





# SYSTEMATIC MODEL-BASED AND SEARCH-BASED TESTING OF CYBER-PHYSICAL SYSTEMS

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#### **OUTLINE OF THE PRESENTATION**

- Background
  - ✓ Cyber-Physical Systems
  - ✓ Search-based Software Engineering
- Results from previous projects
- Ongoing Project
- Summary, Experiences, and Lessons Learnt

User Conference







#### **BACKGROUND**

**Cyber-Physical Systems (CPS)** 



#### **CYBER-PHYSICAL SYSTEMS**

CPSs are the new generation of <u>connected</u> <u>embedded</u> <u>systems</u> integrating <u>cyber-technologies</u>, <u>software</u>, and <u>physical components</u> interacting with each other via <u>information and physical interfaces</u> [1].

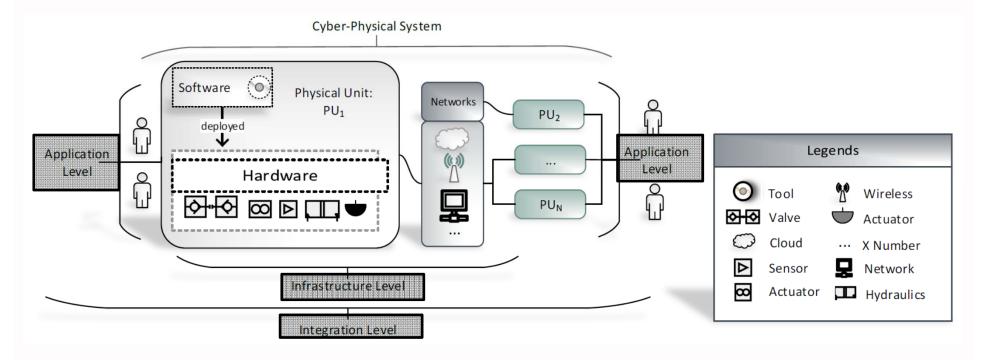




[1] http://cyberphysicalsystems.org/



#### **Testing Levels for CPS**



Application Level: Events and data coming from the user space, e.g., from applications and human

**Infrastructure Level**: Events and data coming from, e.g., physical units, network equipment, and cloud infrastructure

**Integration Level:** Interactions between Application and Infrastructure levels



## SCIENTIFIC AND TECHNICAL CHALLENGES

- Heterogeneous, Large-scale Embedded Systems
- Dealing with Novel Interactions
  - ✓ Software, Hardware, Communication, Human
- Dealing with Uncertainty
- Verifying and validation of extra-functional properties such as performance, robustness, ..
- Autonomous



#### WHY IS IT IMPORTANT TO TEST CPS?

- Applications, e.g., Healthcare, Aerospace, Avionics, Oil/gas and Maritime, Industrial Automation, and Tele-communication
- Current applications > \$32.3 trillions. By 2025, > \$82 trillions [1].
- CPSs must be dependable, i.e., safe, trustworthy, reliable, robust,
  ...
- Improving CPS dependability via systematic and automated testing

[1] Evans, P.C., Annunziata, M.: Pushing the Boundaries of Minds and Machines. General Electric (GE), (2012)







#### **BACKGROUND**

SEARCH-BASED SOFTWARE ENGINEERING

### **Search-Based Software Engineering**

"Using <u>search</u> techniques to search <u>large</u> <u>search</u> <u>spaces</u>, guided by <u>a fitness function</u> that captures properties of the acceptable software artifacts we seek"[1]

**Search Techniques:** Genetic Algorithms, Particle Swarm Optimization, ...

**Large Search Spaces:** Millions or billions of possible solutions to search from.

**Fitness Function:** To determine solution *x* is *better* than Solution *y*.

[1] Borrowed from: SBSE: Introduction, Motivation, Results and Directions. Mark Harman Keynote at SSBSE, 2014







#### **RESULTS FROM SELECTED PROJECTS**

ROBUSTNESS TESTING OF VIDEOCONFERENCING SYSTEMS



#### What is Robustness?

"Robustness is the degree to which a software component functions correctly in the presence of exceptional inputs or <u>stressful environmental</u> conditions" (IEEE Std 610.12-1990)



### MODEL-BASED ROBUSTNESS TESTING IS CHALLENGING

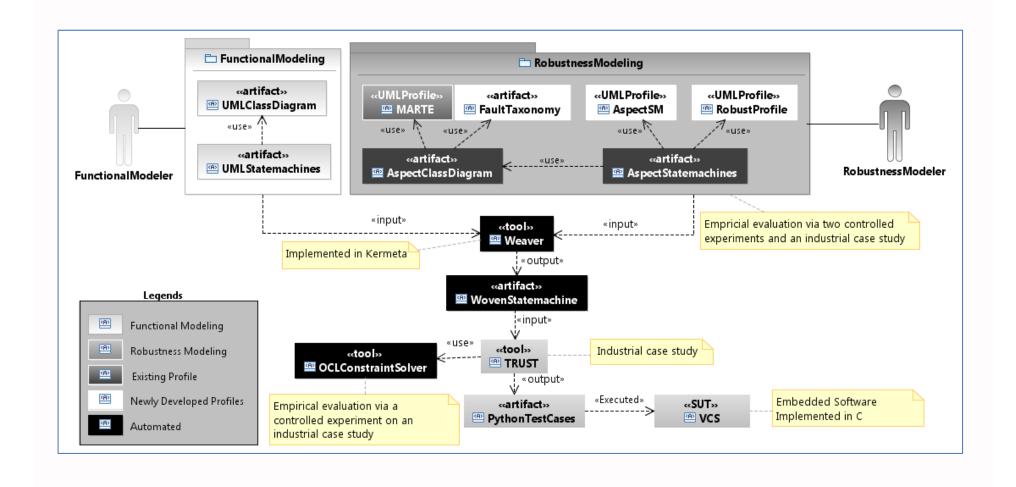
- Modeling robustness behavior makes modeling highly complex and redundant
- Automated generation of executable test cases from robustness models
  - ✓ Targeted to reveal robustness faults
  - ✓ Generating test data
  - ✓ Defining appropriate test strategies for robustness testing



# CASE STUDY: VIDEOCONFERENCING SYSTEMS (CISCO)

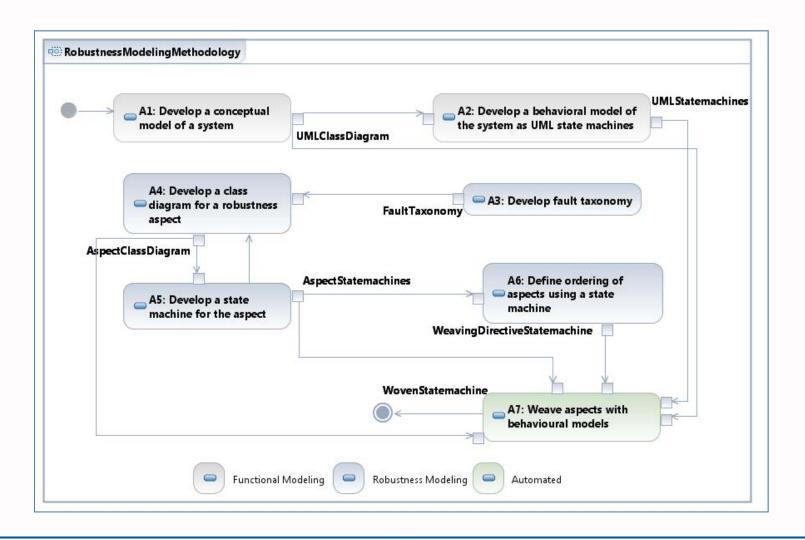


## SOLUTION FOR MODEL-BASED ROBUSTNESS TESTING



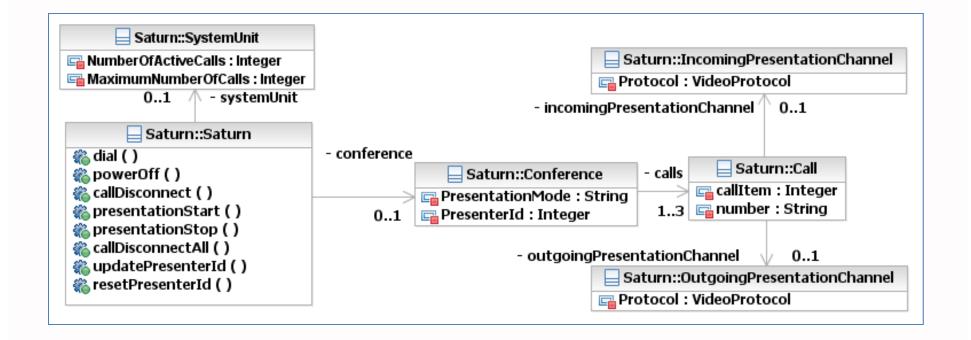


#### **MODELLING METHODOLOGY**



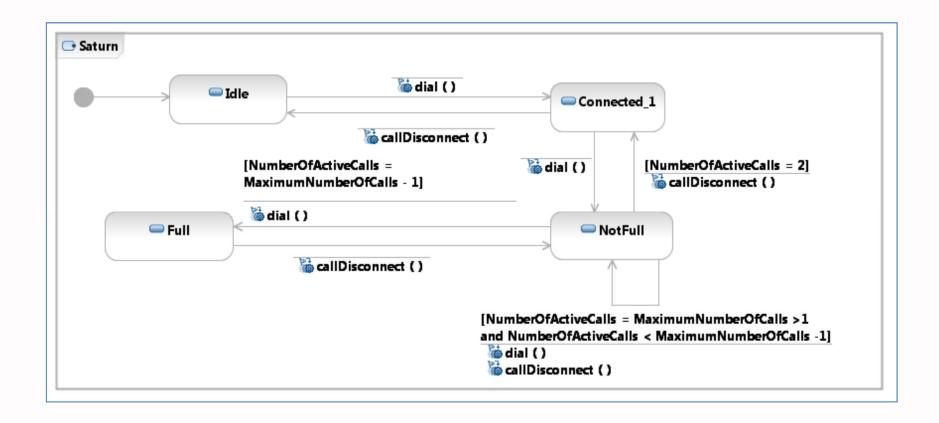


#### **MODELING FUNCTIONAL BEHAVIOR**



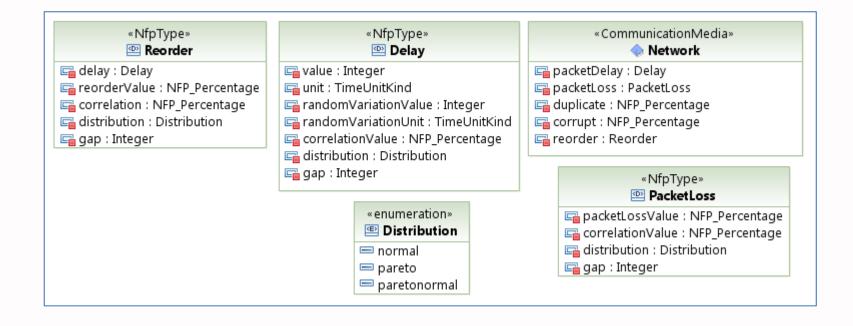


#### **MODELING FUNCTIONAL BEHAVIOR**



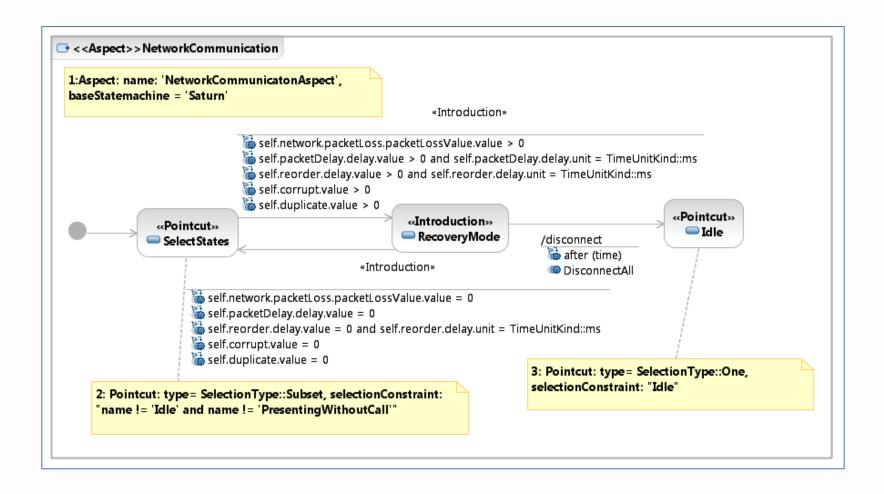


#### **MODELING ASPECT CLASS DIAGRAM**



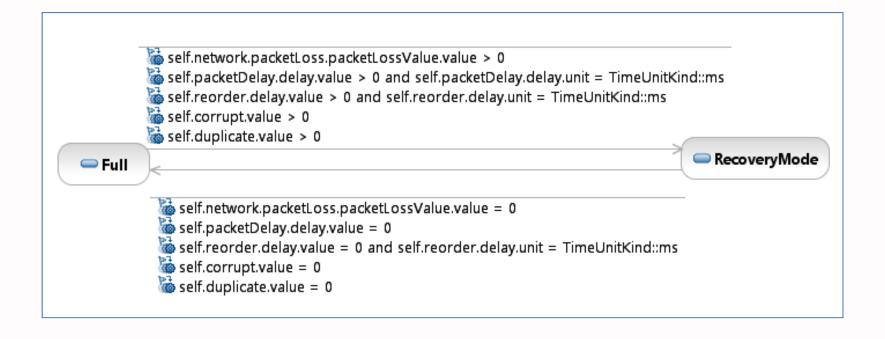


#### **MODELING ASPECT STATE MACHINES**





#### **WOVEN STATE MACHINE**





#### **RESULTS FROM MODELING**

Crosscutting	Using aspects			Without aspects			Effort Saved (%)		
behavior	States (Added)	Transition (Added)	Trigger (Added)	States (Modified/Added)	Transitions (Modified/Ad ded)	Trigger (Added)	States	Transitions	Trigger
Updating audio constraints	1	-	-	86 (Modified)	-	-	98%	-	-
Updating video constraints	1	-		86 (Modified)	-	-	98%	-	-
Media quality recovery	3	3	19	20 (Added)	178	1604	-	98%	98%
Network communication	3	3	13	20 (Added)	178	1082	-	98%	98%
Add Guard	2	1	-	0	22 (Modified)	-	-	95%	-



#### **TEST CASE GENERATION**

- Constraint solving using search algorithms for Test Data Generation (EsOCL tool)
  - ✓ Violates properties of the environment to check robustness of the system against those violations
  - ✓ Search algorithms such as GA, 1+1 (EA), ...
  - ✓ EsOCL's performance is practically applicable
- Developed a tool TRansformation-based tool for Uml-baSed Testing (TRUST)
  - ✓ Supports configurable and extensible features such as input models, test models, coverage criteria, test data generation strategies, and test script languages.
  - ✓ Applied to ABB Robotics and Cisco case studies





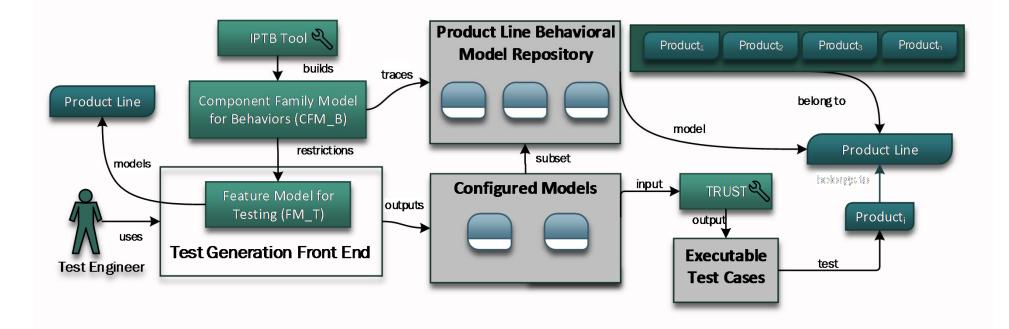


#### **RESULTS FROM EXISTING PROJECTS**

**PRODUCT LINE TESTING** 



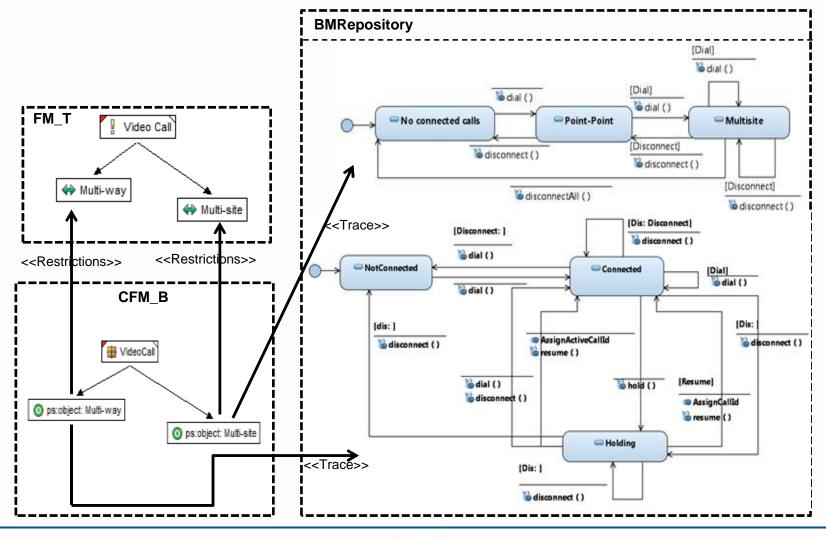




- Select features in FM\_T through the Selection Front-end
- Configure attributes CFM\_B through the Configuration Frontend

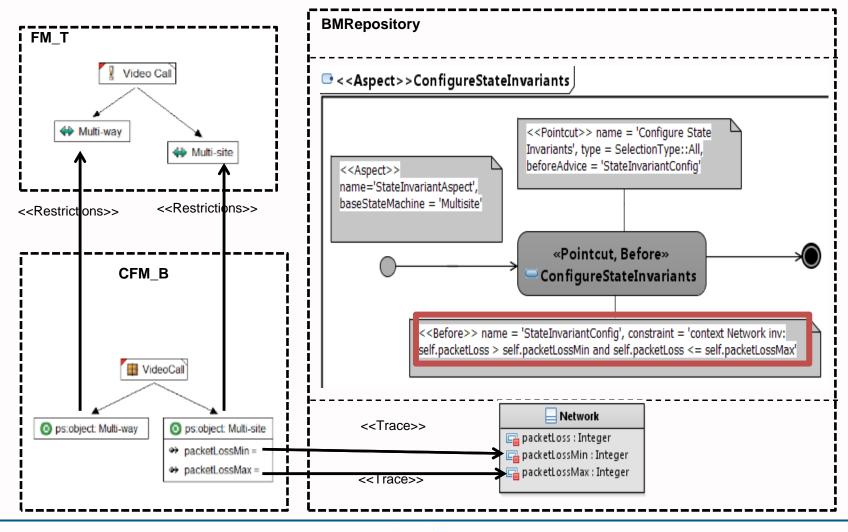


#### **STATE MACHINE VARIABILITY**



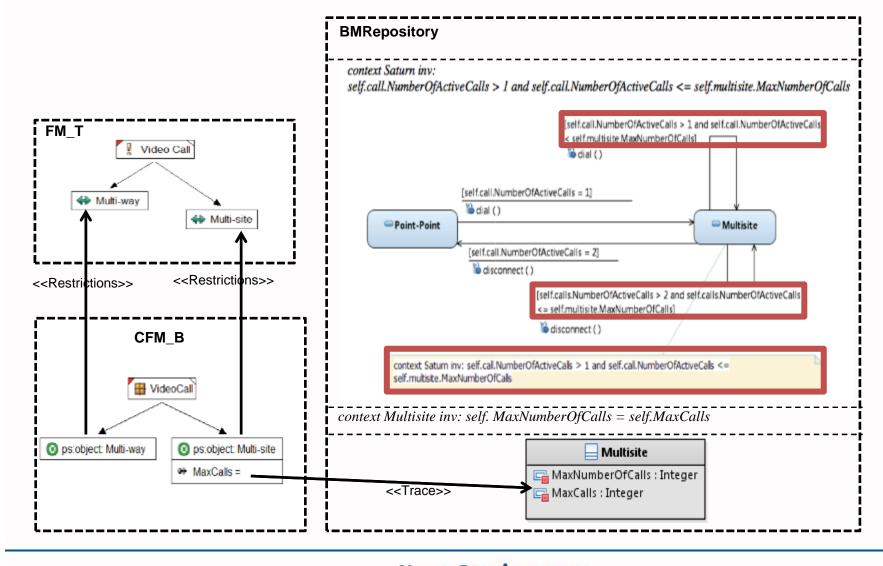


## STATE MACHINE MODEL ELEMENT VARIABILITY



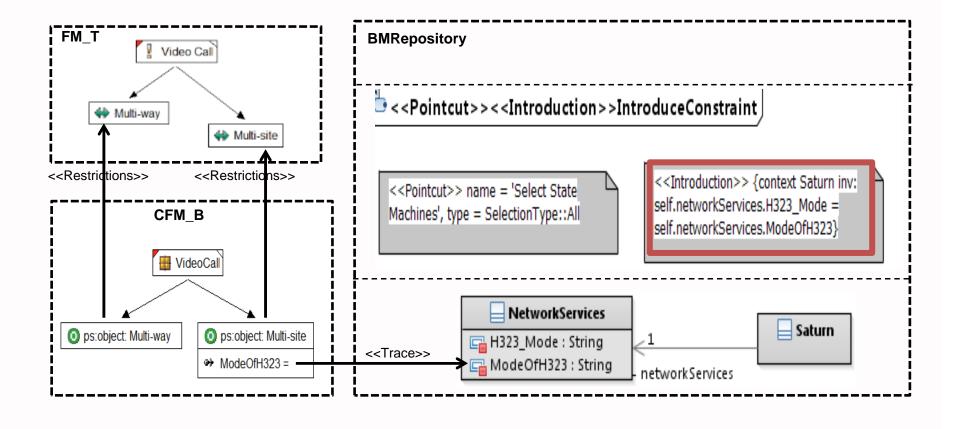








#### **ATTRIBUTE VARIABILITY**





#### **CONCLUDING REMARKS**

- Applied to configure several products in a Videoconferencing Product Line of Cisco.
- The configured models were successfully used to generate test cases using TRUST.







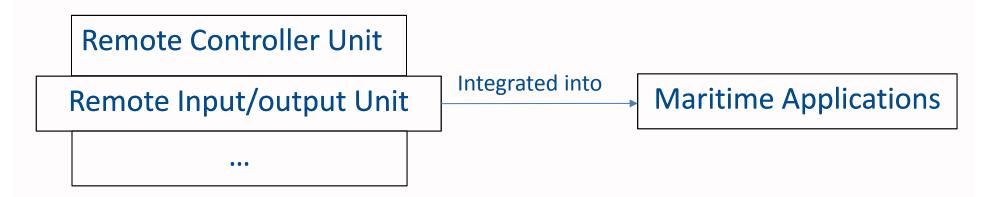
#### **RESULTS FROM SELECTED PROJECTS**

**ROBUSTNESS TEST SELECTION IN A MARITIME APPLICATION** 



#### **CONTEXT OF THE PROBLEM**

- As part of a project in Certus [1] with Kongsberg Maritime as industrial partner
- Overall optimization objective is to find a set of test cases to "break" a CPS as soon as possible



1. Certus Software Verification and Validation Center, http://certus-sfi.no/

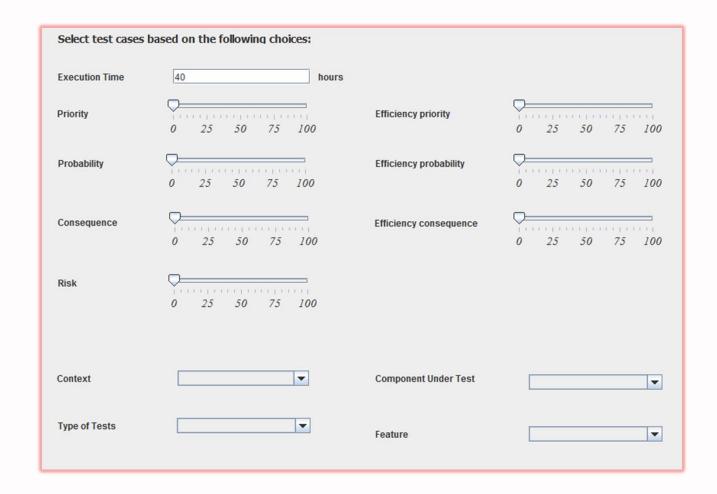


#### **OPTIMIZATION OBJECTIVES**

- Input: <u>Set of test cases</u> focusing on testing software, hardware (mechanical, electronics, ..), interactions among them
- Cost
  - ✓ Overall Execution Time,...
- Effectiveness
  - ✓ Probability of Failure, Risk, Safety Level, ...
- Fitness Function using Cost and Effectiveness measures
- Existing Implementation of Search Algorithms



#### **TOOL SUPPORT**





#### **CONCLUDING REMARKS**

- Some preliminary results are obtained.
- The tool seems to be promising based on initial experiments.
- More case studies are being conducted.







#### **ONGOING CPS TESTING PROJECT: H2020**

U-TEST: Testing Cyber-Physical Systems under Uncertainty: Systematic, Extensible, and Configurable Model-based and Search-based Testing Methodologies

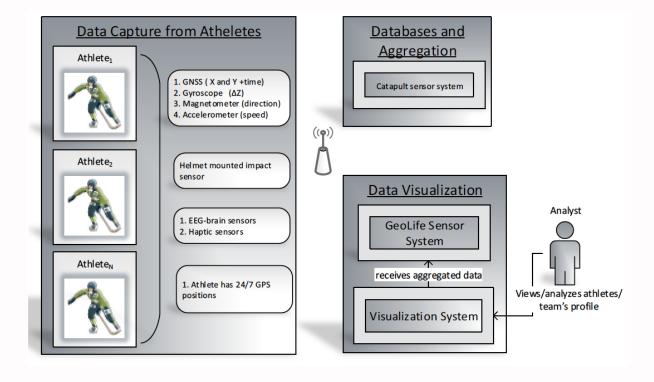


#### **OBJECTIVES OF U-TEST**

- Objective: Improve the dependability
- Means: Model-based and Search-based Testing
- Objective will be achieved by:
  - ✓ Uncertainty Taxonomy
  - ✓ Holistic Modeling and Testing Frameworks
  - ✓ Standards



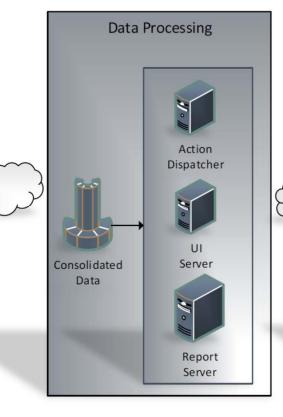
# Case Study Providers: Geo Sports Future Position X, Sweden





# Case Study Providers: Automated Warehouses ULMA Handling Systems, Spain









#### **CONSORTIUM**

#### Research Partners

- ✓ Simula Research Laboratory, Norway
- ✓ Fraunhofer FOKUS, Germany
- ✓ TU Wien, Austria

#### • Tool Vendors

- ✓ Easy Global Marketing
- ✓ FOKUS!MBT

#### • Exploitation

- ✓ Ikerlan
- Test Bed Provider
  - ✓ Nordic MedTest
- Project Management and Administration
  - ✓ Oslo Medtech







#### **SUMMARY OF RESULTS**

**MODELING AND TESTING SOLUTIONS** 

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#### **CPS MODELING FOR MBT**

Category	Objective	Modeling Solution	CPS	Application	
Robustness Testing	Test Case/Data Generation	UML Class Diagram, UML State Machine, AspectSM, and OCL	Video-Conferencing Systems Bottle Recycling System Ship Navigation System	Cisco Systems, Norway, Tomra, Norway WesternGeco, Norway	
	Test Selection	UML Class Diagram and OCL	Dynamic Positioning Systems Vessel Control Systems	Kongsberg Maritime, Norway	
Product Line Testing	Test Selection, Prioritization, Minimization	Feature Model Component Family Model	Video-Conferencing Systems	Cisco Systems, Norway	
	Test Case/Data Generation	UML Class Diagram, UML State Machine, AspectSM, OCL and Feature Model			
Functional Testing	Test Case/Data Generation	RUCM, RTCM			



www.u-test.eu



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### **Experiences**

Modeling Objective	Modeling Solutions
Requirements Specification, V&V	RUCM, RUCM4RT, RTCM, AspectRUCM, RUCM Variability, <b>RUCM4Uncertainty</b>
CPS Product Line Engineering	UML, OCL, MARTE, the SimPL Profile
Model Based Testing	UML, OCL, MARTE, the AspectSM Profile
Model Based Uncertainty Testing	UML, OCL, MARTE, SysML, the Uncertainty Profile
Model Based Product Line Testing	Feature Model, UML, the AspectSM Profile

#### **Experiences:**

- Largely relied on standards
- Proposed several profiles for various purposes
- Developed our own NL-based and model-based solutions
- Developed tools
- Intentionally made effort to reduce modeling effort
- Evaluated with controlled experiments and industrial case studies
- Used existing search algorithms and in rare cases extended



#### **Lessons Learnt**

Modeling Objective	Modeling Solutions
Requirements Specification, V&V	RUCM, RUCM4RT, RTCM, AspectRUCM, RUCM Variability, <b>RUCM4Uncertainty</b>
CPS Product Line Engineering	UML, OCL, MARTE, the SimPL Profile
Model Based Testing	UML, OCL, MARTE, the AspectSM Profile
Model Based Uncertainty Testing	UML, OCL, MARTE, SysML, the Uncertainty Profile
Model Based Product Line Testing	Feature Model, UML, the AspectSM Profile

#### **Lessons Learnt:**

- Poor capability of integrating methodologies and tools
- Difficult to think systematically since the beginning
  - ✓ Uncertainty taxonomy
- Always a challenge to evaluate a modeling methodology
  - ✓ Expressiveness, Usability, Applicability, Readability, etc.
- Which search algorithm to use in which situation
  - ✓ Large scale experiments to select algorithms for different situations



#### **Acknowledgements**

- Tao Yue, Shuai Wang, Bran Selic
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- Former Colleagues: Lionel Briand, Andrea Arcuri, Hadi Hemmati, Zohaib Iqbal, Nina Holt



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### Questions