

# Computer Science 2300: Data Structures and Algorithms

---

RPI, Spring 2009  
Instructor: Sanmay Das

## Course Structure

- 2 lectures (MTh 12-1:30) and 1 lab (W -- must attend your assigned lab)
- Small lab projects (-6), plus -8 homeworks (20% + 35% of grade)
- One midterm (20%), plus a final exam (25%)
- <http://www.cs.rpi.edu/~sanmay/teaching/cs2300/>

## What is this class about?

- Thinking like a computer scientist
  - Continuing the transition from programmer
- Learning how to approach problems
- NOT about code. We assume you are competent in C++

## Textbooks

- Primary: *Algorithms* by Dasgupta, Papadimitriou, and Vazirani (more readable) [DPV]
- Secondary: *Introduction to Algorithms* by Cormen, Leiserson, Rivest and Stein (more encyclopedic) [CLRS]
- Any programming reference you need, but none assigned (suggestion, Stroustrup)

## Prerequisites

- CS2 and Discrete Structures
- Taking Discrete Structures right now?
  - Motivated? Confident about picking up discrete math quickly?
  - Check the appendices in CLRS
- Programming: you won't need any new tricks, but there will be little handholding!

## Staff

- My office hours: Mondays after class. Plus by appointment
- TAs: Eyuphan Bulut and Ashok Sukumaran
  - Primary point of contact: your lab TA
  - Available during lab (OH in non-lab weeks, but not this week) and by appointment
- UTAs will be available during labs to help you out

## Syllabus and Course Policies

- Role of labs
- You are responsible for all announcements made in lecture, posted on the website, or sent via e-mail
- Late-day policy
- Collaboration policy
- Grading policies

## Lectures

- I strongly encourage attendance. You are responsible for everything discussed.
- I'm a big fan of questions. Both receiving them and posing them.
- If no one answers my questions I will wait as long as it takes until someone does

## Data Structures & Algorithms

- $\text{MCDXLVIII} + \text{DCCCXII} = ?$
- Answer:  $\text{MMCCLX}$
- How did you do it?  $1448 + 812 = 2260?$

## Addition, contd.

- Note that representation is key (sort of like a data structure)
- Algorithms operate on data
- Decimal addition is easy, roman numeral addition is not!

## A Brief Tour of the Class

- Introduction. Correctness and running time analysis
- Divide-and-conquer algorithms. How to reduce problems.
  - Faster integer multiplication (!)
  - Sorting
  - Median-finding

## Graph Algorithms

- Why graphs?
  - Encapsulate many problems
  - The web!!
- Graph representations
  - Lists or matrices?
- Exploring graphs and finding short paths

## Data Structures

- More familiar, but more advanced material, which will be coupled with interesting new algorithms:
  - Heaps
  - Trees
  - Hash tables

## More advanced algorithms

- Dynamic programming
- Introduction to NP-completeness -- when can we (probably) not solve a (large) problem exactly?

## Analysis of Algorithms

- Two things we care deeply about:
  - Proving correctness
  - Analyzing running time

## Fibonacci Numbers

- 0, 1, 1, 2, 3, 5, 8, 13, 21, 34, ...
- From rabbit reproduction to Vedic metre...
- Rule:
  - $F_n = F_{n-1} + F_{n-2}, n > 1$
  - $F_n = 1, n = 1$
  - $F_n = 0, n = 0$

## Some Properties

- Grow almost as fast as powers of 2!
- $F_n \approx 2^{0.694n}$
- $F_{100}$  is 21 digits long!

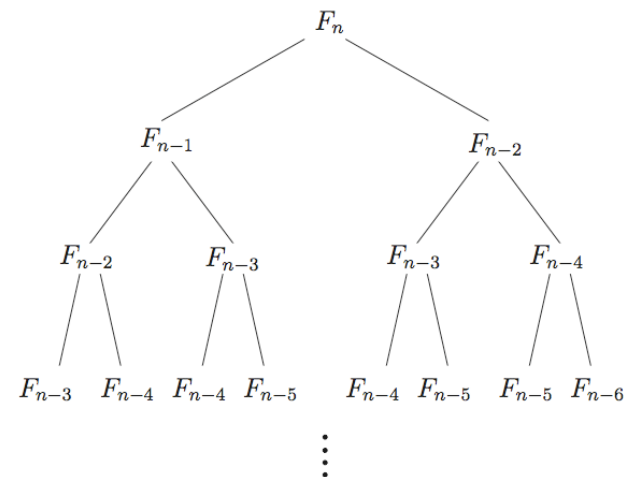
## How to compute $F_n$ ?

- function `fib(n)`
  - if  $n = 0$ : return 0
  - if  $n = 1$ : return 1
  - return `fib(n-1) + fib(n-2)`
- Correctness?
- Time taken?

## Time

- $T(n)$  : # computer steps taken to compute `fib(n)`
- $T(n) \leq 2$  for  $n \leq 1$
- $T(n) = T(n-1) + T(n-2) + 3$  for  $n > 1$
- $T(n) \geq F_n$  !!
- This is very bad news. Exponential complexity!

## Why so slow?



## A Better Algorithm

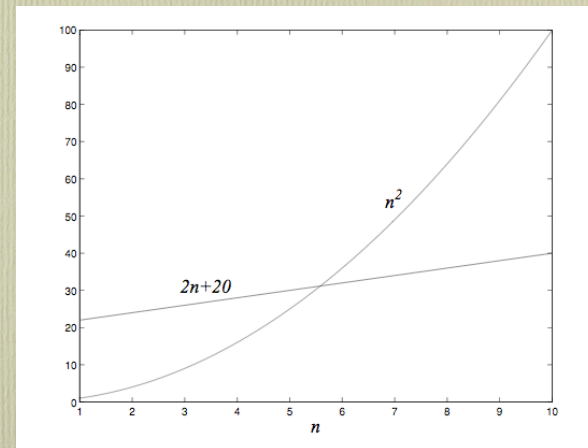
- if  $n = 0$  : return 0
- create an array  $f[0\dots n]$
- $f[0] = 0, f[1] = 1$
- for  $i = 2\dots n$ :
  - $f[i] = f[i-1] + f[i-2]$
- return  $f[n]$

## Running Time?

- Linear!
- Caveat:
  - When does it stop making sense to think of each computer operation as 1 time unit?
- $F_n$  is about 0.694 bits long. We'll quickly exceed 32 (or even 128) bits, so can't just assume one operation.

## Big-O Notation

- $f(n), g(n)$  : functions from integers to reals
- $f$  is  $O(g)$  if  $\exists$  (positive) constants  $c$  and  $n_0$  such that  $f(n) \leq c g(n)$  for  $n \geq n_0$
- Intuition:  $f$  grows no faster than  $g$



## Analogs

- $f = \Omega(g) : g = O(f)$
- $f = \Theta(g) : f = O(g)$  and  $g = O(f)$
- Small o: strictly slower growth

## Rules of Thumb

- Exponentials dominate polynomials
- Polynomials dominate logs
- $n^a$  dominates  $n^b$  if  $a > b$
- Omit multiplicative constants

## Maximum Subsequence Sum

- Given a sequence of integers  $A_1, \dots, A_n$ , find the maximum value of  $\sum_{k=i}^j A_k$
- Example: -2, 11, -4, 13, -5, -2
- Answer: 20

## Algorithm 1

- $\text{maxSum} = 0$
- for  $i$  in  $0:n-1$ 
  - for  $j$  in  $i:n-1$ 
    - $\text{thisSum} = 0$ 
      - for  $k$  in  $i:j$ 
        - $\text{thisSum} = \text{thisSum} + a[k]$
      - if ( $\text{thisSum} > \text{maxSum}$ )
        - $\text{maxSum} = \text{thisSum}$

## Running Time?

- Simple analysis: 3 loops, one inside the other, each of worst case size  $n$  :  $O(n^3)$
- More sophisticated: still  $O(n^3)$

$$\sum_{i=0}^{n-1} \sum_{j=i}^{n-1} \sum_{k=i}^j 1 = ?$$

$$\sum_{k=i}^j 1 = j - i + 1$$

$$\sum_{j=i}^{n-1} (j - i + 1) = \frac{(n-i+1)(n-i)}{2}$$

$$\sum_{i=0}^{n-1} \frac{(n-i+1)(n-i)}{2} = \frac{n^3 + 3n^2 + 2n}{6}$$

## An $O(n^2)$ Algorithm

- $\text{maxSum} = 0$
- for  $i$  in  $0:n-1$ 
  - $\text{thisSum} = 0$
  - for  $j$  in  $i:n-1$ 
    - $\text{thisSum} = \text{thisSum} + a[j]$
    - if ( $\text{thisSum} > \text{maxSum}$ )
      - $\text{maxSum} = \text{thisSum}$
- return  $\text{maxSum}$

## An $O(n)$ Algorithm

- $\text{maxSum} = 0, \text{thisSum} = 0$
- for  $j$  in  $0:n-1$ 
  - $\text{thisSum} = \text{thisSum} + a[j]$
  - if ( $\text{thisSum} > \text{maxSum}$ )
    - $\text{maxSum} = \text{thisSum}$
  - else if ( $\text{thisSum} < 0$ )
    - $\text{thisSum} = 0$
- return  $\text{maxSum}$

## Why Does This Work?

- Key observation: Any negative subsequence cannot be a prefix of the optimal subsequence. We compute the maximum subsequence ending at position  $j$
- Whenever a subsequence first becomes negative, we can reset and consider only subsequences that start beyond  $j$  (why?)