

Chapter 8 - Recursion and Dynamic Programming

// **How to approach?**

- Recursive solutions are built off of solutions to subproblems

// **Bottom-Up Approach** → start by solving the problem for a simple case (eg. list of one element) → then we figure out how to solve it for two elements and so on → built solution on top of previous cases

// **Top-Down Approach** → think about how we can divide the problem for case N into subproblems

// **Half-and-Half Approach** → divide the data set in half (eg. binary search, merge sort)

// **Recursive vs. Iterative solutions** → recursive algorithms can be very space inefficient → if algorithm recurses to a depth of n → it uses at least $O(n)$ memory

// **Dynamic Programming & Memoization** → finding the overlapping subproblems (repeated calls) then caching those results for future repeated calls

// Fibonacci Numbers → compute the n th Fibonacci number

```
int fibonacci(int i) {
    if (i == 0) {
        return 0;
    }
    if (i == 1) {
        return 1;
    }
    return fibonacci(i - 1) + fibonacci(i - 2);
}
```

// The number of nodes in the tree will represent the runtime → each node has 2 children → if we do this n times → $O(2^n)$ (in reality it's $O(1.6^n)$ since the right subtree is smaller)

// **Top-Down Dynamic Programming (or Memoization)** → we simply cache the results of `fibonacci(i)` between calls

```
int fiboncacci(int n) {
    return fibonacci(n, new int[n + 1]);
}
```

```
int fibonacci(int i, int[] memo) {
    if (i == 0 || i == 1) {
        return i;
    }
    if (memo[i] == 0) {
        memo[i] = fibonacci(i - 1, memo) + fibonacci(i - 2, memo);
    }
    return memo[i];
}
```

// The tree now jussy shoots straight down → $2n$ nodes → $O(n)$ runtime

// **Bottom-Up Dynamic Programming** → do the same things as the recursive memoized approach but in reverse

```
int fibonacci(int n) {
    if (n == 0) {
        return 0;
    } else if (n == 1) {
        return 1;
    }
    int[] memo = new int[n];
    memo[0] = 0;
    memo[1] = 1;
    for (int i = 2; i < n; i++) {
        memo[i] = memo[i - 1] + memo[i - 2];
    }
    return memo[n - 1] + memo[n - 2];
}
```

// **Triple Step** → run up the stairs with either 1, 2 or 3 steps at a time. How many possible ways can the child climb the stairs?

```
int countWays(int n) {
    if (n < 0) {
        return 0;
    } else if (n == 0) {
        return 1;
    } else {
```

```

        return countWays(n - 1) + countWays(n - 2) + countWays(n - 3);
    }
}

```

// Runtime is roughly $O(3^n)$

// Typically we use a `HashMap<Integer, Integer>` for caching → keys will be exactly from 1 to n

```

int countWays(int n) {
    int[] memo = new int[n + 1];
    Arrays.fill(memo, -1);
    return countWays(n, memo);
}

```

```

int countWays(int n, int[] memo) {
    if (n < 0) {
        return 0;
    } else if (n == 0) {
        return 1;
    } else if (memo[n] > -1) {
        return memo[n];
    } else {
        memo[n] = countWays(n - 1, memo) + countWays(n - 2, memo) +
            countWays(n - 3, memo);
    }
    return memo[n];
}

```

// int will overflow, long will prolongue it, could use BigInteger?

// **Robot in a Grid** → grid with r rows and c columns → find path from top left to bottom right moving only right and down and some cells are off limits

```

public class QuestionA {

    public static ArrayList<Point> getPath(boolean[][] maze) {
        if (maze == null || maze.length == 0) {
            return null;
        }
        ArrayList<Point> path = new ArrayList<Point>();
        if (getPath(maze, maze.length - 1, maze[0].length - 1, path)) {
            return path;
        }
    }
}

```

```

        return null;
    }

    public static boolean getPath(boolean[][] maze, int row, int col, ArrayList<Point> path) {
        // If out of bounds or not available return
        if (row < 0 || col < 0 || !maze[row][col]) {
            return false;
        }

        boolean isAtOrigin = (row == 0) && (col == 0);

        if (isAtOrigin || getPath(maze, row, col - 1, path) || getPath(maze, row - 1, col,
path)) {
            Point p = new Point(row, col);
            path.add(p);
            return true;
        }

        return false;
    }
}

```

// Optimize the solution by remembering failed points in a HashSet

// **Magic Index** → sorted array of distinct integer → write a method to find a magic index if one exists

// Brute force → not using the fact the array is sorted

```

int magicIndex(int[] array) {
    for (int i = 0; i < array.length; i++) {
        if (i == array[i]) {
            return i;
        }
    }
    return -1;
}

```

// Binary search similarities

```

int magic(int[] array) {
    return magic(array, 0, array.length - 1);
}

```

```

int magic(int[] array, int start, int end) {
    if (end < start) {
        return -1;
    }
    int mid = start + (end - start) / 2;
    if (array[mid] == mid) {
        return mid;
    } else if (array[mid] > mid) {
        return magic(array, start, mid - 1);
    } else {
        return magic(array, mid + 1, end);
    }
}

```

// What if the elements are not distinct?

```

int magic(int[] array) {
    return magic(array, 0, array.length);
}

```

```

int magic(int[] array, int start, int end) {
    if (end < start) {
        return -1;
    }

    int midIndex = start + (end - start) / 2;
    int midValue = array[midIndex];

    if (midValue == midIndex) {
        return midIndex;
    }

    int leftIndex = Math.min(midIndex - 1, midValue);
    int left = magic(array, start, leftIndex);

    if (left > 0) {
        return left;
    }

    int rightIndex = Math.max(midIndex + 1, midValue);
    int right = magic(array, rightIndex, end);
}

```

```

        return right;
    }

```

// **Power Set** → write a method to return all subsets of a set

// How many subsets do we actually have → 2^n

// Each of the n elements are going to be contained in half of all subsets → $n * 2^{(n-1)}$

$P_3 = P_2 + P_d \rightarrow P_d = (P_2 + a_3)$

```

ArrayList<ArrayList<Integer>> getSubsets(ArrayList<Integer> set, int index) {
    ArrayList<ArrayList<Integer>> allSubsets;

    if (set.size() == index) {
        allSubsets = new ArrayList<ArrayList<Integer>>();
        allSubsets.add(new ArrayList<Integer>());
    } else {
        allSubsets = getSubsets(set, index + 1);
        int item = set.get(index);
        ArrayList<ArrayList> moreSubsets = new ArrayList<ArrayList<Integer>>();
        for (ArrayList<Integer> subset : allSubsets) {
            ArrayList<Integer> newSubset = new ArrayList<Integer>();
            newSubset.addAll(subset);
            newSubset.add(item);
            moreSubsets.add(newSubset);
        }
        allSubsets.addAll(moreSubsets);
    }
    return allSubsets;
}

```

// **Walkthrough**

1 2 3 4

```

set.size() = 4;
index = 0

```

--> getSubsets(set, 1)

```

set.size() = 4
index = 1

```

--> getSubsets(set, 2);

set.size() = 4

index = 2

--> getSubsets(set, 3)

set.size() = 4

index = 3

--> getSubsets(set, 4)

set.size() = 4

index = 4

all = {}

--> set.size() = 4, index = 3, all = {}

item = 4

more = empty

subset for all subsets -->

new = subset + item = {4}

more = {4}

all = {}, {4}

--> set.size() = 4, index = 2, all = {}, {4}

item = 3

more = empty

subset for all subsets -->

new = {} + 3

new = {3}

more = {3}

new = {4} + 3

new = {4, 3}

```
more = {3}, {4, 3}
```

```
all = {}, {3}, {4}, {3, 4}
```

```
....
```

// Solve the problem using **Combinatorics** → we iterate through the numbers from 0 to 2^n and translate the binary representation into sets

```
ArrayList<ArrayList<Integer>> getSubsets(ArrayList<Integer> set) {  
    ArrayList<ArrayList<Integer>> all = new ArrayList<>();  
    int max = 1 << set.size();  
  
    for (int k = 0; k < max; k++) {  
        ArrayList<Integer> subset = convertIntToSet(k, set);  
        all.add(subset);  
    }  
  
    return all;  
}
```

```
ArrayList<Integer> convertIntToSet(int x, ArrayList<Integer> set) {  
    ArrayList<Integer> subset = new ArrayList<>();  
  
    int index = 0;  
    for (int k = x; k > 0; k >>= 1) {  
        if ((k & 1) == 1) {  
            subset.add(set.get(index));  
        }  
        index++;  
    }  
    return subset;  
}
```

// **Recursive Multiply** → multiply two positive integer without using the * operator

```
int minProduct(int a, int b) {  
    int bigger = a < b ? b : a;  
    int smaller = a < b ? a : b;  
    return minProductHelper(smaller, bigger);  
}
```



```

int minProductHelper(int smaller, int bigger) {
    if (smaller == 0) {
        return 0;
    } else if (smaller == 1) {
        return bigger;
    }

    int s = smaller >> 1; // divide by 2
    int side1 = minProduct(s, bigger);
    int side2 = side1;

    if (smaller % 2 == 1) {
        side2 = minProductHelper(smaller - s, bigger);
    }
    return side1 + side2;
}

```

// **We have duplicated work** → we can do better by caching results

```

int minProduct(int a, int b) {
    int bigger = a < b ? b : a;
    int smaller = a < b ? a : b;

    int[] memo = new int[smaller + 1];
    return minProduct(smaller, bigger, memo);
}

```

```

int minProduct(int smaller, int bigger, int[] memo) {
    if (smaller == 0) {
        return 0;
    } else if (smaller == 1) {
        return bigger;
    } else if (memo[smaller] > 0) {
        return memo[smaller];
    }

    int s = smaller >> 1; // divide by 2
    int side1 = minProduct(s, bigger, memo);
    int side2 = side1;

    if (smaller % 2 == 1) {
        side2 = minProduct(smaller - s, bigger, memo);
    }
}

```

```

    }
    memo[smaller] = side1 + side2;
    return memo[smaller];
}

```

// **We can still make it a bit faster** → if the number is even we double the half → if the number is odd we can double the half and add the bigger number → no need to cache as the calls will not be the same

// **Towers of Hanoi** → 3 towers, disks sorted in ascending order on tower 1

```

public class Tower {
    private Stack<Integer> disks;
    private int index;

    public Tower(int index) {
        this.disks = new Stack<>();
        this.index = index;
    }

    public int index() {
        return index;
    }

    public boolean add(int disk) {
        if (!disks.isEmpty() && disks.peek() <= disk) {
            return false;
        }
        disks.push(disk);
        return true;
    }

    public void moveTopTo(Tower tower) {
        int top = disks.pop();
        tower.add(top);
    }

    public void moveDisks(int n, Tower destination, Tower buffer) {
        if (n <= 0) {
            return;
        }
        moveDisks(n - 1, buffer, destination);
        moveTopTo(destination);
    }
}

```

```

        buffer.moveDisks(n - 1, destination, this);
    }
}

```

// **Permutations without Dups** → write a method to compute all permutations of a string of unique characters

```

ArrayList<String> getPerms(String str) {
    if (str == null) {
        return null;
    }

    ArrayList<String> permutations = new ArrayList<>();
    if (str.length() == 0) {
        permutations.add("");
        return permutations;
    }
    char first = str.charAt(0);
    String remainder = str.substring(1);
    ArrayList<String> words = getPerms(remainder);
    for (String word : words) {
        for (int j = 0; j <= word.length(); j++) {
            String s = insertCharAt(word, first, j);
            permutations.add(s);
        }
    }
    return permutations;
}

```

```

String insertCharAt(String word, char c, int i) {
    String start = word.substring(0, i);
    String end = word.substring(i);
    return start + c + end;
}

```

// Another approach

```

ArrayList<String> getPerms(String str) {
    ArrayList<String> result = new ArrayList<>();
    getPerms("", str, result);
    return result;
}

```

```

void getPerms(String prefix, String remainder, ArrayList<String> result) {
    if (remainder.length() == 0) {
        result.add(prefix);
    }
    int len = remainder.length();
    for (int i = 0; i < len; i++) {
        String before = remainder.substring(0, i);
        String after = remainder.substring(i + 1, len);
        char c = remainder.charAt(i);
        getPerms(prefix + c, before + after, result);
    }
}

```

// **Perms with dups** → characters of strings are not necessarily unique

```

ArrayList<String> printPerms(String s) {
    ArrayList<String> result = new ArrayList<>();
    HashMap<Character, Integer> map = buildFreqTable(s);
    printPerms(map, "", s.length(), result);
    return result;
}

```

```

HashMap<Character, Integer> buildFreqTable(String s) {
    HashMap<Character, Integer> map = new HashMap<>();
    for (char c : s.toCharArray()) {
        if (!map.containsKey(c)) {
            map.put(c, 0);
        }
        map.put(c, map.get(c) + 1);
    }
    return map;
}

```

```

void printPerms(HashMap<Character, Integer> map, String prefix, int remaining,
ArrayList<String> result) {
    if (remaining == 0) {
        result.add(prefix);
        return;
    }

    for (Character c : map.keySet()) {
        int count = map.get(c);

```

```

        if (count > 0) {
            map.put(c, count - 1);
            printPerms(map, prefix + c, remaining - 1, result);
            map.put(c, count);
        }
    }
}

```

// **Parens** → print all combinations of n pairs of parentheses

```

void parens(ArrayList<String> list, int left, int right, char[] str, int index) {
    if (left < 0 || right < left) {
        return;
    }

    if (left == 0 && right == 0) {
        list.add(String.valueOf(str));
    } else {
        str[index] = '(';
        parens(list, left - 1, right, str, index + 1);

        str[index] = ')';
        parens(list, left, right - 1, str, index + 1);
    }
}

```

```

ArrayList<String> generateParens(int count) {
    char[] str = new char[count * 2];
    ArrayList<String> list = new ArrayList<>();
    parens(list, count, count, str, 0);
    return list;
}

```

// **Another way**

```

def parens(left, right, sequence):
    if left == 0 and right == 0:
        print(sequence)
    if left > 0:
        parens(left - 1, right + 1, sequence + "(")
    if right > 0:
        parens(left, right - 1, sequence + ")")

```

// **Paint fill** → implement the paint fill function common in most image editors

```
enum Color {  
    BLACK,  
    WHITE,  
    RED,  
    YELLOW,  
    GREEN;  
}
```

```
boolean PaintFill(Color[][] screen, int r, int c, Color nColor) {  
    if (screen[r][c] == nColor) {  
        return false;  
    }  
    return PaintFill(screen, r, c, screen[r][c], nColor);  
}
```

```
boolean PaintFill(Color[][] screen, int r, int c, Color oColor, Color nColor) {  
    if (r < 0 || r >= screen.length || c < 0 || c > screen[0].length) {  
        return false; // out of bounds  
    }  
  
    if (screen[r][c] == oColor) {  
        screen[r][c] = nColor;  
        PaintFill(screen, r - 1, c, oColor, nColor); // UP  
        PaintFill(screen, r + 1, c, oColor, nColor); // DOWN  
        PaintFill(screen, r, c - 1, oColor, nColor); // LEFT  
        PaintFill(screen, r, c + 1, oColor, nColor); // RIGHT  
    }  
    return true;  
}
```

// **Coins** → make change

```
long makeChange(int[] coins, int money, int index, HashMap<String, Long> memo) {  
    if (money == 0) {  
        return 1;  
    }  
  
    if (index >= coins.length) {  
        return 0;  
    }  
}
```

```

        String key = money + "-" + index;
        if (memo.containsKey(key)) {
            return memo.get(key);
        }

        int amountWithCoin = 0;
        long ways = 0;

        while (amountWithCoin <= money) {
            int remaining = money - amountWithCoin;
            ways += makeChange(coins, remaining, index + 1, memo);
            amountWithCoin += coins[index];
        }
        memo.put(key, ways);
        return ways;
    }

    long makeChange(int[] coins, int money) {
        return makeChange(coins, money, 0, new HashMap<String, Long>());
    }

```

// Eight Queens

```

int GRID_SIZE = 8;

void placeQueens(int row, Integer[] columns, ArrayList<Integer[]> results) {
    if (row == GRID_SIZE) {
        results.add(columns.clone());
    } else {
        for (int col = 0; col < GRID_SIZE; col++) {
            if (checkValid(columns, row, col)) {
                columns[row] = col;
                placeQueens(row + 1, columns, results);
            }
        }
    }
}

boolean checkValid(Integer[] columns, int row1, int column1) {
    for (int row2 = 0; row2 < row1; row2++) {
        int column2 = columns[row2];
        if (column1 == column2) {
            return false;
        }
    }
}

```

```

    }
    int columnDistance = Math.abs(column2 - column1);
    int rowDistance = row1 - row2;
    if (columnDistance == rowDistance) {
        return false;
    }
}
return true;
}

```

// Stack of Boxes

```

int createStack(ArrayList<Box> boxes) {
    Collections.sort(boxes, new BoxComparator());
    int[] stackMap = new int[boxes.size()];
    return createStack(boxes, null, 0, stackMap);
}

int createStack(ArrayList<Box> boxes, Box bottom, int offset, int[] stackMap) {
    if (offset >= boxes.size()) {
        return 0;
    }
    Box newBottom = boxes.get(offset);
    int heightWithBottom = 0;
    if (bottom == null || newBottom.canBeAbove(bottom)) {
        if (stackMap[offset] == 0) {
            stackMap[offset] = createStack(boxes, newBottom, offset + 1, stackMap);
            stackMap[offset] += newBottom.height;
        }
        heightWithBottom = stackMap[offset];
    }

    int heightWithoutBottom = createStack(boxes, bottom, offset + 1, stackMap);

    return Math.max(heightWithBottom, heightWithoutBottom);
}

```

// Boolean Evaluation → 0, 1, &, |, ^

```

public static int count = 0;
public static boolean stringToBool(String c) {
    return c.equals("1") ? true : false;
}

```



```

public static int countEval(String s, boolean result, HashMap<String, Integer> memo) {
    count++;
    if (s.length() == 0) return 0;
    if (s.length() == 1) return stringToBool(s) == result ? 1 : 0;
    if (memo.containsKey(result + s)) return memo.get(result + s);

    int ways = 0;

    for (int i = 1; i < s.length(); i += 2) {
        char c = s.charAt(i);
        String left = s.substring(0, i);
        String right = s.substring(i + 1, s.length());
        int leftTrue = countEval(left, true, memo);
        int leftFalse = countEval(left, false, memo);
        int rightTrue = countEval(right, true, memo);
        int rightFalse = countEval(right, false, memo);
        int total = (leftTrue + leftFalse) * (rightTrue + rightFalse);

        int totalTrue = 0;
        if (c == '^') {
            totalTrue = leftTrue * rightFalse + leftFalse * rightTrue;
        } else if (c == '&') {
            totalTrue = leftTrue * rightTrue;
        } else if (c == '|') {
            totalTrue = leftTrue * rightTrue + leftFalse * rightTrue + leftTrue *
rightFalse;
        }

        int subWays = result ? totalTrue : total - totalTrue;
        ways += subWays;
    }

    memo.put(result + s, ways);
    return ways;
}

public static int countEval(String s, boolean result) {
    return countEval(s, result, new HashMap<String, Integer>());
}

```