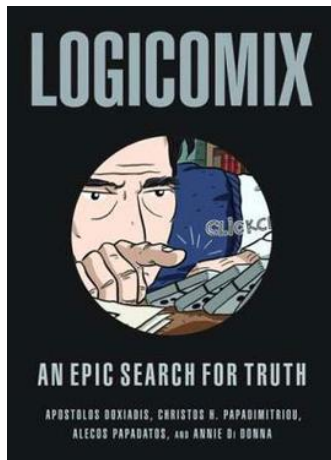


# Logic & the search for truth

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Challenges to

- truth

Liar's Paradox: 'I am lying'



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Liar's Paradox: 'I am lying'

- sets (membership  $\in$ )

Russell set  $R = \{x \mid \text{not } x \in x\}$

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$$R \in R \iff \text{not } R \in R$$

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- search (one by one)

Cantor: cannot count subsets of  $\{0, 1, 2, \dots\}$

$s_1$	=	0	0	0	0	0	0	0	0	0	0	0	0	...
$s_2$	=	1	1	1	1	1	1	1	1	1	1	1	1	...
$s_3$	=	0	1	0	1	0	1	0	1	0	1	0	1	...
$s_4$	=	1	0	1	0	1	0	1	0	1	0	1	0	...
$s_5$	=	1	1	0	1	0	1	1	0	1	0	1	0	...
$s_6$	=	0	0	1	1	0	1	1	0	1	1	0	1	...
$s_7$	=	1	0	0	1	0	0	1	0	0	1	0	0	...
$s_8$	=	0	0	1	1	0	0	1	1	0	0	1	1	...
$s_9$	=	1	1	0	0	1	1	0	0	1	1	0	0	...
$s_{10}$	=	1	1	0	1	1	0	0	1	0	1	0	1	...
$s_{11}$	=	1	1	0	1	0	1	0	0	1	0	1	0	...
$\vdots$		$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	...

$s = 10111010011\dots$

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- computability

Turing: Halting Problem

# The Halting Problem

Given a program  $P$  and data  $D$ , return either 0 or 1 (as output), with 1 indicating that  $P$  halts on input  $D$

$$\text{HP}(P, D) := \begin{cases} 1 & \text{if } P \text{ halts on } D \\ 0 & \text{otherwise} \end{cases}$$

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**Theorem (Turing)** *No TM computes HP.*

The proof is similar to the Liar's Paradox distributed as follows

H: 'L speaks the truth'

L: 'H lies'

with a spoiler L (exposing H as a fraud).



## Proof of uncomputability

Given a TM  $P$  that takes two arguments, we show  $P$  does not compute HP by defining a TM  $\overline{P}$  such that

$$P(\overline{P}, \overline{P}) \neq \text{HP}(\overline{P}, \overline{P}) .$$

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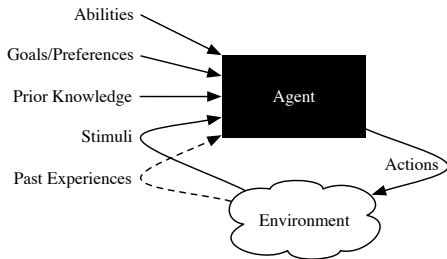
Let

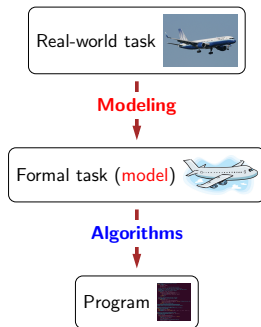
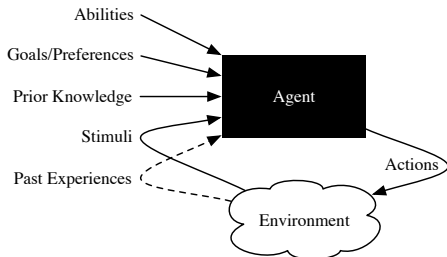
$$\bar{P}(D) \quad \simeq \quad \begin{cases} 1 & \text{if } P(D, D) = 0 \\ \text{loop} & \text{otherwise.} \end{cases}$$

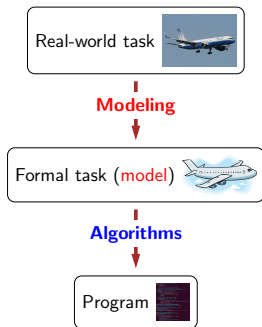
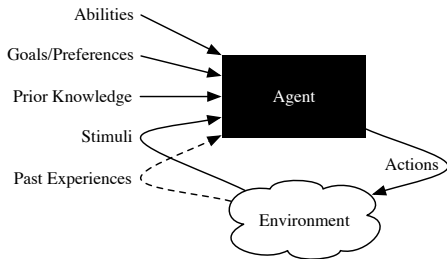
and notice

$$\begin{aligned} \text{HP}(\bar{P}, \bar{P}) &= \begin{cases} 1 & \text{if } \bar{P} \text{ halts on } \bar{P} \\ 0 & \text{otherwise} \end{cases} && (\text{def of HP}) \\ &= \begin{cases} 1 & \text{if } P(\bar{P}, \bar{P}) = 0 \\ 0 & \text{otherwise} \end{cases} && (\text{def of } \bar{P}) \end{aligned}$$

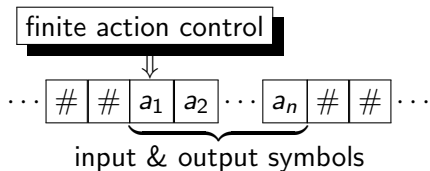
□



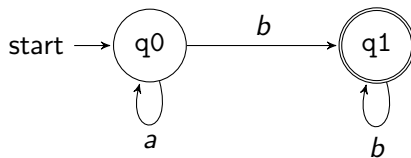




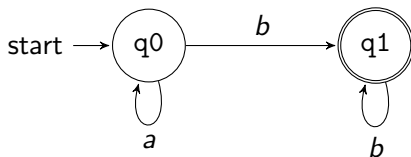
CHURCH-TURING THESIS: Program  $\approx$  Turing machine



## Finite state machine (fsm)



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A **fsm**  $M$  is a triple  $[\text{Trans}, \text{Final}, Q_0]$  where

- $\text{Trans}$  is a list of triples  $[Q, X, Q_n]$  such that  $M$  may, at state  $Q$  seeing symbol  $X$ , change state to  $Q_n$
- $\text{Final}$  is a list of  $M$ 's final (i.e. accepting) states
- $Q_0$  is  $M$ 's initial state.

E.g.  $\text{Trans} = [[q_0, a, q_0], [q_0, b, q_1], [q_1, b, q_1]]$

$\text{Final} = [q_1]$

$Q_0 = q_0$

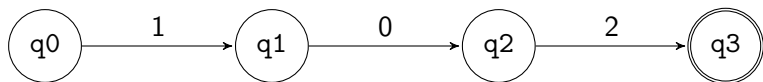
## From strings to fsm's

Encode strings as lists; e.g. 102 as [1,0,2].



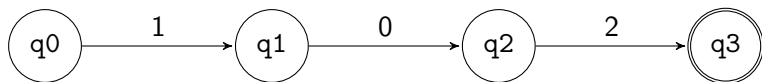
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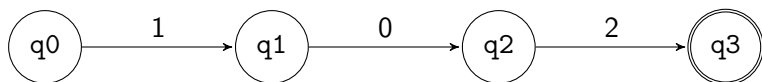
Encode strings as lists; e.g. 102 as [1,0,2].



```
% string2fsm(+String, ?TransitionSet, ?FinalStates)
string2fsm([], [], [q0]).
string2fsm([H|T], Trans, [Last]) :-
```

## From strings to fsm's

Encode strings as lists; e.g. 102 as [1,0,2].



```
% string2fsm(+String, ?TransitionSet, ?FinalStates)
string2fsm([], [], [q0]).
string2fsm([H|T], Trans, [Last]) :-
    mkTL(T, [H], [[q0, H, [H]]], Trans, Last).

% mkTL(+More, +LastSoFar, +TransSoFar, ?Trans, ?Last)
mkTL([], L, Trans, Trans, L).
mkTL([H|T], L, TransSoFar, Trans, Last) :-
    mkTL(T, [H|L], [[L,H,[H|L]]|TransSoFar],
        Trans, Last).
```

States as histories (in reverse)

## More on *states-as-histories*

Encoding  $q_0$  as `[]` leads to the simplification

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str2fsm(String, Trans, [Last]) :-  
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*States-as-histories* works for finite languages,

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str2fsm(String, Trans, [Last]) :-  
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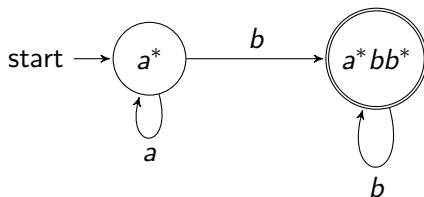
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*States-as-histories* works for finite languages, but not say,  $a^*bb^*$



for *state-as-set-of-equivalent-histories*,  
where equivalence has to do with acceptable **futures** ...

## Exercise

Define a 4-ary predicate

```
accept(+Trans,+Final,+Q0,?String)
```

that is true exactly when `[Trans,Final,Q0]` is a fsm that accepts `String` (encoded as a list).



## Exercise

Define a 4-ary predicate

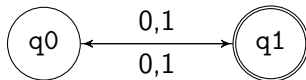
`accept(+Trans,+Final,+Q0,String)`

that is true exactly when `[Trans,Final,Q0]` is a fsm that accepts `String` (encoded as a list).

That is, write a Prolog program to answer queries such as

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?- accept([[q0,0,q1],[q0,1,q1],[q1,0,q0],[q1,1,q0]],  
          [q1], q0, [1,0,0]).
```

true



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Define a 4-ary predicate

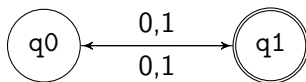
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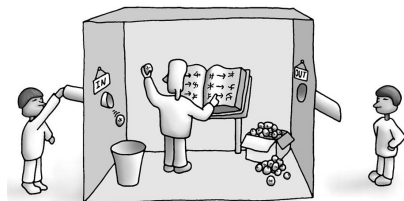
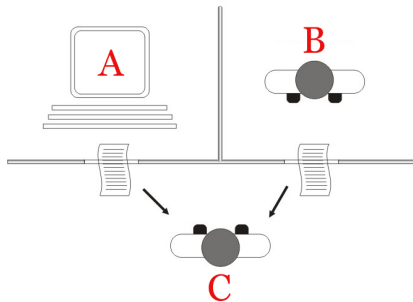
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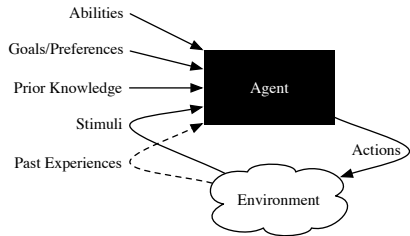
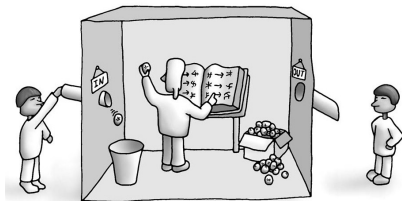
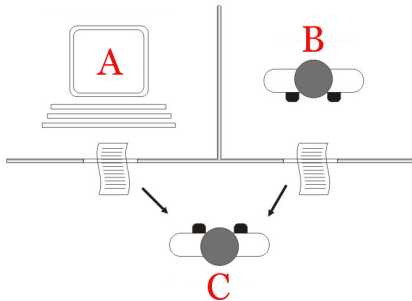
true



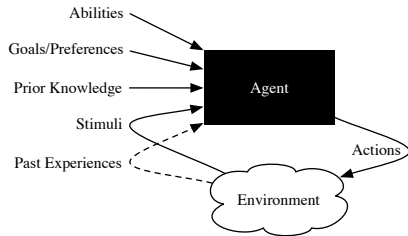
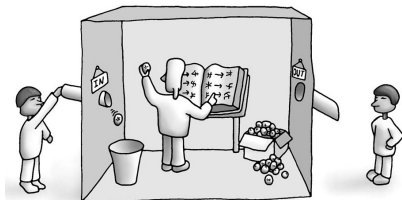
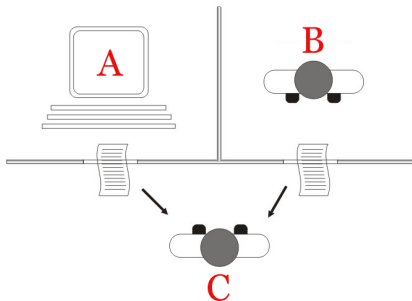
```
test(String) :- string2fsm(String, Trans, Final),  
                accept(Trans, Final, q0, String).
```



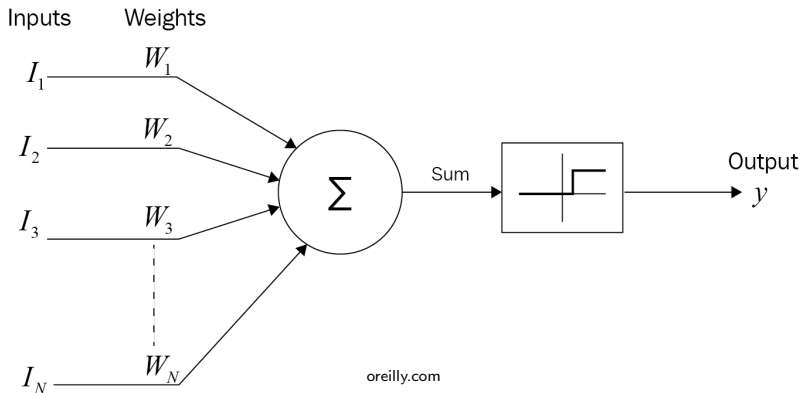
# the black box



# Peering inside the black box

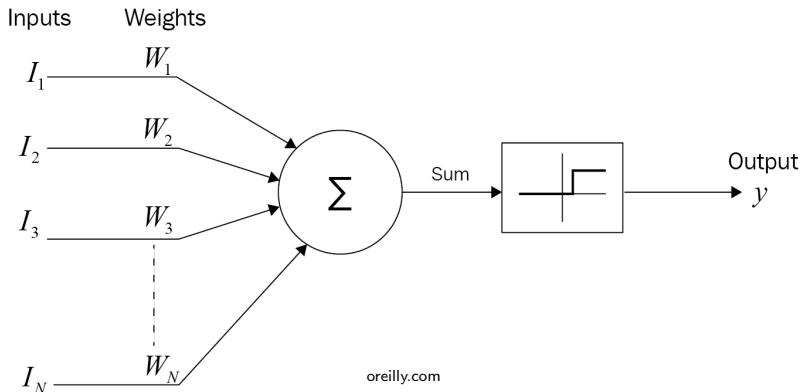


# Agents from neurons (perceptrons)



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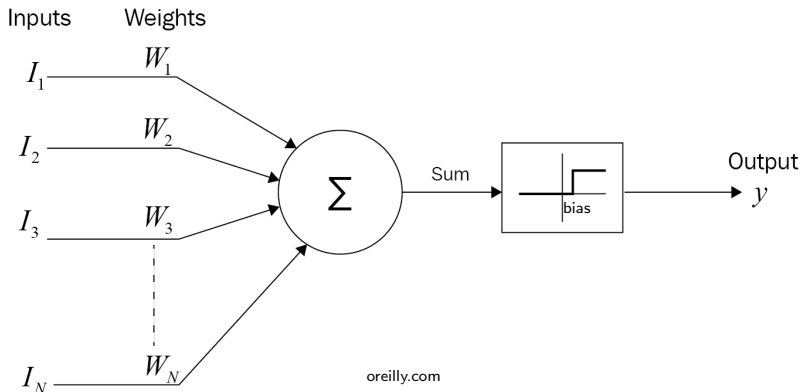
$$\text{Sum} = W_1 I_1 + W_2 I_2 + \cdots + W_N I_N$$



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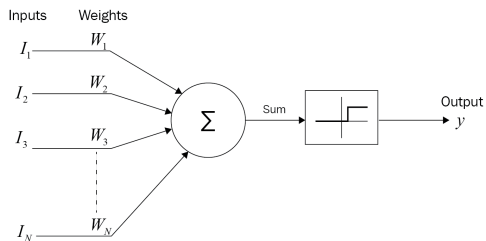
$$\text{Sum} = W_1 I_1 + W_2 I_2 + \cdots + W_N I_N$$

$$y = \begin{cases} 1 & \text{if Sum} \geq \text{bias} \\ 0 & \text{if Sum} < \text{bias} \end{cases}$$

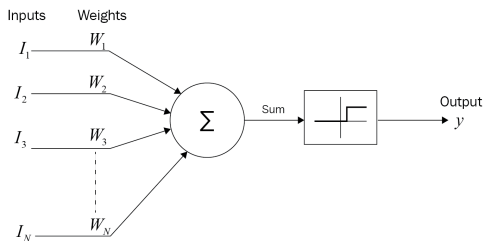




# Finite state aggregations



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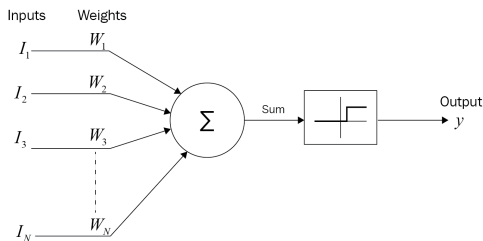
**Kleene 1956**

$$I_1, I_2 \cdots I_N = q, a$$

$$q \overset{a}{\rightsquigarrow} y \iff \begin{array}{l} \text{output } y \text{ on} \\ \text{input } a \text{ at } q \end{array}$$

input  $a$  given by  $k$  input cells  $N_1 \dots N_k$   
state  $q = (v_1 \dots v_m)$  records the  
values  $v_i$  of  $m$  inner cells  $M_1 \dots M_m$

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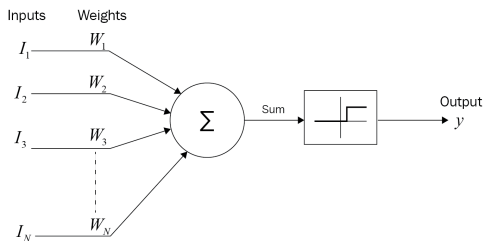
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**McCulloch & Pitts 1943:** neural activity is *all-or-none*

**Kleene 1956:** input cells are binary, forming a string  $a$  of  $k$  bits  
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**Rabin & Scott 1959:** work with any finite sets  $A$ ,  $Q$  and  $\rightarrow$

# Logical abstractions away from physics and biology

1976 Turing Award to Rabin & Scott for their joint paper

The internal workings of an automaton will not be analyzed too deeply. We are **not** concerned with **how** the machine is built but with **what** it can do. The definition of the internal structure must be general enough to cover all conceivable machines, but it need not involve itself with problems of circuitry.

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