



# **Perspective of Predictive Science in the NNSA Advanced Simulation and Computing Program**

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# Outline of the Presentation

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- **Background and Motivation**
- **Terminology and Methodology**
- **Elements of Predictive Capability**
- **Uncertainty Quantification**
- **Closing Remarks**



## Background

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- By Presidential decree, underground testing of nuclear weapons ceased in 1992.
- DOE/Stockpile Stewardship Program began in 1993 to insure the safety, reliability and performance of the nuclear stockpile
- The Accelerated Strategic Computing Initiative (ASCI) was initiated in 1996 (now called Advanced Simulation and Computing, ASC)
- Nuclear weapons labs: Sandia National Laboratories, Los Alamos National Laboratory, and Lawrence Livermore National Laboratory
- ASC Program components:
  - Defense Applications and Modeling
  - Integrated Computing Systems
  - Simulation and Computer Science
  - University Partnerships
- Roughly \$7B has been spent as part of ASC program between the three weapons labs



# ASC Program Elements

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- **Defense Applications and Modeling elements:**
  - Materials and physics modeling
  - Physics-based applications software
  - Simulations of weapons systems, subsystems, and components
  - **Verification and validation**
- **Integrated Computing Systems**
  - Massively-parallel, computing platforms
- **Simulation and Computer Science**
  - Computer network systems
  - Visualization hardware and software
- **University Partnerships**
  - California Institute of Technology, University of Chicago, University of Illinois, Stanford University, and University of Utah
  - Proposals from roughly 20 universities are being reviewed for new awards



# Motivation: Ensuring the Integrity of the Nuclear Stockpile

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- How can the safety, reliability, and performance (SRP) of the nuclear stockpile be assured without full system testing:
  - Inspection, monitoring and maintenance of weapons in the stockpile
  - Improved physics-based simulations to predict SRP
  - Comparison of simulations with:
    - Existing underground test database
    - New allowed testing of subsystems and components
  - Incorporation of V&V practices into decision making
  - Improved quantification of system margins and uncertainties (QMU)
- ASC approach to V&V:
  - Build on foundations of:
    - DOD/DMSO developed procedures
    - Techniques developed in computational fluid dynamics
    - Techniques developed for nuclear power reactor safety
    - Techniques developed for underground storage of nuclear waste
  - Develop improved V&V methodologies and procedures
  - Stronger emphasis on uncertainty quantification techniques



# Terminology: Verification

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**Verification:** The process of determining that a model implementation accurately represents the developer's conceptual description of the model and the solution to the model.

- In computational science and engineering (CSE), two aspects of verification are recognized:
- **Code Verification:** Verification activities directed toward:
  - Finding and removing mistakes in the source code
  - Finding and removing errors in numerical solution algorithms
  - Improving software reliability using software quality engineering practices
- **Solution Verification:** Verification activities directed toward:
  - Assuring the accuracy of input and output data for the problem of interest
  - Estimating and reducing the numerical solution error, e.g. error due to finite element mesh resolution



# Terminology: Validation

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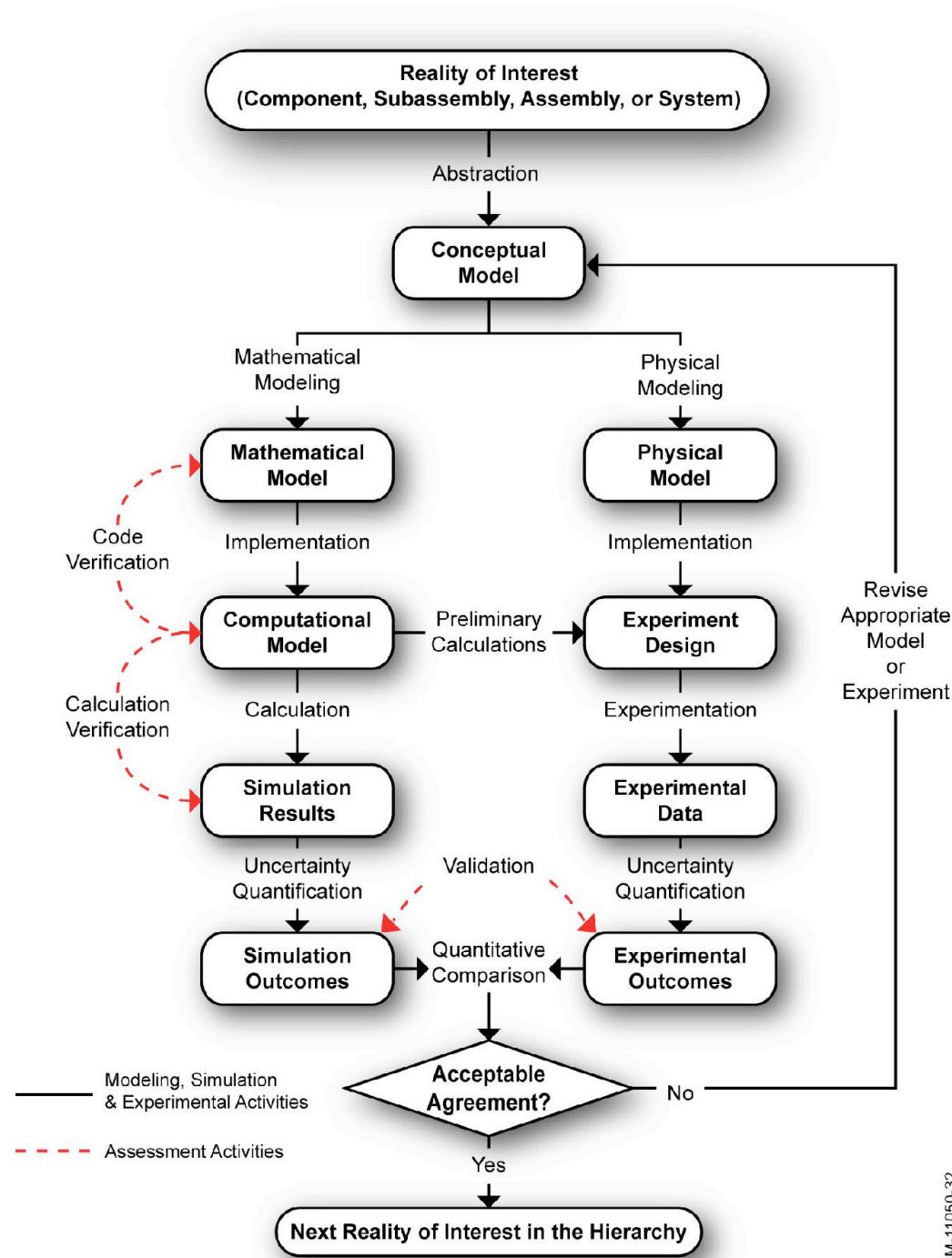
**Validation:** The process of determining the degree to which a model is an accurate representation of the real world from the perspective of the intended uses of the model.

- CSE development of V&V methodology and practices:
  - American Institute of Aeronautics and Astronautics published the first engineering standards document on V&V: "Guide for the Verification and Validation of Computational Fluid Dynamics Simulations," American Institute of Aeronautics and Astronautics, AIAA-G-077-1998.
  - American Society of Mechanical Engineers published a recent engineering standard: "Guide for Verification and Validation in Computational Solid Mechanics," ASME V&V 10-2006."
- Important difference in validation methodology between DoD and CSE:

**Validation can only be conducted by comparison with experimentally measured data.**



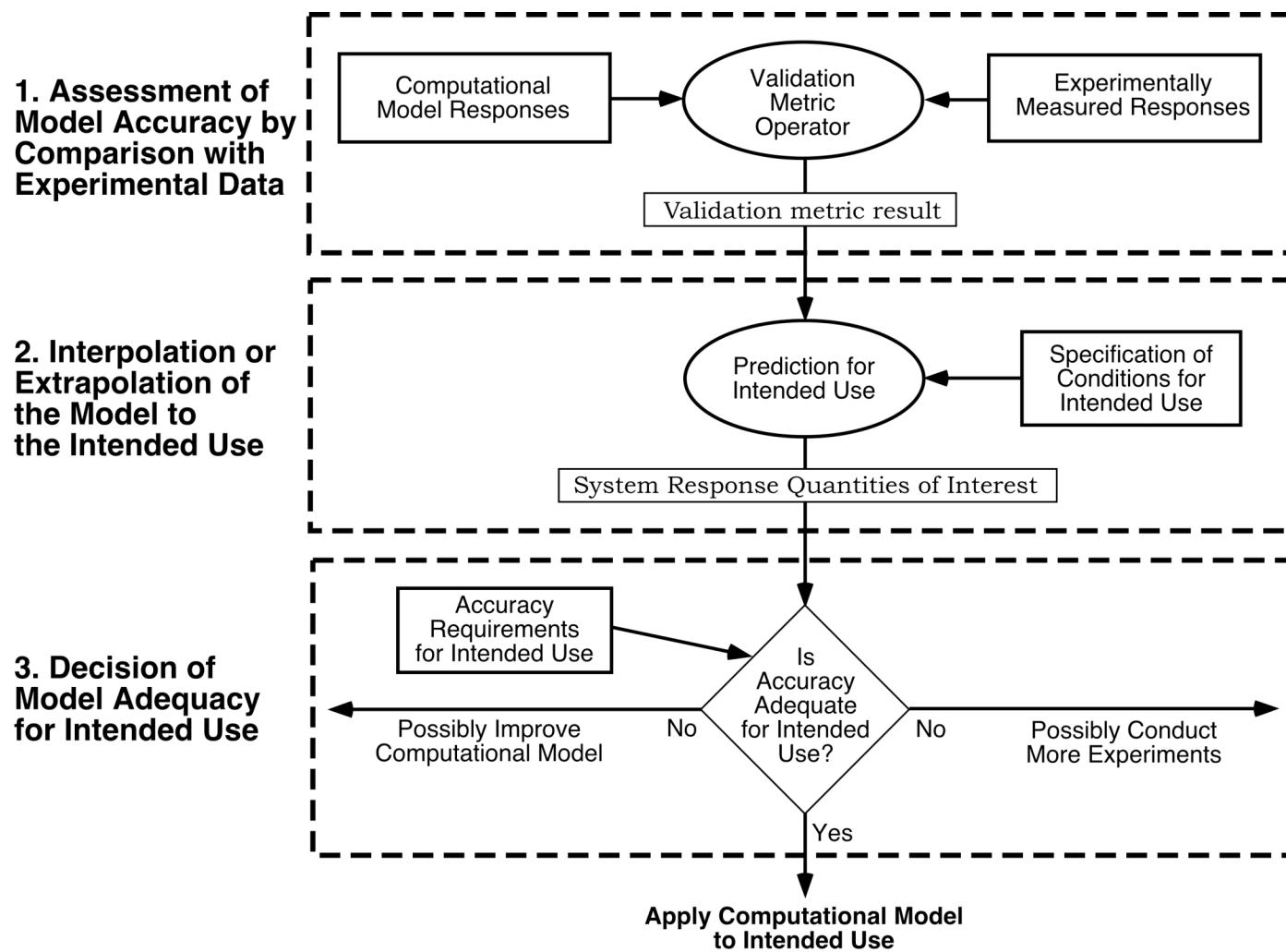
# ASME Validation Procedure



NM-11050-32



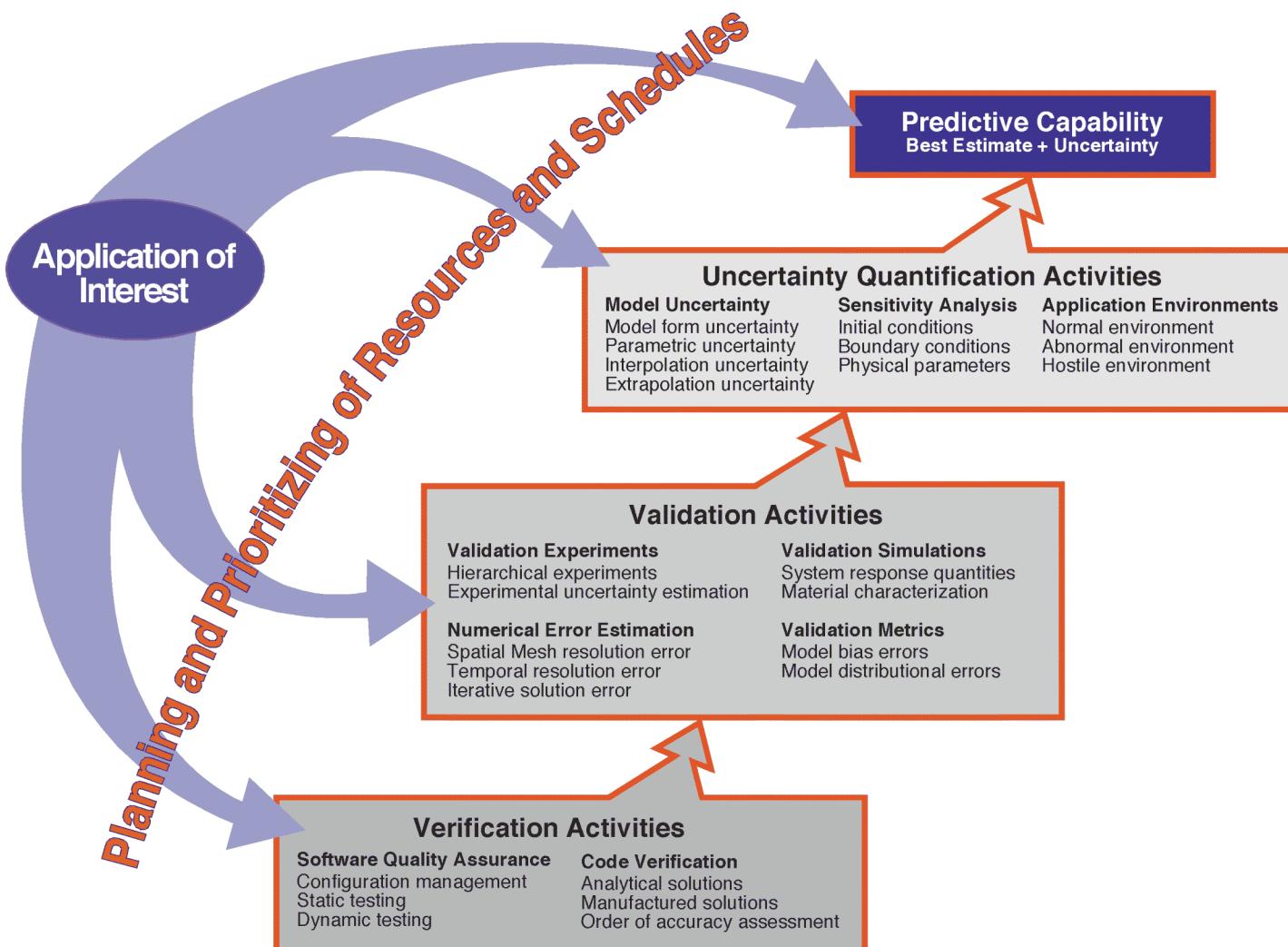
# Three Aspects of Validation



(Ref: Oberkampf and Trucano, 2007)



# Elements of Predictive Capability





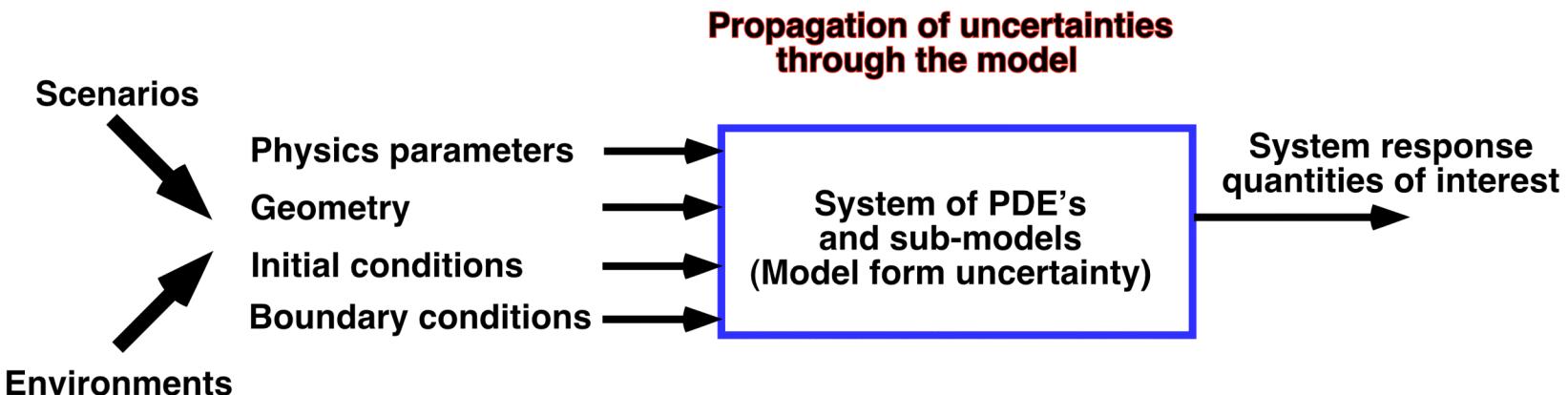
# Recognition of Different Types of Uncertainty

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- **Aleatory uncertainty** is an inherent variation associated with the physical system or the environment
  - Also referred to as variability, irreducible uncertainty, and stochastic uncertainty, random uncertainty
- Examples:
  - Variation in weather conditions
  - Variation in manufacturing and assembly of systems
- **Epistemic uncertainty** is an uncertainty that is due to a lack of knowledge of quantities or processes of the system or the environment
  - Also referred to as subjective uncertainty, reducible uncertainty, and model form uncertainty
- Examples:
  - Lack of experimental data to characterize new materials and processes
  - Poor understanding of physics phenomena
  - Lack of experimental data/testing for complete systems



# Propagation of Uncertainties



**The propagation of uncertain input quantities through a mathematical model to obtain outputs can be written as**

$$y = f(\vec{x}_a, \vec{x}_e)$$

- $y$  is a system response quantity of interest
- $f$  is the mathematical model of the physical process of interest
- $\vec{x}_a = x_1, x_2, \dots, x_m$  is the vector of all aleatory uncertainties
- $\vec{x}_e = x_{m+1}, x_{m+2}, \dots, x_n$  is the vector of all epistemic uncertainties



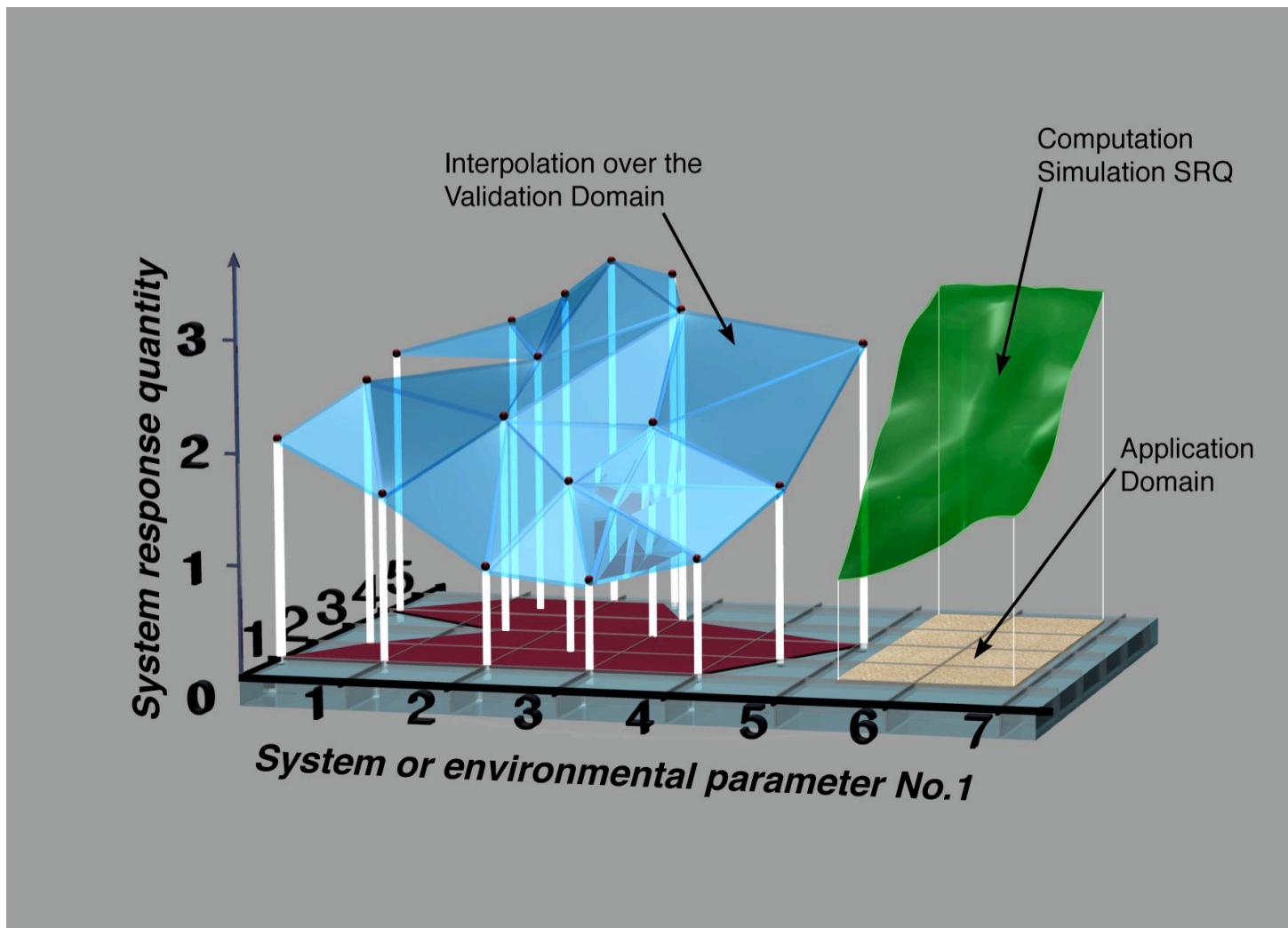
# Methods for Propagating Aleatory and Epistemic Uncertainties

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- **Second-order probabilistic analysis:**
  - Use a two step process separating epistemic and aleatory uncertainties
  - Treat the range all epistemic uncertainties as possible realizations with no probability associated with realizations from sampling
  - Treat aleatory uncertainties as random variables
- **Robust Bayesian inference:**
  - Investigate the effect of different assumptions of prior distributions
  - Investigate the effect of partitioning the available data
- **Evidence theory:**
  - Can represent aleatory and epistemic uncertainties within one framework
  - Early criticism misdirected at Dempster's rule of aggregation of evidence
  - Early applications have been very successful



# Key Area of Concern: Large Extrapolation of the Model





# Closing Remarks

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- **V&V program in ASC has made significant contributions to:**
  - Code and solution verification
  - Methodology for the design and execution of validation experiments
  - Distinction between calibration and validation of models
  - Statistical methods for accuracy assessment of models
  - Uncertainty quantification of predictive capability
- **Improved credibility in M&S can **only** be achieved through improved procedures and consistent application of V&V&UQ**
- **Diverse challenges:**
  - Technical
  - Cultural

**Goal: Improved Risk-Informed Decision Making for the Stockpile**