

Foundations of Computer Science

Lecture 23

Languages: What is Computation?

A Formal Model of a Computing Problem

Decision Problems and Languages

Describing a Language: Regular Expressions

Complexity of a Computing Problem



"Say what's on your mind, Harris—the language of dance has always eluded me."

- ① Comparing infinite sets.
- ② Countable.
 - ▶ $\mathbb{N}_0, E, \mathbb{Z}, \mathbb{Q}$ are countable.
 - ▶ Finite binary strings \mathcal{B} is countable.
- ③ Uncountable
 - ▶ *Infinite* binary strings are uncountable.
 - ▶ Reals are uncountable.
- ④ Infinity and computing.
 - ▶ Programs are finite binary strings (countable).
 - ▶ Functions we might like to compute are infinite binary strings (uncountable).
 - ▶ Conclusion: there are **MANY** functions which *cannot* be computed by programs.

Today: Languages: What is Computation?

- 1 Decision problems.
- 2 Languages.
 - Describing a language.
- 3 Complexity of a computing problem.

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Given $n \in \mathbb{N}$, walk through this list.

- 1: If you come to n output YES.
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LANGUAGES

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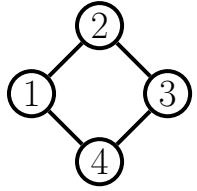
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Decision problems can be formulated as testing membership in a set of strings

A Decision Problem on Graphs

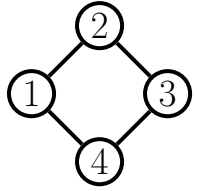
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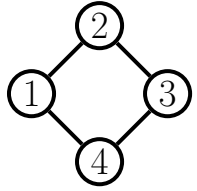


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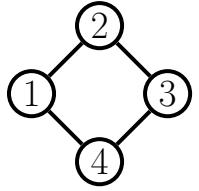
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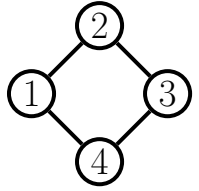
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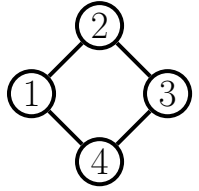
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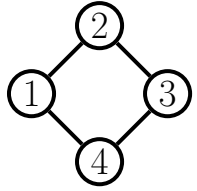
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 ↑
nodes

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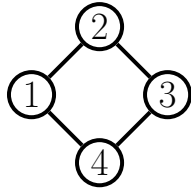
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nodes edges

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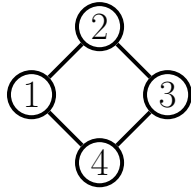
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nodes edges endpoints of path

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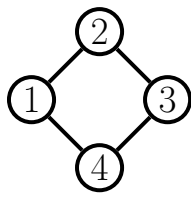
nodes edges endpoints of path target distance

The graph problem can be encoded as a binary string using ASCII

0011000100101100001100100010110000110011001011000011010001111100001010000011000100101100001100100010100100101000001100100010110000110011
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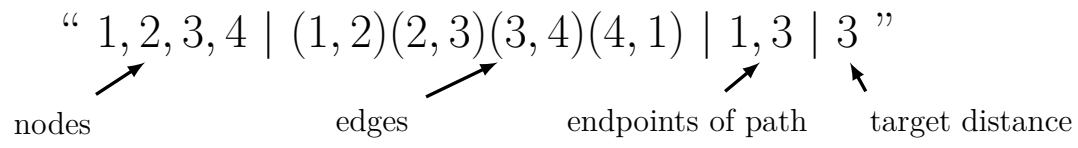


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$$\mathcal{L}_{\text{path}} = \left\{ \text{All strings of the form “nodes | edges | endpoints of path | target distance” for which} \right. \\ \left. \text{the distance between the endpoints in the graph is at most the target distance.} \right\}$$

Pop Quiz. **YES** or **NO**: “ 1, 2, 3, 4, 5 | (1, 2)(2, 3)(3, 5)(3, 4) | 1, 5 | 2 ”

Is Optimization Really Harder than Decision?

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If you can solve the decision problem, you can solve the optimization problem.

Is there a path in the graph between nodes $\odot x$ and $\odot y$ of length at most **1**? NO

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Is there a path in the graph between nodes \otimes and \odot of length at most **3**? ☐ NO

Is there a path in the graph between nodes \otimes and \odot of length at most **4**? ☒ YES

You ask the decision question until the answer is ☒ YES.

The minimum-pathlength between \otimes and \odot is 4.

It can take long, but it works.

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Decision and optimization are “equivalent” when it comes to *solvability*.

A computing problem is a decision problem.

Standard formulation of a decision problem:

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Every decision problem has a YES-set, which we usually don't explicitly list.

$$\begin{aligned}\text{YES-set} &= \{\text{input strings } w \text{ for which the answer is YES}\} \\ &= \{w_1, w_2, w_3, \dots\}.\end{aligned}$$

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A computing problem is a **YES**-set, a set of *finite* binary strings.

Computing Problems Are Languages

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Solving the problem

Give a “procedure” to tell if a general input w is in the language (YES-set).

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\mathcal{L}_{pal}	$\{\varepsilon, 0, 1, 00, 11, 000, 010, 101, 111, \dots\}$	\leftarrow palindromes

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$\mathcal{L}_{(01)^n}$	$\{\varepsilon, 01, 0101, 010101, \dots\} = \{(01)^{\bullet n} \mid n \geq 0\}$	
$\mathcal{L}_{0^n 1^n}$	$\{01, 0011, 000111, \dots\} = \{0^{\bullet n} 1^{\bullet n} \mid n \geq 0\}$	
\mathcal{L}_{pal}	$\{\varepsilon, 0, 1, 00, 11, 000, 010, 101, 111, \dots\}$	\leftarrow palindromes
$\mathcal{L}_{\text{repeated}}$	$\{\varepsilon, 00, 11, 0000, 0101, 1010, 1111, \dots\}$	\leftarrow repeated strings

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For more complicated patterns, we use regular expressions, e.g. the Unix/Linux command

ls FOCS* (Lists everything that starts with FOCS (* is the “wild-card”).)

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Pop Quiz. Which of the strings $\{101110, 00111, 00100, 01100\}$ can you generate using $\{0, 01\}^* \bullet \{1, 10\}^*$?

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Hence $1110111 \in \{1, 11\} \bullet \overline{\{0, 01\}^*} \bullet (\{00\} \cup \{1\}^*)$

Pop Quiz Is there another way to generate 1110111?

Pop Quiz Yes or no: $11110010 \in \{1, 11\} \bullet \overline{\{0, 01\}^*} \bullet (\{00\} \cup \{1\}^*)$?

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- 2 Regular expression for all palindromes (strings which equal their reversal)?

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How to define complexity of a computing problem?

Complexity of a Computing Problem

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- 2: In state q_0 , when you process a 1, transition to state q_1 .
- 3: In state q_1 , when you process a 0, transition to state q_0 .
- 4: In state q_1 , when you process a 1, transition to state q_1 .

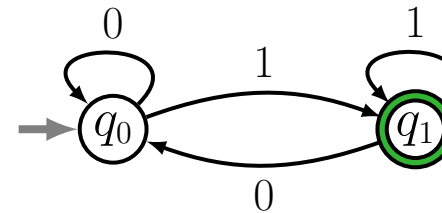
Complexity of a Computing Problem

$\mathcal{L}_{\text{push}} = \{1, 01, 11, 001, 011, 101, 111, 0001, 0011, 0101, 0111, 1001, 1011, \dots\}$ (strings ending in 1)

difficult problem \leftrightarrow “complex” YES-set \leftrightarrow hard to test membership in YES-set

How do we test membership? That brings us to *Models Of Computing*.

\models 1 1 0 1



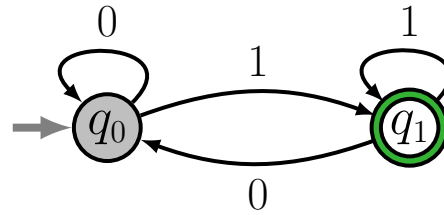
Visual encoding of four (machine-level) instructions:

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“Easy” to implement as a mechanical device.

A Simple Computing Machine (DFA)

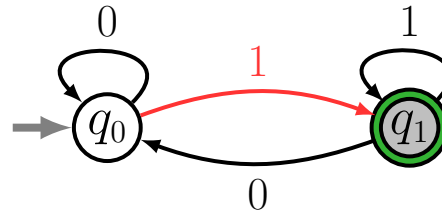
1 1 0 1
⌞



(current state in gray)

A Simple Computing Machine (DFA)

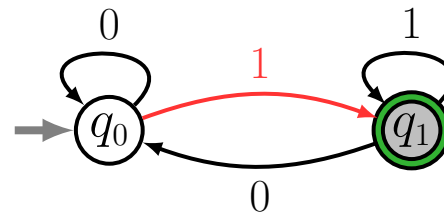
1 1 0 1
⌞



(current state in gray)

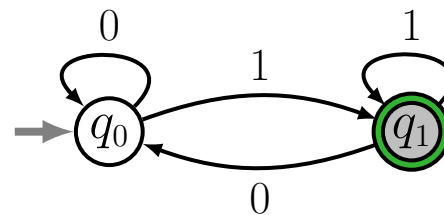
A Simple Computing Machine (DFA)

1 1 0 1
⌞



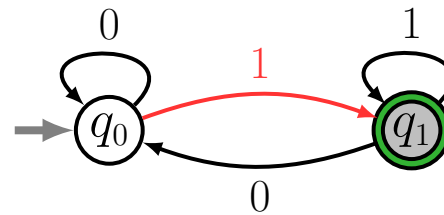
(current state in gray)

1 1 0 1
⌞



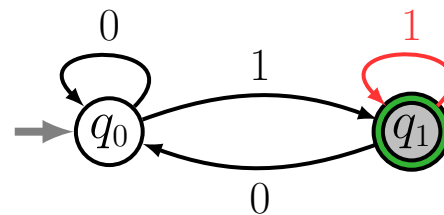
A Simple Computing Machine (DFA)

1 1 0 1
⌞



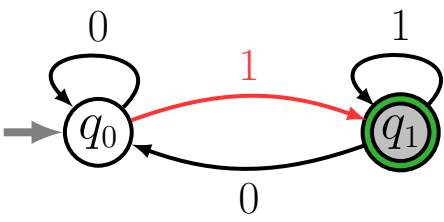
(current state in gray)

1 1 0 1
⌞



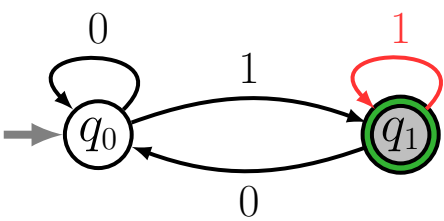
A Simple Computing Machine (DFA)

1 1 0 1
⌞

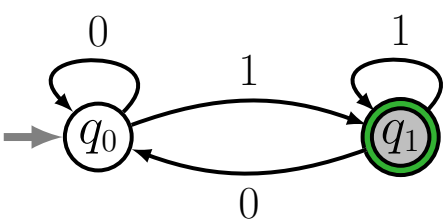


(current state in gray)

1 1 0 1
⌞

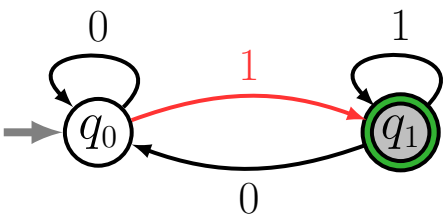


1 1 0 1
⌞



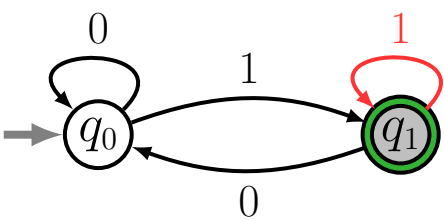
A Simple Computing Machine (DFA)

1 1 0 1
⌞

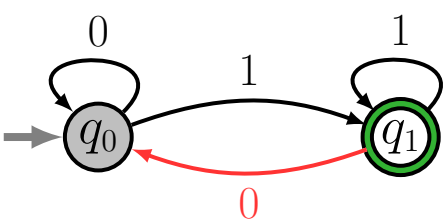


(current state in gray)

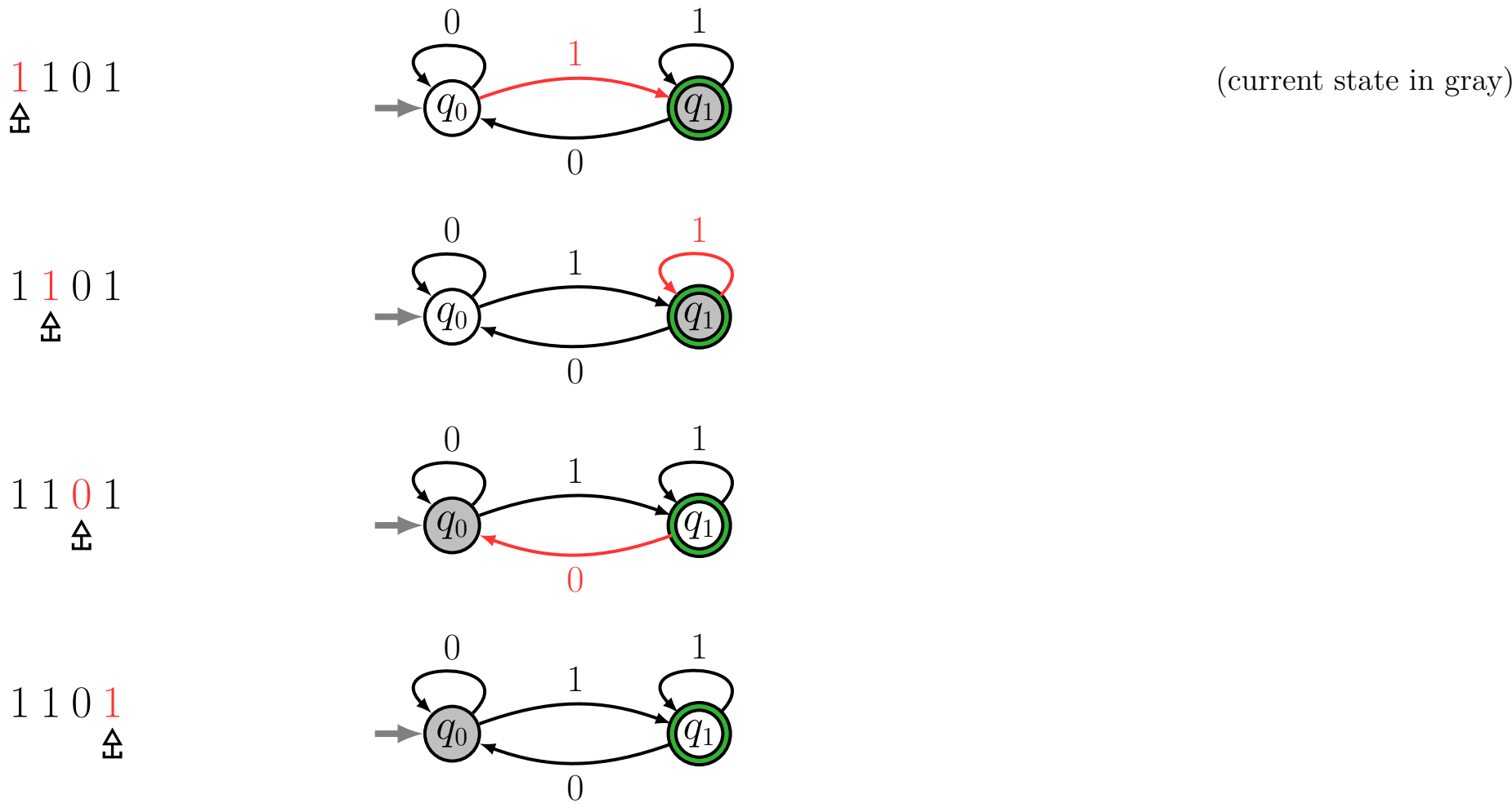
1 1 0 1
⌞



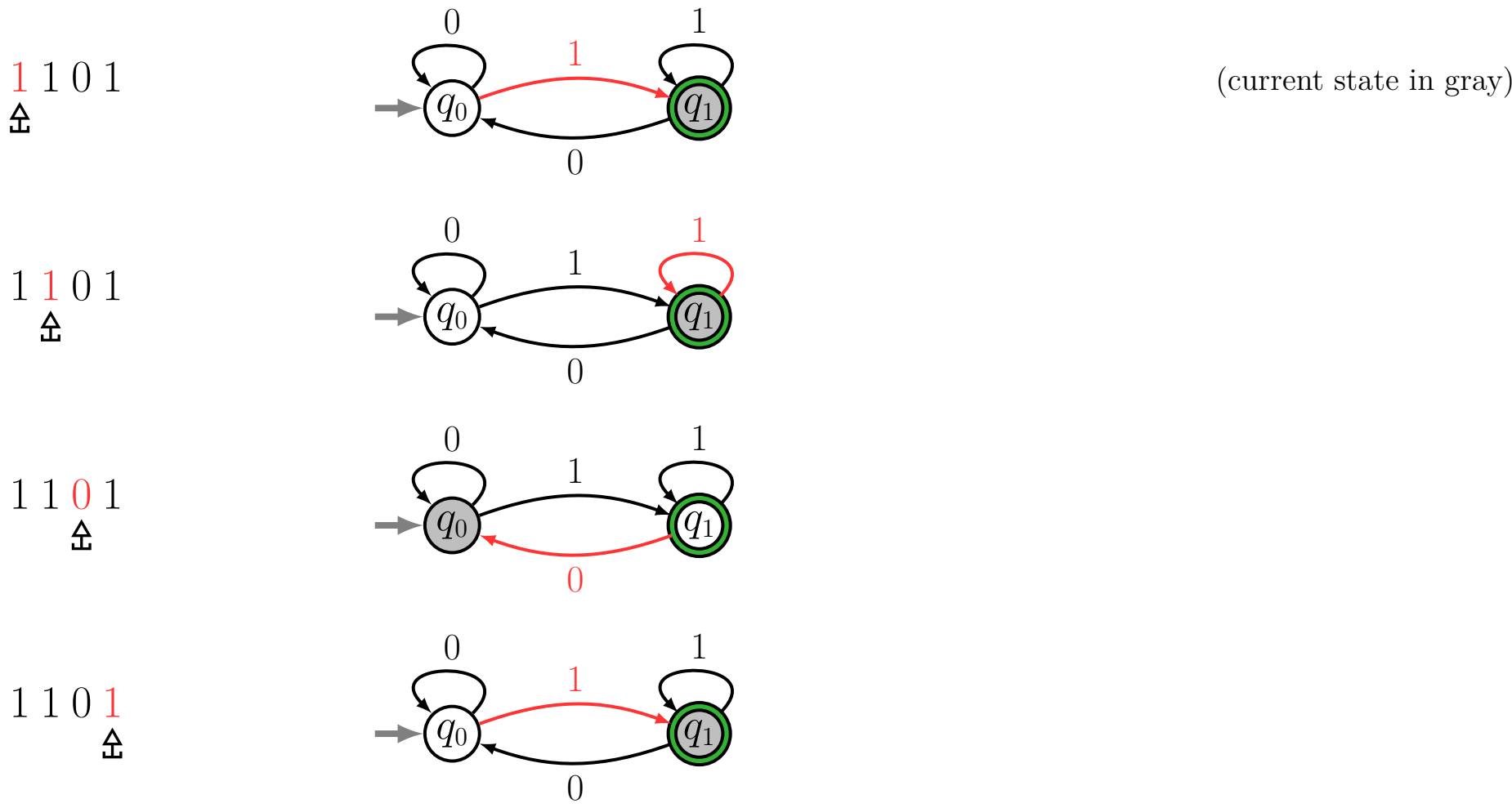
1 1 0 1
⌞



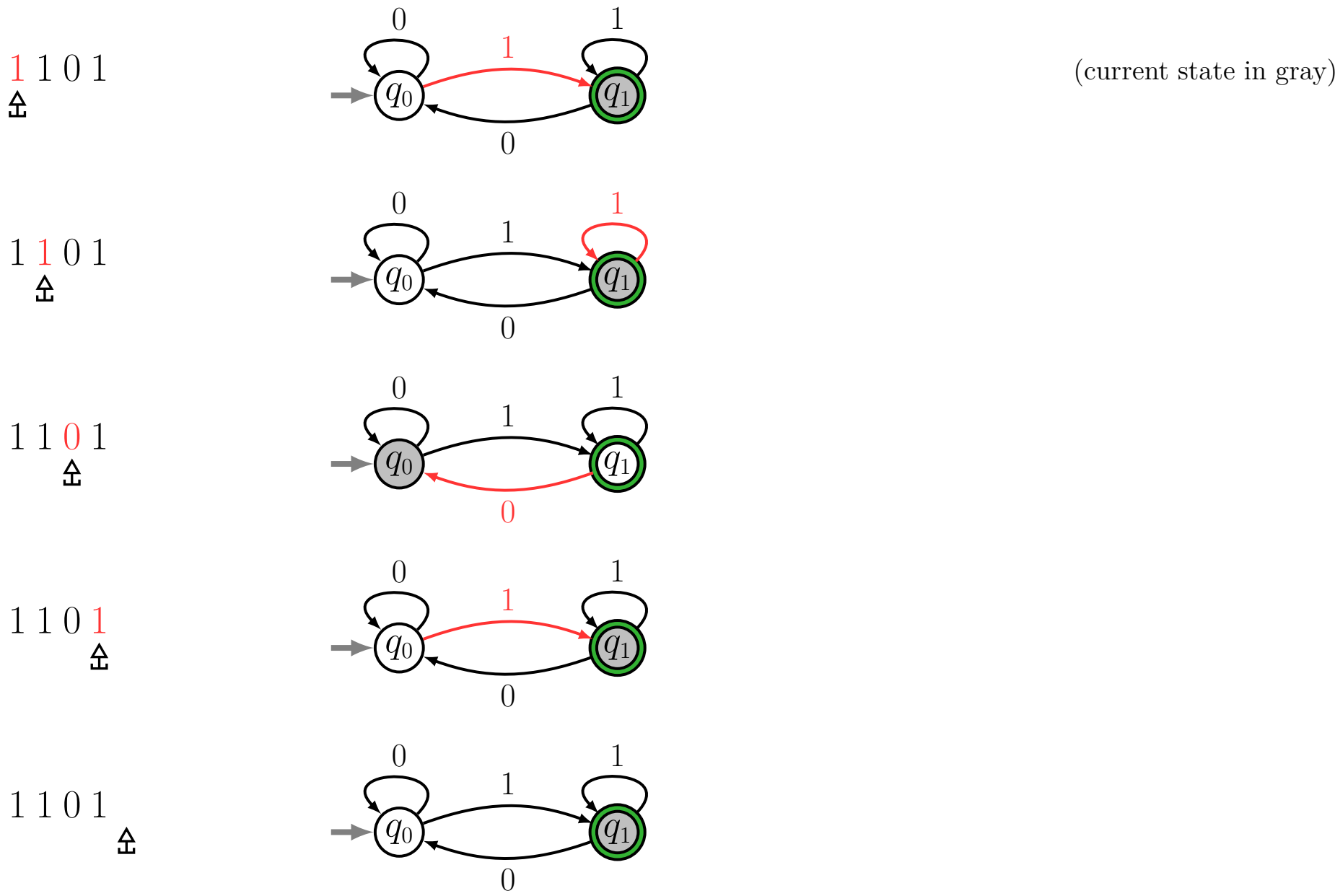
A Simple Computing Machine (DFA)



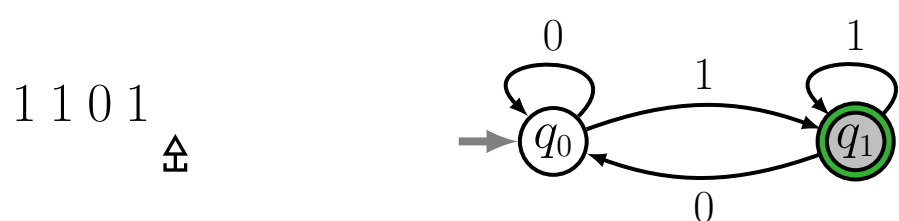
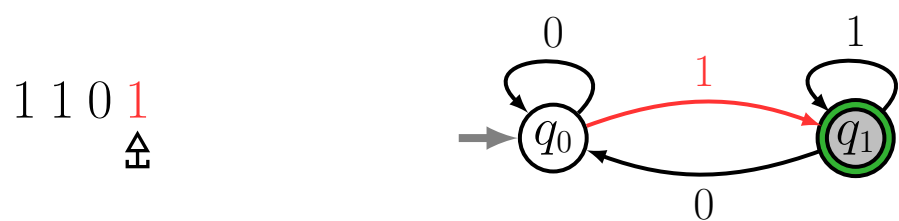
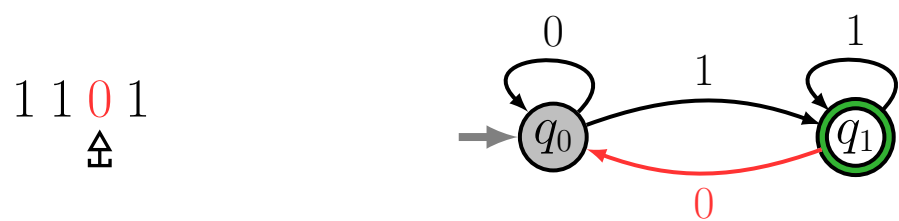
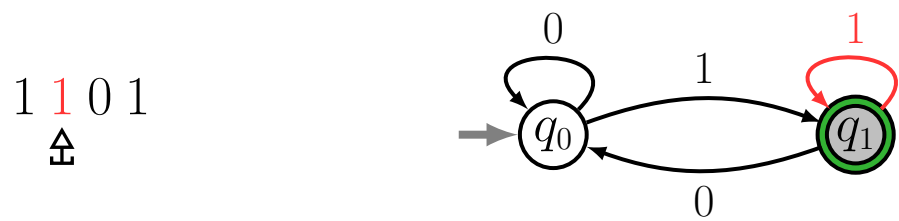
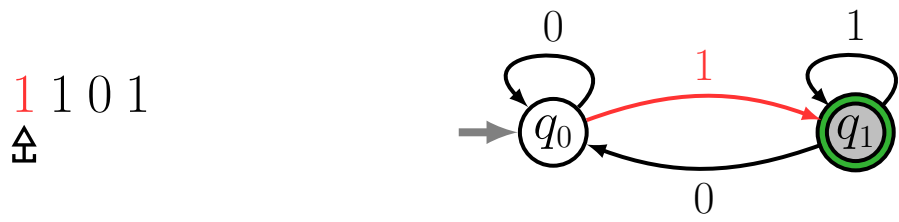
A Simple Computing Machine (DFA)



A Simple Computing Machine (DFA)



A Simple Computing Machine (DFA)



$$\mathcal{L}_{\text{push}} = \{1, 01, 11, 001, 011, 101, 111, 0001, \dots\}$$

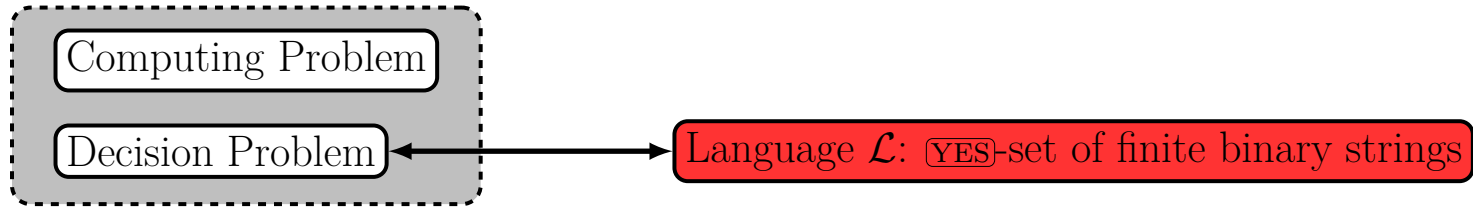
Strings in $\mathcal{L}_{\text{push}}$ end in the “accepting” state q_1 .
Strings not in $\mathcal{L}_{\text{push}}$ do not.

Computing Problems and Their Difficulty

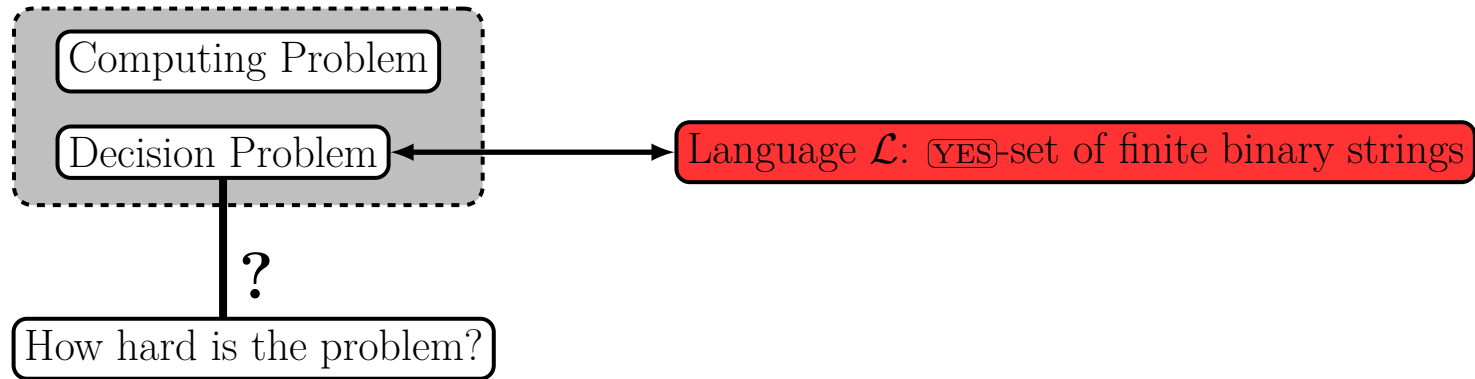
Computing Problem

Decision Problem

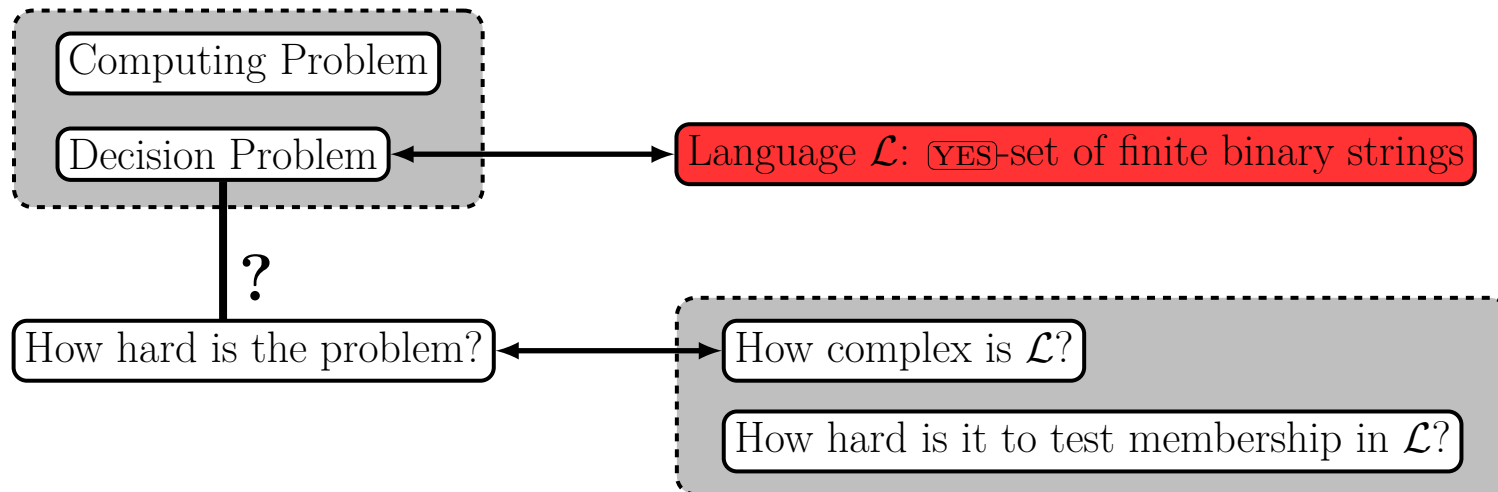
Computing Problems and Their Difficulty



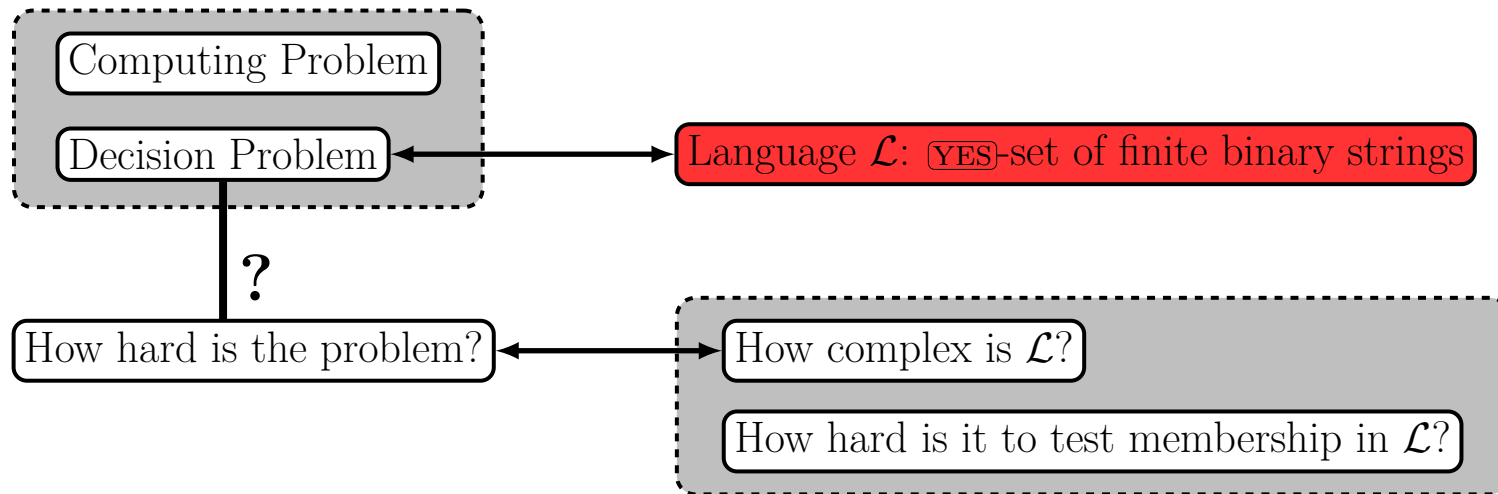
Computing Problems and Their Difficulty



Computing Problems and Their Difficulty



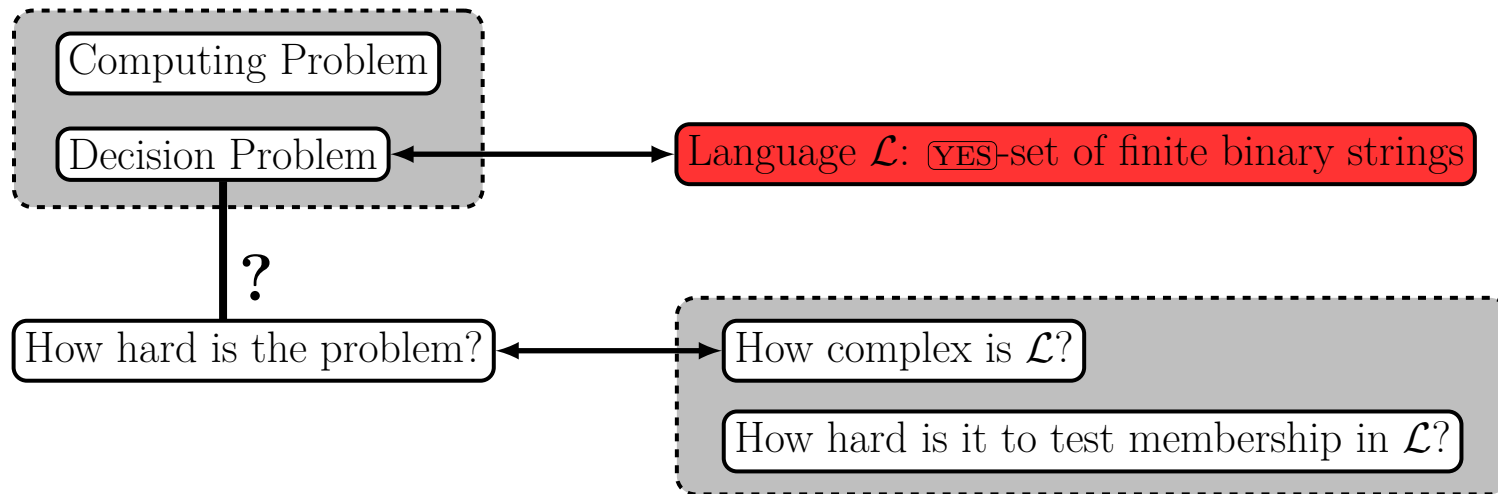
Computing Problems and Their Difficulty



A problem can be harder in two ways.

- 1 The problem needs more resources. For example, the problem can be solved with a similar machine to ours, except with more states.

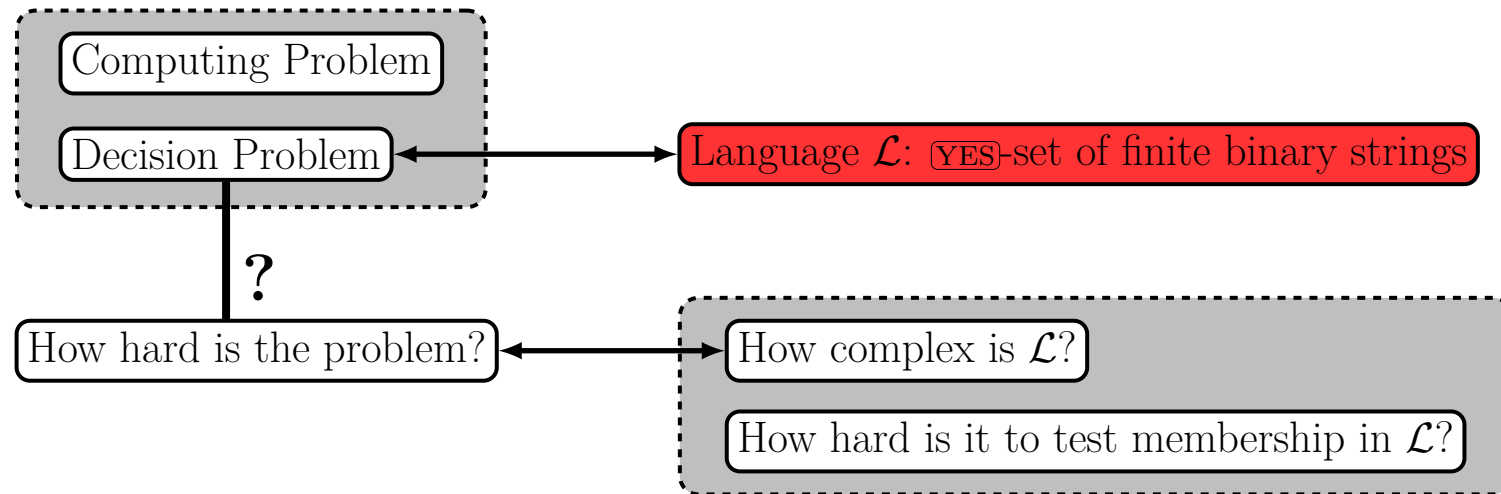
Computing Problems and Their Difficulty



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- 2 The problem needs a different *kind* of computing machine, with superior capabilities.

Computing Problems and Their Difficulty



A problem can be harder in two ways.

- 1 The problem needs more resources. For example, the problem can be solved with a similar machine to ours, except with more states.
- 2 The problem needs a different *kind* of computing machine, with superior capabilities.

The first type of “harder” is the focus of a follow-on algorithms course.

We focus on what *can and can't be solved* on a particular kind of machine.