

# Model-Based Testing

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## Motivation

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- ▶ The **oracle** problem
  - ▶ **Automatically** deriving tests that include **fine-granular expected output information: more than robustness testing**
  - ▶ Specifications (expected output) tend to be bad
- ▶ Common “methodologies” for deriving test cases are, because of their level of abstraction, not too helpful
  - ▶ “Build partitions”—but that’s the nature of the beast
- ▶ Process of deriving tests not reproducible and not systematic; bound to the ingenuity of single engineers

## Overview

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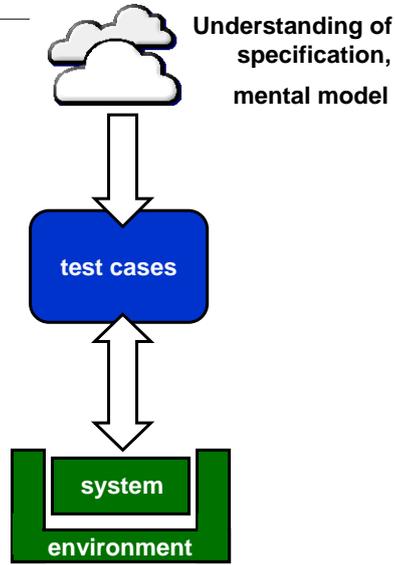
- ▶ Motivation
- ▶ Models and Abstraction
- ▶ Scenarios
- ▶ Selection Criteria
- ▶ Generation Technology
- ▶ Cost Effectiveness and Evidence
- ▶ Summary

## Goal of Today's Class

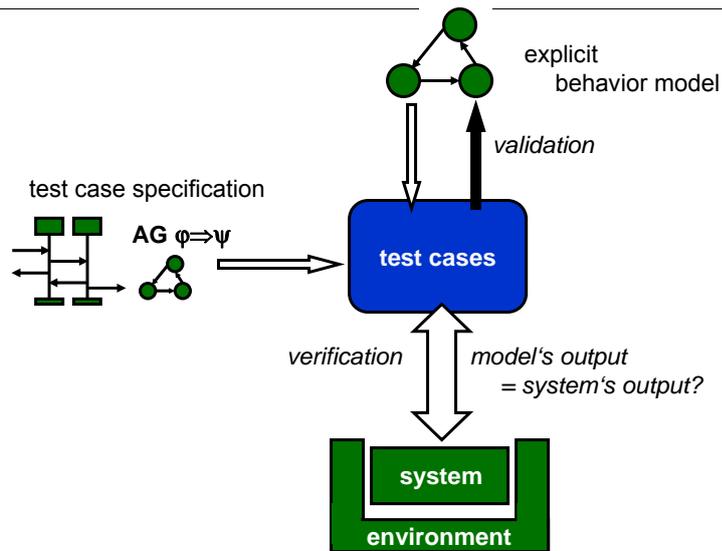
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- ▶ Understand the ideas of model-based testing
- ▶ Understand where you have to think about its deployment
- ▶ Know what it can do and what it can't
- ▶ Know where and not automation is likely to be possible
- ▶ Be able to, in principle, conceive a set-up for model-based testing in your context
  - ▶ Decide on abstraction, build model, decide on test selection criteria, perform test case generation, execute generate tests, judge what you did
  - ▶ Clearly, that's domain-specific

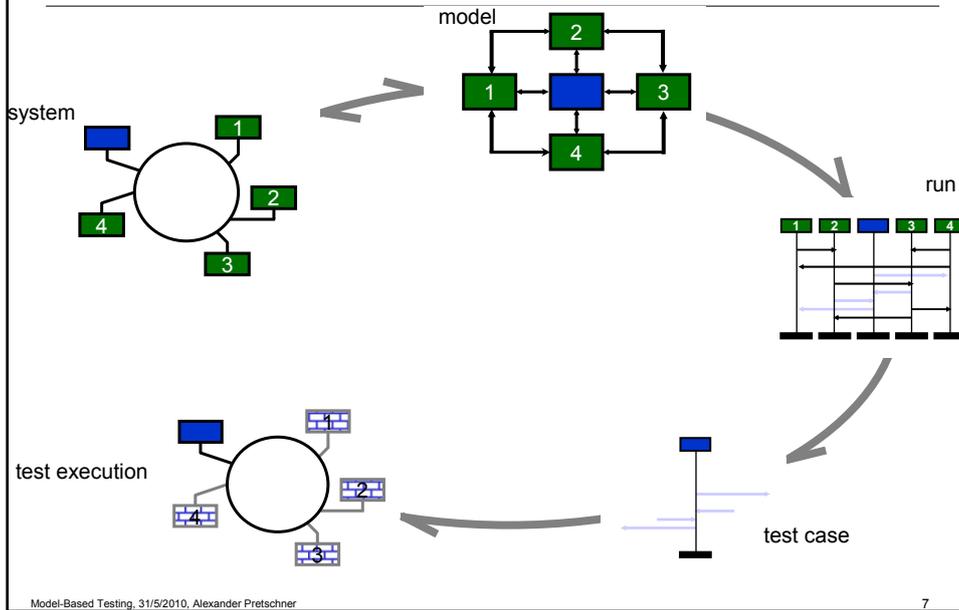
# Testing



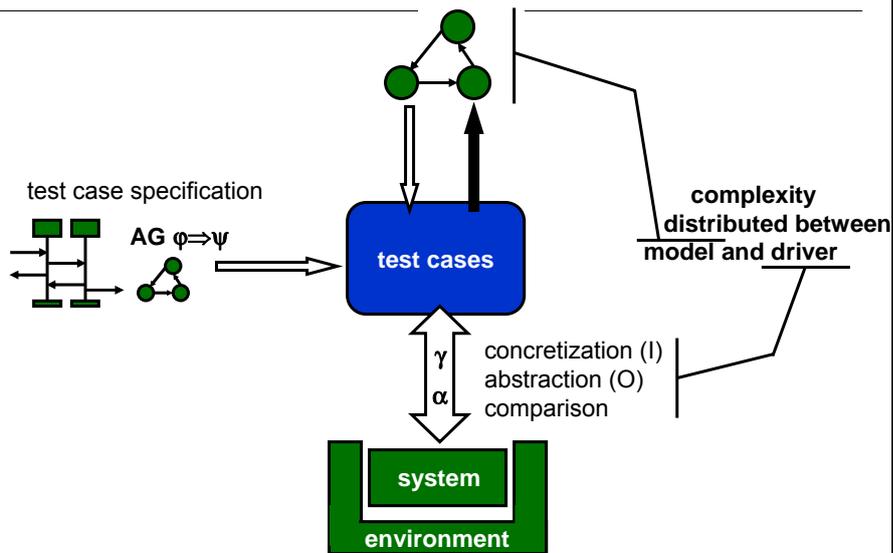
# Model-Based Testing



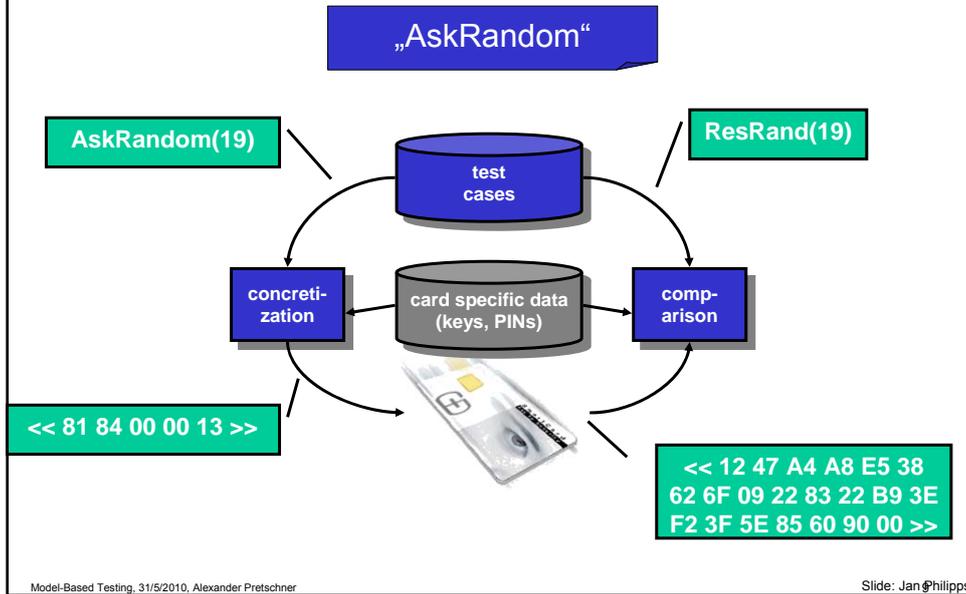
# Test Generation and Execution



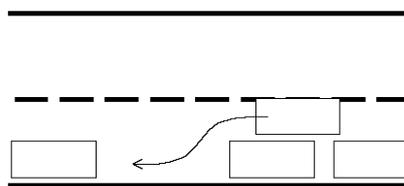
# Levels of Abstraction



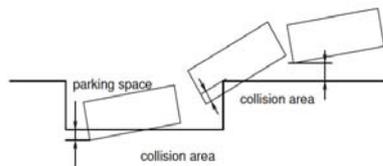
## Levels of Abstraction: Example



## Example II: Autonomous Parking

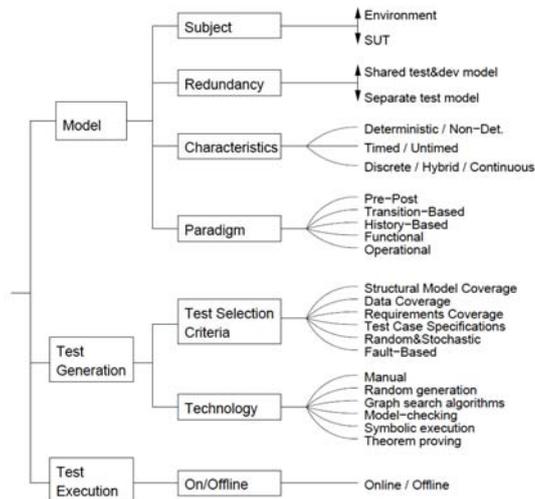


Functionality



Abstract Functionality:  
Don't enter collision area

## Flavors of Model-Based Testing



Utting, Pretschner, Legeard: A taxonomy of MBT, technical report 04/2006, University of Waikato, May 2006

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## Difficult Questions

- ▶ What is modeled? How are models validated?
- ▶ What is tested, and how is this specified?
- ▶ How are test cases computed and executed?
- ▶ Do explicit behavior models yield better and cheaper products?
  - ▶ Or is it better to just define test cases?
  - ▶ E.g., test cases in XP serve as specification
- ▶ Aren't reviews or inspections more efficient and effective?

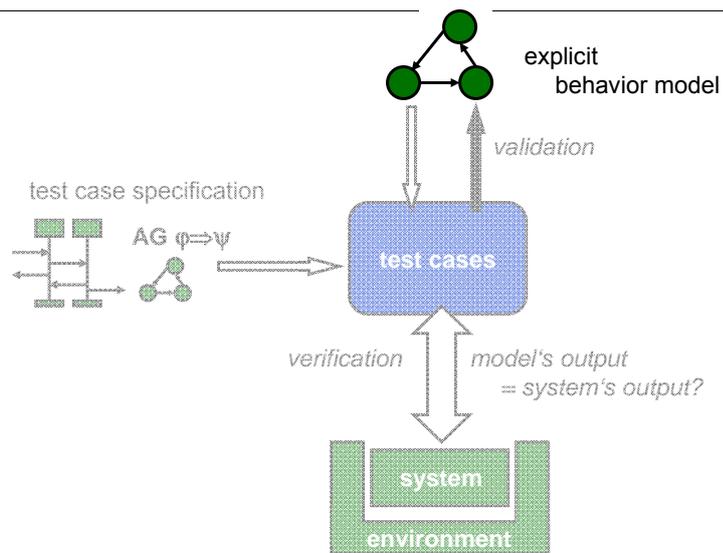
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# Overview

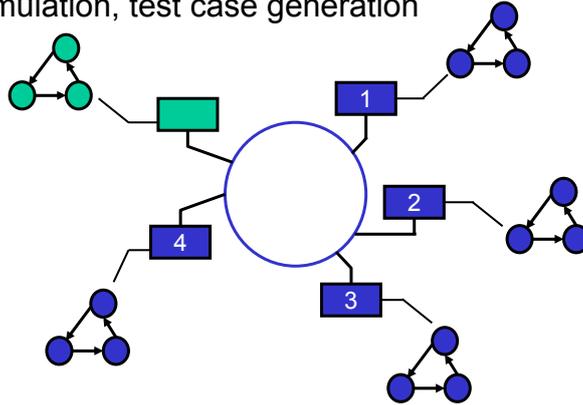
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- ▶ **Models**
- ▶ Scenarios
- ▶ Selection Criteria
- ▶ Generation Technology
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## Implementation and Environment

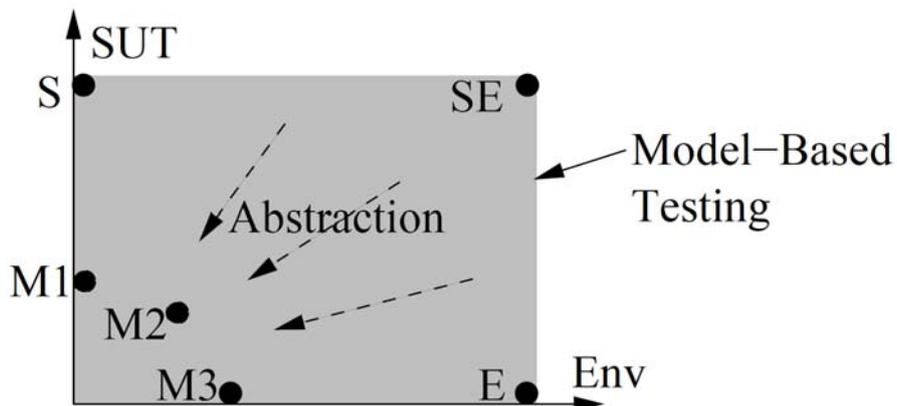
- ▶ Models of (partial) environment often necessary
  - ▶ SW almost always based on assumptions (⇒ integration/system tests)
  - ▶ Simulation, test case generation



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## Abstraction: Models of SUT and Environment



Utting, Pretschner, Legeard: A taxonomy of MBT, technical report 04/2006, University of Waikato, May 2006

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## Purpose of Abstractions

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- ▶ Insights into a system
- ▶ Specification
- ▶ Encapsulated access to parts of a system
- ▶ Communication among developers
- ▶ Code generation
- ▶ Test case generation
- ▶ ...

## One: Models encapsulate Details

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- ▶ Like “abstractions” in programming languages: subroutines, exceptions, garbage collection, Swing
  - ▶ No or “irrelevant” loss of information
    - “macro expansion”
    - Example: MDA for communication infrastructure
  - ▶ Separation of concerns, orthogonality
- ▶ Matlab-Simulink-like
  - ▶ Block diagrams: architecture and behavior
  - ▶ 1:1 representation of a differential equation
  - ▶ Encapsulation of concrete computation
- ▶ Helpful for MBT but not sufficient **if validation of model is done by simulation only**
  - ▶ Is it easier to test a Java program than to test the corresponding bytecode?

## Two: Models omit Details

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- ▶ Simplification with “relevant” loss of information
- ▶ Intellectual mastery; “refinement”
- ▶ “Complexity essential, not accidental” [Brooks’87]
- ▶ Functionality, Data, Scheduling, Communication, Performance

## Abstractions I

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- ▶ Function
  - ▶ Restriction to a particular function(ality)
  - ▶ Detection of feature interactions?
- ▶ Data
  - ▶ No loss of information: binary numbers → integers
  - ▶ Loss of information: equivalence classes → 1 symbol
- ▶ Communication
  - ▶ ISO/OSI stack:  
complex interaction at bottom → 1 (inter-)action above
  - ▶ Corba, J2EE

## Abstractions II

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- ▶ Time (more general: QoS)
  - ▶ Ignore physical time; nondeterministic timeouts
  - ▶ Granularity of time
- ▶ Permutations of sequences of signals (underspecification in the model)
- ▶ Implies natural restrictions w.r.t. tests

## Levels of Abstraction

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- ▶ **Model as precise as SUT—directly validate SUT!**
- ▶ Reuse of model components?
  - ▶ Validate integrated model
- ▶ Reuse of environment models?
  - ▶ Directly test SUT
- ▶ Parametrization of the model?
  - ▶ Informal inductive argument
- ▶ One model as reference implementation?
  - ▶ Conformance tests—why not directly use test cases?

## Behavior Models

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- ▶ Executability helps with validation
  - ▶ Prototypes
  - ▶ Some disagree: carrying out proofs is much better for validation
- ▶ Behavior models need not be executable
  - ▶ E.g., specification of a sorted array
  - ▶ Quantifiers very powerful modeling abstractions
- ▶ Many specification styles; many boil down to pre and postconditions
  - ▶ “declarative” rather than “operational”
- ▶ Doesn't impact our analysis of model-based testing

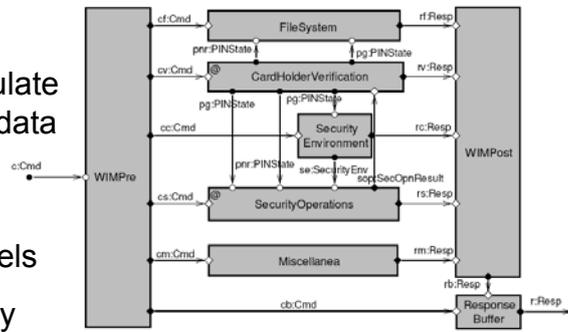
## So what?

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- ▶ Encapsulation helpful if model is to be reviewed (not simulated/tested)
- ▶ But models for test case generation must be written down
  - ▶ Appropriate languages
  - ▶ SUT and environment
- ▶ Models “better” since “simpler”
  - ▶ But complexity essential, not accidental
  - ▶ Missing information must be given by a human
- ▶ Simplifying models for test case generation rather than for code generation!

## Example – Part I

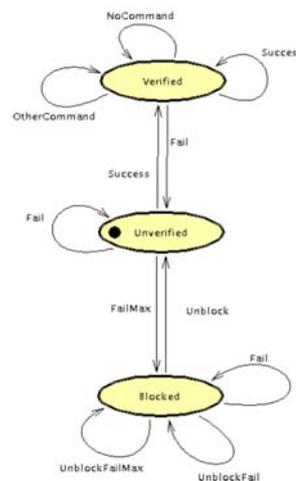
- ▶ Chip card
- ▶ Components encapsulate behavior and private data state
- ▶ Communication exclusively via channels
- ▶ Structure motivated by functional decomposition



Philipps et al., Model-based Test Case Generation for Smart Cards, Proc. FMICS'03

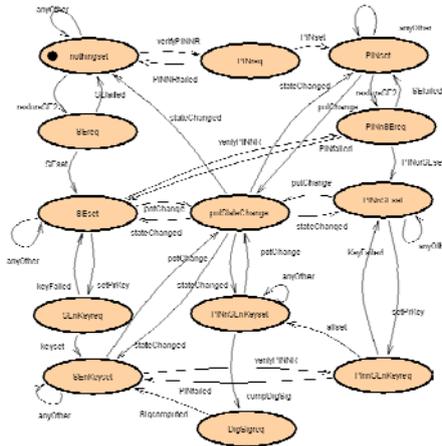
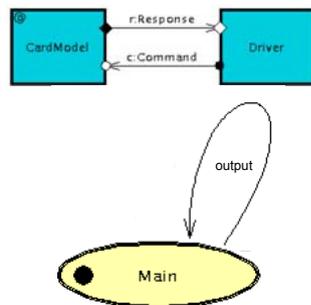
## Example – Part I

- ▶ Behavior of one CardHolderVerification component
- ▶ Wrong PIN increases PIN counter
- ▶ Max PIN counter → card blocked
- ▶ Extended Finite State Machine Transitions  $i?X\wedge\gamma\wedge o!Y\wedge\alpha$



## Example – Part I

- ▶ Environment models
  - ▶ Restrict possible input



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## Example – Part I – Abstraction

- ▶ Function: rudimentary file system
- ▶ Random numbers: “rnd”
- ▶ No actual computation of crypto operations
  - ▶ Driver
- ▶ Abstract commands
  - ▶ No testing at the level of corrupt APDUs
  - ▶ Done separately
- ▶ No hardware-based attacks

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## Example – Part I – Abstraction

MSE: Public Key and Digest of CA

"PSOVerifyDigSig"

PSOVerifyDigSig(SigCA)

ResVerifyDigSig(KeyPubCA, DigCA, SigCA)

```
Bash
--- Command #5 ---
Request: PSOVerifyDigSig(SigCA)
Expected response: ResVerifyDigSig(KeyPubCA, DigCA, SigCA)
Sending: 81 2A 00 08 83 9E 81 80 83 DC C5 E2 7D 77 BE 7F .....)u.s
        67 D1 5D 58 1A 6B 3F 23 77 A4 B2 36 94 6E 1F 64   g.lk?#u..6.n.d
        69 E3 61 D6 AB 30 0C 17 70 3D 9E 98 21 82 6F FF   i.a..0..p=-.f.o.
        EC 2F 90 85 FF A2 E1 90 C4 49 F5 00 D2 DA F2 74   /.....I.....t
        83 EF F5 2C A1 34 74 AD FD E5 1D 20 9C 9C AF 88   .....4e..*.....
        06 DE 2D 8E 16 81 22 F2 00 5E C6 6E 17 C5 08 D7   .....0.....
        28 85 75 C1 FB FA 28 42 69 31 BF 94 7A 4F 3A A6   <.u...<Bil..z0:
        79 13 3B C6 71 C4 6D 80 BA 84 78 B3 B5 EC 15 5F   y;.q.n...x.....
        50 32 BE A4 61 0C A2 01                               Z2..a....
Receiving: 90 00
Signature match.
Success.
```

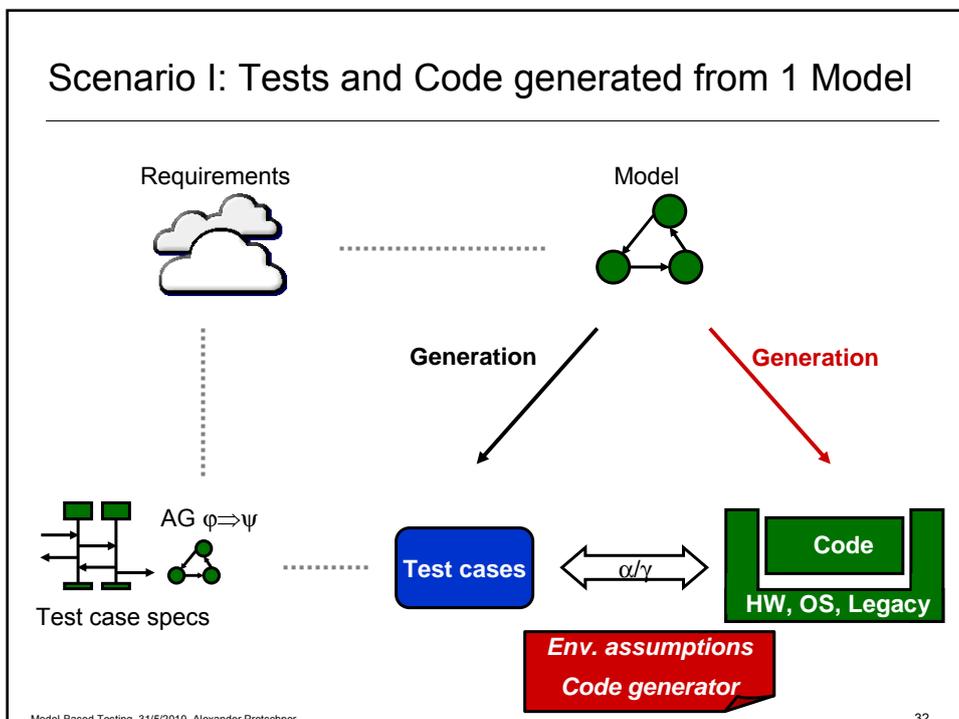
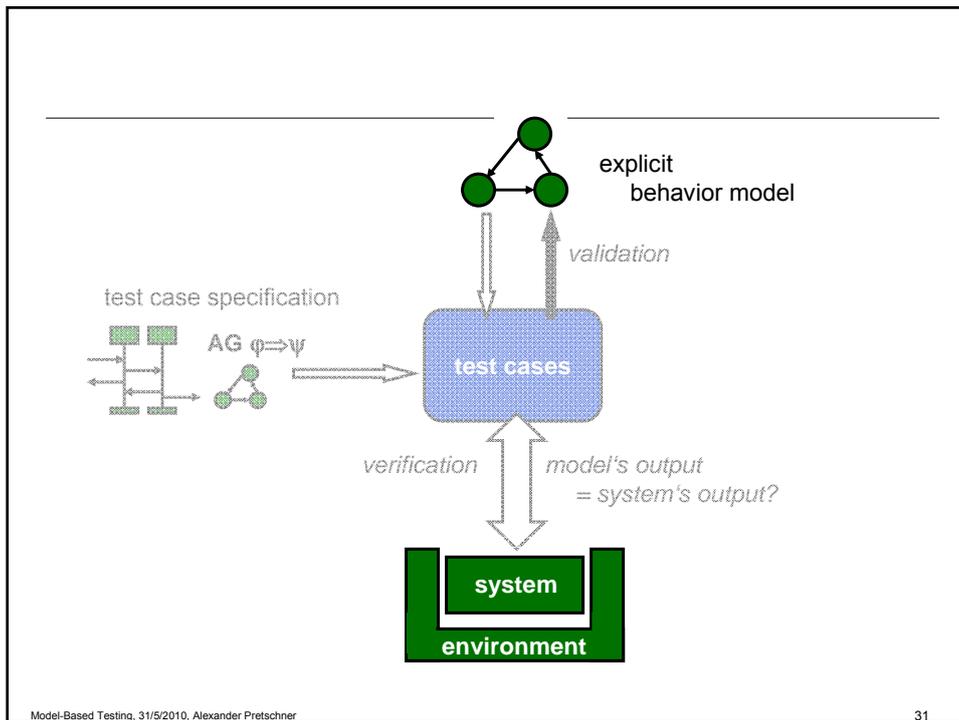
<< 81 2A 00 08 83 9E 81 80 83 DC C5 E2 7D 77 BE 7F .....)u.s  
81 ...  
(Signature of CA) >>

<< 90 00 >>

Slide: Jan Philipps

## Overview

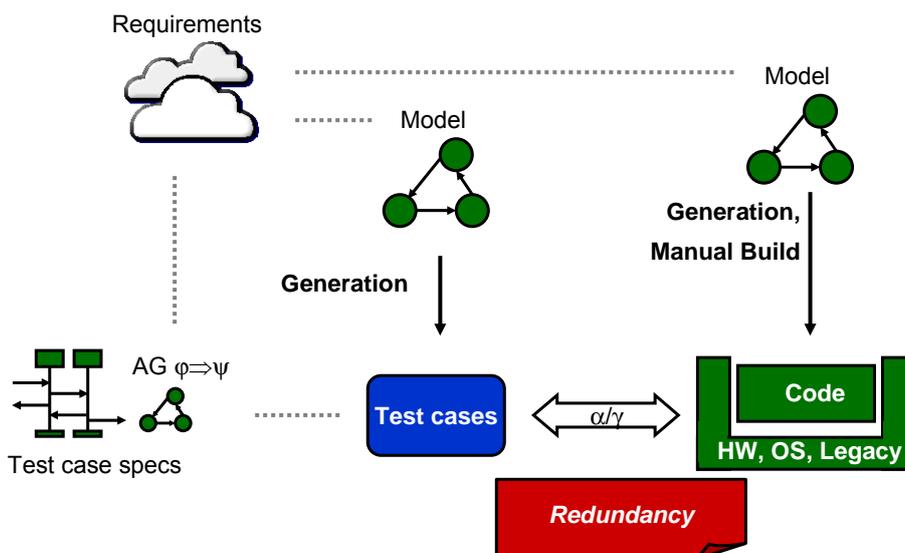
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## Discussion: One Model for Both

- ▶ Generation: no redundancy → no verification
  - ▶ “exceptions” don’t occur—model is valid, generator as well (or is it?)
- ▶ Tests for
  - ▶ Code generators (simulation and production)—MDD
  - ▶ Assumptions on the environment
  - ▶ Possibly performance/stress
  - ▶ Exceptions
- ▶ Models valid → that’s alright!
  - ▶ Different flavor of MBT
  - ▶ No “double check” model ↔ implementation
- ▶ Abstraction levels
- ▶ Test and development models
- ▶ Model as basis for manual implementation

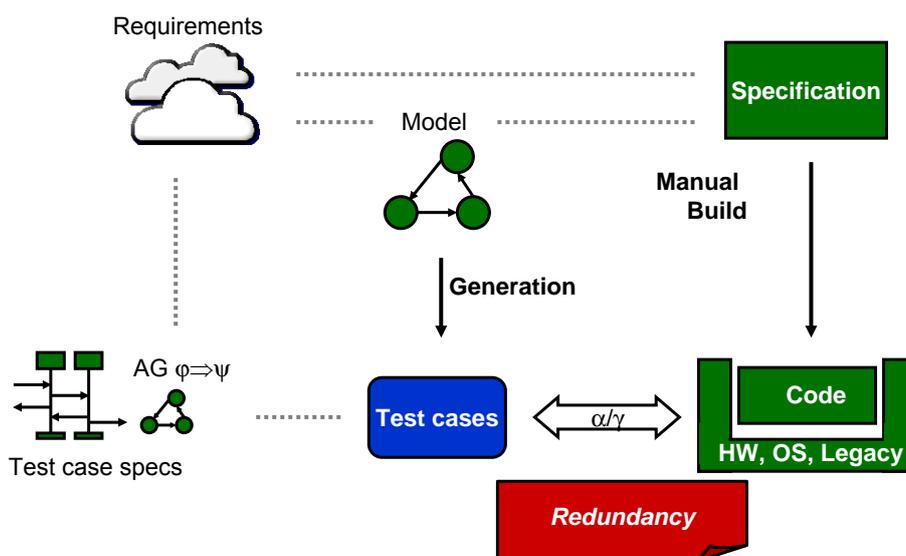
## Scenario II: Two Models



## Discussion: Two Models

- ▶ Expensive
- ▶ Redundancy
- ▶ Different levels of abstraction
- ▶ Both tests and code profit from the (alleged) advantages of model-based development
- ▶ Precise specifications
  - ▶ Car manufacturers and suppliers
  - ▶ Behavior models lead to better specifications
  - ▶ Model alone no (good) specification

## Scenario III: Model only for TC Generation



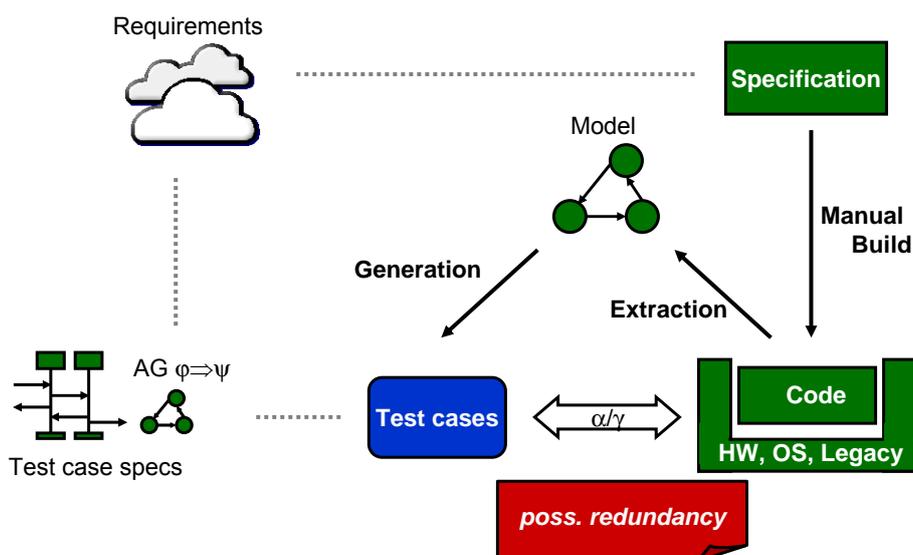
## Discussion: model for test only

- ▶ Redundancy
- ▶ Expensive; concentration on critical parts possible (?)
- ▶ Interleaving code/model with changing requirements
- ▶ Specification doesn't profit from benefits of model-based development
- ▶ Assessment of new model-based testing technology
- ▶ "Conformance" tests: suppliers must show adherence to model
- ▶ Scenario of our running chip card example

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## Scenario IV: Model Extraction from Code



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## Discussion: Model Extraction

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- ▶ Abstractions always bound to purpose and domain: automation?
- ▶ Automatic generation: redundancy?
- ▶ Interleaving code/model?
- ▶ Ex-post development of tests
- ▶ Assessment of new generation technology with manual extraction
- ▶ Tests for “exception/no exception” possible

## Continuous Testing

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- ▶ Assume execution and analysis of tests come at no cost
  - ▶ Generation of tests in the background
  - ▶ Execution of tests in the background
  - ▶ Abstraction level possibly exceptions/no exceptions
- ▶ Maturity of software
  - ▶ Too many detected errors → tedious analysis
- ▶ Embedded systems
  - ▶ Execution takes time
  - ▶ Simulators
  - ▶ Business information systems are different

## Summary I

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- ▶ 1 model for both
  - ▶ No redundancy, no double check
  - ▶ “Test models” different from “development models”
  - ▶ Cf. argument on using abstract models
- ▶ 2 distinct models
  - ▶ Redundancy
  - ▶ Expensive
  - ▶ Different levels of abstraction possible

## Summary II

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- ▶ 1 model for tests
  - ▶ Redundancy
  - ▶ Changing requirements: interleaving model and code development?
  - ▶ OEM builds model, suppliers have to conform to it
- ▶ 1 model from code
  - ▶ Redundancy?
  - ▶ Ex-post development of test cases only
- ▶ [Pretschner'05]

## And in the real world?

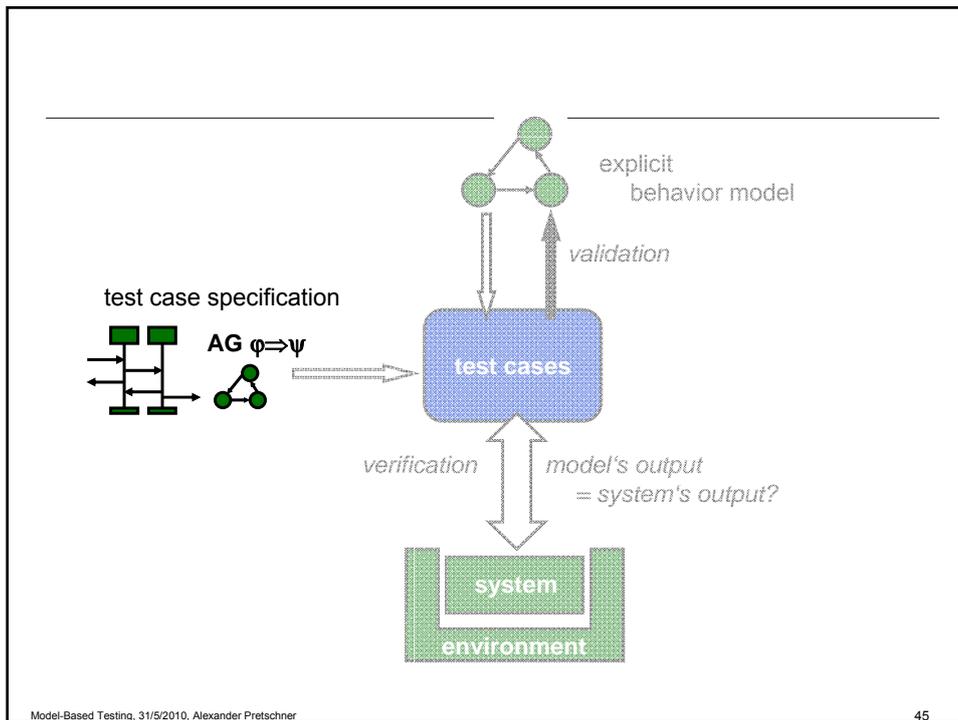
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- ▶ Model-based testing in the hardware industry
  - ▶ Need for redundancy is acknowledged
  - ▶ Reluctance in the SW industry!
- ▶ Stochastic testing: reliability engineering
- ▶ Continuous systems in Matlab: test code generators
- ▶ Models primarily built for test case generation: stage of case studies
- ▶ For SW, I haven't encountered the situation where two distinct models are built (\$\$\$)
- ▶ Generate tests to validate models is rather common

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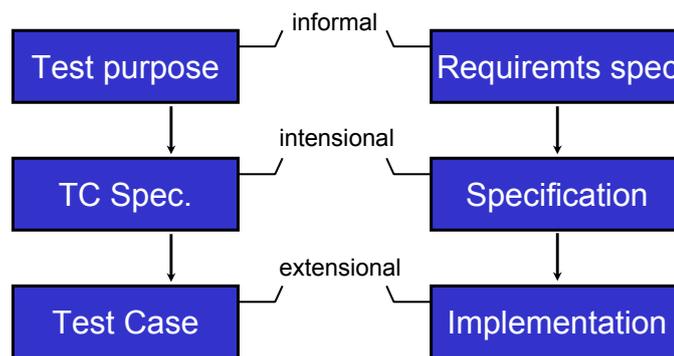


## Test Purpose and Test Case Specification

- ▶ Familiar problem ...
  - ▶ Irrelevant if model-based or not
- ▶ Test cases: selected "relevant" traces
- ▶ What's "relevant"? What's "good"?
- ▶ Test purpose informal, TC spec formal

## Test purpose, TC specification, test case

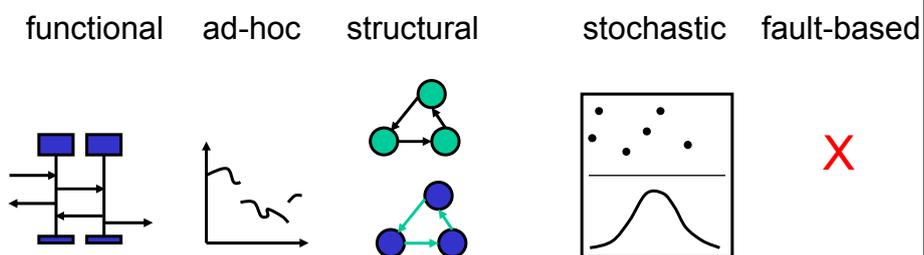
- ▶ TC spec. formalizes test purpose and renders it operational
  - ▶ E.g., an invariant cannot directly be tested



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## Selection Criteria



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## Summary

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- ▶ Functional criteria
  - ▶ Specific to domain or application; requirements
  - ▶ Methodological support
- ▶ Structural criteria
  - ▶ Independent of domain
  - ▶ Data flow, control flow, data
  - ▶ Automatic generation of TC specs and test cases
  - ▶ Measurable
  - ▶ Ability to reveal faults unclear
  - ▶ Models of SUT and environment

## Summary II

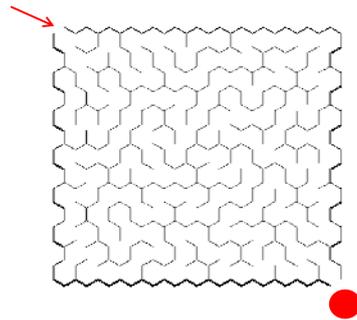
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- ▶ Stochastic criteria
  - ▶ Uniform distributions: “purely at random”
  - ▶ User profiles
  - ▶ In general, not “worse” than structural criteria
- ▶ People tend to agree that there’s not one single good criterion!

## Test Case Generation

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- ▶ Search problem
- ▶ Techniques
  - ▶ Dedicated algorithms for dedicated criteria
  - ▶ (Bounded) model checking
  - ▶ Deductive theorem proving
  - ▶ Symbolic execution
  - ▶ [Lucio'05]



## Search Problem

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- ▶ Enumerate traces and select w.r.t. TC specification
- ▶ Respect constraints during enumeration
  - ▶ Functional criteria
- ▶ General problem: find traces that cover edges/nodes/special data values in the control flow and data flow graphs
  - ▶ Structural criteria
  - ▶ Directed/heuristic search
- ▶ Often, it is a good idea not to visit states twice
  - ▶ State storage
- ▶ Minimization of test suites not covered today

## Overview

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## Assumptions

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- ▶ Effectiveness and cost effectiveness
  - ▶ Models help with getting requirements/specs straight
  - ▶ Test suite vs. model: creation and maintenance
- ▶ Existence of adequate level of abstraction
  - ▶ Abstraction and precision
  - ▶ Easy model validation and maintenance
  - ▶ Distribution of complexity
- ▶ Reuse
  - ▶ Simpler changes in the model (plus push button)
  - ▶ Adaptor and environment models/TC specifications

## Evidence: (Cost) Effectiveness

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- ▶ “Model-Based Testing does find errors”
- ▶ Different/more errors in SUT?
  - ▶ Farchi et al. '02, Pretschner et al. '05
  - ▶ Except for last study: no precise description of reference
  - ▶ Ongoing dispute on comparison with reviews
- ▶ Errors in model or specs
- ▶ Cost Effectiveness
  - ▶ Farchi et al. '02, Bernard et al.'04, Sinha et al. '06
  - ▶ “building tests took less time”
- ▶ In sum: hard to admit, but very little evidence!
  - ▶ But: neither empirical evidence about benefits of OO software

## Coverage?

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- ▶ Unsettled discussion on benefits of structural criteria
  - ▶ Inconclusive studies on both control and data flow
  - ▶ Not surprisingly, using such a criterion “leads to failures that would have gone undetected”
  - ▶ DO-178B recommends MC/DC for level A software
- ▶ Unclear if things change when used on specifications
- ▶ People agree: structural tests complement functional tests

## Empirical Evidence

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- ▶ Compare any “new” approach to random tests and “traditionally developed tests”
- ▶ Homogeneous systems?
  - ▶ Domain
  - ▶ Stage of development
  - ▶ Programming language
  - ▶ Skills of programmers
  - ▶ Complexity
- ▶ As always: generalization?!

## (Personal) Summary and Gut Feel

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- ▶ Don't rely on structural criteria only!
  - ▶ Large state spaces, big problems, anyway!
- ▶ Abstract models for testing for exceptions might be cost-effective
  - ▶ Run tests in the background
- ▶ Continuous testing if at no cost
- ▶ Model-Based Testing does find additional failures
  - ▶ But it's not entirely clear if these wouldn't also have been found as a result of carefully studying the specs
- ▶ Model in itself definitely helps (XP: tests are spec/model)
- ▶ Not necessarily automated generation
- ▶ Plenty of other low-level problems in the real world

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## Summary

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- ▶ Model of SUT and environment at **different levels of abstraction**
  - ▶ Abstraction compulsory
  - ▶ Oracle
- ▶ Possibly automated test generation with **environment model** (statistical testing; structural criteria on encoded scenarios) and **structure of model of the SUT**
  - ▶ **But we still need to tell the machine what a good test consists of!**
- ▶ Different scenarios
- ▶ Different generation technologies
- ▶ As usual, little evidence ...

## My Personal Bottom Line

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- ▶ Go for it! I do eat my own cooking!
- ▶ Don't use it to write a script; model a stack?
- ▶ Use of models beyond testing important
  - ▶ Specifications, contracts for suppliers/OEM
  - ▶ Cost-effectiveness unlikely if nobody uses models anyway
- ▶ Different levels of abstraction are acceptable
- ▶ Not so sure about automation
- ▶ Enforcement of test rationales can help tremendously
- ▶ Use knowledge on earlier failures; user profiles

## Literature

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