



Limits of Computation

16 - Problems in **P**
Bernhard Reus

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The complexity story so far

sequential ones

- **P** is robust under compilation between any machines/languages (**LIN** only between some of them)
- Hierarchy theorems: there exist problems that can only be solved if more running time is available.

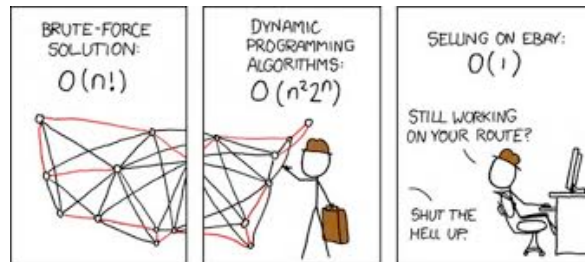
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Complexity of natural problems

- we introduce some natural (and famous) problems and discuss their time complexity.
- The problems in this session are all provably in **P**.
- For others we don't know and the question remains: "are they feasible?" (see next session)

THIS TIME

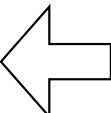
e.g. finding the best route for Travelling Salesman (next session!)



<http://xkcd.com>

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Reduce Decision to Optimisation

- **Instance:** some "scenario" G (often a graph)
 - **Question:** find solution s for G such that $m(s)$ is minimal/maximal where m is some (fixed) measure of the size of s .
- 
- **Instance:** some "scenario" G (often a graph) **and a positive number K**
 - **Question:** **is there a solution s for G such that $m(s) \leq K$?** (or $m(s) \geq K$, resp.)?



Why is this a reduction? Why is this sufficient for our purposes?

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Problems in P

“tractable” by Cook-Karp

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Algorithm	Time Complexity		
	Best	Average	Worst
Quicksort	$\Omega(n \log(n))$	$\Theta(n \log(n))$	$O(n^2)$
Mergesort	$\Omega(n \log(n))$	$\Theta(n \log(n))$	$O(n \log(n))$
Timsort	$\Omega(n)$	$\Theta(n \log(n))$	$O(n \log(n))$
Heapsort	$\Omega(n \log(n))$	$\Theta(n \log(n))$	$O(n \log(n))$
Bubble Sort	$\Omega(n)$	$\Theta(n^2)$	$O(n^2)$
Insertion Sort	$\Omega(n)$	$\Theta(n^2)$	$O(n^2)$
Selection Sort	$\Omega(n^2)$	$\Theta(n^2)$	$O(n^2)$
Tree Sort	$\Omega(n \log(n))$	$\Theta(n \log(n))$	$O(n^2)$
Shell Sort	$\Omega(n \log(n))$	$\Theta(n(\log(n))^2)$	$O(n(\log(n))^2)$
Bucket Sort	$\Omega(n+k)$	$\Theta(n+k)$	$O(n^2)$
Radix Sort	$\Omega(nk)$	$\Theta(nk)$	$\Theta(nk)$
Counting Sort	$\Omega(n+k)$	$\Theta(n+k)$	$\Theta(n+k)$
Cubesort	$\Omega(n)$	$\Theta(n \log(n))$	$O(n \log(n))$

Array Sorting

you should know this already! :-)

- **Instance:** a number array A
- **Question:** What is A sorted?

k = length of key in binary

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Membership test for context-free languages

- we know that context-free languages (generated by context free grammars) are decidable (there is a parser).
- But what is the time complexity of parsing ?
- **Instance:** a context free language L over alphabet A and a word s over alphabet A
- **Question:** is s in L ?

simple minded
algorithm needs to test
all possible derivations
but there are
exponentially many.

**Dynamic
Programming**
use solutions to
subproblems you already
have; in this case
produce a parsing table.
Runs in $O(|s|^3)$



Is a number a prime?

- **Instance:** a natural number n
- **Question:** is n a prime number ?
- Using *binary* representation of numbers to measure (*logarithmic*) size of input.
- That there is an algorithm with polynomial time bound (in this sense) has only be shown in 2002 in a famous (award-winning) result by:
“PRIMES is in P”: Agrawal, Kayal, Saxena (AKS)



Graph (Optimisation) Problems

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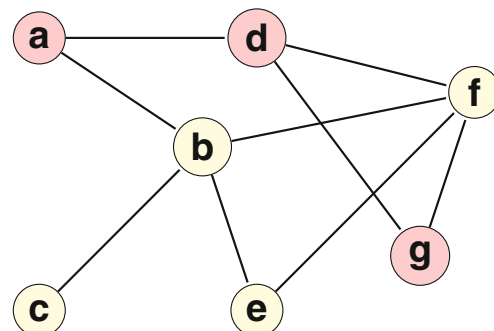
(Graph) Reachability

also called Graph
Accessibility Problem

- Given a graph $G=(V,E)$ with (un)directed edges E , two nodes s and t :
- Is there a path p from node s to node t in G ?

Simple breath-first or depth-first graph traversal starting from s can be done in linear time

Is there a path from **a** to **g**?



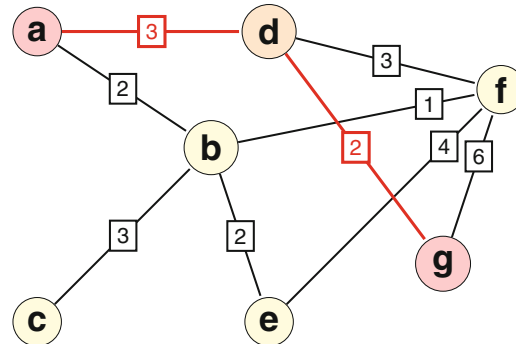
path: a - d - g or a - b - f - g

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Shortest Path

- **Instance:** a weighted graph $G=(V,E,w)$ with weighted edges E , and two vertices s and t
- **Question:** What is (the length of) the shortest path from s to t in G ?



"Floyd-Warshall-algorithm"

"depth first search" F-W algorithm has runtime $O(|V|^3)$

path $a - d - g$ with length $3+2=5$

issues with negative weights

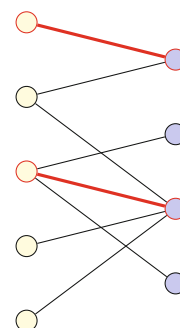
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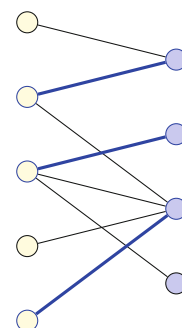
Maximal Matchings

- a *matching* in a graph is a set of edges such that no two edges in the set share a common vertex.
- **Instance:** a graph $G=(V,E)$
- **Question:** What is the largest matching in G ?

matching of size 2



matching of size 3



largest

"Blossom-algorithm" by Edmonds

"depth first search" Edmonds's "Blossom" algorithm has runtime $O(|V|^4)$ but there are better ones

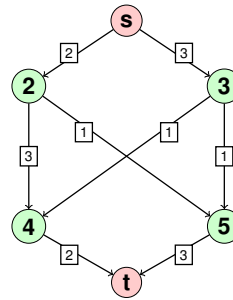
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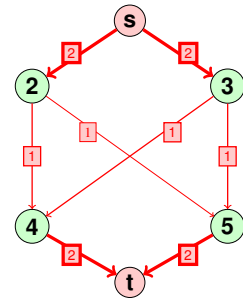
Max-Flow / Min-Cut

- **Instance:** a weighted directed graph $G=(V,E,w)$ encoding a flow network, source node s , sink node t .
- **Question:** What is the *maximum flow* (or *cut with minimum capacity*) in the given network G ?

flow network



max flow in red



max. total flow of 4

"Ford-Fulkerson-algorithm"

Ford-Fulkerson algorithm
has runtime $O(|E| \times \text{maxflow})$

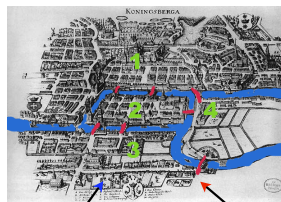
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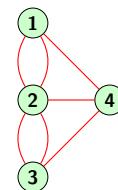
The 7 Bridges of Königsberg



- Frederick the Great wanted to show off the 7 bridges to visiting dignitaries
- and asked famous (Swiss-born) mathematician Leonhard Euler (1707-1783) for a tour that visits each bridge exactly once.



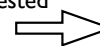
river "Pregel" bridges



abstract graph of
bridges=edges,
nodes=land

- Euler used a graph (inventing graph theory); he had to report back that this is impossible (only possible on certain condition discussed in exercises).

find a tour of requested
kind
among the 7 bridges



find
a Eulerian circuit in
the graph

circuit = closed path with no repeating edges

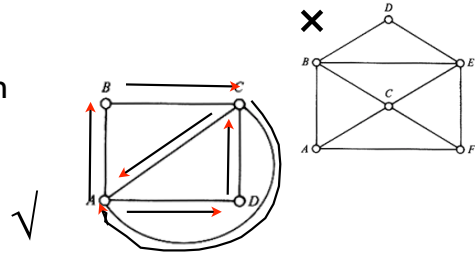
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The Postman Problem

- deliver the mail in your neighbourhood where edges are streets (= undirected graph); start in A;
- you want to visit all streets and return to A without visiting a street twice.
- **Instance:** a graph $G=(V,E)$
- **Question:** Is there an (Eulerian) circuit in G that visits every edge (=street) *once* ?

also "Chinese" postman problem
due to Chinese author Kwan Mei-Ko



http://web.mit.edu/urban_or_book/www/book/chapter6/6.4.2.html

Like 7 bridges problem = find Eulerian circuit

Fleury's algorithm runtime $O(|E|^2)$
but there are faster ones

Route Inspection Problem: replace "once" by at least "once"



- Parsing
- Prime Number Test
- Graph Reachability
- Shortest Path
- Maximal Matching
- Max Flow-Min Cut
- Postman Problem

Problems in P



Linear Programming

very versatile
& useful

- Solving linear inequalities
- **Instance:** a vector of positive (real) variables x , row vector b , matrix A such that $Ax \leq b$ and column vector c

$$\begin{array}{ll} \text{maximise} & P_1 \times x_1 + P_2 \times x_2 \\ \text{where} & x_1 + x_2 \leq A \\ & F_1 \times x_1 + F_2 \times x_2 \leq F \\ & I_1 \times x_1 + I_2 \times x_2 \leq I \end{array}$$

- **Question:** maximise $c^T x$

$$\mathbf{b} = \begin{pmatrix} A \\ F \\ I \end{pmatrix} \quad A = \begin{pmatrix} 1 & 1 \\ F_1 & F_2 \\ I_1 & I_2 \end{pmatrix}$$

$$\mathbf{c} = (P_1 \ P_2)$$

Simplex Algorithm

Simplex algorithm does not have polynomial runtime (!) Karmarkar gave polynomial algorithm $O(n^{3.5} \times L^2 \times \ln L \times \ln \ln L)$ where n is the number of variables and L is size of input (binary).



END

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Next time:

More practically relevant problems for which
no polynomial time algorithms are known.