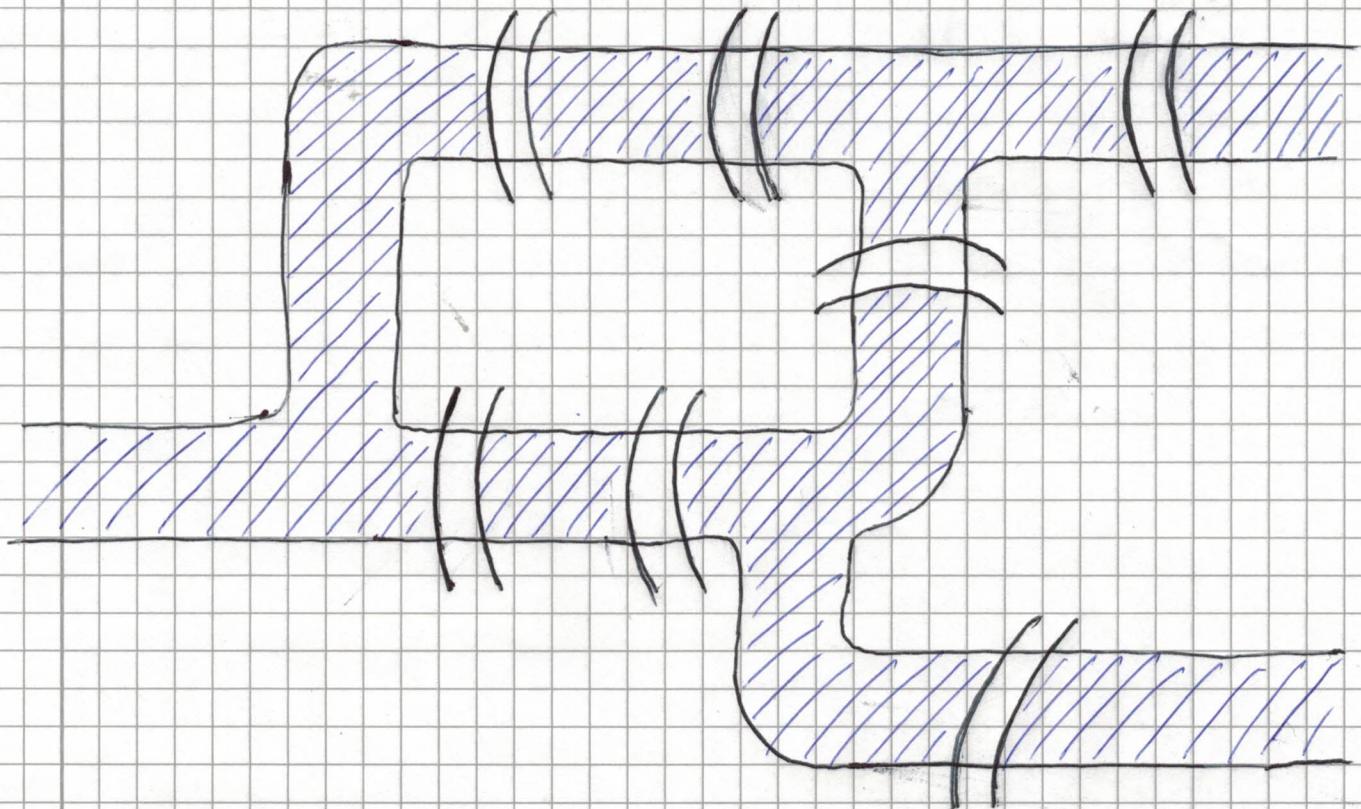


7 bridges of Königsberg (now Kaliningrad)

Problem solved by Euler in 1736

Laid the foundations for graph theory  
(central topic in algorithms)



PROBLEM:

Walk across all bridges exactly once  
and return to starting position

## ALGORITHM DESIGN & ANALYSIS

- Model problem
- Design algorithms
- Prove correctness
- Analyze complexity 

## COMPLEXITY MEASURES

- running time 
- memory usage
- parallelism
- communication
- et cetera

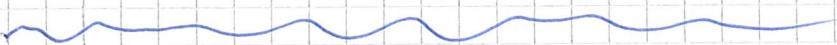
## COMPUTATIONAL MODEL

Give full math details later

For now:

- standard computer
- your favourite programming language  
(Java, Python, C++)

Math model (very) robust to such details



Let's model problems and  
design algorithms to analyze 

Only BRIDGES in Königsberg matter

III

Graphs  $G = (V, E)$

Vertices

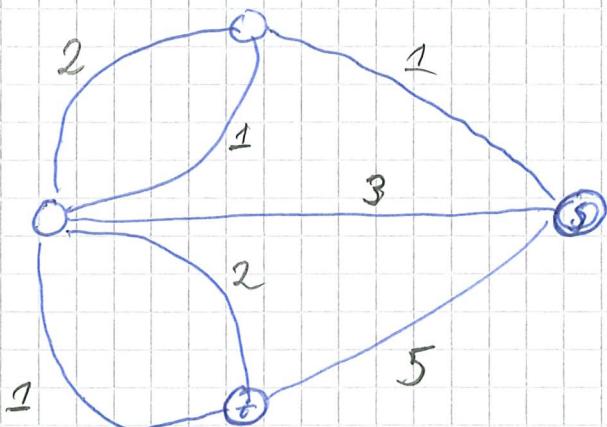
v

Edges (between pairs of vertices)  $(u, v)$

Extensions:

Edges can have weights

(how long does it take to travel over the bridge, say)



CYCLE: Walk along edges returning to start vertex

Computational problems given  $G = (V, E)$  as input

EULERIAN CYCLE: Is there cycle using every edge once?  
ECP

HAMILTONIAN CYCLE: Is there cycle visiting every vertex once?  
HCP

TRAVELING SALESMAN PROBLEM: Cycle visiting every vertex one of length  $\leq L$   
(say  $L = 7$  here)  
TSP

SHORTEST PATH PROBLEM: Path from s to t of length at most  $L'$   
(say,  $L' = 3$  here)  
SPP

## EULERIAN CYCLE ALGORITHM

IV

Observation: For every vertex, edges (bridges) are used in pairs incoming - outgoing.

⇒ After finished cycle, must have even #edges incident to each vertex  
(Can prove this is also sufficient)

Algorithm 1 Given graph  $G(V, E)$

For every vertex

check if # incident even

If so answer "yes", else answer "no"

(Informal pseudo-code — can be translated to formal programs easily)

The other problems ~~are about~~ focus on vertices

Generic algorithm 2

Given graph  $G = (V, E)$

For every possible ordering  $V = v_1, v_2, \dots, v_n$

HCP: check if edges  $(v_i, v_{i+1})$  and  $(v_n, v_1)$  exist

TSP: calculate also total length of cycle

SPP : Calculate length of subpath sum t

Answer "yes" if conditions ever met,  
otherwise "no"

## COMPLEXITY ANALYSIS

Measure # "basic operations"

What does "basic operation" mean? More details soon  
Here for instance:

- add two numbers
- check if edge  $(u, v)$  exists

What is a good (i.e., fast) algorithm?

Both our algorithms will be fast on our small example graph. Will take much longer if we run them on, say, the Facebook friend graph — but then the input is also so much larger!

KEY INSIGHT Measure how running time / # operations scales with input size

Suppose input size doubles — then reasonable that running time at least doubles, since we need to read the input

If running time increases by at most constant factor  $K$ , then algorithm EFFICIENT

Equivalently: Algorithm is efficient if for input size  $n$  running time scales like polynomial  $n^k$

$$K = 2$$

linear in  $n$

$$K = 4$$

$\sim n^2$  quadratic

$$K = 8$$

$\sim n^3$  cubic

## COMPLEXITY CLASS P

All problems that can be solved in polynomial time  $\approx$  "EFFICIENTLY SOLVABLE"  
 INTRACTABLE

Scaling like  $n^k$  for some constant  $k$

ECP  $\in$  P

## COMPLEXITY CLASSES EXP

All problems solvable in time scaling like  $2^{nk}$  for some constant  $k$

Not efficient Problems not solvable in poly time INTRACTABLE

Also many other complexity classes

## EULERIAN CYCLE ALGORITHM 1

Runs in time  $\sim |V| + |E|$  = linear

## GENERIC ALGORITHM 2

For  $|V|=n$ , runs in time something like  
 $\sim n \cdot n! \times 2^{n \log n}$

Even for Facebook graph restricted to Sweden or Denmark,  
 even if every atom in known universe is  
modern super computer running since beginning of time  
13.7 billion years ago, will be nowhere  
 close to finish before the sun dies

## COMPUTATIONAL COMPLEXITY THEORY

Analyze computational problems

Pin down how hard or easy they are  
= how fast can the best algorithm be?

Looking back at our problems

Eulerian cycle  $\in P$

Shortest path  $\in P$  because there is a better algorithm

Dijkstra's algorithm:

Set known distance for  $s = 0$

other vertices =  $\infty$

SKIP DETAILS FOR NOW

Find vertex  $v$  with smallest distance  $d(v)$   
For all neighbours  $u$ , update  $d(u)$  to  
 $d(v) + \text{length of edge } (v, u)$

Runs in linear time Why linear time?

And why is the algorithm correct?

Hamiltonian cycle problem

Travelling salesman problem

Not known! ① Many believe exponential time necessary

LEARN MORE about this at AADS & Colo courses

② Proving  $\notin P$  is one of the MILLENNIUM PRIZE PROBLEMS with a 1 MUSD award.

③ Known answers will be the same for HCP, TSP, and many other problems.

# INTRODUCTION TO DISCRETE MATHEMATICS AND ALGORITHMS

## (IDMA)

A course about

### DISCRETE MATHEMATICS

- numbers, logic, graphs, combinations
- NOT continuous functions, derivatives, integrals et cetera

### MATHEMATICS

- Start from obvious facts (axioms)
- Derive true facts from these axioms
- We won't give fully axiomatic treatment (far from it), but will stress rigorous reasoning
- In mathematics, we derive absolute truth - very different from other fields of science, where there are hypotheses and experiments

### ALGORITHMS

- Our computational problems have concrete, correct answers (not about ML predictions)
- Algorithms are precise descriptions of automated methods for solving such problems (focusing on discrete objects)
- Can be coded up in different programming languages (but we won't do programming in this course)

PRO TIP

- Read course material before lectures
- Maybe even watch online videos for challenging topics

COURSE CONTENTSMATHEMATICS

- definitions of important concepts
- theorems
- proofs
- develop your abilities for rigorous (but creative!) reasoning

ALGORITHMS

- (pseudo) code
- proofs of correctness
- analysis of efficiency / complexity

LECTURER

JAKOB NORDSTRÖM, PROFESSOR

ALGORITHMS & COMPLEXITY SECTION

DEPARTMENT OF COMPUTER SCIENCE (DIKU)

Also at Lund University in Sweden

Research on:

- Proving that really hard problems are really hard
- Solving them as fast as possible anyway
- Producing auditable certificates that solutions are correct

## LANGUAGE OF TUITION

Officially Danish

But Swedish qualifies as Danish for official purposes.

I suggest we continue in English...

## WHAT YOU NEED TO DO

- Be on top of course planning
- Follow lectures (or digest material on your own)
- Read textbooks before and in between lectures!  
(lectures do NOT cover everything!)
- Work on exercises (use TAs at exercise classes)
- Solve and hand in problem sets REQUIRED FOR EXAM
- Interact with course mates - help each other

## PROBLEM SETS

- Help you study ~~throughout the course~~  
(instead of panicking the week before the exam)
- Problems look like (and are) exam problems - graded in the same way

Do yourself a favour: WORK HARD  
 on this course! Will help a lot  
 in later courses!

## Rules (check also Absalon):

- Collaborate in groups of 2-3
  - But write up everything individually!
  - NO COPYING OR SHARING of text, code, formulas
    - o from each other
    - o from the Internet
  - Submit on time on Absalon as PDF file
  - Write up in L<sup>A</sup>T<sub>E</sub>X (or other math-aware system)
  - Graded after one week
  - Corrections needed? One week for resubmission
- QUESTIONS?** Ask (a) now or (b) TAs or (c) on Absalon

PLAGIARISM WILL  
 BE REPORTED

# RAM MODEL

How we think of computer

Big chunk of MEMORY partitioned into WORDS

In one time unit, we can

- read word from memory
- store word in memory
- perform operation

word 1
word 2
word 3
word 4
word 5
:

## WORD ( $w$ )

A number of bits (0s & 1s)

We assume "basic objects" fit in a word

- character
- integer (not ridiculously large)
- pointer (to other location in memory)

What does NOT fit in a word:

- arrays / tables
- lists
- graphs

## OPERATIONS

Assume following operations take constant time

- arithmetic +, -, \*, /
- Boolean operations and, or, not
- Bitwise operations
  - & (bitwise and)
  - | (bitwise or)
  - ~ (bitwise not)

This is a **MODEL**, not a description of reality  
But good enough for our purposes

## PSEUDO-CODE

Not actual code

But "close enough" that you can easily code it up in your favourite programming language

- Focus on essential details
- Ignore irrelevant syntax details
- Assume flat "obvious"/"reasonable" methods exist in some (pseudo-) standard library

What is important?

- NOT the exact syntax
- But that we get a crisp, clear, unambiguous description of the algorithm

## COMPLEXITY ANALYSIS

Given algorithm A solving same task

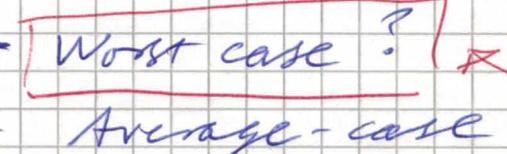
Given input of size  $n$

How many steps does algorithm need for input of size  $n$ ?

Count:

- Reading, assigning, storing
- arithmetic operations
- comparisons
- program flow constructs
  - if - then - else
  - for loops
- method / function calls

What time complexity?

- Best case ?
- = Worst case ? 
- Average-case
- "Real-case"

Focus on worst case (in this course)

Often most relevant for the basic algorithms we will study

But certainly not the only way to measure!

### Simplifying assumptions

All operations take the same time

Only care about highest-order term

### Example

Algorithm A running time  $n^2 - 4n + 3$

Algorithm B  $- 11 - 1000n + 1000000$

A scales like  $\sim n^2$

B scales like  $\sim n$

So B will become (much) better as input size grows

In reality, factor 1000 is of course important

But this is an introductory course - focus on the fundamentals. And linear-time algorithm will quickly beat quadratic-time algorithm in practice