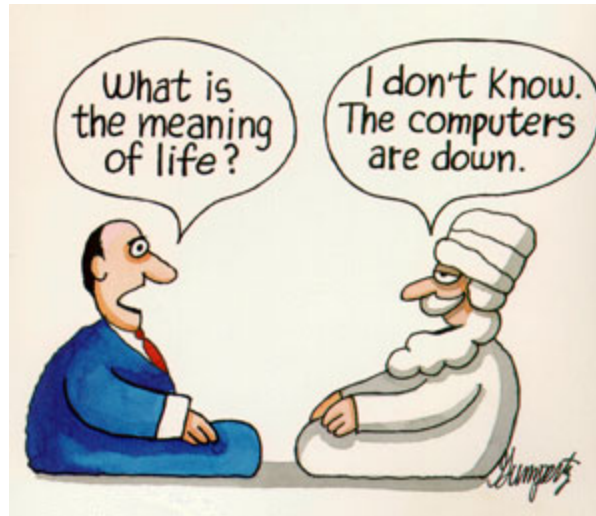


# Universality and Computability

---



## Fundamental Questions

- Q. What is a general-purpose computer?
- Q. Are there limits on the power of digital computers?
- Q. Are there limits on the power of machines we can build?

### Pioneering work in the 1930s.

- Princeton == center of universe.
- Automata, languages, computability, universality, complexity, logic.



*David Hilbert*



*Kurt Gödel*



*Alan Turing*



*Alonzo Church*



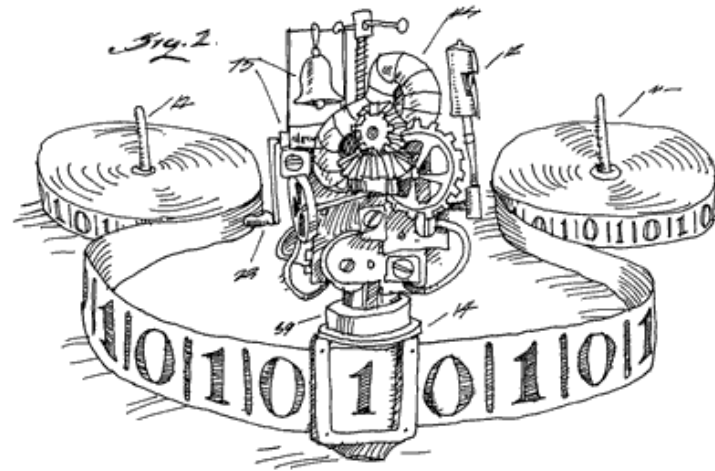
*John von Neumann*

## 7.4 Turing Machines

---



Alan Turing (1912-1954)



Turing Machine by Tom Dunne  
American Scientist, March-April 2002

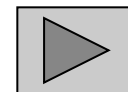
# Turing Machine

**Desiderata.** Simple model of computation that is "as powerful" as conventional computers.

**Intuition.** Simulate how humans calculate.

**Ex.** Addition.

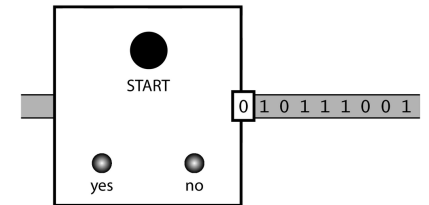
			1	2	3	4	5	6		
		+	3	1	4	1	5	9		



# Last Lecture: DFA

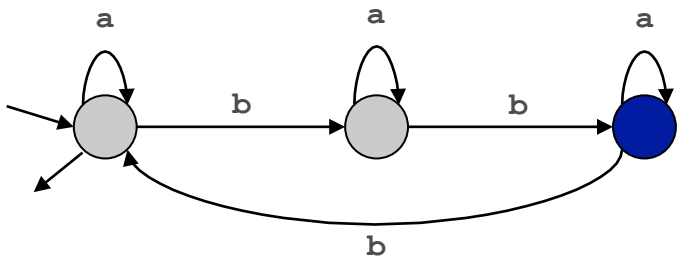
**Tape.** Stores **input** on one arbitrarily long strip, divided into cells.

- Tape head points to one cell.
- **Read** a symbol from tape head.
- Move tape head **right** one cell at a time.



**State.** What machine remembers.

**State transition diagram.** Description of what machine will do.



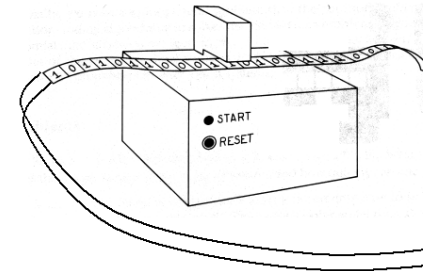
*if in this state and input symbol is **b**:*

- *move to leftmost state*
- *move tape head right*

# This Lecture: Turing Machine

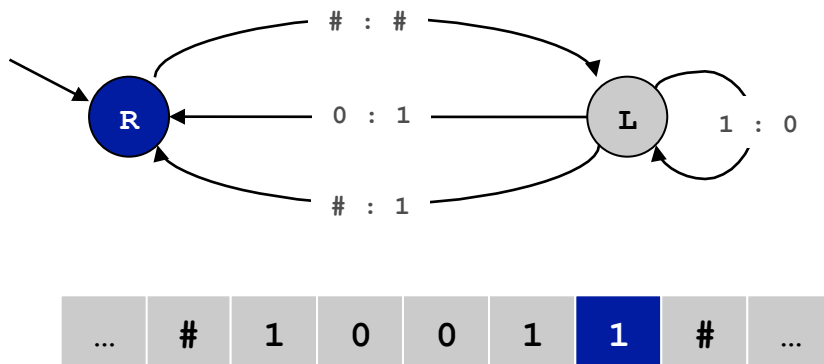
**Tape.** Stores **input**, **output**, and **intermediate results**.

- Tape head points to one cell of tape.
- **Read** a symbol from cell and **write** a symbol to cell.
- Move tape head **left** or **right** one cell at a time.



**State.** What machine remembers.

**State transition diagram.** Description of what machine will do.



# Turing Machine: Execution

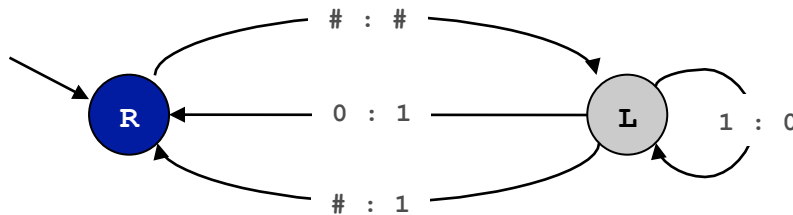
## Simple machine with N states.

- Begin in start state.
- Stop upon reaching a `yes`, `no`, or `halt` state.

infinite loop possible!

## Repeat the following:

- Read symbol from tape.
- Depending on current state and tape symbol,
  - move to new state
  - write a symbol on tape
- Move tape head left or right, depending on label of new state.



if in this state and input symbol is **0** or **1**:

- don't write anything
- stay in same state
- move tape head right



# Turing Machine: Execution

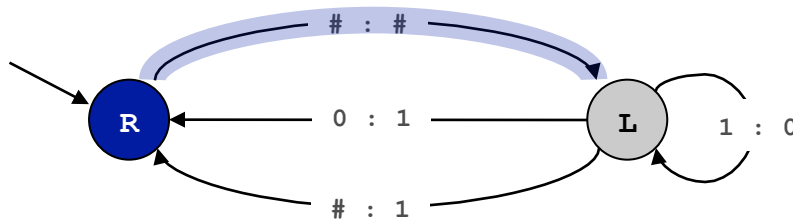
## Simple machine with N states.

- Begin in start state.
- Stop upon reaching a `yes`, `no`, or `halt` state.

infinite loop possible!

## Repeat the following:

- Read symbol from tape.
- Depending on current state and tape symbol,
  - move to new state
  - write a symbol on tape
- Move tape head left or right, depending on label of new state.



*if in this state and input symbol is #:*

- *write a #*
- *move to other state*
- *move tape head left*





# Turing Machine: Execution

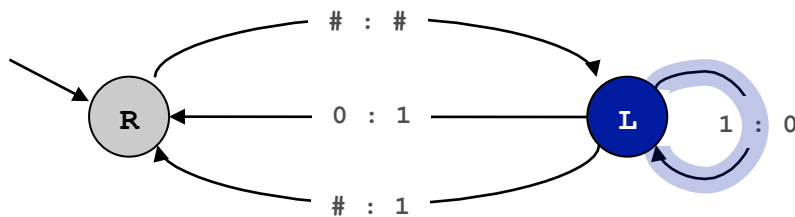
## Simple machine with N states.

- Begin in start state.
- Stop upon reaching a `yes`, `no`, or `halt` state.

infinite loop possible!

## Repeat the following:

- Read symbol from tape.
- Depending on current state and tape symbol,
  - move to new state
  - write a symbol on tape
- Move tape head left or right, depending on label of new state.



*if in this state and input symbol is 1:*

- write a 0
- stay in same state
- move tape head left



# Turing Machine: Execution

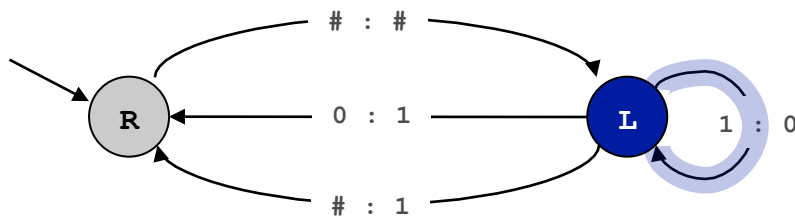
## Simple machine with N states.

- Begin in start state.
- Stop upon reaching a `yes`, `no`, or `halt` state.

infinite loop possible!

## Repeat the following:

- Read symbol from tape.
- Depending on current state and tape symbol,
  - move to new state
  - write a symbol on tape
- Move tape head left or right, depending on label of new state.



*if in this state and input symbol is 1:*

- write a 0
- stay in same state
- move tape head left



# Turing Machine: Execution

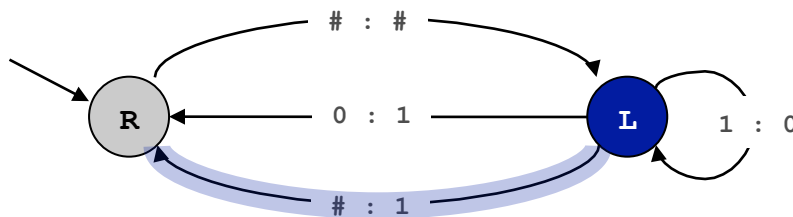
## Simple machine with N states.

- Begin in start state.
- Stop upon reaching a `yes`, `no`, or `halt` state.

infinite loop possible!

## Repeat the following:

- Read symbol from tape.
- Depending on current state and tape symbol,
  - move to new state
  - write a symbol on tape
- Move tape head left or right, depending on label of new state.



*if in this state and input symbol is 0:*

- write a **1**
- move to other state
- move tape head right



# Turing Machine: Execution

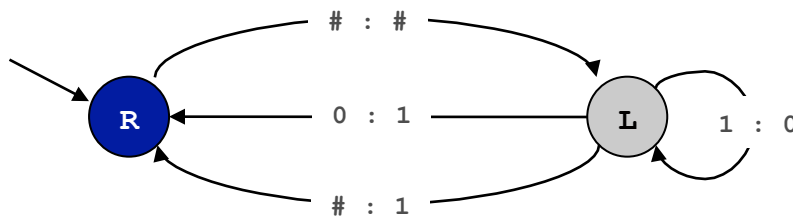
## Simple machine with N states.

- Begin in start state.
- Stop upon reaching a `yes`, `no`, or `halt` state.

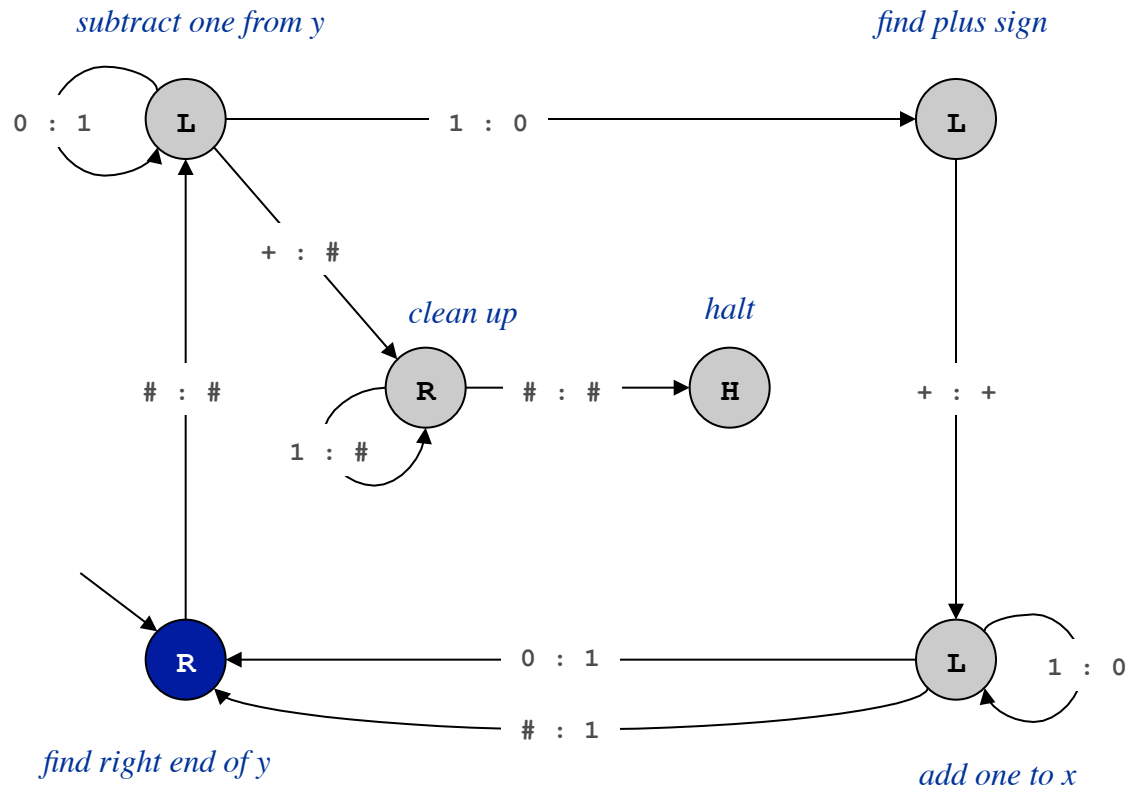
infinite loop possible!

## Repeat the following:

- Read symbol from tape.
- Depending on current state and tape symbol,
  - move to new state
  - write a symbol on tape
- Move tape head left or right, depending on label of new state.



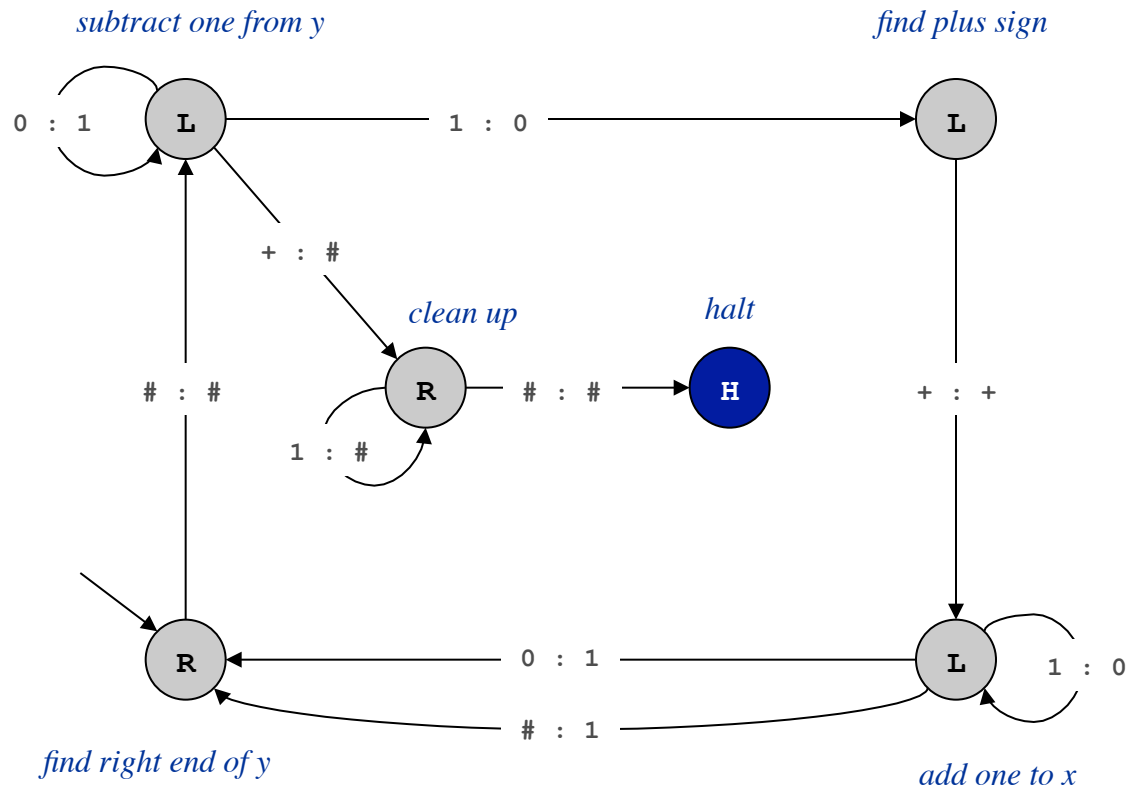
# Binary Adder



tape  
(before)



# Binary Adder

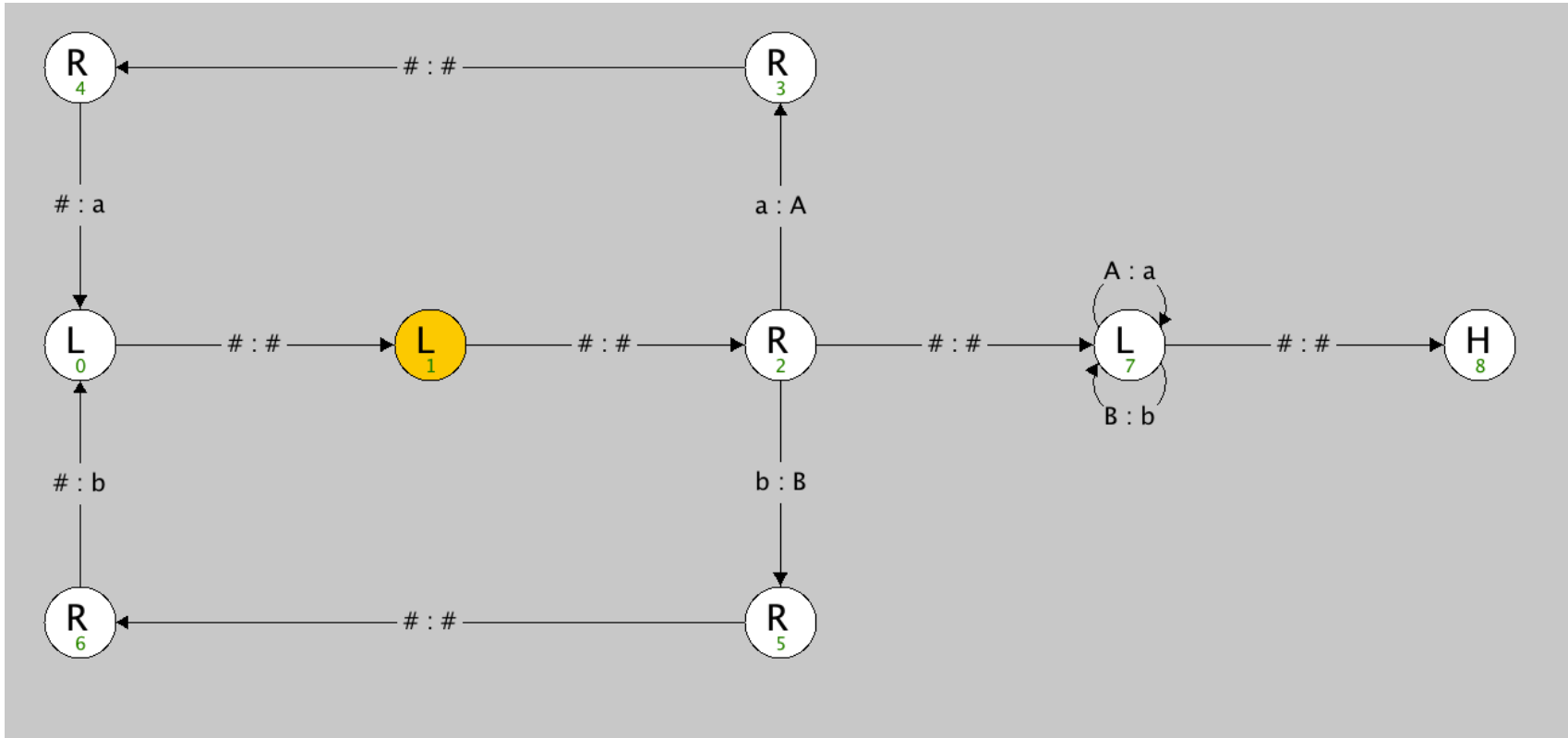


tape  
(after)

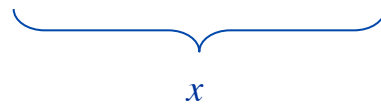


$x + y$

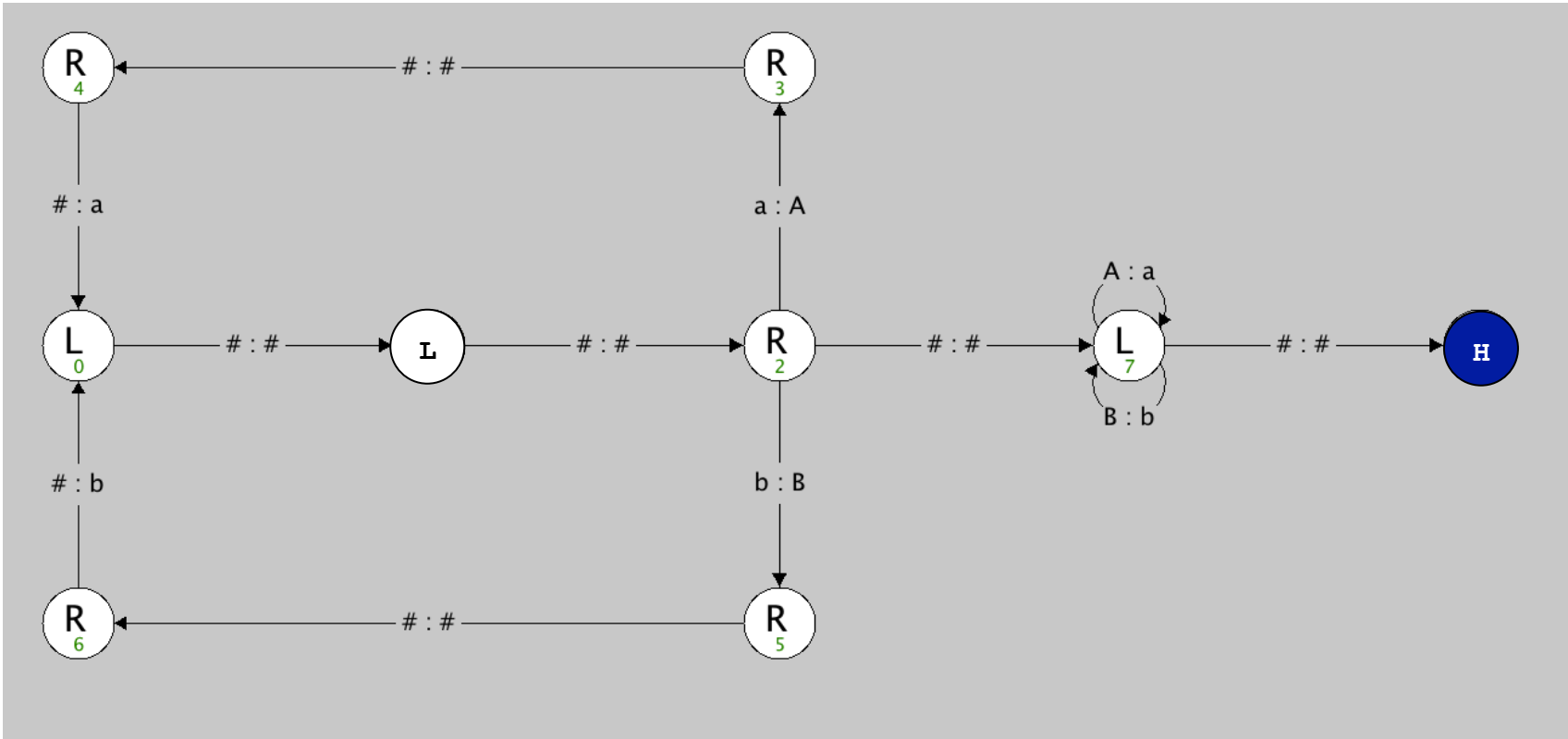
# Copy



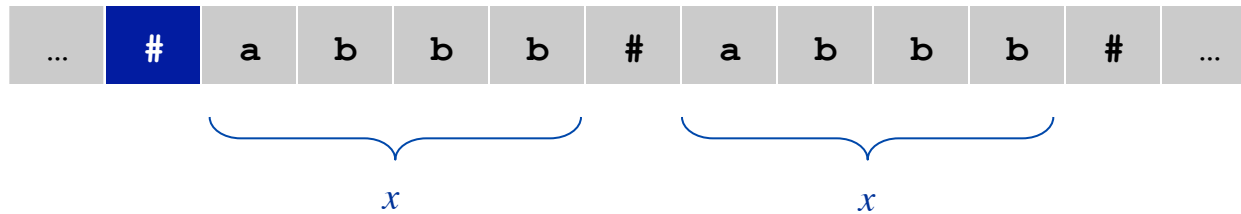
tape  
(before)



# Copy



tape  
(after)





# Program and Data

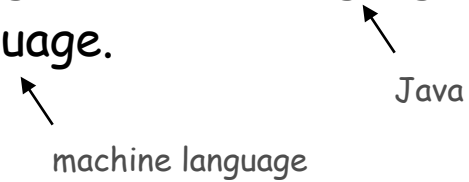
---

# Program and Data

**Data.** Sequence of symbols (interpreted one way).

**Program.** Sequence of symbols (interpreted another way).

**Ex 1.** A **compiler** is a program that takes a program in one language as input and outputs a program in another language.



your program

```
public class HelloWorld {  
    public static void main(String[] args) {  
        System.out.println("Hello, World");  
    }  
}
```

is data to a compiler

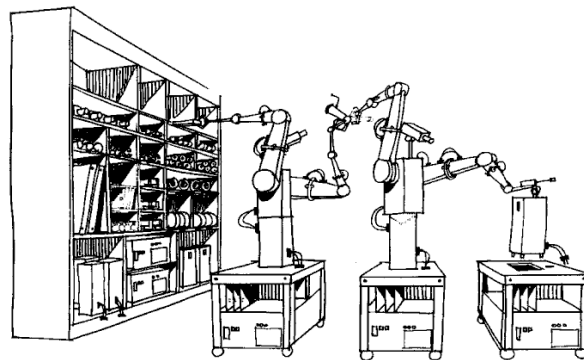
# Program and Data

**Data.** Sequence of symbols (interpreted one way).

**Program.** Sequence of symbols (interpreted another way).

**Ex 2.** Self-replication. [von Neumann 1940s]

Print the following statement twice, the second time in quotes.  
"Print the following statement twice, the second time in quotes."

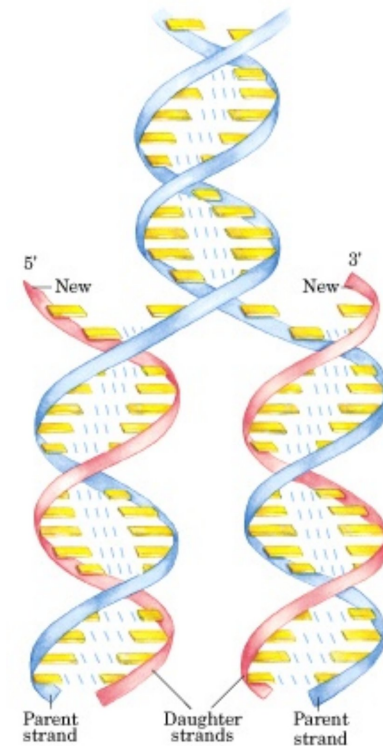


## Program and Data

**Data.** Sequence of symbols (interpreted one way).

**Program.** Sequence of symbols (interpreted another way).

**Ex 3.** Self-replication. [Watson-Crick 1953]



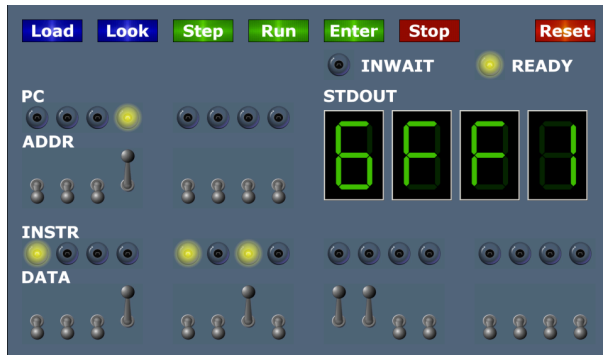
*self-replicating DNA*

# Program and Data

**Data.** Sequence of symbols (interpreted one way).

**Program.** Sequence of symbols (interpreted another way).

Ex 4. TOY / von Neumann architecture.



00:	0008	0005	0000	0000	0000	0000	0000	0000
08:	0000	0000	0000	0000	0000	0000	0000	0000
10:	8A00	8B01	1CAB	9C02	0000	0000	0000	0000
18:	0000	0000	0000	0000	0000	0000	0000	0000
20:	0000	0000	0000	0000	0000	0000	0000	0000
28:	0000	0000	0000	0000	0000	0000	0000	0000
.								
.								
E8:	0000	0000	0000	0000	0000	0000	0000	0000
F0:	0000	0000	0000	0000	0000	0000	0000	0000
F8:	0000	0000	0000	0000	0000	0000	0000	0000

data

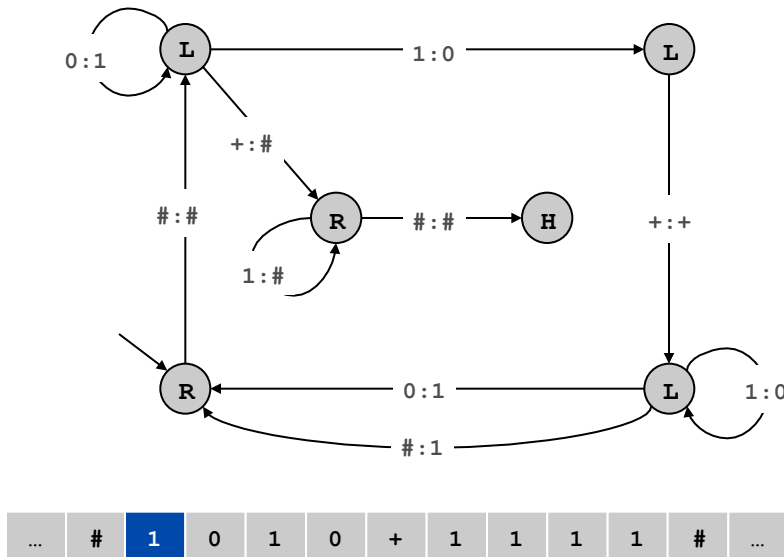
program

# Program and Data

**Data.** Sequence of symbols (interpreted one way).

**Program.** Sequence of symbols (interpreted another way).

Ex 5. Turing machine.



*graphical representation*

```

% more adder.tur
vertices
2 R
0 L
1 L
3 L
4 R
5 H

edges
0 0 0 1
0 1 1 0
0 4 + #
1 3 + +
2 0 # #
3 2 # 1
3 2 0 1
3 3 1 0
4 4 1 #
4 5 # #

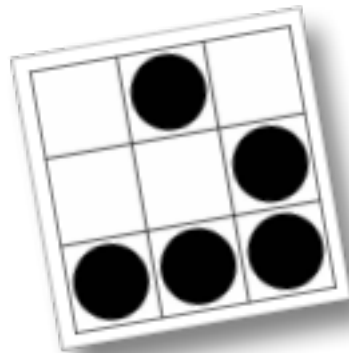
tape
[1] 0 1 0 + 1 1 1 1
    
```

Red arrows point from the word "program" to the "edges" section and from the word "data" to the "tape" section.

*text representation*

## 7.5 Universality

---



# Universal Machines and Technologies



*Dell PC*



*iMac*



*Diebold voting machine*



*iPod*



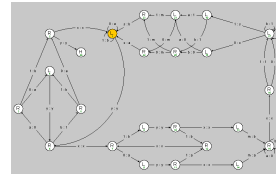
*Printer*



*Xbox*



*Tivo*



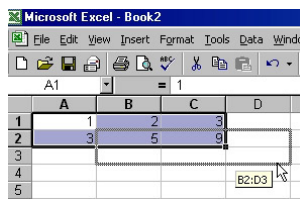
*Turing machine*



*TOY*



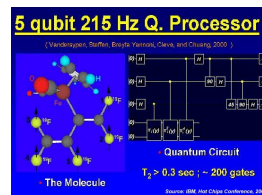
*Java language*



*MS Excel*



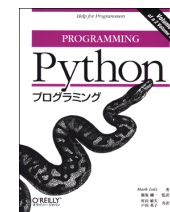
*Blackberry*



*Quantum computer*



*DNA computer*



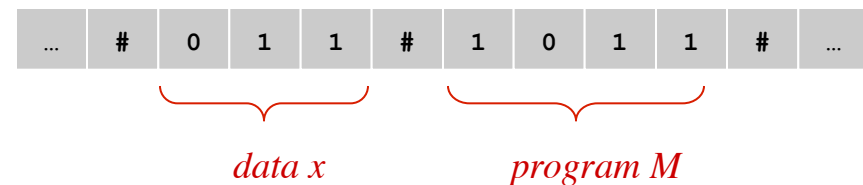
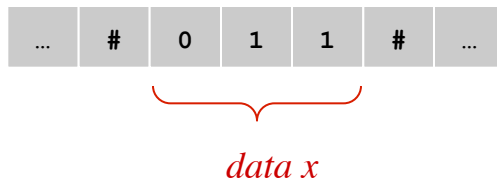
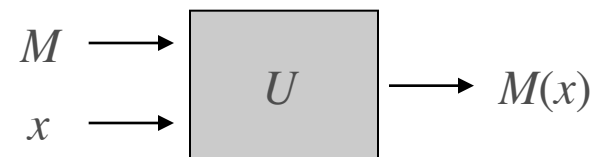
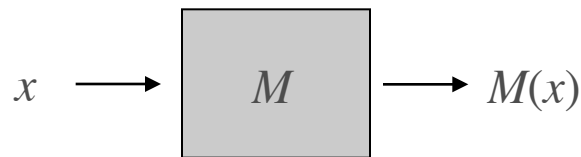
*Python language*



# Universal Turing Machine

Turing machine  $M$ . Given input tape  $x$ , Turing machine  $M$  outputs  $M(x)$ .

Universal Turing machine  $U$ . Given input tape with  $x$  and  $M$ , universal Turing machine  $U$  outputs  $M(x)$ .



TM intuition. Software program that solves **one** particular problem.

UTM intuition. Hardware platform that can implement **any** algorithm.

# Universal Turing Machine

Your laptop (a UTM) can perform **any** computational task.

- Java programming.
- Pictures, music, movies, games.
- Email, browsing, downloading files, telephony.
- Word-processing, finance, scientific computing.
- ...

↑  
even tasks not yet contemplated  
when laptop was purchased



*“ Again, it [the Analytical Engine] might act upon other things besides numbers... the engine might compose elaborate and scientific pieces of music of any degree of complexity or extent. ”* — [Ada Lovelace](#)

# Church-Turing Thesis

Church Turing thesis (1936). Turing machines can do anything that can be described by any physically harnessable process of this universe.

**Remark.** "Thesis" and not a mathematical theorem because it's a statement about the physical world and not subject to proof.

but can be falsified

Use simulation to prove models equivalent.

- TOY simulator in Java.
- Java compiler in TOY.
- Turing machine simulator in Java.
- TOY simulator on a Turing machine.
- ...

**Bottom line.** Turing machine is a **simple** and **universal** model of computation.

# Church-Turing Thesis: Evidence

## Evidence.

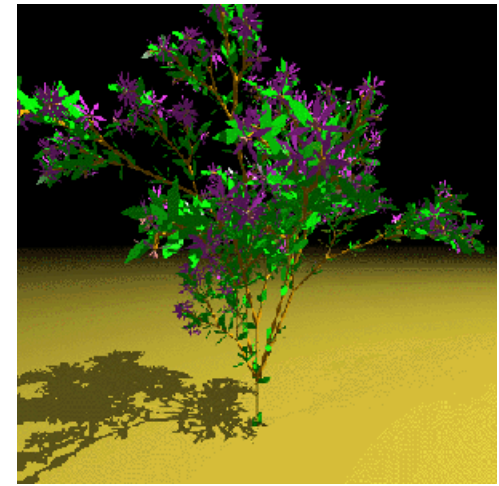
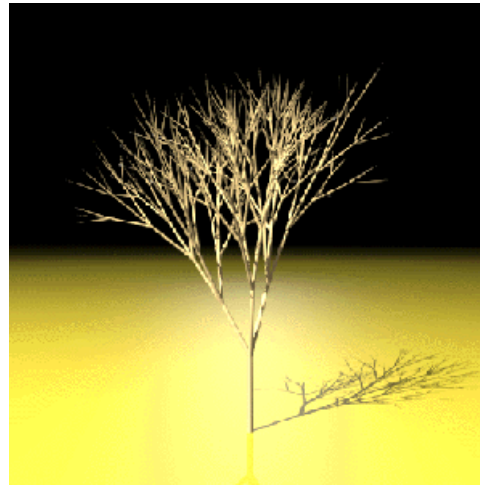
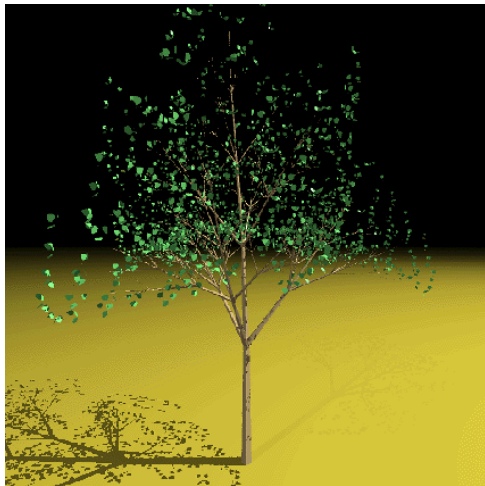
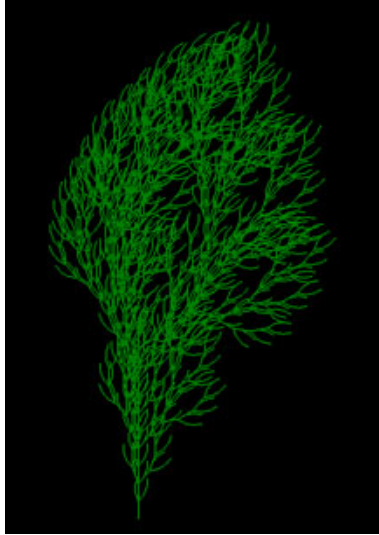
- 7 decades without a counterexample.
- Many, many models of computation that turned out to be equivalent.

"universal"



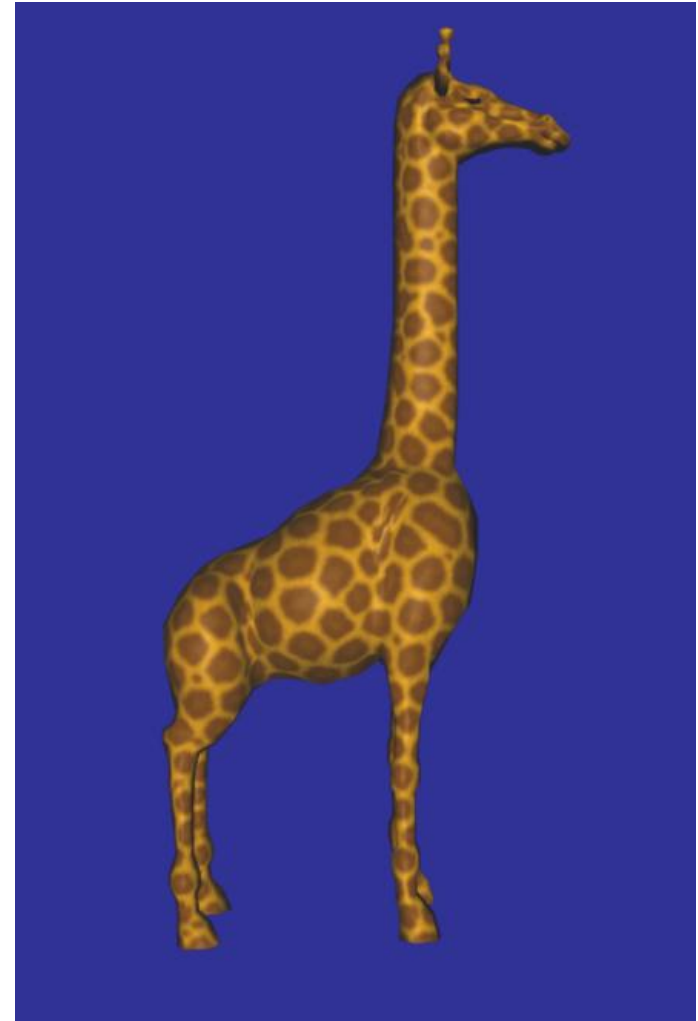
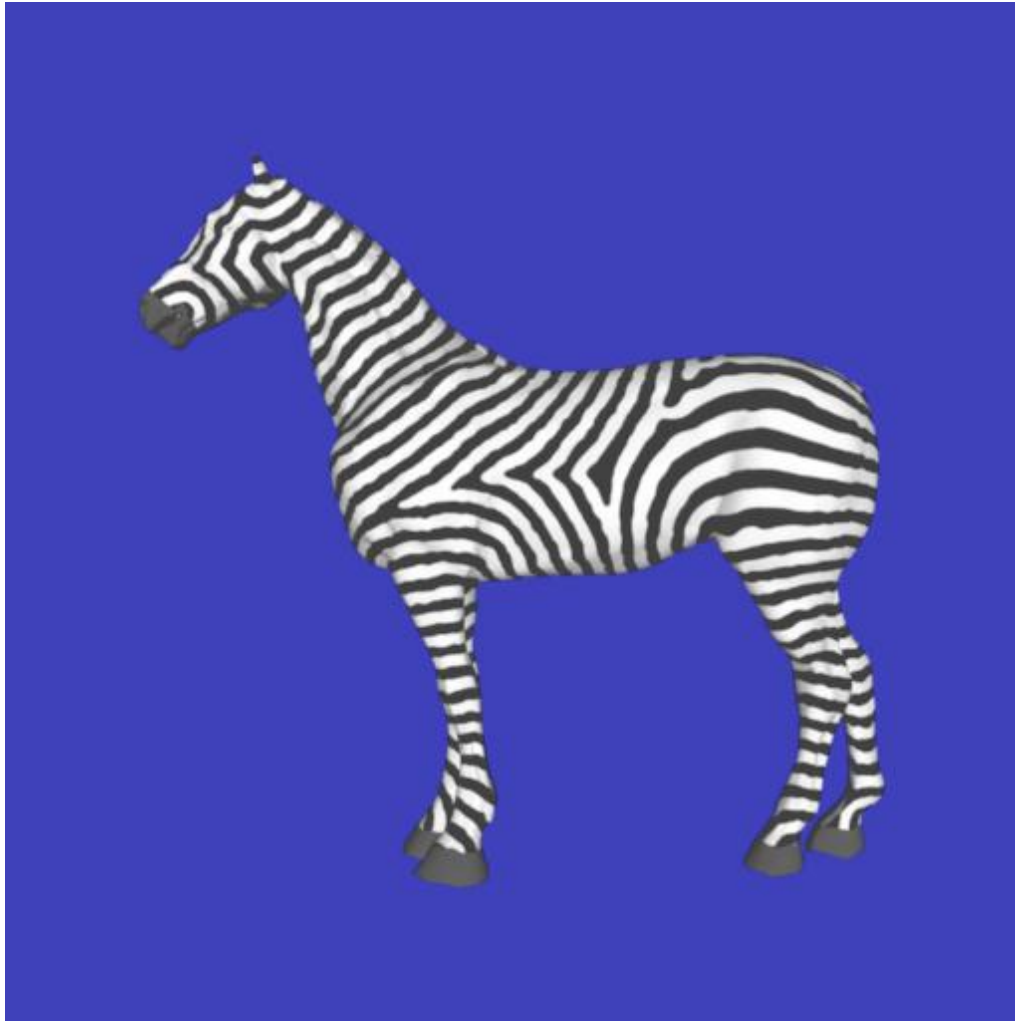
model of computation	description
enhanced Turing machines	multiple heads, multiple tapes, 2D tape, nondeterminism
untyped lambda calculus	method to define and manipulate functions
recursive functions	functions dealing with computation on integers
unrestricted grammars	iterative string replacement rules used by linguists
extended L-systems	parallel string replacement rules that model plant growth
programming languages	Java, C, C++, Perl, Python, PHP, Lisp, PostScript, Excel
random access machines	registers plus main memory, e.g., TOY, Pentium
quantum computer	compute using superposition of quantum states
DNA computer	compute using biological operations on DNA
human brain †	???

# Lindenmayer Systems: Synthetic Plants



<http://astronomy.swin.edu.au/~pbourke/modelling/plants>

## Cellular Automata: Synthetic Zoo

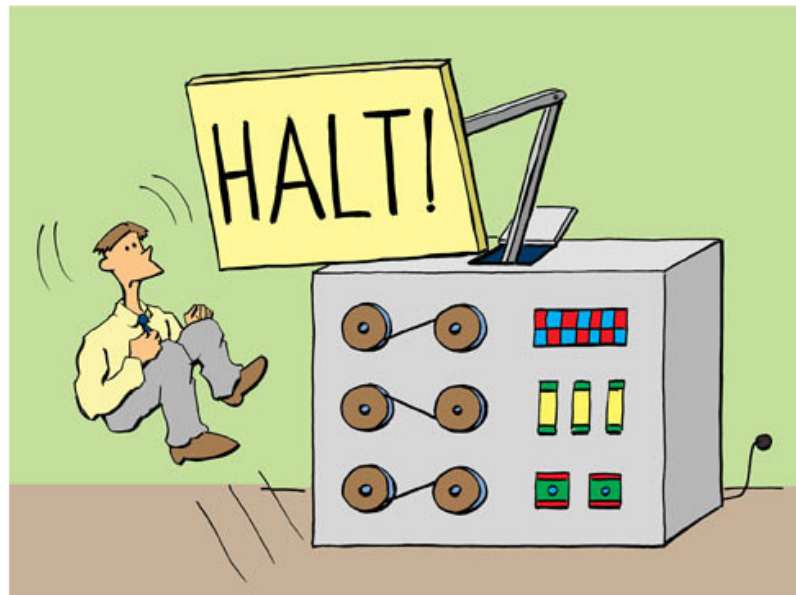


Reference: *Generating textures on arbitrary surfaces using reaction-diffusion* by Greg Turk, SIGGRAPH, 1991.

History: *The chemical basis of morphogenesis* by Alan Turing, 1952.

## 7.6 Computability

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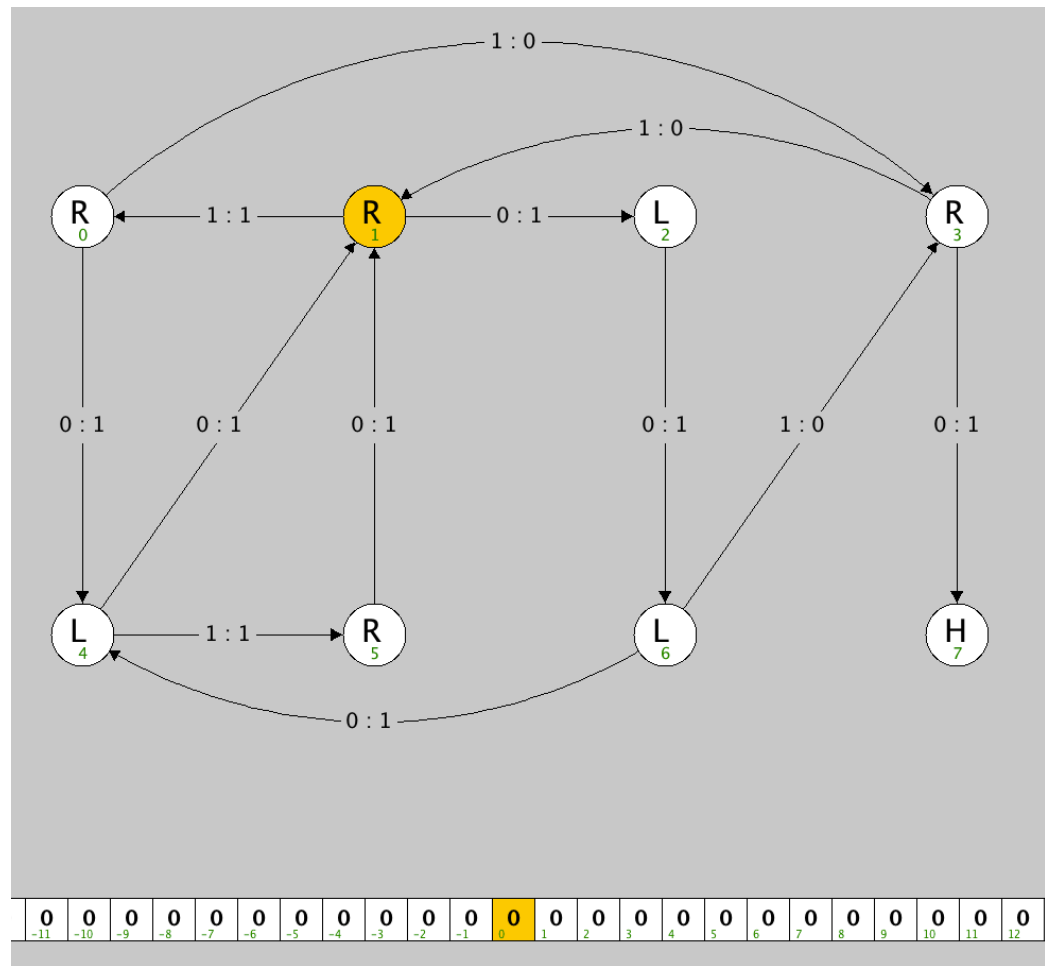


*Alan designed the perfect computer*

<http://www.coopertoons.com/education/haltingproblem/haltingproblem.html>

# Halting Problem

**Halting problem.** Write a Turing machine that reads a Turing machine and its input, and decides whether it results in an infinite loop.





# Halting Problem

**Halting problem.** Write a Java function that reads in a Java function  $f$  and its input  $x$ , and decides whether  $f(x)$  results in an infinite loop.

Collatz sequence relates to famous open math conjecture

Ex. Does  $f(x)$  terminate?

```
public void f(int x) {  
    while (x != 1) {  
        if (x % 2 == 0) x = x / 2;  
        else x = 3*x + 1;  
    }  
}
```

- $f(6)$ : 6 3 10 5 16 8 4 2 1
- $f(27)$ : 27 82 41 124 62 31 94 47 142 71 214 107 322 ... 4 2 1
- $f(-17)$ : -17 -50 -25 -74 -37 -110 -55 -164 -82 -41 -122 ... -17 ...

# Undecidable Problem

A yes-no problem is **undecidable** if no Turing machine exists to solve it.

and (by universality) no Java program either

**Theorem.** [Turing 1937] The halting problem is undecidable.

**Proof intuition:** lying paradox.

- Divide all statements into two categories: truths and lies.
- How do we classify the statement: *I am lying*.



**Key element of lying paradox and halting proof:** self-reference.

# Halting Problem Proof

Assume the existence of `halt(f, x)`:

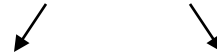
- Input: a function `f` and its input `x`.
- Output: `true` if `f(x)` halts, and `false` otherwise.

Note. `halt(f, x)` does not go into infinite loop.

We prove by contradiction that `halt(f, x)` does not exist.

- *Reductio ad absurdum*: if any logical argument based on an assumption leads to an absurd statement, then assumption is false.

encode `f` and `x` as strings



```
public boolean halt(String f, String x) {  
    if (something terribly clever) return true;  
    else return false;  
}
```

*hypothetical halting function*

# Halting Problem Proof

Assume the existence of `halt(f, x)`:

- Input: a function `f` and its input `x`.
- Output: `true` if `f(x)` halts, and `false` otherwise.

Construct function `strange(f)` as follows:

- If `halt(f, f)` returns `true`, then `strange(f)` goes into an infinite loop.
- If `halt(f, f)` returns `false`, then `strange(f)` halts.



`f` is a string so legal (if perverse)  
to use for second input

```
public void strange(String f) {  
    if (halt(f, f)) {  
        // an infinite loop  
        while (true) { }  
    }  
}
```

# Halting Problem Proof

Assume the existence of `halt(f, x)`:

- Input: a function `f` and its input `x`.
- Output: `true` if `f(x)` halts, and `false` otherwise.

Construct function `strange(f)` as follows:

- If `halt(f, f)` returns `true`, then `strange(f)` goes into an infinite loop.
- If `halt(f, f)` returns `false`, then `strange(f)` halts.

In other words:

- If `f(f)` halts, then `strange(f)` goes into an infinite loop.
- If `f(f)` does not halt, then `strange(f)` halts.

Call `strange()` with `ITSELF` as input.

- If `strange(strange)` halts then `strange(strange)` does not halt.
- If `strange(strange)` does not halt then `strange(strange)` halts.

Either way, a **contradiction**. Hence `halt(f, x)` cannot exist.



## Consequences

Q. Why is debugging hard?

A. All problems below are undecidable.

Halting problem. Give a function  $f$ , does it halt on a given input  $x$ ?

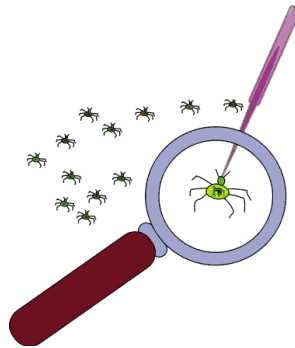
Totality problem. Give a function  $f$ , does it halt on every input  $x$ ?

No-input halting problem. Give a function  $f$  with no input, does it halt?

Program equivalence. Do functions  $f$  and  $g$  and always return same value?

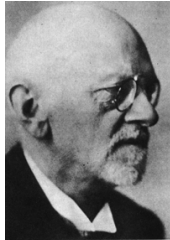
Uninitialized variables. Is the variable  $x$  initialized before it's used?

Dead-code elimination. Does this statement ever get executed?



## More Undecidable Problems

### Hilbert's 10<sup>th</sup> problem.



*Devise a process according to which it can be determined by a finite number of operations whether a given multivariate polynomial has an integral root. — David Hilbert*

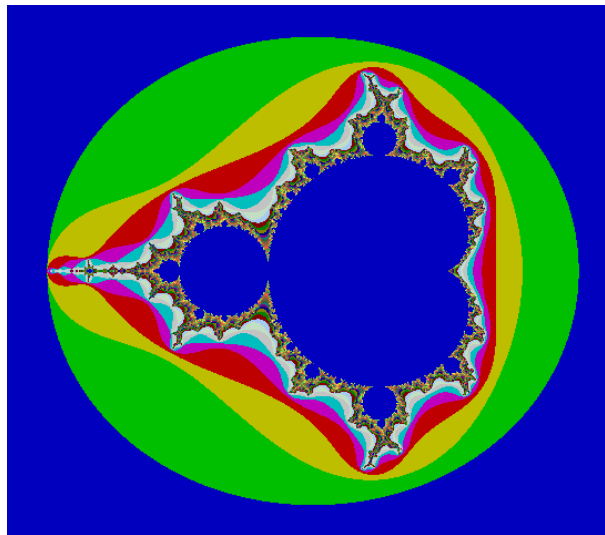
- $f(x, y, z) = 6x^3 y z^2 + 3xy^2 - x^3 - 10.$       yes :  $f(5, 3, 0) = 0.$
- $f(x, y) = x^2 + y^2 - 3.$       no.

**Definite integration.** Given a rational function  $f(x)$  composed of polynomial and trig functions, does  $\int_{-\infty}^{+\infty} f(x) dx$  exist?

- $g(x) = \cos x (1 + x^2)^{-1}$       yes,  $\int_{-\infty}^{+\infty} g(x) dx = \pi/e.$
- $h(x) = \cos x (1 - x^2)^{-1}$       no,  $\int_{-\infty}^{+\infty} h(x) dx$  undefined.

## More Undecidable Problems

**Optimal data compression.** Find the shortest program to produce a given string or picture.




*Mandelbrot set (40 lines of code)*



## More Undecidable Problems

Virus identification. Is this program a virus?

```
Private Sub AutoOpen()  
On Error Resume Next  
If System.PrivateProfileString("", CURRENT_USER\Software\Microsoft\Office\9.0\Word\Security",  
    "Level") <> "" Then  
  
CommandBars("Macro").Controls("Security...").Enabled = False  
. . .  
For oo = 1 To AddyBook.AddressEntries.Count  
    Peep = AddyBook.AddressEntries(x)  
    BreakUmOffASlice.Recipients.Add Peep  
    x = x + 1  
    If x > 50 Then oo = AddyBook.AddressEntries.Count  
Next oo  
. . .  
BreakUmOffASlice.Subject = "Important Message From " & Application.UserName  
BreakUmOffASlice.Body = "Here is that document you asked for ... don't show anyone else ;-)"  
. . .
```



can write programs in MS Word  
(this statement disables security)

*Melissa virus*  
March 28, 1999

# Turing's Key Ideas

## Turing machine.

*formal model of computation*

## Program and data.

*encode program and data as sequence of symbols*

## Universality.

*concept of general-purpose, programmable computers*

## Church-Turing thesis.

*computable at all == computable with a Turing machine*

## Computability.

*inherent limits to computation*

**Hailed as one of top 10 science papers of 20<sup>th</sup> century.**

Reference: *On Computable Numbers, With an Application to the Entscheidungsproblem* by A. M. Turing. In Proceedings of the London Mathematical Society, ser. 2. vol. 42 (1936-7), pp.230-265.

# Alan Turing

## Alan Turing (1912-1954).

- Father of computer science.
- Computer science's "Nobel Prize" is called the Turing Award.

*It was not only a matter of abstract mathematics, not only a play of symbols, for it involved thinking about what people did in the physical world.... It was a play of imagination like that of Einstein or von Neumann, doubting the axioms rather than measuring effects.... What he had done was to combine such a naïve mechanistic picture of the mind with the precise logic of pure mathematics. His machines – soon to be called Turing machines – offered a bridge, a connection between abstract symbols, and the physical world. — John Hodges*



Alan Turing (left)  
Elder brother (right)