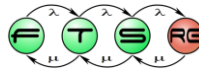


# Testing the robustness and safety of context-aware autonomous behaviour

Software Verification Techniques course

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## Outline

- Motivations and applications
- The testing concept
  - Context modelling
  - Requirements modelling
  - Test strategies
  - Test evaluation
- Testing tool-chain (testing framework)
- Case studies
- Summary

## Introduction

- R3-COP and R5-COP projects
  - Development of methods and tools for the efficient **verification and testing** of dependable and safety-critical systems
- Focus of these projects is testing ...
  - Autonomous systems
    - that make decisions to **execute missions without direct human control**
  - Context-aware systems
    - that **use perceived context information** to provide relevant services



**R5-COP**



3



## Objectives and applications

- Systems to be tested in the project
  - Autonomous robots: household and manufacturing robots
  - Autonomous vehicles: LGV, UAV, RUAV
- Objectives of testing
  - **Robustness and safety**: safe system behaviour in the presence of stressful environmental conditions
  - **Context-awareness**: dependency of the system behaviour on the evolving state of the complex environment (context)
- Typical safety requirements to be addressed
  - *“In case the robot is in close proximity to living beings it shall send sound or voice alerts”*
  - *“When an obstacle gets to the dangerous area then the vehicle shall stop”*
  - **Context-related conditions** (initial, interim and final), and corresponding sequence of actions

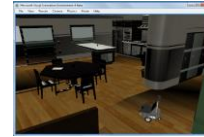
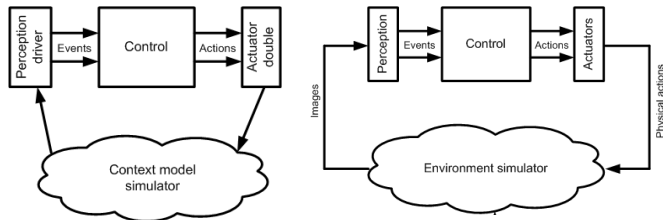


4



## Test purpose and test environment

### Black-box testing of the behaviour



### Test execution:

1. Configuration of the (dynamic) context
2. Starting the robot to execute its mission
3. Observing context-dependent actions

### Test environment:

- Simulator
- Real (physical) environment



5



## Challenges and solutions

### Typical challenges in testing:

- Informal requirements specification
  - Specification of context-aware behaviour is difficult
  - Adaptivity is an issue
- Manual preparation of test cases
  - Based on experience
  - Testing behaviour in typical situations
- Imprecise test quality metrics
  - Relation to context
  - Relation to requirements

### Proposed solutions:

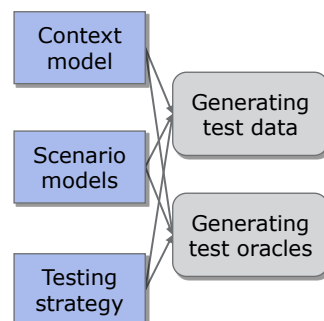
- Precise requirements specification
  - Modelling contexts, dynamic events and actions
  - Modelling scenarios
- Systematic, model based test data generation
  - Based on context model
  - Testing behaviour in stressful context
- Model based test coverage metrics
  - Context based coverage
  - Scenario based coverage



# The testing concept

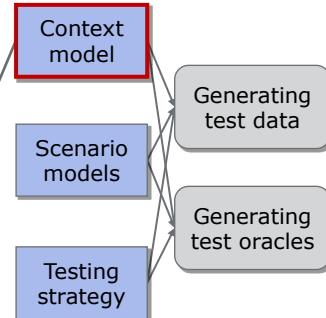
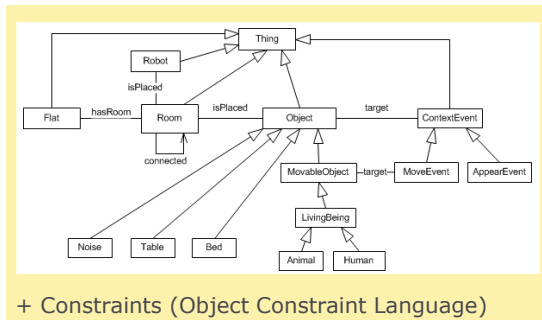
## Overview

- Test goals
  - Systematic generation of test data, i.e., test contexts that include stressful (unexpected) situations
  - Evaluating the safety of the observed behavior
- What is needed?
  - Description of the environment: Context modeling
  - Capturing the test requirements: Scenario modeling
  - Systematic generation of test data: Testing strategies
- Tools for the tedious steps



## Context modeling

- Domain ontology → Context metamodel
  - Objects with properties, including **dynamic objects**
  - Relations: concrete or **abstract** relations
  - **Constraints**: physical limitations and application-specific constraints
- Action model for control actions

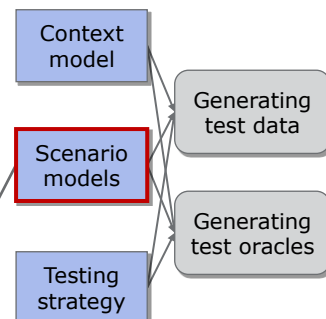
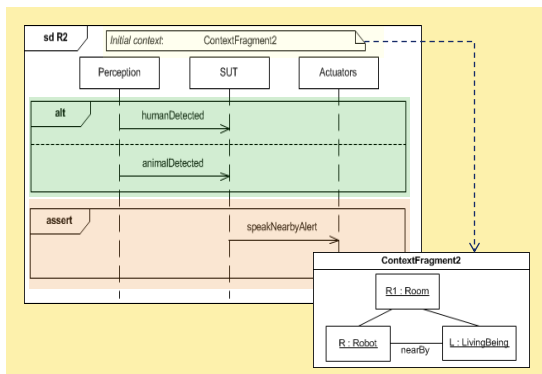


9



## Scenario modeling

- Safety requirements → Scenario model
  - **Initial context fragment**: instances of the context metamodel
  - **Trigger part**: Events (perception) and messages (commands)
  - **Assertion part**: Expected or forbidden actions and context changes
  - **Precise semantics** based on MSC and LSC constructs with time

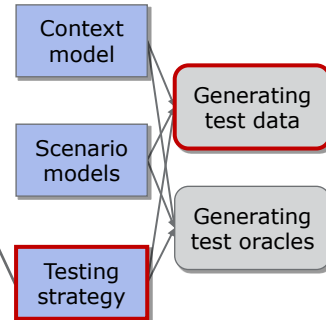
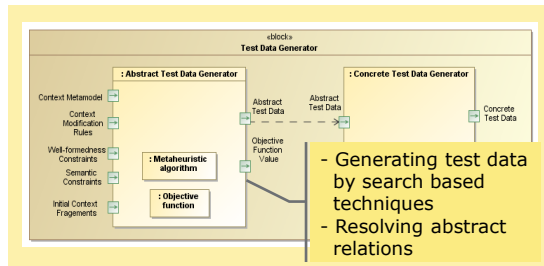


10



## Strategies for testing robustness

- Unexpected objects → Context coverage
  - Extending the initial context fragment with **extra objects**
- Complex contexts → Scenario coverage
  - **Combining** (n-wise) the initial context fragments of scenarios
- Extreme situations → Robustness coverage
  - Mutating initial context fragments: using **boundary values** of properties, violating application constraints

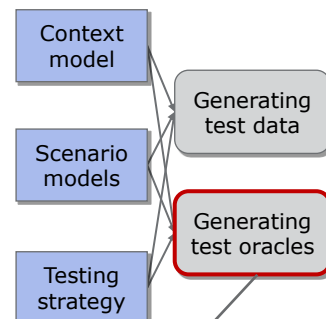
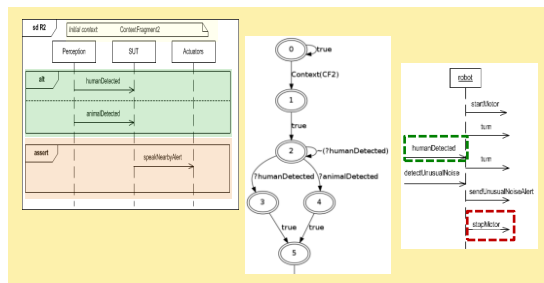


11



## Evaluating test traces

- Evaluating a test trace simultaneously against each requirement scenario, from each relevant step
  - Matching **events** and **context changes** (respecting object hierarchy): using efficient graph-based decomposition techniques
  - Automated evaluation of traces: synthesis of **observer automata** from the scenarios
  - Identifying violated scenarios → metrics



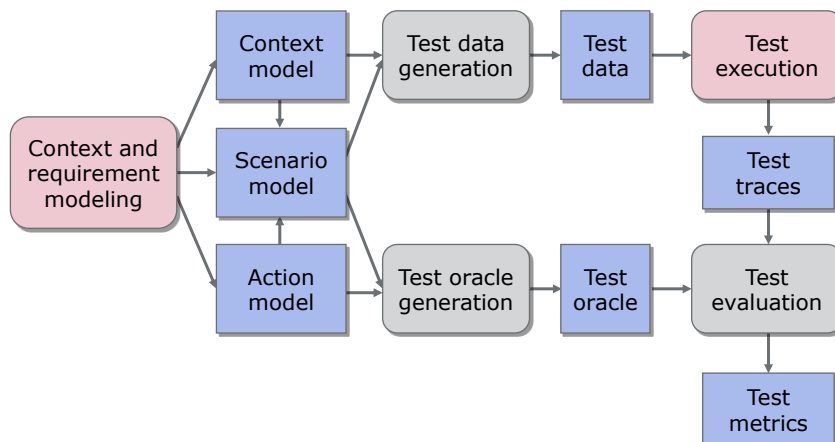
12



## The testing tool-chain

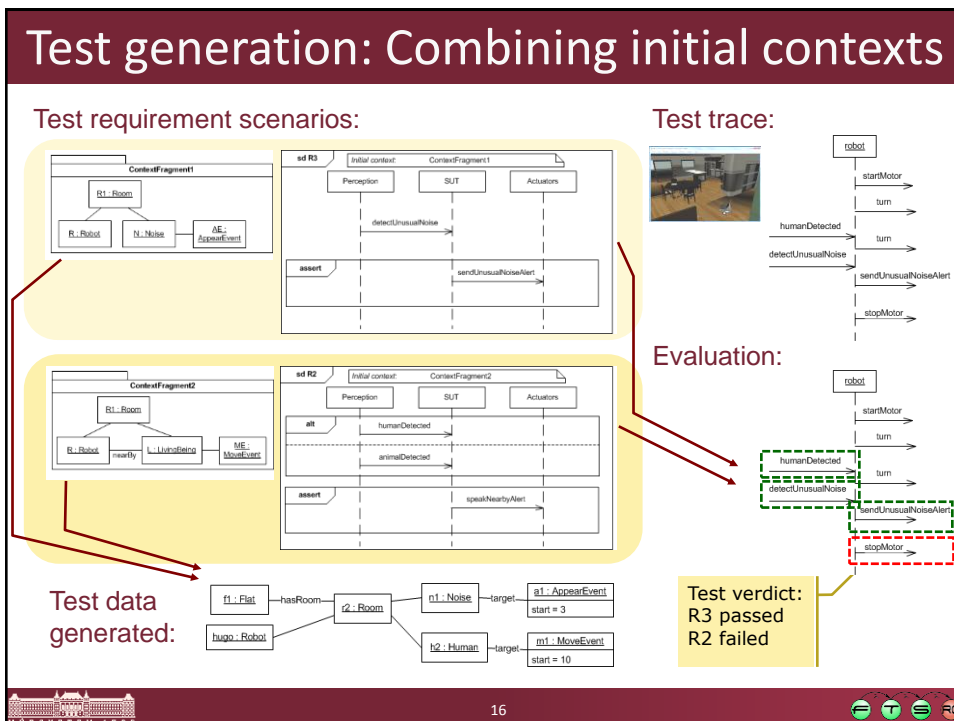
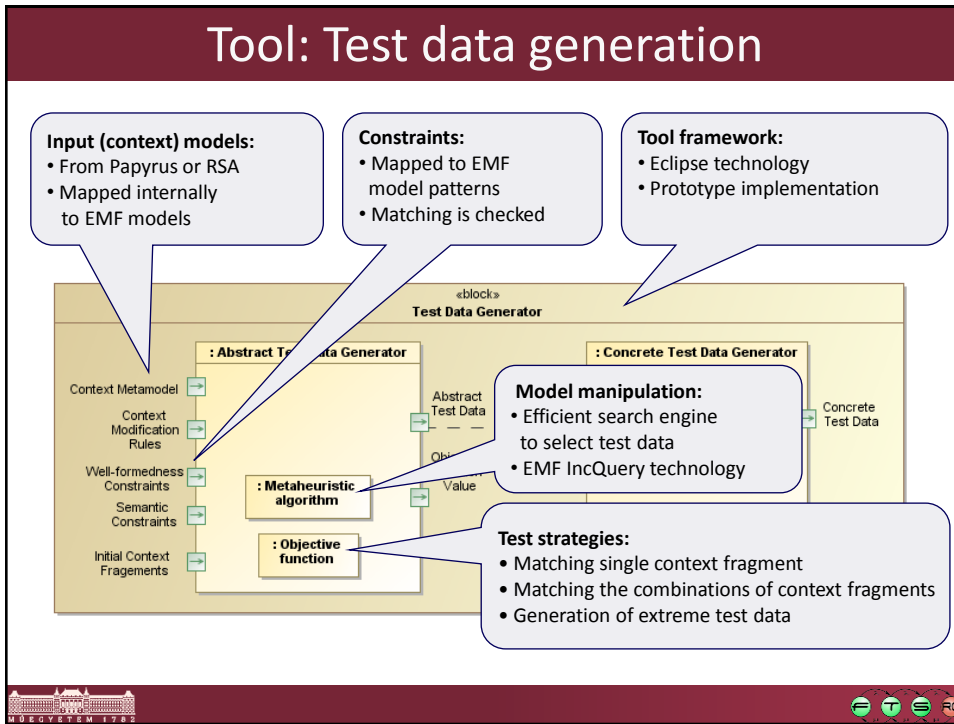


## The testing tool-chain



- Lightweight but precise requirement modeling
- Automated tools to support test generation and evaluation

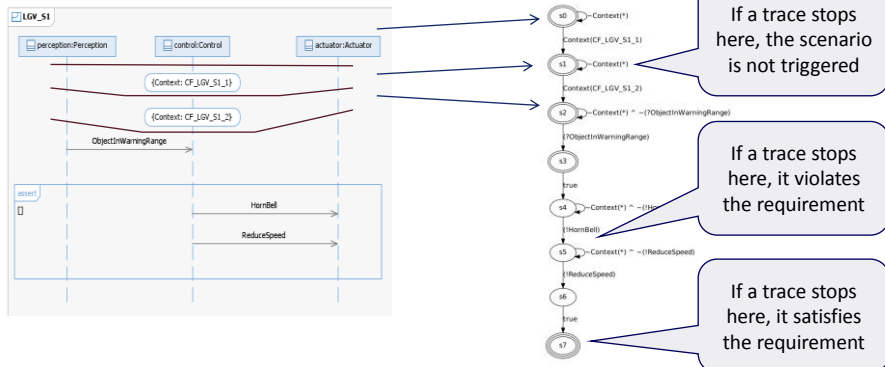






## Tool: Test oracle generation

- **Goal of test evaluation:**
  - Checking which req. scenario was triggered/satisfied/violated
  - Matching of **events/actions** and **context fragments** from test traces
- **Solution: Building an observer automaton for each scenario**

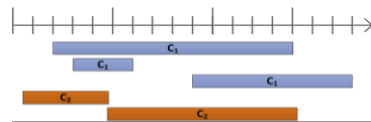
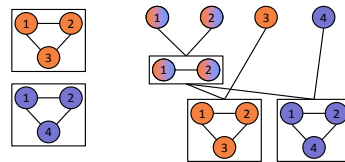


17



## Test oracle: Checking context fragments

- Checking sequences of changing contexts (dynamic objects)
  - Graph based representation and matching of graph sequences
- All requirements (contexts) are checked simultaneously
  - **Decomposition** of context fragments to utilize **common parts** that could be checked once
- Context fragments (from requirement scenarios) are checked for matching at each step of the trace
  - **Concurrent** threads for evaluation of matching contexts

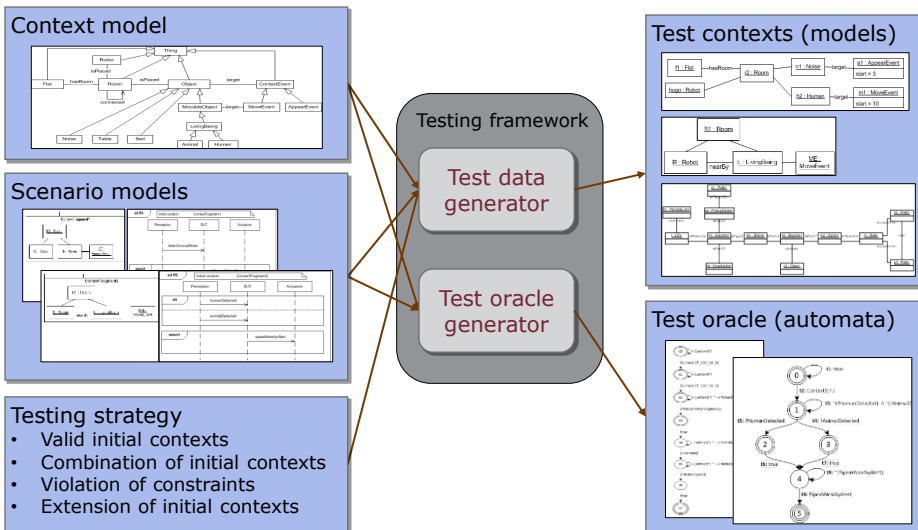


18

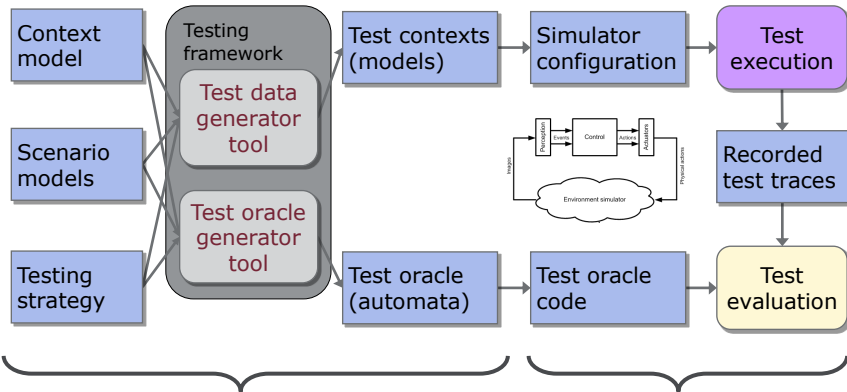


# The testing framework in practice

## Inputs and outputs of generator tools



## Behaviour testing – Use in demonstrators



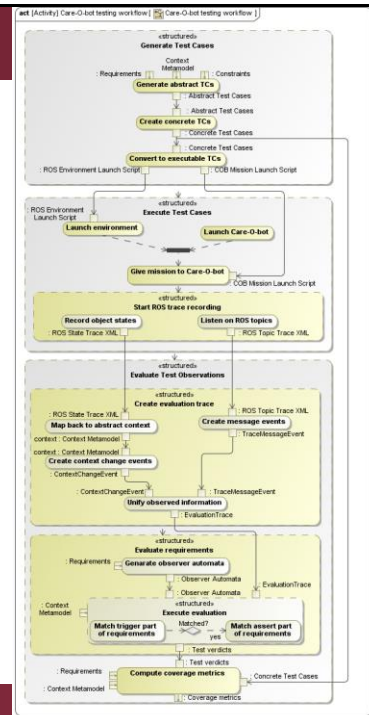
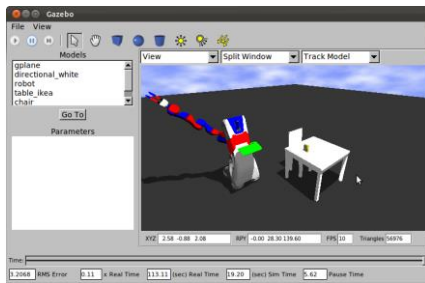
- Demonstrated for LGV (forklift) by generating test context models

- Demonstrated for home robots (Care-O-bot) by interfacing with ROS+Gazebo simulator



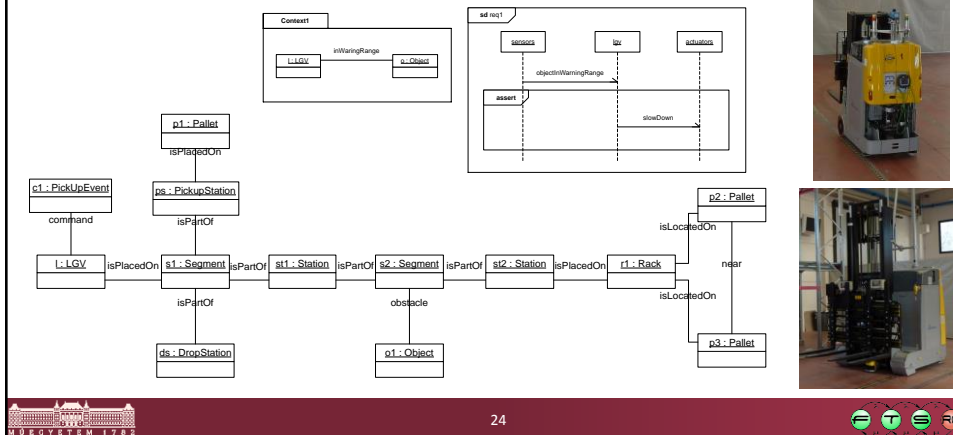
## Simulator based testing

- FHG Care-o-Bot: Simulator based testing
- Interfacing the testing framework with the ROS+Gazebo simulator
  - Mapping the generated test context model to simulator configuration
  - Mapping events and context changes recorded in the simulator to the input of the test oracle



## Testing in real environment

- E80 Forklift: Testing collision avoidance
  - Context and requirements modelling
  - Generating abstract test context (object model)
  - Mapping abstract test context to real configuration

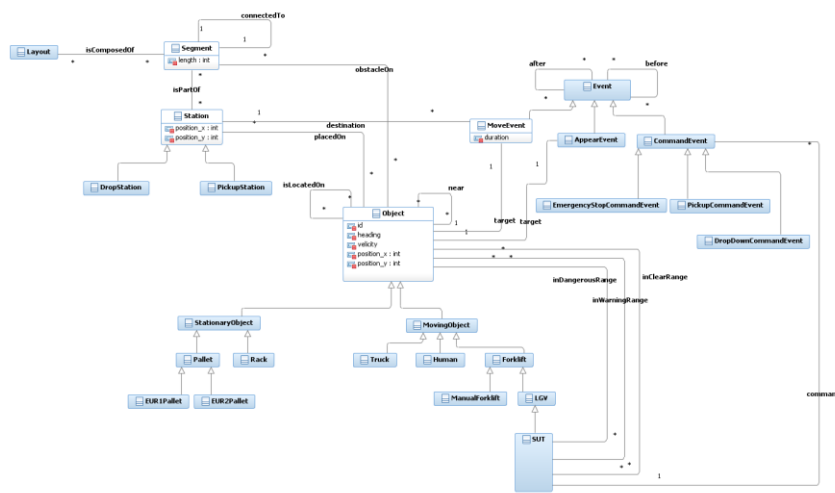


24



## Application: Testing an LGV 1/3

- Context modelling: Capturing environment objects, relations, constraints



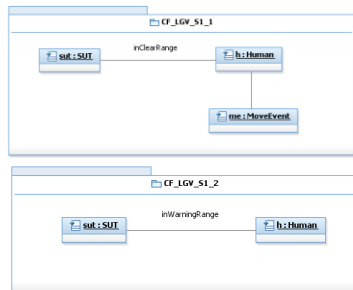
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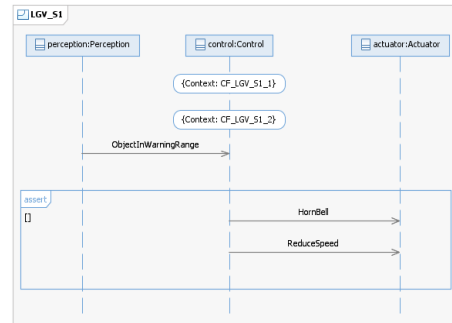
## Application: Testing an LGV 2/3

- **Scenario modelling:** Capturing the situations to be avoided or reached
  - Example: The robot shall horn the bell and reduce its speed when a human comes to the warning area

Context fragments:



Scenario:

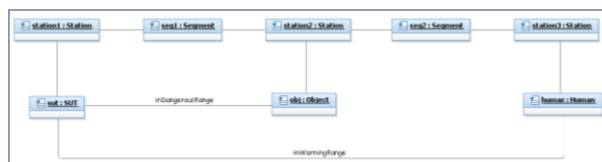


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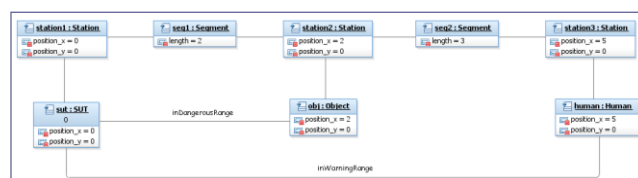
## Application: Testing an LGV 3/3

- **Test generation:** Coverage of individual and combined scenarios + mapping abstract test cases to concrete
  - Example: Obstacle in the dangerous area, human in the warning area (S1+S3)



← Abstract test data

Concrete test data →



27



# Tools, models and test execution environment

The screenshot displays the R3-COP test case generation wizard on the left, which allows users to specify test case generation input. The wizard includes options for TCG method (Generate single test case, Generate test suite based on context fragment combinations, Generate test suite for violating semantic constraint combinations, Generate test suite for maximum coverage) and a section for selecting a TCG context and algorithm. Below the wizard is a photograph of a yellow forklift in a warehouse setting.

The main part of the screenshot shows the Eclipse IDE interface. The Project Explorer on the left shows a project structure for 'E80Tests.combinations'. The Resource Set on the right shows a hierarchical view of the test environment, including 'World', 'Layout', 'Station', 'Position', 'Segment', 'Move Event', 'SUT', and 'Human'. The central diagram is a state transition graph with nodes representing different states and transitions between them, labeled with 'inWarningRange' and 'outWarningRange'.

## Summary

- Model based robustness testing approach
  - Context modelling: “What is possible?”
  - Scenario modelling: “What is required?”
  - Initial context fragment: “What is relevant?”
  - Testing strategy: “What is stressful?”
- Developing methods and tools
  - Context and requirements modelling
  - Generating test data for testing robustness and safety of the context-aware behaviour
  - Generating test oracles for test evaluation
- Applications and validation
  - Household robot (ROS based simulator)
  - Laser guided forklift (real configurations)

