Adjoint Sensitivity Analysis and Data Assimilation in a Large-Scale Pu Benchmark

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Outline



- Pu-239 Data Adjustment
- 2 Benchmark
 - Experiment
 - Simulation



- Sensitivities
- Data Assimilation

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Pu-239 Data Adjustment

Introduction: Does ENDF ²³⁹Pu $\bar{\nu}(E)$ Need Adjustment?



- Recent simulations of a <u>subcritical</u> Pu experiment were discrepant with measurements
- Discrepancy only reduced by $\sim -1.1\%$ adjustment of $\bar{\nu}$. (Miller et. al., 2012)
- ENDF documentation notes poor fits to experimental data for certain energies. (Chadwick et. al. 2006)

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Goal: Perform calibration of nuclear data using data assimilation on this subcritical experiment

Pu-239 Data Adjustment

Nuclear Data Calibration using DA

Necessary Components

- Simulate neutron distribution and compute response *R* for Pu experiment. *R* corresponds to a detector measurement
- Sensitivity Analysis Compute sensitivity of R to each nuclear data parameter α = (...σ_f(E), ν
 (E),...)
- Uncertainty Quantification Use sensitivities to propagate uncertainty in nuclear data to computed response
- Data assimilation combine simulation (response, sensitivities, uncertainties) and experiment to compute "best-estimate values" for nuclear data

Experiment Simulation

Subcritical Experiment - "BeRP Ball" (Mattingly, J.), SAND2009-5804, (2009)



Setup

- Weapons grade Pu source
- Gross Neutron Counter (SNAP Detector) counts # neutrons/s

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³He proportional counter

SNAP Detector: ³He counter measures

$$n + {}^{3} \operatorname{He} \to p + {}^{3} H$$

 $R = \int_{V_{counter}} \mathrm{d}r \mathrm{d}E \Sigma^{^{3}\operatorname{He}}_{(n,p)}(r, E) \psi(r, E)$

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Experiment Simulation

Bare Assembly and Reflected Assembly





- We simulated 2 experiments: Bare Pu sphere and 76.2 mm Reflected
- Reflected assembly is more sensitive to lower energy neutrons and has more chances for fission

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• Compute 2 responses (SNAP detector)



Experiment Simulation

Neutron Distribution (Flux) Computation

Deterministic Time-Independent Transport Equation

$$\underbrace{\Omega \cdot \nabla \psi(r, E, \Omega) + \Sigma_{t}(r, E)\psi(r, E, \Omega)}_{\text{streaming&collision} \equiv L\psi} = \underbrace{\int dE' d\Omega' \Sigma_{s}(r, E' \to E, \Omega' \to \Omega)\psi(r, E', \Omega') +}_{\text{scattering} \equiv S\psi} \\ \chi(r, E) \int dE' d\Omega' \nu(r, E')\Sigma_{f}(r, E')\psi(r, E', \Omega') + \underbrace{Q(r, E)}_{\text{spontaneous fission} \equiv Q} \\ \text{Rewrite in operator form} \to [L - S - F] \psi = Q$$

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Experiment Simulation

Compute Responses and Sensitivity Coefficients



• Bare and Reflected Responses (Detector Count Rates)

$$R = \langle \Sigma^{^{3}\mathrm{He}}_{(n,p)}, \psi \rangle$$

• First-order Sensitivities

$$S_{\alpha_n}^R \equiv \frac{\partial R}{\partial \alpha_n}$$

Use 1 Adjoint to compute all $S_{\alpha_n}^R$

- Adjoint quantifies each neutron's important to *R*
- Computed from: $\left[L - S - F\right]^{\dagger} \psi^{\dagger} = \sum_{(n,p)}^{^{3}\mathrm{He}}$
- Sensitivities are computed using inner products of operators and ψ , ψ^{\dagger}

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$$S^R = (S^R_{\alpha_0}, S^R_{\alpha_1}, \dots, S^R_{\alpha_n})$$

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• *Relative* sensitivity coefficients are quoted: $S_{\alpha_n}^R = \frac{\alpha_n}{R} \frac{\partial R}{\partial \alpha_n}$

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Experiment Simulation

Uncertainty Quantification

First-order propagation of model parameter errors to responses

- $C_r = S^R C_{\alpha} (S^R)^T$ (Error Propagation Formula)
- C_{α} is nuclear parameter covariance data from ENDF/SCALE6.1





Simulation Description

- Geometry/Cross sections are generated in SCALE (ENDF/B-VII)
- Spontaneous fission source from SOURCES-4C
- Calculations use 7680 cpus with modified version of ORNL's Denovo.
- 27 groups/1344 angles/P₃/6 million cells



Experiment Simulation

Computation Results

	Responses	
Assembly	Computed	Measured
Bare Reflected	$\begin{array}{c} 57.786 \pm 2.662 \\ 129.521 \pm 12.208 \end{array}$	$\begin{array}{c} 57.4 \pm 0.4 \\ 116.2 \pm 0.6 \end{array}$



Sensitivities Data Assimilation

Sensitivity Coefficients: Bare Sphere

Top 20 nuclear data sensitivities - integrated over energy



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Image: A matched block

Sensitivities Data Assimilation

Sensitivity Coefficients: Reflected Sphere

Top 20 nuclear data sensitivities - integrated over energy



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Image: A mathematical states of the state

Differential Sensitivity Coefficient: ²³⁹Pu $\bar{\nu}(E)$

Introduction

Reflected is more sensitive. Bare is insensitive below 10 KeV.



Sensitivities Data Assimilation

Data Assimilation

The methodology is described in: Cacuci & Ionescu-Bujor, *Nuc. Sci. Eng.* **165** (1), (2010)

- Based in Bayes' Theorem and Maximum Entropy Principle
- Maximally Objective for Given Data
- Simultaneously calibrates all responses and parameters with sensitivity & uncertainty data.
- For this simple case Constrained maximization of multivariate Gaussian distribution $e^{-\frac{1}{2}Q(\alpha,r)}$ and linear

•
$$\alpha = \alpha_0 - C_{\alpha}(S^R_{\alpha})^{\dagger} [C_m + C_r]^{-1} (r - R)$$

Sensitivities Data Assimilation

DA: Best-predicted Nuclear Data



Figure: Adjustments to $^{239}\mathrm{Pu}$ fission data.



Figure: Adjustments to $^{239}\mathrm{Pu}$ fission data relative to the standard deviation.

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Sensitivities Data Assimilation



- $\bullet\,$ This analysis corroborates previous work $^{239}\mathrm{Pu}\;\bar{\nu}$ appears to high
- \bullet Below roughly 1.5 MeV $\bar{\nu}$ undergoes 1-2 standard deviation adjustment
- This adjustment corresponds to documented discrepancies in evaluated data
- Provides additional information & approach for evaluators (subcritical system with DA)
- Next Step: XSEDE allocation for expanded and refined study (finer energy groups & better convergence verification, additional experiments)

Sensitivities Data Assimilation

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