if node == None: return 0
    return 1 + self.count(node.left) + self.count(node.right)
```

Recursion examples: Tree depth recursively

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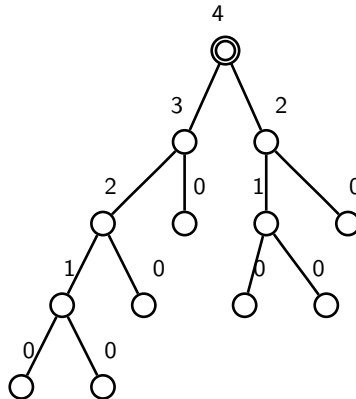
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- We want to find the maximum depth of a tree.
- Base case — if the tree is empty, the depth is -1.
- Recursive step — the depth is 1 (increment for the current depth) plus the maximum depth of the left and right subtrees.



```
def depth( self, node):  
    if node == None: return -1  
    return 1 + max(self.depth(node.left),self.depth(node.right))
```

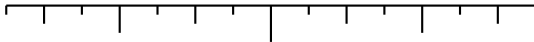
Recursion examples: Marking a ruler

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- We want to mark the positions of a ruler.
- Base case — if the ruler length is 0, there is nothing to mark.
- Recursive step — mark the current position, then recursively mark the rest.



```
def ruler( val ):  
    if val < 1:  
        return  
    ruler( val-1 )  
    print( val, end = ' ' )  
    ruler( val-1 )
```

Call ruler(4) Output: 1 2 1 3 1 2 1 4 1 2 1 3 1 2 1

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Recursion examples: Marking a ruler vs Inorder tree traversal

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- Ruler and inorder traversal of a tree are structurally identical.

```
def ruler( val ):  
    if val < 1:  
        return  
    ruler( val-1 )  
    print( val, end = ' ' )  
    ruler( val-1 )
```

```
def listInOrder(self, node):  
    if node == None:  
        return  
    self.listInOrder(node.left)  
    print(node.key, end=" ")  
    self.listInOrder(node.right)
```

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Recursion examples: Marking a ruler call

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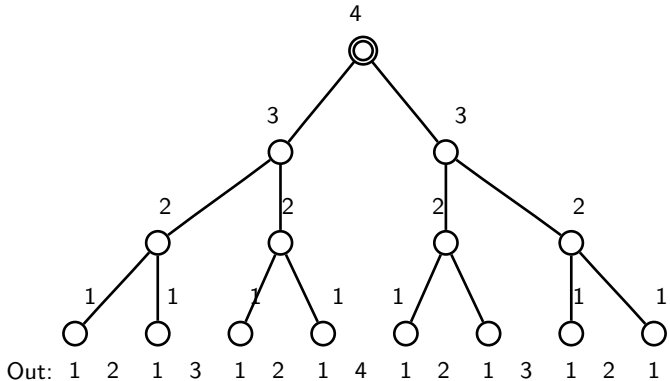
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```
if n == 0: return  
ruler(n - 1)  
print(n)  
ruler(n - 1)
```



Stack

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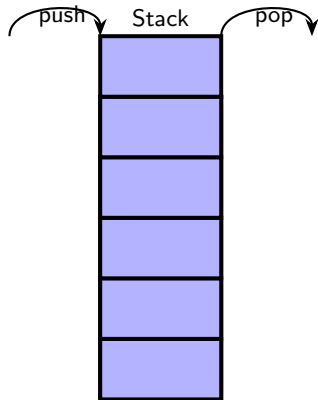
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- Stack is a linear data structure.
- It follows the **LIFO (Last In, First Out)** principle.
- Most basic operations are push and pop.
- Standard approach:
 - **Push** the first node (first element to be processed) to the stack.
 - Push each next node (next element to be processed) to the stack too.
 - Process only the node (element) at the top of the stack.
 - **Pop** the processed element from the stack.
 - Stop when the stack is empty.



Stack implements recursion

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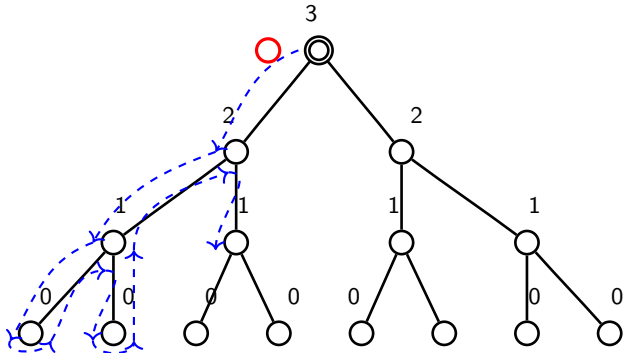
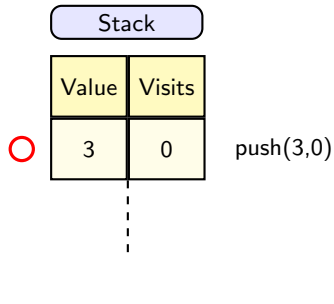
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Stack implements recursion

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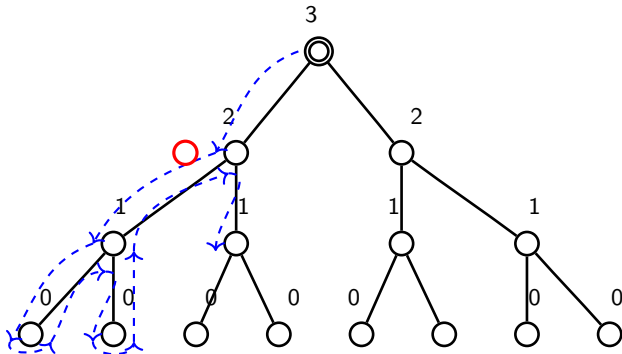
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Stack	
Value	Visits
3	1
2	0

push(2,0)



Stack implements recursion

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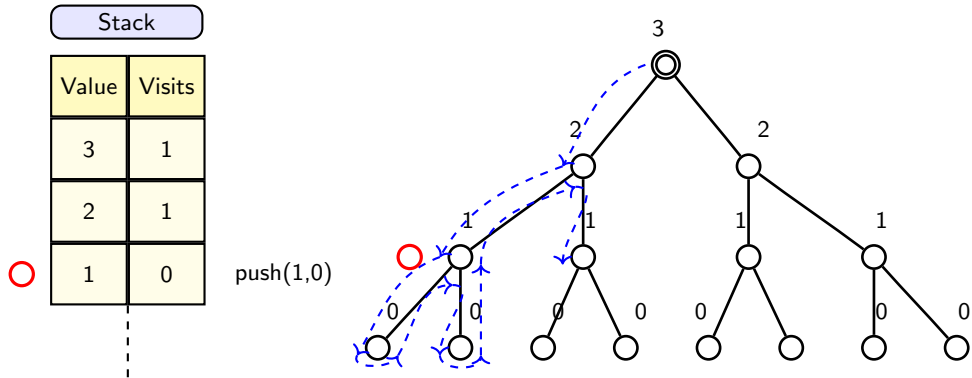
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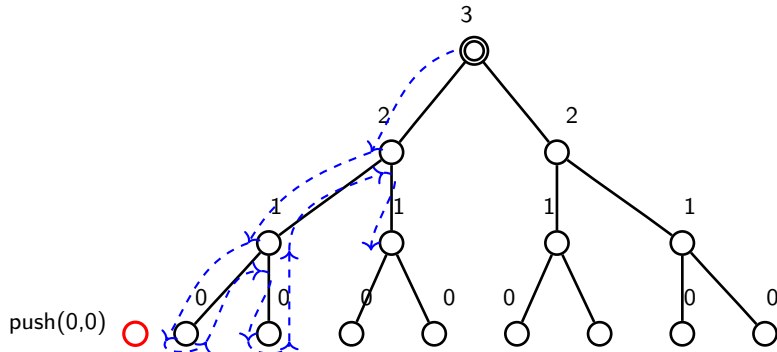
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Stack

Value	Visits
3	1
2	1
1	1
0	0



Stack implements recursion

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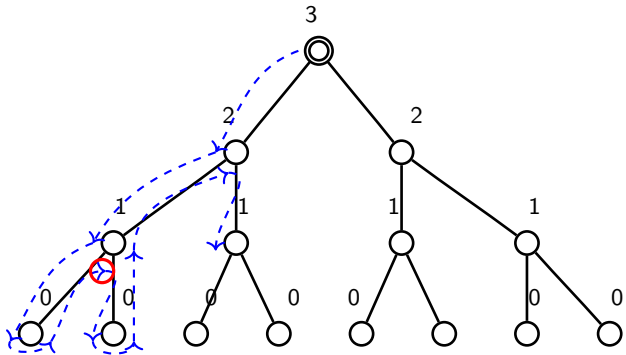
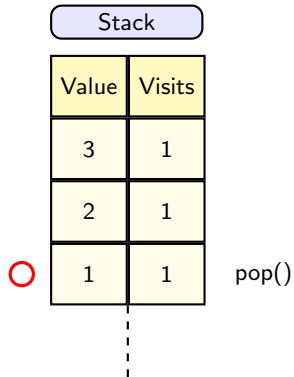
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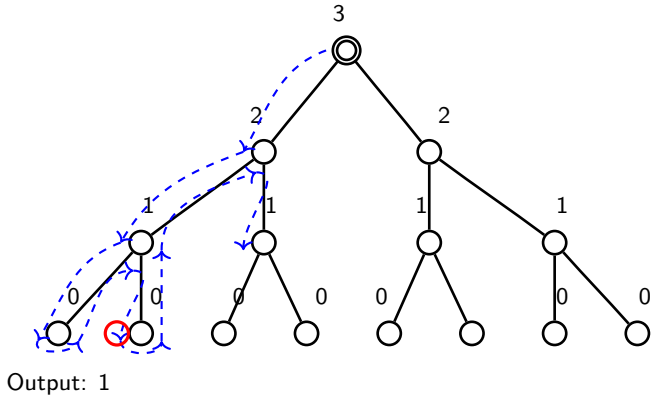
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Stack	
Value	Visits
1	1
2	1
1	2
0	0



push(0,0)



Stack implements recursion

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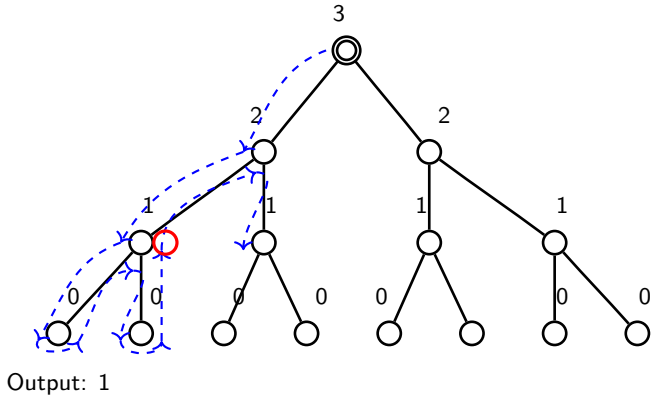
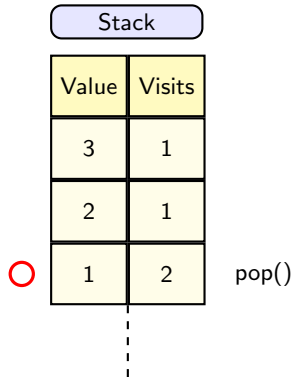
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Stack implements recursion

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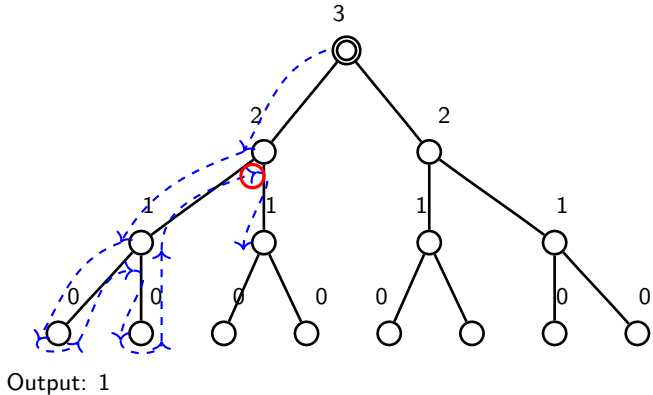
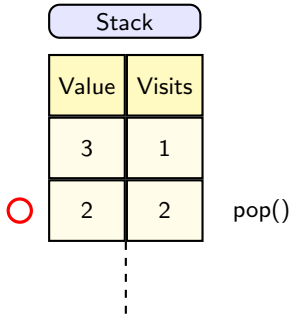
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Stack implements recursion

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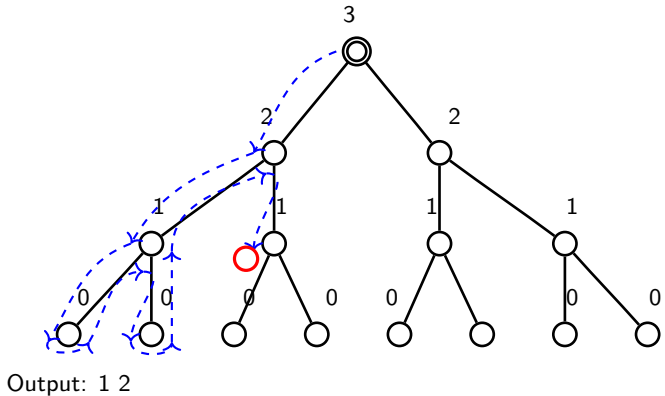
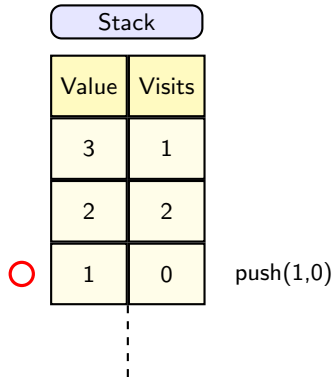
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Ruler without recursive calls

```
def rulerNoRec( N ):
    stack = Stack()
    stack.push( N, 0) # 0 == no. of visits to the root
    while not stack.isEmpty():
        if stack.top().value == 0:
            stack.pop()
        if stack.top().visits == 0:
            stack.top().visits += 1
            stack.push(stack.top().value-1, 0)
        elif stack.top().visits == 1:
            print(stack.top().value, end = ' ')
            stack.top().visits += 1
            stack.push(stack.top().value-1, 0)
        elif stack.top().visits == 2:
            stack.pop()
```

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- **Backtracking** is a general algorithmic technique for solving problems incrementally.
- It builds candidates for solutions step by step, and **abandons (backtracks)** as soon as it determines that the partial candidate cannot lead to a valid solution.
- Often used in:
 - Combinatorial search problems (e.g., subset sum, knapsack, N-Queens).
 - Constraint satisfaction (e.g., Sudoku, puzzles).

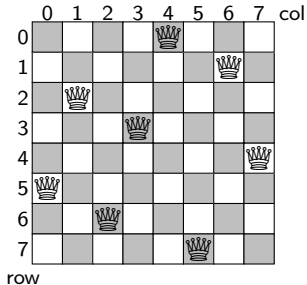
Key Idea

- Explore all possibilities, but prune paths early when they cannot succeed.
- Traverses this search tree recursively, from the root down, in depth-first order

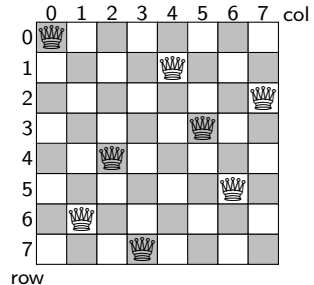
Easy backtrack problem: 8 Queens Puzzle

Problem

Put 8 chess queens on a standard 8×8 chessboard so that no two queens threaten each other.



Example solution with queen positions.



Another valid solution.

Easy backtrack problem: 8 Queens Puzzle

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- The single data structure `queenCol[row]` stores the column index of the queen placed in each row.
- Row conflicts are impossible since we place only one queen per row.

	0	1	2	3	4	5	6	7	col	<i>queenCol[row]</i>
0										0
1										4
2										7
3										5
4										2
5										6
6										1
7										3
row										

Easy backtrack problem 8 queens puzzle

N queens puzzle ($N \times N$ chessboard)

N queens	No. of solutions	No. of tested queen positions		Speedup
		Brute force (N^N)	Backtrack	
4	2	256	240	1.07
5	10	3 125	1 100	2.84
6	4	46 656	5 364	8.70
7	40	823 543	25 088	32.83
8	92	16 777 216	125 760	133.41
9	352	387 420 489	651 402	594.75
10	724	10 000 000 000	3 481 500	2 872.33
11	2 680	285 311 670 611	19 873 766	14 356.20
12	14 200	8 916 100 448 256	121 246 416	73 537.00

Checking if a Queen's Position is Safe

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Idea: When placing a queen at position (r, c) :

- It must not share the same column with any previously placed queen.
- It must not share the same diagonal with any previously placed queen.
- We can check the `queenCol[r]` array for all earlier rows to verify this.

```
def positionOK(r, c):           # r: row, c: column
    for i in range(0, r):      # check all earlier rows
        if (queenCol[i] == c or # same column?
            abs(r - i) == abs(queenCol[i] - c)): # same diagonal?
            return False
    return True
```

Key Observation

- Row conflicts are impossible since we place only one queen per row.
- A queen is safe if no previously placed queen shares its **column** or **diagonal**.

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Placing the queens

Placing queen at position (row, col) and recursively placing queens in the next row:

```
def putQueen(row, col):
    queenCol[row] = col;
    if row == NQ-1: # if solved
        print( queenCol ) # output solution
    else:
        for c in range(0, NQ):           # test all columns
            if (positionOK(row+1, c)):    # if free
                putQueen(row+1, c)       # next row recursion
```

Running the whole algorithm:

```
for col in range(0, NQ):
    putQueen(0, col)
```

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