

# Undecidability

Everything is an Integer  
Countable and Uncountable Sets  
Turing Machines  
Recursive and Recursively  
Enumerable Languages

# Integers, Strings, and Other Things

- Data types have become very important as a programming tool.
- But at another level, there is only one type, which you may think of as integers or strings.
- **Key point:** Strings that are programs are just another way to think about the same one data type.

# Example: Text

- Strings of ASCII or Unicode characters can be thought of as binary strings, with 8 or 16 bits/character.
- Binary strings can be thought of as integers.
- It makes sense to talk about “the  $i$ -th string.”

# Binary Strings to Integers

- There's a small glitch:
  - If you think simply of binary integers, then strings like 101, 0101, 00101,... all appear to be "the fifth string."
- Fix by prepending a "1" to the string before converting to an integer.
  - Thus, 101, 0101, and 00101 are the 13<sup>th</sup>, 21<sup>st</sup>, and 37<sup>th</sup> strings, respectively.

# Example: Images

- Represent an image in (say) GIF.
- The GIF file is an ASCII string.
- Convert string to binary.
- Convert binary string to integer.
- Now we have a notion of “the  $i$ -th image.”

# Example: Proofs

- A formal proof is a sequence of logical expressions, each of which follows from the ones before it.
- Encode mathematical expressions of any kind in Unicode.
- Convert expression to a binary string and then an integer.

# Proofs – (2)

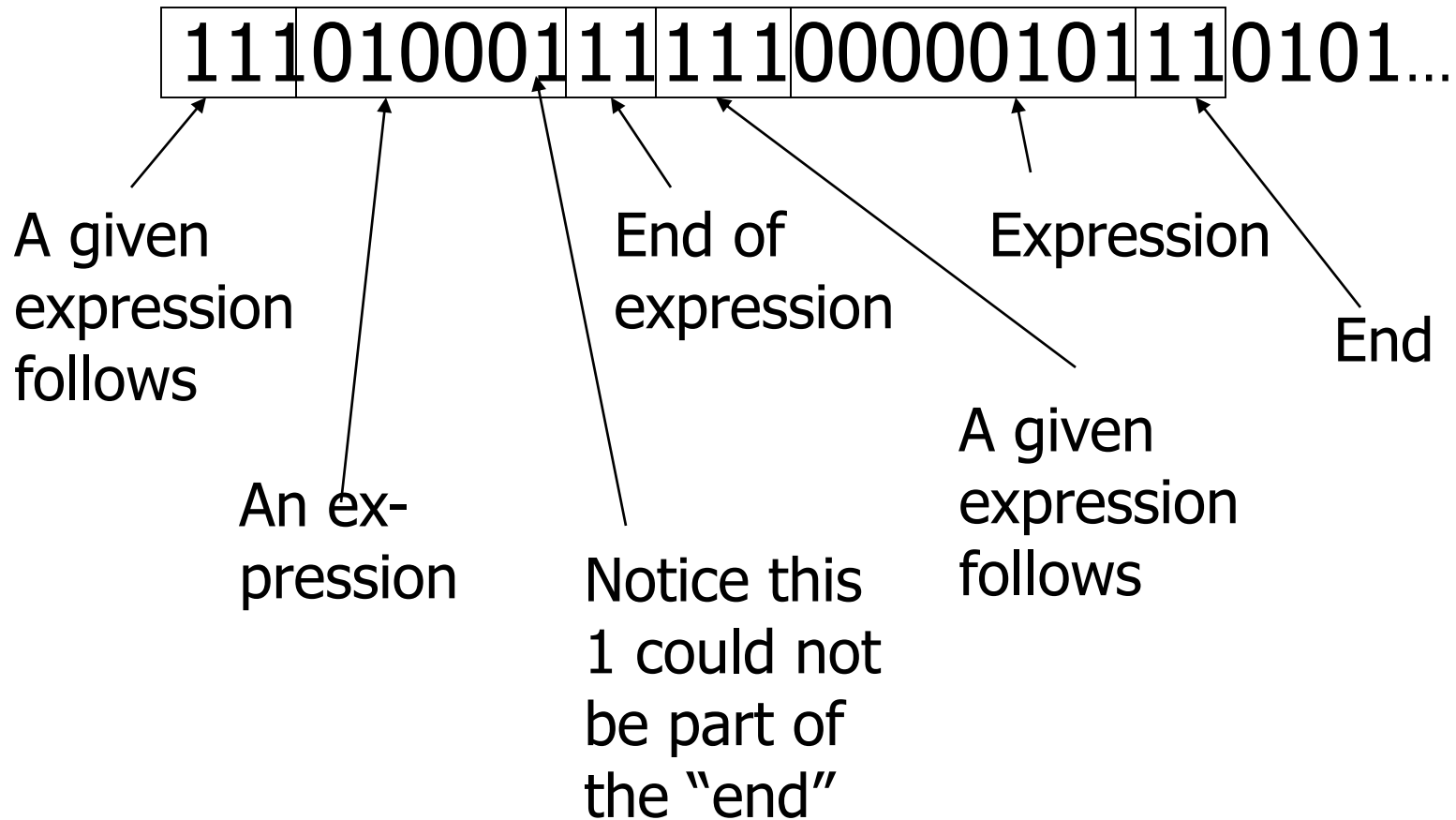
- But a proof is a sequence of expressions, so we need a way to separate them.
- Also, we need to indicate which expressions are given and which follow from previous expressions.

# Proofs – (3)

- Quick-and-dirty way to introduce new symbols into binary strings:
  1. Given a binary string, precede each bit by 0.
    - **Example:** 101 becomes 010001.
  2. Use strings of two or more 1's as the special symbols.
    - **Example:** 111 = "the following expression is given"; 11 = "end of expression."



# Example: Encoding Proofs



# Example: Programs

- Programs are just another kind of data.
- Represent a program in ASCII.
- Convert to a binary string, then to an integer.
- Thus, it makes sense to talk about “the i-th program.”
- Hmm...There aren't all that many programs.

# Finite Sets

- A *finite set* has a particular integer that is the count of the number of members.
- **Example:** {a, b, c} is a finite set; its *cardinality* is 3.
- It is impossible to find a 1-1 mapping between a finite set and a proper subset of itself.

# Infinite Sets

- Formally, an *infinite set* is a set for which there is a 1-1 correspondence between itself and a proper subset of itself.
- **Example:** the positive integers  $\{1, 2, 3, \dots\}$  is an infinite set.
  - There is a 1-1 correspondence  $1 \leftrightarrow 2, 2 \leftrightarrow 4, 3 \leftrightarrow 6, \dots$  between this set and a proper subset (the set of even integers).

# Countable Sets

- A *countable set* is a set with a 1-1 correspondence with the positive integers.
  - Hence, all countable sets are infinite.
- **Example:** All integers.
  - $0 \leftrightarrow 1; -i \leftrightarrow 2i; +i \leftrightarrow 2i+1.$
  - Thus, order is 0, -1, 1, -2, 2, -3, 3,...
- **Examples:** set of binary strings, set of Java programs.

# Example: Pairs of Integers

- Order the pairs of positive integers first by sum, then by first component:
- $[1,1], [2,1], [1,2], [3,1], [2,2], [1,3], [4,1], [3,2], \dots, [1,4], [5,1], \dots$
- **Interesting exercise:** figure out the function  $f(i,j)$  such that the pair  $[i,j]$  corresponds to the integer  $f(i,j)$  in this order.

# Enumerations

- An *enumeration* of a set is a 1-1 correspondence between the set and the positive integers.
- Thus, we have seen enumerations for strings, programs, proofs, and pairs of integers.

# How Many Languages?

- Are the languages over  $\{0,1\}$  countable?
- No; here's a **proof**.
- Suppose we could enumerate all languages over  $\{0,1\}$  and talk about "the  $i$ -th language."
- Consider the language  $L = \{ w \mid w \text{ is the } i\text{-th binary string and } w \text{ is not in the } i\text{-th language} \}$ .

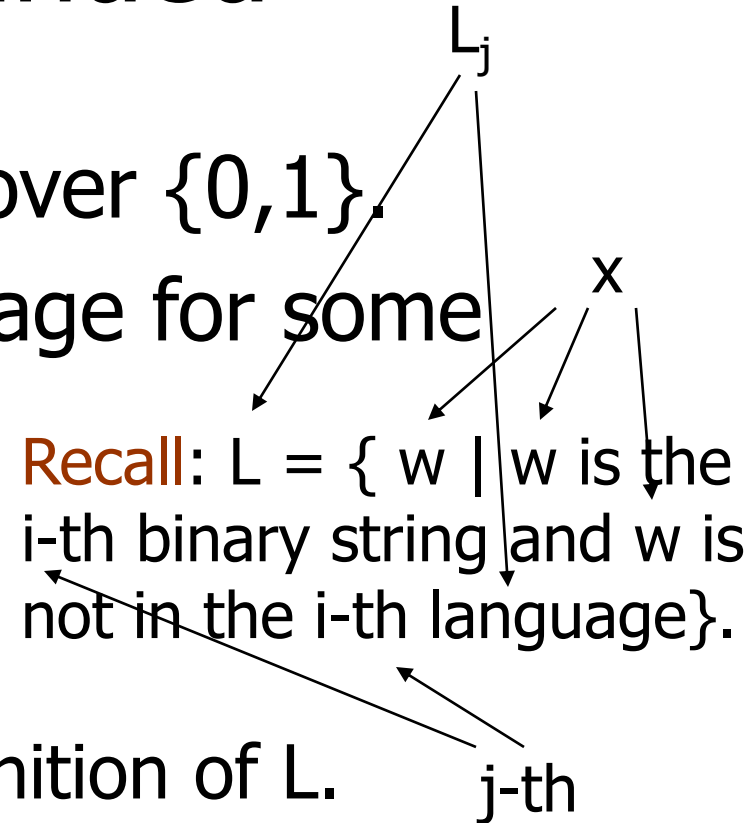


# Proof – Continued

- Clearly,  $L$  is a language over  $\{0,1\}$ .
- Thus, it is the  $j$ -th language for some particular  $j$ .
- Let  $x$  be the  $j$ -th string.
- Is  $x$  in  $L$ ?

Recall:  $L = \{ w \mid w \text{ is the } i\text{-th binary string and } w \text{ is not in the } i\text{-th language} \}$ .

- If so,  $x$  is not in  $L$  by definition of  $L$ .
- If not, then  $x$  is in  $L$  by definition of  $L$ .



# Proof – Concluded

- We have a contradiction:  $x$  is neither in  $L$  nor not in  $L$ , so our sole assumption (that there was an enumeration of the languages) is wrong.
- **Comment:** This is really bad; there are more languages than programs.
- E.g., there are languages with no membership algorithm.

# Diagonalization Picture

Strings

	1	2	3	4	5	...
1	1	0	1	1	0	...
2		1				
3			0			
4				0		
5					1	
...						...

Languages

# Diagonalization Picture

Flip each  
diagonal  
entry

Languages

	Strings					
	1	2	3	4	5	...
1	0	0	1	1	0	...
2		0				
3			1			
4				1		
5					0	
...						...

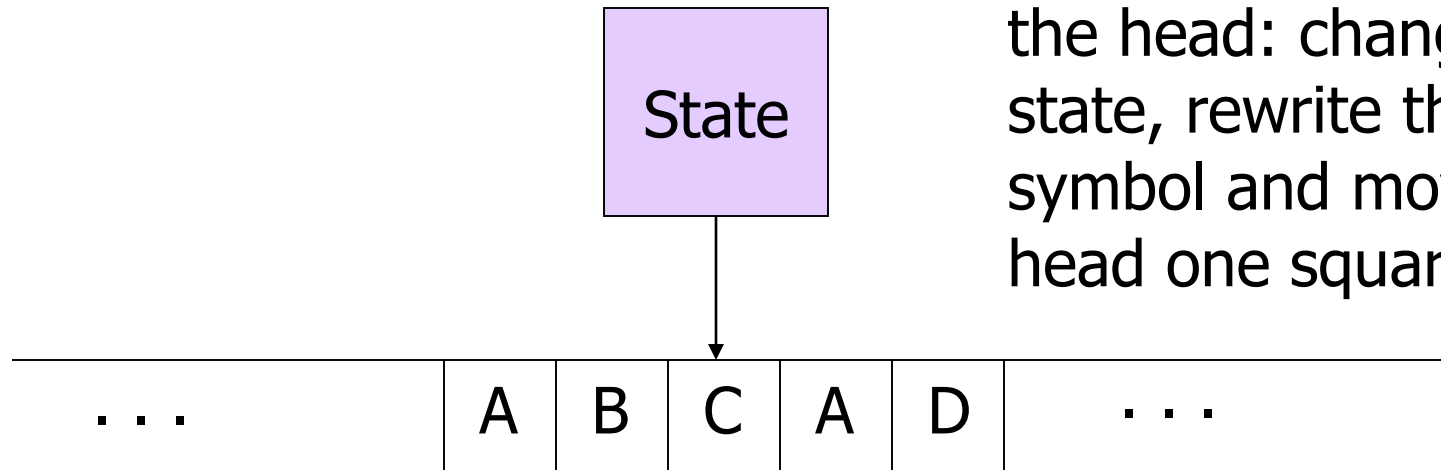
Can't be  
a row –  
it disagrees  
in an entry  
of each row.

# Turing-Machine Theory

- The purpose of the theory of Turing machines is to prove that certain specific languages have no algorithm.
- Start with a language about Turing machines themselves.
- Reductions are used to prove more common questions undecidable.

# Picture of a Turing Machine

**Action:** based on the state and the tape symbol under the head: change state, rewrite the symbol and move the head one square.



Infinite tape with squares containing tape symbols chosen from a finite alphabet

# Why Turing Machines?

- Why not deal with C programs or something like that?
- **Answer:** You can, but it is easier to prove things about TM's, because they are so simple.
  - And yet they are as powerful as any computer.
    - More so, in fact, since they have infinite memory.

# Turing-Machine Formalism

- A TM is described by:
  1. A finite set of *states* ( $Q$ , typically).
  2. An *input alphabet* ( $\Sigma$ , typically).
  3. A *tape alphabet* ( $\Gamma$ , typically; contains  $\Sigma$ ).
  4. A *transition function* ( $\delta$ , typically).
  5. A *start state* ( $q_0$ , in  $Q$ , typically).
  6. A *blank symbol* ( $B$ , in  $\Gamma - \Sigma$ , typically).
    - All tape except for the input is blank initially.
  7. A set of *final states* ( $F \subseteq Q$ , typically).



# Conventions

- $a, b, \dots$  are input symbols.
- $\dots, X, Y, Z$  are tape symbols.
- $\dots, w, x, y, z$  are strings of input symbols.
- $\alpha, \beta, \dots$  are strings of tape symbols.

# The Transition Function

- Takes two arguments:
  1. A state, in  $Q$ .
  2. A tape symbol in  $\Gamma$ .
- $\delta(q, Z)$  is either undefined or a triple of the form  $(p, Y, D)$ .
  - $p$  is a state.
  - $Y$  is the new tape symbol.
  - $D$  is a *direction*, L or R.

# Example: Turing Machine

- This TM scans its input right, looking for a 1.
- If it finds one, it changes it to a 0, goes to final state  $f$ , and halts.
- If it reaches a blank, it changes it to a 1 and moves left.

# Example: Turing Machine – (2)

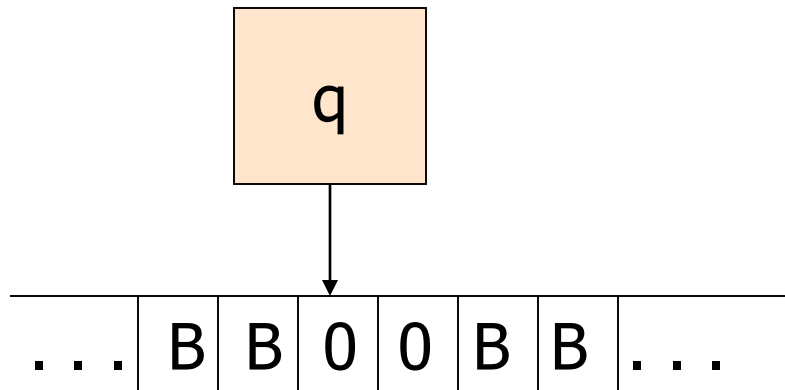
- States = {q (start), f (final)}.
- Input symbols = {0, 1}.
- Tape symbols = {0, 1, B}.
- $\delta(q, 0) = (q, 0, R)$ .
- $\delta(q, 1) = (f, 0, R)$ .
- $\delta(q, B) = (q, 1, L)$ .

# Simulation of TM

$$\delta(q, 0) = (q, 0, R)$$

$$\delta(q, 1) = (f, 0, R)$$

$$\delta(q, B) = (q, 1, L)$$

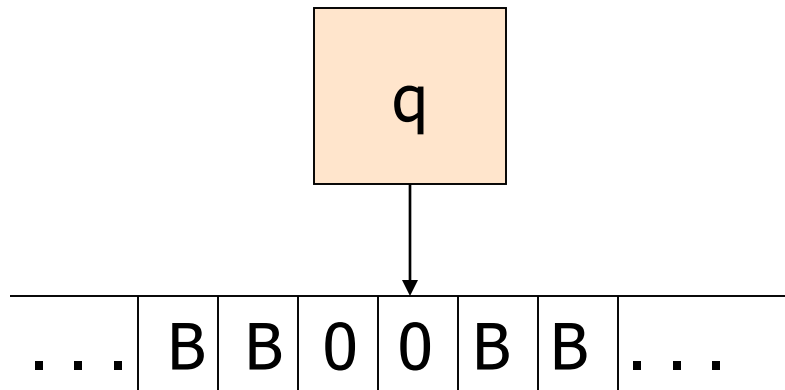


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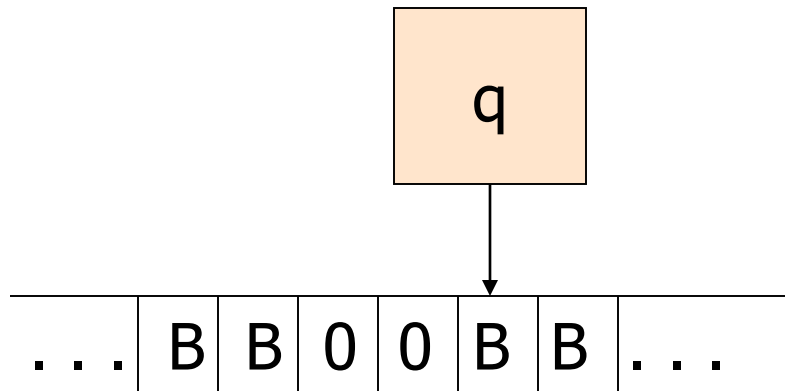


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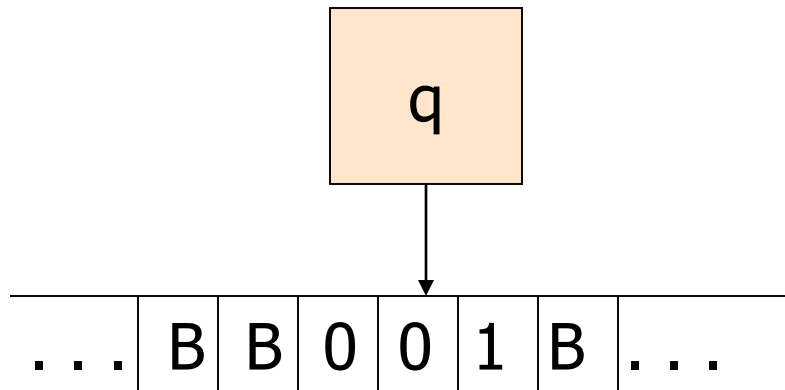


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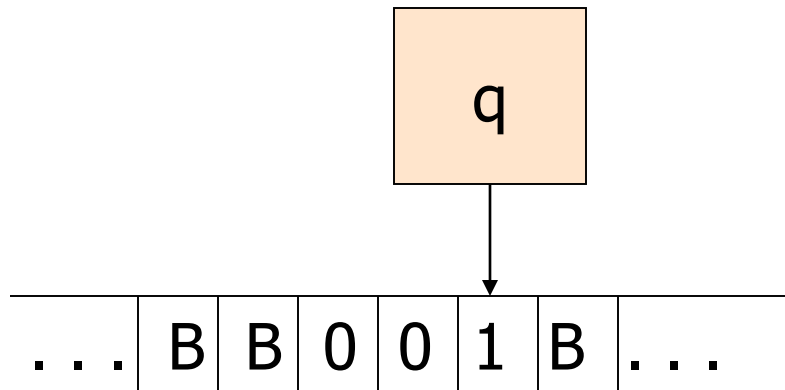


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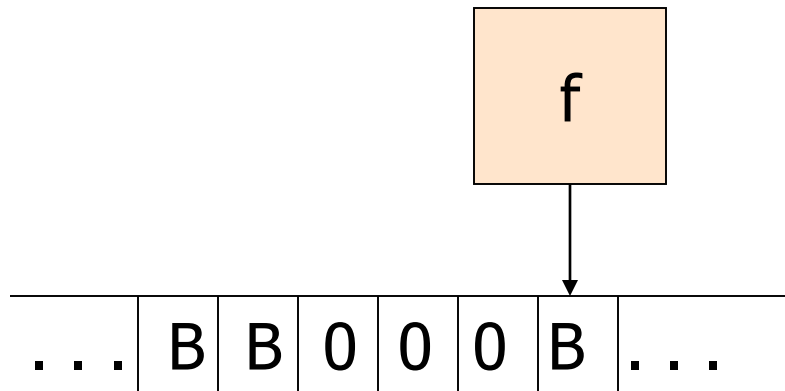


# Simulation of TM

$$\delta(q, 0) = (q, 0, R)$$

$$\delta(q, 1) = (f, 0, R)$$

$$\delta(q, B) = (q, 1, L)$$



No move is possible.  
The TM halts and  
accepts.

# Instantaneous Descriptions of a Turing Machine

- Initially, a TM has a tape consisting of a string of input symbols surrounded by an infinity of blanks in both directions.
- The TM is in the start state, and the head is at the leftmost input symbol.

## TM ID's – (2)

- An ID is a string  $\alpha q \beta$ , where  $\alpha \beta$  includes the tape between the leftmost and rightmost nonblanks.
- The state  $q$  is immediately to the left of the tape symbol scanned.
- If  $q$  is at the right end, it is scanning  $B$ .
  - If  $q$  is scanning a  $B$  at the left end, then consecutive  $B$ 's at and to the right of  $q$  are part of  $\alpha$ .

## TM ID's – (3)

- As for PDA's we may use symbols  $\vdash$  and  $\vdash^*$  to represent "becomes in one move" and "becomes in zero or more moves," respectively, on ID's.
- **Example:** The moves of the previous TM are  $q_00 \vdash 0q_0 \vdash 00q \vdash 0q_01 \vdash 00q_1 \vdash 000f$

# Formal Definition of Moves

1. If  $\delta(q, Z) = (p, Y, R)$ , then
  - $\alpha q Z \beta \vdash \alpha Y p \beta$
  - If  $Z$  is the blank  $B$ , then also  $\alpha q \vdash \alpha Y p$
2. If  $\delta(q, Z) = (p, Y, L)$ , then
  - For any  $X$ ,  $\alpha X q Z \beta \vdash \alpha p X Y \beta$
  - In addition,  $q Z \beta \vdash p B Y \beta$

# Languages of a TM

- A TM defines a language by final state, as usual.
- $L(M) = \{w \mid q_0 w \vdash^* I, \text{ where } I \text{ is an ID with a final state}\}$ .
- Or, a TM can accept a language by halting.
- $H(M) = \{w \mid q_0 w \vdash^* I, \text{ and there is no move possible from ID } I\}$ .

# Equivalence of Accepting and Halting

1. If  $L = L(M)$ , then there is a TM  $M'$  such that  $L = H(M')$ .
2. If  $L = H(M)$ , then there is a TM  $M''$  such that  $L = L(M'')$ .



# Proof of 1: Final State -> Halting

- Modify  $M$  to become  $M'$  as follows:
  1. For each final state of  $M$ , remove any moves, so  $M'$  halts in that state.
  2. Avoid having  $M'$  accidentally halt.
    - Introduce a new state  $s$ , which runs to the right forever; that is  $\delta(s, X) = (s, X, R)$  for all symbols  $X$ .
    - If  $q$  is not a final state, and  $\delta(q, X)$  is undefined, let  $\delta(q, X) = (s, X, R)$ .

# Proof of 2: Halting $\rightarrow$ Final State

- Modify  $M$  to become  $M''$  as follows:
  1. Introduce a new state  $f$ , the only final state of  $M''$ .
  2.  $f$  has no moves.
  3. If  $\delta(q, X)$  is undefined for any state  $q$  and symbol  $X$ , define it by  $\delta(q, X) = (f, X, R)$ .

# Recursively Enumerable Languages

- We now see that the classes of languages defined by TM's using final state and halting are the same.
- This class of languages is called the *recursively enumerable languages*.
  - Why? The term actually predates the Turing machine and refers to another notion of computation of functions.

# Recursive Languages

- An *algorithm* is a TM, accepting by final state, that is guaranteed to halt whether or not it accepts.
- If  $L = L(M)$  for some TM  $M$  that is an algorithm, we say  $L$  is a *recursive language*.
  - Why? Again, don't ask; it is a term with a history.

# Example: Recursive Languages

- Every CFL is a recursive language.
  - Use the CYK algorithm.
- Almost anything you can think of is recursive.

# More About Turing Machines

“Programming Tricks”

Restrictions

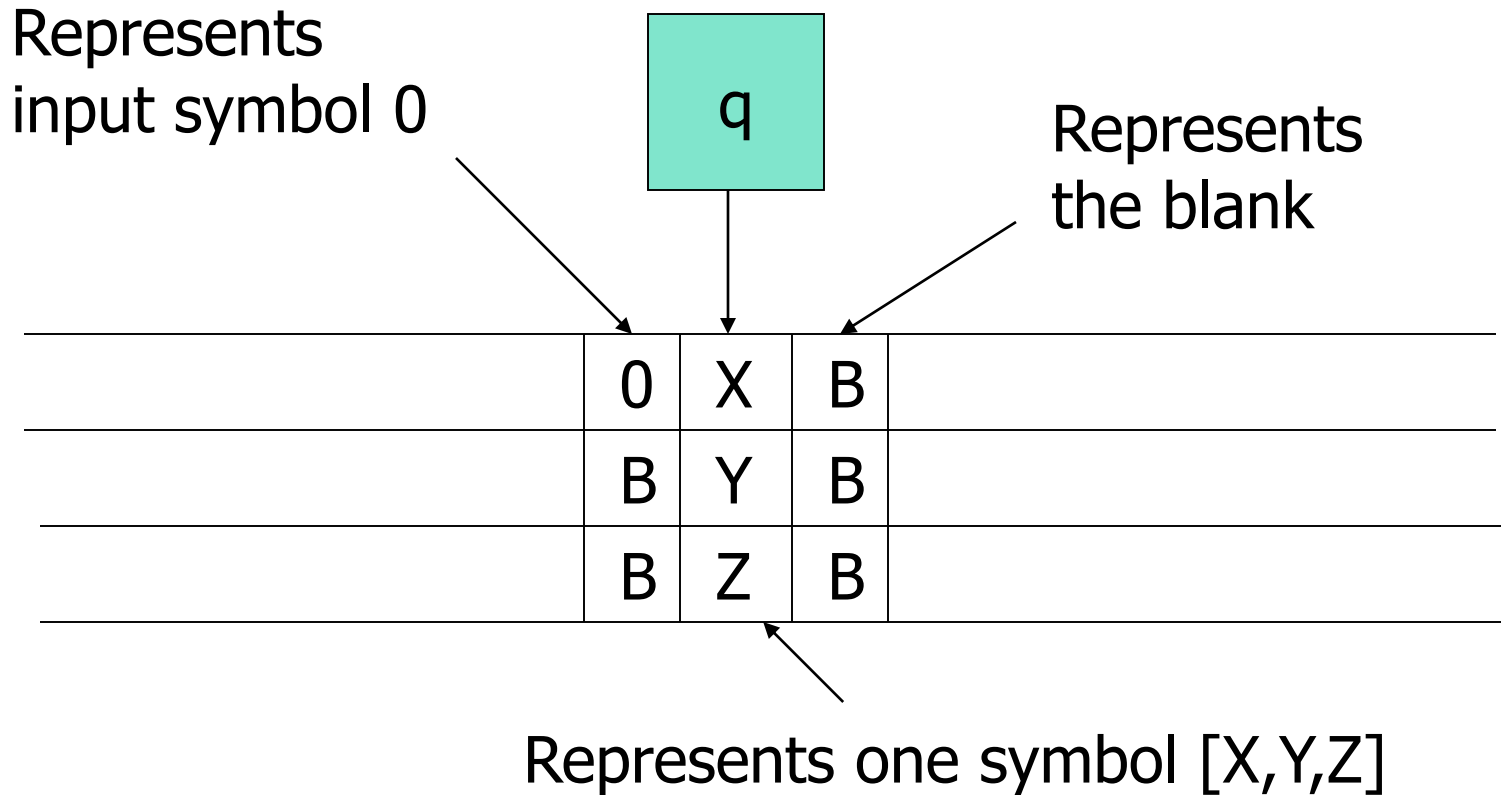
Extensions

Closure Properties

# Programming Trick: Multiple Tracks

- Think of tape symbols as vectors with  $k$  components, each chosen from a finite alphabet.
- Makes the tape appear to have  $k$  tracks.
- Let input symbols be blank in all but one track.

# Picture of Multiple Tracks

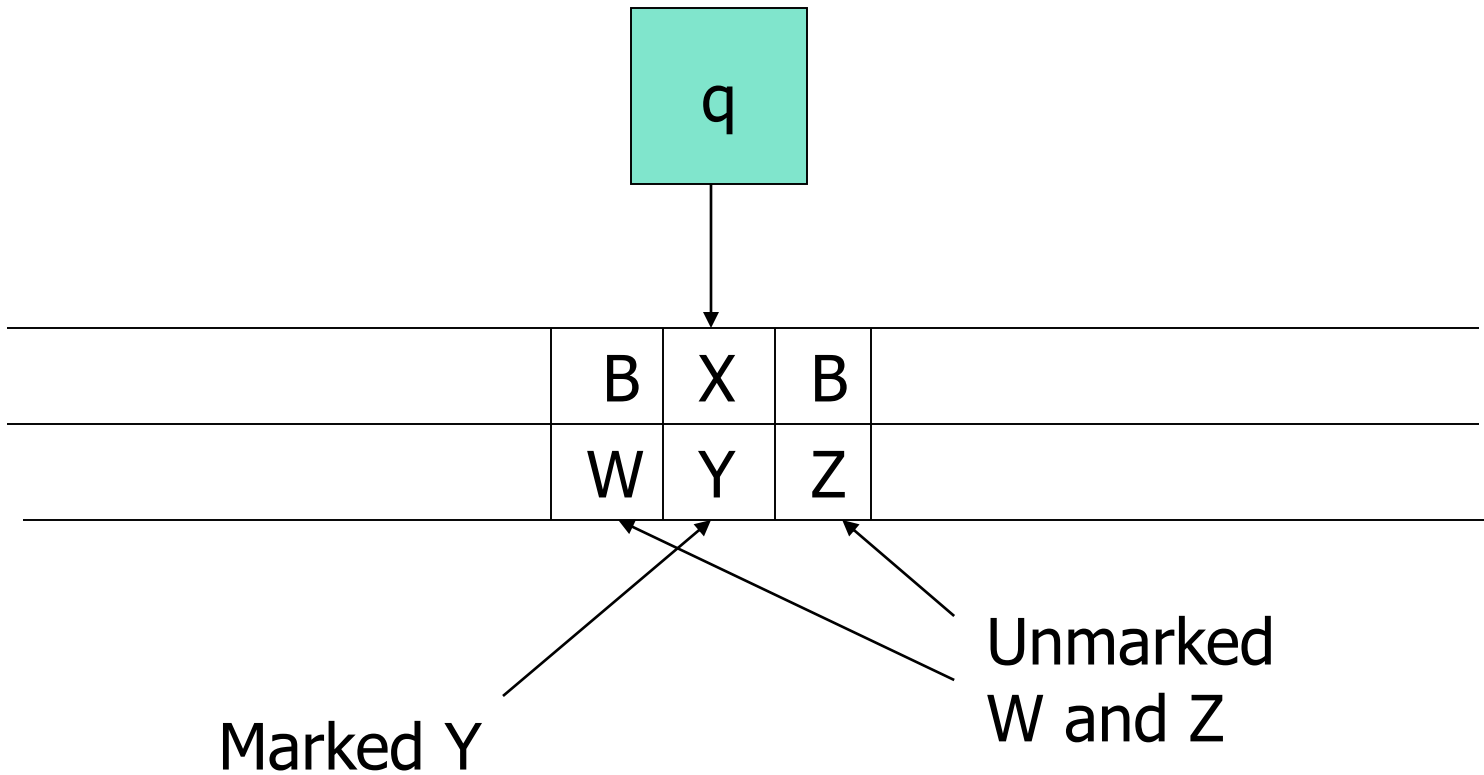




# Programming Trick: Marking

- A common use for an extra track is to *mark* certain positions.
- Almost all tape squares hold B (blank) in this track, but several hold special symbols (marks) that allow the TM to find particular places on the tape.

# Marking



# Programming Trick: Caching in the State

- The state can also be a vector.
- First component is the “control state.”
- Other components hold data from a finite alphabet.

# Example: Using These Tricks

- This TM doesn't do anything terribly useful; it copies its input  $w$  infinitely.
- Control states:
  - $q$ : Mark your position and remember the input symbol seen.
  - $p$ : Run right, remembering the symbol and looking for a blank. Deposit symbol.
  - $r$ : Run left, looking for the mark.

## Example – (2)

- States have the form  $[x, Y]$ , where  $x$  is  $q, p,$  or  $r$  and  $Y$  is  $0, 1,$  or  $B$ .
  - Only  $p$  uses  $0$  and  $1$ .
- Tape symbols have the form  $[U, V]$ .
  - $U$  is either  $X$  (the “mark”) or  $B$ .
  - $V$  is  $0, 1$  (the input symbols) or  $B$ .
  - $[B, B]$  is the TM blank;  $[B, 0]$  and  $[B, 1]$  are the inputs.

# The Transition Function

- **Convention:**  $a$  and  $b$  each stand for “either 0 or 1.”
- $\delta([q,B], [B,a]) = ([p,a], [X,a], R)$ .
  - In state  $q$ , copy the input symbol under the head (i.e.,  $a$ ) into the state.
  - Mark the position read.
  - Go to state  $p$  and move right.

# Transition Function – (2)

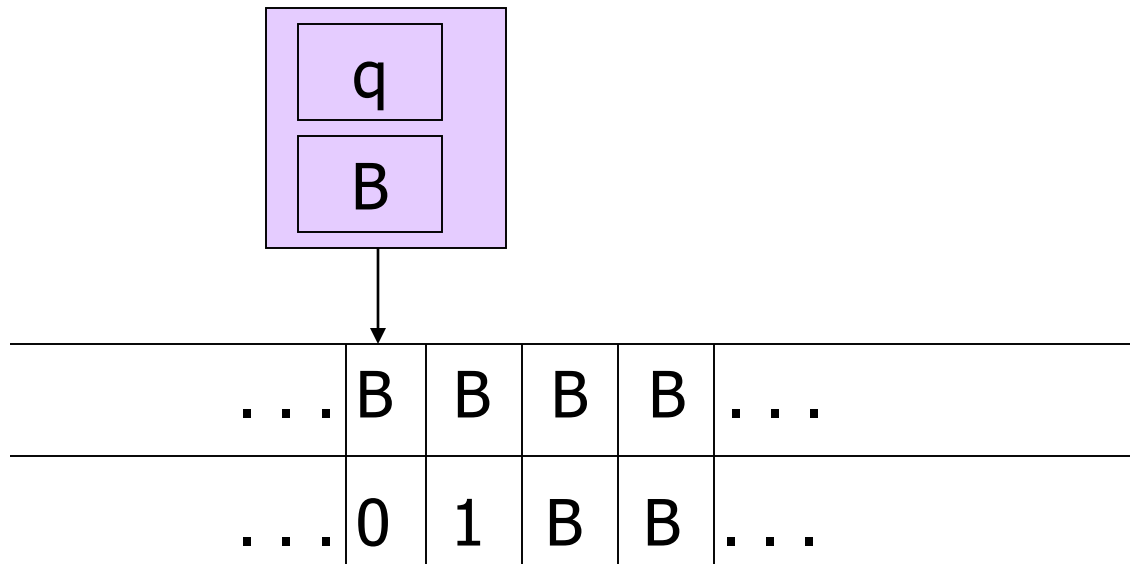
- $\delta([p,a], [B,b]) = ([p,a], [B,b], R)$ .
  - In state  $p$ , search right, looking for a blank symbol (not just  $B$  in the mark track).
- $\delta([p,a], [B,B]) = ([r,B], [B,a], L)$ .
  - When you find a  $B$ , replace it by the symbol ( $a$ ) carried in the “cache.”
  - Go to state  $r$  and move left.

# Transition Function – (3)

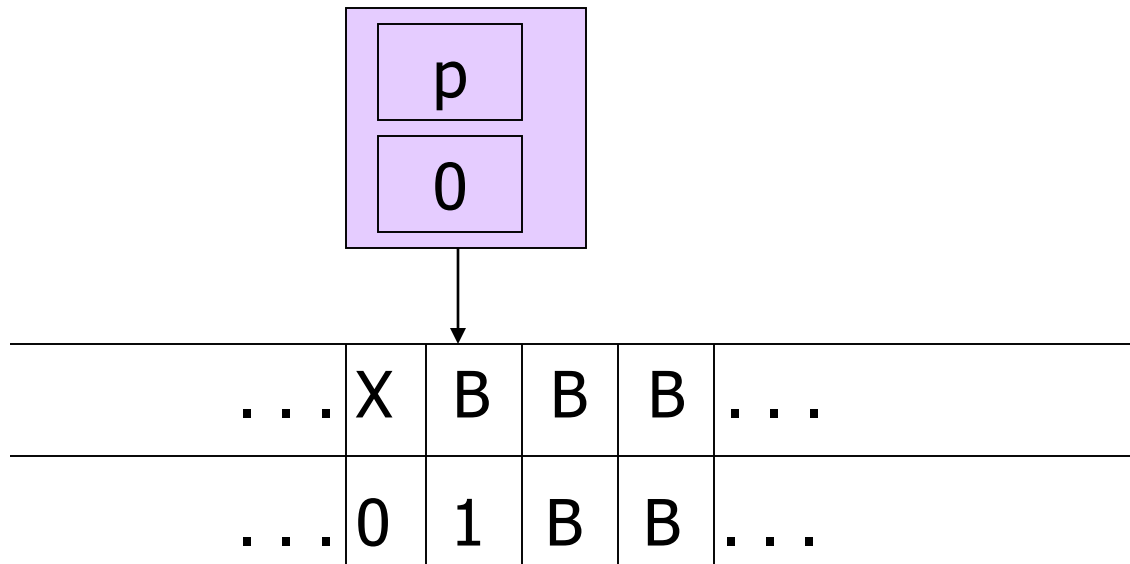
- $\delta([r,B], [B,a]) = ([r,B], [B,a], L)$ .
  - In state  $r$ , move left, looking for the mark.
- $\delta([r,B], [X,a]) = ([q,B], [B,a], R)$ .
  - When the mark is found, go to state  $q$  and move right.
  - But remove the mark from where it was.
  - $q$  will place a new mark and the cycle repeats.



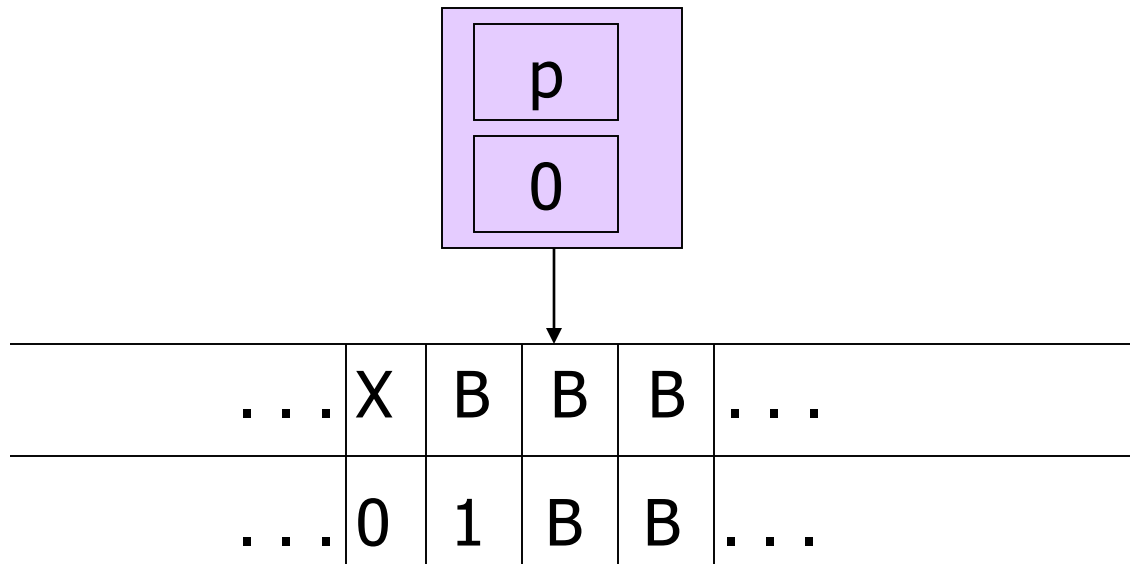
# Simulation of the TM



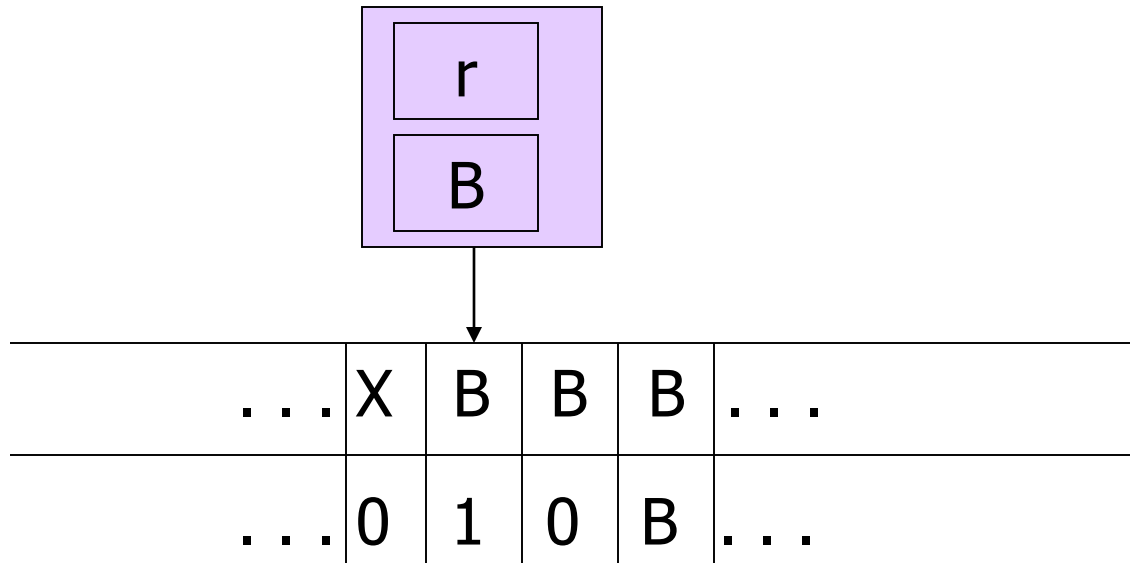
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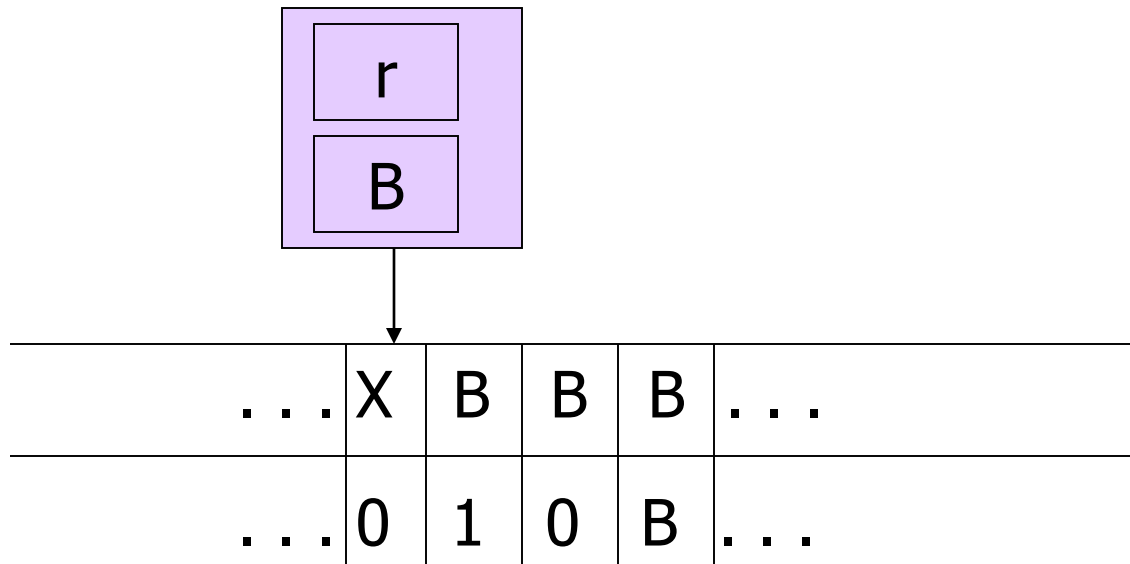
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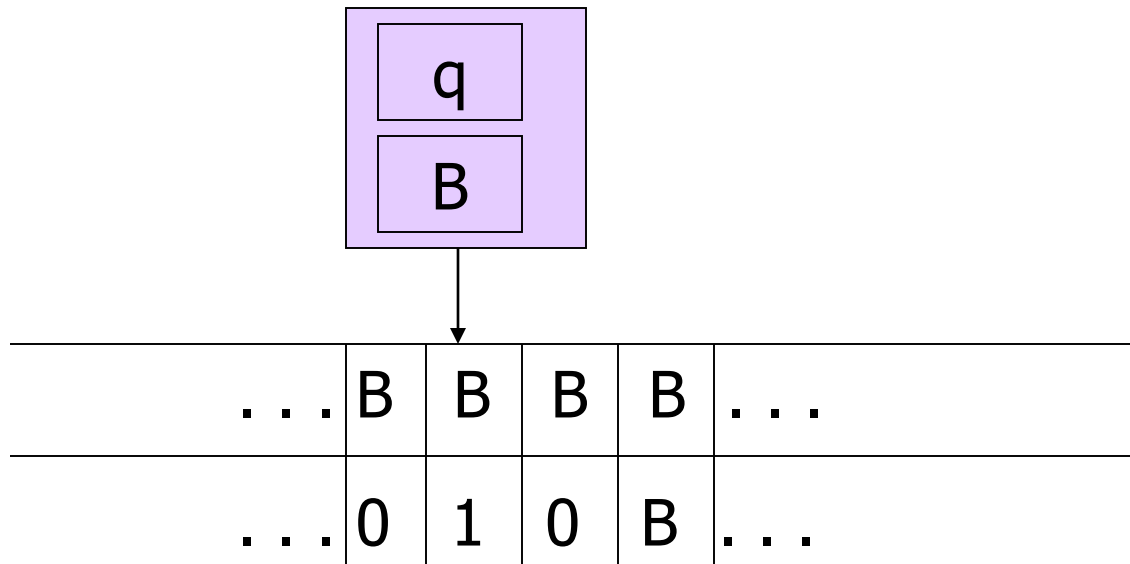
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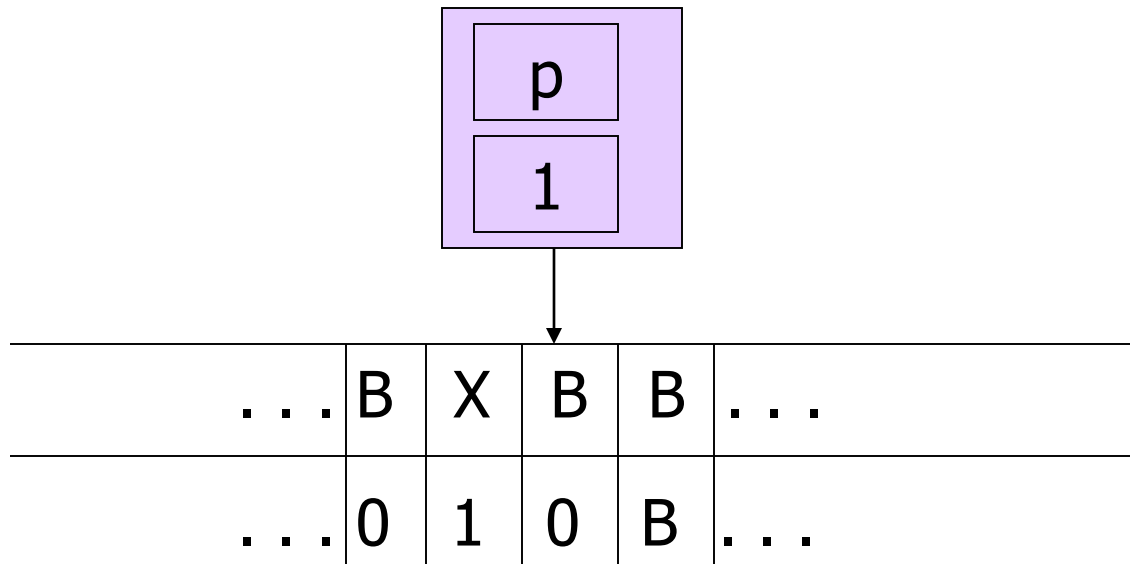
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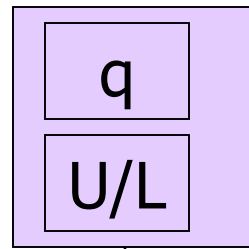


# Semi-infinite Tape

- We can assume the TM never moves left from the initial position of the head.
- Let this position be 0; positions to the right are 1, 2, ... and positions to the left are  $-1, -2, \dots$
- New TM has two tracks.
  - Top holds positions 0, 1, 2, ...
  - Bottom holds a marker, positions  $-1, -2, \dots$



# Simulating Infinite Tape by Semi-infinite Tape



State remembers whether simulating upper or lower track. Reverse directions for lower track.

0	1	2	3	...
*	-1	-2	-3	...

Put \* here at the first move

You don't need to do anything, because these are initially B.

# More Restrictions

- Two stacks can simulate one tape.
  - One holds positions to the left of the head; the other holds positions to the right.
- In fact, by a clever construction, the two stacks to be *counters* = only two stack symbols, one of which can only appear at the bottom.

**Factoid:** Invented by Pat Fischer, whose main claim to fame is that he was a victim of the Unabomber.

# Extensions

- More general than the standard TM.
- But still only able to define the RE languages.
  1. Multitape TM.
  2. Nondeterministic TM.
  3. Store for name-value pairs.

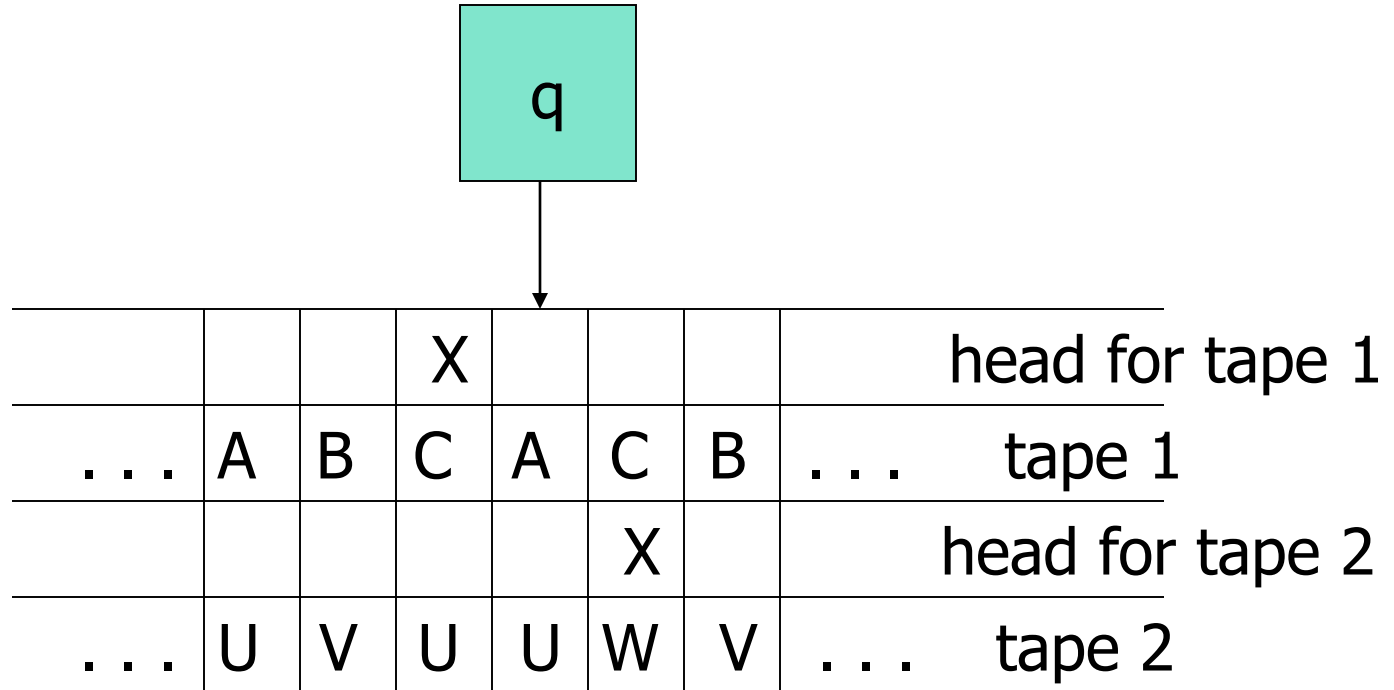
# Multitape Turing Machines

- Allow a TM to have  $k$  tapes for any fixed  $k$ .
- Move of the TM depends on the state and the symbols under the head for each tape.
- In one move, the TM can change state, write symbols under each head, and move each head independently.

# Simulating $k$ Tapes by One

- Use  $2k$  tracks.
- Each tape of the  $k$ -tape machine is represented by a track.
- The head position for each track is represented by a mark on an additional track.

# Picture of Multitape Simulation



# Nondeterministic TM's

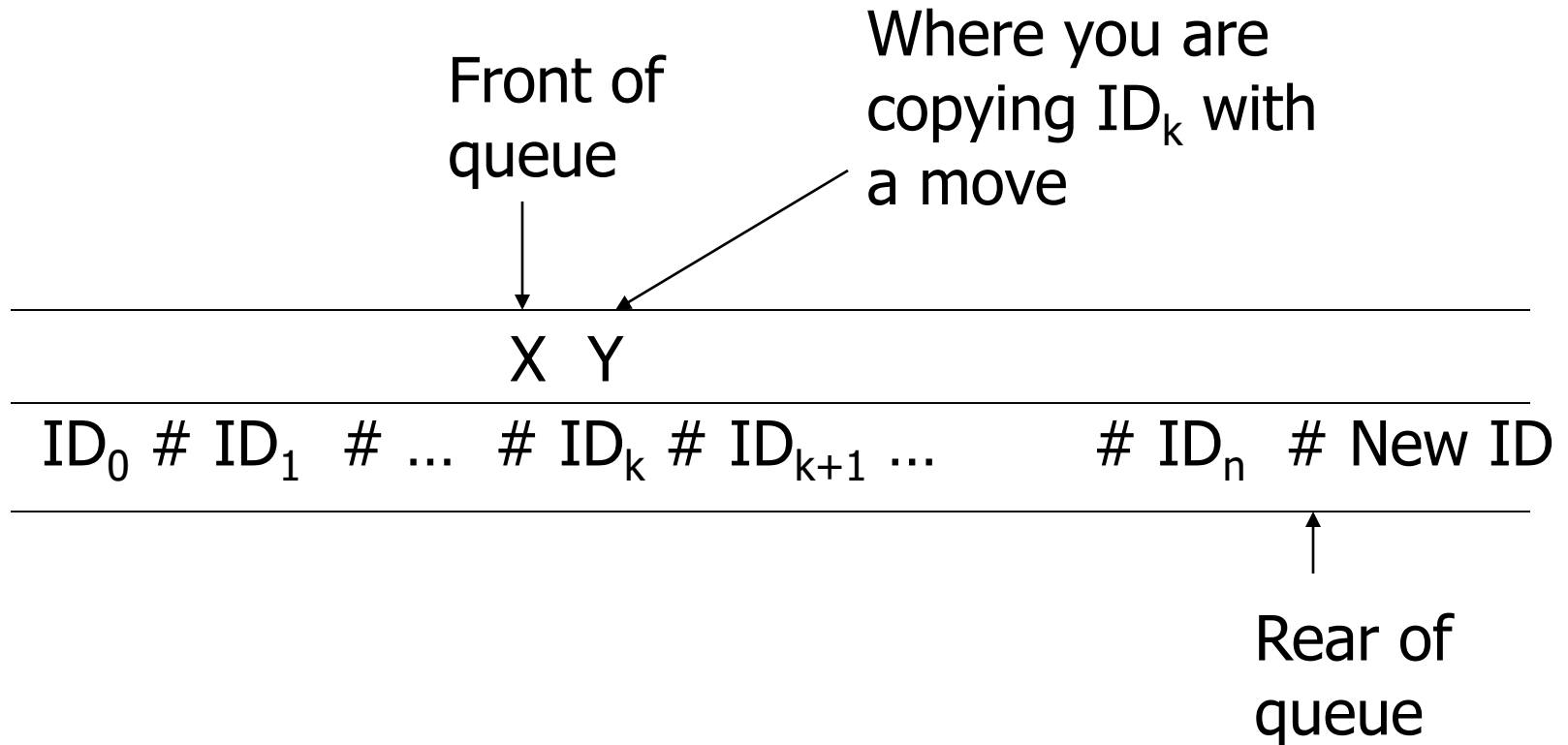
- Allow the TM to have a choice of move at each step.
  - Each choice is a state-symbol-direction triple, as for the deterministic TM.
- The TM accepts its input if any sequence of choices leads to an accepting state.

# Simulating a NTM by a DTM

- The DTM maintains on its tape a queue of ID's of the NTM.
- A second track is used to mark certain positions:
  1. A mark for the ID at the head of the queue.
  2. A mark to help copy the ID at the head and make a one-move change.



# Picture of the DTM Tape



# Operation of the Simulating DTM

- The DTM finds the ID at the current front of the queue.
- It looks for the state in that ID so it can determine the moves permitted from that ID.
- If there are  $m$  possible moves, it creates  $m$  new ID's, one for each move, at the rear of the queue.

# Operation of the DTM – (2)

- The  $m$  new ID's are created one at a time.
- After all are created, the marker for the front of the queue is moved one ID toward the rear of the queue.
- However, if a created ID has an accepting state, the DTM instead accepts and halts.

# Why the NTM $\rightarrow$ DTM Construction Works

- There is an upper bound, say  $k$ , on the number of choices of move of the NTM for any state/symbol combination.
- Thus, any ID reachable from the initial ID by  $n$  moves of the NTM will be constructed by the DTM after constructing at most  $(k^{n+1}-k)/(k-1)$  ID's.

Sum of  $k+k^2+\dots+k^n$

## Why? – (2)

- If the NTM accepts, it does so in some sequence of  $n$  choices of move.
- Thus the ID with an accepting state will be constructed by the DTM in some large number of its own moves.
- If the NTM does not accept, there is no way for the DTM to accept.

# Taking Advantage of Extensions

- We now have a really good situation.
- When we discuss construction of particular TM's that take other TM's as input, we can assume the input TM is as simple as possible.
  - E.g., one, semi-infinite tape, deterministic.
- But the simulating TM can have many tapes, be nondeterministic, etc.

# Simulating a Name-Value Store by a TM

- The TM uses one of several tapes to hold an arbitrarily large sequence of name-value pairs in the format `#name*value#...`
- Mark, using a second track, the left end of the sequence.
- A second tape can hold a name whose value we want to look up.

# Lookup

- Starting at the left end of the store, compare the lookup name with each name in the store.
- When we find a match, take what follows between the \* and the next # as the value.



# Insertion

- Suppose we want to insert name-value pair  $(n, v)$ , or replace the current value associated with name  $n$  by  $v$ .
- Perform lookup for name  $n$ .
- If not found, add  $n*v\#$  at the end of the store.

# Insertion – (2)

- If we find  $\#n*v'\#$ , we need to replace  $v'$  by  $v$ .
- If  $v$  is shorter than  $v'$ , you can leave blanks to fill out the replacement.
- But if  $v$  is longer than  $v'$ , you need to make room.

# Insertion – (3)

- Use a third tape to copy everything from the first tape to the right of  $v'$ .
- Mark the position of the  $*$  to the left of  $v'$  before you do.
- On the first tape, write  $v$  just to the left of that star.
- Copy from the third tape to the first, leaving enough room for  $v$ .

# Picture of Shifting Right

Tape 1

... # n \* v' # vlah blah blah ...

Tape 3

# blah blah blah ...

# Picture of Shifting Right

Tape 1

... # n \* v # blah blah blah ...

Tape 3

# blah blah blah ...

# Closure Properties of Recursive and RE Languages

- Both closed under union, concatenation, star, reversal, intersection, inverse homomorphism.
- Recursive closed under difference, complementation.
- RE closed under homomorphism.

# Union

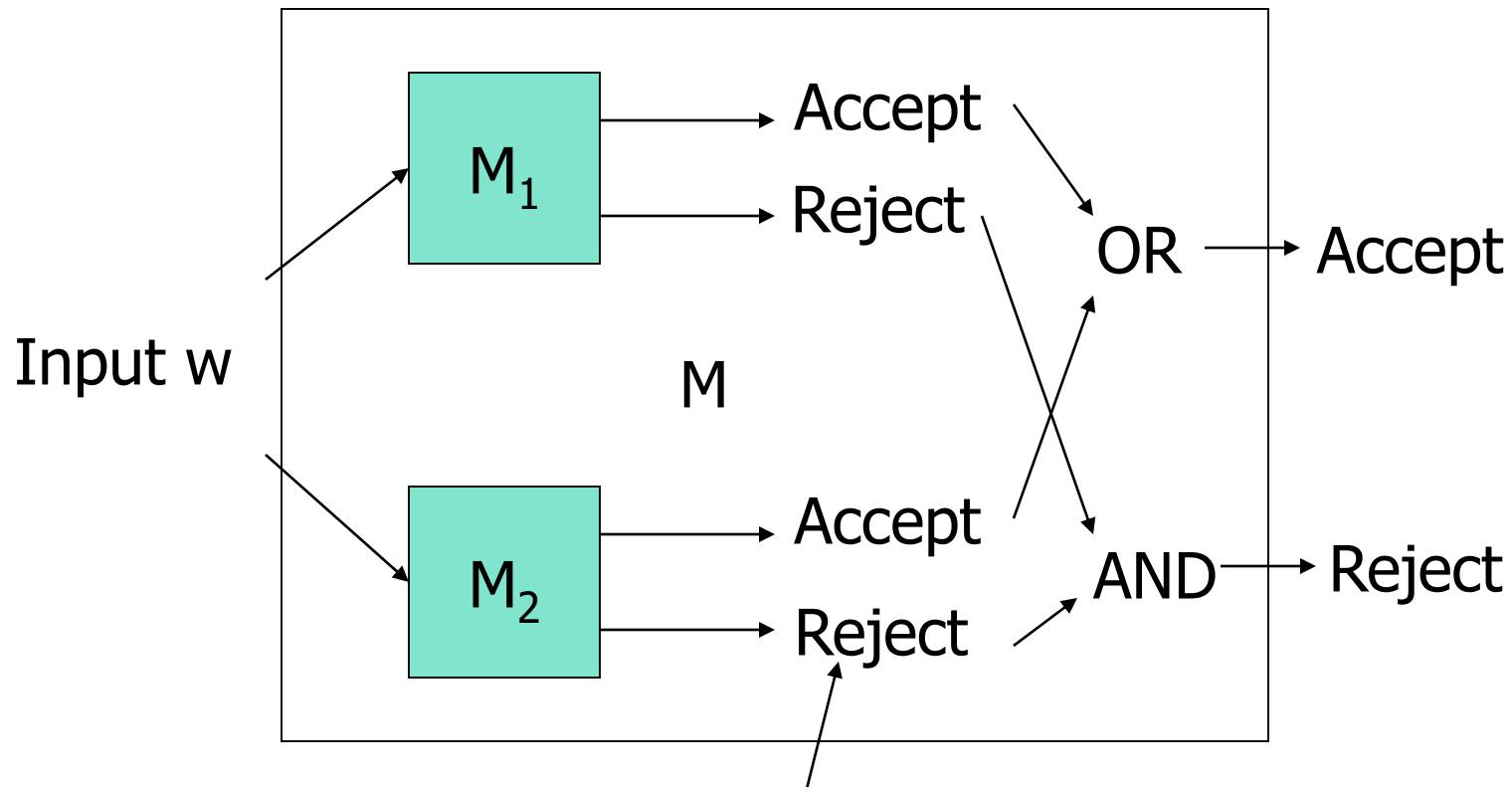
- Let  $L_1 = L(M_1)$  and  $L_2 = L(M_2)$ .
- Assume  $M_1$  and  $M_2$  are single-semi-infinite-tape TM's.
- Construct 2-tape TM  $M$  to copy its input onto the second tape and simulate the two TM's  $M_1$  and  $M_2$  each on one of the two tapes, "in parallel."

# Union – (2)

- **Recursive languages:** If  $M_1$  and  $M_2$  are both algorithms, then  $M$  will always halt in both simulations.
- **RE languages:** accept if either accepts, but you may find both TM's run forever without halting or accepting.

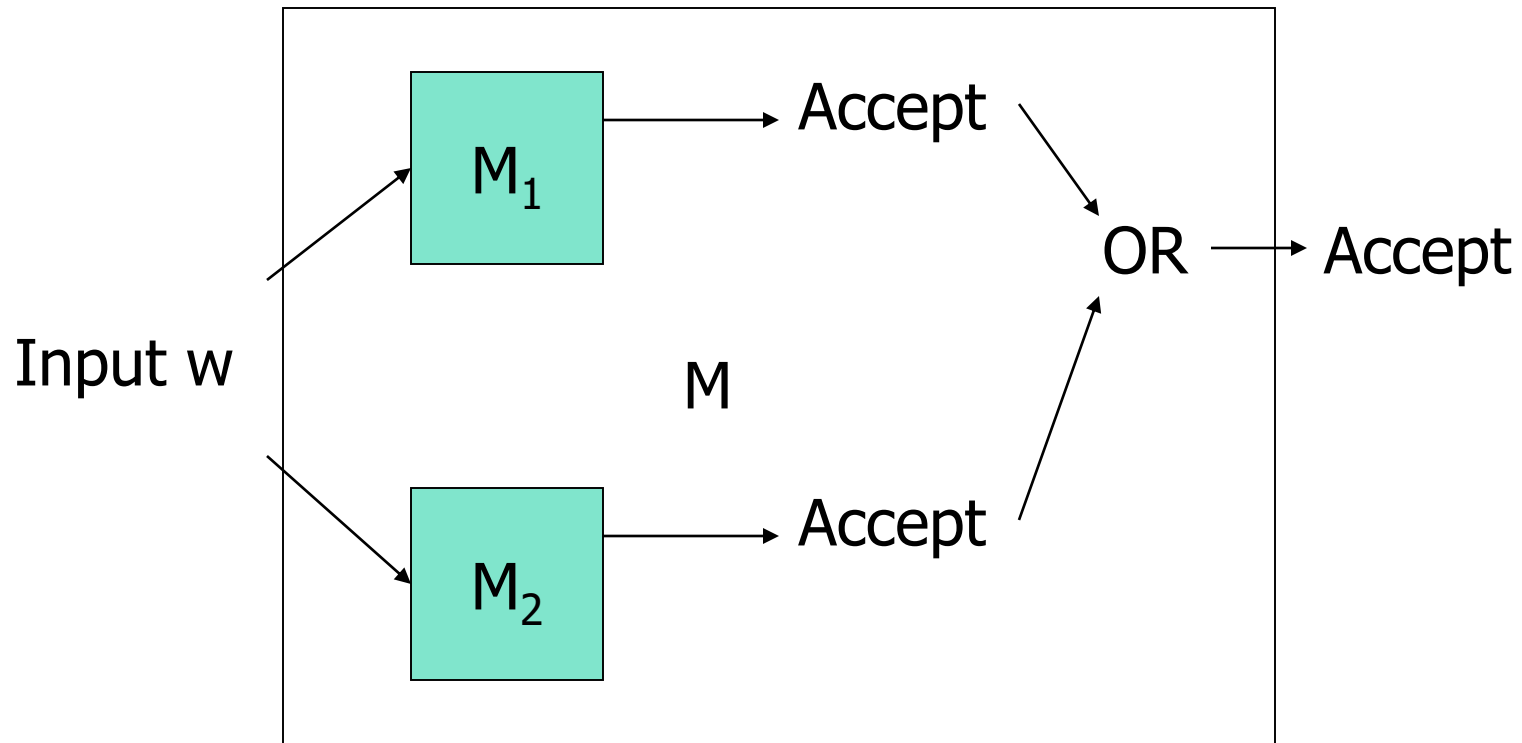


# Picture of Union/Recursive

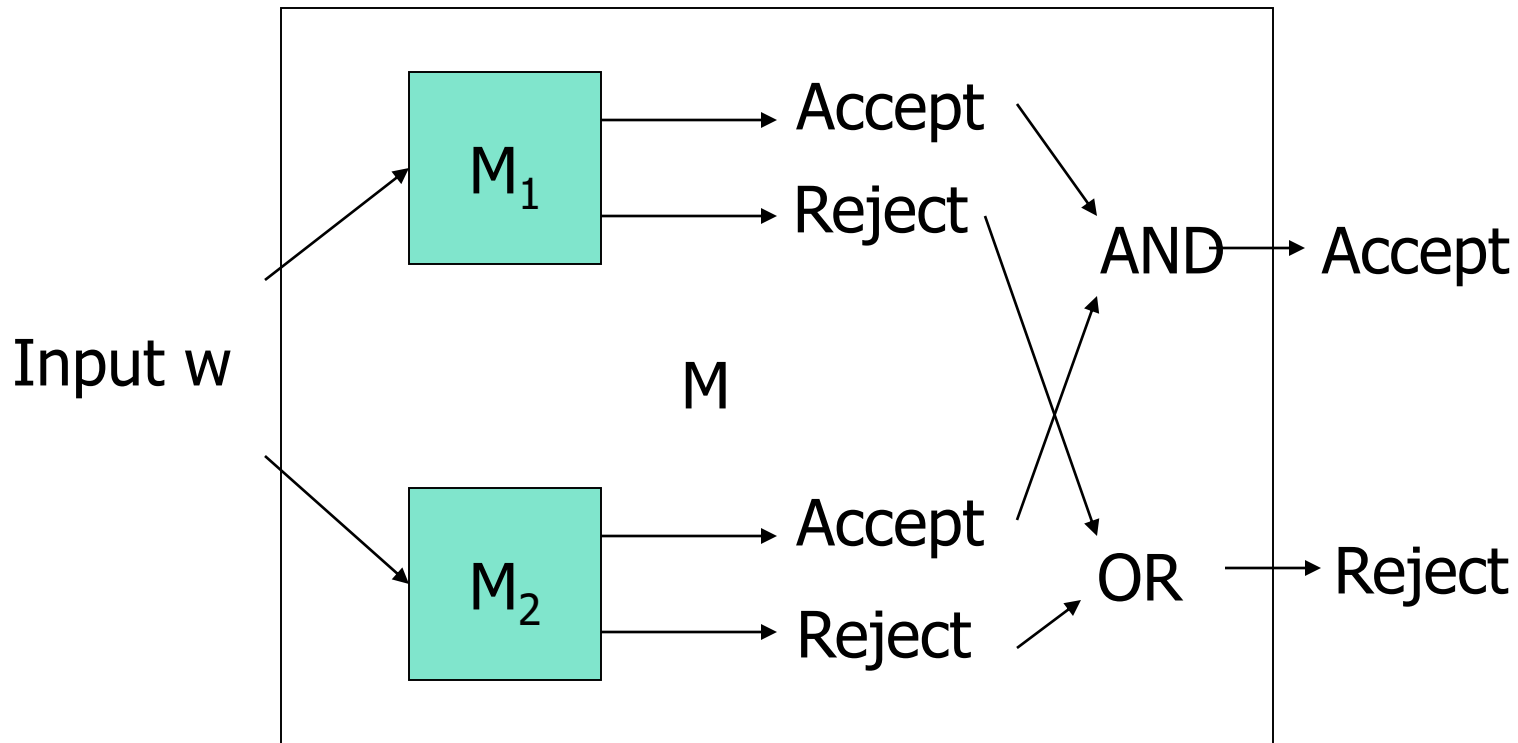


**Remember:** = "halt without accepting"

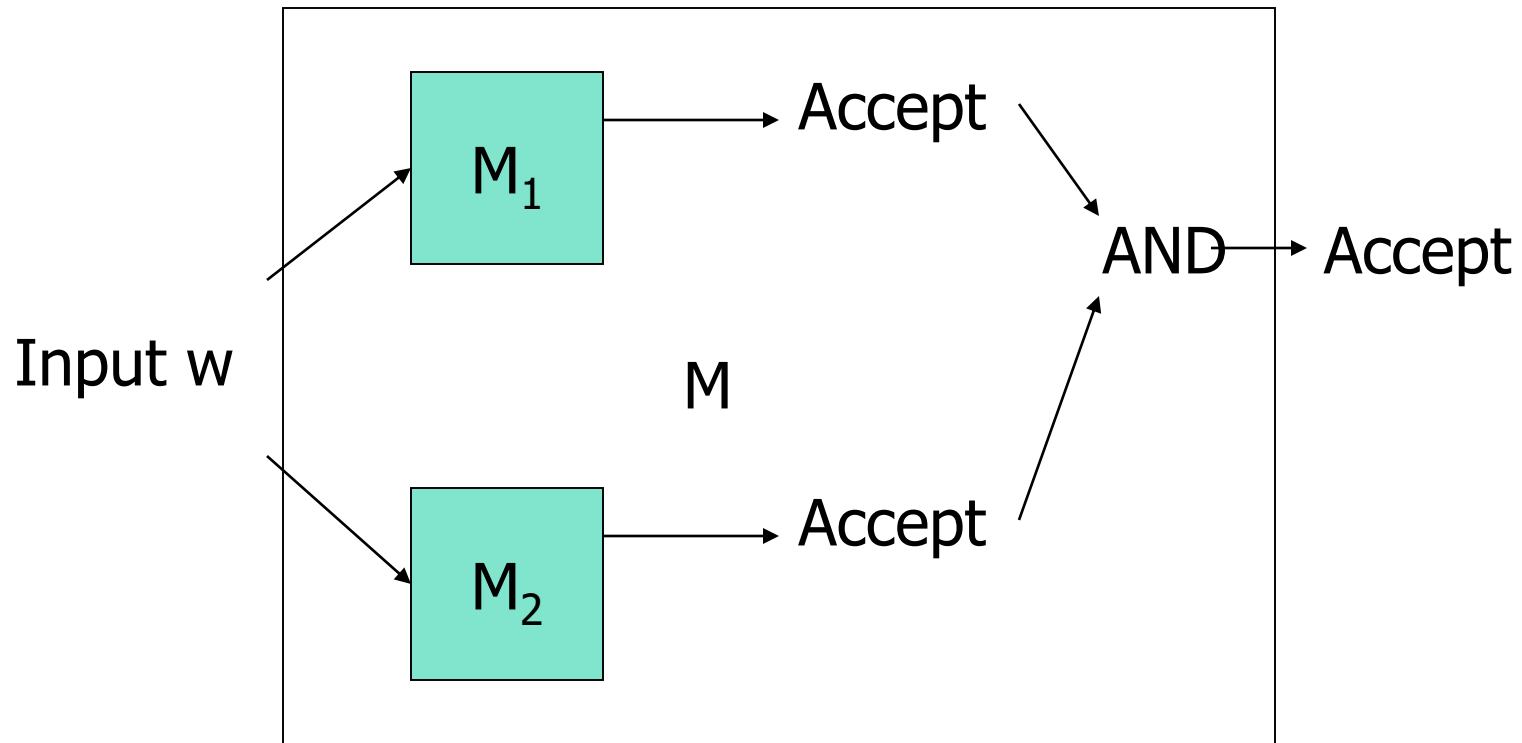
# Picture of Union/RE



# Intersection/Recursive – Same Idea



# Intersection/RE



# Difference, Complement

- **Recursive languages**: both TM's will eventually halt.
- Accept if  $M_1$  accepts and  $M_2$  does not.
  - **Corollary**: Recursive languages are closed under complementation.
- **RE Languages**: can't do it;  $M_2$  may never halt, so you can't be sure input is in the difference.

# Concatenation/RE

- Let  $L_1 = L(M_1)$  and  $L_2 = L(M_2)$ .
- Assume  $M_1$  and  $M_2$  are single-semi-infinite-tape TM's.
- Construct 2-tape Nondeterministic TM  $M$ :
  1. Guess a break in input  $w = xy$ .
  2. Move  $y$  to second tape.
  3. Simulate  $M_1$  on  $x$ ,  $M_2$  on  $y$ .
  4. Accept if both accept.

# Concatenation/Recursive

- Can't use a NTM.
- Systematically try each break  $w = xy$ .
- $M_1$  and  $M_2$  will eventually halt for each break.
- Accept if both accept for any one break.
- Reject if all breaks tried and none lead to acceptance.

# Star

- Same ideas work for each case.
- **RE**: guess many breaks, accept if  $M_1$  accepts each piece.
- **Recursive**: systematically try all ways to break input into some number of pieces.



# Reversal

- Start by reversing the input.
- Then simulate TM for  $L$  to accept  $w$  if and only  $w^R$  is in  $L$ .
- Works for either Recursive or RE languages.

# Inverse Homomorphism

- Apply  $h$  to input  $w$ .
- Simulate TM for  $L$  on  $h(w)$ .
- Accept  $w$  iff  $h(w)$  is in  $L$ .
- Works for Recursive or RE.

# Homomorphism/RE

- Let  $L = L(M_1)$ .
- Design NTM  $M$  to take input  $w$  and guess an  $x$  such that  $h(x) = w$ .
- $M$  accepts whenever  $M_1$  accepts  $x$ .
- **Note:** won't work for Recursive languages.