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# Sensitivity analysis and uncertainty quantification applied to the Feynman *Y* and Sm<sub>2</sub>

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> ANS Winter Meeting November 11-15<sup>th</sup>, 2018 Orlando, Florida

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#### Introduction



#### **Motivation**

- Cross section evaluation using critical experiments and reaction rate measurements has led to over-calibration in nuclear cross sections
- Neutron multiplicity counting (NMC) is a method of nondestructive assay of SNM assemblies
  - Each NMC distribution moment is a function of the cross sections raised to the power of the moment's order
  - Higher-order NMC distribution moments are more sensitive to the cross sections than the mean (first moment)
- *Y* and Sm<sub>2</sub> are ratios of NMC distribution moments
- Reliable characterization of SNM requires Sensitivity analysis (SA) and uncertainty quantification (UQ) applied to Y and Sm<sub>2</sub>



#### **Neutron multiplicity counting**

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- NMC accumulates distribution of coincident neutron counts
- Independent neutron emissions e.g.  $(\alpha, n)$ reactions characterized by Poisson distribution
- Fission-chain reactions are described by generalized Poisson distribution



Accumulation of counting distribution Miller, Nuc. Sci. and Eng., 2014





#### Feynman *Y* definition and use

 Ratio of variance-tomean of NMC distribution

$$Y = \frac{\sigma_n^2}{\overline{n}} - 1$$

- Measure of deviation of NMC distribution from Poisson statistics
- Can infer integral properties of SNM, such as neutron lifetime and neutron multiplication



Y vs coincidence gate



#### $\ensuremath{\mathsf{Sm}}_2$ definition and use

 Ratio of doubles-tosingles-squared

$$\operatorname{Sm}_2 = \frac{D}{S^2}$$

- Independent of detector response function
- Observe same Sm<sub>2</sub> for SNM assembly counted at different sourcedetector distances



Measured and simulated Sm<sub>2</sub> for MC-15 counting plutonium sphere from 30 cm to 80 cm McSpaden, Trans. ANS Winter, 2017

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#### **Over-calibration of Pu-239** $\overline{\nu}$

- Simulations of NMC of a 4.5-kg sphere of weapons grade plutonium metal (BeRP ball) overpredicted NMC distribution moments
- 1% reduction in Pu-239 v
  improved accuracy of
  simulated NMC distribution
  moments
- Over-calibration in  $\overline{\nu}$  had greater effect on the variance than the mean
- v

   artificially adjusted to match JEZEBEL critical experiments



Simulated NMC distribution before (top) and after (bottom) Pu-239  $\overline{\nu}$  reduction Miller, Nuc. Sci. and Eng., 2014

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## Sensitivity analysis



#### **Forward NTE**

 Describes a balance of production and loss terms for expected number of neutrons



#### **Adjoint NTE**

Counterpart to forward NTE

$$L^{+}\psi_{1}^{+} = Q_{1}^{+}$$

$$\begin{split} L^{+} &= -\widehat{\Omega} \cdot \nabla + \sigma_{t} - \int d\Omega' \int dE' \sigma_{s} - \\ &\overline{\nu} \sigma_{f} \int d\Omega' \int dE' \frac{\chi}{4\pi} \end{split}$$

 Adjoint flux is "importance" of source neutrons to the mean count rate



#### **NMC distribution moments**

• First moment of NMC distribution (mean count rate)

$$R_1 = \langle \psi, Q_1^+ \rangle = \langle \psi, \sigma_d \rangle$$

 Higher-order adjoint NTE have the same form as usual adjoint NTE with special fixed source terms

$$L^+\psi_k^+ = Q_k^+, k = 1, 2, \dots$$

• Higher-order detector responses are computed the same way as  $R_1$ 

$$R_k = \langle \psi, Q_k^+ \rangle$$



#### **Second NMC distribution moment**

$$R_2 = \langle \psi, Q_2^+ \rangle$$

$$Q_2^+ = \overline{\nu(\nu-1)}\sigma_f I_1^2$$

$$I_1 = \int d\Omega \int dE \frac{\chi}{4\pi} \psi_1^+$$

- $\psi_1^+$  is a linear function of the cross sections
- $Q_2^+$  is proportional to the square of the cross sections

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#### Sensitivity of mean count rate

• Perturbation theory allows the sensitivity to be computed with few transport solves

$$\frac{\partial R_1}{\partial \alpha_{m,g}} = \left\langle \frac{\partial Q_1^+}{\partial \alpha_{m,g}}, \psi \right\rangle + \left\langle \psi_1^+, \frac{\partial Q}{\partial \alpha_{m,g}} - \frac{\partial L}{\partial \alpha_{m,g}} \psi \right\rangle$$

• Sensitivity of higher-order detector response moments have a similar form



#### **Relative sensitivity definition**

 Absolute sensitivity is scaled by cross section and detector response values

$$\frac{\delta R_k}{R_k} = S_{R_k, \alpha_{m,g}} \frac{\delta \alpha_{m,g}}{\alpha_{m,g}}$$

 Represents a linear relationship between change in cross section value and corresponding change in detector response



#### Sensitivity of Y and Sm<sub>2</sub>

$$Y = \frac{\sigma_n^2 - \overline{n}}{\overline{n}} = \frac{R_2}{R_1}$$

$$S_{Y,\alpha_{m,g}} = S_{R_2,\alpha_{m,g}} - S_{R_1,\alpha_{m,g}}$$

$$\operatorname{Sm}_2 = \frac{D}{S^2} = \frac{1}{2} \frac{R_2}{R_1^2}$$

$$S_{\mathrm{Sm}_2,\alpha_{m,g}} = S_{R_2,\alpha_{m,g}} - 2S_{R_1,\alpha_{m,g}}$$



### **Uncertainty quantification**



#### Linear propagation of uncertainty

• Variance in *Y* and Sm<sub>2</sub> may be estimated using linear propagation of uncertainty

$$\operatorname{var}(f) = \mathbf{S}_{f,\alpha}^{\mathrm{T}} \mathbf{C}_{\alpha} \mathbf{S}_{f,\alpha}$$
,  $f = Y$ ,  $\operatorname{Sm}_2$ 

- *Y* and Sm<sub>2</sub> variance due to random nature of counting may be reduced by longer counting
- Y and Sm<sub>2</sub> variance due to cross sections does not change



#### **Current results**



#### **Response and sensitivity calculations**

- 44-group, 1D PARTISN simulations of NMC of BeRP ball simulated with:
  - No reflector
  - 3.8 cm of polyethylene
- Cross sections present in the SA/UQ process:

$$- \alpha_g = \left\{ \chi_g, \ \overline{\nu}_g, \ \overline{\nu}(\nu - 1)_g, \\ \sigma_{fg}, \ \sigma_{el,g}, \ \sigma_{in,g}, \ \sigma_{cg} \right\}$$

 Only Pu-239 and H-1 isotopes



nPod neutron multiplicity counter Miller, Nuc. Sci. and Eng., 2014



BeRP ball nested in polyethylene reflectors Miller, Nuc. Sci. and Eng., 2014





# Relative sensitivity of Y and Sm<sub>2</sub> to Pu-239 $\overline{\nu}$



#### Y and Sm<sub>2</sub> and their uncertainty





#### **Relative sensitivity totals of** *Y* and Sm<sub>2</sub>



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#### Summary





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#### Summary

- Performed first calculation of variance in Y and Sm<sub>2</sub> due to covariance in the cross sections
- Assay of SNM utilizing Y may be preferred for its historical use in inferring integral properties of the material
- Assay of SNM utilizing Sm<sub>2</sub> may be preferred because it
  - Is independent of detector response function
  - Has less variance due to the cross sections than Y to the cross sections



#### **Future work**

- Concurrent dissertation work is optimization of cross sections utilizing NMC experiments
  - SA/UQ applied to NMC distribution moments informs calibration of cross sections via parameter estimation (PE)
  - Estimate cross sections such that NMC experiments are more accurately simulated
- PE that includes SA/UQ applied to NMC distribution moments as well as Y and Sm<sub>2</sub> may further improve accuracy of simulation of NMC experiments

