



26th annual INCOSE

international symposium

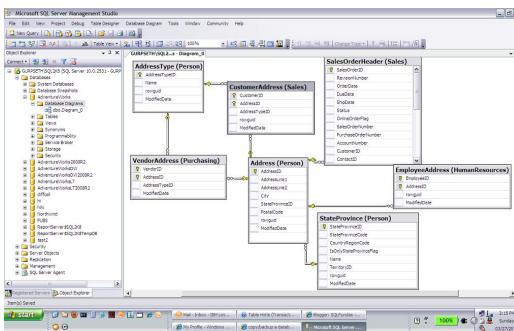
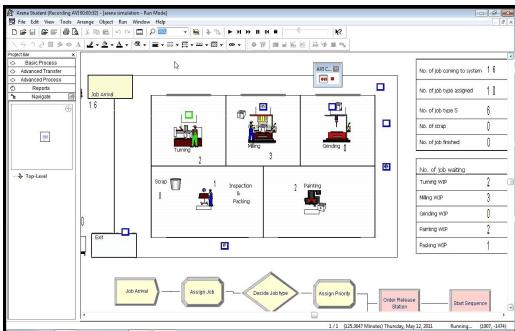
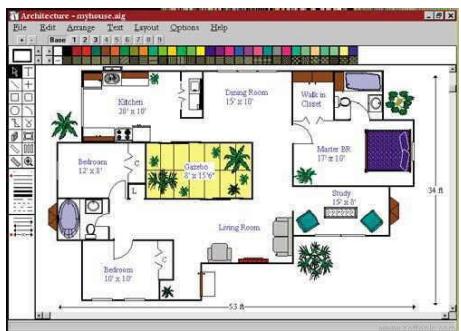
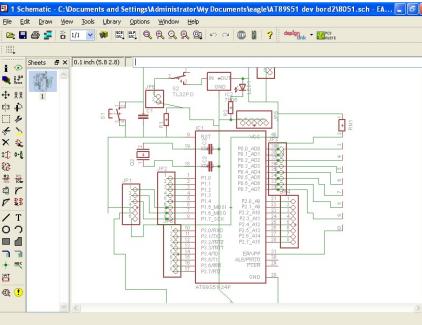
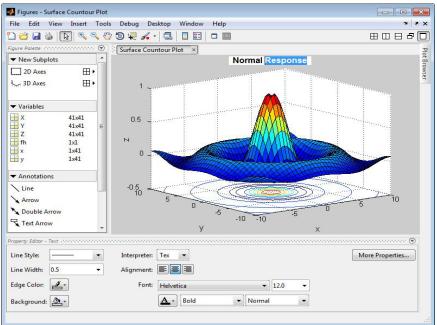
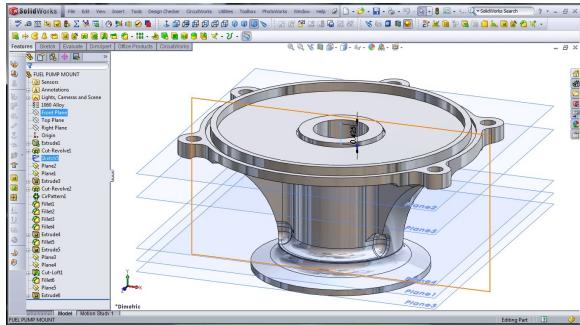
Edinburgh, UK
July 18 - 21, 2016

Towards a Quantitative Framework for Evaluating the Expressive Power of Conceptual System Models

Yaniv Mordecai & Dov Dori

Technion – Israel Institute of Technology

Engineering is founded on modeling



Why model? What are models for?



- **Understanding:** clarifying, explaining a concept, rationalizing “how things look and work”
- **Communicating:** Sharing and ideas, brainstorming, experimenting with new ideas
- **Early Lifecycle:** Architecting, analysis, conceptual design, concept evaluating & selecting, optimizing, what-if, operational concepts and problems, formal validating and verifying design, consistency, potential scenarios and results
- **Late Lifecycle:** Design, development, testing, demonstration, simulation, manufacturing, assembly, installation
- **Documentation:** Current, intended, expected system
- **Control:** Monitoring, tracking, evaluating, behavior regulating

Why should we care about model value?

How many times have you heard systems engineers, architects, or designers ask questions like:

- "How **informative** is a given model?"
- "How much **information** does (or can) a model convey?"
- "Which of two models of the same problem is more **informative**?"
- Too difficult to answer?
- Yet needs to be pursued!



Can we define model value?



- Assessing models for faithfully specifying systems is intuitive, if at all pursued.
- Model formality is critical for encoding, verification, validation, consistency checking, reproduction, and comparison with other models.
- The value of a model is affected by the amount and quality of information that the model expresses.
- **Yet, research on conceptual model evaluation has been surprisingly scarce!**

Problem: System model utility is not being measured

- No clear definition of the informative value of a model
- No finite reference for relative information contribution
- Lack of objectivity of the value of information
- No convention of quantitative measuring and analysis of model utility
- Decision-theoretic information value is difficult to attribute to model facts
- Lack of support by modeling and architecting frameworks, processes, tools

Model Informativity



- A measure of the value of information that a model conveys.
- **A highly useful index for evaluation and comparison of models and versions.**
- Informativity can be perceived as a form of utility (Azrieli & Lehrer, 2008).
- **Information utility of is difficult to quantify (Bernardo, 1979).**
- Utility is subjective.
- **Model informativity is subjective – in the eyes of the model user.**
- Viable as utility in its own right

Previous Research

- Akaike's Information Criterion (AIC) for predictive model efficiency.

$$AIC = -2 \cdot \log L(\theta) + 2k \text{ (Akaike, 1974)}$$

- Variations of AIC for information complexity in statistical models (Bozdogan, 2000)
- Studies of the informativity of knowledge representations (Bowdle & Gentner, 1997), (Frankel, Kothari, & Weber, 2006), (Trentelman, 2009)
- Variability among several models of the same problem (Goldstein et al. 2008)
- Structural/functional qualitative/quantitative measures of informativity (Reich, 2002)

Model Informativity Analysis – MIA



- A quantitative, utility-based approach for measuring the value of the information in conceptual models
- A prescriptive approach for boosting the model's expressive power
- Based on analyzing the knowledge represented by the model.

Model Informativity Index



- $EP(M) = f(I(M), \text{other things})$ // EP: Expressive Power, $I =$ Model, $I =$ Edinburgh, UK
Informativity
- $I(M) = \sum_{\text{specs}}(INF(\text{spec}))$ // INF = Information figure in [0..1] of specs (statement, model facts) in M.
- $INF(\text{spec}) = \sum_{\text{IEFs}}(INF_{IEF}(\text{spec}))$ // IEF = Informativity Enhancing Factor: an attribute of a statement that

determines information about the from that statement

Informativity Delta



- $I(M)$, $INF_{IEF}(M)$ are unbounded measures.
- The value of interest is the
change in informativity as the model evolves
(like a stock exchange or price index):

$$\Delta I(I(M \downarrow 1), I(M \downarrow 0)) = I(M \downarrow 1) / I(M \downarrow 0) - 1$$

- $M \downarrow 1$ is the relevant version of the model.
- $M \downarrow 0$ is the reference version of the model.

Informativity Enhancing Factors



Specification Pattern

Uncertainty

Meta-Specification

Model Management

Specification Patterns and Graphical Constructs



- A model consist of facts
 - expressed graphically as constructs that follow specification patterns
- Spec. patterns enhance formality and uniformity
- A modeling language is evaluated by its capability to support spec. patterns
 - In OPM each construct is translated into a textual statements – easy to analyze.

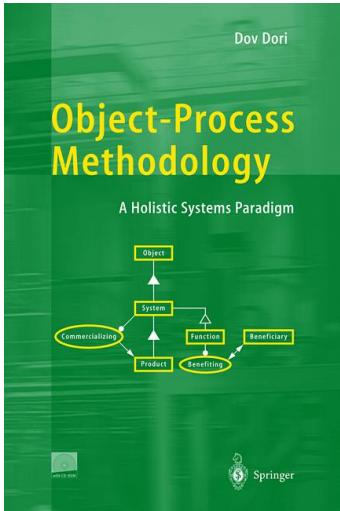
Optimizing number of spec patterns to increase informativity



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- Spec patterns are where syntax meets semantics.
- If there are not enough spec patterns – no differentiation.
- If there are too many spec patterns – over-discriminative, difficult to maintain.
- The challenge: minimize the number of spec patterns while maximizing semantic richness.

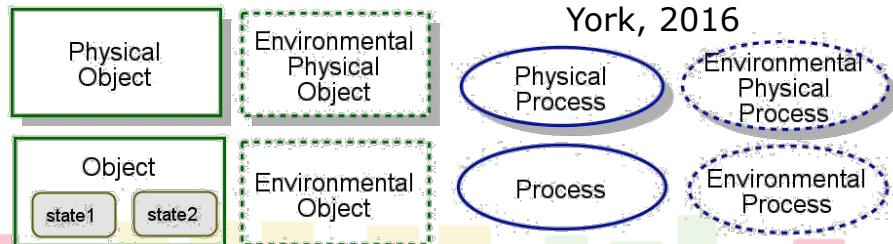
Object-Process Methodology



Dov Dori,
[Object-Process Methodology - A Holistic Systems Paradigm](#), Springer Verlag, Berlin, Heidelberg, New York, 2002



Dov Dori,
[Model-Based Systems Engineering with OPM and SysML](#), Springer, New York, 2016



Object Process Methodology - OPM



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Conceptual modeling language and methodology

Based on the minimal universal ontology

A single diagram kind expresses system structure, behavior, and function

Diagrams are organized hierarchically

Bimodal: the model is both graphical (OPD) and textual (OPL).

Standard: OPM is ISO 19450

Constructing OPM models with OPCAT



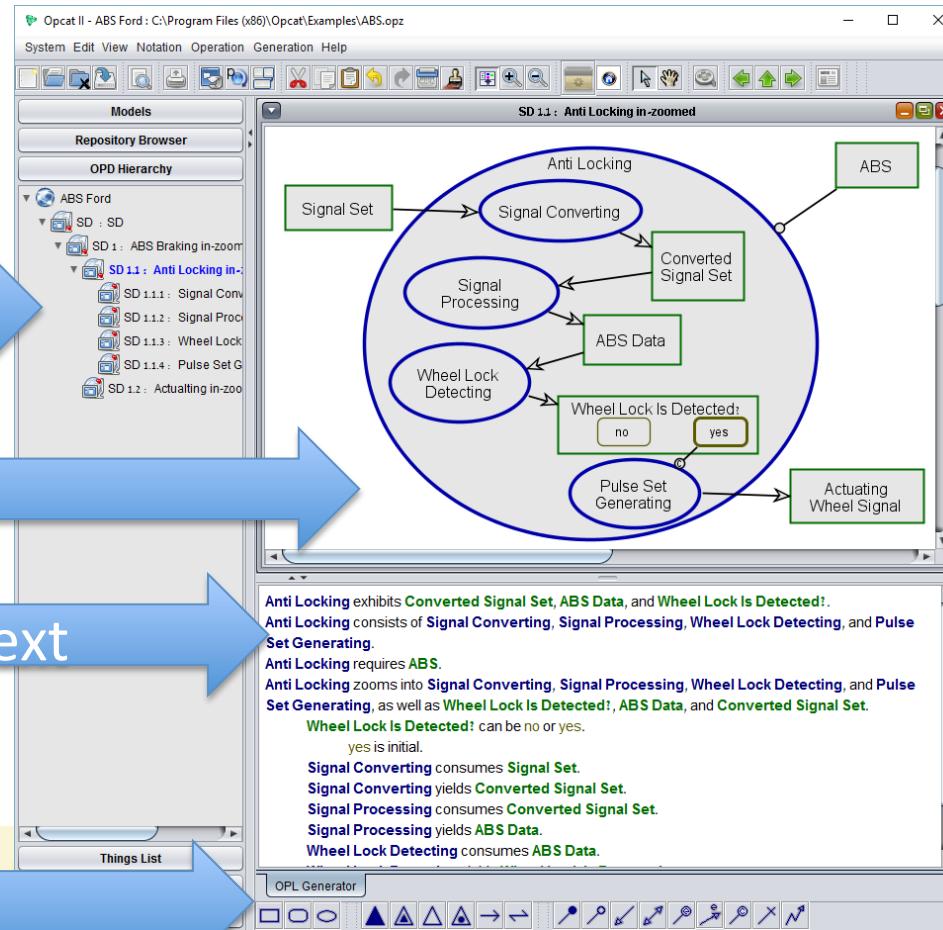
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OPD Hierarchy

Current OPD

Current OPD's OPL Text

OPM Notation



Spec Patterns in OPM



OPM consists of 22 Specification Patterns.

Specification Pattern exhibits Graphical Pattern, Textual Pattern, Execution Semantics, Informativity Score, and at least one Specification Refinement.

Informativity Score consists of Execution Semantics, Informativity Factor, and Subjective Importance.

Specification Refinement exhibits Informativity Factor.

OPM Model is instance of an OPM.

OPM Model consists of many OPDs.

OPD consists of Model Fact.

Model Fact is instance of a Specification Pattern.

Model Fact exhibits OPL Sentence, OPD Construct, and Informativity Figure.

OPL Sentence is instance of a Textual Pattern.

OPD Construct is instance of a Graphical Pattern.

Informativity Figure is instance of an Informativity Score.

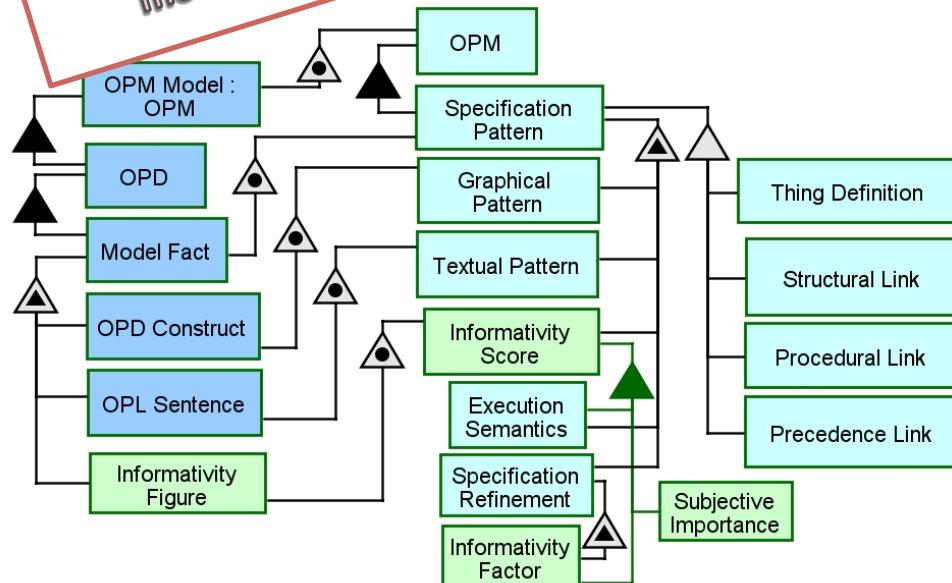
Thing Definition is a Specification Pattern.

Structural Link is a Specification Pattern.

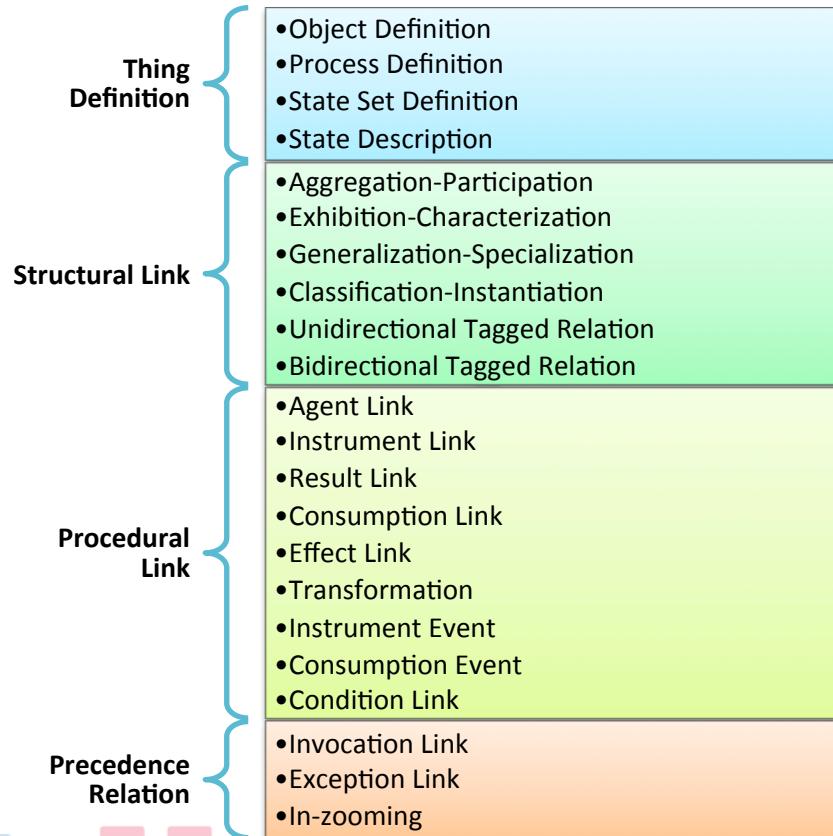
Procedural Link is a Specification Pattern.

Precedence Link is a Specification Pattern.

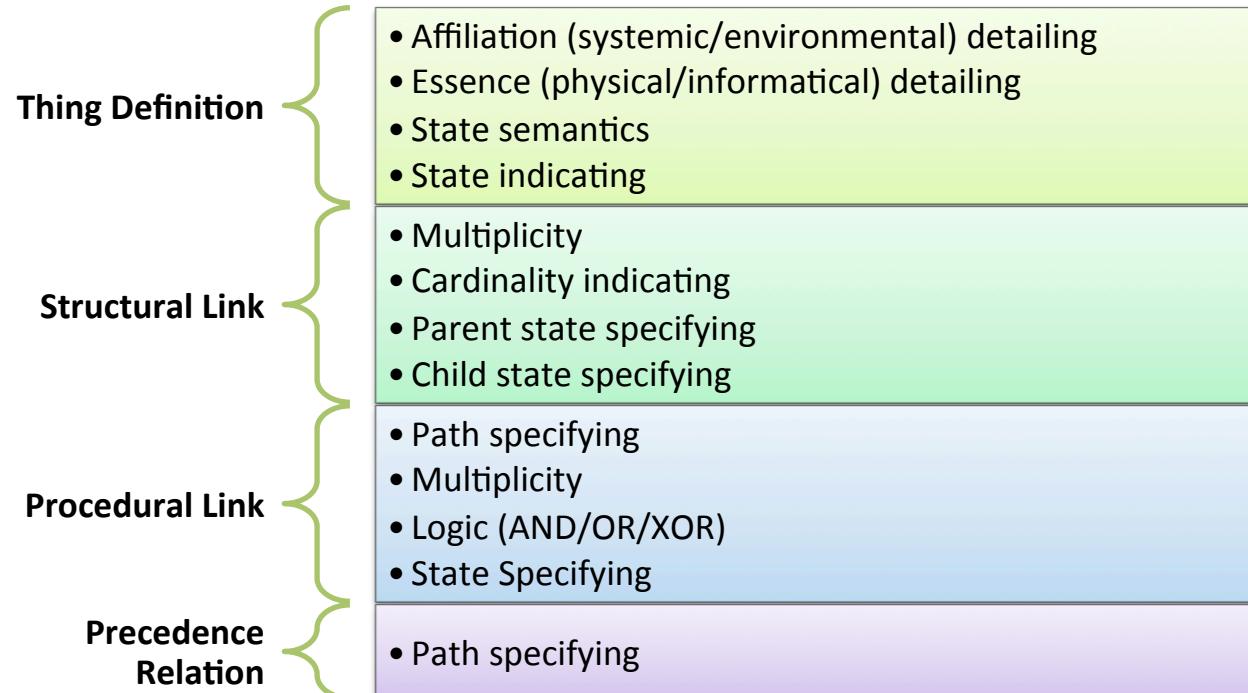
A conceptual model of informativity analysis in OPM models, using OPM!



OPM has 22 specification patterns



Specification Pattern Refinements



Spec Pattern Informativity Figure



| Spec Pattern Group | Spec Pattern | Distinctive OPL Phrase | INF |
|--------------------|--------------------------------|------------------------|------|
| Thing Definition | Object Definition | object | 0.0 |
| | Process Definition | process | 0.0 |
| | State Set Definition | can be | 0.25 |
| | State Description | initial, final | 0.50 |
| Structural Link | Aggregation-Participation | consists of | 0.50 |
| | Exhibition-Characterization | exhibits | 0.50 |
| | Generalization-Specification | is a, is an | 0.25 |
| | Classification-Instantiation | instance | 0.25 |
| | Unidirectional Tagged Relation | relates to | 0.50 |
| | Bidirectional Tagged Relation | are | 0.50 |
| Procedural Link | Agent Link | handles | 0.50 |
| | Resource Link | requires | 0.75 |
| | Result Link | yields | 1.00 |
| | Consumption Link | consumes | 0.75 |
| | Effect Link | affects | 0.50 |
| | Transformation | changes | 1.00 |
| | Instrument Event | triggers | 0.75 |
| | Condition Link | occurs if | 1.00 |
| Precedence Link | Invocation Link | invokes | 1.00 |
| | Exception Link | when it lasts | 0.50 |
| | In-zooming | zooms into | 1.00 |

INF_{Spec_Pattern} is subjective and depends on:

1. Model orientation.
2. Subjective preference.
3. Execution semantics.

Specification Uncertainty

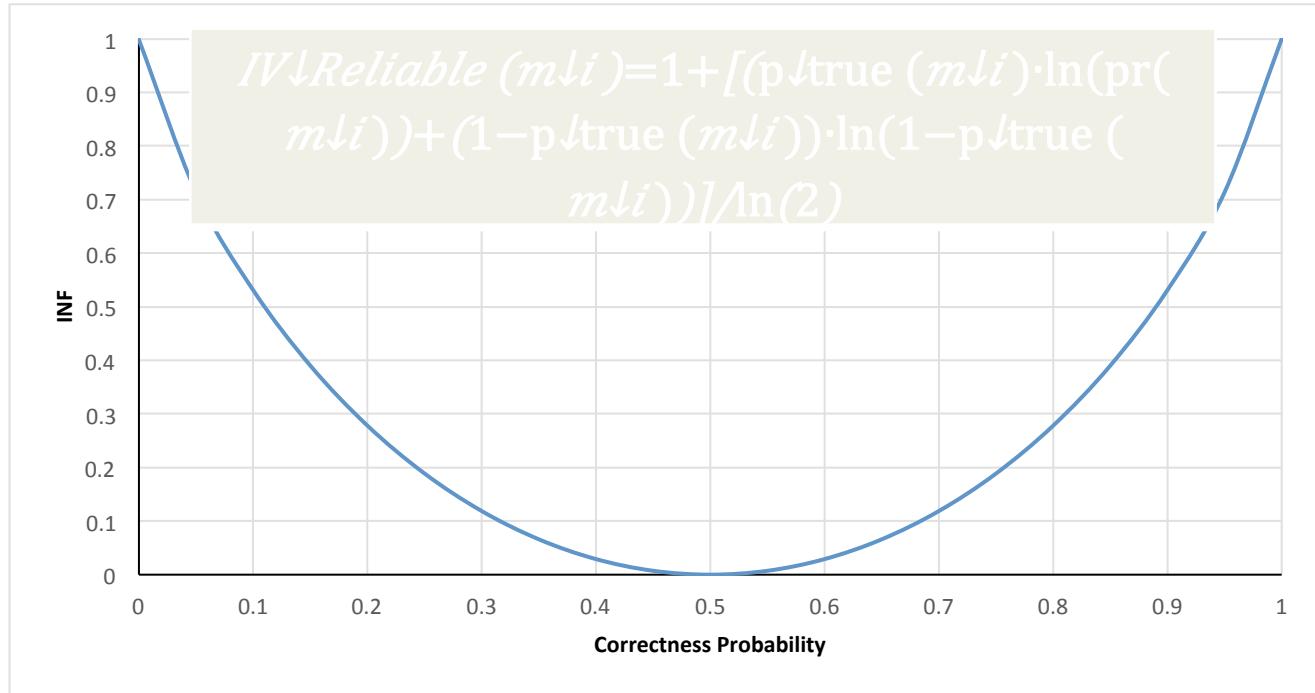


- So far we have assumed that any statement's informativity is deterministic and time/timing-insensitive.
- We should also take into consideration stochastic factors such as:
 - The reliability of the statement
 - The possibility that the information is already known
 - The ambiguity vs simplification potential of the information

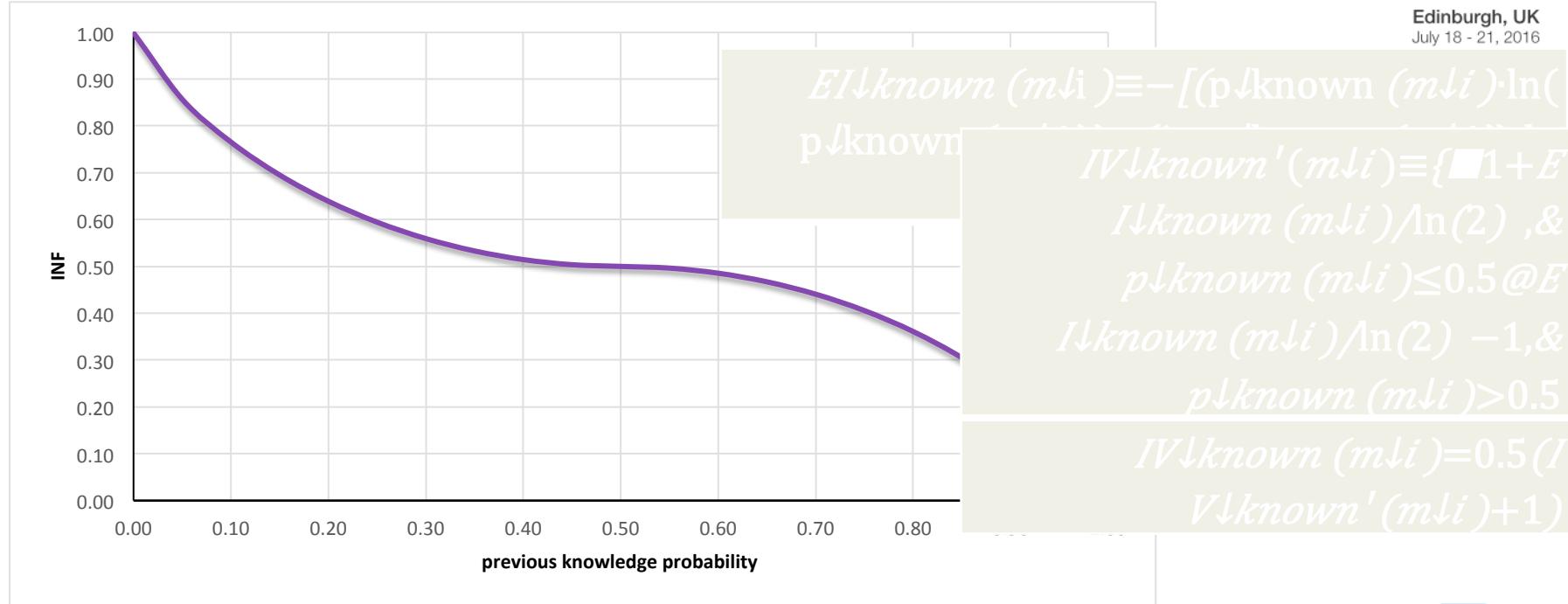
Informativity and Uncertainty: reliability



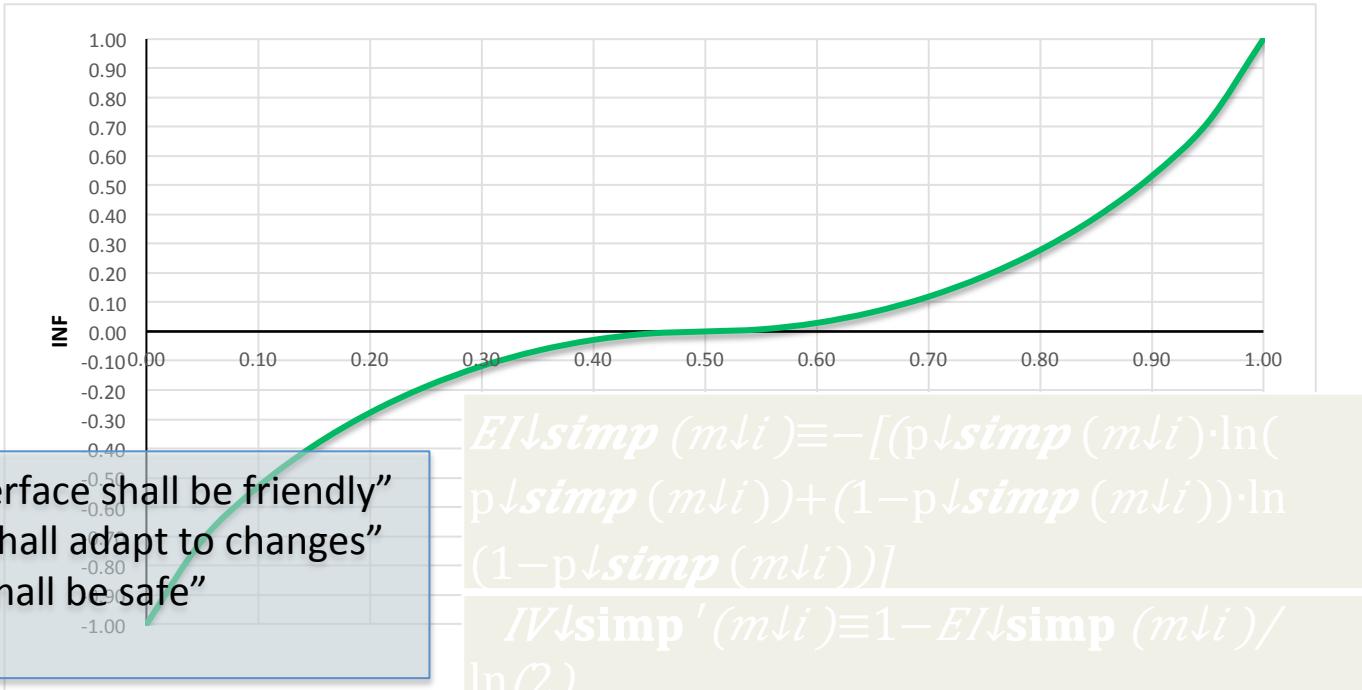
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Informativity and Uncertainty: discovery



Informativity and Uncertainty: simplification



Meta Specification



- Details about specification statements:
 - Maturity
 - Category
 - Rationale
 - Priority
 - Ownership

Maturity Levels



| Precedence | Maturity Level | Explanation | INF |
|------------|-------------------------|---|-----|
| 1 | Initiation | Coming of idea into existence | 0.6 |
| 2 | Conception | Creating a systems concept | 0.7 |
| 3 | Elaboration | Detailing the design | 0.9 |
| 4 | Allocation | Assigning or posting for implementation | 1.0 |
| 5 | Implementation | Developing or prototyping | 0.8 |
| 5 | Verification | Testing and evaluation | 0.7 |
| 6 | Production | Manufacturing or integrating | 0.6 |
| 7 | Introduction | Marketing, deploying, or driving adoption | 0.5 |
| 8 | Operation & Maintenance | Using and maintaining | 0.4 |
| 9 | Retirement | Phasing the system out | 0.1 |
| 99 | Not specified | | 0.0 |

Category

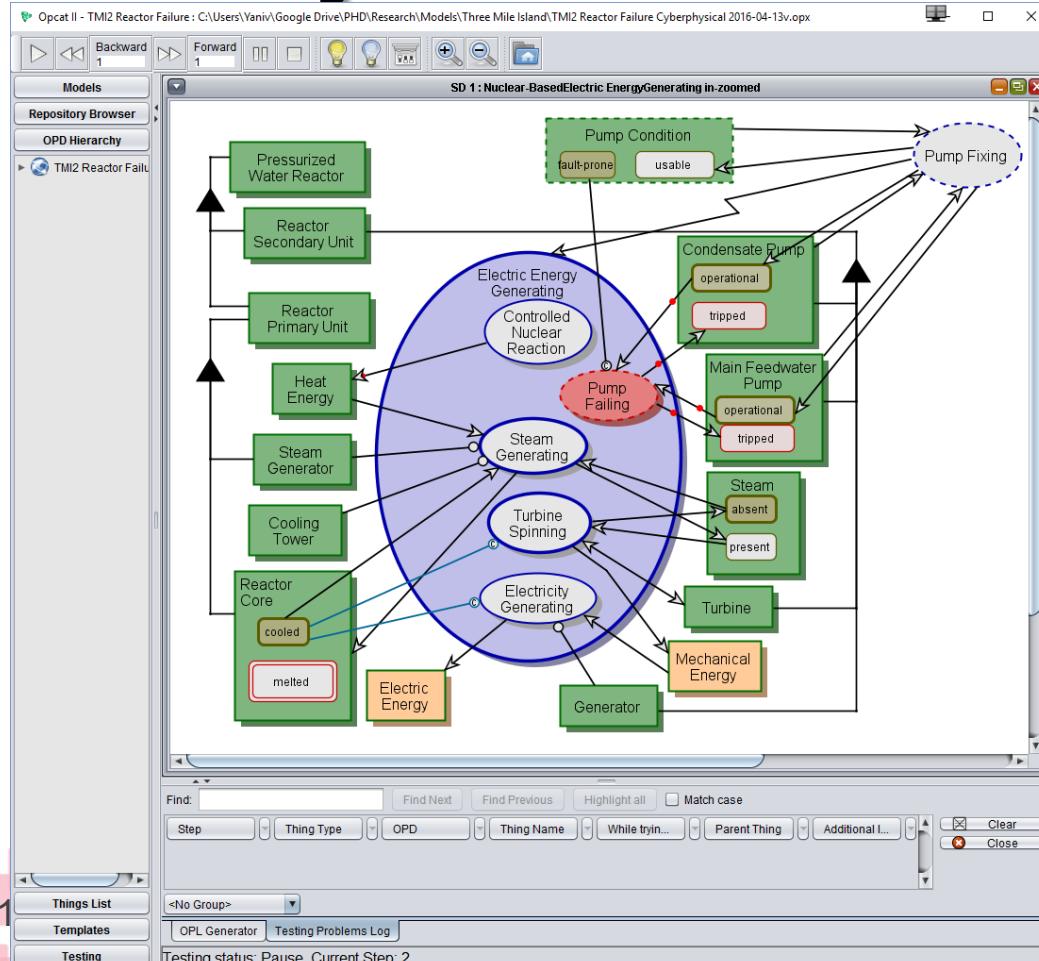
| Precedence | Category | INF |
|------------|----------------------------|-----|
| 1 | Contractual Commitment | 1.0 |
| 2 | Requirement | 0.9 |
| 3 | Engineering Design | 0.8 |
| 4 | Implementation | 0.7 |
| 5 | Risk Effect / Response | 0.6 |
| 6 | Physical Fact / Constraint | 0.5 |
| 99 | Not specified | 0.0 |

Specification Management

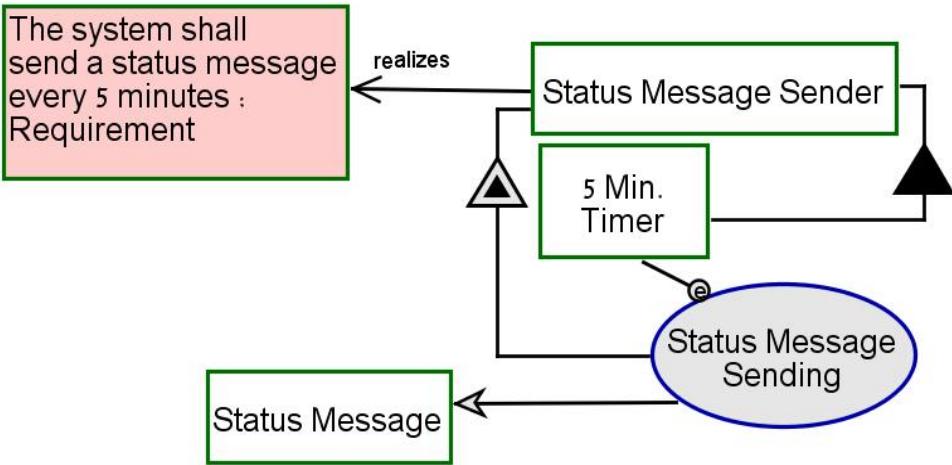


- **Demonstrability**
 - In action
 - In experiment
 - By simulation
 - By analysis
- **Traceability**
 - Operational requirements \Leftrightarrow Functional analysis \Leftrightarrow architecture & design \Leftrightarrow implementation \Leftrightarrow test cases \Leftrightarrow failures

Demonstration by Simulation



Traceability: Integrating Requirements into the Model



1. The system shall send a status message every 5 minutes is of type Requirement.
2. Status Message Sender exhibits Status Message Sending.
- 2.1. Status Message Sending requires 5 Min. Timer.
- 2.2. Status Message Sending yields Status Message.
3. Status Message Sender consists of 5 Min. Timer.
- 3.1. 5 Min. Timer triggers Status Message Sending.

Status Message Sender realizes The system shall send a status message every 5 minutes.

The Integrated Informativity Index



| IEF Cluster | IEF name | Weight |
|--------------------------------|-----------------------|--------|
| Specification (e.g., 40%) | Specification Pattern | 40 |
| Uncertainty (e.g., 30%) | Reliability | 12 |
| | Discovery | 12 |
| | Simplification | 6 |
| Meta-Specification (e.g., 20%) | Rationale | 5 |
| | Initiator | 5 |
| | Category | 5 |
| | Priority | 5 |
| | Maturity | 5 |
| Model Management (e.g., 10%) | Traceability | 3 |
| | Demonstrability | 7 |

The weighting scheme is subjective to the stakeholder

The Integrated Informativty Index

= Weighted Informativity

Figure of statement (i)



$FINF \downarrow j$ = Aggregate Informativity
Figure of factor (j)

I^3 = Integrated Informativity Index =
Aggregate WINF over all model
statements.

ΔI^3 = difference in I^3 between two
versions of the model

MIA for UML / SysML



- Can we implement MIA on UML or SysML models?
 - YES!
- What would it require?
 - The ability to export a formal schematic description of the model
 - The ability to identify each statement
 - A quantitative mapping of each statement and its refinements
- Once we have a set of identifiable and quantifiable statements, we can draw informativity values for a model in any language.

SysML vs OPM



| Feature | SysML | OPM |
|------------------------------------|--------------------------------|-------------------------------|
| Theoretical foundation | Rational Unified Process | Minimal Universal Ontology |
| Standardization | OMG | ISO (19450) |
| # of spec pages | ~1600 (inc. UML) | ~130 |
| # diagram kinds | 9 | 1 |
| # symbols | ~120 | ~20 |
| # spec patterns | ~10-15 per diagram kind | 21 |
| # Google Scholar Citations | ~9000 | ~1000 |
| Complexity management | Aspect-based | Detail-based |
| Hierarchical decomposition | Partial, limited | Full, unlimited |
| Graphic modality | Yes | Yes |
| Textual modality | No | Yes |
| Physical-informational distinction | No | Yes |
| System-Environment distinction | Partial | Yes |
| Probability modeling | No | Yes |
| System of Systems compatibility | Limited | Extended |
| CASE tools | Multiple, licensed, commercial | Single, free to use, academic |

Informativity Analysis in Action



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- Comparing nominal vs risk-informed models of the Three Mile Island nuclear reactor.
- The nominal model did not cover the possibility of the failure that led to the TMI 2 meltdown accident of 1979.
- Enhancing the nominal model with failure information led to a significant (order of magnitude) improvement in the model's informativity.

Three Mile Island 2 Accident

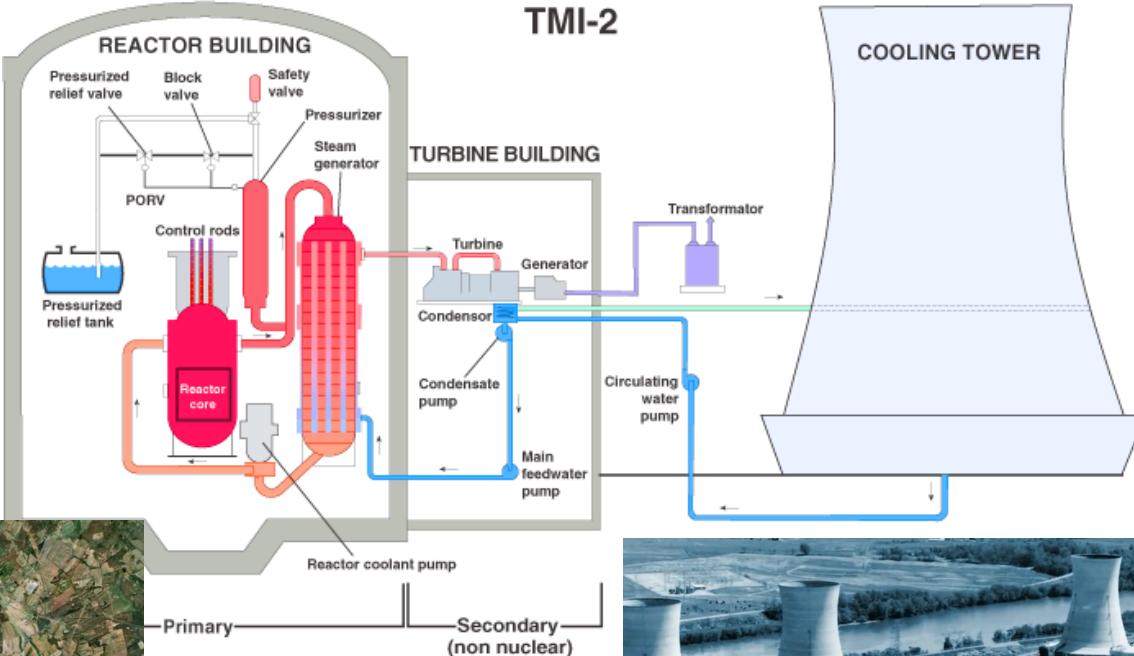
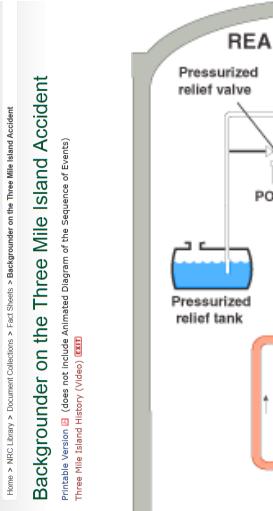
March 28, 1979

<http://www.nrc.gov/reading-rm/doc-collections/fact-sheets/3mile-isle.html>

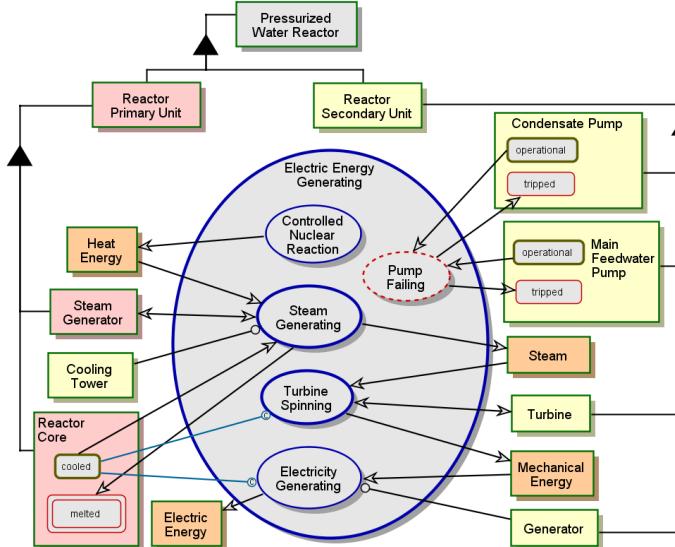
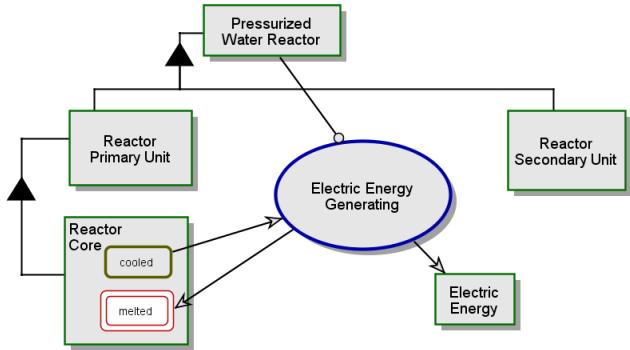


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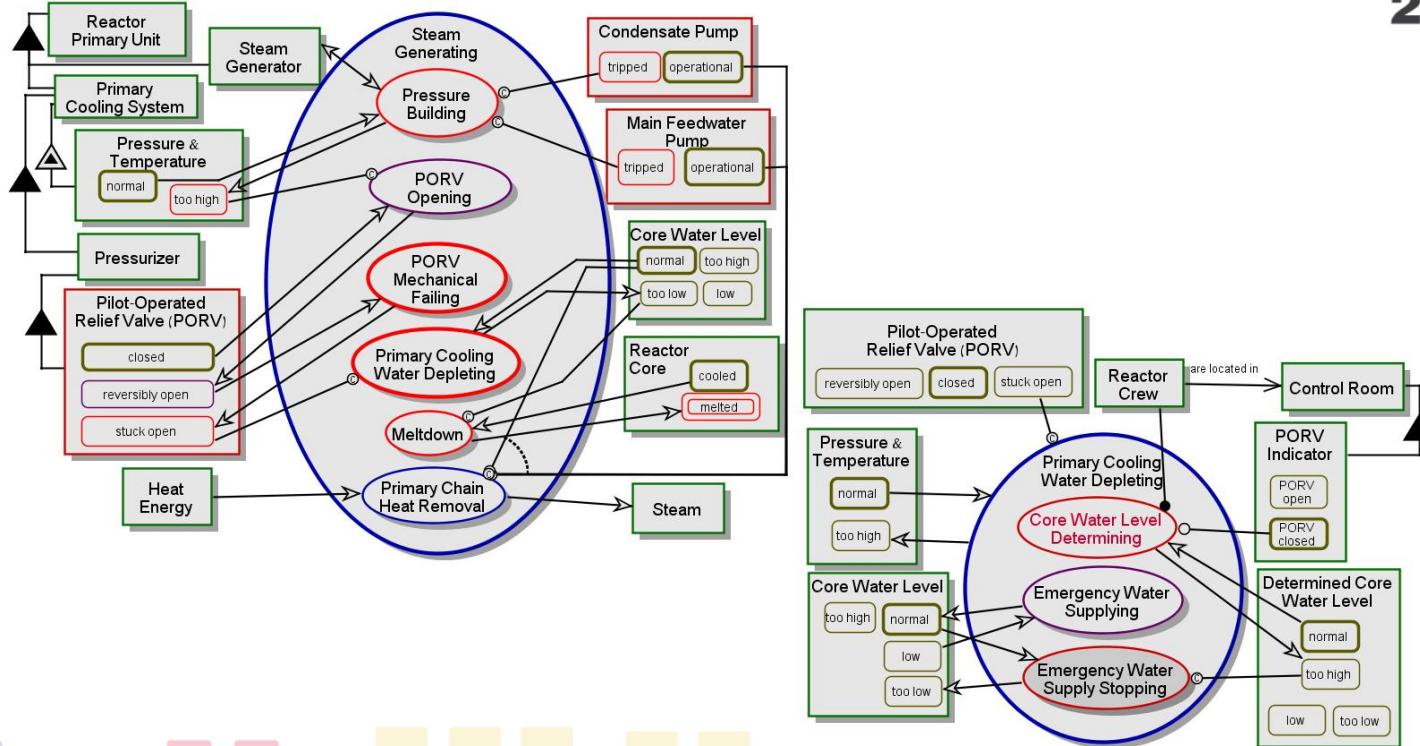
Nominal Model



Risk-Informed Model



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Informative Value Comparative Analysis: Nominal vs Risk-Informed



| Measure | Nominal Version | Risk-Informed Version |
|---------------------------------------|-----------------|-----------------------|
| Number of MFs | 61 | 141 |
| Removed MFs | 9 | |
| New MFs | | 89 |
| Structural MFs | 27 | 56 (+33,-4) |
| Behavioral MFs | 34 | 86 (+56,-4) |
| Model Informativity (I^3) | 18.526 | 38.539 (+108%) |
| Spec Pattern INF (unweighted) | 24 | 63.25 (+164%) |
| Reliability INF (unweighted) | 20 | 17.33 (-13%) |
| Discovery INF (unweighted) | 30.7 | 70.5 (+130%) |
| Complexity Reduction INF (unweighted) | -0.56 | 3.1 (+548%) |

Summary

- Model informativity is a prime indicator of model usefulness.
- MIA is a framework for **Model Informativity Analysis**.
- MIA is subjective and heuristic BUT:
 - the analytical foundations of subjective judgement, utility, information, and probability are well-defined (Pratt, Raiffa, & Schlaifer, 1964; Savage, 1972).
- Future research:
 - Informativity analysis of model-based protocol specifications
 - Informativity analysis of knowledge-based engineering (KBE) models for design automation.
 - Integration of MIA into OPCloud – the new cloud-based OPM modeling tool



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Thanks!
Questions?

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