

# Dynamic Programming

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# Outline

- 1 Introduction
  - Definitions
  - A particular problem



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# What is dynamic programming?

## Definition (Dynamic Programming)

It's a technique for mathematical programming (optimization), or in other words, a paradigm to problem solving. So, the word “programming” is not directly meaning a computer program or an algorithm. The actual meaning is more similar to linear programming or planning or taking decisions.

- It consists in:
  - Split the problem in smaller sub-problems:
    - recurrence relationship
    - optimal sub-structure
  - We stop when have a trivial problems (base cases)
  - Store smaller solutions (memoization, states)
  - Merge the solutions when is need it
  - Difference with D&C: **overlapping and compute a value**



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# Recurrence relationship and tree of calls

Fibonacci sequence  $(0, 1, 1, 2, 3, 5, \dots)$  is the simplest examples



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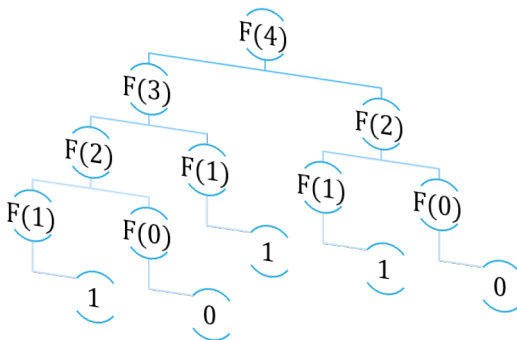
$$F(n) = \begin{cases} 1 & n = 1 \\ F(n-1) + F(n-2) & n > 1 \\ 0 & \text{otherwise} \end{cases}$$



# Recurrence relationship and tree of calls

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$$F(n) = \begin{cases} 1 & n = 1 \\ F(n-1) + F(n-2) & n > 1 \\ 0 & \text{otherwise} \end{cases}$$





# Fibonacci classic iterative implementation

```
const int MAX = 90;
function long int fibonacci(int n):
    static long int memo[MAX + 1];
    if n < 0 or n > MAX then throw "Out of range.";
    memo[0] = 0; memo[1] = 1;
    if memo[n] == UNDEFINED then
        for k = 2 to n do:
            memo[k] = memo[k - 1] + memo[k - 2];
        end
    end
    return memo[n];
end
```



# Fibonacci classic recursive implementation

```
const int MAX = 90;  
function long int fibonacci(int n):  
    if  $n < 0$  or  $n > \text{MAX}$  then throw Out of range.;  
    if  $\text{memo}[n] \neq \text{UNDEFINED}$  then return  $\text{memo}[n]$ ;  
    return  $\text{memo}[n] = \text{fibonacci}(n-1) + \text{fibonacci}(n-2)$ ;  
end
```



# Problems with the classic implementations

We can see that  $F(2)$  is computed twice (this is the **overlapping**).



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# Design and implementations

There are two ways to implement dynamic programming:

- Bottom-up (iterative implementation)
  - Solve **all the the possible smaller problems** before the bigger one
- Top-down (recursive implementation)
  - Solve **only the instances which are actually needed** for a given problem
- Both solve the problem in efficient way, the discussion could be end up in religious arguments.



# Fibonacci bottom-up implementation

Solve all the the possible smaller problems before the bigger one:

```
const int MAX = 90;
const long int UNDEFINED = -1;
function long int fibonacci(int n):
    static long int memo[MAX+1];
    if n < 0 or n > MAX then throw "Out of range.";
    memo[0] = 0; memo[1] = 1;
    if memo[n] == UNDEFINED then
        for k = 2 to n do:
            memo[k] = memo[k-1] + memo[k-2];
        end
    end
    return memo[n];
end
```



# Fibonacci top-down implementation

Solve only the instances which are actually needed for a given problem:

```
const int MAX = 90;
const long int UNDEFINED = -1;
function long int fibonacci(int n):
    static long int memo[MAX+1];
    if n < 0 or n > MAX then throw "Out of range.";
    memo[0] = 0; memo[1] = 1;
    if memo[n] ≠ UNDEFINED then return memo[n];
    return memo[n] = fibonacci(n-1) + fibonacci(n-2);
end
```



# Analysis





# References I

- Introduction to Algorithms, Thomas H. Cormen
- Algorists: Github Repository
- Wikipedia: Dynamic Programming
- HackerRank
- CodeForces
- OmegaUp
- LeetCode

