



Algorithms Theory

14 – Dynamic Programming (1)

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Outline



- General approach, differences to a recursive solution
- Basic example: Computation of the Fibonacci numbers



Method of dynamic programming

Recursive approach: Solve a problem by solving several smaller analogous subproblems of the same type. Then combine these solutions to generate a solution to the original problem.

Drawback: Repeated computation of solutions

Dynamic-programming method: Once a subproblem has been solved, store its solution in a table so that it can be retrieved later by simple table lookup.

Example: Fibonacci numbers

$$f(0) = 0$$

$$f(1) = 1$$

$$f(n) = f(n-1) + f(n-2), \text{ for } n \geq 2$$

Remark:

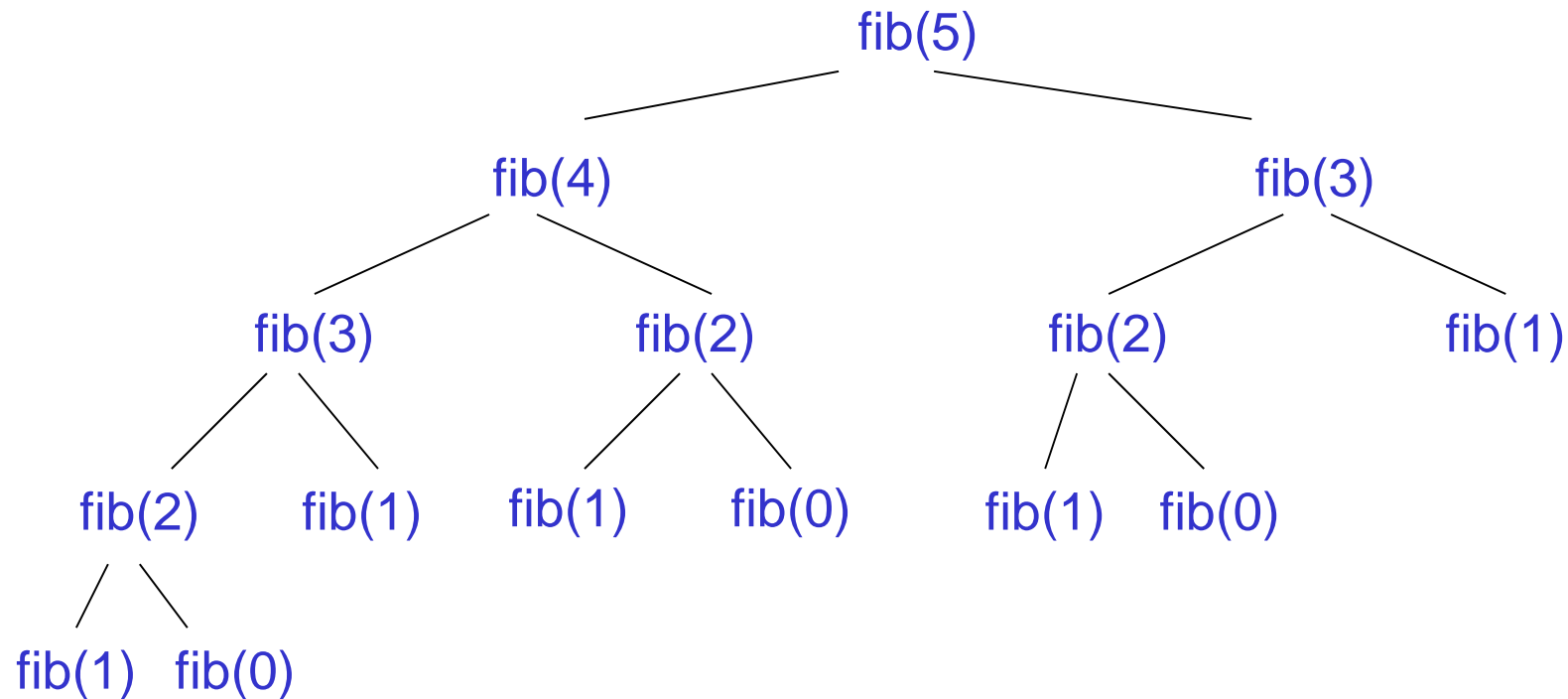
$$f(n) = \left[\frac{1}{\sqrt{5}} (1.618\dots)^n \right]$$

Straightforward implementation:

```
procedure fib (n : integer) : integer
if (n == 0) or (n == 1)
  then return n
  else return fib(n - 1) + fib(n - 2)
```

Example: Fibonacci numbers

Recursion tree:



Repeated computation!

$$T(n) \approx \left[\left(1 + \frac{1}{\sqrt{5}} \right) \left(\frac{\sqrt{5} + 1}{2} \right)^n - 1 \right] \approx [1.447 \times 1.618^n - 1]$$

Dynamic programming

Approach:

1. Recursively define problem P .
2. Determine a set T consisting of all subproblems that have to be solved during the computation of a solution to P .
3. Find an order T_0, \dots, T_k of the subproblems in T such that during the computation of a solution to T_i only subproblems T_j with $j < i$ arise.
4. Solve T_0, \dots, T_k in this order and store the solutions.

Example: Fibonacci numbers

1. Recursive definition of the Fibonacci numbers, based on the standard equation.
2. $T = \{ f(0), \dots, f(n-1) \}$
3. $T_i = f(i), \quad i = 0, \dots, n - 1$
4. Computation of $fib(i)$, for $i \geq 2$, only requires the results of the last two subproblems $fib(i - 1)$ and $fib(i - 2)$.

Example: Fibonacci numbers

Computation by dynamic programming, version 1:

procedure *fib*(*n* : *integer*) : *integer*

1 $f_0 := 0; f_1 := 1$

2 **for** $k := 2$ **to** n **do**

3 $f_k := f_{k-1} + f_{k-2}$

4 **return** f_n

Example: Fibonacci numbers

Computation by dynamic programming, version 2:

```
procedure fib (n : integer) : integer  
1   $f_{secondlast} := 0; f_{last} := 1$   
2  for  $k := 2$  to  $n$  do  
3       $f_{current} := f_{last} + f_{secondlast}$   
4       $f_{secondlast} := f_{last}$   
5       $f_{last} := f_{current}$   
6  if  $n \leq 1$  then return  $n$  else return  $f_{current}$  ;
```

Linear running time, constant space requirement!

Computing Fibonacci numbers with memoization



Compute each number exactly once, store it in an array $F[0\dots n]$:

```
procedure fib ( $n : integer$ ) : integer
1   $F[0] := 0; F[1] := 1;$ 
2  for  $i := 2$  to  $n$  do
3       $F[i] := \infty;$ 
4  return lookupfib( $n$ )
```

The procedure *lookupfib* is defined as follows:

```
procedure lookupfib( $k : integer$ ) : integer
1  if  $F[k] < \infty$ 
2      then return  $F[k]$ 
3      else  $F[k] := lookupfib(k - 1) + lookupfib(k - 2);$ 
4          return  $F[k]$ 
```