



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

Dr. William L. Oberkamp

**Distinguished Member Technical Staff
wloberk@sandia.gov**

Dr. Anthony A. Giunta

Manager

**Validation and Uncertainty Quantification Department
Sandia National Laboratories, Albuquerque, New Mexico
aagiunt@sandia.gov**

**Verification, Validation & Accreditation Summit
Orlando, Florida
September 20-21, 2007**



Sandia is a multiprogram laboratory operated by Sandia Corporation, a Lockheed Martin Company,
for the United States Department of Energy's National Nuclear Security Administration
under contract DE-AC04-94AL85000.





Outline of the Presentation

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



Background

- **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

- **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

- **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

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

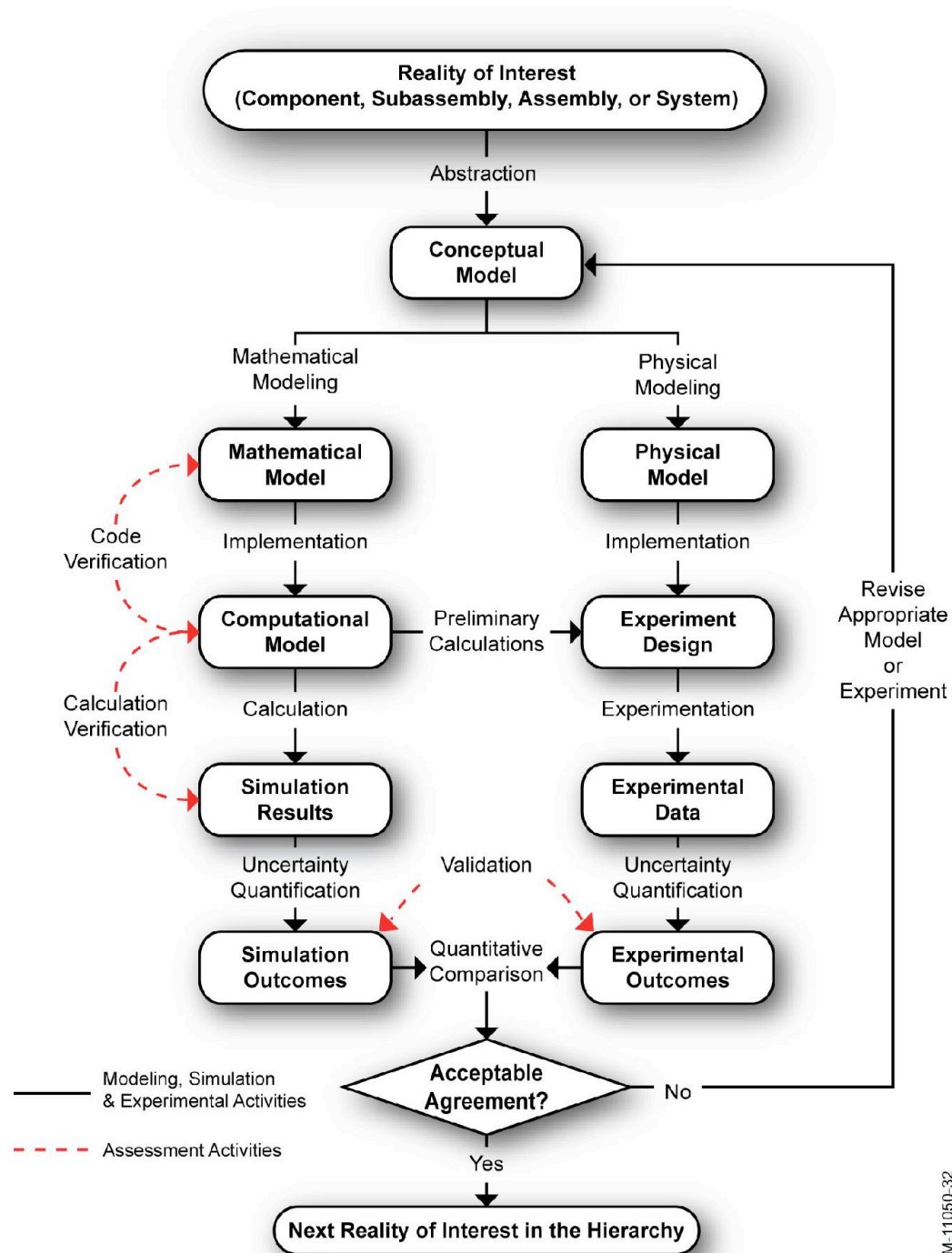
Validation: The process of determining the degree to which a model is an accurate representation of the real world from the perspective of the intended uses of the model.

- **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

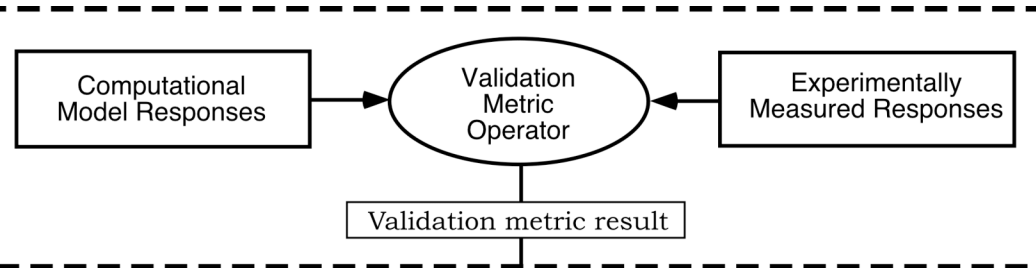


NM-11050-32

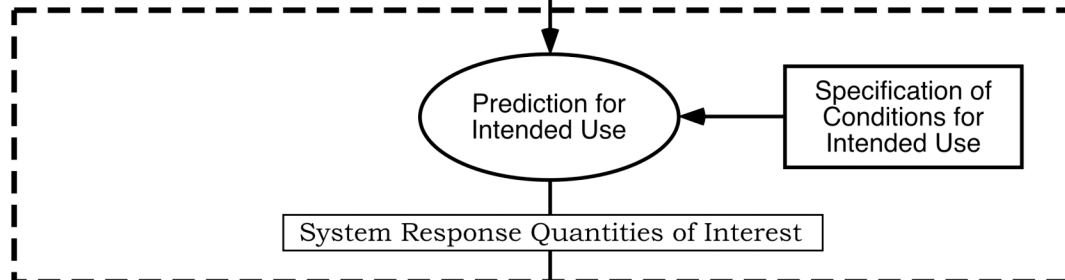


Three Aspects of Validation

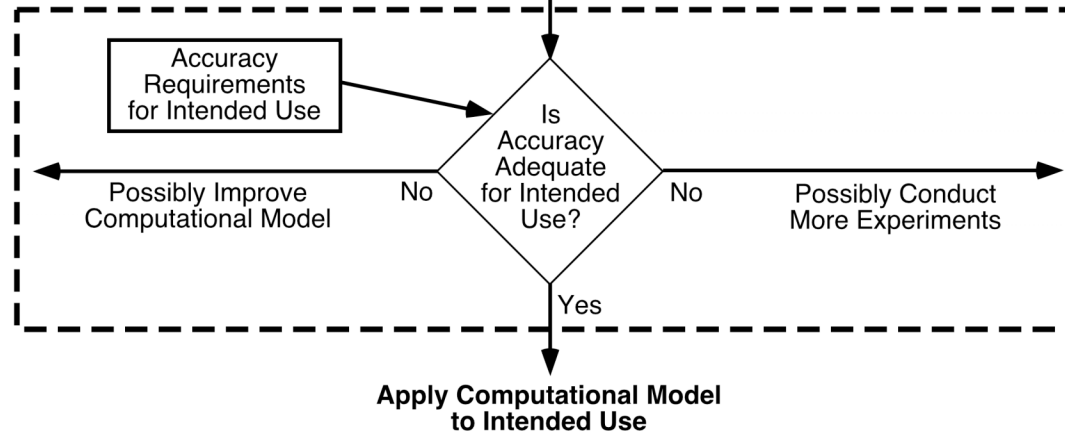
1. Assessment of Model Accuracy by Comparison with Experimental Data



2. Interpolation or Extrapolation of the Model to the Intended Use

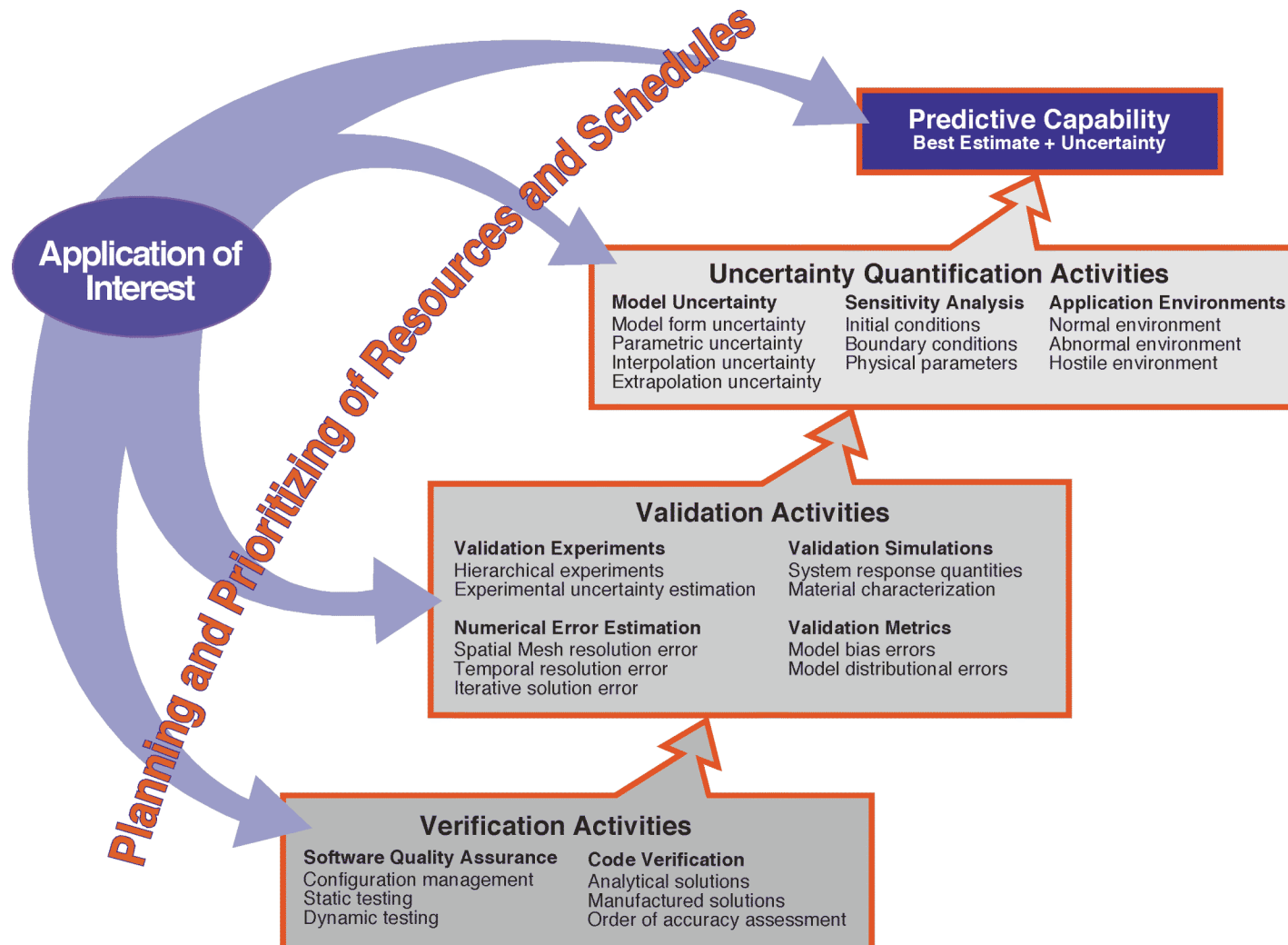


3. Decision of Model Adequacy for Intended Use



(Ref: Oberkampf and Trucano, 2007)

Elements of Predictive Capability



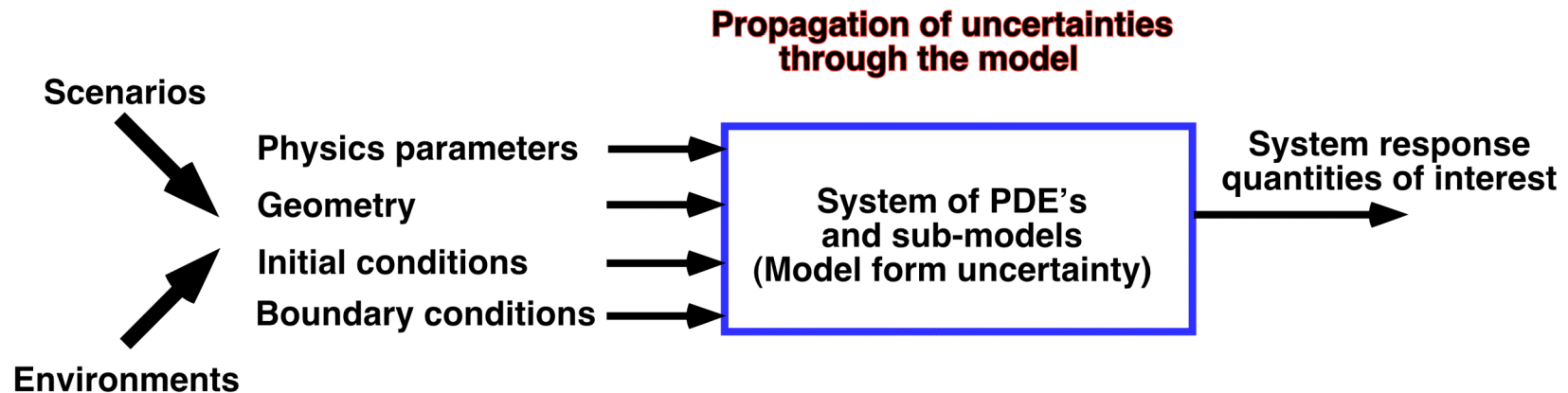


Recognition of Different Types of Uncertainty

- **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

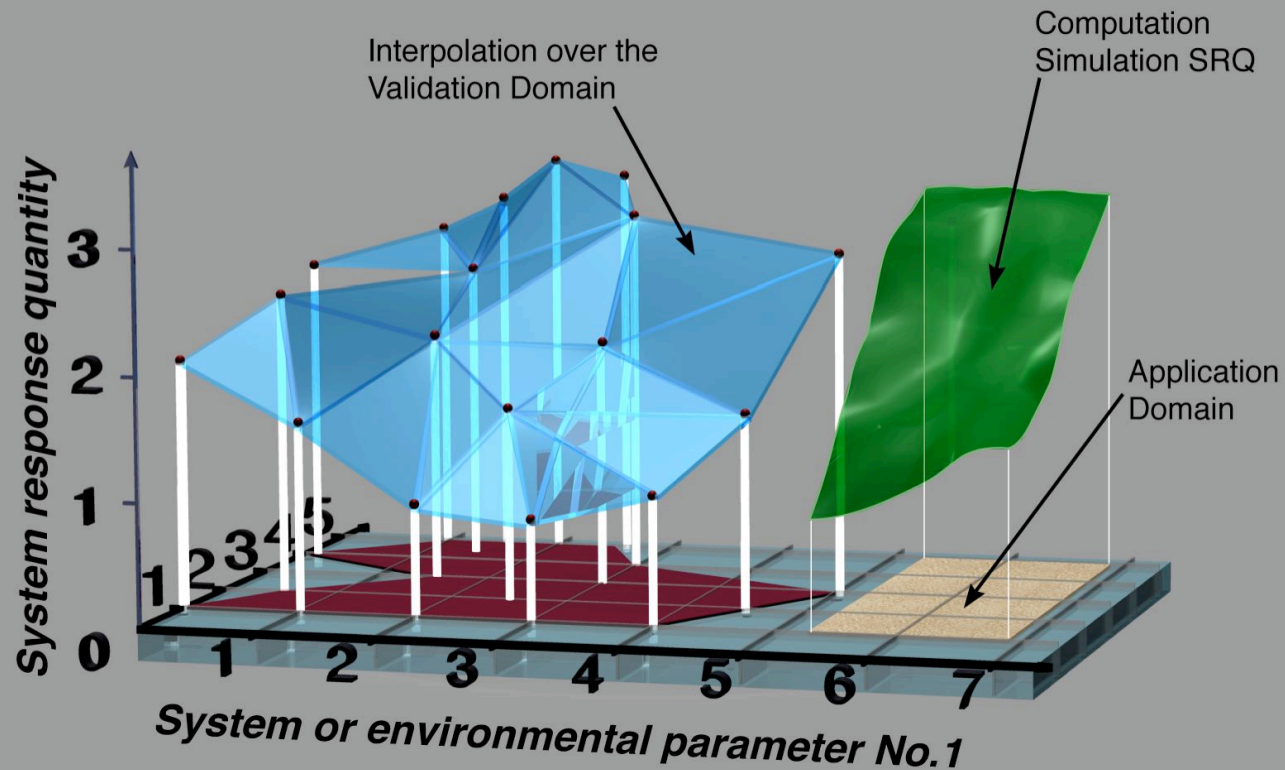


Methods for Propagating Aleatory and Epistemic Uncertainties

- **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

- **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