

# Black Box Testing of Finite State Machines

Frits Vaandrager

(based on slides Petra van den Bos and Ramon Janssen)

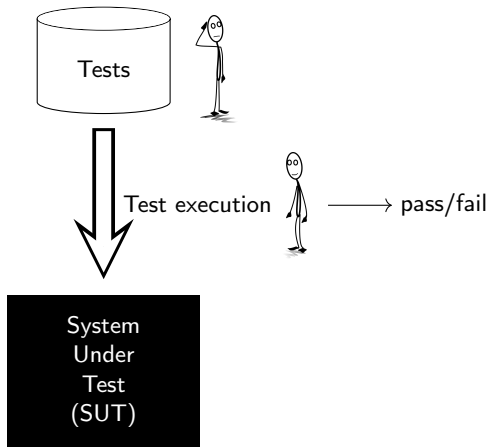
December 2, 2022

# Black Box Testing

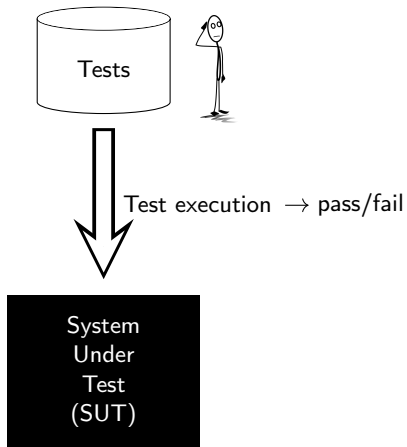
A method of software testing that examines the functionality of an application without peering into its internal structures or workings.



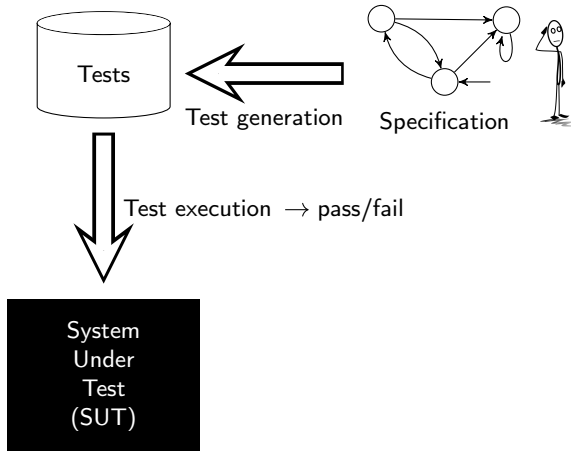
# Manual Testing



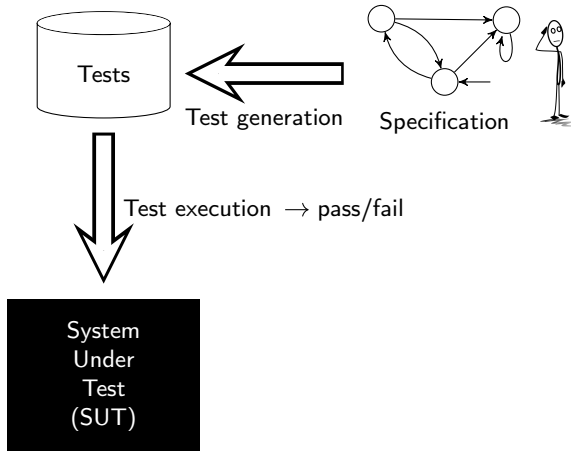
# Automated Testing



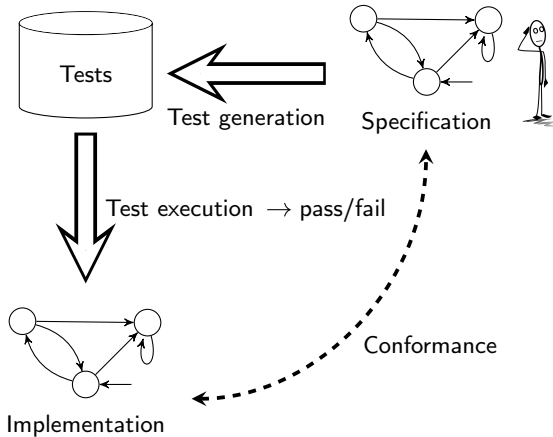
# Model-Based Testing



# Test Hypothesis



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# Today We Will Address Three Questions

1. What is a model?
  - Today: a Finite State Machine (FSM)





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  - Today: an  $n$ -complete test suite for FSMs



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## Literature:

- Dorofeeva, Rita, et al. FSM-based conformance testing methods — A survey annotated with experimental evaluation. Information and Software Technology, 2010, 52.12: 1286-1297.
- Ural, Hasan. Formal methods for test sequence generation. Computer communications, 1992, 15.5: 311-325.
- Lee, David; Yannakakis, Mihalīs. Principles and methods of testing finite state machines-a survey. Proc. IEEE, 1996, 84.8: 1090-1123.



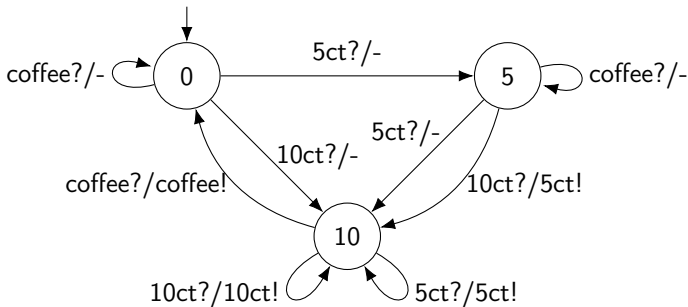
# Finite State Machine



# FSM

An **FSM** (also called **Mealy machine**) consists of:

- states
- transitions
- inputs
- outputs



# What Can Be Modeled With FSMs?

- FSMs are used for modeling functional behavior of **reactive systems**
- Examples:
  - communication protocols: TCP, SSH, TLS,...
  - hardware circuits
  - web applications
  - embedded control software within printers, cars, X-ray scanners, lithography systems, elevators, thermostats, ...
  - ...



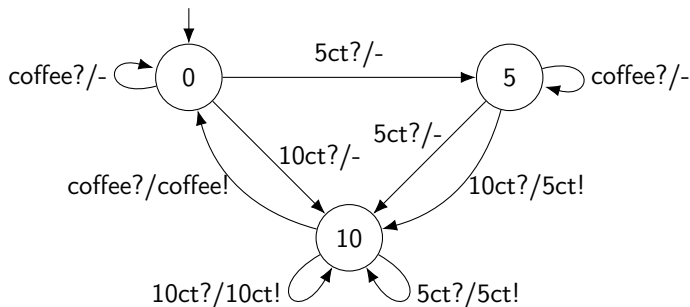
# FSMs are Quite Restrictive!

1. Each input triggers exactly one output
2. Source state and input uniquely determine target state (determinism)
3. Only finitely many states, inputs and outputs
4. No data parameters



## Representing FSMs with a Table

States →	0		5		10	
Inputs ↓	Output	New state	Output	New state	Output	New state
5ct	-	5	-	10	5ct	10
10ct	-	10	5ct	10	10ct	10
coffee	-	0	-	5	coffee	0





## Formal Definition

An **FSM (Mealy machine)** is a 6-tuple  $M = (Q, q_0, I, O, \delta, \lambda)$  with:

- $Q$  a finite set of **states**
- $q_0$  the **initial state**
- $I$  a finite set of **inputs**
- $O$  a finite set of **outputs**
- $\delta : Q \times I \rightarrow Q$  the **transition function**
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$Q \rightarrow$	0		5		10	
$I \downarrow$	$\lambda$	$\delta$	$\lambda$	$\delta$	$\lambda$	$\delta$
5ct	-	5	-	10	5ct	10
10ct	-	10	5ct	10	10ct	10
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## Extension of Transition and Output Functions

Extend  $\delta$  and  $\lambda$  to sequences:  $\delta^* : Q \times I^* \rightarrow Q$  and  $\lambda^* : Q \times I^* \rightarrow O^*$ :

$$\delta^*(q, \epsilon) = q$$

$$\delta^*(q, \mu \cdot \sigma) = \delta^*(\delta(q, \mu), \sigma) \quad (\mu \in I \text{ is a single symbol})$$

$$\lambda^*(q, \epsilon) = \epsilon$$

$$\lambda^*(q, \mu \cdot \sigma) = \lambda(q, \mu) \cdot \lambda^*(\delta(q, \mu), \sigma)$$



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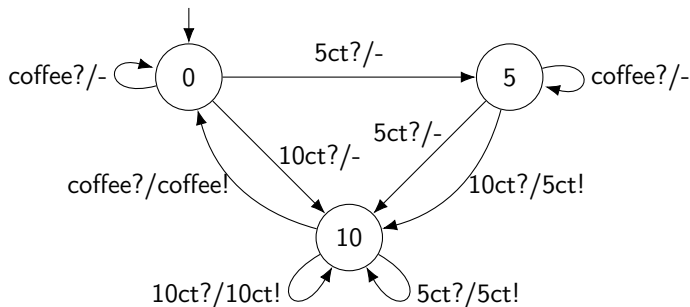
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For FMS  $M$  with initial state  $q_0$ , we write:

$$\begin{aligned}\delta^*(M, \sigma) &= \delta^*(q_0, \sigma) \\ \lambda^*(M, \sigma) &= \lambda^*(q_0, \sigma)\end{aligned}$$



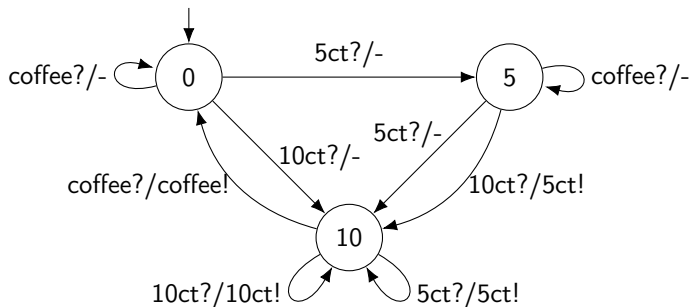
## Extension of Transition and Output Functions



$\delta^*(M, 5ct? \ 10ct? \ coffee?) =$



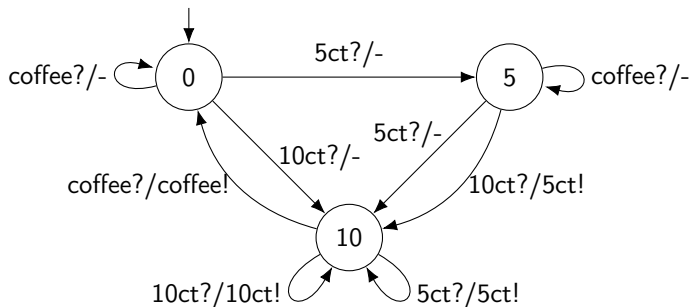
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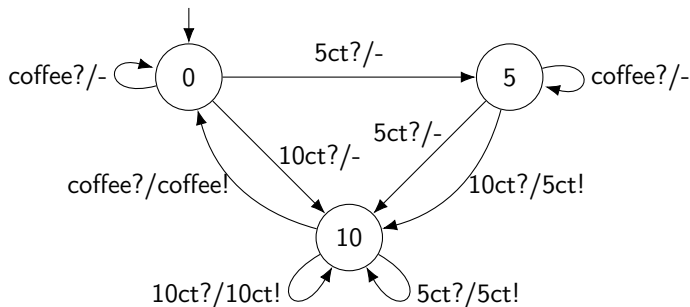


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## Extension of Transition and Output Functions



$$\delta^*(M, 5ct? \ 10ct? \ coffee?) = 0$$

$$\lambda^*(M, 5ct? \ 10ct? \ coffee?) = - \ 5ct! \ coffee!$$





# FSM Restrictions

FSMs are:

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- **deterministic**:  $\delta$  and  $\lambda$ ,  $\delta^*$  and  $\lambda^*$  are functions
- **completely specified**:  $\delta$ ,  $\lambda$ ,  $\delta^*$  and  $\lambda^*$  are complete functions
  - Symbol '-' in the coffee machine is an artificial output
- **connected**: from initial state any other state can be reached
  - Every non-connected FSM can be rewritten to a connected FSM



## Equivalence

- States  $q$  and  $q'$  are **equivalent** if they produce the same output sequence for every input sequence:

$$\forall \sigma \in I^* : \lambda^*(q, \sigma) = \lambda^*(q', \sigma)$$



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- States  $q$  and  $q'$  are **inequivalent** if there exists a **separating sequence**:

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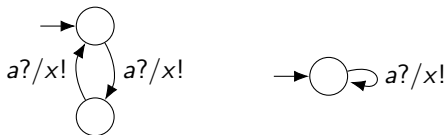
*For FSMs, we use equivalence as conformance relation*



# Minimality

An FSM is **minimal** if no two states are equivalent.

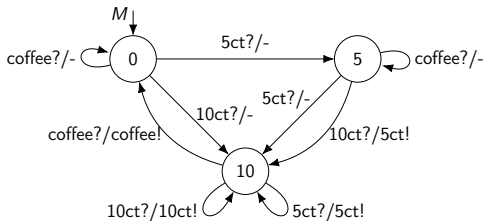
- Every non-minimal FSM can be rewritten to an equivalent minimal FSM



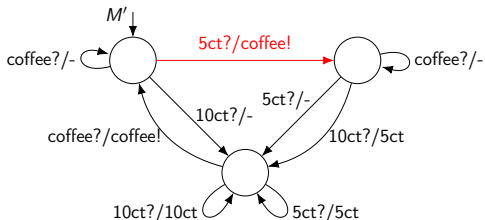


# Inequivalence Examples

**Output fault:** transition has wrong output

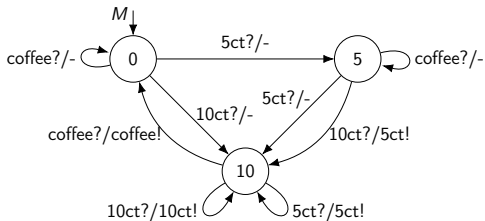


separating sequence?



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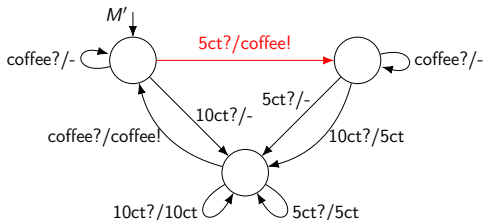
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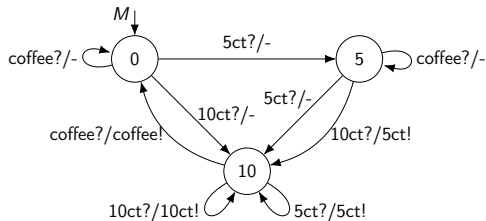
$$\lambda^*(M, 5ct?) = -$$

$$\lambda^*(M', 5ct?) = \text{coffee!}$$

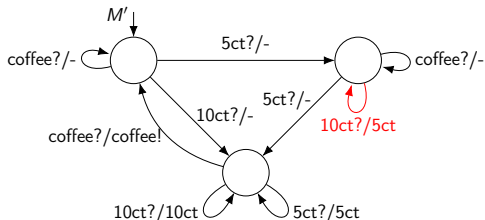


# Inequivalence Examples

**Transition fault:** transition goes to wrong state

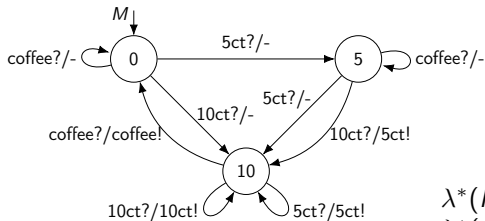


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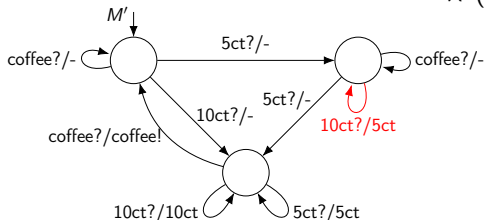
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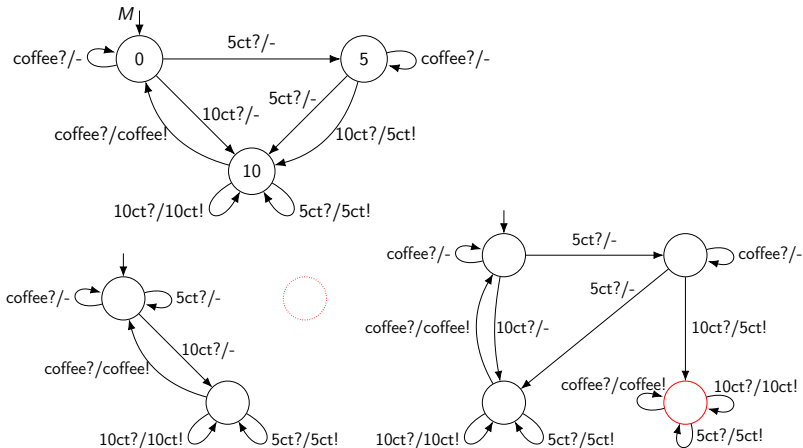
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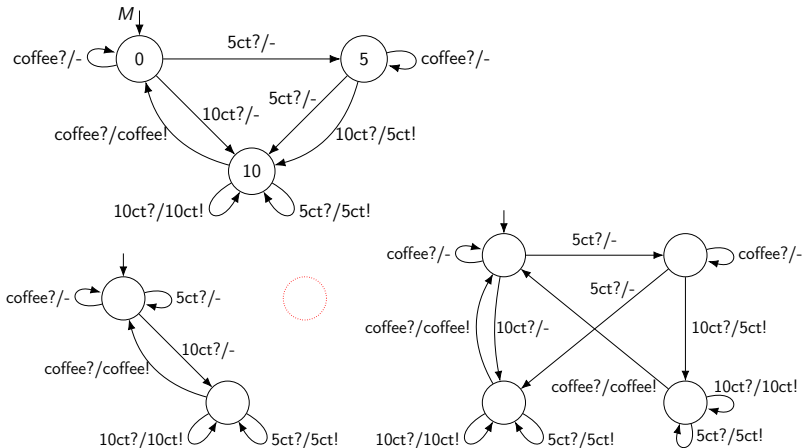
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## Missing states and extra states



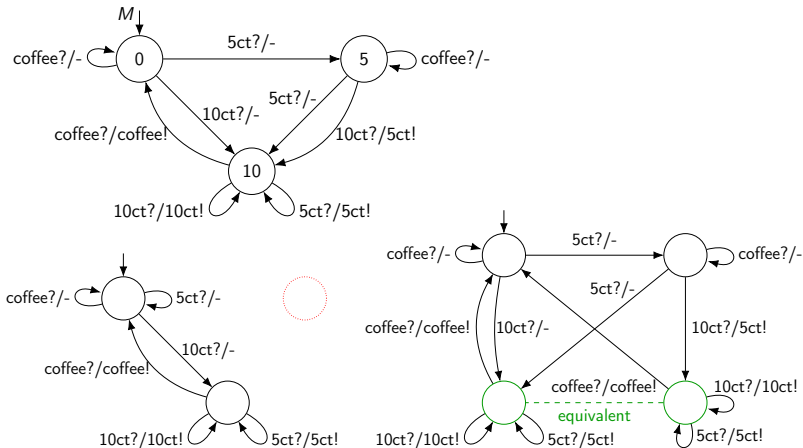
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## $n$ -Complete Test Suites





## Test Suite

Given a specification FSM  $S$  and an implementation FSM  $M$ :

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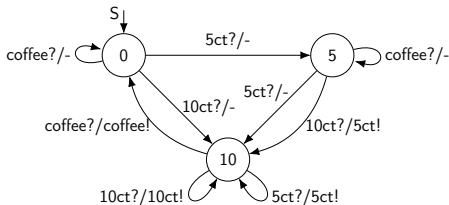
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- A **test suite** is a finite set of test cases  $T \subseteq I^*$
- A test suite **fails** if a single test case fails, and **passes** otherwise



## Executing a Test Suite

To execute  $T$  on a black-box system:

- apply **input** sequences  $\sigma \in T$
- observe **output** sequences  $\lambda^*(M, \sigma)$ 
  - fail if  $\lambda^*(M, \sigma) \neq \lambda^*(S, \sigma)$
- **reset** system in between tests



# Complete Test Suite

- Let  $S$  be a specification and  $T$  a test suite.
- Then  $T$  is **complete** if **for any implementation  $M$ :**  
 $M$  passes  $T \iff M$  equivalent to  $S$



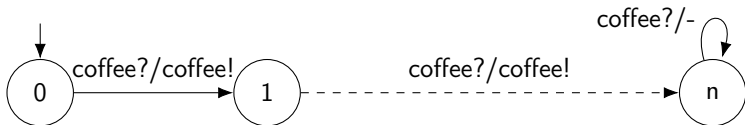
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- Complete test suites do not exist!

Specification:



Implementation:



Test cases of length  $< n$  will not find this fault, and  $n$  can be arbitrarily large



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- Exists! Based on access sequences and characterization sets  
(a.k.a. the  $W$ -method).





## Building Block: Access sequences

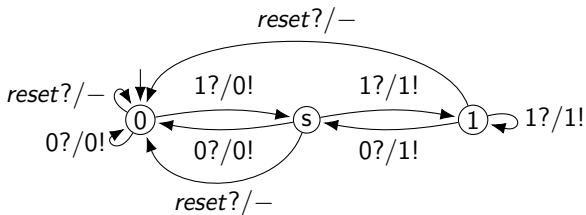
Let  $S$  be a specification FSM with states  $Q$  and initial state  $q_0$ .

- An **access sequence** for state  $q \in Q$  is any sequence  $\sigma$  with  $\delta^*(q_0, \sigma) = q$ .
- An **access sequence set**  $A \subseteq I^*$  for  $Q$  contains an access sequence for all states in  $Q$ ; we require  $\epsilon \in A$ .

Executing  $A$  ensures that we reach all states in  $Q$ .



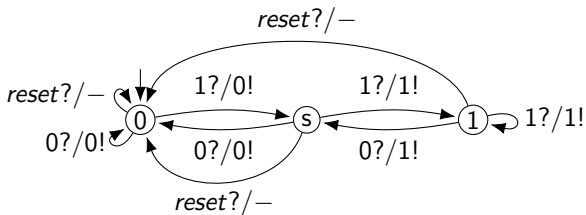
## Access Sequences Example



$A = ?$



## Access Sequences Example



$$A = \{\epsilon, 1?, 1?1?\}$$



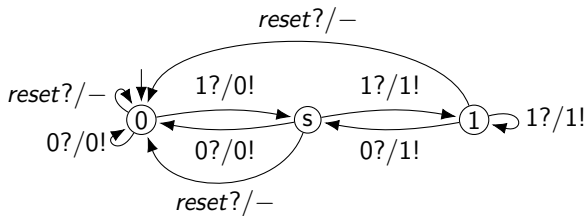
## Building Block: Characterization Sets

Let  $S$  be a minimal specification FSM with states  $Q$ .

- A **characterization set**  $C \subseteq I^*$  for  $Q$  contains a separating sequence for every pair of states  $q, q' \in Q$  (with  $q \neq q'$ ).



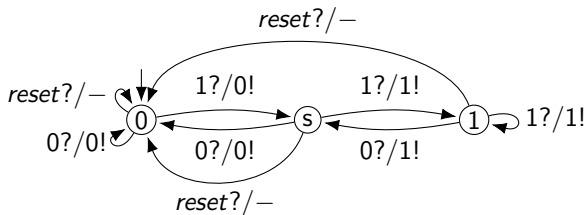
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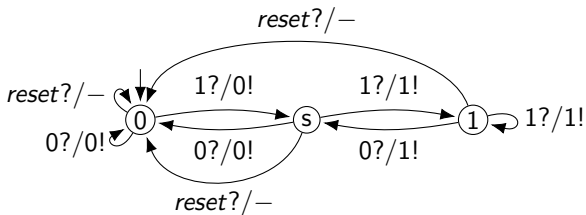


$$C = \{0?, 1?\}$$

Why is this a characterization set?



## Characterisation Set Example



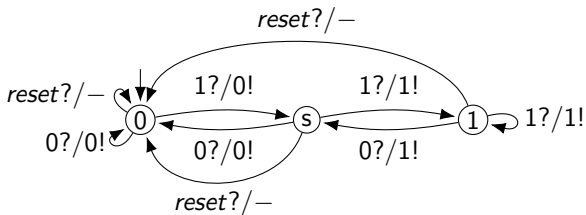
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$$\lambda^*(0, 1?) = 0! \neq 1! = \lambda^*(s, 1?) \quad (C \text{ separates } 0 \text{ and } s)$$



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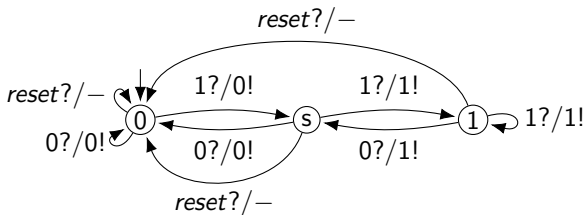
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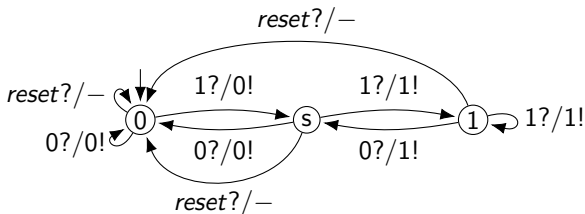
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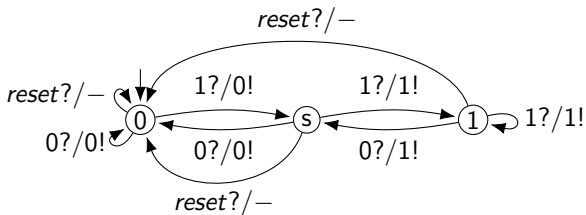
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(why is  $?reset$  useless in a characterization set?)



## Characterisation Set Example



$$C = \{0?, 1?\}$$

$\lambda^*$	0?	1?
0	0!	0!
s	0!	1!
1	1!	1!

All rows of this table ( $\lambda^*$  for  $Q$  and  $C$ ) are different: state identification



## Building Blocks for 0-Complete Test Suite

- Check that the implementation has at least as many states as the specification (no missing states)
- Check that each implementation state is correct:
  - outgoing transitions have a correct output (no output fault), and
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Assumption: 0 extra states w.r.t.  $S$  (no extra states)



## Building Block 1: No Missing States

**Check that  $M$  has at least as many states as specification  $S$ :**

- Execute all input sequences of  $A \cdot C$  on  $M$
- For every  $a, a' \in A$ , execution of  $a \cdot C$  and  $a' \cdot C$  shows that  $a$  and  $a'$  reach different specification states



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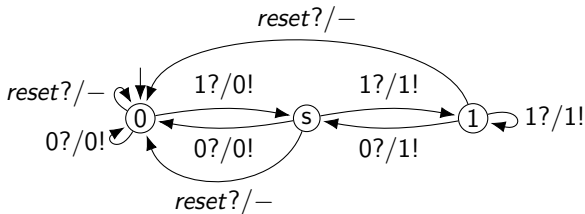
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## Building Block 1: No Missing States

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A passing implementation must have at least 3 states, reached by  $A$ :

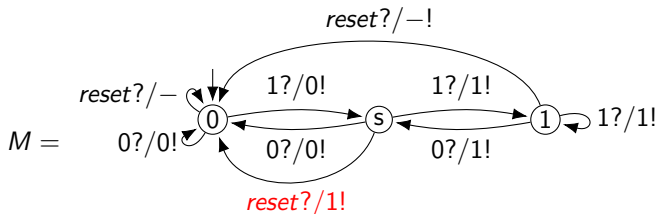
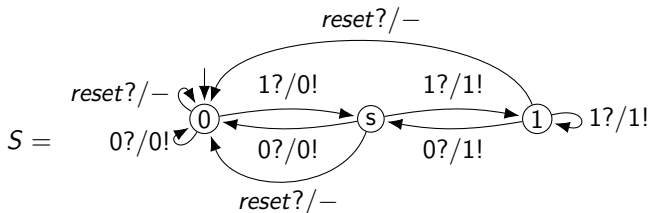
$a \cdot c$	0?	1?	1?0?	1?1?	1?1?0?	1?1?1?
$\lambda^*(M, a \cdot c)$	0!	0!	0!0!	0!1!	0!1!1!	0!1!1!





# Building Block 1: No Missing States

$A \cdot C$  does not find all output faults yet!



## Building Block 2: No Output Faults

Solution: also test  $A \cdot I =$

$\{0?, 1?, \text{reset?}, 1?0?, 1?1?, 1?\text{reset?}, 1?1?0?, 1?1?1?, 1?1?\text{reset?}\}$

This works, because  $A$  reaches all *implementation* states

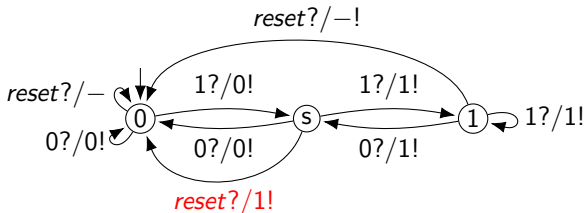


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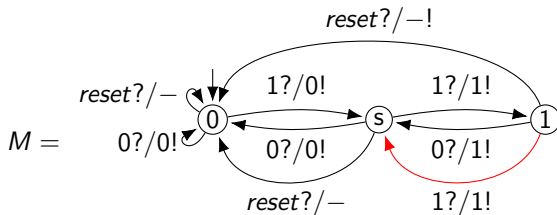
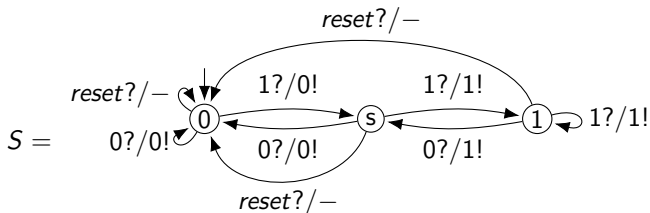
$\lambda^*(S, 1?\text{reset?}) = 0!-$

$\lambda^*(M, 1?\text{reset?}) = 0!1!$



## Building Block 2: No Output Faults

$A \cdot C + A \cdot I$  does not detect transition faults yet!



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- $C$  tests whether the right state is reached after  $A \cdot I$

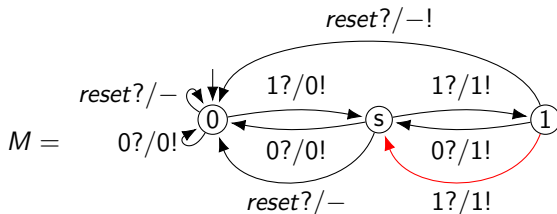


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$$\lambda(S, 1?1?1?0?) = 0!1!1!1!$$

$$\lambda(M, 1?1?1?0?) = 0!1!1!0!$$

(access sequence  $1?1?$ ; faulty transition  $1?$ ; separating sequence  $0?$  for states  $s$  and 1)



## 0-Complete Test Suite

Full 0-complete test suite is

$$T = A \cdot C + A \cdot I + A \cdot I \cdot C$$



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Note: many possible sets  $A$  and  $C$ !



## Correctness

**Theorem** Let  $S$  be a minimal FSM with set of access sequences  $A$ , set of inputs  $I$ , and characterization set  $C$ . Then  $T = A \cdot I^{\leq 1} \cdot C$  is 0-complete.



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**Proof:** We use the concept of a **bisimulation**.



# Bisimulation

**Definition** Let  $M_1$  and  $M_2$  be FSMs with inputs  $I$ . A **bisimulation** between  $M_1$  and  $M_2$  is a relation  $R \subseteq Q_1 \times Q_2$  such that  $(q_0^1, q_0^2) \in R$  and, for all  $(q, r) \in R$  and  $i \in I$ ,

1.  $\lambda_1(q, i) = \lambda_2(r, i)$ ,
2.  $(\delta_1(q, i), \delta_2(r, i)) \in R$ .



## Bisimulation (cnt)

**Lemma** If there exists a bisimulation  $R$  between  $M_1$  and  $M_2$ , then  $M_1$  and  $M_2$  are equivalent.

**Proof:** Assume  $(q, r) \in R$  and  $\sigma \in I^*$ . By induction on the length of  $\sigma$  we prove that  $\lambda_1^*(q, \sigma) = \lambda_2^*(r, \sigma)$ .

- Base. Trivial since  $\lambda_1^*(q, \epsilon) = \epsilon = \lambda_1^*(r, \epsilon)$ .
- Induction step. Let  $\sigma = i \rho$ . By definition,

$$\begin{aligned}\lambda_1^*(q, \sigma) &= \lambda_1(q, i) \lambda_1^*(\delta_1(q, i), \rho), \\ \lambda_2^*(r, \sigma) &= \lambda_2(r, i) \lambda_2^*(\delta_2(r, i), \rho).\end{aligned}$$

By condition (1) for bisimulations  $\lambda_1(q, i) = \lambda_2(r, i)$ . By condition (2) for bisimulations  $(\delta_1(q, i), \delta_2(r, i)) \in R$ . Therefore, by induction hypothesis,  $\lambda_1^*(\delta_1(q, i), \rho) = \lambda_2^*(\delta_2(r, i), \rho)$ . This implies that  $\lambda_1^*(q, \sigma) = \lambda_2^*(r, \sigma)$ , as required.

From this property the lemma follows since  $(q_0^1, q_0^2) \in R$ .



## Correctness (cnt)

**Theorem** Let  $S$  be a minimal FSM with set of access sequences  $A$ , set of inputs  $I$ , and characterization set  $C$ . Then  $T = A \cdot I^{\leq 1} \cdot C$  is 0-complete.

**Proof:** Let  $M$  be an FSM with at most as many states as  $S$  such that  $M$  passes tests  $T$ . By the previous lemma, it suffices to show that the following relation  $R$  is a bisimulation between  $M$  and  $S$ :

$$(q, r) \in R \iff \forall \sigma \in C : \lambda_M^*(q, \sigma) = \lambda_S^*(r, \sigma)$$

Because we require  $\epsilon \in A$  we have  $C \subseteq R$ . Therefore, since  $M$  passes  $T$ ,  $\forall \sigma \in C : \lambda_M^*(q_0^M, \sigma) = \lambda_S^*(q_0^S, \sigma)$ . This implies  $(q_0^M, q_0^S) \in R$ , as required.



## Correctness (cnt)

Suppose  $r_1$  and  $r_2$  are distinct states of  $S$  with access sequences  $\rho_1$  and  $\rho_2$ , respectively. Then there exists a separating sequence  $\sigma \in C$  for  $r_1$  and  $r_2$ . Let  $q_1$  and  $q_2$  be the states of  $M$  reached by access sequences  $\rho_1$  and  $\rho_2$ . Then, since  $M$  passes  $A \cdot C$ ,  $\sigma$  is also a separating sequence for  $q_1$  and  $q_2$ . Since all states of  $S$  can be reached and pairwise be separated by  $C$ , this means that  $M$  has at least as many states as  $S$ , that can pairwise be separated by  $C$ . Since we assume that  $M$  has at most as many states as  $S$ , we conclude that  $M$  and  $S$  have the same number of states. Moreover, since  $M$  passes  $A \cdot C$ , we know that for each pair  $(q, r) \in R$  there exists an access sequence  $\rho \in A$  such that  $\delta_M(q_0^M, \rho) = q$  and  $\delta_S(q_0^S, \rho) = r$ .





## Correctness (cnt)

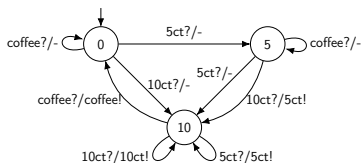
Now suppose that  $(q, r) \in R$  and  $i \in I$ . Let  $\rho$  be an access sequence for  $q$  and  $r$ . Then, since  $M$  passes tests  $\rho$   $i$   $C$  we may conclude

1.  $\lambda_M(q, i) = \lambda_S(r, i)$ ,
2.  $(\delta_M(q, i), \delta_S(r, i)) \in R$ ,

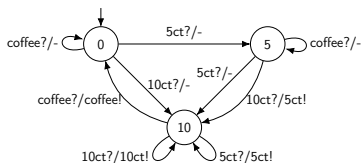
which means that  $R$  is a bisimulation between  $M$  and  $S$ .



## Example: 0-Complete Test Suite Coffee Machine



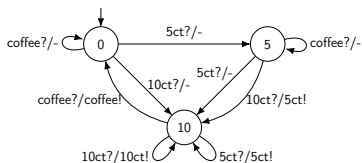
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$$A = \{\epsilon, 5\text{ct?}, 10\text{ct?}\}$$



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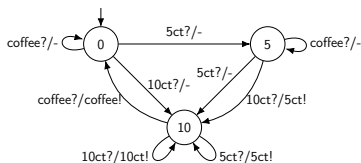


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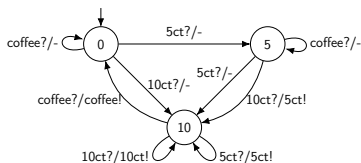
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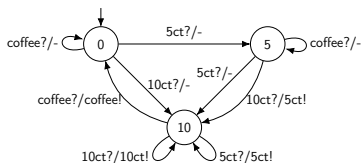
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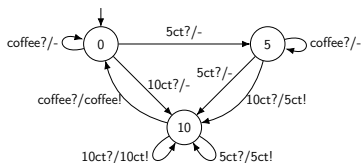
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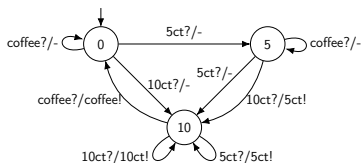
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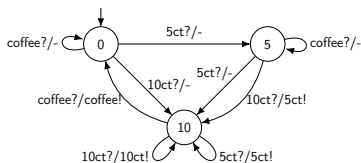
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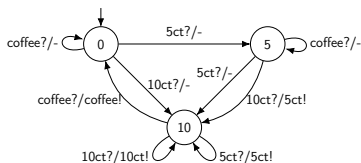
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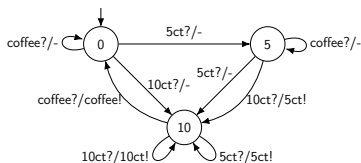
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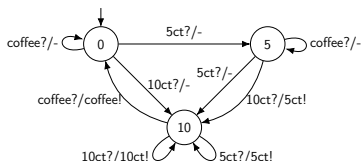
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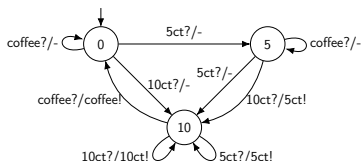
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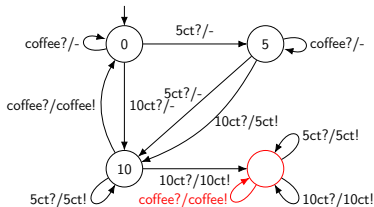
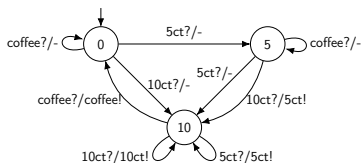
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or simply

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# Characterization Sets



## Large Characterisation Sets

- Remember: set  $C \subseteq I^*$  is a characterisation set for specification  $S$  if:
  - For each pair of distinct states  $q$  and  $q'$  of  $S$  there is a  $c \in C$  such that  $\lambda^*(q, c) \neq \lambda^*(q', c)$
- Upper bound on the size of  $C$  is  $\binom{|S|^2 - |S|}{2}$  elements.



## Special (Smaller) Characterisation Sets

- A sequence  $c \in C$  is a **Unique Input Output sequence (UIO)** for some state  $q$  if:
  - for all other states  $q'$  of  $S$ :  $\lambda^*(q, c) \neq \lambda^*(q', c)$
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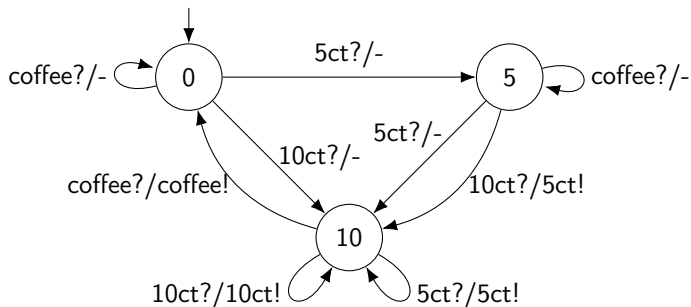


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- UIOs and DSs do not always exist...



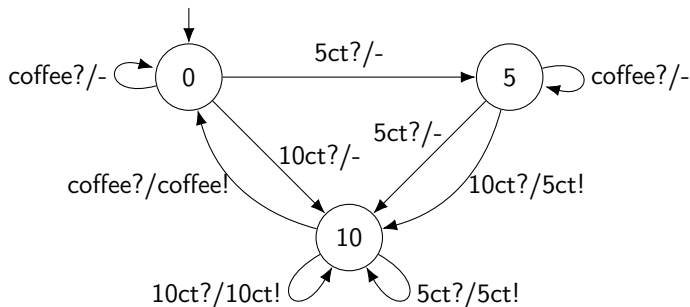
## Example: SS, UIO, or DSs?



- 10ct?



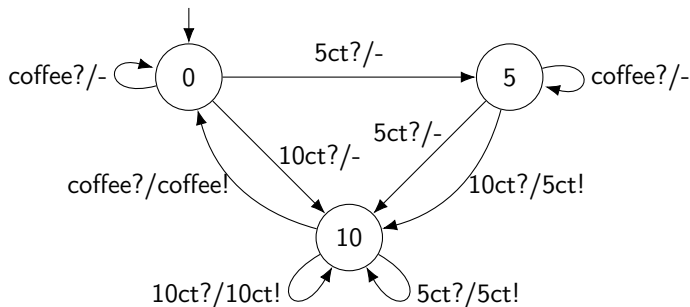
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- 10ct? **DS**
- 5ct? coffee?



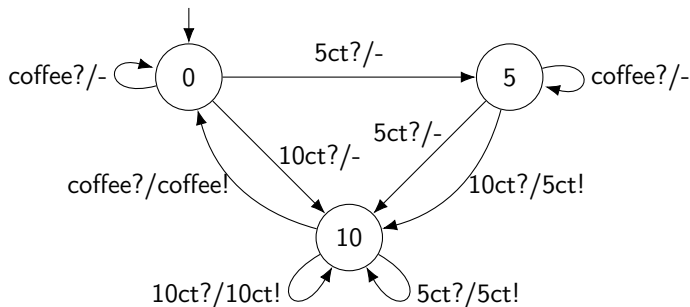
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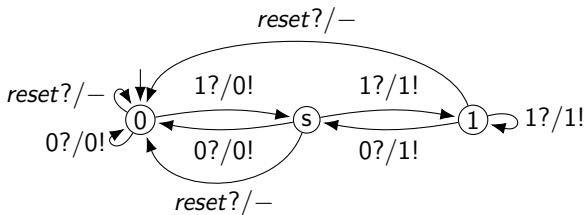
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- 10ct? **DS**
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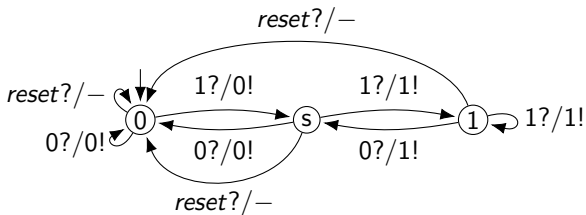
## Example: Do DSes or UIOs Exist?



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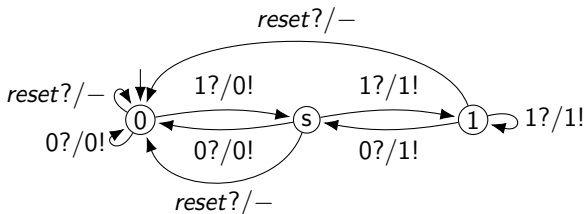
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- Any DS? **no**
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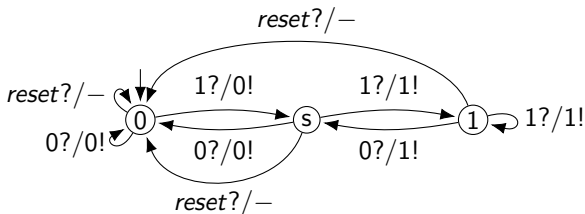


- Any DS? **no**
- Does 0 have an UIO? **yes**, sequence 1?.
- Does s have an UIO?





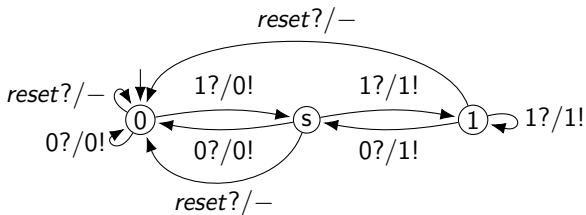
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- Any DS? **no**
- Does 0 have an UIO? **yes**, sequence 1?.
- Does s have an UIO? **no**
- Does 1 have an UIO?



## Example: Do DSes or UIOs Exist?

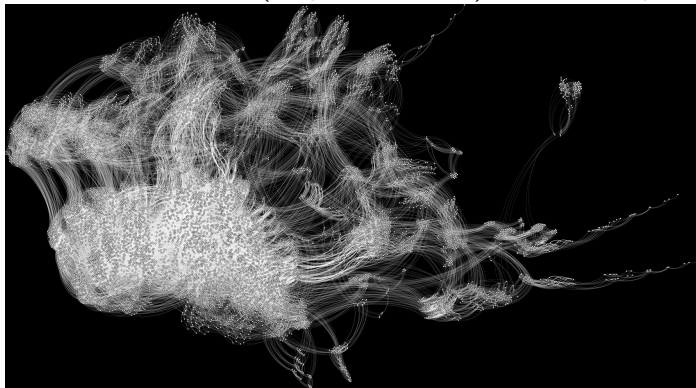


- Any DS? **no**
- Does 0 have an UIO? **yes**, sequence 1?.
- Does s have an UIO? **no**
- Does 1 have an UIO? **yes**, sequence 0?.



## A More Realistic Example

- $\pm 10.000$  states and  $\pm 150$  inputs
- Test suite from this lecture:  $\pm 5,0 \cdot 10^8$  inputs
- Smarter test suite (adaptive DS + SS):  $\pm 1.5 \cdot 10^8$  inputs



## Algorithm for Finding Separating Sequences

- Using breadth-first search for each pair of states:  $O(pn^3)$
- Do it all at once (next slides):  $O(pn^2)$
- Optimal (Hopcroft):  $O(pn \log n)$

( $n$  = number of states,  $p$  = number of inputs)



# Algorithm for Finding Separating Sequences

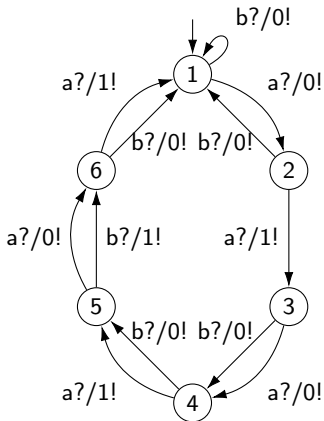
- Use **partition refinement**
- Initially, all states are not separated: one block
- Gradually separate states: refine partitions
  - A block is split if we find a separating sequence



# Algorithm for Finding Separating Sequences

Use a splitting tree:

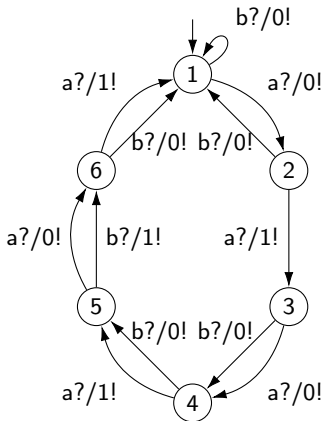
$\{1, \dots, 6\}$



# Algorithm for Finding Separating Sequences

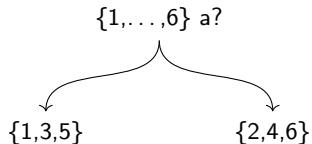
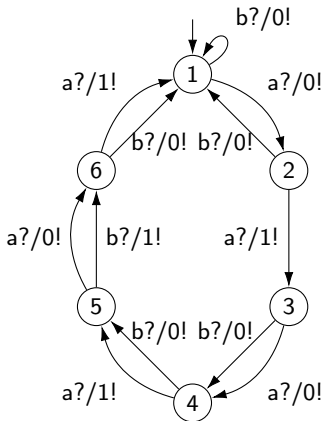
Use a splitting tree:

$\{1, \dots, 6\}$   $a?$



## Algorithm for Finding Separating Sequences

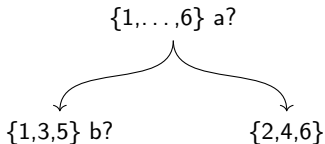
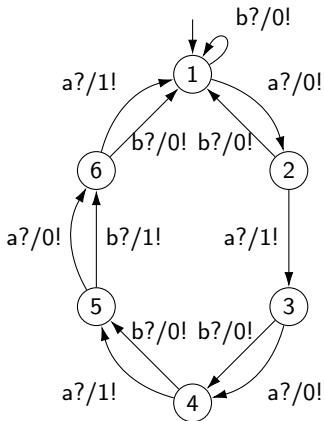
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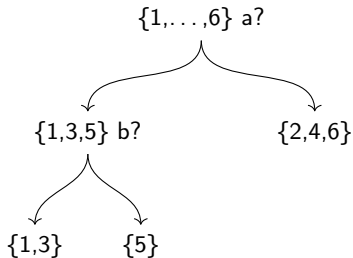
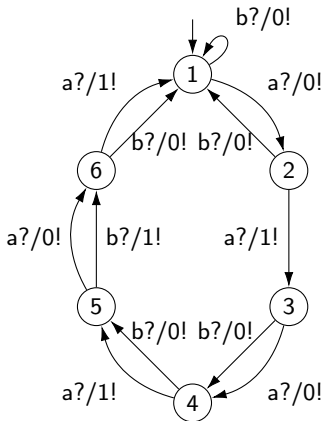
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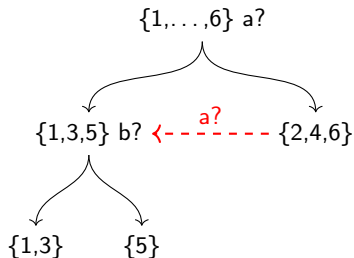
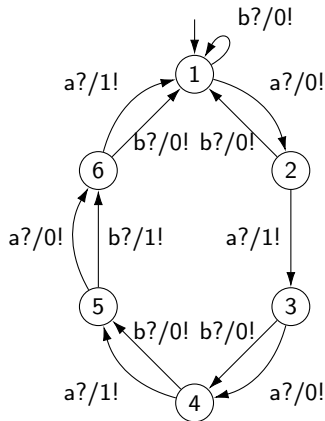
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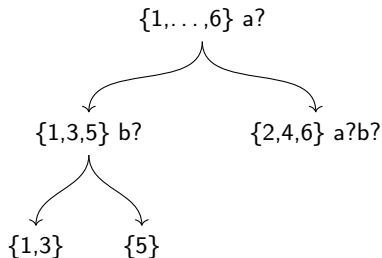
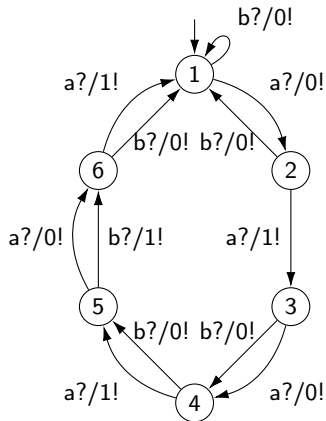
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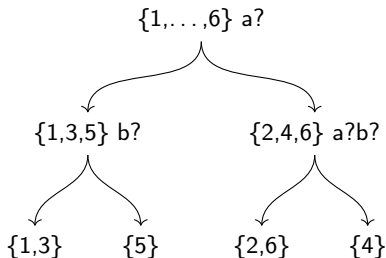
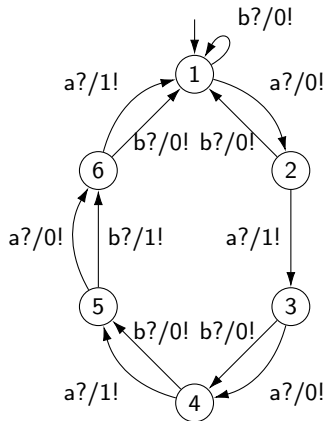
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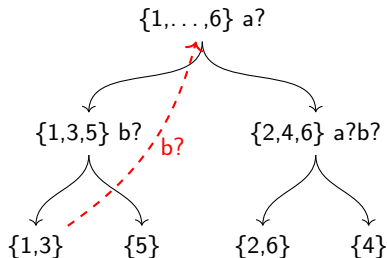
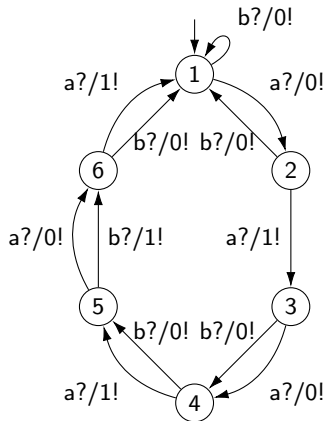
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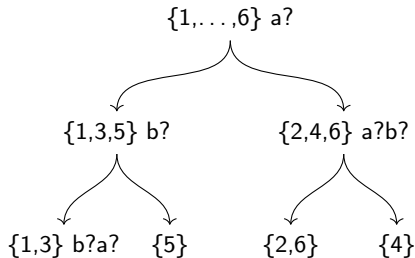
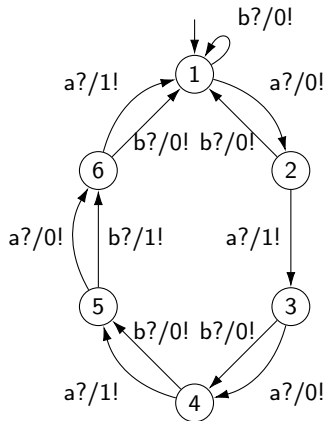
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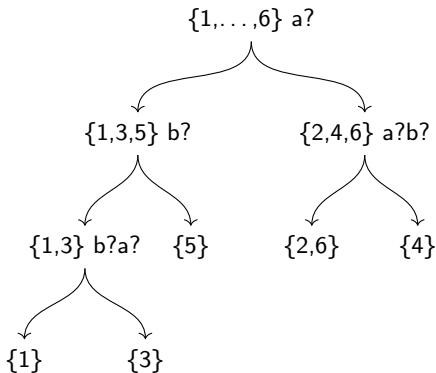
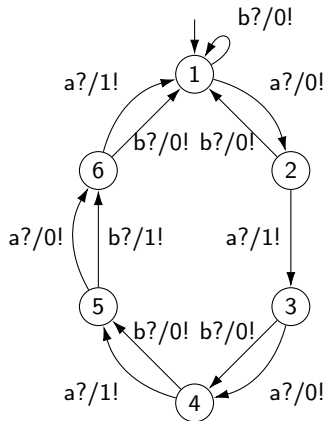
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# Algorithm for Finding Separating Sequences

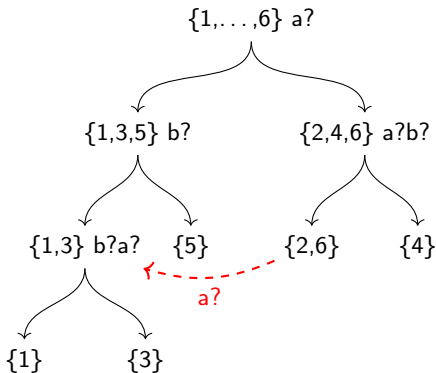
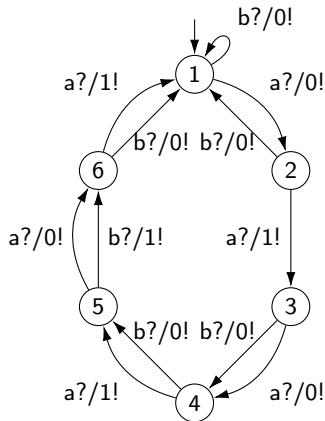
Use a splitting tree:





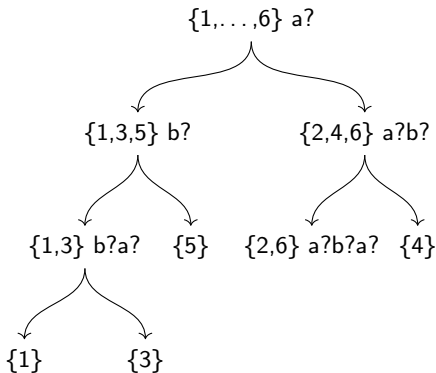
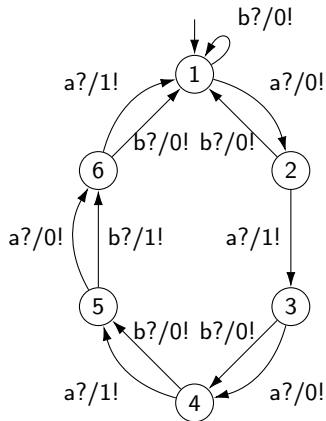
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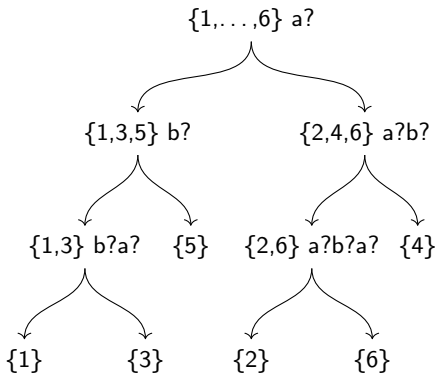
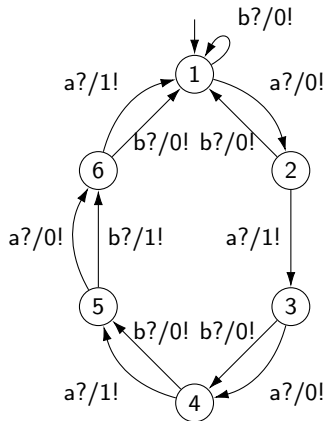
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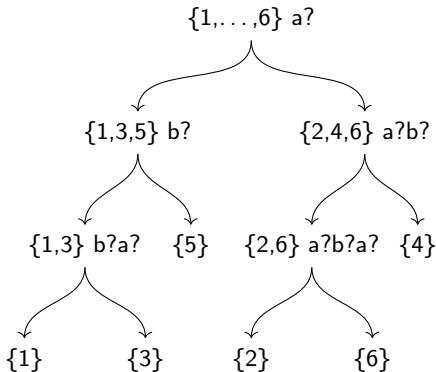
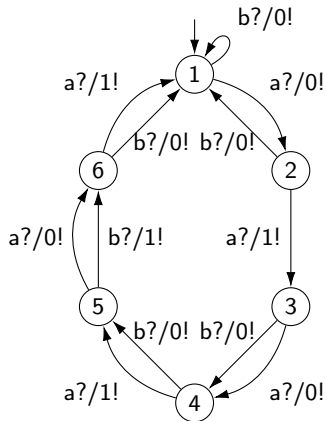
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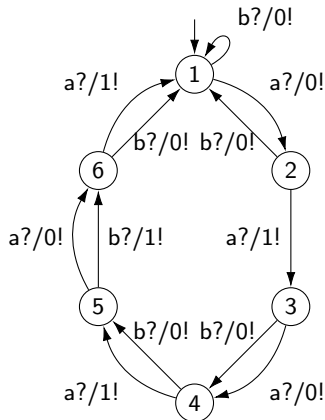


$$C = \{a?, b?, a?b?, b?a?, a?b?a?\}$$

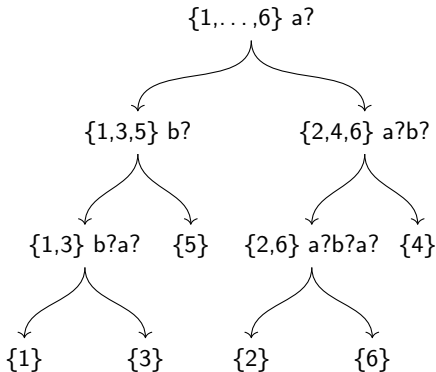


# Algorithm for Finding Separating Sequences

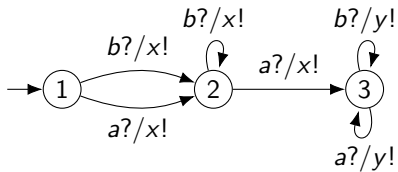
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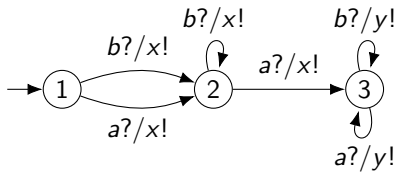


## Splitting node: Separate States by Input



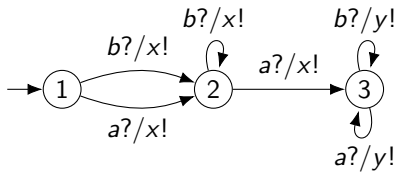
## Splitting node: Separate States by Input

{1,2,3}



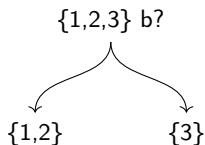
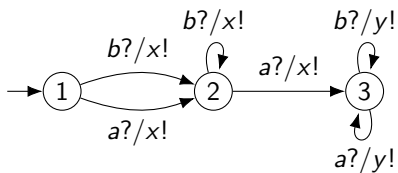
## Splitting node: Separate States by Input

$\{1,2,3\}$  b?

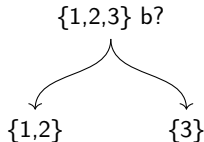
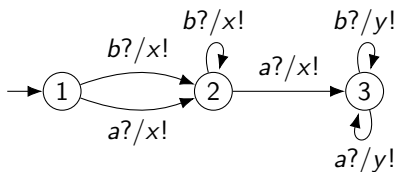




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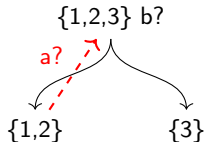
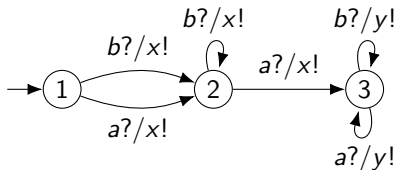


$\{1, 2\}$  can be split based on  $a?$  and the split of  $\{1, 2, 3\}$ , because

- $\delta(1, a?) = 2$  and  $\delta(2, a?) = 3$ , and
- states 2 and 3 are already split in node  $\{1, 2, 3\}$  (they are in different children of  $\{1, 2, 3\}$ )



## Splitting node: Separate States by Input

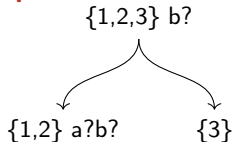
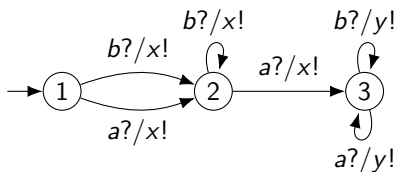


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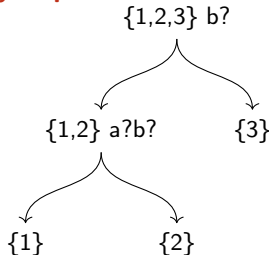
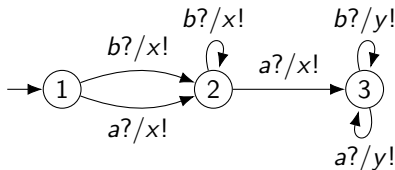


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## Splitting node: Separate States by Input



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$C = \{a?, a?b?\}$



## Pseudo-Algorithm: What Did We Do?

Initialisation: create root with all states



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repeat until no more splits can be made:

- pick any leaf  $N$  and input  $i$ :

- if  $\lambda$  gives different outputs for  $i$ , for different states in  $N$

- split with  $N$  with  $i$



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repeat until finished:

- pick any leaf  $N$  and input  $i$ :

- if  $\delta$  brings us to states already split with sequence  $\sigma$

- split  $N$  with  $i$

- append  $i \cdot \sigma$  to  $N$





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- split  $N$  with  $i$

- append  $i \cdot \sigma$  to  $N$

A split for node  $N$  and input  $i$  partitions  $N$  into multiple smaller parts



# Test Suites Without Resets

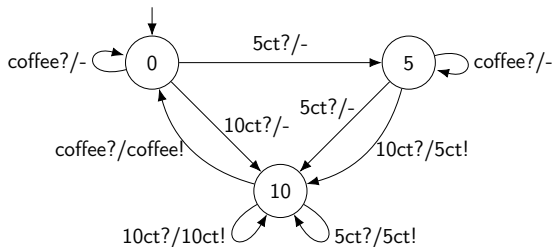


## Testing Without Reset

- To execute multiple tests a reset is needed!
- What if the SUT has no reset?
- Use a **synchronising sequence**:
  - A sequence which always ends in the same state
  - May not exist!
  - Instead of reset, synchronize to initial state
- (Synchronizing sequences are not  $n$ -complete!)



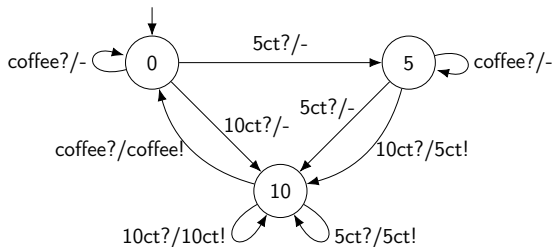
## Synchronising Sequence



- to state 10:



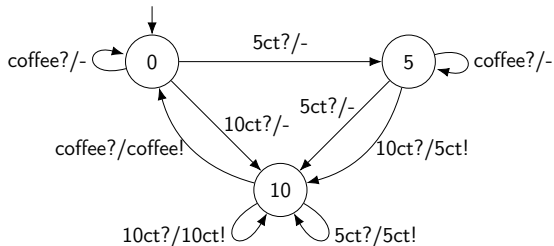
## Synchronising Sequence



- to state 10: 10ct?
- to state 0:



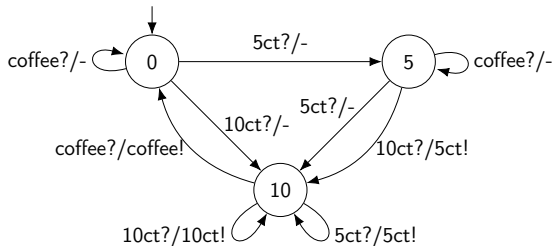
## Synchronising Sequence



- to state 10: 10ct?
- to state 0: 10ct? coffee?
- to state 5:



## Synchronising Sequence



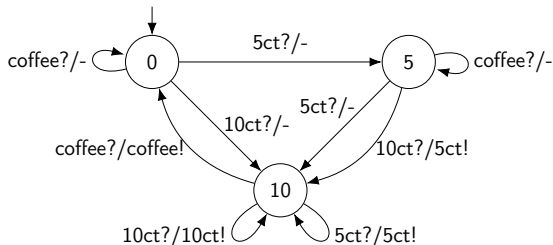
- to state 10: 10ct?
- to state 0: 10ct? coffee?
- to state 5: 10ct? coffee? 5ct?



## Transition Tour

Alternative: make a **transition tour**

- long sequence going through all transitions ending in the initial state
- Can only detect output faults



coffee? 5ct? coffee? 5ct? 5ct? 10ct? coffee?  
10ct? coffee?  
5ct? 10ct? coffee?





## Recap

- Finite state machines
- Equivalence
- $n$ -complete test suite =  $A \cdot I^{\leq n+1} \cdot C$  with
  - Access sequences  $A$
  - Characterization set  $C$ , built up from
    - ▶ Separating sequences
    - ▶ Unique input output sequences (UIO)
    - ▶ Distinguishing sequence (DS)
- Algorithm for finding separating sequences
- No reset: transition tour or synchronising sequence



# Questions?

