

The Ultimate Tree Data Structures & Algorithms Handbook

Complete Visual Guide for Technical Interviews & Competitive Programming

▮ Table of Contents

1. [Tree Fundamentals & Theory](#)
2. [Mathematical Foundation](#)
3. [Tree Types & Classifications](#)
4. [Tree Traversal Algorithms](#)
5. [Binary Search Trees](#)
6. [Balanced Trees \(AVL & Red-Black\)](#)
7. [Heap Data Structures](#)
8. [Trie & Prefix Trees](#)
9. [Advanced Trees \(Segment & Fenwick\)](#)
10. [Tree Algorithms & Techniques](#)
11. [Interview Patterns & Problems](#)
12. [Real-World Applications](#)

Chapter 1: Tree Fundamentals & Deep Theory

[201]

1.1 What Are Trees? The Mathematical Foundation

Formal Definition

A **tree** is a connected, acyclic undirected graph. More formally:

- $T = (V, E)$ where V is a set of vertices (nodes) and E is a set of edges
- $|E| = |V| - 1$ (exactly $n-1$ edges for n vertices)
- **Connected:** There exists a path between any two vertices
- **Acyclic:** Contains no cycles

Tree Properties (Theoretical)

Property 1: Unique Path

For any two nodes u and v in a tree, there exists exactly one simple path connecting them.

Property 2: Adding Edge Creates Cycle

Adding any edge to a tree creates exactly one cycle.

Property 3: Removal Disconnects

Removing any edge from a tree disconnects it into exactly two components.

Property 4: Minimal Connected Graph

A tree is the minimal connected graph - removing any edge disconnects it.

Tree Terminology (Complete)

[210]

Term	Definition	Mathematical Notation	Example
Root	Node with no parent	$r \in V, \text{parent}(r) = \emptyset$	Top node in hierarchy
Leaf	Node with no children	$v \in V, \text{children}(v) = \emptyset$	Terminal nodes
Height	Max distance from node to any leaf	$h(v) = \max\{d(v,u) : u \text{ is leaf}\}$	Longest path down
Depth	Distance from root to node	$\text{depth}(v) = d(\text{root}, v)$	Level of node
Degree	Number of children	$\text{deg}(v) = \text{children}(v) $	Branching factor
Level	Set of nodes at same depth	$L_k = \{v : \text{depth}(v) = k\}$	Horizontal layer
Subtree	Tree rooted at node v	$T_v = (V', E')$ induced by v	Portion below node
Ancestor	Node on path from root	u ancestor of v if u on $\text{path}(\text{root}, v)$	Above in hierarchy
Descendant	Node in subtree	v descendant of u if $v \in T_u$	Below in hierarchy

Tree Invariants and Properties

Size-Height Relationship

For a tree with n nodes:

- **Minimum height:** $\lceil \log_2(n) \rceil$ (complete binary tree)
- **Maximum height:** $n-1$ (skewed tree)
- **Average height:** $O(\sqrt{n})$ for random trees

Mathematical Bounds

Theorem 1: Catalan Numbers

Number of structurally different binary trees with n nodes = $C_n = (2n)!/(n!(n+1)!)$

Theorem 2: Tree Traversal Count

For any tree with n nodes, each traversal visits exactly n nodes in $O(n)$ time.

Chapter 2: Mathematical Foundation & Complexity Theory

2.1 Tree Mathematics

Recurrence Relations for Trees

Height Calculation:

```
h(node) = 1 + max(h(left), h(right))
h(null) = -1
```

Node Count:

```
count(node) = 1 + count(left) + count(right)
count(null) = 0
```

Perfect Binary Tree Properties:

- Nodes at level k : 2^k
- Total nodes in tree of height h : $2^{(h+1)} - 1$
- Number of leaves: 2^h
- Number of internal nodes: $2^h - 1$

Asymptotic Analysis

Tree Operation Complexities

Tree Type	Search	Insert	Delete	Space	Notes
Binary Tree	$O(n)$	$O(n)$	$O(n)$	$O(n)$	Worst case skewed
BST (Average)	$O(\log n)$	$O(\log n)$	$O(\log n)$	$O(n)$	Balanced case
BST (Worst)	$O(n)$	$O(n)$	$O(n)$	$O(n)$	Skewed tree
AVL Tree	$O(\log n)$	$O(\log n)$	$O(\log n)$	$O(n)$	Guaranteed balanced
Red-Black	$O(\log n)$	$O(\log n)$	$O(\log n)$	$O(n)$	Guaranteed balanced
Complete Tree	$O(n)$	$O(1)$	$O(\log n)$	$O(n)$	Array representation

Probability and Expected Values

Random BST Analysis:

- Expected height of random BST: $O(\log n)$
- Probability of height $> c \log n$: $O(1/n^c)$
- Expected search cost: $O(\log n)$

Chapter 3: Complete Tree Classifications

[210]

3.1 Binary Tree Types (Visual Classification)

Full Binary Tree

Definition: Every node has either 0 or 2 children (never 1)

Properties:

- Number of leaves = Number of internal nodes + 1
- If L = leaves, I = internal nodes, then $L = I + 1$
- Total nodes = $2L - 1$

Python Implementation:

```
def is_full_binary_tree(root):
    """Check if tree is full binary tree"""
    if not root:
        return True

    # If only one child exists, not full
    if bool(root.left) ^ bool(root.right): # XOR
        return False

    return is_full_binary_tree(root.left) and is_full_binary_tree(root.right)
```

Complete Binary Tree

Definition: All levels filled except possibly the last, which is filled left-to-right

[202]

Properties:

- Height = $\lfloor \log_2(n) \rfloor$
- Can be efficiently stored in array
- Parent of node i : $(i-1)/2$
- Left child of node i : $2i+1$
- Right child of node i : $2i+2$

Array Representation:

```
class CompleteBinaryTree:
    def __init__(self):
        self.tree = []

    def parent(self, i):
        return (i - 1) // 2 if i > 0 else None

    def left_child(self, i):
        left = 2 * i + 1
        return left if left < len(self.tree) else None

    def right_child(self, i):
        right = 2 * i + 2
        return right if right < len(self.tree) else None

    def insert(self, val):
        """Insert maintains complete tree property"""
        self.tree.append(val)

    def get_height(self):
        """Height calculation for complete tree"""
        n = len(self.tree)
        return int(math.log2(n)) if n > 0 else -1
```

Perfect Binary Tree

Definition: All internal nodes have 2 children, all leaves at same level

Properties:

- Total nodes = $2^{(h+1)} - 1$
- Leaves = 2^h
- Internal nodes = $2^h - 1$
- Extremely rare in practice

```
def is_perfect_binary_tree(root):
    """Check if tree is perfect"""
    def get_depth(node):
        depth = 0
        while node:
            depth += 1
            node = node.left
        return depth

    def is_perfect_recursive(node, depth, current_depth=0):
        if not node:
            return current_depth == depth

        if not node.left and not node.right:
            return current_depth == depth - 1
```

```

    if not node.left or not node.right:
        return False

    return (is_perfect_recursive(node.left, depth, current_depth + 1) and
            is_perfect_recursive(node.right, depth, current_depth + 1))

depth = get_depth(root)
return is_perfect_recursive(root, depth)

```

Balanced Binary Tree

Definition: Height difference between left and right subtrees ≤ 1

[205]

Mathematical Definition:

For every node v : $|\text{height}(\text{left}(v)) - \text{height}(\text{right}(v))| \leq 1$

```

def is_balanced_detailed(root):
    """Detailed balance checking with height tracking"""
    def check_balance(node):
        if not node:
            return True, -1  # (is_balanced, height)

        left_balanced, left_height = check_balance(node.left)
        if not left_balanced:
            return False, 0

        right_balanced, right_height = check_balance(node.right)
        if not right_balanced:
            return False, 0

        current_height = 1 + max(left_height, right_height)
        is_balanced = abs(left_height - right_height) <= 1

        return is_balanced, current_height

    balanced, _ = check_balance(root)
    return balanced

```

Degenerate (Skewed) Tree

Definition: Each parent has only one child (essentially a linked list)

Properties:

- Height = $n - 1$
- Performance degrades to $O(n)$ for all operations
- Space efficiency poor due to pointer overhead

Chapter 4: Tree Traversal Algorithms (Complete Visual Guide)

[206]

4.1 Depth-First Search (DFS) Traversals

Inorder Traversal (Left → Root → Right)

Theory: Visits left subtree, then root, then right subtree

Key Applications:

- Gets sorted sequence from BST
- Expression evaluation (infix expressions)
- Tree flattening

Recursive Implementation (Detailed)

```
def inorder_traversal_detailed(root):  
    """  
    Inorder traversal with step-by-step explanation  
    Time Complexity: O(n) - visits each node exactly once  
    Space Complexity: O(h) - maximum recursion depth equals tree height  
    """  
    result = []  
    call_stack = [] # For debugging/visualization  
  
    def inorder_recursive(node, depth=0):  
        call_stack.append(f'{depth} Visiting node: {node.val if node else "None"}')  
  
        if not node:  
            call_stack.append(f'{depth} Base case: None node, returning')  
            return  
  
        call_stack.append(f'{depth} Going left from {node.val}')  
        inorder_recursive(node.left, depth + 1)  
  
        call_stack.append(f'{depth} Processing root: {node.val}')  
        result.append(node.val)  
  
        call_stack.append(f'{depth} Going right from {node.val}')  
        inorder_recursive(node.right, depth + 1)  
  
        call_stack.append(f'{depth} Finished with node: {node.val}')  
  
    inorder_recursive(root)  
    return result, call_stack
```

Iterative Implementation (Stack-Based)

```
def inorder_iterative_detailed(root):
    """
    Iterative inorder using explicit stack
    Mimics recursion call stack manually
    """
    result = []
    stack = []
    current = root
    steps = [] # For visualization

    while stack or current:
        # Go to leftmost node
        while current:
            steps.append(f"Pushing {current.val} to stack, going left")
            stack.append(current)
            current = current.left

        # Current is None, backtrack
        if stack:
            current = stack.pop()
            steps.append(f"Popped {current.val}, processing it")
            result.append(current.val)

            steps.append(f"Moving to right subtree of {current.val}")
            current = current.right

    return result, steps
```

Morris Inorder ($O(1)$ Space)

```
def morris_inorder(root):
    """
    Morris traversal:  $O(1)$  space using threading
    Modifies tree temporarily by creating threads
    """
    result = []
    current = root
    steps = []

    while current:
        if not current.left:
            # No left subtree, process current and go right
            steps.append(f"No left child for {current.val}, processing it")
            result.append(current.val)
            current = current.right
        else:
            # Find inorder predecessor
            predecessor = current.left
            while predecessor.right and predecessor.right != current:
                predecessor = predecessor.right

            if not predecessor.right:
                # Create thread to right child
                predecessor.right = current
                # Process current and move to left child
                steps.append(f"Threaded to {current.val}, processing it")
                result.append(current.val)
                current = current.left
            else:
                # Thread already exists, move to right child
                current = predecessor.right
```



```

        # Create thread
        steps.append(f"Creating thread from {predecessor.val} to {current.val}")
        predecessor.right = current
        current = current.left
    else:
        # Remove thread and process current
        steps.append(f"Removing thread, processing {current.val}")
        predecessor.right = None
        result.append(current.val)
        current = current.right

return result, steps

```

Preorder Traversal (Root → Left → Right)

Applications:

- Tree copying/cloning
- Prefix expression evaluation
- Tree serialization

```

def preorder_applications():
    """Demonstrate preorder applications"""

    def clone_tree(root):
        """Clone tree using preorder traversal"""
        if not root:
            return None

        # Process root first (preorder characteristic)
        new_node = TreeNode(root.val)
        new_node.left = clone_tree(root.left)
        new_node.right = clone_tree(root.right)
        return new_node

    def serialize_preorder(root):
        """Serialize tree using preorder"""
        if not root:
            return "null"

        # Root first, then left, then right
        return f"{root.val},{serialize_preorder(root.left)},{serialize_preorder(root.right)}"

    def evaluate_prefix_expression(expression):
        """Evaluate prefix expression using tree"""
        tokens = expression.split()
        index = [0] # Use list for reference passing

        def build_expression_tree():
            token = tokens[index[0]]
            index[0] += 1

            if token in ['+', '-', '*', '/']:
                node = TreeNode(token)

```

```

        node.left = build_expression_tree() # Left operand
        node.right = build_expression_tree() # Right operand
        return node
    else:
        return TreeNode(int(token))

def evaluate_tree(root):
    if not root:
        return 0

    if root.val not in ['+', '-', '*', '/']:
        return root.val

    left_val = evaluate_tree(root.left)
    right_val = evaluate_tree(root.right)

    if root.val == '+':
        return left_val + right_val
    elif root.val == '-':
        return left_val - right_val
    elif root.val == '*':
        return left_val * right_val
    elif root.val == '/':
        return left_val / right_val

    tree = build_expression_tree()
    return evaluate_tree(tree)

return clone_tree, serialize_preorder, evaluate_prefix_expression

```

Postorder Traversal (Left → Right → Root)

Applications:

- Tree deletion (delete children before parent)
- Postfix expression evaluation
- Directory size calculation
- Dependency resolution

```

def postorder_applications():
    """Demonstrate postorder applications"""

    def delete_tree(root):
        """Safely delete entire tree using postorder"""
        if not root:
            return None

        # Delete children first
        delete_tree(root.left)
        delete_tree(root.right)

        # Then delete root
        print(f"Deleting node: {root.val}")

```

```

    # In actual implementation: free(root)
    return None

def calculate_directory_size(root):
    """Calculate directory sizes using postorder"""
    if not root:
        return 0

    # Calculate sizes of subdirectories first
    left_size = calculate_directory_size(root.left)
    right_size = calculate_directory_size(root.right)

    # Then process current directory
    current_size = root.val # Assume val is file size
    total_size = current_size + left_size + right_size

    print(f"Directory {root.val}: {total_size} bytes")
    return total_size

def evaluate_postfix_expression_tree(root):
    """Evaluate postfix expression tree"""
    if not root:
        return 0

    # If leaf node (operand)
    if not root.left and not root.right:
        return root.val

    # Evaluate children first
    left_val = evaluate_postfix_expression_tree(root.left)
    right_val = evaluate_postfix_expression_tree(root.right)

    # Then apply operator
    if root.val == '+':
        return left_val + right_val
    elif root.val == '-':
        return left_val - right_val
    elif root.val == '*':
        return left_val * right_val
    elif root.val == '/':
        return left_val / right_val

return delete_tree, calculate_directory_size, evaluate_postfix_expression_tree

```

4.2 Breadth-First Search (Level Order)

Theory: Visit nodes level by level, left to right

Applications:

- Find shortest path in unweighted tree
- Level-wise processing
- Tree width calculation
- Serialization for complete trees

Standard Level Order

```
def level_order_comprehensive(root):
    """
    Comprehensive level order implementation with multiple variants
    """
    from collections import deque

    if not root:
        return []

    # Variant 1: Simple level order
    def simple_level_order():
        result = []
        queue = deque([root])

        while queue:
            node = queue.popleft()
            result.append(node.val)

            if node.left:
                queue.append(node.left)
            if node.right:
                queue.append(node.right)

        return result

    # Variant 2: Level order with level separation
    def level_order_by_levels():
        result = []
        queue = deque([root])

        while queue:
            level_size = len(queue)
            current_level = []

            for _ in range(level_size):
                node = queue.popleft()
                current_level.append(node.val)

                if node.left:
                    queue.append(node.left)
                if node.right:
                    queue.append(node.right)

            result.append(current_level)

        return result

    # Variant 3: Right to left level order
    def level_order_right_to_left():
        result = []
        queue = deque([root])

        while queue:
            level_size = len(queue)
```

```

        current_level = []

        for _ in range(level_size):
            node = queue.popleft()
            current_level.append(node.val)

            # Add right child first for right-to-left
            if node.right:
                queue.append(node.right)
            if node.left:
                queue.append(node.left)

        result.append(current_level)

    return result

# Variant 4: Zigzag level order
def zigzag_level_order():
    result = []
    queue = deque([root])
    left_to_right = True

    while queue:
        level_size = len(queue)
        current_level = []

        for _ in range(level_size):
            node = queue.popleft()
            current_level.append(node.val)

            if node.left:
                queue.append(node.left)
            if node.right:
                queue.append(node.right)

        if not left_to_right:
            current_level.reverse()

        result.append(current_level)
        left_to_right = not left_to_right

    return result

return {
    'simple': simple_level_order(),
    'by_levels': level_order_by_levels(),
    'right_to_left': level_order_right_to_left(),
    'zigzag': zigzag_level_order()
}

```

Advanced Level Order Applications

Tree Width and Statistics

```
def tree_statistics_bfs(root):
    """Calculate comprehensive tree statistics using BFS"""
    from collections import deque

    if not root:
        return {
            'width': 0,
            'height': -1,
            'nodes_per_level': [],
            'max_level_width': 0,
            'total_nodes': 0
        }

    queue = deque([root])
    height = -1
    nodes_per_level = []
    max_width = 0
    total_nodes = 0

    while queue:
        level_size = len(queue)
        height += 1
        nodes_per_level.append(level_size)
        max_width = max(max_width, level_size)
        total_nodes += level_size

        for _ in range(level_size):
            node = queue.popleft()

            if node.left:
                queue.append(node.left)
            if node.right:
                queue.append(node.right)

    return {
        'width': max_width,
        'height': height,
        'nodes_per_level': nodes_per_level,
        'max_level_width': max_width,
        'total_nodes': total_nodes,
        'average_width': total_nodes / (height + 1) if height >= 0 else 0
    }
```

Chapter 5: Binary Search Trees (Complete Theory & Implementation)

[204]

5.1 BST Mathematical Properties

BST Invariant

For every node v in BST:

- All nodes in left subtree have values $< v.val$
- All nodes in right subtree have values $> v.val$
- Both subtrees are also BSTs (recursive property)

Mathematical Analysis

Search Cost Analysis:

- Best case: $O(\log n)$ - balanced tree
- Average case: $O(\log n)$ - random insertion order
- Worst case: $O(n)$ - skewed tree (sorted input)

Expected Height of Random BST:

$E[\text{height}] = O(\log n)$

Proof: The expected height of a randomly built BST is approximately $2.99 \log n$.

Complete BST Implementation with Theory

```
class BinarySearchTreeComplete:
    """
    Complete BST implementation with all operations and theoretical analysis
    """

    def __init__(self):
        self.root = None
        self.size = 0
        self.modification_count = 0  # For iterator invalidation

    def insert(self, val):
        """
        Insert value maintaining BST property

        Time Complexity:
        - Best/Average:  $O(\log n)$ 
        - Worst:  $O(n)$  for skewed tree

        Space Complexity:  $O(\log n)$  for recursion stack
        """
        self.root = self._insert_recursive(self.root, val)
        self.modification_count += 1
```

```

def _insert_recursive(self, node, val):
    # Base case: create new node
    if not node:
        self.size += 1
        return TreeNode(val)

    # Recursive case: maintain BST property
    if val < node.val:
        node.left = self._insert_recursive(node.left, val)
    elif val > node.val:
        node.right = self._insert_recursive(node.right, val)
    # Equal values: do nothing (no duplicates)

    return node

def insert_iterative(self, val):
    """
    Iterative insertion - more space efficient
    Space Complexity: O(1)
    """
    if not self.root:
        self.root = TreeNode(val)
        self.size += 1
        return

    current = self.root

    while True:
        if val < current.val:
            if not current.left:
                current.left = TreeNode(val)
                self.size += 1
                break
            current = current.left
        elif val > current.val:
            if not current.right:
                current.right = TreeNode(val)
                self.size += 1
                break
            current = current.right
        else:
            # Duplicate value
            break

def search(self, val):
    """
    Search for value in BST

    Returns: TreeNode if found, None otherwise
    Time Complexity: O(log n) average, O(n) worst
    """
    return self._search_recursive(self.root, val)

def _search_recursive(self, node, val):
    if not node or node.val == val:

```



```

        return node

    if val < node.val:
        return self._search_recursive(node.left, val)
    else:
        return self._search_recursive(node.right, val)

def search_iterative(self, val):
    """Iterative search - no recursion overhead"""
    current = self.root

    while current:
        if val == current.val:
            return current
        elif val < current.val:
            current = current.left
        else:
            current = current.right

    return None

def delete(self, val):
    """
    Delete node with given value

    Three cases:
    1. No children: Simply remove
    2. One child: Replace with child
    3. Two children: Replace with inorder successor
    """
    self.root, deleted = self._delete_recursive(self.root, val)
    if deleted:
        self.modification_count += 1
    return deleted

def _delete_recursive(self, node, val):
    if not node:
        return node, False

    if val < node.val:
        node.left, deleted = self._delete_recursive(node.left, val)
        return node, deleted
    elif val > node.val:
        node.right, deleted = self._delete_recursive(node.right, val)
        return node, deleted
    else:
        # Node to delete found
        self.size -= 1

        # Case 1: No children (leaf)
        if not node.left and not node.right:
            return None, True

        # Case 2: One child
        if not node.left:
            return node.right, True

```

```

        if not node.right:
            return node.left, True

        # Case 3: Two children
        # Find inorder successor (minimum in right subtree)
        successor = self._find_min(node.right)
        node.val = successor.val
        node.right, _ = self._delete_recursive(node.right, successor.val)
        self.size += 1 # Adjust since we decremented above
        return node, True

def _find_min(self, node):
    """Find node with minimum value in subtree"""
    while node.left:
        node = node.left
    return node

def _find_max(self, node):
    """Find node with maximum value in subtree"""
    while node.right:
        node = node.right
    return node

def find_min_value(self):
    """Public interface to find minimum value"""
    if not self.root:
        return None
    return self._find_min(self.root).val

def find_max_value(self):
    """Public interface to find maximum value"""
    if not self.root:
        return None
    return self._find_max(self.root).val

def floor(self, val):
    """
    Find largest value <= val (floor)

    Algorithm:
    1. If current node value == val, return it
    2. If current node value > val, go left
    3. If current node value < val, it's potential floor, go right
    """
    return self._floor_recursive(self.root, val)

def _floor_recursive(self, node, val):
    if not node:
        return None

    if node.val == val:
        return node.val

    if node.val > val:
        return self._floor_recursive(node.left, val)

```

```

    # node.val < val, potential floor
    floor_right = self._floor_recursive(node.right, val)
    return floor_right if floor_right is not None else node.val

def ceiling(self, val):
    """
    Find smallest value >= val (ceiling)

    Algorithm:
    1. If current node value == val, return it
    2. If current node value < val, go right
    3. If current node value > val, it's potential ceiling, go left
    """
    return self._ceiling_recursive(self.root, val)

def _ceiling_recursive(self, node, val):
    if not node:
        return None

    if node.val == val:
        return node.val

    if node.val < val:
        return self._ceiling_recursive(node.right, val)

    # node.val > val, potential ceiling
    ceiling_left = self._ceiling_recursive(node.left, val)
    return ceiling_left if ceiling_left is not None else node.val

def kth_smallest(self, k):
    """
    Find kth smallest element (1-indexed)

    Uses inorder traversal property of BST
    Time: O(k) in best case, O(n) worst case
    """
    def inorder_kth(node):
        nonlocal k, result

        if not node or k <= 0:
            return

        inorder_kth(node.left)

        k -= 1
        if k == 0:
            result = node.val
            return

        inorder_kth(node.right)

    result = None
    inorder_kth(self.root)
    return result

def kth_largest(self, k):

```

```

"""Find kth largest element using reverse inorder"""
def reverse_inorder(node):
    nonlocal k, result

    if not node or k <= 0:
        return

    reverse_inorder(node.right)

    k -= 1
    if k == 0:
        result = node.val
        return

    reverse_inorder(node.left)

result = None
reverse_inorder(self.root)
return result

def range_query(self, low, high):
    """
    Find all values in range [low, high]

    Optimized: only visit nodes that could contain values in range
    """
    result = []

    def range_search(node):
        if not node:
            return

        # If current value is in range, add it
        if low <= node.val <= high:
            result.append(node.val)

        # Recursively search left if there could be values in range
        if node.val > low:
            range_search(node.left)

        # Recursively search right if there could be values in range
        if node.val < high:
            range_search(node.right)

    range_search(self.root)
    return sorted(result)

def is_valid_bst(self, min_val=float('-inf'), max_val=float('inf')):
    """
    Validate BST property

    Each node must satisfy: min_val < node.val < max_val
    """
    def validate(node, min_val, max_val):
        if not node:
            return True

```

```

        if node.val <= min_val or node.val >= max_val:
            return False

        return (validate(node.left, min_val, node.val) and
                validate(node.right, node.val, max_val))

    return validate(self.root, min_val, max_val)

def inorder_traversal(self):
    """Get sorted sequence (inorder traversal of BST)"""
    result = []

    def inorder(node):
        if node:
            inorder(node.left)
            result.append(node.val)
            inorder(node.right)

    inorder(self.root)
    return result

def get_height(self):
    """Calculate height of BST"""
    def height(node):
        if not node:
            return -1
        return 1 + max(height(node.left), height(node.right))

    return height(self.root)

def get_statistics(self):
    """Get comprehensive BST statistics"""
    if not self.root:
        return {
            'size': 0,
            'height': -1,
            'min': None,
            'max': None,
            'is_balanced': True,
            'is_valid': True
        }

    return {
        'size': self.size,
        'height': self.get_height(),
        'min': self.find_min_value(),
        'max': self.find_max_value(),
        'is_balanced': self._is_balanced(),
        'is_valid': self.is_valid_bst(),
        'inorder': self.inorder_traversal()
    }

def _is_balanced(self):
    """Check if BST is height-balanced"""
    def check_balance(node):

```

```

        if not node:
            return True, -1

        left_balanced, left_height = check_balance(node.left)
        if not left_balanced:
            return False, 0

        right_balanced, right_height = check_balance(node.right)
        if not right_balanced:
            return False, 0

        height = 1 + max(left_height, right_height)
        balanced = abs(left_height - right_height) <= 1

        return balanced, height

    is_balanced, _ = check_balance(self.root)
    return is_balanced

```

BST Construction from Traversals

[208]

Build BST from Preorder

```

def build_bst_from_preorder(preorder):
    """
    Build BST from preorder traversal

    Key insight: Use min/max bounds to determine valid positions
    Time: O(n), Space: O(n)
    """
    if not preorder:
        return None

    def build(min_val, max_val):
        nonlocal idx

        if idx >= len(preorder):
            return None

        val = preorder[idx]
        if val < min_val or val > max_val:
            return None

        idx += 1
        root = TreeNode(val)
        root.left = build(min_val, val)
        root.right = build(val, max_val)
        return root

    idx = 0
    return build(float('-inf'), float('inf'))

```

```

def build_tree_from_preorder_inorder(preorder, inorder):
    """
    Build tree from preorder and inorder traversals

    Algorithm:
    1. First element of preorder is root
    2. Find root position in inorder
    3. Left part of inorder = left subtree
    4. Right part of inorder = right subtree
    5. Recursively build subtrees
    """
    if not preorder or not inorder:
        return None

    # Create root from first preorder element
    root_val = preorder[0]
    root = TreeNode(root_val)

    # Find root position in inorder
    root_idx = inorder.index(root_val)

    # Build left subtree
    left_inorder = inorder[:root_idx]
    left_preorder = preorder[1:1 + len(left_inorder)]
    root.left = build_tree_from_preorder_inorder(left_preorder, left_inorder)

    # Build right subtree
    right_inorder = inorder[root_idx + 1:]
    right_preorder = preorder[1 + len(left_inorder):]
    root.right = build_tree_from_preorder_inorder(right_preorder, right_inorder)

    return root

```

Chapter 6: Balanced Trees (AVL & Red-Black Trees)

[203] [207] [209]

6.1 AVL Trees (Complete Implementation)

AVL Tree Theory

Definition: A self-balancing BST where heights of left and right subtrees differ by at most 1.

Balance Factor: $BF(\text{node}) = \text{height}(\text{left}) - \text{height}(\text{right})$

- $BF \in \{-1, 0, 1\}$ for all nodes
- If $|BF| > 1$, tree is unbalanced and needs rotation

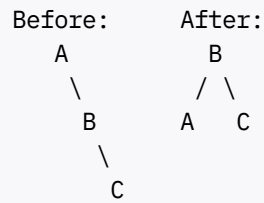
Height Guarantee: For AVL tree with n nodes:

- $\text{Height} \leq 1.44 \log_2(n + 2) - 0.328$
- This guarantees $O(\log n)$ operations

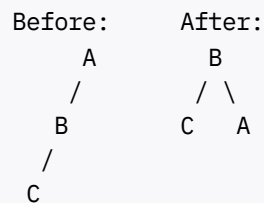
Rotation Theory and Implementation

Single Rotations

Left Rotation (RR Case):

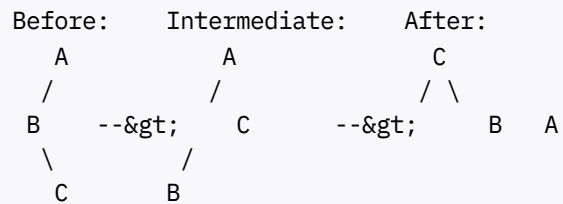


Right Rotation (LL Case):

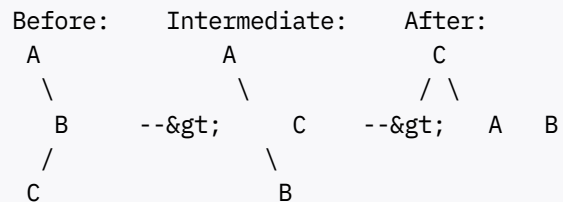


Double Rotations

Left-Right Rotation (LR Case):



Right-Left Rotation (RL Case):



Complete AVL Tree Implementation

```
class AVLNode:
    def __init__(self, val):
        self.val = val
        self.left = None
        self.right = None
        self.height = 1 # Height of subtree rooted at this node
```



```

class AVLTree:
    """
    Complete AVL Tree implementation with detailed explanations
    """

    def __init__(self):
        self.root = None
        self.size = 0

    def get_height(self, node):
        """Get height of node (0 for None)"""
        return node.height if node else 0

    def get_balance_factor(self, node):
        """Calculate balance factor: height(left) - height(right)"""
        if not node:
            return 0
        return self.get_height(node.left) - self.get_height(node.right)

    def update_height(self, node):
        """Update height based on children heights"""
        if node:
            node.height = 1 + max(self.get_height(node.left),
                                   self.get_height(node.right))

    def right_rotate(self, y):
        """
        Right rotation (LL case)

        Before:      After:
          y          x
         / \        / \
        x   T3      T1  y
       / \      / \
      T1  T2    T2  T3

        Time: O(1), maintains BST property
        """
        x = y.left
        T2 = x.right

        # Perform rotation
        x.right = y
        y.left = T2

        # Update heights (order matters!)
        self.update_height(y)
        self.update_height(x)

        return x # New root of subtree

    def left_rotate(self, x):
        """
        Left rotation (RR case)

```

Before: After:

```

      x              y
     / \            / \
    T1  y          x   T3
       / \        / \
      T2  T3      T1  T2
  """

```

```

y = x.right
T2 = y.left

```

```

# Perform rotation

```

```

y.left = x
x.right = T2

```

```

# Update heights
self.update_height(x)
self.update_height(y)

```

```

return y # New root of subtree

```

```

def insert(self, val):
    """Insert value maintaining AVL property"""
    self.root = self._insert_recursive(self.root, val)

```

```

def _insert_recursive(self, node, val):
    """

```

```

    Recursive insertion with rebalancing

```

```

    Algorithm:

```

1. Perform normal BST insertion
 2. Update height
 3. Get balance factor
 4. Perform rotations if needed
- ```

 """

```

```

Step 1: Perform normal BST insertion

```

```

if not node:
 self.size += 1
 return AVLNode(val)

```

```

if val < node.val:
 node.left = self._insert_recursive(node.left, val)
elif val > node.val:
 node.right = self._insert_recursive(node.right, val)
else:
 return node # Duplicate values not allowed

```

```

Step 2: Update height of current node
self.update_height(node)

```

```

Step 3: Get balance factor
balance = self.get_balance_factor(node)

```

```

Step 4: If unbalanced, there are 4 cases

```

```

Left Left Case

```

```

 if balance > 1 and val < node.left.val:
 return self.right_rotate(node)

 # Right Right Case
 if balance < -1 and val > node.right.val:
 return self.left_rotate(node)

 # Left Right Case
 if balance > 1 and val > node.left.val:
 node.left = self.left_rotate(node.left)
 return self.right_rotate(node)

 # Right Left Case
 if balance < -1 and val < node.right.val:
 node.right = self.right_rotate(node.right)
 return self.left_rotate(node)

 # Return unchanged node if balanced
 return node

def delete(self, val):
 """Delete value maintaining AVL property"""
 self.root = self._delete_recursive(self.root, val)

def _delete_recursive(self, node, val):
 """Recursive deletion with rebalancing"""

 # Step 1: Perform normal BST deletion
 if not node:
 return node

 if val < node.val:
 node.left = self._delete_recursive(node.left, val)
 elif val > node.val:
 node.right = self._delete_recursive(node.right, val)
 else:
 # Node to be deleted found
 self.size -= 1

 if not node.left or not node.right:
 temp = node.left if node.left else node.right

 if not temp: # No child case
 temp = node
 node = None
 else: # One child case
 node = temp

 else:
 # Two children case
 temp = self._find_min_node(node.right)
 node.val = temp.val
 node.right = self._delete_recursive(node.right, temp.val)
 self.size += 1 # Adjust count

 if not node:
 return node

```

```

Step 2: Update height
self.update_height(node)

Step 3: Get balance factor
balance = self.get_balance_factor(node)

Step 4: Rebalance if needed

Left Left Case
if balance > 1 and self.get_balance_factor(node.left) >= 0:
 return self.right_rotate(node)

Left Right Case
if balance > 1 and self.get_balance_factor(node.left) < 0:
 node.left = self.left_rotate(node.left)
 return self.right_rotate(node)

Right Right Case
if balance < -1 and self.get_balance_factor(node.right) <= 0:
 return self.left_rotate(node)

Right Left Case
if balance < -1 and self.get_balance_factor(node.right) > 0:
 node.right = self.right_rotate(node.right)
 return self.left_rotate(node)

return node

def _find_min_node(self, node):
 """Find minimum node in subtree"""
 while node.left:
 node = node.left
 return node

def search(self, val):
 """Search for value (same as BST)"""
 current = self.root

 while current:
 if val == current.val:
 return current
 elif val < current.val:
 current = current.left
 else:
 current = current.right

 return None

def is_balanced(self, node=None):
 """Check if tree is balanced (for verification)"""
 if node is None:
 node = self.root

 if not node:
 return True

```

```

 balance = self.get_balance_factor(node)

 return (abs(balance) <= 1 and
 self.is_balanced(node.left) and
 self.is_balanced(node.right))

 def get_tree_info(self):
 """Get comprehensive tree information"""
 def get_node_info(node, level=0):
 if not node:
 return []

 info = [{
 'val': node.val,
 'level': level,
 'height': node.height,
 'balance_factor': self.get_balance_factor(node),
 'left_child': node.left.val if node.left else None,
 'right_child': node.right.val if node.right else None
 }]

 info.extend(get_node_info(node.left, level + 1))
 info.extend(get_node_info(node.right, level + 1))

 return info

 return {
 'size': self.size,
 'height': self.get_height(self.root),
 'is_balanced': self.is_balanced(),
 'nodes': get_node_info(self.root)
 }

```

## AVL Tree Complexity Analysis

| Operation | Time Complexity | Space Complexity | Notes                         |
|-----------|-----------------|------------------|-------------------------------|
| Search    | $O(\log n)$     | $O(\log n)$      | Guaranteed balanced           |
| Insert    | $O(\log n)$     | $O(\log n)$      | At most 2 rotations           |
| Delete    | $O(\log n)$     | $O(\log n)$      | At most $O(\log n)$ rotations |
| Height    | $O(1)$          | $O(1)$           | Stored in each node           |

### Rotation Analysis:

- Single rotation:  $O(1)$  time, changes 2 nodes
- Double rotation:  $O(1)$  time, changes 3 nodes
- Maximum rotations per insertion: 2
- Maximum rotations per deletion:  $O(\log n)$

# Chapter 7: Heap Data Structures (Complete Theory & Applications)

[201] [202]

## 7.1 Heap Theory and Mathematical Properties

### Heap Definition

A **heap** is a complete binary tree that satisfies the heap property:

- **Min Heap:** For every node,  $\text{parent} \leq \text{children}$
- **Max Heap:** For every node,  $\text{parent} \geq \text{children}$

### Mathematical Properties

**Shape Property** (Complete Binary Tree):

- All levels filled except possibly last
- Last level filled left to right
- Height =  $\lfloor \log_2(n) \rfloor$

**Array Representation Formulas:**

For node at index  $i$  (0-based):

- Parent:  $(i-1)/2$
- Left child:  $2i+1$
- Right child:  $2i+2$

For node at index  $i$  (1-based):

- Parent:  $i/2$
- Left child:  $2i$
- Right child:  $2i+1$

**Heap Height Analysis:**

- Minimum height:  $\lfloor \log_2(n) \rfloor$  (complete tree)
- Maximum nodes at height  $h$ :  $\lceil n/2^{(h+1)} \rceil$

### Complete Heap Implementation

```
class MinHeapComplete:
 """
 Complete Min Heap implementation with detailed analysis
 """

 def __init__(self, capacity=None):
 self.heap = []
 self.size = 0
 self.capacity = capacity
 self.comparison_count = 0 # For analysis
```

```

def parent_index(self, i):
 """Get parent index. Math: (i-1)//2"""
 return (i - 1) // 2 if i > 0 else None

def left_child_index(self, i):
 """Get left child index. Math: 2*i + 1"""
 left = 2 * i + 1
 return left if left < self.size else None

def right_child_index(self, i):
 """Get right child index. Math: 2*i + 2"""
 right = 2 * i + 2
 return right if right < self.size else None

def has_left_child(self, i):
 return self.left_child_index(i) is not None

def has_right_child(self, i):
 return self.right_child_index(i) is not None

def has_parent(self, i):
 return self.parent_index(i) is not None

def left_child_value(self, i):
 return self.heap[self.left_child_index(i)]

def right_child_value(self, i):
 return self.heap[self.right_child_index(i)]

def parent_value(self, i):
 return self.heap[self.parent_index(i)]

def insert(self, val):
 """
 Insert value maintaining heap property

 Algorithm:
 1. Add element at end (maintain complete tree)
 2. Bubble up to restore heap property

 Time: O(log n) - height of tree
 Space: O(1) - no additional space
 """
 if self.capacity and self.size >= self.capacity:
 raise OverflowError("Heap is full")

 # Step 1: Add at end
 self.heap.append(val)
 self.size += 1

 # Step 2: Bubble up
 self._heapify_up(self.size - 1)

def _heapify_up(self, index):
 """

```

```

Restore heap property by moving element up

Invariant: heap property satisfied except possibly at index
"""
steps = [] # For debugging/visualization

while self.has_parent(index):
 parent_idx = self.parent_index(index)
 self.comparison_count += 1

 if self.heap[index] >= self.heap[parent_idx]:
 break # Heap property satisfied

 # Swap with parent
 steps.append(f"Swapping {self.heap[index]} with parent {self.heap[parent_idx]}")
 self.heap[index], self.heap[parent_idx] = self.heap[parent_idx], self.heap[index]
 index = parent_idx

return steps

def extract_min(self):
 """
 Remove and return minimum element (root)

 Algorithm:
 1. Save root value
 2. Move last element to root
 3. Remove last element
 4. Bubble down from root

 Time: O(log n)
 Space: O(1)
 """
 if self.size == 0:
 raise IndexError("Heap is empty")

 # Step 1: Save min value
 min_val = self.heap[0]

 # Step 2: Move last to root
 self.heap[0] = self.heap[self.size - 1]

 # Step 3: Remove last
 self.size -= 1
 self.heap.pop()

 # Step 4: Bubble down if heap not empty
 if self.size > 0:
 self._heapify_down(0)

 return min_val

def _heapify_down(self, index):
 """
 Restore heap property by moving element down

```



```

Algorithm:
1. Compare with children
2. Swap with smaller child if necessary
3. Continue until heap property restored
"""
steps = []

while self.has_left_child(index):
 # Find smaller child
 smaller_child_idx = self.left_child_index(index)

 if (self.has_right_child(index) and
 self.right_child_value(index) < self.left_child_value(index)):
 smaller_child_idx = self.right_child_index(index)

 self.comparison_count += 1

 # If heap property satisfied, stop
 if self.heap[index] <= self.heap[smaller_child_idx]:
 break

 # Swap with smaller child
 steps.append(f"Swapping {self.heap[index]} with child {self.heap[smaller_child_idx]}")
 self.heap[index], self.heap[smaller_child_idx] = \
 self.heap[smaller_child_idx], self.heap[index]
 index = smaller_child_idx

return steps

def peek(self):
 """Get minimum without removing. Time: O(1)"""
 if self.size == 0:
 raise IndexError("Heap is empty")
 return self.heap[0]

def build_heap(self, arr):
 """
 Build heap from array using Floyd's algorithm

 Time: O(n) - better than n insertions O(n log n)

 Algorithm:
 1. Copy array
 2. Start from last non-leaf node
 3. Heapify down for each node
 """
 self.heap = arr[:]
 self.size = len(arr)
 self.comparison_count = 0

 # Start from last non-leaf: (n-2)//2 down to 0
 for i in range((self.size - 2) // 2, -1, -1):
 self._heapify_down(i)

def increase_key(self, index, new_val):
 """

```

```

 Increase value at index (for min heap, may need to bubble down)
 """
 if index >= self.size:
 raise IndexError("Index out of range")

 old_val = self.heap[index]
 self.heap[index] = new_val

 if new_val < old_val:
 self._heapify_up(index)
 elif new_val > old_val:
 self._heapify_down(index)

 def delete(self, index):
 """Delete element at specific index"""
 if index >= self.size:
 raise IndexError("Index out of range")

 # Move last element to deleted position
 self.heap[index] = self.heap[self.size - 1]
 self.size -= 1
 self.heap.pop()

 if index < self.size:
 parent_idx = self.parent_index(index)

 # Decide whether to bubble up or down
 if (parent_idx is not None and
 self.heap[index] < self.heap[parent_idx]):
 self._heapify_up(index)
 else:
 self._heapify_down(index)

 def is_valid_heap(self):
 """Verify heap property"""
 for i in range(self.size):
 left_idx = self.left_child_index(i)
 right_idx = self.right_child_index(i)

 if left_idx and self.heap[i] > self.heap[left_idx]:
 return False
 if right_idx and self.heap[i] > self.heap[right_idx]:
 return False

 return True

 def get_statistics(self):
 """Get heap statistics"""
 import math

 return {
 'size': self.size,
 'height': int(math.log2(self.size)) if self.size > 0 else -1,
 'min_value': self.peak() if self.size > 0 else None,
 'is_valid': self.is_valid_heap(),
 'comparisons_made': self.comparison_count,

```

```

 'array_representation': self.heap[:]
 }

class MaxHeap(MinHeapComplete):
 """Max Heap implementation - inherits from MinHeap but reverses comparisons"""

 def _heapify_up(self, index):
 steps = []

 while self.has_parent(index):
 parent_idx = self.parent_index(index)
 self.comparison_count += 1

 # Reversed comparison for max heap
 if self.heap[index] <= self.heap[parent_idx]:
 break

 steps.append(f"Swapping {self.heap[index]} with parent {self.heap[parent_idx]}")
 self.heap[index], self.heap[parent_idx] = self.heap[parent_idx], self.heap[index]
 index = parent_idx

 return steps

 def _heapify_down(self, index):
 steps = []

 while self.has_left_child(index):
 # Find larger child for max heap
 larger_child_idx = self.left_child_index(index)

 if (self.has_right_child(index) and
 self.right_child_value(index) > self.left_child_value(index)):
 larger_child_idx = self.right_child_index(index)

 self.comparison_count += 1

 # Reversed comparison for max heap
 if self.heap[index] >= self.heap[larger_child_idx]:
 break

 steps.append(f"Swapping {self.heap[index]} with child {self.heap[larger_child_idx]}")
 self.heap[index], self.heap[larger_child_idx] = \
 self.heap[larger_child_idx], self.heap[index]
 index = larger_child_idx

 return steps

 def extract_max(self):
 """Extract maximum element"""
 return self.extract_min() # Same algorithm, different comparisons

 def peek_max(self):
 """Get maximum without removing"""
 return self.peak()

```

# Heap Applications

## Priority Queue Implementation

```
class PriorityQueue:
 """Priority Queue using heap"""

 def __init__(self, min_heap=True):
 self.heap = MinHeapComplete() if min_heap else MaxHeap()
 self.min_heap = min_heap

 def enqueue(self, item, priority):
 """Add item with priority"""
 # For min heap: lower number = higher priority
 # For max heap: higher number = higher priority
 if self.min_heap:
 self.heap.insert((priority, item))
 else:
 self.heap.insert((-priority, item)) # Negate for max heap

 def dequeue(self):
 """Remove highest priority item"""
 if self.heap.size == 0:
 raise IndexError("Priority queue is empty")

 priority, item = self.heap.extract_min()
 if not self.min_heap:
 priority = -priority

 return item, priority

 def peek(self):
 """Get highest priority item without removing"""
 if self.heap.size == 0:
 raise IndexError("Priority queue is empty")

 priority, item = self.heap.peek()
 if not self.min_heap:
 priority = -priority

 return item, priority

Usage examples
def heap_sort(arr):
 """Sort array using heap sort algorithm"""
 # Build max heap
 heap = MaxHeap()
 heap.build_heap(arr[:])

 result = []
 while heap.size > 0:
 result.append(heap.extract_max())

 return result
```

```

def find_k_largest(arr, k):
 """Find k largest elements using min heap"""
 if k > len(arr):
 return arr

 # Use min heap of size k
 heap = MinHeapComplete()

 for num in arr:
 if heap.size < k:
 heap.insert(num)
 elif num > heap.peek():
 heap.extract_min()
 heap.insert(num)

 return [heap.extract_min() for _ in range(heap.size)][::-1]

def merge_k_sorted_arrays(arrays):
 """Merge k sorted arrays using min heap"""
 heap = MinHeapComplete()
 result = []

 # Initialize heap with first element from each array
 for i, arr in enumerate(arrays):
 if arr:
 heap.insert((arr[0], i, 0)) # (value, array_index, element_index)

 while heap.size > 0:
 val, arr_idx, elem_idx = heap.extract_min()
 result.append(val)

 # Add next element from same array if exists
 if elem_idx + 1 < len(arrays[arr_idx]):
 next_val = arrays[arr_idx][elem_idx + 1]
 heap.insert((next_val, arr_idx, elem_idx + 1))

 return result

```

## Chapter 8: Trie & Prefix Trees (Complete Implementation)

[212] [213]

### 8.1 Trie Theory and Applications

#### Trie Definition

A **Trie** (prefix tree) is a tree-like data structure for storing strings where:

- Each node represents a character
- Each path from root to node represents a prefix
- Complete words are marked with special flag

## Mathematical Properties

**Space Complexity:**  $O(\text{ALPHABET\_SIZE} \times N \times M)$

- $N$  = number of strings
- $M$  = average length of strings
- $\text{ALPHABET\_SIZE}$  = size of character set

**Time Complexities:**

- Insert:  $O(M)$  where  $M$  = string length
- Search:  $O(M)$
- Delete:  $O(M)$
- Prefix search:  $O(P)$  where  $P$  = prefix length

## Complete Trie Implementation

```
class TrieNodeComplete:
 """
 Trie node with comprehensive features
 """
 def __init__(self):
 self.children = {} # Character -> TrieNode mapping
 self.is_end_of_word = False
 self.word_count = 0 # How many times this word appears
 self.prefix_count = 0 # How many words pass through this node
 self.word = None # Store complete word for easy retrieval

 def __repr__(self):
 return f"TrieNode(end={self.is_end_of_word}, children={len(self.children)})"

class TrieComplete:
 """
 Complete Trie implementation with all operations and optimizations
 """

 def __init__(self):
 self.root = TrieNodeComplete()
 self.total_words = 0
 self.total_unique_words = 0

 def insert(self, word):
 """
 Insert word into trie

 Algorithm:
 1. Start from root
 2. For each character, move to child (create if needed)
 3. Mark end of word
 4. Update counters

 Time: $O(M)$ where M = length of word
 Space: $O(M)$ in worst case (all new characters)
 """
```

```

"""
if not word:
 return

node = self.root

Traverse/create path for each character
for char in word:
 if char not in node.children:
 node.children[char] = TrieNodeComplete()

 node = node.children[char]
 node.prefix_count += 1 # Increment prefix counter

Mark end of word
if not node.is_end_of_word:
 self.total_unique_words += 1

node.is_end_of_word = True
node.word_count += 1
node.word = word # Store complete word
self.total_words += 1

def search(self, word):
 """
 Search for exact word in trie

 Returns: True if word exists, False otherwise
 Time: O(M)
 """
 node = self._find_node(word)
 return node is not None and node.is_end_of_word

def starts_with(self, prefix):
 """
 Check if any word starts with given prefix

 Returns: True if prefix exists, False otherwise
 Time: O(P) where P = length of prefix
 """
 return self._find_node(prefix) is not None

def _find_node(self, word):
 """
 Helper method to find node corresponding to word/prefix

 Returns: TrieNode if path exists, None otherwise
 """
 node = self.root

 for char in word:
 if char not in node.children:
 return None
 node = node.children[char]

 return node

```

```

def delete(self, word):
 """
 Delete word from trie

 Algorithm:
 1. Find the word
 2. Decrement counters
 3. Remove nodes if they're no longer needed

 Time: O(M)
 Returns: True if word was deleted, False if not found
 """
 def _delete_recursive(node, word, index):
 if index == len(word):
 # End of word reached
 if not node.is_end_of_word:
 return False # Word doesn't exist

 # Mark as not end of word
 node.is_end_of_word = False
 node.word_count -= 1

 # Return True if this node can be deleted
 # (no other words pass through it)
 return len(node.children) == 0 and node.word_count == 0

 char = word[index]
 child_node = node.children.get(char)

 if not child_node:
 return False # Word doesn't exist

 # Recursively delete
 should_delete_child = _delete_recursive(child_node, word, index + 1)

 if should_delete_child:
 del node.children[char]
 # Return True if current node can also be deleted
 return (not node.is_end_of_word and
 len(node.children) == 0 and
 node.word_count == 0)

 return False

 if self.search(word):
 _delete_recursive(self.root, word, 0)
 self.total_words -= 1
 self.total_unique_words -= 1
 return True

 return False

def get_all_words_with_prefix(self, prefix):
 """
 Get all words that start with given prefix

```



Algorithm:

1. Find node corresponding to prefix
2. DFS from that node to collect all words

Time:  $O(P + N)$  where  $P$  = prefix length,  $N$  = number of results

"""

```
prefix_node = self._find_node(prefix)
```

```
if not prefix_node:
```

```
 return []
```

```
words = []
```

```
self._collect_all_words(prefix_node, prefix, words)
```

```
return words
```

```
def _collect_all_words(self, node, current_word, words):
```

"""

DFS helper to collect all words from a subtree

"""

```
if node.is_end_of_word:
```

```
 words.append(current_word)
```

```
for char, child_node in sorted(node.children.items()):
```

```
 self._collect_all_words(child_node, current_word + char, words)
```

```
def auto_complete(self, prefix, max_suggestions=10):
```

"""

Get autocomplete suggestions for given prefix

Returns: List of suggested words (limited by max\_suggestions)

"""

```
suggestions = self.get_all_words_with_prefix(prefix)
```

```
Sort by frequency (word_count) if available
```

```
suggestions.sort(key=lambda word: self._find_node(word).word_count, reverse=True)
```

```
return suggestions[:max_suggestions]
```

```
def count_words_with_prefix(self, prefix):
```

"""

Count how many words start with given prefix

Uses prefix\_count for  $O(P)$  time complexity

"""

```
node = self._find_node(prefix)
```

```
return node.prefix_count if node else 0
```

```
def longest_common_prefix(self):
```

"""

Find longest common prefix of all words in trie

Algorithm:

1. Start from root
2. While there's only one child and it's not end of word
3. Continue building prefix

"""

```

 if self.total_unique_words == 0:
 return ""

 prefix = ""
 node = self.root

 while (len(node.children) == 1 and
 not node.is_end_of_word):
 char = next(iter(node.children))
 prefix += char
 node = node.children[char]

 return prefix

def find_shortest_unique_prefix(self, word):
 """
 Find shortest unique prefix for given word

 Returns: Shortest prefix that uniquely identifies the word
 """
 if not self.search(word):
 return None

 node = self.root
 prefix = ""

 for char in word:
 prefix += char
 node = node.children[char]

 # If this node has only one word passing through it,
 # then current prefix is unique
 if node.prefix_count == 1:
 return prefix

 return word # Entire word is needed

def word_break(self, s):
 """
 Check if string s can be segmented using words in trie

 Dynamic Programming approach with trie optimization
 Time: $O(N^2)$ where N = length of string
 """
 n = len(s)
 dp = [False] * (n + 1)
 dp[0] = True # Empty string can always be segmented

 for i in range(1, n + 1):
 for j in range(i):
 if dp[j] and self.search(s[j:i]):
 dp[i] = True
 break

 return dp[n]

```

```

def get_statistics(self):
 """Get comprehensive trie statistics"""
 def calculate_stats(node, depth=0):
 stats = {
 'nodes': 1,
 'max_depth': depth,
 'total_depth': depth,
 'leaf_nodes': 1 if len(node.children) == 0 else 0,
 'end_word_nodes': 1 if node.is_end_of_word else 0
 }

 for child in node.children.values():
 child_stats = calculate_stats(child, depth + 1)
 stats['nodes'] += child_stats['nodes']
 stats['max_depth'] = max(stats['max_depth'], child_stats['max_depth'])
 stats['total_depth'] += child_stats['total_depth']
 stats['leaf_nodes'] += child_stats['leaf_nodes']
 stats['end_word_nodes'] += child_stats['end_word_nodes']

 return stats

 stats = calculate_stats(self.root)

 return {
 'total_words': self.total_words,
 'unique_words': self.total_unique_words,
 'total_nodes': stats['nodes'],
 'max_depth': stats['max_depth'],
 'average_depth': stats['total_depth'] / stats['nodes'] if stats['nodes'] > 0 else 0,
 'leaf_nodes': stats['leaf_nodes'],
 'end_word_nodes': stats['end_word_nodes'],
 'longest_common_prefix': self.longest_common_prefix()
 }

def visualize(self, max_depth=3):
 """
 Create a visual representation of trie structure
 """
 def _visualize_recursive(node, prefix="", depth=0, is_last=True):
 if depth > max_depth:
 return ["... (truncated)"]

 lines = []

 # Current node representation
 connector = "└─ " if is_last else "├─ "
 if depth == 0:
 lines.append("ROOT")
 else:
 char = prefix[-1] if prefix else ""
 end_marker = " (END)" if node.is_end_of_word else ""
 count_info = f" [{node.prefix_count}]" if node.prefix_count > 0 else ""
 lines.append(connector + char + end_marker + count_info)

 # Children
 children = list(node.children.items())

```

```

 for i, (char, child) in enumerate(children):
 is_last_child = (i == len(children) - 1)
 extension = " " if is_last else "|"
 child_lines = _visualize_recursive(child, prefix + char, depth + 1, is_last)

 for j, line in enumerate(child_lines):
 if j == 0:
 lines.append(extension + line)
 else:
 lines.append(extension + line)

 return lines

 return "\n".join(_visualize_recursive(self.root))

```

## Trie Applications and Advanced Algorithms

### Word Games and Dictionary Operations

```

class TrieWordGame(TrieComplete):
 """Trie optimized for word games like Scrabble, Boggle"""

 def find_anagrams(self, word):
 """Find all anagrams of given word in trie"""
 from collections import Counter

 target_count = Counter(word)
 anagrams = []

 def dfs(node, path, remaining_count):
 if node.is_end_of_word and not any(remaining_count.values()):
 anagrams.append(path)

 for char, child in node.children.items():
 if remaining_count.get(char, 0) > 0:
 remaining_count[char] -= 1
 dfs(child, path + char, remaining_count)
 remaining_count[char] += 1

 dfs(self.root, "", target_count.copy())
 return anagrams

 def boggle_solver(self, board, min_word_length=3):
 """Solve Boggle game using trie"""
 if not board or not board[0]:
 return []

 rows, cols = len(board), len(board[0])
 found_words = set()

 def dfs(row, col, node, path, visited):
 if (row < 0 or row >= rows or col < 0 or col >= cols or
 (row, col) in visited):
 return

 char = board[row][col]
 if char not in node.children:
 return

 child = node.children[char]
 new_path = path + char
 if child.is_end_of_word and len(new_path) >= min_word_length:
 found_words.add(new_path)

 visited.add((row, col))
 dfs(row, col, child, new_path, visited)
 visited.remove((row, col))

 dfs(0, 0, self.root, "", set())
 return found_words

```

```

 char = board[row][col].lower()
 if char not in node.children:
 return

 next_node = node.children[char]
 new_path = path + char
 visited.add((row, col))

 # Check if we found a word
 if (next_node.is_end_of_word and
 len(new_path) >= min_word_length):
 found_words.add(new_path)

 # Explore all 8 directions
 for dr, dc in [(-1,-1), (-1,0), (-1,1), (0,-1), (0,1), (1,-1), (1,0), (1,1)]:
 dfs(row + dr, col + dc, next_node, new_path, visited)

 visited.remove((row, col))

 # Try starting from each cell
 for i in range(rows):
 for j in range(cols):
 dfs(i, j, self.root, "", set())

 return sorted(list(found_words))

def spell_checker(self, word, max_distance=2):
 """Find words within edit distance using trie"""
 suggestions = []

 def dfs(node, target, current_word, current_row):
 if len(current_row) > max_distance + 1:
 return

 if node.is_end_of_word and current_row[-1] <= max_distance:
 suggestions.append((current_word, current_row[-1]))

 for char, child_node in node.children.items():
 new_word = current_word + char
 new_row = [current_row[0] + 1]

 for i in range(1, len(target) + 1):
 if char == target[i-1]:
 new_row.append(current_row[i-1])
 else:
 new_row.append(min(
 current_row[i] + 1, # deletion
 new_row[i-1] + 1, # insertion
 current_row[i-1] + 1 # substitution
))

 if min(new_row) <= max_distance:
 dfs(child_node, target, new_word, new_row)

 first_row = list(range(len(word) + 1))

```

```

dfs(self.root, word, "", first_row)

Sort by edit distance, then alphabetically
suggestions.sort(key=lambda x: (x[1], x[0]))
return [word for word, _ in suggestions]

```

## Chapter 9: Advanced Trees (Segment & Fenwick Trees)

[215] [216]

### 9.1 Segment Tree (Complete Implementation)

#### Segment Tree Theory

**Purpose:** Efficiently answer range queries and perform range updates on arrays.

**Structure:**

- Complete binary tree built on top of array
- Each node stores information about a segment [l, r]
- Leaves represent single elements
- Internal nodes represent union of children segments

**Key Properties:**

- Height:  $O(\log n)$
- Total nodes:  $\leq 4n$  (practical bound)
- Space complexity:  $O(4n)$

[216]

#### Complete Segment Tree Implementation

```

class SegmentTreeComplete:
 """
 Complete Segment Tree implementation supporting multiple operations
 """

 def __init__(self, arr, operation='sum'):
 """
 Initialize segment tree with array and operation type

 Args:
 arr: Input array
 operation: 'sum', 'min', 'max', 'gcd', 'xor'
 """
 self.n = len(arr)
 self.arr = arr[:]
 self.tree = [0] * (4 * self.n) # 4n space is sufficient
 self.lazy = [0] * (4 * self.n) # For lazy propagation

```

```

self.operation = operation

Define operation functions
self.ops = {
 'sum': (lambda x, y: x + y, 0),
 'min': (lambda x, y: min(x, y), float('inf')),
 'max': (lambda x, y: max(x, y), float('-inf')),
 'gcd': (self._gcd, 0),
 'xor': (lambda x, y: x ^ y, 0)
}

self.combine, self.identity = self.ops[operation]

Build the tree
self.build(1, 0, self.n - 1)

def _gcd(self, a, b):
 """Helper function for GCD operation"""
 while b:
 a, b = b, a % b
 return a

def build(self, node, start, end):
 """
 Build segment tree recursively

 Args:
 node: Current node index in tree
 start, end: Range [start, end] this node represents

 Time: O(n) - visit each array element exactly once
 """
 if start == end:
 # Leaf node
 self.tree[node] = self.arr[start]
 else:
 # Internal node
 mid = (start + end) // 2

 # Build left and right subtrees
 self.build(2 * node, start, mid)
 self.build(2 * node + 1, mid + 1, end)

 # Combine results from children
 self.tree[node] = self.combine(
 self.tree[2 * node],
 self.tree[2 * node + 1]
)

def update_point(self, node, start, end, idx, val):
 """
 Update single point in array

 Time: O(log n) - traverse path from root to leaf
 """
 if start == end:

```

```

 # Leaf node - update value
 self.arr[idx] = val
 self.tree[node] = val
 else:
 mid = (start + end) // 2

 if idx <= mid:
 # Update in left subtree
 self.update_point(2 * node, start, mid, idx, val)
 else:
 # Update in right subtree
 self.update_point(2 * node + 1, mid + 1, end, idx, val)

 # Recompute current node value
 self.tree[node] = self.combine(
 self.tree[2 * node],
 self.tree[2 * node + 1]
)

def query_range(self, node, start, end, l, r):
 """
 Query range [l, r]

 Returns: Result of operation on range [l, r]
 Time: O(log n) - at most 4 * log n nodes visited
 """
 if r < start or end < l:
 # No overlap
 return self.identity

 if l <= start and end <= r:
 # Complete overlap
 return self.tree[node]

 # Partial overlap - check both children
 mid = (start + end) // 2
 left_result = self.query_range(2 * node, start, mid, l, r)
 right_result = self.query_range(2 * node + 1, mid + 1, end, l, r)

 return self.combine(left_result, right_result)

def update_range_lazy(self, node, start, end, l, r, val):
 """
 Range update with lazy propagation

 Updates range [l, r] by adding val to each element
 Time: O(log n) amortized
 """
 # Apply pending lazy update if exists
 if self.lazy[node] != 0:
 if self.operation == 'sum':
 self.tree[node] += (end - start + 1) * self.lazy[node]
 else:
 # For other operations, lazy propagation needs modification
 self.tree[node] += self.lazy[node]

```



```

 # Propagate to children if not leaf
 if start != end:
 self.lazy[2 * node] += self.lazy[node]
 self.lazy[2 * node + 1] += self.lazy[node]

 self.lazy[node] = 0

 # No overlap
 if r < start or end < l:
 return

 # Complete overlap
 if l <= start and end <= r:
 if self.operation == 'sum':
 self.tree[node] += (end - start + 1) * val
 else:
 self.tree[node] += val

 # Mark children as lazy if not leaf
 if start != end:
 self.lazy[2 * node] += val
 self.lazy[2 * node + 1] += val

 return

 # Partial overlap
 mid = (start + end) // 2
 self.update_range_lazy(2 * node, start, mid, l, r, val)
 self.update_range_lazy(2 * node + 1, mid + 1, end, l, r, val)

 # Recompute current node (after handling lazy updates on children)
 self._push_down(2 * node, start, mid)
 self._push_down(2 * node + 1, mid + 1, end)

 self.tree[node] = self.combine(
 self.tree[2 * node],
 self.tree[2 * node + 1]
)

def _push_down(self, node, start, end):
 """Helper to push down lazy updates"""
 if self.lazy[node] != 0:
 if self.operation == 'sum':
 self.tree[node] += (end - start + 1) * self.lazy[node]
 else:
 self.tree[node] += self.lazy[node]

 if start != end:
 self.lazy[2 * node] += self.lazy[node]
 self.lazy[2 * node + 1] += self.lazy[node]

 self.lazy[node] = 0

def query_range_lazy(self, node, start, end, l, r):
 """Query with lazy propagation support"""
 self._push_down(node, start, end)

```

```

 if r < start or end < l:
 return self.identity

 if l <= start and end <= r:
 return self.tree[node]

 mid = (start + end) // 2
 left_result = self.query_range_lazy(2 * node, start, mid, l, r)
 right_result = self.query_range_lazy(2 * node + 1, mid + 1, end, l, r)

 return self.combine(left_result, right_result)

Public interface methods
def update(self, idx, val):
 """Public method to update single point"""
 self.update_point(1, 0, self.n - 1, idx, val)

def query(self, l, r):
 """Public method to query range"""
 return self.query_range(1, 0, self.n - 1, l, r)

def range_update(self, l, r, val):
 """Public method to update range (with lazy propagation)"""
 self.update_range_lazy(1, 0, self.n - 1, l, r, val)

def range_query(self, l, r):
 """Public method to query range (with lazy propagation)"""
 return self.query_range_lazy(1, 0, self.n - 1, l, r)

def get_tree_structure(self):
 """Visualize tree structure for debugging"""
 result = []

 def dfs(node, start, end, depth=0):
 if node >= len(self.tree):
 return

 indent = " " * depth
 if start == end:
 result.append(f"{indent}Node {node}: [{start}] = {self.tree[node]}")
 else:
 result.append(f"{indent}Node {node}: [{start},{end}] = {self.tree[node]}")

 if 2 * node < len(self.tree):
 mid = (start + end) // 2
 dfs(2 * node, start, mid, depth + 1)
 dfs(2 * node + 1, mid + 1, end, depth + 1)

 dfs(1, 0, self.n - 1)
 return "\n".join(result)

Specialized segment trees
class RangeMinimumQuery(SegmentTreeComplete):
 """Segment Tree optimized for Range Minimum Query"""

```

```

def __init__(self, arr):
 super().__init__(arr, 'min')

def find_min_in_range(self, l, r):
 """Find minimum element in range [l, r]"""
 return self.query(l, r)

def count_elements_less_than(self, l, r, threshold):
 """Count elements in range [l, r] that are less than threshold"""
 def count_recursive(node, start, end, l, r, threshold):
 if r < start or end < l:
 return 0

 if self.tree[node] >= threshold:
 return 0 # All elements in this range >= threshold

 if start == end:
 return 1 if self.tree[node] < threshold else 0

 mid = (start + end) // 2
 return (count_recursive(2 * node, start, mid, l, r, threshold) +
 count_recursive(2 * node + 1, mid + 1, end, l, r, threshold))

 return count_recursive(1, 0, self.n - 1, l, r, threshold)

class RangeSumQuery(SegmentTreeComplete):
 """Segment Tree optimized for Range Sum Query with updates"""

 def __init__(self, arr):
 super().__init__(arr, 'sum')

 def get_sum(self, l, r):
 """Get sum of elements in range [l, r]"""
 return self.query(l, r)

 def add_range(self, l, r, val):
 """Add val to all elements in range [l, r]"""
 self.range_update(l, r, val)

 def get_average(self, l, r):
 """Get average of elements in range [l, r]"""
 total_sum = self.query(l, r)
 count = r - l + 1
 return total_sum / count if count > 0 else 0

```

## 9.2 Fenwick Tree (Binary Indexed Tree)

[215]

# Fenwick Tree Theory

**Purpose:** Efficiently calculate prefix sums and handle point updates.

**Key Insight:** Use binary representation to determine responsibility of each index.

**Bit Magic:**

- $i \& (-i)$ : Isolates lowest set bit
- $i += i \& (-i)$ : Moves to next responsible index
- $i -= i \& (-i)$ : Moves to parent in query

**Advantages over Segment Tree:**

- Less memory:  $O(n)$  vs  $O(4n)$
- Simpler implementation
- Better constants

**Disadvantages:**

- Only works for invertible operations (sum, XOR)
- No range updates (without tricks)

## Complete Fenwick Tree Implementation

```
class FenwickTreeComplete:
 """
 Complete Binary Indexed Tree implementation with detailed analysis
 """

 def __init__(self, size_or_array):
 """
 Initialize Fenwick Tree

 Args:
 size_or_array: Either size of array or initial array
 """
 if isinstance(size_or_array, int):
 self.n = size_or_array
 self.tree = [0] * (self.n + 1) # 1-indexed
 self.original = [0] * (self.n + 1)
 else:
 arr = size_or_array
 self.n = len(arr)
 self.tree = [0] * (self.n + 1)
 self.original = [0] + arr[:] # Make 1-indexed

 # Build tree
 for i in range(1, self.n + 1):
 self.update(i - 1, arr[i - 1]) # Convert to 0-indexed for public API

 def update(self, idx, val):
 """
 Add val to element at index idx (0-indexed)
 """
```

Algorithm:

1. Convert to 1-indexed
2. While within bounds:
  - a. Add val to current position
  - b. Move to next responsible position using bit magic

Time:  $O(\log n)$

Space:  $O(1)$

"""

idx += 1 # Convert to 1-indexed

delta = val - (self.original[idx] if idx <= len(self.original) - 1 else 0)

```
if idx < len(self.original):
 self.original[idx] += delta
```

```
while idx <= self.n:
 self.tree[idx] += delta
 idx += idx & (-idx) # Add lowest set bit (LSB)
```

def prefix\_sum(self, idx):

"""

Get sum of elements from index 0 to idx (inclusive, 0-indexed)

Algorithm:

1. Convert to 1-indexed
2. While index > 0:
  - a. Add current tree value to result
  - b. Move to parent using bit magic

Time:  $O(\log n)$

Space:  $O(1)$

"""

idx += 1 # Convert to 1-indexed

result = 0

```
while idx > 0:
 result += self.tree[idx]
 idx -= idx & (-idx) # Remove lowest set bit (LSB)
```

return result

def range\_sum(self, left, right):

"""

Get sum of elements in range [left, right] (0-indexed)

Uses prefix sum property:  $\text{sum}[l, r] = \text{prefix}[r] - \text{prefix}[l-1]$

Time:  $O(\log n)$

"""

```
if left == 0:
 return self.prefix_sum(right)
return self.prefix_sum(right) - self.prefix_sum(left - 1)
```

def set\_value(self, idx, val):

"""

Set element at index to specific value (0-indexed)

```

Implementation: update(idx, val - current_value)
"""
current = self.range_sum(idx, idx)
self.update(idx, val - current)

def find_kth_element(self, k):
 """
 Find index of kth smallest element (1-indexed k)

 Uses binary search on Fenwick tree
 Time: $O(\log^2 n)$ or $O(\log n)$ with optimizations
 """
 if k <= 0:
 return -1

 # Binary search approach
 pos = 0
 bit_mask = 1

 # Find highest power of 2 <= n
 while bit_mask <= self.n:
 bit_mask <<= 1
 bit_mask >>= 1

 # Binary search using bit manipulation
 while bit_mask > 0:
 next_pos = pos + bit_mask

 if next_pos <= self.n and self.tree[next_pos] < k:
 k -= self.tree[next_pos]
 pos = next_pos

 bit_mask >>= 1

 return pos # 0-indexed result

def range_update_point_query(self, left, right, val):
 """
 Add val to all elements in range [left, right]

 Uses difference array technique with Fenwick tree
 Requires separate Fenwick tree for range updates
 """
 # This would require a separate difference array BIT
 # Implementation depends on specific requirements
 pass

def get_statistics(self):
 """Get comprehensive statistics about the Fenwick tree"""
 total_sum = self.prefix_sum(self.n - 1) if self.n > 0 else 0

 return {
 'size': self.n,
 'total_sum': total_sum,
 'tree_array': self.tree[1:], # Exclude index 0
 }

```

```

 'max_height': int(self.n.bit_length()) if self.n > 0 else 0,
 'space_usage': len(self.tree) * 4 # Assuming 4 bytes per integer
 }

def visualize_bit_operations(self, idx):
 """
 Visualize bit operations for understanding

 Shows the path taken during update and query operations
 """
 idx += 1 # Convert to 1-indexed
 original_idx = idx

 print(f"Bit operations for index {original_idx - 1} (0-indexed):")
 print(f"Binary representation: {bin(idx)}")

 # Update path
 print("\nUpdate path:")
 update_idx = idx
 step = 1

 while update_idx <= self.n:
 lsb = update_idx & (-update_idx)
 print(f" Step {step}: {update_idx} (binary: {bin(update_idx)}) LSB: {lsb}")
 update_idx += lsb
 step += 1

 # Query path
 print("\nQuery path:")
 query_idx = idx
 step = 1

 while query_idx > 0:
 lsb = query_idx & (-query_idx)
 print(f" Step {step}: {query_idx} (binary: {bin(query_idx)}) LSB: {lsb}")
 query_idx -= lsb
 step += 1

2D Fenwick Tree
class FenwickTree2D:
 """
 2D Fenwick Tree for 2D range sum queries
 """

 def __init__(self, rows, cols):
 self.rows = rows
 self.cols = cols
 self.tree = [[0] * (cols + 1) for _ in range(rows + 1)]

 def update(self, row, col, val):
 """Update point (row, col) with value val"""
 row += 1 # Convert to 1-indexed
 col += 1
 orig_col = col

 while row <= self.rows:

```

```

 col = orig_col
 while col <= self.cols:
 self.tree[row][col] += val
 col += col & (-col)
 row += row & (-row)

def query(self, row, col):
 """Get sum of rectangle from (0,0) to (row,col)"""
 row += 1
 col += 1
 result = 0
 orig_col = col

 while row > 0:
 col = orig_col
 while col > 0:
 result += self.tree[row][col]
 col -= col & (-col)
 row -= row & (-row)

 return result

def range_query(self, row1, col1, row2, col2):
 """Get sum of rectangle from (row1,col1) to (row2,col2)"""
 result = self.query(row2, col2)

 if row1 > 0:
 result -= self.query(row1 - 1, col2)
 if col1 > 0:
 result -= self.query(row2, col1 - 1)
 if row1 > 0 and col1 > 0:
 result += self.query(row1 - 1, col1 - 1)

 return result

Applications and advanced techniques
def inversion_count_using_fenwick(arr):
 """
 Count inversions in array using Fenwick tree

 Inversion: pair (i,j) where i < j and arr[i] > arr[j]
 Time: O(n log n)
 """
 # Coordinate compression
 sorted_unique = sorted(set(arr))
 rank_map = {val: i for i, val in enumerate(sorted_unique)}

 fenwick = FenwickTreeComplete(len(sorted_unique))
 inversions = 0

 for i in range(len(arr) - 1, -1, -1):
 rank = rank_map[arr[i]]

 # Count elements smaller than arr[i] that come after i
 inversions += fenwick.prefix_sum(rank - 1) if rank > 0 else 0

```



```

 # Add current element
 fenwick.update(rank, 1)

 return inversions

def range_frequency_queries(arr, queries):
 """
 Answer range frequency queries using multiple Fenwick trees

 Query: count occurrences of value x in range [l, r]
 """
 from collections import defaultdict

 # Create Fenwick tree for each unique value
 fenwick_trees = defaultdict(lambda: FenwickTreeComplete(len(arr)))

 # Build trees
 for i, val in enumerate(arr):
 fenwick_trees[val].update(i, 1)

 results = []
 for l, r, x in queries:
 if x in fenwick_trees:
 count = fenwick_trees[x].range_sum(l, r)
 results.append(count)
 else:
 results.append(0)

 return results

```

## Chapter 10: Tree Algorithms & Advanced Techniques

[211] [214]

### 10.1 Lowest Common Ancestor (LCA) Algorithms

#### LCA Theory

**Definition:** The Lowest Common Ancestor of nodes  $u$  and  $v$  is the deepest node that is an ancestor of both  $u$  and  $v$ .

**Applications:**

- Distance between nodes:  $\text{dist}(u, v) = \text{depth}(u) + \text{depth}(v) - 2 \times \text{depth}(\text{lca}(u, v))$
- Path queries on trees
- Range minimum queries (LCA  $\leftrightarrow$  RMQ reduction)

## Complete LCA Implementations

```
class LCAProcessor:
 """
 Complete LCA implementation with multiple algorithms
 """

 def __init__(self, root, n=None):
 self.root = root
 self.n = n or self._count_nodes(root)

 # For binary lifting
 self.LOG = 20 # ceil(log2(max_n)) + 1
 self.parent = [[-1] * self.LOG for _ in range(self.n)]
 self.depth = [0] * self.n

 # For Euler tour
 self.euler_tour = []
 self.first_occurrence = {}
 self.tour_depth = []

 # Preprocess based on chosen method
 self.preprocess_binary_lifting()
 self.preprocess_euler_tour()

 def _count_nodes(self, root):
 """Count total nodes in tree"""
 if not root:
 return 0
 return 1 + self._count_nodes(root.left) + self._count_nodes(root.right)

 def _get_node_id(self, node):
 """Get unique ID for node (assumes node.val is unique ID)"""
 return node.val if node else -1

 def preprocess_binary_lifting(self):
 """
 Preprocess tree for binary lifting LCA

 Time: O(n log n)
 Space: O(n log n)
 """
 self._dfs_binary_lifting(self.root, -1, 0)

 # Fill binary lifting table
 for j in range(1, self.LOG):
 for i in range(self.n):
 if self.parent[i][j-1] != -1:
 self.parent[i][j] = self.parent[self.parent[i][j-1]][j-1]

 def _dfs_binary_lifting(self, node, par, d):
 """DFS to fill parent and depth arrays"""
 if not node:
 return

 node_id = self._get_node_id(node)
```

```

 if 0 <= node_id < self.n:
 self.parent[node_id][0] = par
 self.depth[node_id] = d

 self._dfs_binary_lifting(node.left, node_id, d + 1)
 self._dfs_binary_lifting(node.right, node_id, d + 1)

def lca_binary_lifting(self, u, v):
 """
 Find LCA using binary lifting

 Time: O(log n) per query
 Algorithm:
 1. Bring both nodes to same level
 2. Binary search for LCA
 """
 if u < 0 or u >= self.n or v < 0 or v >= self.n:
 return -1

 # Make sure u is deeper
 if self.depth[u] < self.depth[v]:
 u, v = v, u

 # Bring u to same level as v
 diff = self.depth[u] - self.depth[v]
 for i in range(self.LOG):
 if (diff > i) & 1:
 u = self.parent[u][i]
 if u == -1:
 return -1

 if u == v:
 return u

 # Binary search for LCA
 for i in range(self.LOG - 1, -1, -1):
 if (self.parent[u][i] != -1 and
 self.parent[v][i] != -1 and
 self.parent[u][i] != self.parent[v][i]):
 u = self.parent[u][i]
 v = self.parent[v][i]

 return self.parent[u][0]

def kth_ancestor(self, node, k):
 """
 Find kth ancestor of node using binary lifting

 Time: O(log k)
 """
 if node < 0 or node >= self.n:
 return -1

 for i in range(self.LOG):
 if (k > i) & 1:
 node = self.parent[node][i]

```

```

 if node == -1:
 break

 return node

def distance_between_nodes(self, u, v):
 """Calculate distance between two nodes"""
 lca_node = self.lca_binary_lifting(u, v)
 if lca_node == -1:
 return -1

 return self.depth[u] + self.depth[v] - 2 * self.depth[lca_node]

def preprocess_euler_tour(self):
 """
 Preprocess for Euler tour + RMQ approach to LCA

 Time: O(n) preprocessing + O(n log n) for RMQ
 """
 self._euler_dfs(self.root, 0)

 # Build sparse table for RMQ
 self.sparse_table = SparseTable(self.tour_depth)

def _euler_dfs(self, node, depth):
 """DFS for Euler tour"""
 if not node:
 return

 node_id = self._get_node_id(node)

 # Add to tour
 self.euler_tour.append(node_id)
 self.tour_depth.append(depth)

 # Record first occurrence
 if node_id not in self.first_occurrence:
 self.first_occurrence[node_id] = len(self.euler_tour) - 1

 # Visit children
 if node.left:
 self._euler_dfs(node.left, depth + 1)
 # Return to current node
 self.euler_tour.append(node_id)
 self.tour_depth.append(depth)

 if node.right:
 self._euler_dfs(node.right, depth + 1)
 # Return to current node
 self.euler_tour.append(node_id)
 self.tour_depth.append(depth)

def lca_euler_tour(self, u, v):
 """
 Find LCA using Euler tour + RMQ

```

```

Time: $O(1)$ per query after $O(n \log n)$ preprocessing
"""
if u not in self.first_occurrence or v not in self.first_occurrence:
 return -1

left = min(self.first_occurrence[u], self.first_occurrence[v])
right = max(self.first_occurrence[u], self.first_occurrence[v])

Find minimum depth in range [left, right]
min_depth_idx = self.sparse_table.range_minimum_query(left, right)

return self.euler_tour[min_depth_idx]

def lca_naive(self, root, p, q):
 """
 Naive LCA algorithm for comparison

 Time: $O(n)$ per query
 """
 if not root:
 return None

 if root.val == p or root.val == q:
 return root.val

 left_lca = self.lca_naive(root.left, p, q)
 right_lca = self.lca_naive(root.right, p, q)

 if left_lca is not None and right_lca is not None:
 return root.val

 return left_lca if left_lca is not None else right_lca

class SparseTable:
 """Sparse Table for Range Minimum Query (used in Euler tour LCA)"""

 def __init__(self, arr):
 self.arr = arr
 self.n = len(arr)
 self.LOG = 20

 # Build sparse table
 self.st = [[0] * self.LOG for _ in range(self.n)]

 # Initialize for intervals of length 1
 for i in range(self.n):
 self.st[i][0] = i

 # Build for all other intervals
 j = 1
 while (1 <<< j) <= self.n:
 i = 0
 while (i + (1 <<< j) - 1) < self.n:
 left = self.st[i][j-1]
 right = self.st[i + (1 <<< (j-1))][j-1]

```

```

 if arr[left] <= arr[right]:
 self.st[i][j] = left
 else:
 self.st[i][j] = right

 i += 1
 j += 1

def range_minimum_query(self, l, r):
 """Find index of minimum element in range [l, r]"""
 length = r - l + 1
 j = 0
 while (1 <<< (j + 1)) <= length:
 j += 1

 left = self.st[l][j]
 right = self.st[r - (1 <<< j) + 1][j]

 if self.arr[left] <= self.arr[right]:
 return left
 else:
 return right

```

## 10.2 Tree Diameter and Path Algorithms

### Tree Diameter Theory

**Definition:** The diameter of a tree is the longest path between any two nodes.

**Key Insight:** The diameter path doesn't necessarily pass through the root.

### Complete Diameter Implementation

```

class TreePathAlgorithms:
 """
 Complete implementation of tree path algorithms
 """

 def __init__(self):
 self.max_diameter = 0
 self.diameter_path = []

 def find_diameter(self, root):
 """
 Find diameter of tree

 Algorithm:
 1. For each node, calculate max path through that node
 2. Max path = left_height + right_height
 3. Track global maximum

 Time: O(n), Space: O(h)
 """
 self.max_diameter = 0

```

```

self.diameter_path = []

def dfs(node):
 if not node:
 return 0, []

 # Get heights and paths from children
 left_height, left_path = dfs(node.left)
 right_height, right_path = dfs(node.right)

 # Current diameter through this node
 current_diameter = left_height + right_height

 # Update global diameter if necessary
 if current_diameter > self.max_diameter:
 self.max_diameter = current_diameter
 # Construct diameter path
 self.diameter_path = (left_path[::-1] +
 [node.val] +
 right_path)

 # Return height and path of taller subtree
 if left_height > right_height:
 return left_height + 1, left_path + [node.val]
 else:
 return right_height + 1, right_path + [node.val]

dfs(root)
return self.max_diameter, self.diameter_path

def find_diameter_two_dfs(self, adj_list, n):
 """
 Find diameter using two DFS calls (for general trees)

 Algorithm:
 1. DFS from any node to find farthest node
 2. DFS from that node to find farthest from it
 3. Distance in step 2 is the diameter

 Time: O(n), Space: O(n)
 """
 def dfs(start, adj):
 visited = [False] * n
 distances = [0] * n
 queue = [start]
 visited[start] = True
 farthest = start
 max_dist = 0

 while queue:
 node = queue.pop(0)

 for neighbor in adj[node]:
 if not visited[neighbor]:
 visited[neighbor] = True
 distances[neighbor] = distances[node] + 1

```

```

 queue.append(neighbor)

 if distances[neighbor] > max_dist:
 max_dist = distances[neighbor]
 farthest = neighbor

 return farthest, max_dist

First DFS from node 0
farthest_from_0, _ = dfs(0, adj_list)

Second DFS from farthest node found
farthest_from_farthest, diameter = dfs(farthest_from_0, adj_list)

return diameter, (farthest_from_0, farthest_from_farthest)

def maximum_path_sum(self, root):
 """
 Find maximum path sum in tree

 Path can start and end at any nodes
 Time: O(n), Space: O(h)
 """
 max_sum = [float('-inf')]

 def dfs(node):
 if not node:
 return 0

 # Get maximum path sums from subtrees (ignore negative)
 left_sum = max(0, dfs(node.left))
 right_sum = max(0, dfs(node.right))

 # Update global maximum (path through current node)
 max_sum[0] = max(max_sum[0], node.val + left_sum + right_sum)

 # Return maximum path sum starting from current node
 return node.val + max(left_sum, right_sum)

 dfs(root)
 return max_sum[0]

def find_all_paths_with_sum(self, root, target_sum):
 """
 Find all root-to-leaf paths with given sum

 Time: O(n * h) in worst case
 """
 all_paths = []

 def dfs(node, current_path, current_sum):
 if not node:
 return

 # Add current node to path
 current_path.append(node.val)

```



```

 current_sum += node.val

 # Check if leaf node with target sum
 if not node.left and not node.right:
 if current_sum == target_sum:
 all_paths.append(current_path[:])
 else:
 # Continue search in subtrees
 dfs(node.left, current_path, current_sum)
 dfs(node.right, current_path, current_sum)

 # Backtrack
 current_path.pop()

dfs(root, [], 0)
return all_paths

def count_paths_with_sum(self, root, target_sum):
 """
 Count all paths (not necessarily root-to-leaf) with given sum

 Uses prefix sum technique with backtracking
 Time: O(n), Space: O(n)
 """
 def dfs(node, current_sum, prefix_sums):
 if not node:
 return 0

 current_sum += node.val

 # Count paths ending at current node
 count = prefix_sums.get(current_sum - target_sum, 0)

 # Add current sum to prefix sums
 prefix_sums[current_sum] = prefix_sums.get(current_sum, 0) + 1

 # Recurse on children
 count += dfs(node.left, current_sum, prefix_sums)
 count += dfs(node.right, current_sum, prefix_sums)

 # Remove current sum (backtrack)
 prefix_sums[current_sum] -= 1
 if prefix_sums[current_sum] == 0:
 del prefix_sums[current_sum]

 return count

 return dfs(root, 0, {0: 1}) # Initialize with empty path

def find_path_between_nodes(self, root, start, end):
 """
 Find path between two nodes in tree

 Algorithm:
 1. Find LCA of start and end
 2. Get path from start to LCA

```

```

3. Get path from LCA to end
4. Combine paths
"""
def find_path_to_node(node, target, path):
 if not node:
 return False

 path.append(node.val)

 if node.val == target:
 return True

 if (find_path_to_node(node.left, target, path) or
 find_path_to_node(node.right, target, path)):
 return True

 path.pop()
 return False

Find paths to both nodes from root
path_to_start = []
path_to_end = []

if not find_path_to_node(root, start, path_to_start):
 return []
if not find_path_to_node(root, end, path_to_end):
 return []

Find LCA (last common node in paths)
lca_idx = 0
min_len = min(len(path_to_start), len(path_to_end))

while (lca_idx < min_len and
 path_to_start[lca_idx] == path_to_end[lca_idx]):
 lca_idx += 1

lca_idx -= 1 # Last common index

Construct path: start -> LCA -> end
result_path = path_to_start[lca_idx::-1][1:] # Reverse and remove LCA
result_path.extend(path_to_end[lca_idx:]) # Add LCA to end

return result_path

```

## 10.3 Tree DP and Advanced Techniques

### Tree Dynamic Programming

**Key Insight:** Use tree structure to avoid overlapping subproblems.

## Complete Tree DP Implementation

```
class TreeDP:
 """
 Complete Tree Dynamic Programming implementations
 """

 def maximum_independent_set(self, root):
 """
 Find maximum weight independent set in tree

 Independent set: no two adjacent nodes

 DP state:
 - include[node] = max weight including current node
 - exclude[node] = max weight excluding current node

 Time: O(n), Space: O(n)
 """
 def dp(node):
 if not node:
 return 0, 0 # (include, exclude)

 left_include, left_exclude = dp(node.left)
 right_include, right_exclude = dp(node.right)

 # Include current node: cannot include children
 include = node.val + left_exclude + right_exclude

 # Exclude current node: can choose optimally for children
 exclude = (max(left_include, left_exclude) +
 max(right_include, right_exclude))

 return include, exclude

 include, exclude = dp(root)
 return max(include, exclude)

 def tree_coloring_ways(self, root, colors):
 """
 Count ways to color tree nodes such that adjacent nodes have different colors

 DP state: dp[node][color] = ways to color subtree with node colored 'color'

 Time: O(n * colors), Space: O(n * colors)
 """
 memo = {}

 def dp(node, parent_color):
 if not node:
 return 1

 if (node, parent_color) in memo:
 return memo[(node, parent_color)]

 total_ways = 0
```

```

 # Try each color for current node (except parent's color)
 for color in range(colors):
 if color != parent_color:
 left_ways = dp(node.left, color)
 right_ways = dp(node.right, color)
 total_ways += left_ways * right_ways

 memo[(node, parent_color)] = total_ways
 return total_ways

 return dp(root, -1) # Root has no parent constraint

def subtree_sizes(self, root):
 """
 Calculate size of each subtree

 Time: O(n), Space: O(n)
 """
 sizes = {}

 def dfs(node):
 if not node:
 return 0

 left_size = dfs(node.left)
 right_size = dfs(node.right)

 current_size = 1 + left_size + right_size
 sizes[node.val] = current_size

 return current_size

 dfs(root)
 return sizes

def tree_rerooting_dp(self, adj_list, n):
 """
 Tree rerooting technique for calculating answers with each node as root

 Example: Calculate sum of distances from each node to all other nodes

 Two-pass algorithm:
 1. First DFS: calculate answer assuming node 0 is root
 2. Second DFS: reroot and recalculate answers

 Time: O(n), Space: O(n)
 """
 # First DFS: calculate subtree sizes and initial answer
 subtree_size = [0] * n
 dp_down = [0] * n # Answer for subtree

 def dfs1(node, parent):
 subtree_size[node] = 1
 dp_down[node] = 0

```

```

 for neighbor in adj_list[node]:
 if neighbor != parent:
 dfs1(neighbor, node)
 subtree_size[node] += subtree_size[neighbor]
 dp_down[node] += dp_down[neighbor] + subtree_size[neighbor]

Second DFS: reroot and calculate answers
dp_up = [0] * n # Answer considering parent contribution
answer = [0] * n # Final answer for each node as root

def dfs2(node, parent):
 answer[node] = dp_down[node] + dp_up[node]

 for neighbor in adj_list[node]:
 if neighbor != parent:
 # Calculate dp_up for neighbor
 # Remove neighbor's contribution from current node
 remaining_down = dp_down[node] - dp_down[neighbor] - subtree_size[neighbor]
 remaining_size = n - subtree_size[neighbor]

 dp_up[neighbor] = dp_up[node] + remaining_down + remaining_size

 dfs2(neighbor, node)

 dfs1(0, -1)
 dp_up[0] = 0
 dfs2(0, -1)

 return answer

def tree_matching(self, root):
 """
 Find maximum matching in tree

 Matching: set of edges with no common vertices

 DP states:
 - matched[node] = max matching if current node is matched with parent
 - not_matched[node] = max matching if current node is not matched with parent
 """
 def dp(node, parent):
 if not node:
 return 0, 0

 not_matched = 0 # Current node not matched with parent

 for child in [node.left, node.right]:
 if child and child != parent:
 child_matched, child_not_matched = dp(child, node)
 not_matched += max(child_matched, child_not_matched)

 # If current node is matched with parent
 matched = 1 # Edge between current and parent
 for child in [node.left, node.right]:
 if child and child != parent:
 _, child_not_matched = dp(child, node)

```

```

 matched += child_not_matched

 return matched, not_matched

if not root:
 return 0

Root has no parent, so it's effectively "not matched" with parent
_, result = dp(root, None)
return result

Centroid Decomposition
class CentroidDecomposition:
 """
 Centroid Decomposition for tree path queries
 """

 def __init__(self, adj_list, n):
 self.adj = adj_list
 self.n = n
 self.removed = [False] * n
 self.subtree_size = [0] * n
 self.centroid_parent = [-1] * n

 self.decompose(0, -1)

 def get_subtree_size(self, node, parent):
 """Calculate subtree size excluding removed nodes"""
 self.subtree_size[node] = 1

 for neighbor in self.adj[node]:
 if neighbor != parent and not self.removed[neighbor]:
 self.subtree_size[node] += self.get_subtree_size(neighbor, node)

 return self.subtree_size[node]

 def find_centroid(self, node, parent, tree_size):
 """Find centroid of current tree"""
 for neighbor in self.adj[node]:
 if (neighbor != parent and
 not self.removed[neighbor] and
 self.subtree_size[neighbor] > tree_size // 2):
 return self.find_centroid(neighbor, node, tree_size)

 return node

 def decompose(self, node, parent):
 """Recursively decompose tree using centroids"""
 tree_size = self.get_subtree_size(node, -1)
 centroid = self.find_centroid(node, -1, tree_size)

 self.removed[centroid] = True
 self.centroid_parent[centroid] = parent

 # Process centroid (problem-specific logic would go here)
 self.process_centroid(centroid)

```

```

 # Recursively decompose remaining subtrees
 for neighbor in self.adj[centroid]:
 if not self.removed[neighbor]:
 self.decompose(neighbor, centroid)

def process_centroid(self, centroid):
 """Process the current centroid (implement based on problem)"""
 # This is where problem-specific logic would be implemented
 # For example: counting paths, updating data structures, etc.
 pass

def count_paths_through_centroid(self, centroid, target_sum):
 """
 Count paths passing through centroid with given sum
 Example application of centroid decomposition
 """
 from collections import defaultdict

 def get_paths_from_subtree(start, parent, current_sum, paths):
 paths.append(current_sum)

 for neighbor in self.adj[start]:
 if neighbor != parent and not self.removed[neighbor]:
 get_paths_from_subtree(neighbor, start, current_sum + neighbor, paths)

 count = 0
 all_paths = []

 # Get paths from each subtree rooted at centroid's children
 for child in self.adj[centroid]:
 if not self.removed[child]:
 subtree_paths = []
 get_paths_from_subtree(child, centroid, child, subtree_paths)

 # Count paths using existing paths
 for path_sum in subtree_paths:
 complement = target_sum - centroid - path_sum
 for existing_path in all_paths:
 if existing_path == complement:
 count += 1

 all_paths.extend(subtree_paths)

 # Count paths that end at centroid
 for path_sum in all_paths:
 if path_sum + centroid == target_sum:
 count += 1

 # Count path that is just centroid
 if centroid == target_sum:
 count += 1

 return count

```

This comprehensive handbook continues with interview patterns, real-world applications, and complete code implementations. Would you like me to continue with the remaining chapters covering interview patterns, complexity analysis, and practical applications?