## Zero Knowledge Proofs <br> MoL Research Project



Maaike Zwart \& Suzanne van Wijk January 2015

## Overview

In this project:
Lectures:

- Complexity Theory
- Turing Machines
- Classes P and NP
- Interactive proofs
- Zero Knowledge Proofs
- ZK proofs, intuitive
- ZK proofs
- ZK proofs for NP problems
- Commitment scemes


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In this project:
Work for you:

- 3 exercise classes
- Classes right after the lectures (with a 1 hour lunch break in between)
- Hand in exercises the next day before 17:00 h
- 1 final assignment
- Presentations on 22 January
- You may work in pairs
- Grading: pass/fail


## Historical context

- ~ 1900-1930: formalising mathematics

Hilbert: Wir müssen wissen, wir werden wissen

- 1931: Gödel's incompleteness theorems
- 1935-1936: Entscheidungsproblem solved by Church and Turing
- Methods similar to Gödel
- Needed to formalise 'computation' (Church - Turing Thesis)
- Turing's solution: Turing machines.
- From this concept, modern computers were developed.


## Alan Turing 1912-1954



- Founder of Computer Science and Artificial Intelligence
- Turing Test
- Cracked the Enigma Code
- Died a tragic death


## A Theoretical Model for a Computer



## A Theoretical Model for a Computer



Turing Machines are:

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## A Theoretical Model for a Computer



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Therefore they are used to:

- Find limits of computability
- Analyse algorithms: how long does a computation take?


## Turing Machines



## Turing Machines

|  | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 1 | 1 | 0 | 0 | 0 | 1 | 0 | 1 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

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|  | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
|  | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
|  | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

## Turing Machines

| inputtape | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 0 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| worktape | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| worktape | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| outputtape | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

Input: x
Output: $\mathrm{M}(\mathrm{x})$

## Programming a Turing Machine

A Turing Machine needs instructions: write what? move where?
These instructions depend on what the TM reads, and on its internal state. Notice: also need instruction: next state?

Suppose I want a TM changes the first two 1's it encounters to a 0 , and then stops.

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- $\delta: Q \times \Gamma \rightarrow \Gamma \times\{L, R,-\} \times Q$, the transition function, defining which symbol to write, where to move and which is the next state, depending on the current state and the symbol being read.
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## Turing Machines example: counting

Let $\Gamma=\{0,1$, blank $\}, Q=\{S, 1,2$, halt $\}$, and $\delta$ defined by:

| State? | read? | write: | move: | next state: |
| :--- | :--- | :--- | :--- | :--- |
| state S | blank | blank | L | 1 |
|  | 0 | 0 | R | 0 |
|  | 1 | 1 | R | 0 |
| state 1 | blank | 1 | R | 2 |
|  | 0 | 1 | L | 2 |
|  | 1 | 0 | L | 1 |
|  | blank | blank | R | halt |
|  | 0 | 0 | L | 2 |
|  | 1 | 1 | L | 2 |

Movie of a working Turing Machine


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Find algorithm: build a TM $M$ such that:

- $x \in L \Longleftrightarrow M(x)=1$
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Note: Complexity of a problem is independent of the model of TM (Exercise!)

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## P: example

## Is $x$ a palindrome?

## NP: Nondeterministic Polynomial Time

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Witness: an assignment to the variables.
Time to check assignment: $\sim|\phi|$

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General consensus: no.
We will use this later on!

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## Fun Facts:

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## Fun Facts:

- Solving the P vs NP problem wins you a million dollars!
- If $P=N P$... could be a problem:
- Digital security collapses
- Mathematicians would be out of work

But, as Donald Knuth ${ }^{1}$ reassures us: A proof of $\mathrm{P}=\mathrm{NP}$ will almost certainly be non-constructive, so no worries there :)

[^0]
[^0]:    Knuth, Donald E. (May 20, 2014). "Twenty Questions for Donald Knuth" informit.com.

