



# Constructing Formal Models through Automata Learning

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# Outline

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  - ▶ History
  - ▶ Motivation
- ▶ Idea
- ▶ Method
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# Introduction

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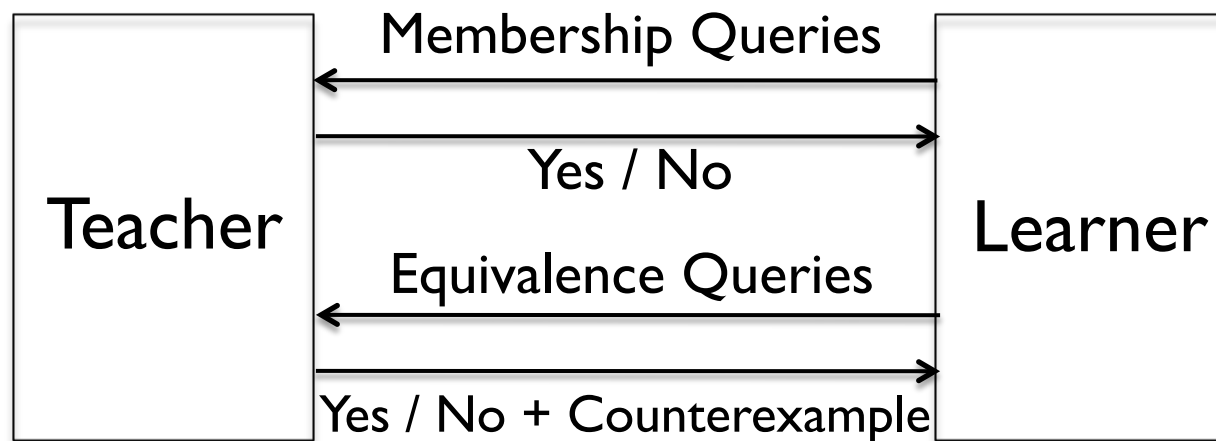




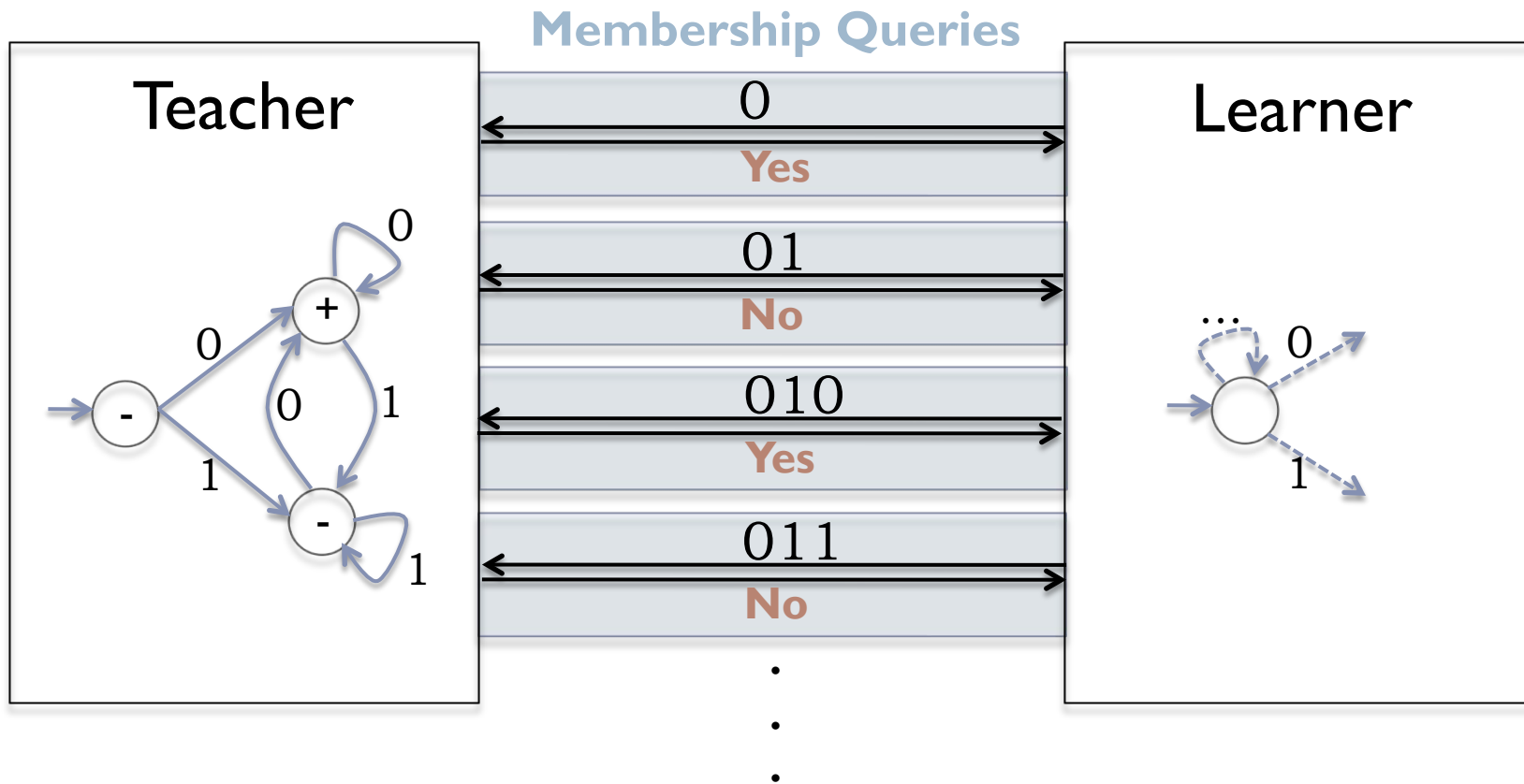
# History

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- ▶ 1987: Angluin's  $L^*$  Algorithm for Learning DFA
  - ▶ Teacher knows a DFA
  - ▶ Learner knows the alphabet

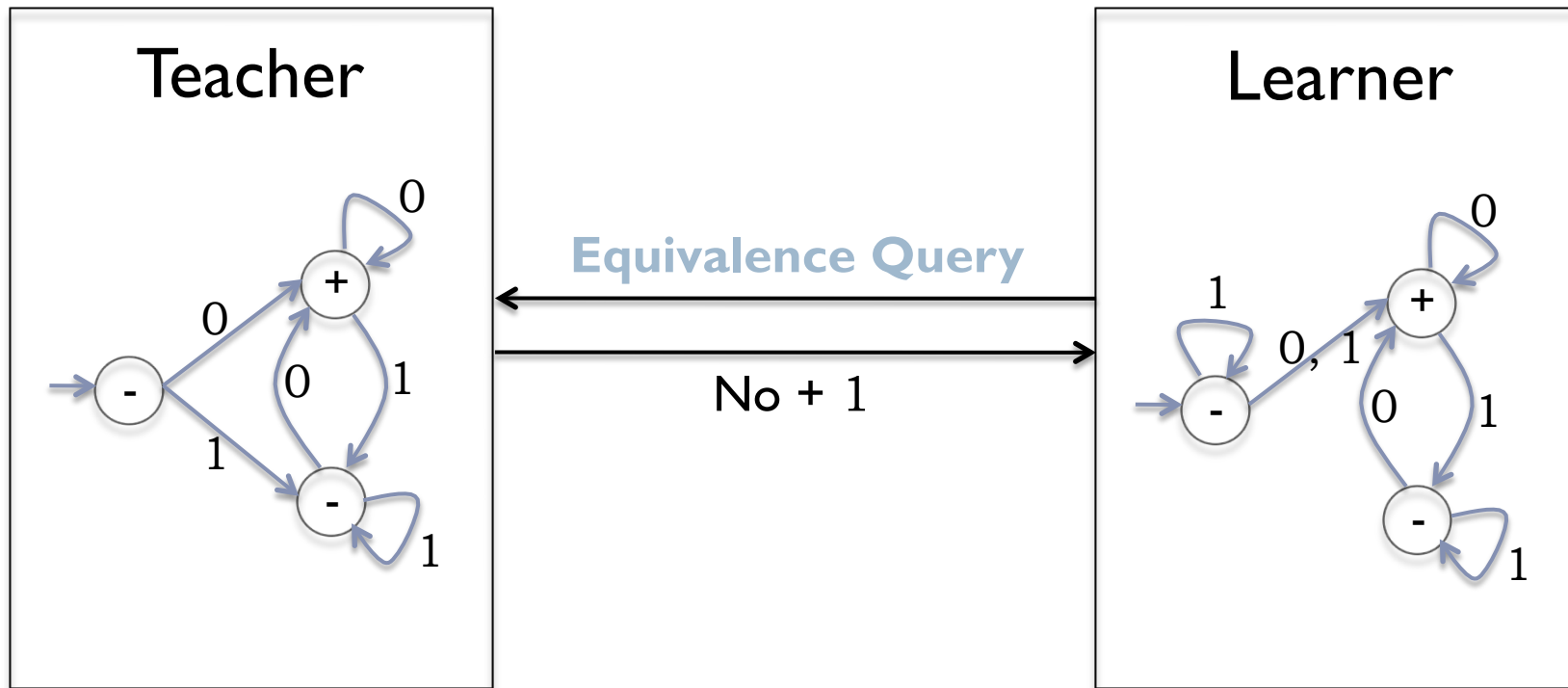


# Example



# Example

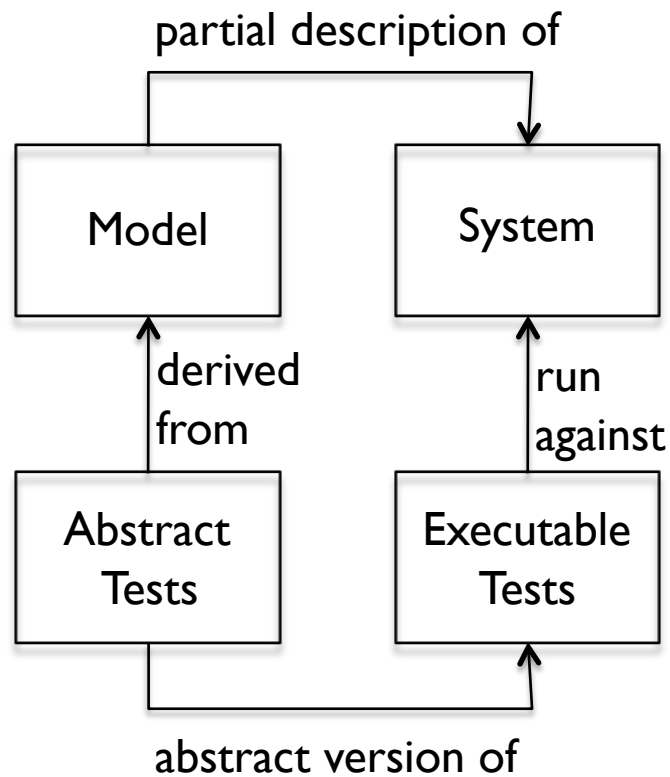
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# Motivation

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## Model-based Testing



## Test-based Modeling

- ▶ build models that allow effective testing
- ▶ design for testability



# Motivation

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## Regression Testing

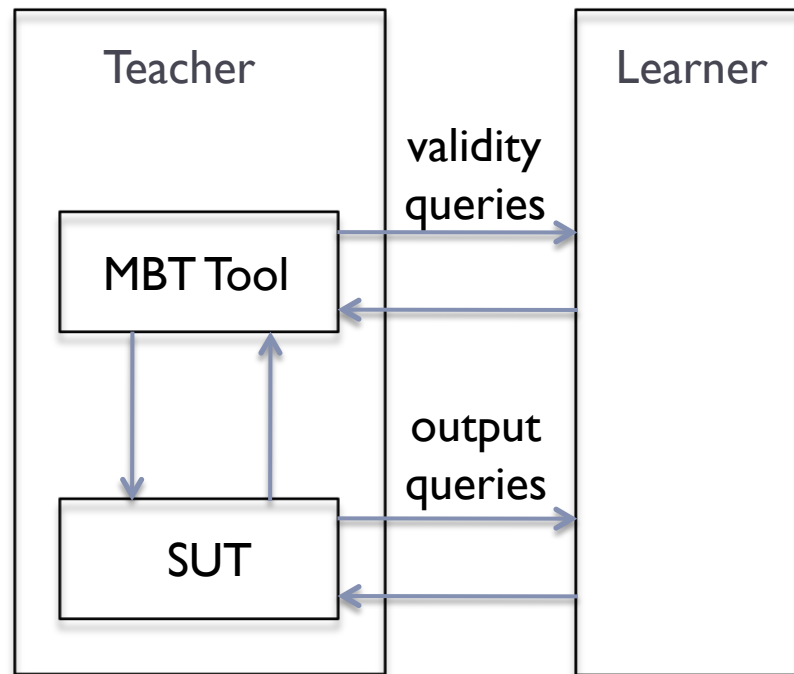
- ▶ Fix the bugs and make sure the problems are solved!



# Motivation

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## Active Learning of Reactive Systems



## LearnLib Tool

- ▶ Learns deterministic Mealy Machines
- ▶ learns state machines with up to 30000 states

# Challenge

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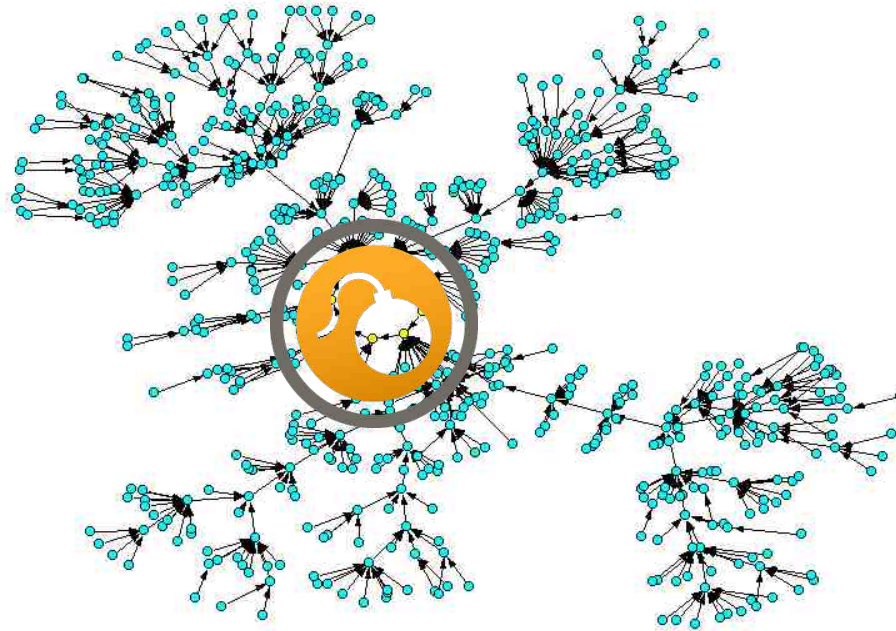
- ▶ Learning parametric systems

- ▶  $\text{Act}(p_1, \dots, p_n), p_i \in \mathbb{N}$

- ▶  $\text{Act}(p_1, p_2)$

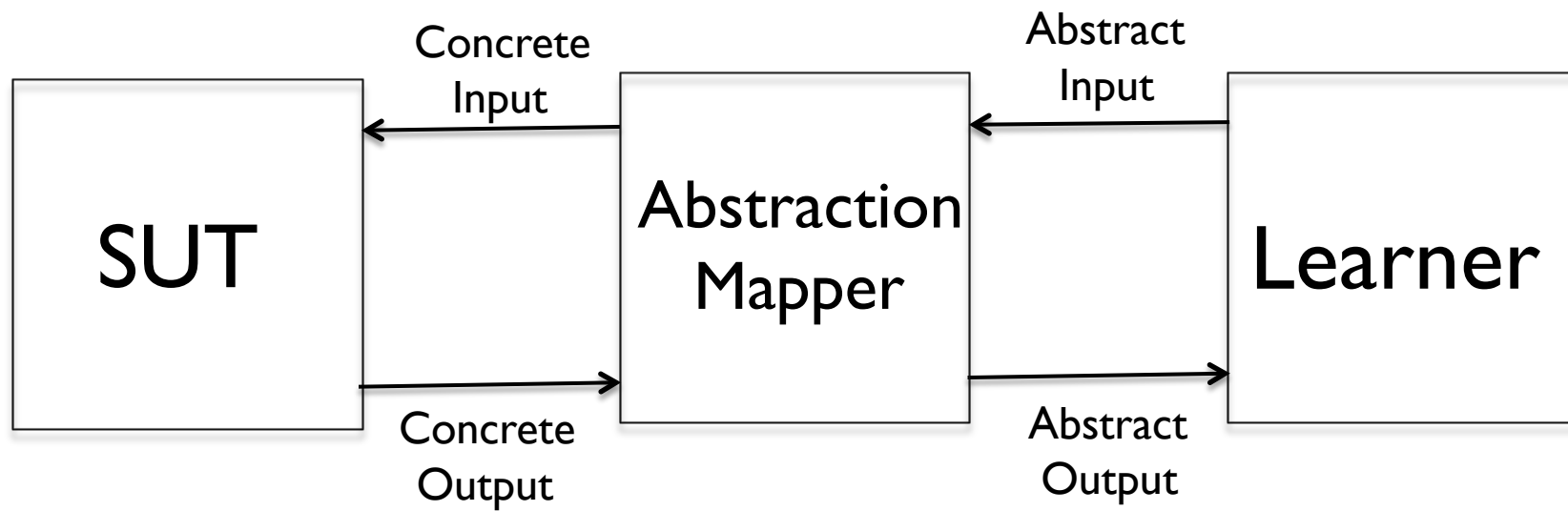
- $\text{Act}(1,1), \text{Act}(1,2), \text{Act}(2,1), \text{Act}(1,3), \text{Act}(2,2), \text{Act}(3,1), \text{Act}(1,4), \dots$

- ▶ State space explosion



# Idea

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## Related Work

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- ▶ Falk Howar, Bernhard Steffen and Maik Merten, *Automata Learning with Automated Alphabet Abstraction Refinement*, 2011
- ▶ Therese Berg, Bengt Jonsson and Harald Raffelt, *Regular Inference for State Machines Using Domains with Equality Tests*, 2008
- ▶ Therese Berg, Bengt Jonsson and Harald Raffelt, *Regular Inference for State Machines with Parameters*, 2006

# Restrictions on SUT's

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## Actions

- ▶ **Input Actions**
  - ▶  $IN(p_1, \dots, p_n)$
  - ▶  $v_i := p_j$
- ▶ **Output Actions**
  - ▶  $OUT(q_1, \dots, q_m)$

## Guards

- ▶ **Conjunctions of equalities and inequalities**

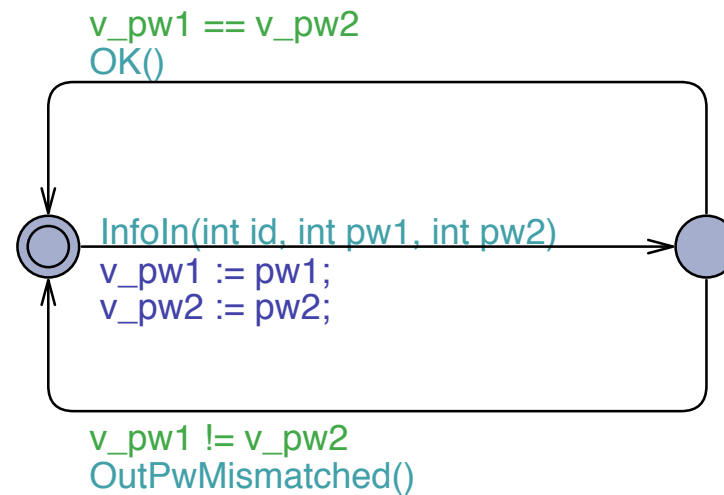
- ▶ **Example:**

$$(p_i = p_j \wedge v_k \neq p_\ell \wedge v_u = c_u)$$

## Scalarset Symbolic Interface Automata

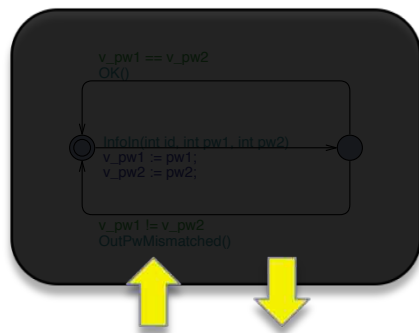
# Registration System

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# Registration System

## SUT Model



- ▶ **Input Actions**
  - ▶ InfoIn(id, pw1, pw2)
- ▶ **OutputActions**
  - ▶ OK()
  - ▶ OutPwMismatched()

## Mapper

- ▶ **State Variables**
  - ▶ id\_f, id\_l
  - ▶ pw1\_f, pw2\_l
  - ▶ pw2\_f, pw2\_l

- ▶ **Abstraction Table**

	0	1	2	...
id				
pw1				
pw2				




# Registration System

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## Traces

<b>InfoIn</b>	<b>id</b>	<b>pw1</b>	<b>pw2</b>	<b>OK</b>
	1	2	2	



<b>InfoIn</b>	<b>id</b>	<b>pw1</b>	<b>pw2</b>	<b>OutPwMis matched</b>
	1	2	3	

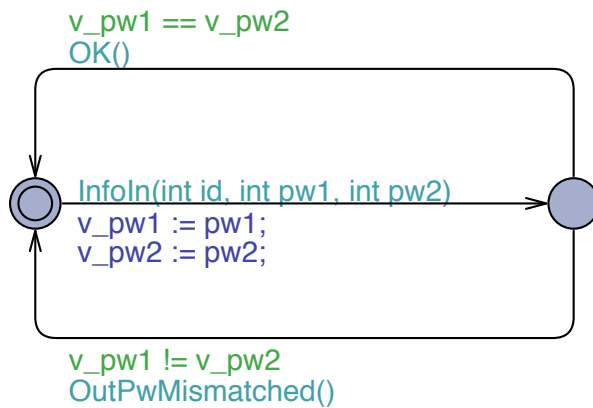
## Abstraction Table

	<b>0</b>	<b>1</b>	<b>2</b>
id			
pw1			
pw2	pw1_f		

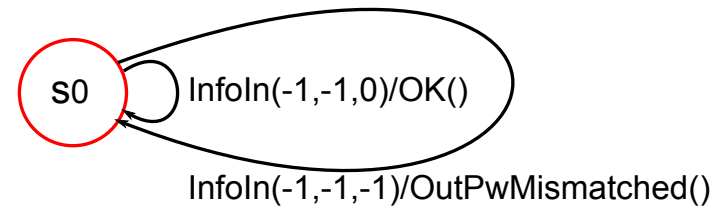
# Registration System

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## SUT Model

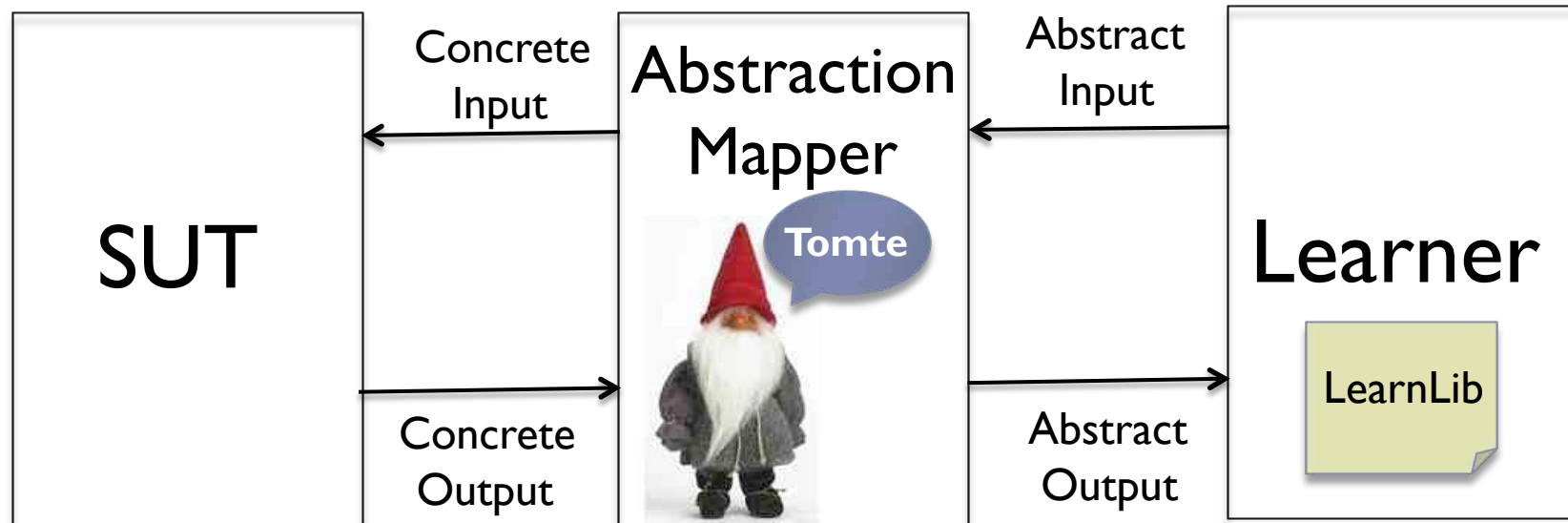


## Learned Model



# Implementation

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# Theory

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- ▶ Under certain conditions,

$$T \text{ ioco } A \parallel H \Rightarrow T \parallel A \text{ ioco } H$$

- ▶ T: SUT
- ▶ A: Mapper
- ▶ H: Learned Automaton

# Experiments Results

<b>System Under Test</b>	<b>Input Refinements</b>	<b>States</b>	<b>Learning/ Testing Queries</b>	<b>Learning/ Testing Time (seconds)</b>
Alternating Bit Protocol - Sender	1	7	193/3001	1.3s/104.9s
Alternating Bit Protocol - Receiver	2	4	145/3002	0.9s/134.5s
Alternating Bit Protocol - Channel	0	2	31/3000	0.3s/107.5s
Biometric Passport	3	5	2199/3582	7.7s/94.5s
Session Initiation Protocol	3	13	1755/3402	8.3s/35.9s
Login System	3	5	639/3063	2.0s/56.8s
Farmer-Wolf-Goat-Cabbage Puzzle	4	10	699/3467	4.4s/121.8s
Palindrome/Repdigit Checker	11	1	3461/3293	10.3s/256.4s

# Future Work

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- ▶ ITALIA project: <http://www.italia.cs.ru.nl/>
- ▶ Automatically learning the state variables the mapper needs to store
- ▶ Extending the memory
- ▶ Extending the class of SUT's that we can handle (in particular operations on data)
- ▶ More case studies

Thank You!

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Questions or Suggestions?