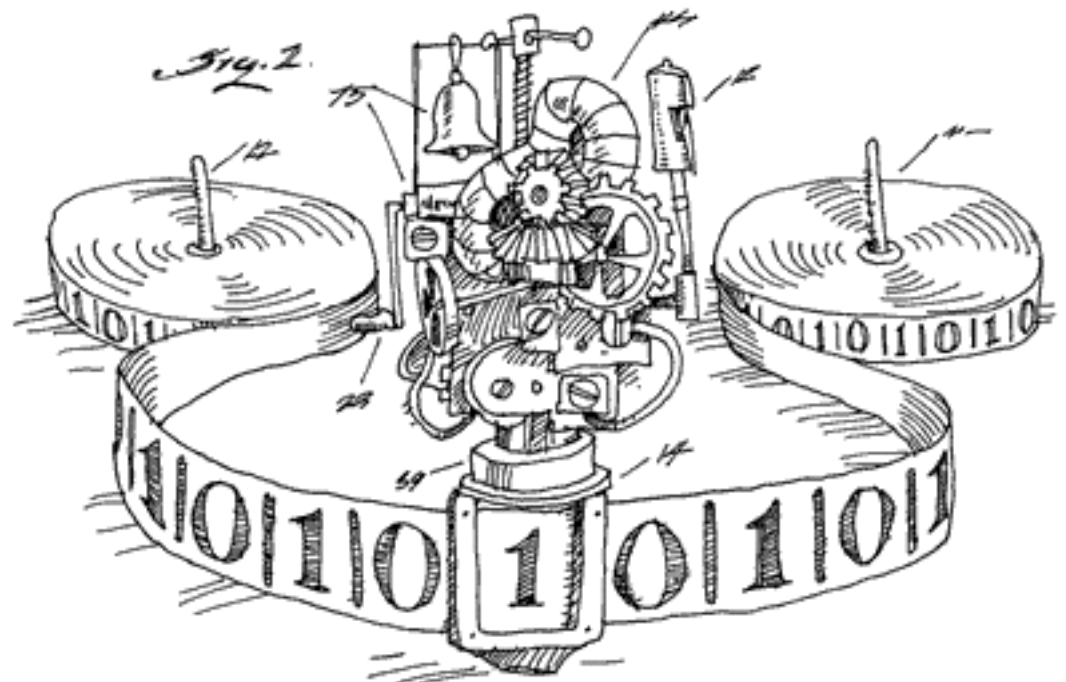


15-251

Great Theoretical Ideas in Computer Science

Lecture 4: Turing's Legacy



September 10th, 2015

This Week



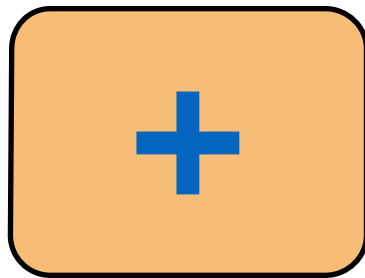
What is **computation**?

What is an **algorithm**?

How can we mathematically define them?

Let's assume two things about our world

No “universal” machines exist.



Identify these with the corresponding algorithms.

We only have machines to solve **decision problems**.

Definitions from last time

Σ^* = the set of all finite length strings over Σ

A subset $L \subseteq \Sigma^*$ is called a *language*.

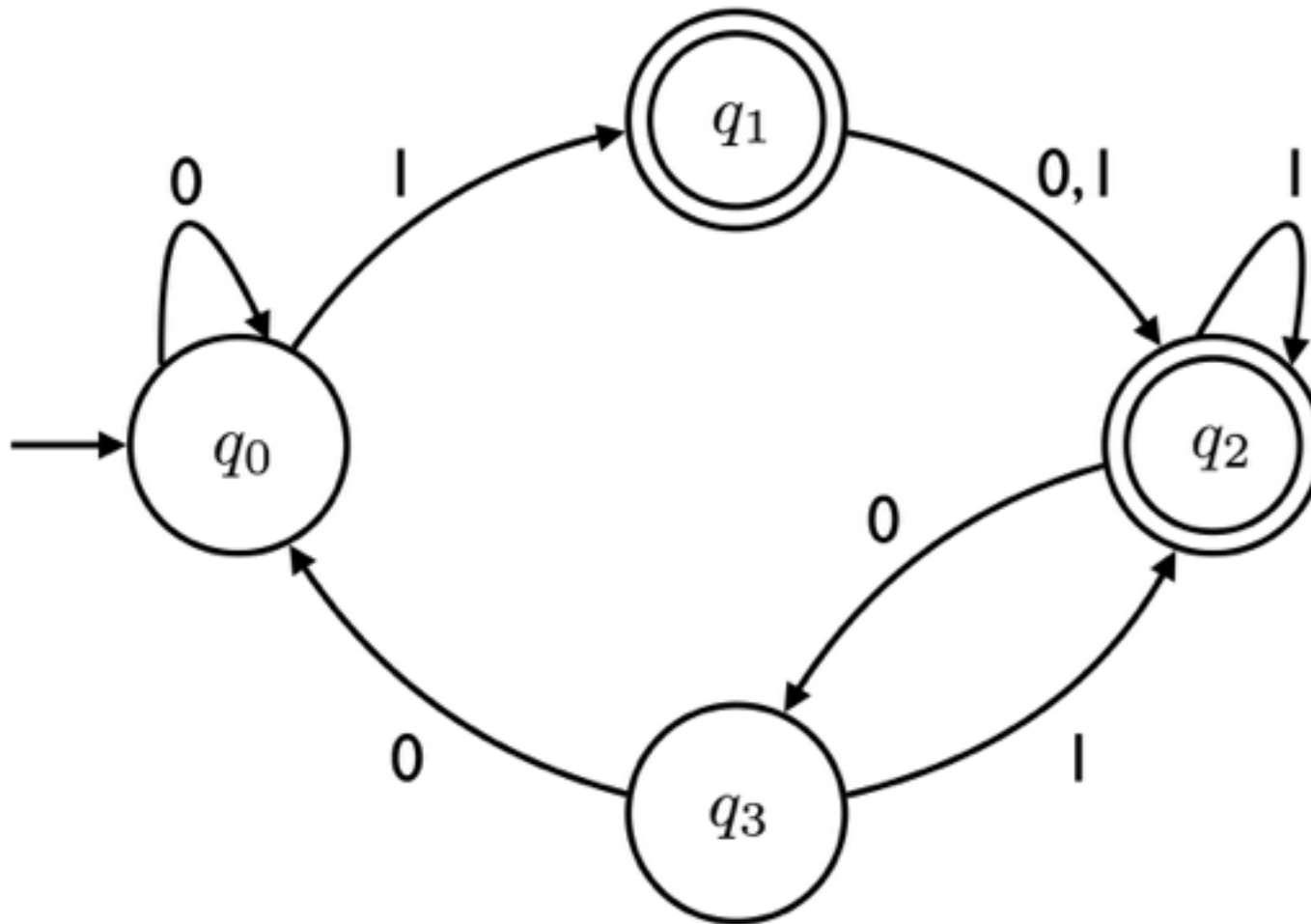
A *computational problem* is a function $f : \Sigma^* \rightarrow \Sigma^*$.

A *decision problem* is a function $f : \Sigma^* \rightarrow \{0, 1\}$.

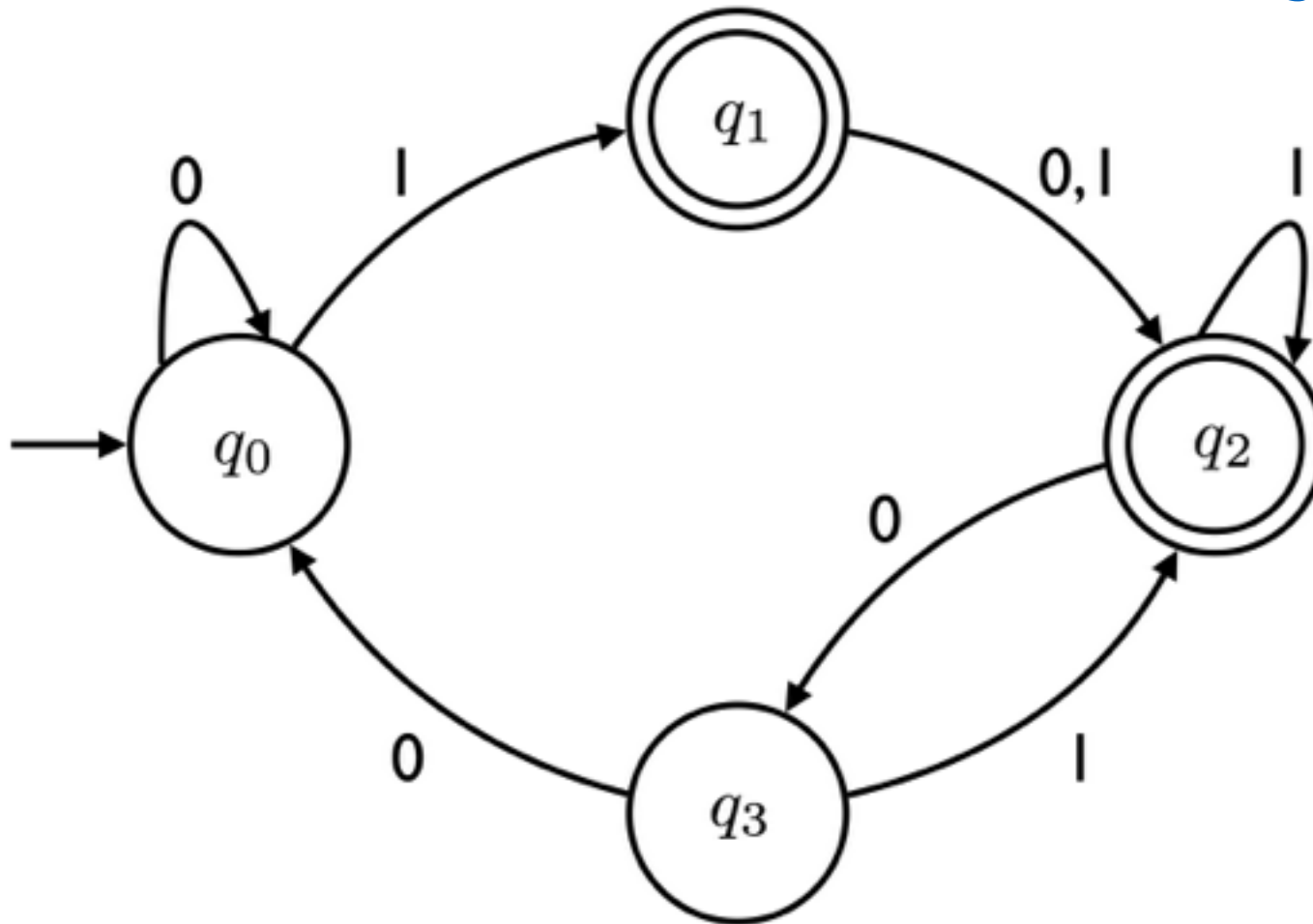
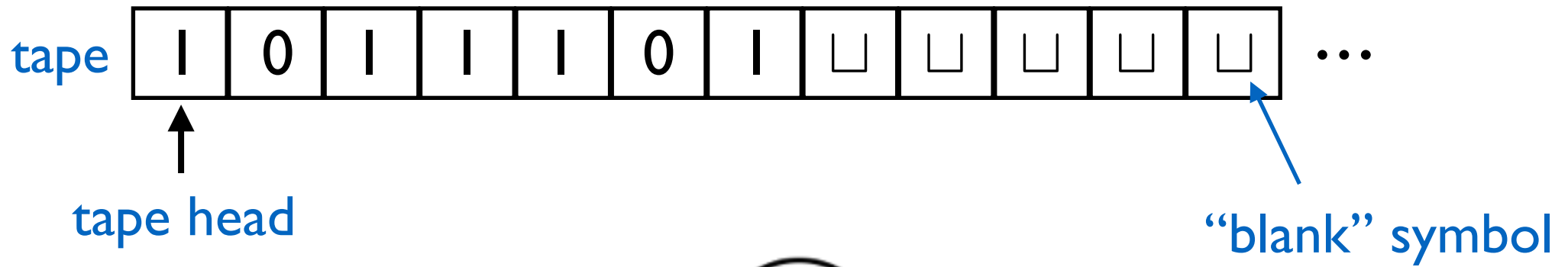
There is a one-to-one correspondence between *decision problems* and *languages*.

DFA state diagram

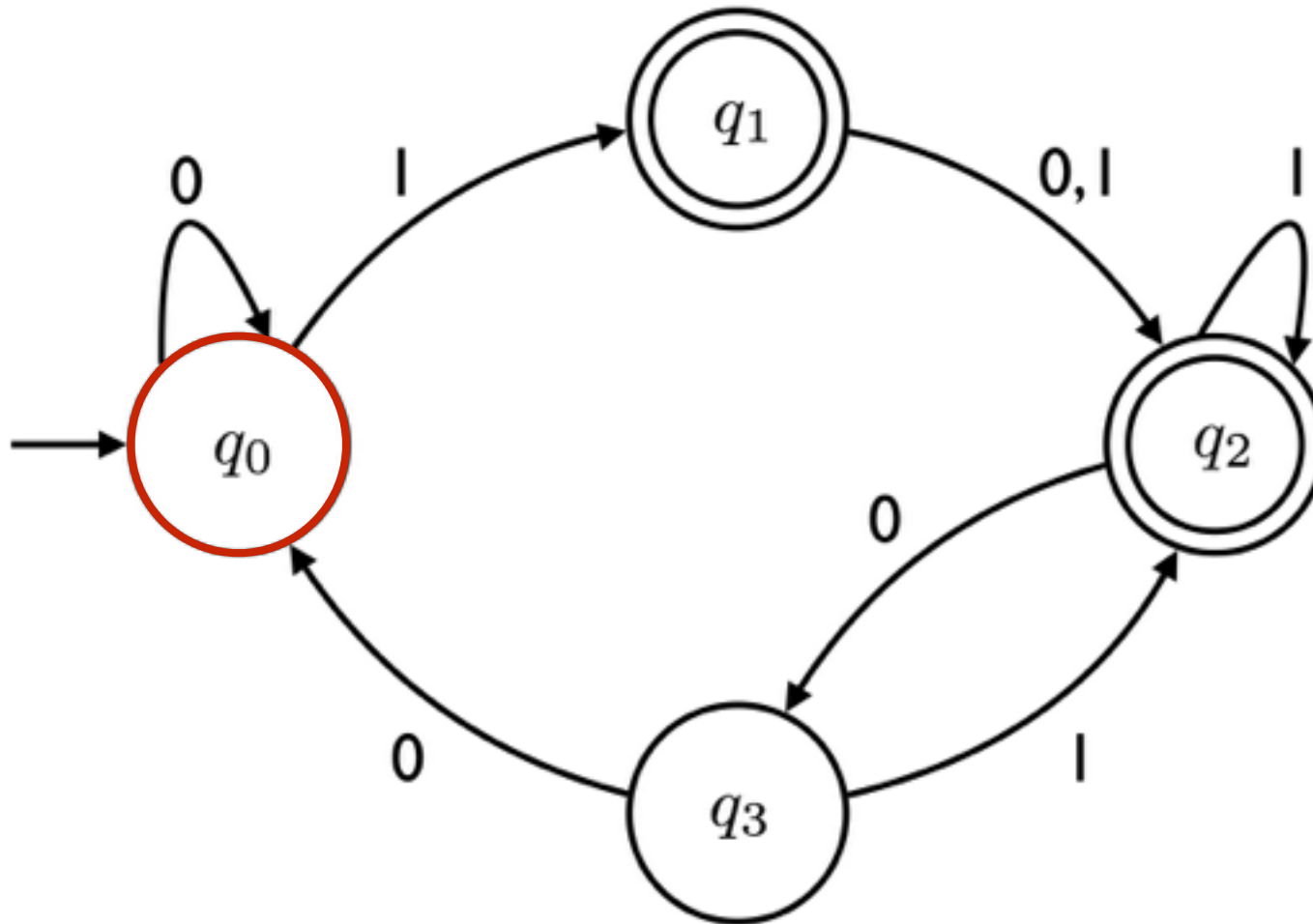
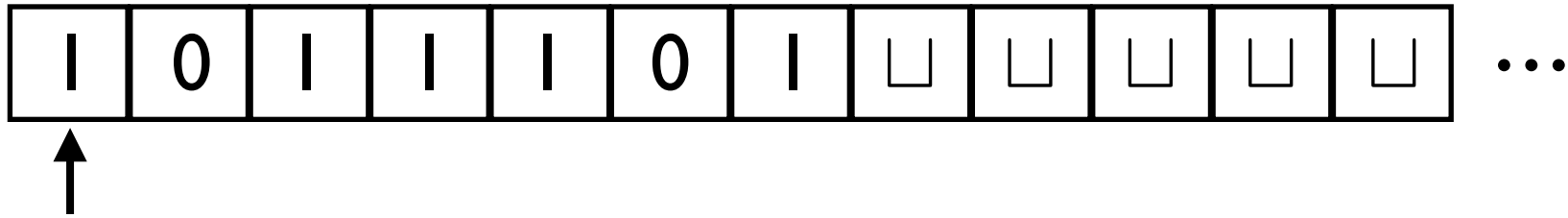
Input: 01111
↑



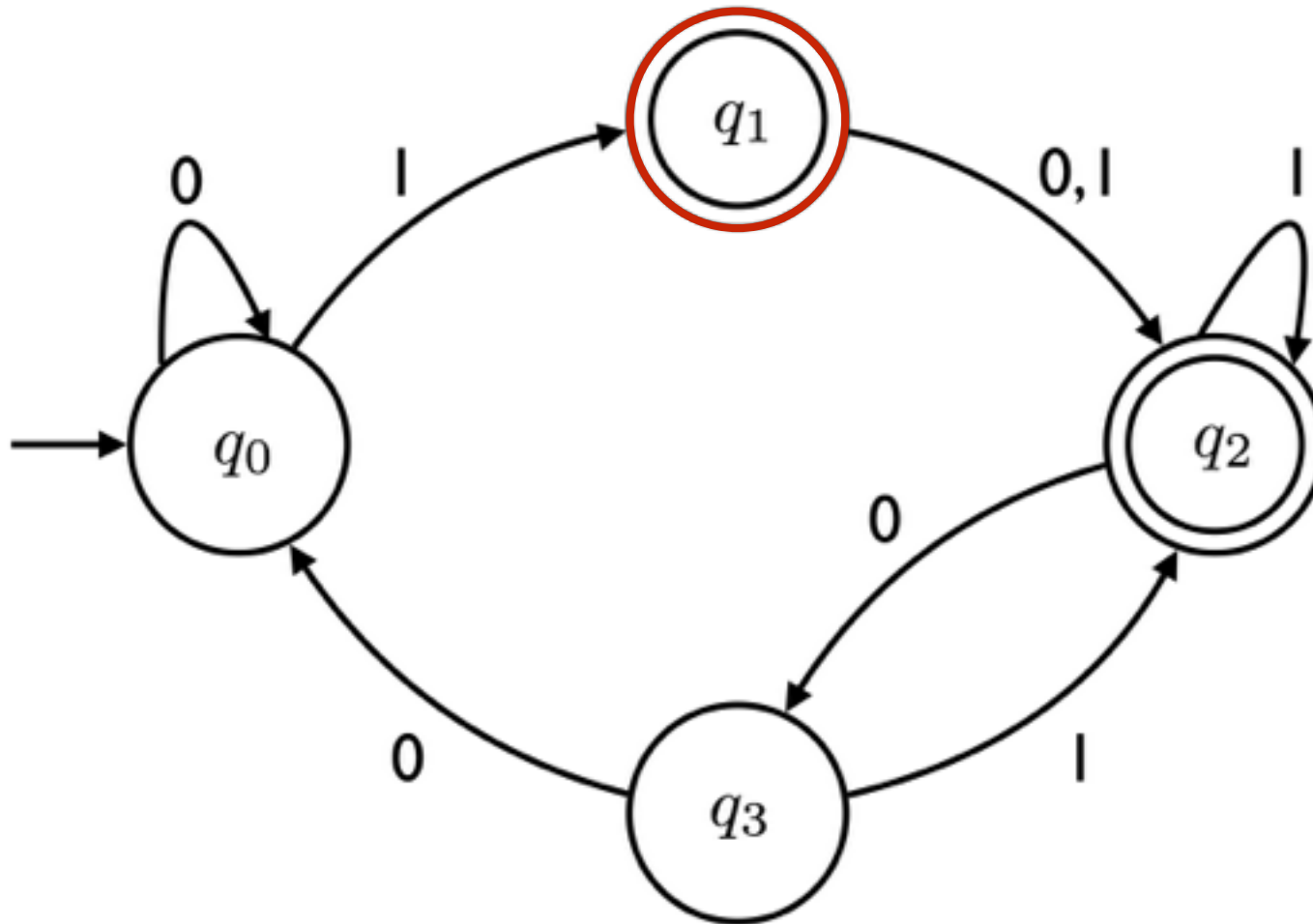
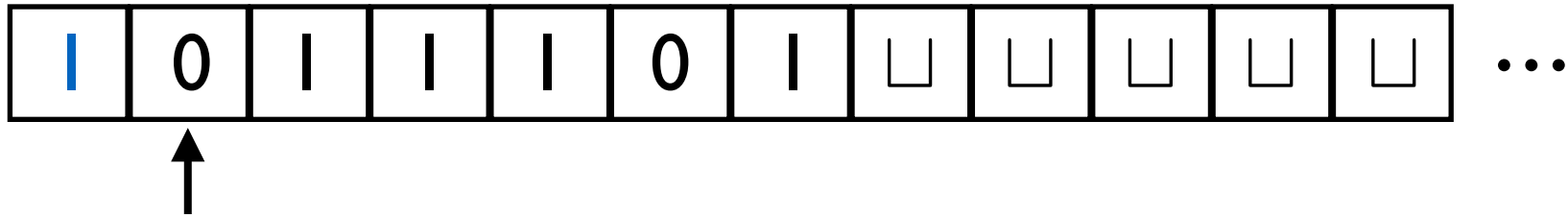
DFA: state diagram + input tape



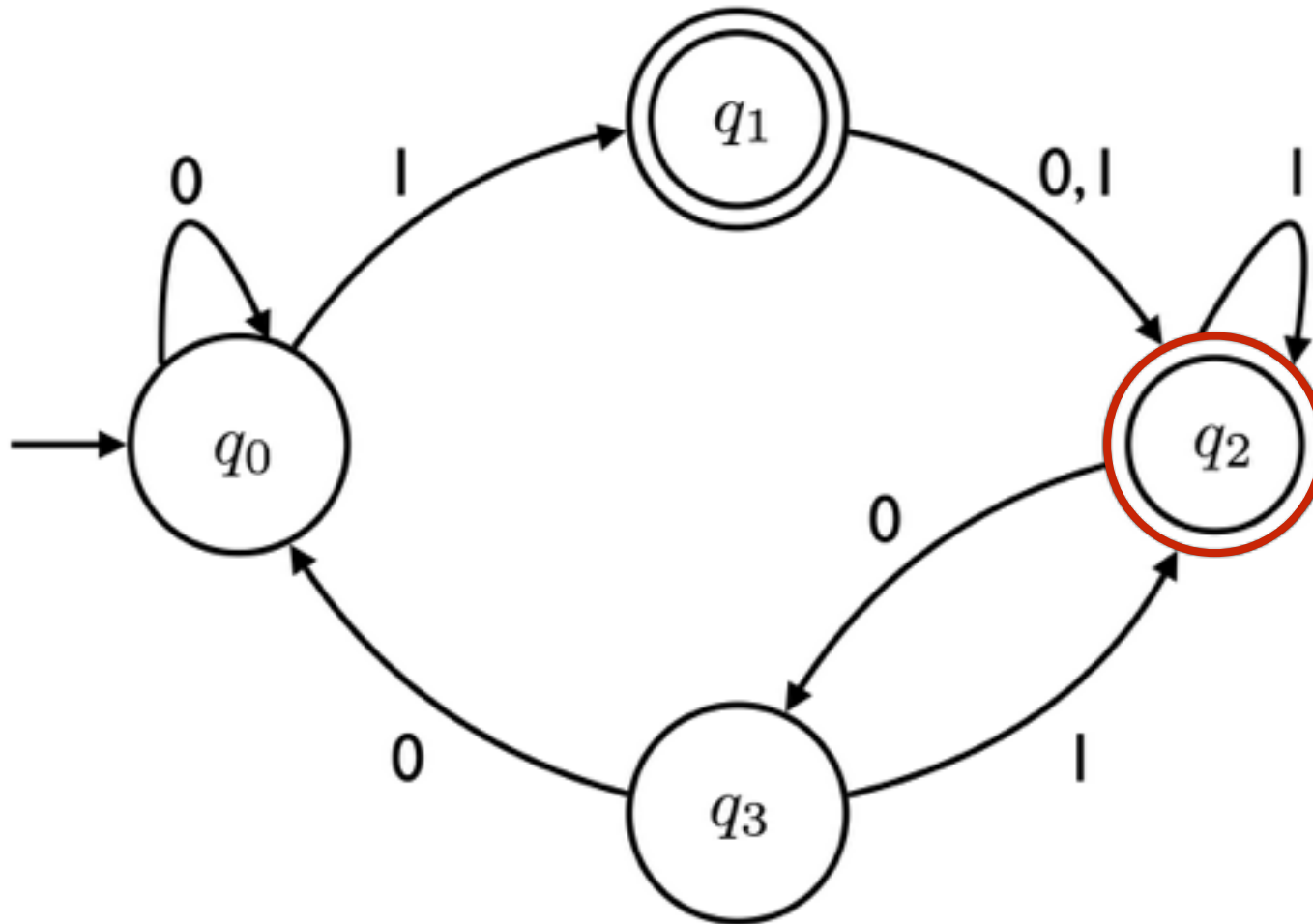
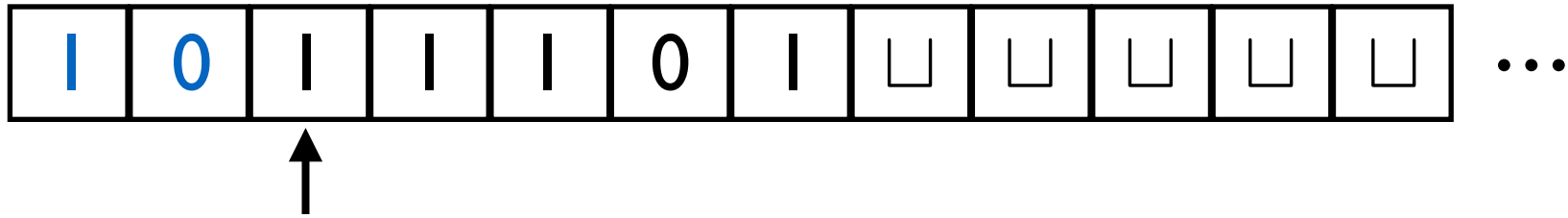
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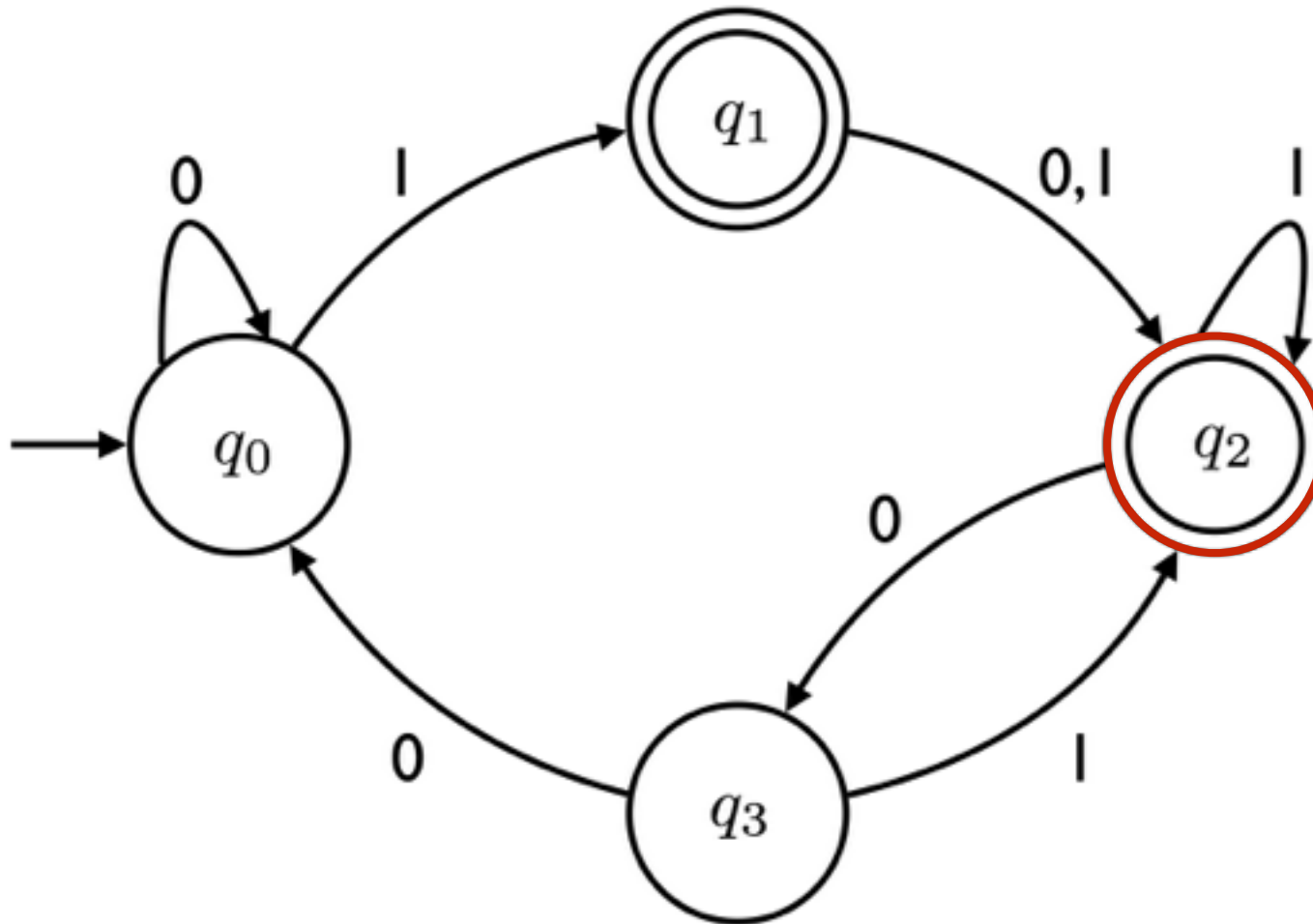
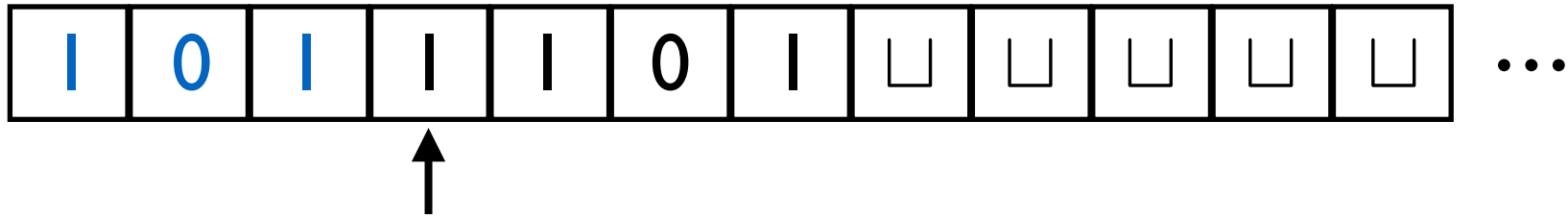
DFA: state diagram + input tape



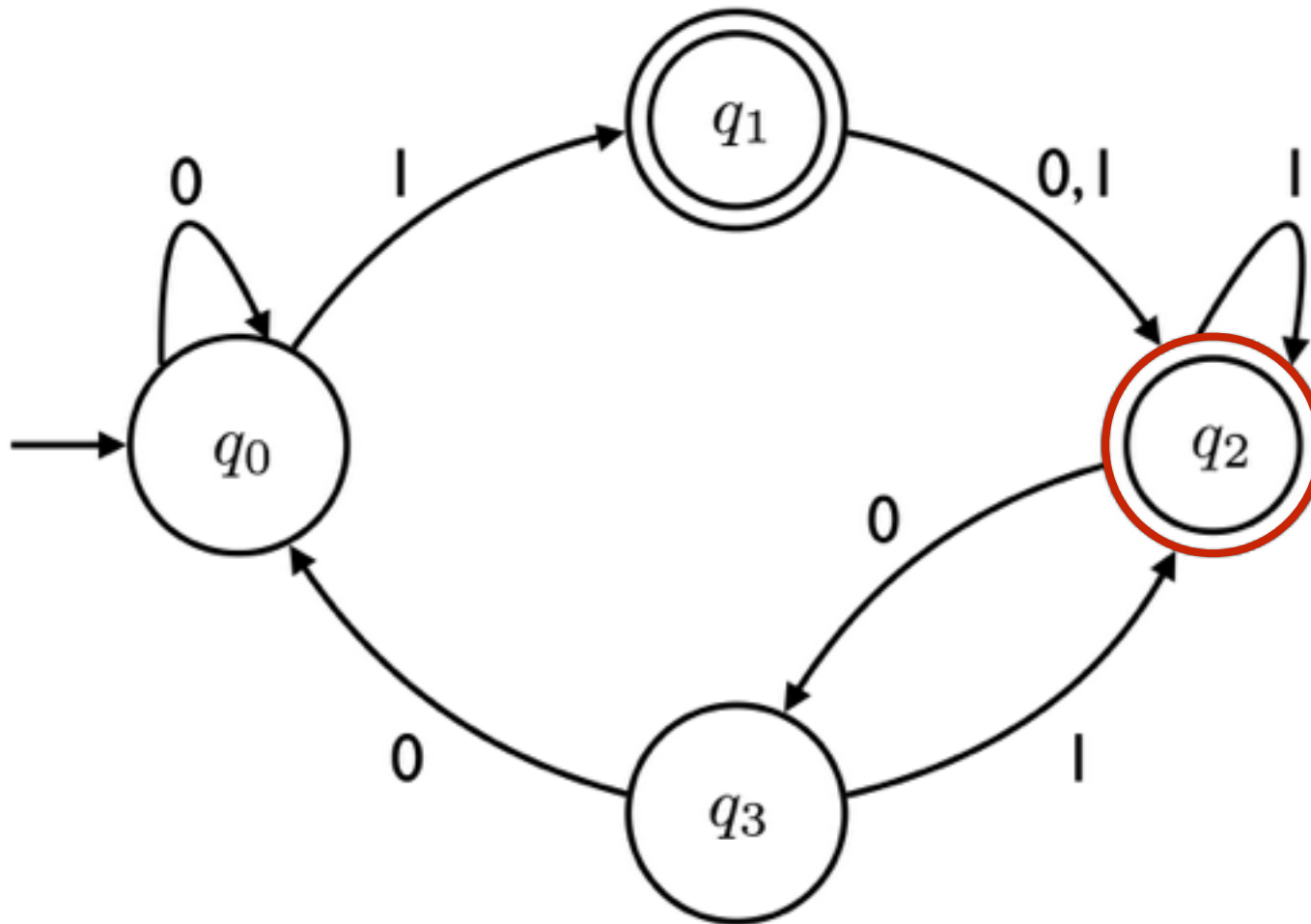
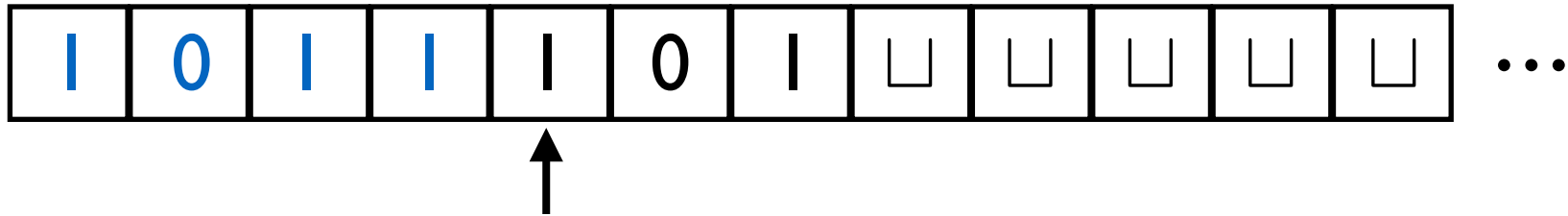
DFA: state diagram + input tape



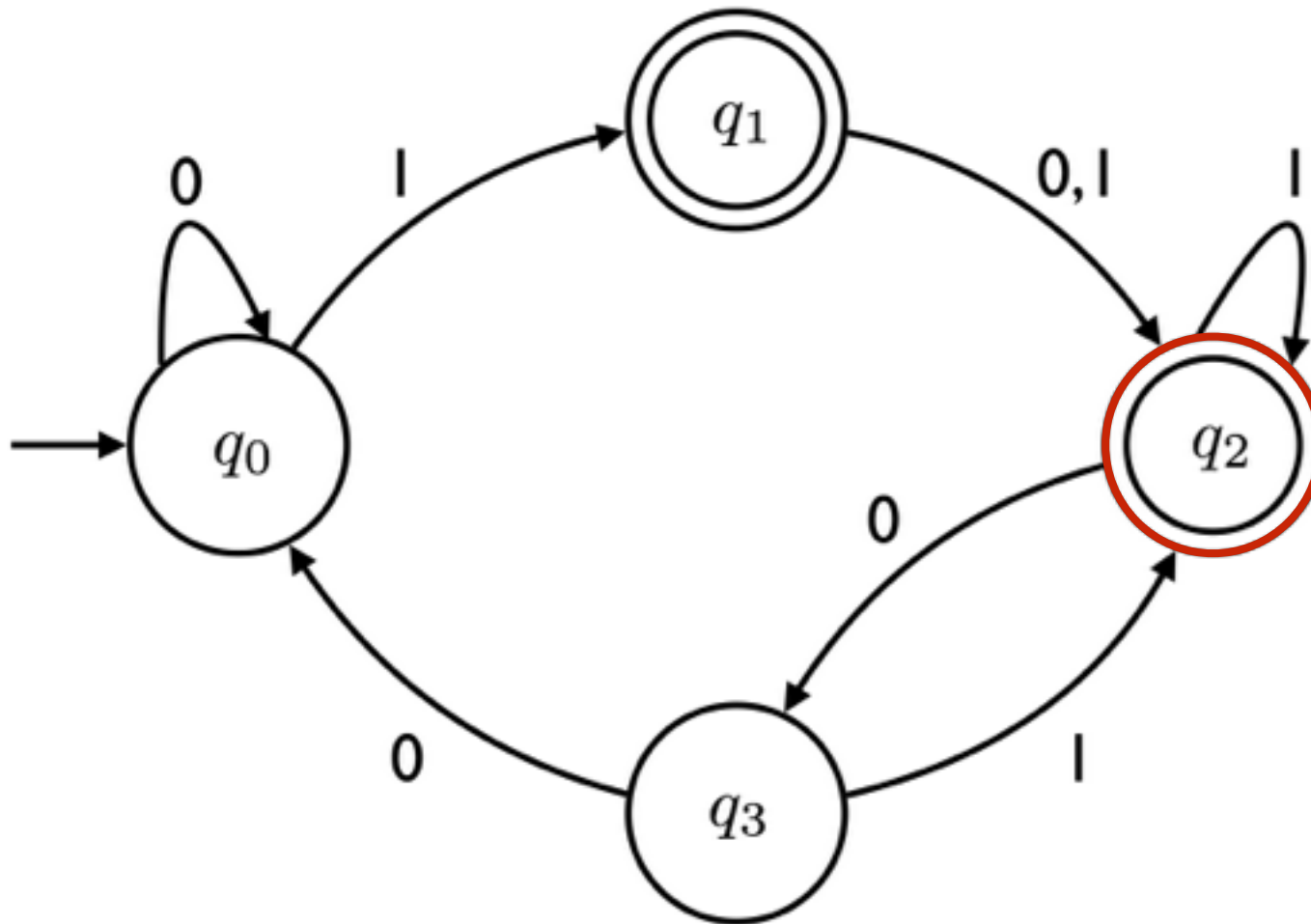
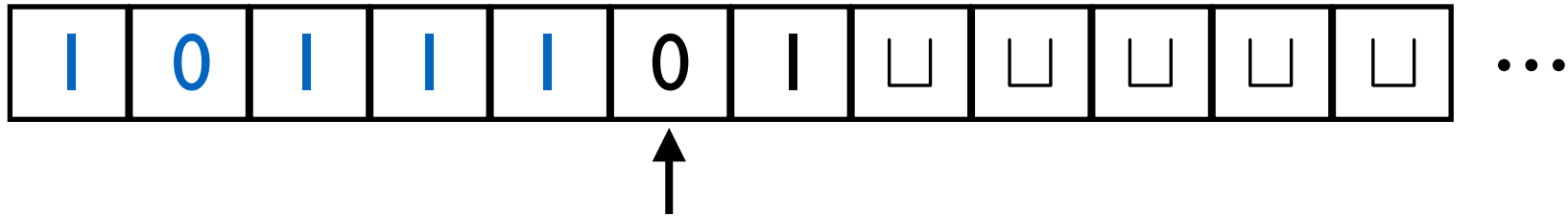
DFA: state diagram + input tape



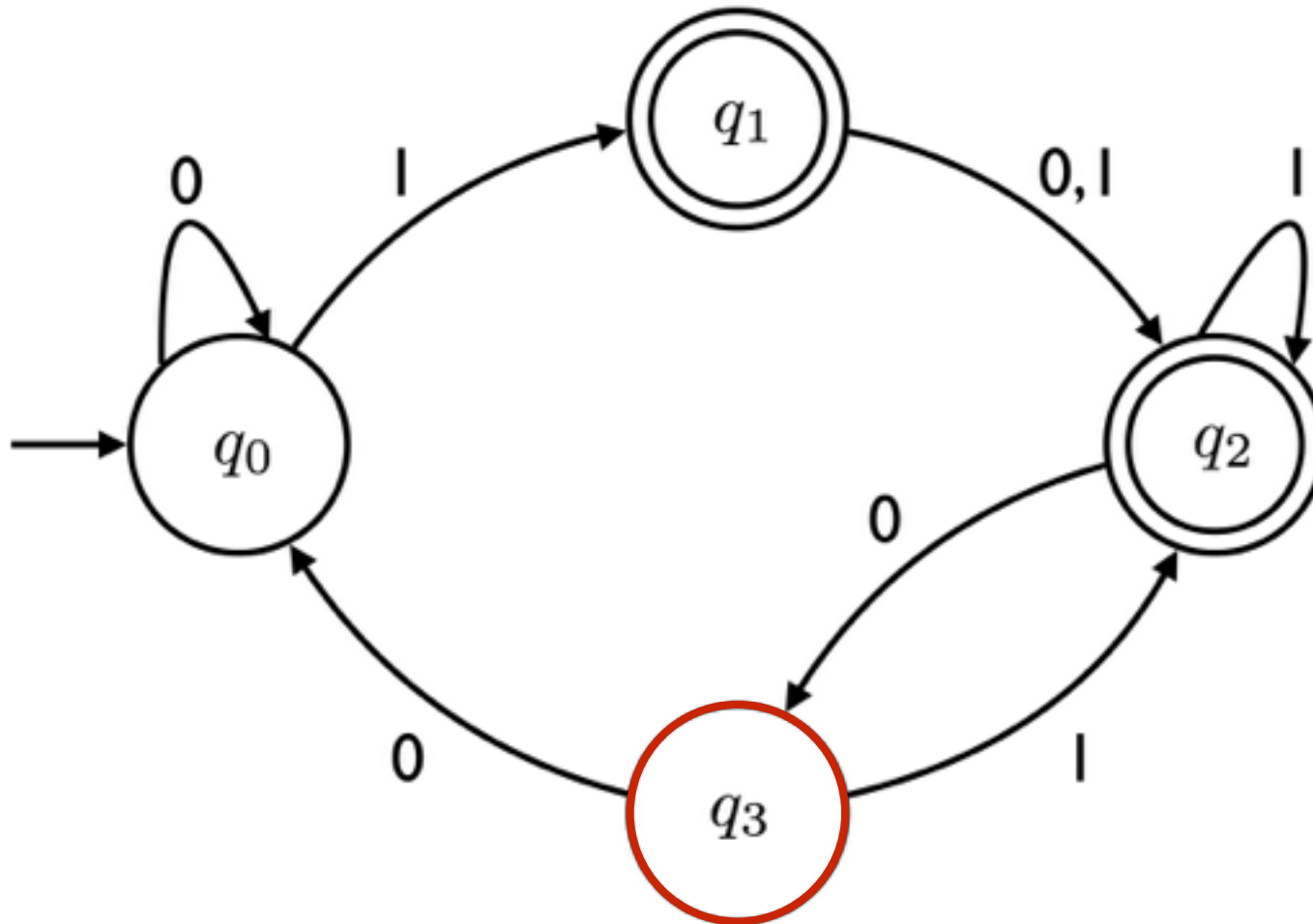
DFA: state diagram + input tape



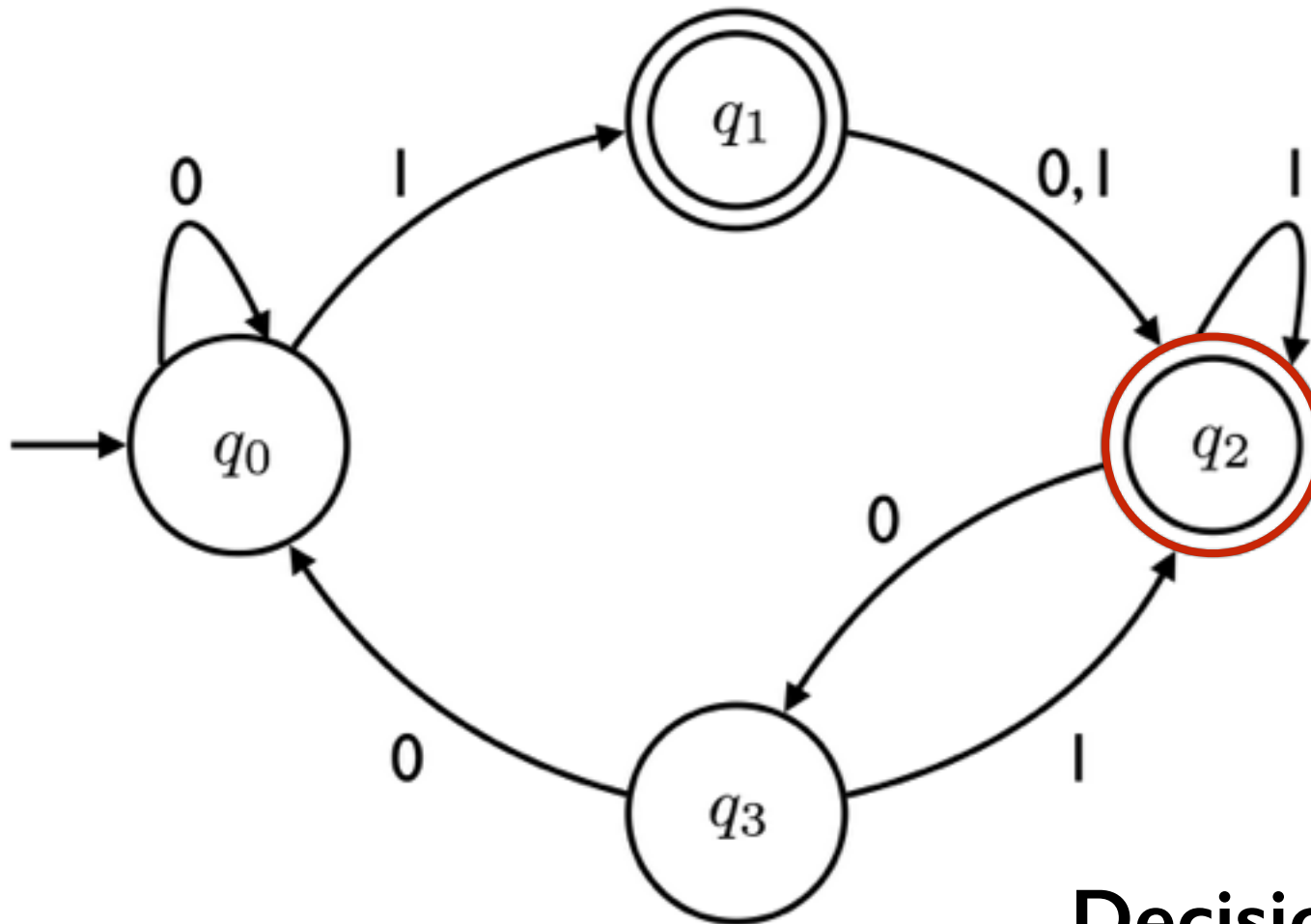
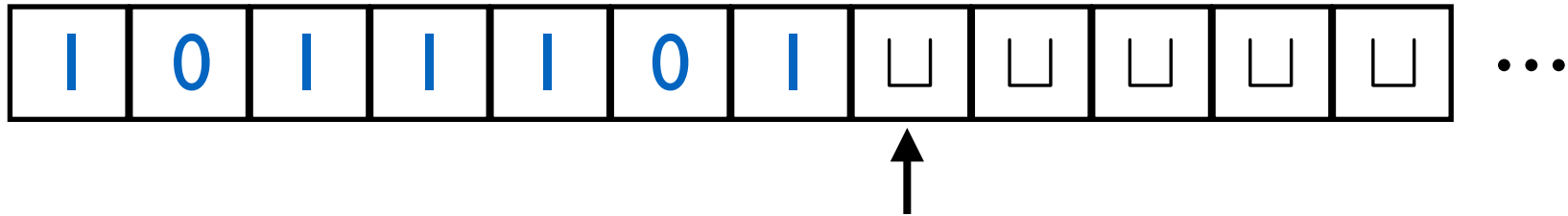
DFA: state diagram + input tape



DFA: state diagram + input tape



DFA: state diagram + input tape



Decision: **Accept**

DFA as a programming language

```
def foo(input):
```

```
  i = 0;
```

```
  STATE 0:
```

```
    if (i == input.length): return False;
```

```
    letter = input[i];
```

```
    i++;
```

```
    switch(letter):
```

```
      case '0': go to STATE 0;
```

```
      case '1': go to STATE 1;
```

```
  STATE 1:
```

```
    if (i == input.length): return True;
```

```
    letter = input[i];
```

```
    i++;
```

```
    switch(letter):
```

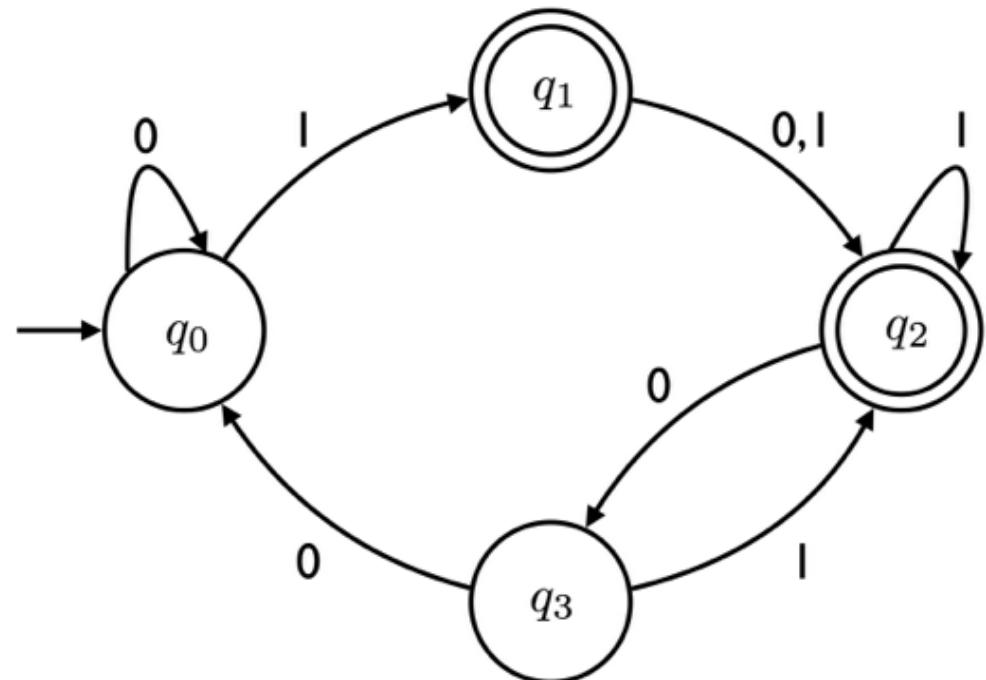
```
      case '0': go to STATE 2;
```

```
      case '1': go to STATE 2;
```

```
  ...
```

input =

0	1	1	1	1
---	---	---	---	---



Formal definition: DFA

A **deterministic finite automaton (DFA)** M is a 5-tuple

$$M = (Q, \Sigma, \delta, q_0, F)$$

where

- Q is a finite set (which we call the **set of states**);
- Σ is a finite set (which we call the **alphabet**);
- δ is a function of the form $\delta : Q \times \Sigma \rightarrow Q$ (which we call the **transition function**);
- $q_0 \in Q$ is an element of Q (which we call the **start state**);
- $F \subseteq Q$ is a subset of Q (which we call the **set of accepting states**).

Formal definition: DFA accepting a string

Let $w = w_1w_2 \cdots w_n$ be a string over an alphabet Σ .

Let $M = (Q, \Sigma, \delta, q_0, F)$ be a DFA.

We say that M **accepts** the string w if there exists a sequence of states $r_0, r_1, \dots, r_n \in Q$ such that

- $r_0 = q_0$;
- $\delta(r_{i-1}, w_i) = r_i$ for each $i \in \{1, 2, \dots, n\}$;
- $r_n \in F$.

Otherwise we say M **rejects** the string w .

Definition: Regular languages

Definition: A language L is called *regular* if $L = L(M)$ for some DFA M .

2 Theorems

Theorem:

The language $L = \{0^n 1^n : n \in \mathbb{N}\}$ is **not** regular.

Theorem:

Let Σ be some finite alphabet.

If $L_1 \subseteq \Sigma^*$ and $L_2 \subseteq \Sigma^*$ are regular, then so is $L_1 \cup L_2$.



What is **computation**?

What is an **algorithm**? A specification that describes how information is transformed.

How can we mathematically define them?

The properties we want from the definition:

Simplicity! (the simpler the better)

Generality! (general enough to capture all of computation)

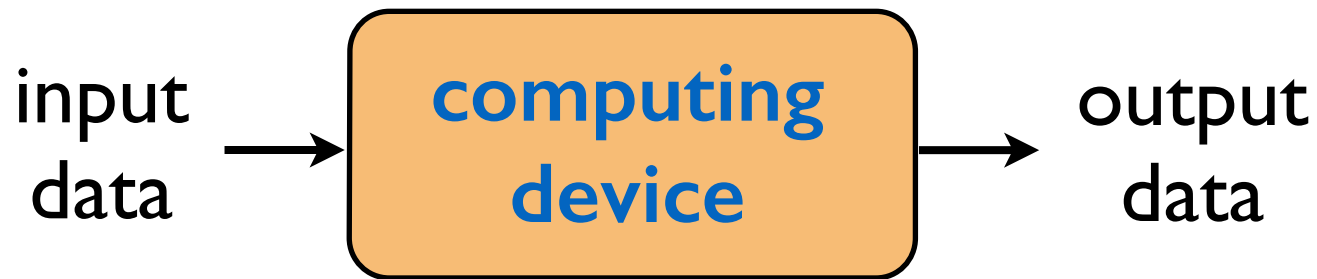


1900

1936

2015

Goal is to reach the definition of a Turing machine.

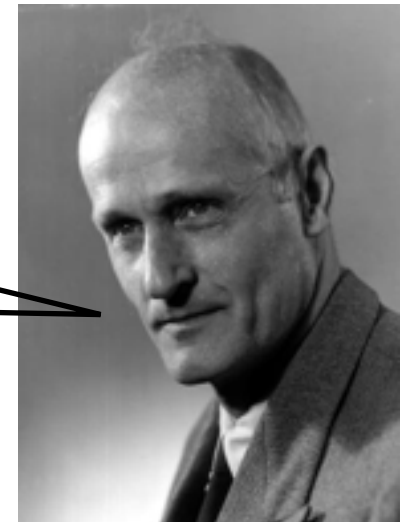


2 important observations:

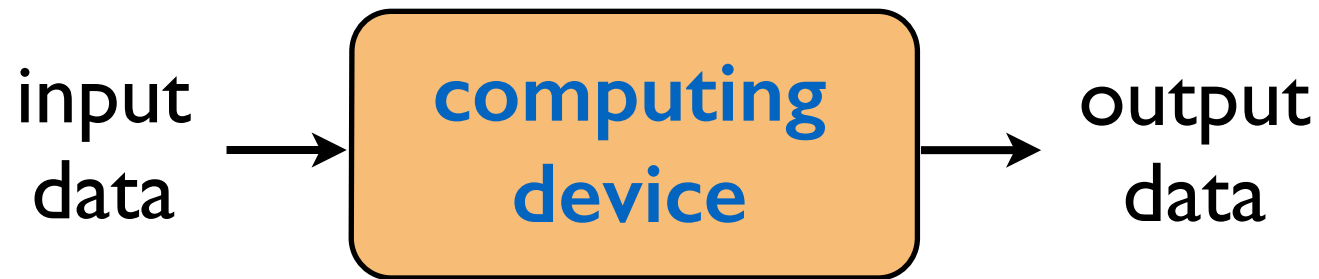
1. The device should be a “finite object”.

An algorithm should be a “finite object”.

An algorithm is a finite answer to infinite number of questions.



Stephen Kleene

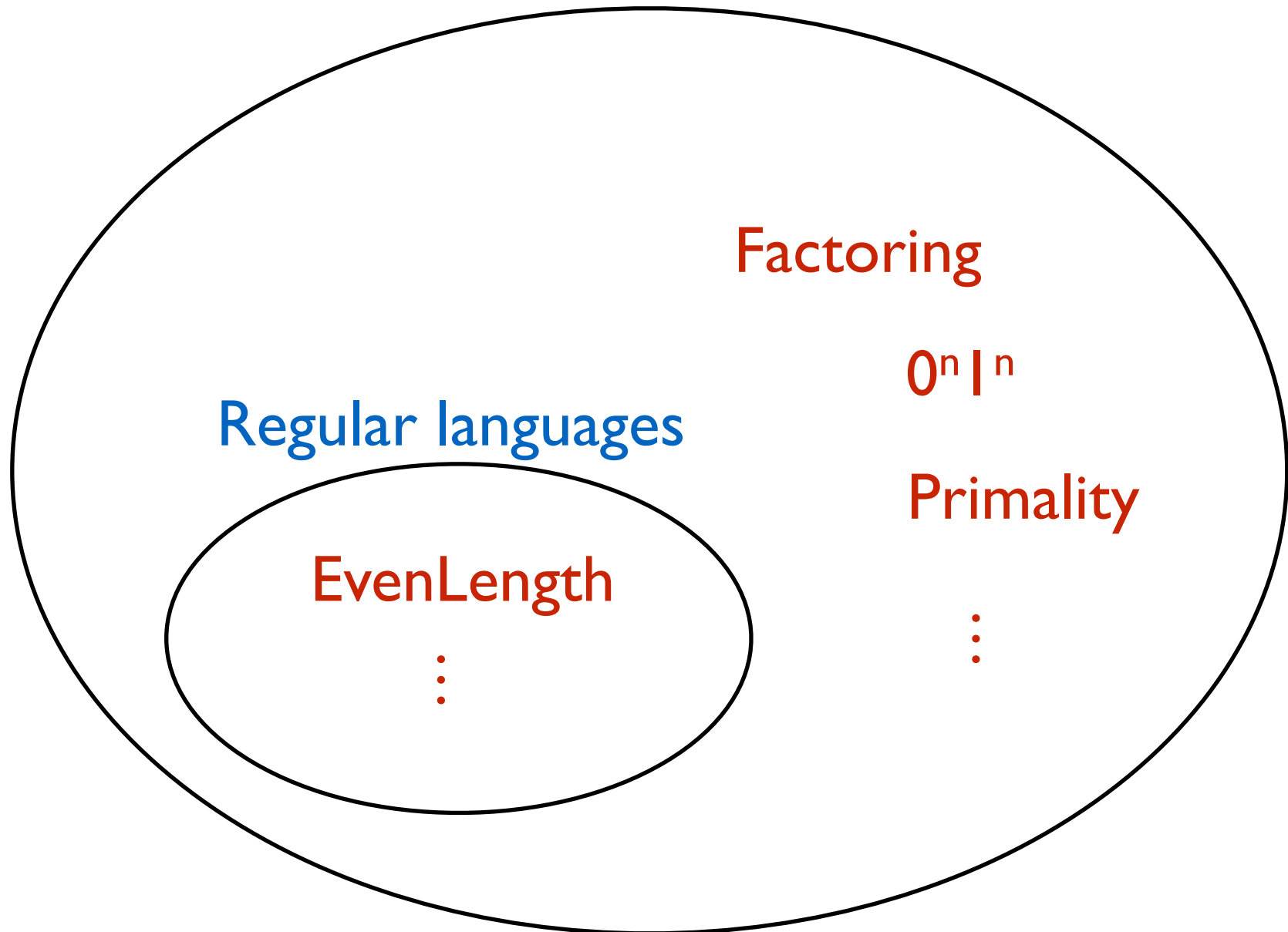


2 important observations:

2. The device should be able to use “unlimited memory”.
(there is always more space to work on, if needed)

Wouldn't be mathematically natural otherwise.

Solvable with any
computing device



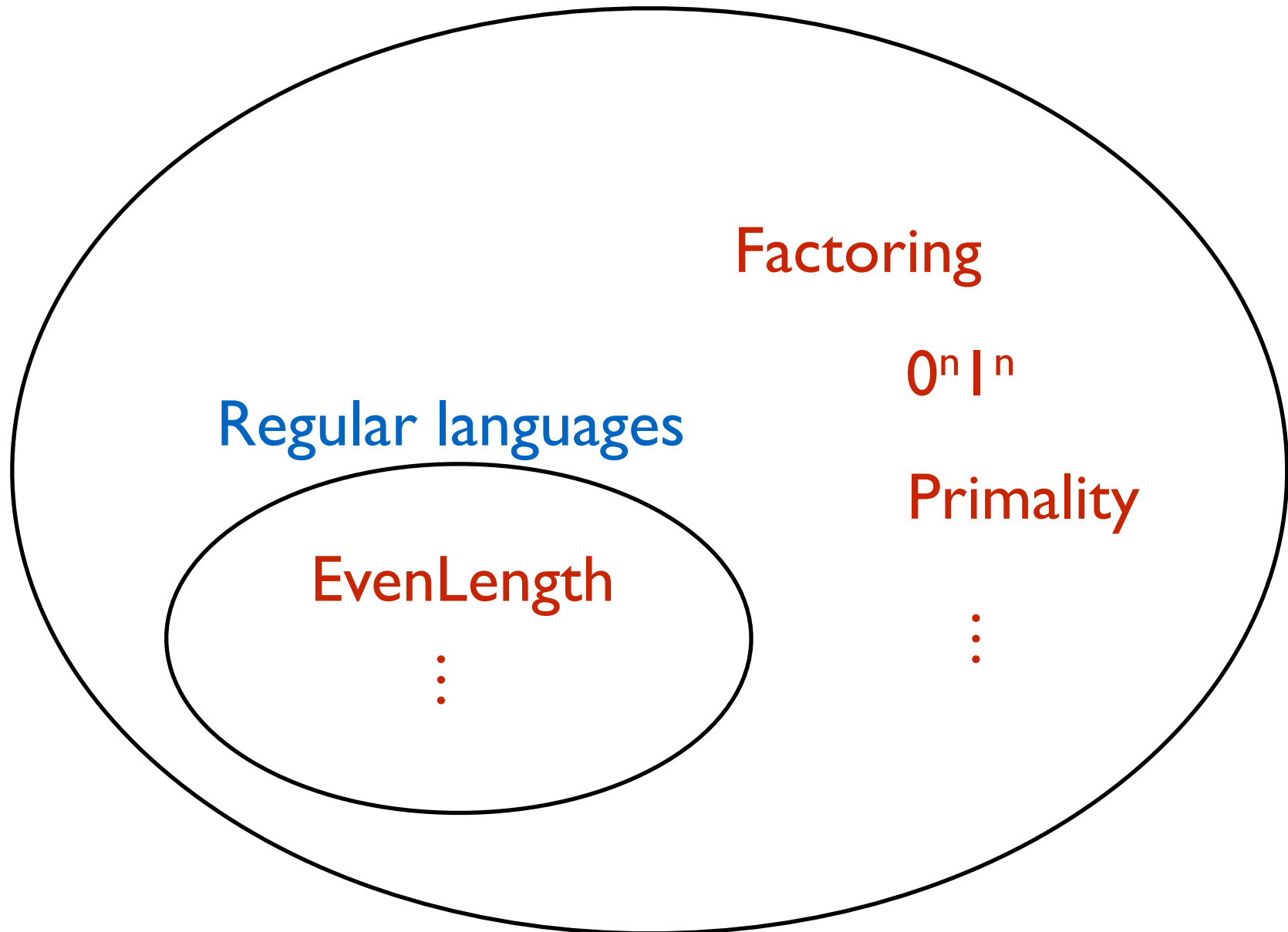
Solving $0^n 1^n$ in Python

```
def foo(input):  
    i = 0  
    j = len(input) - 1  
    while(j >= i):  
        if(input[i] != '0' or input[j] != '1'):  
            return False  
        i = i + 1  
        j = j - 1  
    return True
```

Solving $0^n 1^n$ in C

```
int foo(char input[])
{
    int i = 0, j;
    while(input[j] != NULL) /* NULL is end-of-string character */
        j++;
    j--;
    while(j >= i)
    {
        if(input[i] != '0' || input[j] != '1')
            return 0; /* Reject */
        i++;
        j--;
    }
    return 1; /* Accept */
}
```

Solvable with Python?



Should we define **computable** to mean what is computable by a Python function/program?

Downsides as a formal definition?

- Why choose Python, why not C, Java, SML,... ?
Are these equivalent?
solvable in Python = solvable in C?
- Extremely complicated to define rigorously.
(even bytecode)

Should we define **computable** to mean what is computable by a Python function/program?

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(even bytecode)

So what we want is:

A **totally minimal (TM)** programming language such that

- it can simulate simple bytecode
(and therefore Python, C, Java, SML, etc...)
- it is simple to define and reason about completely mathematically rigorously

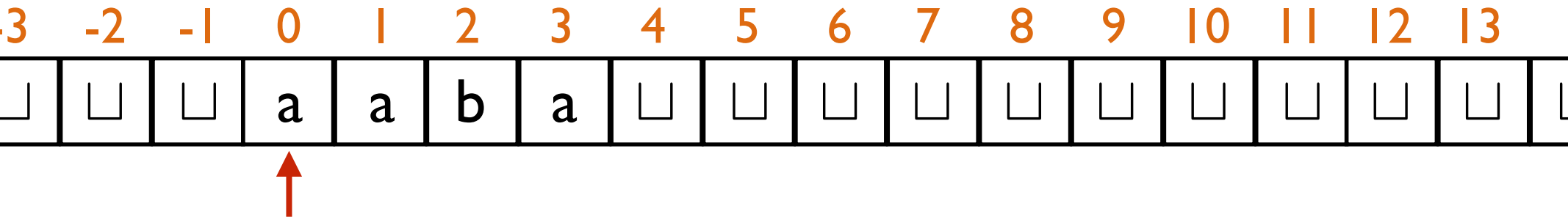
Actually **TM** stands for Turing machine.



Defined by Alan Turing in a paper he wrote in 1936 while he was a PhD student.

Turing machine description

TM \approx DFA + infinite tape



Input is written on the tape starting at index **0**.

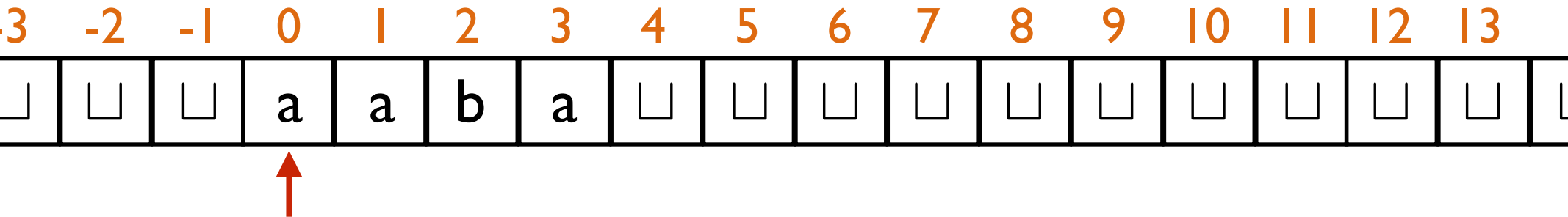
All other cells contain the *blank* symbol \square .

There is a tape **pointer/head** (initially at position 0).

You can read & write to the tape cell pointed to.

Turing machine description

TM \approx DFA + infinite tape



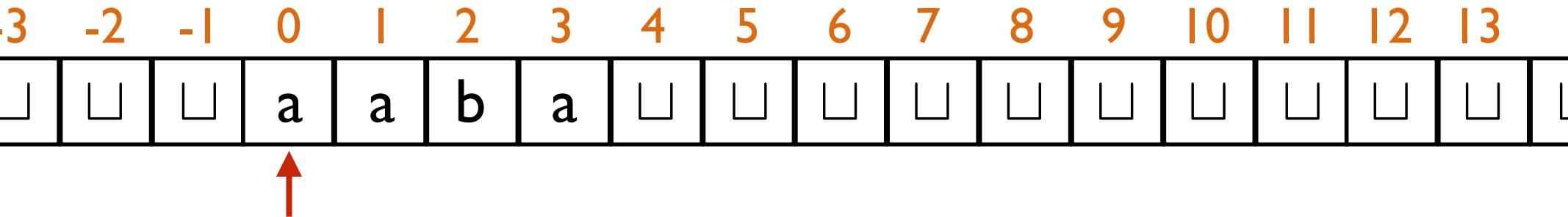
TM could have been defined as a sequence of instructions, where the allowed instructions are:

- > Move the head left
- > Move the head right
- > Write a symbol a (from the alphabet)
- > If head is reading symbol a , GOTO step j
- > Halt and accept
- > Halt and reject

But, we want to keep the def'n as simple as possible.

Turing machine description

TM \approx DFA + infinite tape



So a TM is a sequence of steps (states), each looking like:

STATE 0:

switch(letter under the head):

- case 'a': **write** 'b'; **move** Left; **go to** STATE 2;
- case 'b': **write** '□'; **move** Right; **go to** STATE 0;
- case '□': **write** 'b'; **move** Left; **go to** STATE 1;

Turing machine description

STATE 0:

switch(letter under the head):

case 'a': **write** 'b'; **move** Left; **go to** STATE 2;
case 'b': **write** '␣'; **move** Right; **go to** STATE 0;
case '␣': **write** 'b'; **move** Left; **go to** STATE 1;

At each step, you have to:

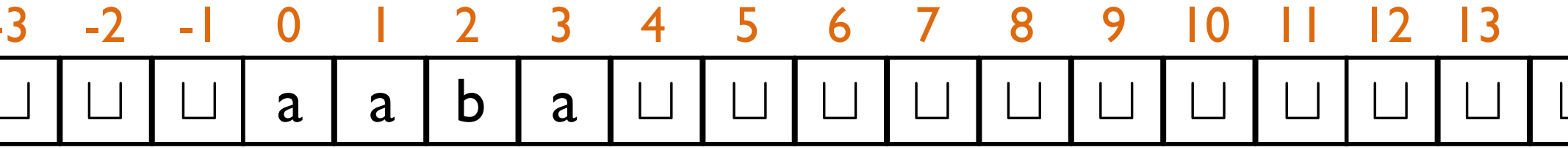
- write a *new* symbol to the cell under the head
- move tape head Left or Right
- go to a *new* state

Don't want to change the symbol: write the same symbol.

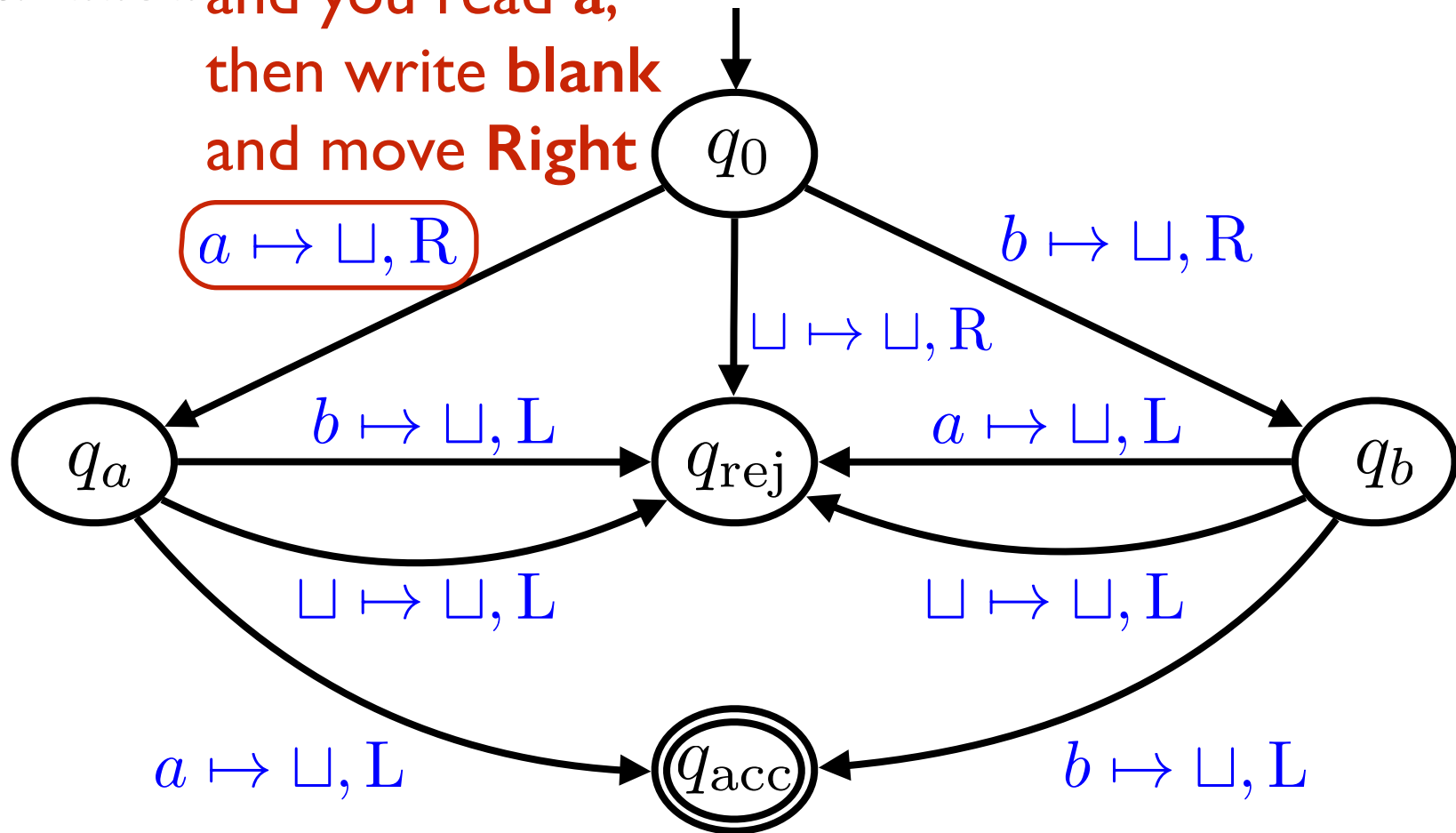
Want to stay put: move Left then Right.

Don't want to change state: go to the same state.

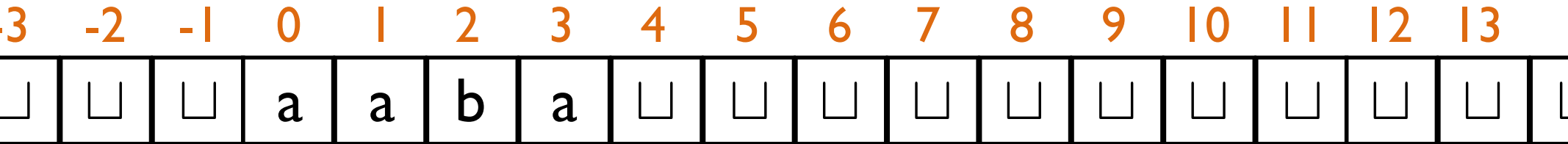
Turing machine official picture



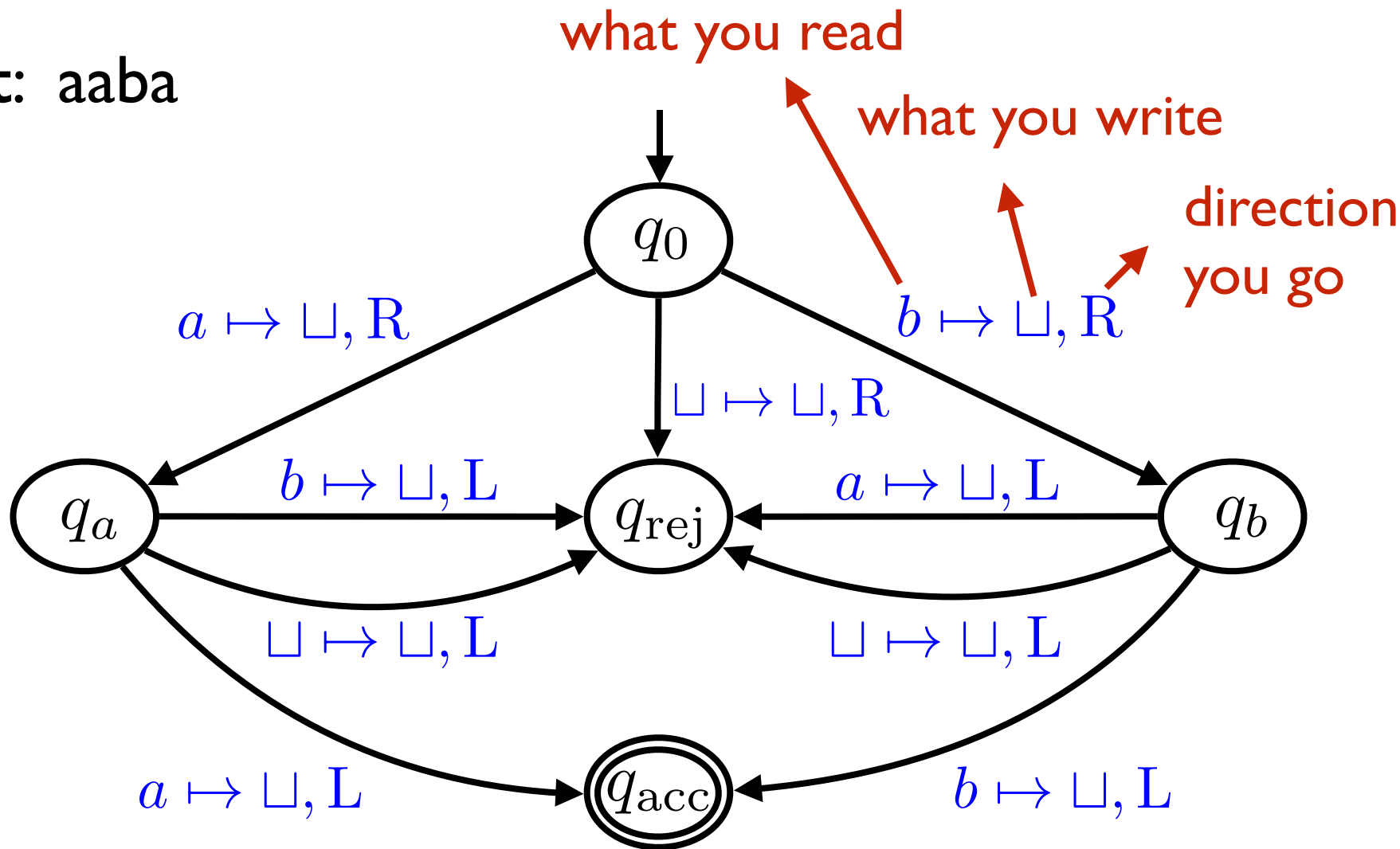
Input: aaba if you are in state 0 and you read a, then write blank and move Right



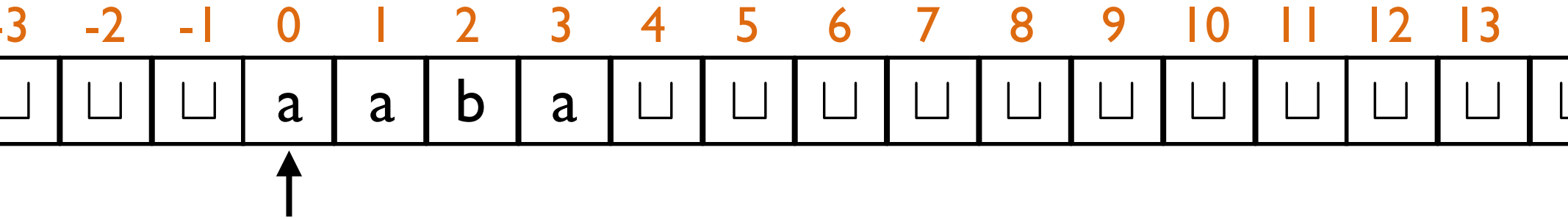
Turing machine official picture



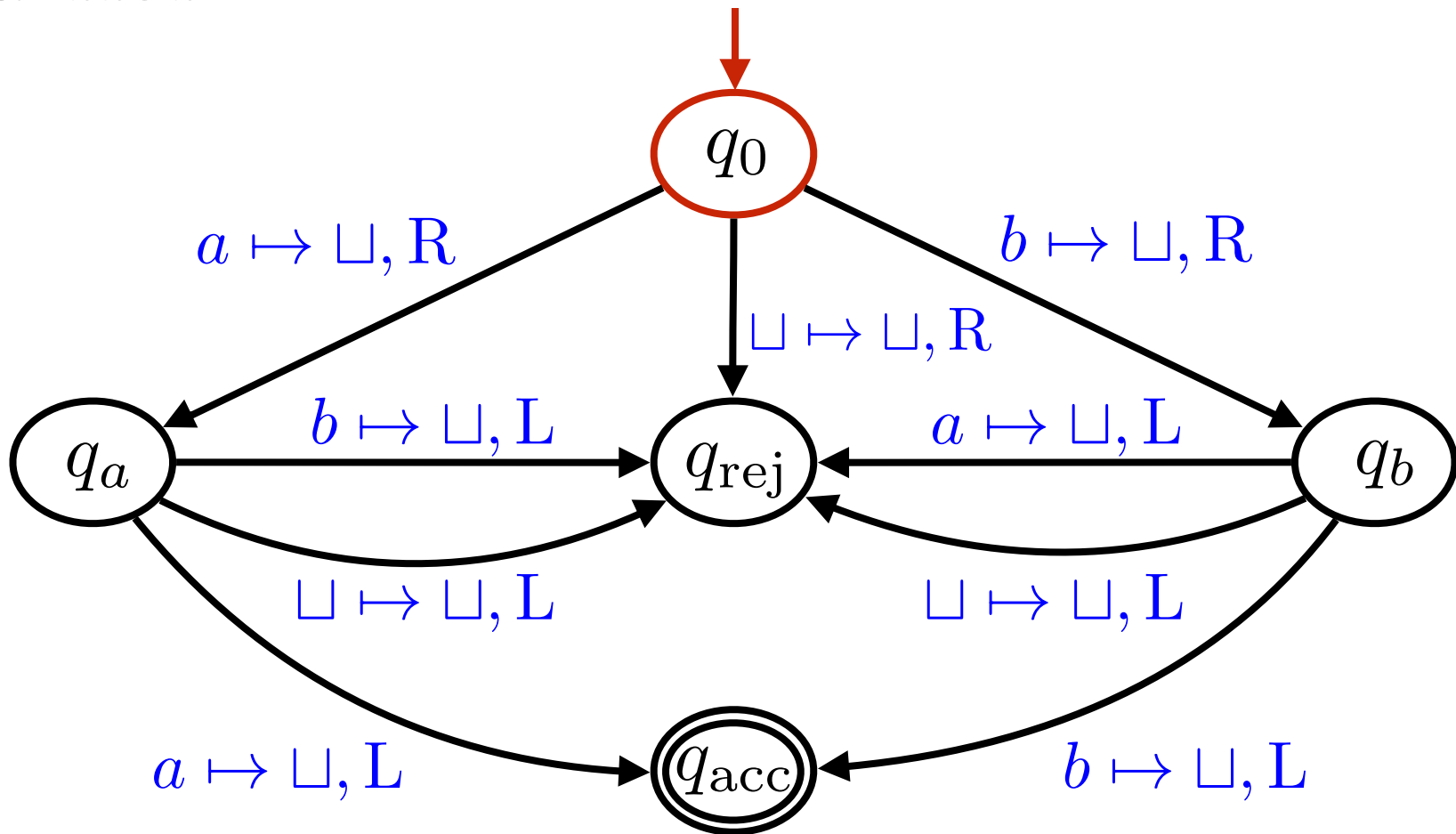
Input: aaba



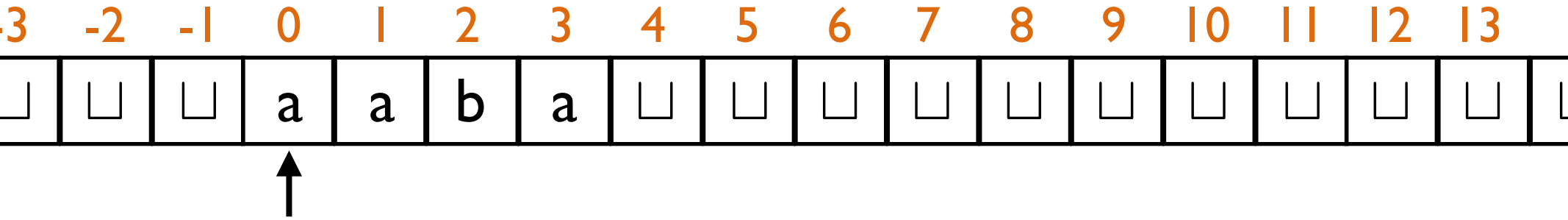
Turing machine simulation example



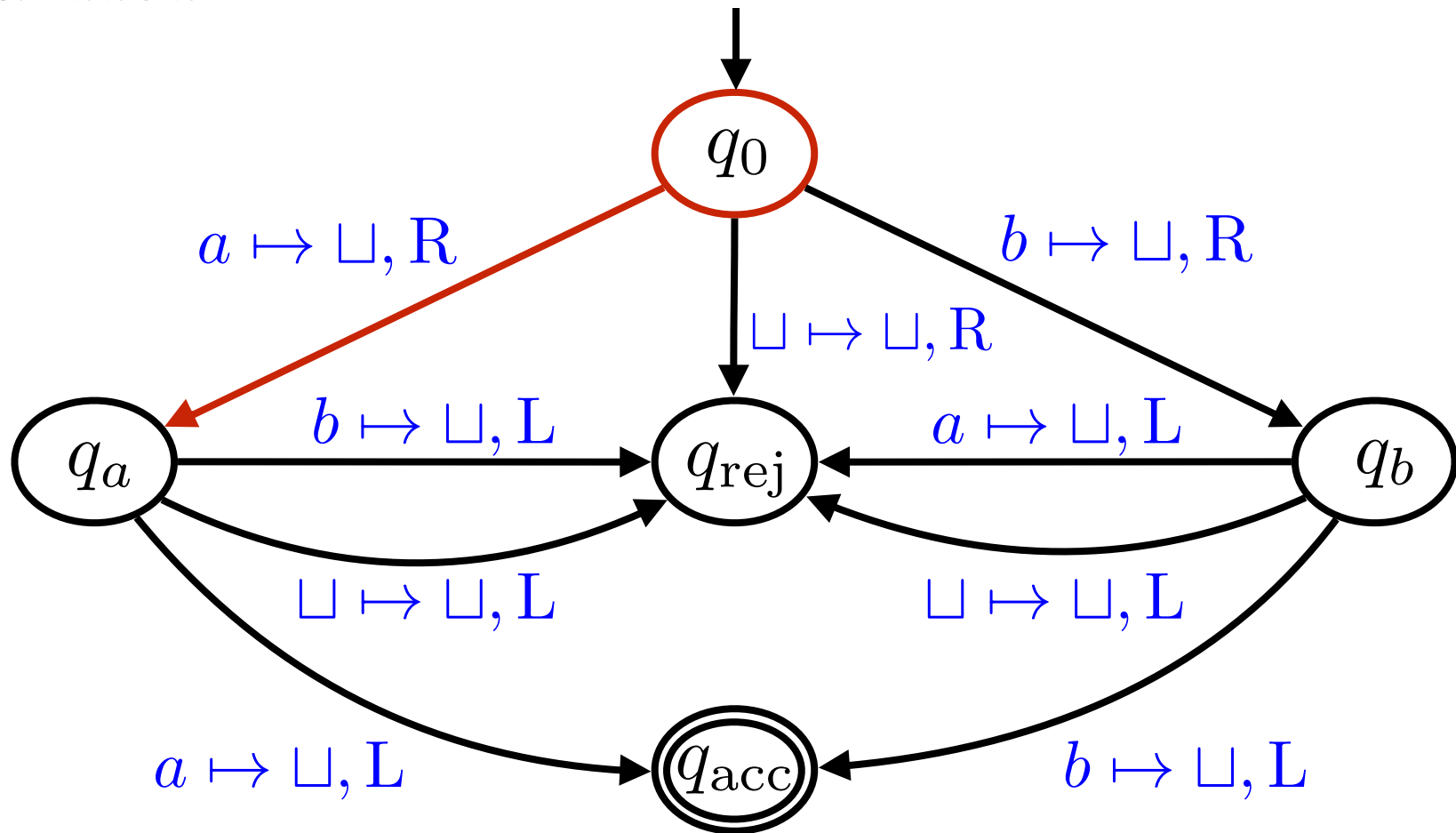
Input: aaba



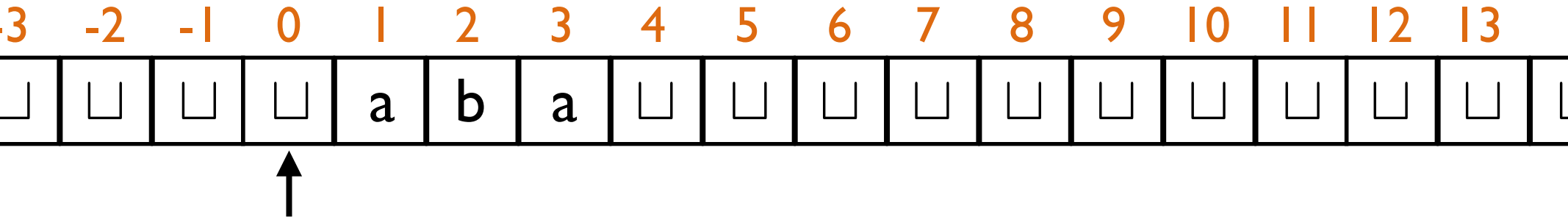
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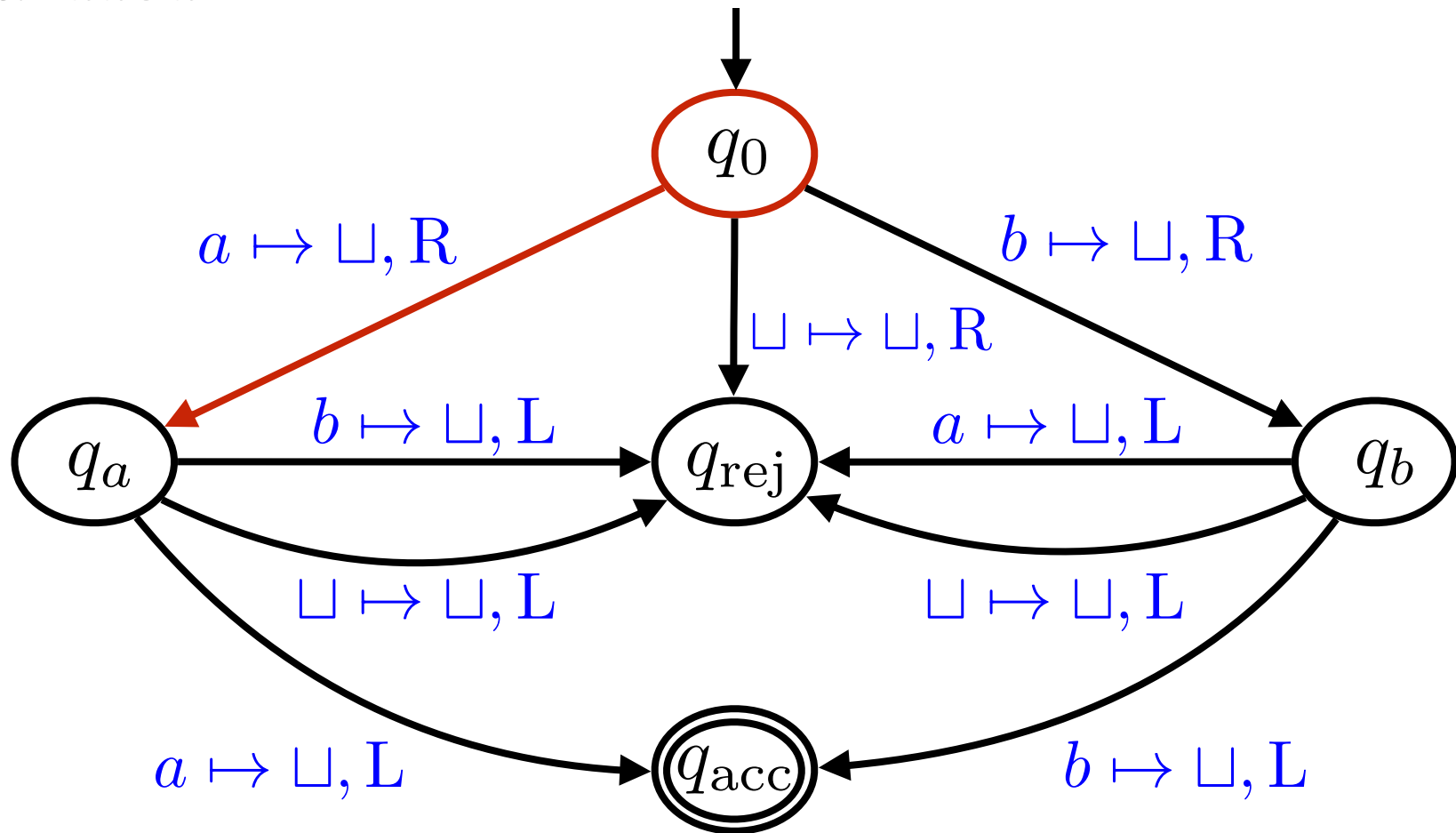
Input: aaba



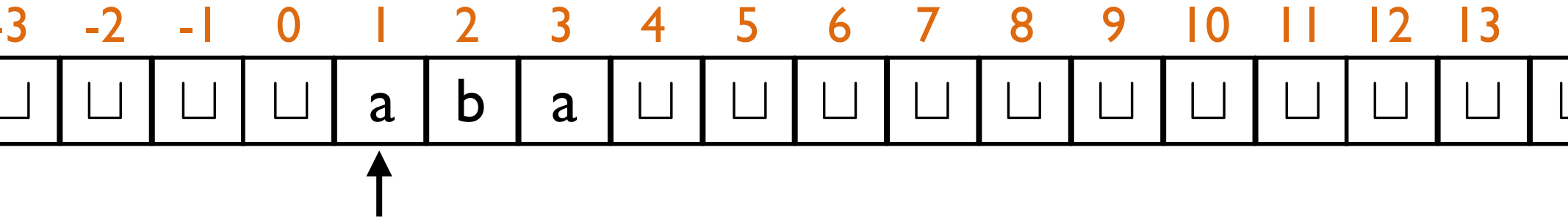
Turing machine simulation example



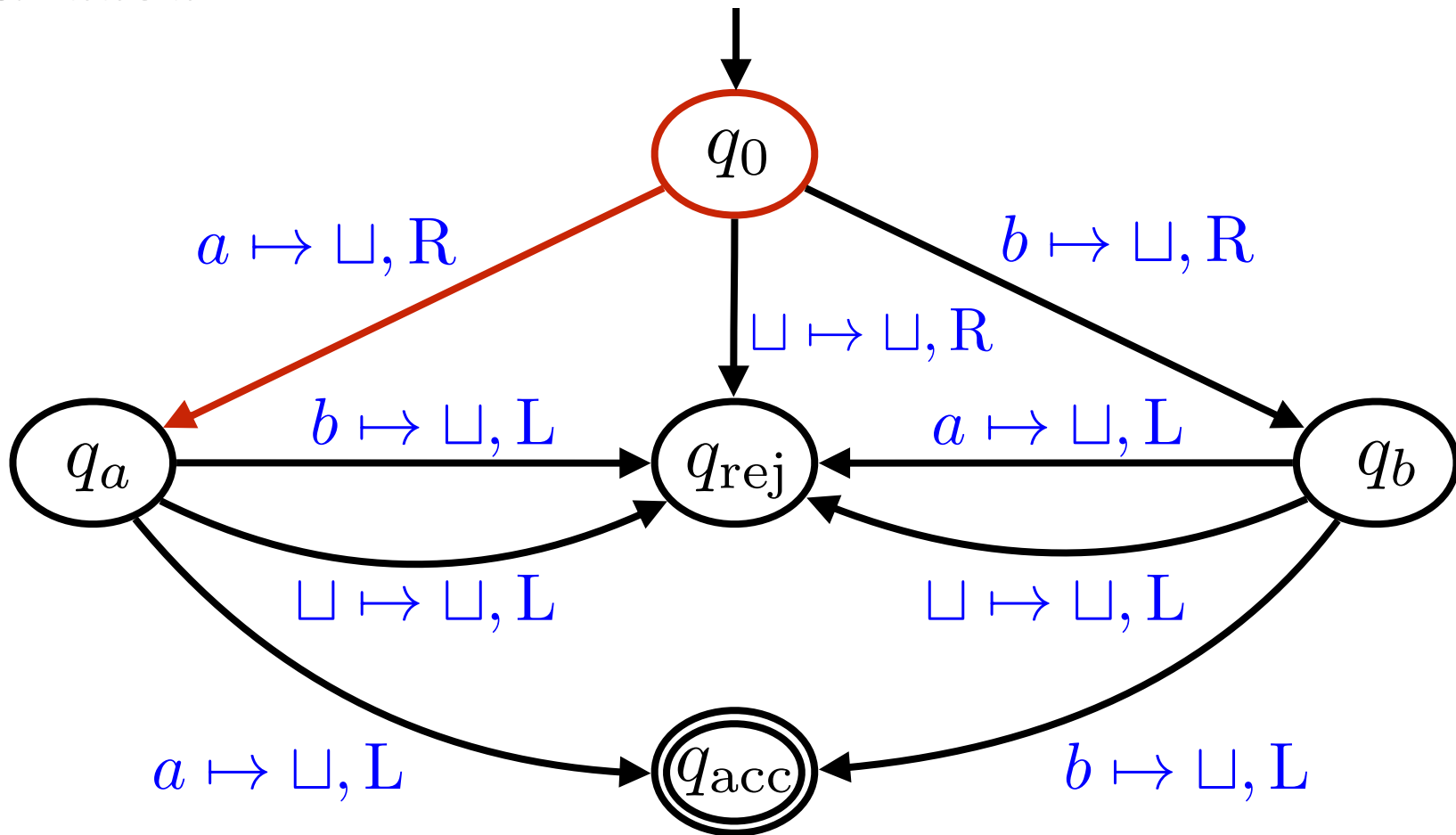
Input: aaba



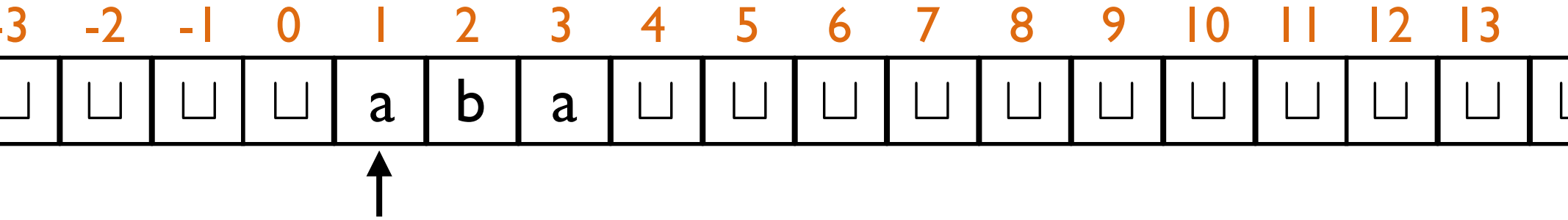
Turing machine simulation example



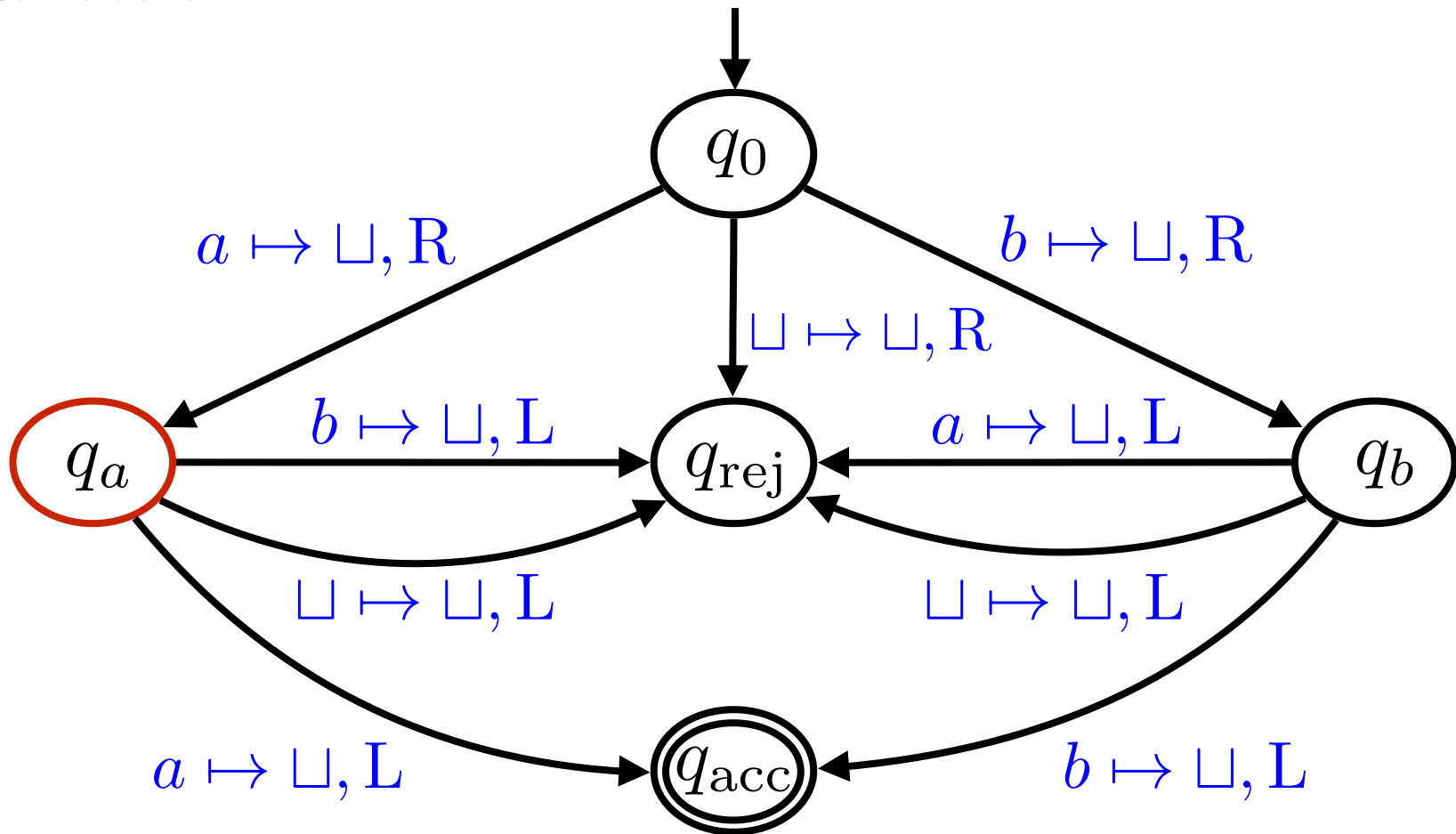
Input: aaba



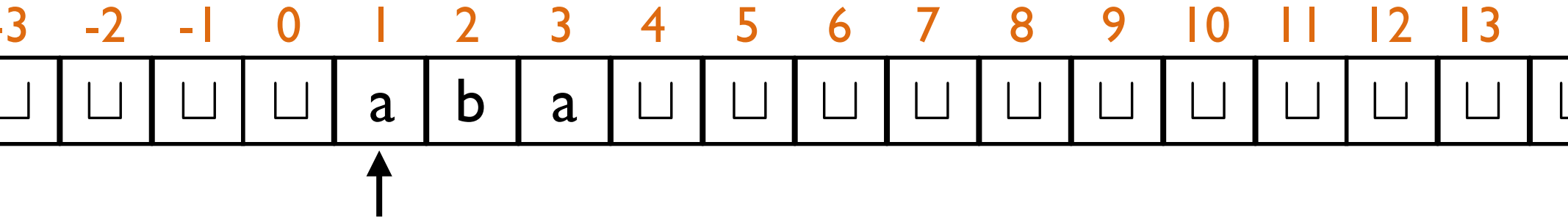
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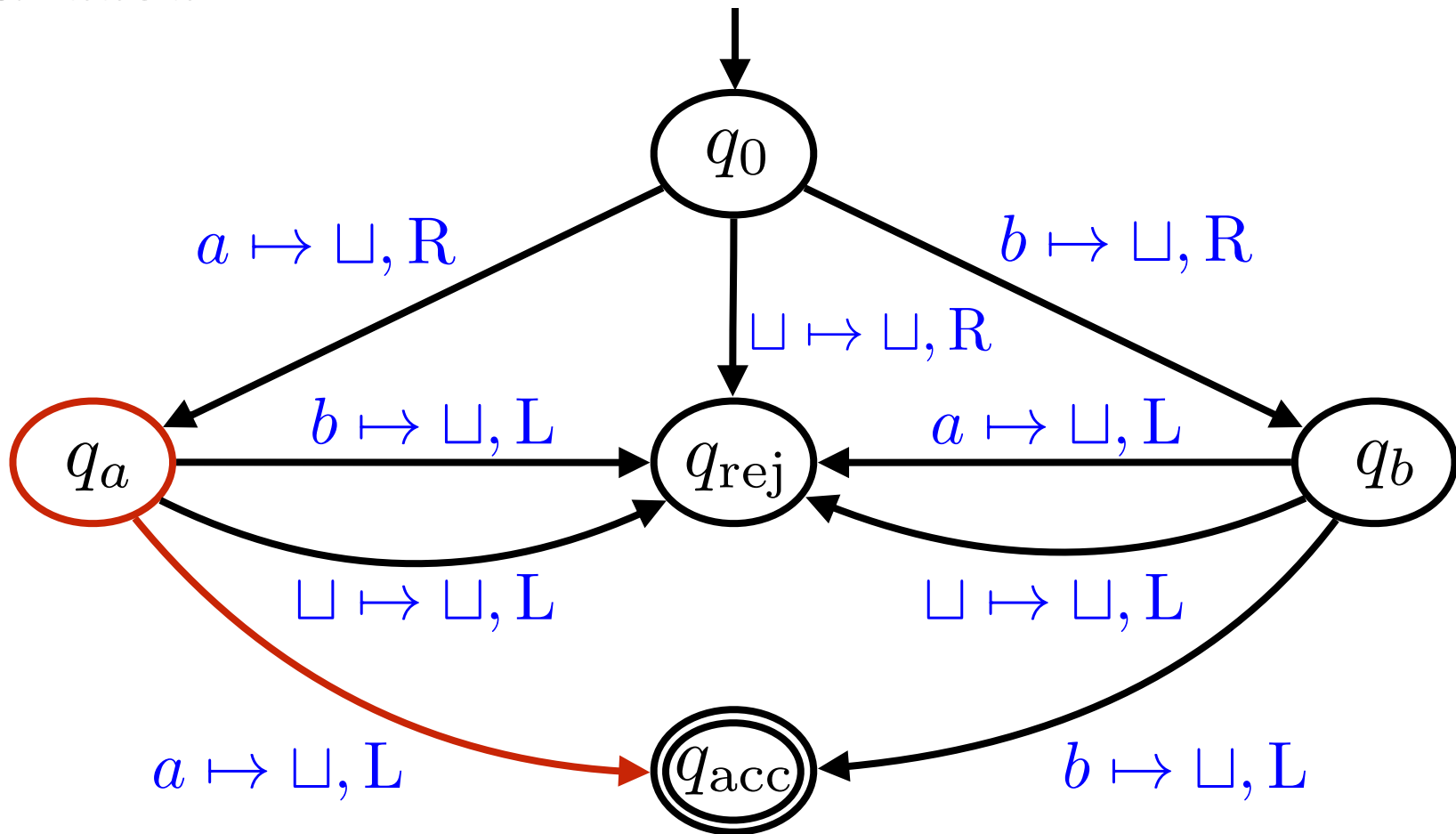
Input: aaba



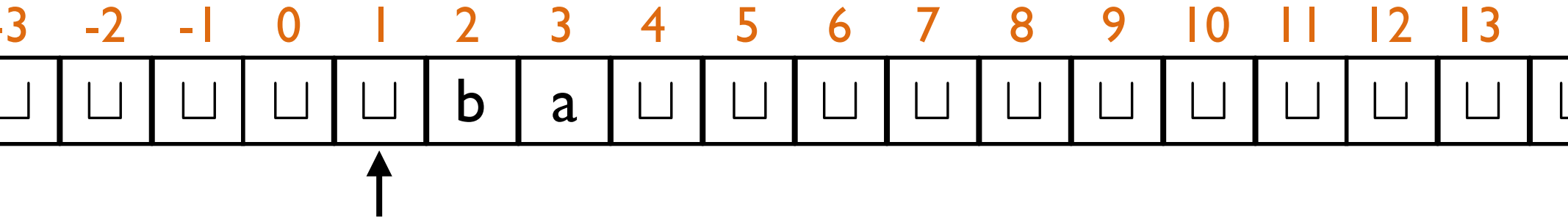
Turing machine simulation example



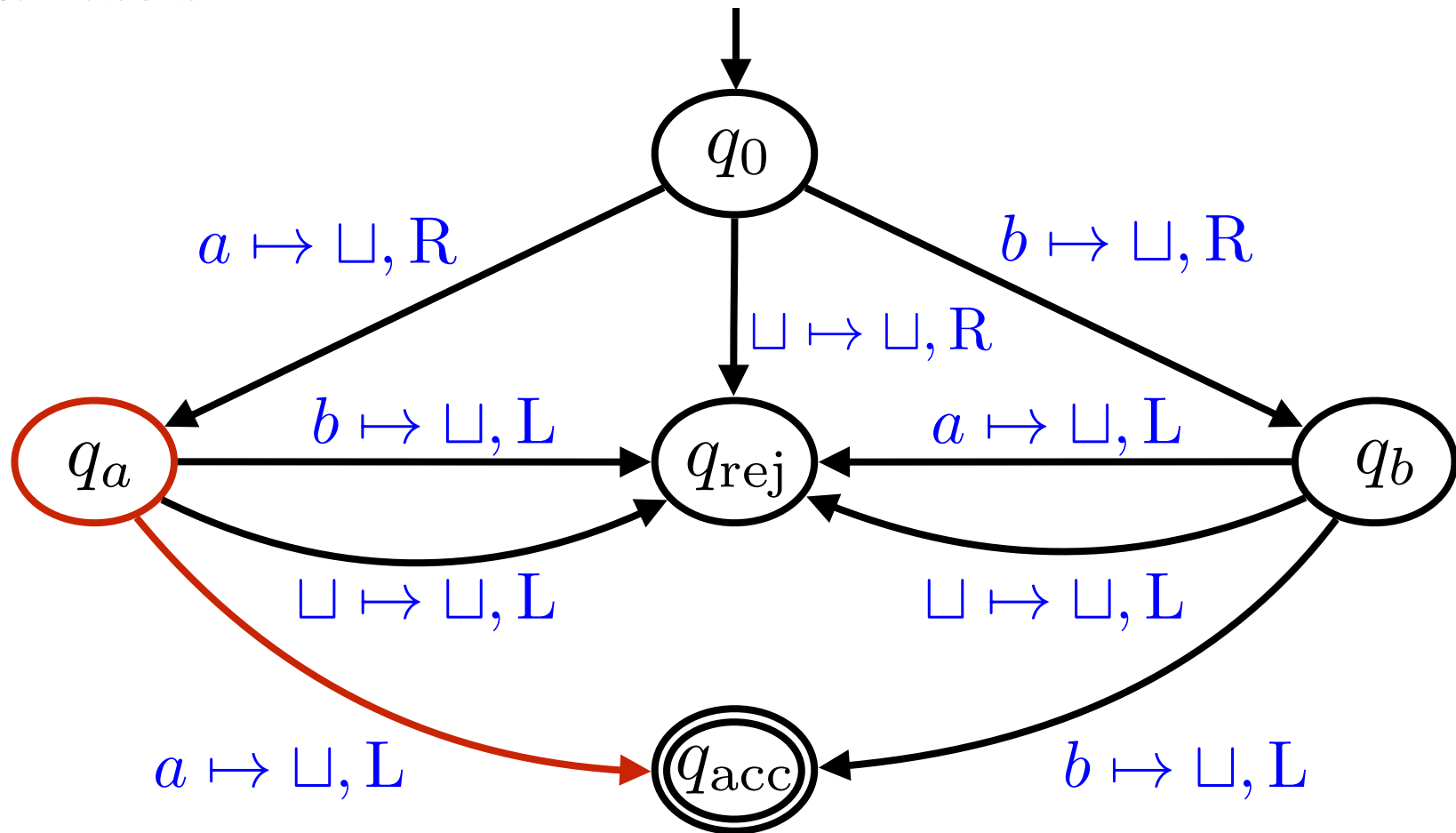
Input: aaba



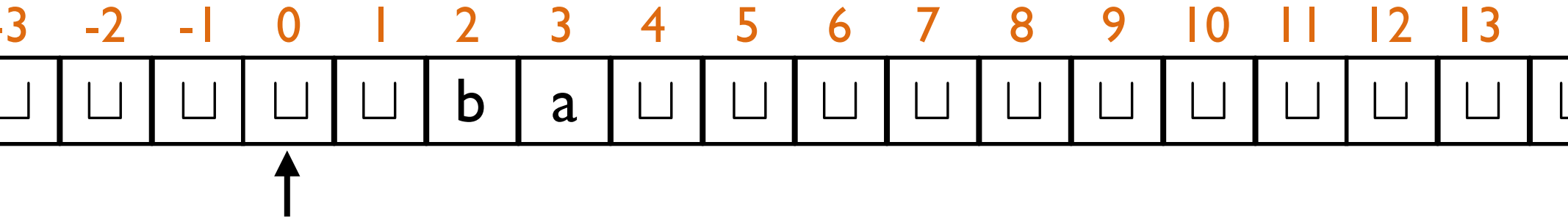
Turing machine simulation example



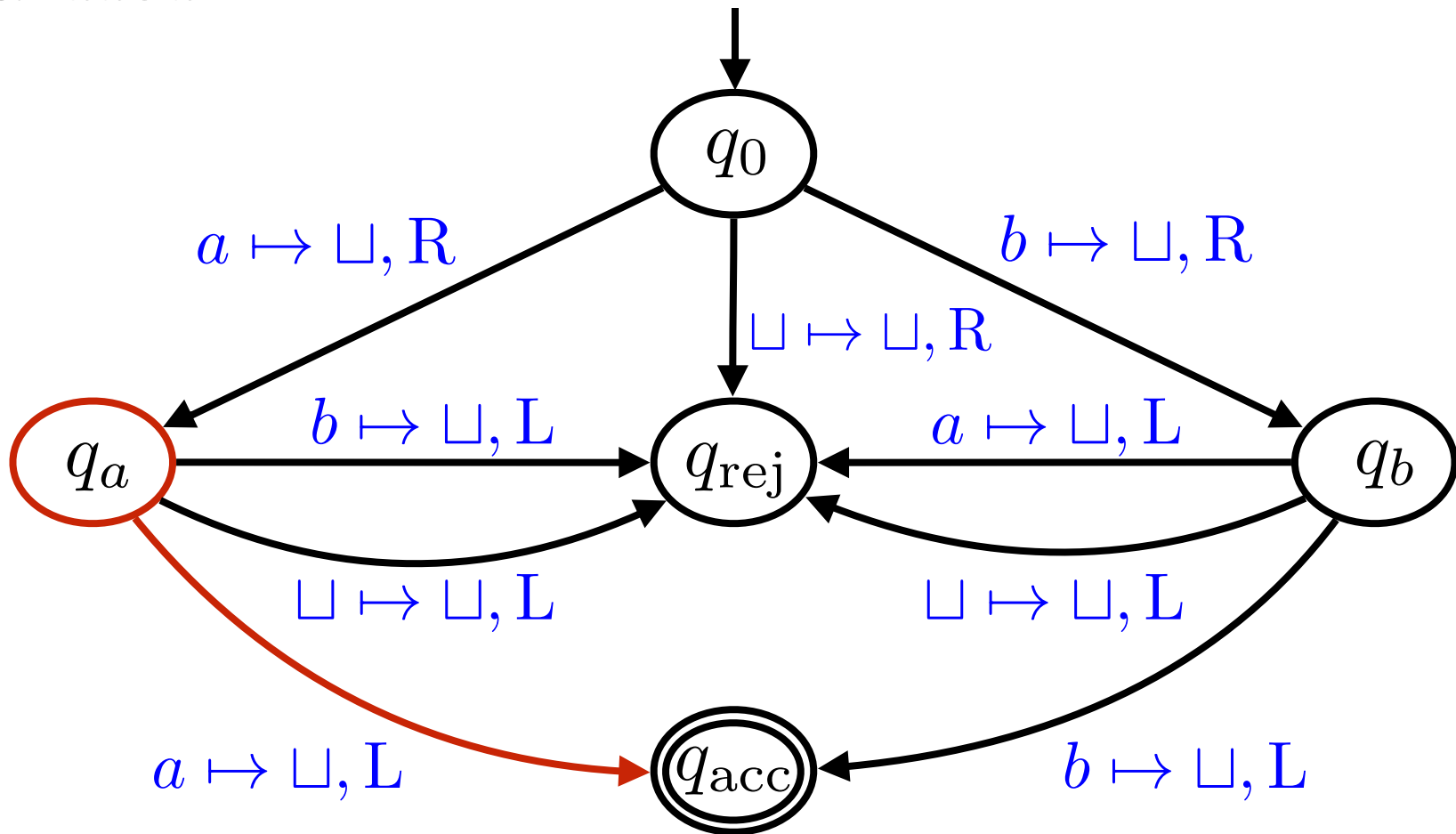
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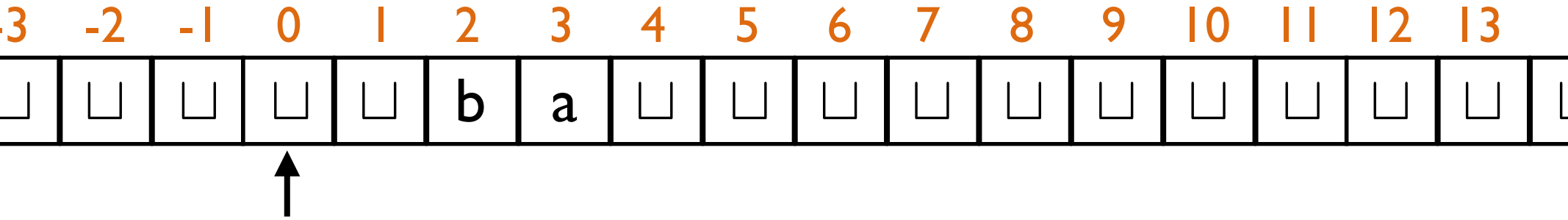
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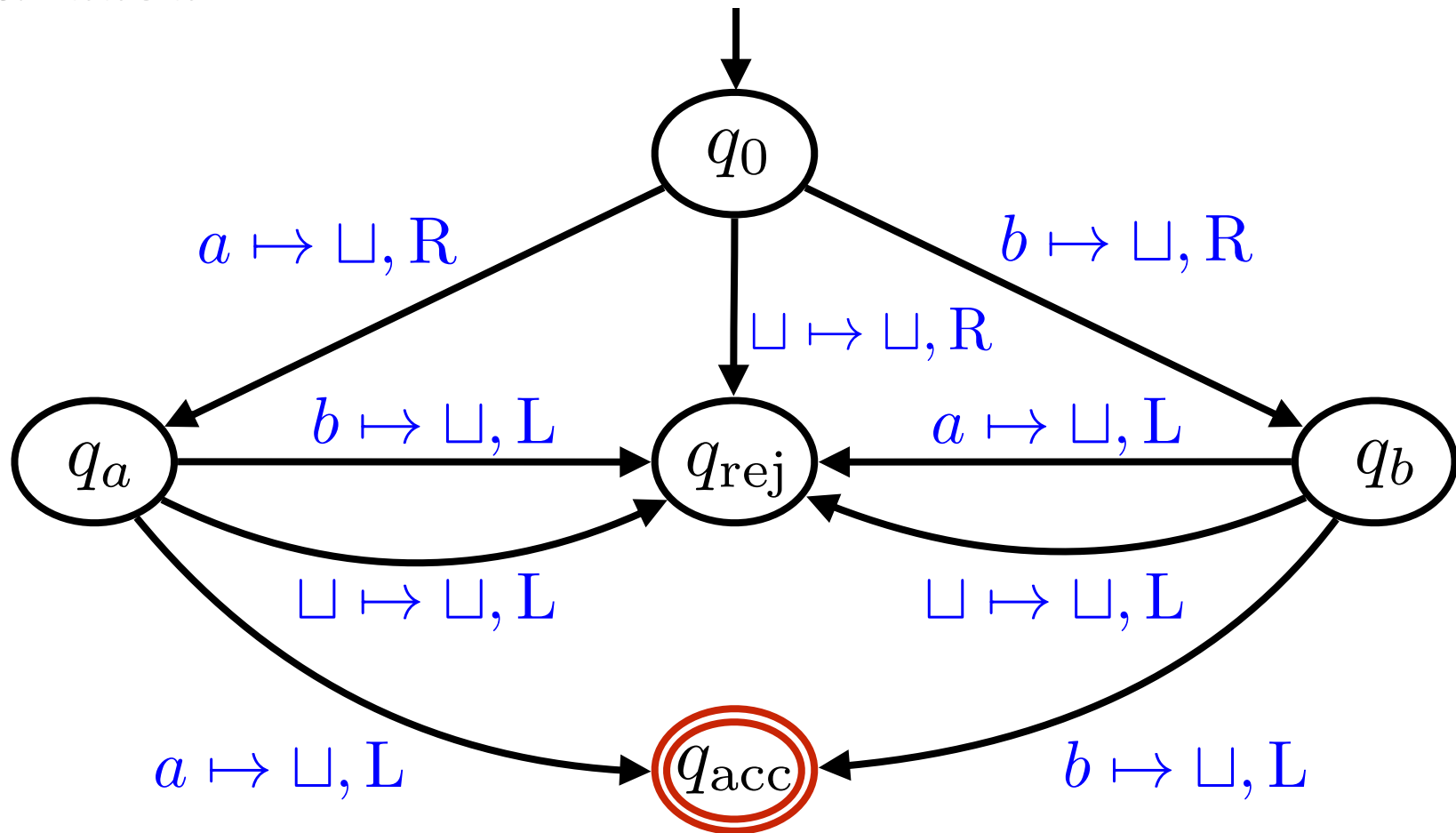
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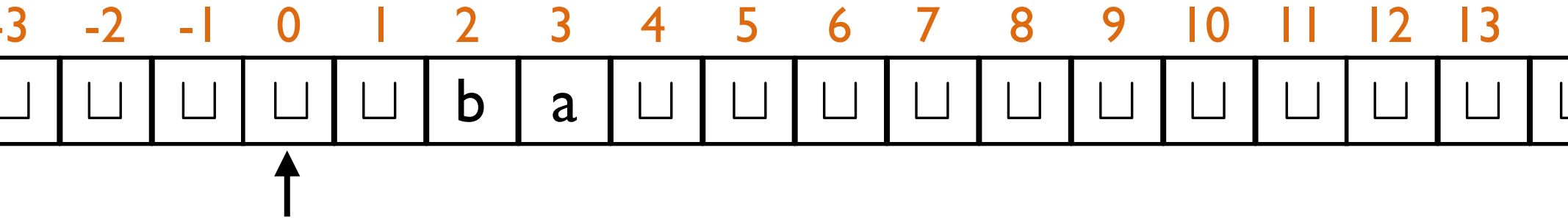
Turing machine simulation example



Input: aaba

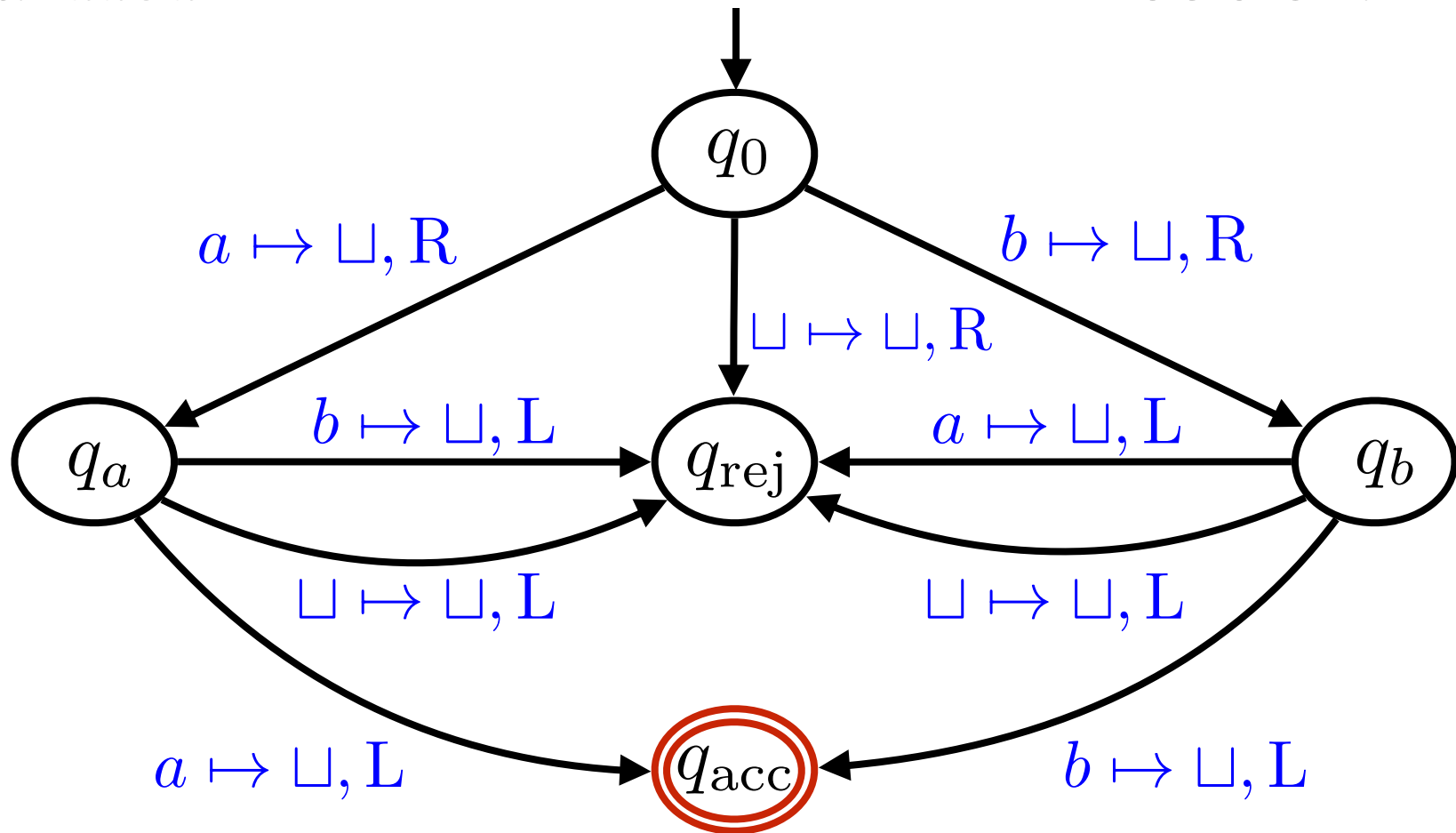


Turing machine simulation example

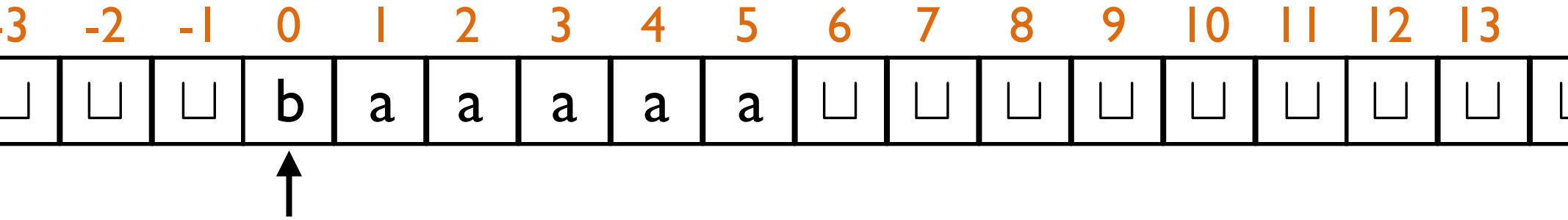


Input: aaba

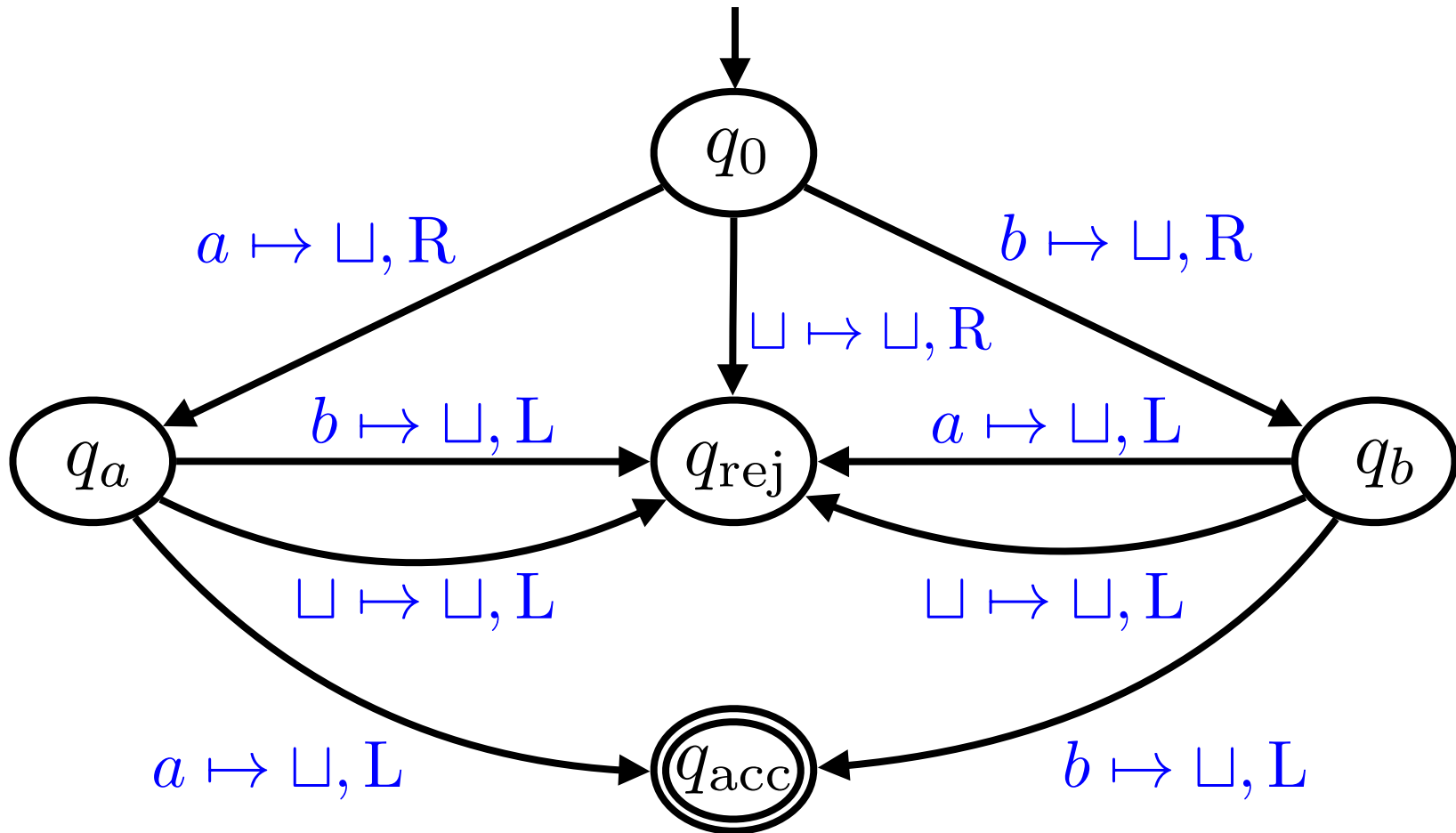
Decision: **Accept**



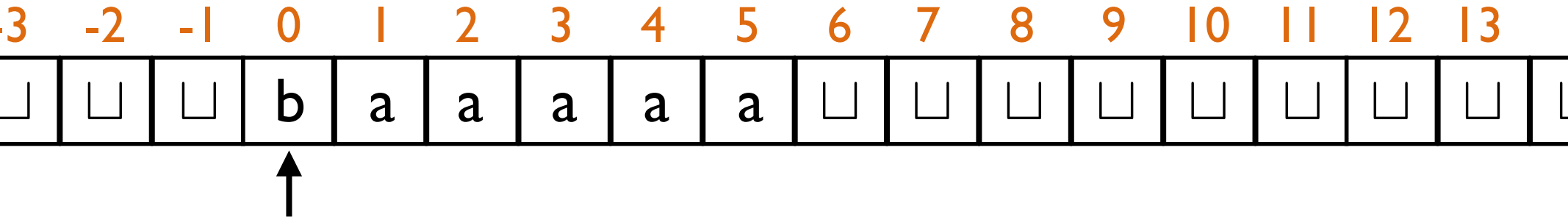
Turing machine simulation example



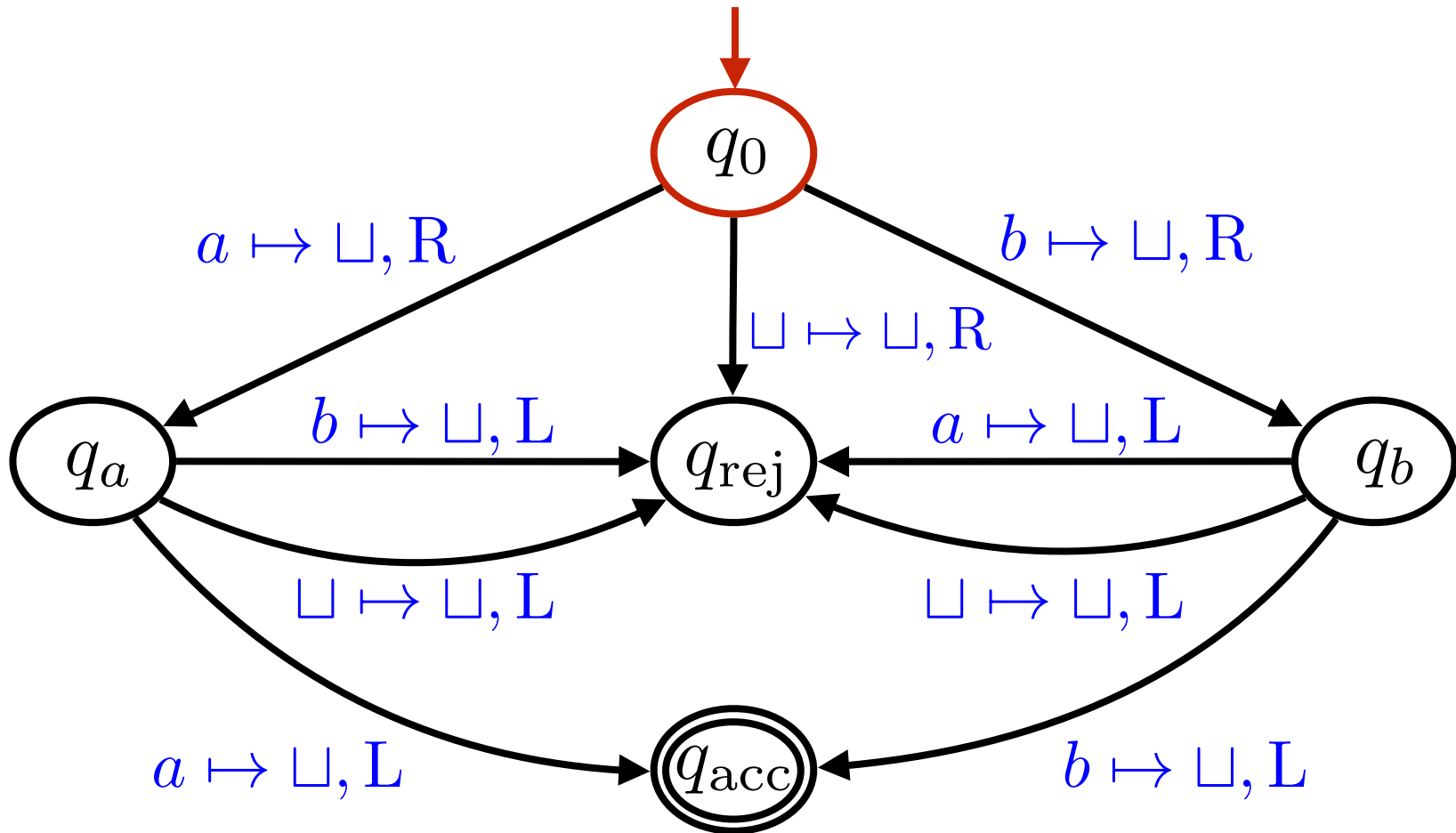
Input: baaaaa



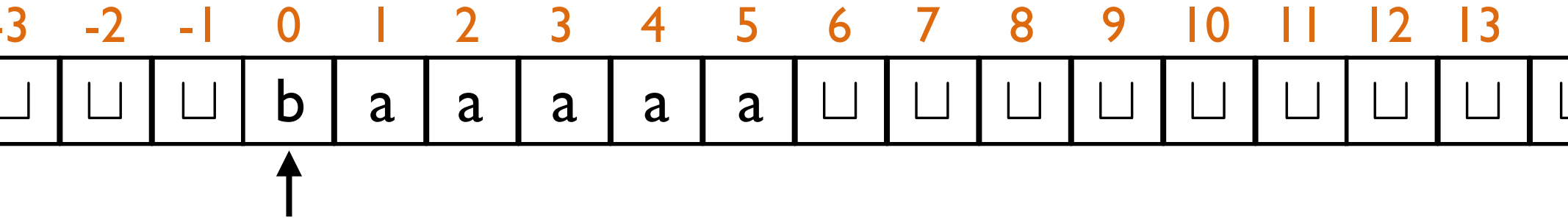
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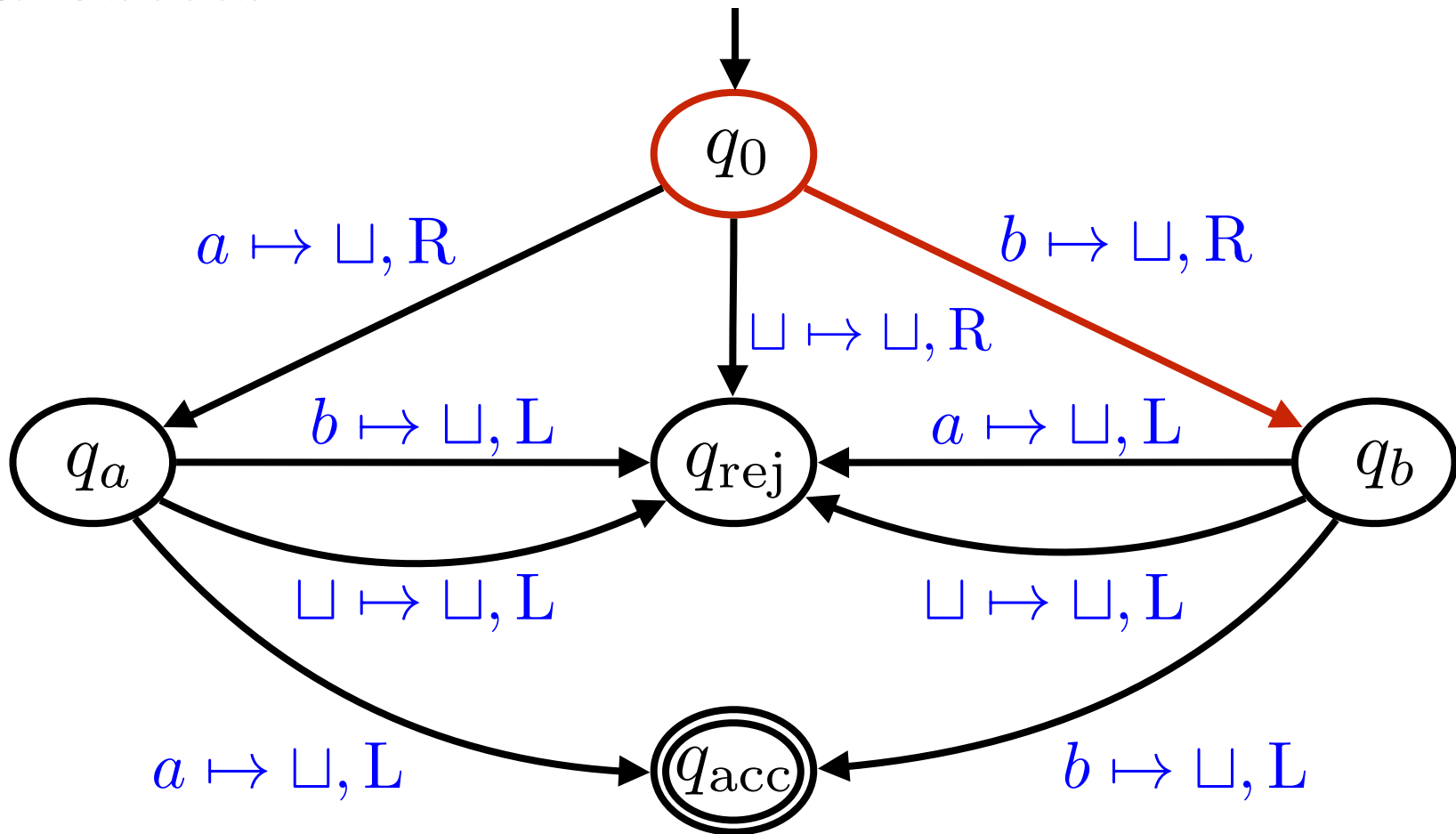
Input: baaaaa



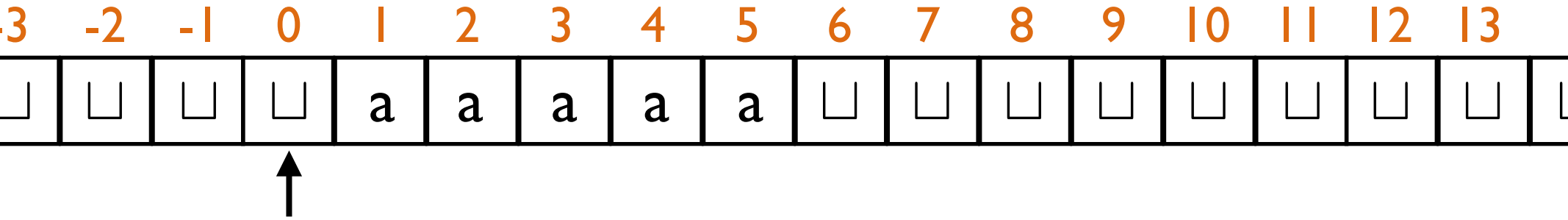
Turing machine simulation example



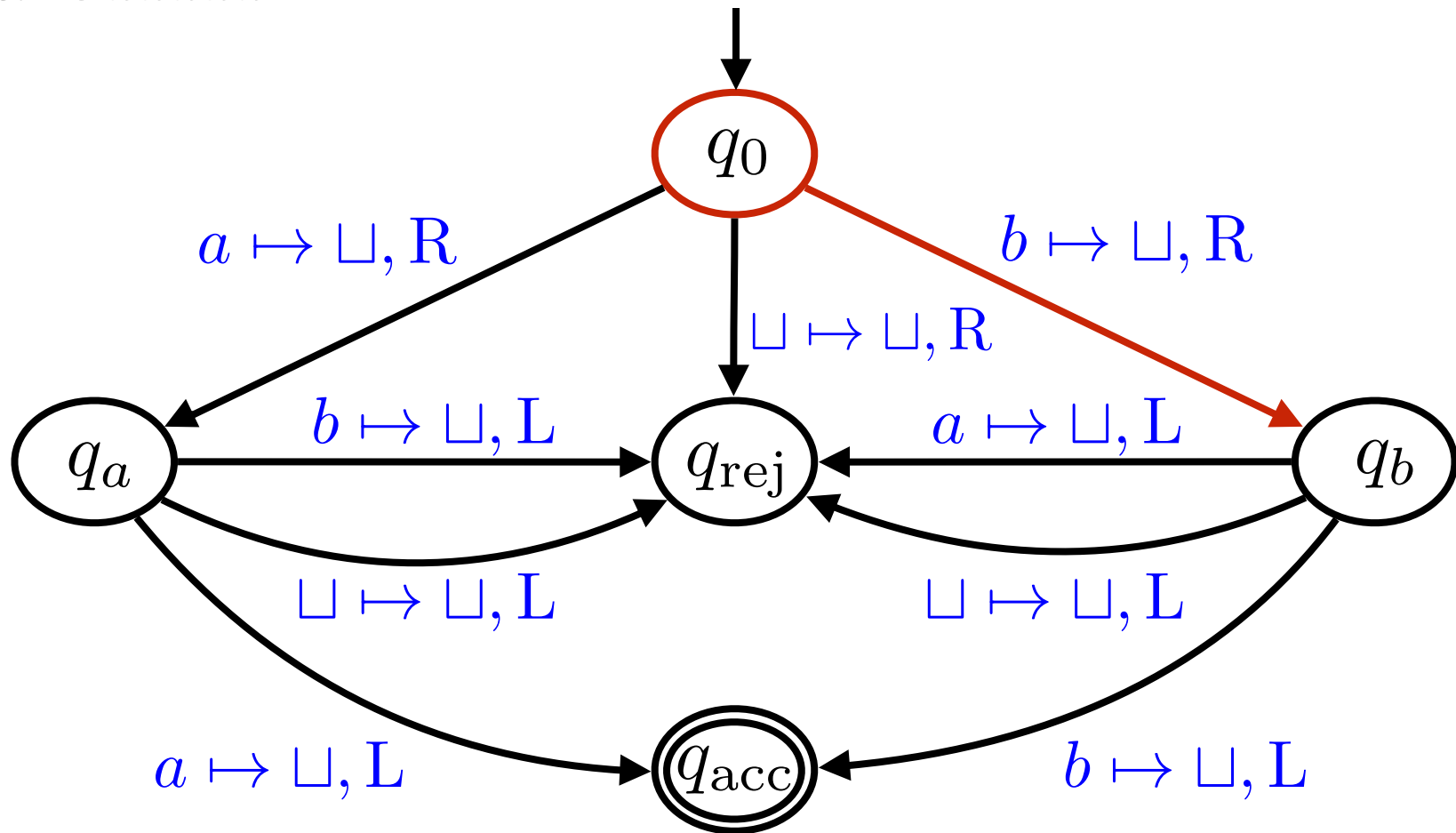
Input: baaaaa



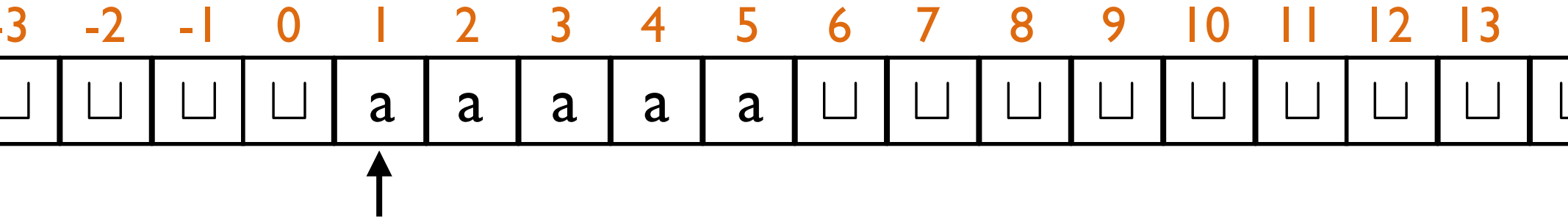
Turing machine simulation example



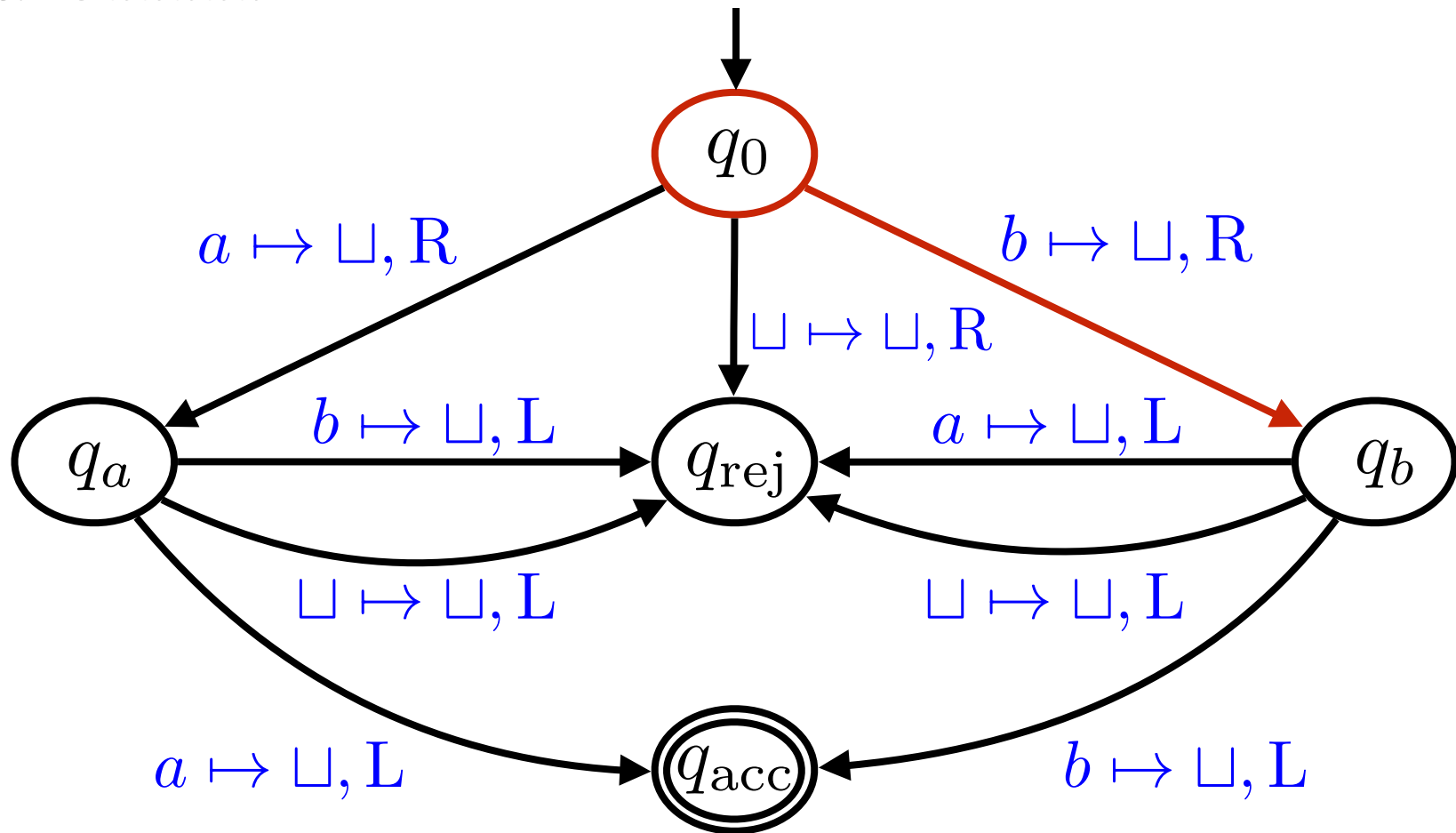
Input: baaaaa



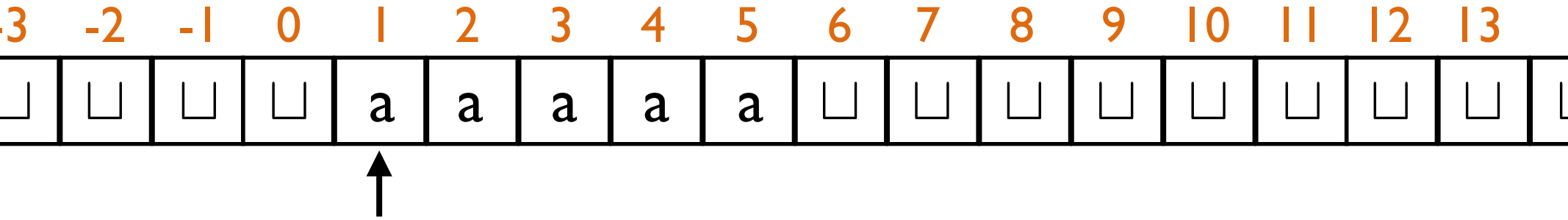
Turing machine simulation example



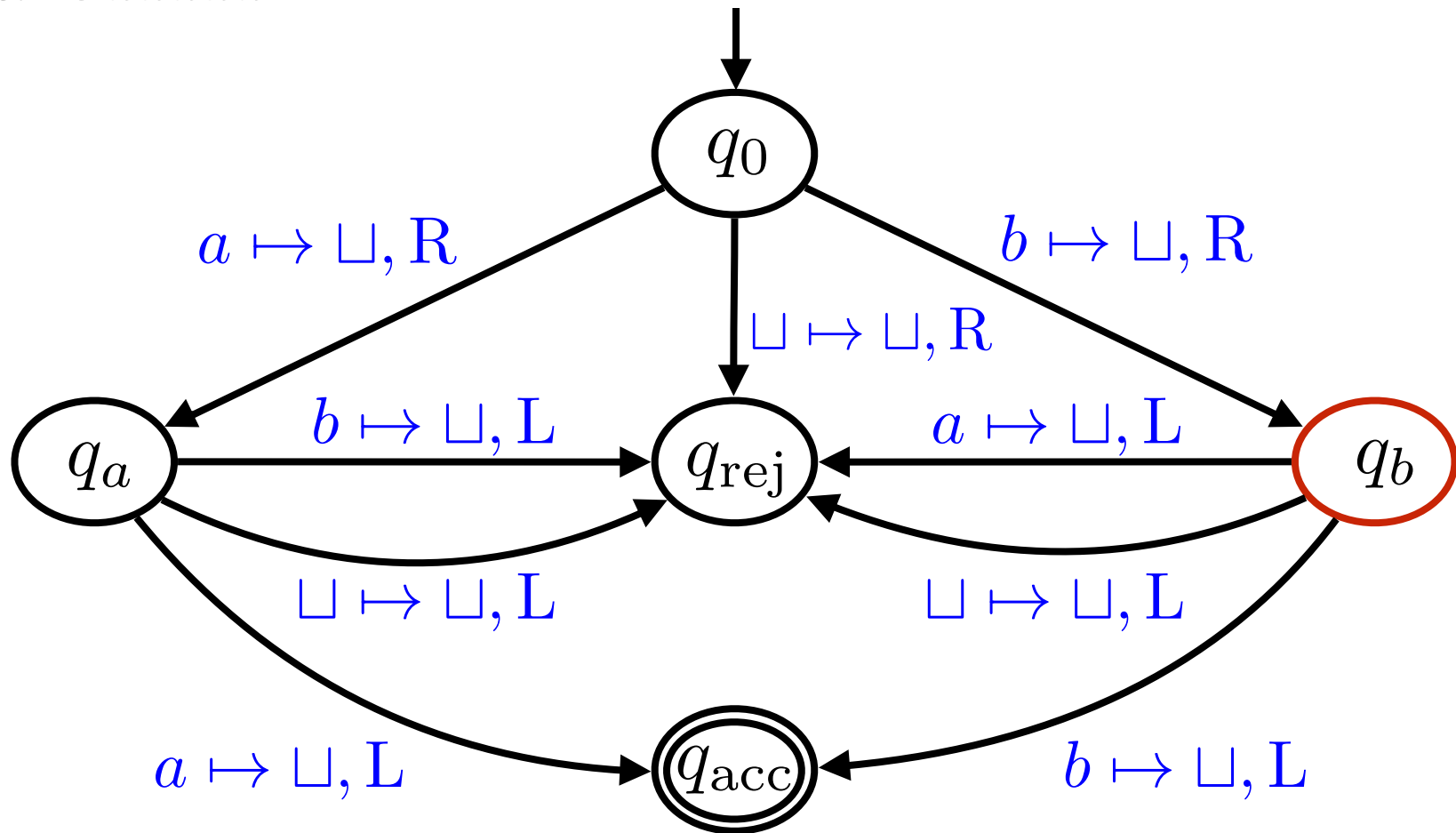
Input: baaaaa



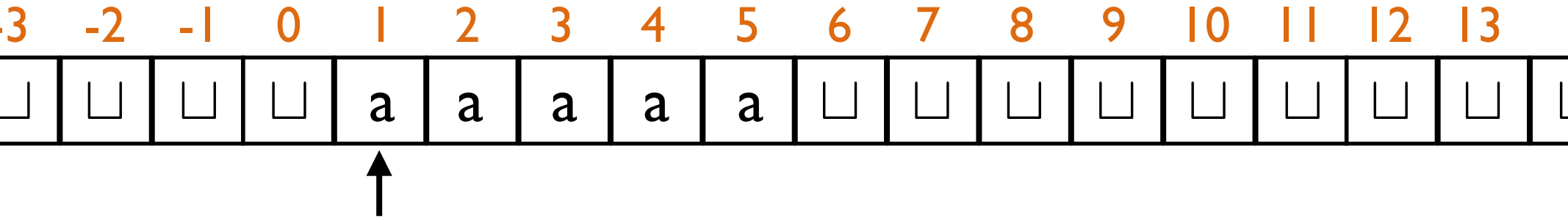
Turing machine simulation example



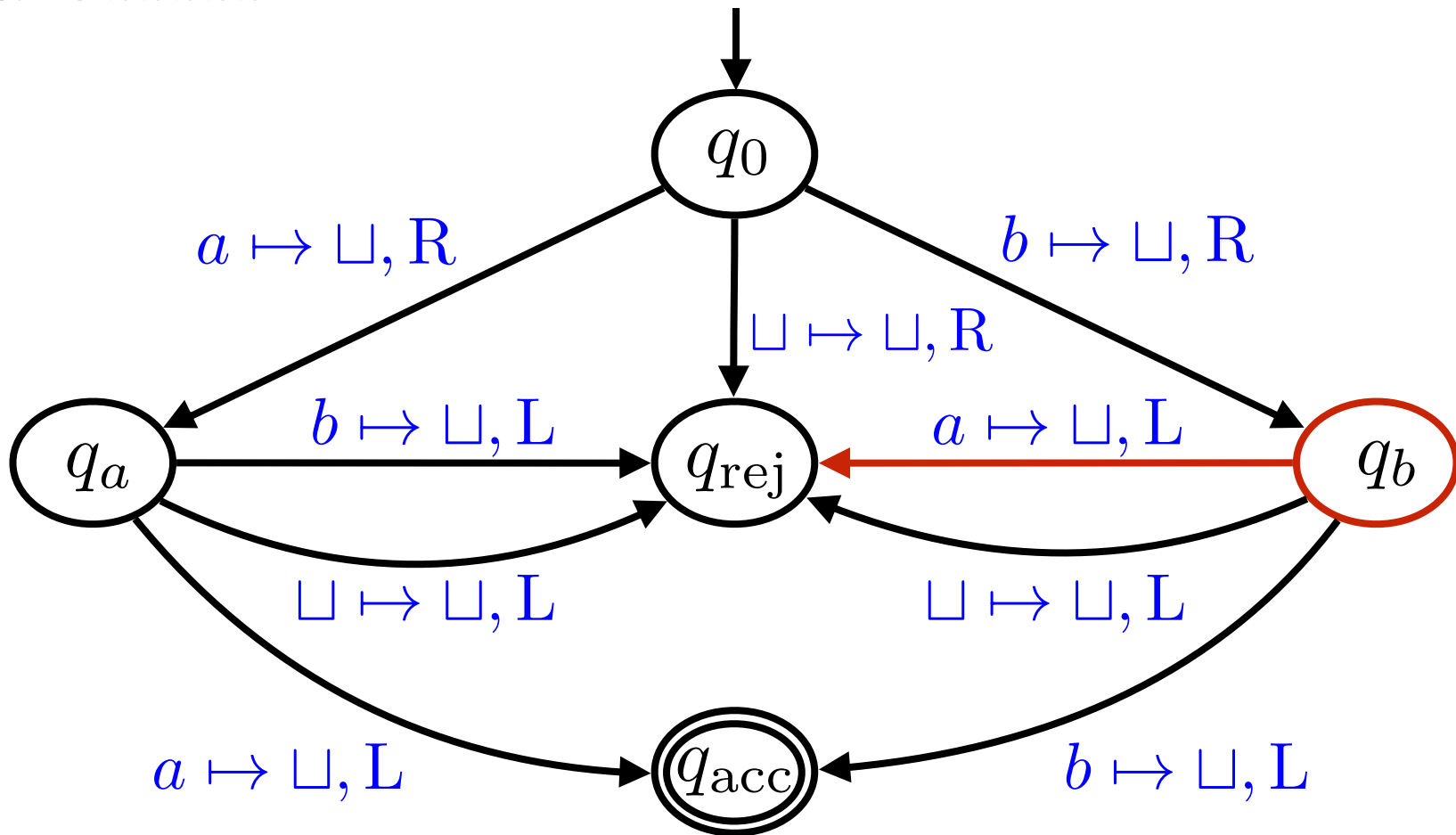
Input: baaaaa



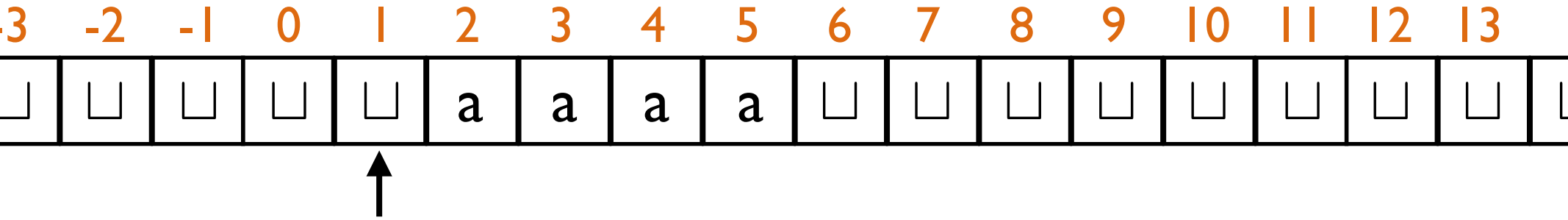
Turing machine simulation example



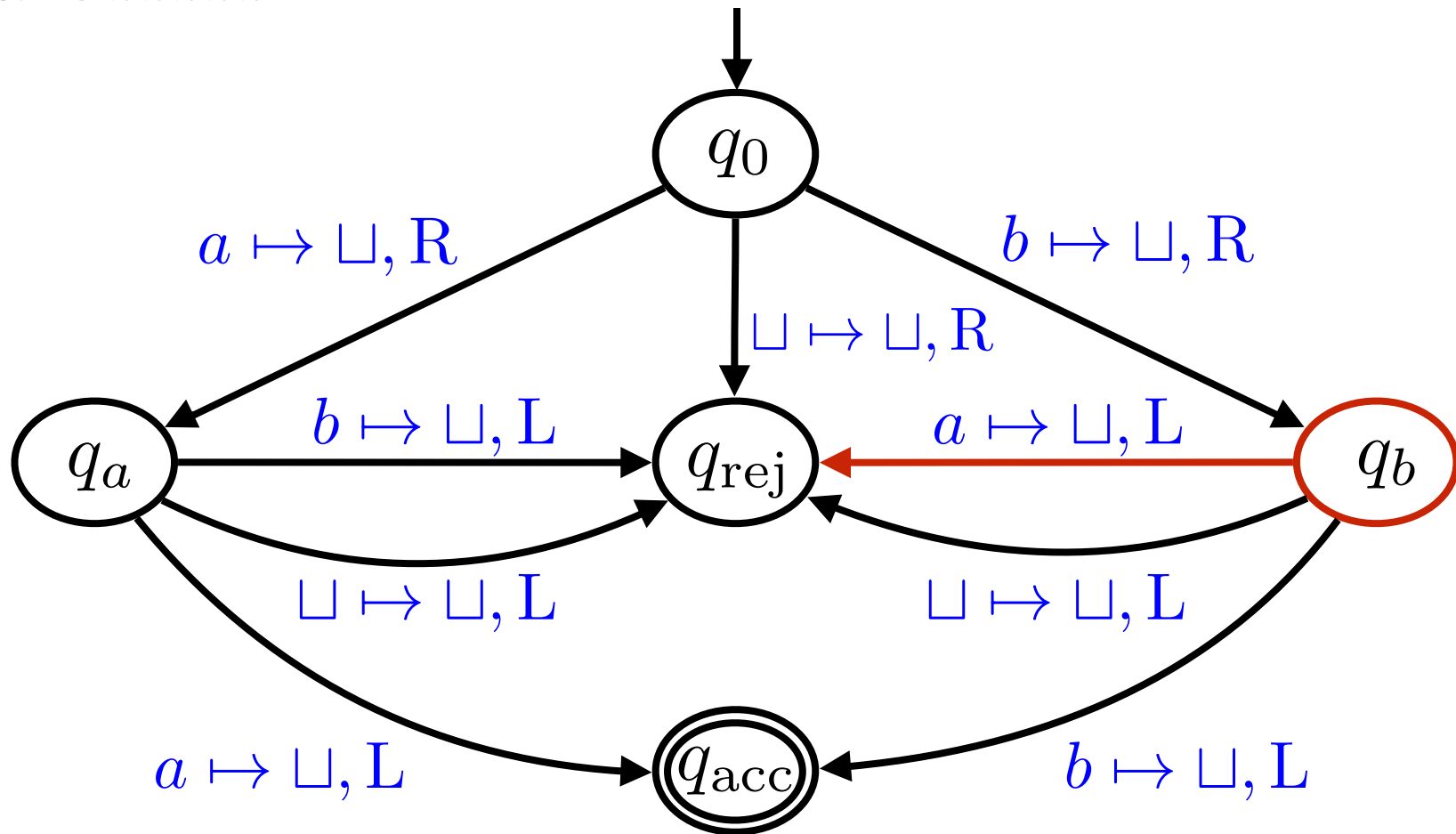
Input: baaaaa



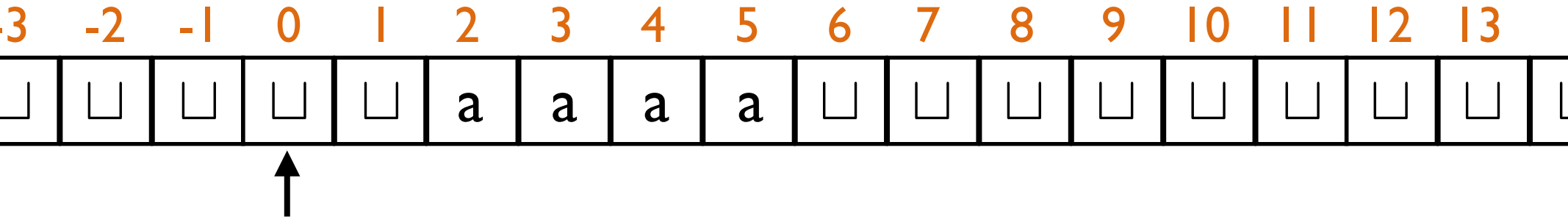
Turing machine simulation example



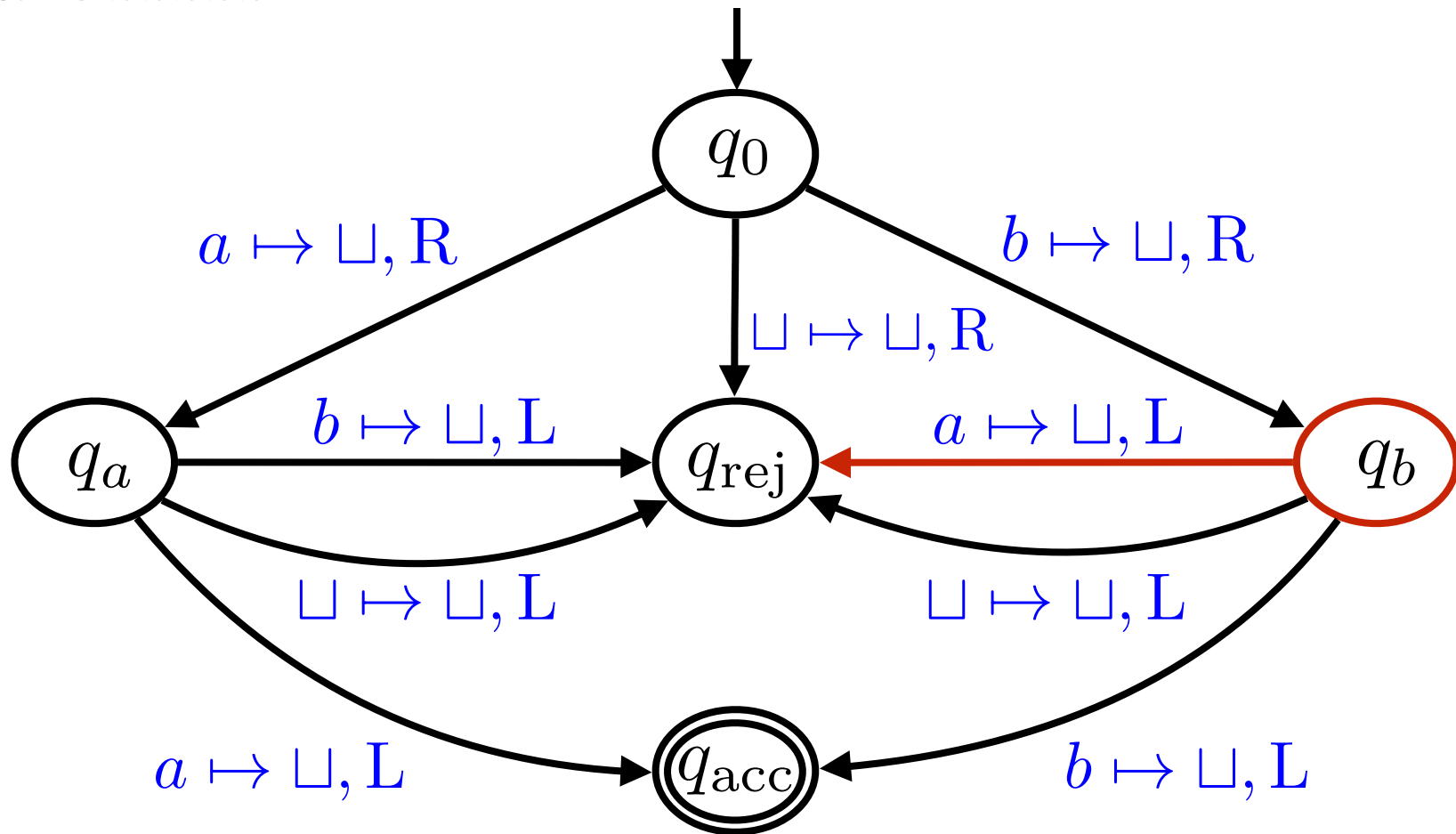
Input: baaaaa



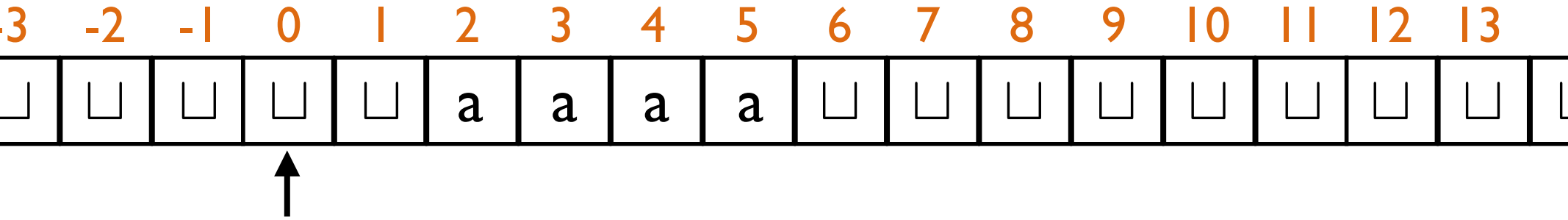
Turing machine simulation example



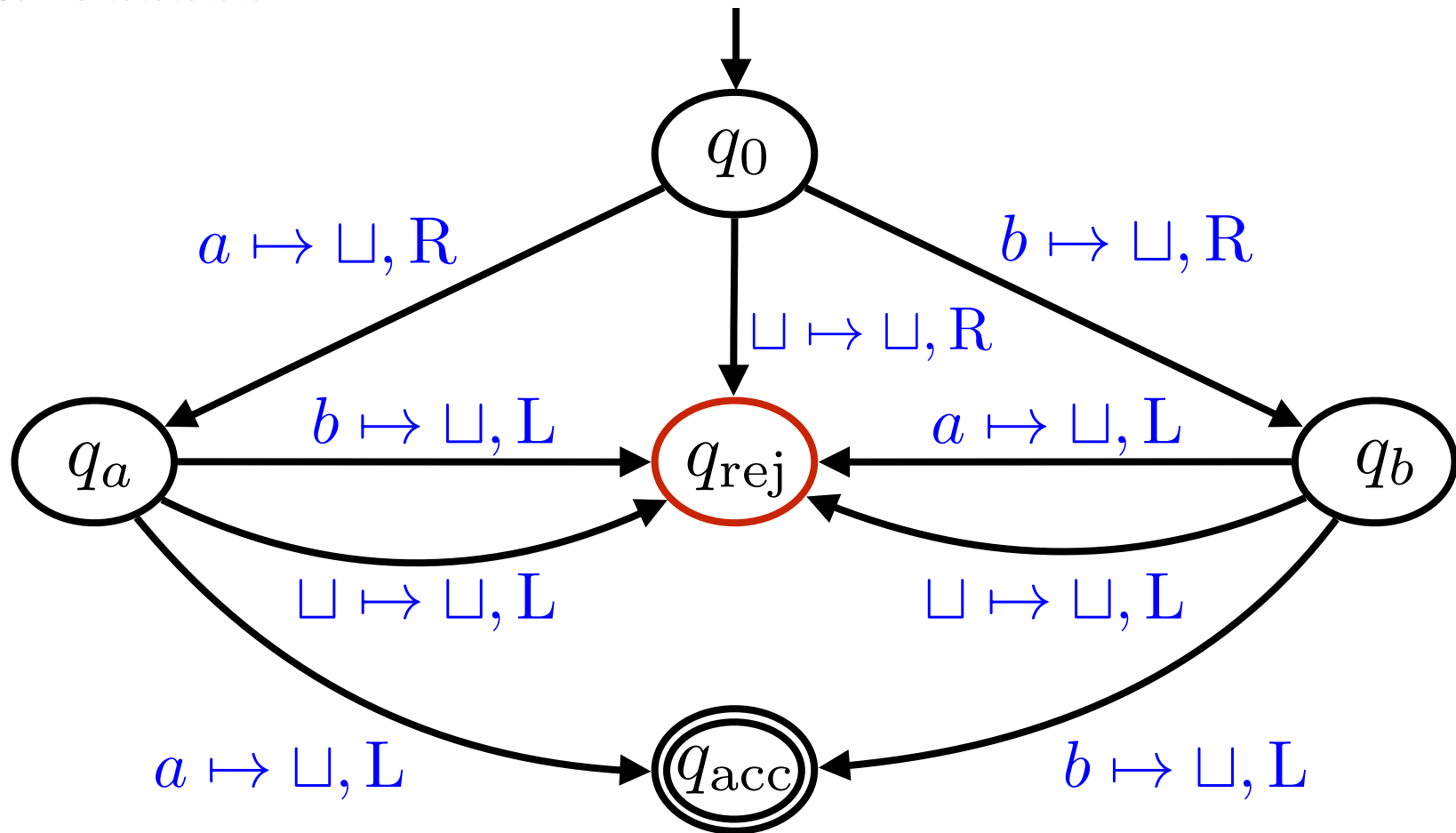
Input: baaaaa



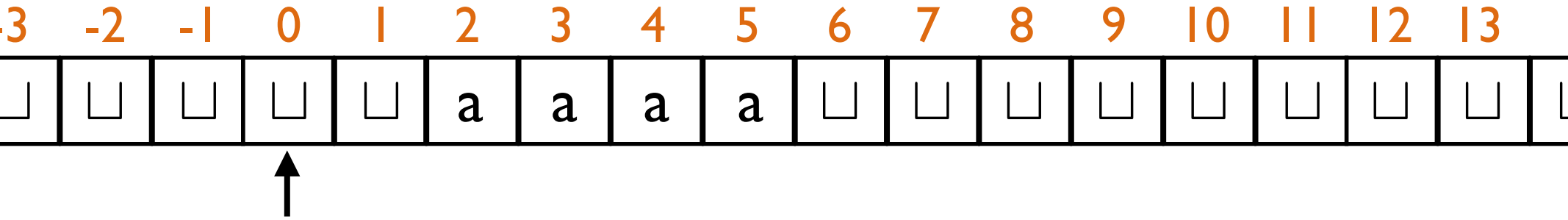
Turing machine simulation example



Input: baaaaa

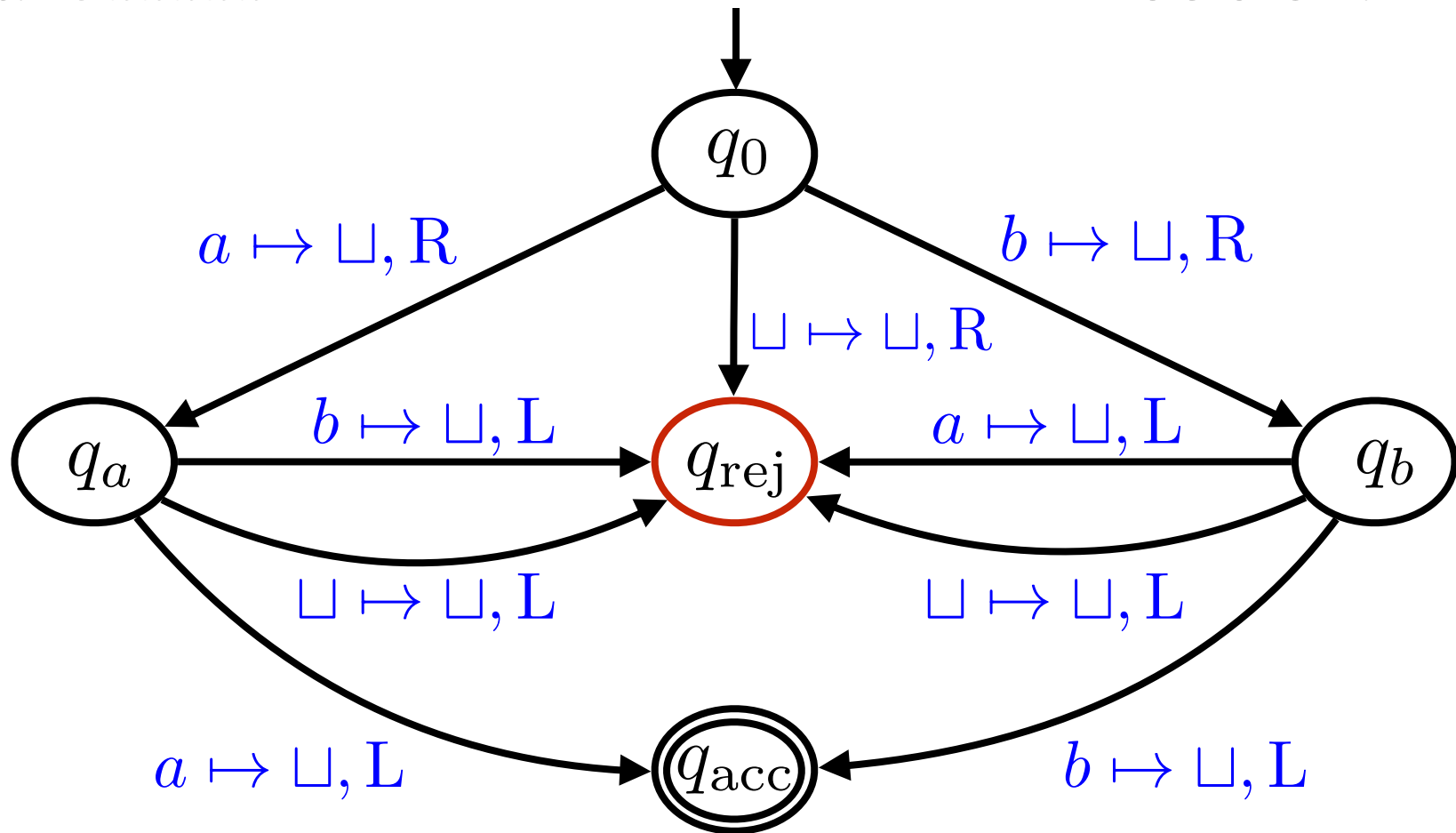


Turing machine simulation example



Input: baaaaa

Decision: **Reject**



TM as a programming language

```
def foo(input):
```

```
  i = 0 tape head position
```

```
  STATE 0:
```

```
    letter = input[i];
```

```
    switch(letter):
```

```
      case 'a': input[i] = ' '; i++; go to STATE a;
```

```
      case 'b': input[i] = ' '; i++; go to STATE b;
```

```
      case ' ': input[i] = ' '; i++; go to STATE rej;
```

```
  STATE a:
```

```
    letter = input[i];
```

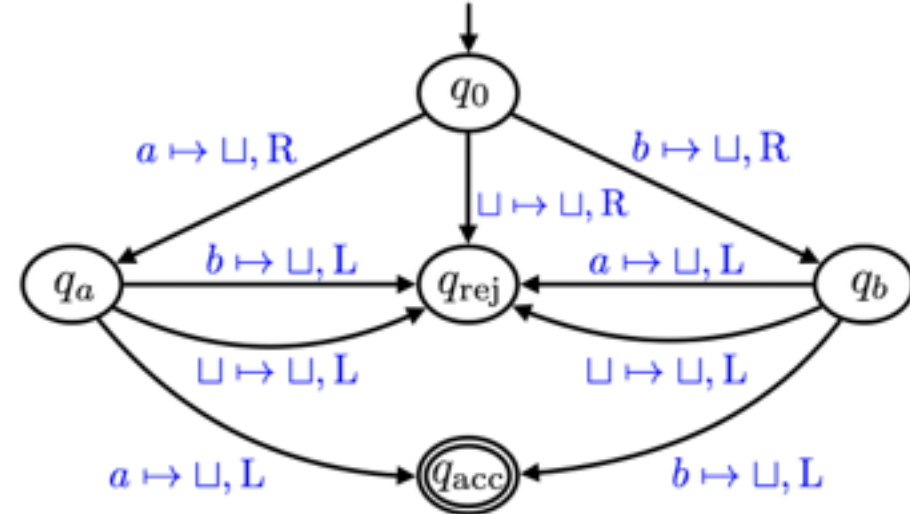
```
    switch(letter):
```

```
      case 'a': input[i] = ' '; i--; go to STATE acc;
```

```
      case 'b': input[i] = ' '; i--; go to STATE rej;
```

```
      case ' ': input[i] = ' '; i--; go to STATE rej;
```

```
  ⋮
```



TM as a programming language

```
def foo(input):
```

```
  i = 0
```

```
  STATE 0:
```

```
    letter = input[i];
```

```
    switch(letter):
```

```
      case 'a': input[i] = ' '; i++; go to STATE a;
```

```
      case 'b': input[i] = ' '; i++; go to STATE b;
```

```
      case ' ': input[i] = ' '; i++; go to STATE rej;
```

```
  STATE a:
```

```
    letter = input[i];
```

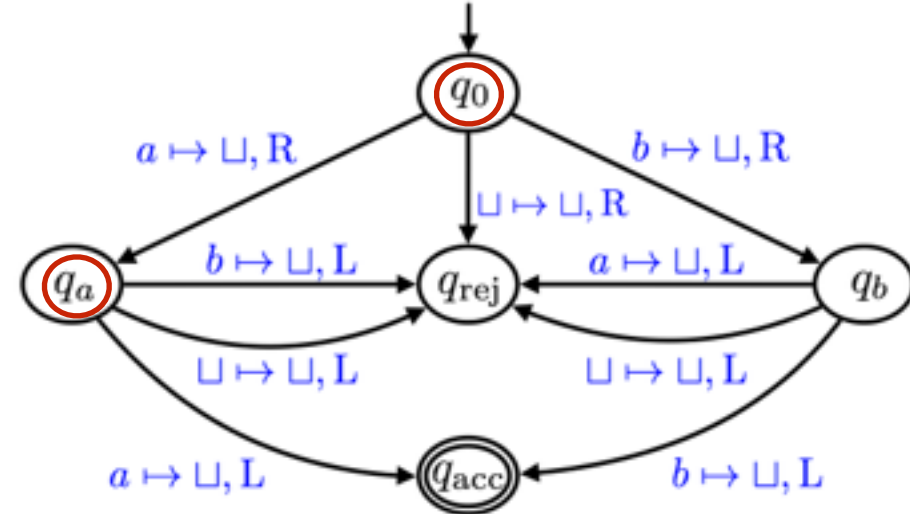
```
    switch(letter):
```

```
      case 'a': input[i] = ' '; i--; go to STATE acc;
```

```
      case 'b': input[i] = ' '; i--; go to STATE rej;
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      case ' ': input[i] = ' '; i--; go to STATE rej;
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```
  ⋮
```



TM as a programming language

```
def foo(input):
```

```
  i = 0
```

```
  STATE 0:
```

```
    letter = input[i];  
    switch(letter):
```

```
      case 'a': input[i] = ' '; i++; go to STATE a;
```

```
      case 'b': input[i] = ' '; i++; go to STATE b;
```

```
      case ' ': input[i] = ' '; i++; go to STATE rej;
```

```
  STATE a:
```

```
    letter = input[i];
```

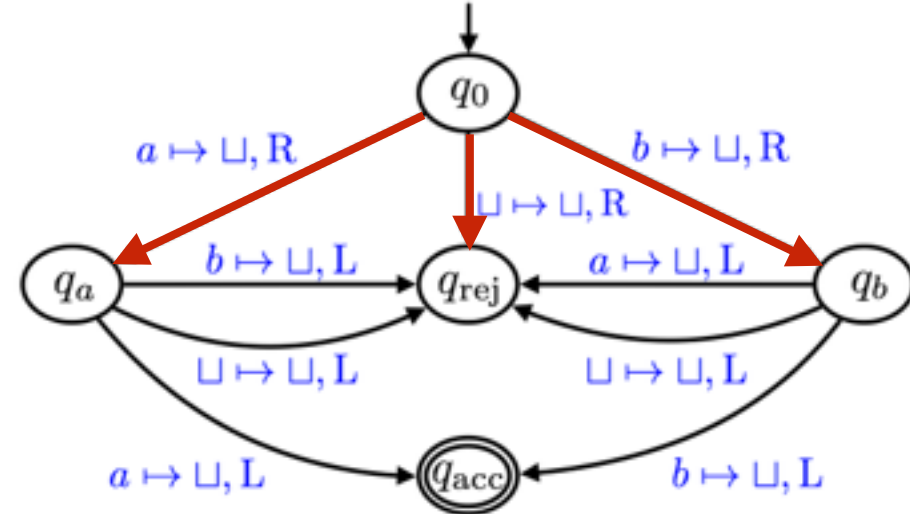
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    switch(letter):
```

```
      case 'a': input[i] = ' '; i--; go to STATE acc;
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      case 'b': input[i] = ' '; i--; go to STATE rej;
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      case ' ': input[i] = ' '; i--; go to STATE rej;
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```
  ⋮
```



TM as a programming language

```
def foo(input):
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  i = 0
```

```
  STATE 0:
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```
    letter = input[i];
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    switch(letter):
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      case 'a': input[i] = ' '; i++; go to STATE a;
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```
  STATE a:
```

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```

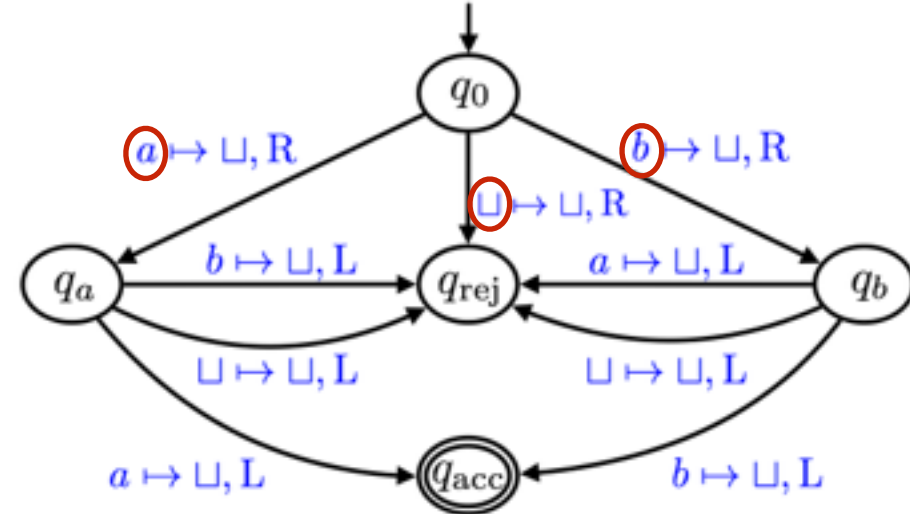
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      case 'a': input[i] = ' '; i--; go to STATE acc;
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TM as a programming language

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```

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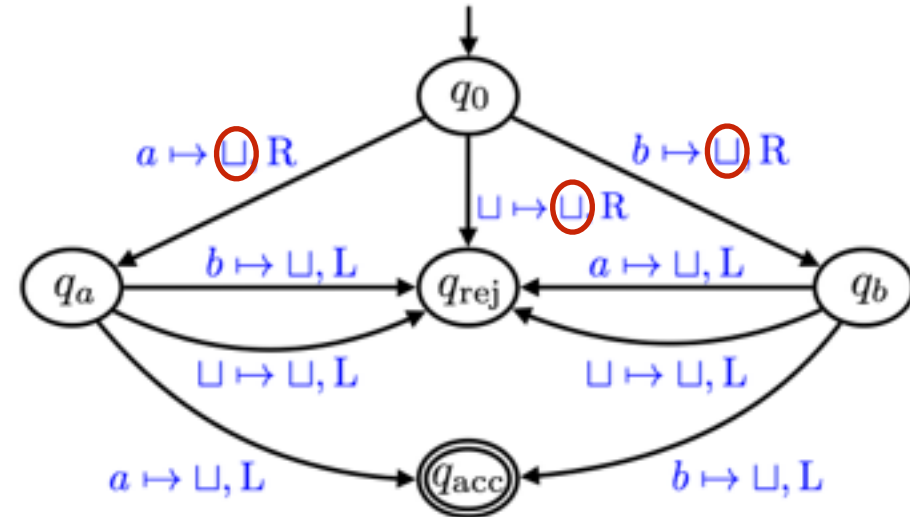
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  ⋮
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TM as a programming language

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```
  STATE 0:
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  STATE a:
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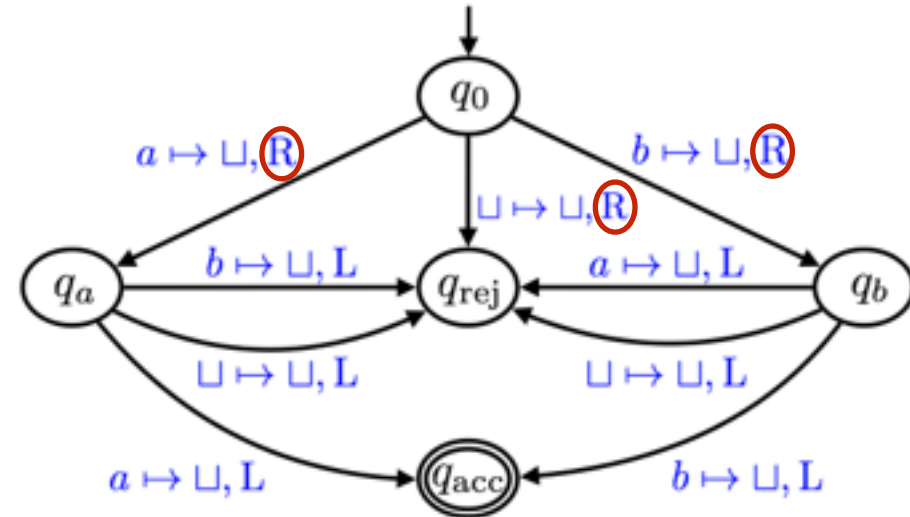
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      case 'a': input[i] = ' '; i--; go to STATE acc;
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  ⋮
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TM as a programming language

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```
  STATE a:
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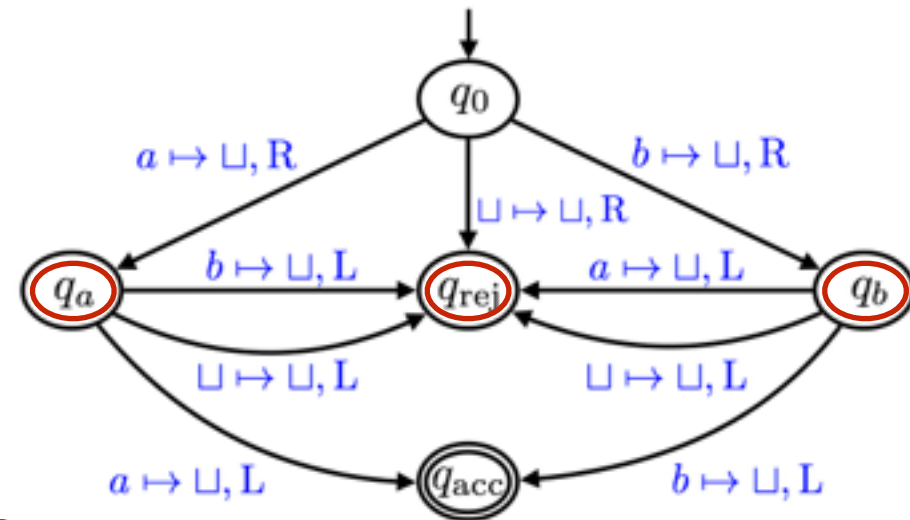
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  ⋮
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TM as a programming language

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```

```
      case ' ': input[i] = ' '; i++; go to STATE rej;
```

```
  STATE a:
```

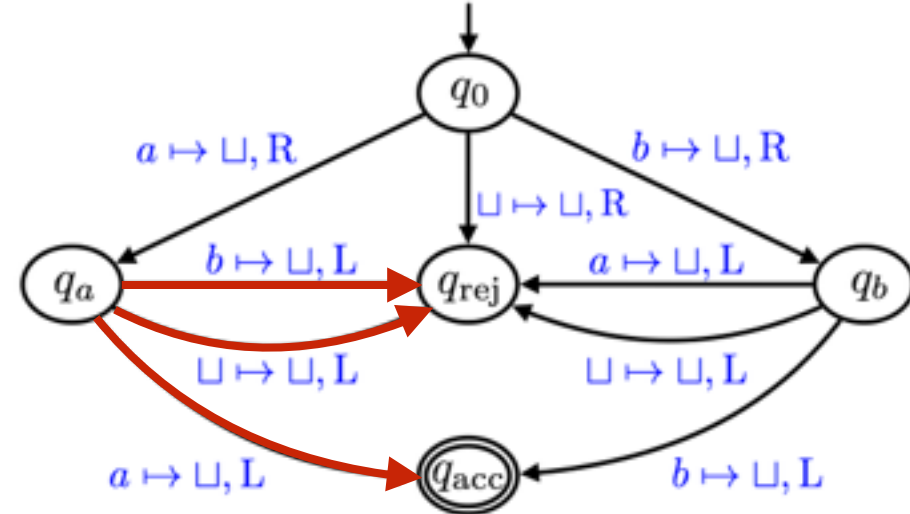
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      case 'a': input[i] = ' '; i--; go to STATE acc;
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⋮

TM as a programming language

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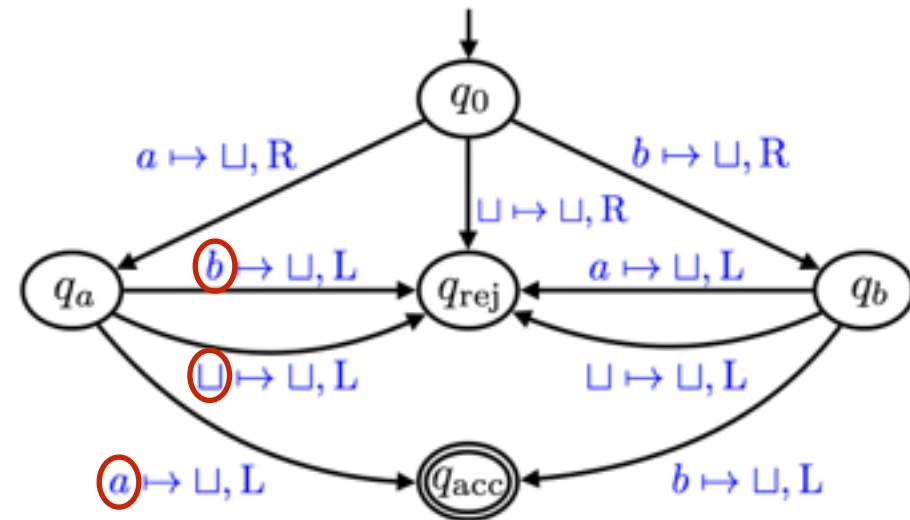
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```
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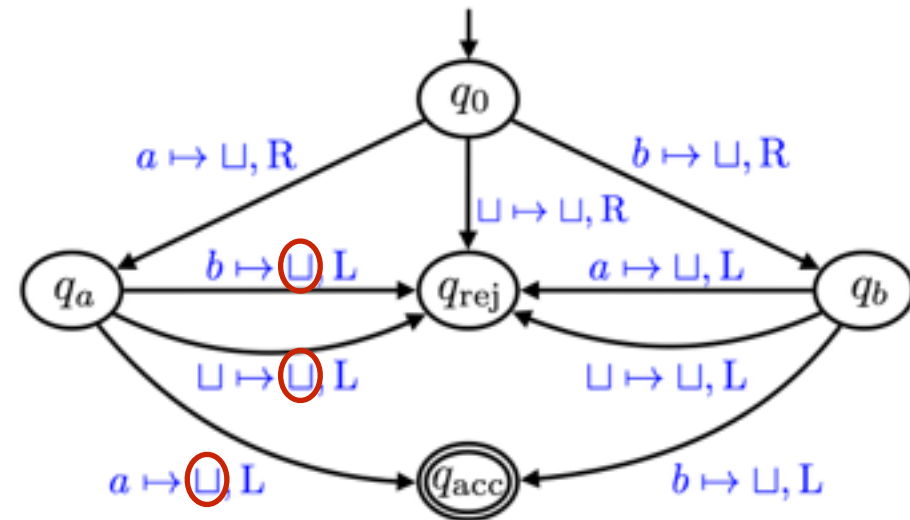
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```
  ⋮
```



TM as a programming language

```
def foo(input):
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    letter = input[i];
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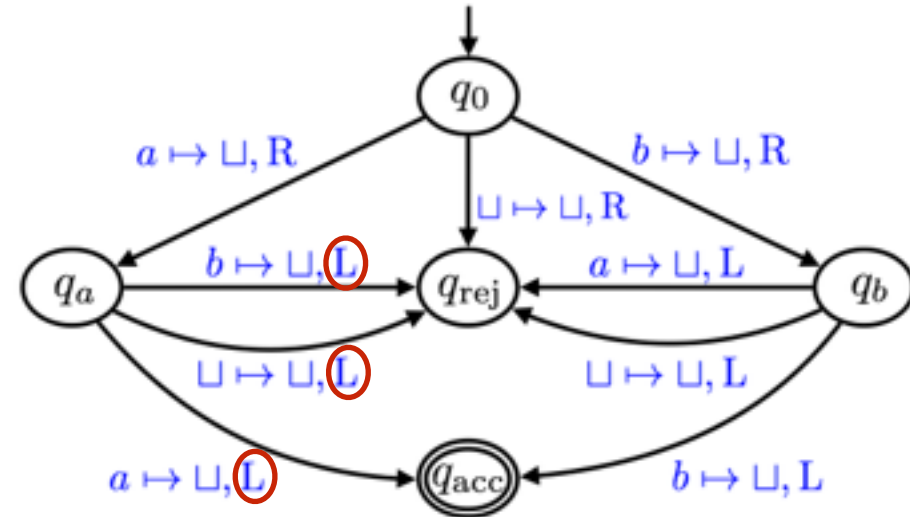
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TM as a programming language

```
def foo(input):
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```
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```
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```

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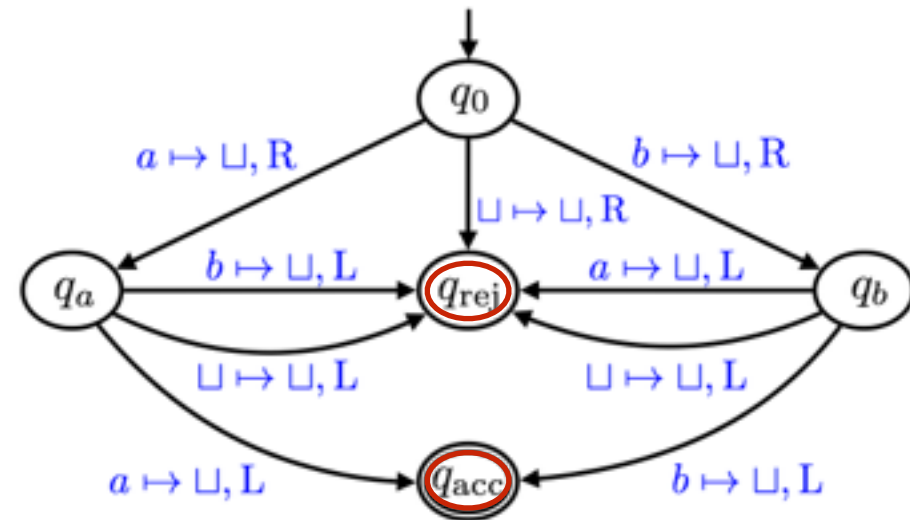
```
    switch(letter):
```

```
      case 'a': input[i] = ' '; i--; go to STATE acc;
```

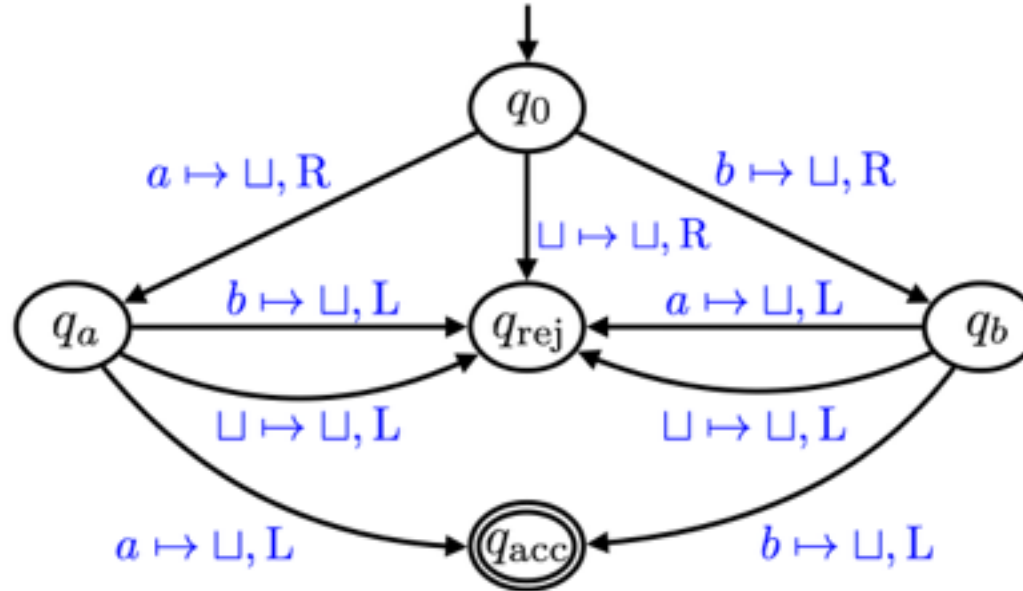
```
      case 'b': input[i] = ' '; i--; go to STATE rej;
```

```
      case ' ': input[i] = ' '; i--; go to STATE rej;
```

```
  ⋮
```



Poll



The machine accepts a string x if and only if:

$x[0] = x[1]$ and $|x| = 2$

x has at least two a's or two b's.

$x[0] \neq x[1]$

$|x| > 1$ and $x[0] = x[1]$

$x[0] = x[1]$

None of these.

Beats me.

Exercise

Let $\Sigma = \{a, b\}$.

Draw the state diagram of a TM that accepts a string iff it starts and ends with an a .

Formal definition: Turing machine

A **Turing machine (TM)** M is a 7-tuple

$$M = (Q, \Sigma, \Gamma, \delta, q_0, q_{acc}, q_{rej})$$

where

- Q is a finite set (which we call the **set of states**);
- Σ is a finite set with $\sqcup \notin \Sigma$
(which we call the **input alphabet**);
- Γ is a finite set with $\sqcup \in \Gamma$ and $\Sigma \subset \Gamma$
(which we call the **tape alphabet**);
- δ is a function of the form $\delta : Q \times \Gamma \rightarrow Q \times \Gamma \times \{L, R\}$
(which we call the **transition function**);
- $q_0 \in Q$ (which we call the **start state**);
- $q_{acc} \in Q$ (which we call the **accept state**);
- $q_{rej} \in Q$, $q_{rej} \neq q_{acc}$ (which we call the **reject state**);

Formal definition: TM accepting a string

A bit complicated to define rigorously.

Not too much though.

See Homework 2.

DFAs vs TMs

- A DFA does not have access to tape cells that don't contain the input.
(doesn't have access to unbounded memory)
- A DFA's tape head can only move right.
- A DFA can't write to the tape.
- A DFA can have more than one accepting state.
- A DFA always halts once all the input symbols are read.
A TM might loop forever.

DFAs vs TMs

- A DFA does not have access to tape cells that don't contain the input.
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- A DFA's tape head can only move right.
- A DFA can't write to the tape.
- A DFA can have more than one accepting state.
- A DFA always halts once all the input symbols are read.
A TM might loop forever.

Definition: decidable/computable languages

Let M be a Turing machine.

We let $L(M)$ denote the set of strings that M **accepts**.

So, $L(M) = \{x \in \Sigma^* : M(x) \text{ accepts.}\}$

What is the analog of **regular languages** in this setting?

Definition: A TM is called a **decider** if it halts on all inputs.

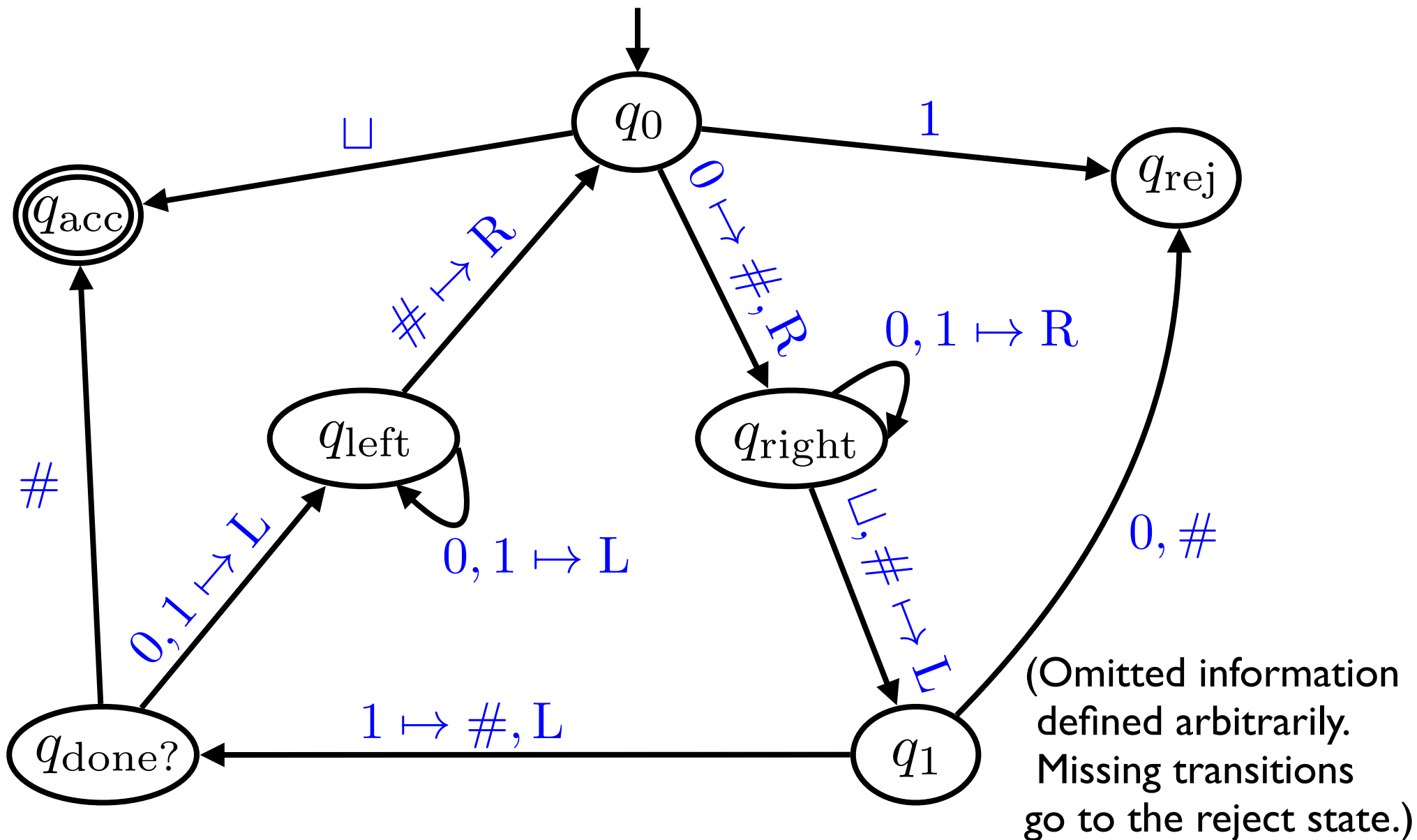
Definition: A language L is called **decidable** (or **computable**) if $L = L(M)$ for some decider TM M .

regular languages [?] = decidable languages

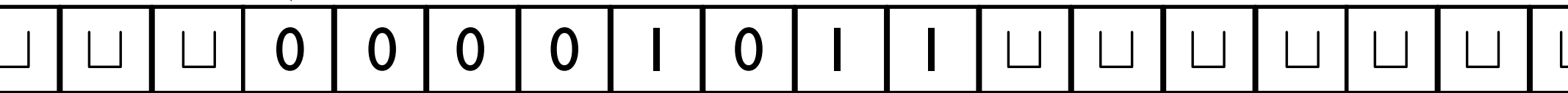
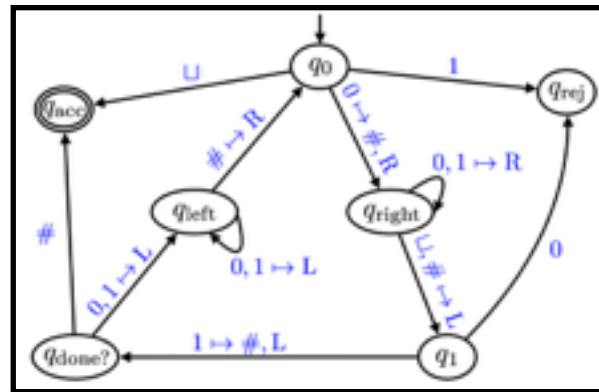
Turing machine that decides $0^n 1^n$

$$\Sigma = \{0, 1\}$$

$$\Gamma = \{0, 1, \#, \sqcup\}$$

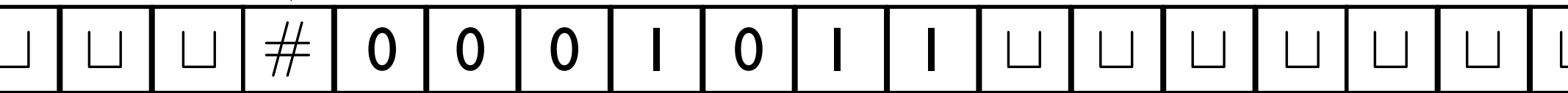
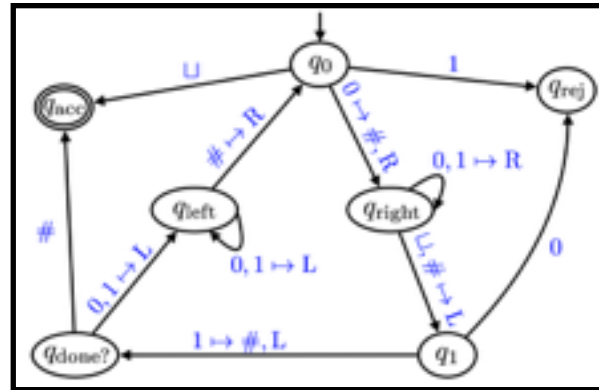


Turing machine that decides $0^n 1^n$



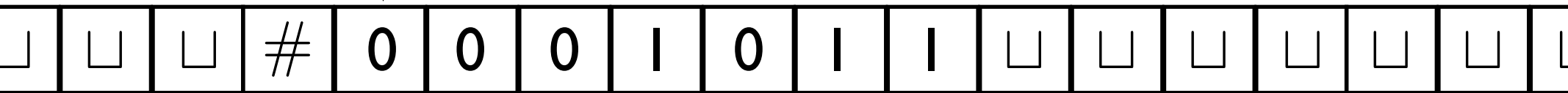
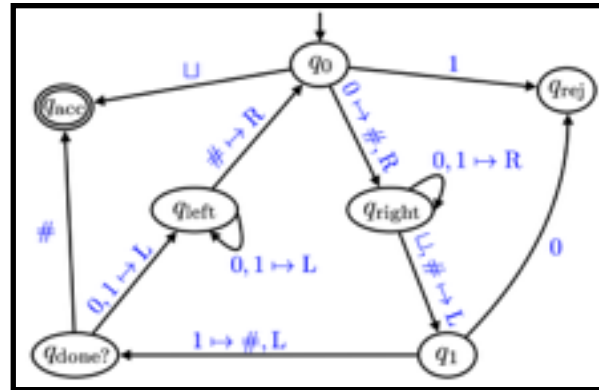
Input: 00001011

Turing machine that decides $0^n 1^n$



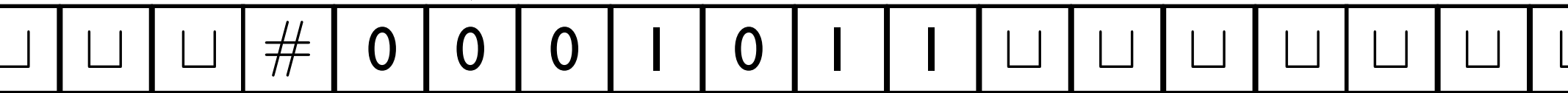
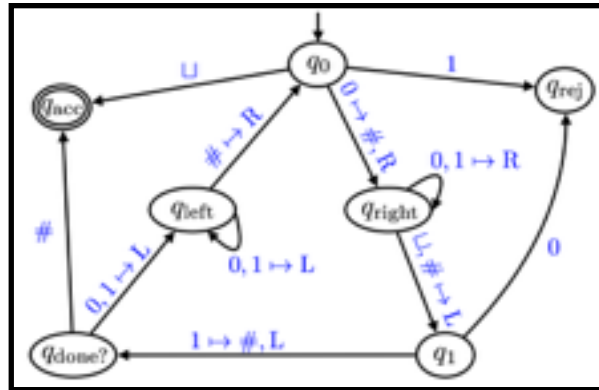
Input: 0001011

Turing machine that decides $0^n 1^n$



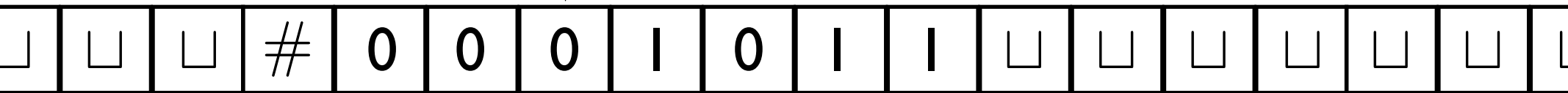
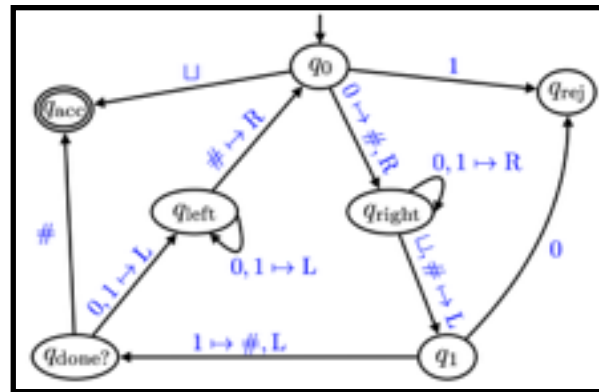
Input: 0001011

Turing machine that decides $0^n 1^n$



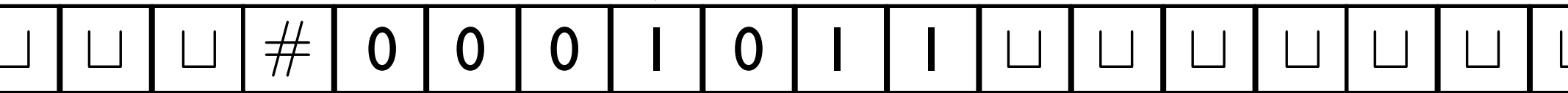
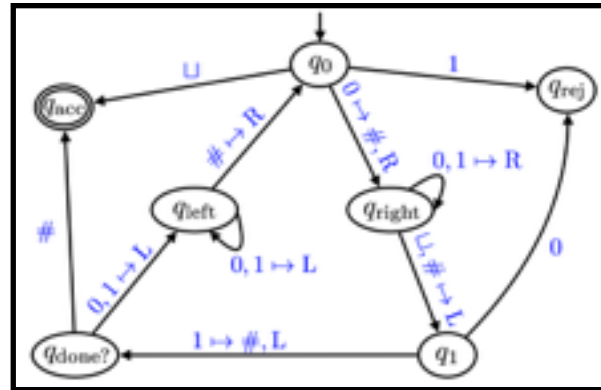
Input: 0001011

Turing machine that decides $0^n 1^n$



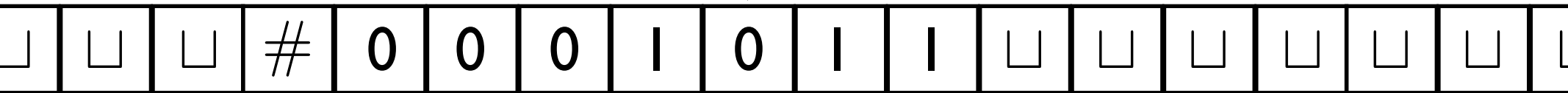
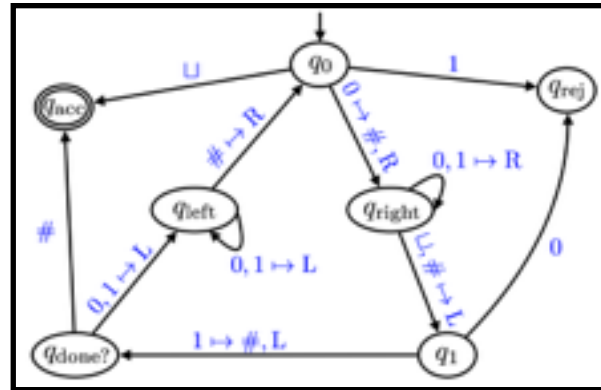
Input: 0001011

Turing machine that decides $0^n 1^n$



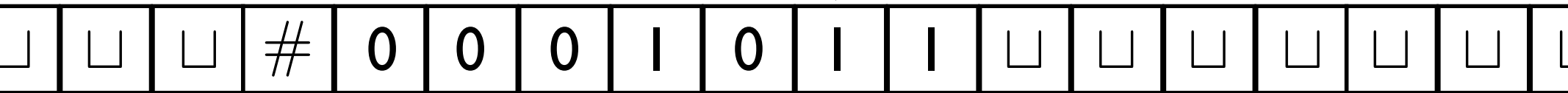
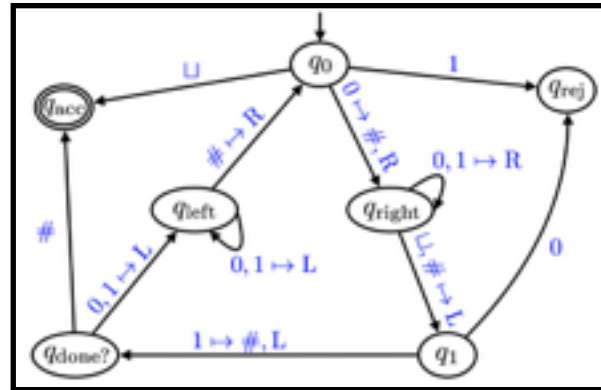
Input: 0001011

Turing machine that decides $0^n 1^n$



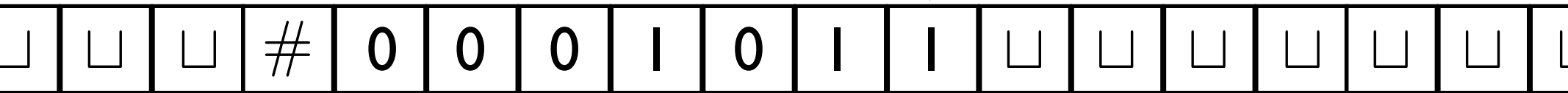
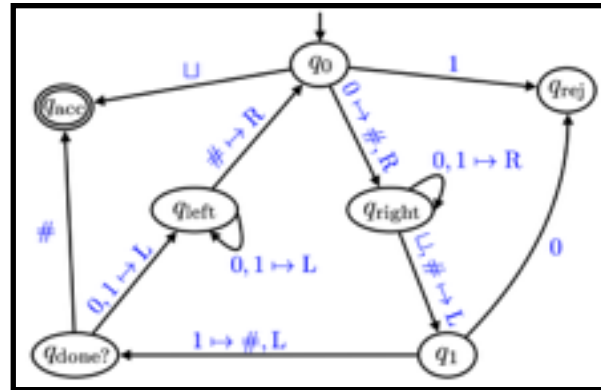
Input: 0001011

Turing machine that decides $0^n 1^n$



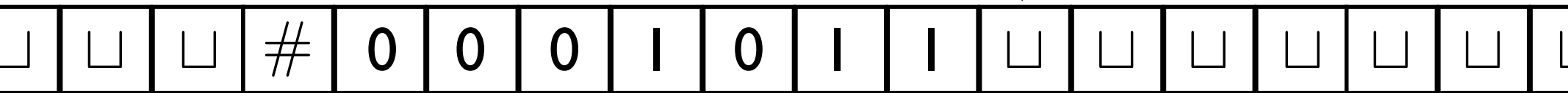
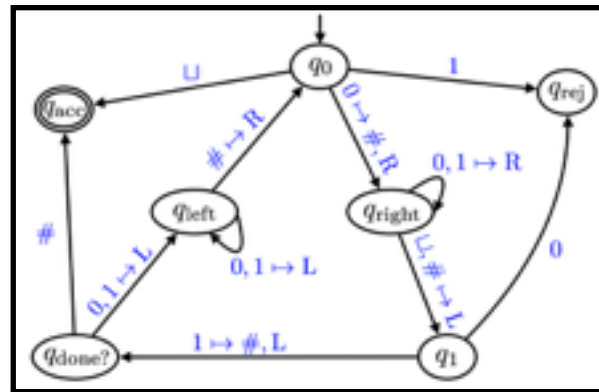
Input: 0001011

Turing machine that decides $0^n 1^n$



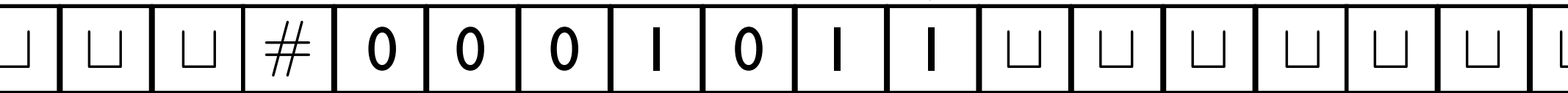
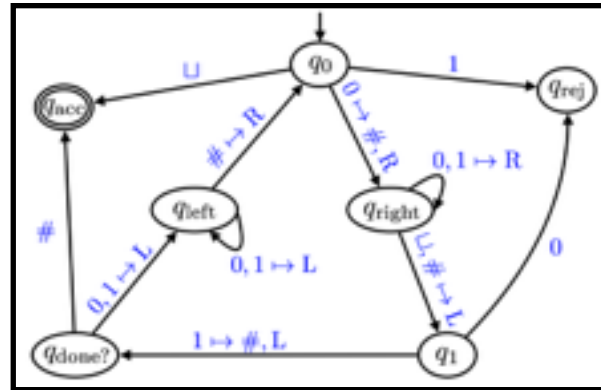
Input: 0001011

Turing machine that decides $0^n 1^n$



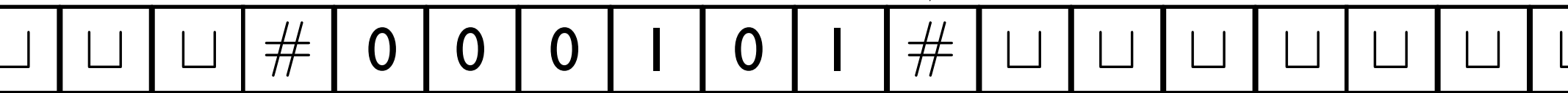
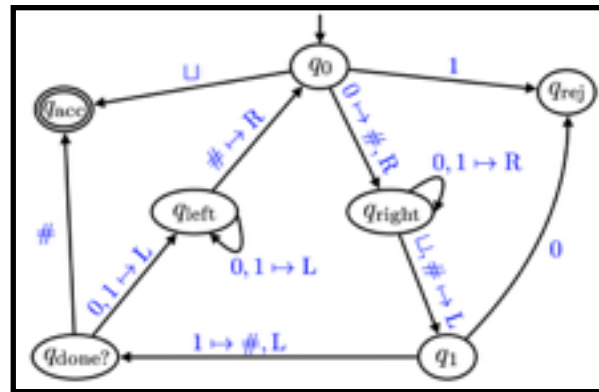
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Turing machine that decides $0^n 1^n$



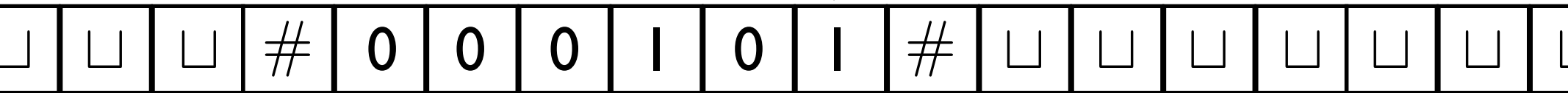
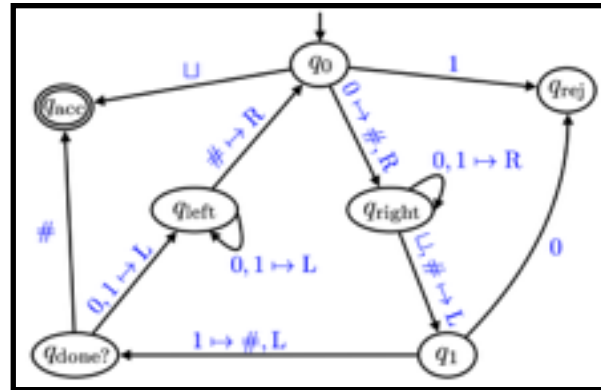
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Turing machine that decides $0^n 1^n$



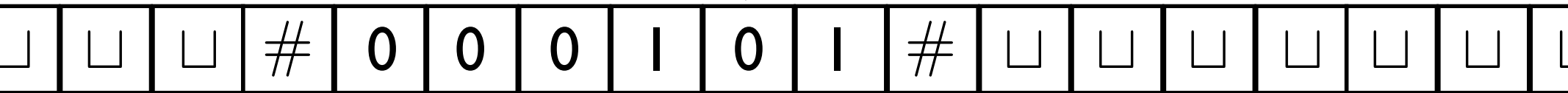
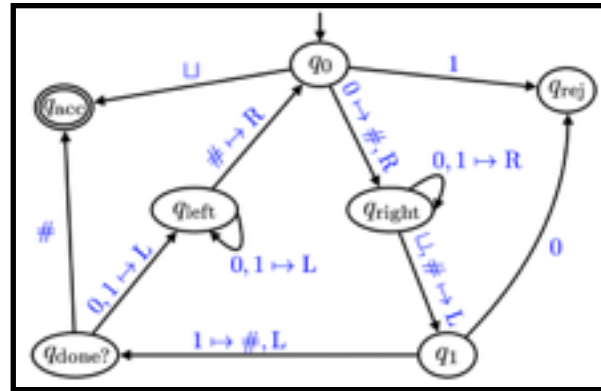
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Turing machine that decides $0^n 1^n$



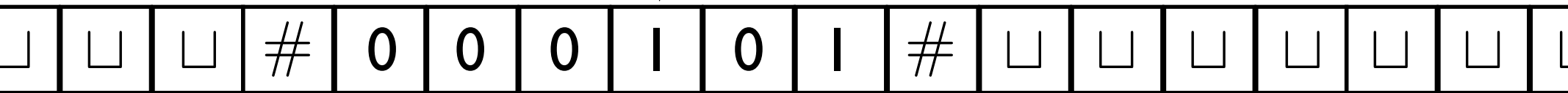
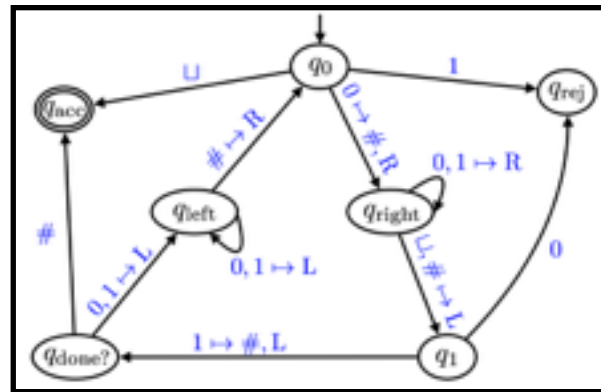
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Turing machine that decides $0^n 1^n$



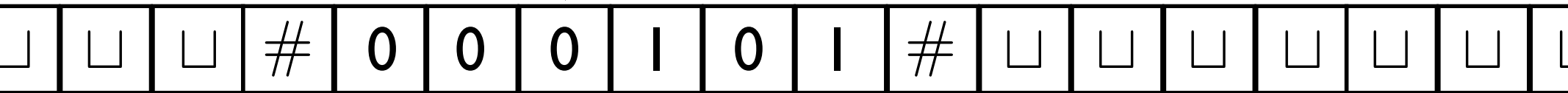
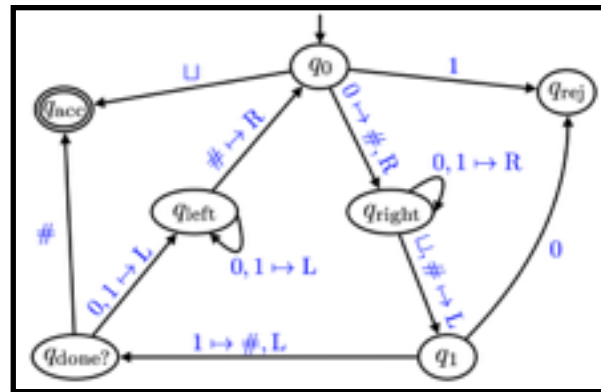
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Turing machine that decides $0^n 1^n$



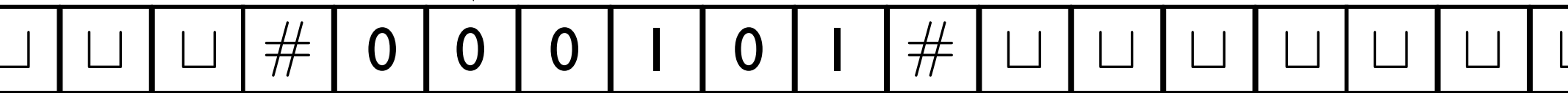
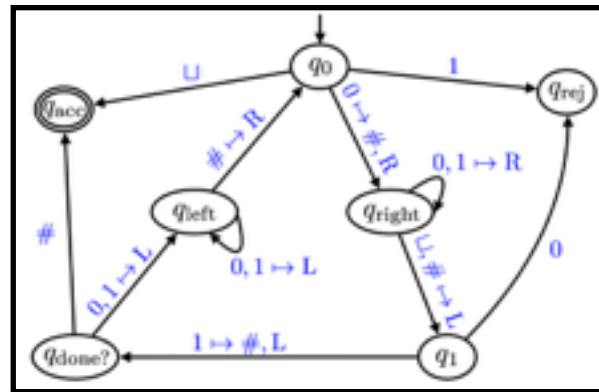
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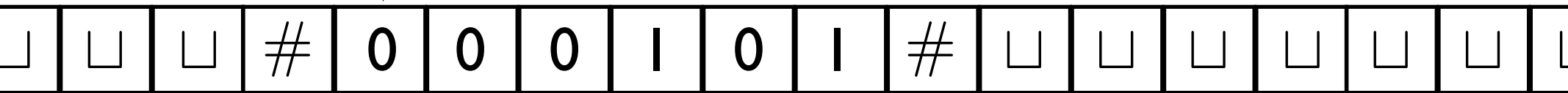
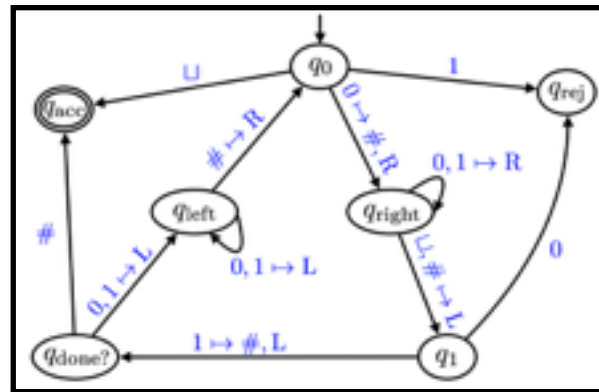
Input: 0001011

Turing machine that decides $0^n 1^n$



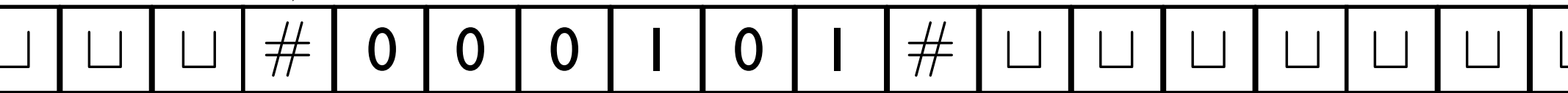
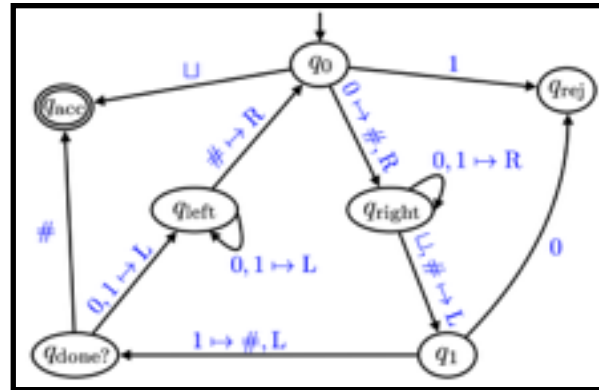
Input: 0001011

Turing machine that decides $0^n 1^n$



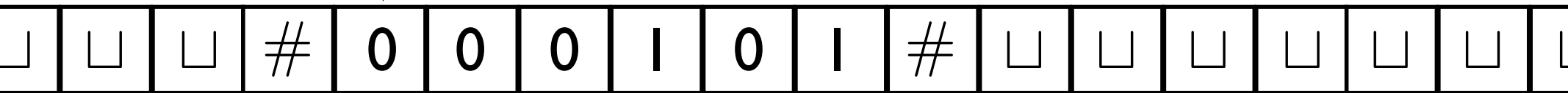
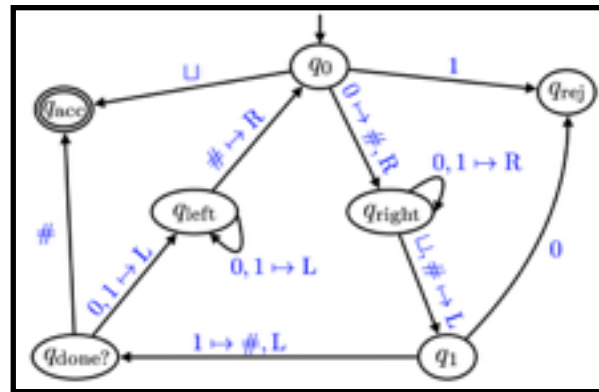
Input: 00001011

Turing machine that decides $0^n 1^n$



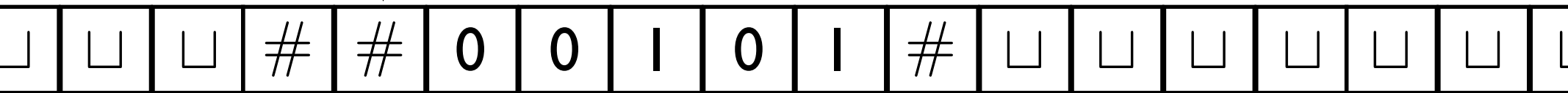
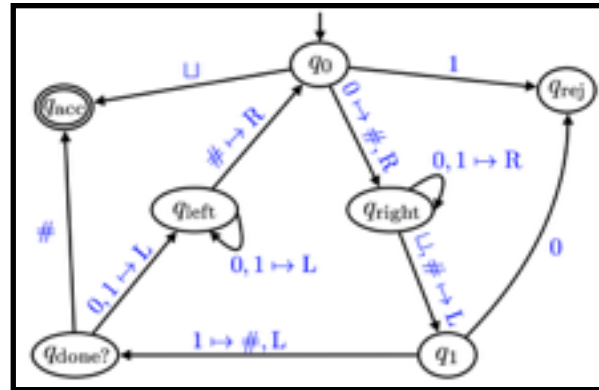
Input: 0001011

Turing machine that decides $0^n 1^n$



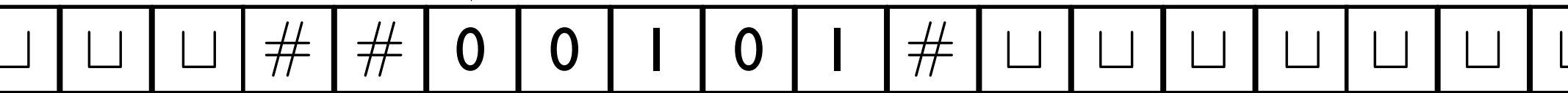
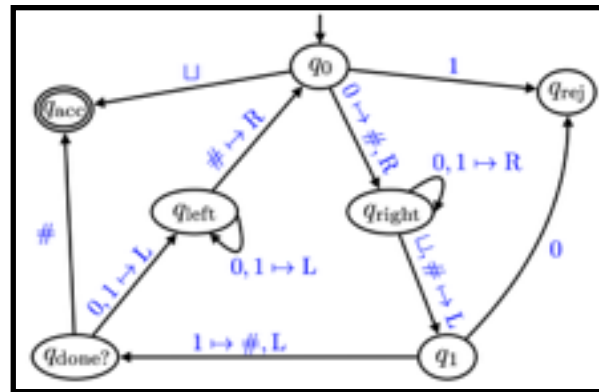
Input: 0001011

Turing machine that decides $0^n 1^n$



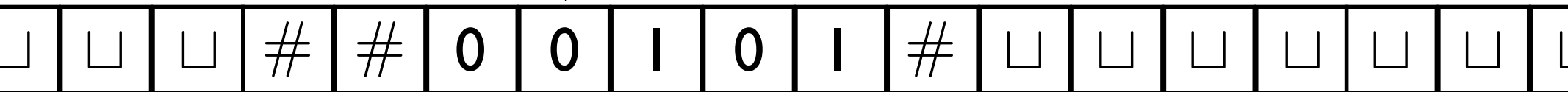
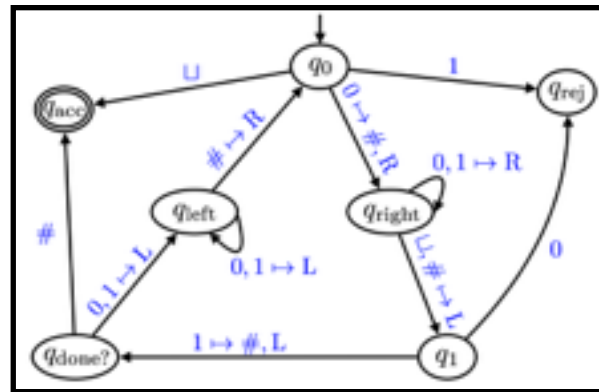
Input: 0001011

Turing machine that decides $0^n 1^n$



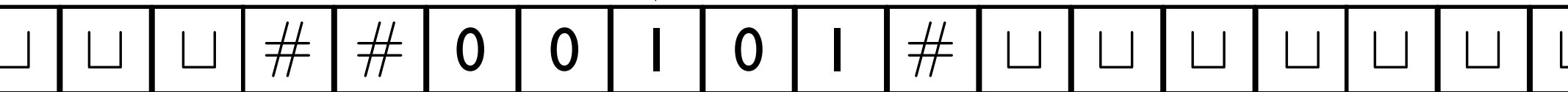
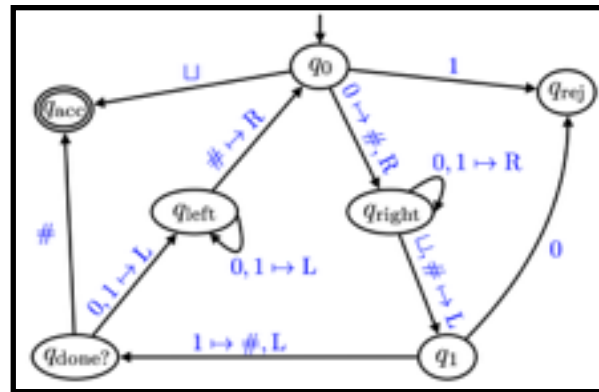
Input: 0001011

Turing machine that decides $0^n 1^n$



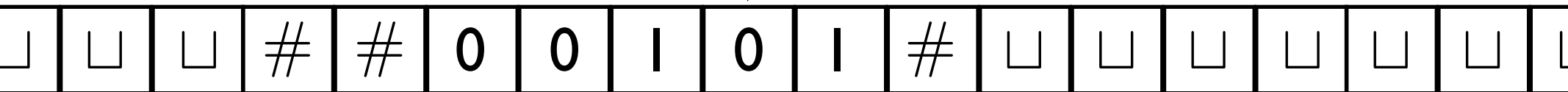
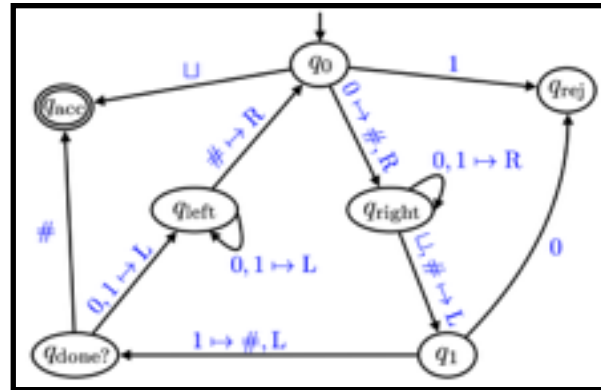
Input: 0001011

Turing machine that decides $0^n 1^n$



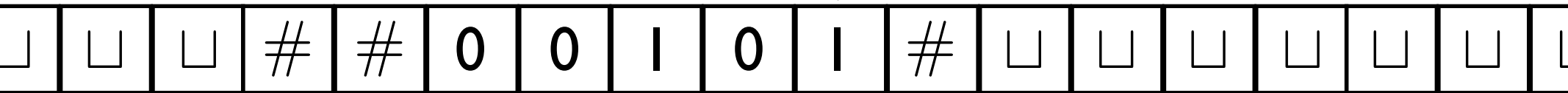
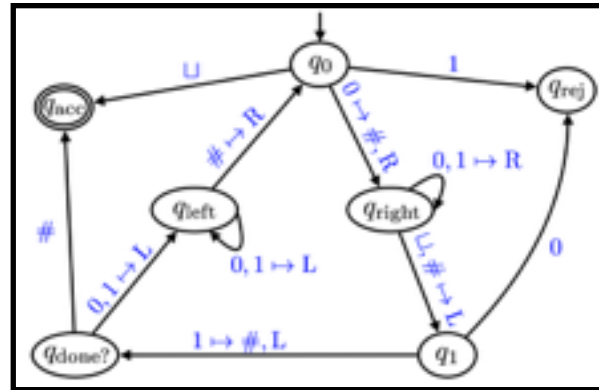
Input: 0001011

Turing machine that decides $0^n 1^n$



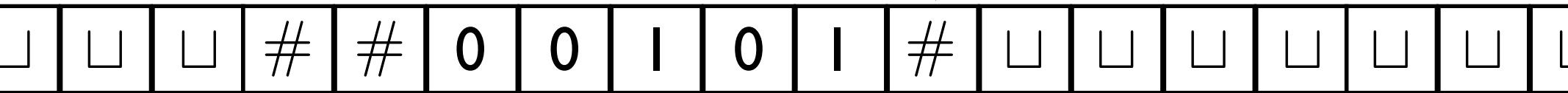
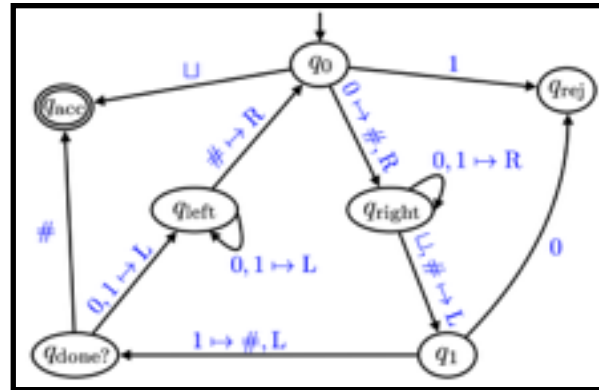
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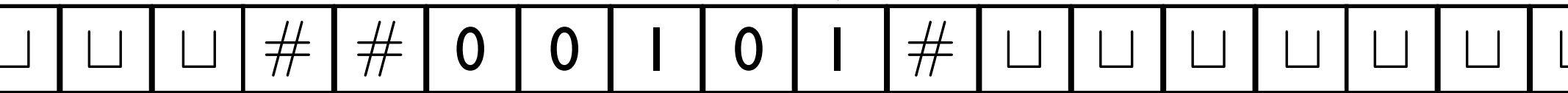
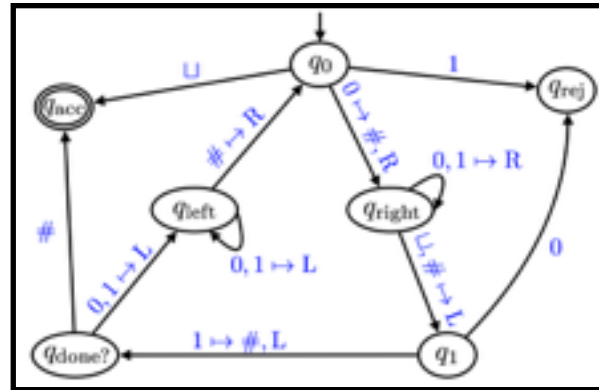
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Turing machine that decides $0^n 1^n$



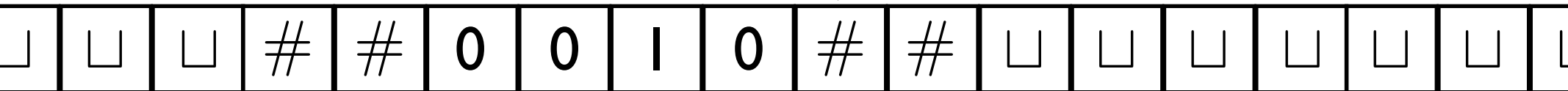
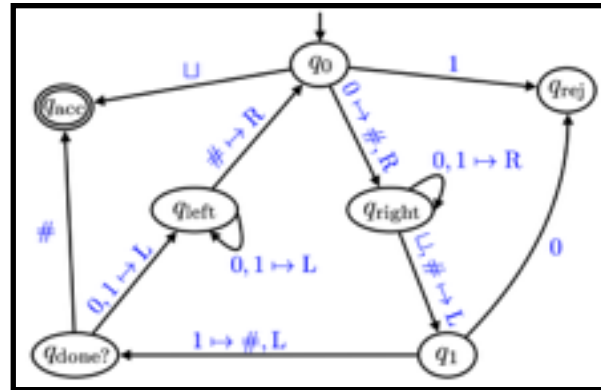
Input: 0001011

Turing machine that decides $0^n 1^n$



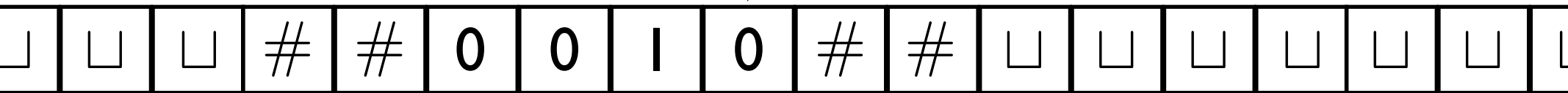
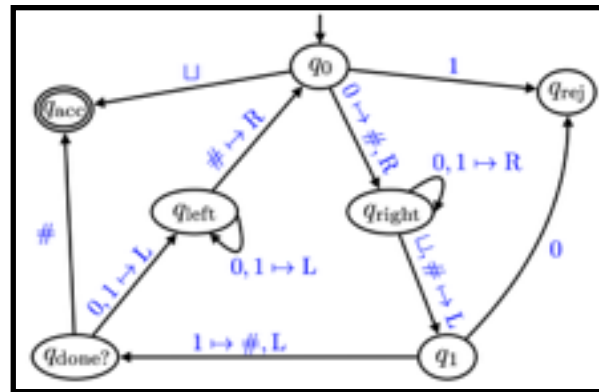
Input: 0001011

Turing machine that decides $0^n 1^n$



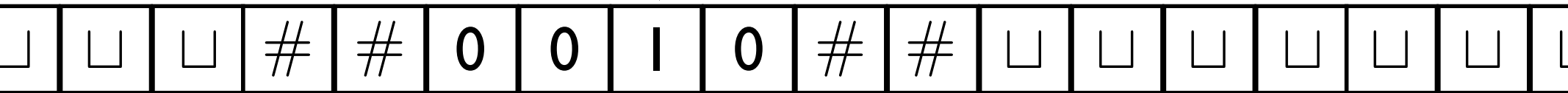
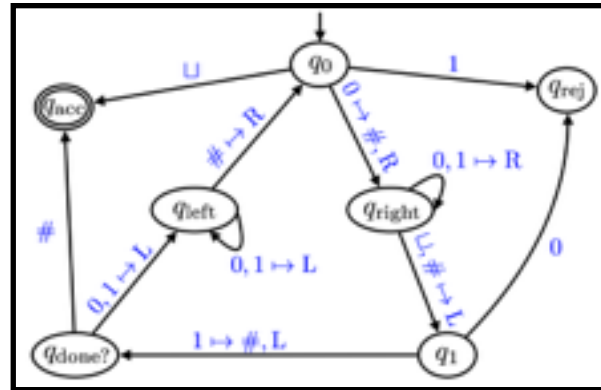
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Turing machine that decides $0^n 1^n$



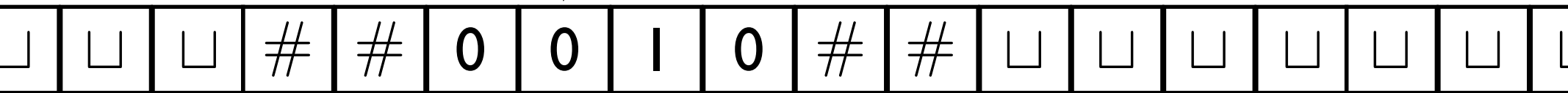
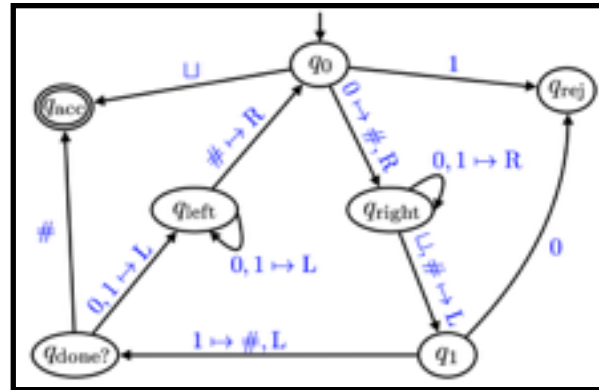
Input: 0001011

Turing machine that decides $0^n 1^n$



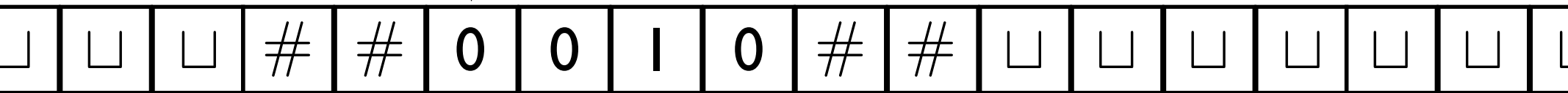
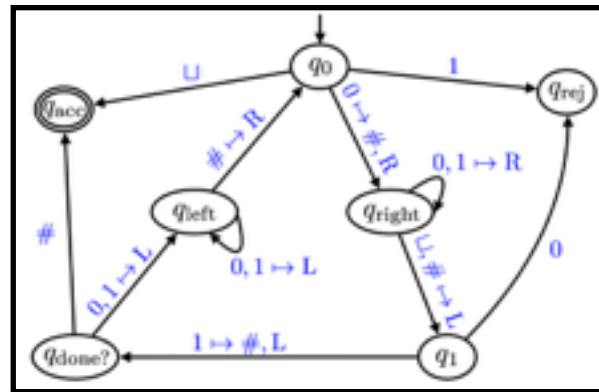
Input: 0001011

Turing machine that decides $0^n 1^n$



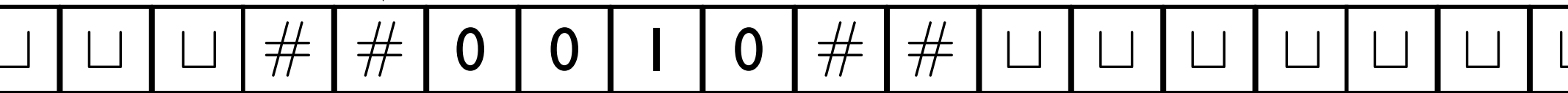
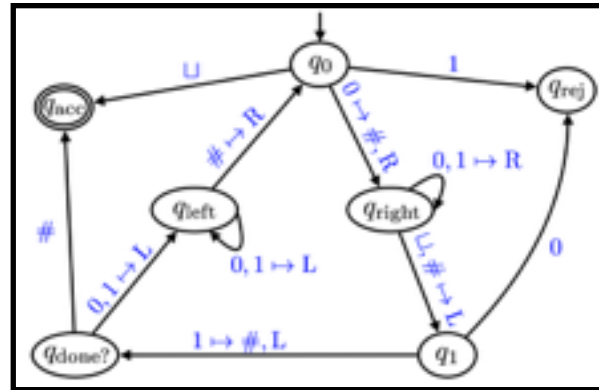
Input: 00001011

Turing machine that decides $0^n 1^n$



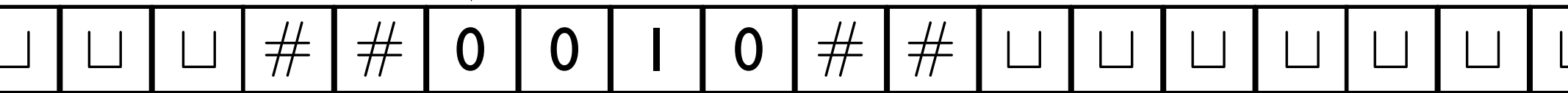
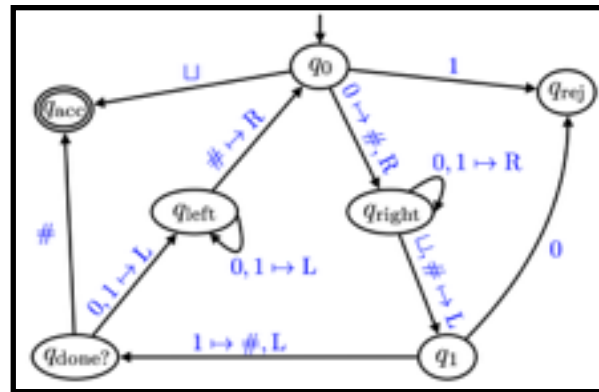
Input: 0001011

Turing machine that decides $0^n 1^n$



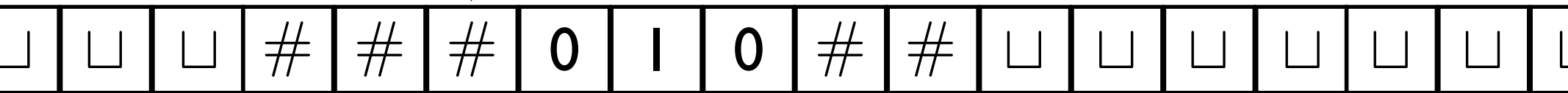
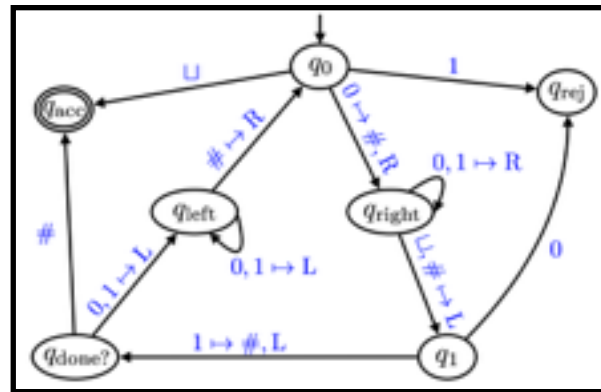
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Turing machine that decides $0^n 1^n$



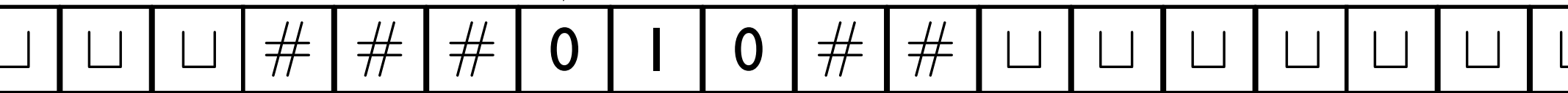
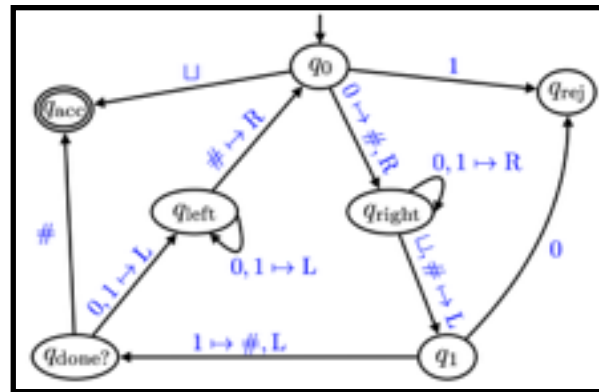
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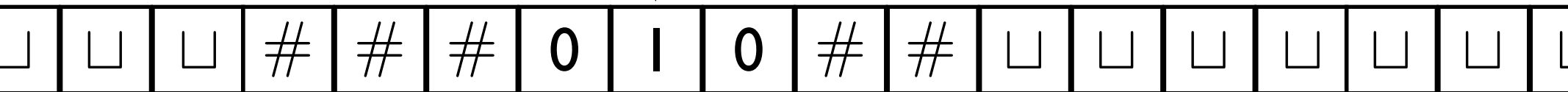
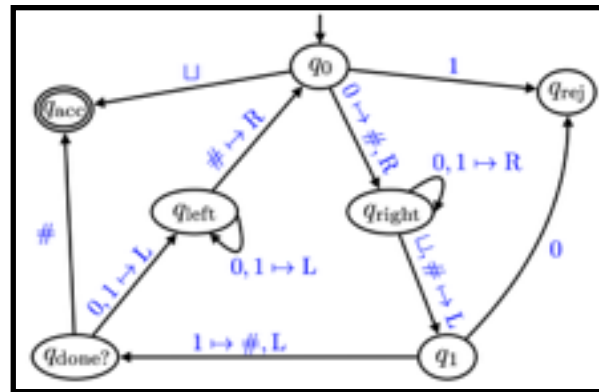
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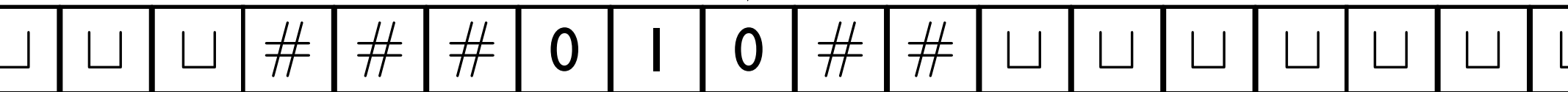
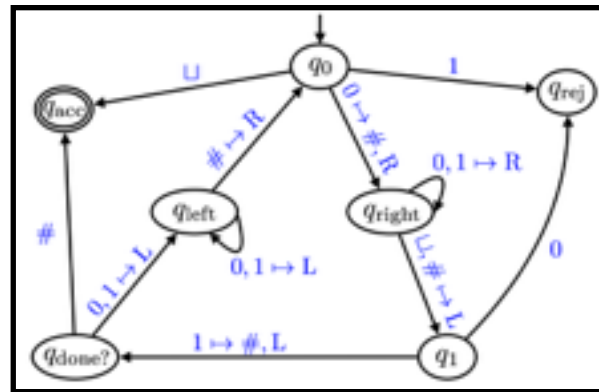
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Turing machine that decides $0^n 1^n$



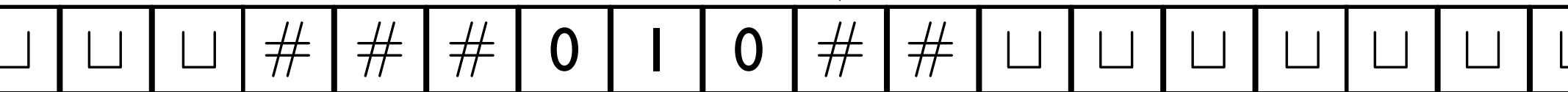
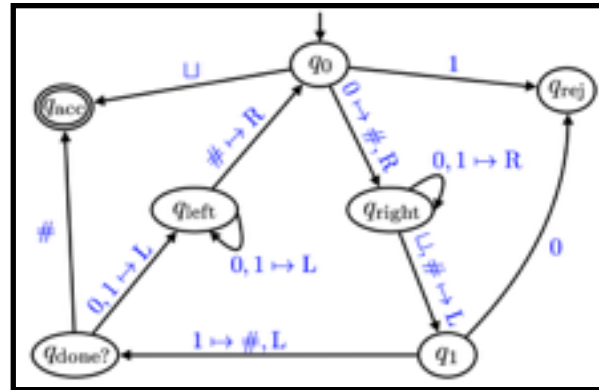
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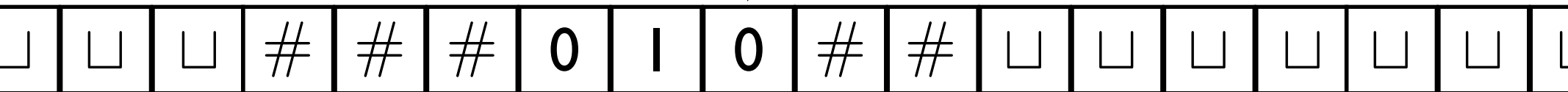
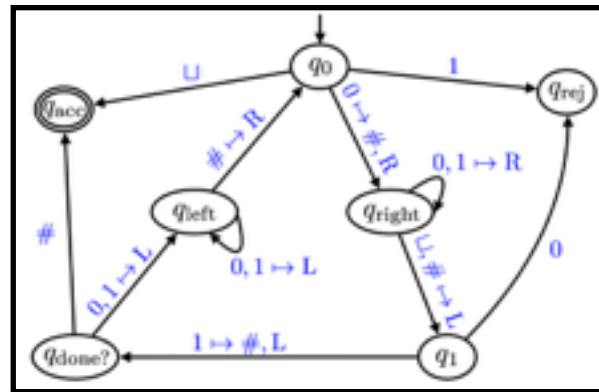
Input: 00001011

Turing machine that decides $0^n 1^n$



Input: 0001011

Turing machine that decides $0^n 1^n$



Input: 00001011

Decision: **reject**

Programming with a TM is tiresome.

Every computer scientist should spend some time doing it at least once in their life.

Unfortunately for you, that time is now!

Some TM subroutines and tricks

- Move right (or left) until first \sqcup encountered
- Shift entire input string one cell to the right
- Convert input from

$$x_1 x_2 x_3 \dots x_n \quad \text{to} \quad \sqcup x_1 \sqcup x_2 \sqcup x_3 \dots \sqcup x_n$$

- Simulate a big Γ by just $\{0, 1, \sqcup\}$
- “Mark” cells. If $\Gamma = \{0, 1, \sqcup\}$, extend it to
$$\Gamma = \{0, 1, 0^\bullet, 1^\bullet, \sqcup\}$$
- Copy a stretch of tape between two marked cells into another marked section of the tape



Some TM subroutines and tricks

- Implement basic string and arithmetic operations
- Simulate a TM with 2 tapes and heads
- Implement a dictionary data structure
- Simulate “random access memory”
- ⋮
- Simulate assembly language

You could prove this rigorously if you wanted to.

So what we want is:

A **totally minimal (TM)** programming language such that

- it can simulate simple bytecode
(and therefore Python, C, Java, SML, etc...) 
- it is simple to define and reason about completely
mathematically rigorously 

A note

You could describe a TM in 3 ways:

Low level description

State diagram

Medium level description

Description of the movement and the behavior of the tape head.

High level description

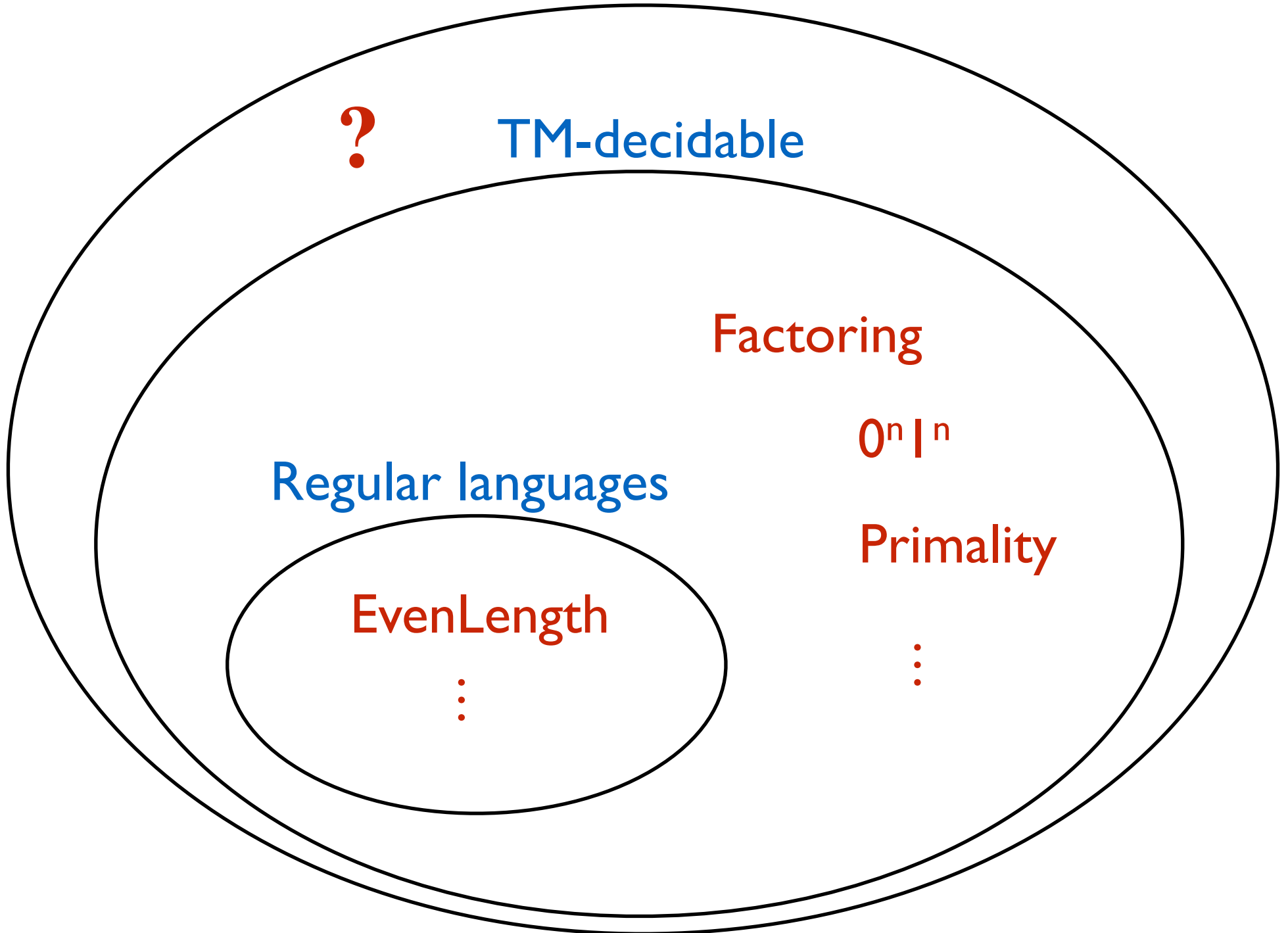
Pseudocode or algorithm

Important Question

Is TM the right definition?

Is there a reasonable definition of “algorithm”
that can compute more languages than TM-decidable ones?

Solvable with any computing device



Church-Turing Thesis

Church-Turing Thesis

The intuitive notion of “computable” is captured by functions computable by a Turing Machine.

This is not a theorem!

Is it ...

an observation?

a definition?

a hypothesis?

a law of nature/physics?

a philosophical statement?

How did Turing think about all this?

1936: On Computable Numbers, with an Application to the Entscheidungsproblem



At the time of writing,
“computer” meant a person,
trained in calculation.

Computers in the age of Turing



How did Turing think about all this?

1936: On Computable Numbers, with an Application to the Entscheidungsproblem



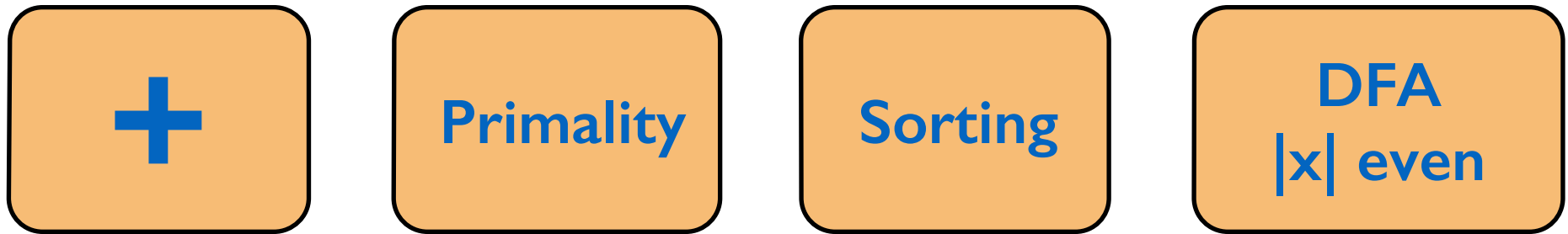
Any notion of "computation" must be able to be carried out by a "computer".

Turing justified TMs by arguing that it can do anything a human could.

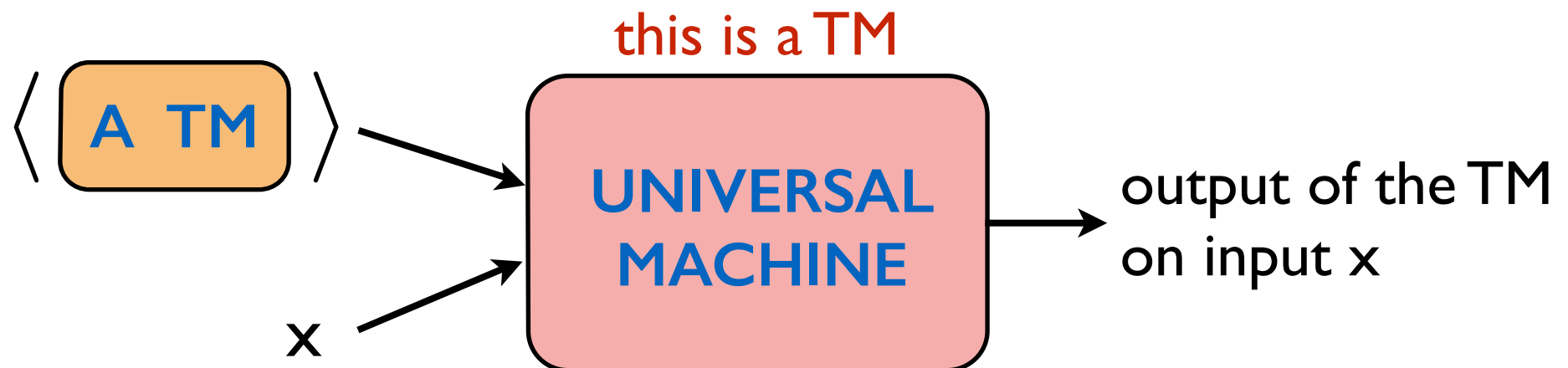
What else did Turing do in his paper?

Universal Machine

(one machine to rule them all)



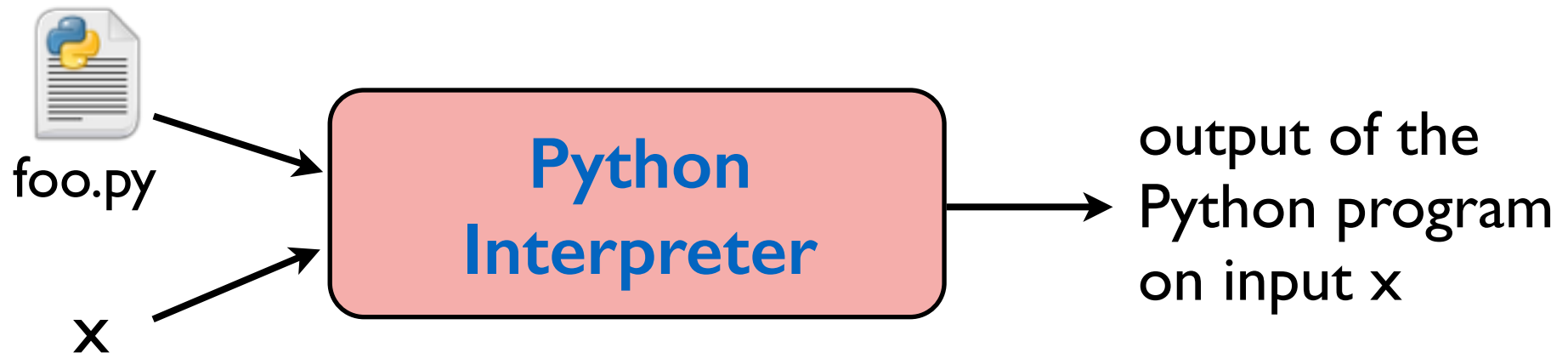
All can be encoded/represented with a string.
(e.g. think source code)



What else did Turing do in his paper?

Universal Machine (one machine to rule them all)

This is exactly what an **interpreter** does.



What else did Turing do in his paper?

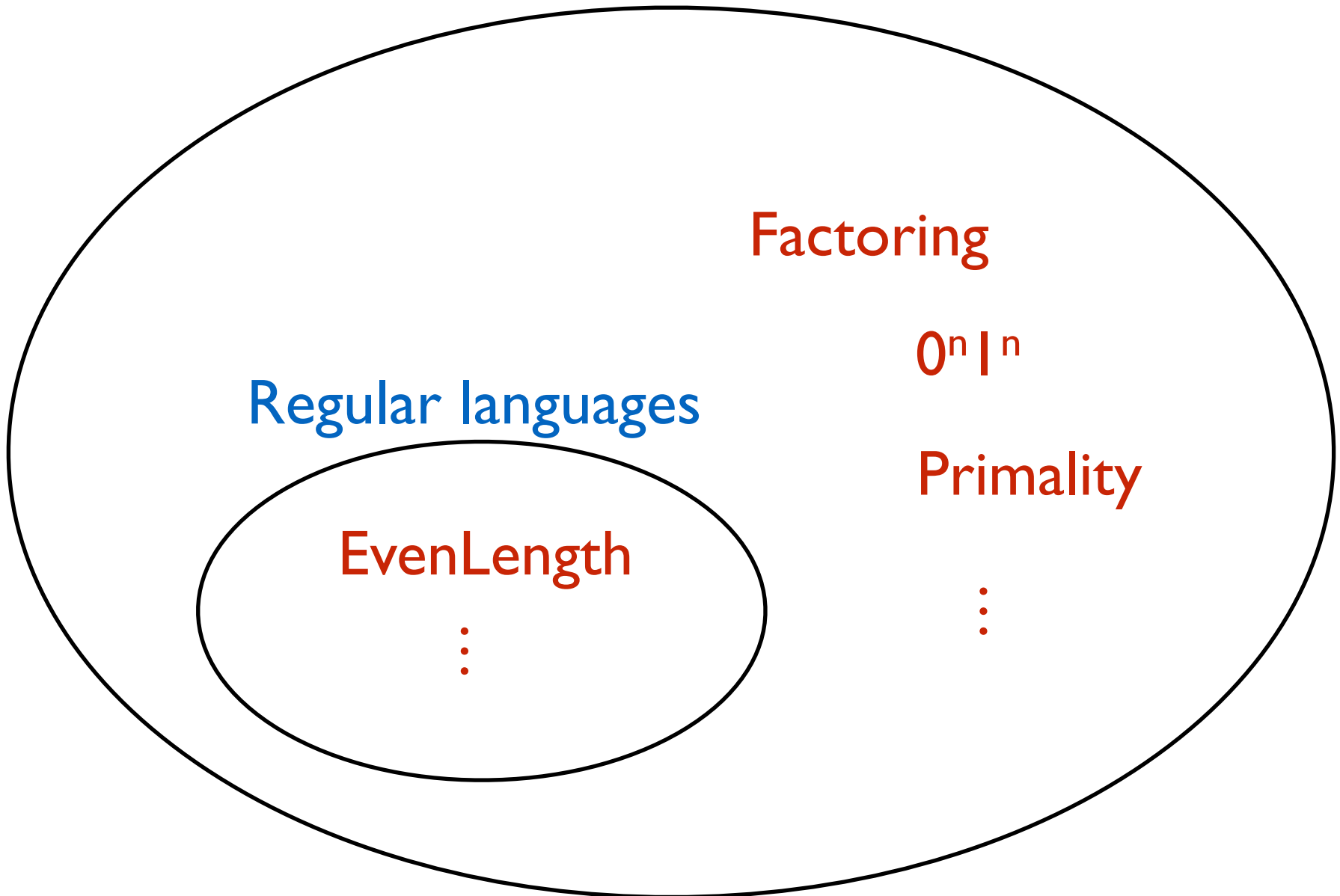
There are languages that cannot be computed!

?

Solvable with any computing device

=

TM-decidable



What else did Turing do in his paper?

There are languages that cannot be computed!

Entscheidungsproblem

Determining the validity of a given FOL sentence.

e.g. $\neg \exists x, y, z, n \in \mathbb{N} : (n \geq 3) \wedge (x^n + y^n = z^n)$

Not decidable!

Halting problem

Determining if a given TM halts on all inputs.

(i.e. determining if a given TM is a **decider**.)

Not decidable!

How do you show a problem is **undecidable**?

Well, of course, you assume it is decidable,
and reach a contradiction.

Next week's topic!

