

# Principles of Model-Based Testing

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# Software Testing

# Testing: A Definition

Software testing is:

- a technical process,
- performed by executing / experimenting with a product,
- in a controlled environment, following a specified procedure,
- with the intent of measuring one or more characteristics / quality of the software product
- by demonstrating the deviation of the actual status of the product from the required status / specification.

# Quality : There is more than Testing

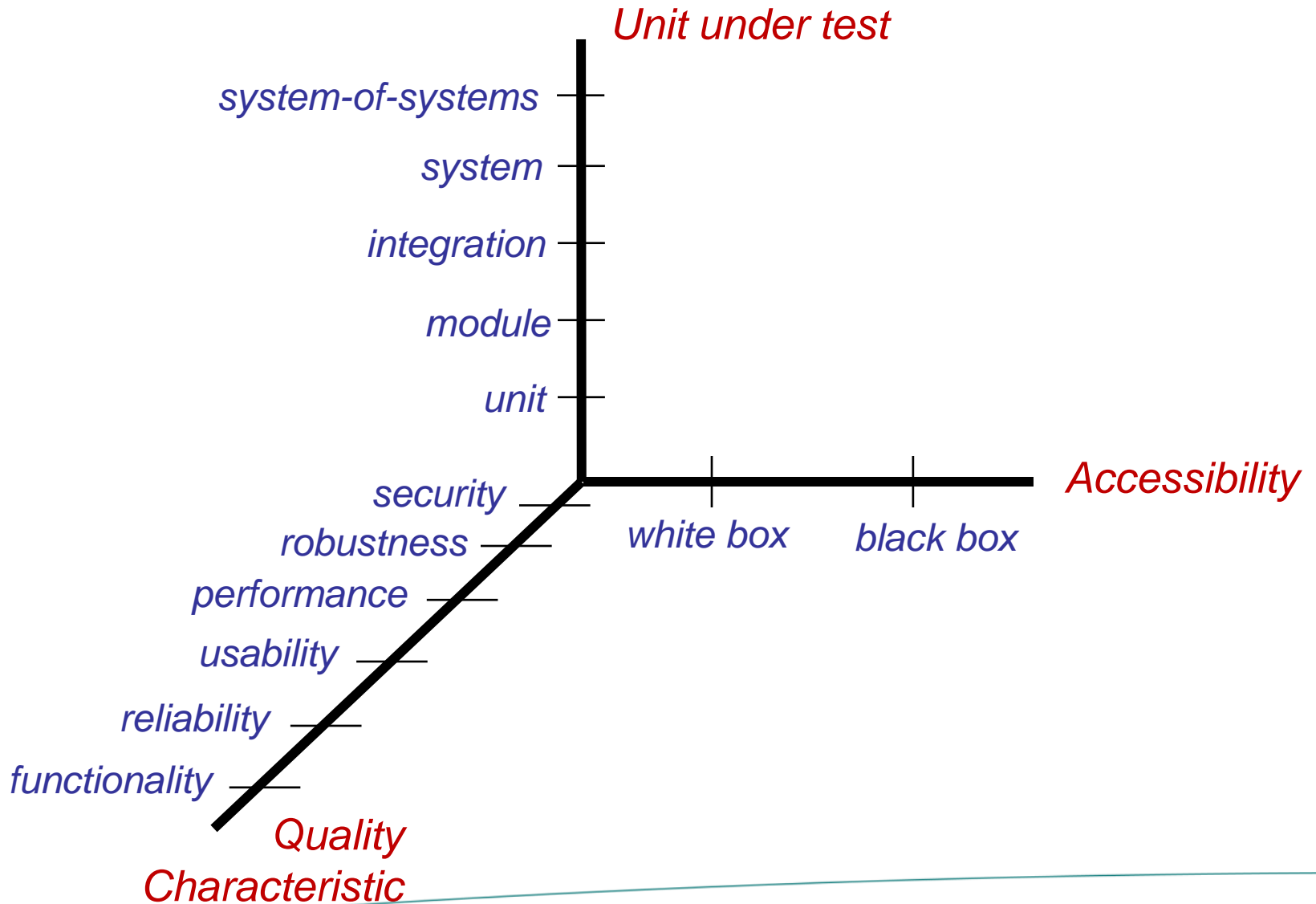


# Sorts of Testing

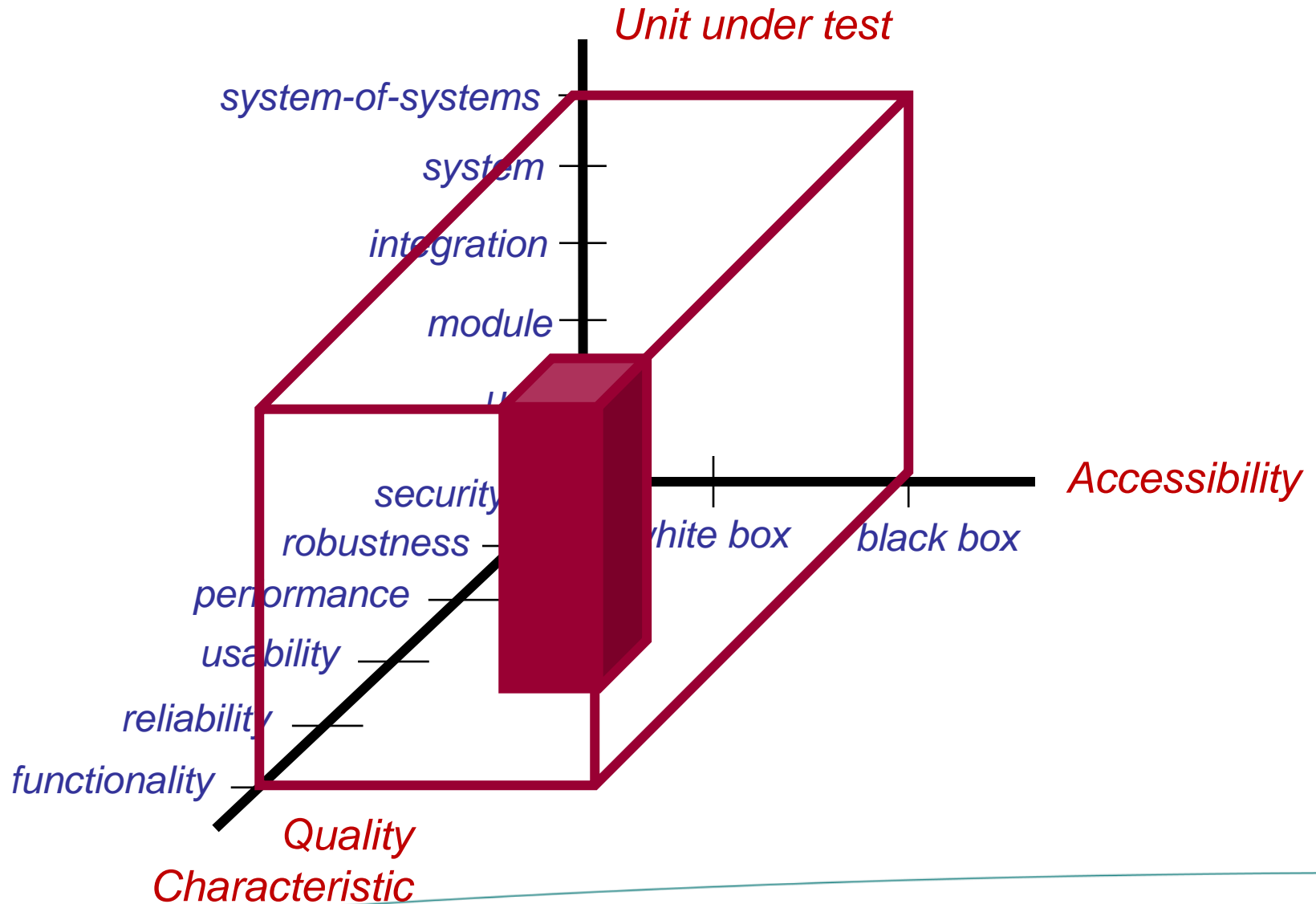
# Sorts of Testing : Classification

- **Quality characteristics**
  - functional, security, compliance, interoperability
  - reliability, robustness, usability, learnability
  - performance, resource, stress, portability, conformance
- **Who**
  - developer, tester, user, QA, third party, certifier
  - alpha testing, beta testing, system admin, . . .
- **Phase**
  - programming, integration, acceptance, regression, . . .
- **Unit under test**
  - unit, module, component, subsystem, system, system-of-systems
  - documentation, system-in-context
- **Goal of testing**
  - bug finding, confidence, certification, . . .
- **Testing techniques**
  - Black / white-box, . . .
- . . . . .

# Sorts of Testing



# Sorts of Testing : Model-Based Testing





# Software Testing

Measuring some quality characteristic of an executing software object by performing experiments in a controlled environment while comparing actual behaviour with required behaviour

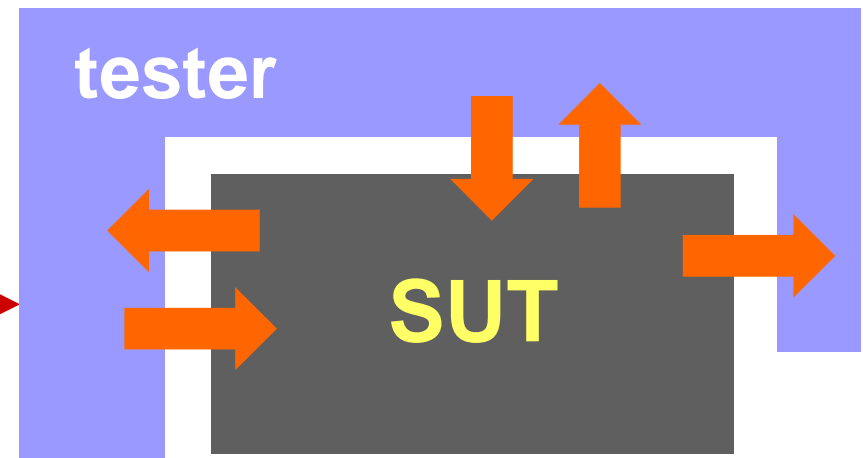
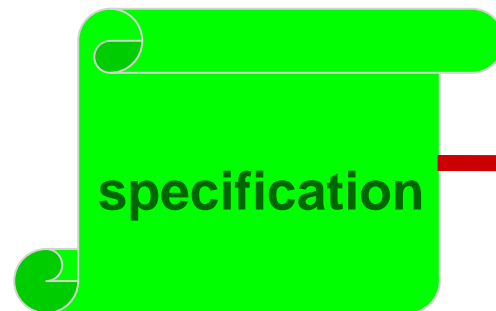
*functionality*

*SUT*

*tester*

*specification-based, active, black-box testing of functionality*

*specification*

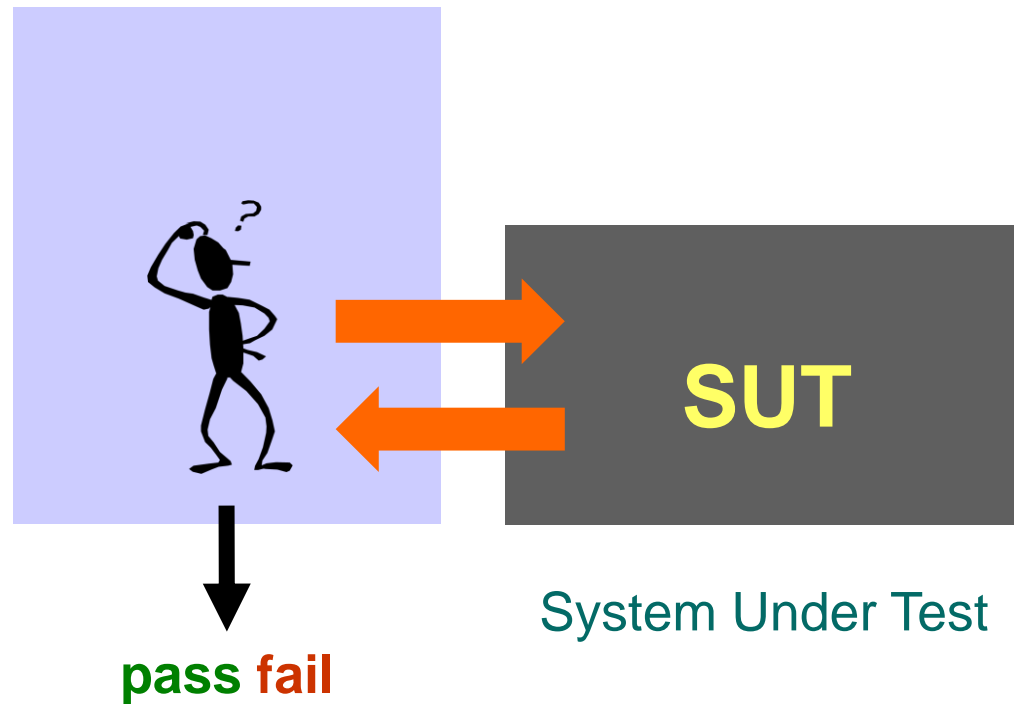


# Model-Based Testing

## Basics

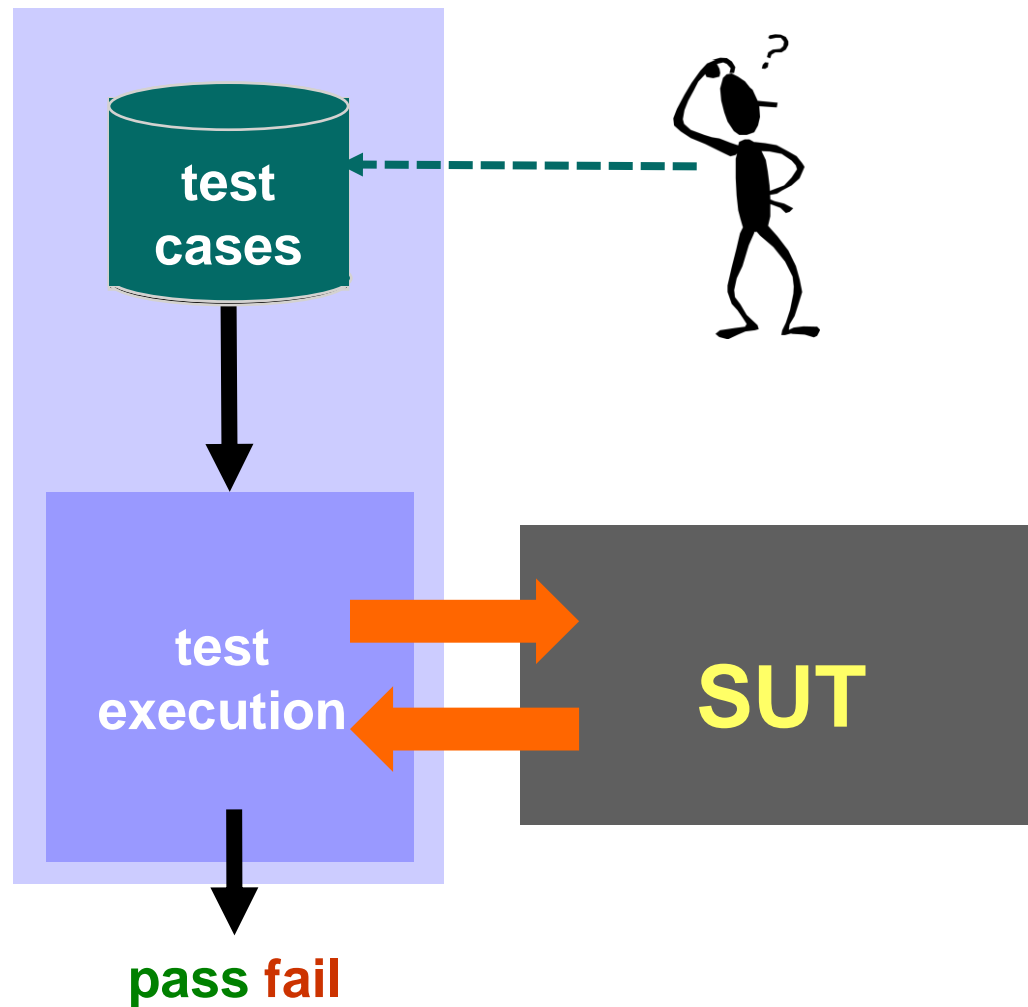
# 1 : Manual Testing

## 1. Manual testing



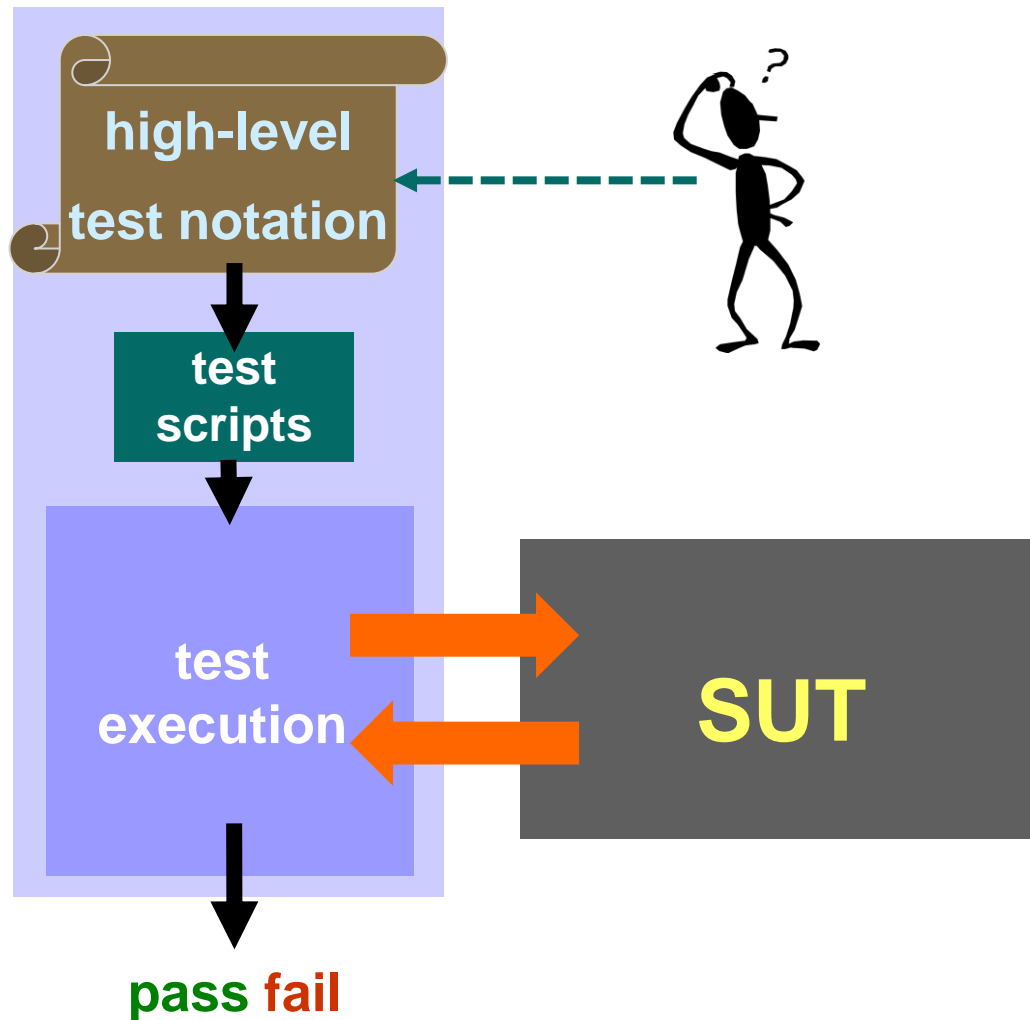
## 2 : Scripted Testing

1. Manual testing
2. Scripted testing



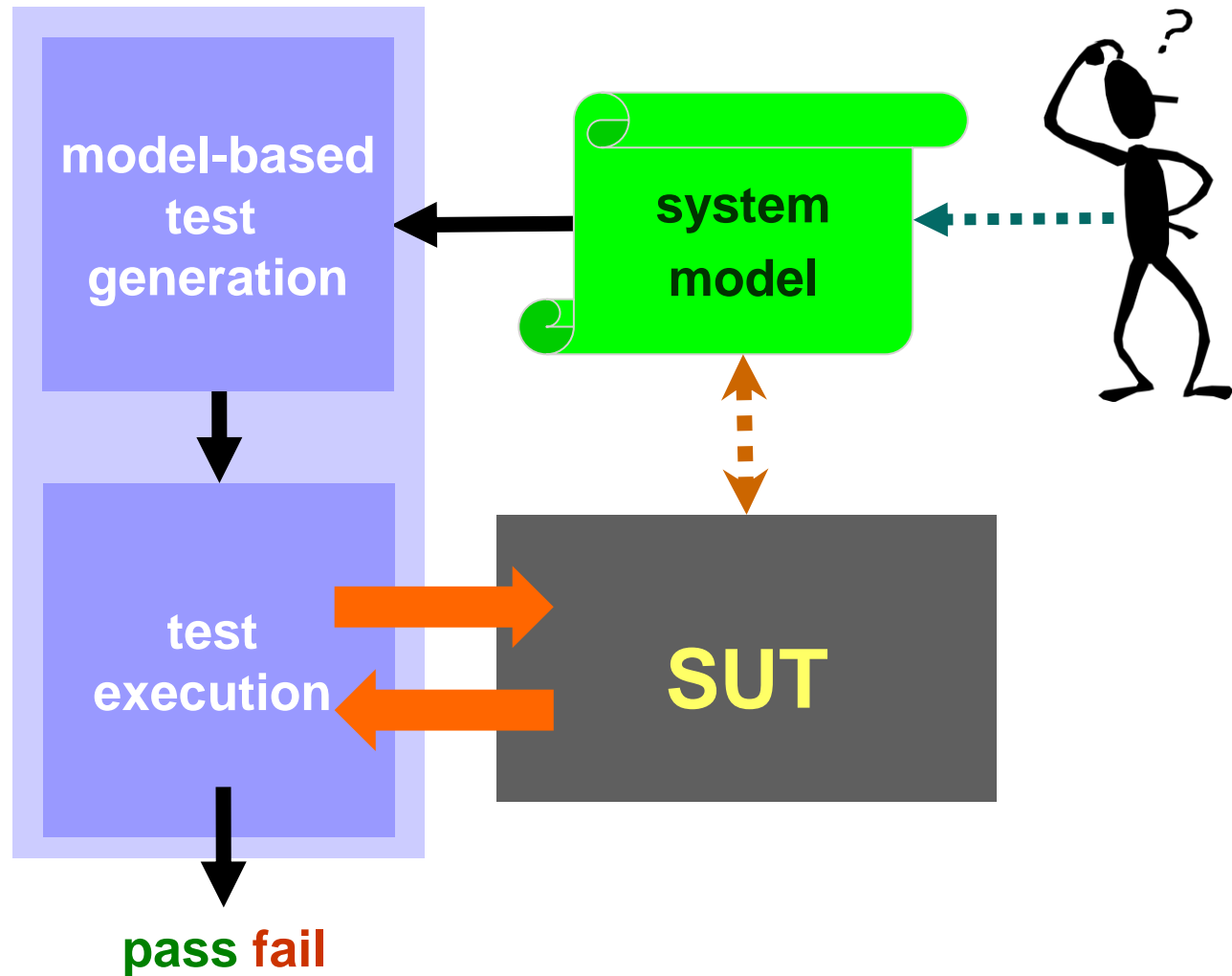
# 3 : Keyword-Driven Testing

- 1. Manual testing
- 2. Scripted testing
- 3. Keyword-driven testing



# 4 : Model-Based Testing

1. Manual testing
2. Scripted testing
3. Keyword-driven testing
4. Model-based testing



# Model-Based Testing

Measuring some quality characteristic of an executing software object by performing experiments in a controlled environment while comparing actual behaviour with required behaviour

functionality

SUT

MBT Tester

specification-based, active, black-box testing of functionality

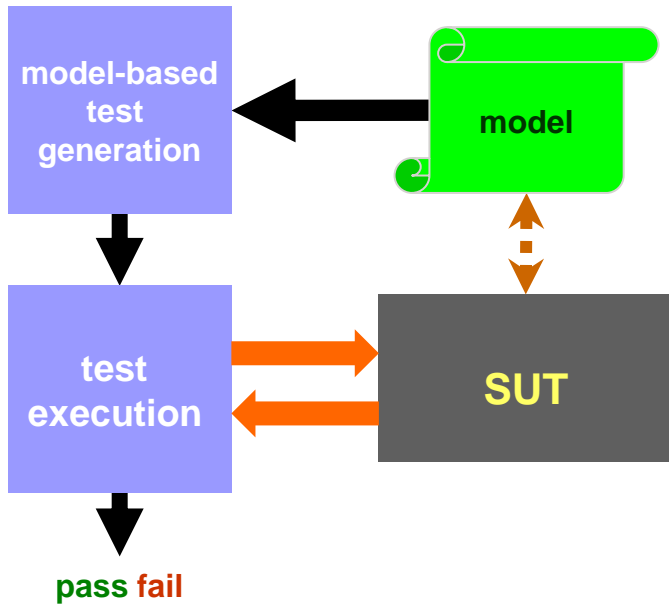
system model

specification  
=  
system model

MBT Test Generation + Execution

SUT

# MBT : Benefits



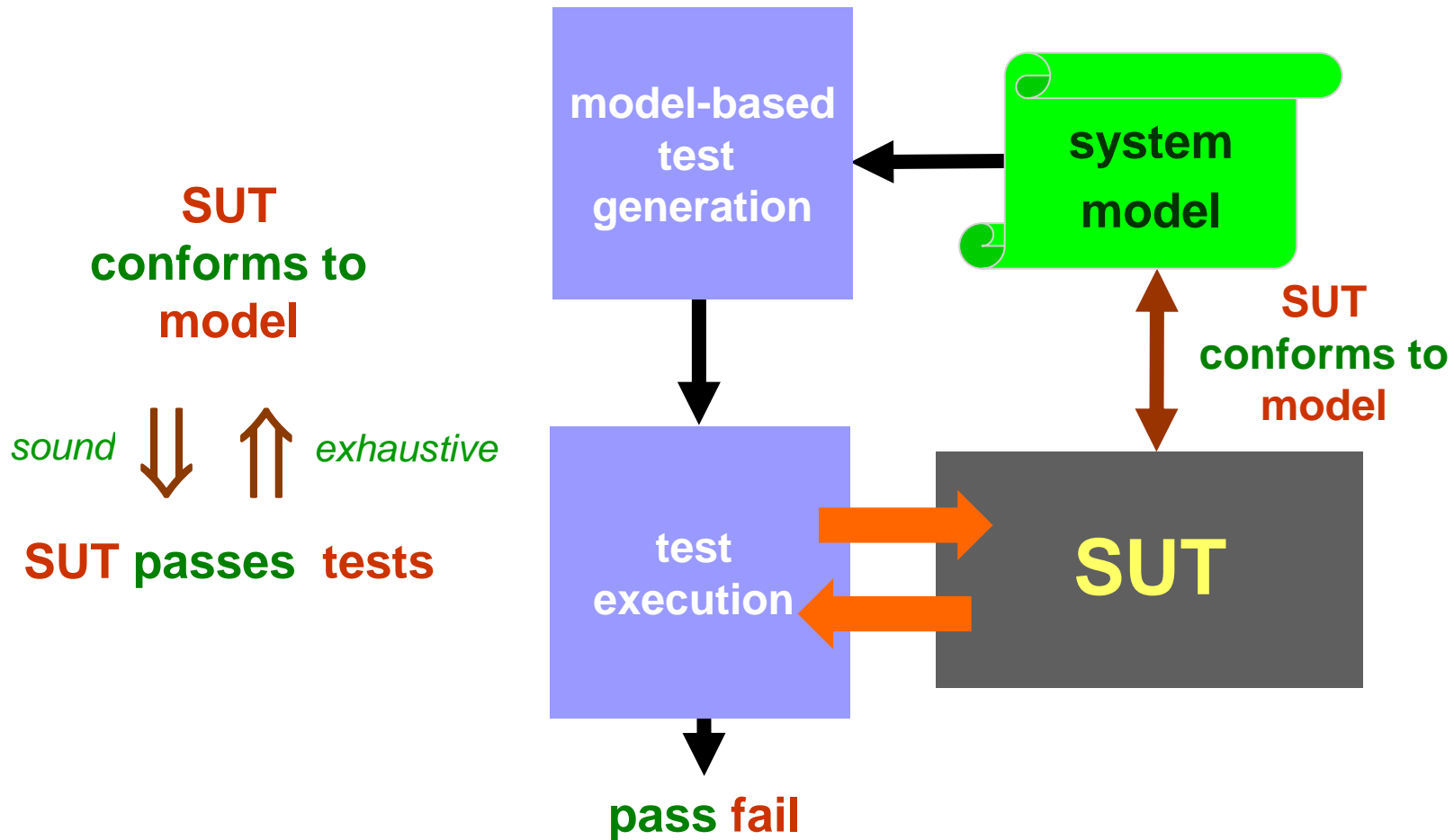
*detecting more bugs  
faster and cheaper*

## MBT: next step in test automation

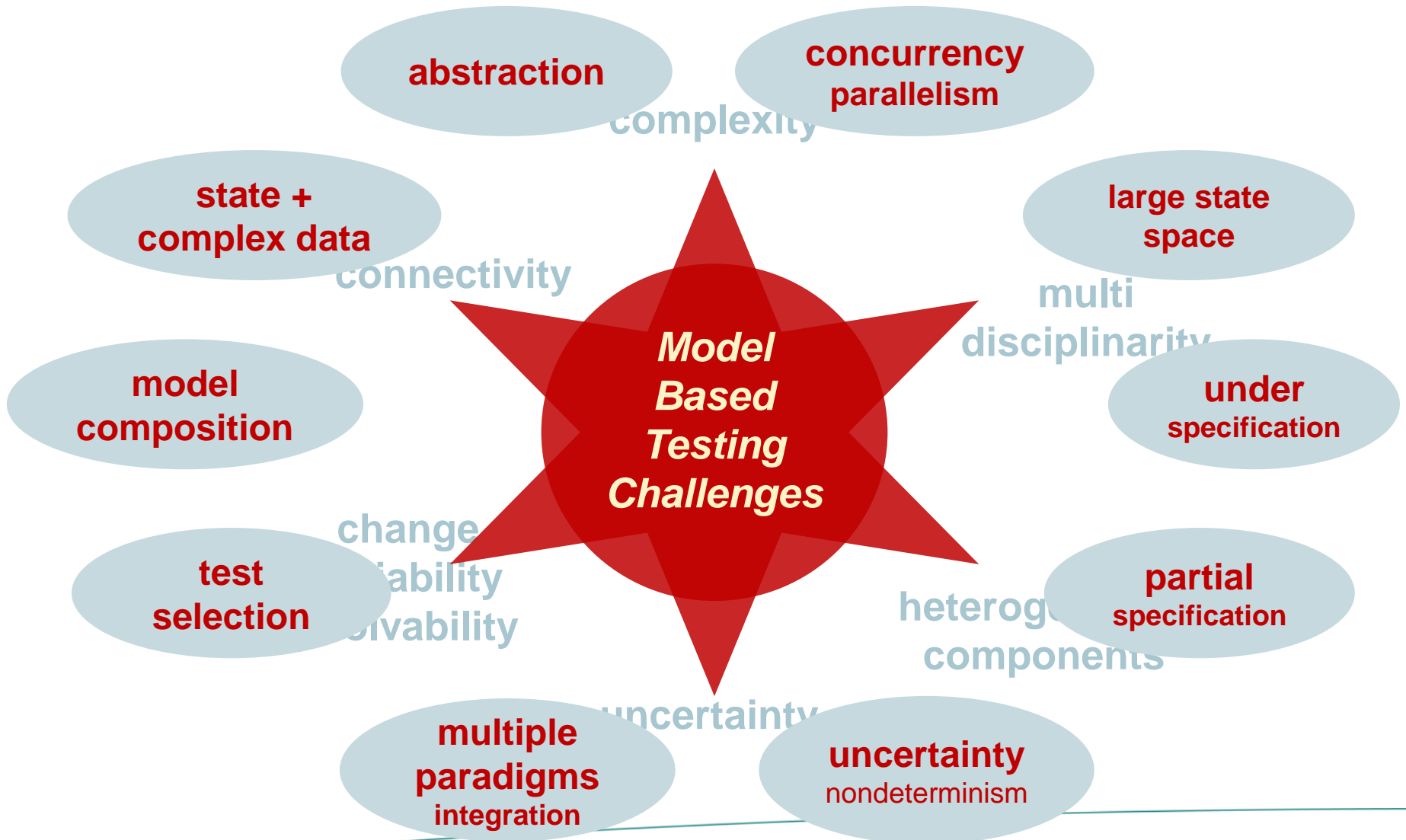
- **Automatic test generation**  
+ test execution + result analysis
- **More, longer, and diversified test cases**  
more variation in test flow and in test data
- **Model is precise and consistent test basis**  
unambiguous analysis of test results
- **Test maintenance by maintaining models**  
improved regression testing
- **Expressing test coverage**  
model coverage  
customer profile coverage



# Model Based Testing



# Model-Based Testing : Challenges



# Models of Systems

# Modelling Methods and Formalisms

- Labelled Transition Systems
- Automata
- Formal Languages
- Petri Nets
- Finite-State Machines  
( Mealy - , Moore Machines )
- (First Order) Properties
- Abstract Data Types
- Streams
- Data Flow Models
- . . . . .
- Functions over Time
- Linear Differential Equations
- PDE
- Simulink Models
- Bayesian Networks
- Queueing Networks
- Fault Trees
- Programming Language Models
- Drawings
- Clay Models
- Paper model
- . . . . .

Modelling Formalism  $\neq$  Modelling Languages

# Modelling Systems

- **Traditional systems theory:** (piecewise-) continuous functions of time; analysis and control with ordinary and partial differential equations
- Nowadays, **Digital systems:** discrete, event-driven



# Modelling Systems

Model  $\neq$  System

- **System** : “something real” ( *realization* )
- **Model** : an “abstraction”
- Model : “*any representation of a system not being the system itself*” (Edward Lee)
- By choosing a model, or a class of models, or a modeling formalism, you determine a *view* on the system (and restrict the properties under consideration)
- *A system is not continuous or discrete, a model is*
- One system has many models, for different purposes:
  - quality characteristics
  - abstraction levels
  - prescriptive  $\leftrightarrow$  descriptive
  - black-box / functional  $\leftrightarrow$  white-box / structural
  - .....

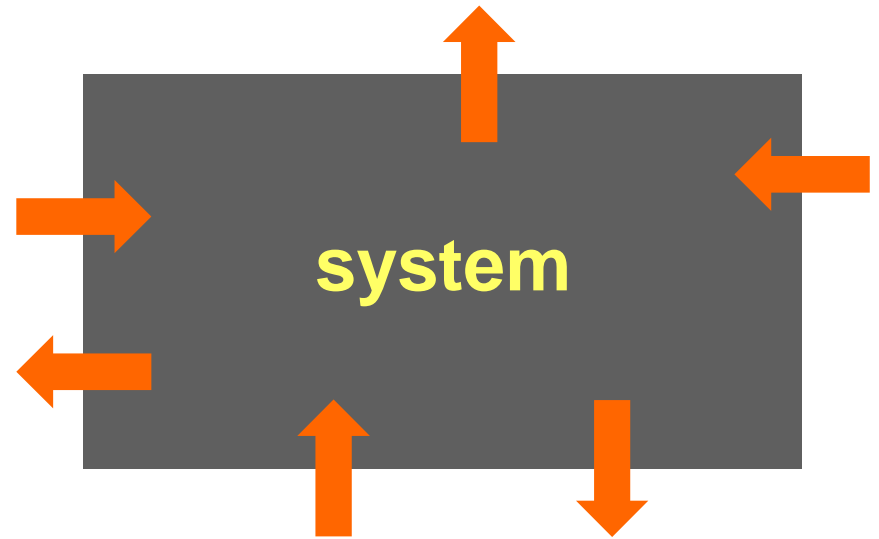
# System Modelling for MBT

## Our systems are digital :

- ☞ *discrete, event-driven,*
- ☞ *reactive, dynamic,*
- ☞ *data-intensive,*
- ☞ *black-box*

## Typical modelling formalisms:

- ☞ automata
- ☞ formal languages, grammar
- ☞ symbolic transition systems
- ☞ (extended) finite-state machine
- ☞ petri nets
- ☞ *labelled transition system*
- ☞ . . . . .



## View on a system:

black box, with discrete,  
atomic events on interfaces:

- ☞ inputs, initiated by environment
- ☞ outputs, initiated by the system

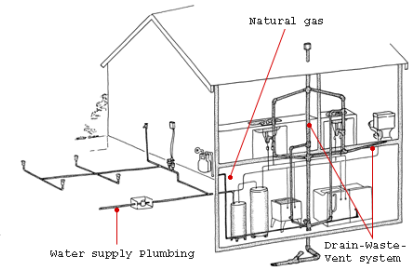
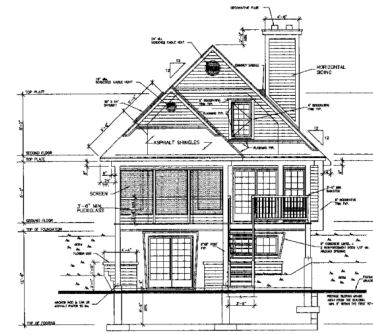
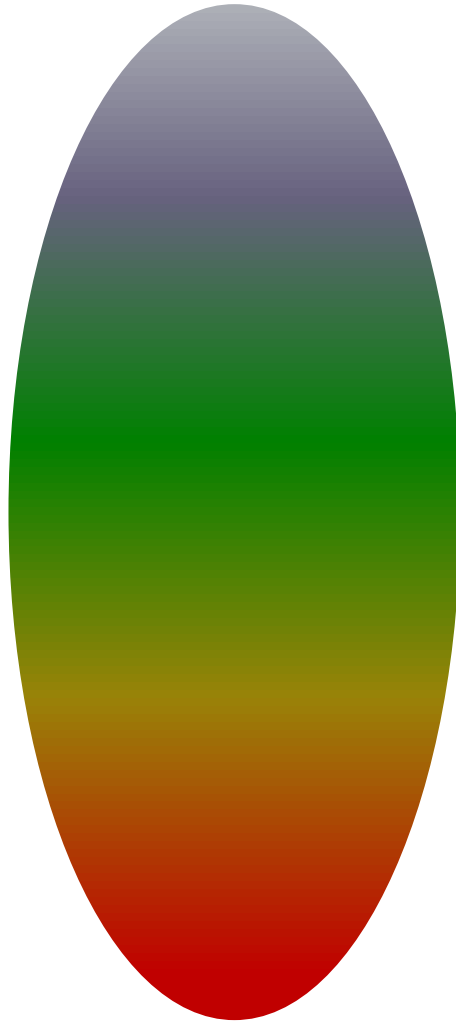
# Spectrum of Models

abstract  
(test)  
models

design  
models

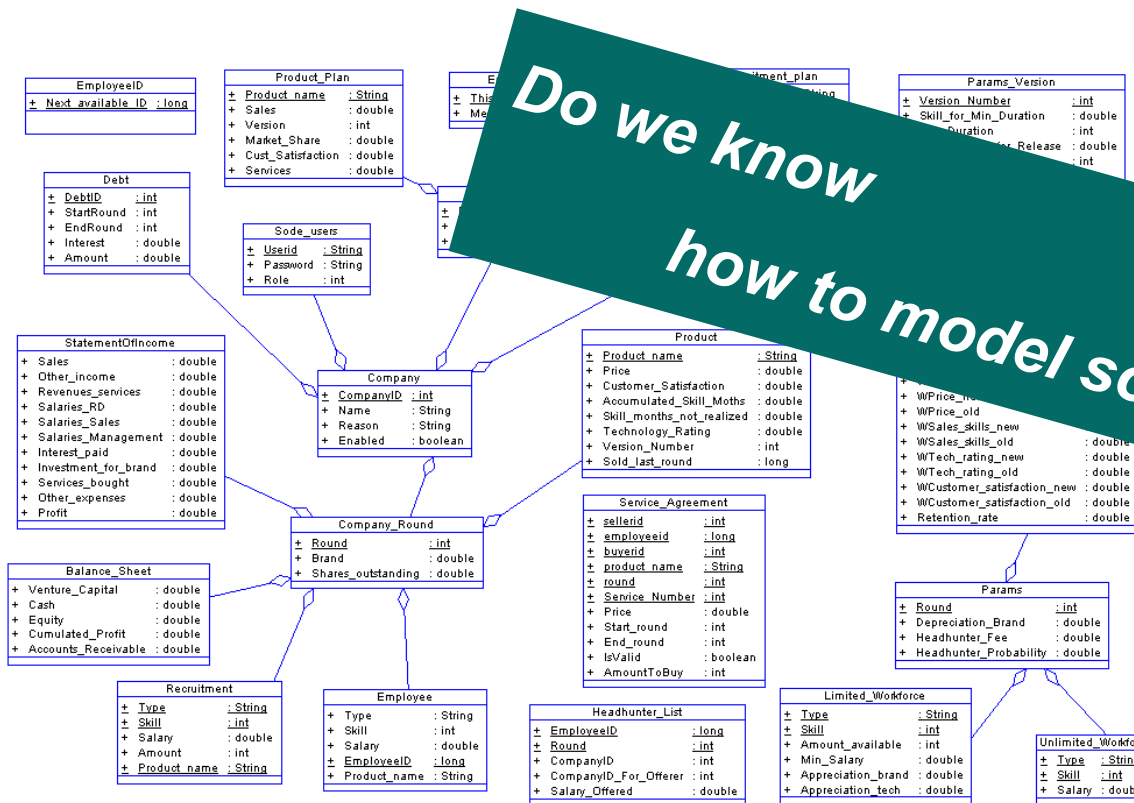
virtualization

realization

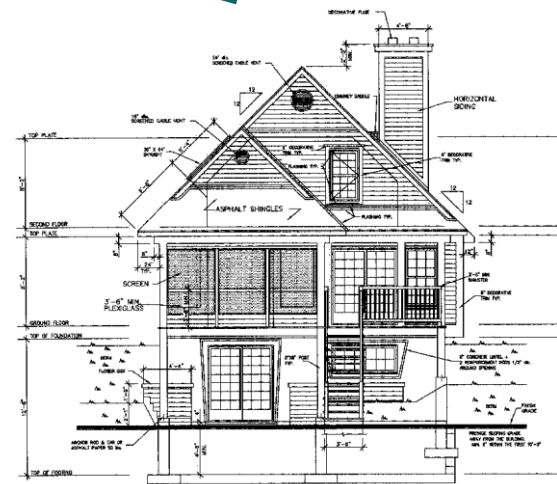




# A Software Model



Do we know how to model software ?



More with

model-based testing

model-based monitoring

simulation

model checking

model learning

model-based prediction

model-based analysis

model-based control

model-driven design

code generation



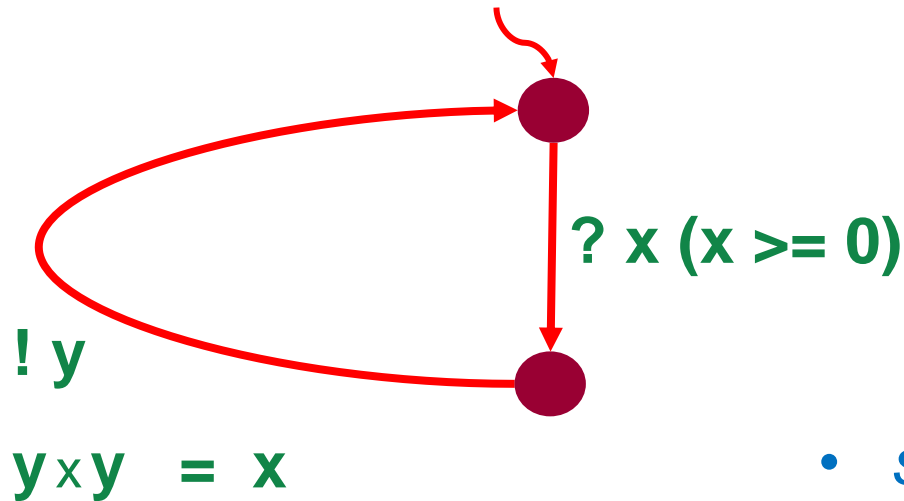
# Code Generation from a Model



A model is more (*less*)  
than code generation:

- views
- abstraction
- testing of aspects
- verification and validation of aspects

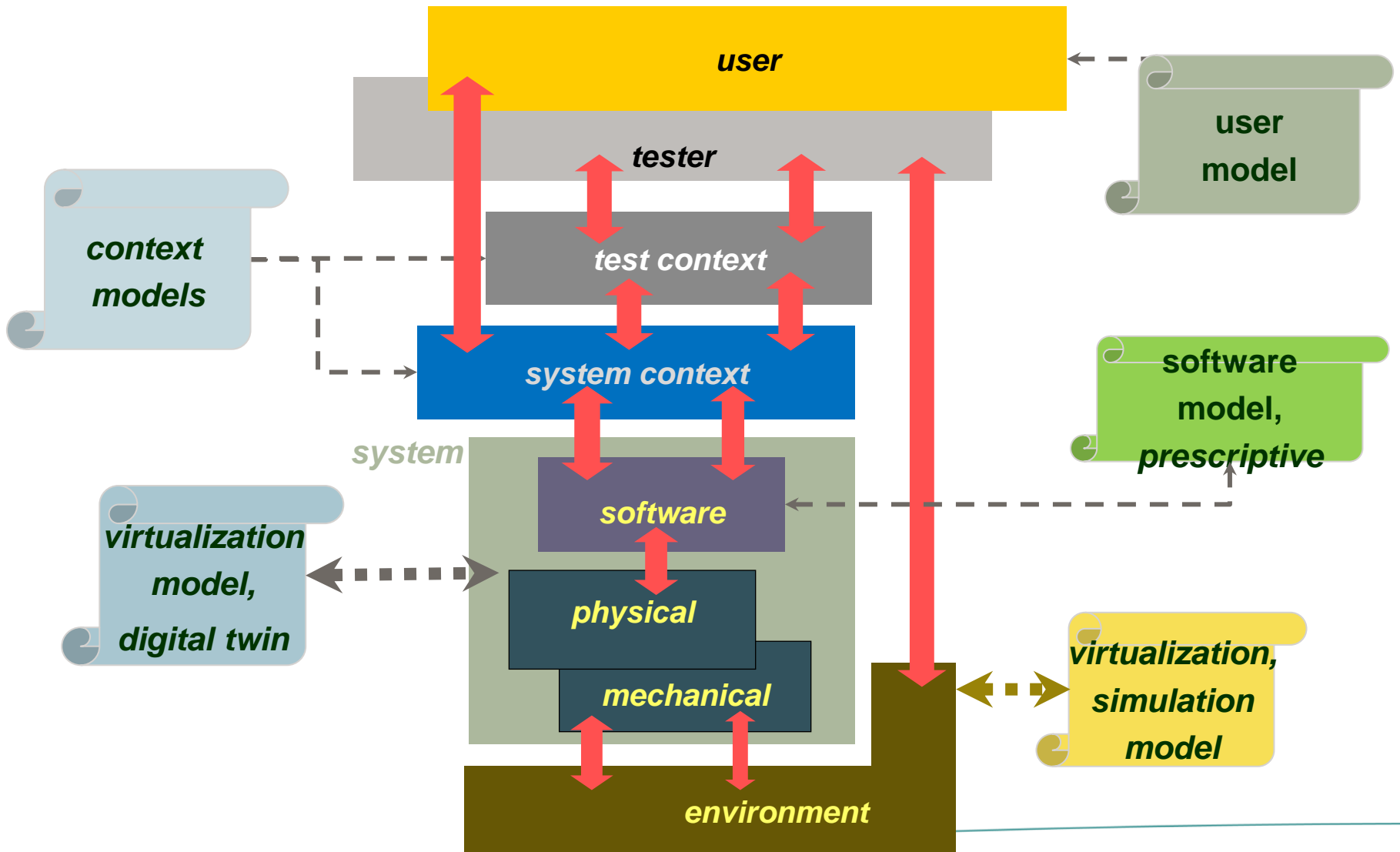
# Code Generation from a Model Not Always Possible



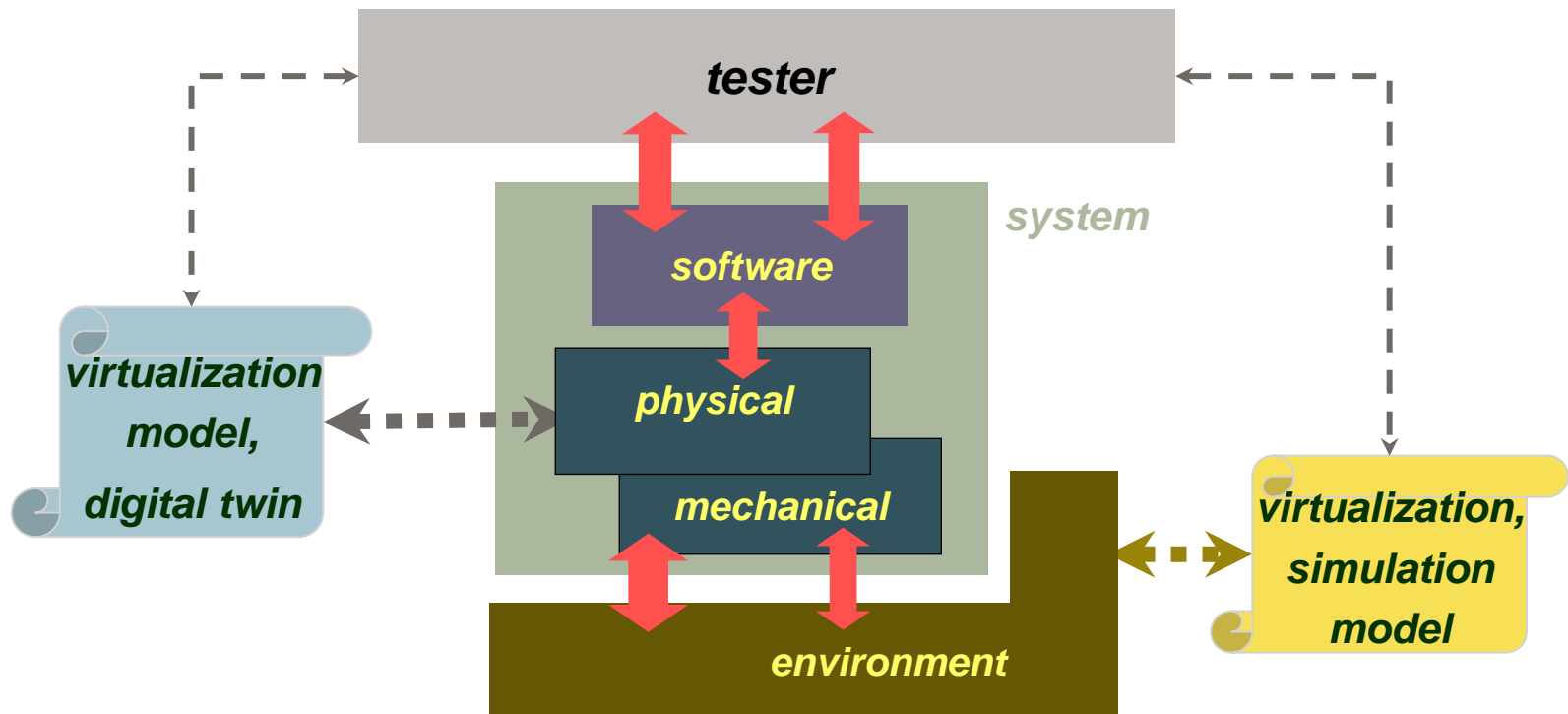
model of  $\sqrt{x}$

- *specification of **properties** rather than construction*
- ***under-specification***
- ***non-determinism***

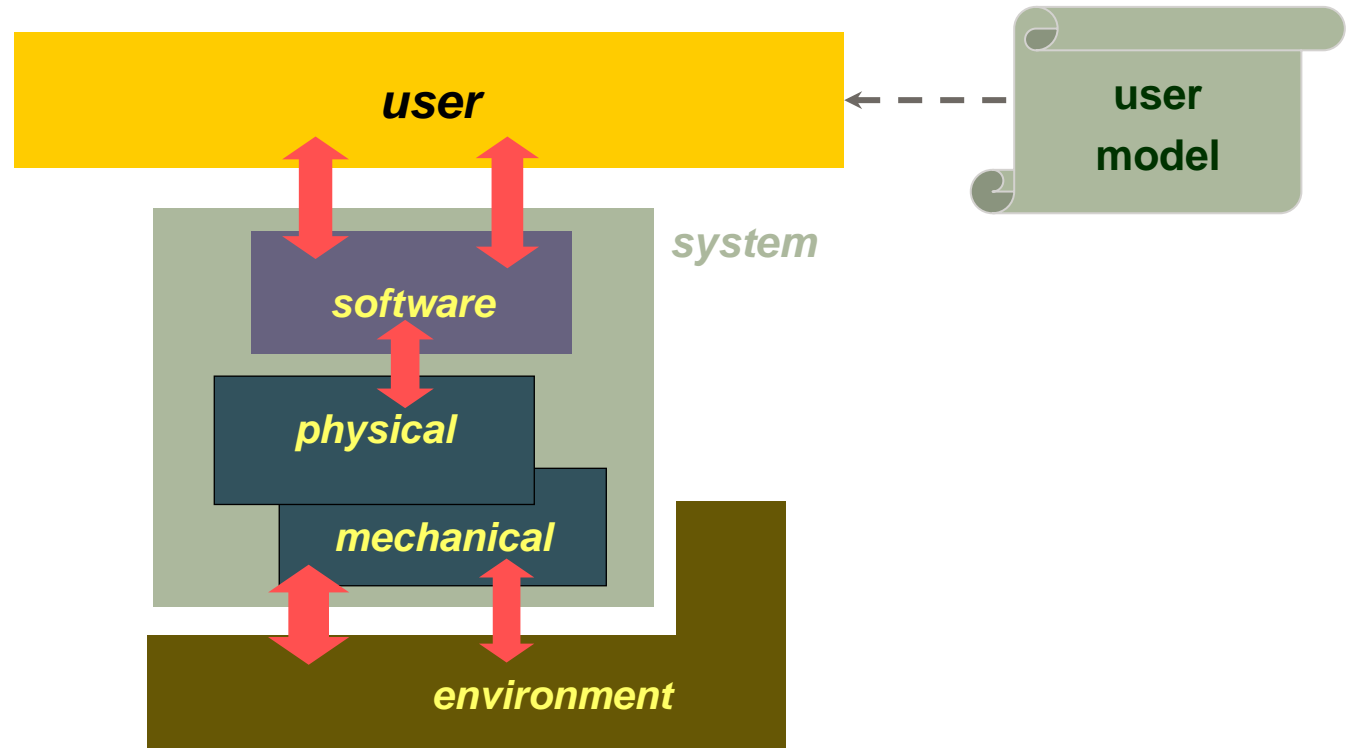
# Models for Testing



# Models for Testing : Stubs



# Models for Testing : Usage Profile



# A Choice of Modelling Formalism :

## Labelled Transition Systems



# Models: Labelled Transition Systems

Labelled Transition System:

$\langle S, L_I, L_U, T, s_0 \rangle$

states

input labels

output labels

transitions

$T \subseteq S \times (L \cup \{\tau\}) \times S$

initial state

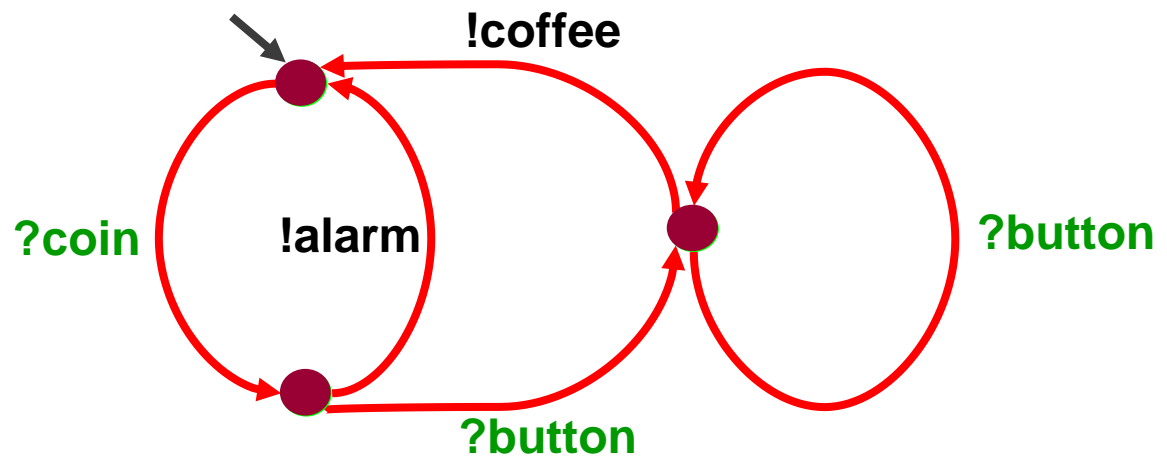
$s_0 \in S$

? = input

! = output

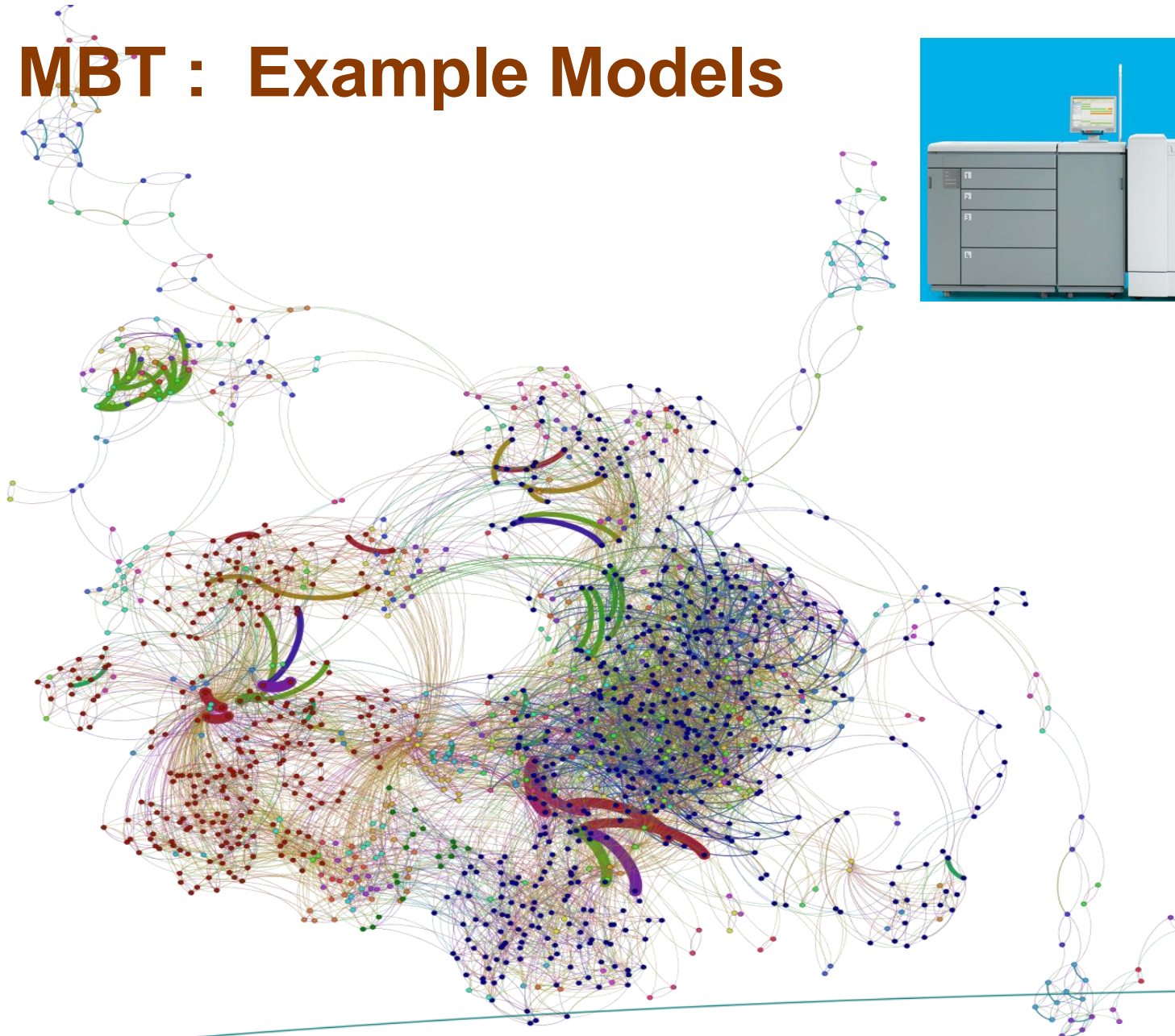
$L = L_I \cup L_U$

$L_I \cap L_U = \emptyset$

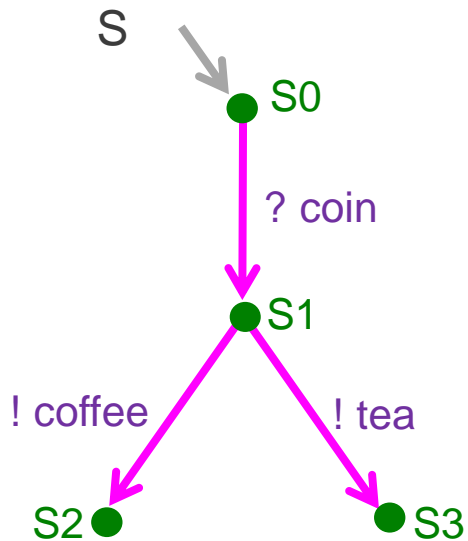




# MBT : Example Models



# LTS : Representation



- Explicit :  $\langle \{ S0, S1, S2, S3 \},$   
 $\{ ?\text{coin} \},$   
 $\{ !\text{coffee}, !\text{tea} \},$   
 $\{ ( S0, ?\text{coin}, S1 ),$   
 $( S1, !\text{coffee}, S2 ),$   
 $( S1, !\text{tea}, S3 ) \},$   
 $S0 \rangle$

- Transition tree / graph

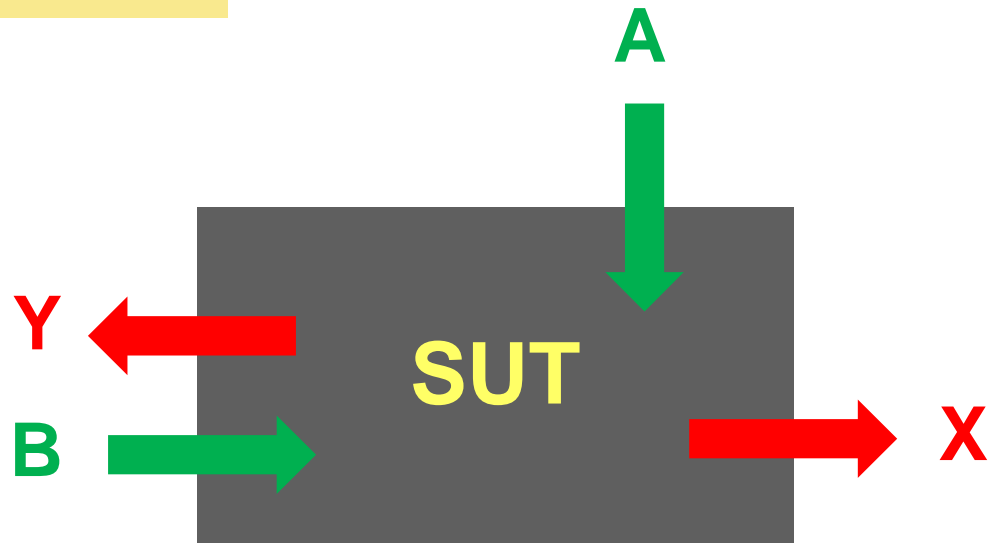
- Language :

**S ::= Coin >-> ( Coffee ## Tea )**

# LTS : A Black-Box View on Systems

- Inputs Channels: **A**; **B**
- Output Channels: **X**; **Y**

*A black-box view on a system starts with its **interfaces***



# STS : A Black-Box View on Systems

## *Symbolic Transition System*

channels with messages :

Symbolic Trabs

- Inputs Channels:

**A :: Int; B :: Struct**

- Output Channels:

**X :: Int; Y :: String**

## **SUT**

*real, black-box system  
communicating with its  
environment*

*via messages on input- and  
output channels*

**Y ! `yes`**

**B ? s**



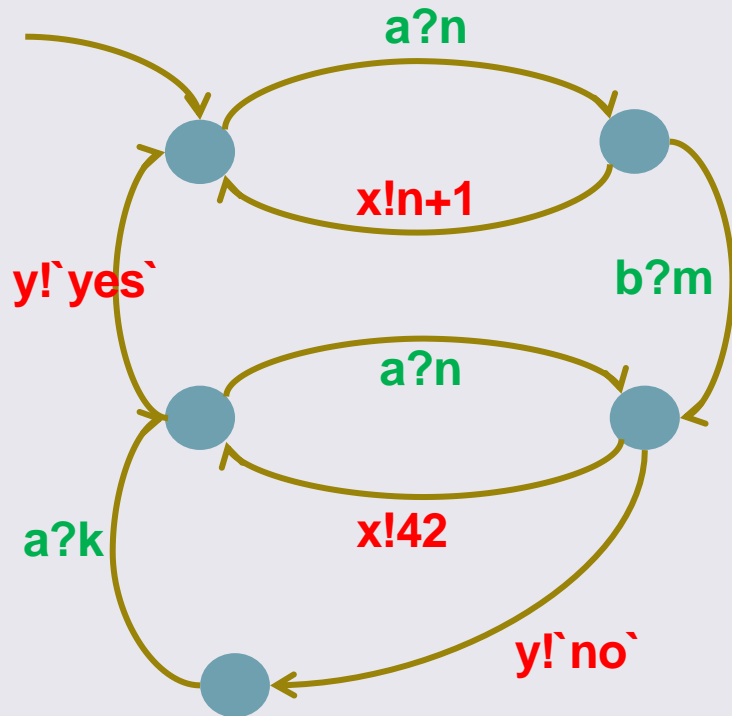
**SUT**



**X ! n+1**

# A View on Systems and Models

model



black-box  
system view

Abstracted from :

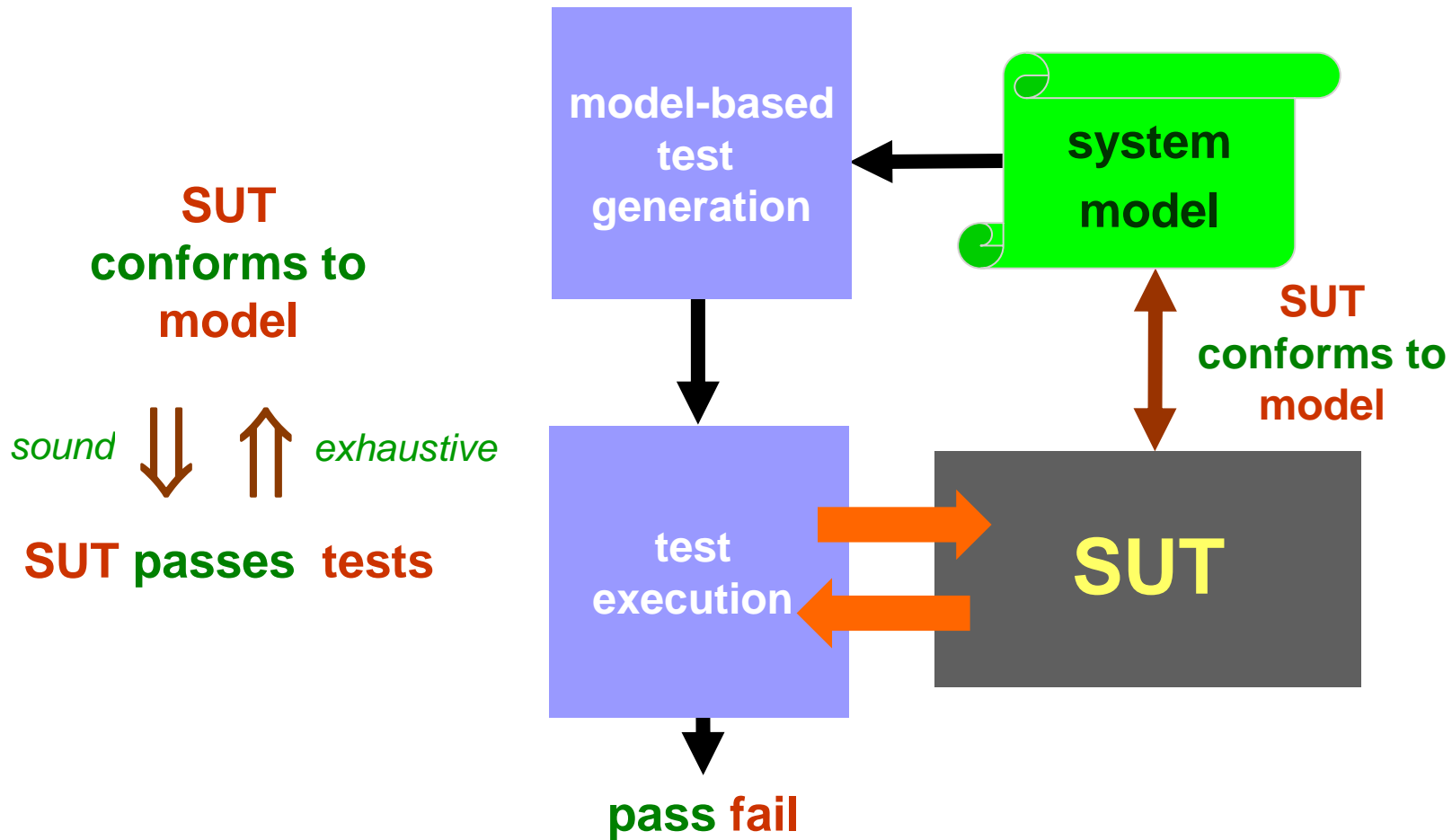
- real-time
- probabilities
- derivatives (hybrid)

modelled as  
a symbolic  
transition system

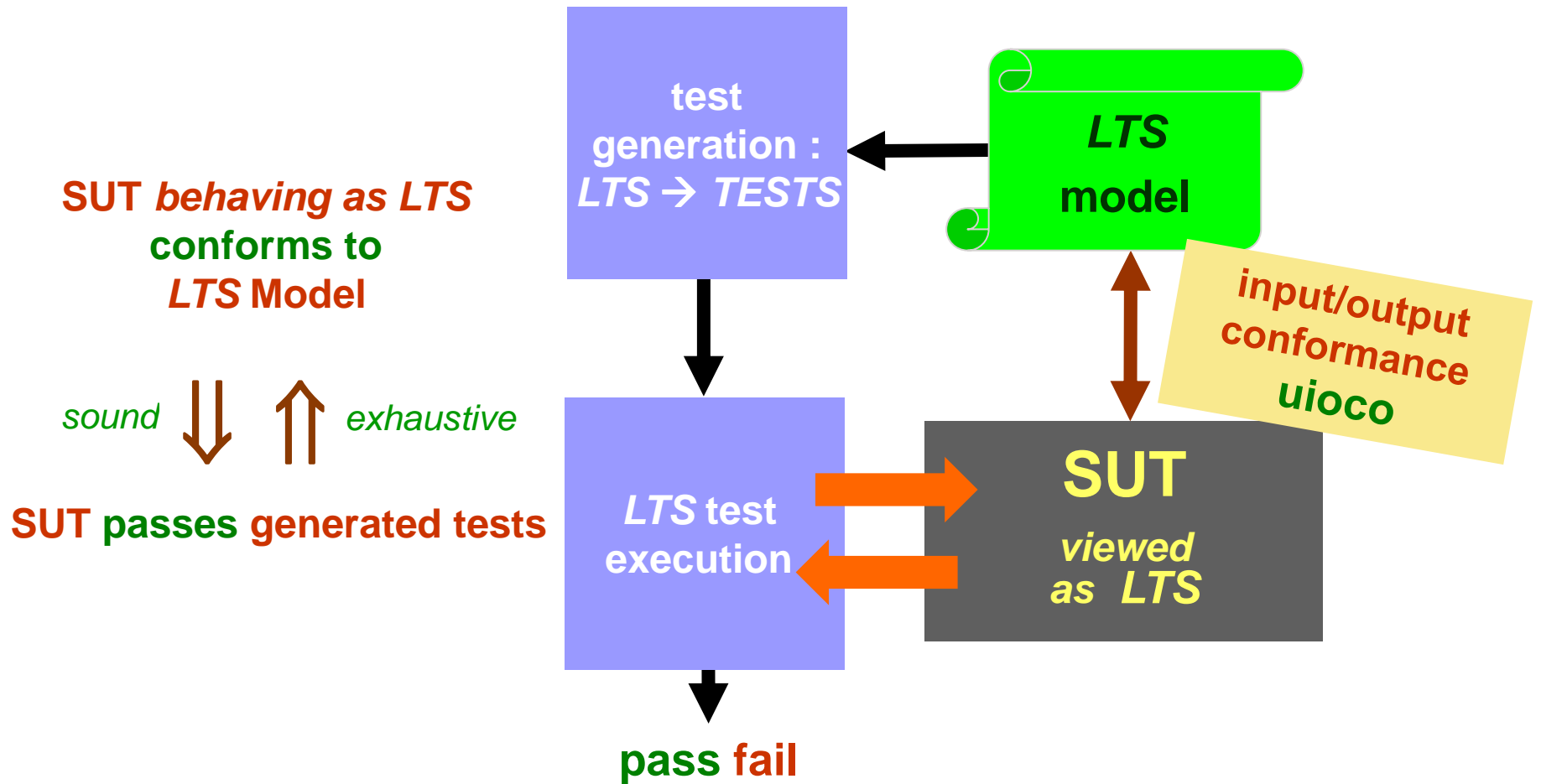
# Model-Based Testing with Labelled Transition Systems



# Model Based Testing

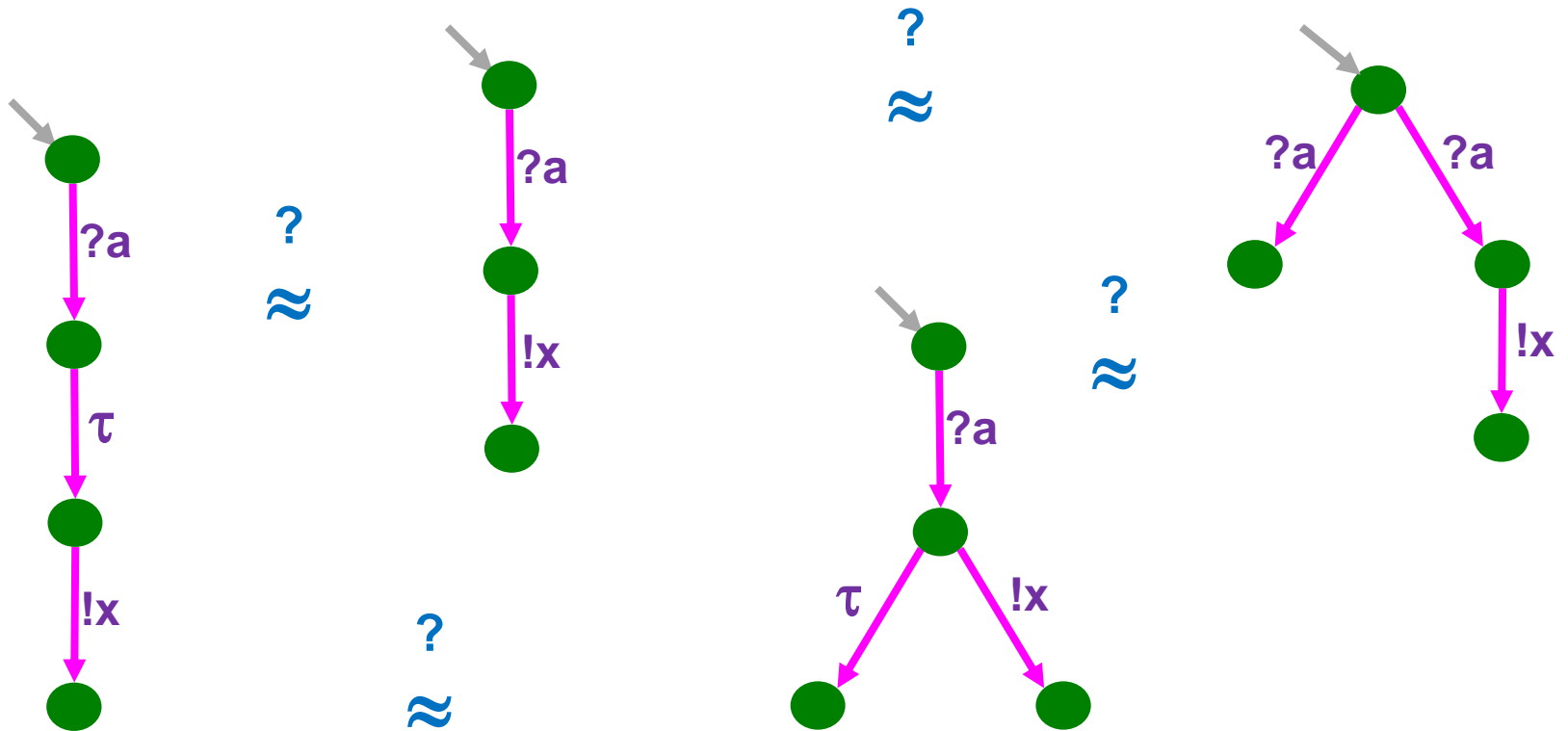


# Model Based Testing with LTS



# Equivalences on Labelled Transition Systems

# Observable Behaviour



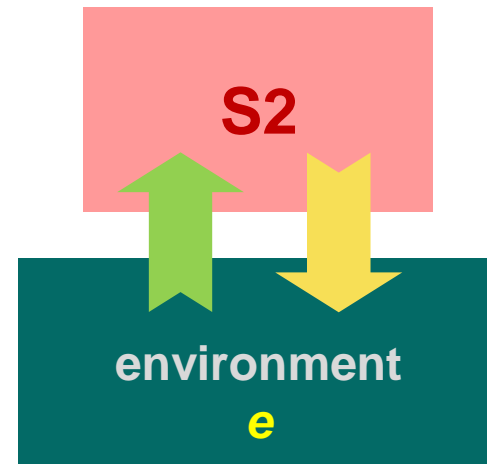
***“ Some transition systems  
are more equal than others “***

# Comparing Transition Systems

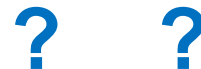


- Suppose an environment interacts with the systems:
  - the environment **tests** the system as **black box** by **observing** and actively **controlling** it;
  - the environment acts as a **tester**;
- Two systems are **equivalent** iff they pass the same tests.

# Comparing Transition Systems



$$S1 \approx S2 \iff \forall t \in T. \text{obs}(t, S1) = \text{obs}(t, S2)$$



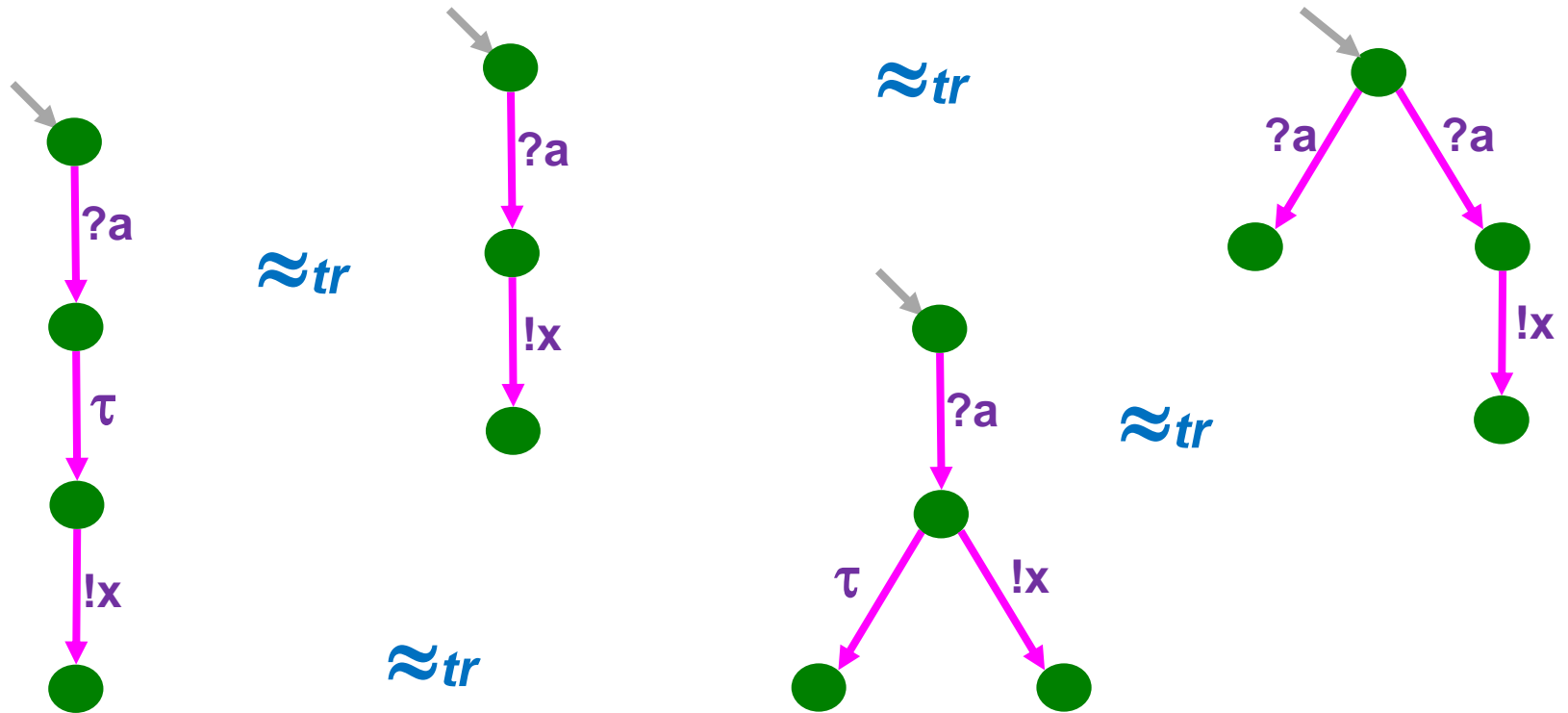
# Comparing Transition Systems



$$S1 \approx_{tr} S2 \iff \text{traces}(S1) = \text{traces}(S2)$$

Traces:  $\text{traces}(S) = \{ \sigma \in L^* \mid S \xRightarrow{\sigma} \}$

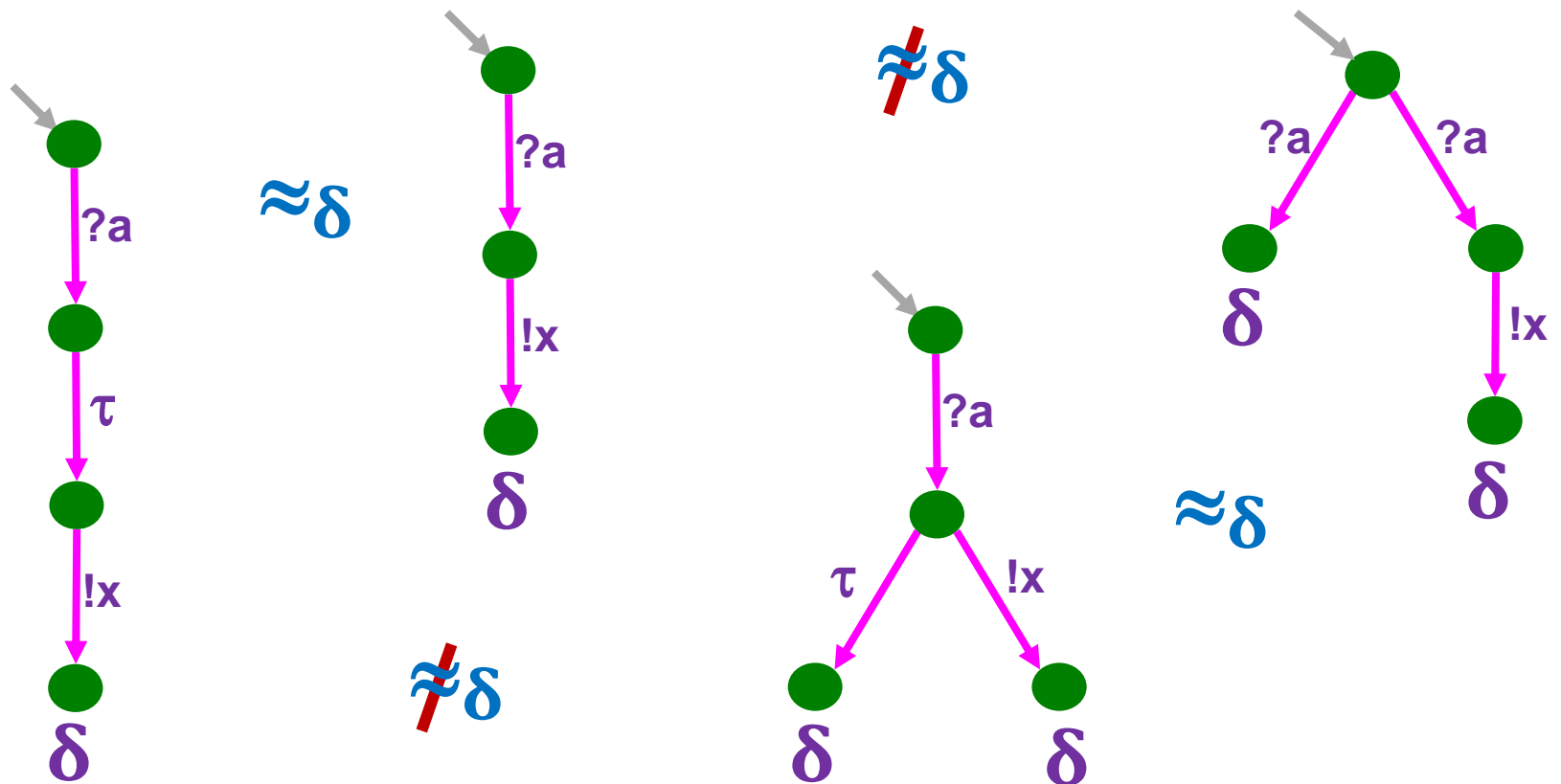
# Trace Equivalence



for all:  $traces (. ) = \{ \epsilon , ?a , ?a.!x \}$



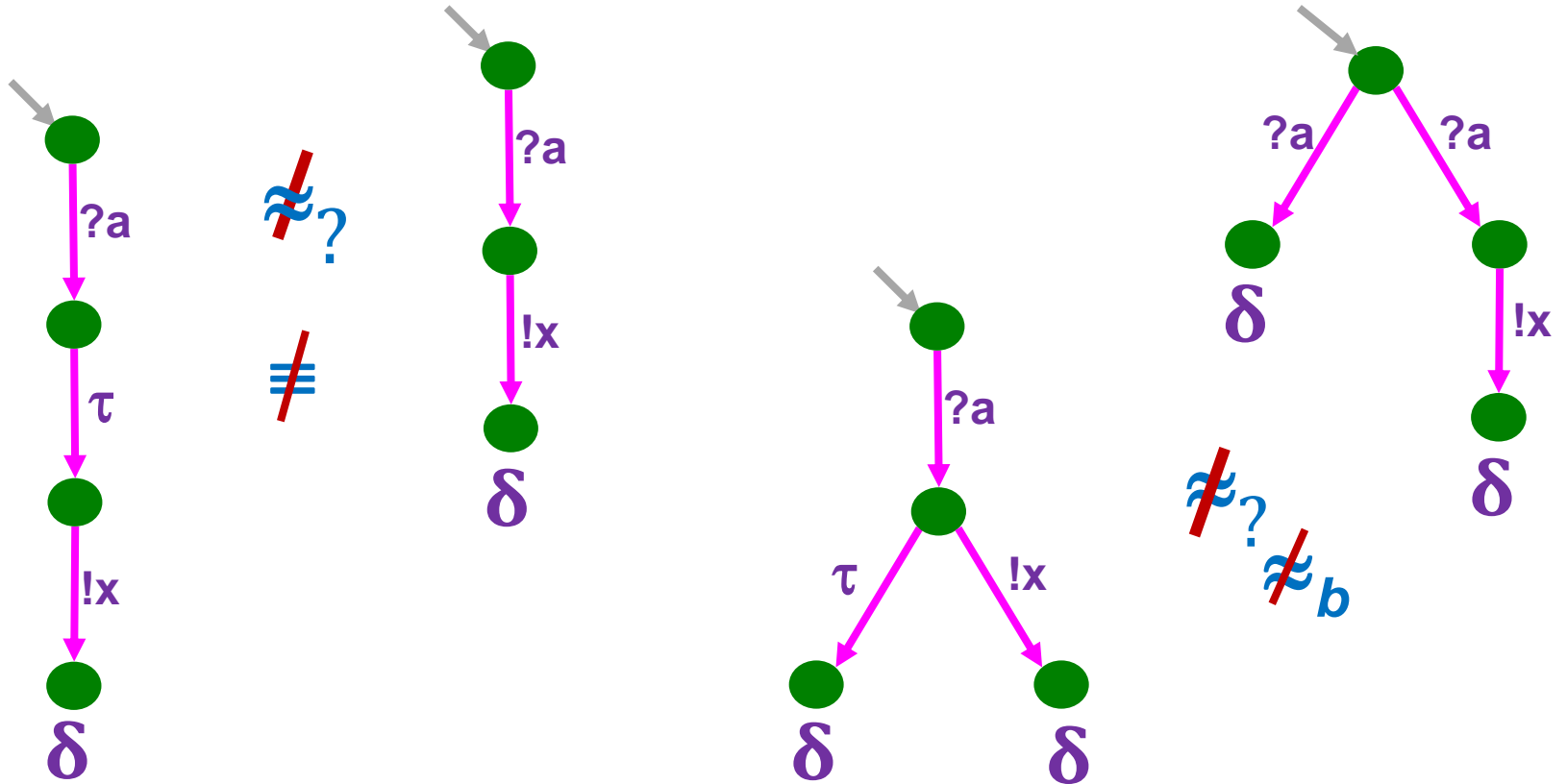
# Equivalence with $\delta$



$$p \xrightarrow{\delta} p = \forall !x \in L_U \cup \{\tau\}. p \not\xrightarrow{!x}$$

$$\text{Straces}(s) = \{ \sigma \in (L \cup \{\delta\})^* \mid s \xRightarrow{\sigma} \}$$

# Stronger Equivalences



# MBT : Equivalences

1. *equivalent if they have the same behaviours*

$$S1 \approx S2 \Leftrightarrow \text{traces}(S1) = \text{traces}(S2)$$

$$S1 \approx S2 \Leftrightarrow \text{Straces}(S1) = \text{Straces}(S2)$$

2. *equivalent if they pass the same tests*

$$S1 \approx S2 \Leftrightarrow \forall t \in T. S1 \text{ passes } t \Leftrightarrow S2 \text{ passes } t$$

3. *equivalent if they allow the same implementations*

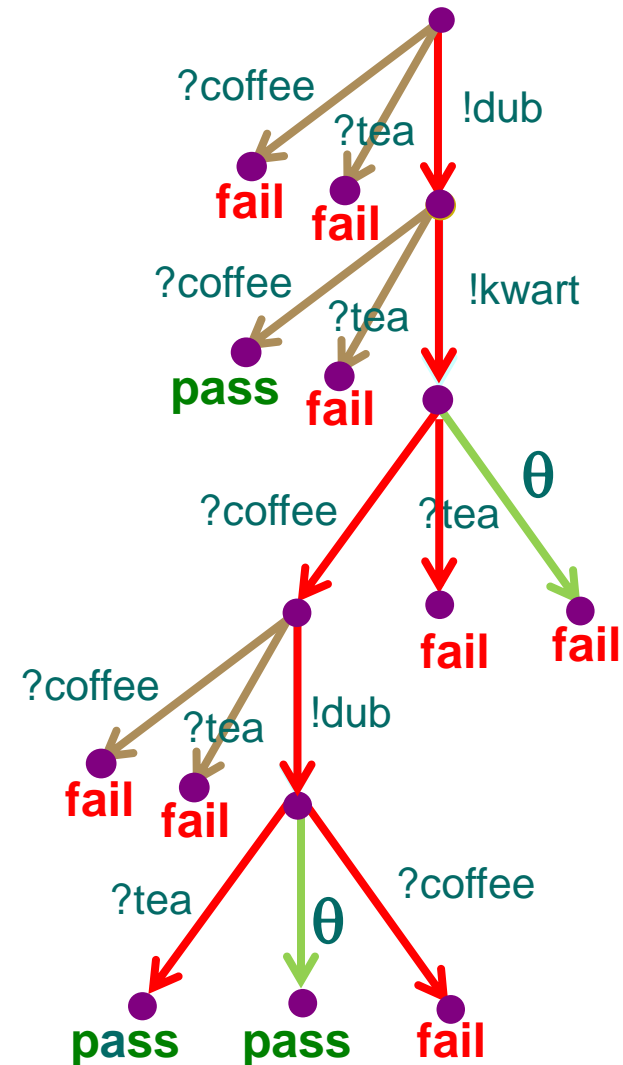
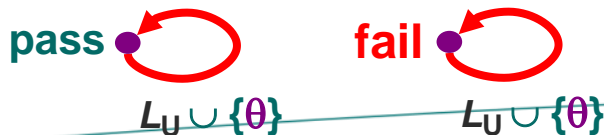
$$S1 \approx S2 \Leftrightarrow \text{Imp}(S1) = \text{Imp}(S2)$$

# A Choice of Test Cases

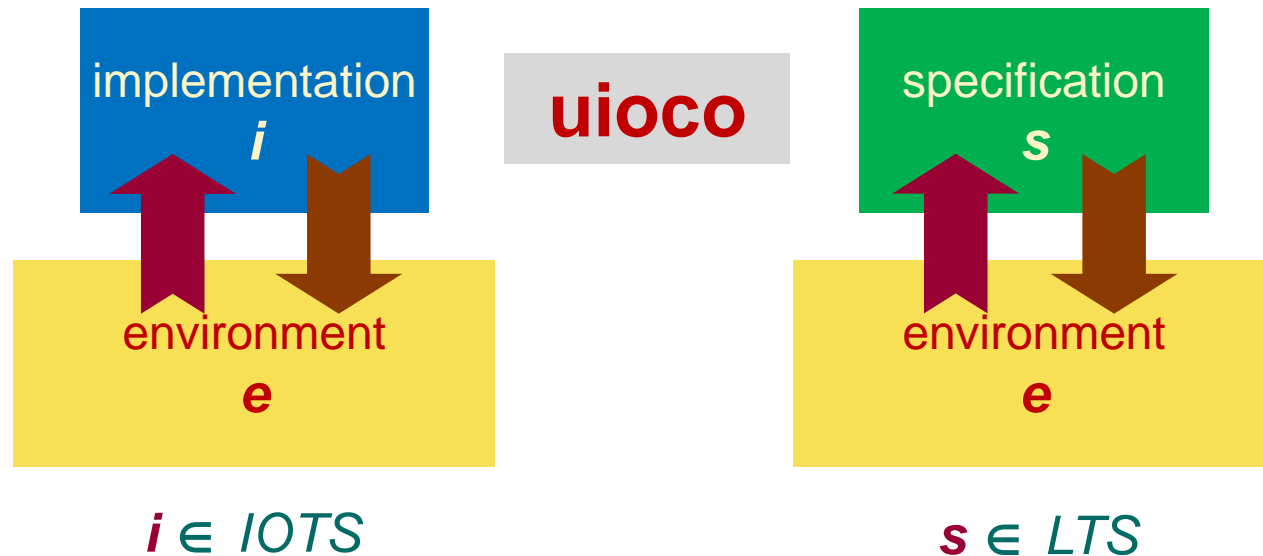
*model of a test case*

= *labelled transition system*

- labels in  $L_I \cup L_U \cup \{\theta\}$
- ‘quiescence’ / ‘time-out’ label  $\theta$
- tree-structured
- finite, deterministic
- sink states **pass** and **fail**
- from each state  $\neq$  **pass**, **fail** :
  - either one input **!a** and all outputs **?x**
  - or all outputs **?x** and  $\theta$



# A Choice of Implementation Relation: *uioco*



$$\mathbf{uioco} \subseteq IOTS(L_I, L_U) \times LTS(L_I, L_U)$$

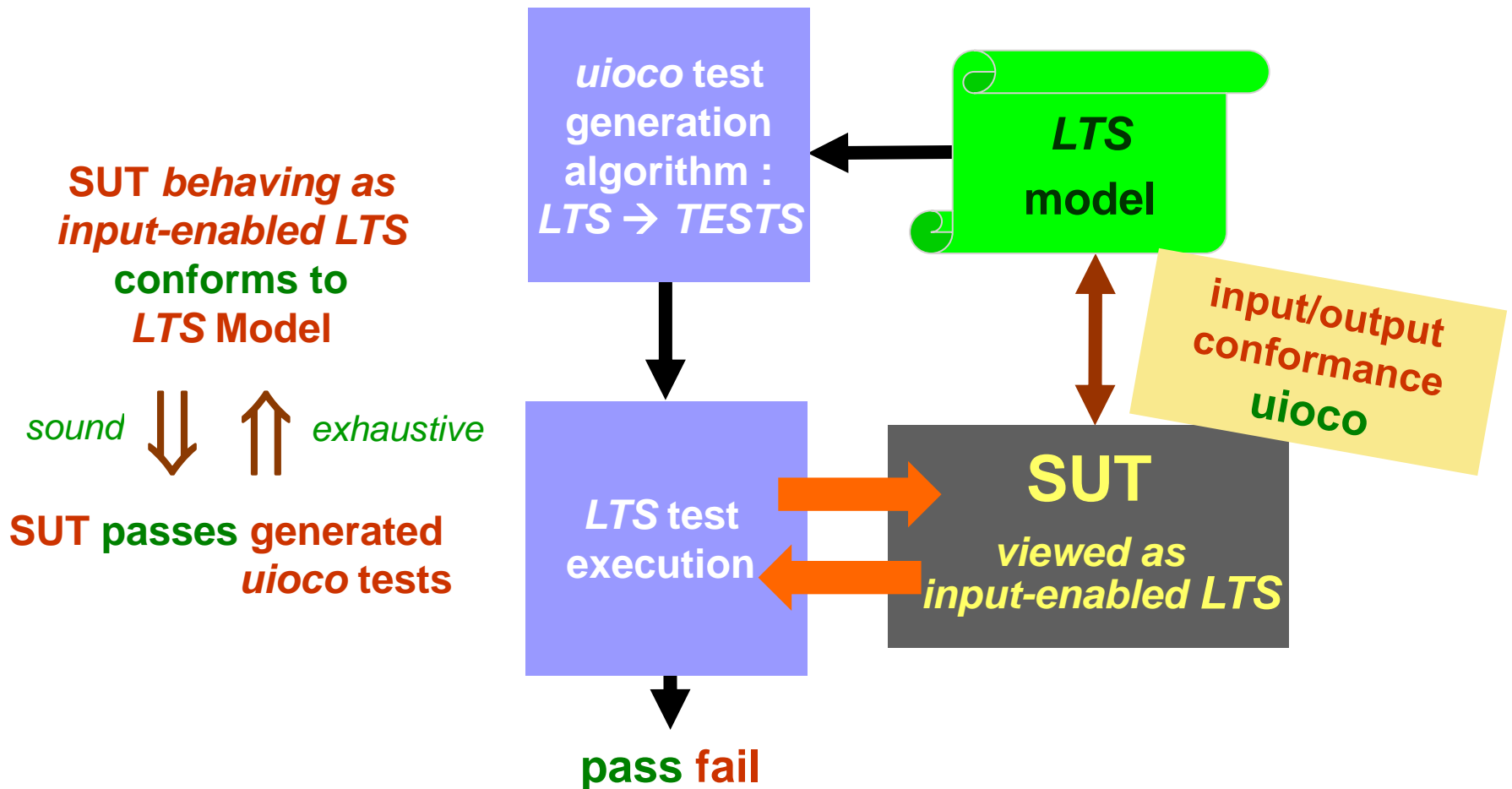
***IOTS***:  
input  
enabled  
*LTS*

$i \mathbf{uioco} s$

$i$  is a conforming implementation of  $s$

# MBT with Labelled Transition Systems and **uioco**

# Model Based Testing with LTS and *uioco*



# Input/Output Conformance : *uioco*

$$i \text{ uioco } s \stackrel{\text{def}}{=} \forall \sigma \in \text{Utraces}(s) : \text{out}(i \text{ after } \sigma) \subseteq \text{out}(s \text{ after } \sigma)$$

$s$  is a Labelled Transition System

$i$  is (assumed to be) an input-enabled LTS

$$s \text{ after } \sigma = \{ s' \mid s \xRightarrow{\sigma} s' \}$$

$$s \text{ refuses } A \iff \forall \mu \in A \cup \{\tau\} : s \not\xrightarrow{\mu}$$

$$s \xrightarrow{\delta} s \iff s \text{ refuses } L_U$$

$$\text{Straces}(s) = \{ \sigma \in (L \cup \{\delta\})^* \mid s \xRightarrow{\sigma} \}$$

$$\text{Utraces}(s) = \{ \sigma \in \text{Straces}(s) \mid \forall \sigma_1 \text{ ?b } \sigma_2 = \sigma : \text{not}(s \text{ after } \sigma_1 \text{ refuses } \{\text{?b}\}) \}$$

$$\text{out}(P) = \{ !x \in L_U \mid \exists p \in P : p \xrightarrow{!x} \} \cup \{ \delta \mid \exists p \in P : p \xrightarrow{\delta} p \}$$



# Input/Output Conformance : *uioco*

$i \text{ uioco } s \stackrel{\text{def}}{=} \forall \sigma \in \text{Utraces}(s) : \text{out}(i \text{ after } \sigma) \subseteq \text{out}(s \text{ after } \sigma)$

$s$  is a Labelled Transition System

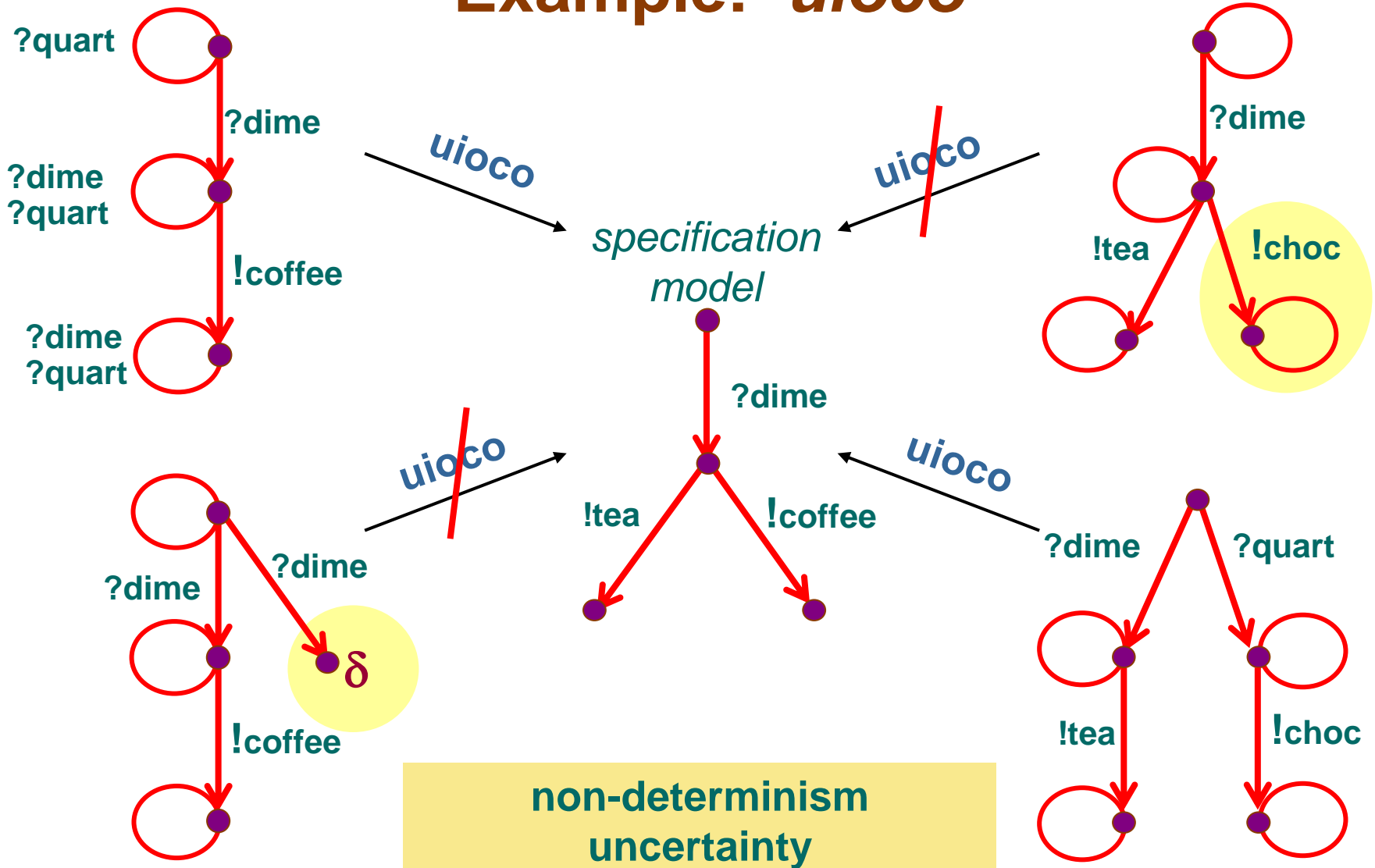
$i$  is (assumed to be) an input-enabled LTS

Intuition:

$i$  **uioco**-conforms to  $s$ , iff

- if  $i$  produces output  $x$  after  $U$ -trace  $\sigma$ ,  
then  $s$  can produce  $x$  after  $\sigma$
- if  $i$  cannot produce any output after  $U$ -trace  $\sigma$ ,  
then  $s$  cannot produce any output after  $\sigma$  (called *quiescence*  $\delta$ )

# Example: *uioco*



# Test Generation Algorithm : *uioco*

Algorithm to generate a test case  $t(S)$

from a transition system state set  $S$ , with  $S \neq \emptyset$ , and initially  $S = s_0$  after  $\varepsilon$

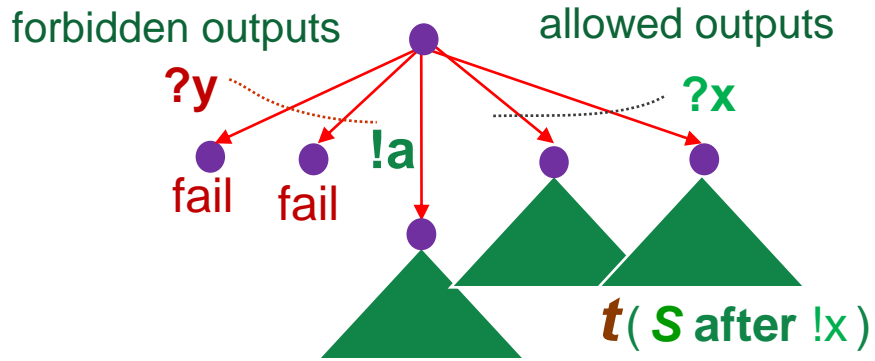
Apply the following steps recursively, non-deterministically :

1 end test case

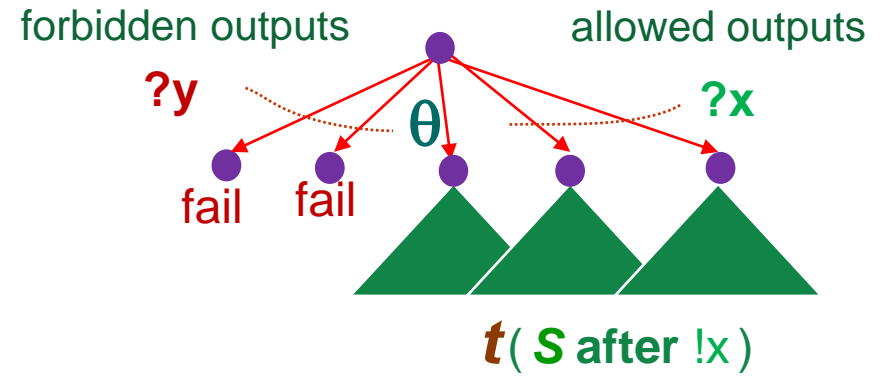
• pass

3 observe all outputs

2 supply input !a

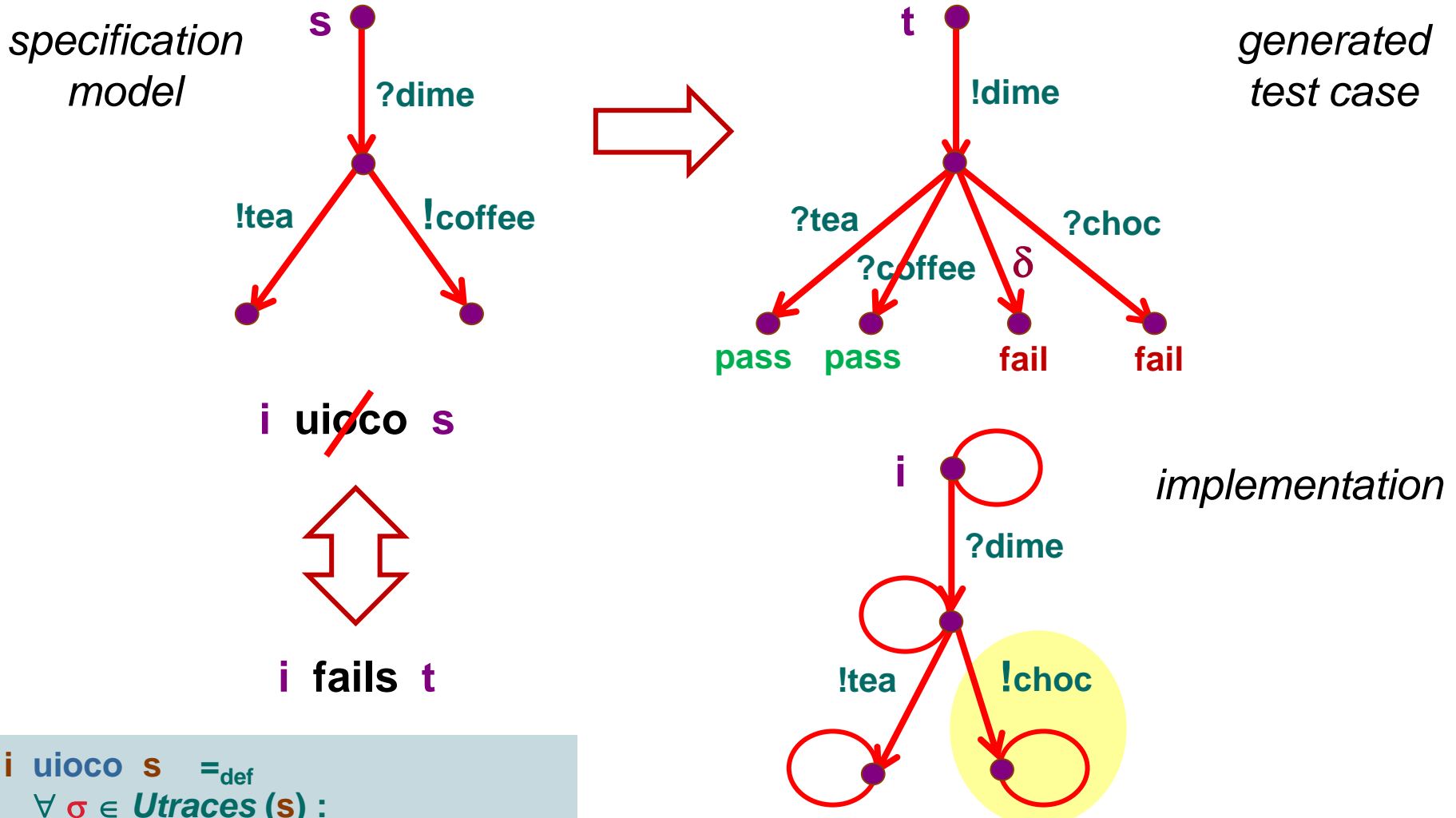


$t(S \text{ after } ?a)$ , for  $?a \in L_I$   
and *not*  $S$  refuses  $\{?a\}$



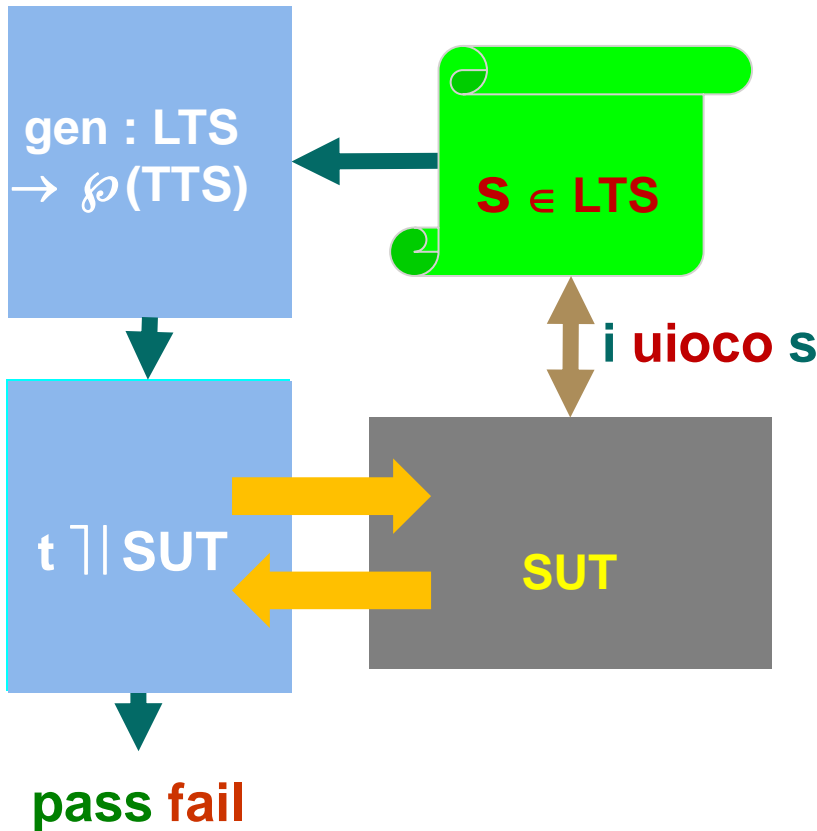
allowed outputs (or  $\delta$ ):  $!x \in out(S)$   
forbidden outputs (or  $\delta$ ):  $!y \notin out(S)$

# Example: *uioco* Test Generation



$i \text{ uioco } s \stackrel{\text{def}}{=} \forall \sigma \in \text{Utraces}(s) : \text{out}(i \text{ after } \sigma) \subseteq \text{out}(s \text{ after } \sigma)$

# MBT with *uioco* is Sound and Exhaustive



**Testability assumption :**

$\forall \text{SUT} \in \text{IMP} . \exists m_{\text{SUT}} \in \text{IOTS} .$

$\forall t \in \text{TESTS} .$

**SUT passes  $t \Leftrightarrow m_{\text{SUT}}$  passes  $t$**

**Prove soundness and exhaustiveness:**

$\forall i \in \text{IOTS} .$

$( \forall t \in \text{gen}(s) . i \text{ passes } t )$

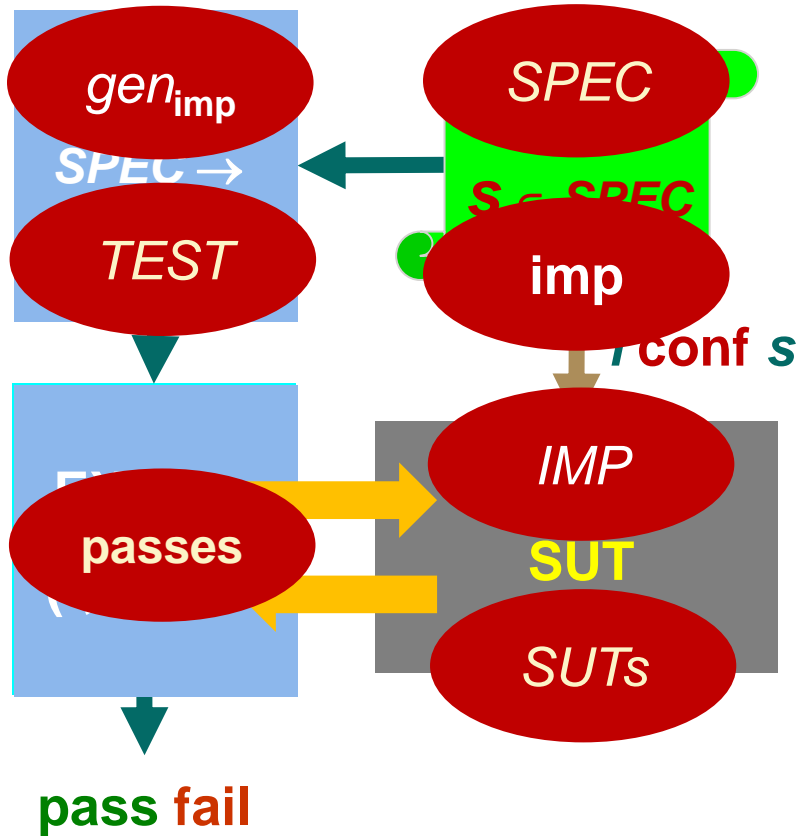
$\Leftrightarrow i \text{ uioco } s$

**SUT conforms to  $s$**

exhaustive  $\Uparrow \Downarrow$  sound

**SUT passes  $\text{gen}(s)$**

# MBT : Formal Framework Overview



**Testability assumption :**

$$\forall \text{SUT} . \exists i_{\text{SUT}} \in \text{IMP} .$$

$$\forall t \in \text{TEST} .$$

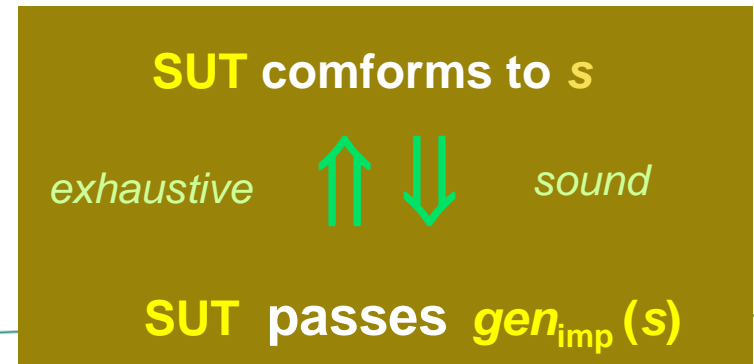
$$\text{SUT passes } t \Leftrightarrow i_{\text{SUT}} \text{ passes } t$$

**Prove soundness and exhaustiveness:**

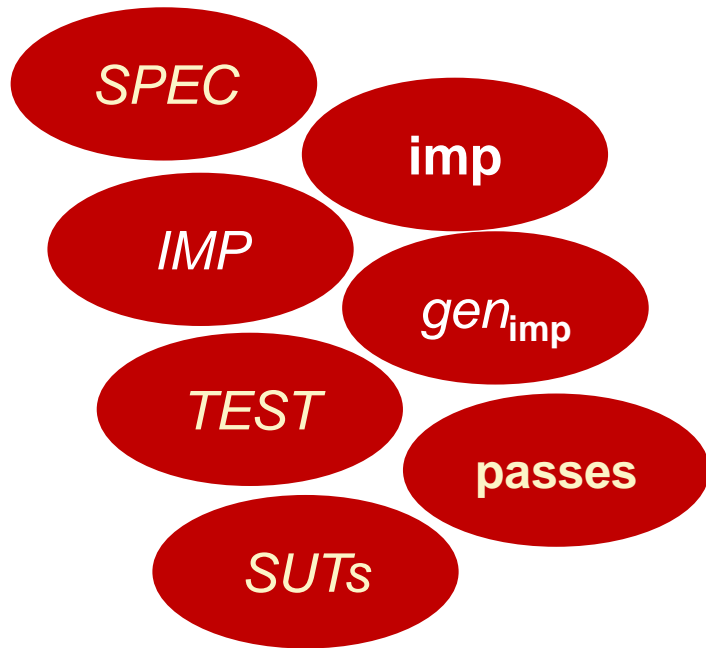
$$\forall s \in \text{SPEC} . \forall i \in \text{IMP} .$$

$$(\forall t \in \text{gen}_{\text{imp}}(s) . i \text{ passes } t)$$

$$\Leftrightarrow i \text{ imp } s$$



# Formal Framework : Instantiations



Giving different interpretations to these abstract concepts, different model-based testing theories are obtained :

- *Labelled Transitions System*
- *Finite-State Machines*
- *Formal Language acceptance*
- *Abstract Data Type testing*
- *Property-Based Testing*
- . . . . .

# Instantiation : Property-Based Testing

*SPEC*

- *relations over typed values*

*imp*

- *function  $\subseteq$  relation*

*IMP*

- *functions*

*gen<sub>imp</sub>*

- *random value generation*

*SUTs*

- *side-effect free computations*

*passes*

- *constraint satisfaction on results of function computations*

*TEST*

- *sets of typed values*



You can use MBT  
without knowing all this

# MBT : Many Tools

- AETG
- Agatha
- Agedis
- Autolink
- Axini Test Manager
- Conformiq
- Cooper
- Cover
- DTM
- fMBT
- G $\forall$ st
- Gotcha
- Graphwalker
- JTorX
- MaTeLo
- MBTsuite
- M-Frame
- MISTA
- NModel
- OSMO
- ParTeG
- Phact/The Kit
- PyModel
- QuickCheck
- Reactis
- Recover
- RT-Tester
- SaMsTaG
- Smartesting CertifyIt
- Spec Explorer
- StateMate
- STG
- tedeso
- Temppo
- TestGen (Stirling)
- TestGen (INT)
- TestComposer
- TestOptimal
- TGV
- Tigris
- TorX
- TorXakis
- T-Vec
- Tveda
- Uppaal-Cover
- Uppaal-Tron
- .....

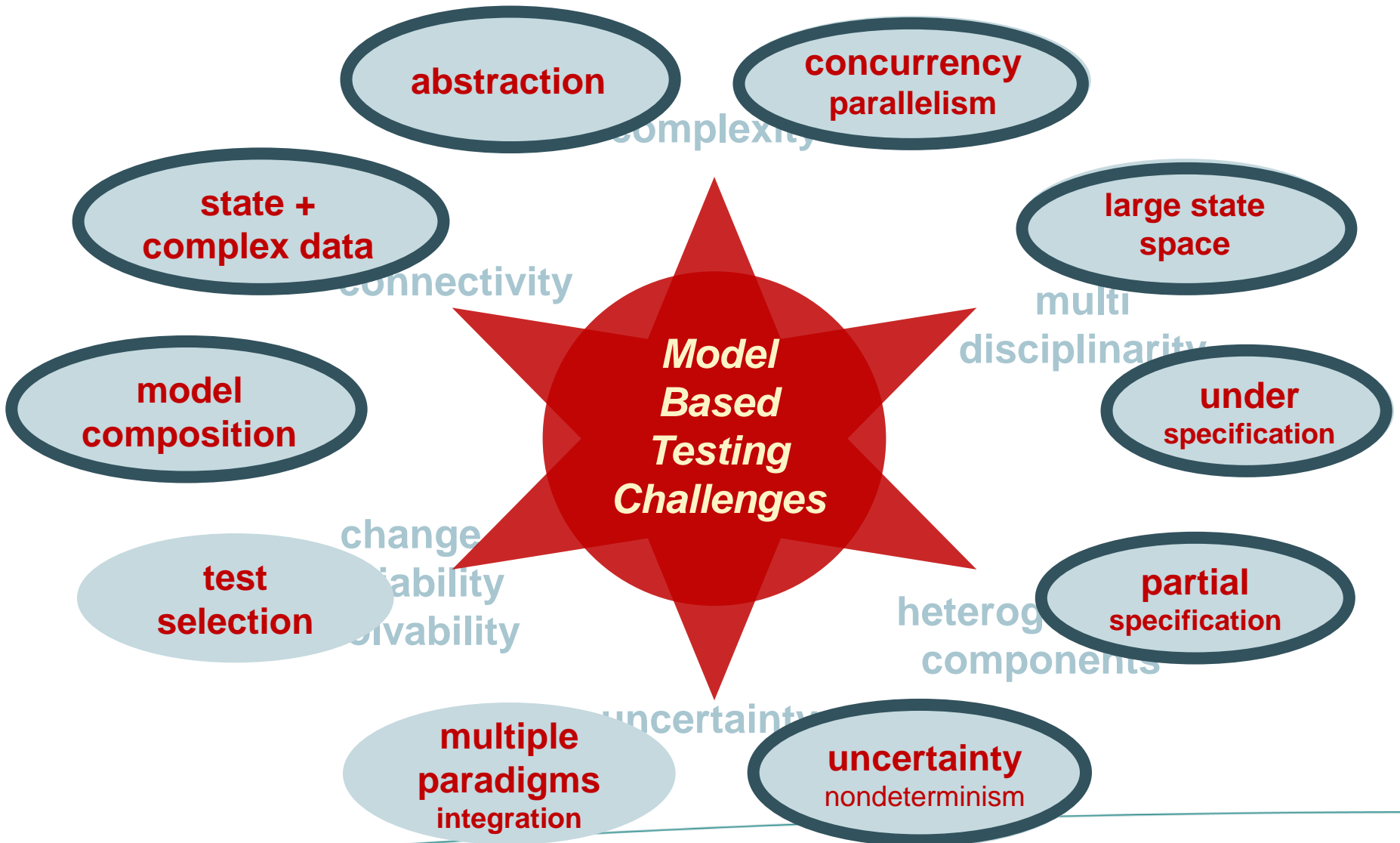
# MBT Tools *u/ioco*

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- .....

# Yet Another MBT Tool

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- Agedis
- Autolink
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- Cooper
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# MBT : Next Step Challenges



# TorXakis : Overview

## Models

- state-based control flow and complex data
- support for parallel, concurrent systems
- composing complex models from simple models
- non-determinism, uncertainty
- abstraction, under-specification

## Applications

- several high-tech systems companies
- experimental level

## But ....

- research prototype
- poor usability

## Tool

- on-line MBT tool

## Current Research

- test selection
- partial models & composition

## Under the hood

- powerful constraint/SMT solvers (Z3, CVC4)
- well-defined semantics and algorithms
- **ioco** testing theory for symbolic transition systems
- algebraic data-type definitions

# Principles of Model-Based Testing



*There is nothing more practical  
than a good theory*

Jan Tretmans

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