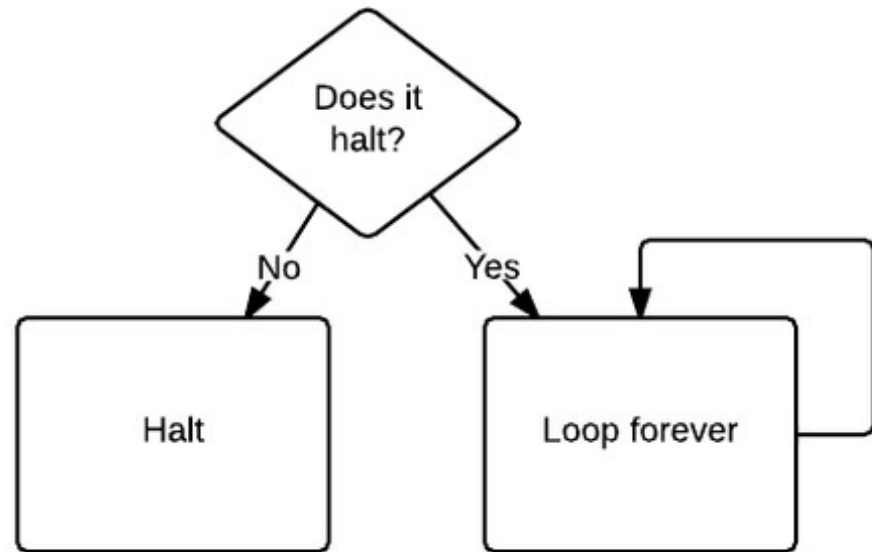
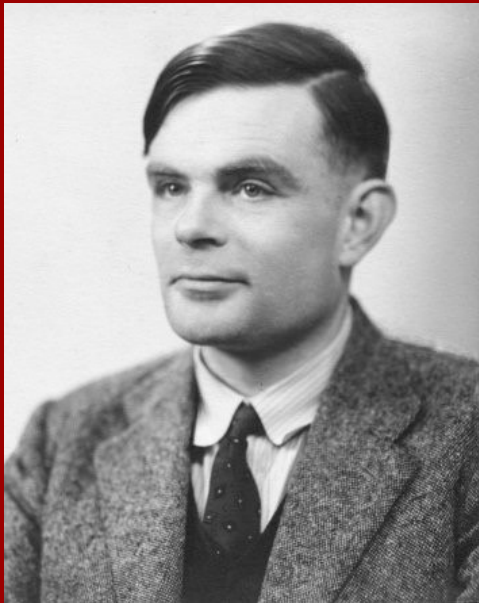


15-251: Great Theoretical Ideas in Computer Science

Lecture 6

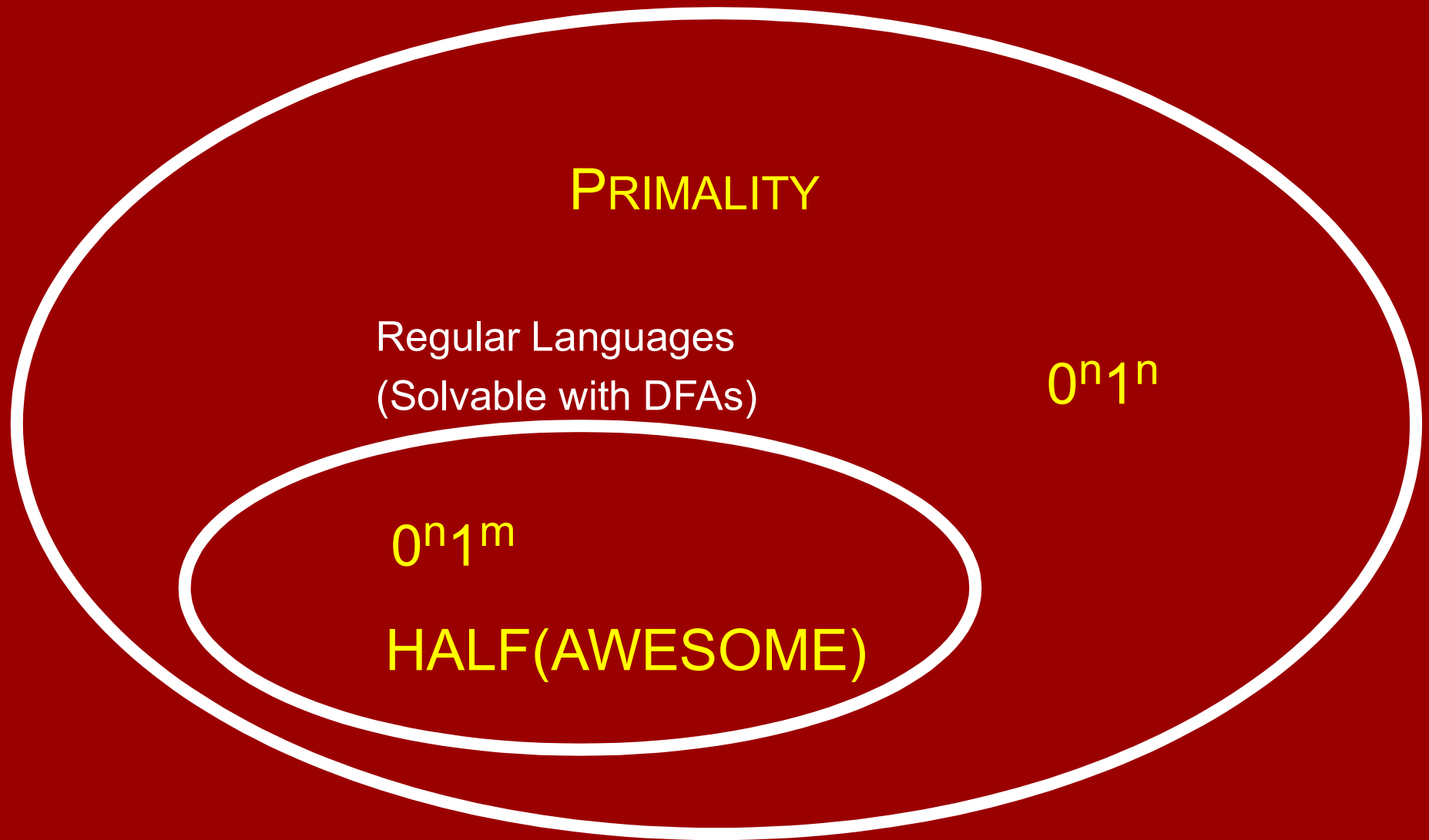
# Turing's Legacy Continues



Solvable with Python  
= Solvable with C  
= Solvable with Java  
= Solvable with SML

=

Decidable Languages  
(decidable by Turing Machines)



# Robustness of Decidability

Decidability power is the same for TMs with:

- one-sided or double-sided infinite tape
- ability to stay in addition to going left / right
- even a fixed (oblivious) moving pattern works
- binary or larger finite tape alphabet
- one tape or a finite number of tapes/heads

Decidability power is also the same as:

- Python, C, Java, Assembly (any other language)
- Random Access Machine + other comp. models
- Lambda-Calculus

## Side note: Efficiency

Model details (and encodings) **do** play a role when it comes to efficiency, e.g., how many computation steps are needed.

### Examples:

- a TM with one tape can simulate any multi-tape TM with a quadratic slowdown (sometimes needed)
- Random Access Machines can be simulated by a multi-tape TM with logarithmic slowdown
- Quantum computation can be simulated with exponential slowdown. It is unknown whether a super-polynomial slowdown is needed)

# Robustness of Decidability

Most computational models, including those abstracted from any natural phenomenon, tend to be either wimpy or **Turing equivalent**, i.e., exactly equivalent in computational power to TMs.

No candidates of potentially implementable / natural computational models that are more powerful than a TM have been suggested.

**Church–Turing Thesis (1936):**

*“Any natural / reasonable notion of computation can be simulated by a TM.”*

# Cellular Automata

Most systems / the world can be described as many (tiny) parts interacting with other close-by parts.

Formal computational model:

A **Cellular automaton (CA)** consists of:

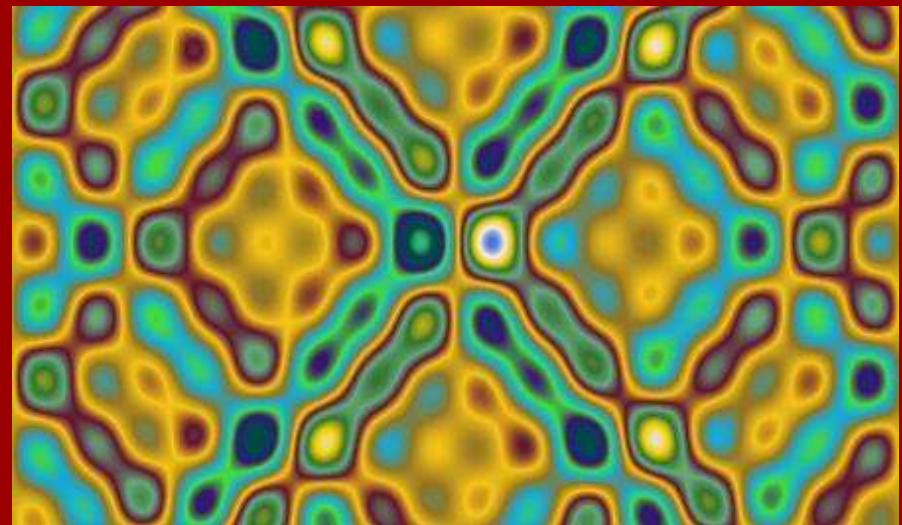
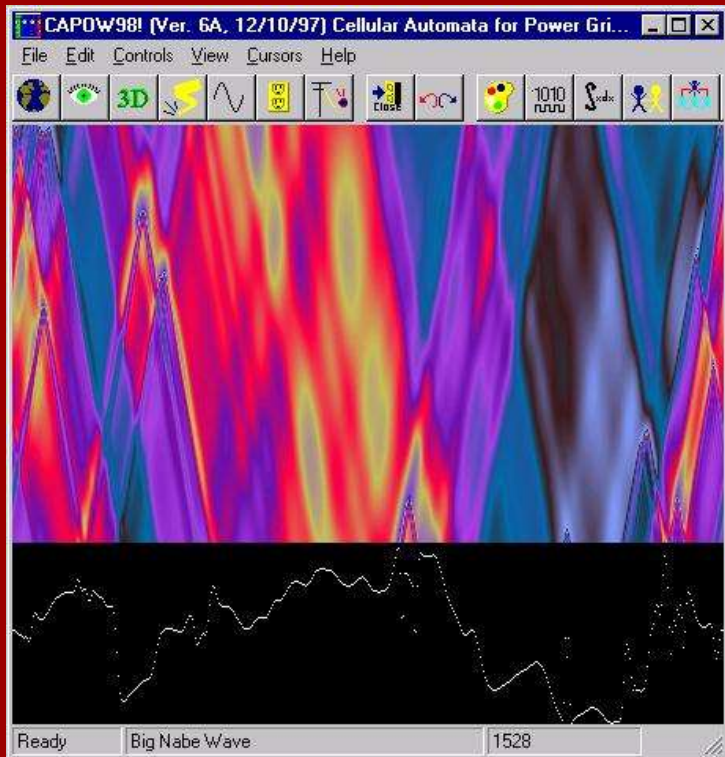
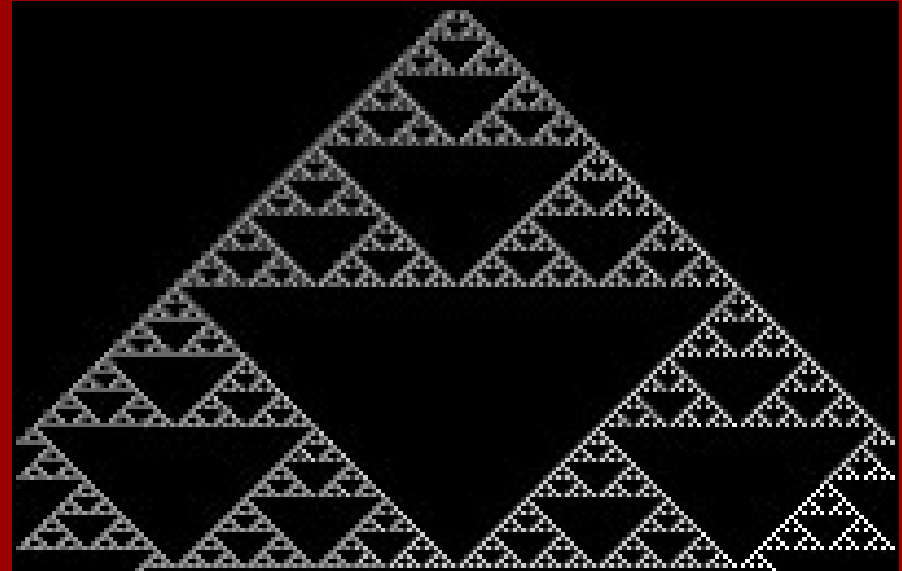
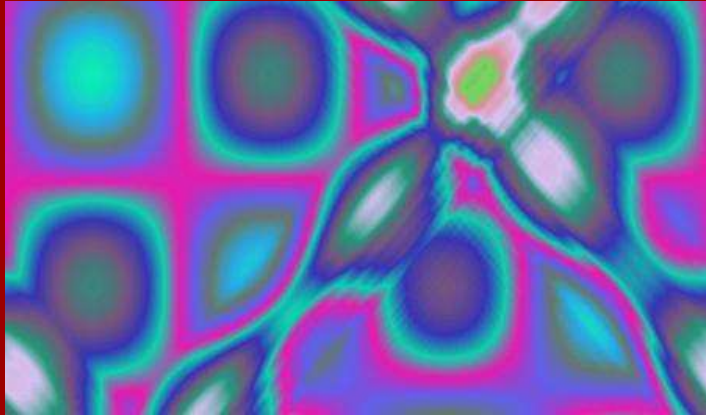
- **cells** with a **finite set of states**  $Q$
- a **neighborhood relation** between cells
- a **transition function**  $\delta_v: Q^{\deg(v)+1} \rightarrow Q$

Computation: In every round every cell  $v$  (synchronously) transitions its state according to  $\delta_v$  based on its and its neighbors' state.

# Applications of Cellular Automata

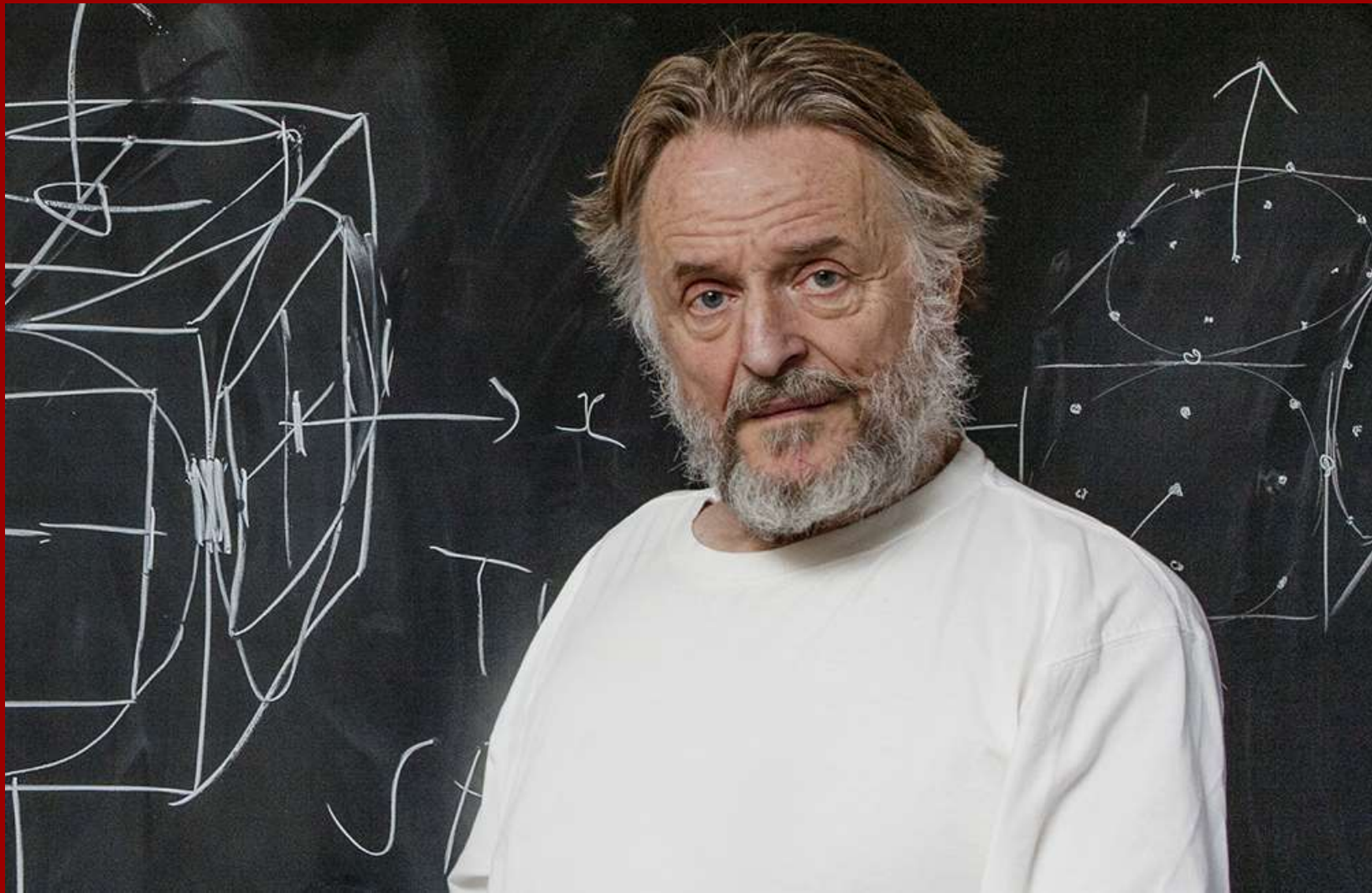
- Simulation of Biological Processes
- Simulation of Cancer cells growth
- Predator – Prey Models
- Art
- Simulation of Forest Fires
- Simulations of Social Movement
- ...many more..

# Cellular Automata: Examples





# Example CA: Conway's Game of Life

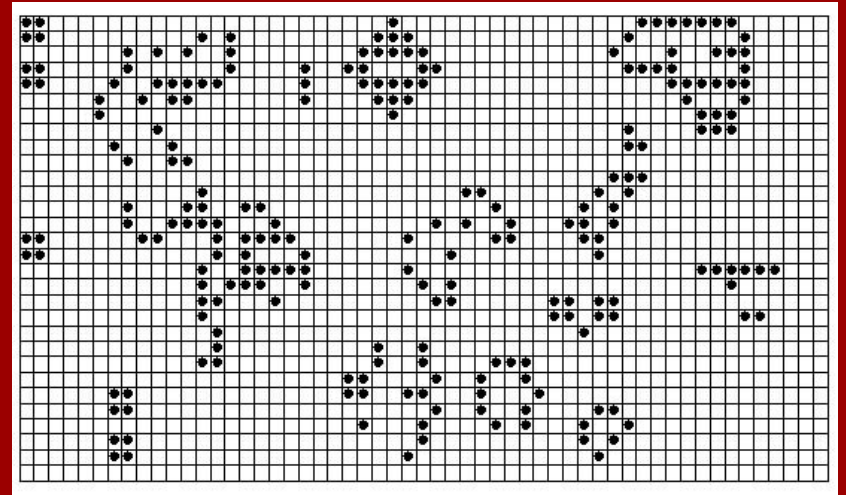


# Example CA: Conway's Game of Life

Cells form the infinite 2D-Grid

$Q = \{\text{alive}, \text{dead}\}$

3 transition rules ( $\delta: Q^9 \rightarrow Q$ ):



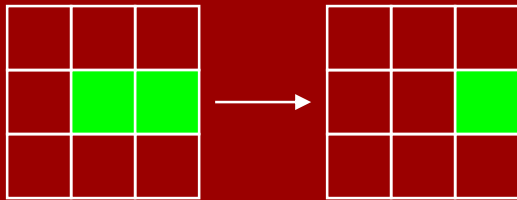
**Loneliness:** Life cell with fewer than 2 neighbors dies.

**Overcrowding:** Life cell with at least 4 life neighbors dies.

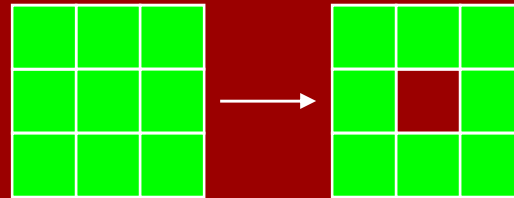
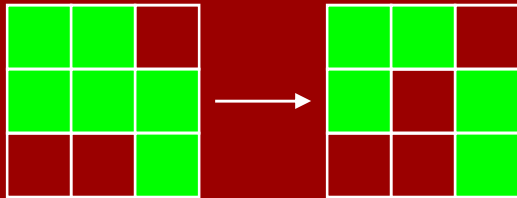
**Procreation:** Dead cell with exactly 3 neighbors gets born.

# Conway's Game of Life: Rule examples

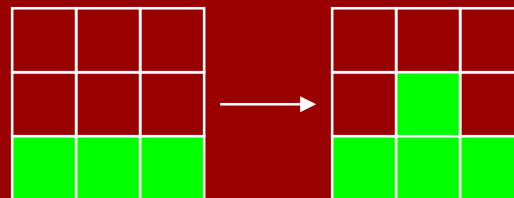
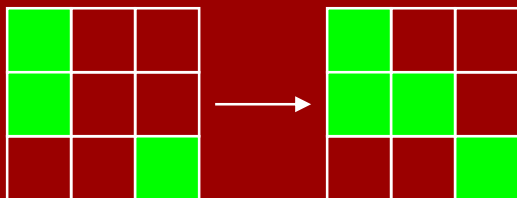
- loneliness



- overcrowding

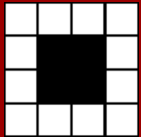


- procreation

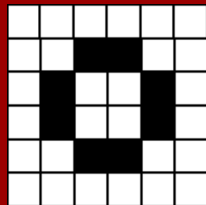


# Conway's Game of Life: Patterns

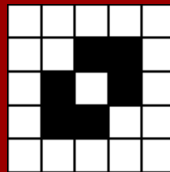
## Stable



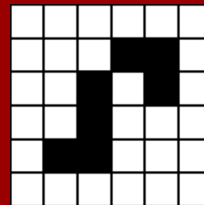
block



pond

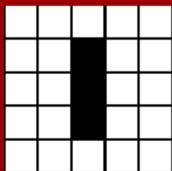


ship

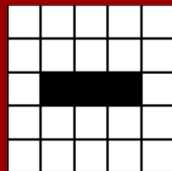


eater

## Periodic

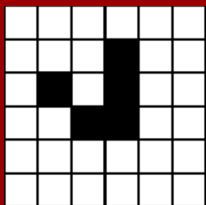


time = 1

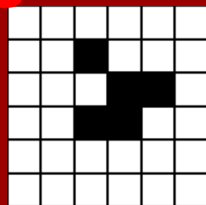


time = 2

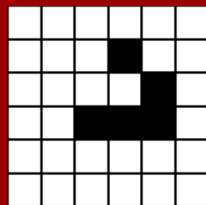
## Moving



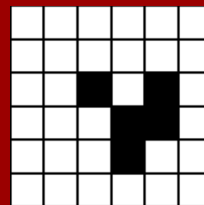
Time = 1



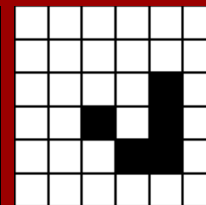
time = 2



time = 3

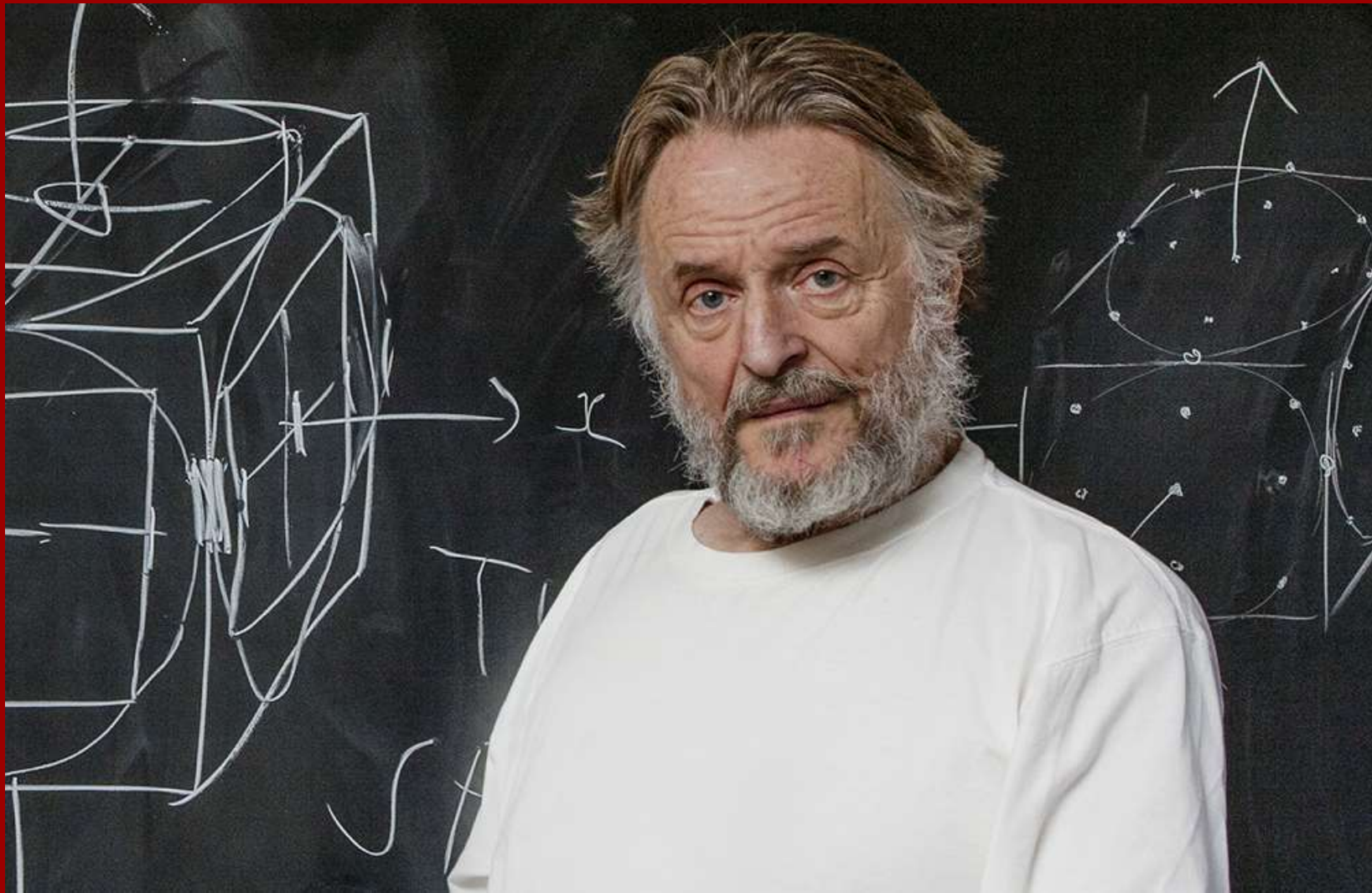


time = 4



time = 5

# Example CA: Conway's Game of Life





# CA Turing Equivalence

**Theorem:** Python / a TM can simulate any CA.

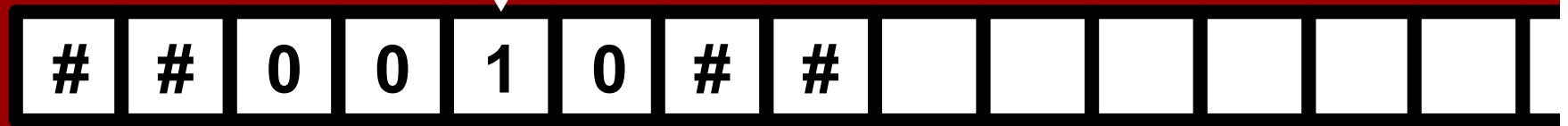
**Theorem:** For any TM there is a 1D-CA simulating it.

**Construction Sketch:**

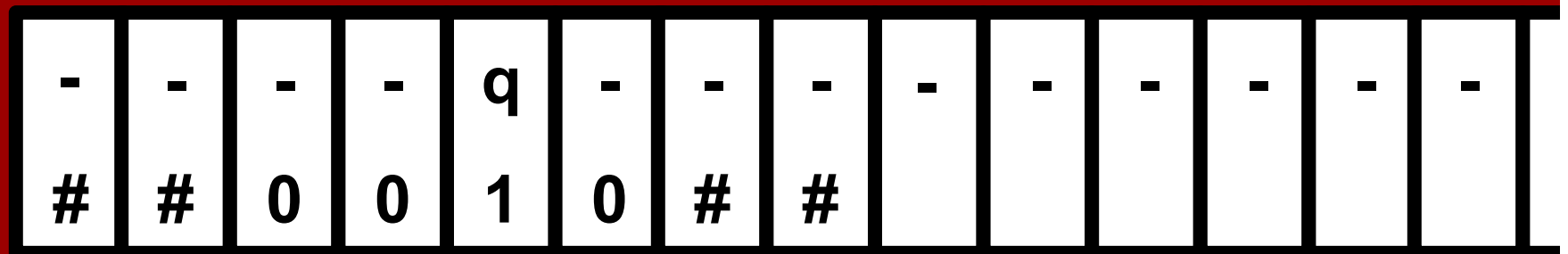
- For TM with state set  $Q$  and tape alphabet  $\Gamma$  create 1D-CA with state space  $\Gamma \times (Q \cup \{-\})$ .
- Cells simulate the tape and exactly one cell indicates the position of the a head and the TM state.
- Cells only transition if a neighboring cell contains the head.
- Transitions are based on the TM transition function.

TM:

finite control in state q

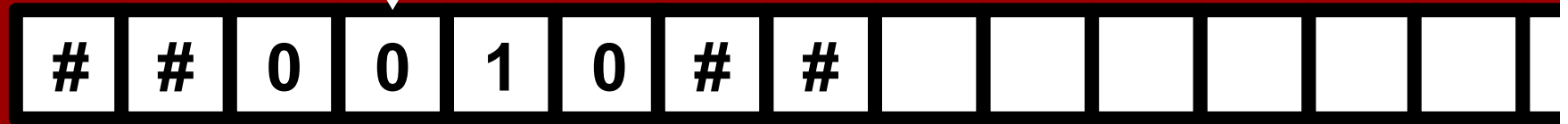


1D-CA:

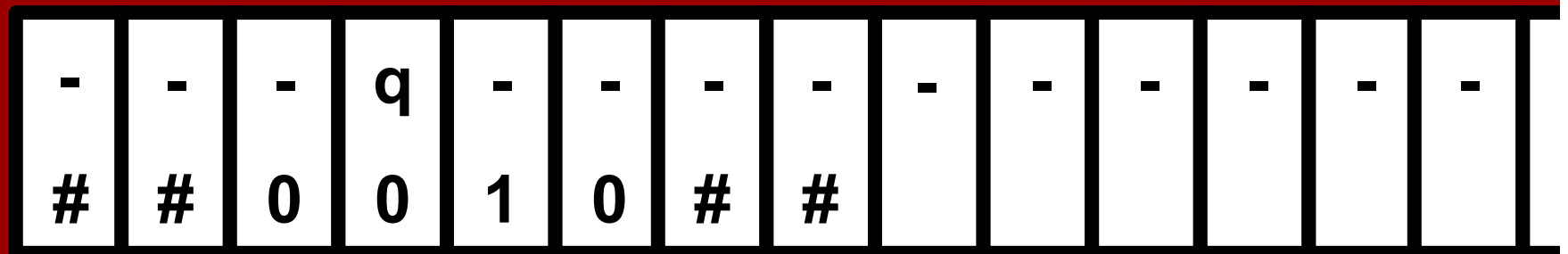


TM:

finite control in state q



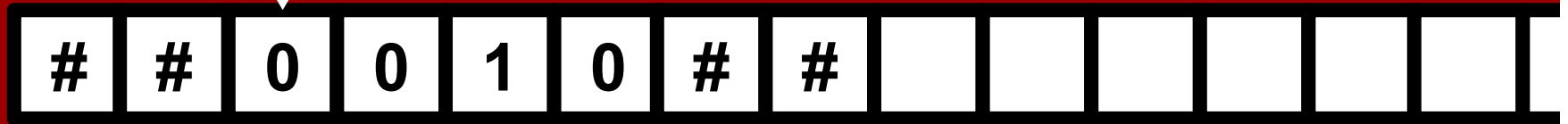
1D-CA:



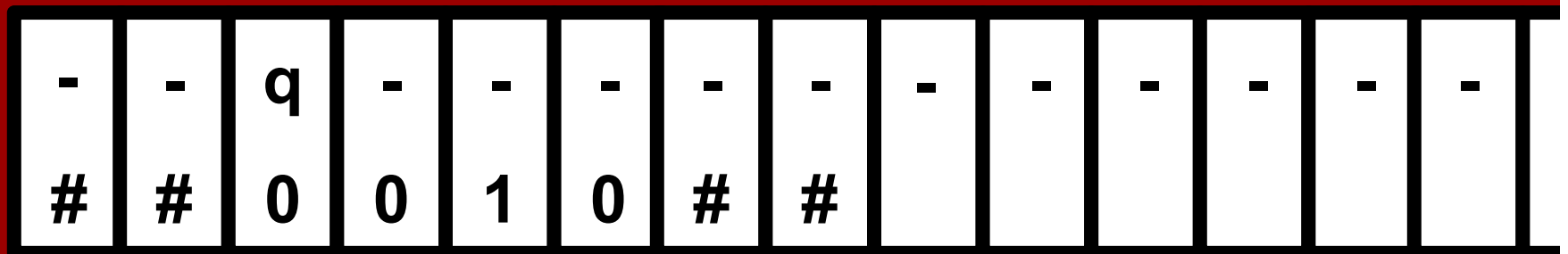


TM:

finite control in state q



1D-CA:

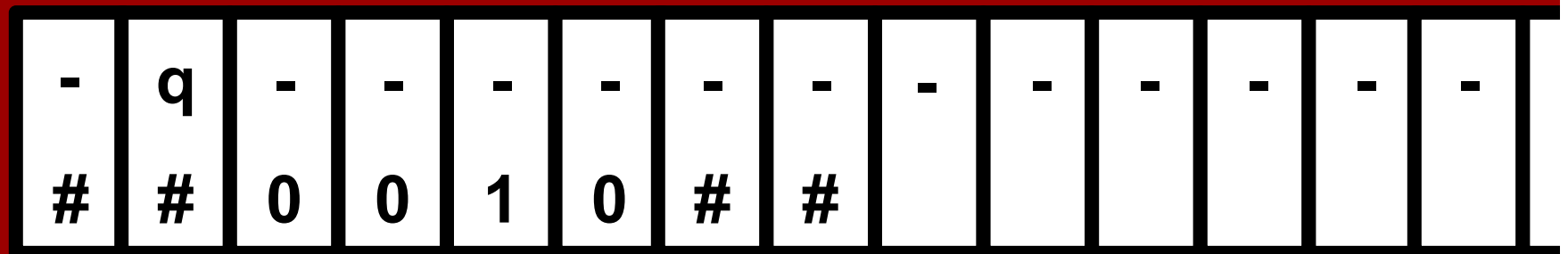


TM:

finite control in state q

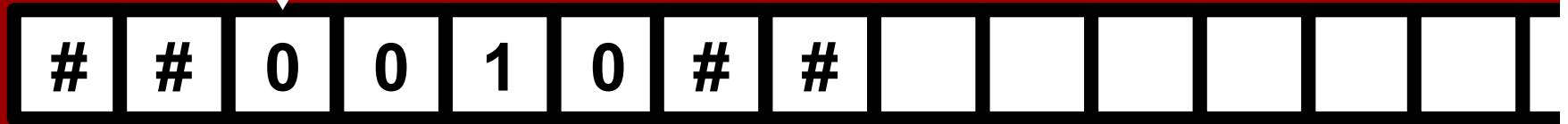


1D-CA:

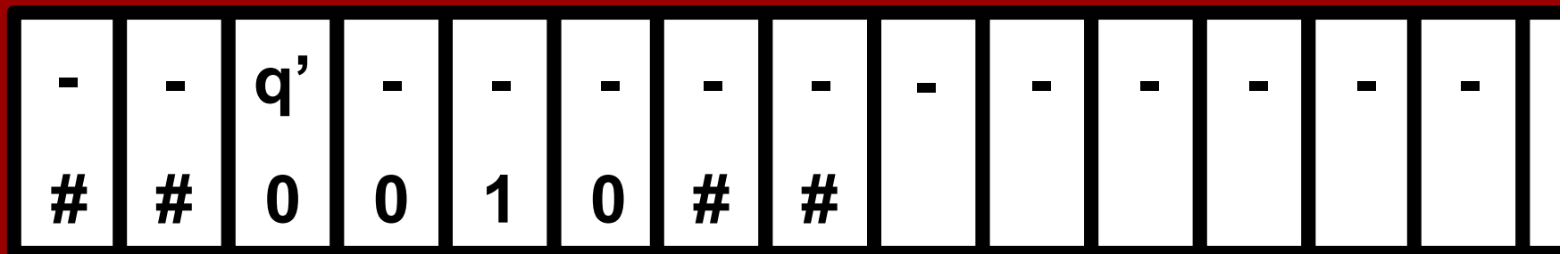


TM:

finite control in state  $q'$

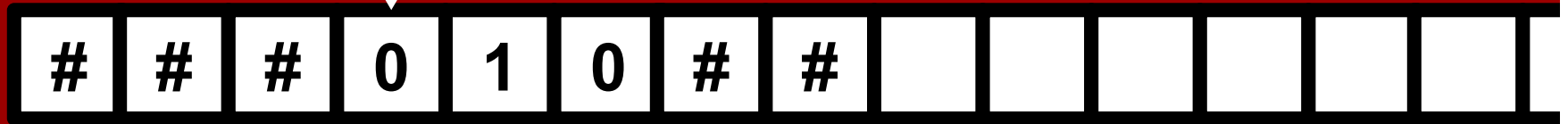


1D-CA:

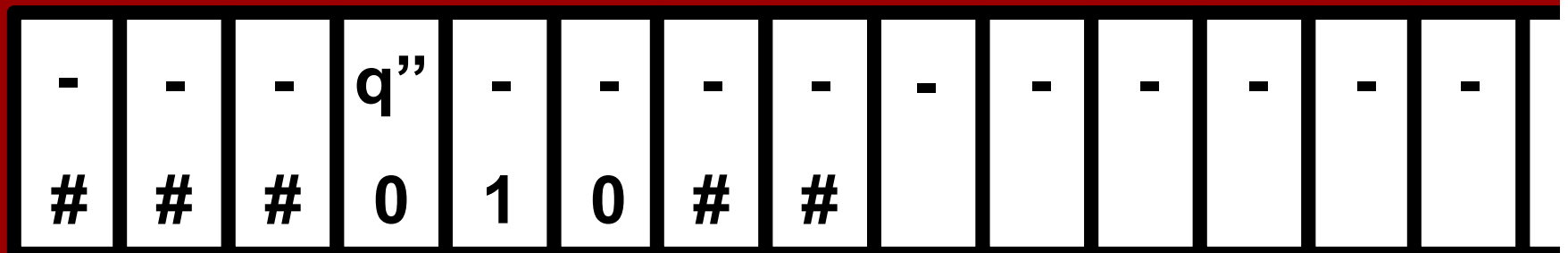


TM:

finite control in state  $q''$

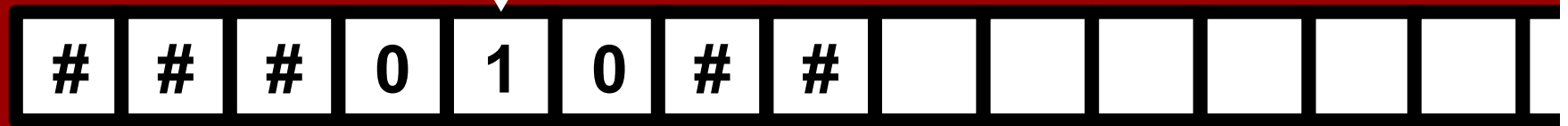


1D-CA:

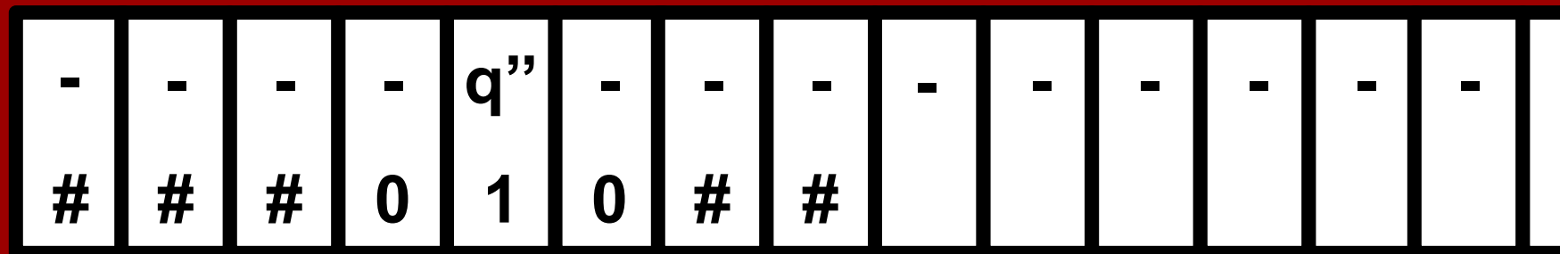


TM:

finite control in state  $q''$

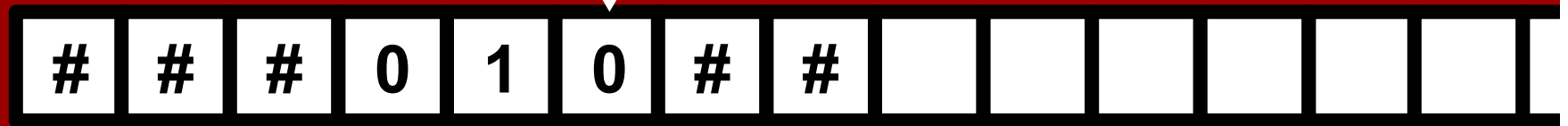


1D-CA:

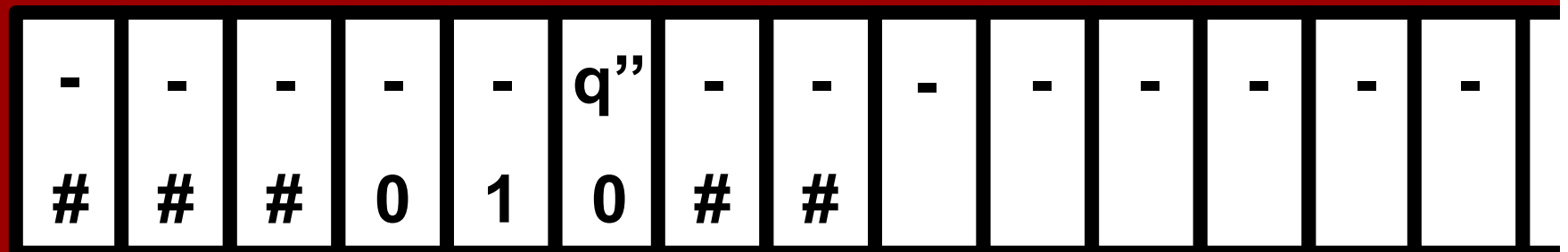


TM:

finite control in state  $q''$

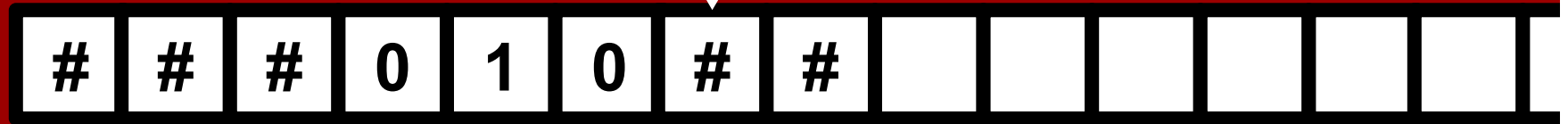


1D-CA:

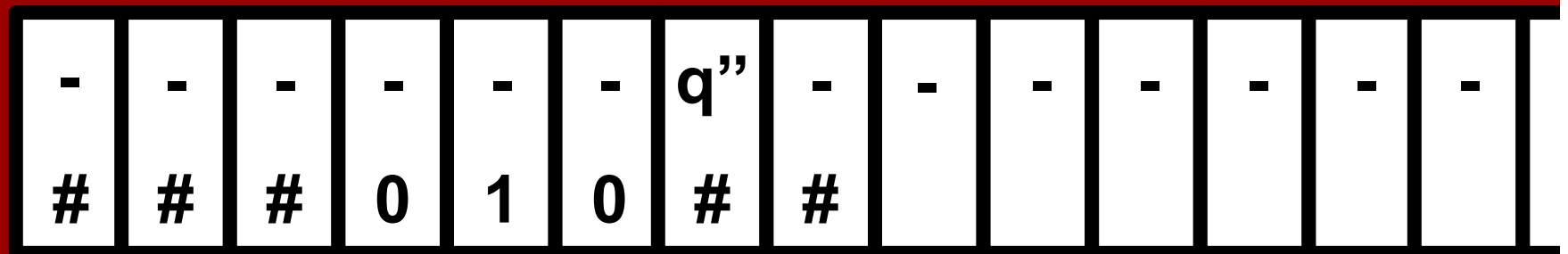


TM:

finite control in state  $q''$



1D-CA:



# CA Turing Equivalence

**Theorem:** Python / a TM can simulate any CA.

**Theorem:** For any TM there is a 1D-CA simulating it.

**Construction Sketch:**

For TM with state set  $Q$  and tape alphabet  $\Gamma$  create 1D-CA with state space  $\Gamma \times (Q \cup \{-\})$ ..

Cells simulate the tape and exactly one cell indicates the position of the a head and the TM state. Cells only transition if a neighboring cell contains the head.

Transitions are based on the TM transition function.

**Theorem:** Game of Life can simulate a universal TM.



# Church–Turing Thesis:

*“Any natural / reasonable notion of computation can be simulated by a TM.”*

# Decidability

# Decidable languages

## Definition:

A language  $L \subseteq \Sigma^*$  is **decidable** if there is a Turing Machine  $M$  which:

1. **Halts on every input**  $x \in \Sigma^*$ .
2. Accepts inputs  $x \in L$  and rejects inputs  $x \notin L$ .

Such a Turing Machine is called a **decider**.

It '**decides**' the language  $L$ .

We like deciders. We don't like TM's that sometimes loop.

# Encoding different objects with strings

Fix some alphabet  $\Sigma$  .

We use the  $\langle \cdot \rangle$  notation to denote the encoding of an object as a string in  $\Sigma^*$  .

Examples:

$\langle M \rangle \in \Sigma^*$  is the encoding a TM  $M$

$\langle D \rangle \in \Sigma^*$  is the encoding a DFAD

$\langle M_1, M_2 \rangle \in \Sigma^*$  is the encoding of a pair of TMs

$\langle M, x \rangle \in \Sigma^*$  is the encoding a pair  $(M, x)$  , where  $M$  is a TM, and  $x \in \Sigma^*$  .

## Decidability: Poll

$\text{ACCEPT}_{\text{DFA}} = \{ \langle D, x \rangle \mid D \text{ is a DFA that accepts } x \}$

$\text{SELF-ACCEPT}_{\text{DFA}} = \{ \langle D \rangle \mid D \text{ is a DFA that accepts } \langle D \rangle \}$

$\text{EMPTY}_{\text{DFA}} = \{ \langle D \rangle \mid D \text{ is a DFA that accepts no } x \}$

$\text{EQUIV}_{\text{DFA}} =$   
 $= \{ \langle D, D' \rangle \mid D \text{ and } D' \text{ are DFA and } L(D) = L(D') \}$

## Decidability: Examples

$\text{ACCEPT}_{\text{DFA}} = \{ \langle D, x \rangle \mid D \text{ is a DFA that accepts } x \}$

$\text{SELF-ACCEPT}_{\text{DFA}} = \{ \langle D \rangle \mid D \text{ is a DFA that accepts } \langle D \rangle \}$

**Theorem:**

**$\text{ACCEPT}_{\text{DFA}}$**  is decidable.

**$\text{SELF-ACCEPT}_{\text{DFA}}$**  is decidable.

**Proof:** Simulate DFA step by step.

## Decidability: Examples

$\text{EMPTY}_{\text{DFA}} = \{ \langle D \rangle \mid D \text{ is a DFA that accepts no } x \}$

### Theorem:

$\text{EMPTY}_{\text{DFA}}$  is decidable.

### Proof:

A DFA  $D$  accepts the empty language iff  
no accepting state is reachable from the start state  
via a simple sequence of states.

Try all  $|Q|!$  possible such sequences.

## Decidability: Examples

$$\begin{aligned}\text{EQUIV}_{\text{DFA}} &= \\ &= \{ \langle D, D' \rangle \mid D \text{ and } D' \text{ are DFA and } L(D) = L(D') \}\end{aligned}$$

### Theorem:

$\text{EQUIV}_{\text{DFA}}$  is decidable.

### Proof:

Create a DFA  $D''$  for the symmetric difference

$$L(D'') = (L(D) \cap \overline{L(D')}) \cup (\overline{L(D)} \cap L(D'))$$

using the Union and Intersection theorem for DFA.

Run the decider TM for  $\text{EMPTY}_{\text{DFA}}$  on  $\langle D'' \rangle$ .



# Reductions

*Using one problem as a **subroutine** to solve another is a powerful algorithmic technique.*

## Definition:

Language *A reduces to language B* means:

“It is possible to decide A using an algorithm for deciding B as a subroutine.”

Notation:  $A \leq_T B$  (T stands for Turing).

Think, “*A is no harder than B*”.

# Reductions

## Fact:

Suppose  $A \leq_T B$ ; i.e., A reduces to B.

If B is decidable, then A is also decidable.

Here:

$\text{EQUIV}_{\text{DFA}} \leq_T \text{EMPTY}_{\text{DFA}}$  and  $\text{EMPTY}_{\text{DFA}}$  is decidable.

This makes  $\text{EQUIV}_{\text{DFA}}$  decidable.

Indeed,  $\text{EQUIV}_{\text{DFA}}$  is at most as hard as  $\text{EMPTY}_{\text{DFA}}$

because solving  $\text{EQUIV}_{\text{DFA}}$  is easy given a

solution to  $\text{EMPTY}_{\text{DFA}}$ .

# Undecidability

# Undecidability

## Definition:

A language  $L \subseteq \Sigma^*$  is **undecidable** if there is **no** Turing Machine  $M$  which:

1. **Halts on every input**  $x \in \Sigma^*$ .
2. Accepts inputs  $x \in L$  and rejects inputs  $x \notin L$ .

## Poll

Let  $A$  be the set of all languages over  $\Sigma = \{0,1\}$ .

Select all correct ones:

- $A$  is finite
- $A$  is infinite
- $A$  is countable
- $A$  is uncountable

# Poll

Let  $A$  be the set of all languages over  $\Sigma = \{0,1\}$ .

Select all correct ones:

-  $A$  is finite

✓ -  $A$  is infinite

-  $A$  is countable

✓ -  $A$  is uncountable  $|A| = |\mathcal{P}(\Sigma^*)| = |\mathcal{P}(\mathbb{N})|$

## Question:

Is every language in  $\{0,1\}^*$  decidable?

$\Leftrightarrow$  Is every function  $f : \{0,1\}^* \rightarrow \{0,1\}$  computable?

**Answer:** No!

Every TM is encodable by a finite string.

Therefore the set of all TM's is countable.

So the subset of all *decider* TM's is countable.

Thus **the set of all decidable languages is countable.**

But **the set of all languages** is the **power set of  $\{0,1\}^*$**   
which is **uncountable.**

## Question:

Is every language in  $\{0,1\}^*$  decidable?

$\Leftrightarrow$  Is every function  $f : \{0,1\}^* \rightarrow \{0,1\}$  computable?

## Answer:

Essentially all (decision) functions are uncomputable!





## Question:

Is it just weird languages that no one would care about which are *undecidable*?

## Answer (due to Turing, 1936):

Sadly, no.

There are many natural languages one would like to compute but which are undecidable.



# Example: Program Equivalence

Given a program  $P$  and a program  $P'$  we would like to automatically decide whether both do the same thing.

Formally:

$$\begin{aligned} \text{EQUIV}_{\text{TM}} &= \\ &= \{ \langle P, P' \rangle \mid P \text{ and } P' \text{ are Python programs and} \\ &\quad L(D) = L(D') \} \end{aligned}$$

Useful for:

- Compiler Optimization
- Matching programs to their specification
- Autograder for 112 or 251 😊

# Example: 112 Autograder

First 112 assignment: Write a “Hello World” program.

Given a program  $P$  submitted by a student we want to automatically decide whether  $P$  does the right thing.

We want an algorithm  $A$  such that:

$$A(\langle P \rangle) = \begin{cases} \text{pass} & \text{iff } P \text{ outputs “Hello World” and} \\ \text{fail} & \text{otherwise} \end{cases}$$

## Example: 112 Autograder

Given a program  $P$  and a program  $P'$  we would like to automatically decide whether both do the same thing.

Formally:

$$\begin{aligned} \text{EQUIV}_{\text{TM}} &= \\ &= \{ \langle P, P' \rangle \mid P \text{ and } P' \text{ are Python programs and} \\ &\quad L(D) = L(D') \} \end{aligned}$$

Useful for:

- Compiler Optimization
- Matching programs to their specification
- Autograder for 112 or 251 ☺

# 112 Autograder Submission 1

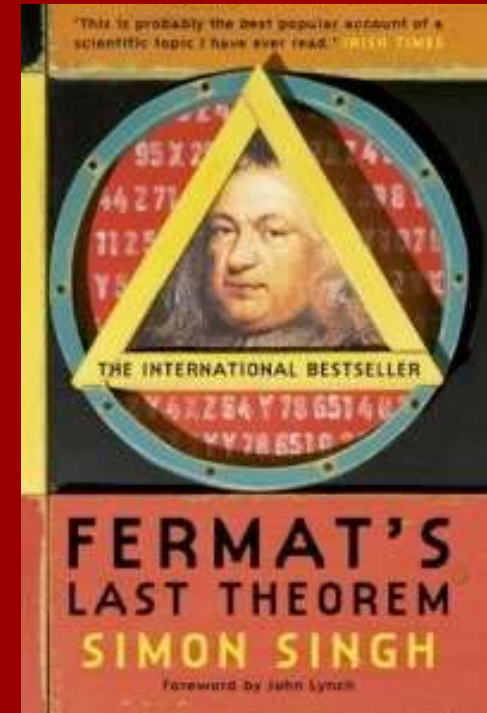
```
main(t,_,a ) char * a; { return! 0<t? t<3? main(-79,-13,a+ main(-87,1-_, main(-86, 0, a+1 )
+a)): 1, t<_? main( t+1, _, a ) :3, main ( -94, -27+t, a ) &&t == 2 ? _ <13 ? main ( 2, _+1, "%s
%d %d\n" ) :9:16: t<0? t<-72? main( _, t,
"@n'+,#/*{}w+/w#cdnr/+,{}r/*de}+,/*{*+,/w{%+,/w#q#n+,/#{l,+,/n{n+,/+ #n+,/ #;#q#n+,/+k#;*,/'r
:'d*'3,){w+K w'K:'+}e#';dq#l
q#+d'K#!/+k#;q#'r}eKK#}w'r}eKK{nl]'/ #;#q#n')}{#}w')}{nl]'/+ #n';d}rw' i;# ){nl]!/n{n#'; r{#w'r
nc{nl]'/#{l,+'K {rw' iK{;[{nl]'/w#q#n'wk nw' iwk{KK{nl]!/w{%l###w#' i;
:{nl]'/*{q#ld;r'}{nlwb!/*de}'c ;;{nl'-}{rw]'/+,}##*'}#nc,',#nw]'/+kd'+e}+;#rdq#w! nr/' ' ) }+}{rl#'{n'
')# }'+}##(!/"/) : t<-50? _==*a ? putchar(31[a]): main(-65,_,a+1) : main((*a == '/') + t, _, a + 1 ) :
0<t? main ( 2, 2 , "%s") : *a=='/'|| main(0, main(-61,*a, "!ek;dc i@bK'(q)-
[w]*%n+r3#l,{ }:\nuwloca-O;m .vpbks,fxntdCeghiry") ,a+1);}
```

This C program prints out all the lyrics of  
*The Twelve Days Of Christmas.*

Ok, so let just run the program P and check the output.

# 112 Autograder Submission 2

```
def HelloWorld():  
    t = 3  
    while (True):  
        for n in xrange(3, t+1):  
            for x in xrange(1, t+1):  
                for y in xrange(1, t+1):  
                    for z in xrange(1, t+1):  
                        if (x**n + y**n == z**n):  
                            return "Hello World"  
        t += 1
```



This program terminates and outputs "Hello World"  
if and only if Fermat's Last Theorem is false.

# 112 Autograder Submission 3

```
numberToTest := 2;  
flag := 1;  
while flag = 1 do  
  flag := 0;  
  numberToTest := numberToTest + 2;  
  for p from 2 to numberToTest do  
    if IsPrime(p) and IsPrime(numberToTest-p) then  
      flag := 1;  
      break;  
    end if  
  end for  
end do  
print("HELLO WORLD")
```

**Terminates with “Hello World” output  
if and only if Goldbach’s Conjecture is false.**

# Some uncomputable functions

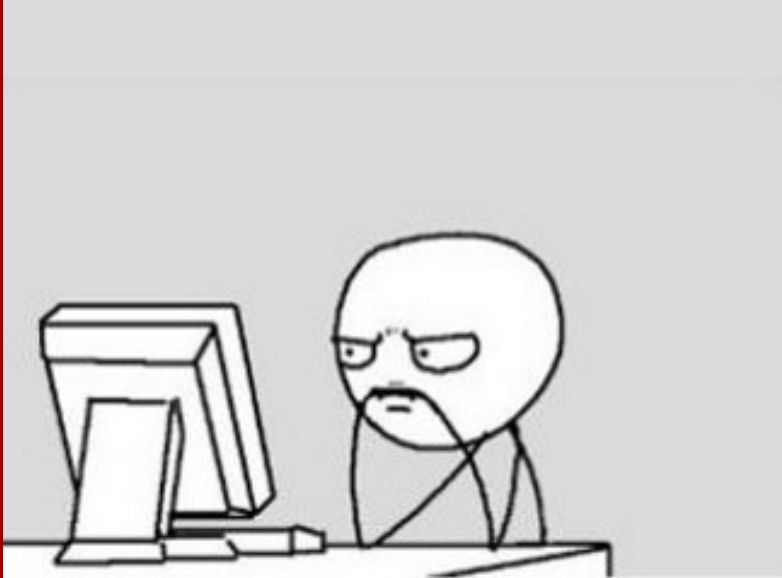
Given two TM descriptions,  $\langle M_1 \rangle$  and  $\langle M_2 \rangle$ , do they act the same (accept/reject/loop) on all inputs?

Given the description of an algorithm,  $\langle M \rangle$ , does it print out “HELLO WORLD”?

Given a TM description  $\langle M \rangle$  and an input  $x$ , does  $M$  halt on input  $x$ ?

Given a TM description  $\langle M \rangle$ , does  $M$  halt when the input is a blank tape?





## Study Guide

### Definitions:

Cellular Automata (CA)  
Reductions  
Undecidability

### Theorems/proofs:

Turing equivalency of CA  
Decidability of several  
languages  
Existence of undecidable  
problems

### Practice:

Decidability Proofs  
(via Reductions)