

1

Machines & Models

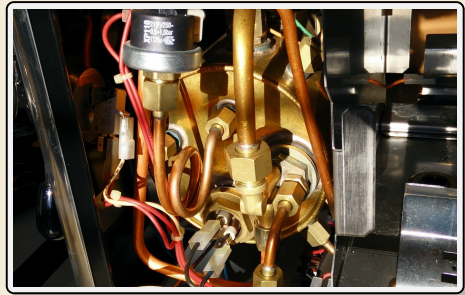
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Sebastian Wild

Learning Outcomes

1. Understand the difference between empirical *running time* and algorithm *analysis*.
2. Understand *worst / best / average case* models for input data.
3. Know the *RAM machine* model.
4. Know the definitions of *asymptotic notation* (Big-Oh classes and relatives).
5. Understand the reasons to make *asymptotic approximations*.
6. Be able to *analyze* simple *algorithms*.

Unit 1: *Machines & Models*



Outline

1 Machines & Models

- 1.1 Algorithm analysis
- 1.2 The RAM Model
- 1.3 Asymptotics & Big-Oh

What is an algorithm?

An algorithm is a sequence of instructions.

↑
think: recipe

↑
e. g. Python script

More precisely:

1. mechanically executable
 ~> no "common sense" needed
2. finite description ≠ finite computation!
3. solves a *problem*, i. e., a class of problem instances

↑
 $x + y$, not only $17 + 4$

▶ input-processing-output abstraction



Typical example: *bubblesort*

~> not a specific program
but the underlying idea

What is a data structure?

A data structure is

1. a rule for encoding data
(in computer memory), plus
2. algorithms to work with it
(queries, updates, etc.)

typical example: binary search tree



1.1 Algorithm analysis

Good algorithms

Our goal: Find good (best?) algorithms and data structures for a task.

Good “usually” means

- ▶ fast running *time*
- ▶ moderate memory *space* usage

can be complicated in distributed systems

Algorithm analysis is a way to

- ▶ compare different algorithms,
- ▶ predict their performance in an application

Running time experiments

Why not simply run and time it?

- ▶ results only apply to
 - ▶ single *test* machine
 - ▶ tested inputs
 - ▶ tested implementation
 - ▶ ...
- ≠ *universal truths*



- ▶ instead: consider and analyze algorithms on an abstract machine

↪ provable statements for model

survives Pentium 4

↪ testable model hypotheses

↪ Need precise model of machine (costs), input data and algorithms.

Data Models

Algorithm analysis typically uses one of the following simple data models:

▶ **worst-case performance:**

consider the *worst* of all inputs as our cost metric

▶ **best-case performance:**

consider the *best* of all inputs as our cost metric

▶ **average-case performance:**

consider the average/expectation of a *random* input as our cost metric

Usually, we apply the above for *inputs of same size n* .

⇒ performance is only a **function of n** .

1.2 The RAM Model

Clicker Question

What is the cost of *adding* two d -digit integers?
(For example, for $d = 5$, what is $45\,235 + 91\,342$?)



- A** constant time
- B** logarithmic in d
- C** proportional to d
- D** quadratic in d
- E** no idea what you are talking about



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Machine models

The machine model decides

- ▶ what algorithms are possible
- ▶ how they are described (= programming language)
- ▶ what an execution *costs*

Goal: Machine model should be detailed and powerful enough to reflect actual machines, abstract enough to unify architectures, simple enough to analyze.

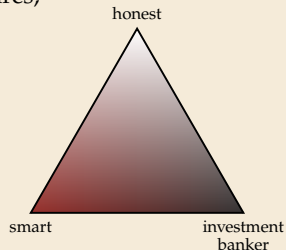
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~> usually some compromise is needed



Random Access Machines

Random access machine (RAM)

more detail in §2.2 of *Sequential and Parallel Algorithms and Data Structures*
by Sanders, Mehlhorn, Dietzfelbinger, Dementiev

- ▶ unlimited *memory* $\text{MEM}[0], \text{MEM}[1], \text{MEM}[2], \dots$
 - ▶ fixed number of *registers* R_1, \dots, R_r (say $r = 100$)
 - ▶ memory cells $\text{MEM}[i]$ and registers R_i store w -bit integers, i. e., numbers in $[0..2^w - 1]$
 w is the word width/size; typically $w \propto \lg n \rightsquigarrow 2^w \approx n$
 - ▶ Instructions:
 - ▶ load & store: $R_i := \text{MEM}[R_j] \quad \text{MEM}[R_j] := R_i$ —
 - ▶ operations on registers: $R_k := R_i + R_j$ (arithmetic is *modulo* 2^w !)
also $R_i - R_j, R_i \cdot R_j, R_i \text{ div } R_j, R_i \bmod R_j$
C-style operations (bitwise and/or/xor, left/right shift)
 - ▶ conditional and unconditional jumps
 - ▶ cost: number of executed instructions
- \rightsquigarrow The RAM is the standard model for sequential computation.

 we will see further models later

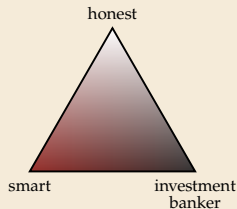
Pseudocode

- ▶ Programs for the random-access machine are very low level and detailed
≈ assembly/machine language

Typical simplifications when describing and analyzing algorithms:

- ▶ more abstract *pseudocode* ← code that humans understand (easily)
 - ▶ control flow using **if**, **for**, **while**, etc.
 - ▶ variable names instead of fixed registers and memory cells
 - ▶ memory management (next slide)
- ▶ count *dominant operations* (e. g. memory accesses)
instead of all RAM instructions

In both cases: We can go to full detail where needed.



Memory management & Pointers

- ▶ A random-access machine is a bit like a bare CPU . . . without any operating system
 ↪ cumbersome to use
- ▶ All high-level programming languages add *memory management* to that:
 - ▶ Instruction to *allocate* a contiguous piece of memory of a given size (like `malloc`).
 - ▶ used to allocate a new array (of a fixed size) or
 - ▶ a new object/record (with a known list of instance variables)
 - ▶ There's a similar instruction to free allocated memory again.
 - ▶ A *pointer* is a memory address (i. e., the *i* of `MEM[i]`).
 - ▶ Support for procedures (a.k.a. functions, methods) calls including recursive calls
 - ▶ (this internally requires maintaining call stack)



We will mostly ignore *how* all this works in COMP526.