

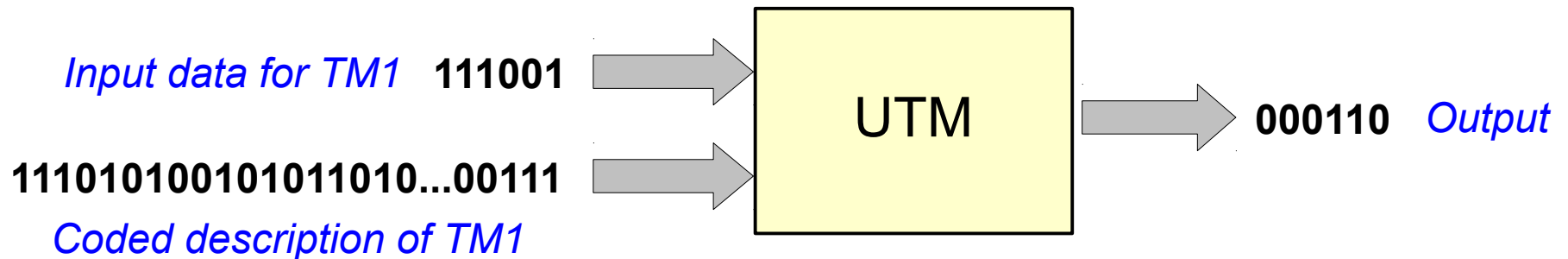
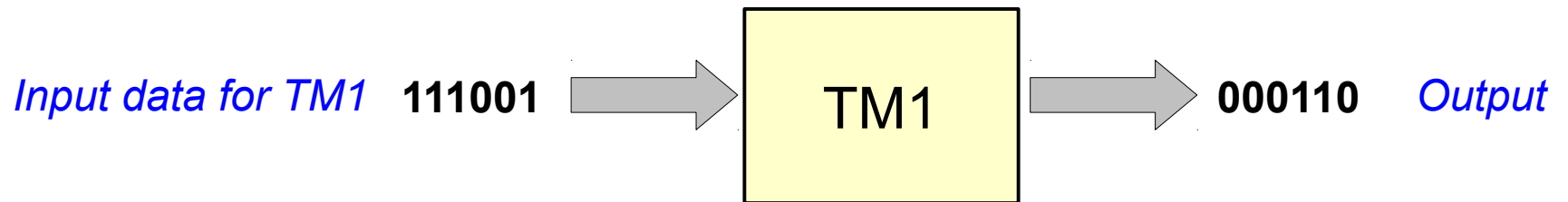
# Reading for this week and next

- *Complexity: a Guided Tour*
  - Chapters 5-8: background material on evolution and genetics
  - Chapter 9: genetic algorithms (“Robby the Robot”)
- *The Computational Beauty of Nature*
  - Sections 20.1 through 20.3: genetic algorithms

# Universal Turing Machines

# Universal Turing Machines

- A special TM, called a **Universal Turing Machine**, can simulate any other Turing machine



# How to Encode a Turing Machine?

- States:  $s_1, s_2, s_3, \text{halt}$   $\rightarrow 0, 00, 000, 0000, \text{etc.}$
- Symbols:  $x, y, z$   $\rightarrow 0, 00, 000, \text{etc.}$
- Moves: Right, Left, None  $\rightarrow 0, 00, 000$
- Rules:

$s_1 \ y \ y \ R \ s_3$

$s_2 \ x \ z \ L \ \text{halt}$

$\rightarrow$

0 1 00 1 00 1 0 1 000

$\rightarrow$

00 1 0 1 000 1 00 1 0000



111 0 1 00 1 00 1 0 1 000 11 00 1 0 1 000 1 00 1 0000 111

# How to Encode a Turing Machine?

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- Symbols:  $x, y, z$   $\rightarrow 0, 00, 000, \text{etc.}$
- Moves: Right, Left, None  $\rightarrow 0, 00, 000$
- Rules:

$s_1 \ y \ y \ R \ s_3 \rightarrow 0 \ 1 \ 00 \ 1 \ 00 \ 1 \ 0 \ 1 \ 000$

$s_2 \ x \ z \ L \ \text{halt} \rightarrow 00 \ 1 \ 0 \ 1 \ 000 \ 1 \ 00 \ 1 \ 0000$

**111** 0 1 00 1 00 1 0 1 000 **11** 00 1 0 1 000 1 00 1 0000 **111**

1110100100101000110010100010010000111

# How to Encode a Turing Machine?

- States:  $s_1, s_2, s_3, \text{halt}$   $\rightarrow 0, 00, 000, 0000, \text{etc.}$
- Symbols:  $x, y, z$   $\rightarrow 0, 00, 000, \text{etc.}$
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$s_1 \ y \ y \ R \ s_3 \rightarrow 0 \ 1 \ 00 \ 1 \ 00 \ 1 \ 0 \ 1 \ 000$

$s_2 \ x \ z \ L \ \text{halt} \rightarrow 00 \ 1 \ 0 \ 1 \ 000 \ 1 \ 00 \ 1 \ 0000$

**111**  $0 \ 1 \ 00 \ 1 \ 00 \ 1 \ 0 \ 1 \ 000$  **11**  $00 \ 1 \ 0 \ 1 \ 000 \ 1 \ 00 \ 1 \ 0000$  **111**

= 125,176,464,519 in decimal

# Example: The “Binary Inverter” TM

- States: s1, halt  $\rightarrow$  0, 00
- Symbols: 0, 1, \_  $\rightarrow$  0, 00, 000
- Moves: Right, Left, None  $\rightarrow$  0, 00, 000
- Rules:

s1 0 1 R s1  $\rightarrow$  0 1 0 1 00 1 0 1 0

s1 1 0 R s1  $\rightarrow$  0 1 00 1 0 1 0 1 0

s1 \_ \_ \* halt  $\rightarrow$  0 1 000 1 000 1 000 1 00

111 0101001010 11 0100101010 11 0100010001000100 111

1110101001010110100101010110100010001000100111

# Example: The “Binary Inverter” TM

- States:  $s1$ , halt  $\rightarrow 0, 00$
- Symbols:  $0, 1, \_$   $\rightarrow 0, 00, 000$
- Moves: Right, Left, None  $\rightarrow 0, 00, 000$
- Rules:

$s1 \ 0 \ 1 \ R \ s1 \rightarrow 0 \ 1 \ 0 \ 1 \ 00 \ 1 \ 0 \ 1 \ 0$

$s1 \ 1 \ 0 \ R \ s1 \rightarrow 0 \ 1 \ 00 \ 1 \ 0 \ 1 \ 0 \ 1 \ 0$

$s1 \ \_ \ \_ \ * \ halt \rightarrow 0 \ 1 \ 000 \ 1 \ 000 \ 1 \ 000 \ 1 \ 00$

111 0101001010 11 0100101010 11 0100010001000100 111

= 64,414,398,685,735 in decimal



# Your Turn

- States: s1, halt  $\rightarrow$  0, 00
- Symbols: 0, 1, \_  $\rightarrow$  0, 00, 000
- Moves: Right, Left, None  $\rightarrow$  0, 00, 000
- Rules:

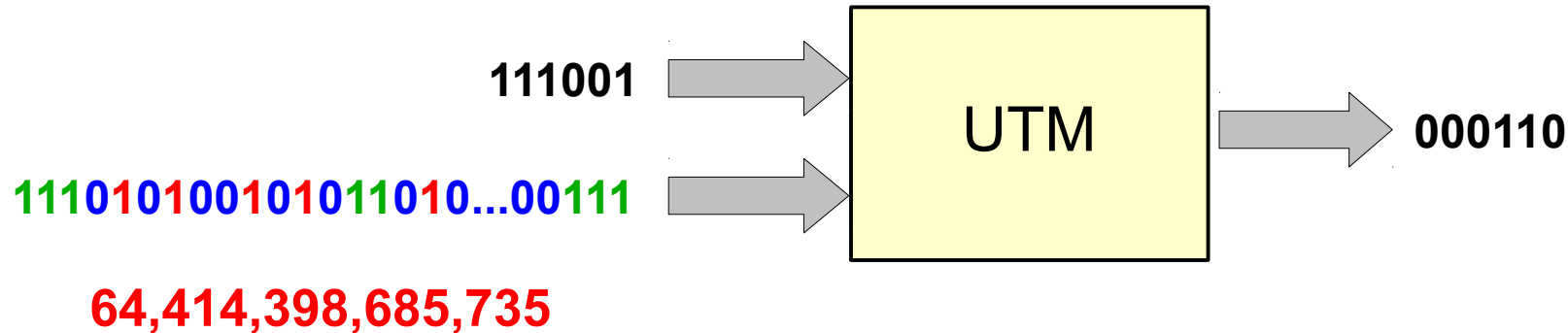
s1 0 0 R s1	$\rightarrow$	0 1 0 1 0 1 0 1 0
s1 1 1 L s1	$\rightarrow$	0 1 00 1 00 1 00 1 0
s1 _ _ * halt	$\rightarrow$	0 1 000 1 000 1 000 1 00

111 010101010 11 010010010010 11 0100010001000100 111

11101010101011010010010010110100010001000100111

= 129,014,683,017,767 in decimal

# The Universal Machine



- UTM's own internal rules are **fixed**
- Coded description acts as a **program** that UTM executes on the input string 111001
- Or we could say that the number **64,414,398,685,735** **acts** on the input 111001 to produce the output 000110

# The Universal Machine

Before Turing, things were done to numbers. After Turing, numbers began doing things.

—George Dyson, *Turing's Cathedral*

I am thinking about something much more important than bombs. I am thinking about computers.

—John Von Neumann, 1946

The fact that there is a universal machine to imitate all other machines...was understood by von Neumann and a few others. And when he understood it, then he knew what we could do.

—Julian Bigelow, chief engineer of the IAS Electronic Computer Project

# The Universal Machine

- The existence of the UTM is what makes computers **fundamentally different** from other machines
- Computers are the only machines that can **simulate any other machine** to an arbitrary degree of accuracy
- **Universality** is why computers have taken over the world!

# The Universal Machine

*Even the word “cellphone” is a misnomer. They could just as easily be called cameras, video players, Rolodexes, calendars, tape recorders, libraries, diaries, albums, televisions, maps or newspapers.*

—Chief Justice John Roberts Jr.,  
June 25, 2014 Supreme Court ruling that police need warrants to search cellphones of people under arrest



# The Universal Machine

- Are Turing Machines really as powerful as real computers?
  - Unlimited memory (infinite tape)
  - Speed / efficiency is irrelevant
  - Any type of data can be encoded in binary  
(numbers, text, pictures, sounds, movies, etc.)

# The Universal Machine

- All proposed models of computation have turned out to be exactly equivalent to one another:
  - Turing machines
  - Lambda calculus
  - Recursive functions
  - Post production systems
  - Random access machines
  - All programming languages (Python, Javascript, C, ...)
  - etc. etc.

# The Universal Machine

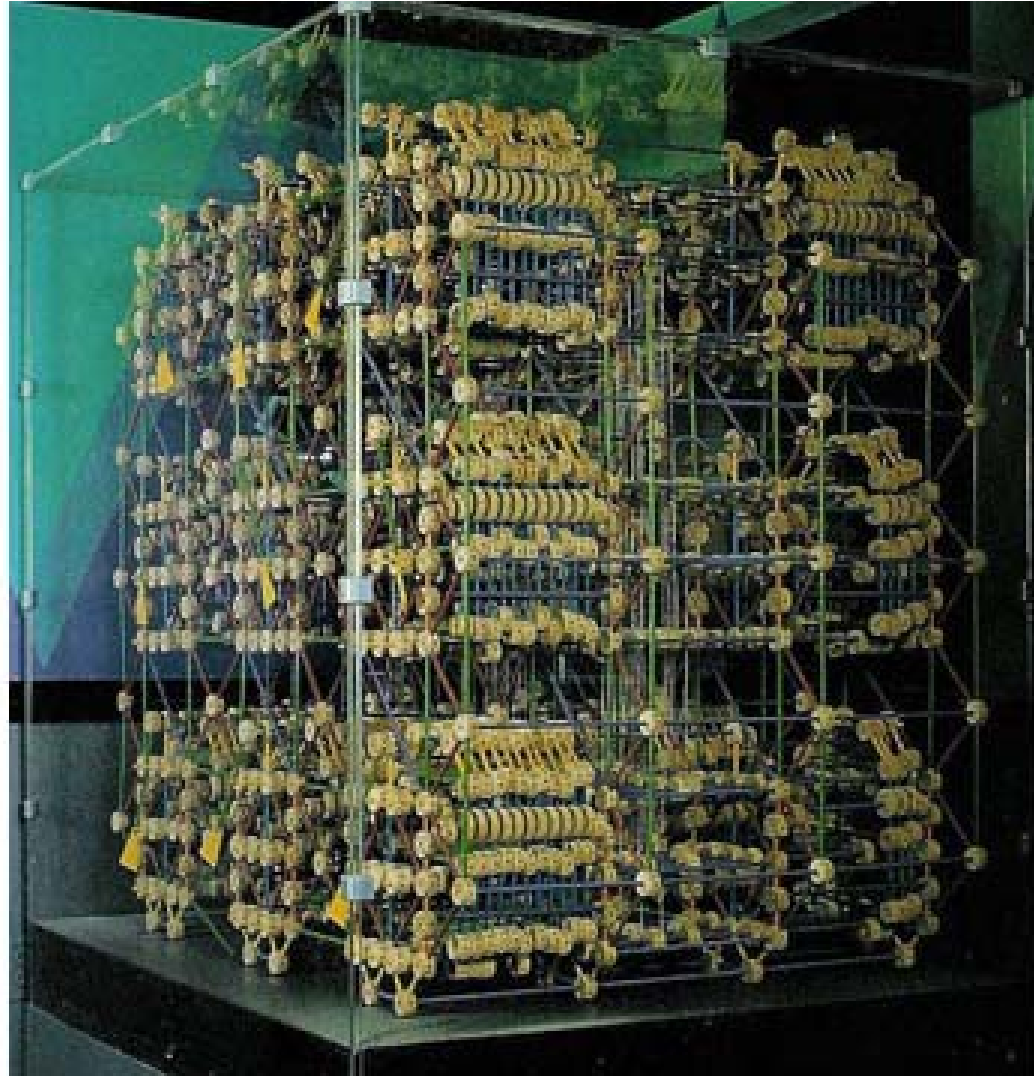
- **Church-Turing Thesis:**

Anything that is computable can be computed by a suitably programmed Turing machine

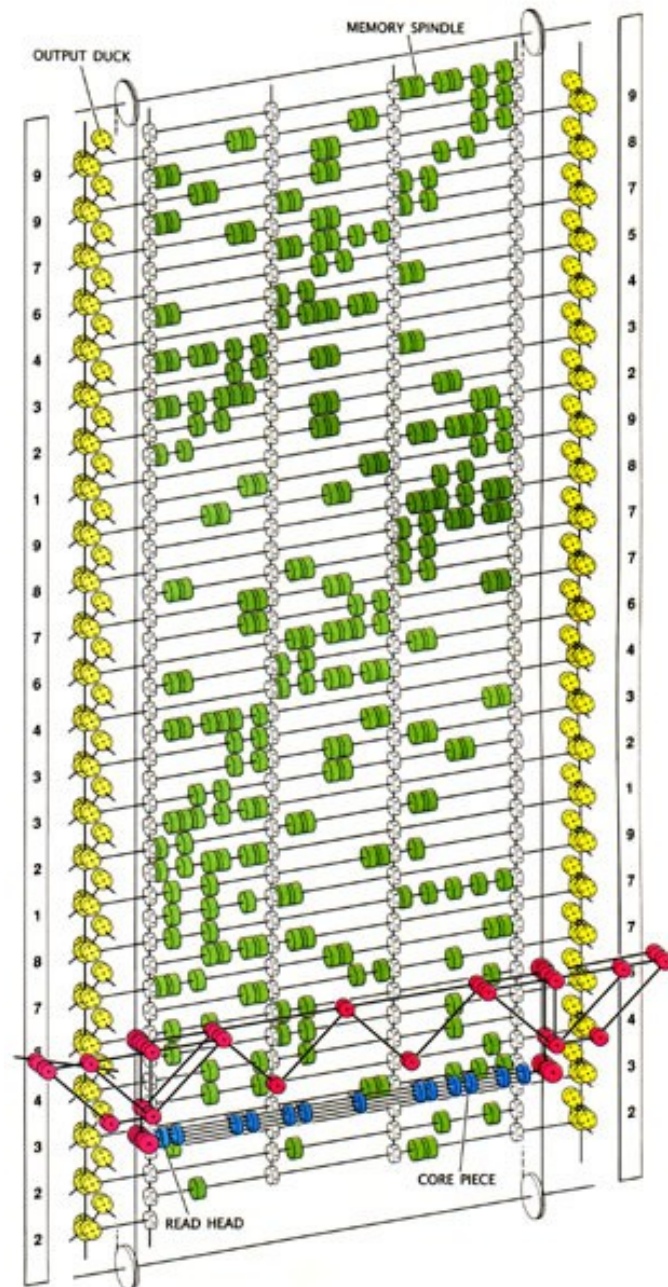
- Choice of **programming substrate** doesn't matter
- What matters is the organization and flow of **information**
- You can build a computer out of **Tinkertoys** if you like!



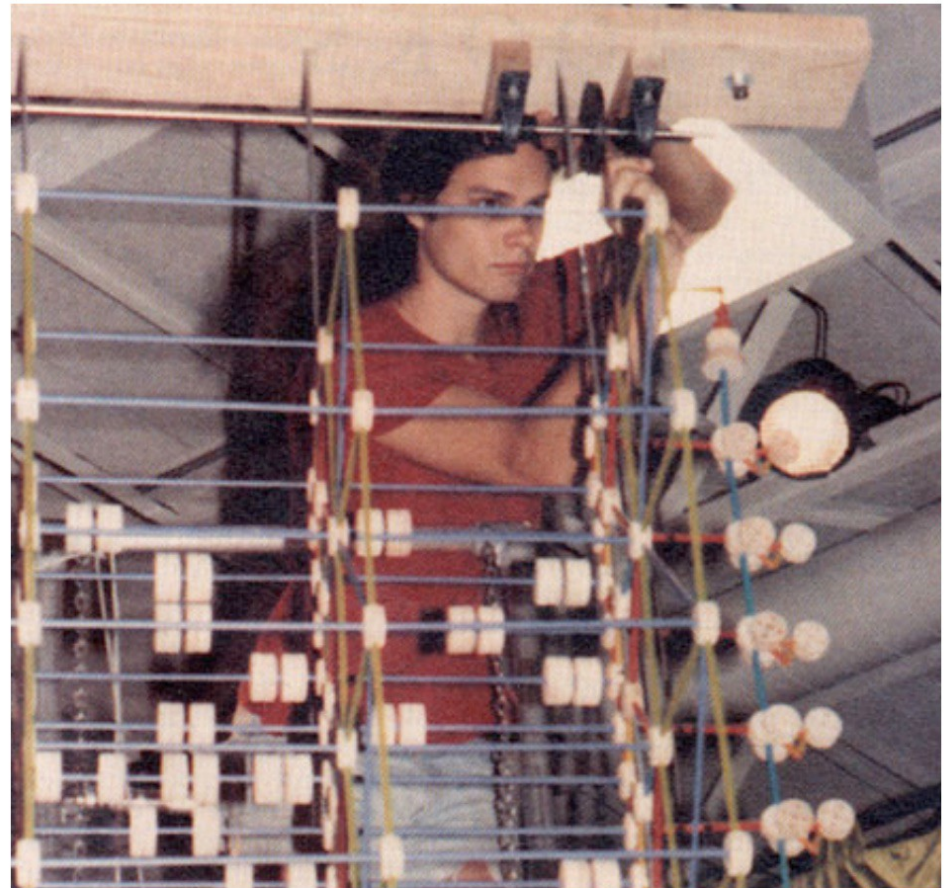
# Tinkertoy Computer for Playing Tic-Tac-Toe



# Tinkertoy Computer for Playing Tic-Tac-Toe



*The Tinkertoy computer: ready for a game of tic-tac-toe*



*Edward Hardebeck helps to assemble the Tinkertoy computer*

# The Limits of Computation

- Is there anything a TM **cannot** compute, in principle?
- YES! No TM can **infallibly** predict whether another TM will get stuck in an infinite loop when run on some input

- Example:

s1	0	0	R	s1
s1	1	1	L	s1
s1	—	—	*	halt

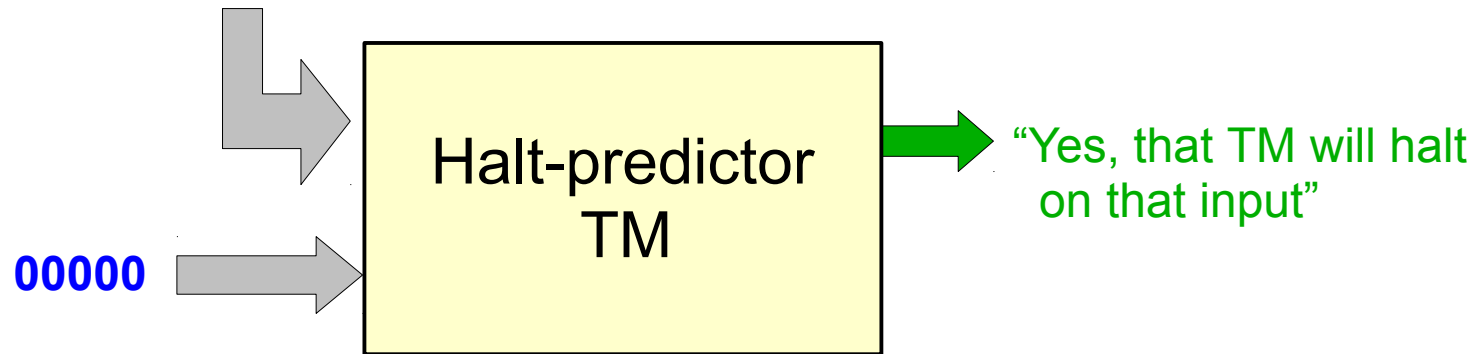
“Looper TM”

- Input: **00000**                      Result: halts after 5 steps
- Input: **000111**                      Result: never halts (infinite loop)

# The Halting Problem

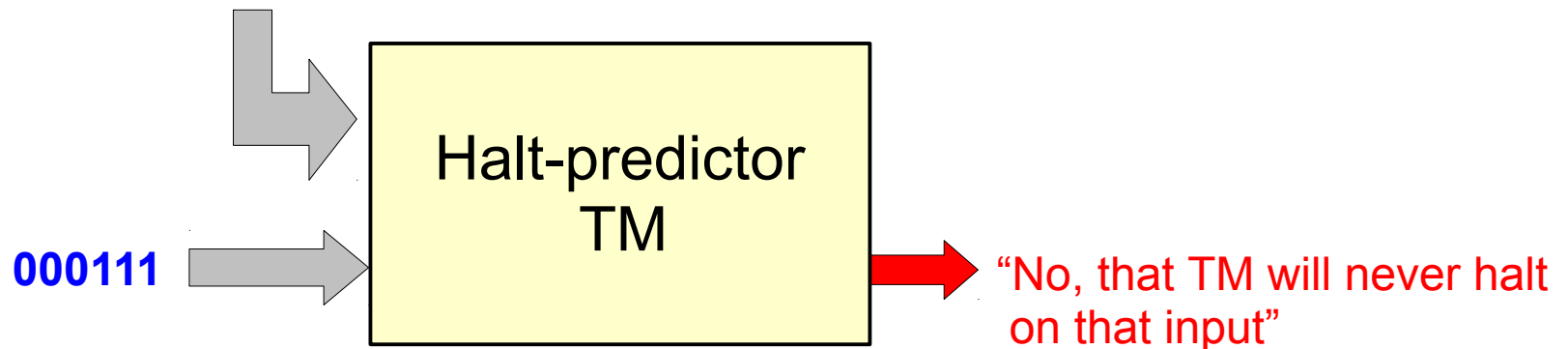
Coded description of “Looper” TM

11101010101011010010010010110100010001000100111

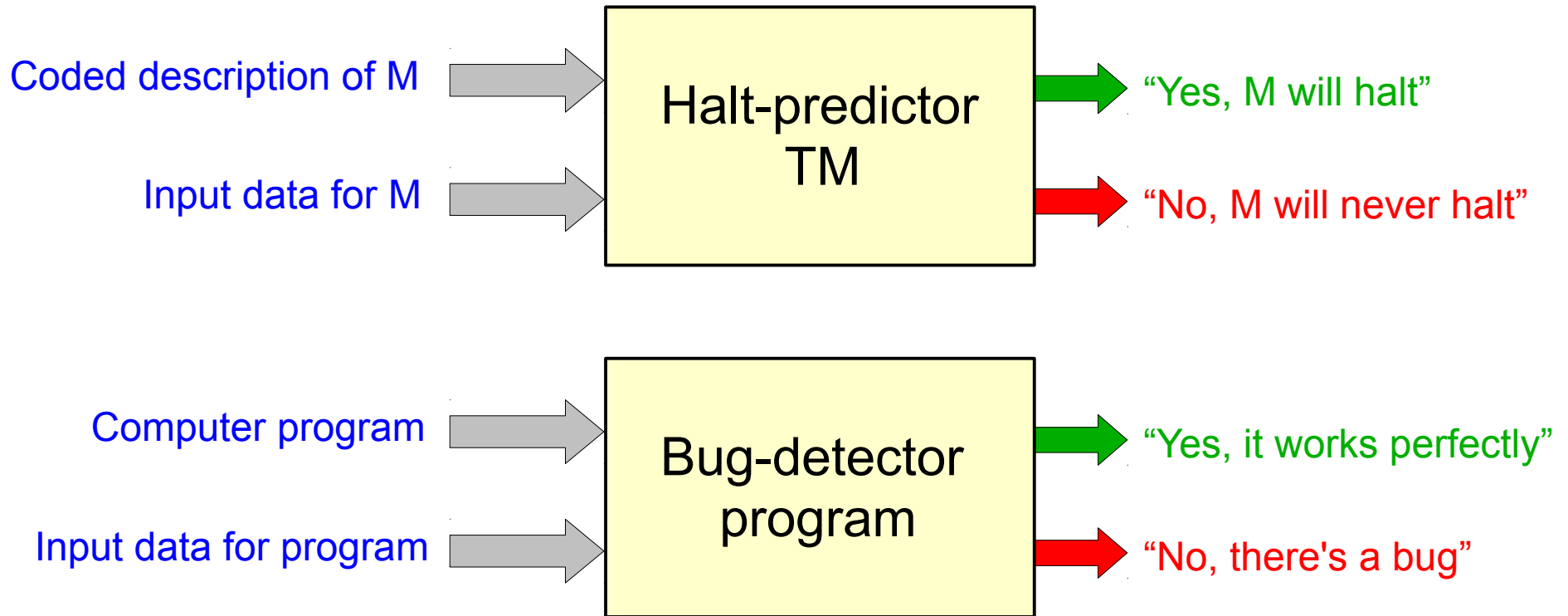


Coded description of “Looper” TM

11101010101011010010010010110100010001000100111



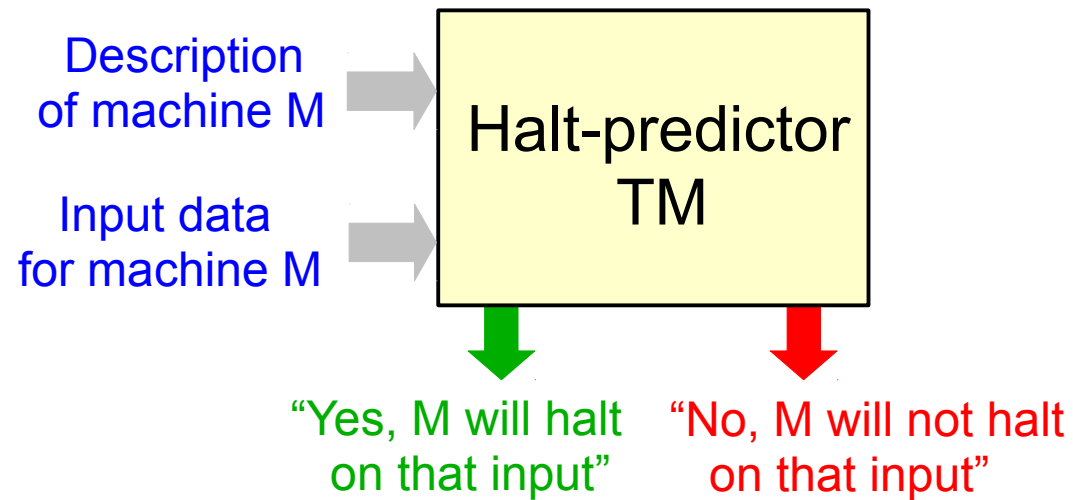
# The Halting Problem



- The task of deciding in advance if an arbitrary computation will ever terminate cannot be described computationally
- This was proven by Turing in his 1936 paper

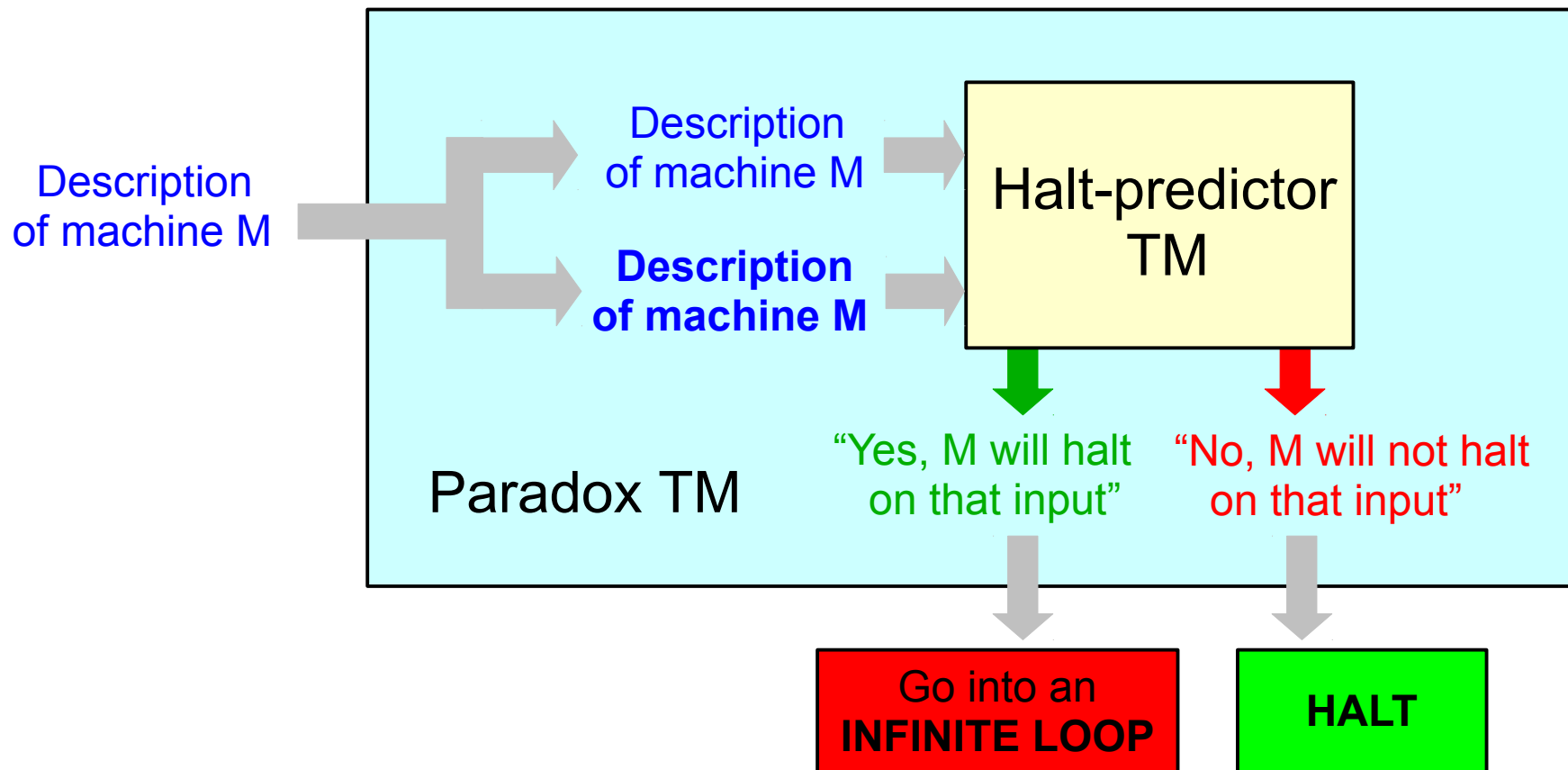
# Outline of Turing's Argument

(1) **Assume for now** that the Halt-predictor TM actually exists



# Outline of Turing's Argument

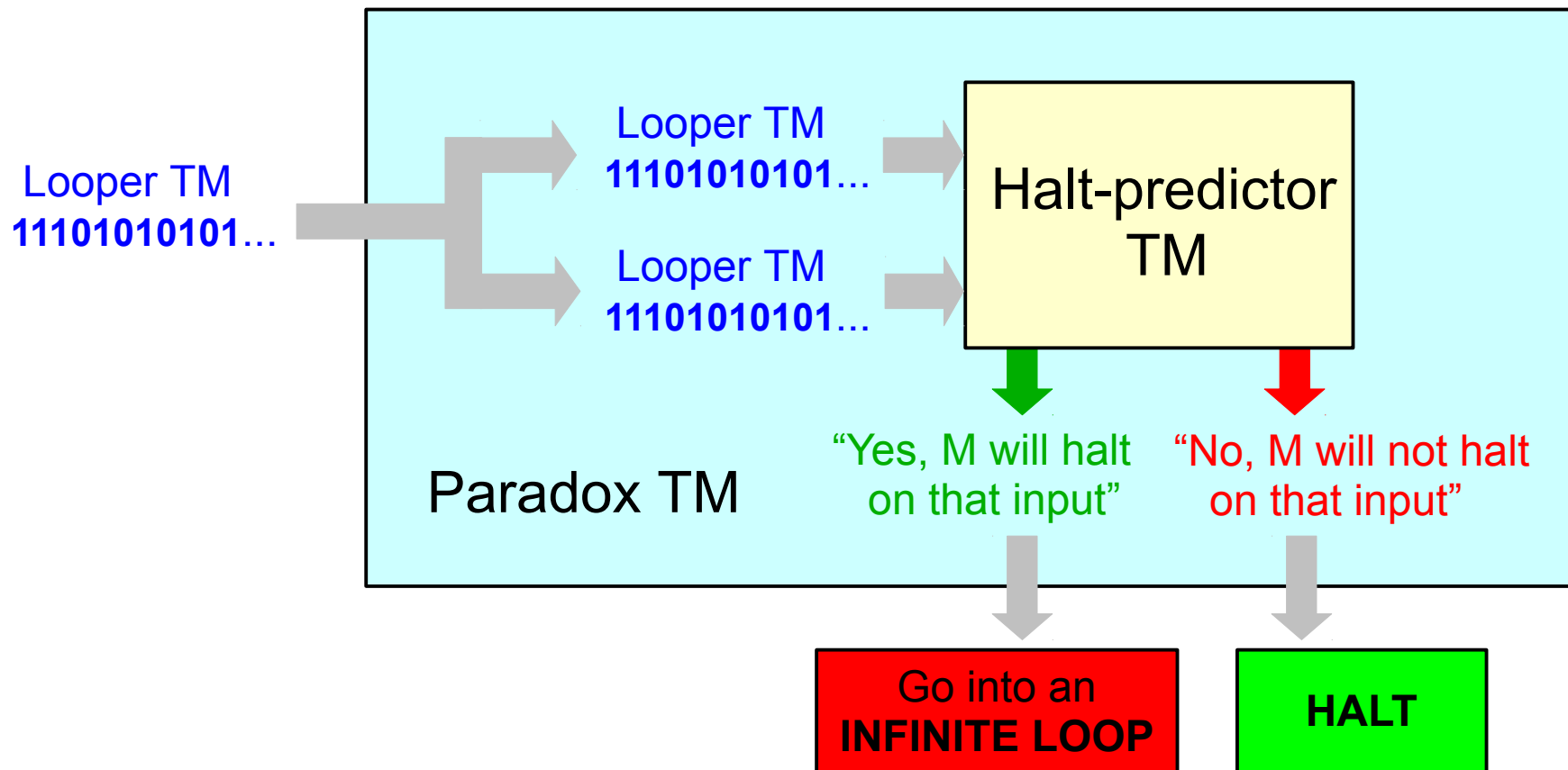
- (1) **Assume for now** that the Halt-predictor TM actually exists
- (2) **Construct** a new TM called **Paradox** that uses Halt-predictor



# Outline of Turing's Argument

- (1) **Assume for now** that the Halt-predictor TM actually exists
- (2) **Construct** a new TM called **Paradox** that uses Halt-predictor

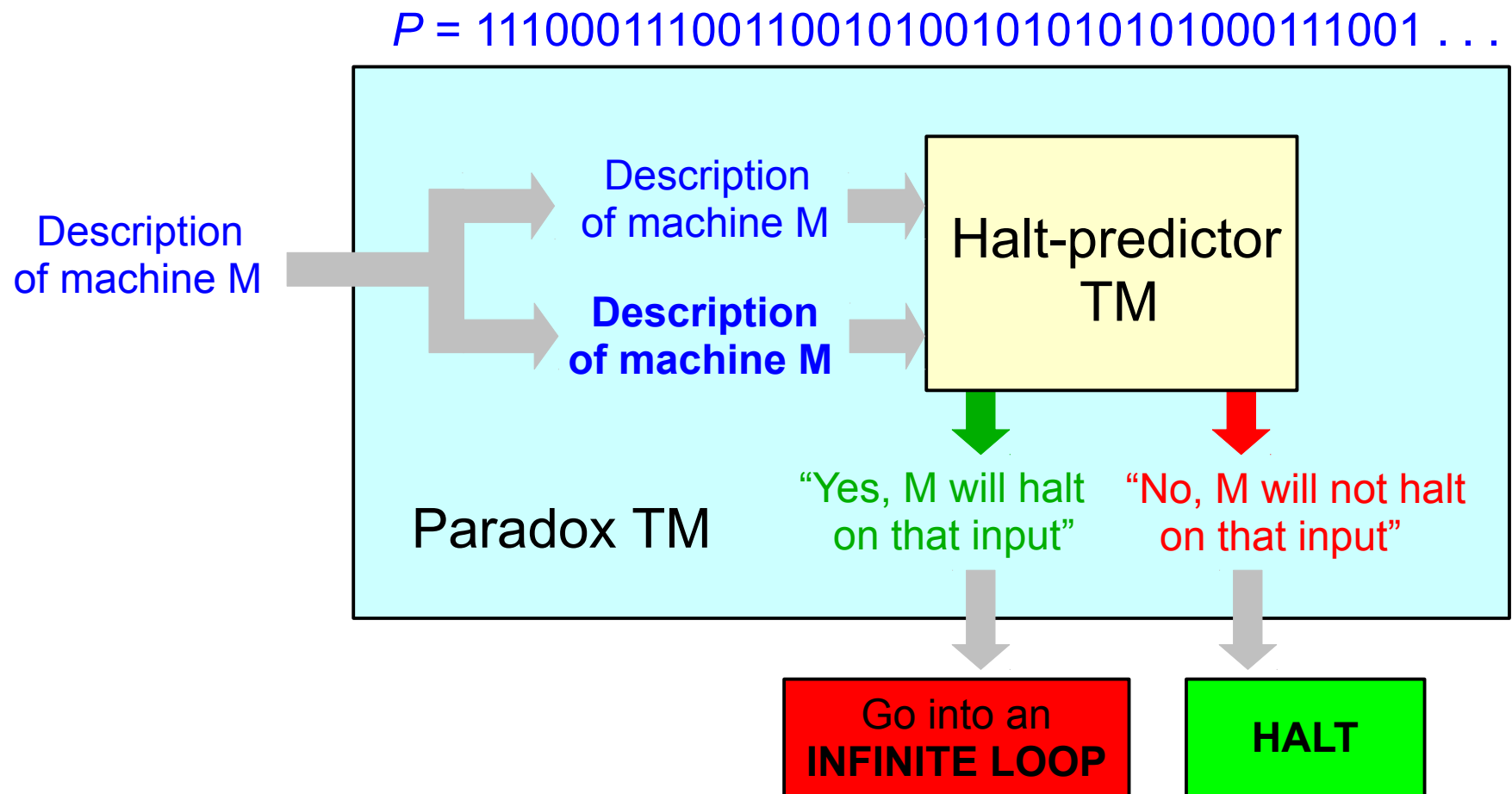
Example: we could feed Paradox the Looper TM description





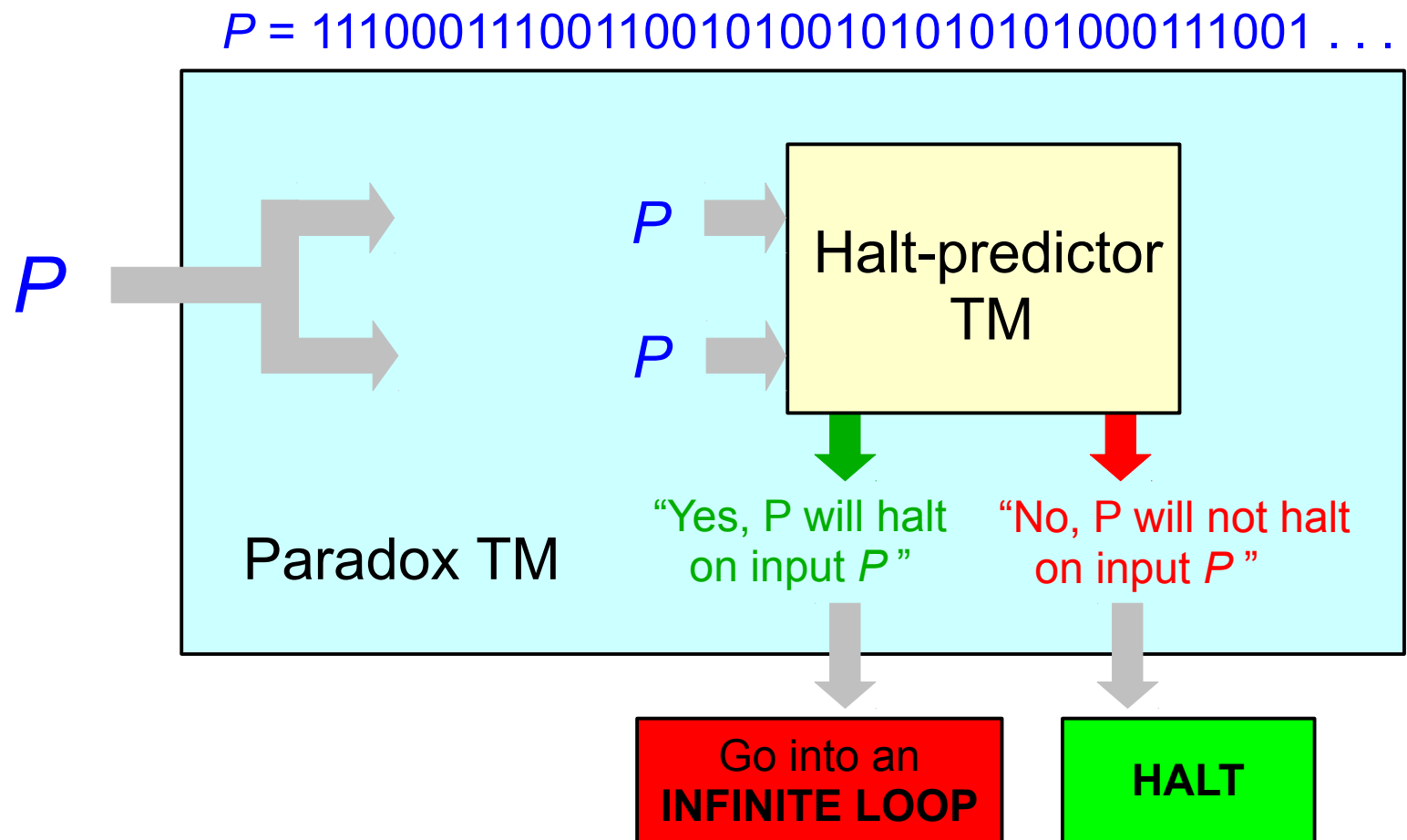
# Outline of Turing's Argument

(3) Write down the **binary description  $P$**  of the Paradox TM



# Outline of Turing's Argument

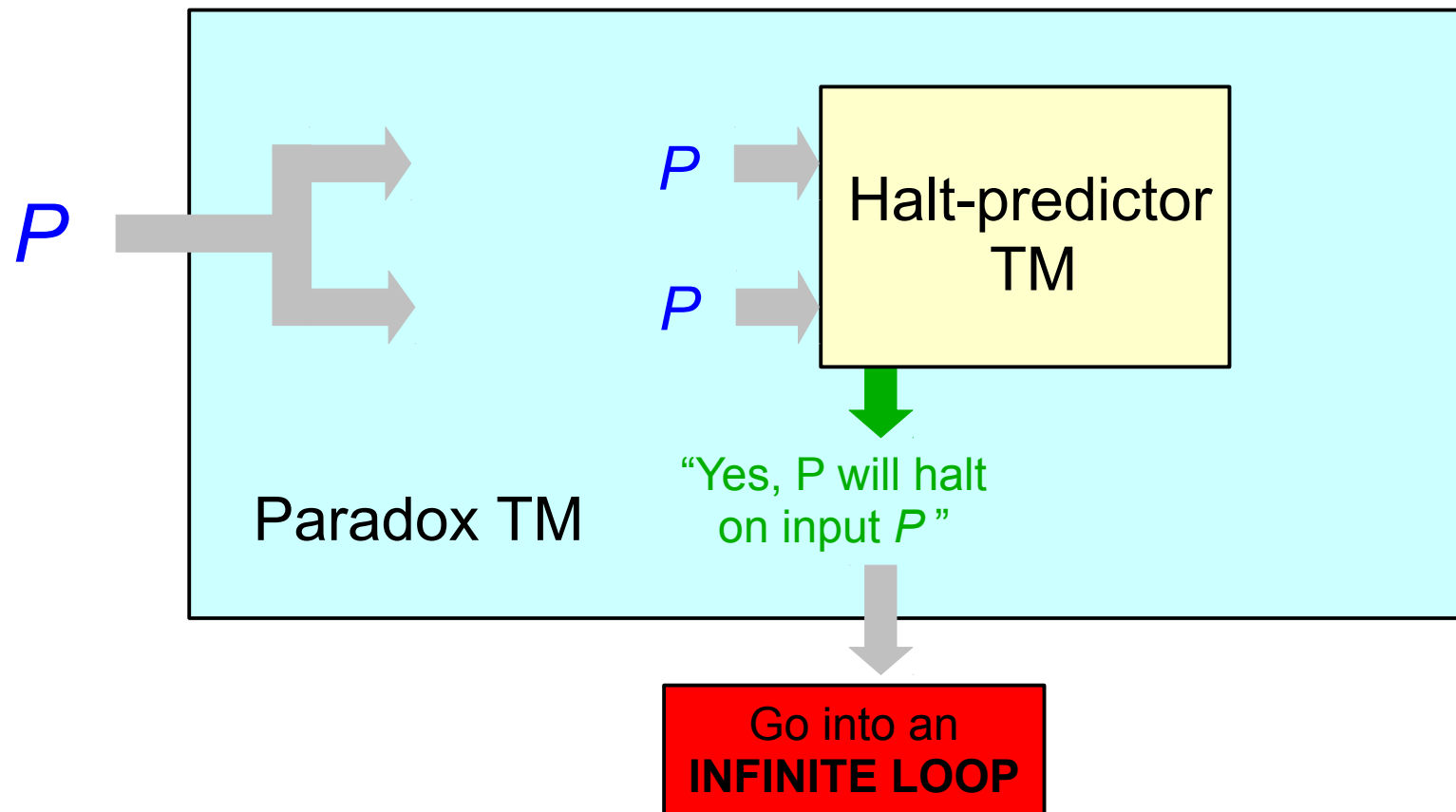
- (3) Write down the **binary description**  $P$  of the Paradox TM
- (4) Feed the description  $P$  to the Paradox TM itself



# Outline of Turing's Argument

If Halt-predictor says “Yes”, then **P never halts**

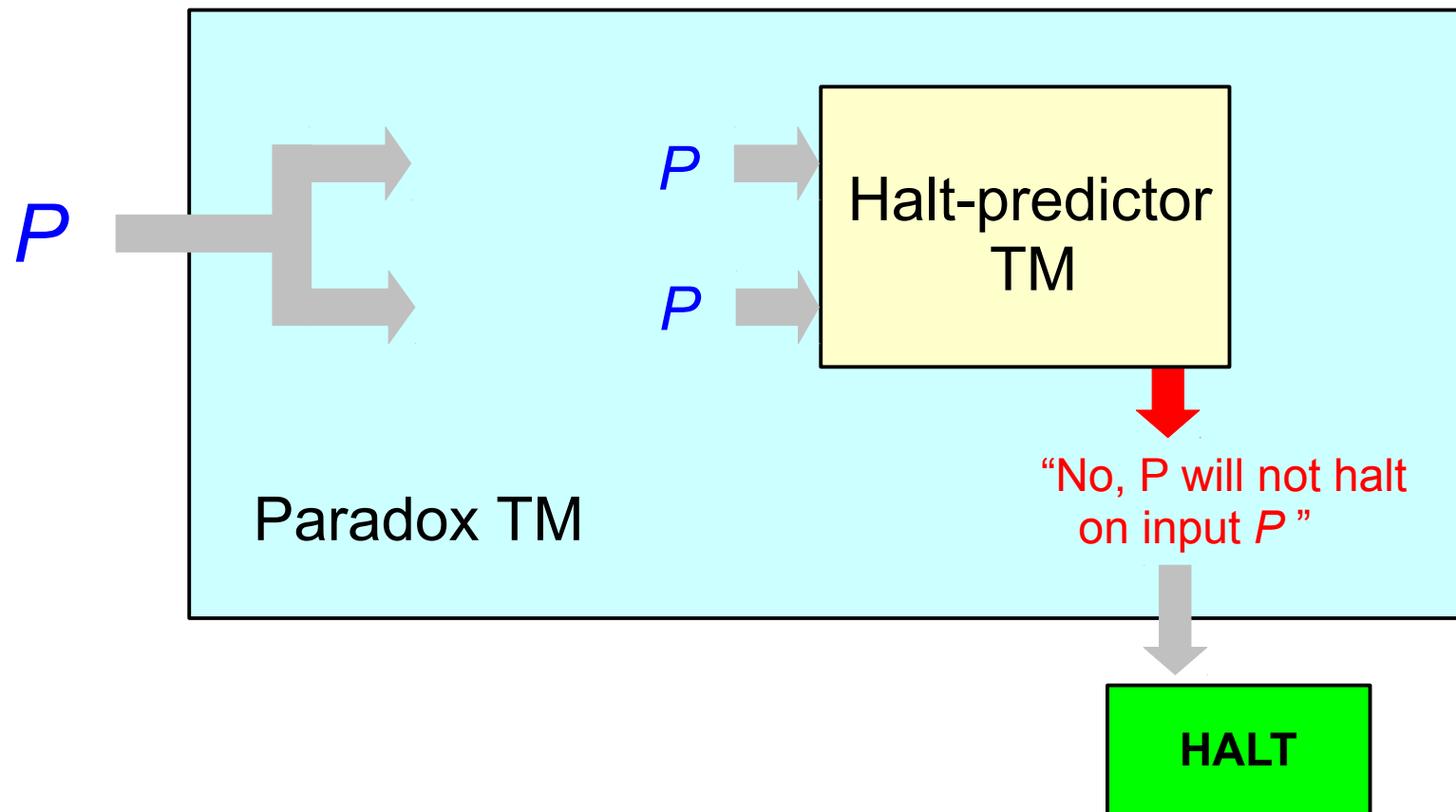
*This contradicts what Halt-predictor just said!*



# Outline of Turing's Argument

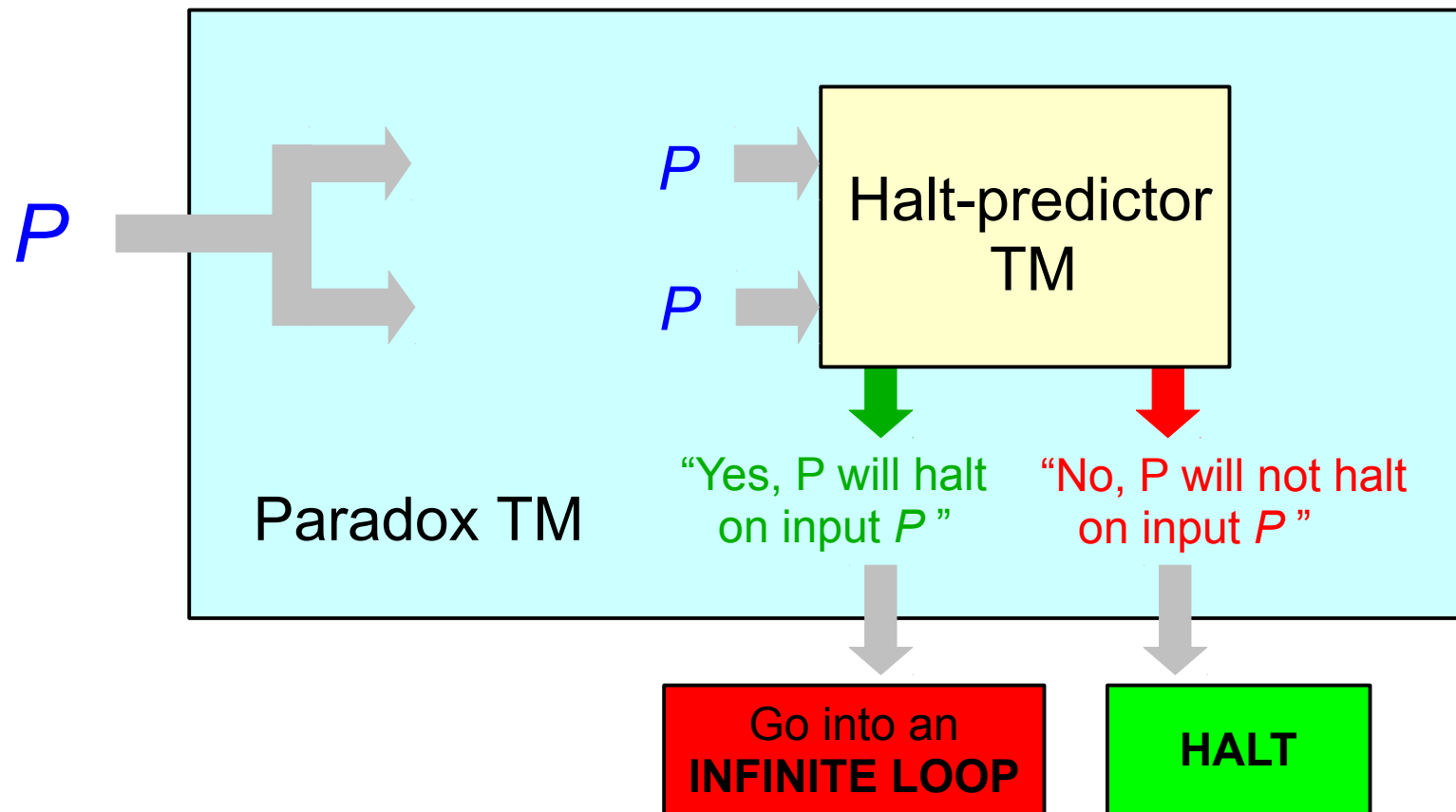
If Halt-predictor says “No”, then  $P$  **halts**

*This **contradicts** what Halt-predictor just said!*



# Outline of Turing's Argument

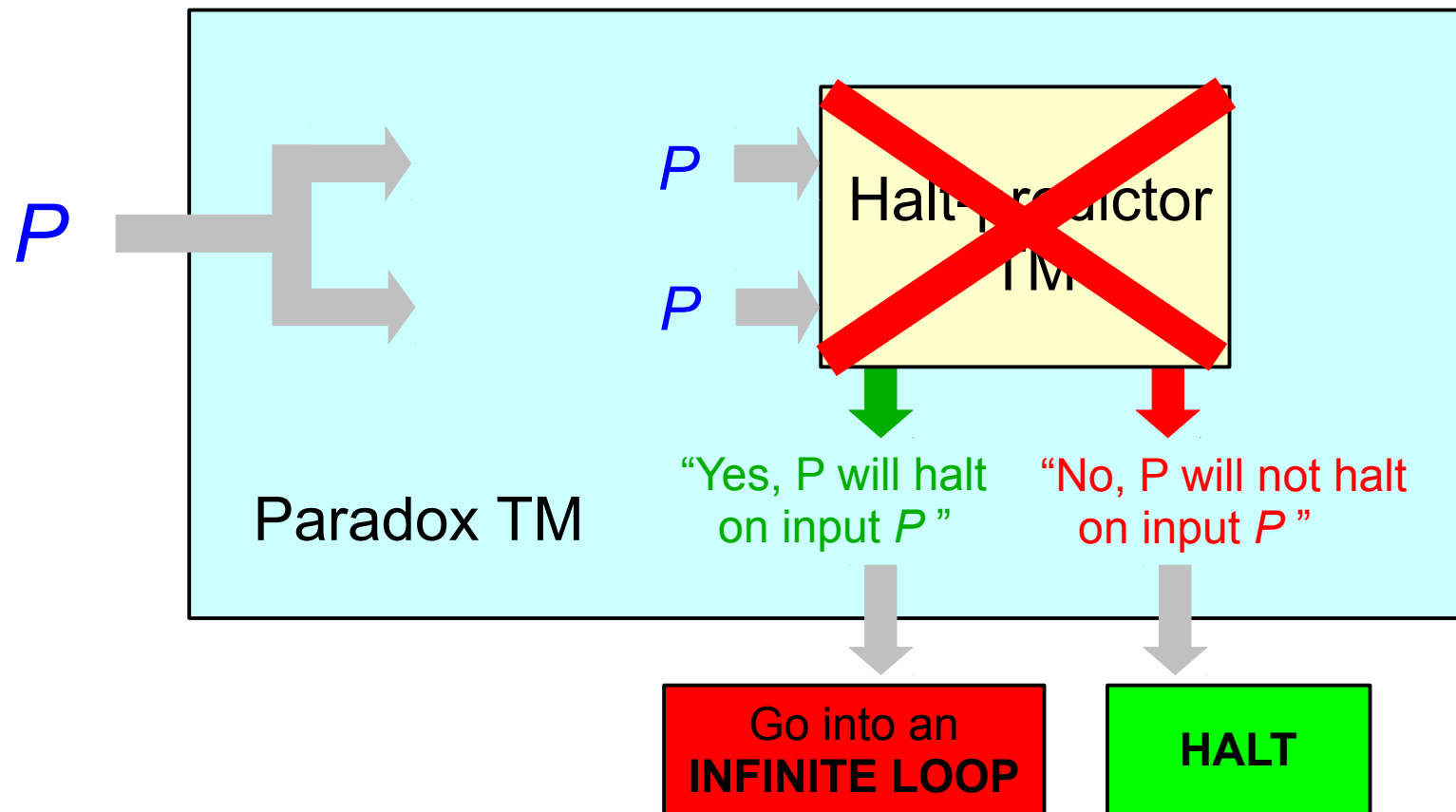
Either way, we get a **logical contradiction!**



# Outline of Turing's Argument

The only possible conclusion:

**The Halt-predictor TM cannot exist**



# Undecidable Problems

- The Halting Problem was the first **undecidable problem** to be discovered
- ... but certainly not the last
- The class of undecidable problems is **infinitely large**
- The study of undecidable problems constitutes an extremely rich area of **theoretical computer science**