

**COMP20003**  
**Algorithms and Data Structures**  
**Algorithms**

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**Outline of the first few lectures**



- Algorithms: general
- This subject: details
- ➔ • **Algorithm efficiency**
- Computational complexity
- Data structures
  - Basic data structures
  - Algorithms on basic data structures
  - Complexity analysis of algorithms on basic ds's

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1-2

**Revisit: What is an algorithm?**



- A **set of steps** to accomplish a task.
- Computer algorithms must be:
  - **Specific.**
  - **Correct.**
  - Reasonably **efficient.**

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1-3

**Algorithms and Efficiency**



- An algorithm must:
  - be **accurate** (to within the required tolerance).
  - compute in a "**reasonable**" amount of **time**.
- The **most accurate** algorithm in the world is **useless** if it takes **forever** to compute.
  - We are particularly interested in **efficiency** as the **size of the input** grows.
- **Why?**

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1-4

### Example algorithm: Compute Fibonacci numbers

- $F_n = F_{n-1} + F_{n-2}$ 
  - $F_0 = 0$
  - $F_1 = 1$

n	F(n-1)	F(n-2)	F(n)
0	-	-	0
1	-	-	1
2	1	0	1
3	1	1	2
4	2	1	3
5	3	2	5
6			8
7	8	5	13
8	13	8	21

- 0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, ...

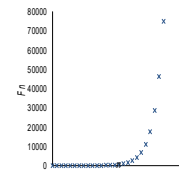
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1-5

### Fibonacci numbers

- Fibonacci numbers grow very quickly:

- $F_{10} = 55$
- $F_{15} = 610$
- $F_{20} = 6765$



Painting by Kobi, 19<sup>th</sup> c, public domain

### Fibonacci numbers

- The original problem that Fibonacci was investigating (1202):
  - How fast can rabbits breed under ideal circumstances?
  - <http://www.maths.surrey.ac.uk/hosted-sites/R.Knott/Fibonacci/fibnat.html#Rabbits>



Painting by Kobi, 19<sup>th</sup> c, public domain

### How to compute Fibonacci numbers?

- Given the definition of Fibonacci numbers:
  - $F_n = F_{n-1} + F_{n-2}$ 
    - $F_0 = 0$
    - $F_1 = 1$
- Does this suggest an **easy way** to calculate  $F_n$ ?

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1-8

## Computing Fibonacci Numbers: Scaffolding

```
#include<stdio.h>
#define DEBUG 1

int fib (int n)
{
    if(n==0) return 0;
    if(n==1) return 1;
    return fib(n-1) + fib(n-2);
}

int main()
{
    int n, ans;
    printf("Enter a number:\n");
    scanf("%d", &n);
    if(DEBUG)
        printf("%d\n", n);
    ans = fib(n);
    printf("Fibonacci of %d is %d\n", n, ans);
}
```

Source: <https://jdoodle.com/a/4eF>

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1-9

## Naïve Fibonacci algorithm

```
int fib (int n)
{
    if(n==0) return 0;
    if(n==1) return 1;
    return fib(n-1) + fib(n-2);
}
```

Definition:

$$\begin{aligned} F_0 &= 0 \\ F_1 &= 1 \\ F_n &= F_{n-1} + F_{n-2} \end{aligned}$$

- Is the algorithm correct? **yes**
- How long does it take to compute? **Next slides**

## Fibonacci computation

- How to **estimate computation** effort:
  - **Count operations.**
  - Count operations as a **function of input size.**
  - Count operations as a **proxy for time.**
- $T(n)$  = **run time** for input  $n \approx$  **number of operations** for input  $n$ .
  - **Portable** between machines.
  - Can **compare** algorithms.



## Fibonacci computation

- Looking at  $T(n)$  as **number of operations** to calculate the **nth** Fibonacci number, then
  - $T(n) = T(n-1) + T(n-2) + 3$  (operations)
  - $T(1) = T(0) = 1$
- Example: unrolling the loop
  - $T(4) = T(3) + T(2) + 3$

### Fibonacci computation

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  - $= T(2) + T(1) + 3 + T(2) + 3$

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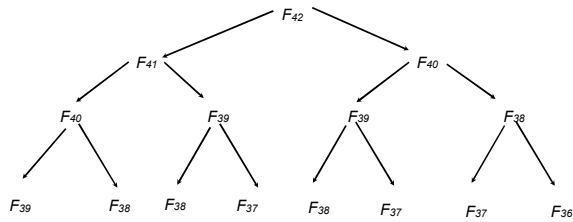
### Fibonacci computation

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- Example: unrolling the loop
  - $T(4) = T(3) + T(2) + 3$
  - $= T(2) + T(1) + 3 + T(2) + 3$
  - $= T(1) + T(0) + 3 + T(1) + 3 + T(1) + T(0) + 3$
  - $+ 3$
  - $= 1+1+3+1+3+1+1+3+3 = 17$  operations

### Fibonacci computation

- Looking at  $T(n)$  as number of operations to calculate the  $n$ th Fibonacci number, then
  - $T(n) = T(n-1) + T(n-2) + 3$  (operations)
  - $T(1) = T(0) = 1$
- Example:
  - $T(5) = T(4) + T(3)$
  - $= 17 + T(2) + T(1) + 3$
  - $= 17 + 9$
  - $= 26$

## How many operations to calculate $F_{42}$ ?



Any obvious inefficiencies?

Recomputation

## Memoization

Store previously computed values

```

int fib(int n)
{
    int i;
    int fib[n+1];

    fib[0] = 0;
    fib[1] = 1;

    for(i = 2; i <= n; i++)
    {
        fib[i] = fib[i-1] + fib[i-2];
    }
    return fib[n];
}
/* how many operations to calculate fib(n)? */

```

Source: <https://jdoodle.com/a/4eM>

## ...or without storing all the intermediate results

```

int fib(int n)
{
    int result = 0;
    int preOldResult = 1;
    int oldResult = 1;

    if(n <= 0) return 0;
    if(n > 0 && n < 3) return 1;

    for (int i = 3; i <= n; i++) {
        result = preOldResult + oldResult;
        preOldResult = oldResult; //Bookkeeping of last 2 results
        oldResult = result;
    }
    return result;
}

```

Source: <https://jdoodle.com/a/4eH>

1-19

## Counting operations

- Count of **operations** as proxy for run time:
  - Advantages?
  - Caveats?
- How long does calculation of **fib(2)** take
  - Using the **naïve** algorithm? Use  $T(2) = 5$  ops
  - Using **memoization**? 5 ops as well. Differences appear for big  $n$ !!
- Do we care how long things take for **small input  $n$** ?

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1-20

### Complexity analysis: general method

- Count operations for  $T(n)$  “time” (number of ops) taken for input  $n$ .
  - best to identify the most expensive operation and count that operation.
  - we can sometimes trade off space for time.

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1-21

### Complexity analysis: a fine point for fib()

- Assumption:
  - addition of two numbers takes constant time.
  - True if both numbers can fit into one computer word: 32 bits,  $\text{number} < 2^{32}$ .
- But Fibonacci numbers get very large:
  - $F_n$  takes approximately  $0.694n$  bits, so
  - To fit in one word,  $n < 32/0.694 = 46$
  - $F_{50} = 12,586,269,025 > 12 \cdot 10^9 > 2^{33}$
  - Assumption not valid for large  $n$ .

1-22

### Closed form for Fibonacci numbers

- Binet's formula:

$$F_n = \frac{1}{\sqrt{5}} \left( \left( \frac{1 + \sqrt{5}}{2} \right)^n - \left( \frac{1 - \sqrt{5}}{2} \right)^n \right)$$

- For large  $n$ ,  $F_n \approx 2^{0.694n}$
- For more on Fibonacci numbers see :
  - <http://mathworld.wolfram.com/FibonacciNumber.html>

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1-23

### Complexity analysis: Intuition

- Fortunately, most algorithms do deal with smaller numbers.
  - Counting operations usually suffices.
- Always be aware of the assumptions:
  - What is the most expensive operation?
  - Are the operations really constant?
  - What are the inputs and outputs?

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1-24

## Skiena: Algorithm Design Manual

- Chapter 1:
  - Algorithm correctness.
  - Example problems.
- Chapter 2:
  - Chapter 2.1: counting operations

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1-25

## A small diversion: Which C standard?

- **C standards:**
  - ANSI C (C89)
  - C99 – “substantially” completely supported in gcc 4.5 (with `-std=C99` option on)
  - C11 (current C standard, from 2011) **gcc 4.8**
- On `nutmeg.eng.unimelb.edu.au`:
  - `gcc -v`:
  - **gcc version 4.4.7**

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1-26

## C for gcc on nutmeg

- ANSI C with *some* of the features of C99, *e.g.*
  - Supported:
    - inline functions
    - long long int
  - Not supported:
    - Variable length arrays
    - Doesn't insist on explicit return type for function
- For all the new features in C99 see:  
<http://www.open-std.org/jtc1/sc22/wg14/www/newinc9x.htm>

1-27

## Next section

- **Complexity analysis more formally.**
- **Big-O** and related formalisms.

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1-28