

---

---

# Turing Machines

Robert Keller  
November 2008

# Mathematical Machines

---

---

- “Mathematical” (as opposed to mechanical) machines
  - Turing Machines (potentially infinite-state)
  - Finite-state machines
  - Other categories (cf. CS 81, 142)

# What is a Turing Machine?

---

---

- A computational model thought to be *universal* from the viewpoint of **functions** that can be computed
- Proposed by Alan M. Turing as a means of discussing such functions
- Universality generally accepted by computer scientists based on Turing's argument (see text) and other evidence

# Alan M. Turing (1912-1954)

---

---



# Turing Milestones

---

---

- 1936: Essay on computability
- 1940: Machine ("the Bombe") for decrypting the German *Enigma* code machine
- 1943: Participated in design and construction of an electronic computer (the "Colossus")
- 1949: First paper on proving correctness of programs
- 1950: Paper on AI ("the Turing test")
- 1951: Biological pattern formation ("morphogenesis")

# The Enigma (from [NSA museum](#))

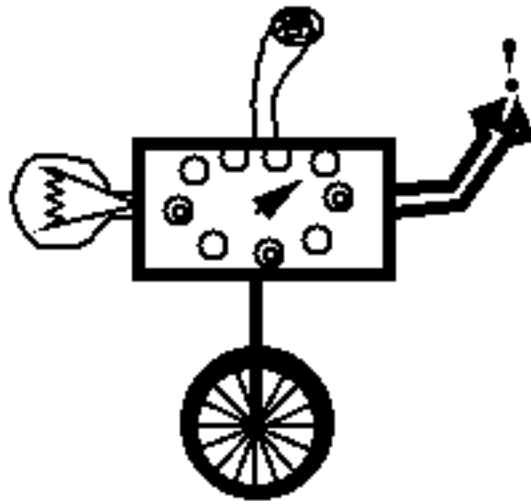


# Another Enigma?

---

---

C	S		6	0	
---	---	--	---	---	--



# Play about Turing

---

---

- "Breaking the Code" by Hugh Whitmore
- Played in London, New York, LA
- Public TV version



# Turing Machine Details

---

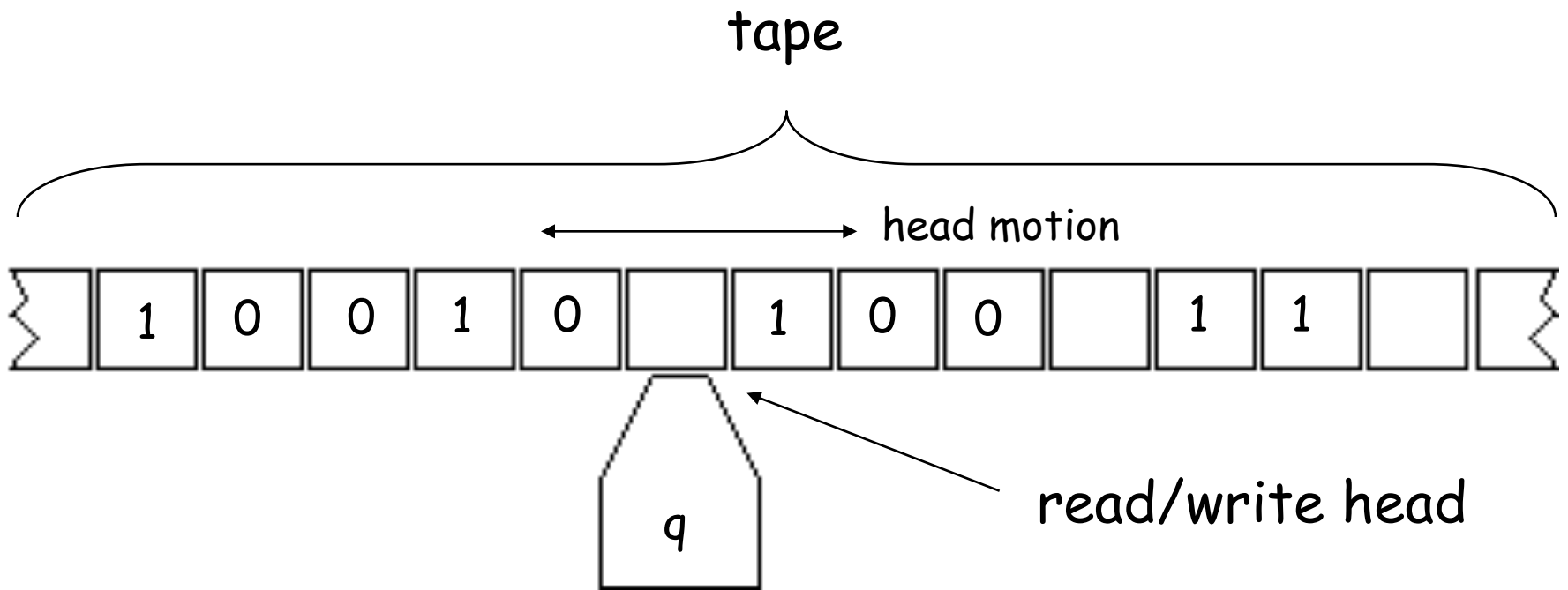
---

- The *tape*: an unbounded amount of memory. Consists of *cells*, each containing exactly one of a pre-convened set of characters (such as '0', '1', ' ' blank)
- The control: a finite amount of memory, the *control states*. Defines *control functions*.

# Turing Machine

---

---



control, in control state  $q$

# More about the Tape

---

---

- Only a finite portion of the tape is "non-blank" at any time.
- New cells are added at either end "as needed".

# More about Blank

---

---

- Blank counts as symbol.
- It may be regarded as 0, or it could be separate from 0.
- It all depends on the convention being used.

# The Complete State of a TM

---

---

- The complete state of a TM is determined by:
  - The control state
  - The symbol currently under the head
  - The sequence of symbols to the right of the head
  - The sequence of symbols to the left of the head

# Control Functions

---

---

- The control determines the following, given any combination of control state ( $q$ ) and symbol under the head ( $s$ ):
  - A new control state ( $q'$ )
  - A new symbol to be written ( $s'$ )
  - A head motion  $m$  (Left, Right, or None)
- Call the control partial-function  $f$ , so that
$$f(q, s) = (q', s', m)$$

# Caution:

## "state" is an overloaded term

---

---

- The **true state** of a TM is the combination of:
  - The control state
  - The tape to the left of the head
  - The tape under and to the right of the head.
- However, "state" is often used in referring to just the control state.
- The ambiguity is resolved by context.

# Sequential Operation

---

---

- The machine begins in a specified starting control state, with initial tape contents, and the head positioned at a standard place with respect to the contents.
- The machine goes through a sequence of states until it arrives at a halting state.

# Halting Convention

---

---

- If  $f(q, s)$  is unspecified, then the TM is said to have *halted* in the current state.

# 5-tuple notation

---

---

- The control partial-function  $f$ , so that

$$f(q, s) = (q', s', m)$$

is often written as a set of 5-tuples  
of the form:

$$(q, s, q', s', m)$$

# TM Simulator in Scheme

---

---

- Refer to file

# Various TM Categories

---

---

- **Transducer:** Starting with the initial tape contents, produce a new tape contents
- **Acceptor or Classifier:** Starting with the initial tape contents, halt in either an accepting state or a rejecting state
- **Generator:** Starting with an empty tape, generate the elements of some sequence on the tape.

# Examples of TM Categories

---

---

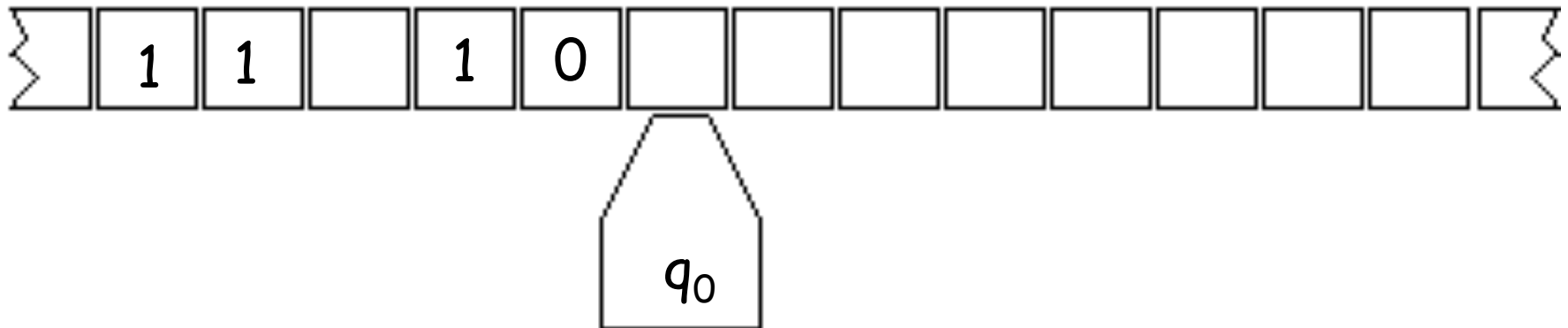
- **Transducer:** Multiply two binary numerals
- **Acceptor or Classifier:** Determine whether or not a binary numeral is prime
- **Generator:** Starting with an empty tape, generate numerals for the primes, each separated by a blank

# TM Multiplying Example

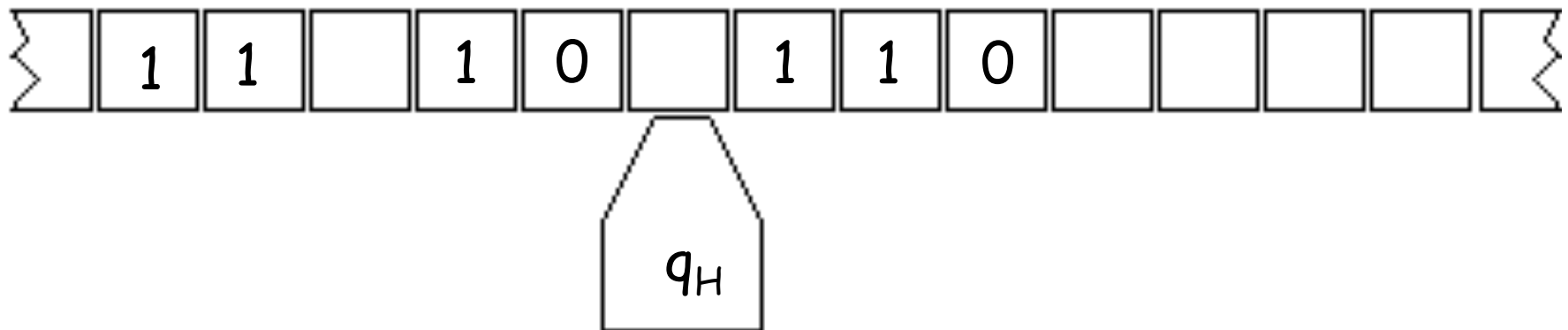
---

---

Initial



Final



# Simplifying TM Programming

---

---

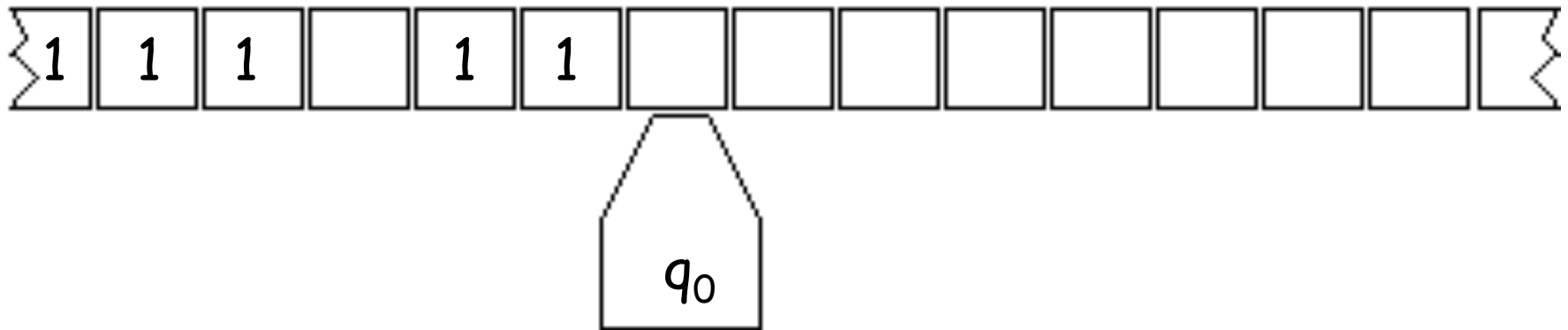
- Allow symbols to be erased
- Use extra symbols: can always convert to fewer symbols later (by encoding the larger set)
- Use symbols with/without **markers**: these in effect are just a larger symbol set
- Use special encodings, such as 1-adic encoding (number  $n$  is  $n$  1's)

# 1-adic Multiplying

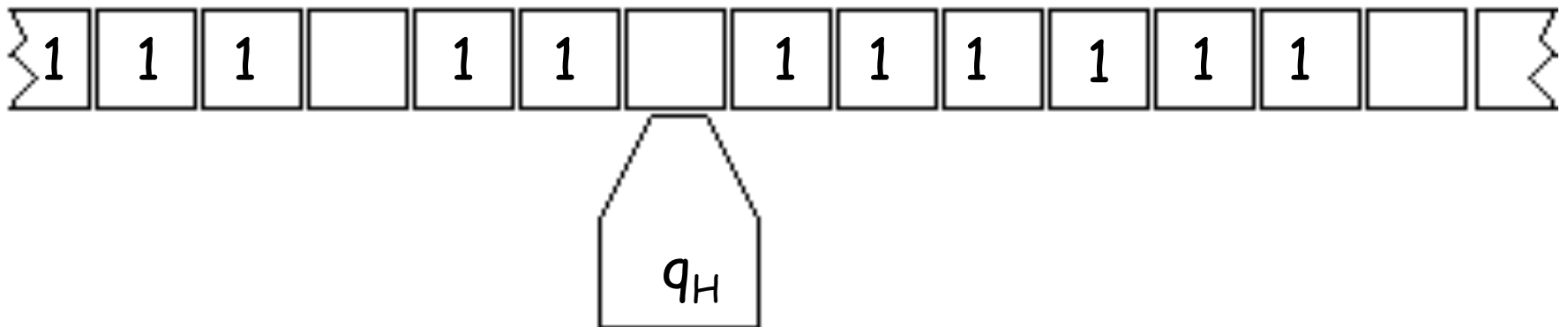
---

---

Initial



Final





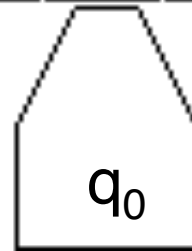
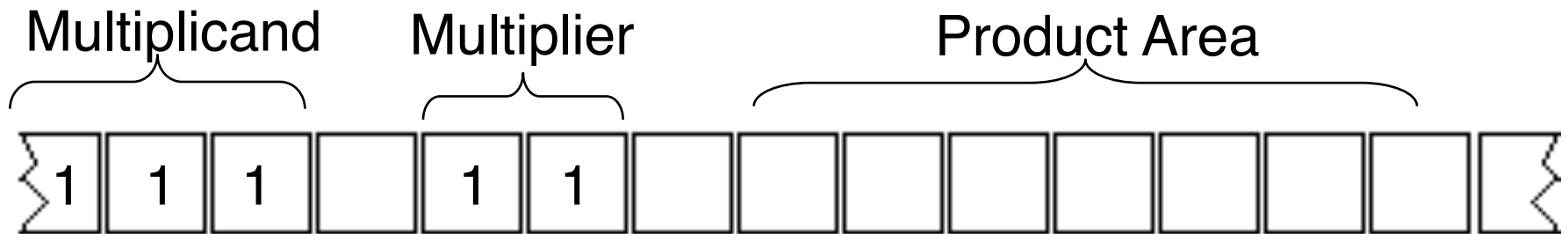
# 1-adic Multiplier Plan

---

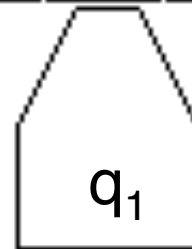
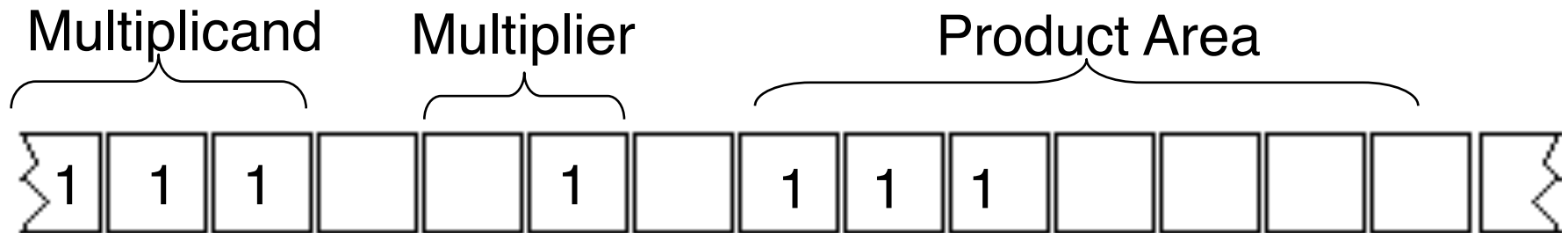
---

- Check whether the multiplicand is 0 (no 1's); if so, return to home position and halt.
- For each 1 in the multiplier:
  - Copy the multiplicand to the right of the accumulated product
  - Erase the leftmost 1 in the multiplier
- until all multiplier 1's have been erased
- Then restore the multiplier 1's and halt.

# 1-adic Multiplier In Operation

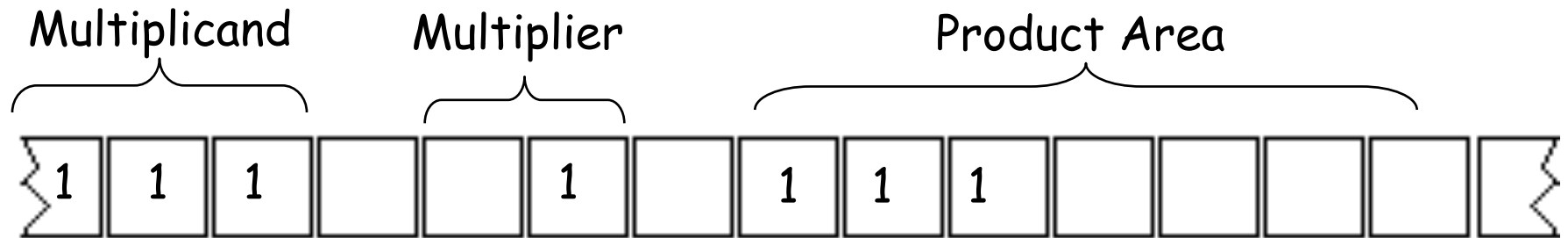


After first major cycle:

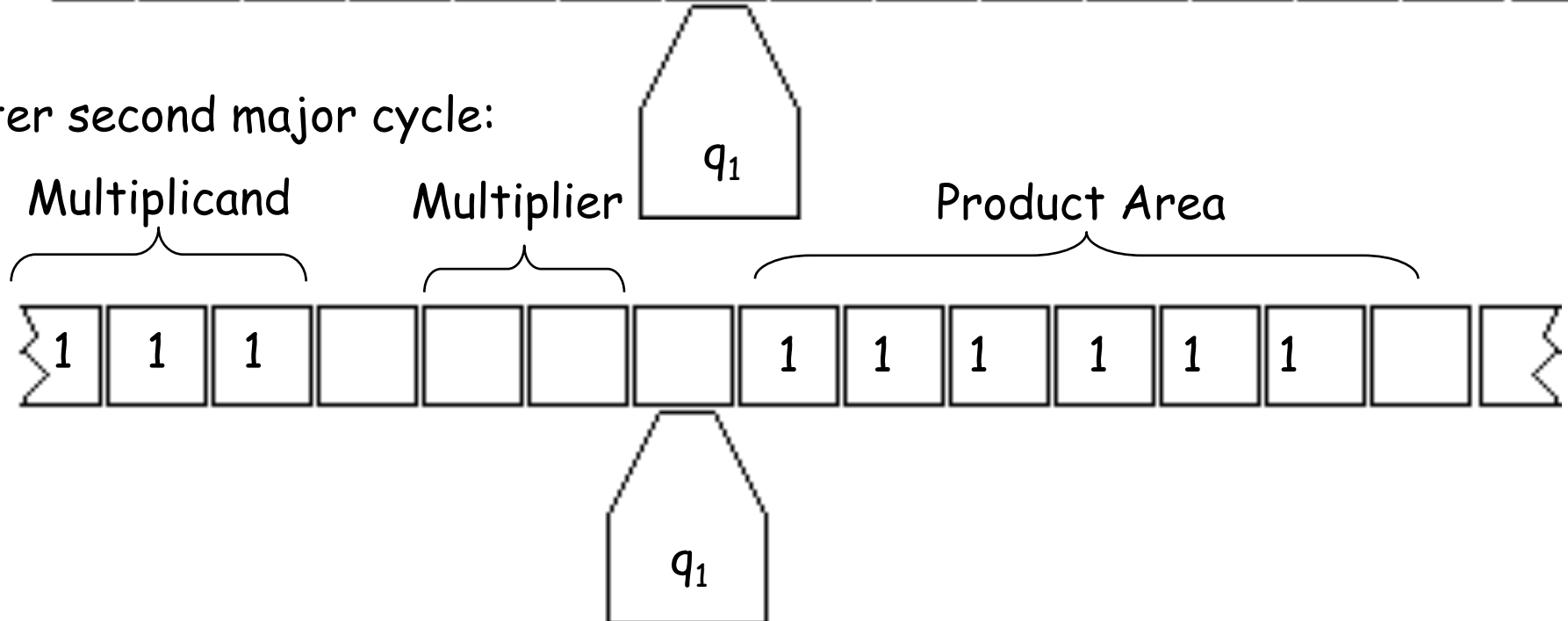


# 1-adic Multiplier In Operation

After first major cycle:



After second major cycle:



# How to tell when done?

---

---

- Each time the multiplicand is copied, the leftmost 1 of the multiplier will be set to blank (it will be restored at the end).
- Moving left from  $q_1$ , if there is a 1 then the multiplier has not been decimated.

# How to copy the multiplicand?

---

---

- This is tricky, because the multiplicand can be arbitrarily long; we cannot “count” arbitrarily-high in the control of the machine alone.
- During copying, make each 1 of the multiplicand into a 0. At the end of copying, turn all 0's back to 1's.
- The machine is done copying when there are no 1's left.

# Turing's Hypothesis

---

---

- Turing's Hypothesis is that for every computable function there is some Turing machine that computes it.
- Turing's argument was detailed and based on a direct appeal to intuition.

# Practical Use of Turing's Hypothesis

---

---

- If we can state an algorithm for doing something, there is a way to program a Turing machine to perform that algorithm.

# Impossibility of proving Turing's hypothesis

---

---

- In order to give a sound proof of the hypothesis, it would be necessary to characterize precisely what it means to be "computable".
- This would entail presenting another convincing notion of computability, which would have to be argued to Turing's original argument.
- Most computer scientists and mathematicians accept Turing's notion as the notion.

## Possibility of disproving Turing's hypothesis

---

---

- Disproof is possible, although not likely.
- A disproof would involve finding an example of a function that is clearly intuitively computable, then proving that no Turing machine can compute it.

# Turing's Hypothesis

---

---

- Many other notions of computability have been proposed, some more natural than others:
  - Partial recursive functions
  - General recursive functions
  - Lambda calculus
  - Markov algorithms
  - Uniform register machines
  - ...
- All such notions have been proved equivalent to Turing machines through appropriate encodings.

# Divergence

---

---

- A Turing machine is said to **diverge** on an input if it **never halts**.
- Divergence is like a program that never terminates, e.g. either due to an infinite loop or a search that can never yield an answer (but maybe we don't know that).
- If a machine diverges, the partial function it computes is **undefined** for this input.

# Examples of Divergence

---

---

- If a TM, starting on a given input, returns to a complete state a second time, then it will return to that state an infinite number of times, and thus diverge.
- If a TM "searches" for a number having a certain property, but there is no such number, then it will diverge.

# Example of Properties for which divergence is not known

---

---

Let  $P(n)$  be the property:

" $2n$  is expressible as the sum of two primes"

Is there an  $n > 1$  for which  $P(n)$  is false? It is not known at present (1 December 2008).

$P(n)$  is easily testable by a program.

It is similarly easy to construct a program that will determine an  $n$  for which  $P(n)$  is false, if there is such an  $n$ .

# Example of Properties for which divergence is not known

---

---

- The assertion that  $P(n)$  is true for all  $n > 1$ , i.e.

"Every even integer  $> 2$  is expressible as the sum of two primes"

is known as "Goldbach's Conjecture" (1742).

- Examples:  $4 = 2+2$   
 $6 = 3+3$   
 $8 = 3 + 5$   
...  
 $14 = 3 + 11$

- ...  
It has been checked for all  $n \leq 10^{18}$ .

# Encoding Turing Machines into a fixed alphabet

---

---

- Why do we want to encode?
  - For input to a Universal machine.
  - To prove interesting results.

# Encoding

---

---

- Every TM and its tapes can be encoded into the alphabet  $\{1, \_ \}$ .
- First the tapes.
  - Suppose the tape alphabet is  $\{b, a, c, d\}$ , where  $b$  plays the role of blank.
  - Encode each symbol as follows:
    - b as  $\_ \_ \_$
    - a as  $\_ 1$
    - c as  $\_ 1 1$
    - d as  $\_ 1 1 1$

# Encoded tape

---

---

- Suppose our tape is:

a c d a a b . . .

- Then the encoding is:

\_ 1 \_ 1 1 \_ 1 1 1 \_ 1 \_ 1 \_ \_ ...

# Encoding the Machine

---

---

- Encode the state as:  
\_1, \_11, \_111, \_1111, ... to whatever  
number of states we have.
- Encode the moves as:  
L is \_1  
R is \_1 1  
N is \_1 1 1

# Encoded tuples

---

---

- Suppose the 5-tuple is:  
( s1 a c L s2)

The encoding would be:

\_ 1 \_ 1 \_ 111 \_ 11 \_ 11

Encode a list of 5-tuples by concatenating their encodings.

# Interpretation of Encodings as Numerals

---

---

- For convenience, we can think of strings of  $_$  and  $1$  as numerals (representations of numbers).
- $0 = \_$
- $1 = 1$
- $2 = 1 \_$
- $3 = 1 1$
- etc.

# Default TM

---

---

- For an arbitrary number  $n$ , its numeral may or may not represent an encoded TM as described.
- For those  $n$  that do not, adopt the convention that they represent a special **default machine**, that does nothing.

# Default Tape

---

---

- Similarly, some numbers represent valid encoded tapes, while others do not.
- Consider the ones that do not to be encodings of the all-blank tape, by convention.

# Enumeration

---

---

- Because the strings over  $\{\_, 1\}$  can be enumerated in a natural order, as given by the numbers they encode, there is a Turing machine  $T_n$  for each number  $n$ , and a tape  $x_n$  for each  $n$  as well.

# Universal Turing Machine

---

---

- Consider a TM  $U$  constructed to operate on the encoding alphabet  $\{1, \_ \}$ . When this machine starts with its tape having an encoding of machine  $T_n$  and an encoding of some tape  $x_m$ , it **simulates** the moves on  $x_m$ , in the sense that
  - $U$  halts on  $\langle T_n, x_m \rangle$  (the encoding of  $T_n$  and  $x_m$ ) iff  $T_n$  halts on  $x_m$ .
- A universal TM can simulate any TM, including itself.

# Non-Computable Functions

---

---

- There are more partial functions, say, from the natural numbers to themselves, than there are Turing machines:
  - The infinite set of functions  $\mathbb{N} \rightarrow \mathbb{N}$  is *not* countable (can't be enumerated).
  - Even the set of functions  $\mathbb{N} \rightarrow \{0, 1\}$  is not countable (Cantor, 1891).
  - The infinite set of Turing machines *is* countable (can be enumerated).
  - So there are functions in  $\mathbb{N} \rightarrow \{0, 1\}$  that are not computable.

# Diagonalization

---

---

- We know that for each natural number  $n$ , there is a Turing machine  $T_n$  and a tape  $x_n$ .
- Conceptually create the following infinite array:
  - The rows correspond to  $T_0, T_1, T_2, \dots$
  - The columns correspond to  $x_0, x_1, x_2, \dots$
  - There is a 1 in row  $i$  column  $j$  iff  $T_i$  accepts  $x_j$ , otherwise there is a 0.
  - Consider the **diagonal** of this array. Flip the 1's and 0's. The corresponding sequence cannot be a row of the array. Hence, the flipped diagonal describes a function not computed by **any** Turing machine.

# The Divergence Problem

---

---

- Let  $T_0, T_1, T_2, \dots$  be an enumeration of all Turing machines.
- Similarly let  $x_0, x_1, x_2, \dots$  be an enumeration of all tapes.
- Define the partial function  $D$  as follows:

$$D(x_i) = \begin{cases} 1 & \text{if } T_i \text{ diverges on input } x_i \\ \text{diverges} & \text{if } T_i \text{ halts on } x_i \end{cases}$$

- ( $x_i$  encodes the natural number  $i$ , as described before.)

# The Divergence Problem

---

---

$$D(x_i) = \begin{cases} 1 & \text{if } T_i \text{ diverges on input } x_i \\ \text{diverges} & \text{if } T_i \text{ halts on } x_i \end{cases}$$

- Claim:  $D$  is not computable by any Turing machine (in the sense that  $D(i)$  is the result of the machine  $T_i$  on  $x_i$ ).
- Suppose instead that  $k$  is such that  $T_k$  computes  $D$ . Then

$$D(x_k) = \begin{cases} 1 & \text{if } T_k \text{ diverges on input } x_k \\ \text{diverges} & \text{if } T_k \text{ halts on } x_k \end{cases}$$

- Does this look ok so far?

# The Divergence Problem

---

---

- The thrust of the divergence problem is to state concretely a (partial) function that is not computable.
- It really is diagonalization expressed in a slightly different way.

# A Similar-Looking Problem

---

---

$$H(x_i) = \begin{cases} 1 & \text{if } T_i \text{ halts on input } x_i \\ \text{diverges} & \text{if } T_i \text{ diverges on } x_i \end{cases}$$

- Is this partial function computable?

# The Halting Problem

---

---

- The “Halting Problem” is that of devising a computable function that will tell whether or not (yes or no) Turing machine  $T_n$  halts on tape  $x_m$ , i.e. whether  $H$  is computable:

$$H(n, m) = \begin{cases} 1 & \text{if } T_n \text{ halts on } x_m \\ 0 & \text{otherwise} \end{cases}$$

- If the Halting Problem were solvable, so would the Divergence problem be. We say the Divergence Problem **reduces** to the Halting Problem.

# DP reduces to HP

---

---

- Simply note that:

$$D(i) = \begin{cases} 1 & \text{if } H(i, i) = 0 \text{ (i.e. } T_i \text{ fails to halt on } x_i\text{)} \\ \text{diverge} & \text{otherwise} \end{cases}$$

So if we could compute  $H$ , we could compute  $D$  by embedding a call to  $H$  with just a little more "glue logic":

Replicating the argument  $i$  of  $D$ .

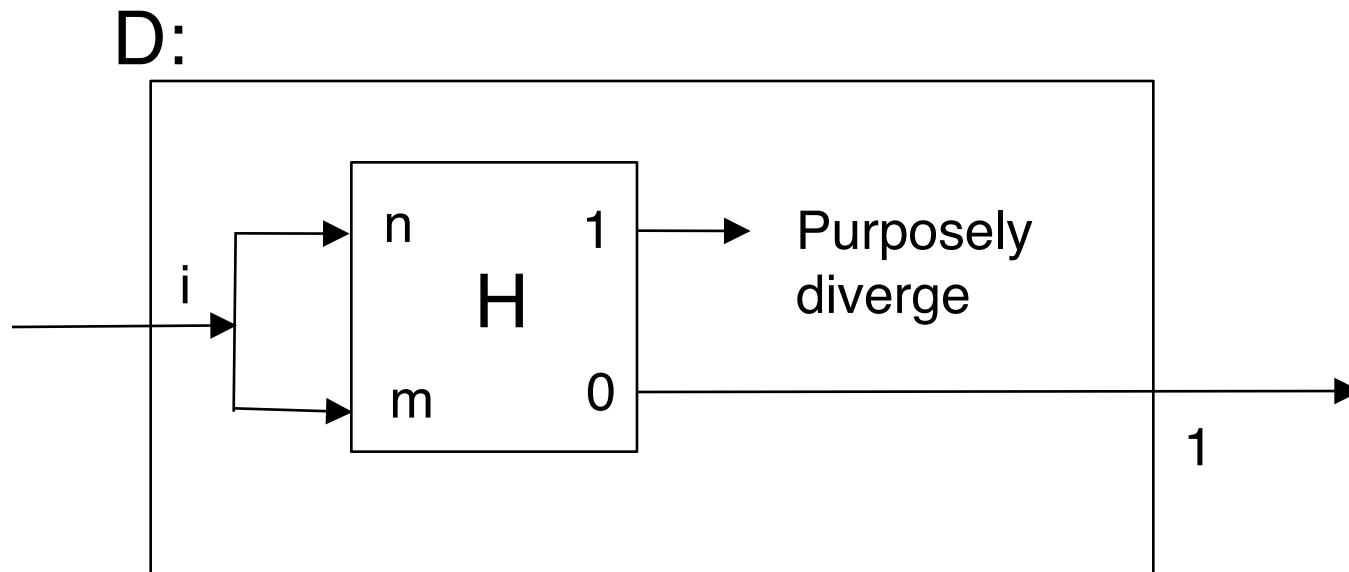
Checking whether the result of  $H(i, i)$  is 0.

# DP reduces to HP

---

---

- How to implement D, given H:



Since D can't really exist, H can't either.

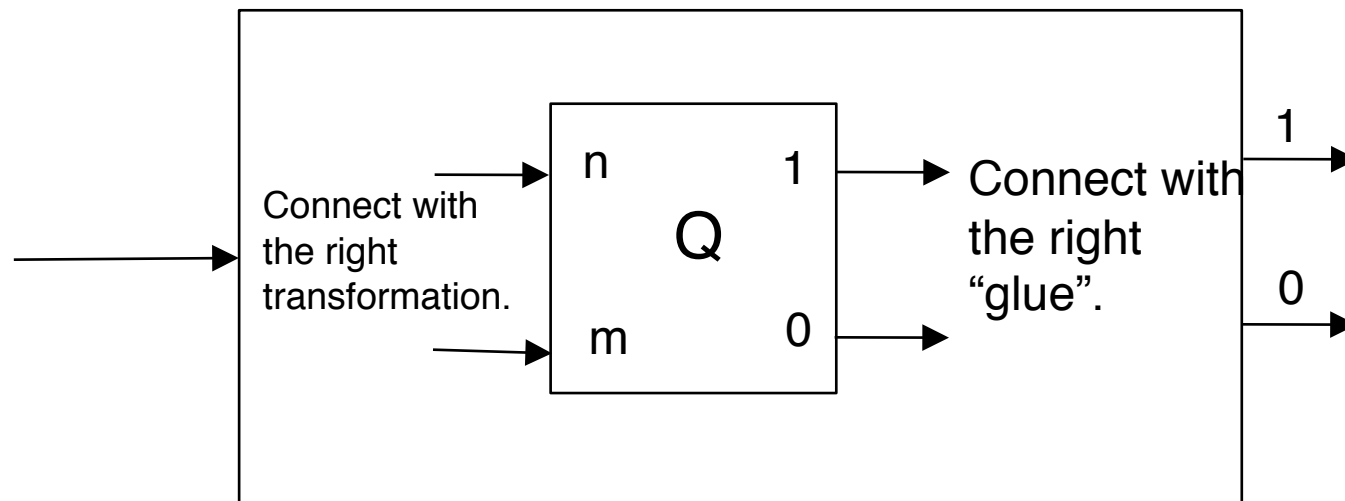
# A Template for Uncomputability Proofs

---

---

- The preceding diagrammatic reduction can be modified for a variety of similar proofs.

U: (Known to be uncomputable)



Q's computability is in question.

The transformation might not be obvious!

# The Blank-Tape Halting Problem (BT)

---

---

- What about the ostensibly-easier case of computing:

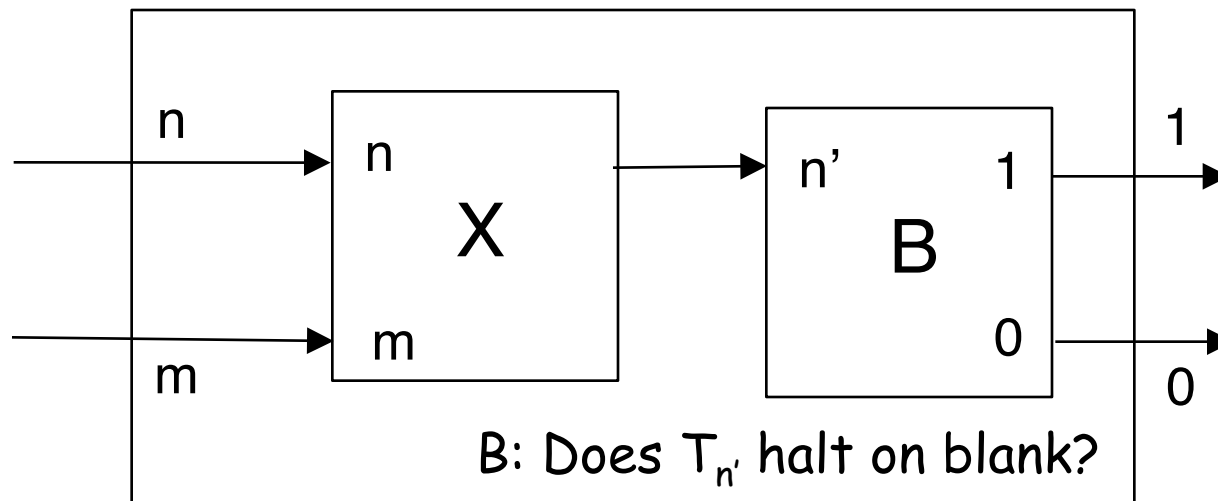
$$B(i) = \begin{cases} 1 & \text{if } T_i \text{ halts on a completely blank tape} \\ 0 & \text{otherwise} \end{cases}$$

Remember that the argument is an encoding of an arbitrary Turing machine. That encoding can be treated as data, to create an encoding of another machine, if desired.

# HP reduces to BT

- How to implement  $H$  (known uncomputable) given  $B$ :

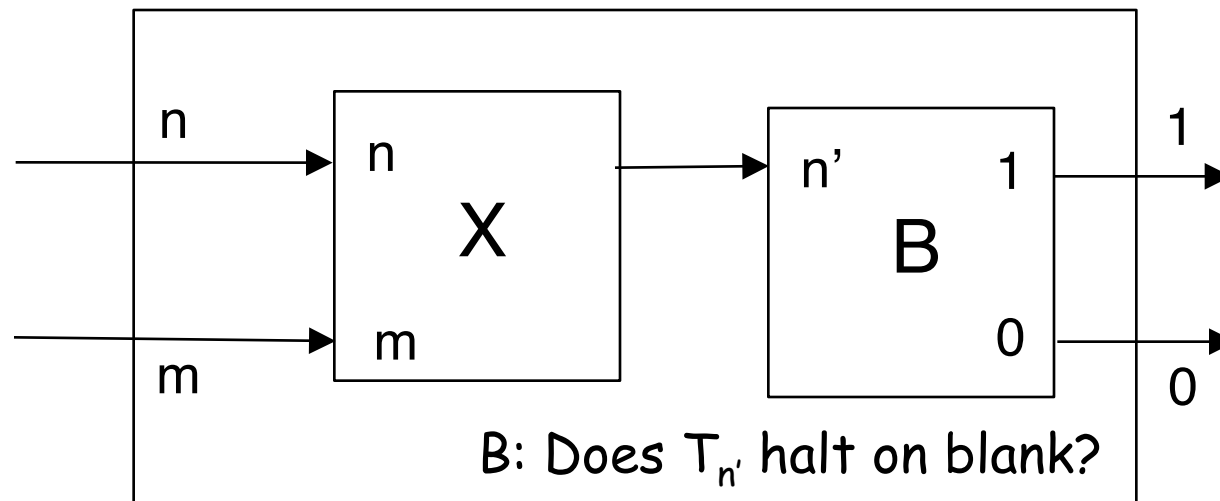
$H$ : Does  $T_n$  halt on  $x_m$ ?



What is  $X$ ?

# What is X?

- X: with input  $n$  and  $m$ , constructs a new machine  $n'$ :  $n'$  writes  $x_m$  on the tape, then behaves like  $T_n$ .
- Thus  $T_n$  halt on  $x_m$  iff  $T_{n'}$  halts on a blank tape.



$X$  adds to the tuples of  $T_n$  a prolog of tuples that writes  $x_m$ .

## Try this

---

---

- What about the still-easier case of computing:

$$S(i) = \begin{cases} 1 & \text{if } T_i \text{ halts on some tape} \\ 0 & \text{otherwise} \end{cases}$$

# Cautions

---

---

- The template might not apply to every uncomputable problem.
- The machines that are constructed by transformations  $X$  don't necessarily get run in the process.

# The arguments are not specific to Turing machines

---

---

- The same argument could be made for any universal programming language (Scheme, Java, ISCAL, ...).

# Turing Machine vs. Finite-State

---

---

- Discuss the best characterization of the **computing power** of a practical computer, such as a laptop, desktop, or pda:
  - Finite-State Machine
  - Turing Machine
  - Something else?

# Decidability

---

---

- A decision problem is one of devising an algorithm that will tell us "yes" or "no" for any given input.
- Thus a decision problem dichotomizes all possible inputs into one of two categories.

# Presentation of Languages

---

---

- We need a way of presenting languages, i.e. representing them finitely.
- DFAs and regular expressions provide a way, but are not very general.
- Turing machines acting as acceptors allow us to represent a much broader set of languages, the **computable** languages.

# Undecidability

---

---

- If it is provably-impossible to devise an algorithm for a decision problem, the problem is called undecidable.
- Decision problems can be cast as language-recognition problems, given an appropriate encoding of problem instances: They recognize members of the language for which a "yes" answer is given, and reject members for which a "no" is given.

# Functional Properties

---

---

- A property of (a machine accepting) a Turing-acceptable language is called "functional" if it only depends on the language itself, and not on the characteristics of the specific machine that accepts the language.

## Example of a Non-Functional Property

---

---

- Let  $P(n)$  be the property  $T_n$  halts within  $n$  steps when started on a blank tape.
- The language of all  $n$  for which  $P(n)$  is true is non-functional: Different machines computing the same language may have or not have the property.

# Trivial Properties

---

---

- A property  $P$  of languages is called "trivial" if either:
  - $P$  holds for all languages, or
  - $P$  holds for no language.

# Examples of Non-Trivial Properties of languages $L$

---

---

- $L$  is empty
- $L$  is all strings over the alphabet
- $L$  is regular
- $L$  is context-free

...

# Rice's Theorem

---

---

- The only decidable functional properties are the trivial ones.
- In other words, there is no algorithm that will decide of the properties of languages accepted by Turing machines, other than the two trivial properties.

# More Caution

---

---

- Consider a language  $L$  such as:

$$L = \begin{cases} \text{empty, if Goldbach's conjecture is true,} \\ \text{all strings in } \{0, 1\}^* \text{ otherwise.} \end{cases}$$

- $L$  is **decidable**, because  $L$  is one of two decidable sets. We just don't know which set (yet).
- (In fact,  $L$  is trivial in the sense of Rice's Theorem.)

# Proof of Rice's Theorem

---

---

- We'll first do the proof for a special case to make it more concrete, then observe that the method is completely general.
- Suppose we want to show the property of being **regular** is undecidable, i.e. there is no way to test whether an arbitrary Turing machine accepts a regular language.

# Proof of Rice

---

---

- We have to ask this question first:
  - Does the empty language have the property?
    - For the property of being regular, the answer is \_\_\_\_.
    - If so, let  $S$  be some Turing-acceptable language that does **not** have the property. For the question of regularity, we could let  $S$  be \_\_\_\_\_.

# Rice Proof, continued

---

---

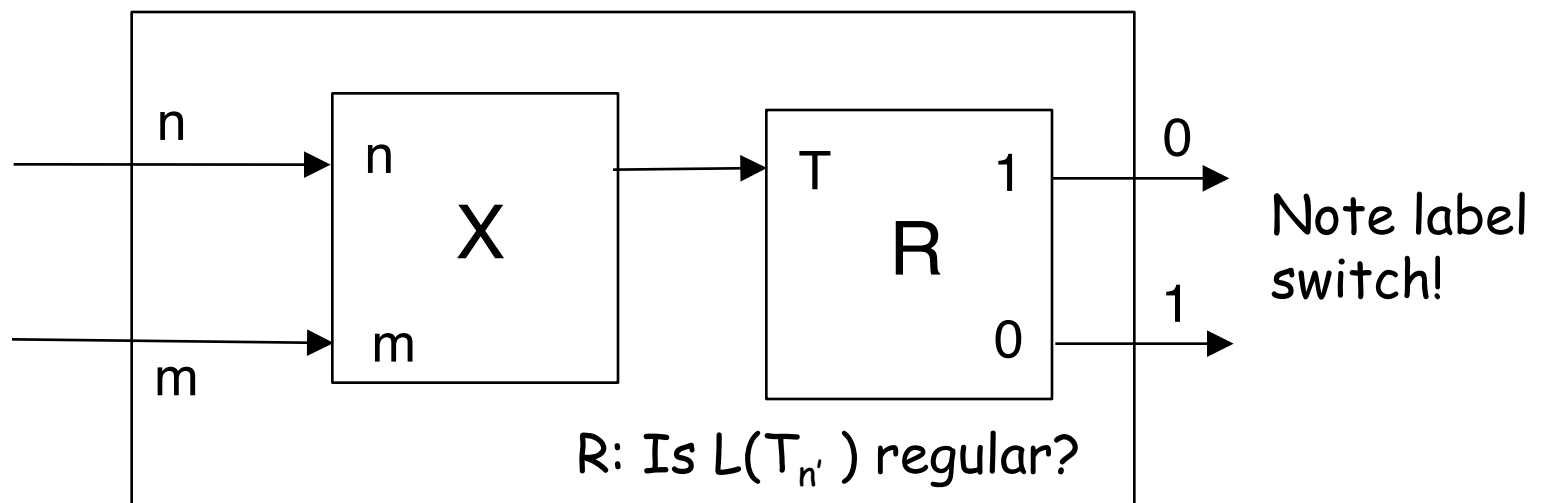
- Let  $Q$  be a Turing machine accepting  $S$ , the non-regular language.
- Now assume that we can determine whether the language of an arbitrary TM is regular. Let  $R$  be a machine that decides this.
- We'll bring our template back again, to construct an uncomputable function.

# Rice Template

---

---

Does  $T_n$  halt on  $x_m$ ?



What is  $X$ ?

X:

---

---

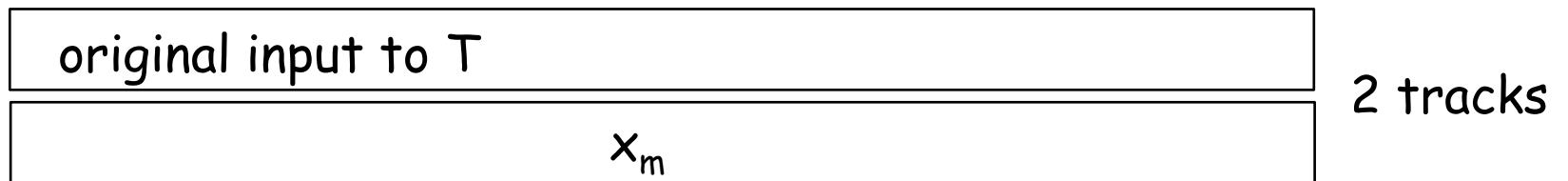
- With input  $n$  and  $m$ ,  $X$  constructs a Turing machine  $T$  that behaves as follows:
  - $T$  puts its original input aside (on a separate tape track for later recall).
  - $T$  then writes  $x_m$  on the main tape track and behaves as  $T_n$  on  $x_m$ .
    - **If this behavior halts**, then  $T$  next behaves as  $Q$  on the original tape of  $T$  that was set aside.
    - **If this behavior does not halt** (which can't be detected),  $T$  does not halt either.

# Picture of T in action

---

---

Tape:



Control:

Save input, write $x_m$ on main track	Behave as $T_n$ on $x_m$	Behave as Q on original input
---	-----------------------------	----------------------------------

T

---

---

- The language of T is exactly one of two things:
  - The language of Q, i.e. S, if  $T_n$  halts on  $x_m$ .
  - The empty language, if  $T_n$  does not halt on  $x_m$ .

T

---

---

- The language of T is one of two things:
  - S, i.e. **non-regular**,  
if  $T_n$  halts on  $x_m$ .
  - Empty, i.e. **regular**,  
if  $T_n$  does not halt on  $x_m$ .

# Rice Conclusion

---

---

- Once  $T$  is constructed, it is passed to  $R$ , the regularity tester.
- If  $R$  says that  $L(T)$  is regular (which is equivalent to  $L(T)$  being empty), it is essentially saying that  $T_n$  does not halt on  $x_m$ .
- If  $R$  says that  $L(T)$  is **not** regular (which is equivalent to  $L(T)$  being  $S$ ), it is saying that  $T_n$  halts on  $x_m$ .
- So if  $R$  exists, we could use it to construct a halt-checker.
- Thus  $R$  cannot exist.

# The General Case

---

---

- We worked with the property of being **regular**. What about other properties?
- For any property, we must first ask whether the **empty language** has the property or not.
- If it does, we proceed exactly as before, with  $S$  being a computable language **not** having the property.
- If it does not, we let  $S$  be a language **having** the property. In this case, we **don't switch the labels** on the outer box in the template.