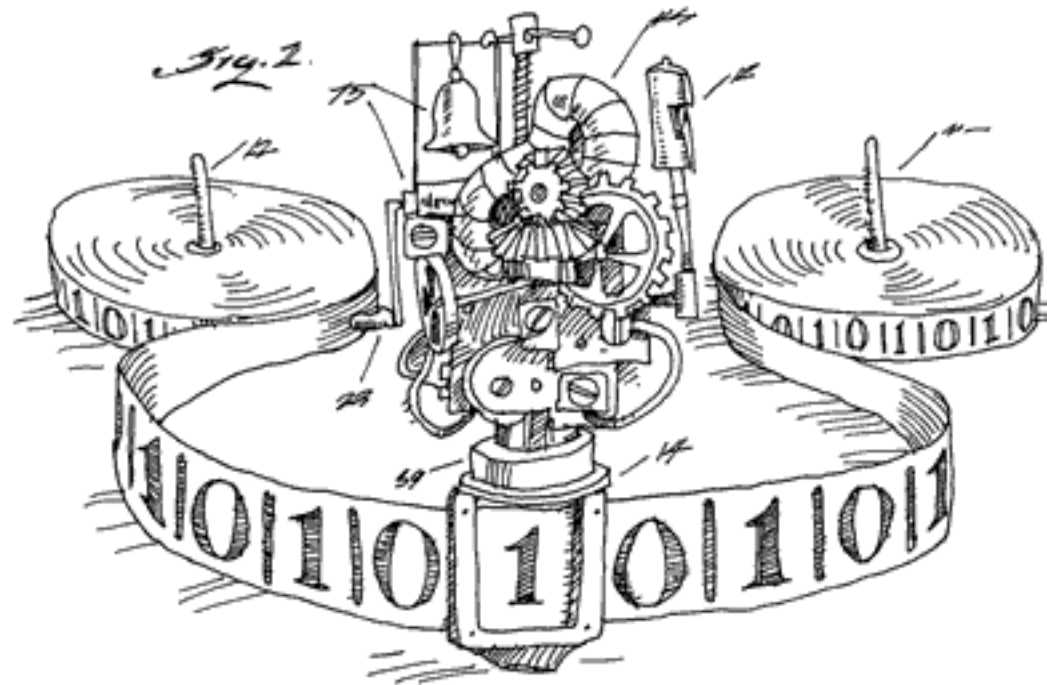


CSC4010: Introduction to Theoretical Computer Science



Lecture 3

Logistics

- Is everyone getting Blackboard emails?
- Part of Problem Set 1 is out, contains three problems. We will discuss in tutorial. You should attempt this, alone or in groups.
- Course webpage is also updated with topics to read from references. Please make sure to have a look.

Recap

1. **Computational Problems:** is a *task* which for each *valid input* produces one or more *outputs*. to: general.
2. **Two Simplifying Restrictions:**
 - Inputs are binary strings $\Rightarrow$ finite set of size $k \rightarrow$ can be encoded as $\{0,1\}^k$.
 - Outputs are 0/1 or YES/NO.
3. **Decision Problems = Languages:**
 $L \subseteq \{0,1\}^*, \underline{x} \in L \iff$ answer on x is YES.
4. **Cardinality of Languages:** The set $\{0,1\}^*$ is countable but, the set of all languages: $\mathbb{L} = \{L : L \subseteq \{0,1\}^*\}$, is uncountable.

Recap

Fact 1: $\{0,1\}^*$ is countable.
 $\{0,1\}^* = \{x_1, x_2, \dots\}$

Claim: The set of all languages: $\mathbb{L} = \{L : L \subseteq \{0,1\}^*\}$, is uncountable.

Proof: (By contradiction) $\mathbb{L}$ is countable, $\mathbb{L} = \{L_1, L_2, \dots\}$.

	x_1	x_2	x_3	x_4
L_1	0	1	1	
L_2	0	1	0	
L_3	1	1	0	
$\vdots$				

$$= M(L_j, x_i) = 1 \Leftrightarrow x_i \in L_j \text{ and } 0/w.$$

$$L_{\text{diag}} = \{x_i \mid x_i \notin L_i\}$$

$$L_{\text{diag}} = \{x_1, x_3, \dots\}$$

$L_{\text{diag}} \neq L_i$
 as it disagrees w/
 L_i at x_i

$$L_{\text{diag}} \notin \{L_1, L_2, \dots\} \rightarrow \textcircled{2}$$

$$L_{\text{diag}} \subseteq \{0,1\}^*$$

$$L_{\text{diag}} \in \mathbb{L} \rightarrow \textcircled{3}$$

$$\textcircled{2} + \textcircled{3} \Rightarrow \text{contradiction}$$

Recap

Observation: Python program P , its $\langle P \rangle$ is also finite.

Claim: There exists a language L for which there is no python code P such that $P(x) = 1 \iff x \in L$.

$$\mathcal{P} = \{ \langle P \rangle \mid P \text{ is a python program} \} \subseteq \Sigma^* \text{ (countable)}$$

$$|\mathcal{P}| < |\mathbb{N}| \rightarrow \textcircled{1}$$

Proof: (contradiction) For every language $L \in \mathcal{L}$, $\exists$ Python code P_L st. $P_L(x) = 1 \iff x \in L$.

$$f: \mathcal{L} \rightarrow \mathcal{P}, \quad f(L) = \langle P_L \rangle \text{ (one-one)}$$

$$|\mathcal{L}| \leq |\mathcal{P}| \text{ (f is one-one)}$$

$$|\mathcal{L}| > |\mathbb{N}| \text{ (uncountable)}$$

$$\frac{|\mathcal{L}| > |\mathcal{P}|}{|\mathcal{P}| < |\mathbb{N}|} \textcircled{2} \quad |\mathcal{P}| = |\mathbb{N}|$$

$\Downarrow$
as python prog
corresponding to
each language is
distinct.

Some Thoughts on the Proof

- There is nothing special about Python. You can replace it with a programming language or machine model of your choice.
- The key step: any algorithm has a finite description and we can therefore encode them as strings.
- **Objection 1:** The proof is **non-constructive**. What are the problems that cannot be solved by a python code? Are they interesting?
- **Objection 2:** The proof says: for every computational model there is a problem that cannot be solved by it. **Is there a problem that cannot be solved by all computational models simultaneously?**

Our Hero for This Lecture



Alan Turing (1912-1954)
*Founder of Computer Science
Mathematician, Philosopher,
Codebreaker,
World Class Marathoner*

- Designed the **Turing Machine**, foundation of the modern theory of computation and computability.
- Answered the **Decidability Question**.
- Contributed to breaking the German **Enigma code** during WWII.
- Designed in theory, one of the first **first computers (ACE)** and the **first programming languages (ACI)**.
- His best marathon time of 2:46:03 was only 11 minutes slower than the 1948 Olympic champion.



Computation

- Computers: modern technology?
- But **computation** is ancient.
- Can be performed by:
 - A human being with a pen and a pencil.
 - A smart-phone.
 - A supercomputer.
- We want a mathematical model that **describes all of these** and **transcends any one technology**.



Computation

- Note: Humans do the same computation that (smartphones/laptops do)
 - Less quickly and less reliably
- Consequence: we can do computation without understanding electronics.
- Computation is a familiar, everyday, **human** act.



Turing Machine

- We need a precise mathematical meaning of the term “algorithm”.
- The model should not depend on a particular program, programming language, or technology. Should capture the essence of computation.
- Turing Machines captures computation using a finite set of simple rules that allow for one small operation at a time.

010 is a palindrome,

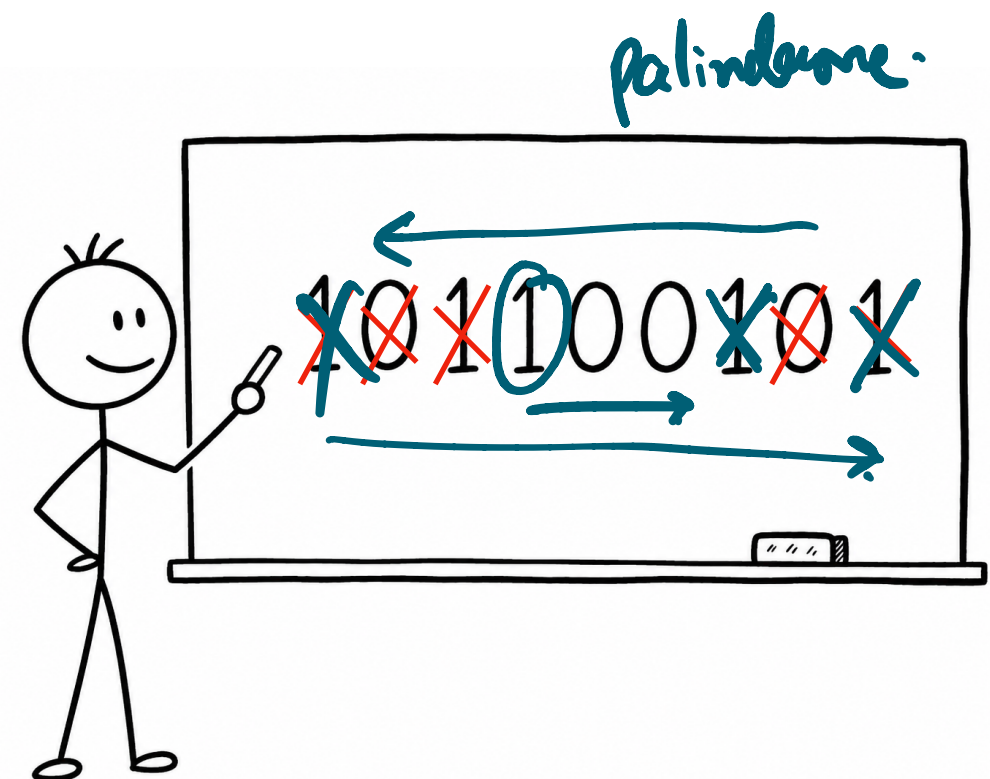
100 is not a
palindrome.

Example: Palindromes

- Suppose a long string of bits is written on a blackboard.
- Our job: Figure out whether the string is a “palindrome,” i.e., whether it is the same forwards and backwards.
- What should we do?

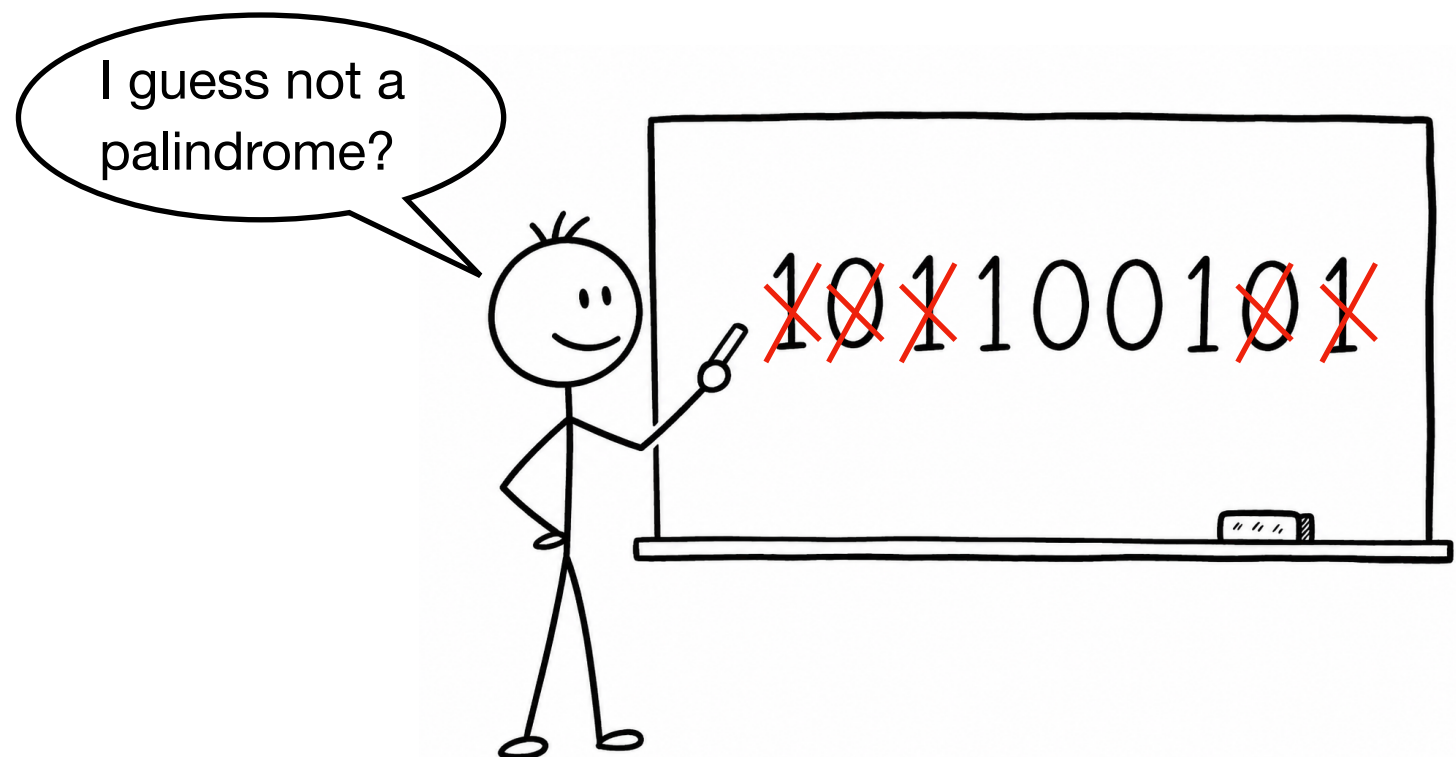
Example: Palindromes

- Idea: Compare and cross off the first and last symbols.
- Repeat until there is a mismatch or everything is crossed off.



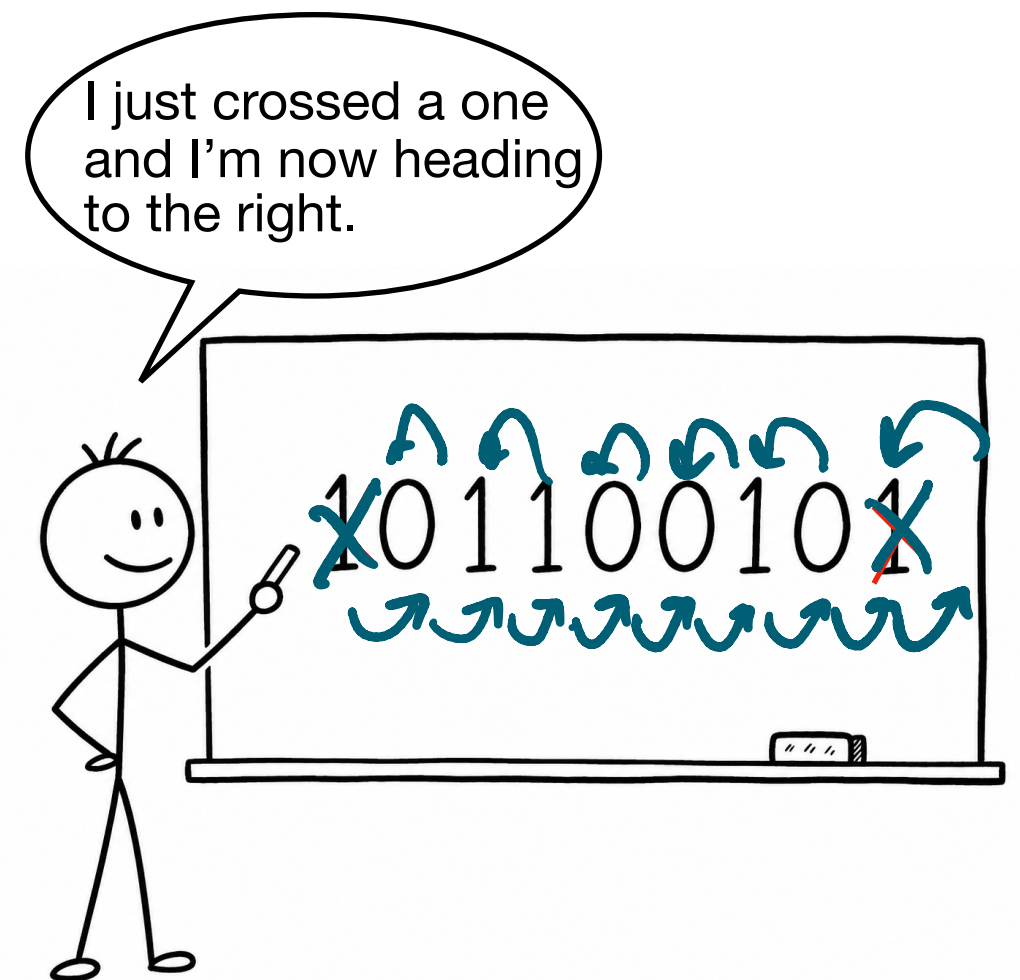
Example: Palindromes

- Idea: Compare and cross off the first and last symbols.
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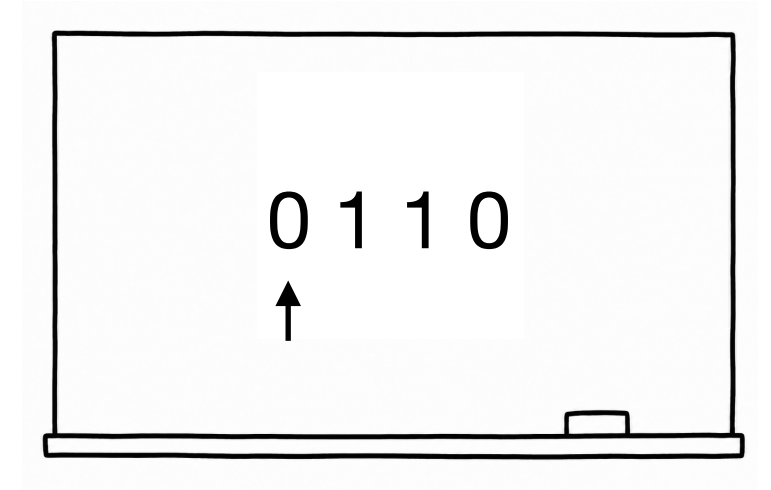


Local Decisions

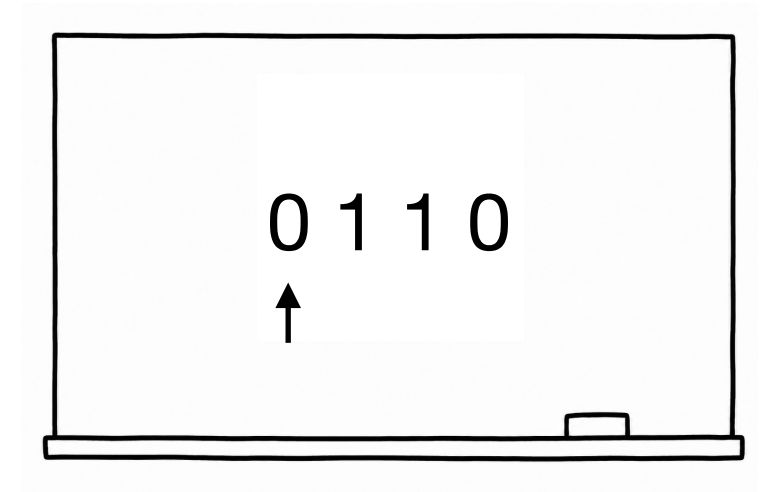
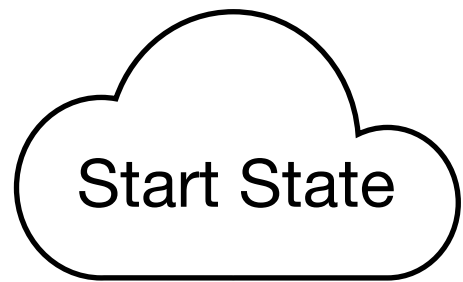
- In each step, how do we know what to do next?
 1. We keep track of some information (“**state**”) in our head.
 2. We look at the **local contents** of the blackboard. (One symbol is sufficient.)
 3. We can describe the algorithm using a “**state diagram**”



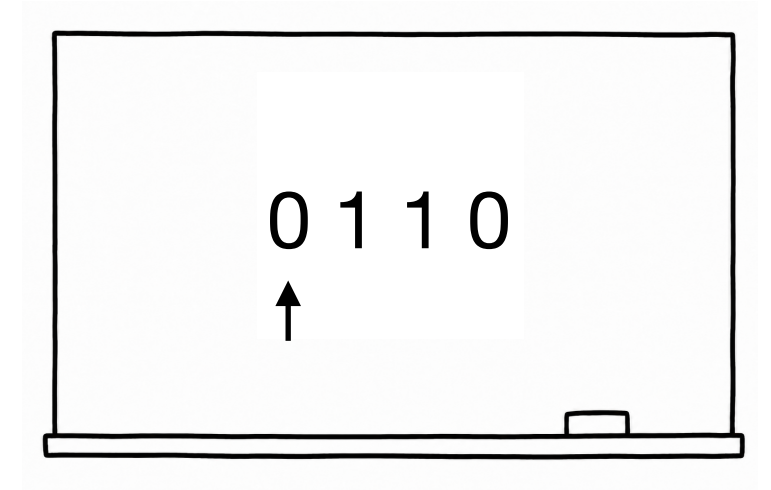
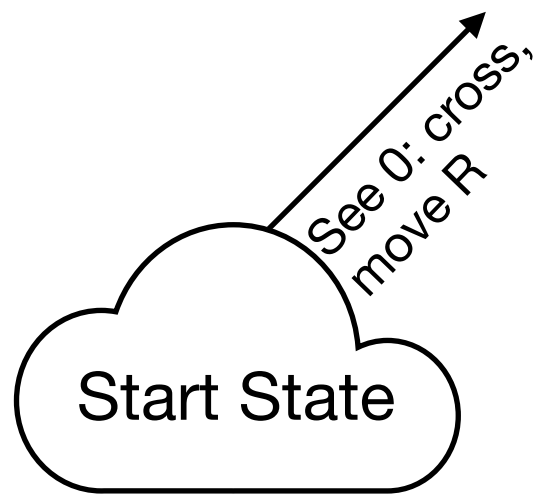
State Diagram



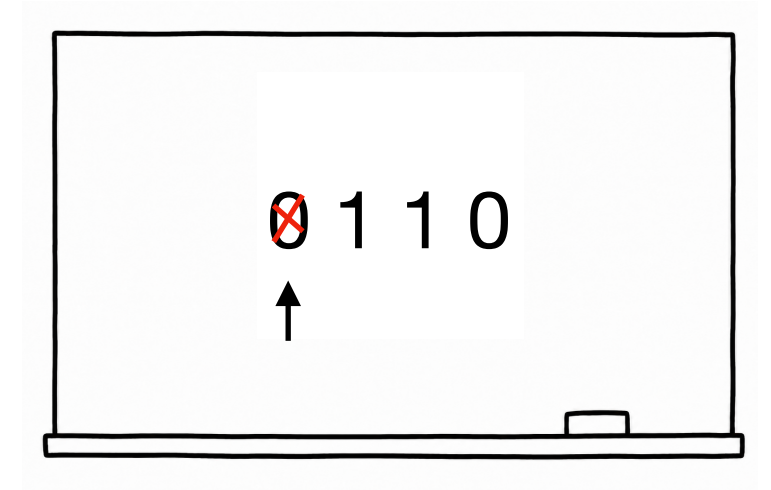
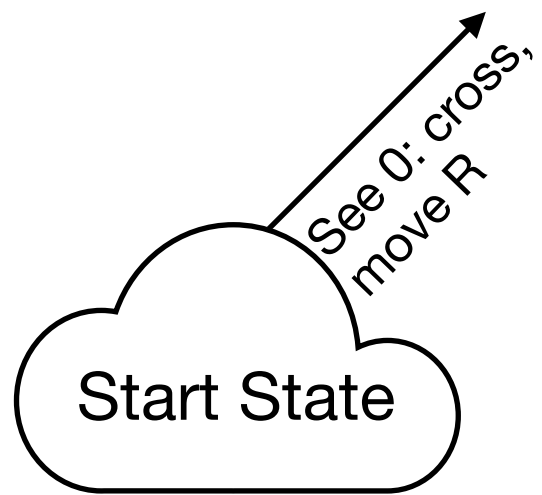
State Diagram



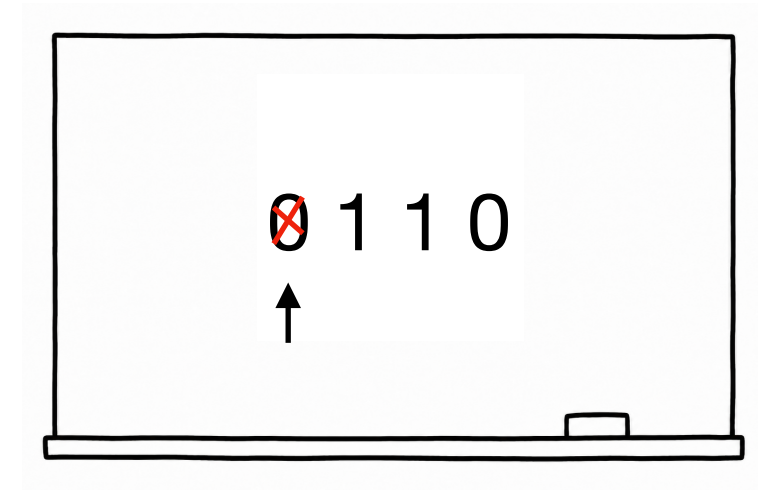
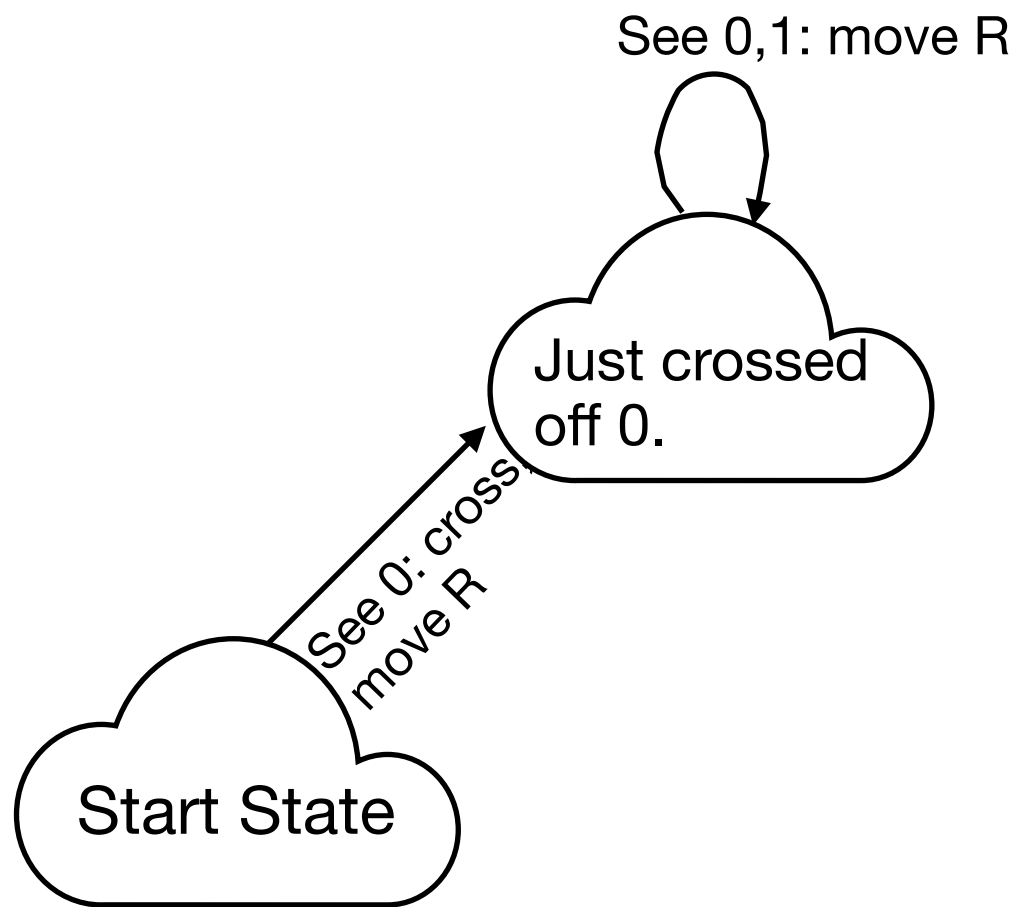
State Diagram



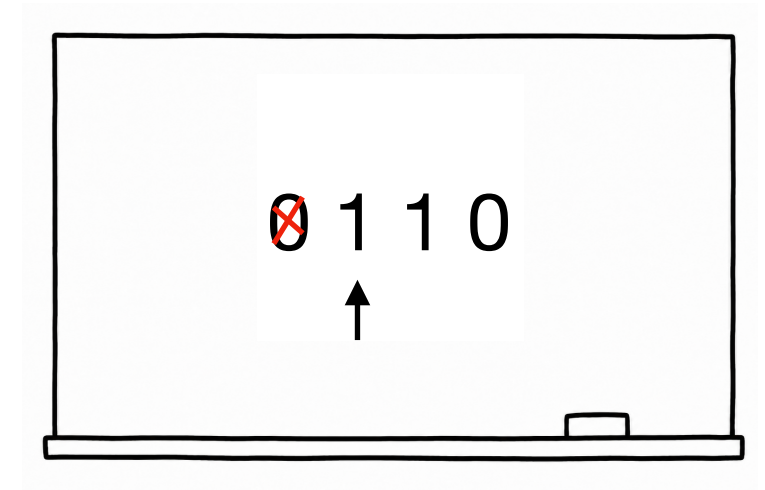
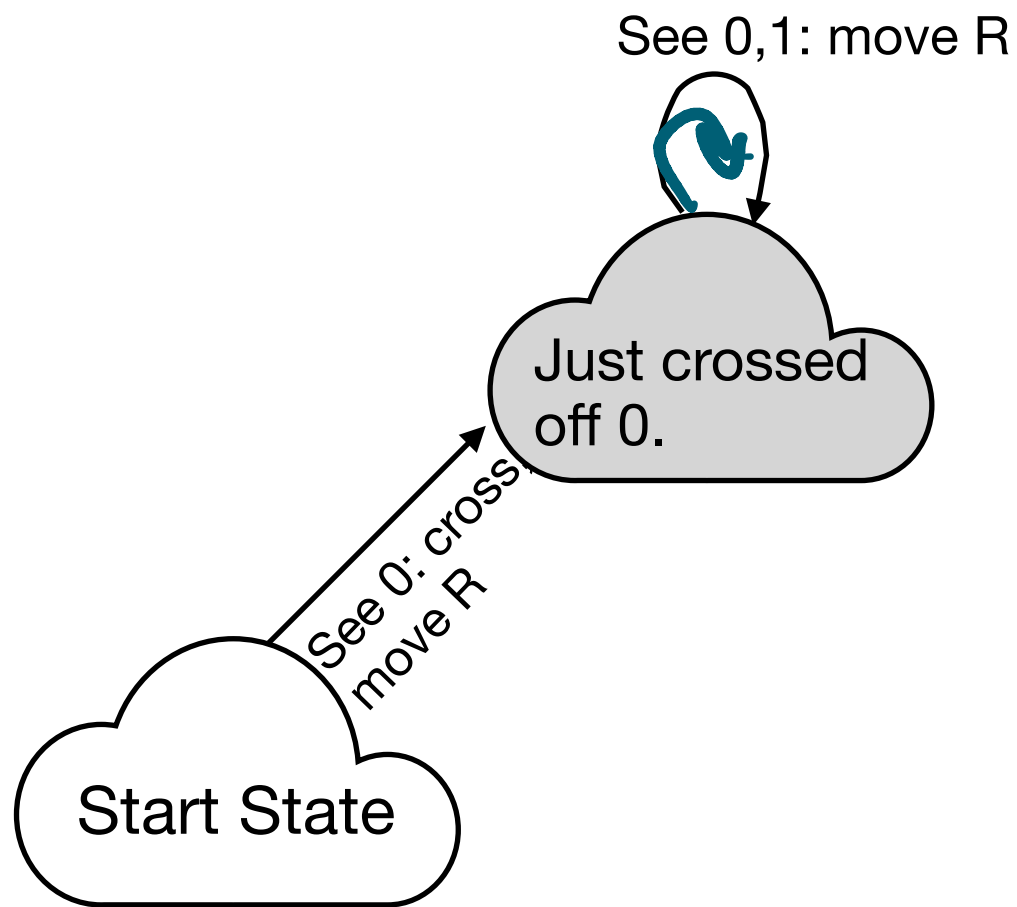
State Diagram



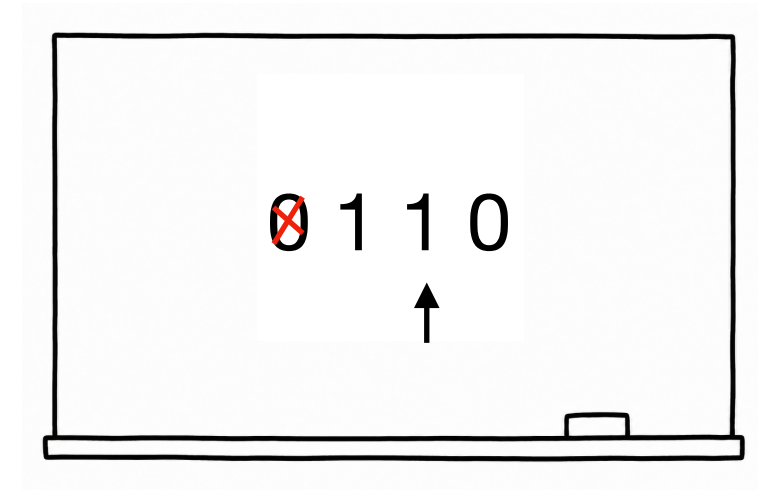
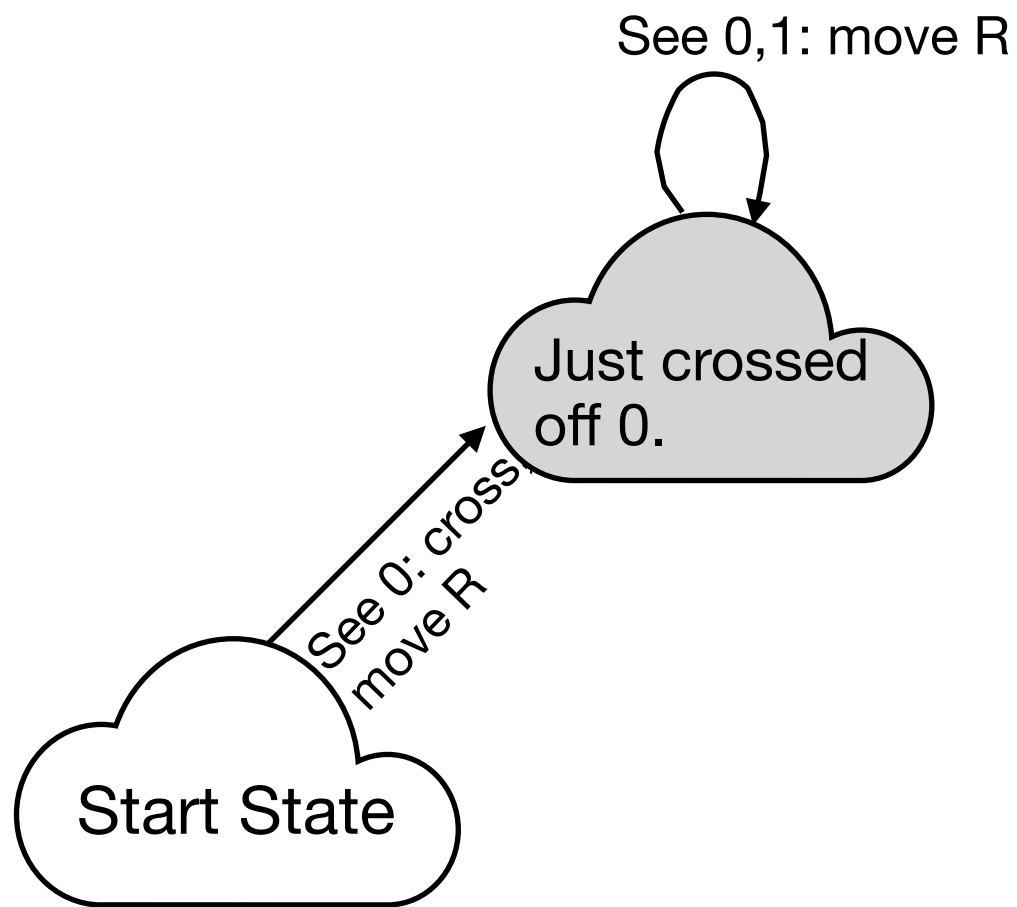
State Diagram



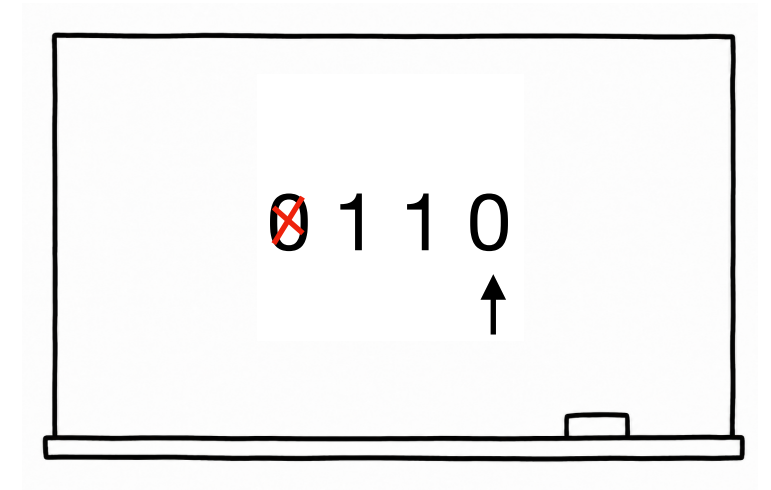
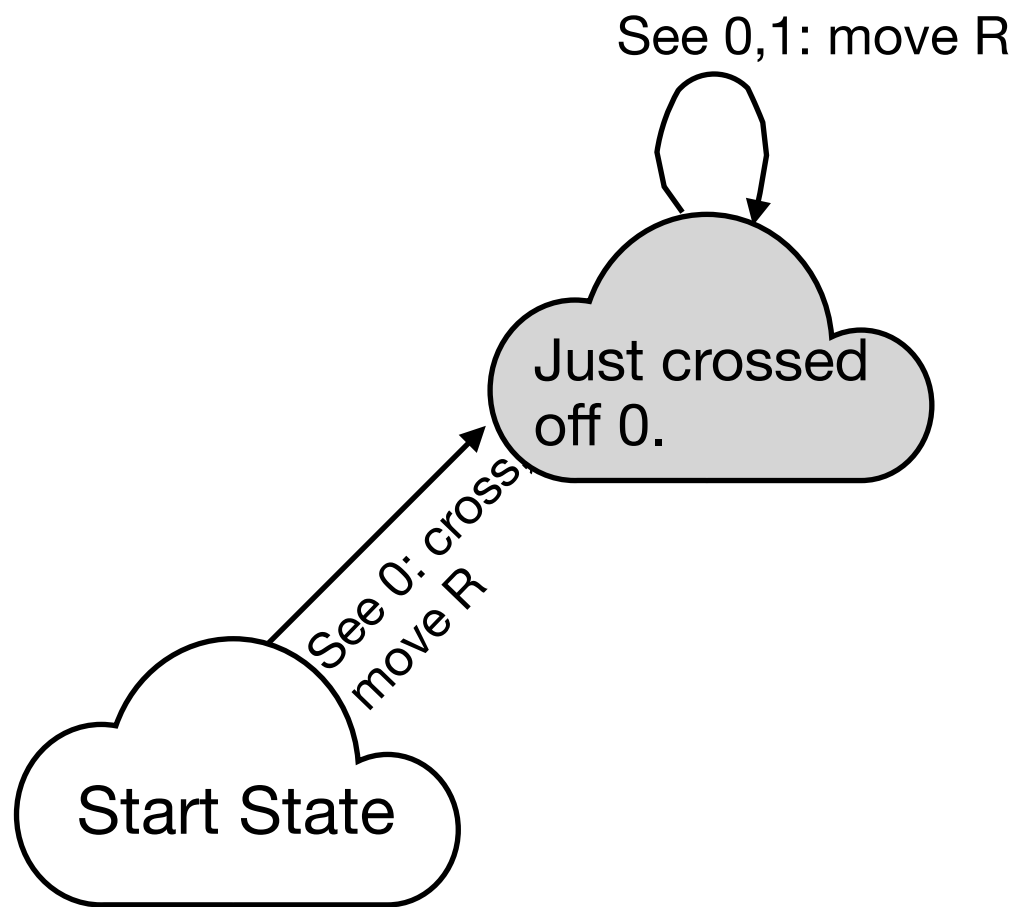
State Diagram



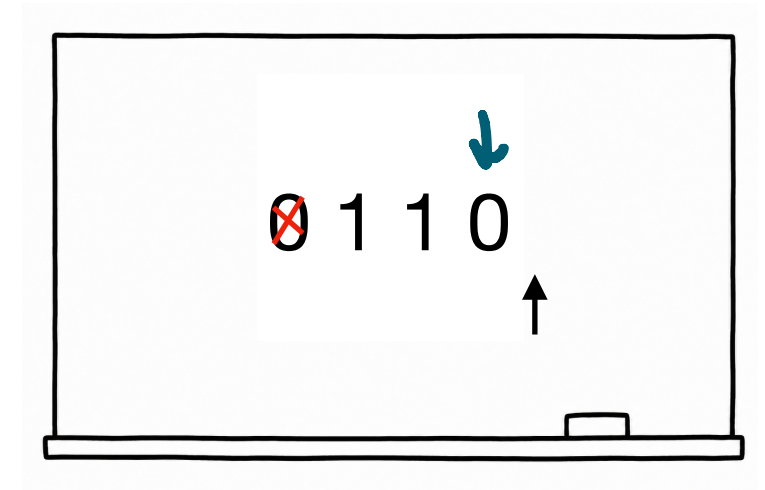
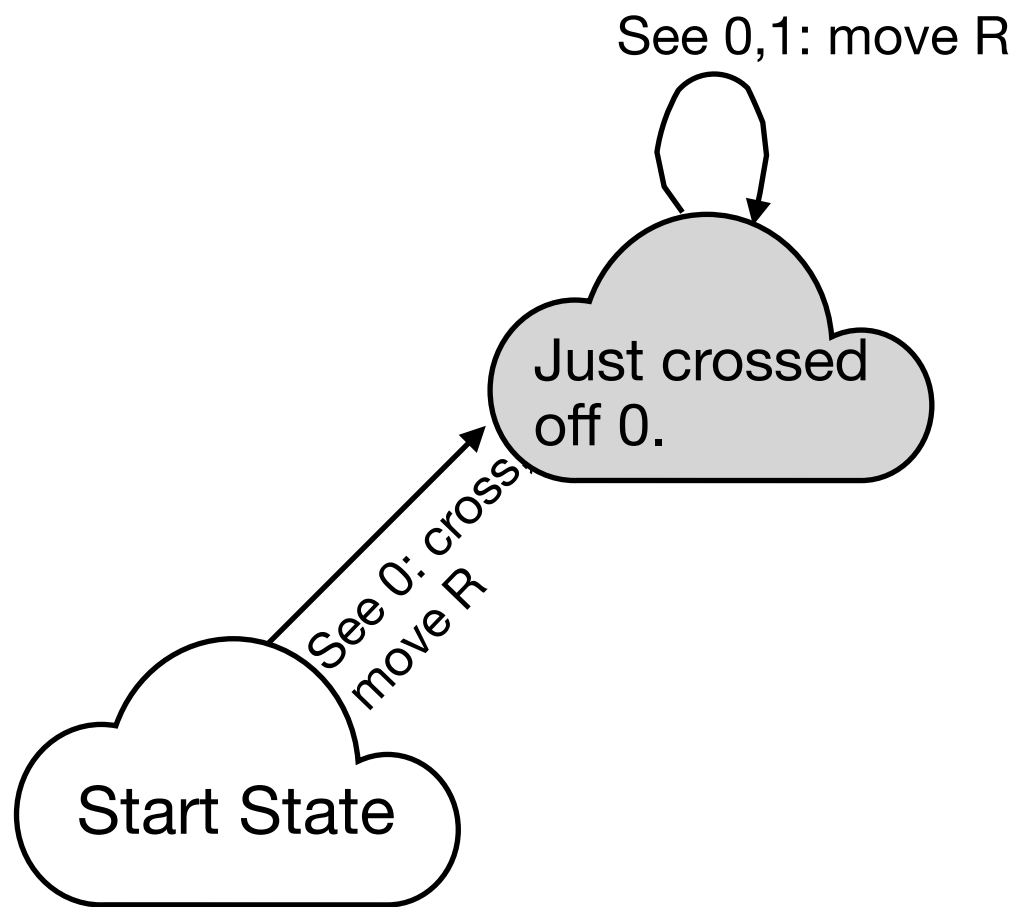
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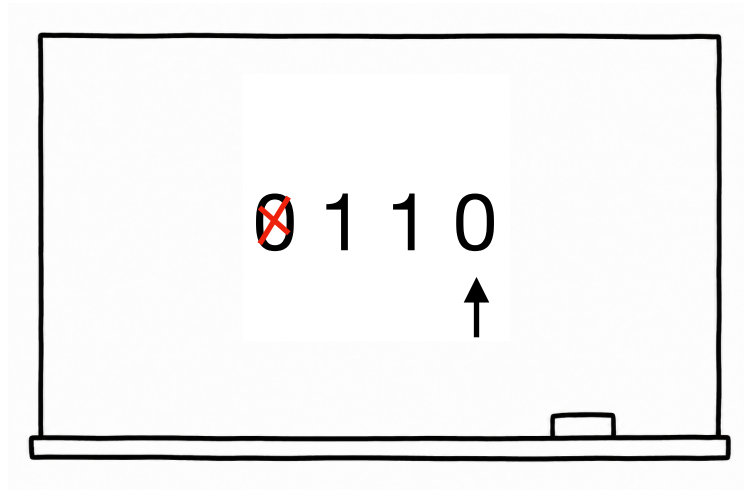
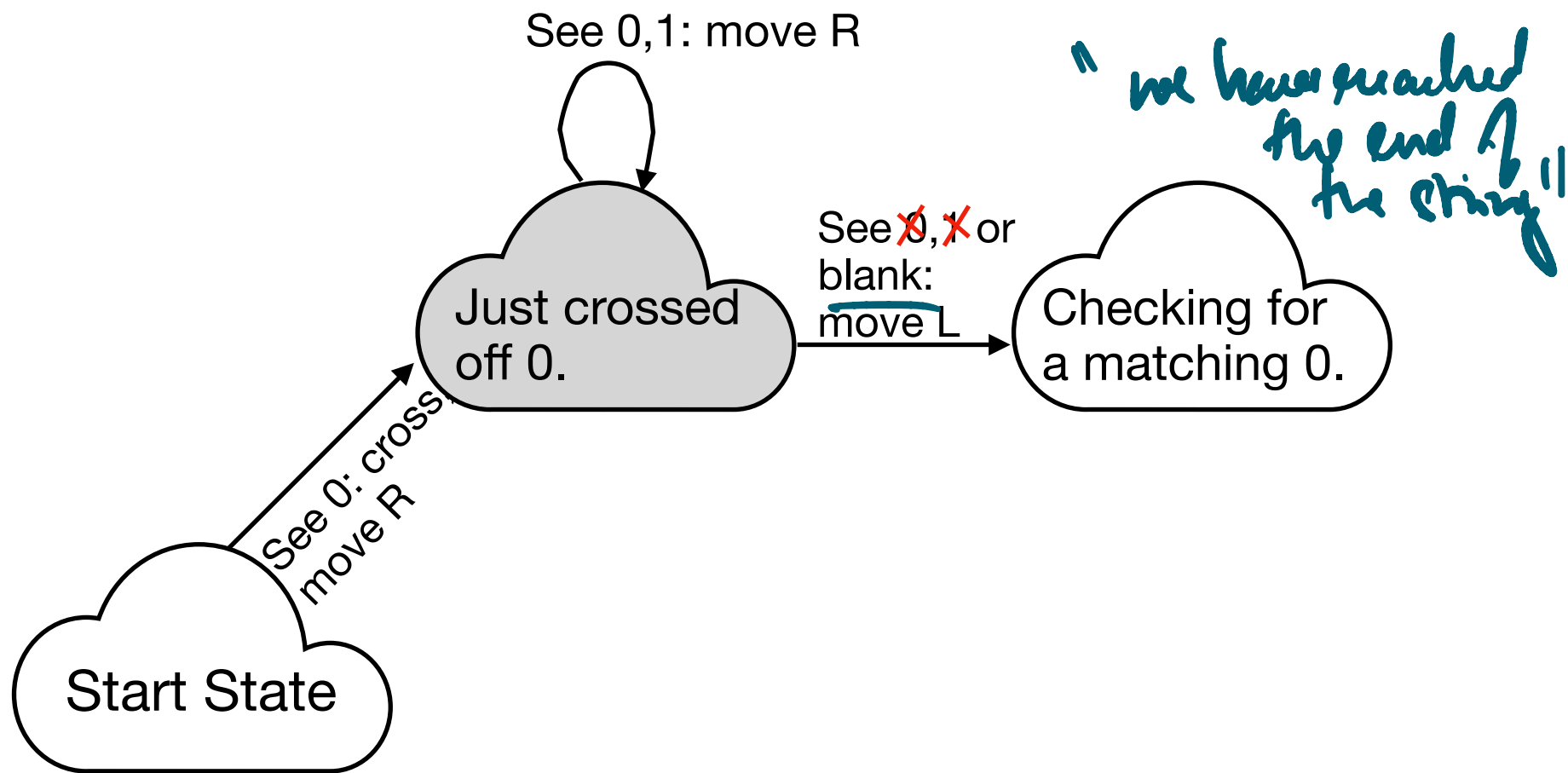
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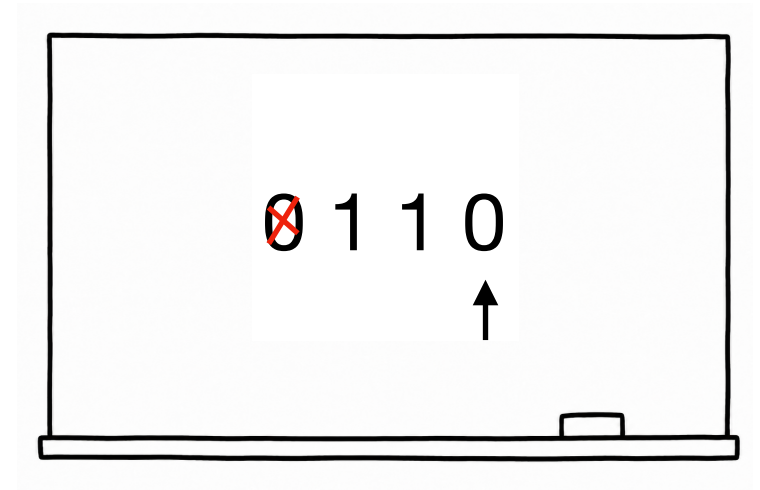
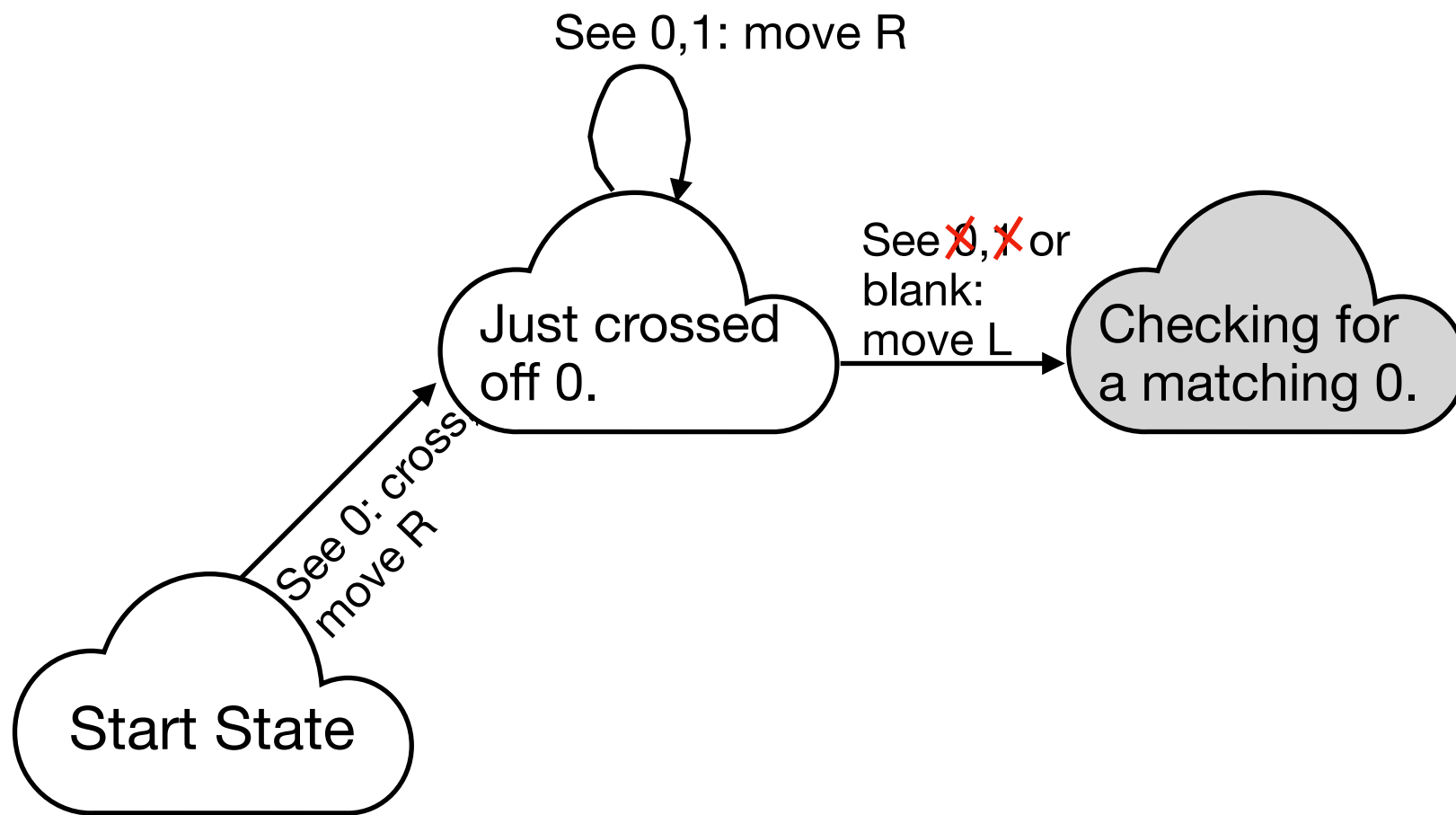
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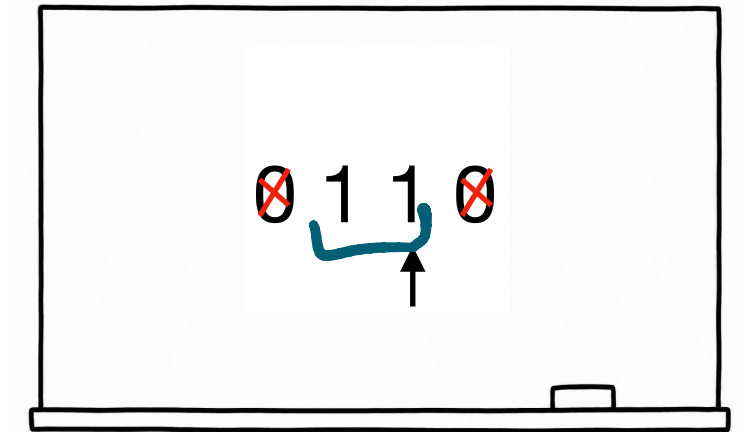
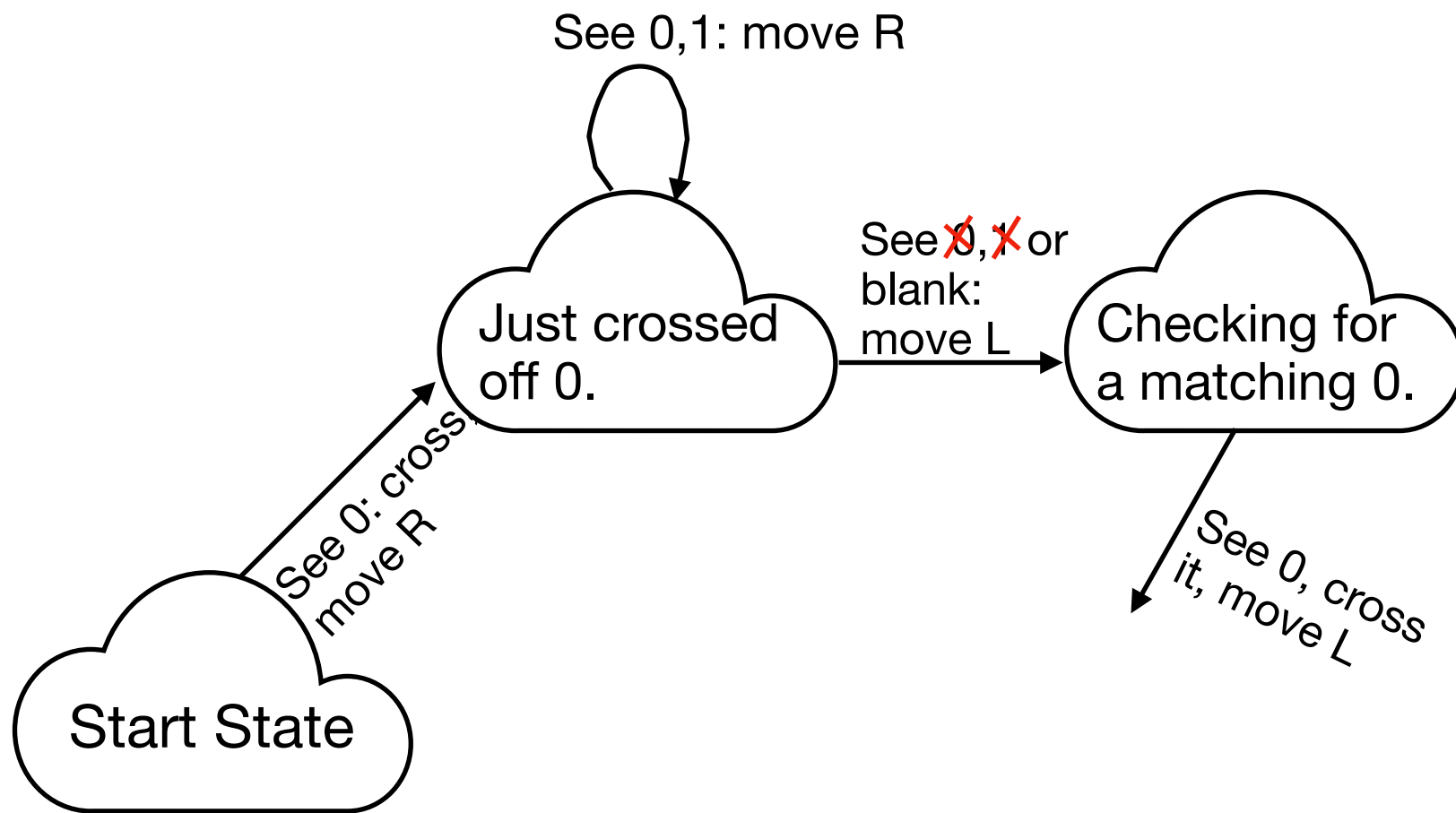
State Diagram



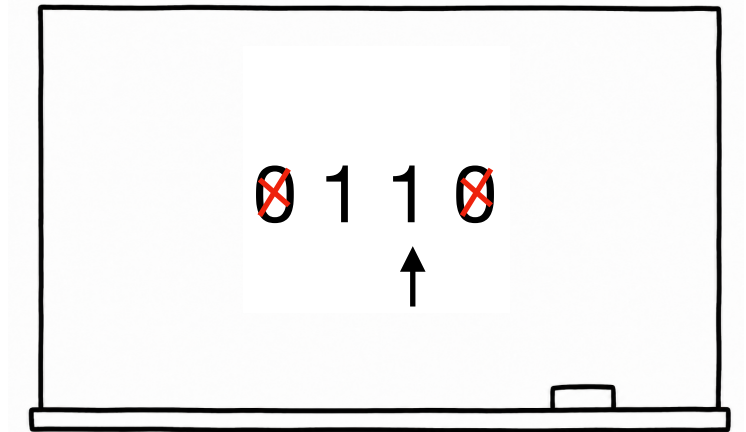
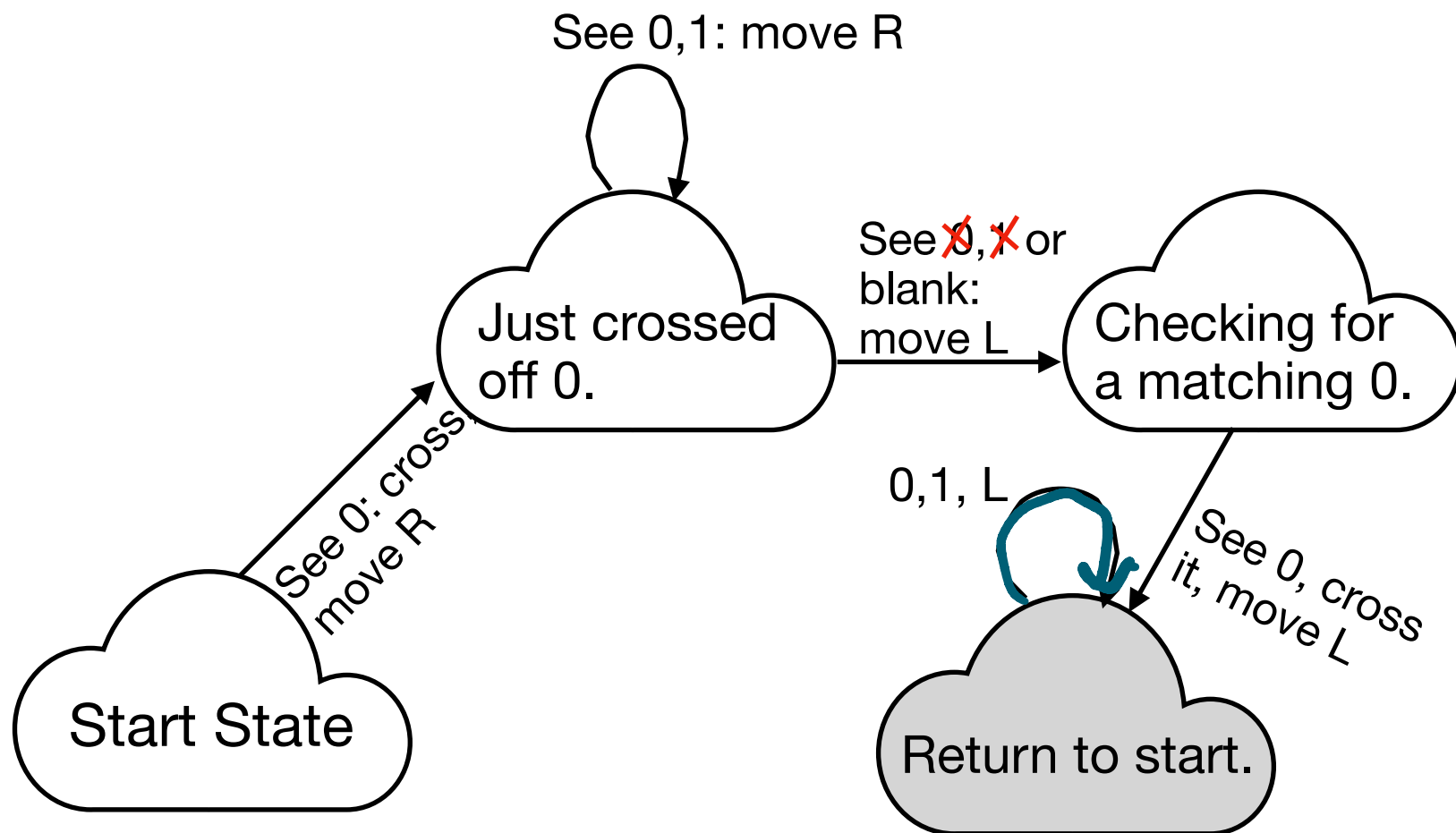
State Diagram



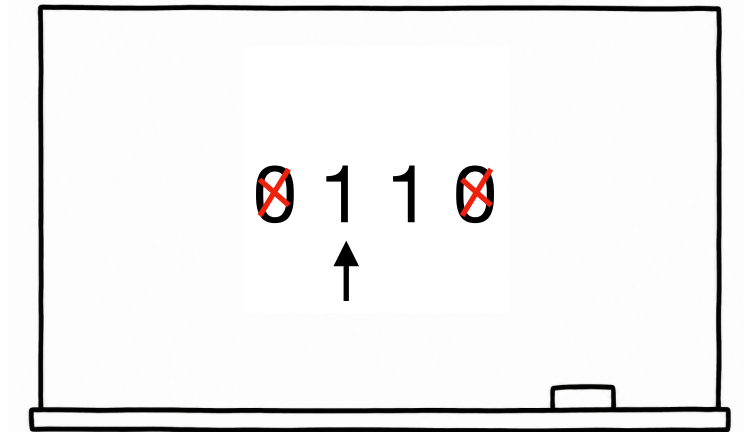
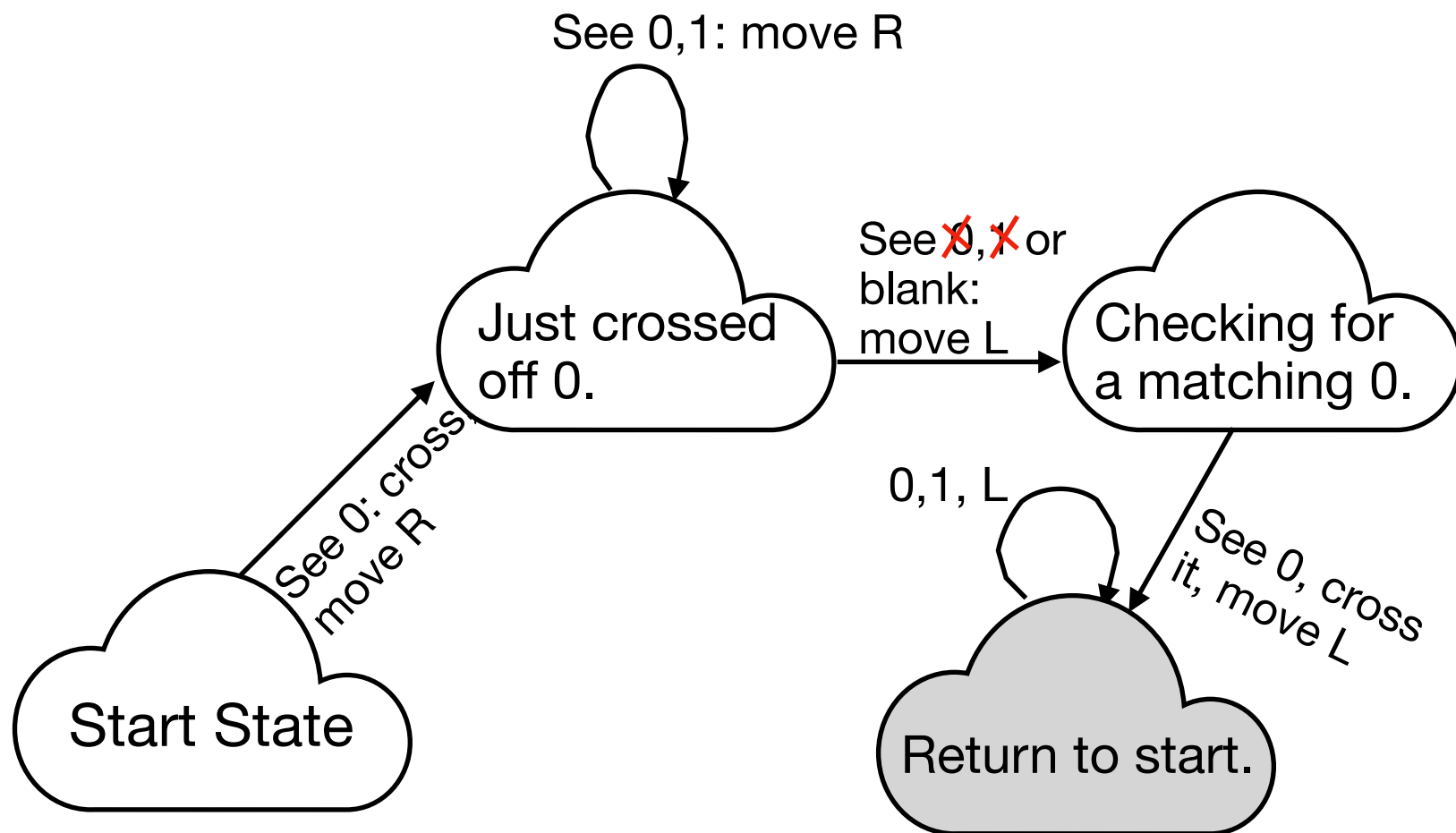
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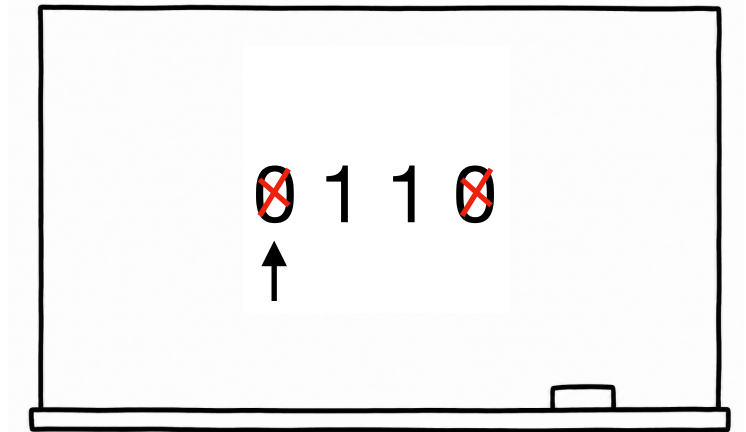
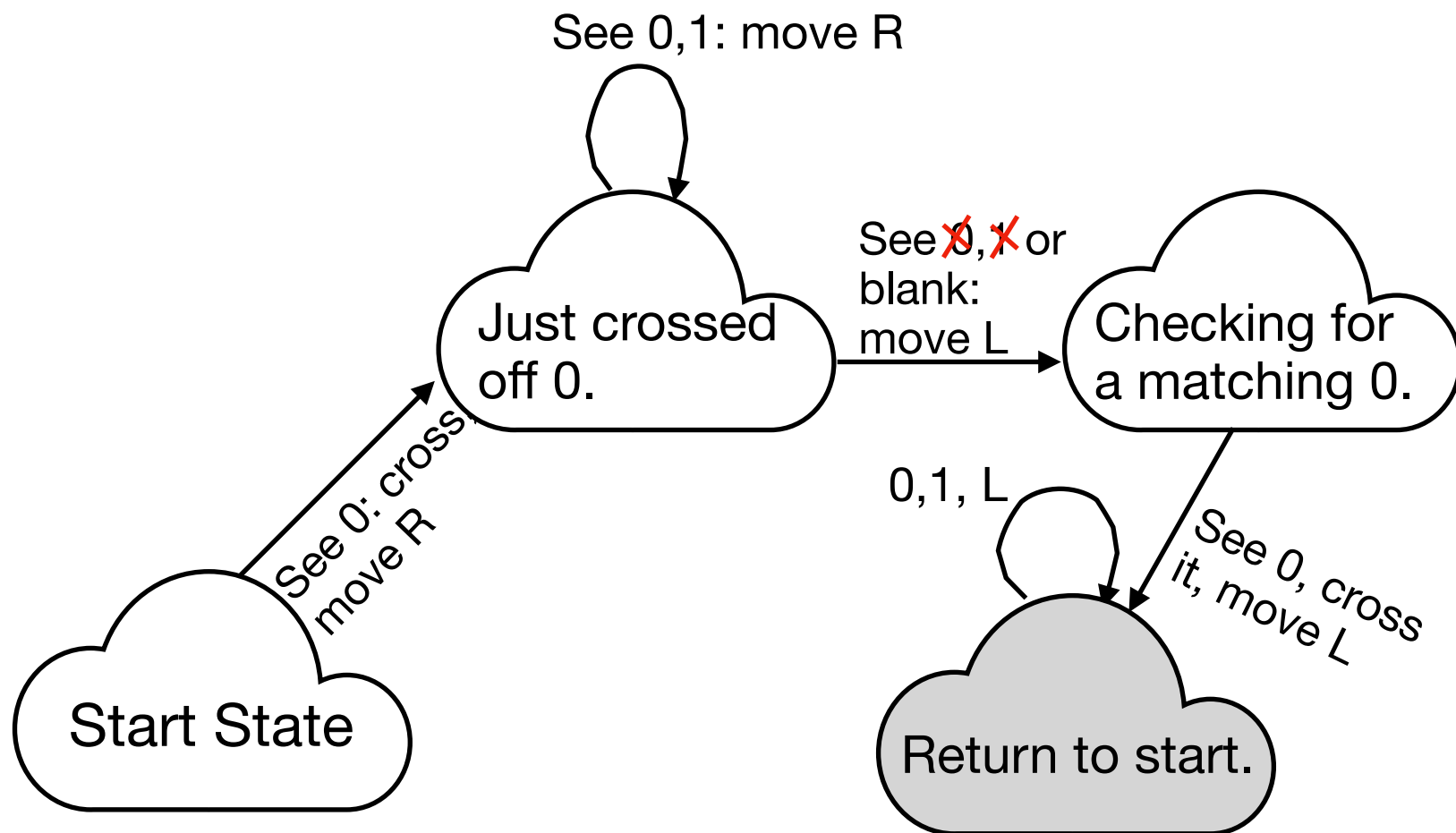
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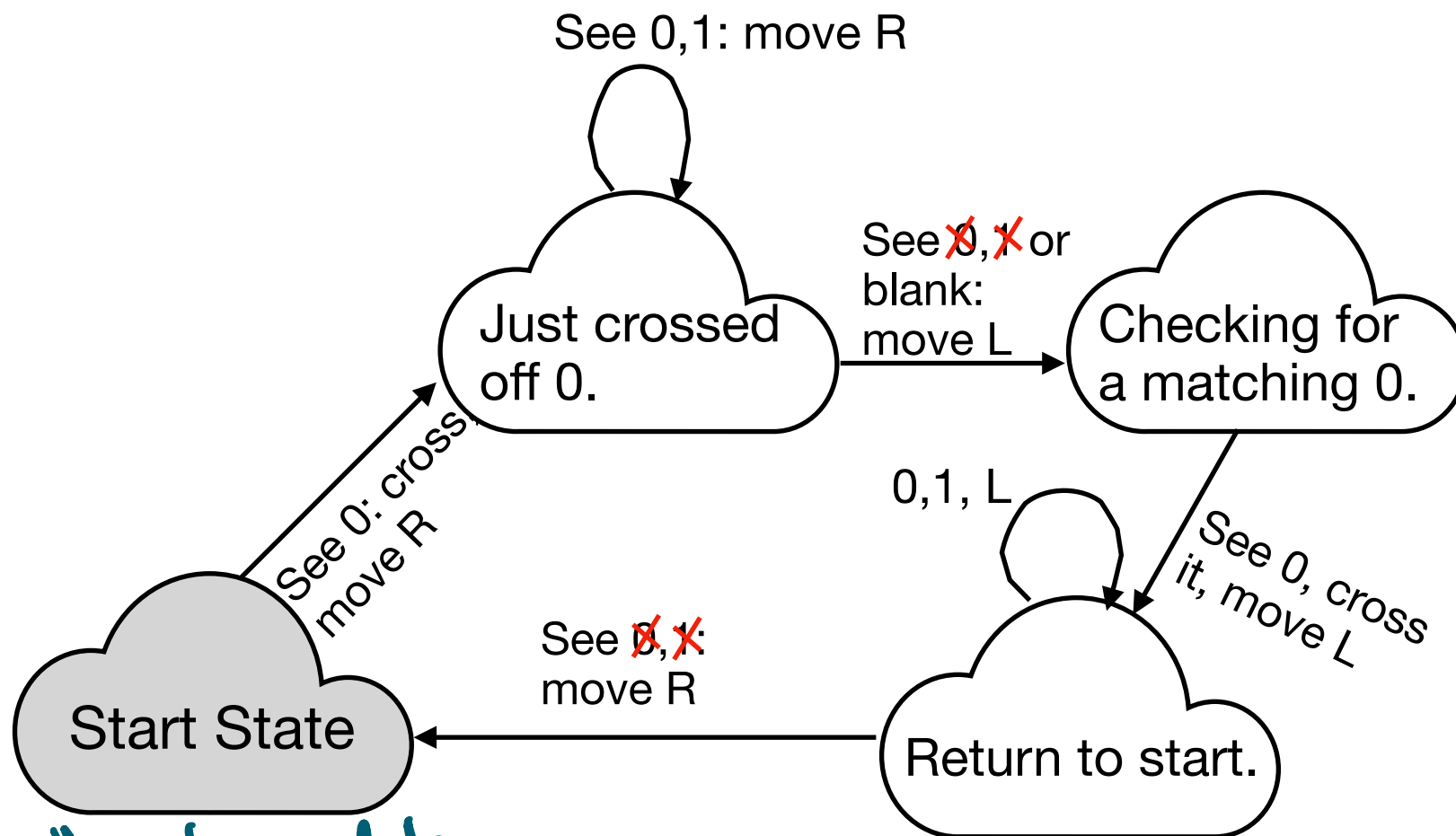
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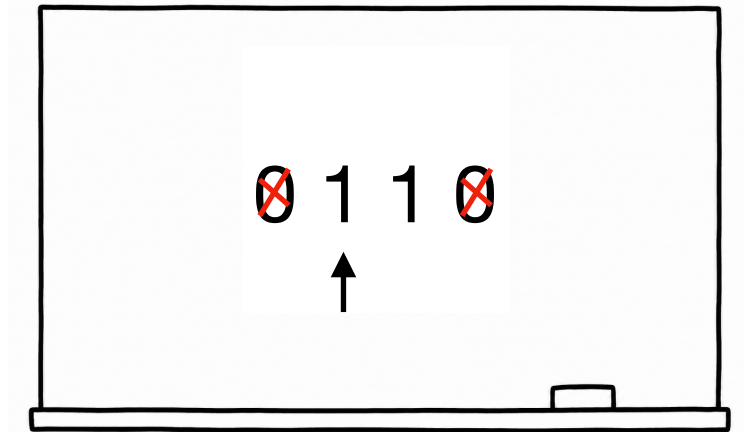
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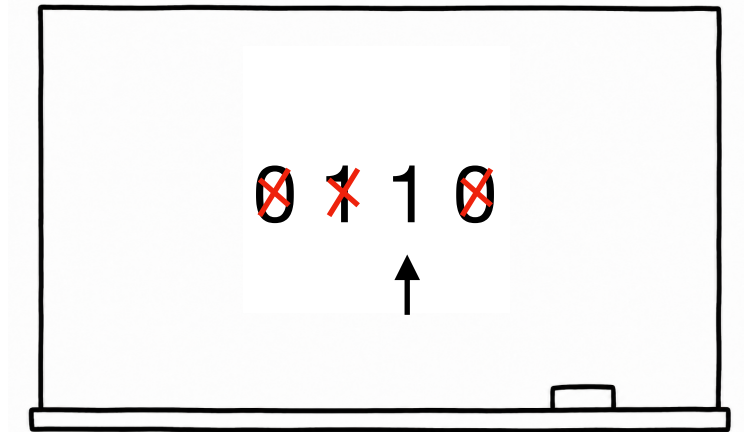
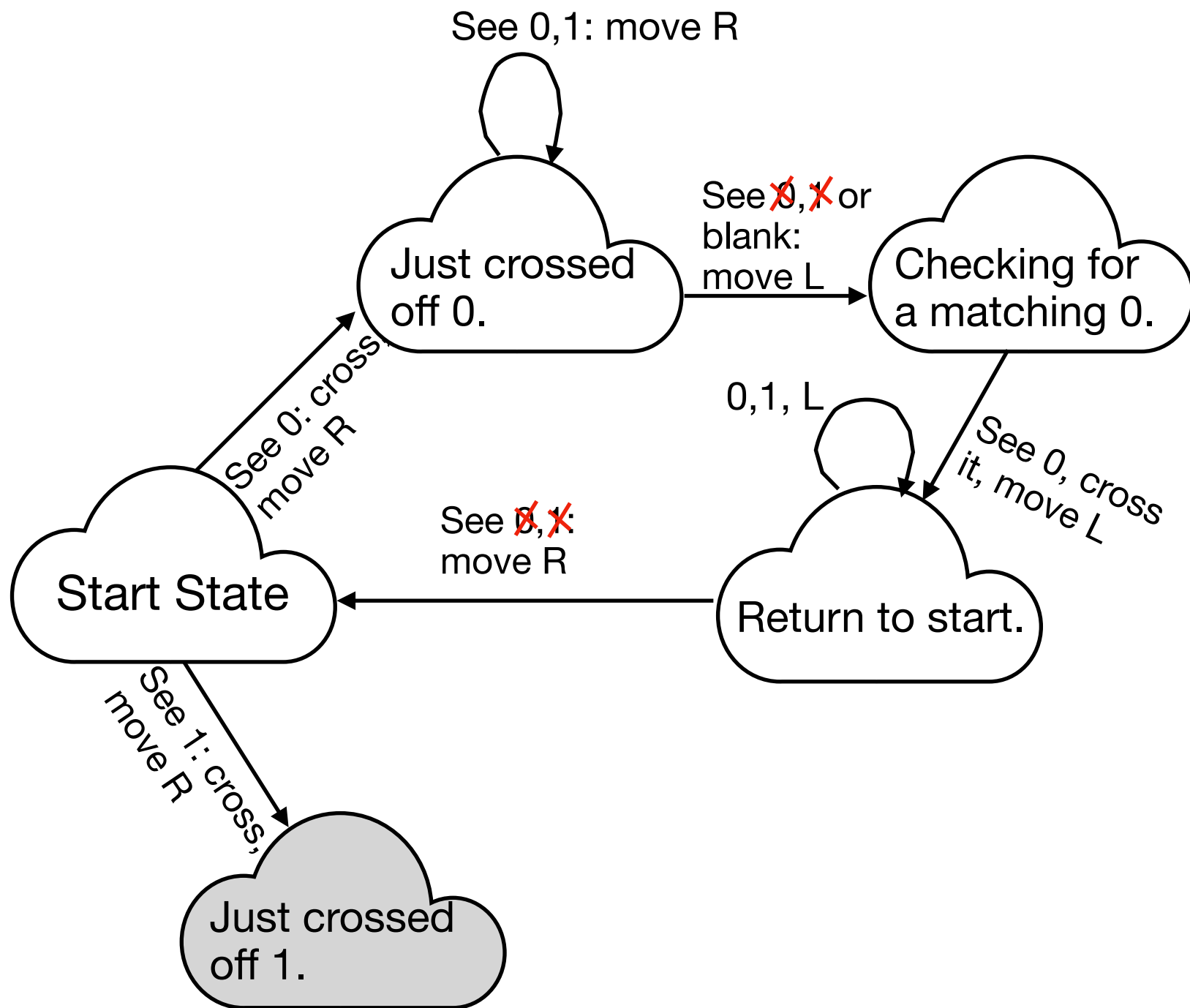
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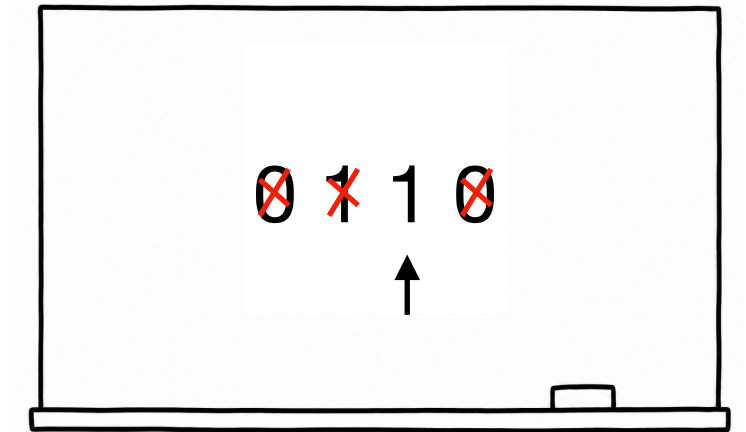
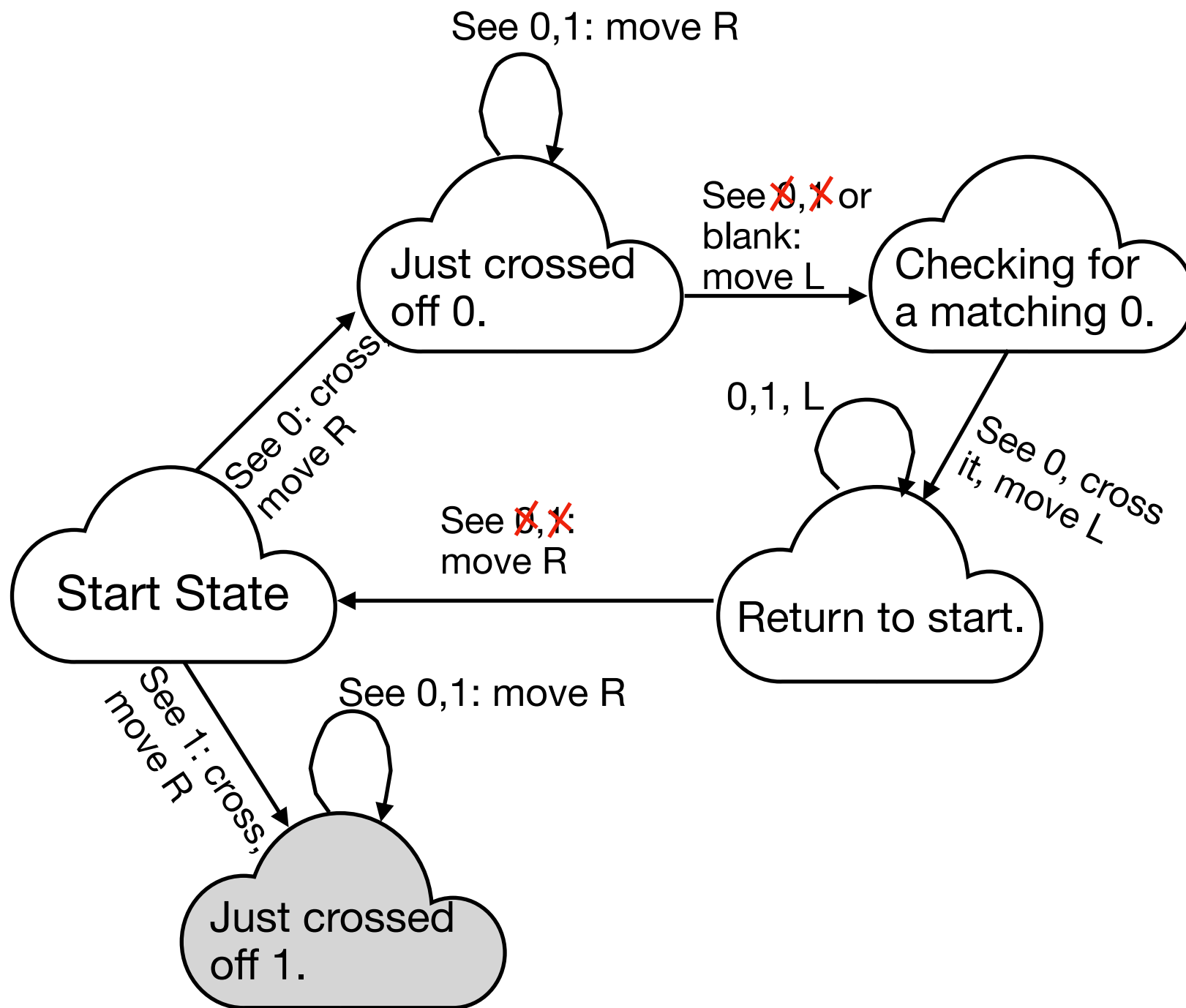
"returned to
the beginning of
the string".



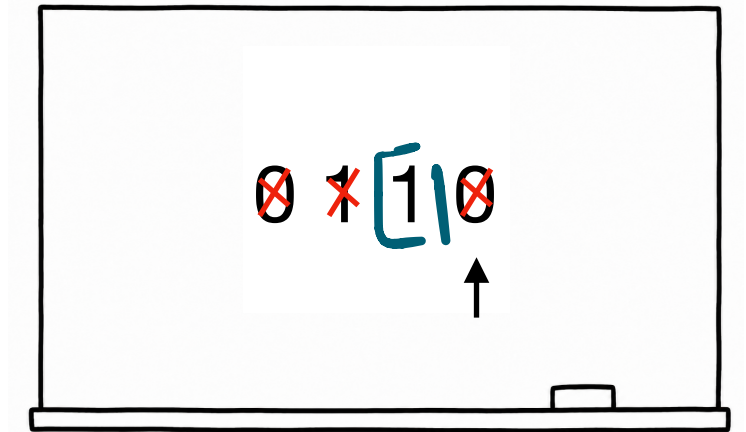
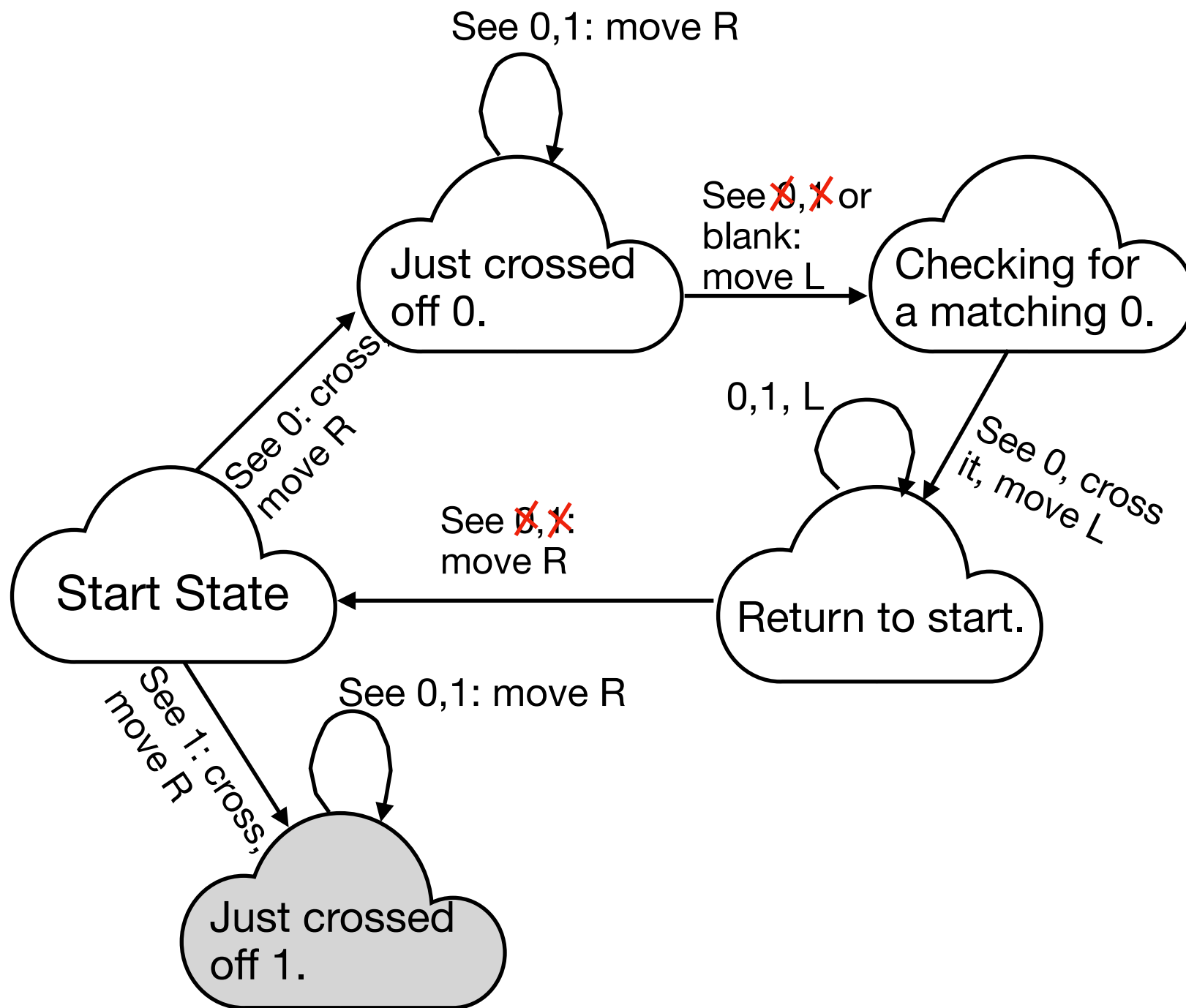
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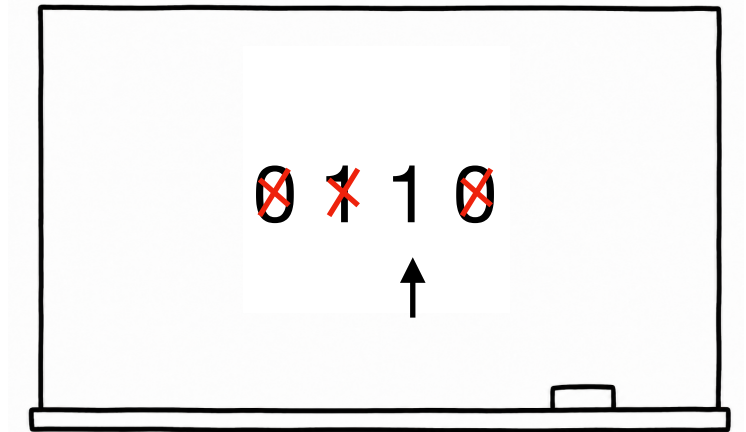
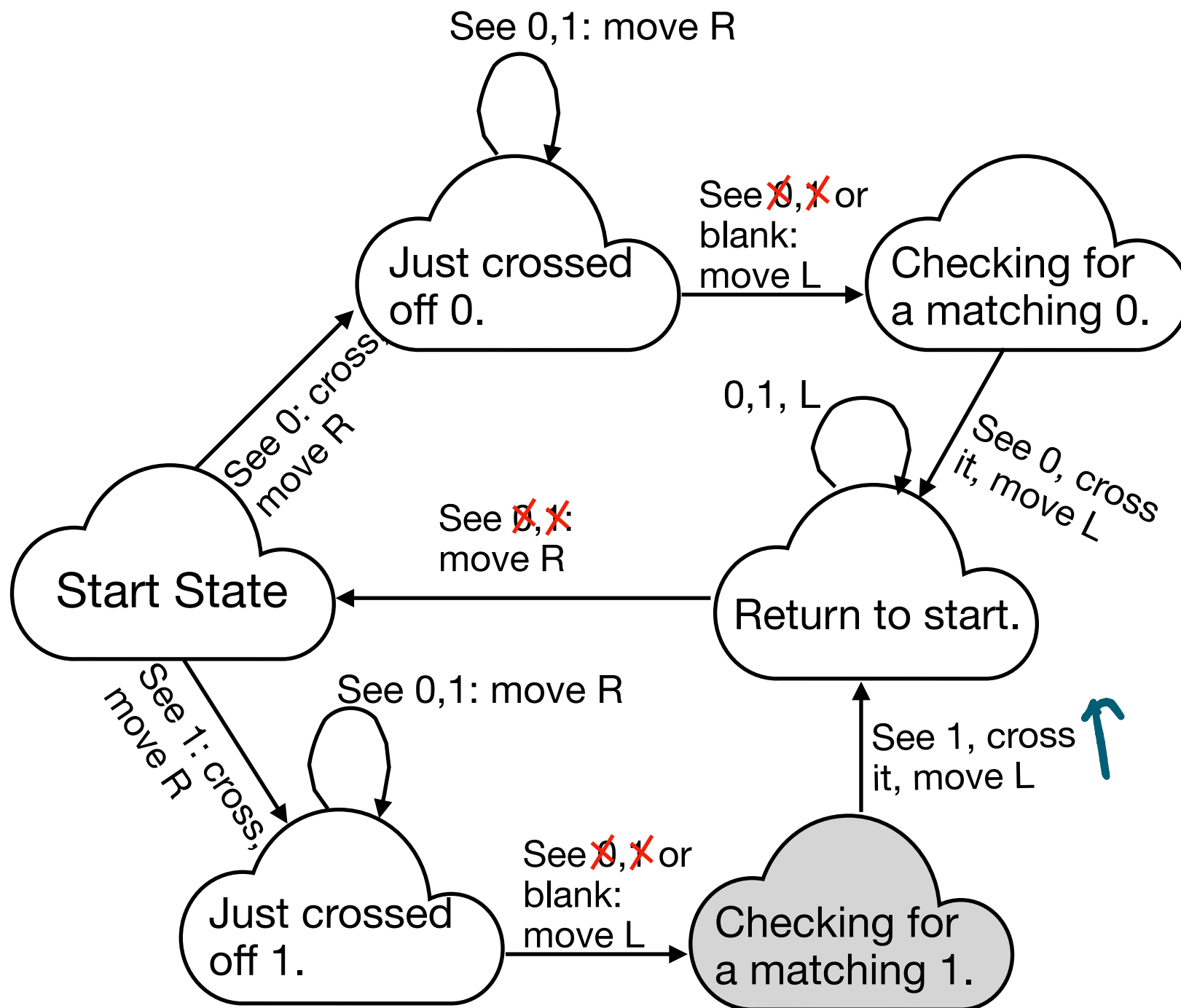
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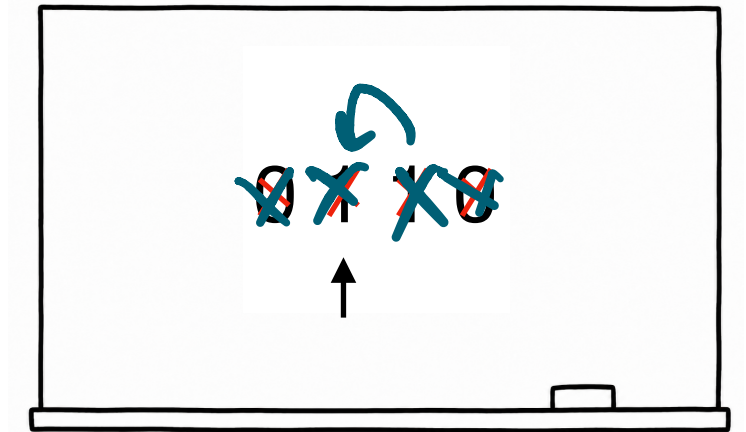
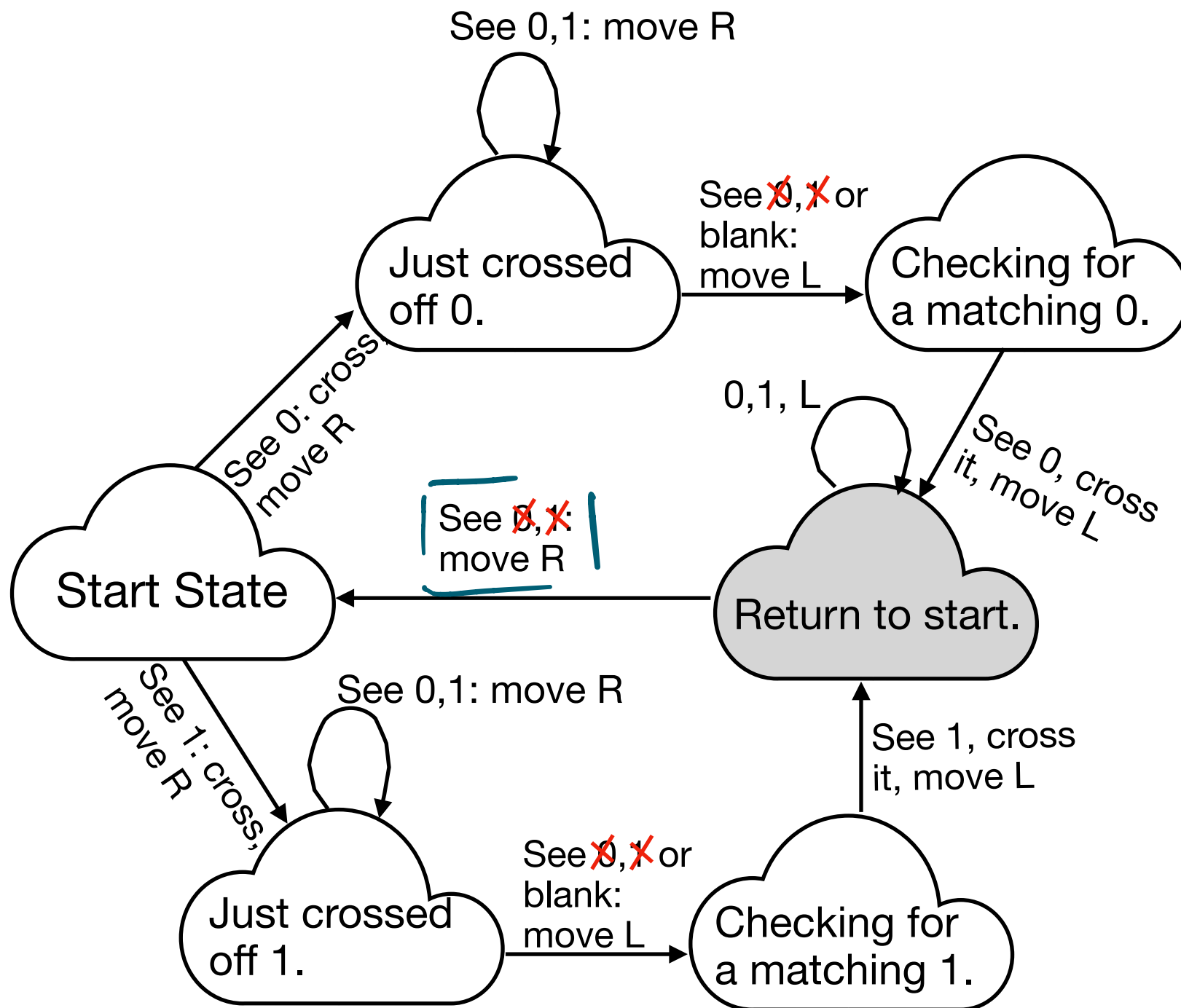
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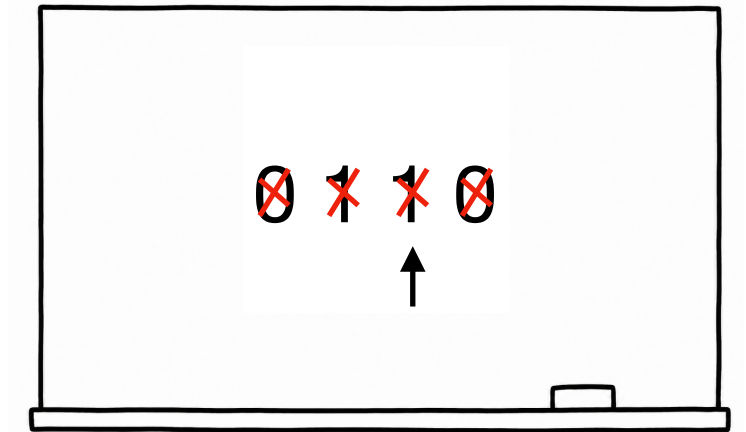
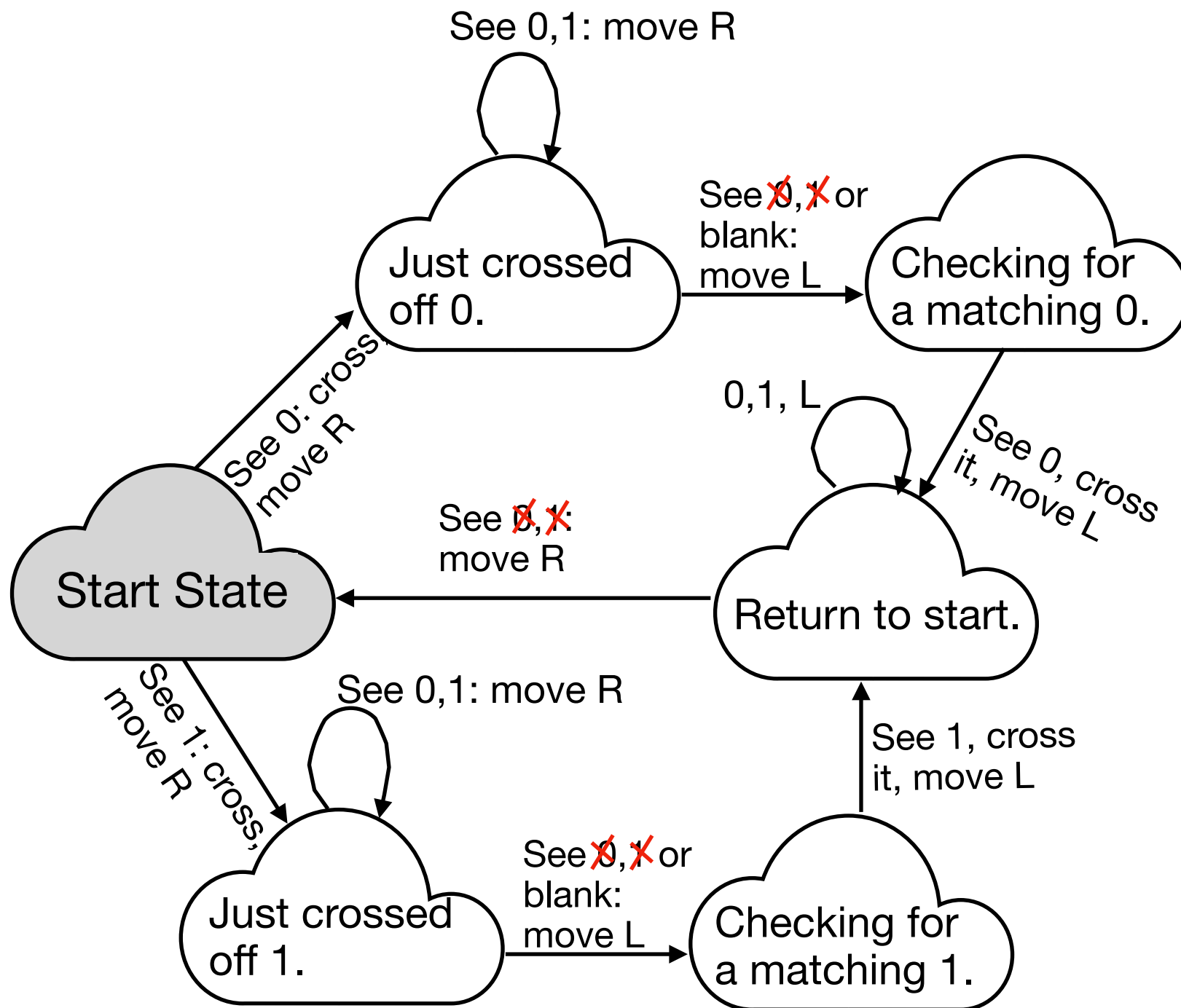
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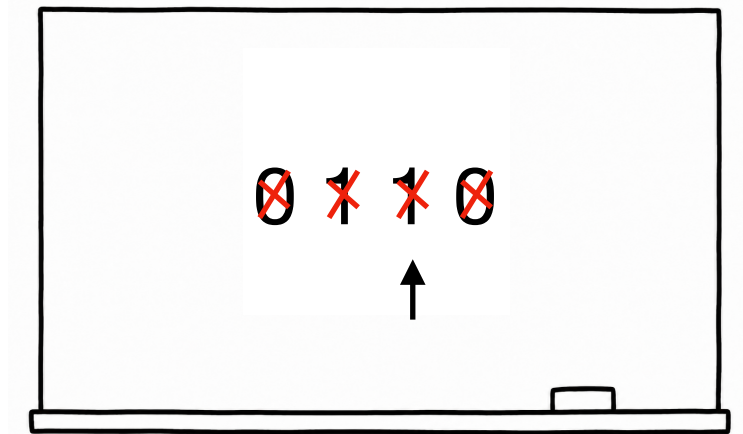
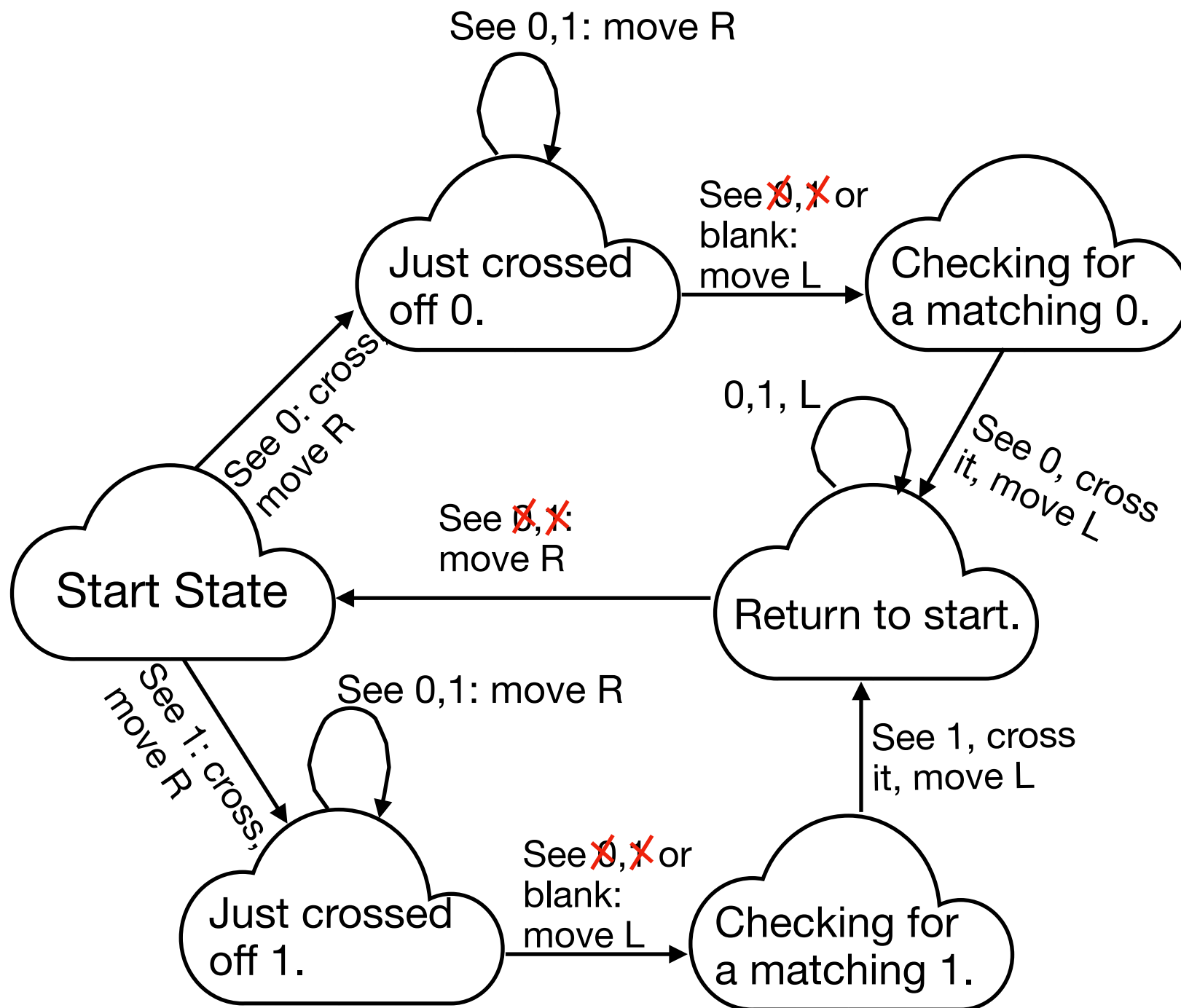
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State Diagram

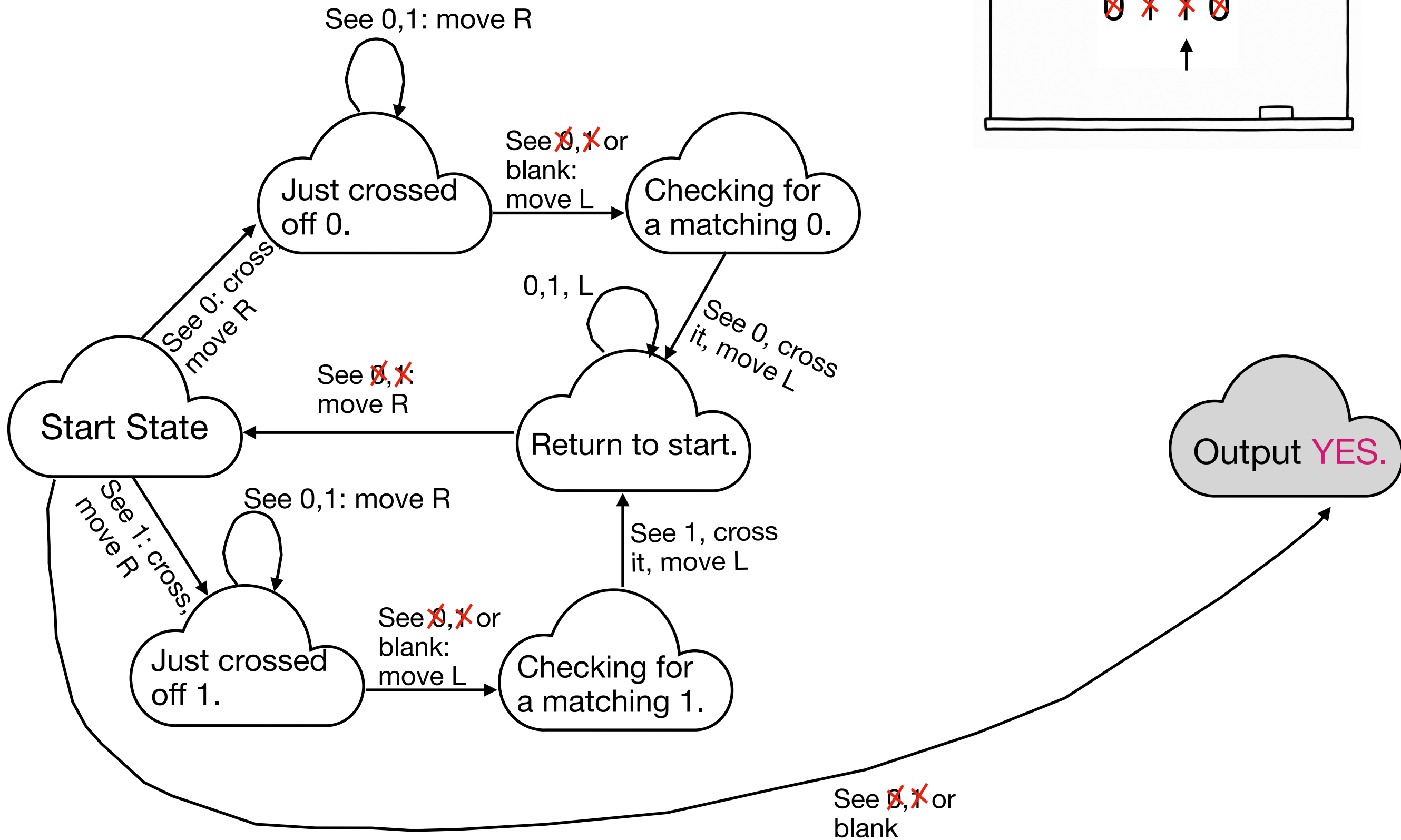


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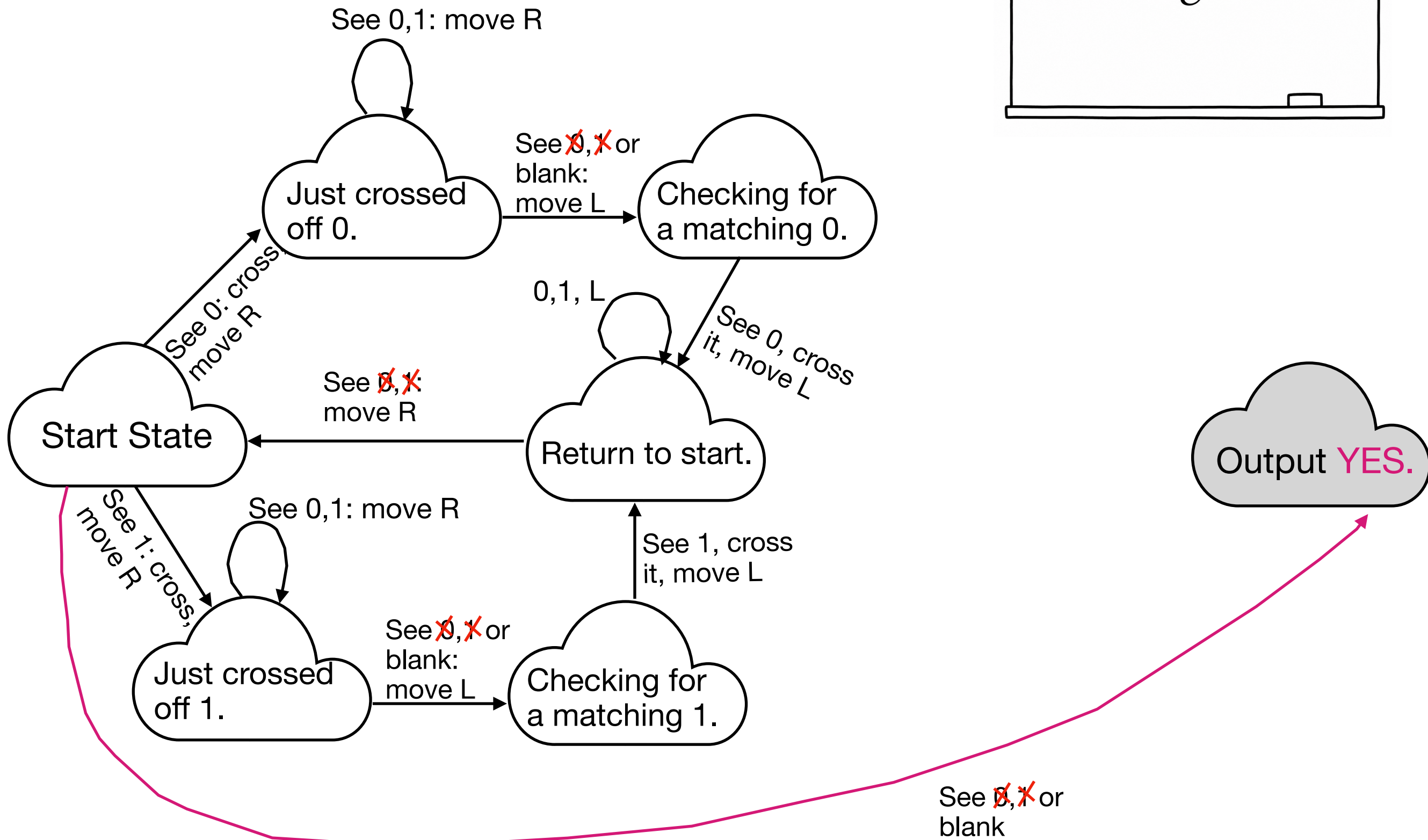


Output **YES.**

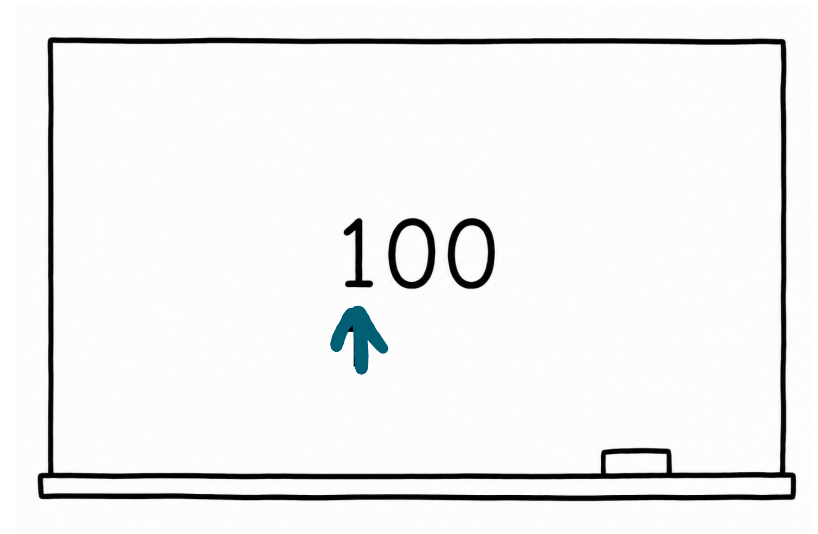
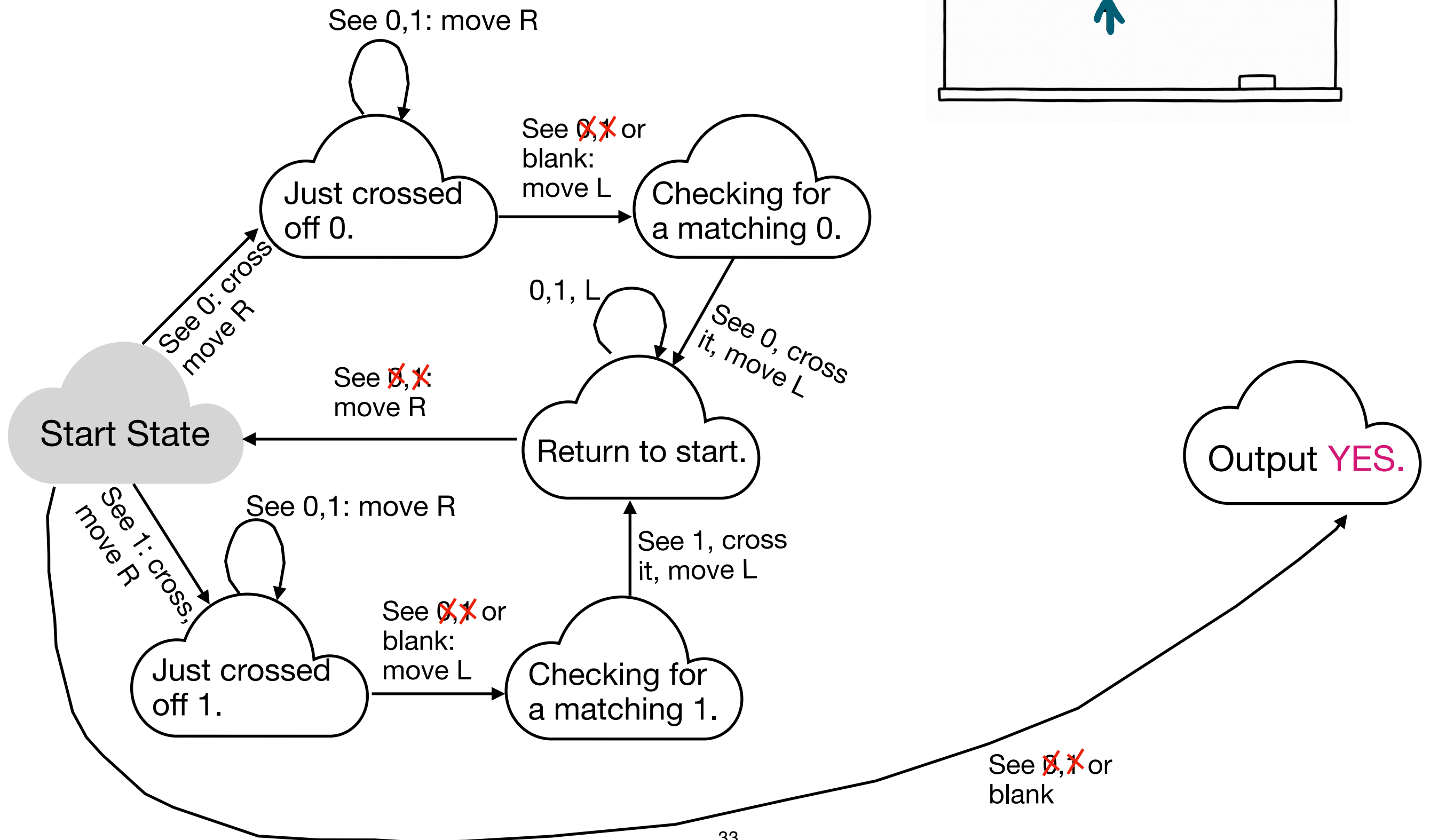
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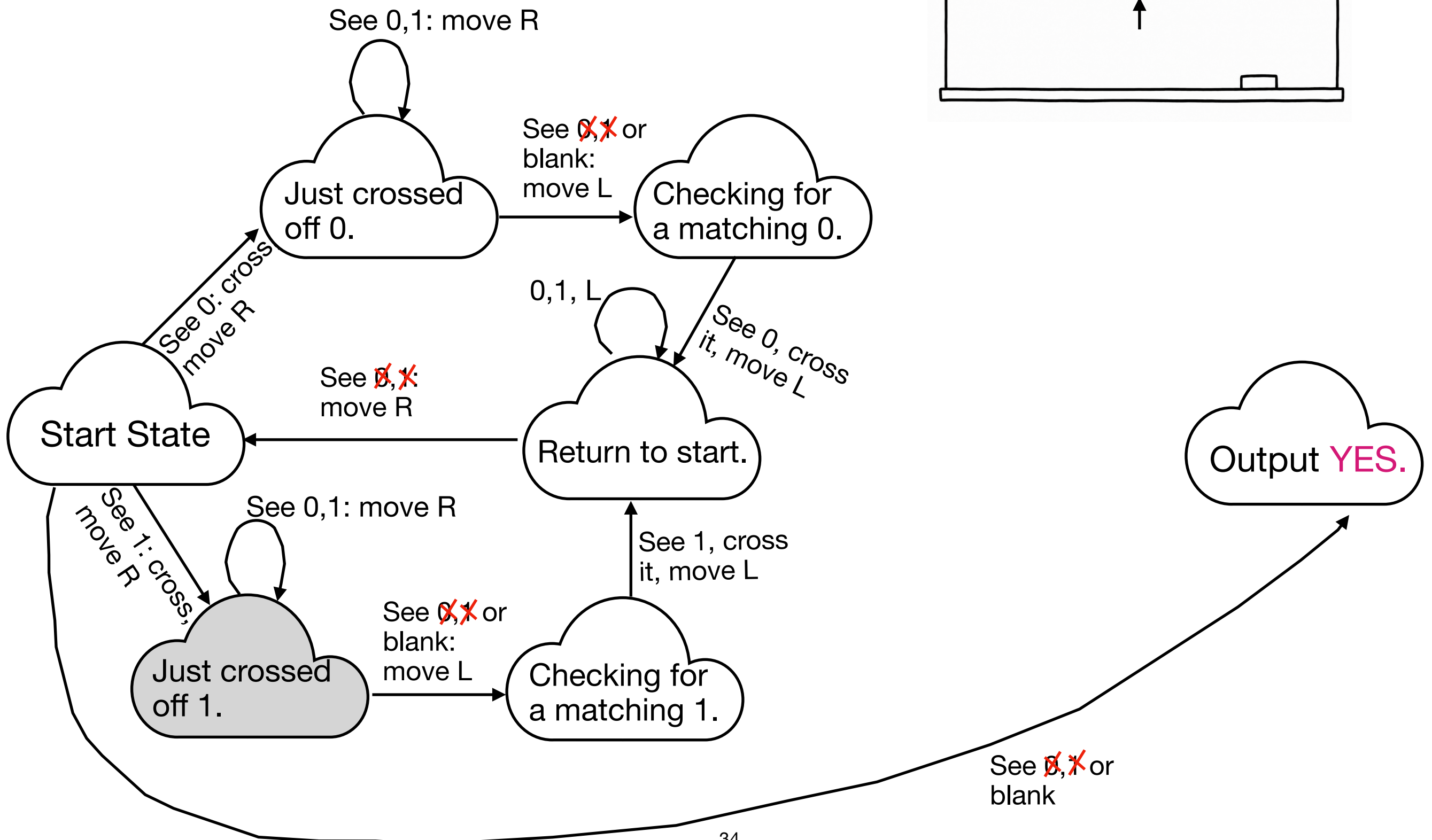
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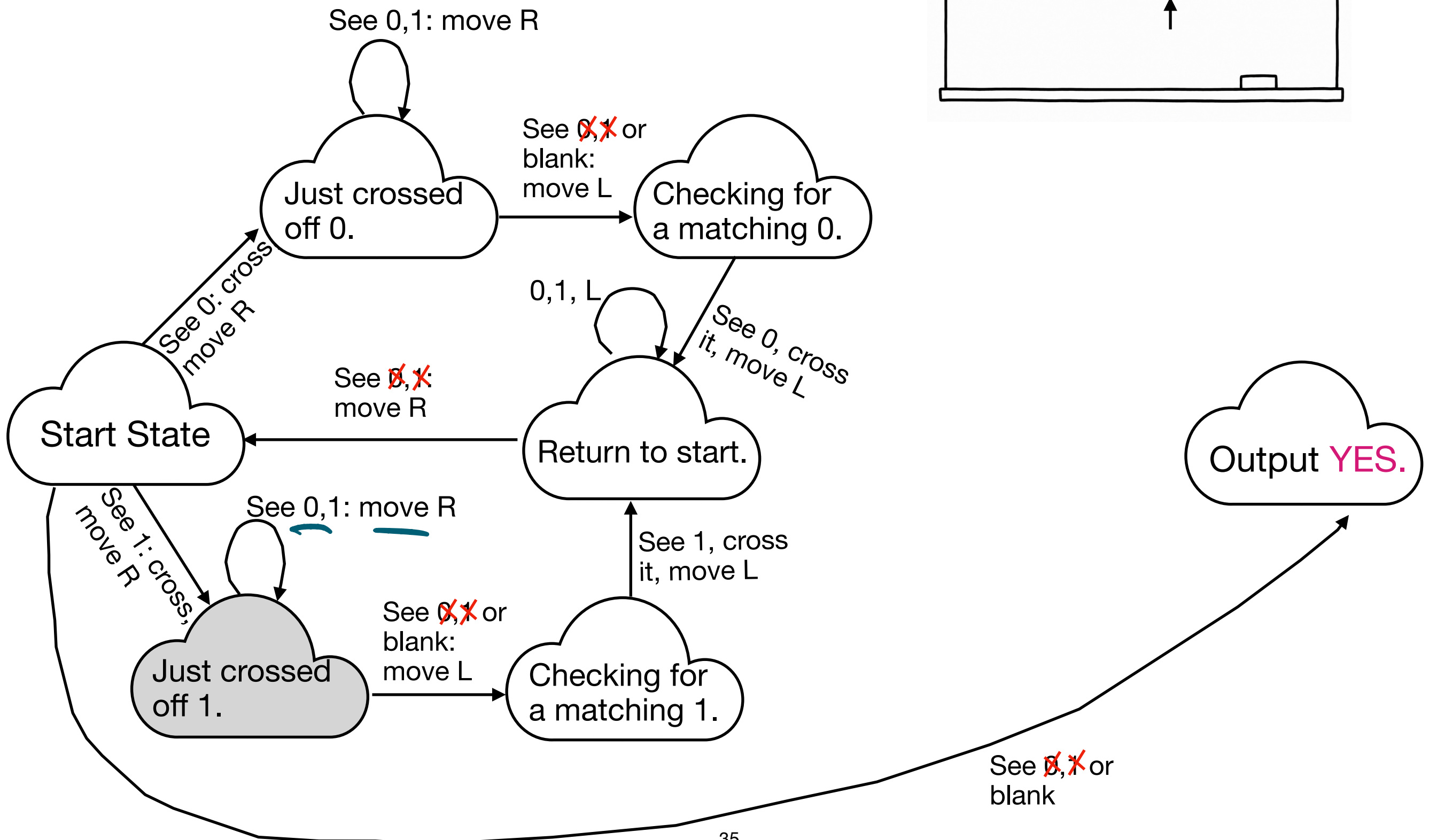
Examples



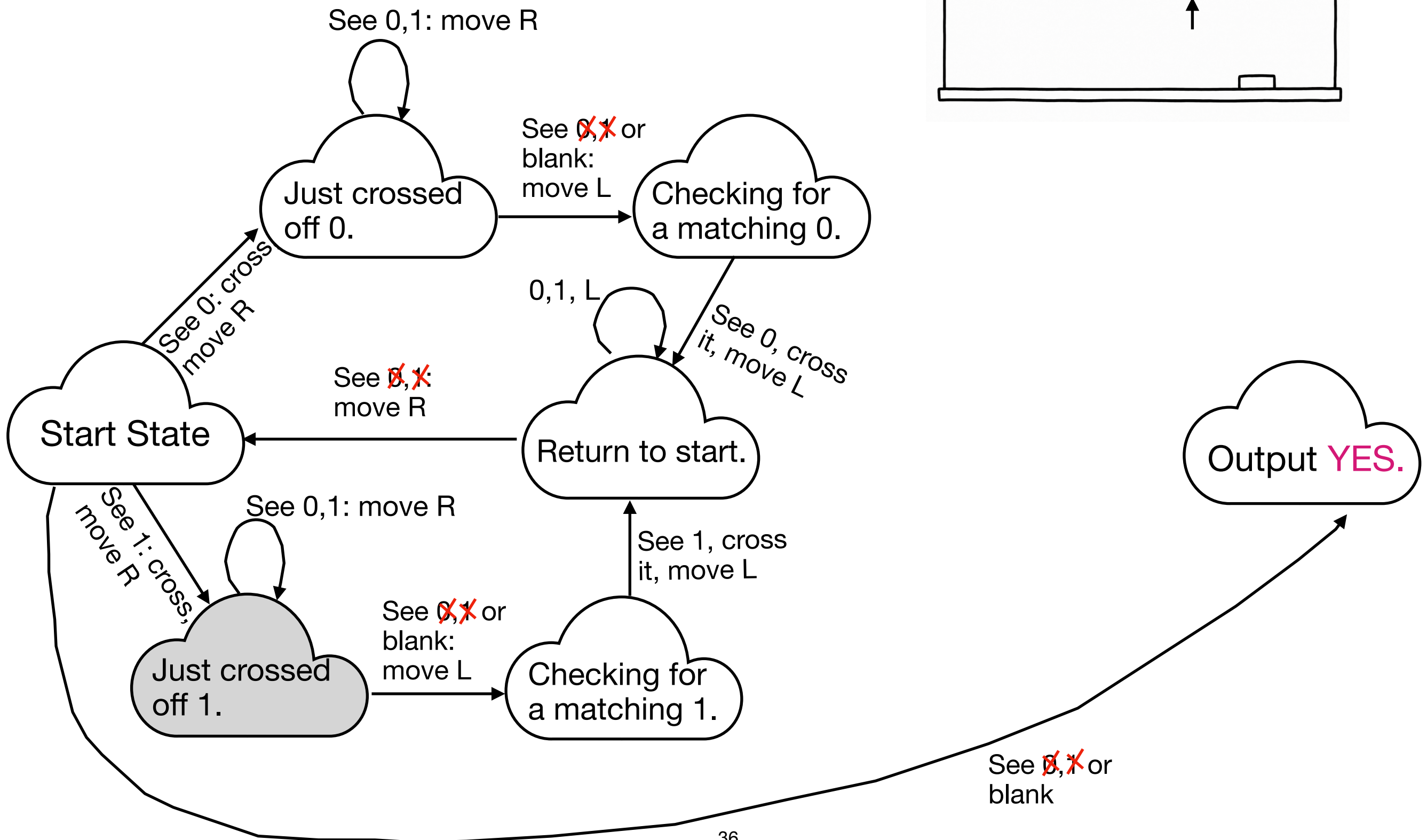
Examples



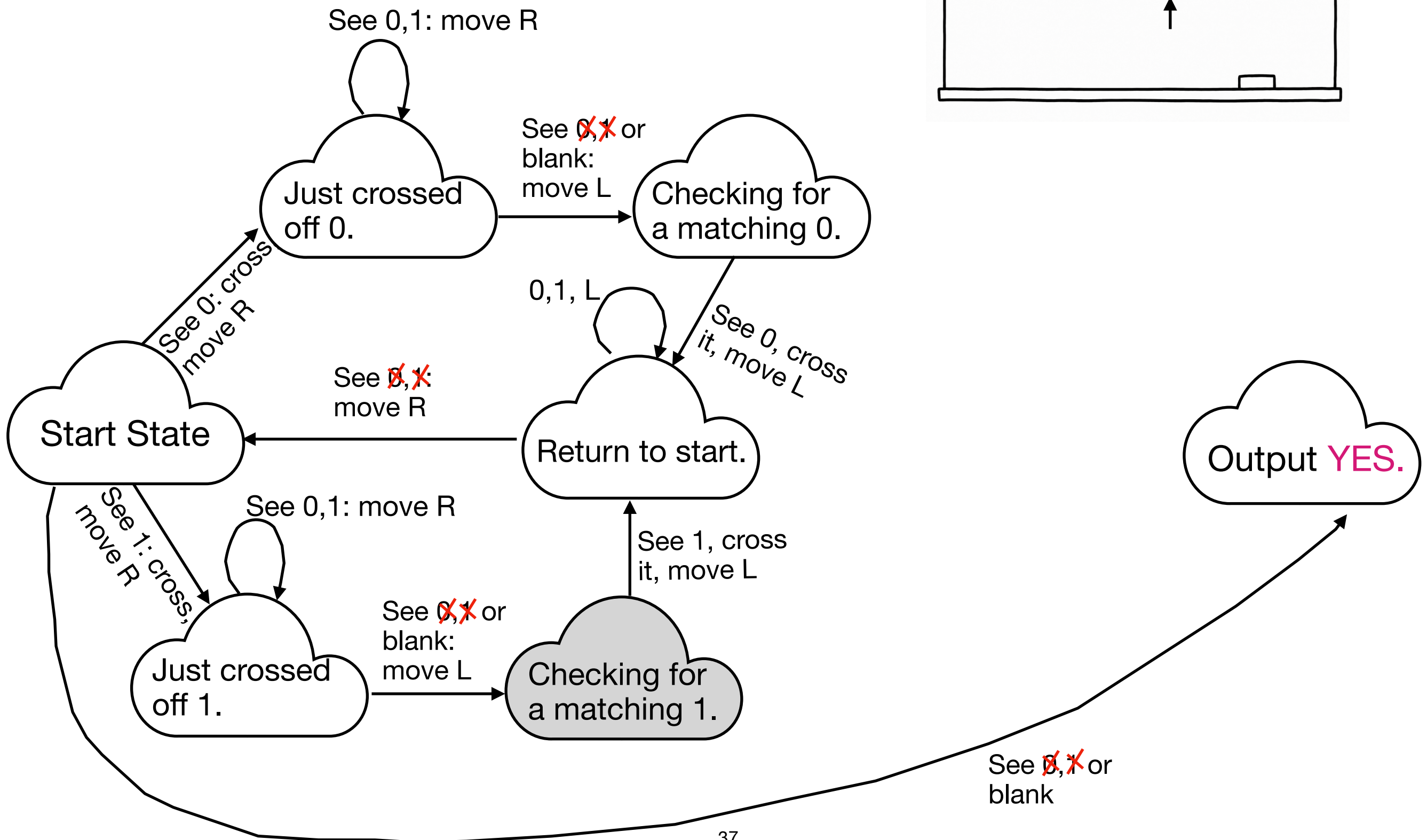
Examples



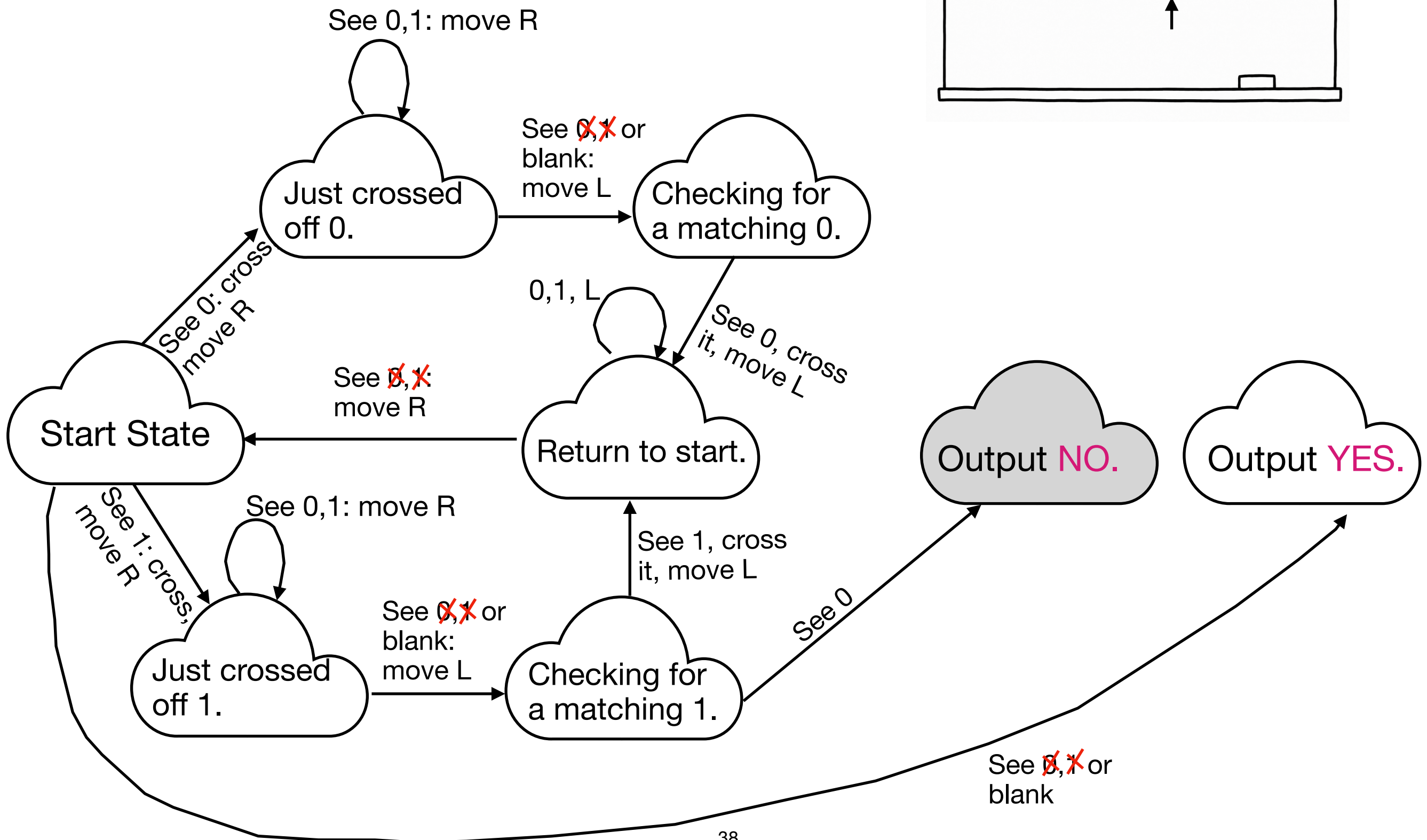
Examples



Examples

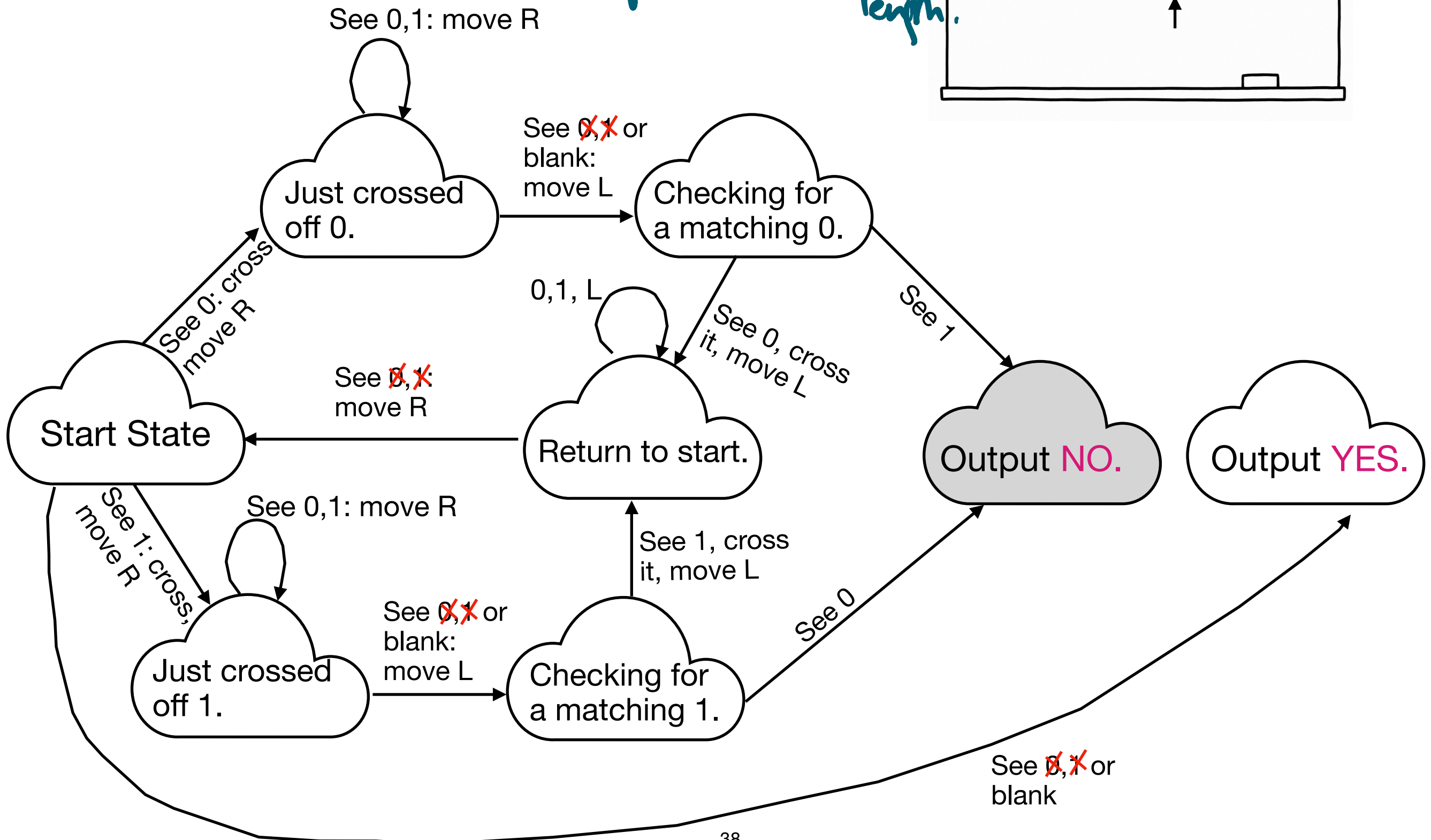
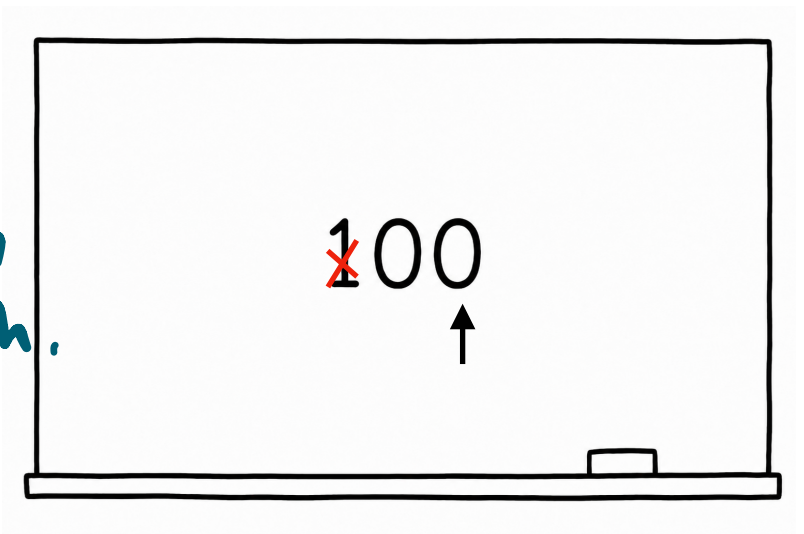


Examples

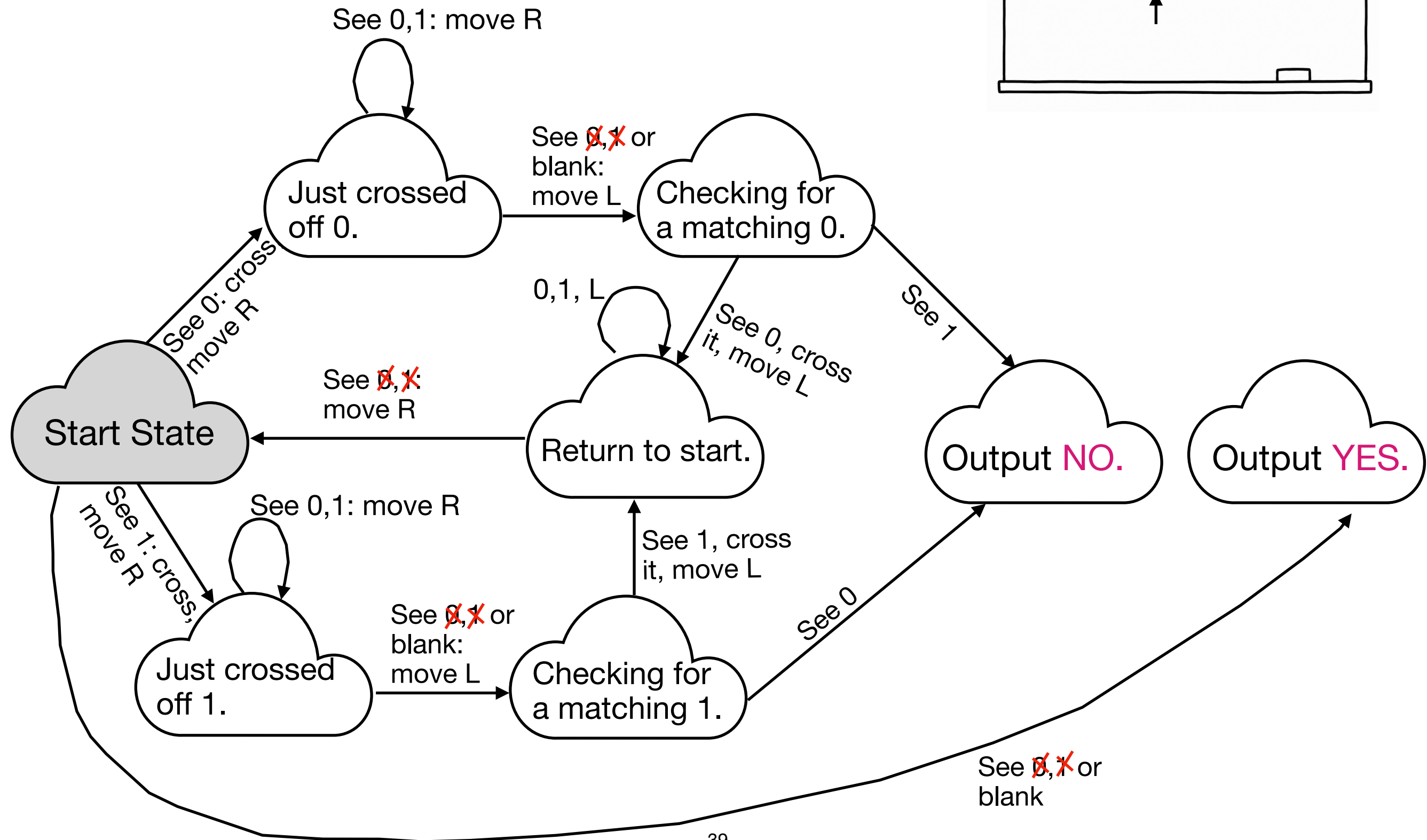
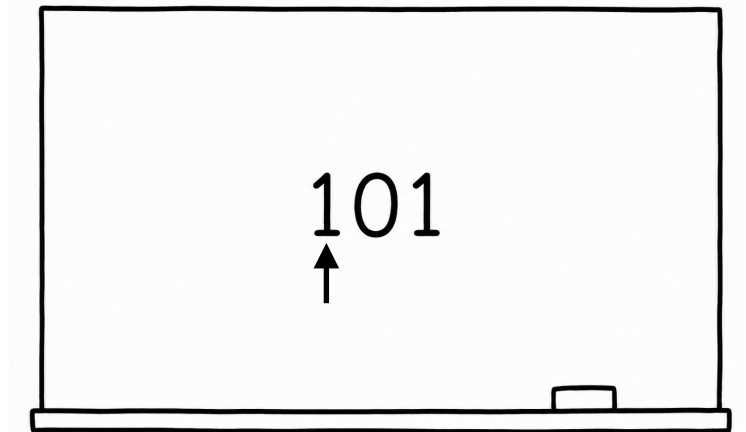


Examples

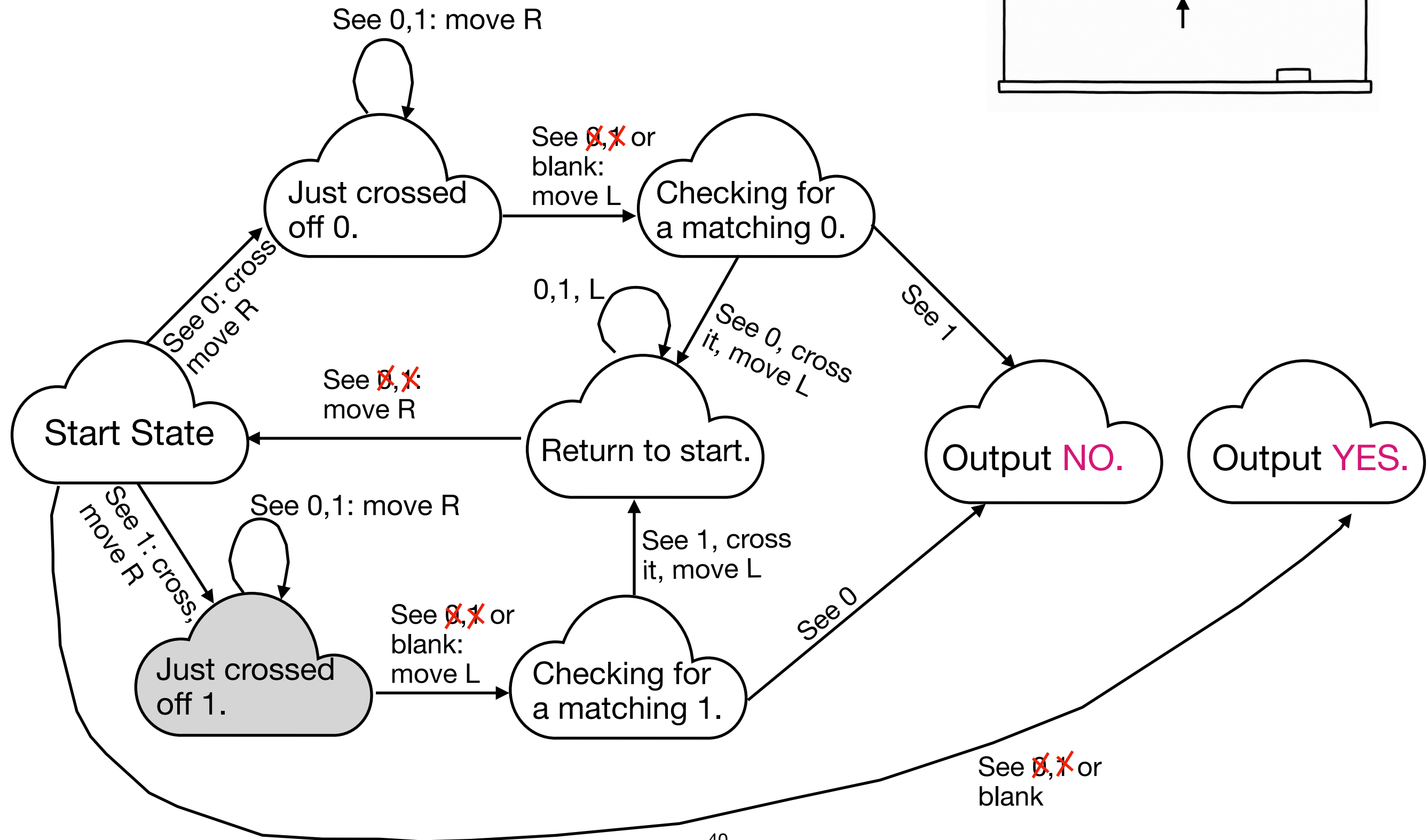
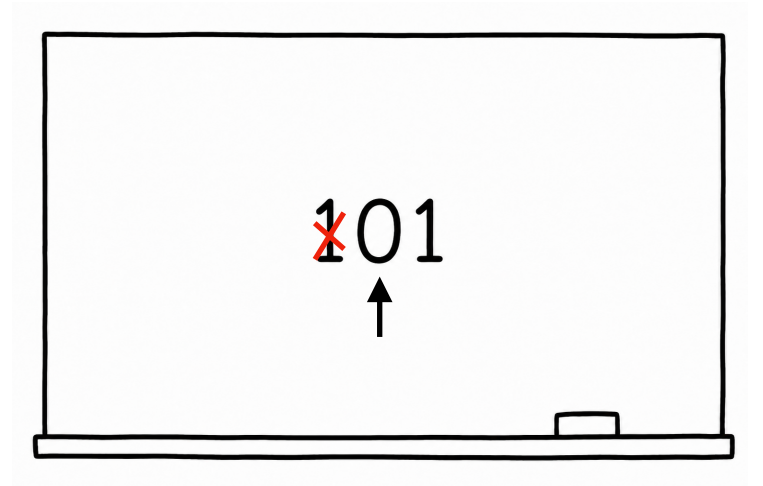
- 1) Σ
- 2) non-palindromes
- 3) palindromes of even length.



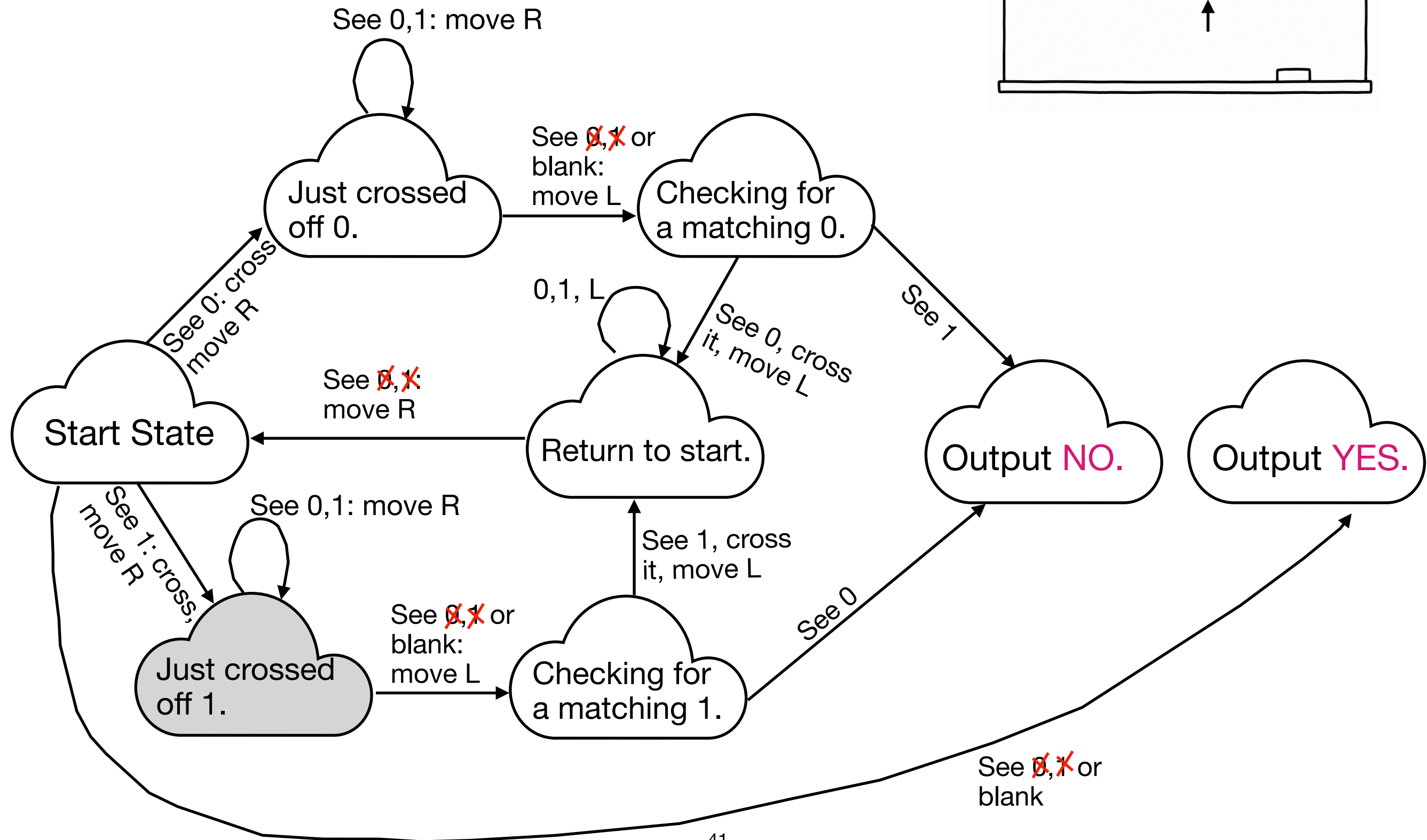
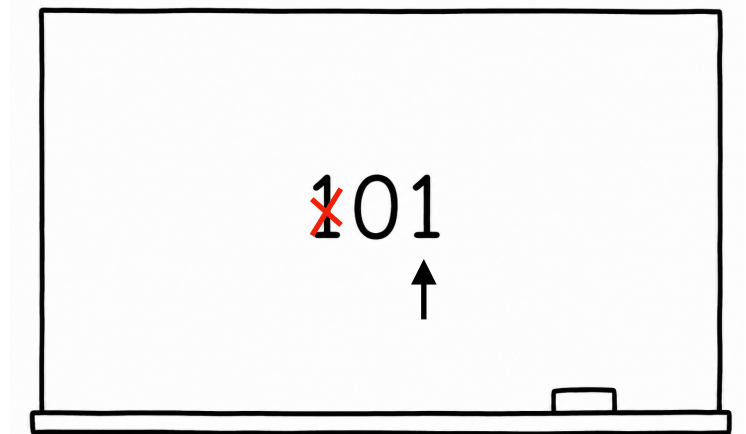
Examples



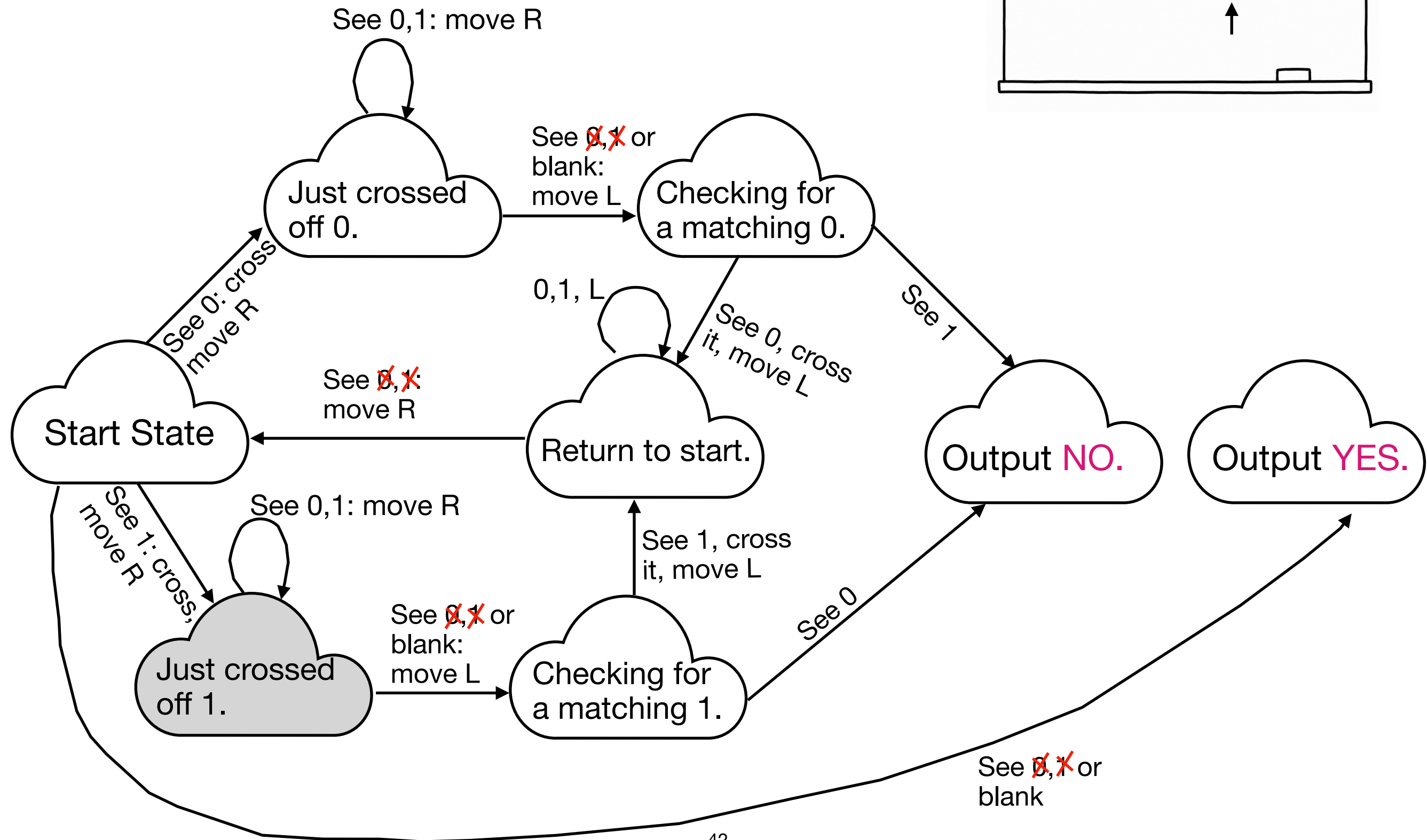
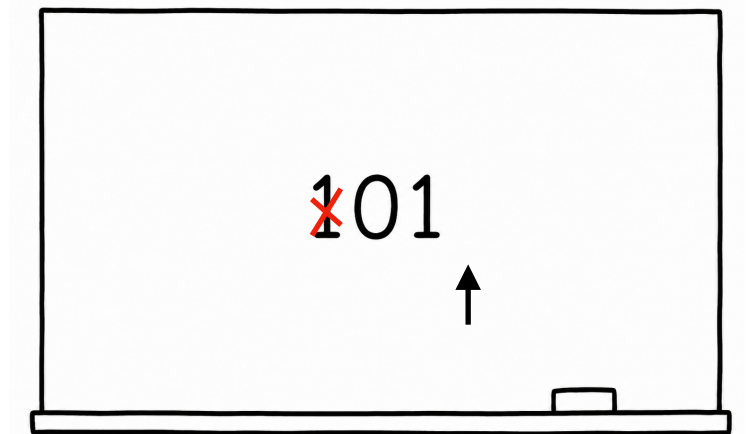
Examples



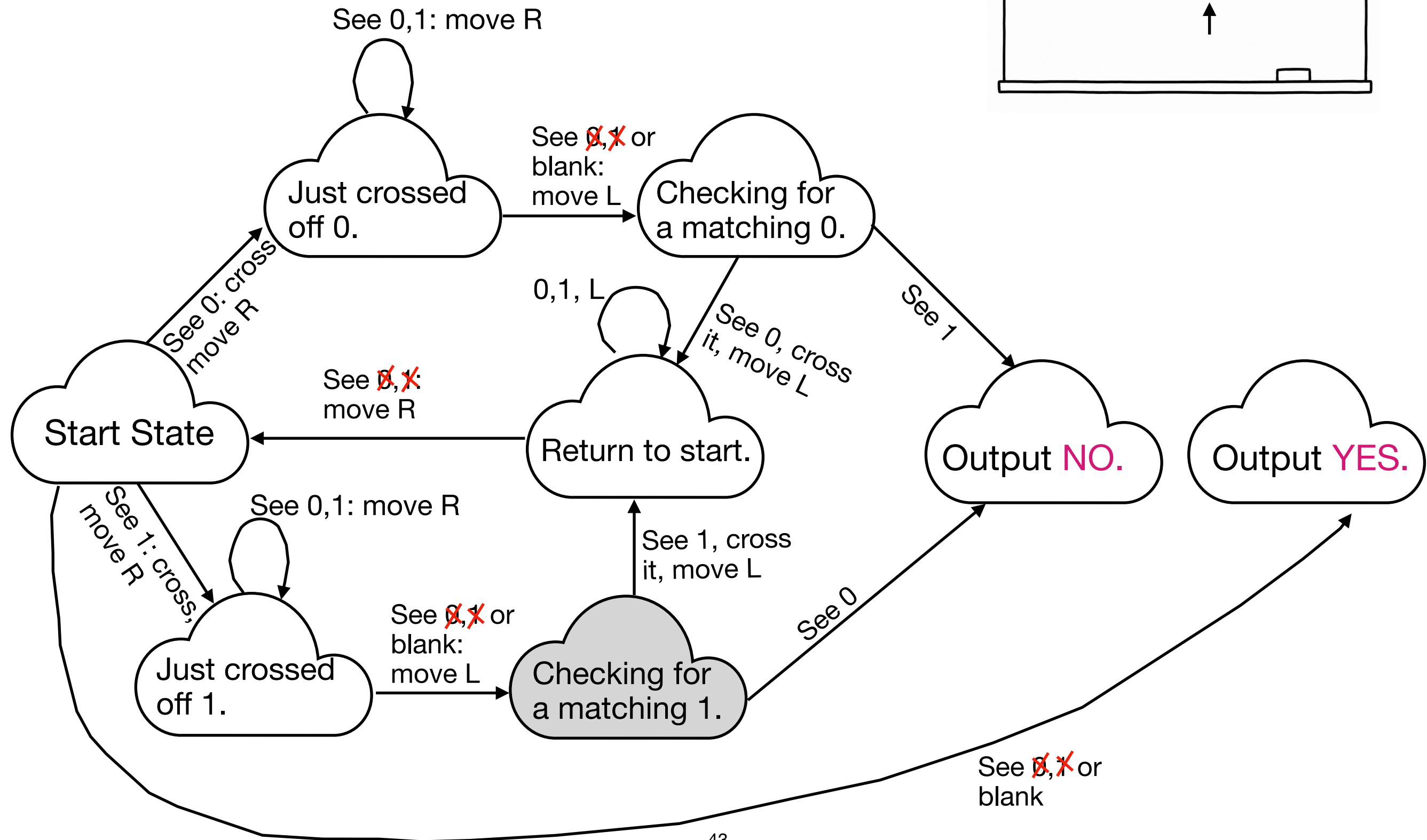
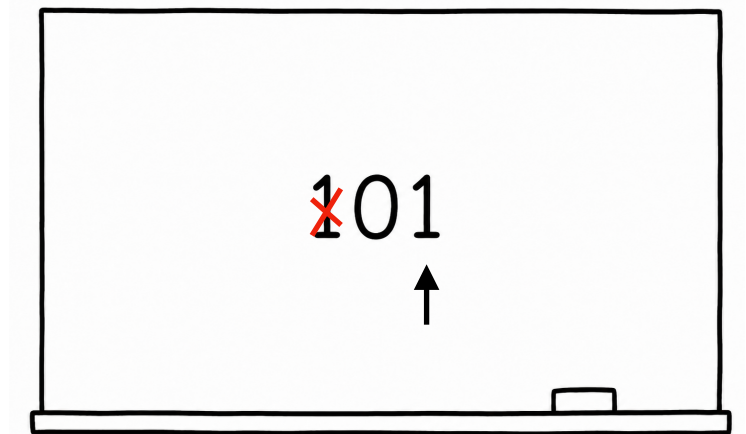
Examples



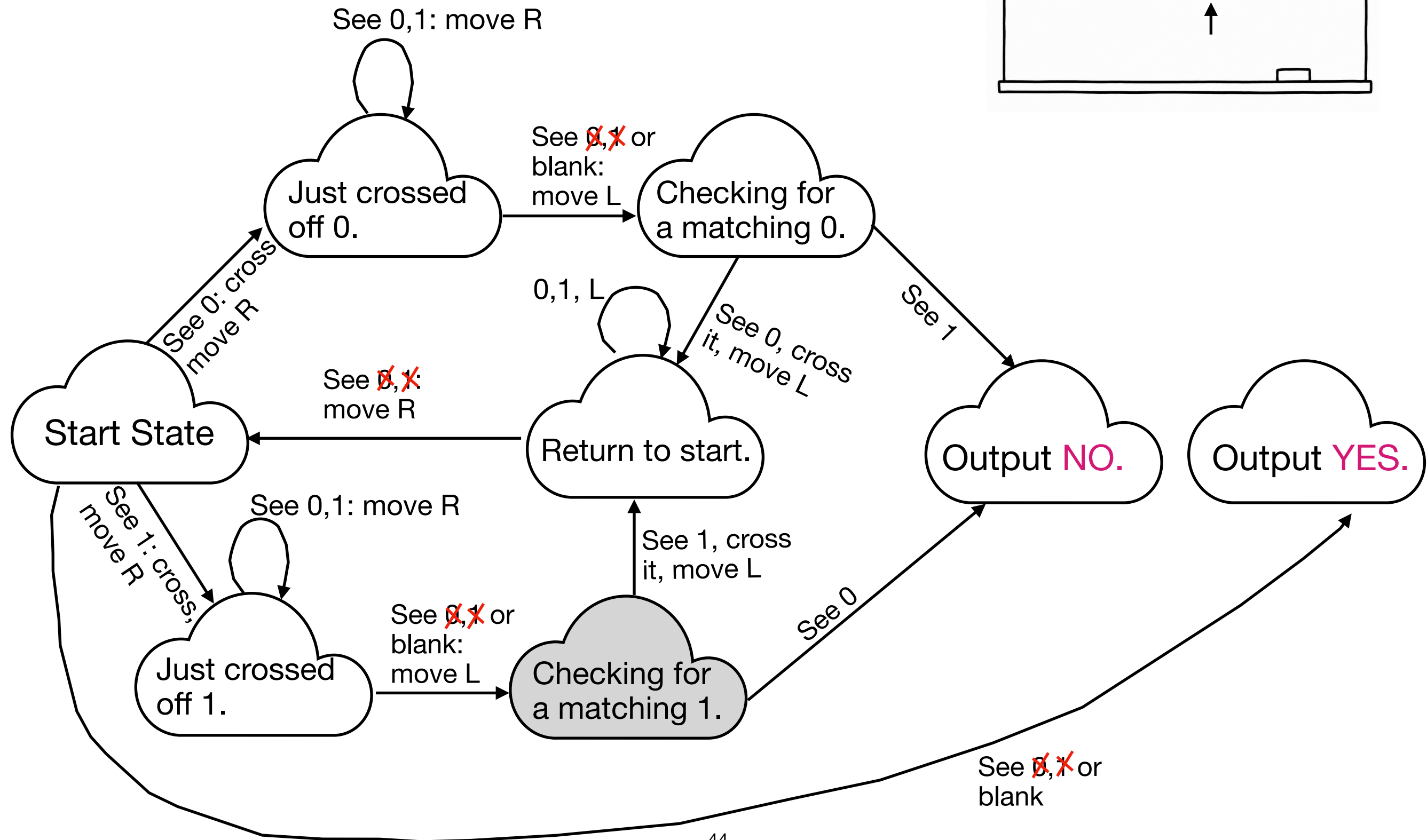
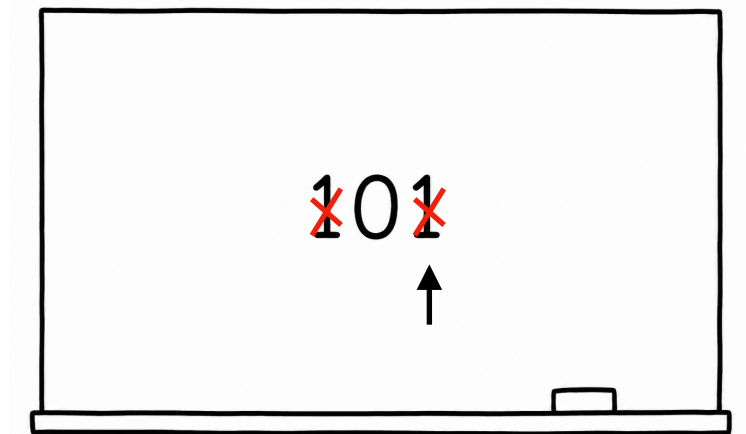
Examples



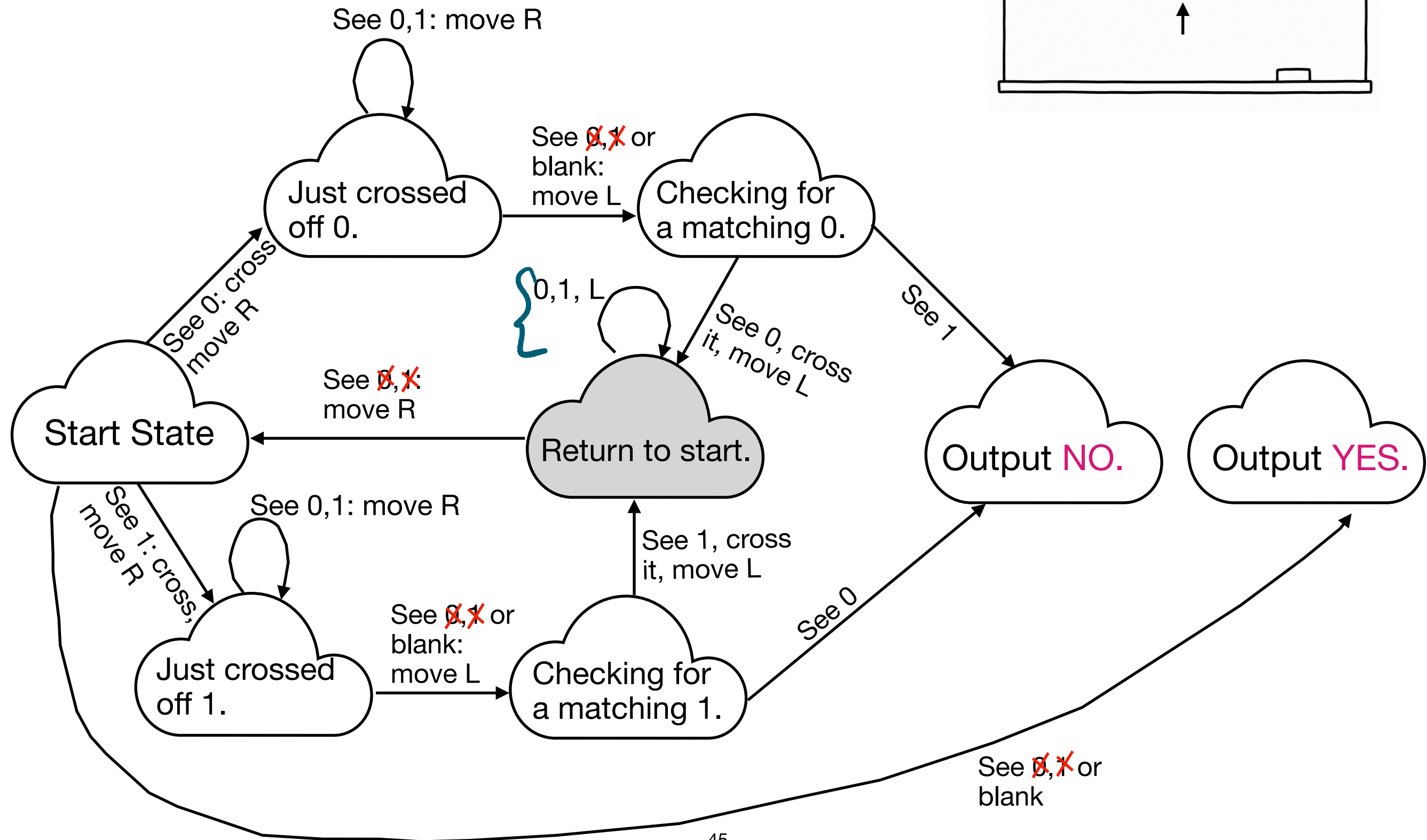
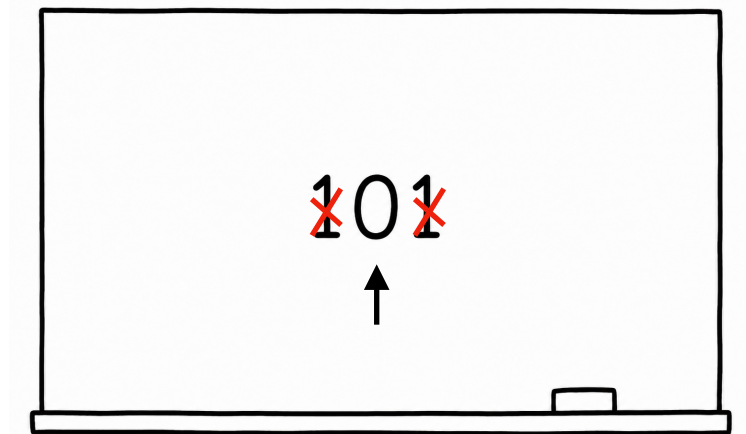
Examples



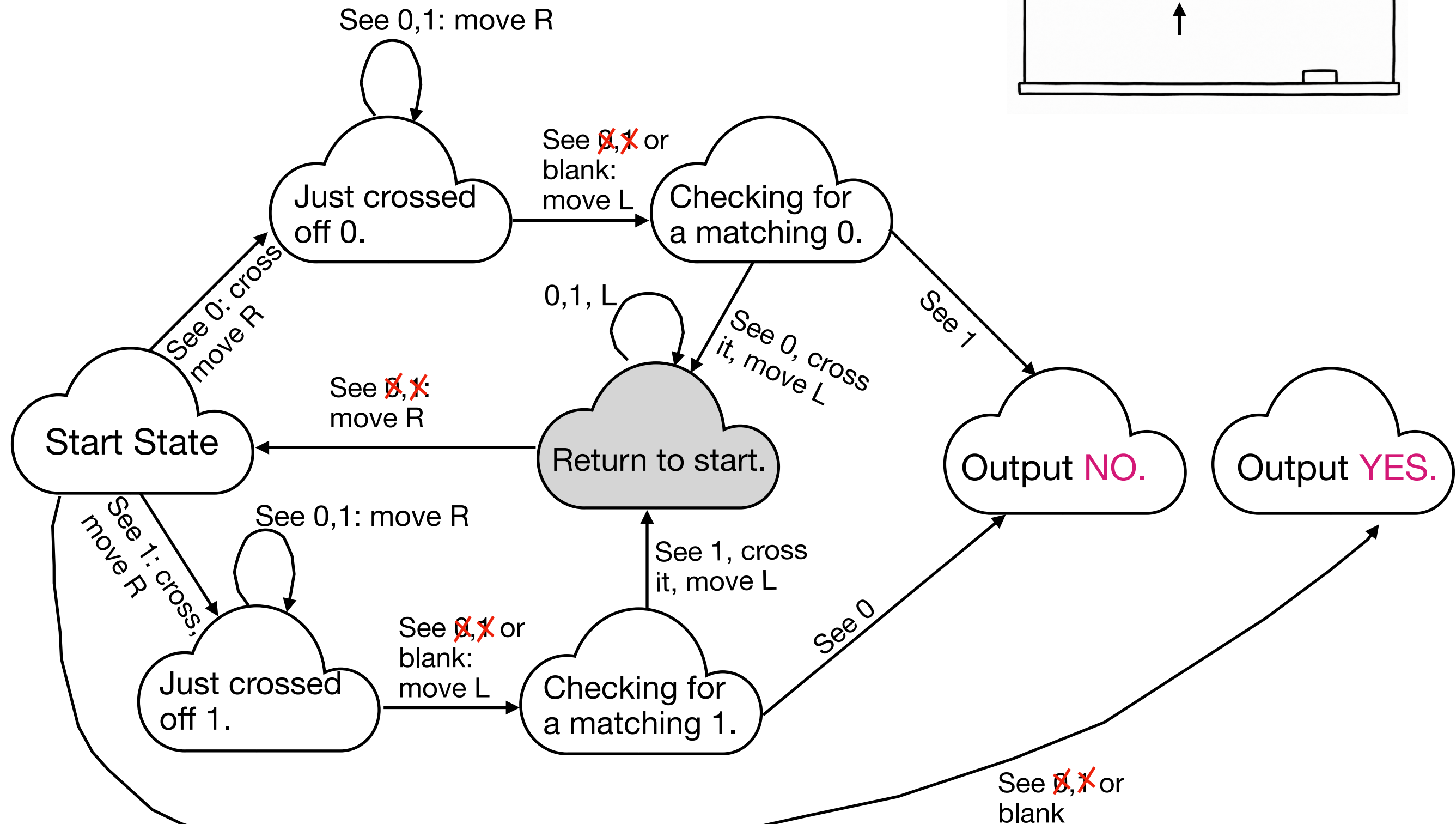
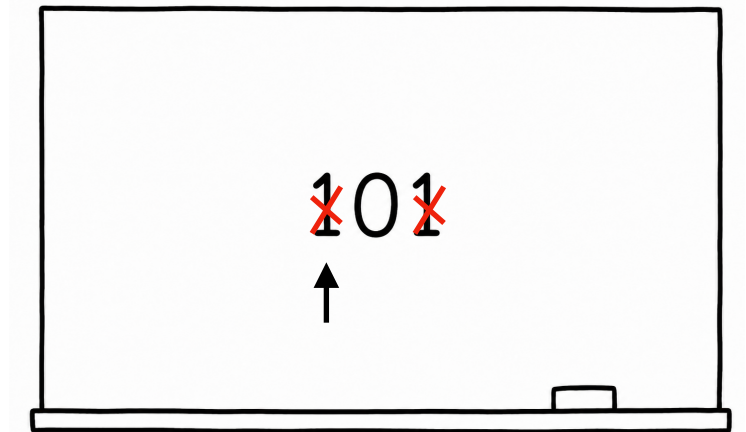
Examples



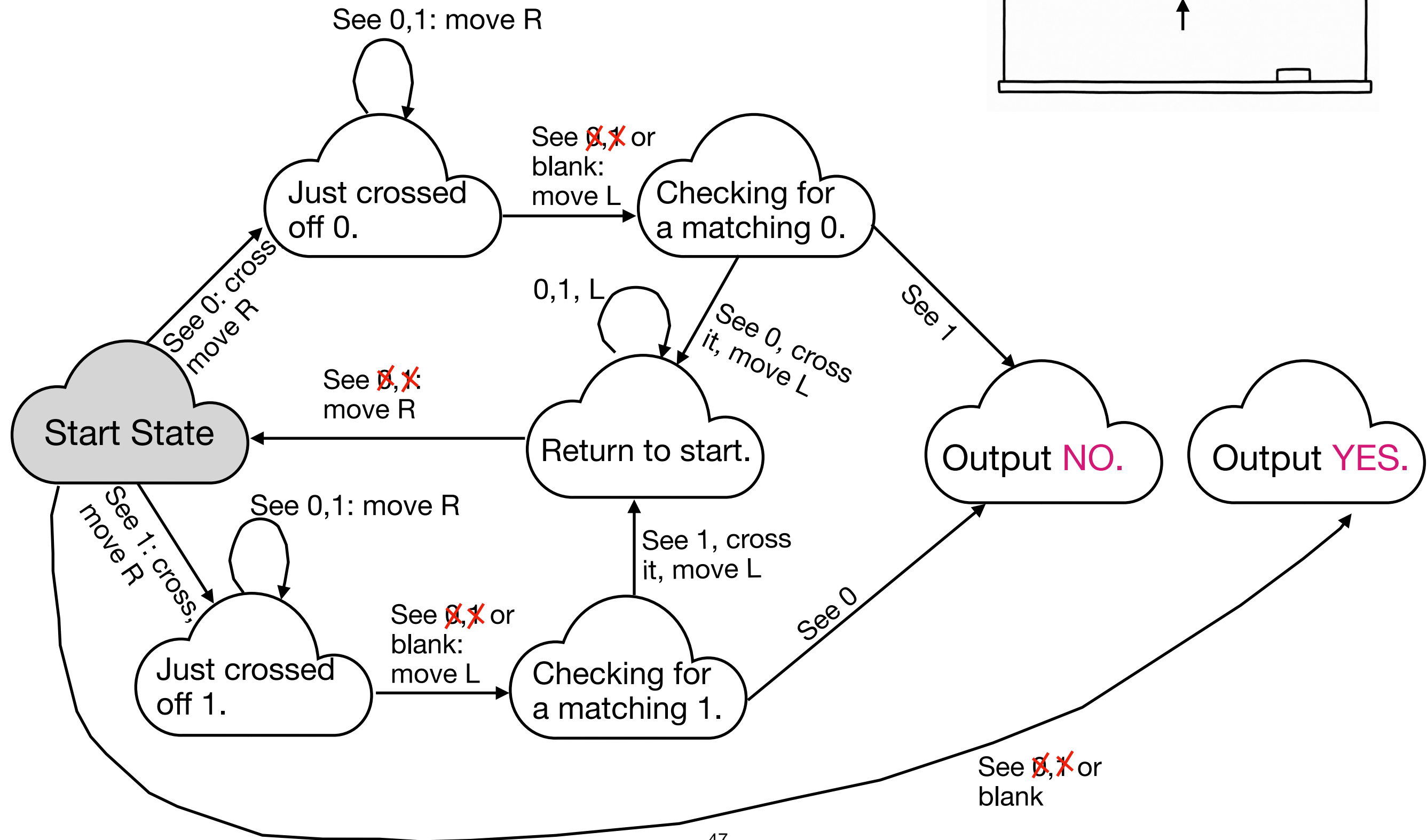
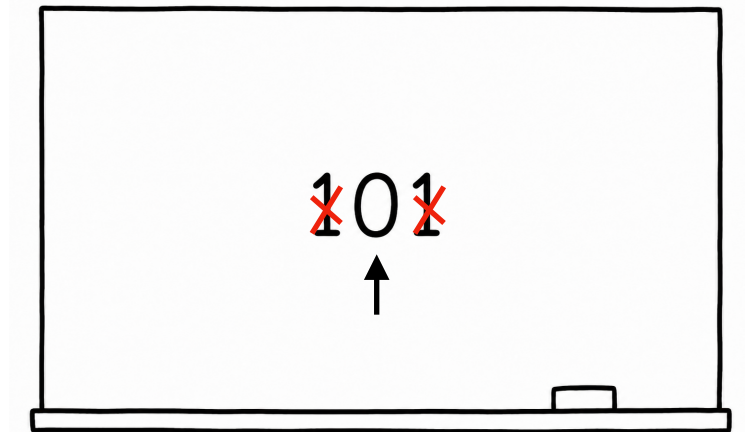
Examples



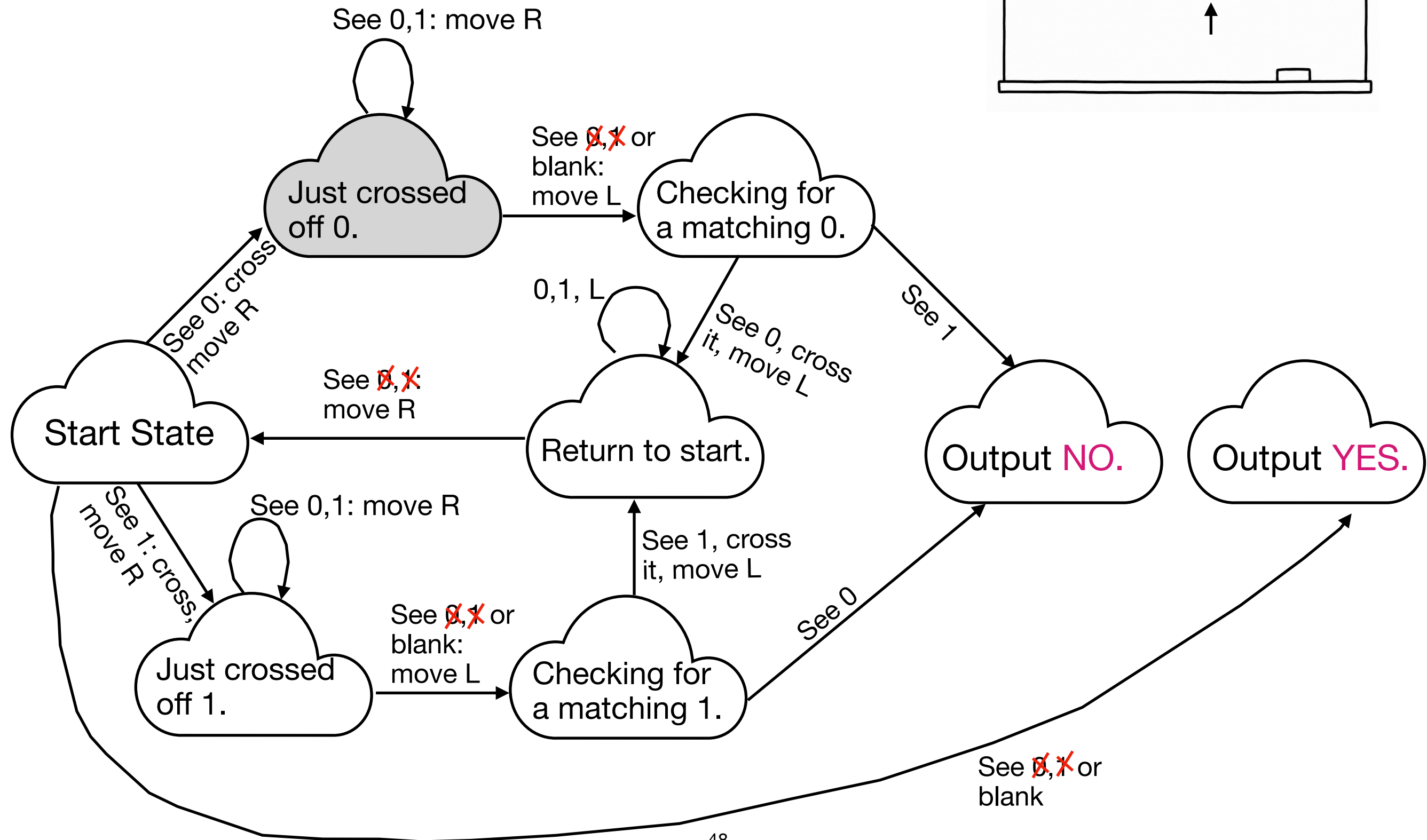
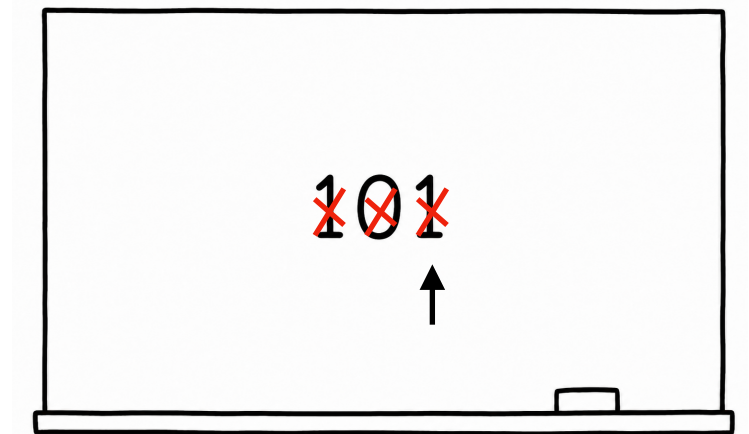
Examples



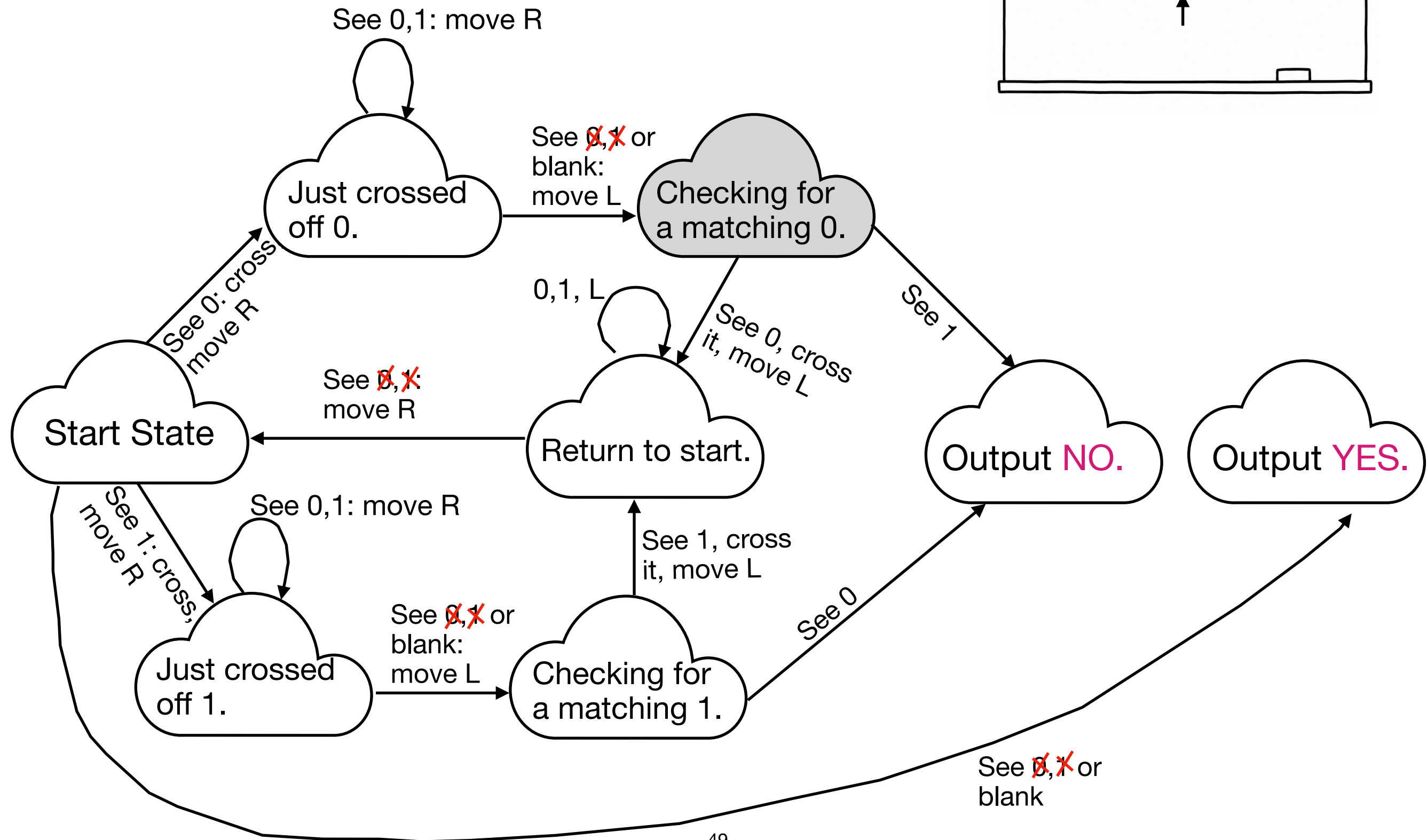
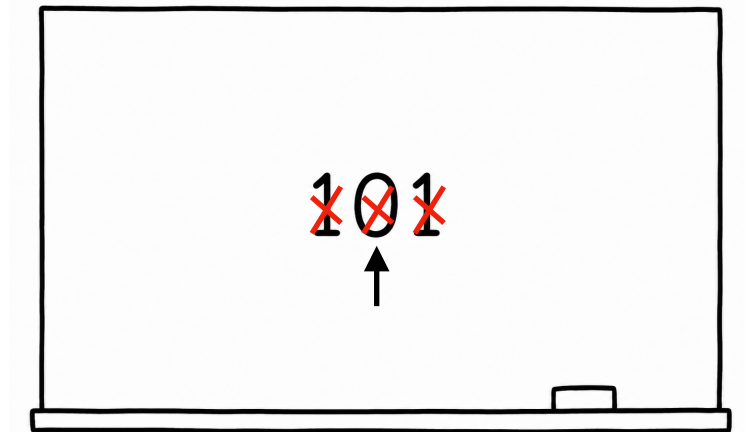
Examples



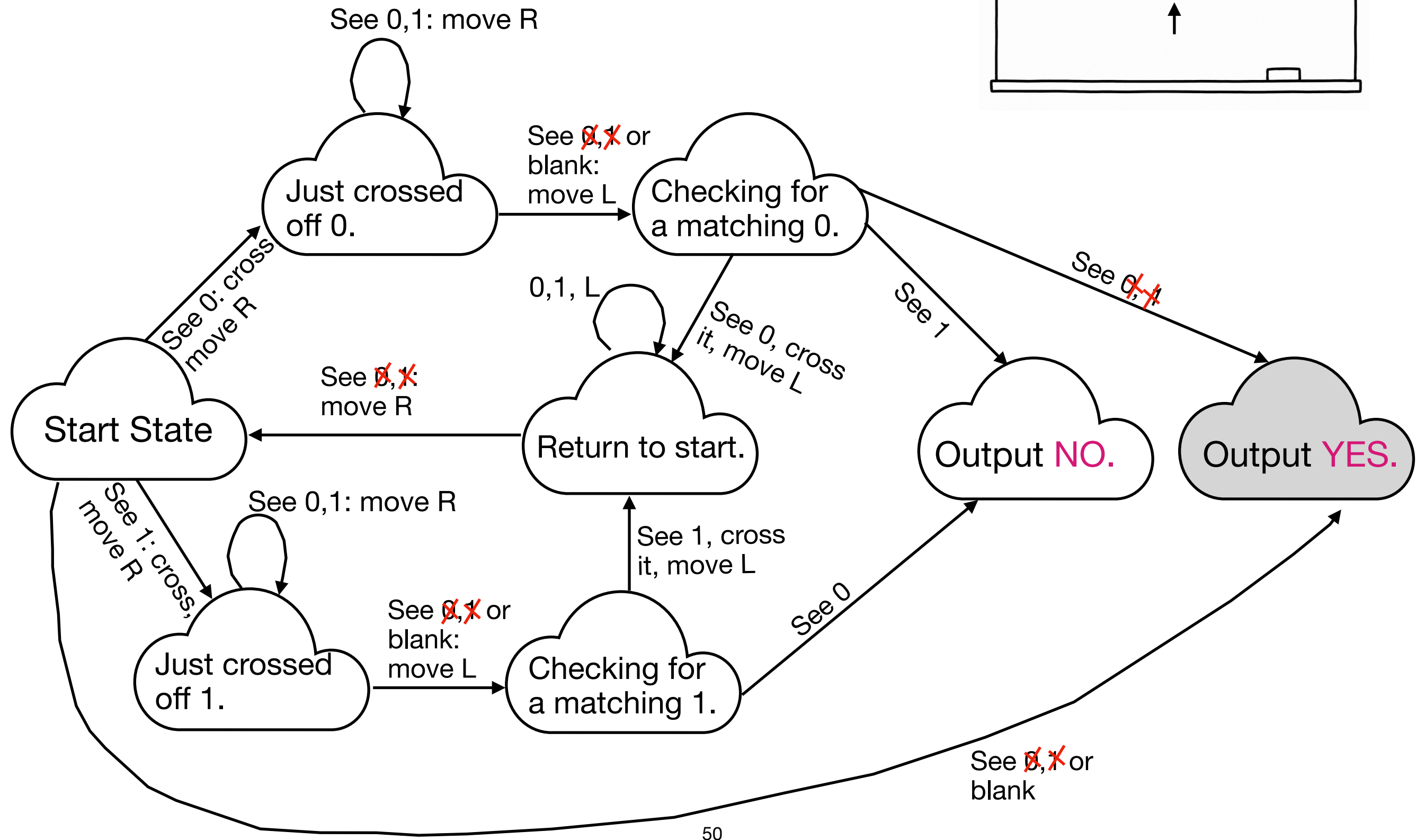
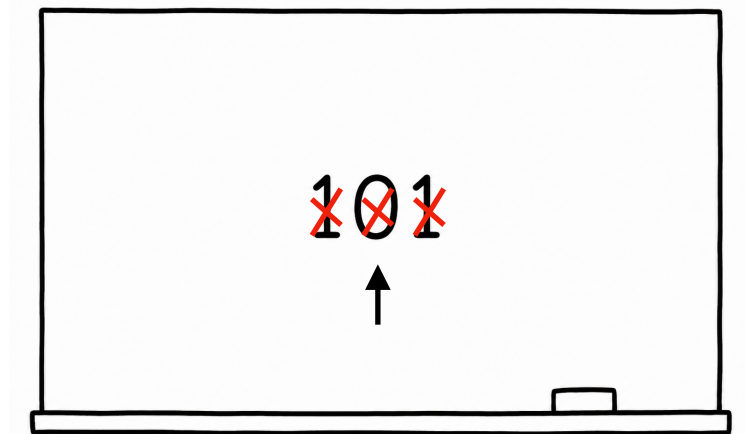
Examples



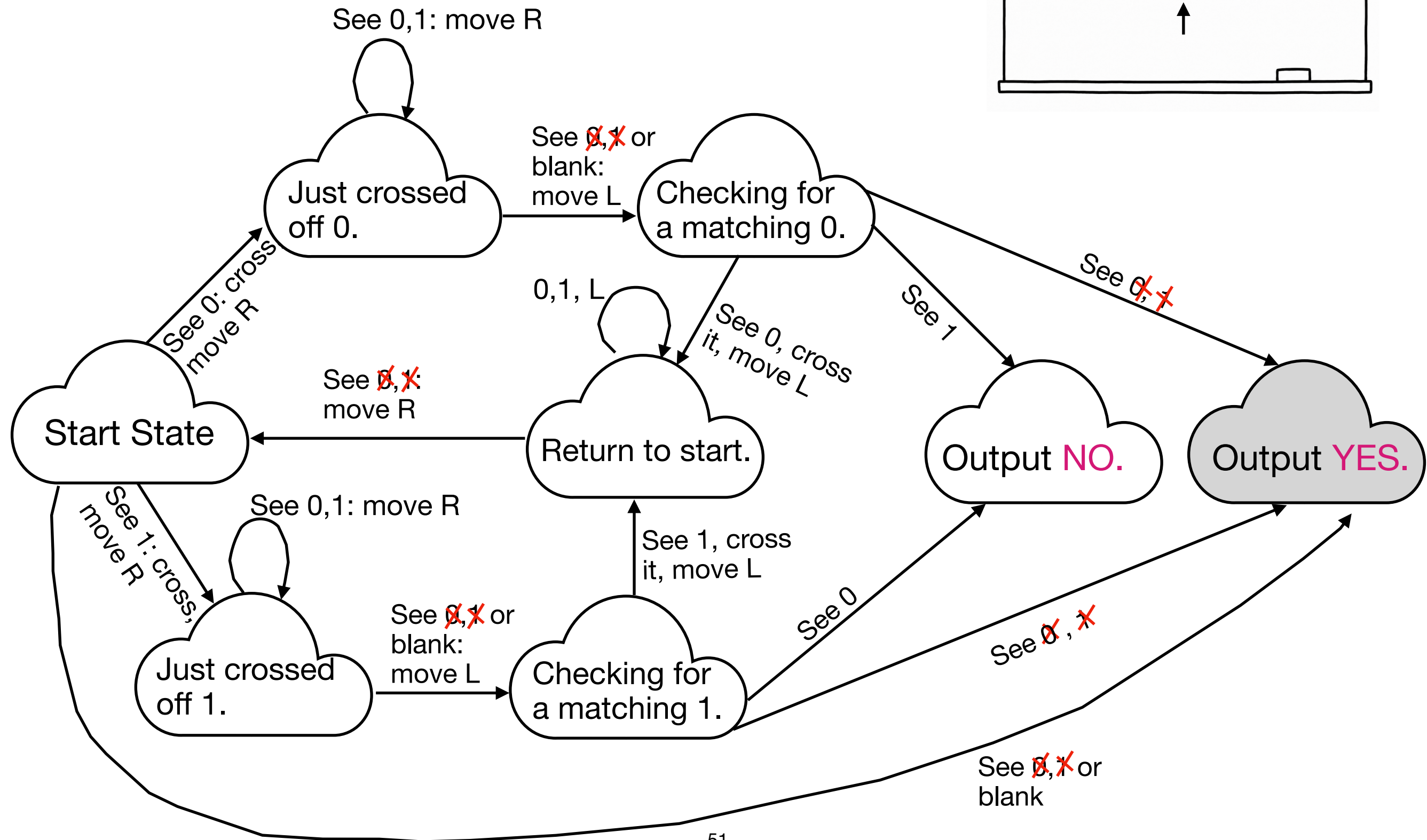
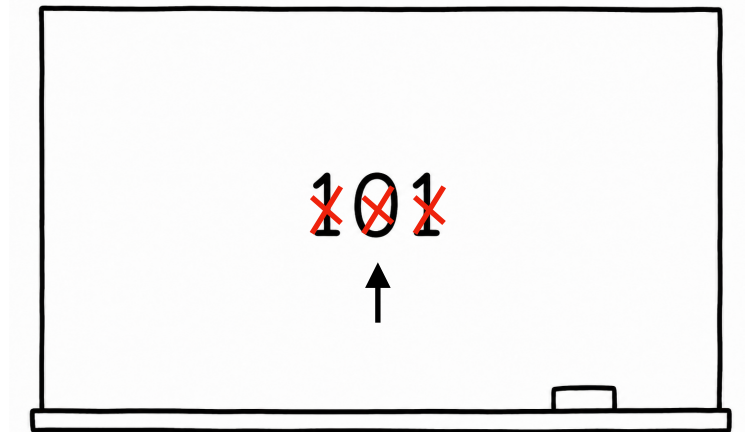
Examples



Examples



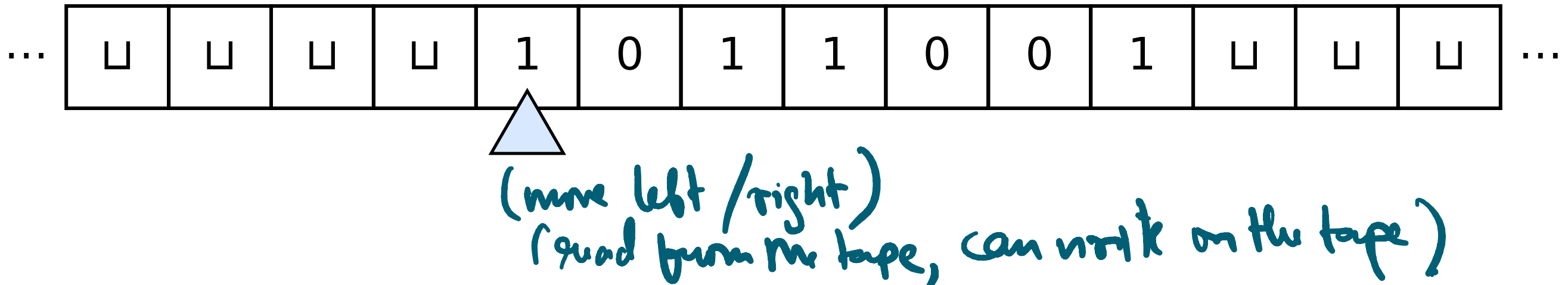
Examples



The Turing Machine Model

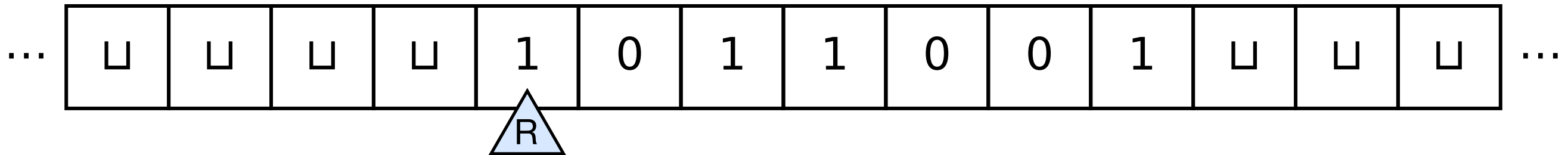
- Turing Machines: A mathematical model of **human computation**.
- The state diagram illustrates the local, step-by-step behavior that we will formalize as a Turing Machine.

The Turing Machine Model



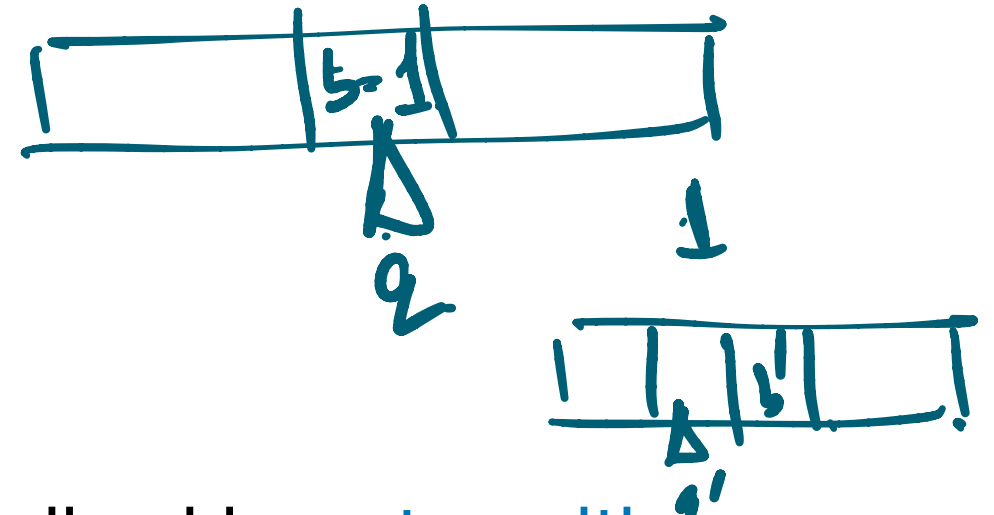
- We imagine an infinite, one-dimensional “tape”.
- The tape divided into “cells”.
- Each cell contains a single symbol.
- There is a “head” pointing at one cell of the tape.
- The machine can be in one of finitely many “internal states”

The Turing Machine Model



- In each step, the machine decides:
 - What to write in current cell,
 - Which cell to move in (left/right),
 - And, the next state.
- The decision is based only on the symbol being read and the current state the machine is in.

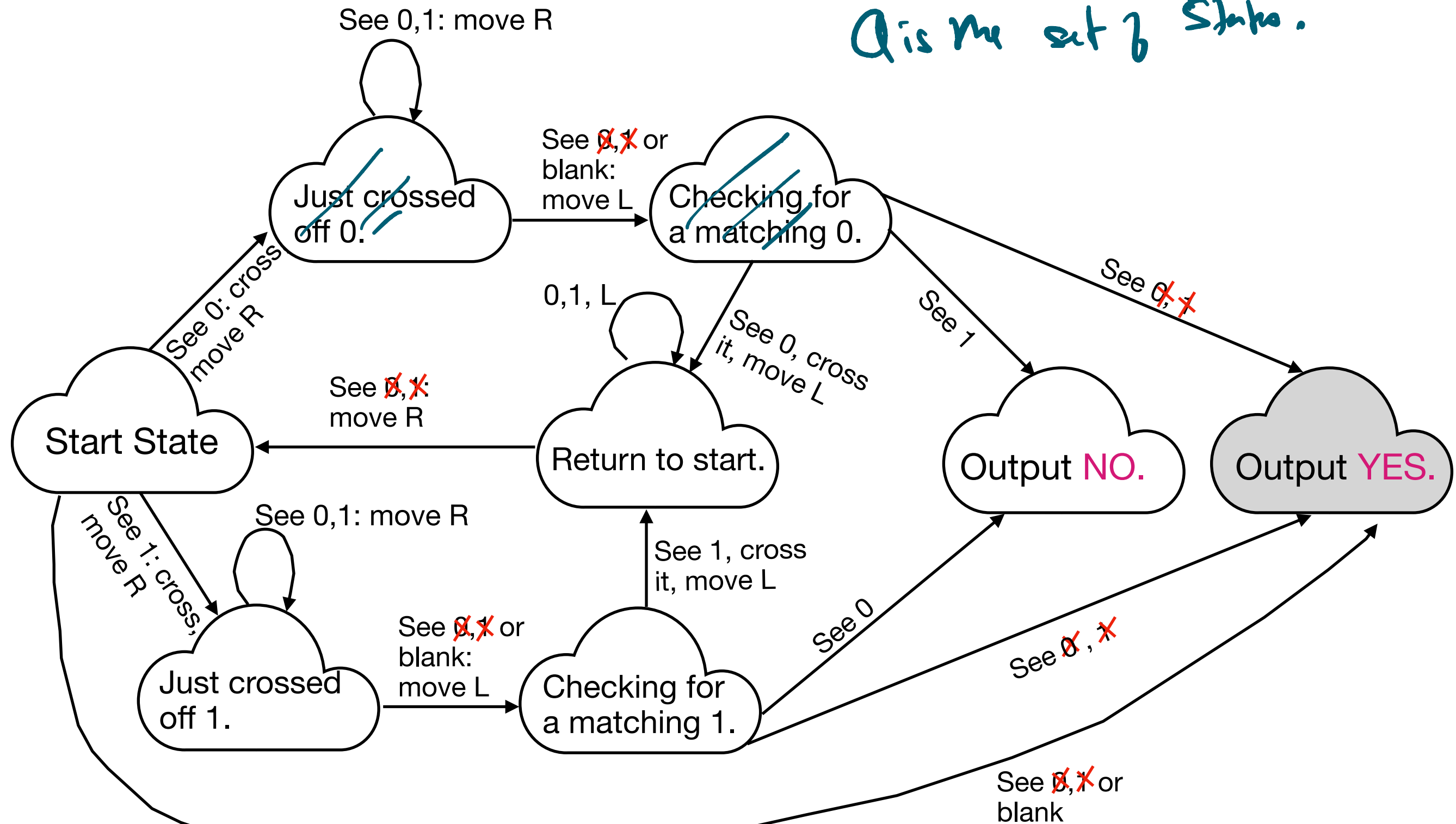
Transition Function



- Mathematically, a Turing machine is described by a **transition function**: $\delta : Q \times \Sigma \rightarrow Q \times \Sigma \times \{L, R\}$.
↗ right.
- Here Q is the set of states and Σ is the set of symbols.
↖ left
- $\delta(q, b) = (q', b', D)$ means:
↘
 $\Sigma = \{0, 1, \text{blank}, *, \cup\}$
 - If we are in state q and read the symbol b .
 - Write b' (replacing b), move the head in direction D (L = left and R = right), and go to state q' .

Examples

Q is the set of states.



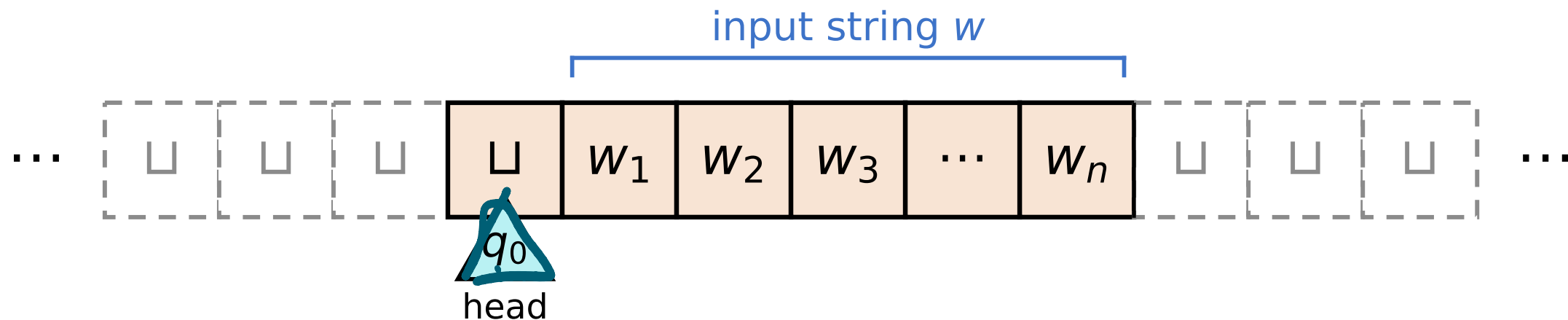
Input

- One Turing Machine represents one algorithm.
- For us, the **input** to a Turing machine will always be a **string over the binary alphabet**.

$\{0,1\}^* \Sigma = \text{tape alphabet}$

$\cancel{x}, x \in \Sigma$

Turing Machine Initialization



- The tape initially contains an **input string** $w \in \{0,1\}^*$.
- The head is initially in a cell to the left of the input.
 - The cell contains a special “**blank symbol**” $\sqcup$.
- The machine is initially in a special “**start state**” q_0 .

Halting

$$\delta(q_0, \perp) \rightarrow (q, \downarrow, R)$$

- After initialization, we repeatedly apply the transition function.
- Eventually, the computation may reach a “**halting state**”:
 - There are two halting states: q_{accept} and q_{reject} .
- In this case, the computation **halts**.

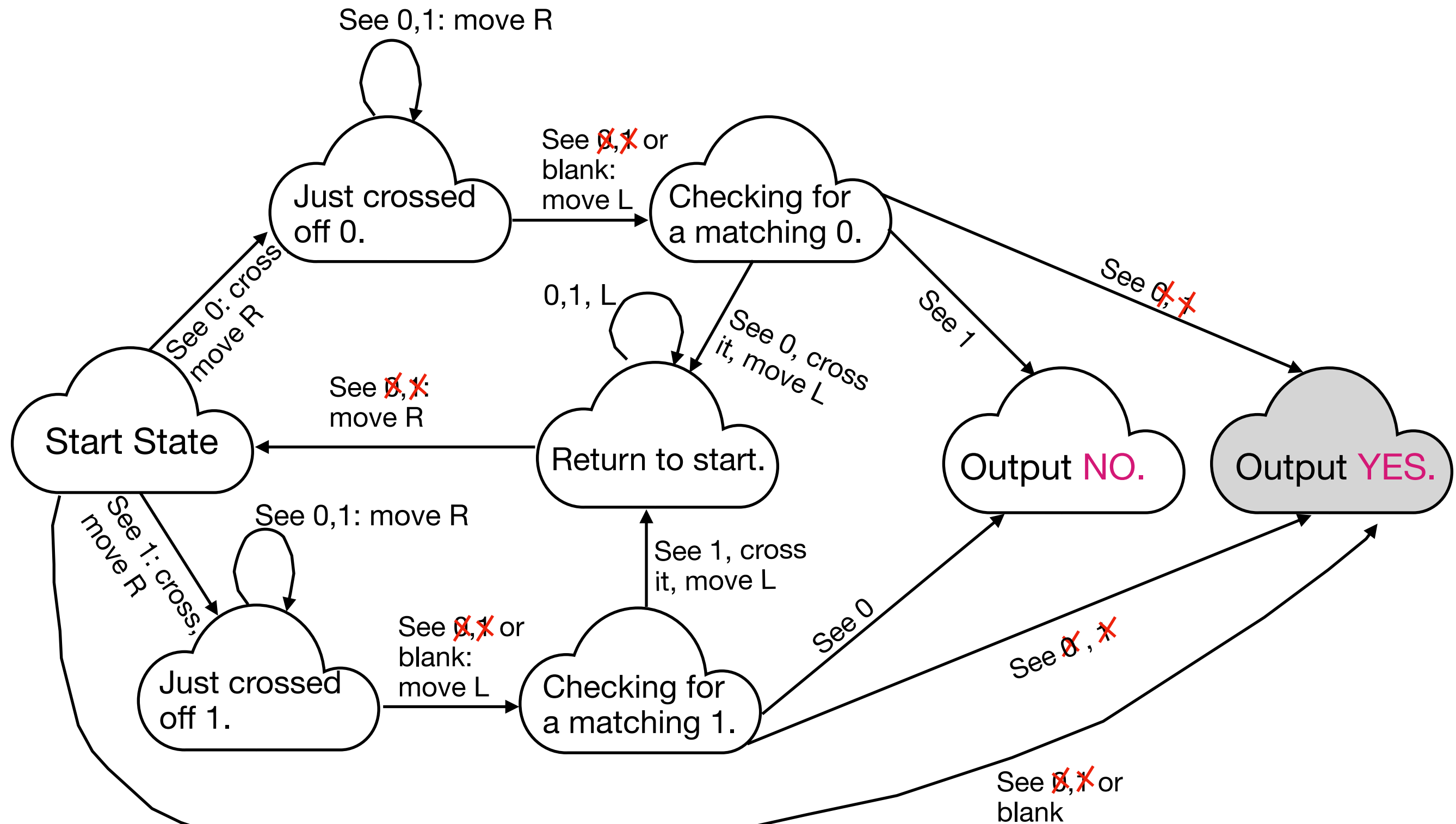
$\Downarrow$
output yes

$\Downarrow$
output NO.

Accepting and Rejecting

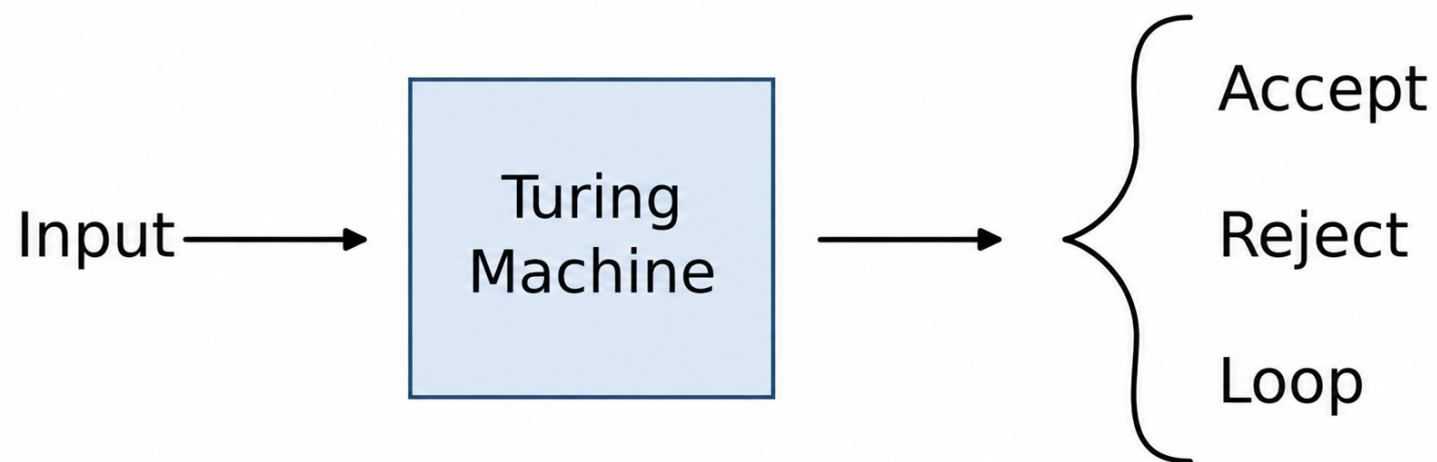
- If the machine enters q_{accept} , we say it **accepts** the input.
 - Analogy: “**return True**”.
- If the machine enters q_{reject} , we say it **rejects** the input.
 - Analogy: “**return False**”.

Examples



Looping

- It is also possible the machine runs **forever** without halting.
- In this case, we say the machine “**loops**”.



**Which problems can be solved
through computation?**

Deciding a Language

- **Recall:** In Lecture 1, decision problems = languages.

- Let M be a Turing Machine, and L be a language.

- We say M **decides** L if *(M halts on all inputs)*

- ▶ M accepts every $x \in L$, and

- ▶ M rejects every $x \notin L \Rightarrow x \in \{0,1\}^*$

- This is a mathematical model of what it means to “solve a decision problem”.

*Consider a decision problem D ,
is it solvable?*

*Yes then,
 D is solvable*

else it is not solvable.

(1) Language L_D corresponding to D .

(2) Is there a TM deciding L_D ?

Example: Parity

- **Informal Problem Statement:** “Given $w \in \{0,1\}^*$, determine whether the number of ones in w is even or odd”.

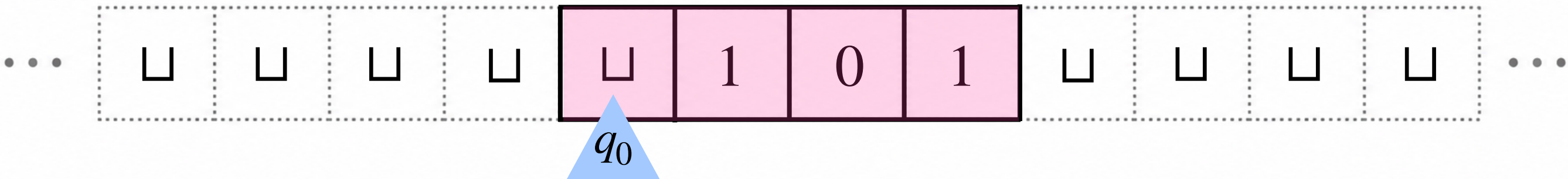
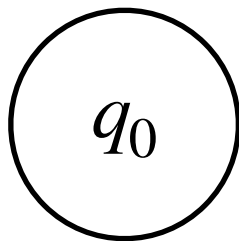
- **Can be formulated as:**

010 $\in$ PARITY, 000 $\notin$ PARITY

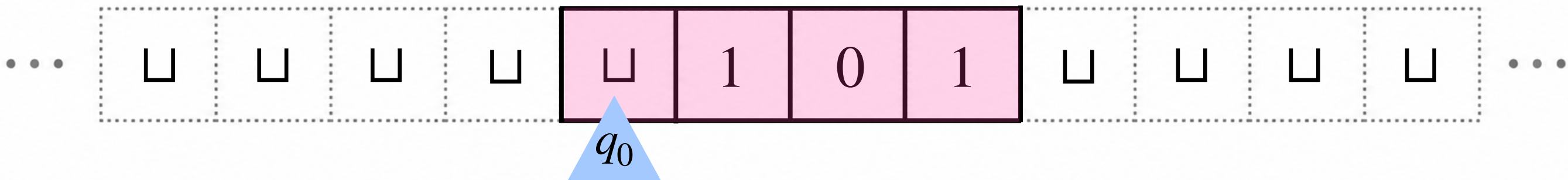
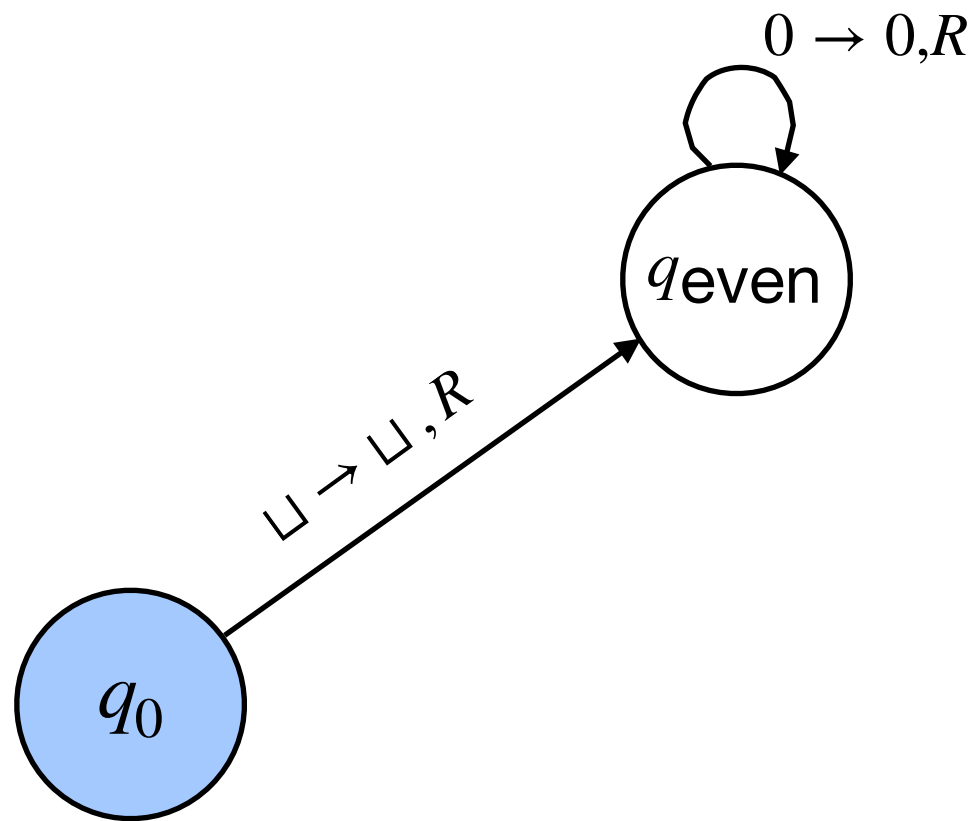
PARITY = $\{w \in \{0,1\}^* \text{ such that } w \text{ has an odd number of 1's}\}$

- Design a Turing Machine for PARITY.

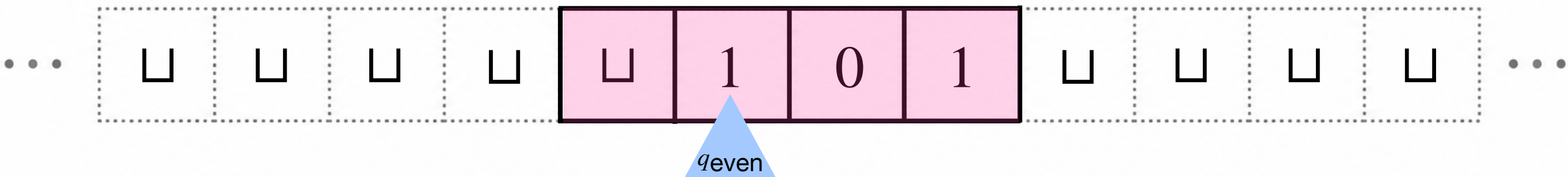
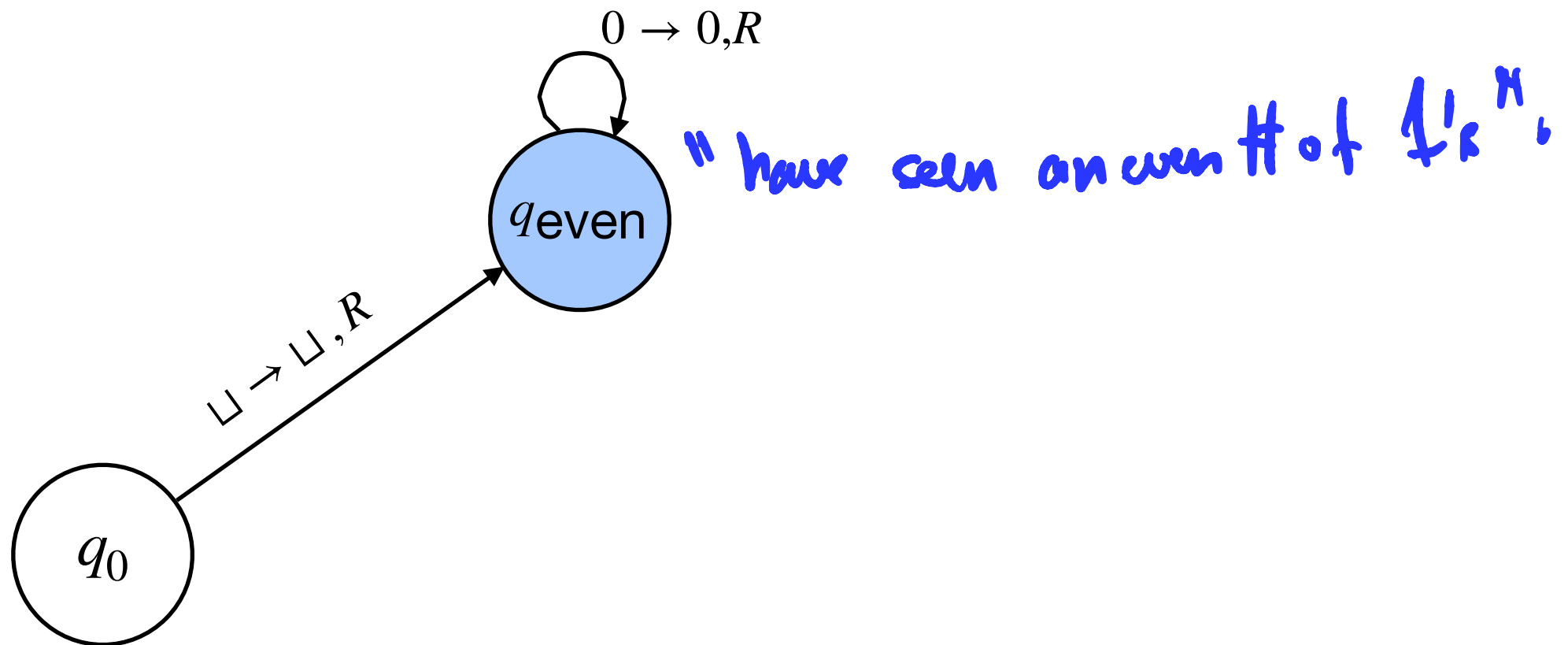
Example: Parity



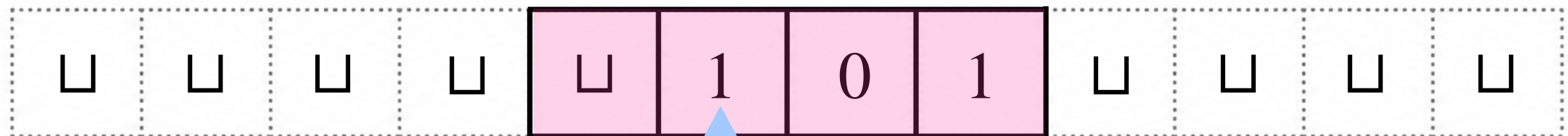
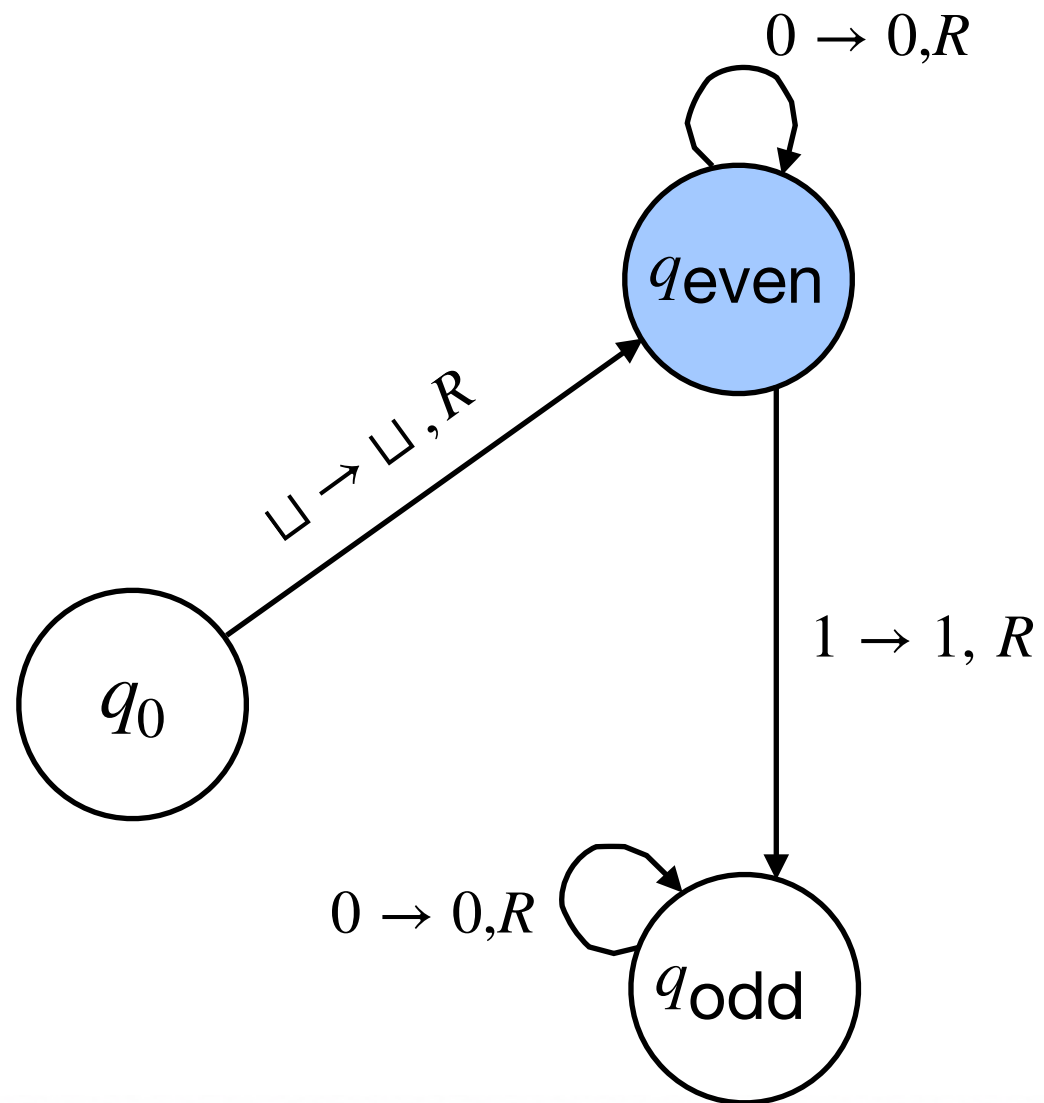
Example: Parity



Example: Parity

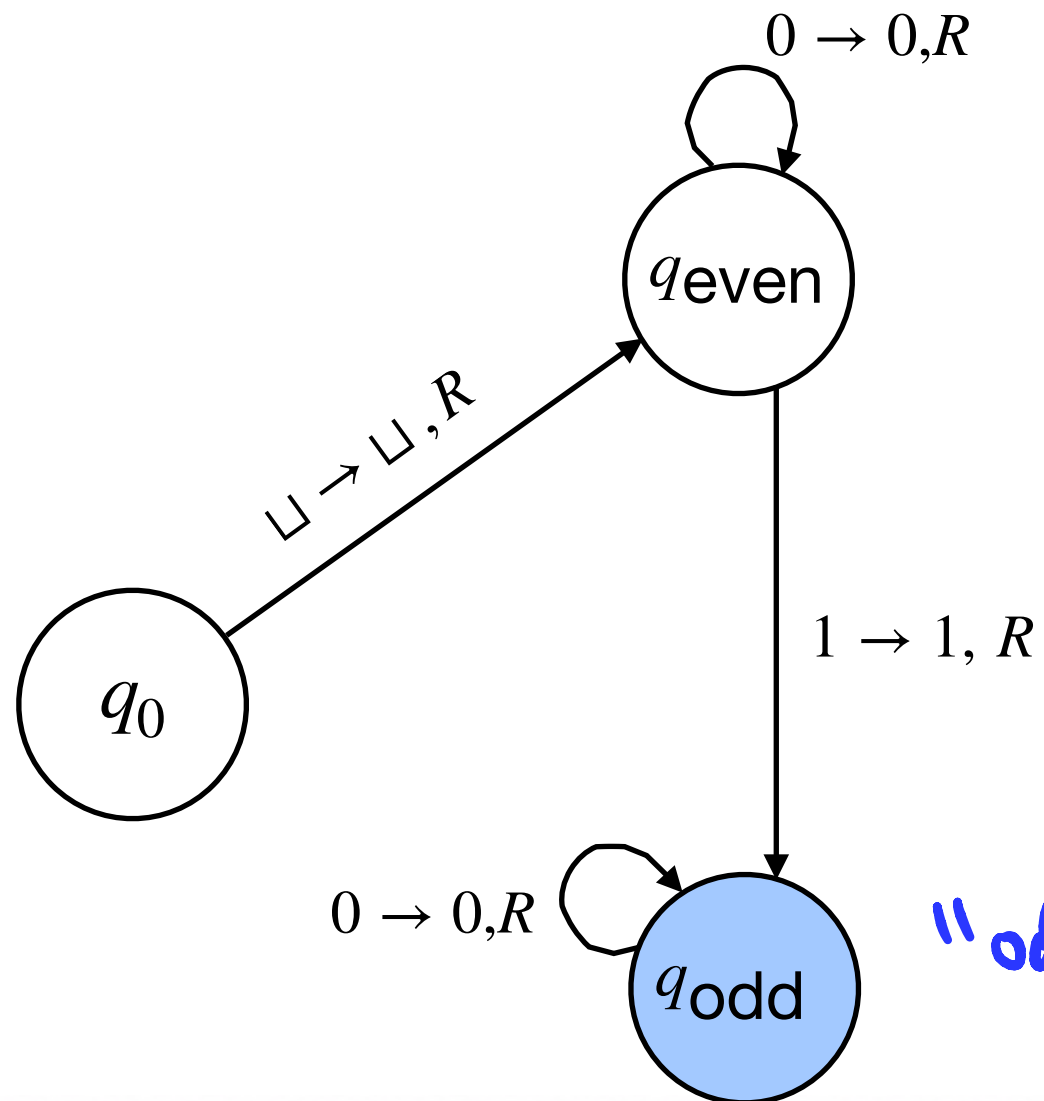


Example: Parity

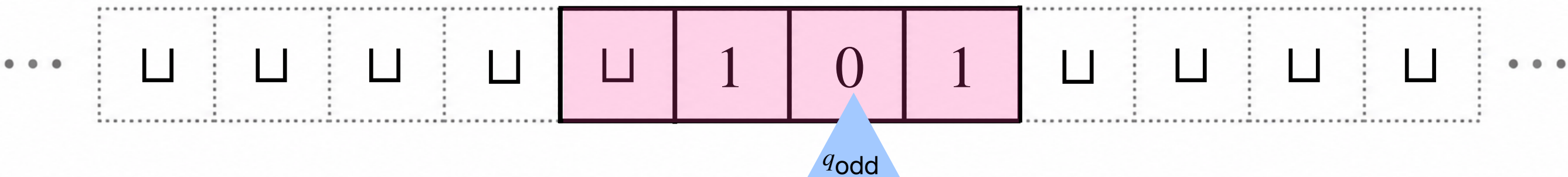


q_{even}

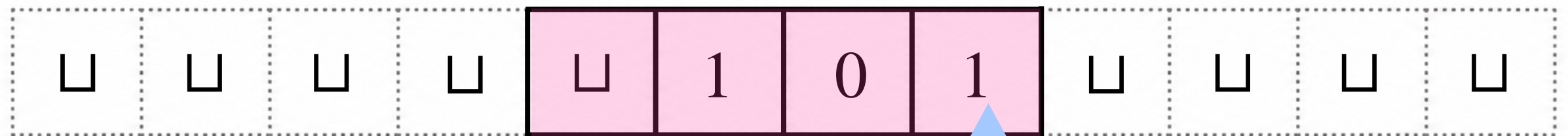
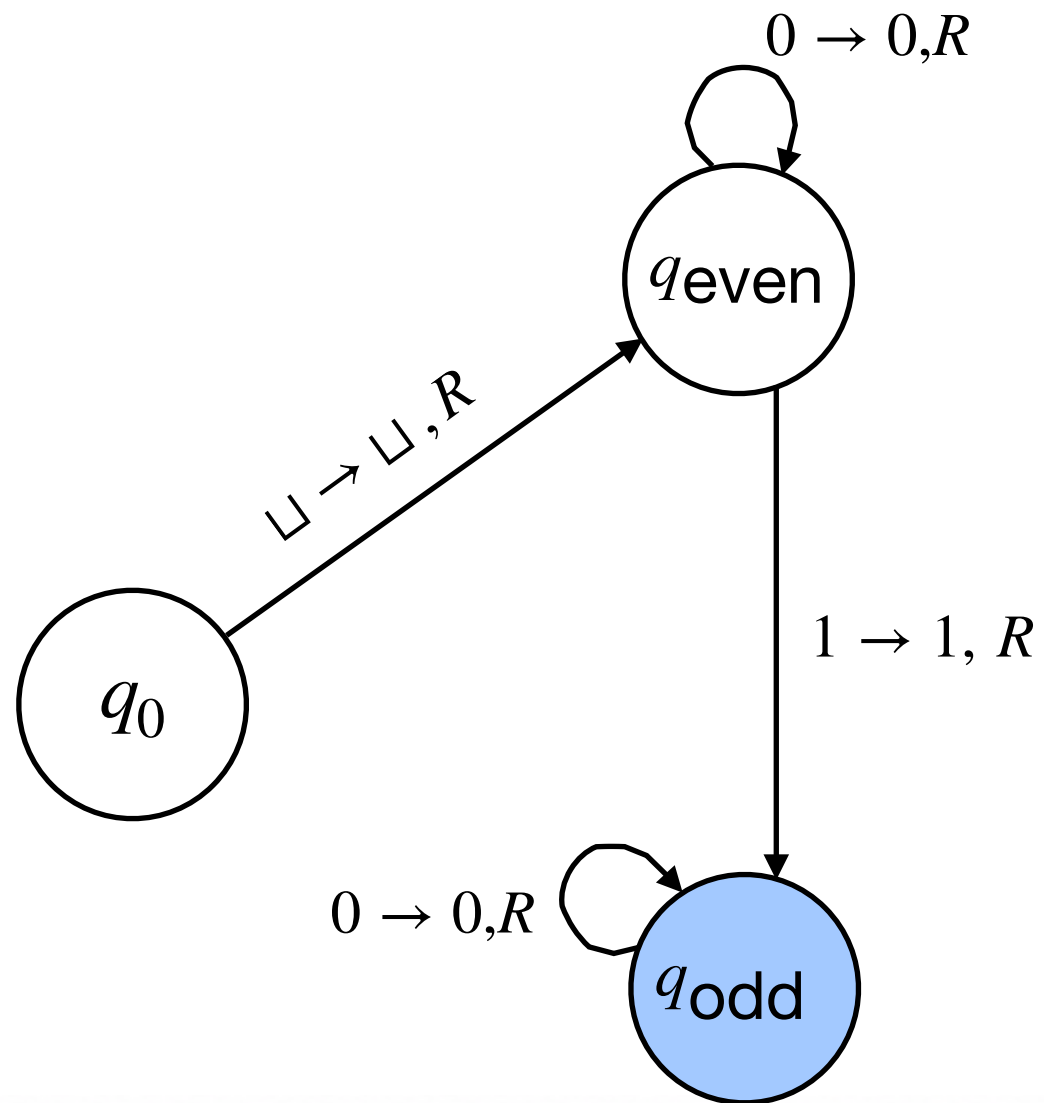
Example: Parity



"odd # of 1s so far".

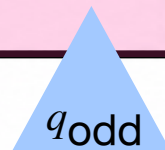
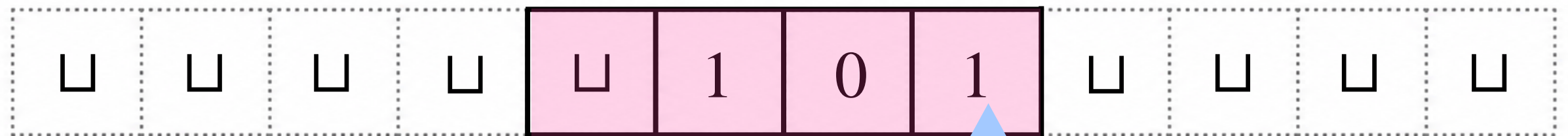
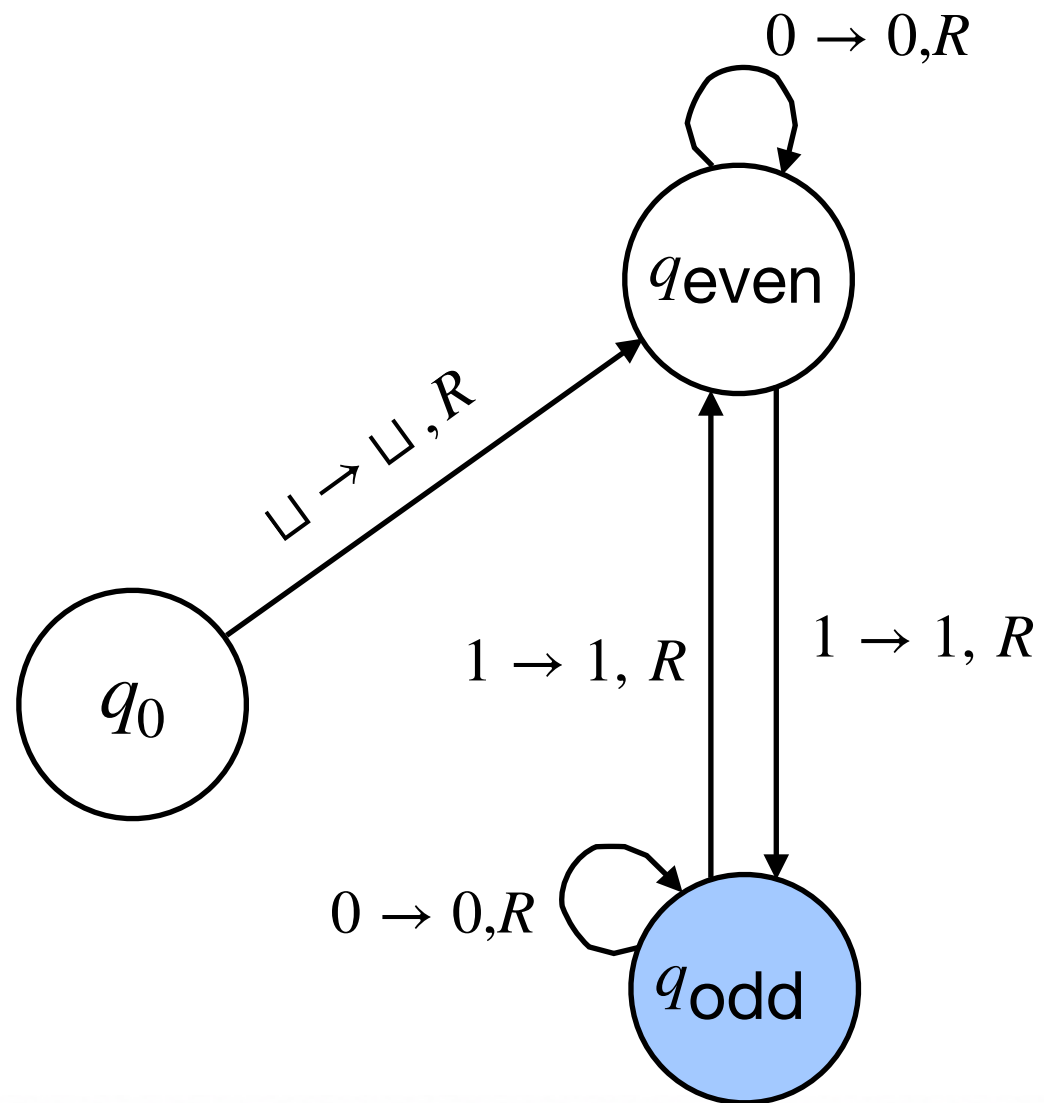


Example: Parity

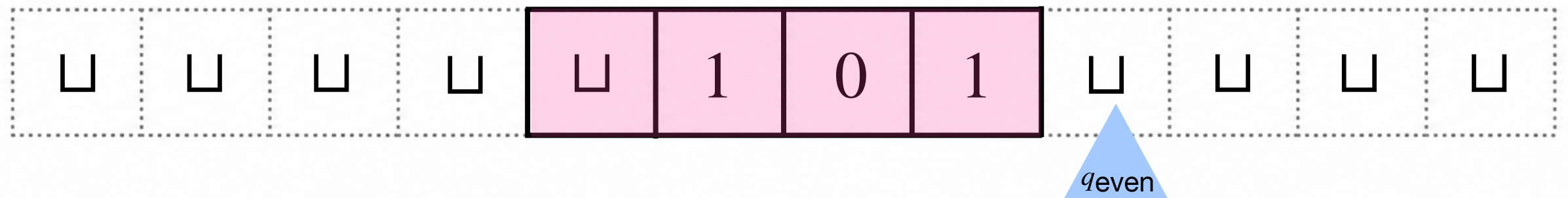
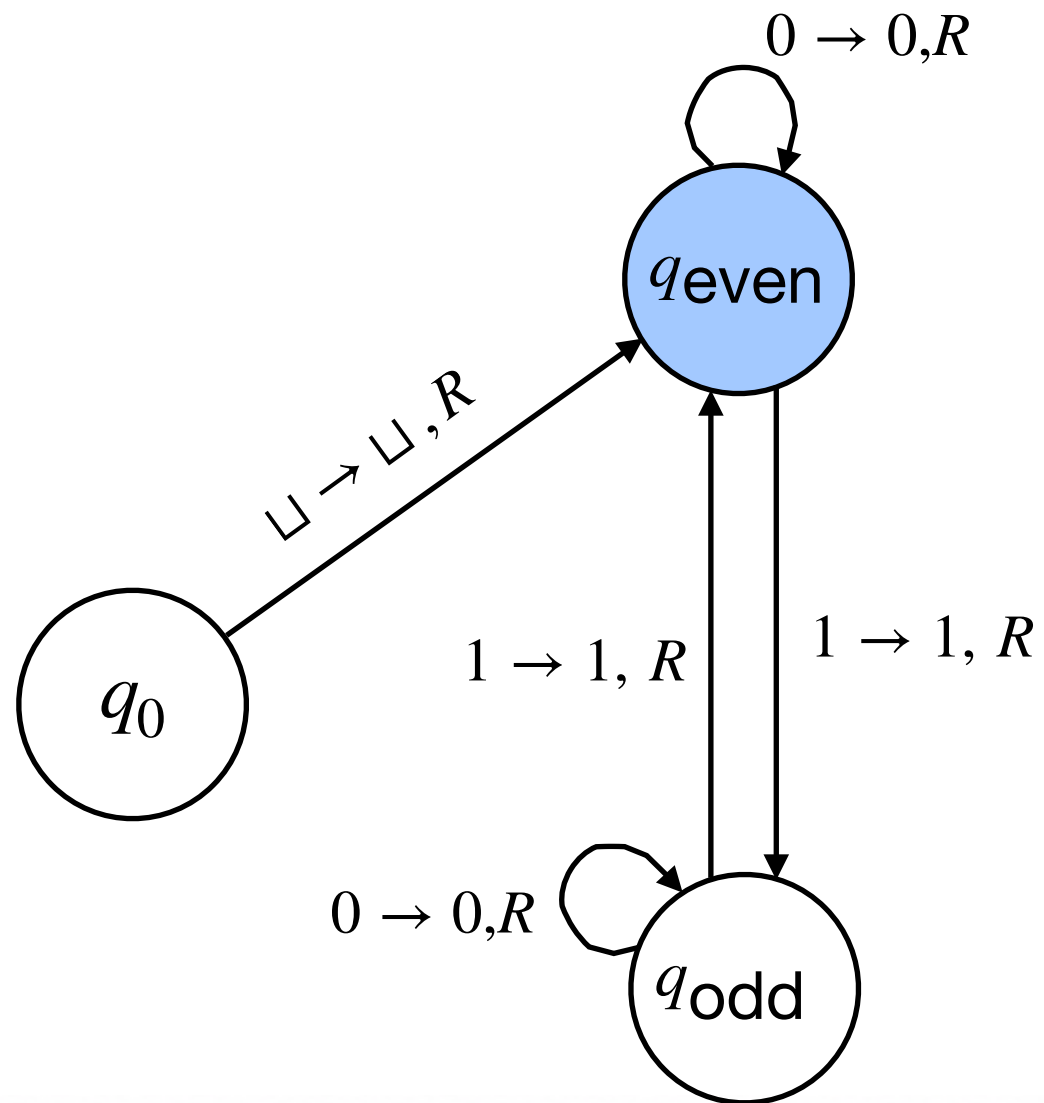


q_{odd}

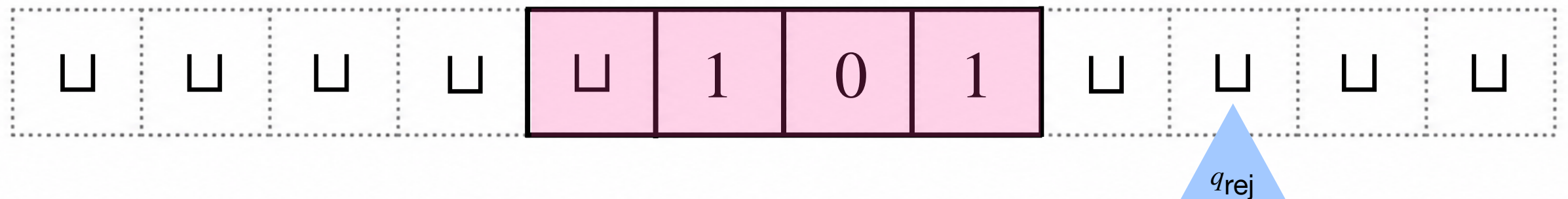
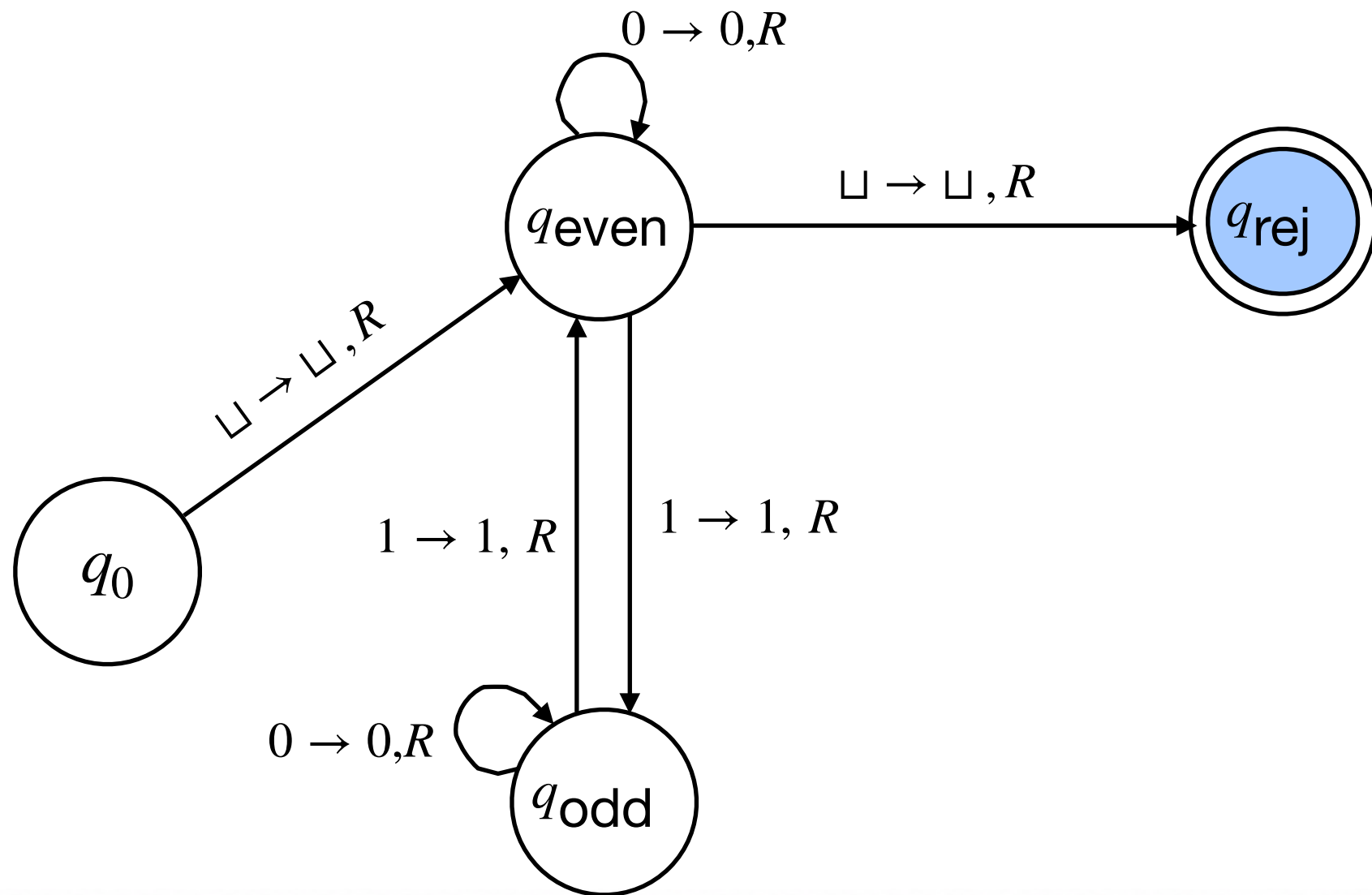
Example: Parity



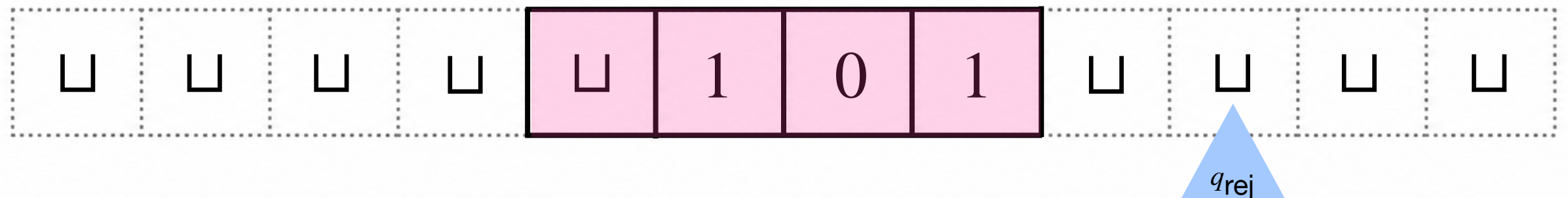
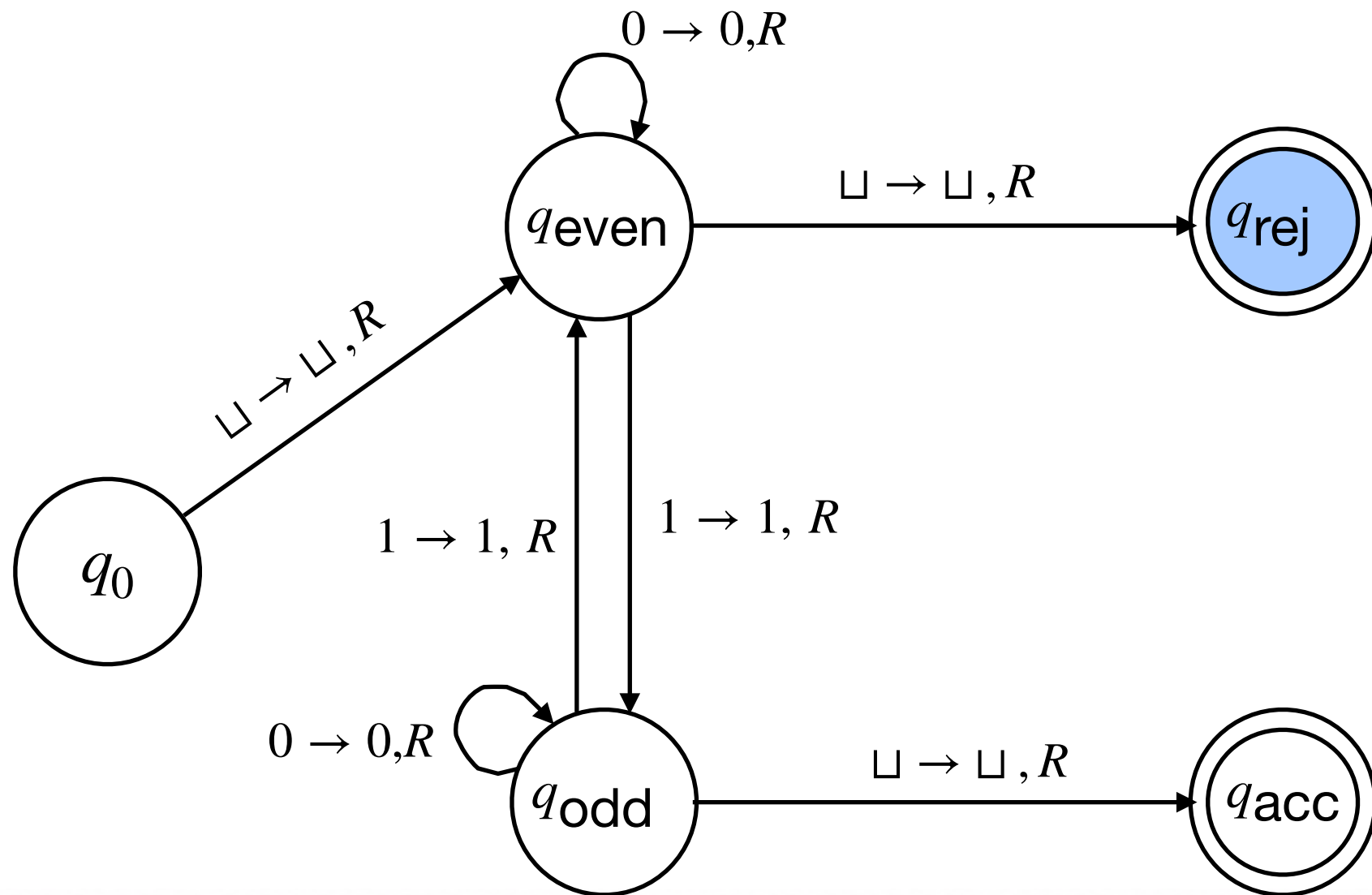
Example: Parity



Example: Parity



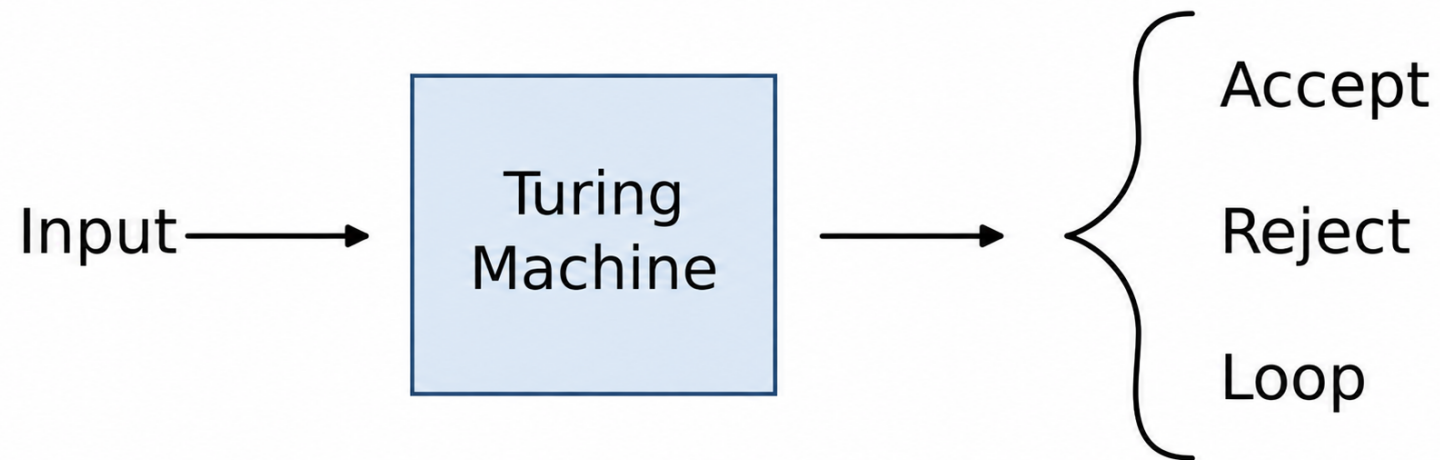
Example: Parity



Decidable Languages

- A language L is **decidable** if and only if there exists a Turing Machine M that decides it.
 - Otherwise, it is **undecidable**.
- Handwritten note in blue:* $x \text{ accepts } x \in L \text{ and rejects } x \notin L.$

Recognizing a Language



- The Turing Machine M recognizes the language $L \subseteq \{0,1\}^*$ if for every $x \in \{0,1\}^*$, M accepts x if and only if $x \in L$.
- Note that by this definition, the machine M can reject or loop forever on inputs $x \notin L$.

Turing Machine as a Recognizer

- Every Turing Machine M recognizes some language $L(M) = \{x \in \{0,1\}^* \text{ such that } M \text{ accepts } x\}$.
- Not every Turing machine decides a language.


Decidable and Recognizable Languages

- Decidable Languages $\subseteq$ Recognizable Languages
- Is this a proper subset?
- What is an example of an undecidable language?

Summary

- Turing Machines: a mathematical model of computation:
 - an unbounded **tape**,
 - a head that moves **left/right**, and **reads/writes** one cell,
 - has finitely many **states**
 - each decision is based on the state and the current symbol being read. Modeled as a **transition function** $\delta : Q \times \Sigma \rightarrow Q \times \Sigma \times \{L, R\}$.
 - On input a Turing Machine may **accept/reject/loop**.

Summary

- M **decides** a language L if it accepts every $x \in L$ and rejects every $x \notin L$.
- M **recognizes** a language L if it accepts $x \iff x \in L$.
- A language L is **decidable** if and only if there exists a Turing machine that decides it. Otherwise it is **undecidable**.
- A language L is **recognizable** if and only if there exists a Turing machine that recognizes it.

Next Week: Formal Definition of TMs, and More Decidable Languages.