

# FACING UNCERTAINTY IN COMPLEX CPS DESIGN

-- It's time to talk about the elephant in the room --

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# AGENDA

- The problem of uncertainty in system design
- The U-Test H2020 project
- U-Taxonomy: A conceptual model of uncertainty
- Applying the U-Taxonomy to CPS Testing
- Summary

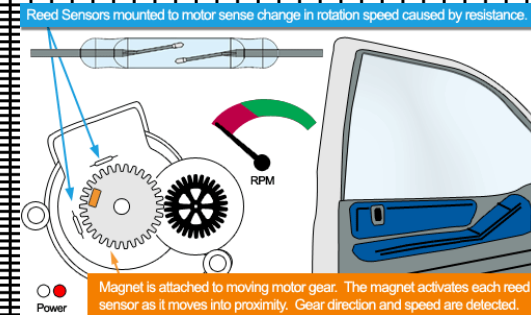


# A WHIFF OF THE ELEPHANT: THE "INTEGRATION" PROBLEM

- Occurs when independently defined features interact

	Susp	Brake	Steer	Wheel	Diff	Trans	Clutch	Eng	Driver
Susp		P	P	X+P	P	P	P	P	X+P
Brake	P		P	X+P	P	P	P	P	X+P
Steer	P	P		X+P	P	P	P	P	X+P
Wheel	X	X	X+P		X				
Diff	P	P	P	X+P		X+P	P	P	
Trans	P	P	P	P	X+P		X+P	P	P
Clutch		P	P		P	X+P		X+P	P
Eng	P	P	P	P	P	P	X+P		P
Driver	P	X+P	X+P		P	P	X+P	P	

IoT / SAE



*Everything is connected to everything else...we cannot model the Universe*

*⇒ engineering problems with greatly increased levels of UNCERTAINTY*

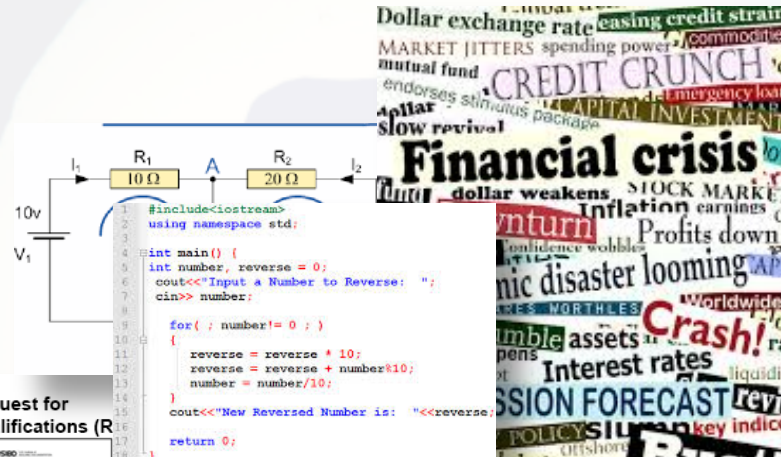
\*Table credit of Martin Grimheden, KTH

# COMPLEX SYSTEM DESIGN...

- ...requires knowledge of many different things...



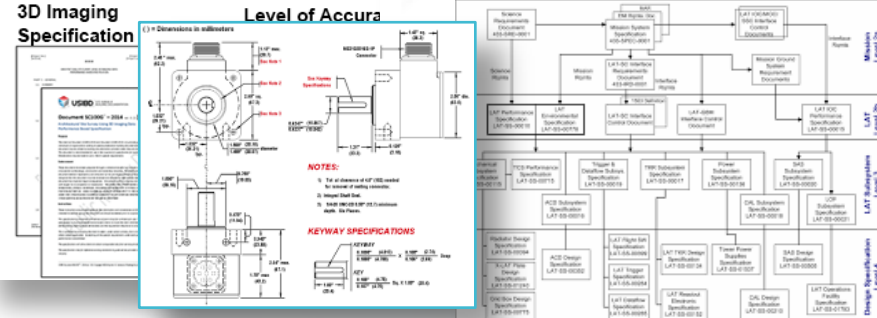
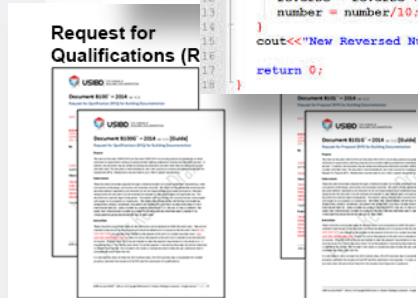
**A COMPLEX SYSTEM**



```

1 #include <iostream>
2 using namespace std;
3
4 int main() {
5     int number, reverse = 0;
6     cout << "Input a Number to Reverse: ";
7     cin >> number;
8
9     for( ; number != 0 ; )
10    {
11        reverse = reverse * 10;
12        reverse = reverse + number%10;
13        number = number/10;
14    }
15    cout << "New Reversed Number is: " << reverse;
16
17    return 0;
18 }
    
```

$$\begin{aligned}
 H(X) &= \sum_i P(x_i) H(Y|x_i) \\
 &= - \sum_i P(x_i) \sum_j P(y_j|x_i) \log P(y_j|x_i) \\
 &= - \sum_{i,j} P(x_i \cdot y_j) \log P(y_j|x_i) \\
 &= - \sum_{i,j} P(x_i \cdot y_j) \log P(x_i \cdot y_j) + \sum_{i,j} P(x_i \cdot y_j) \log P(x_i) \\
 &= H(X, Y) - H(X)
 \end{aligned}$$





# WHERE THE ELEPHANT LIES

RQ: How can we factor this into our design?



**A COMPLEX SYSTEM**

**Risk**

Set of all the things we need to know



Set of things we don't know that we don't know

(Unknown Unknowns)

Covered by "conventional" design methods

Set of things we know we don't know

(Known Unknowns)

"Tacit knowledge"

Set of things we don't realize we know

(Unknown Knowns)

Set of things we know we know

(Known Knowns)

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# THE U-TEST H2020 PROJECT



## U-Test: Testing Cyber-Physical Systems under Uncertainty

### OBJECTIVE:

*To improve the dependability of CPSs, via cost-effective model-based and search-based testing of CPSs under uncertainty, by (1) defining an uncertainty taxonomy and (2) holistic modelling and testing frameworks with considerable reliance on standards.*

**Duration: 2015 – 2018**  
**Overall funding: € 3.71M**  
**Members: 9**

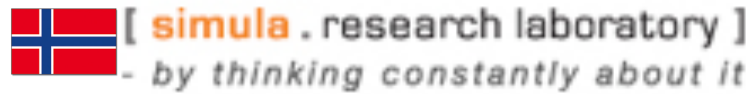


# U-TEST CONSORTIUM: MEMBERS



**U-Test**

## 1. Research Partners



## 4. Test Bed Provider



## 2. Case Study Providers



## 5. Exploitation



## 3. Tool Providers



## 6. Dissemination/ Administration/ Financial





# AGENDA

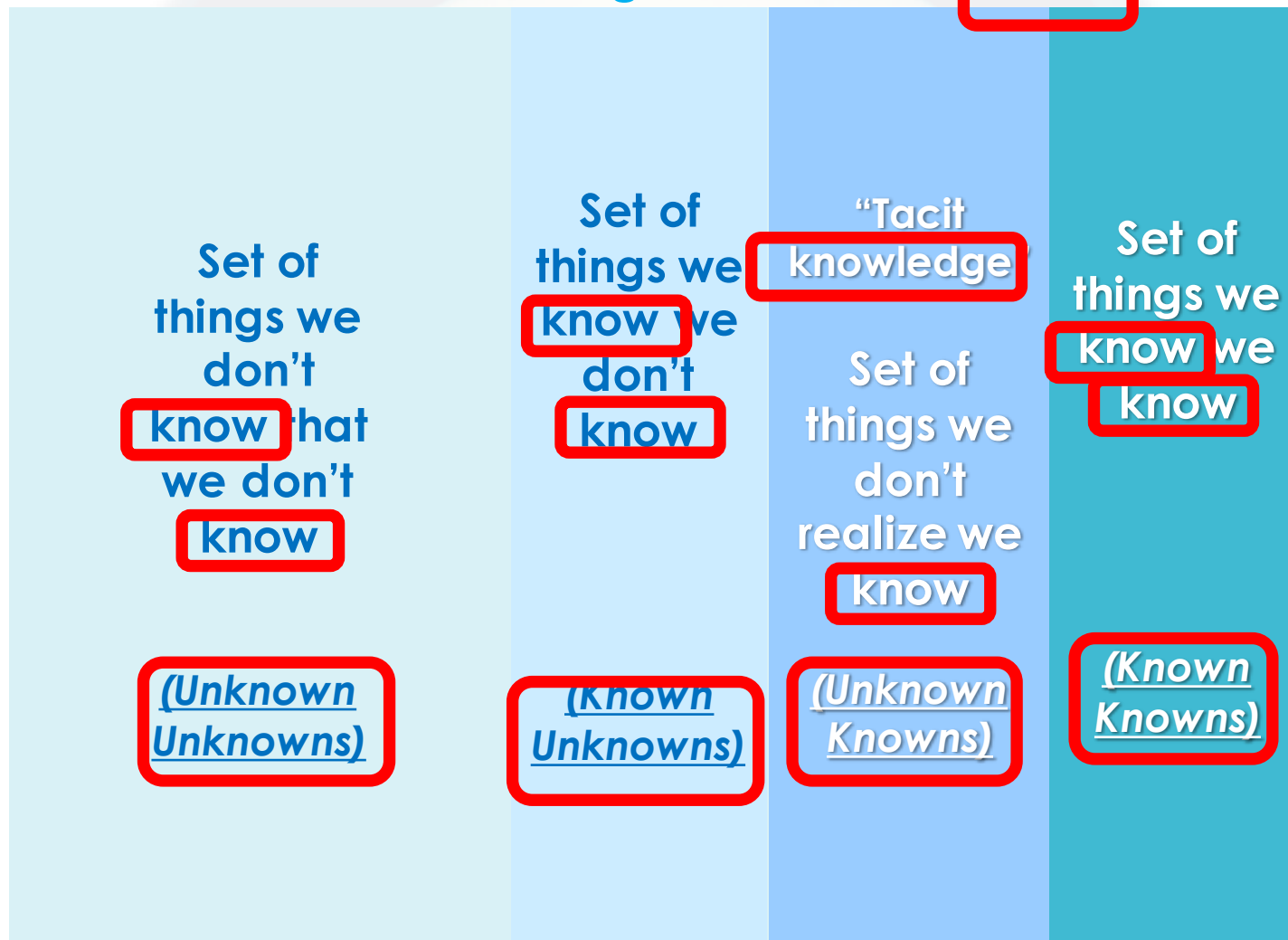
- The problem of uncertainty in system design
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# UTEST APPROACH TO UNCERTAINTY

- **Start with a general reference model of uncertainty**
  - ✓ Basis for a common conceptual framework for discussing and reasoning about uncertainty
  - ✓ Includes capability to characterize uncertainty both quantitatively and qualitatively (e.g., for analyses)
- **Foundation for domain-specific specializations**
  - ✓ E.g., testing of CPS

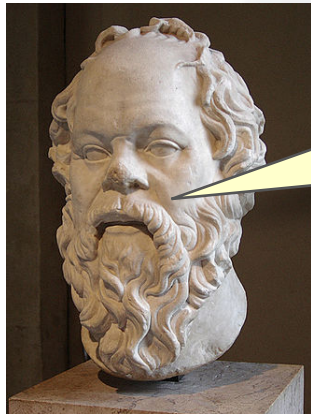
# CATEGORIES OF KNOWLEDGE

Set of all the things we need to know



# BUT, WHAT IS "KNOWLEDGE"?

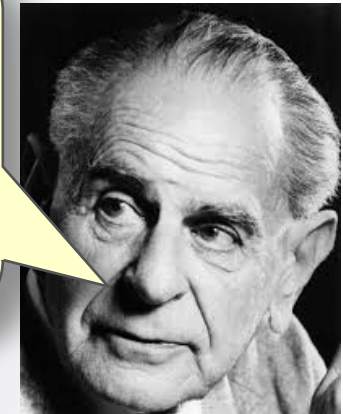
- Knowledge is an elusive and controversial concept
  - ✓ Philosophers have been disagreeing on its meaning for centuries
  - ✓ Epistemology = a whole discipline dedicated to the study of knowledge



"I know that I know nothing"

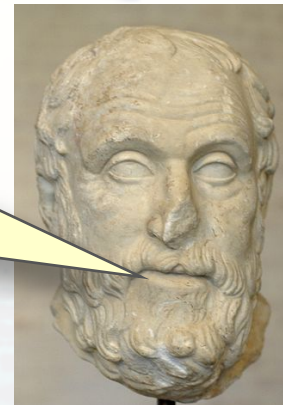
SOCRATES (470-399 BC)

Knowledge is, irreducibly conjectural or hypothetical, generated by creative imagination [Wikipedia]



K. POPPER (1902-1994)

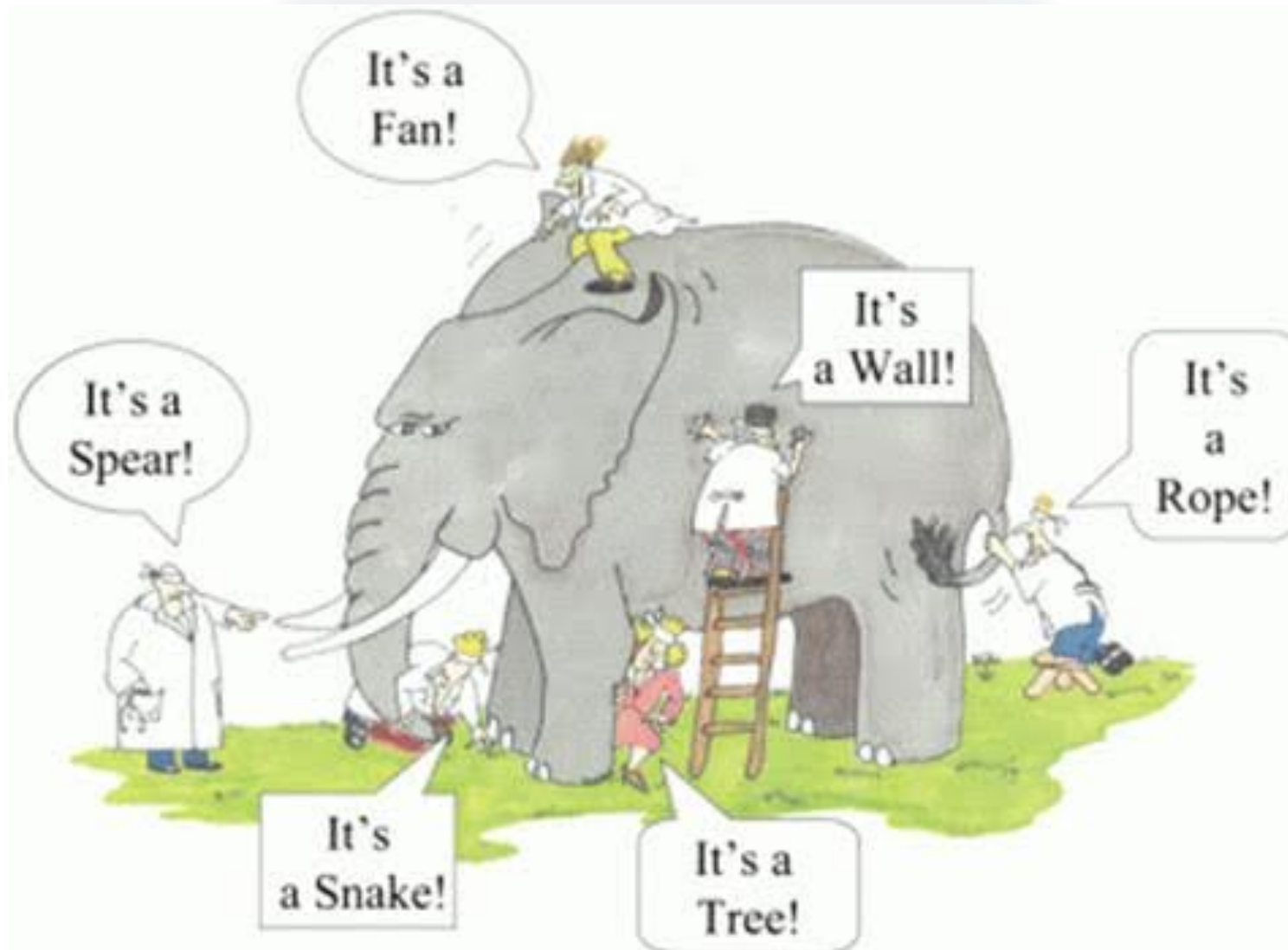
"Nothing can be known – not even this"



CARNEADES (213-129 BC)

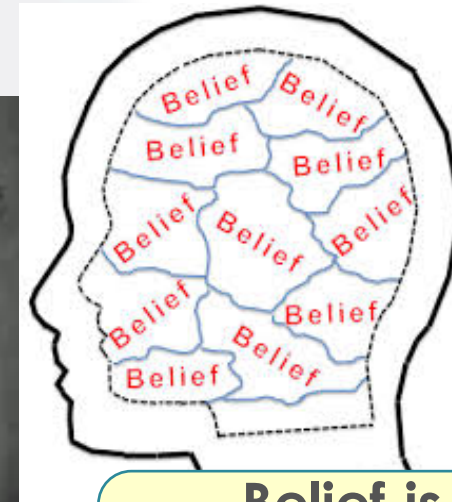


# KNOWLEDGE AND TRUTH



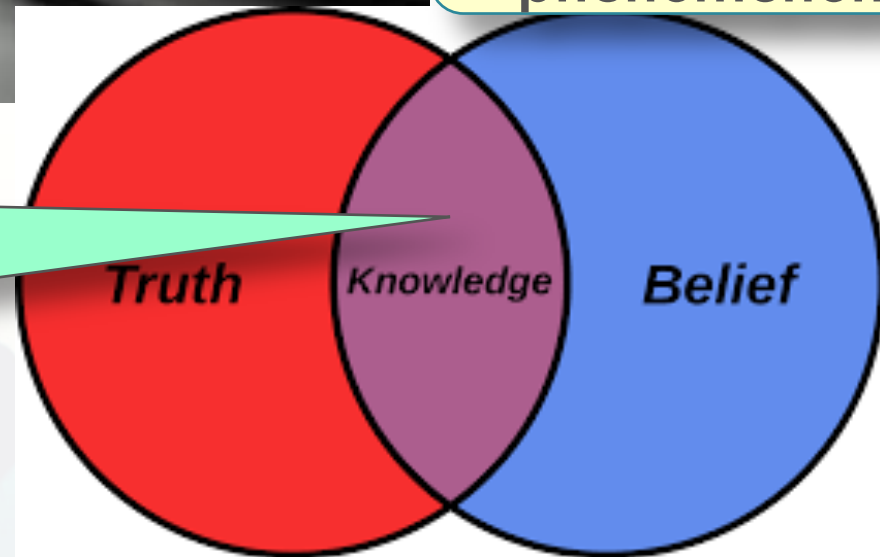
***NB: Each statement is based on concrete evidence!***

# SO, WHAT'S LEFT?

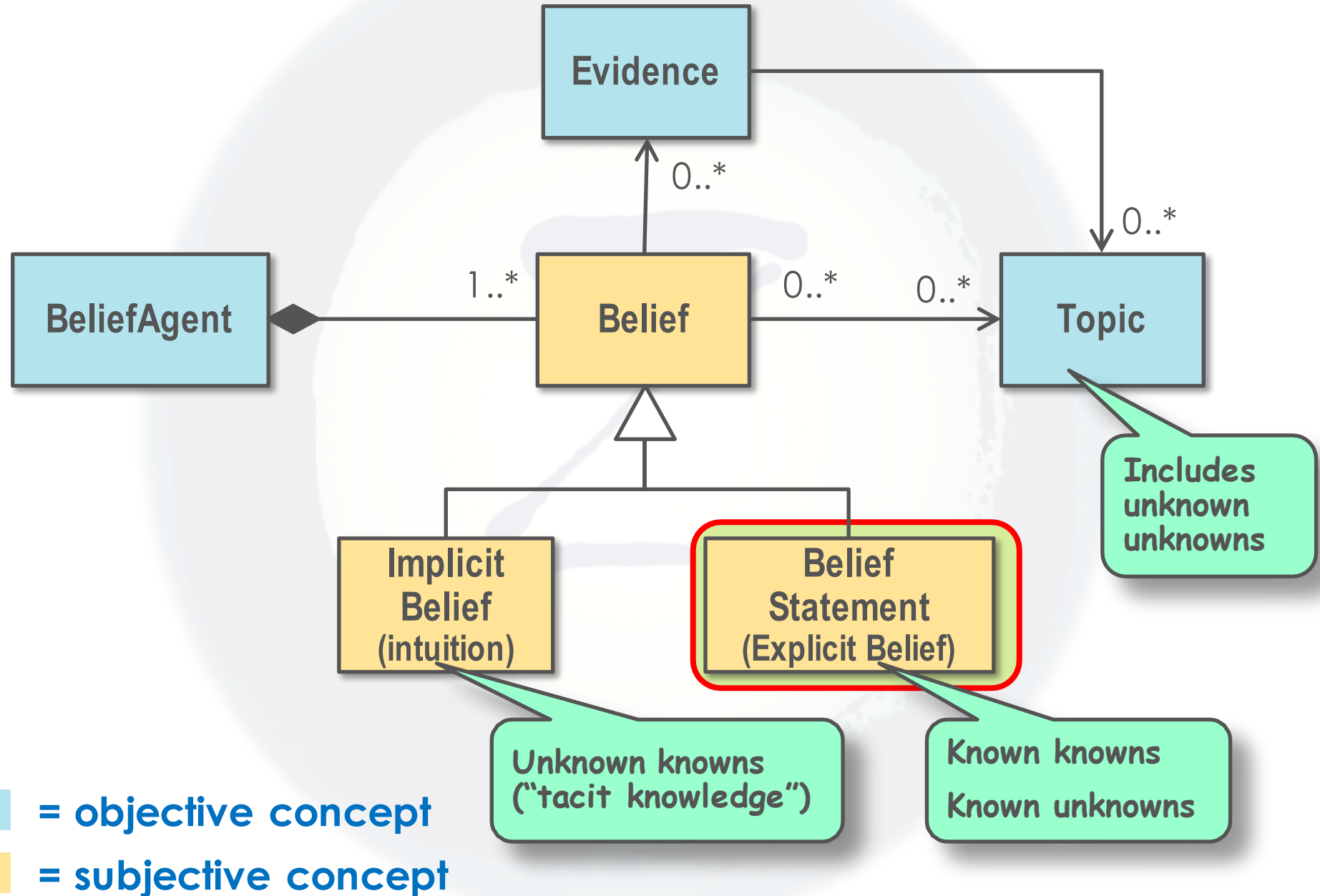


**Belief is a subjective phenomenon**

We cannot even be certain of which of our beliefs corresponds to the truth (and how much)!



# THE U-TAXONOMY BELIEF MODEL

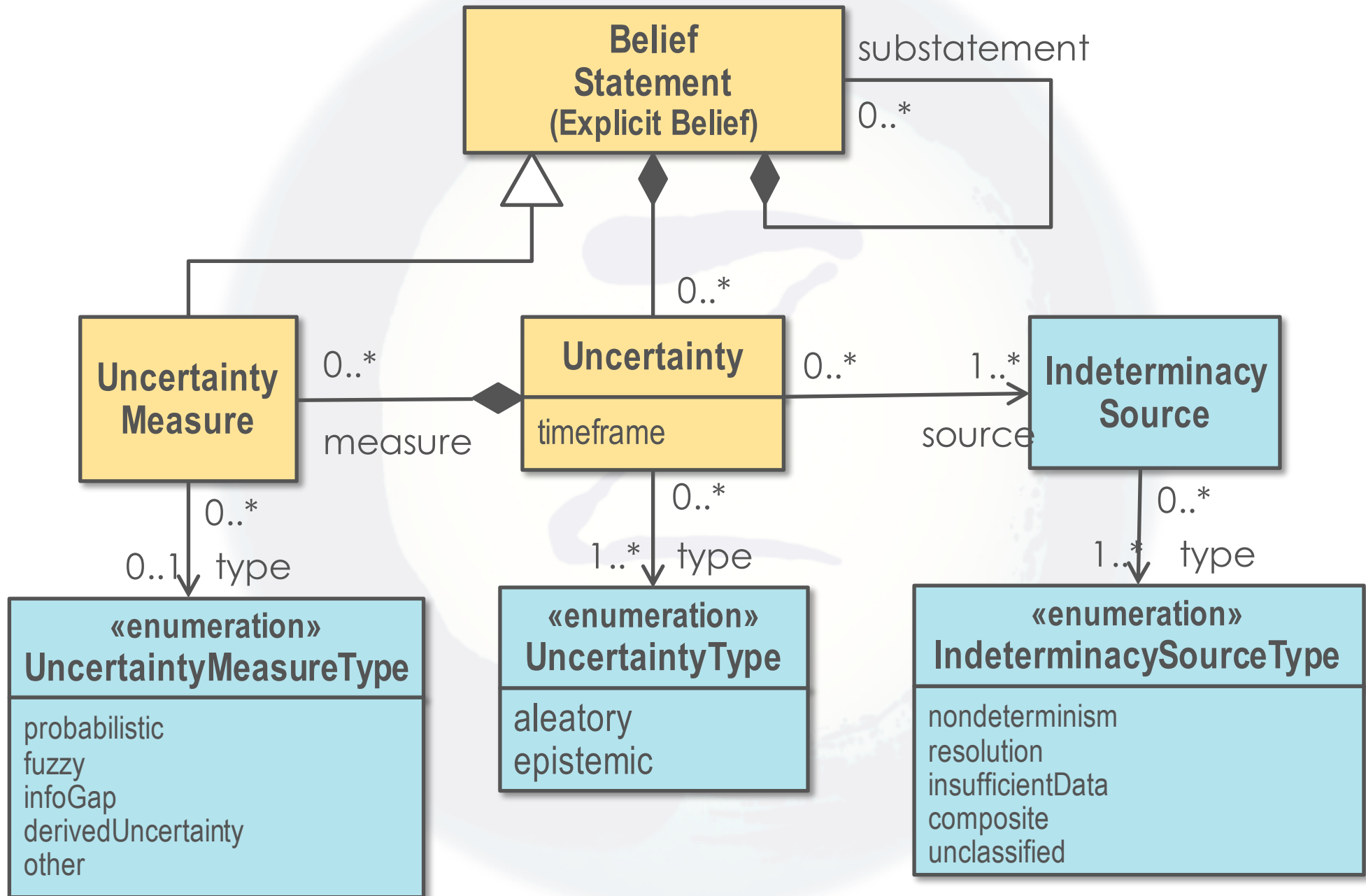


# SOME KEY DEFINITIONS

- **Belief Agent**: an individual, group, or mechanism capable of acting or reasoning based on one or more beliefs that it holds
- **Belief**: An implicit or explicit opinion or conviction held by a belief agent
- **Belief Statement**: an explicit formulation of a belief
  - ✓ E.g., natural language, mathematical expression, binary code
- **Topic**: some objective phenomenon or concept that may be the subject of beliefs
- **Evidence**: objective information that may be used to justify a belief



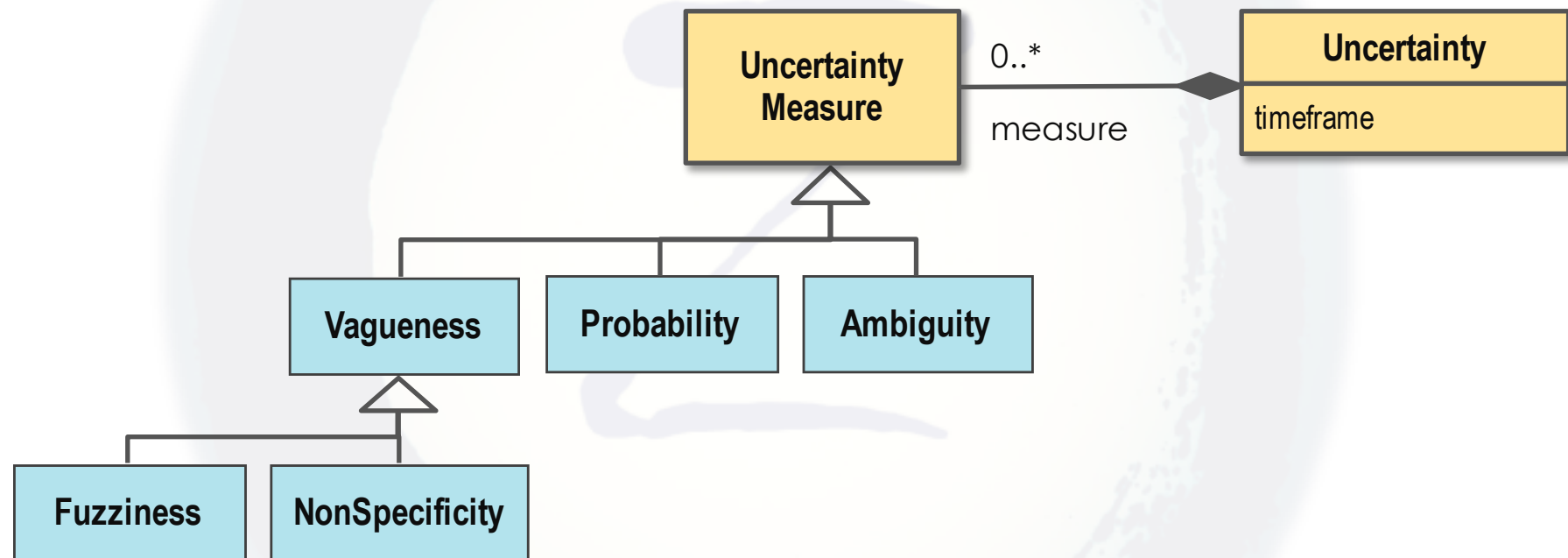
# U-TAXONOMY: UNCERTAINTY



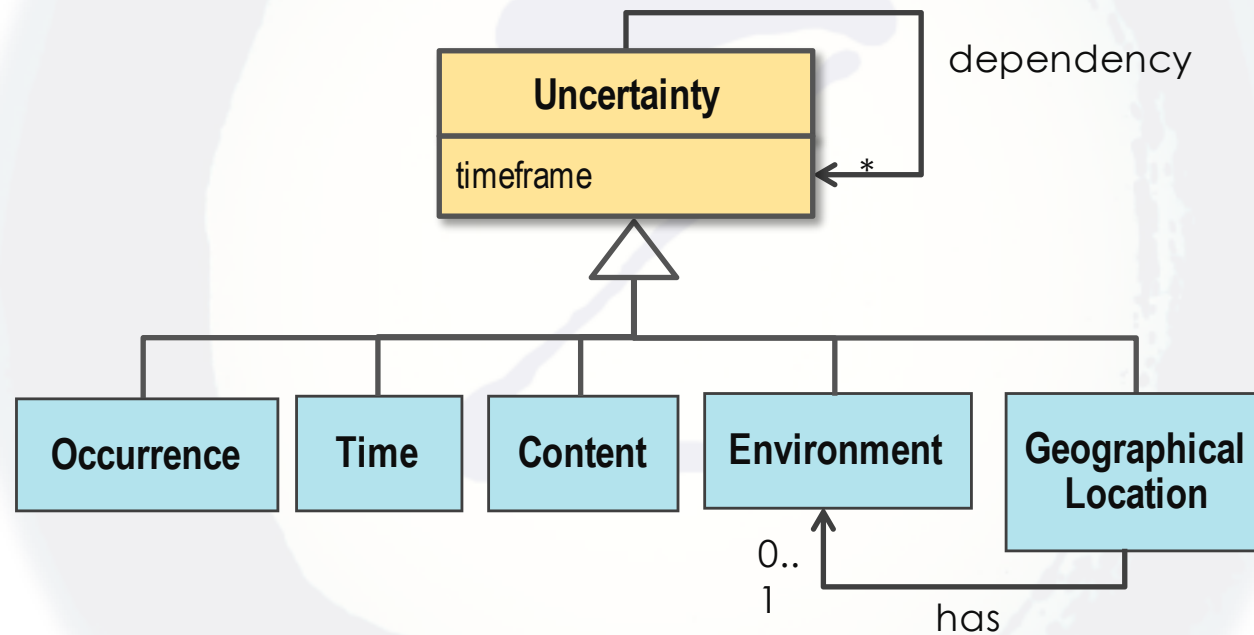
## MORE KEY DEFINITIONS

- **Uncertainty**: Lack of confidence by a belief agent in the accuracy (truthfulness) of a belief statement
- **Uncertainty Measure**: An explicit quantified or qualified expression, specified by a belief agent, of the degree of uncertainty (or confidence) associated with a belief statement
  - ✓ NB: Not a measure of truthfulness, but of belief of truthfulness of a statement
- **Indeterminacy Source**: the direct causes of uncertainties associated with a belief statement
- **Uncertainty Type**:
  - ✓ Aleatory - uncertainty due to non-deterministic or variability phenomena
  - ✓ Epistemic - uncertainty due to lack of information on the part of the belief agent

# MEASURE MODEL

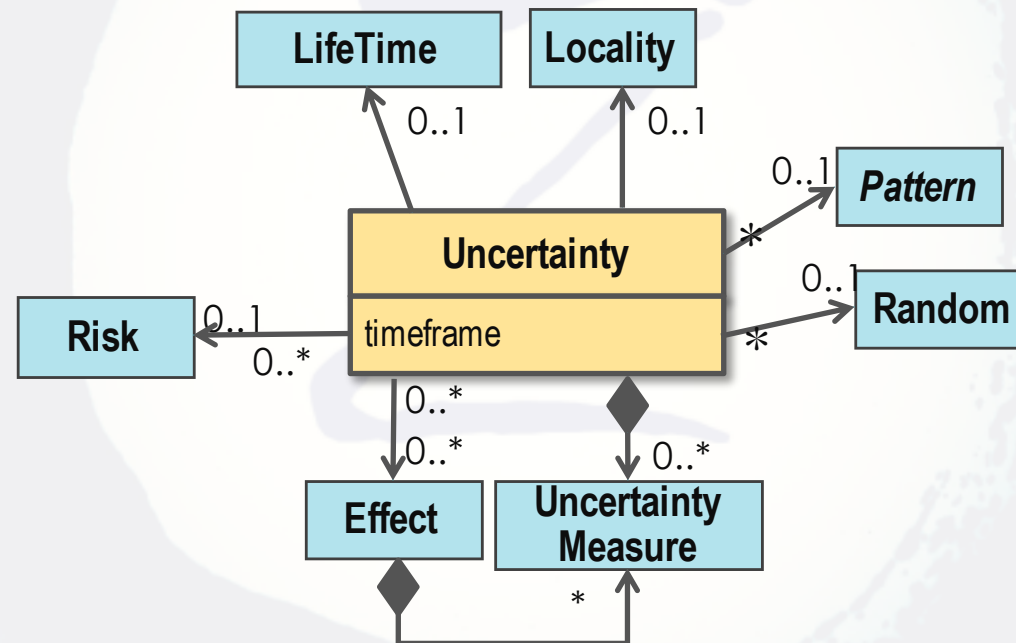


# UNCERTAINTY MODEL - CLASSIFICATION

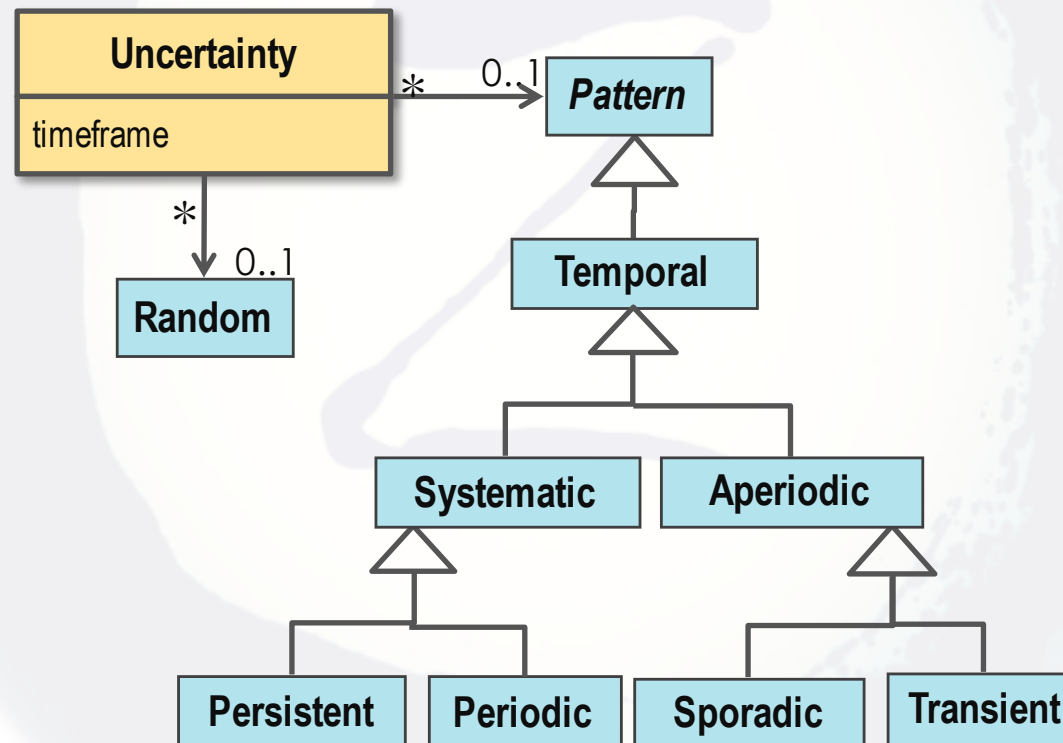




# UNCERTAINTY MODEL - CHARACTERIZING UNCERTAINTY



# UNCERTAINTY MODEL - PATTERNS OF UNCERTAINTY OCCURRENCE



# UNCERTAINTY MODEL - RISK



# SO, WHAT CAN WE DO WITH THIS?

- **Foundation for purpose-specific specializations**
  - ✓ **Systematically identifying, collecting, specifying and discovering uncertainty requirements**
    - Reference model for asking questions in a structured, precise, and systematic manner
    - RUCM-Uncertainty for specifying known uncertainty requirements and automated discovering of unknown uncertainty requirements
  - ✓ **Modeling, analysing and discovering software/system uncertainty behaviours**
  - ✓ **Testing software/system under uncertainties**

# AGENDA

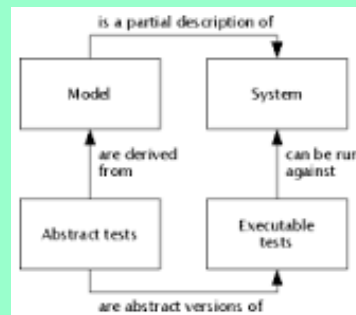
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# PROPOSED TECHNICAL APPROACH



**U-Test**

## Model-based Testing



## Search-based Testing



- **Abstraction**
- **Complexity management**
- **Automation**
- **Systematic approach**
- **Industry standards**

- **Optimization**
- **“Smart” mechanisms**
- **Uncovering unknown unknowns**
- **Genetic algorithms**
- **...**



# THE U-TEST H2020 PROJECT



## U-Test: Testing Cyber-Physical Systems under Uncertainty

### OBJECTIVE:

*To improve the dependability of CPSs, via cost-effective model-based and search-based testing of CPSs under uncertainty, by (1) defining an uncertainty taxonomy and (2) holistic modelling and testing frameworks with considerable reliance on standards.*

**Approach:** start with *requirements* as a basis for:

- Specifying uncertainties
- Test case specification



# U-TEST: TESTING WITH UNCERTAINTY

- Relinquish full deterministic control of test
- Use search-based testing techniques (combined with genetic algorithms) to explore the “unknown unknown” space and uncover unforeseen situations

## Search-based Testing



- Optimization
- “Smart” mechanisms
- Uncovering unknown unknowns
- Genetic algorithms

• ...

*This research is currently in progress*

# RUCM: RESTRICTED USE CASE MODELING\*

- **A method (and tool) for specifying UML use cases based on restricted natural language**
  - ✓ PhD thesis of Dr. Tao Yue at Carleton U. in Canada
  - ✓ Facilitates transition from informal domain of user requirements to formal domain of engineering models
    - Automated translation of use cases to UML analysis models
  - ✓ Tool and method currently in use by Simula Research Laboratory (Norway) and at the U. of Luxembourg
- **Zen RUCM version of the tool used in the U-Test project by case study providers to specify their use cases**
  - ✓ <https://ghost.simula.no/publications/Simula.simula.2078>

(\*) T. Yue, L. Briand, and Y. Labiche, “aToucan: An Automated Framework to Derive UML Analysis Models from Use Case Models”, *ACM Trans. On Software Engineering and Methodology* (24, 3), May 2015.

# RUCM EXAMPLE

<b>Use Case Name</b>	Withdraw Fund	
<b>Brief Description</b>	ATM customer withdraws a specific amount of funds from a valid bank account.	
<b>Precondition</b>	The system is idle. The system is displaying a Welcome message.	
<b>Primary Actor</b>	ATM customer	
<b>Secondary Actors</b>	None	
<b>Dependency</b>	INCLUDE USE CASE Validate PIN.	
<b>Generalization</b>	None	
<b>Basic Flow</b>	<b>Steps</b>	
	1	INCLUDE USE CASE Validate PIN.
	2	ATM customer selects Withdrawal through the system
	3	ATM customer enters the withdrawal amount through the system.
	4	ATM customer selects the account number through the system.
	5	The system VALIDATES THAT the account number is valid.
	6	The system VALIDATES THAT ATM customer has enough funds in the account.
	7	The system VALIDATES THAT the withdrawal amount does not exceed the daily limit of the account.
	8	The system VALIDATES THAT the ATM has enough funds.
	9	The system dispenses the cash amount.
	10	The system prints a receipt showing transaction number, transaction type, amount withdrawn, and account balance.
	11	The system ejects the ATM card.
	12	The system displays Welcome message.
<b>Postcondition</b>	ATM customer funds have been withdrawn.	

# RUCM4UNCERTAINTY

- A modified version of the original RUCM tool that incorporates the UTaxonomy

Belief Specification																					
Use Case Name(Belief)	Monitor Windows and Doors																				
Brief Description	Notify the monitoring personnel about a possible intrusion into the home.																				
Precondition(Belief)	The monitoring windows and doors options are not set.																				
Primary Actor(Belief)	Intruder																				
Secondary Actors (Belief)	Home Owner, Monitoring Personnel, Magnetic Switch																				
Dependency(Belief)	None																				
Generalization(Belief)	None																				
Evidence Description	REF Experience																				
IndeterminacySource Description	REF Unpredicted intrusion, REF behavior																				
Belief Degree	Probability::80%																				
Belief Agent	Fancisco Rojas																				
Stated Time	03-06-2209, unknown																				
Basic Flow (Belief) (Until)	<table border="1"> <thead> <tr> <th colspan="2">Steps</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>IF Home Owner is outside TH</td> </tr> <tr> <td>2</td> <td>Home Owner enables the</td> </tr> <tr> <td>3</td> <td>The system enables the m</td> </tr> <tr> <td>4</td> <td>DO</td> </tr> <tr> <td>5</td> <td>The system invokes the m</td> </tr> <tr> <td>6</td> <td>The system <b>VALIDATES THAT</b> the status of windows and doors is normal.</td> </tr> <tr> <td>7</td> <td><b>UNTIL</b> Home Owner disables the monitoring of windows and doors</td> </tr> <tr> <td>8</td> <td><b>ENDIF</b></td> </tr> <tr> <td>Postcondition (Belief)</td> <td>None</td> </tr> </tbody> </table>	Steps		1	IF Home Owner is outside TH	2	Home Owner enables the	3	The system enables the m	4	DO	5	The system invokes the m	6	The system <b>VALIDATES THAT</b> the status of windows and doors is normal.	7	<b>UNTIL</b> Home Owner disables the monitoring of windows and doors	8	<b>ENDIF</b>	Postcondition (Belief)	None
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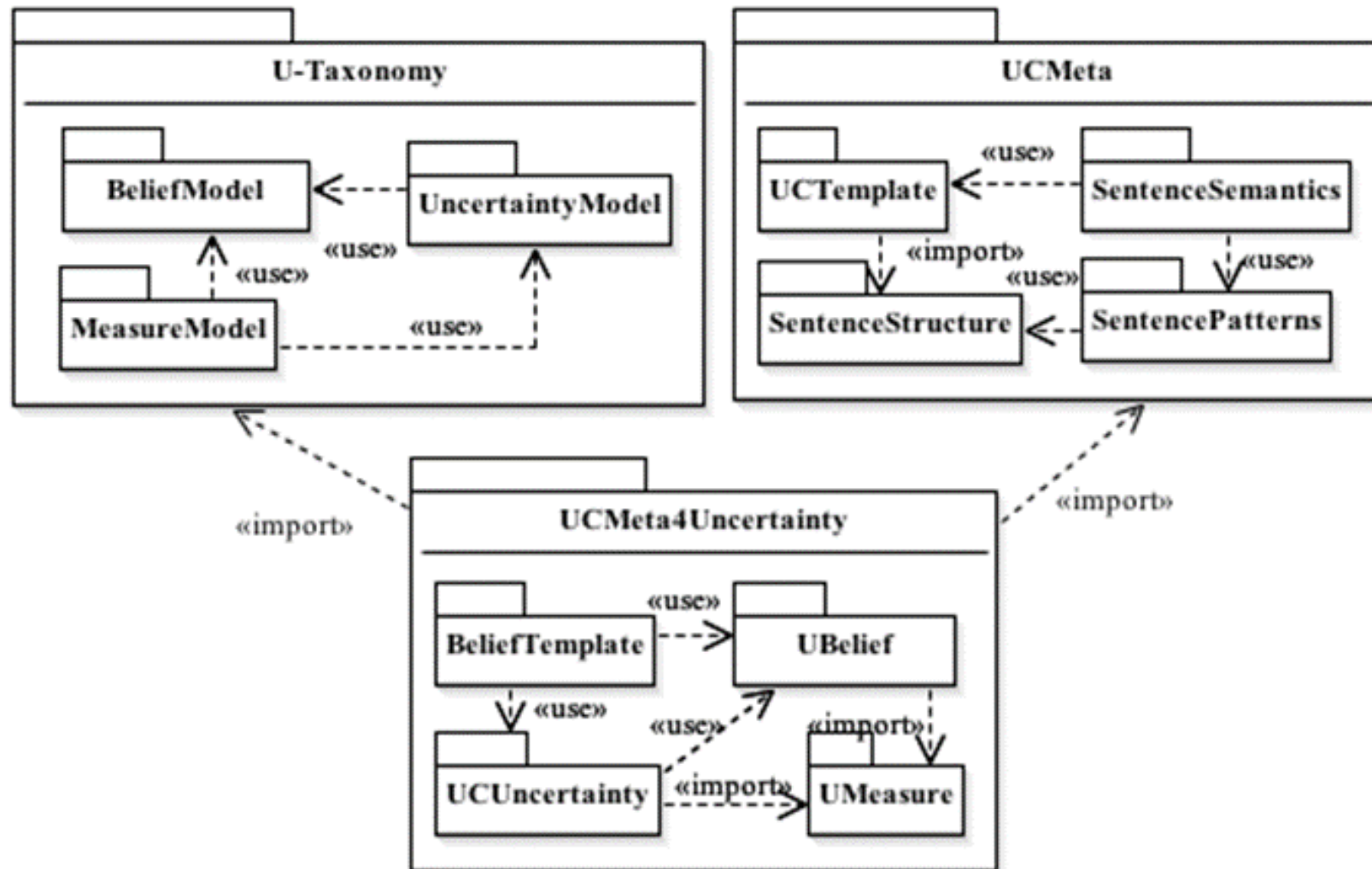
The entire use case (and/or individual steps) can be treated as a specific kind of Belief Statement with its own uncertainty characteristics and measures

Belief statements can be characterized (e.g., trustworthiness)



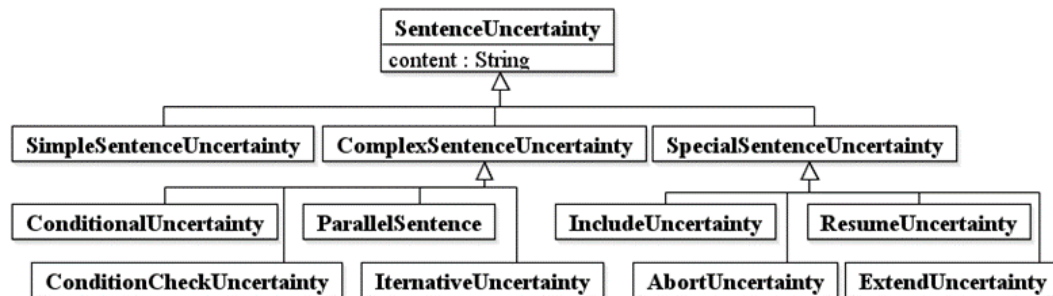
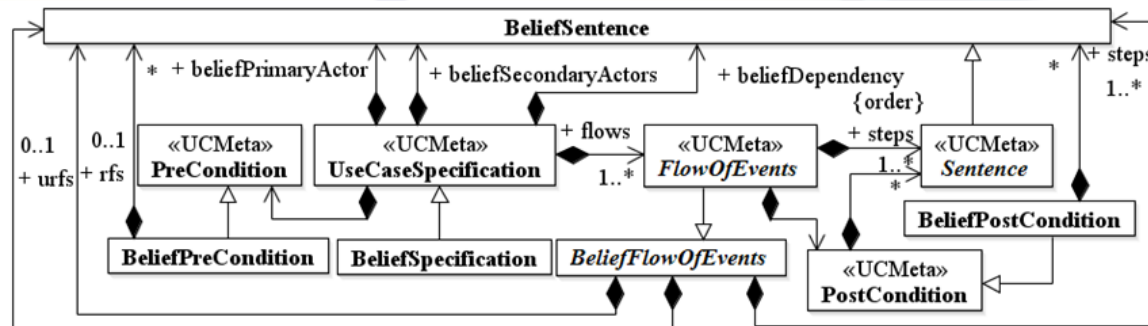
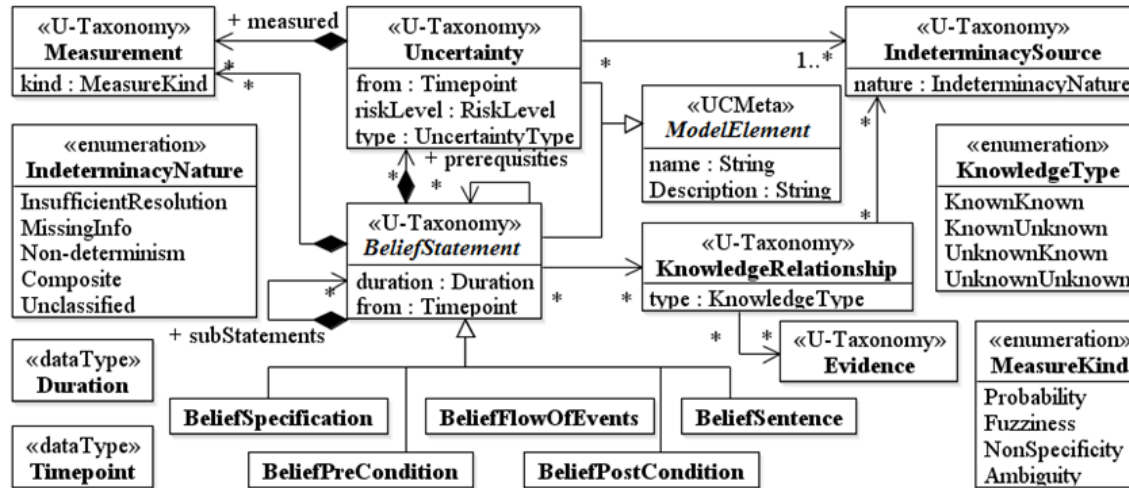
# RUCM FOR THE U-TAXONOMY

- For this to work, it was necessary to merge two domain-specific languages:





# MERGED METAMODEL



# AGENDA

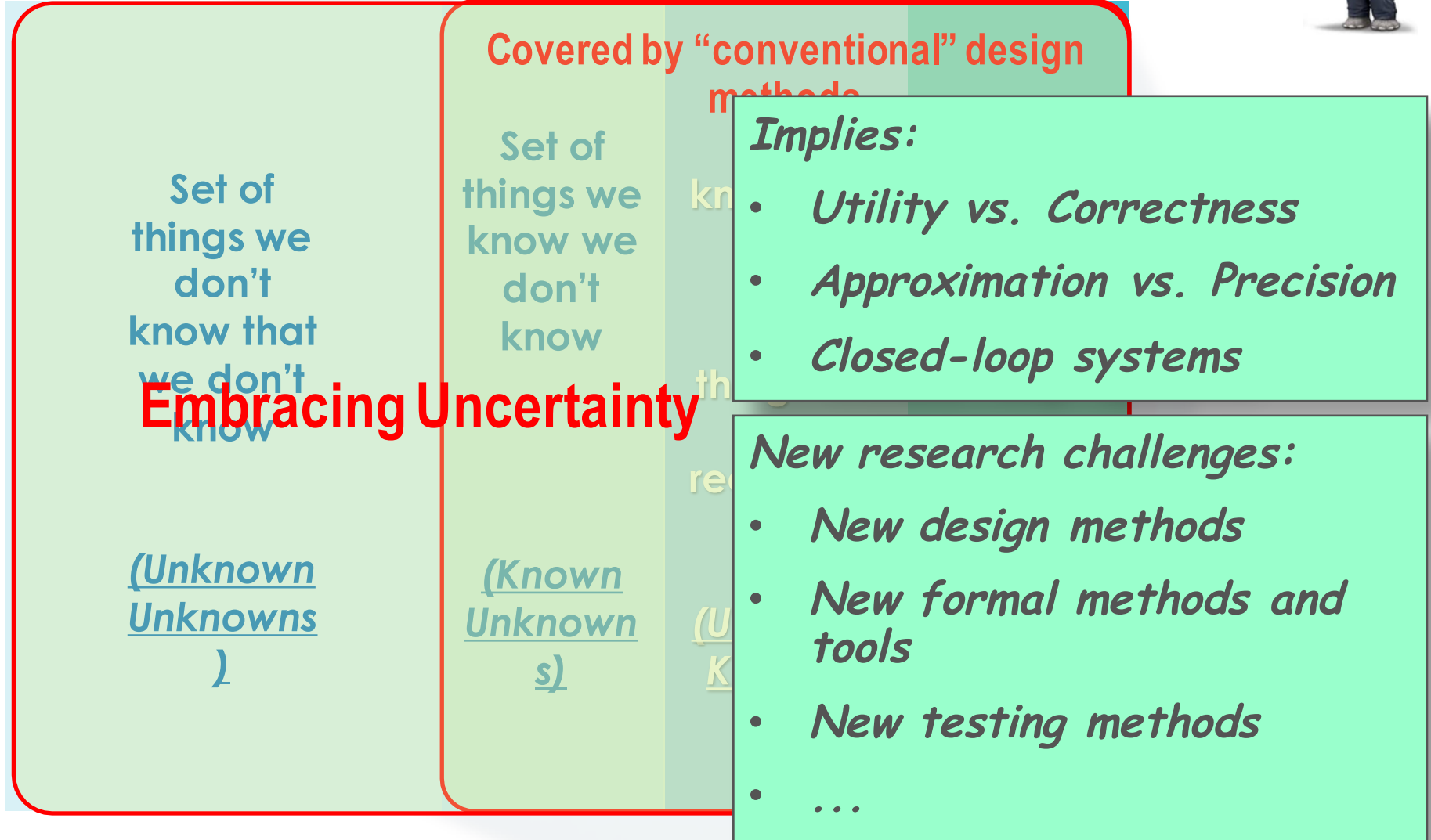
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# UNCERTAINTY AS PRIMARY DESIGN CONCERN

- Methods that explicitly address uncertainty

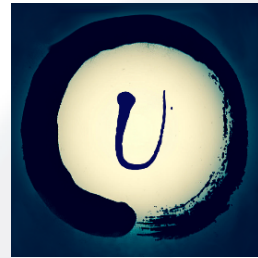


Set of all the things we need to know



**Embracing Uncertainty**

# THE U-TEST H2020 PROJECT



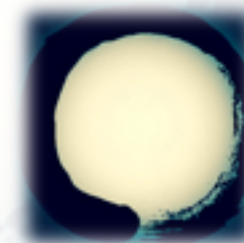
**U-Test**



- Primary focus on testing CPS in the presence of uncertainty
- Objectives:
  - ✓ An extensible conceptual framework for representing and reasoning about uncertainty (the U-Taxonomy)
    - Status: Initial proposal available
    - Potentially reusable beyond the testing context
  - ✓ New methods for testing (initial work commencing)
    - Status: Experimental testbed and tool under construction
    - Status: Industrial case studies in development



# THANK YOU!



**An Uncertainty Taxonomy to Support Model-Based Uncertainty Testing of Cyber-Physical Systems**

MAN ZHANG, BRAN SELIC, SHAUKAT ALI, TAO YUE, OSCAR OKARIZ AND ROLAND NORGREN

Technical Report TR 2015-3, Simula Research Laboratory

<https://www.simula.no/publications/uncertainty-taxonomy-support-model-based-uncertainty-testing-cyber-physical-systems>