# Computers are Not Omnipotent 

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## For more, see:

## Algorithmics

The Spirit of Computing third edition

## David Harel

Yishai Feldman


1987/2004
2001/2004

## TIME magazine (April 1984)

"Put the right kind of software into a computer, and it will do whatever you want it to. There may be limits on what you can do with the machines themselves, but there are no limits on what you can do with software."

Not so !!

## Disclaimer:

-Can computers run companies?
-Can computers make good decisions?
-Can computers diagnose?
-Can computers love?

## Disclaimer:

-Car computers run companies?
-Can computiers make good decisions?
-Can computers diagnose?
-Can eomputers love?

* Non-analytic questions
* Pseudo-scientific issues
* Require heuristics

亿
"SOFT" Research
(Artificial Intelligence)

## Algorithmic problems:

* Set of legal inputs
* Specification of desired output as function of input

Decision problems:


- The algorithm $\boldsymbol{A}$ involves "effectively executable" elementary operations, each taking bounded time and bounded resources.
- The algorithm $\boldsymbol{A}$ halts for every legal input, and answers the question correctly.


ROBUSTNESS
FOLLOWS
FROM THE
CHURCH/TURING
THESIS, 1936
(All computers are equal...)


## Tiling (Domino) Problems:



1×1
non-rotatable, non-reversible

## Tile

* These problems involve tiling portions of the integer grid $Z^{2}$, such that adjacent edges are monochromatic.
* Inputs include a finite set $T$ of tile types; there are infinitely many copies of each.



Can tile entire plane $Z^{2}$




## Can't tile even a $3 \times 3$ square !

Proof:

1. tile \#3 must appear.
2. 



## !!!

## Basic unbounded tiling (domino) problem:

Given $T$, can $T$ tile $Z^{2}$ ?
(equivalent to "can $T$ tile any $k \times k$ square")


No such machine
No such algorithm
No such recipe
The domino problem is undecidable!!
No such program

## Unbounded nature of problem is misleading

Given T and two points, p, q, can $T$ form "snake" connecting $p$ and $q$ ?


UNDECIDABLE in $\mathbb{Z}^{2 / 2}$ (positive half-plane) DECIDABLE in $\mathrm{Z}^{2}$ !!

Undecidable even when removing a single point!!

## The halting problem

## Positive integers

A: if $x=1$ stop;
$x \leftarrow x-1 ;$ goto $A$.

B: if $x=1$ stop
if $x$ is even then $x \leftarrow x / 2$ else $x \leftarrow 3 x+1$;
goto $B$.

## Is there a W ??



## There is no such W

The halting problem is undecidable

And so is essentially any problem about computation, including correctness, efficiency, equivalence, etc.!!

# In fact, discovering errors early on is crucial, and can make a tremendous difference... 

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## Example: The Y2K Problem

Can we build software to find the errors in any given program?

Can we correct the errors in programs?
Can we tell whether a program will be efficient?
Can we tell wether two prog's are equivalent?

In general, no way!!

## Unbounded tiling/domino problem

## $Z^{2} / 2$ Snake domino problem

 Halting problem

All are computationally equivalent

Reduction: Given one as "free" subroutine, others are decidable

## Some problems are much "worse"...

Given $T$, and $d$ in $T$, can tile $Z^{2}$ such that d occurs infinitely often in the tiling?



## Order of Magnitude Running Time <br> upper bound lower bound

Searching in an unordered list
O(n)
O(n)
Searching in an ordered lis $\dagger$
O(log $n$ )
O(log $n$ )
Sorting an unordered list
O(n $\log \mathrm{n})$
O( $\mathrm{n} \log \mathrm{n}$ )

Multiplying matrices
O(n $\left.{ }^{2.39 . \ldots . .}\right)$
$0\left(\mathbf{n}^{2}\right)$

So, we are talking about amounts, quantities, the size of things...

Sometimes, big differences in size can produce quite striking effects...


## Polynomial vs. exponential time



## Polynomial time vs. Exponential time algorithms:

assuming 1 instruction per nanosecond

| $\mathbf{N}$ | 20 | 40 | 60 | 100 | 300 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{N}^{2}$ | $1 / 2500$ <br> second | $1 / 625$ <br> second | $1 / 278$ <br> second | $1 / 100$ <br> second | $1 / 11$ <br> second |
| $\mathbf{N}^{5}$ | $1 / 300$ <br> second | $1 / 10$ <br> second | $7 / 10$ <br> second | 10 <br> seconds |  |
| $\mathbf{2}^{\mathbf{N}}$ | $1 / 1000$ <br> second |  |  |  |  |
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| $\mathbf{N}^{\mathbf{N}}$ |  |  |  |  |  |

For comparison: the big bang was approximately 15 billion years ago.

|  | 20 | 40 | 60 | 100 | 300 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| $N^{2}$ | $\begin{aligned} & 1 / 2500 \\ & \text { second } \end{aligned}$ | $\begin{array}{r} 1 / 625 \\ \text { second } \end{array}$ | $\begin{aligned} & 1 / 278 \\ & \text { second } \end{aligned}$ | $\begin{aligned} & 1 / 100 \\ & \text { second } \end{aligned}$ | $\begin{gathered} 1 / 11 \\ \text { second } \end{gathered}$ |
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| $2^{N}$ | $\begin{aligned} & 1 / 1000 \\ & \text { second } \end{aligned}$ | $\begin{gathered} 18.3 \\ \text { minutes } \end{gathered}$ | $\begin{gathered} 36.6 \\ \text { years } \end{gathered}$ | 400 billion centuries | a 72-digit number of centuries |
| $N^{N}$ | 3.3 billion years | a 46-digit number of centuries | an 89digit number of centuries | a 182digit number of centuries | a 725digit number of centuries |



## "Roadblock"

- Two players on a road network;
- "A wins" and "B wins" intersections;
- One turn: player travels in one of his/her cars along any single colored stretch, free of cars.



## does Roadblock player have guaranteed win?



# ALL HAVE $2^{(N)}$ LOWER BOUNDS 

## Therefore INTRACTABLE!



## Possible challenge to this robustness:

## Quantum computing

(e.g., there is a polynomial-time algorithm for factoring numbers)

## However,

(1) not yet for any provably intractable problem
(2) no practical quantum computer on the horizon yet

## Memory (space) requirements

Some problems provably require exponentialspace; i.e., even on reasonable inputs (Nk150) would require memory larger than the entire known universe, even if each bit were the size of a proton or quark !!!


## NP-completeness:

## Rising or falling together

There are 700-3000 problems sharing remarkable properties:

1. Best upper bounds we have are exponential,...
2. but best lower bounds are polynomial.
3. However, if one is tractable we know they all are ...
4. and if one is intractable they all are!

## $P \stackrel{?}{=} N P$ (1971)

- Most important open problem in computer science
- Already considered major open problem in mathematics


So, what we are saying here is that an entire skyscraper can depend on a single foundation, right?

Here's what this kind of thing can really look like...



General monkey puzzle (arbitrary N) is NP-complete
(e.g., if $\mathrm{N}=144$, is probably unsolvable in less than millions of
$\mathrm{N}=9 \quad 3 \times 3$ years of computer time!)

## Other NP-complete (i.e., status-unknown) problems:

## Timetable problem:

> * given $N$ teachers, $M$ time-slots, $K$ courses, teachers' time openings, courses to be taught by who and when; is there a schedule making everyone happy?

## Traveling salesman problem:

[^0]* given integers $a_{1}, \ldots, a_{n}$, and $K$, does some subset subset of the a's sum to $K$ ?
* given a formula in propositional logic, is it satisfiable?
* given K trucks with capacities and N objects with weights, can they be packed in the trucks?


Q: Can this be remedied by approximation algorithms; e.g., can we find (fast) a traveling salesman tour guaranteed to be no more than $50 \%$ longer than the optimum?

A: Sometimes, but not always.

There are NP-complete problems that have been proven to admit no approximate solutions unless $P=N P$ !

## Sometimes the bad news can be used constructively:

## In cryptography and security

## Zero-knowledge interactive proofs



A: "I can color this graph with 3 colors"
B: "I don't believe you"
A: "Ok, I'll prove it"

B: "Now I believe you, but I have no idea how to do it myself" ??!!?!?!?!

## Here come some overhead transparencies...

## Computer Science folklore:

"Asking whether computers can think is like asking whether submarines can swim"


## The Turing Test



B: human or computer


C: human or computer

A: human interrogator

## Typical Questions

(1) Are you a computer?
(2) What is the time?
(3) When was president Kennedy assassinated?
(4) What is $2276448 \times 7896$ ?
(5) Can white win in one move from following chess position...?
(6) Describe your parents
(7) How does the following poem strike you..?
(8) What do think of Charles Dickens?
(9) What is your opinion on the arms race, in view of the fact that millions of people around the globe suffer from starvation?


## What is a zupchok?



A zupchok is a flying novel-writing whale. It has been carefully cultivated in a laboratory over several generations to ensure that its fins evolve into wing-like things that enable it to fly. It has also been gradually taught to read and write. It has thorough knowledge of modern literature, and has the ability to write publishable mystery stories.


Do you think zupchoks exist?


No way, they cannot.

For many reasons. First of all, our genetic engineering capabilities are far from adequate when it comes to turning fins into wings, not to mention our inability to cause 10 -ton engineless creatures to defy gravity just by flapping those things. Secondly, the novel-writing part doesn't even deserve responding to, since writing a good story requires much more than the technical ability to read and write.

Machine: Hello, this is Jim's phone.
Voice: Oh, it's you. Listen, this is his boss. I really need to get Jim right away. Can you locate him and have him call me?

Machine: I'm sorry, Mr. Hizboss, Jim is playing golf this afternoon and left orders not to be disturbed.

Voice: He is, is he? Well look, I'm thin on patience this afternoon.
This is HIS BOSS calling, you idiot, not Mr.Hizboss. Get Jim. Now!
Machine: I'm pleased to hear that you are spending time with your patients this afternoon, Dr.Thin. Business must be good. If you want to reach Jim's boss just dial 553-8861. Certainly you would never find him here in Jim's office; we have him listed in our directory under the alias of The Monster.

Voice: Take this message, you son of a chip, and get it straight. Tell him he is not worth the keys on your control panel. He is fired!

## (Click)

Machine: Hello, this is Jim's phone.
Voice: Oh, hello, you darling machine. I just wanted to check that we're still on for dinner and whatever.
Machine: Of course, Sue. I have you for Thursday at the usual spot.
Voice: This is Jim's fiancee, Barbara. Who is Sue?
Machine: Oh, Barbara, I didn'† recognize your voice. I've never heard of anyone name Sue.

Voice: But you just said he was meeting with Sue on Thursday.
Machine: Oh, THAT Sue. Are you sure you have the right number?
This is Robert Finch's phone.
Voice: You can't pull that trick on me. Tell Jim it's all over!!
Machine: You have reached a nonworking number. Please check your listing and redial.

## (Click)

Machine: Hello, this is Jim's phone.
Voice: Are you satisfied with your present investments? Have you considered the advantages of tax-free municipal bonds? To hear more, please give your name and address following the beep.

## (Beep)

Machine: Err...this is Jim's phone.
Voice: Thank you very much Mr.Jimzfone. Let me tell you more about our unusual investment opportunities.......


And to end this gloomy talk, here is a beautiful example of what computers can do:

## Thank you for listening

$\square$


[^0]:    * given a distance map with N cities, is there a tour of all cities of length < K?

