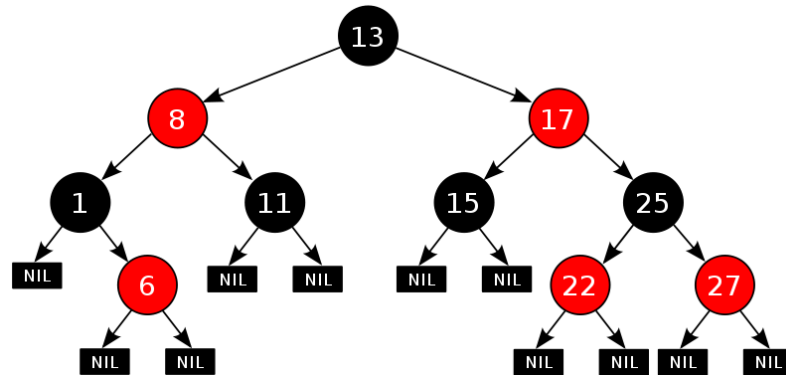


# Algorithms I

## Dr Robert Harle

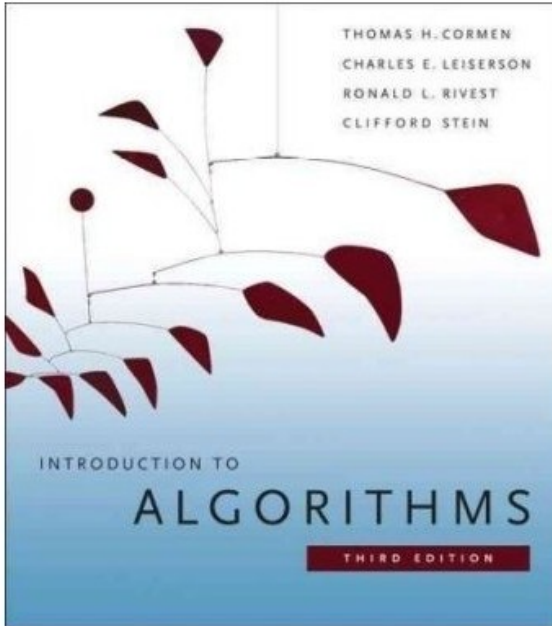


CST Paper I  
(IA NST CS, PPS CS and CST)  
Easter 2009/10

# Algorithms I

- This course was developed by **Dr Frank Stajano**, who is on sabbatical this year
- I'm the “substitute teacher” :-)
- Dr Stajano's notes are very good: you have a copy of those as the handout. Those and the course textbook are probably all you need.
- However, I will post an annotated PDF of the notes I make in lectures as we go: check the course web page
- Three Parts
  - **Sorting Algorithms**
  - **Algorithm Design**
  - **Data Structures**

# The CLR(S) Book



- Intro. To Algorithms
  - Cormen, Lieverson, Rivest, (Stein)  
CLR
- The course is loosely based on this book
  - Definitely read the relevant bits of this book
  - Most libraries should have a copy
  - It contains some good exercises

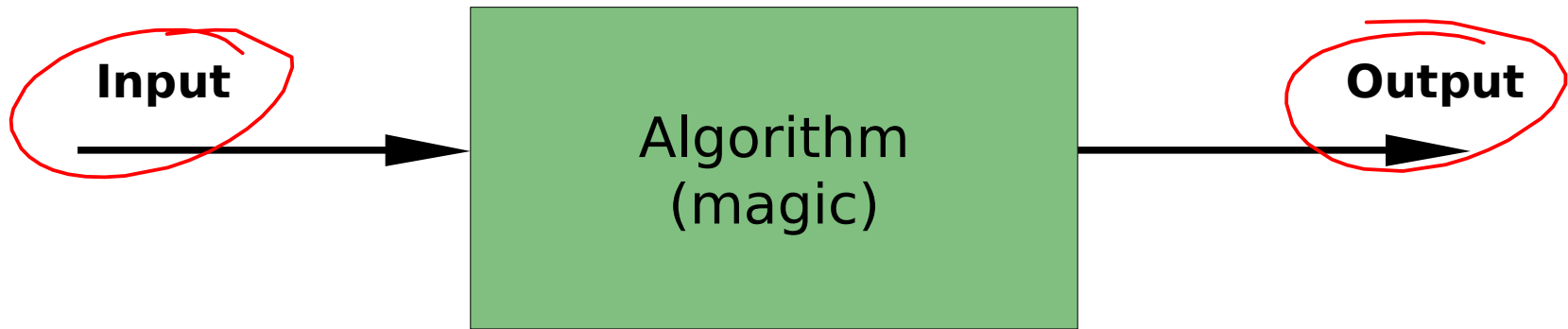
# Exercises

- There are some exercises dispersed throughout the notes
  - They aren't numbered
  - Most are just meant to be done as you read, rather than detailed problems
- There will be **an exercise sheet available as a PDF on the course website** that you may wish to use for supervisions.

# Algorithms

- At its core, CS is really just about puzzle solving. But we aren't just interested in finding a solution (or “algorithm”), we're interested in **finding the best solution** given some definition of 'best'
- Everything else (programming, maths) is just a set of tools that turn out to be useful in supporting our puzzle solving.
- There is no “universal algorithm”; nor will there be.
  - But you can learn a lot from studying how to solve a variety of problems since many problems can be broken down into smaller problems to which established algorithms (or variants of) are appropriate

# Algorithms Optimize Something



- We choose algorithms based on:
  - How soon they give us output (**performance**) ✂
  - How much resource they use (**space**) ✂
  - How good the output is (**quality**) ←
  - Combinations of the above

# Example: Digital Cameras (JPEG)

- Digital cameras read in a load of pixels and have to convert them into a JPEG image
  - **Performance**: Need to do the conversion quickly so you can take another picture
  - **Space**: Need to do the conversion with minimal space overheads (to keep camera cost and size down)
  - **Quality**: Need to produce a small file that is still a good representation of the original data



# Example: Search Engines

Pages: **A B C D E F G H I J K L**

Google: 1000 queries per second (2006)

14,000,000,000  
140,000,000 MB

## Index

GET

A

FIRST

THIS

YEAR

**A B F H**

G D K I J B D

**G A**

E F I G A

C

Google algorithms:

1. Page rank  
- better ordering  
- more money in

2. Mapreduce  
- use lots of cheap PCs to do the work

200,000 words in English

## Algorithms:

- Look up the search term in the index
- Optionally combine the results (AND, OR)
- Arrange the results in some useful order



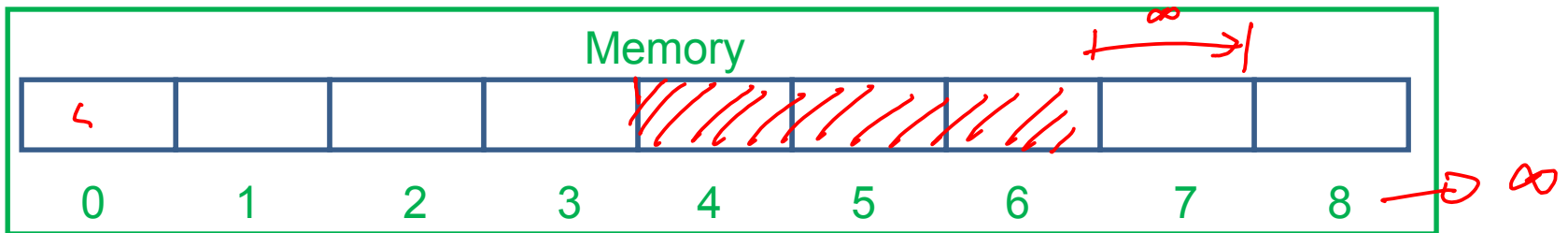
# Part I: Sorting Algorithms

# Why Sorting?

- There is an objective correct result
- Many sorting algorithms are available
  - Some really simple
  - Some more complex
- Sorting (and searching) are needed for most large-scale algorithms
- You have already met some of this in FoCS, but I'll recap anyway (it is revision time after all)
  - Plus you concentrated on sorting **lists** in FoCS: here we look at sorting **arrays**

# Memory Model

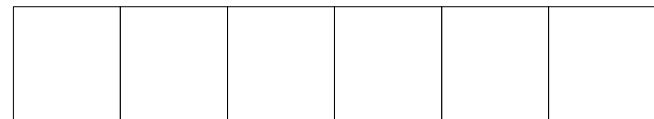
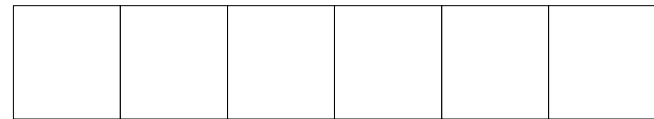
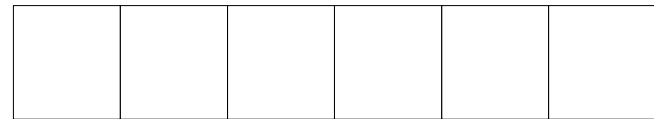
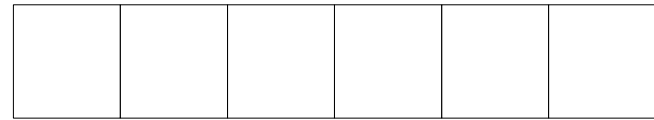
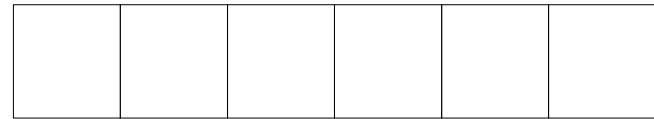
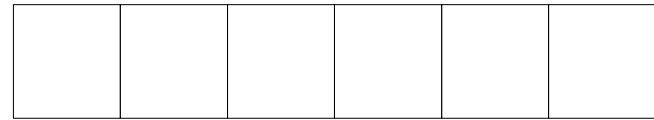
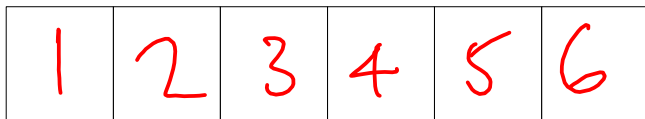
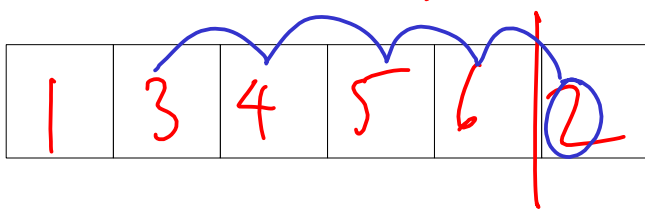
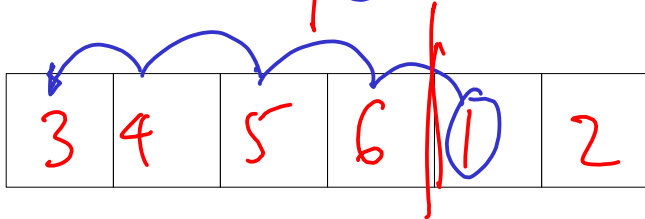
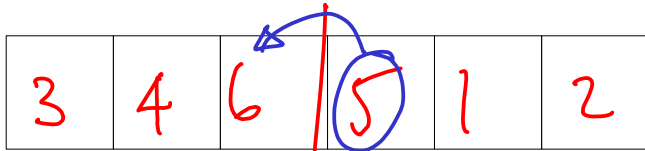
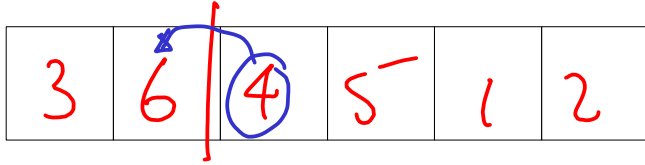
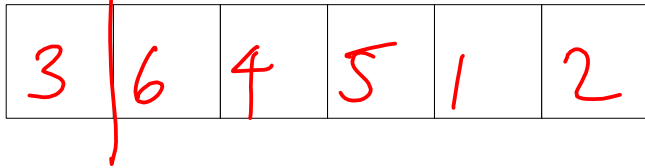
- We'll use the simple model from OOP



- Key points:
  - Memory is addressed using numerical addresses and therefore random access
  - We will assume that we never run out of memory
  - We will not worry about the capacity of each memory slot (we'll assume any number can be represented in any slot)

# Insertion Sort

sorted ← → unsorted



# Insertion Sort

```
0 def insertSort(a):
1     '''BEHAVIOUR: Run the insertsort algorithm on the integer
2     array a, sorting it in place.
3
4     PRECONDITION: array a contains len(a) integer values.
5
6     POSTCONDITION: array a contains the same integer values as before,
7     but now they are sorted in ascending order.'''
8
9     for k from 0 to len(a)-2:
10        [assert(the first k positions are already sorted)]
11
12        # Pick up item k+1 (call it a[j]) and let it sink to its correct place
13        j = k+1
14        while j > 0 and a[j-1] > a[j]:
15            swap(a[j-1], a[j])
16            j = j-1
```

constraints  
on input  
(if any)

"Contract" for  
what the  
alg will do

# How 'good' is any algorithm?

- It's hard to put numbers to anything since the performance is presumably heavily dependent on the input
- As you know we usually study the limiting behaviour using the **asymptotic notation** you met in FoCS

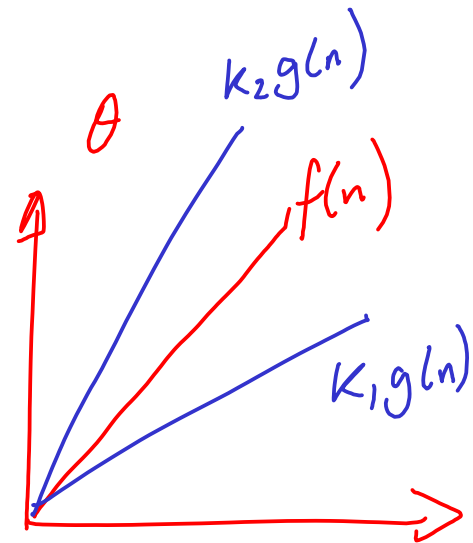
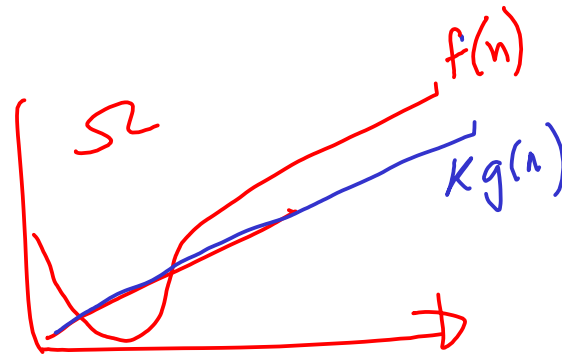
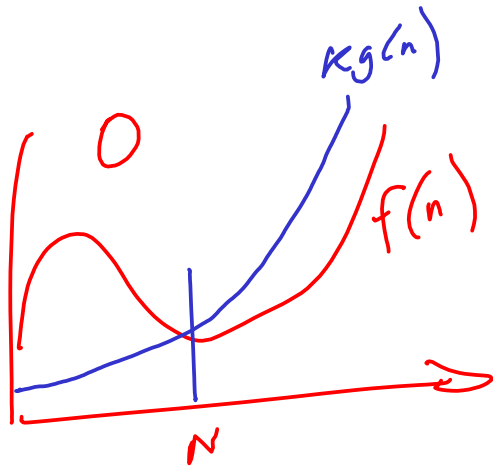
# Complexity Notations

Big-O:  $0 \leq f(n) \leq k \cdot g(n)$

$\Theta$ :  $0 \leq k_1 \cdot g(n) \leq f(n) \leq k_2 \cdot g(n)$

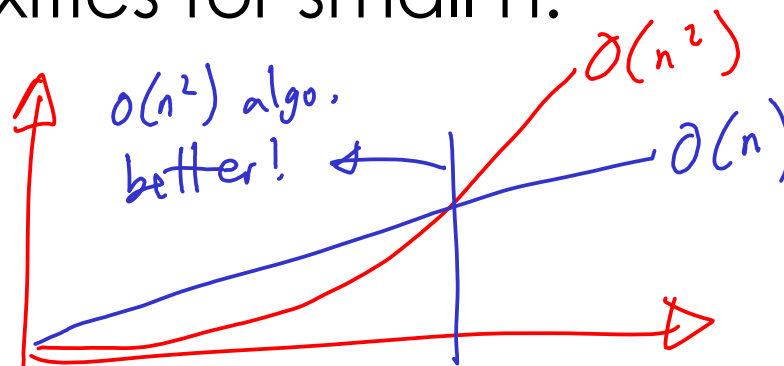
$\Omega$ :  $0 \leq k \cdot g(n) \leq f(n)$

For  $n > N$   
 $K, k_1, k_2, N > 0$



# Notes

- $\log_a(x) = \log_b(x) / \log_b(a)$ 
  - So the base of any logarithm in  $g(n)$  is irrelevant "lg" or "log"
- The value of  $N$  above which the bound holds could be very big
  - i.e. Take care when comparing two complexities for small  $n$ .





# Examples

- Show  $(x+5)\lg(3x^2+7)$  is  $O(x\lg x)$

$$(x+5)\lg(3x^2+7) \leq (x+5x)\lg(3x^2+7x^2) \quad x \geq 1$$
$$\leq 6x\lg(10x^2)$$

$$6x\lg(\underline{10x^2}) \leq 6x\lg(x^3) \quad x \geq 10$$
$$= 18x\lg x$$

$$(x+5)\lg(3x^2+7) \leq 18x\lg x$$

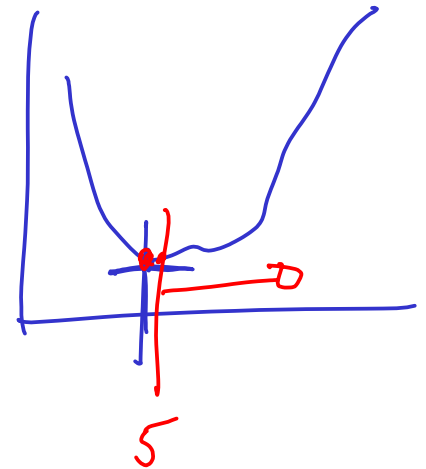
$$\underline{\underline{O(x\lg x)}}$$

# Examples

- Show  $n^3 + 20n$  is  $\Omega(n^2)$

$$n^3 + 20n \geq kn^2 \quad \text{Defn}$$

$$n + \frac{20}{n} \geq k \quad \text{constant}$$



Find  
minimum

$$\frac{d}{dn} \left( n + \frac{20}{n} \right) = 1 - \frac{20}{n^2} = 0$$

$$n^2 = 20 \quad n = \sqrt{20} \approx \underline{\underline{4.5}}$$

$$\underline{\underline{N=5}} \quad k \leq 9$$

$$5 + \frac{20}{5} = 9$$

# Examples

- Show  $n^2 - 3n$  is  $\Theta(n^2)$

$$k_1 n^2 \leq n^2 - 3n \leq k_2 n^2 \quad \text{Def'n}$$

$$k_1 \leq 1 - \frac{3}{n} \leq k_2$$

$$k_1, k_2 > 0$$

$n$	$1 - \frac{3}{n}$
1	-2
2	-0.5
3	0
4	$\frac{1}{4}$
⋮	⋮

$$k_1 = \frac{1}{4}$$
$$n \geq 4$$

$$k_2 \geq 1$$
$$\forall n > 1$$

$$\Theta(n^2)$$
$$k_1 = \frac{1}{4} \quad N = 4$$
$$k_2 = 1$$

# Relating to Running Time

- We assume:
  - Any memory access takes unit time  $O(1)$
  - Any arithmetic takes unit time  $O(1)$
- Thus the running time is linked to the number of operations the algorithm requires.
- Problem: this is often dependent on the input

# Worst, Average and Amortized costs

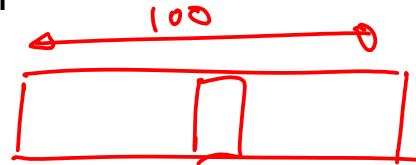
- **Worst-case**

- Analyse for the worst possible input. This gives you an upper bound for the performance.

- **Average-case**

- Analyse for an 'average' input. Problem here is that the notion of average assumes some probability distribution of inputs, which we rarely have (and which is application specific of course).

- **Amortized analysis**



- Sometimes we have a sequence of operations that occur: in this case we may *amortize* the total cost to run the sequence of operations so we get an average cost per operation. e.g. Garbage collection.