

## COMP S265F Design and Analysis of Algorithms

### Lab 3: Fibonacci Numbers, Binary Tree, and Dynamic Programming

This lab introduces the Fibonacci numbers, how to print a binary tree using the Python package `graphviz`, and a powerful algorithm design technique called *Dynamic Programming*.

#### 1. Fibonacci numbers

Leonardo of Pisa (a.k.a. Fibonacci) invented the *Fibonacci numbers* when he was studying the population dynamics of rabbits. He simplified the problem with the following assumptions:

- A pair of rabbits gives birth to a pair of children every year.
- These children are too young to have children of their own until two years later.
- Rabbits never die.

Then, the number of *pairs* of rabbits can be expressed as the following function of years:

- $F(0) = 0$  (We don't have any pairs of rabbits.)
- $F(1) = 1$  (We start with one pair *A* of rabbits in Year 1.)
- $F(2) = 1$  (The pair *A* is too young to have their own children in Year 2.)
- $F(3) = 2$  (*A* gives birth to a pair *B*.)
- $F(4) = 3$  (*A* gives birth to another pair *C*, but *B* is too young to have children.)
- $F(5) = 5$  (There are two new pairs by *A* and *B*.)

Therefore, the *Fibonacci numbers*  $F(n)$  can be defined, as follows:

- $F(0) = 0$
- $F(1) = 1$
- $F(n) = F(n-1) + F(n-2)$  for any  $n \geq 2$

In general, to compute  $F(n)$  for Year  $n$ , we can see that all the previous rabbits are still there ( $F(n-1)$ ) plus that every pair in two years ago gives birth to a new pair ( $F(n-2)$ ).

It is well-known that Fibonacci number has a closed-form expression  $F(n) = \frac{\phi^n - (1-\phi)^n}{\phi - (1-\phi)}$ , where  $\phi = \frac{1+\sqrt{5}}{2} \approx 1.618$  is the golden ratio. By careful calculations, we can approximate  $F(n) \approx 2^{0.694n}$ .

We can use recursion to find the  $n$ -th Fibonacci number  $F(n)$ :

01fib.py

```
1  from sys import stdin
2
3  def fib(n):
4      if n <= 1:
5          return n
6      else:
7          return fib(n-1) + fib(n-2)
8
9  def main():
10     """Reads a user-specified non-negative integer n,
11     and then prints the n-th Fibonacci number F(n)."""
```

```

12
13     n = int(stdin.readline())
14     print(f"F({n}) = {fib(n)}")
15
16 if __name__ == "__main__":
17     print(main.__doc__)
18     main()

```

**Time complexity.** Let  $T(n)$  be the number of steps to compute `fib(n)`. Therefore, we have

- $T(n) = 2$  for  $n = 0, 1$
- $T(n) = T(n-1) + T(n-2) + 3$  for  $n \geq 2$

Comparing the recurrences of  $T(n)$  and  $F(n)$ , we immediately see that  $T(n) \geq F(n) = \Omega(2^{0.694n})$ .

That is, the time complexity of `fib(n)` is exponential to  $n$ ; it takes a long time to compute small inputs like  $F(50)$ .

## 2. Fibonacci trees: A binary tree

A *Fibonacci tree* represents the recursive call structure of the Fibonacci computation. The root of a Fibonacci tree is the value  $n$  that represents the  $n$ -th Fibonacci number  $F(n)$ . In general, the root has two children: the left is the value  $n-1$  for  $F(n-1)$  and the right is the value  $n-2$  for  $F(n-2)$ . All other internal nodes (except  $n = 0, 1$ ) have two children defined similarly. Therefore, a Fibonacci tree is a binary tree.

We can define a class `Node` to represent a tree node:

02fib.py

```

1  from sys import stdin
2
3  num_node = 0
4
5  class Node:
6      def __init__(self, n, left, right):
7          global num_node
8          self.id = str(num_node)
9          num_node += 1
10         self.n = n
11         self.left = left
12         self.right = right
13
14 def fib(n):
15     if n <= 1:
16         return Node(n, None, None)
17     else:
18         return Node(n, fib(n-1), fib(n-2))
19
20 def traverse(node):
21     if node.left == None:
22         print(f"#[{node.id}] [{node.n}] has no children")
23     else:
24         print(f"#[{node.id}] [{node.n}] has two children #[{node.left.id}] [{node.left.n}] and
25               #[{node.right.id}] [{node.right.n}]")
26         traverse(node.left)
27         traverse(node.right)
28
29 def main():
30     """Reads a user-specified non-negative integer n,
31     and then prints the structure of the Fibonacci tree for F(n)."""
32
33     n = int(stdin.readline())

```

```

33     root = fib(n)
34     traverse(root)
35
36 if __name__ == "__main__":
37     print(main.__doc__)
38     main()

```

In the constructor of `Node`, the keyword `global` makes the variable `num_node` a global variable (otherwise, it is a variable local to the method). The above program assumes that all tree nodes have a unique id, and it outputs the Fibonacci tree structure using lines with following formats:

- “ $\#x [n]$  has two children  $\#y [n - 1]$  and  $\#z [n - 2]$ ” if a node  $n$  with id  $x$  has two child nodes  $n - 1$  with id  $y$  and  $n - 2$  with id  $z$ .
- “ $\#x [n]$  has no children” if a node  $n$  with id  $x$  does not have any children.

It would be more helpful and insightful to display the Fibonacci tree by a graph. We may use the Python package `graphviz` (which can be installed by `conda install python-graphviz`). You can instantiate a `Graph` object that has the following three methods:

- `node(x, label=L)`: Create a node with id  $x$  and displayed it as  $L$ .
- `edge(x, y, label=L)`: Create an edge connecting nodes with id  $x$  and  $y$  and add an edge label  $L$ .
- `view()`: Display the graph as a PDF file.

Then we can revise the program, as follows:

02fibtree.py

```

1  from sys import stdin
2  from graphviz import Graph
3
4  num_node = 0
5  tree = Graph()
6
7  class Node:
8      def __init__(self, n, left, right):
9          global num_node
10         self.id = str(num_node)
11         num_node += 1
12         self.n = n
13         self.left = left
14         self.right = right
15
16 def fib(n):
17     global tree
18     if n <= 1:
19         node = Node(n, None, None)
20         tree.node(node.id, label=str(n))
21     else:
22         left_node = fib(n-1)
23         right_node = fib(n-2)
24         node = Node(n, left_node, right_node)
25         tree.node(node.id, label=str(node.n))
26         tree.edge(node.id, left_node.id)
27         tree.edge(node.id, right_node.id)
28     return node
29
30 def main():
31     """Reads a user-specified non-negative integer n,
32     and then prints the structure of the Fibonacci tree for F(n)."""

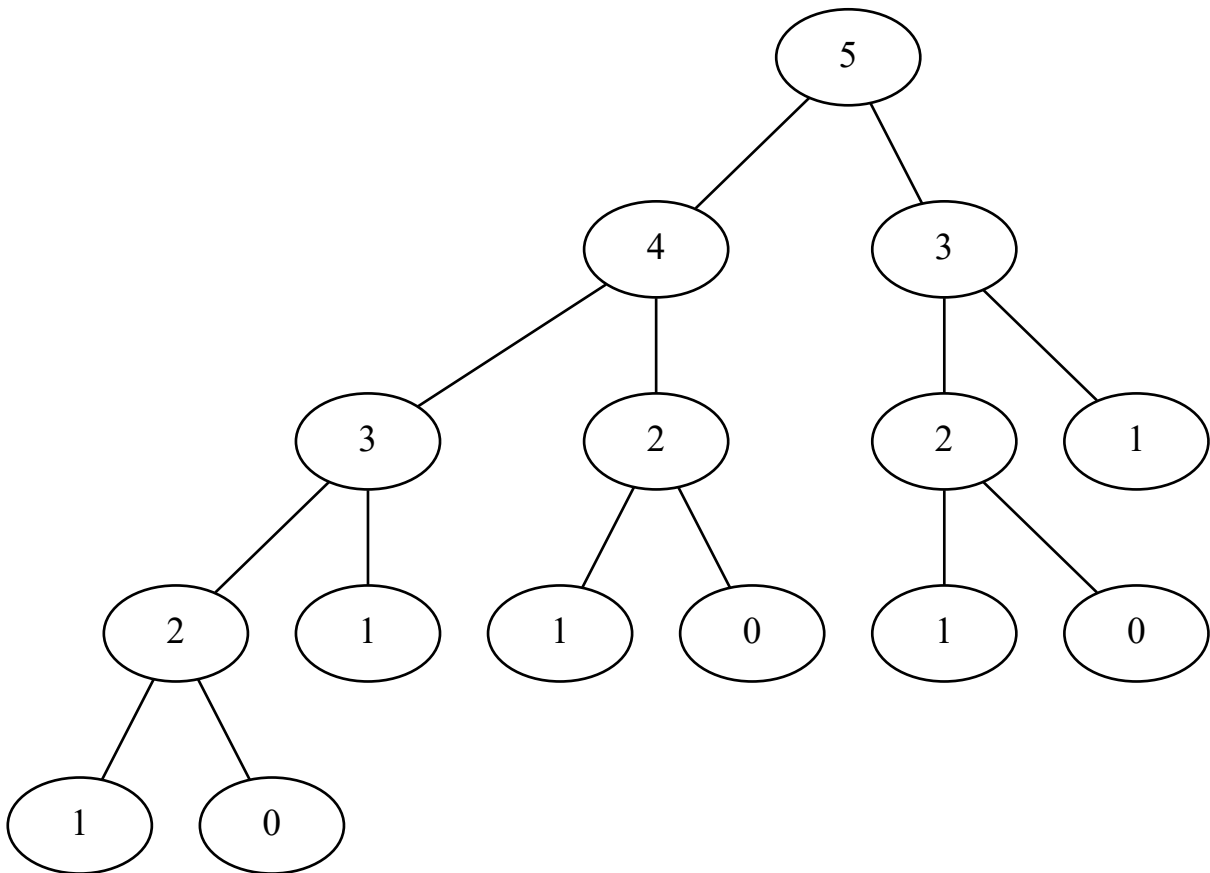
```

```

33     global tree
34
35     n = int(stdin.readline())
36     root = fib(n)
37     tree.view()
38
39 if __name__ == "__main__":
40     print(main.__doc__)
41     main()

```

Below is the output of the Fibonacci tree for  $F(5)$ :



### 3. A polynomial-time algorithm: Dynamic programming

Let's try to understand why `fib(n)` is so slow. The Fibonacci tree shown in Section 2 shows the cascade of recursive invocations triggered by a single call to `fib(5)`. Notice that many computations are repeated! For example, `fib(2)` was repeated three times, and `fib(3)` was repeated twice.

We can apply a technique called *Dynamic Programming*. The idea is to simply store the results of the subproblems, so that we do not have to re-compute them when needed later. We will use a dictionary `f` to store the subproblem results:

### 03fib.py

```
1  from sys import stdin
2  f = {}
3
4  def fib(n):
5      global f
6
7      if n in f: # if F(n) was computed before
8          return f[n]
9
10     # if F(n) was not computed before
11     if n <= 1:
12         f[n] = n
13     else:
14         f[n] = fib(n-1) + fib(n-2)
15     return f[n]
16
17 def main():
18     """Reads a user-specified non-negative integer n,
19     and then prints the n-th Fibonacci number F(n)."""
20
21     n = int(stdin.readline())
22     print(f"F({n}) = {fib(n)}")
23
24 if __name__ == "__main__":
25     print(main.__doc__)
26     main()
```

**Time complexity.** Now, we only compute  $\text{fib}(k)$  once for every  $k \leq n$ , and then we can obtain its result by simply using  $f[k]$ . Therefore, the time complexity of the improved algorithm is  $O(n)$ . Notice that we have improved the time complexity from exponential to linear!

## 4. Exercises

**Question 1.** Using both the *original* and *improved* Euclid's Algorithm, find the greatest common divisor (*g.c.d.*) of the following numbers.

- (a) 48, 36
- (b) 133, 728

**Question 2.** Consider the following algorithm in pseudocode that prints an  $n$ -integer array in ascending order.

```
1  fuction(num_array):
2      while num_array is not empty:
3          min_num = num_array[0]
4          for each number x in num_array:
5              if min_num > x:
6                  min_num = x
7          print(min_num)
8          delete min_num from num_array
```

- (a) What is its time complexity?
- (b) Where is the bottleneck in its computation?
- (c) How can we reduce the number of steps used in this bottleneck?