## Algorithms and Programs

Erasmus Award Lecture
Kurt Mehlhorn

III
max planck institut informatik

## Goals of Talk

- Better understanding of Informatics (Computer Science)
- My fascination for the field and glimpses at my work
- A bit entertaining
slides available on my homepage


## Outline of Talk

- Information Technology has changed the world

- Early Fascination
- Algorithms and Programs
- What is an Algorithm? What is a Program?
- Laws of Computation
- Connections to Other Fields
- Theory and Practice, Mathematics and Engineering
- Future


## My First Encounter with Informatics

- Informatics was introduced as an area of study in Germany in 1968; I started studying in 1968 (Math, Physics, CS).
- I had no idea what informatics was about; I had never seen a computer except in pictures.
- The lectures
- Math: polished, consistent in difficulty, basement of a tower of knowledge, instructor had material at his fingertips.
- Informatics: rough, uneven in difficulty, bits and pieces, instructor (F. L. Bauer) struggled with content.

Ena and I, 73

F. L. Bauer

## Early Fascination

Formal Languages and Programming Languages

- Syntax and semantics defined without any ambiguity
- Programming language = language for specifying computations
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Algorithms and Programs

- An algorithm is a step-by-step procedure for solving a certain class of problems.
- Two examples


Al-Khwarizmi, 780-850
The Compendious Book on Calculation by Completion and Balancing

## A First Algorithm: Calf's Liver

1-pound piece calf's liver, $3 / 4$ pound onions, sliced paper-thin, 4 tablespoons unsalted butter, $1 / 3$ cup water, 1 tablespoon chopped parsley

1. Rinse liver to remove any traces of blood and discard membrane and any tough veins. Cut cross-wise into $1 / 8$-inch-thick slices.
2. Cook onions in 2 tablespoons butter in a 12-inch heavy skillet over moderate heat, stirring for 1 minute. Cover skillet and continue to cook, stirring occasionally, until softened and golden brown, about 10 minutes. Transfer to a bowl and keep warm, covered.
3. Pat half of liver slices dry and toss with salt and pepper to taste. ...

## A Second Algorithm: Solving a Quadratic Equation

## Algorithm

Sample Execution
write the equation as $x^{2}+b x+c=0$ move the constant term to the other side

$$
\begin{gathered}
x^{2}+8 x-9=0 \\
x^{2}+8 x=9
\end{gathered}
$$

add $(b / 2)^{2}$ on both sides
write LHS as $(x+b / 2)^{2}$, simplify RHS
$x^{2}+8 x+4^{2}=9+4^{2}$
$(x+4)^{2}=25$
if RHS is negative, STOP (no solution) remove ${ }^{2}$ on LHS, replace RHS by $\pm \sqrt{\text { RHS }} \quad x+4= \pm \sqrt{25}$ move constant term from LHS to RHS

$$
x=-4 \pm \sqrt{25}
$$

Algorithm is in Al-Kwarizmi's book.

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Both algorithms are for human computers, programs for real computers are much more detailed.

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The PERM

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Formative Insights

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- Intellectually demanding tasks can be mechanized.
- Computers amplify brainpower.
- Algorithm design and programming are acts of creation.


## Laws of Computation

Physicists discover laws of nature; informaticians discover laws of computation,

## Laws of Computation

Physicists discover laws of nature; informaticians discover laws of computation,
in particular, limits of efficiency for performing certains tasks.
We measure efficiency in terms of

- Time (number of elementary steps needed), and
- Space (number of symbols needed to store intermediate results).


## A Computer Chip (Vintage 1995)

## Der MIPS R10K Prozessorchip.



# The block FP-Mult multiplies numbers. 

It occupies about 3 by 4 mm of space.

It multiplies numbers in 5 microseconds

## Is this good?

## How Hard is it to Multiply Numbers?

- Complexity measures

$$
\begin{aligned}
A & =\text { area of the circuit } \\
T & =\text { execution time }
\end{aligned}
$$

- There are many different circuits for multiplication:
- Circuits that are fast, but also large,
- Circuits that are small, but also slow.


## Is there a circuit that is small and fast?

## Is there a Circuit that is Small and Fast?



## Is there a Circuit that is Small and Fast?

Time T required for multiplication


Every combination of $A$ and $T$ in red region is impossible.

Every combination of $A$ and $T$ in green region can be realized.

## Connections to Other Fields



Engineering

Linguistics
embedded systems, circuit design, autonomous systems, computer vision machine translation, speech recognition, information retrieval

Biology and medicine
Economics

Art
Natural sciences
bioinformatics, computations in nature
business processes, game theory, algorithmic economics
computer graphics
high performance computing


Mathematical Model (Tero et al., J. Theor. Biology 2007)

- Physarum is a network of pipes.
- Flow of liquids determined by concentration differences and lengths and diameters of pipes.
- Pipes adapt: if flow through a pipe is high (low) relative to diameter of the
 pipe, the diameter grows (shrinks).


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 pipe, the diameter grows (shrinks).


## Theorem (Bonifaci, KM, Varma, 2012, J. Theor. Biology)

Network converges to shortest path, i.e.,
the diameter of tubes not on the shortest path converges to zero.

## Mathematician in the Morning,

## Engineer in the Afternoon

## Mathematician

works on problems of a fundamental nature that

- are intrinsic to the field, e.g., laws of computation or new algorithms, or
- come up in applications (and are too hard for engineers)


## Engineer

- turns algorithms into programs
- designs and builds systems
- turns ideas into working systems
- identifies the need for further theory

Library of Efficient Data Structures and Algorithms joint work with S. Näher and C. Uhrig

- When I asked former students, ....


## Library of Efficient Data Structures and Algorithms

 joint work with S. Näher and C. Uhrig- When I asked former students, ....
- Insight (1990): Writing books and articles does not suffice.

Must turn knowledge of the field into software that is

- easy-to-use,
- correct, and
- efficient.

- Started LEDA project in 1990, later CGAL, STXXL, SCIL
- In use at thousands of academic and industrial sites

Algorithmic Solutions GmbH

## The Project Almost Ruined My Reputation

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Adopted new design principle: certifying algorithms.
Today, LEDA is a main source of my reputation.

## The Problem



- A user feeds $x$ to the program, the program returns $y$.
- How can the user be sure that $y$ is indeed the correct output for input $x$ ?
The user has no way to know.


## The Proposal

## Programs must justify (prove) their answers in a way that is easily checked by their users.

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- the function value $y$ and
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or more elegantly, by a checker program $C$.


## Example: Planarity Test

## Planar Graph

A graph is planar if it can be drawn in the plane without edge crossings.

planar drawing

planar graph


K5


K3,3

Fact: Every non-planar graph contains a Kuratowski graph. Story and Demo

- I do not claim that I invented the concept; it is rather an old concept
- al-Kwarizmi (780-850): multiplication
- extended Euclid ( $\approx 1700$ ): gcd
- primal-dual algorithms in combinatorial optimization
- Blum et al.: Programs that check their work
- I do claim that Stefan Näher and I were the first (1995) to adopt the concept as the design principle for a software project:

LEDA (Library of Efficient Data Types and Algorithms)

- McConnell/M/Näher/Schweitzer (2010): 80 page survey


## Who Checks the Checker?



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Answer as of 2011: Checkers are simple programs, and hence, we get them correct.

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Today's answer: Checkers are simple programs, and hence, we can prove their correctness using formal mathematics.

## Formal Mathematics

- Mathematics is carried in a formal language without any ambiguities.
- Proofs are machine-checked.
- Isabelle/HOL (L. Paulson/T. Nipkow)
definition disjoint-edges :: $(\alpha, \beta)$ pre-graph $\Rightarrow \beta \Rightarrow \beta \Rightarrow$ bool where disjoint-edges $G e_{1} e_{2}=($
start $G e_{1} \neq$ start $G e_{2} \wedge$ start $G e_{1} \neq$ target $G e_{2} \wedge$
target $G e_{1} \neq$ start $G e_{2} \wedge$ target $G e_{1} \neq$ target $\left.G e_{2}\right)$
definition matching $::(\alpha, \beta)$ pre-graph $\Rightarrow \beta$ set $\Rightarrow$ bool where matching $G M=($

$$
M \subseteq \text { edges } G \wedge
$$

$$
\left.\left(\forall e_{1} \in M . \forall e_{2} \in M . e_{1} \neq e_{2} \longrightarrow \text { disjoint-edges } G e_{1} e_{2}\right)\right)
$$

definition edge_as_set $:: \beta \Rightarrow \alpha$ set where
edge_as_set $\mathrm{e} \equiv\{$ tail G e, head Ge\}
lemma matching_disjointness:
assumes matching G M
assumes $e_{1} \in M$ assumes $e_{2} \in M$ assumes $e_{1} \neq e_{2}$
shows edge_as_set $e_{1} \cap$ edge_as_set $e_{2}=\{ \}$
using assms
by (auto simp add: edge_as_set_def disjoint_arcs_def matching_def)

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    matching \(G M=(\)
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    by (auto simp add: edge_as_set_def disjoint_arcs_def matching_def)
```

We formally verify

- the witness property (e.g., Kuratowski $\rightarrow$ non-planarity),
- termination of the checker program, and
- correctness of the checker program.


## Formal Verification: Summary

## Formal Instance Correctness

If a formally verified checker accepts a triple ( $x, y, w$ ),
we have a formal proof that $y$ is the correct output for input $x$.

- Highest achievable trust (only Isabelle kernel to be trusted)
- A way to build large libraries of trusted algorithms


## Trends

- From information to knowledge

- bBg data and machine learning
- Autonomous systems
- Security, privacy, and accountability


Ideas of Informatics (http://resources.mpi-inf.mpg.de/
departments/d1/teaching/ws14/Ideen-der-Informatik/)

- An introduction to informatics for non-specialists (Studium Generale)


## IDEEN DER INFORMATIK

- Goal: informatics litteracy
- Presents concepts and their applications, e.g.,
- cryptography and electronic banking
- shortest path algs and navigation systems
- machine learning and
automatic translation
- In WS 14/15: (internal) online-course
- In WS 15/16: public on-line course (Iversity) with credit points.


## Thank You

