



# **Solution of Multivariate Inverse Radiation Transport Problems**

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# Outline

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- About Sandia, my organization, and our work
- About inverse radiation transport problems
- Solution of an example problem
- Constraining the solution using multiple complementary measurements
- Neutron multiplicity counting and inverse transport problems
- Summary, ongoing and future work



# Sandia National Laboratories

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- Department of Energy National Laboratory
- Government-owned, contractor-operated
- Established in 1949 to support US nuclear weapon program
- Today Sandia develops a broad range of technologies that support US national security
- Main lab campuses in Albuquerque NM and Livermore CA
- Facilities in New Mexico, Nevada, Texas, and Hawaii
- More than 8,500 full-time staff & 2,200 contractors
- About 1,500 PhD & 2,700 MS/MA staff
- Annual budget of about \$2.4 billion (FY2007)



# Sandia Mission Areas

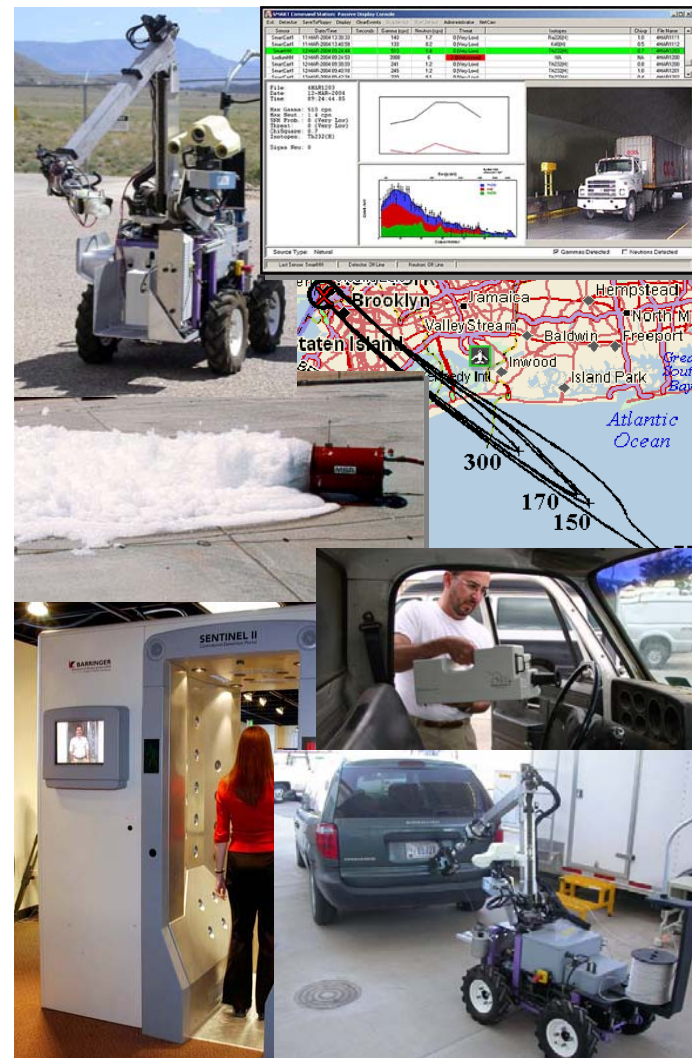
- Nuclear weapons
- Defense systems
- Homeland security
- Nonproliferation
- Energy & infrastructure
- Science, technology, and engineering





# Sandia's HE/Rad/Nuc Countermeasures Program

- Explosive and radiological observables & signatures
- Detection technologies
- Analytical methods & services
- Systems integration
- Field deployment & testing
- Effects modeling
- Protection methods
- Disablement systems
- Mitigation / containment
- Performance validation
- Training & consulting

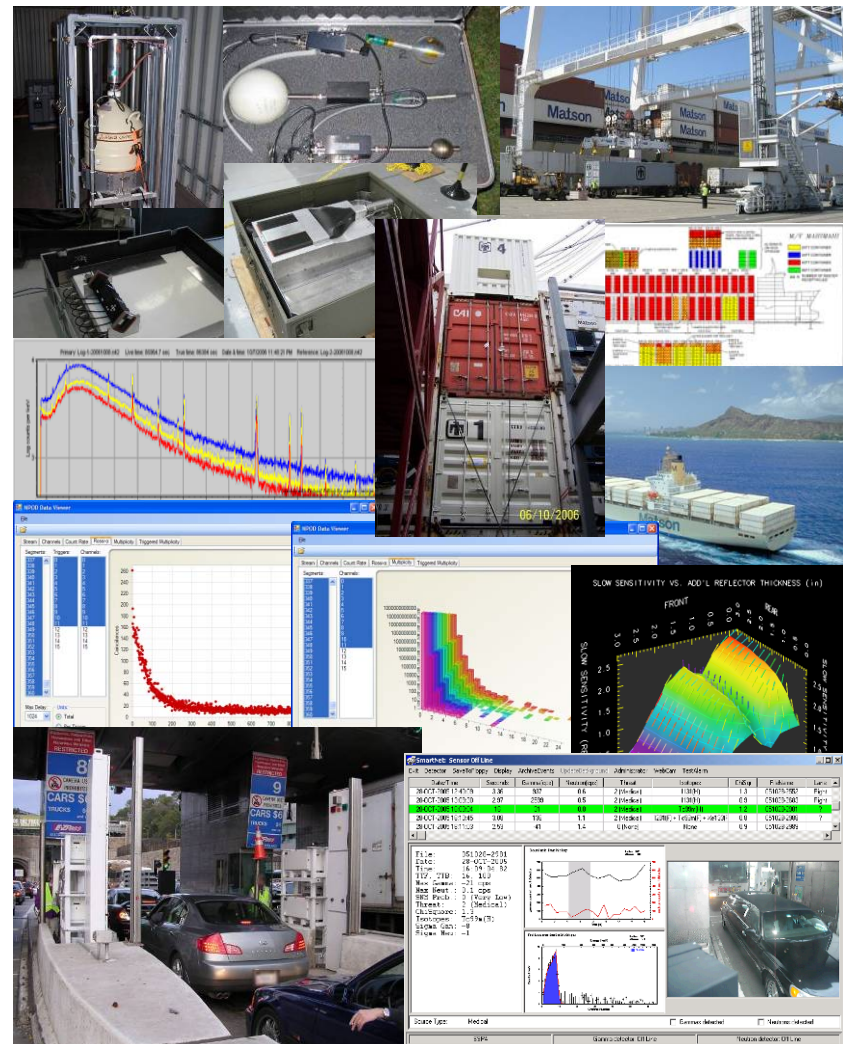






# Radiation Detection and Analysis R&D

- Basic physics measurements
- Radiation transport modeling
- Analysis software development
- Sensor development & design
- Sensor deployment & testing
- Radiation signature analysis





# Inverse Radiation Transport Problems

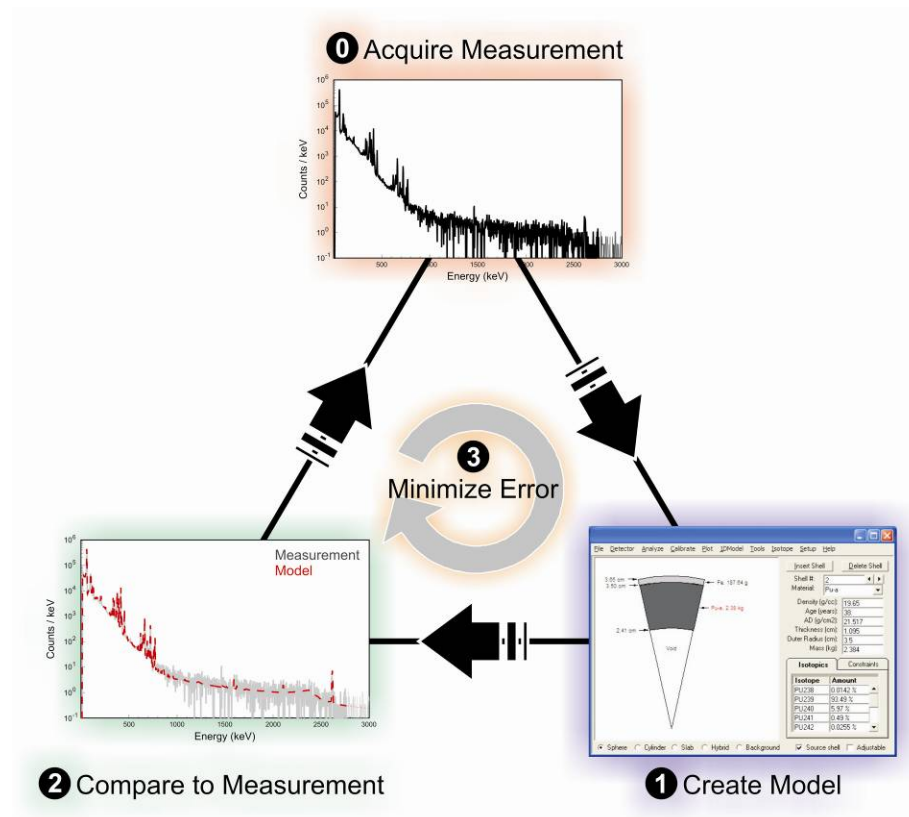
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- Objective: infer configuration of an unknown radiation source from its measured radiation signatures
- Source features
  - Isotopic composition
  - Fissile mass & multiplication
  - Geometric arrangement of radiating and shielding materials
- Signatures
  - Gamma spectrometry
  - Neutron time-correlation and multiplicity counting
- Applications
  - Nonproliferation
  - Counterterrorism
  - Emergency Response



# Solution Method

- Start from initial estimate of model parameters
- Solve forward transport models to compute radiation field
- Fold radiation field with detector response model to estimate radiation signatures
- Compute error between predicted and observed signatures
- Iteratively follow gradient in error to minimum







# Solution Requirements

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- Forward computations must be accurate
- Minimize bias in solution due to systematic errors in model
- Forward computations must be fast
- Minimize time required for iterations to find solution
- Model must have finite number of numeric parameters
- Minimize degrees of freedom / dimensionality of solution
- Accuracy requires high-fidelity spectral synthesis: coupled neutron/electron/photon transport calculations
- Speed requires explicit solution of transport problem: deterministic transport
- Tractable problems do not have arbitrary geometry



# Radiation Observables

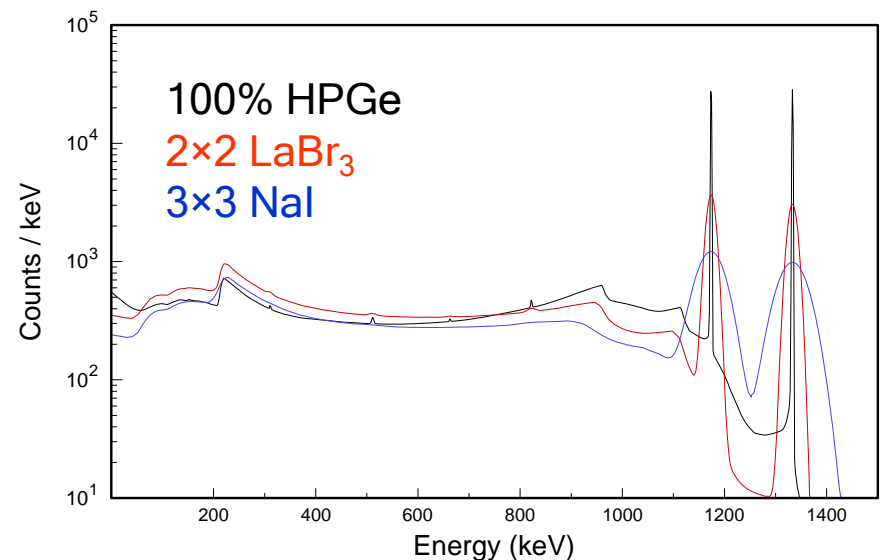
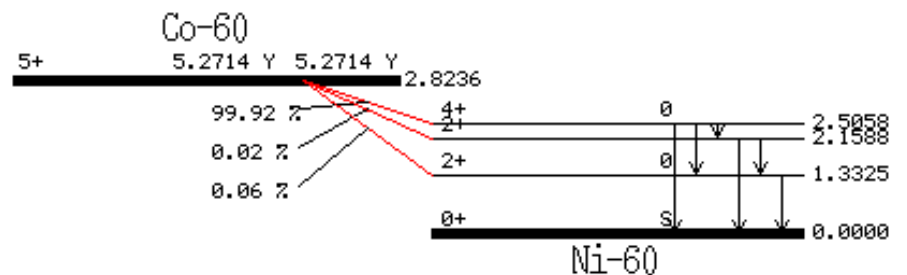
- Most externally observable radiation signatures result from gamma and neutron emissions
- Observables are usually differential over one or more independent variables (e.g., energy, position, time)
- Gamma spectrometry measures the distribution of photons versus energy
- Neutron multiplicity counting measures the distribution of neutrons versus number and counting time





# Gamma Spectrometry

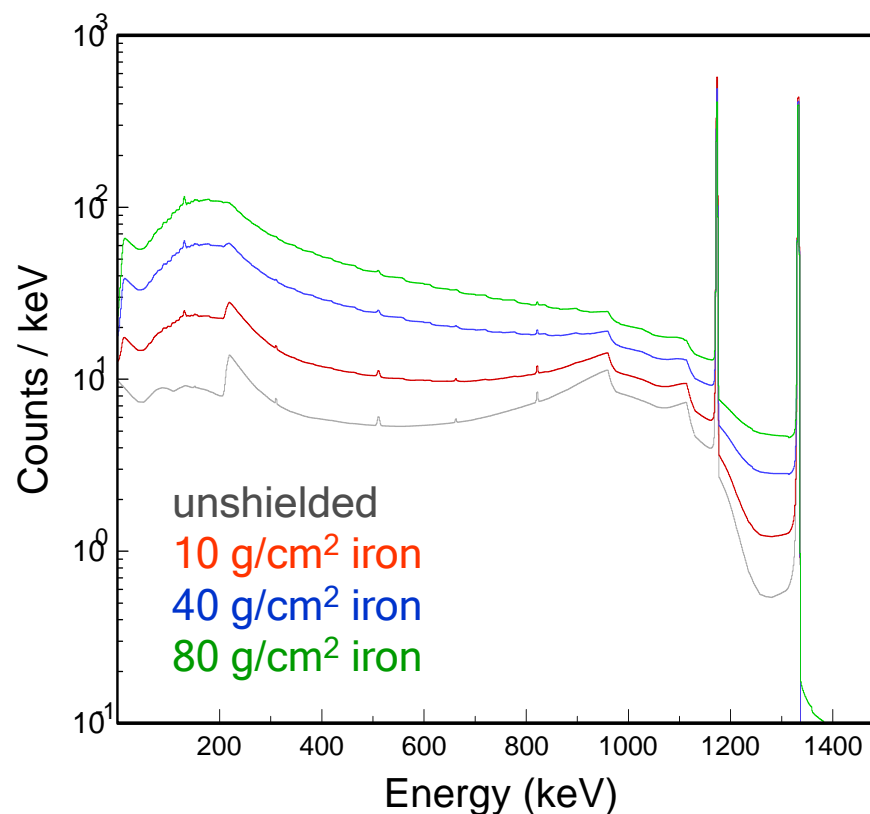
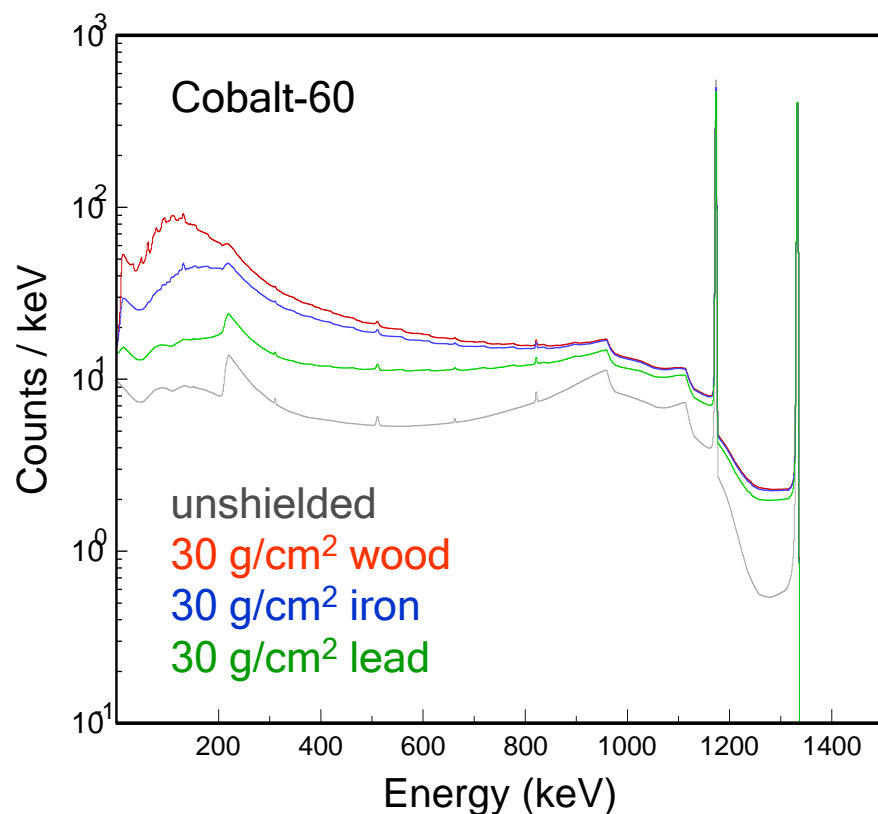
- Radionuclide decays from unstable ground state through series of discrete energy levels
- Decay between levels of a single daughter achieved via emission of discrete energy gammas
- Gammas characteristic of daughter level scheme
- Gamma spectrometers measure distribution of photon energies
- Spectrum can be used to identify radionuclide(s) and shielding





# Photopeaks and Compton Continua

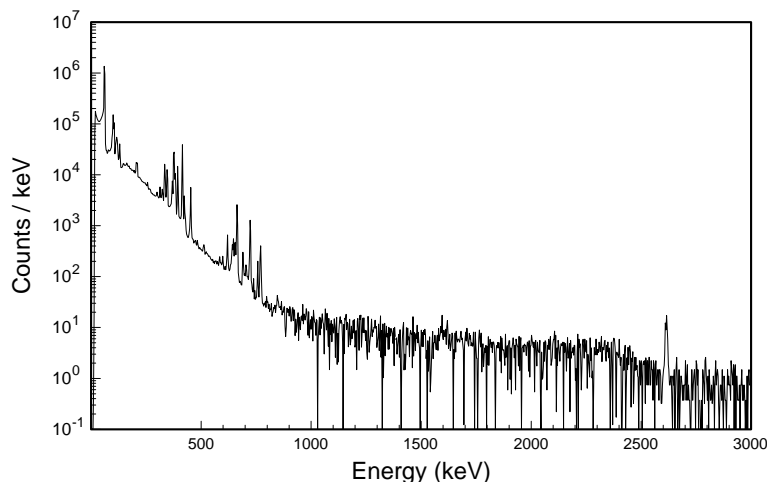
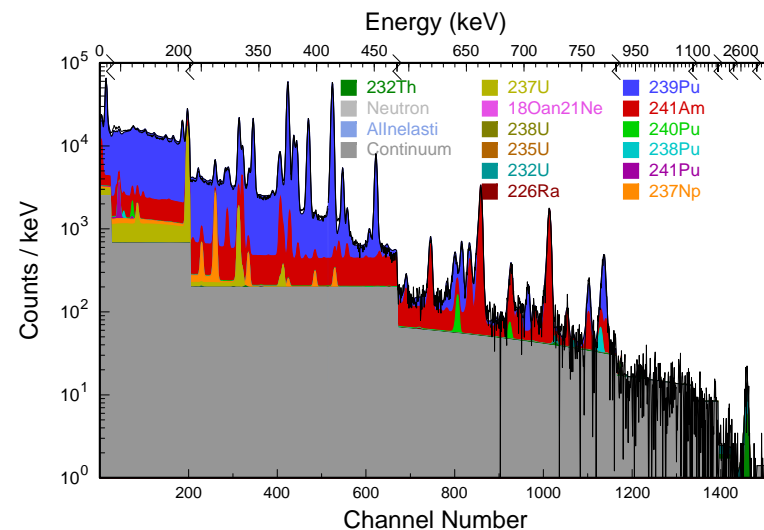
- Photopeak positions identify source
- Differential attenuation of photopeaks and Compton continua identify shielding





# Example Problem

- Gamma spectrum (bottom-left) exhibits features consistent with plutonium
- Nonlinear regression (top-right) fits spectrum using variable isotopics, volume, shielding, and age
- Regression analysis (bottom-right) provides approximate model of source



Plutonium wt.% (@ 33 +/- 1 years)				@ t=0	
Pu-236:	2.69E-12	+/-	1.19E-12	8.98E-09	+/- 4.75E-09
Pu-238:	0.014	+/-	0.008	0.019	+/- 0.010
Pu-239:	94.205	+/-	0.603	94.295	+/- 0.604
Pu-240:	5.279	+/-	1.157	5.298	+/- 1.161
Pu-241:	0.095	+/-	0.006	0.513	+/- 0.038
Pu-242:	[ 0.010]			[ 0.010]	
Am-241:	0.396	+/-	0.008		
Np-237:	0.017	+/-	0.002		
U-237:	2.94E-09	+/-	1.92E-10		
U-232:	8.98E-09	+/-	3.97E-09		

Confidence for measured 180-an-21Ne gammas: -1.6 sigma  
 Measured (a,n) relative to expected for oxide: -3.0 sigma  
 Aluminum-inelastic peak: 1011.7 keV @ 2.3 sigma  
 Chemical form: METALLIC  
 External shielding: AN = 30 +/- 1; AD = 3.9 +/- 0.1  
 Outer radius if plutonium is spherical: 3.8 cm  
 Estimated void radius: 3.3 cm  
 Estimated mass if delta-phase plutonium: 1.3 kg

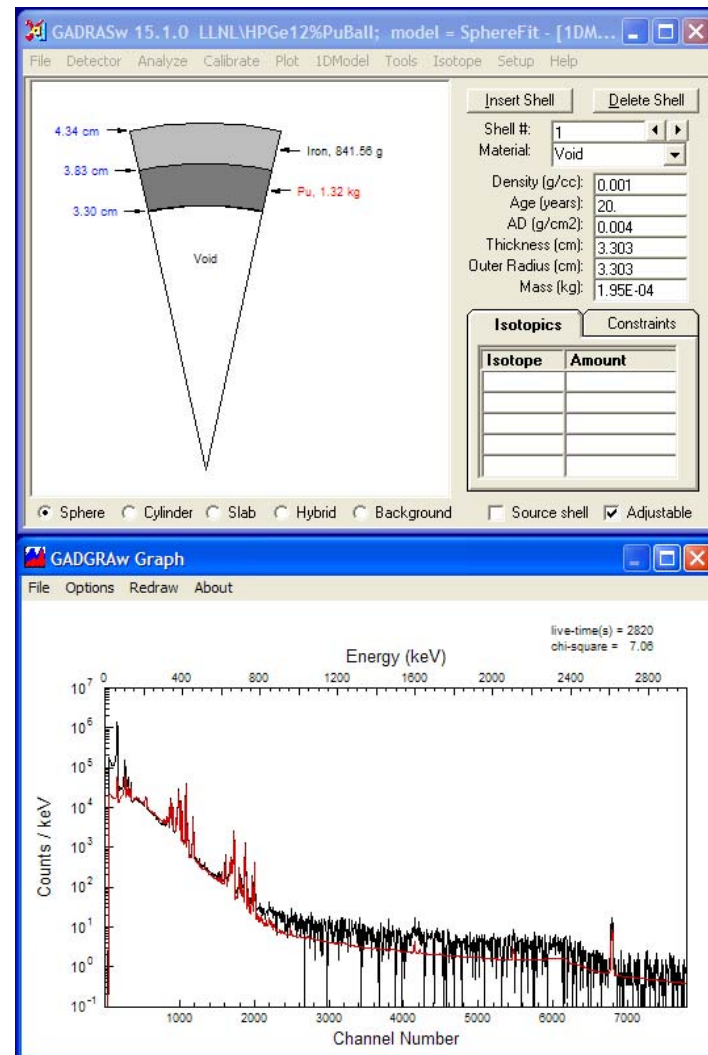
There is no evidence that uranium is present.





# Example Problem

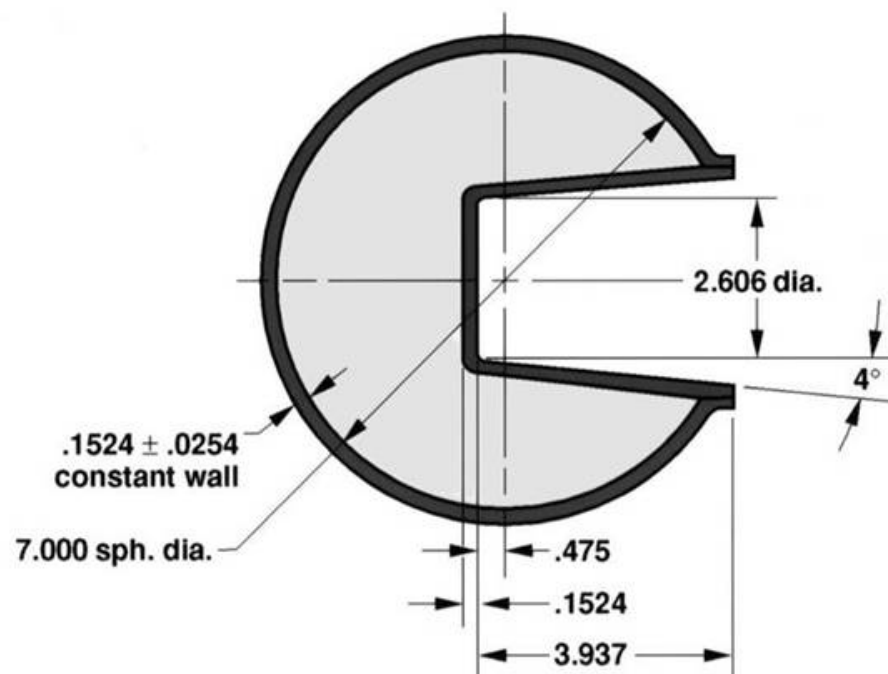
- One-dimensional transport model (top) generated from regression analysis
  - Model displayed as section of sphere with center at bottom and outer surface at top
  - Dimensions of model layers are treated as variable parameters
- Initial estimate of gamma spectrum (bottom) is generated from coupled neutron/electron/photon transport calculation
- Nonlinear optimization procedure finds model dimensions that minimize error in calculation



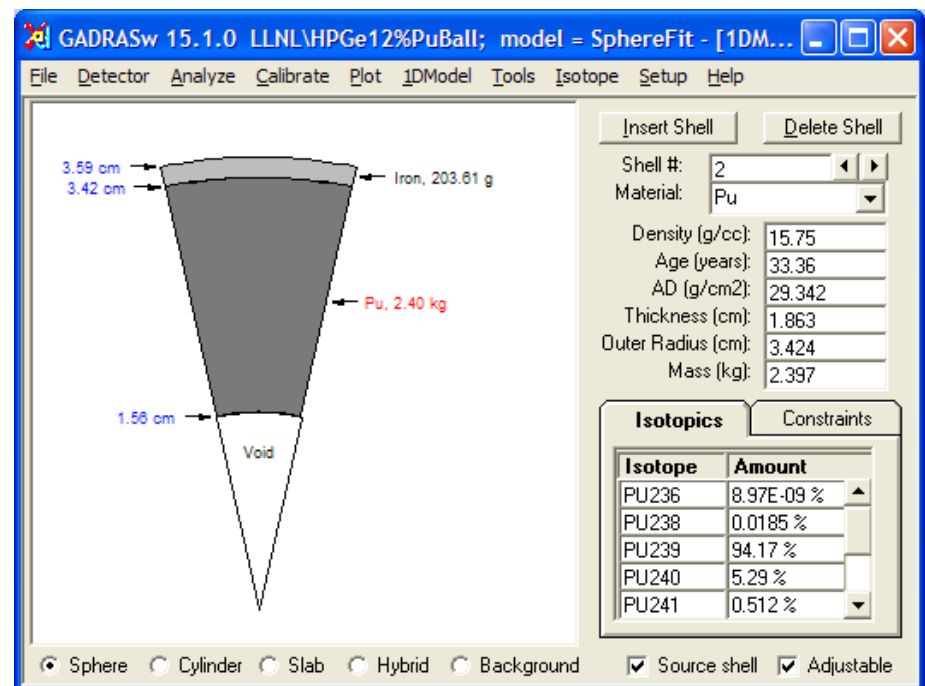


# Actual Source

LLNL Plutonium Sphere



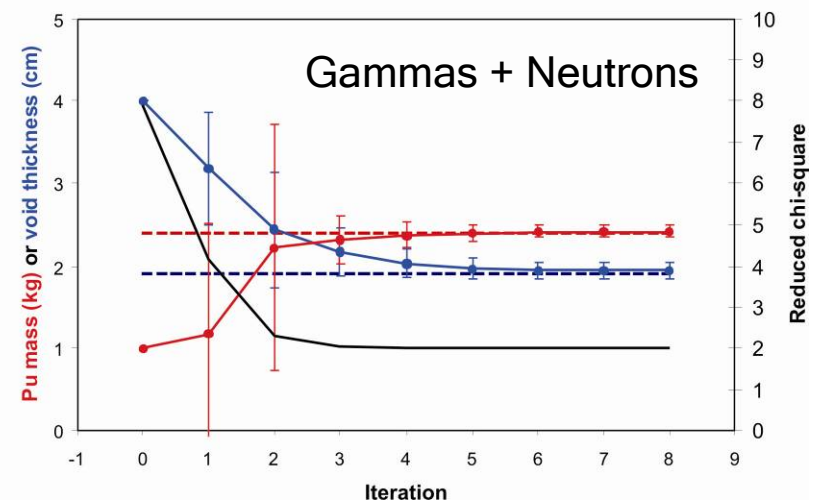
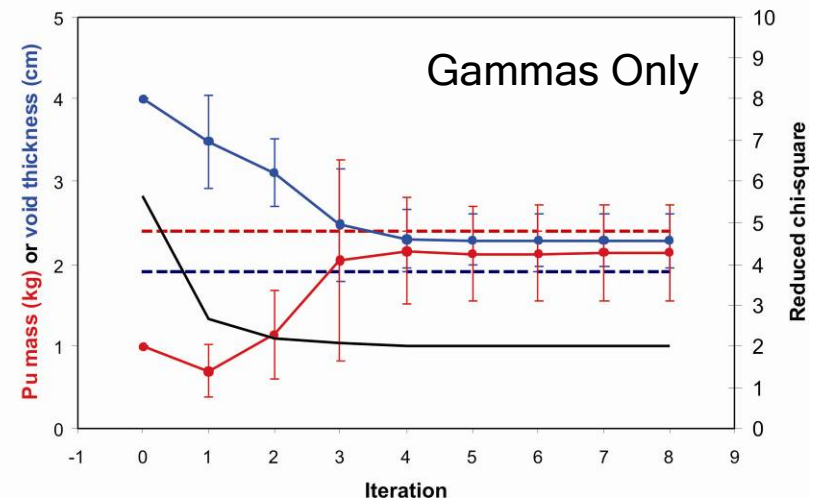
Optimized Transport Model





# Solution using Gammas and Neutrons

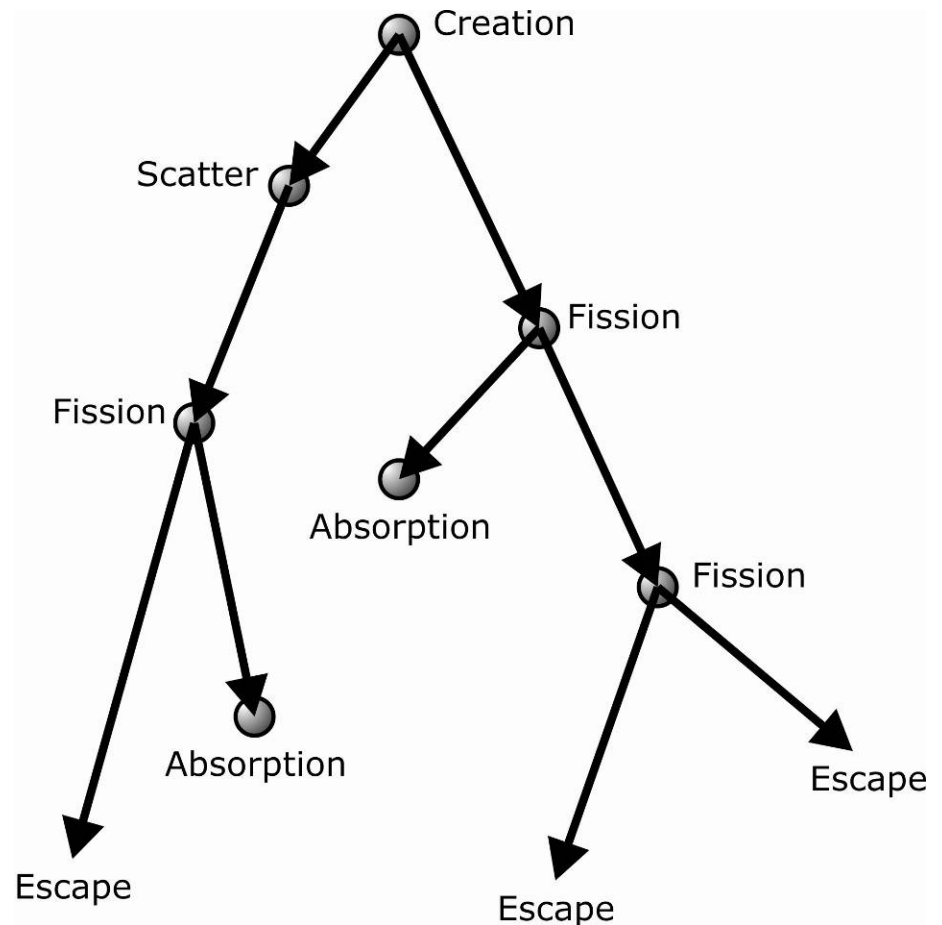
- Gamma spectrum is primarily sensitive to outer surface of source
- Solution based on gamma spectrum alone is weakly constrained
- Neutron measurements (e.g., count rate) are more sensitive to entire volume of source
- Simultaneous solution based on analysis of gamma and neutron signatures is better constrained
- Neutron multiplicity counting provides a fairly rich signature of the neutron field





# Fission Chain-Reactions

- Fission chain reactions multiply the number of neutrons in fissile transport medium
- Chain reaction characteristics:
  - Number of neutrons made during the chain reaction: neutron multiplication
  - Speed of chain reaction evolution: neutron generation time
- Neutron multiplicity measurements are sensitive to both characteristics

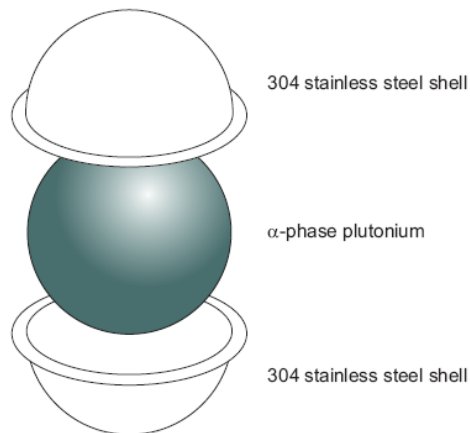




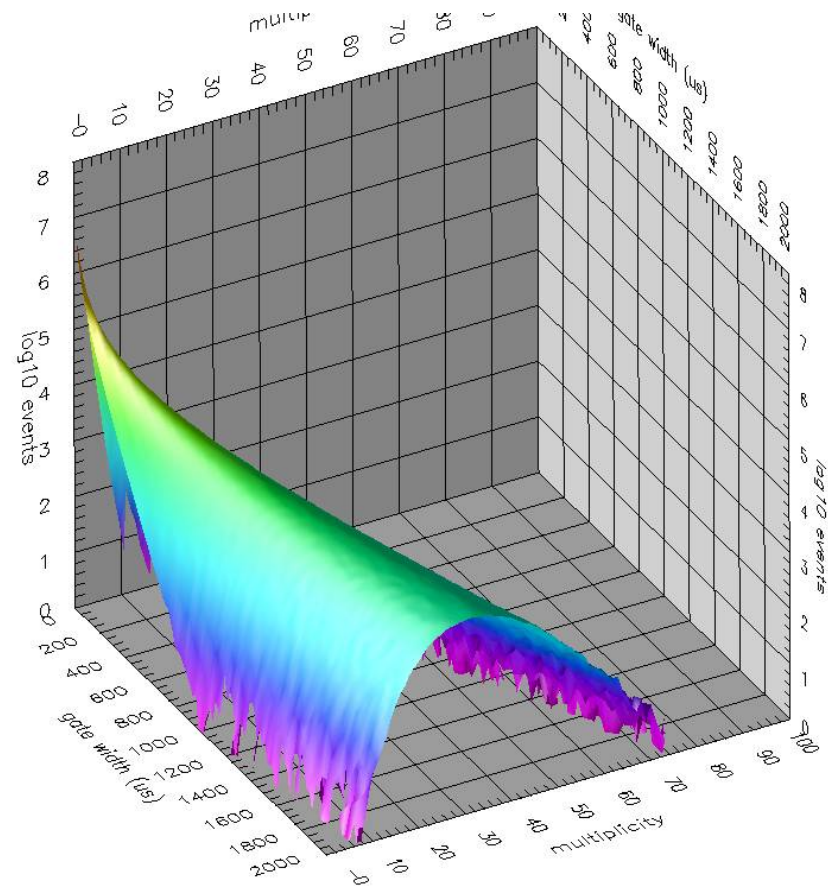
# Neutron Multiplicity Counting

- Neutron multiplicity counting measures frequency of neutron detection versus:
  - Counting time, a.k.a., coincidence gate width, usually on order of microseconds
  - Number of coincident counts, a.k.a., multiplicity, usually between 10's and 100's of coincident neutrons

LANL BeRP Ball



LANL BeRP Ball / 1.5" Poly Reflector

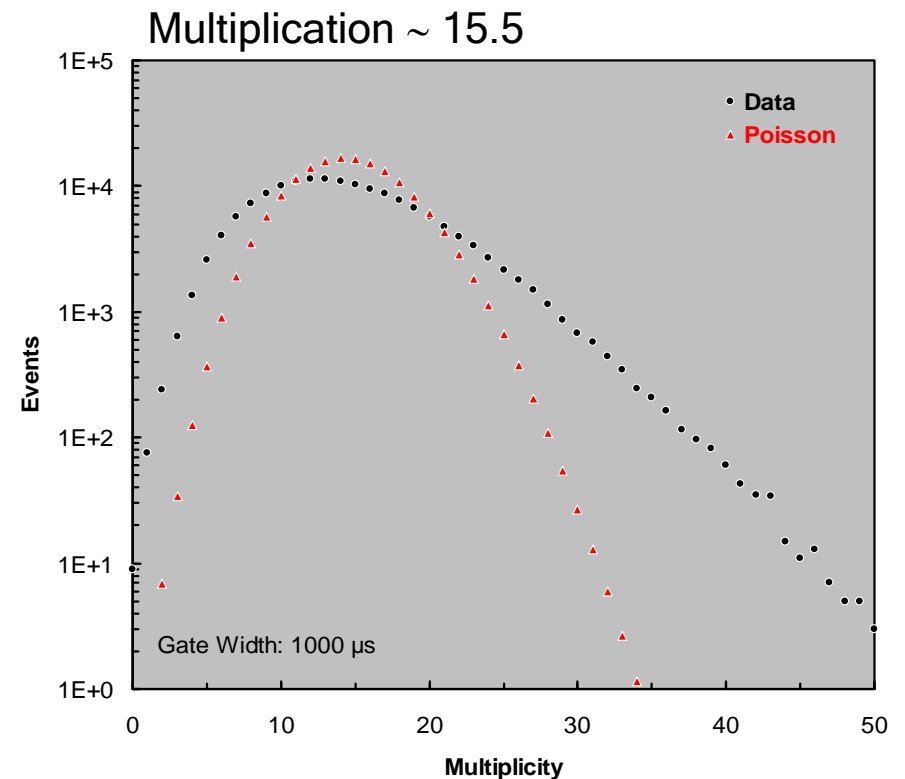
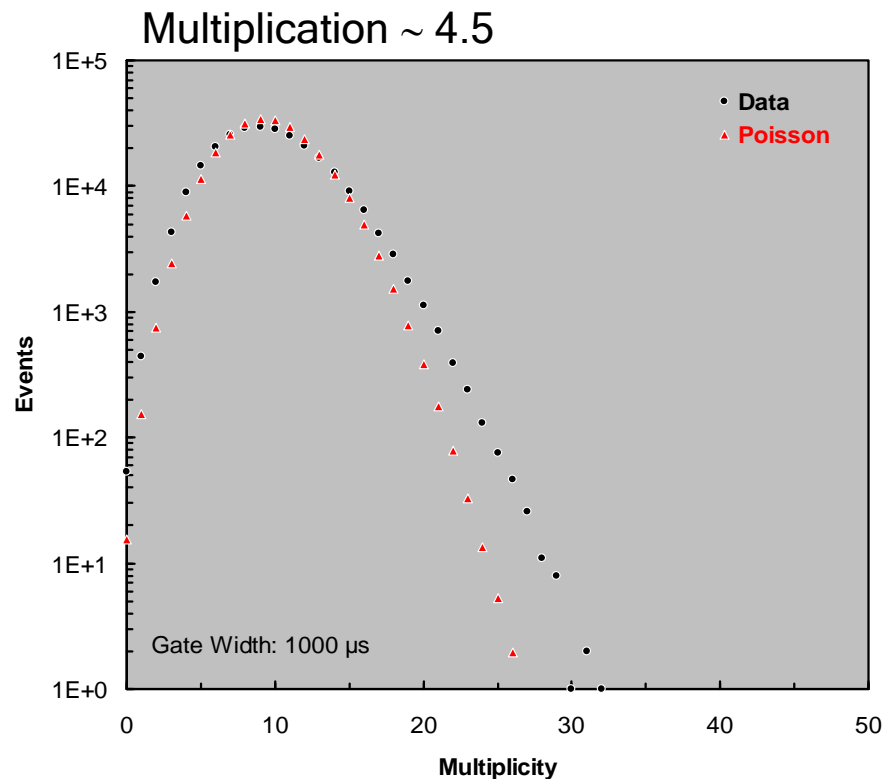






# Multiplication Produces Excess Variance

- Fission chain reactions are “bursty”
- Relative to a population of uncorrelated, Poisson-distributed counts, fission multiplicity distribution is wider





# Feynman-Y

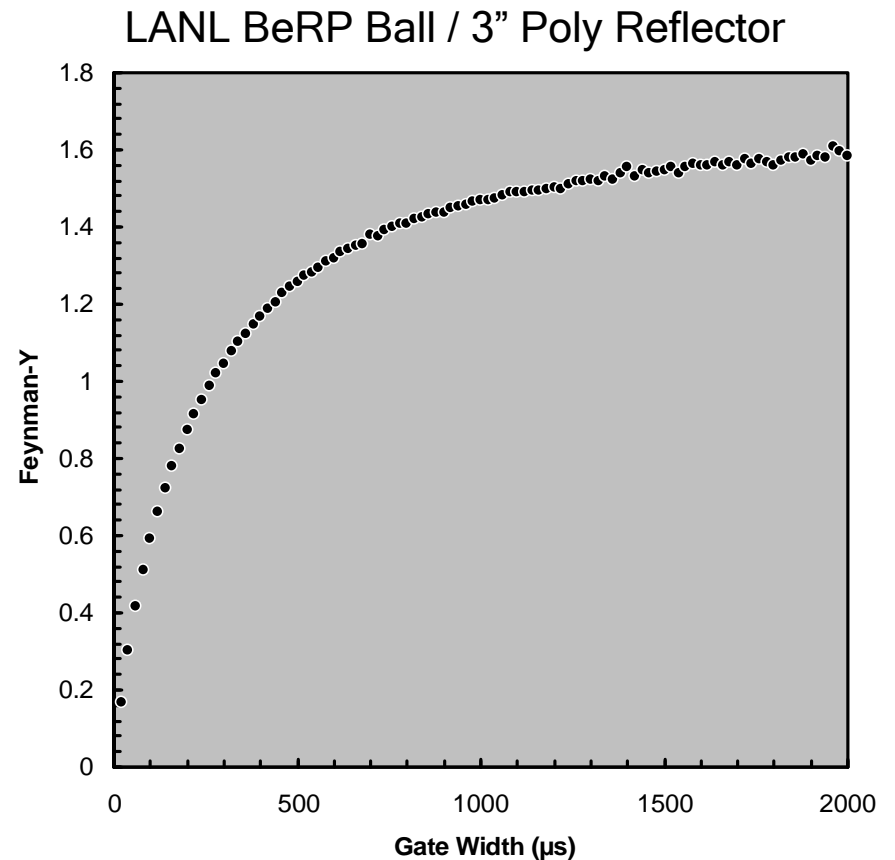
- Feynman-Y measures variance in excess of Poisson distribution

$$\frac{\sigma^2}{\mu} = 1 + Y$$

$\sigma^2$  : *variance*

$\mu$  : *mean*

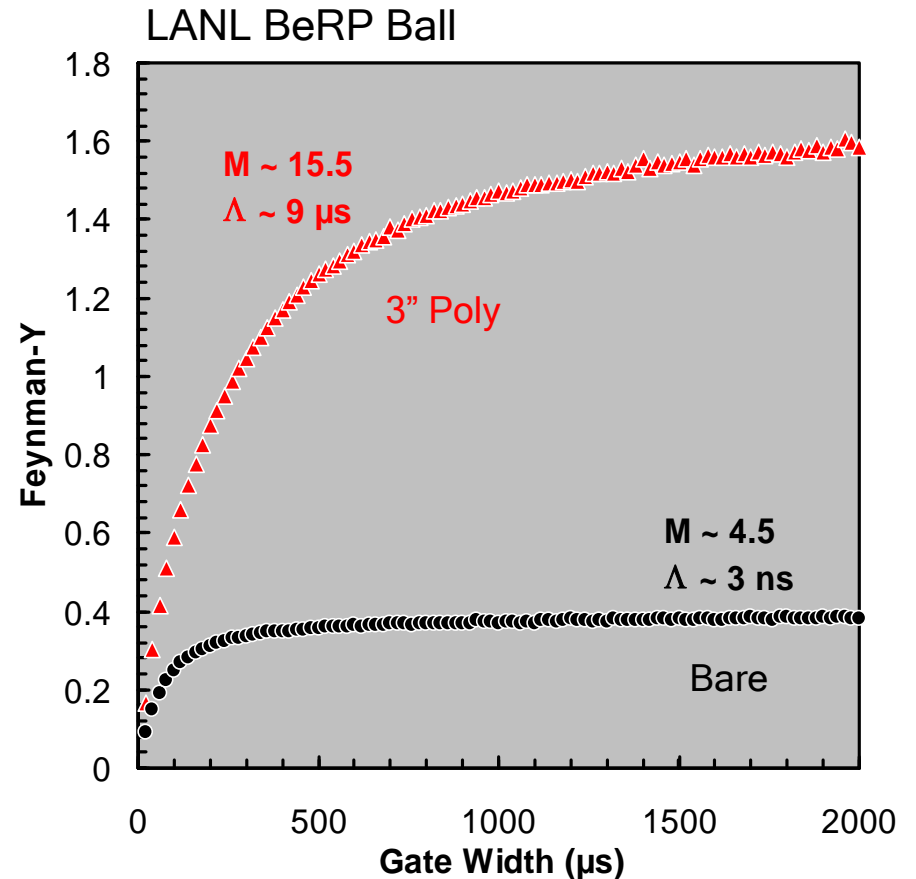
- Y vanishes if counting distribution is purely Poisson
- Y tends to increase with neutron multiplication
- Usually measured vs. coincidence gate width (counting time)





# Effect of Multiplication and Generation Time

- $Y$  is a measure of the second moment of the counting distribution
- Asymptotic value tends to increase with square of neutron multiplication
- $Y$  is a measure of the system's dynamic response
- Shape vs. gate width tends to evolve more slowly with increasing neutron generation time





# Neutron Multiplicity: Distribution vs. Moments

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- Choice of observable dictated by solution requirements: accuracy, speed, and degrees of freedom
- Multiplicity distribution
  - Can be computed using Monte Carlo methods – accurate, but slow
  - Can be computed using recursive point models – faster, but still slow, and inaccurate for systems that violate point kinetics assumptions
  - Could be computed by deterministic solution of generalization to Boltzmann transport model – but no numerical solver exists
  - Degrees of freedom much lower than dimensionality – distribution dictated by product of source strength, multiplication, and leakage probability
- Multiplicity moments
  - Can be computed using analytical point models: fast, but inaccurate for non-point systems
  - Can be computed by deterministic solution of forward and adjoint Boltzmann transport models – fast and accurate
  - First few low-order moments convey most of the information contained in the distribution



# Deterministic Computation of Feynman-Y

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- Muñoz-Cobo, Perez, and Verdú developed method to compute neutron multiplicity moments via deterministic solution of Boltzmann transport equation (see NS&E #95)
- Method enables computation of first and higher moments (e.g., mean and variance) using existing deterministic transport solvers
- Three calculations required
  - Forward time-independent, fixed source
  - Adjoint time-independent, adjoint source is detector response
  - Forward time-dependent, instantaneous step in fixed source intensity





# Deterministic Computation of Feynman–Y

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- Feynman–Y exhibits two notional features
  - Asymptotic value
  - Shape dependent on coincidence gate width
- Asymptote
  - Computed from static forward and adjoint transport solution
  - Accounts for relative contribution of source and induced fission neutrons
  - Source term for adjoint problem is detection efficiency – adjoint flux  
“weighting function” represents importance to detection
- Shape
  - Computed from solution to dynamic step response problem
  - Forward source term is instantaneously stepped
  - Leakage current is folded with detector cross section & impulse response
  - Detector response is integrated over gate width



# Feynman-Y Asymptote: Excess Variance

- Excess variance comes from **source** and induced **fission**

$$\frac{\sigma^2}{\mu} = 1 + Y \qquad \sigma^2 = \mu + {}_2S_0 + {}_2S$$

- Variance of **source** neutron production  $Q$

$${}_2S_0 = \int d^3r \int dE \frac{\overline{v_0(v_0-1)}}{v_0} Q(\vec{r}, E) I_0^2(\vec{r}) \qquad I_0(\vec{r}) = \int dE' \frac{\chi_0(\vec{r}, E')}{4\pi} \phi^\dagger(\vec{r}, E')$$

- Variance of **fission** neutron production  $v\Sigma_f\phi$

$${}_2S = \int d^3r \int dE \frac{\overline{v(v-1)}}{v} \Sigma_f(\vec{r}, E) \phi(\vec{r}, E) I^2(\vec{r}) \qquad I(\vec{r}) = \int dE' \frac{\chi(\vec{r}, E')}{4\pi} \phi^\dagger(\vec{r}, E')$$

- Importances  $I_0$  and  $I$  weighted by adjoint flux  $\phi^\dagger$



## Forward vs. Adjoint Flux

- Forward transport: **rate of change** = **source** + **production** - **losses**

$$\frac{1}{v} \frac{\partial}{\partial t} \phi = Q + P\phi - L\phi$$

- Relationship between **forward** and **adjoint**

$$\langle \phi^\dagger Q \rangle = \langle Q^\dagger \phi \rangle$$

- Adjoint transport reverses time, direction, and change in energy

$$-\frac{1}{v} \frac{\partial}{\partial t} \phi^\dagger = Q^\dagger + P^\dagger \phi^\dagger - L^\dagger \phi^\dagger$$

- Adjoint flux represents importance of source neutrons to interaction embodied in adjoint source

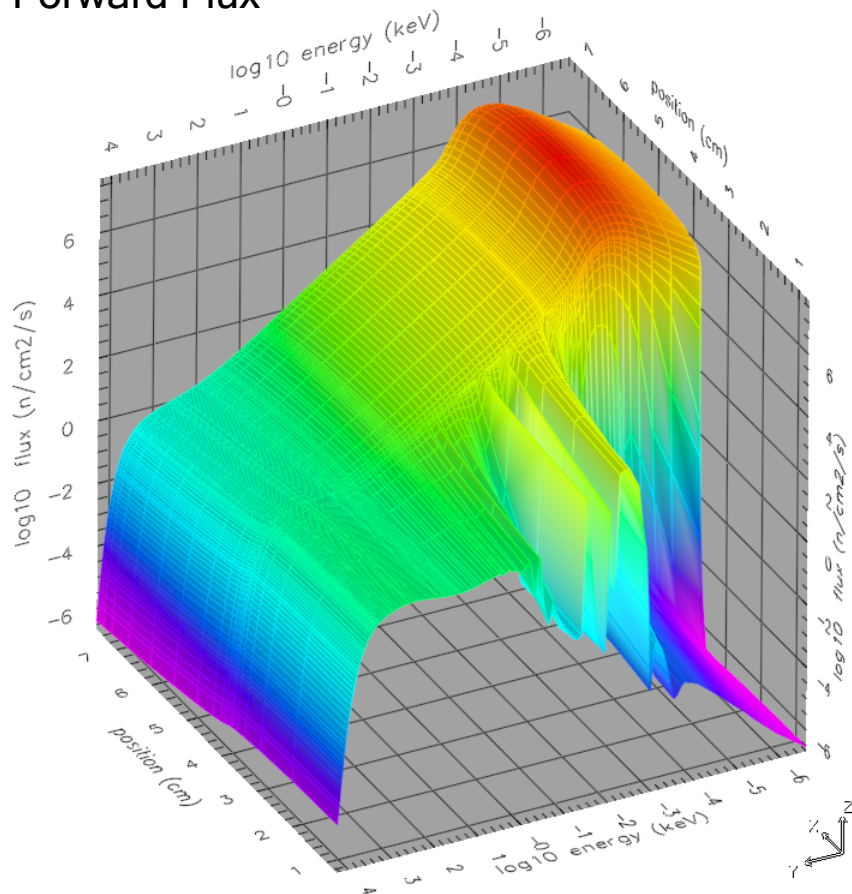
$$Q^\dagger = \Sigma_x \Rightarrow R_x = \langle \Sigma_x \phi \rangle = \langle \phi^\dagger Q \rangle$$



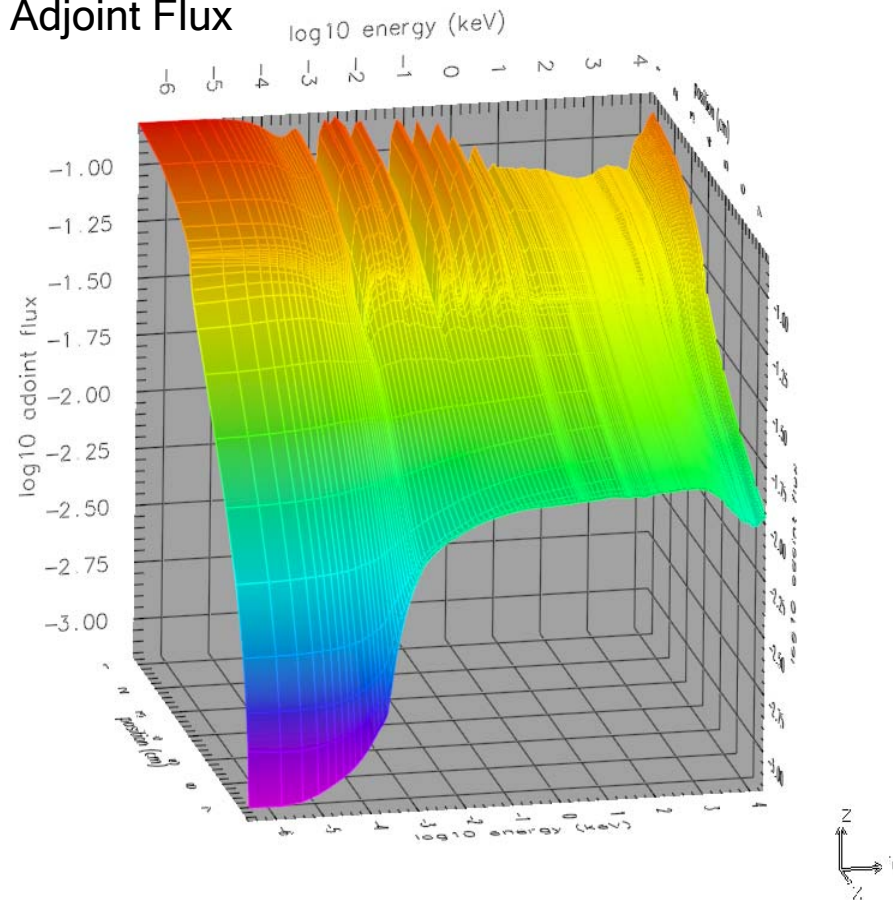
# Static Forward and Adjoint Solutions

LANL BeRP Ball / 1.5" Poly Reflector

Forward Flux



Adjoint Flux





# Feynman–Y Shape: Dynamic Response

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- Feynman–Y shape computed from solution to forward dynamic step response problem

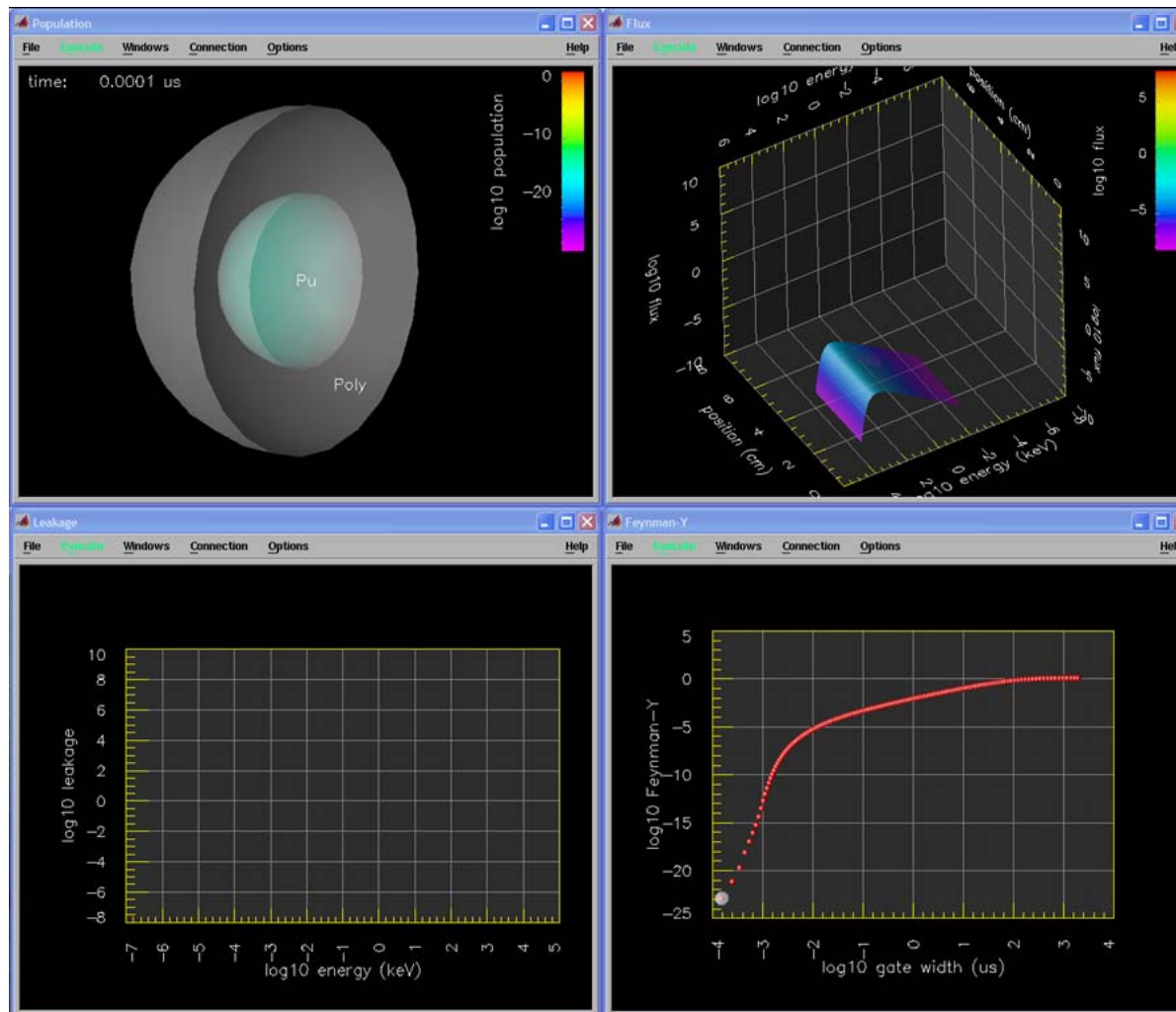
$$Y(T) \propto \frac{1}{T} \int_0^T dt \int_0^t dt' h(t-t') \Sigma_d(\vec{r}, E) \phi(\vec{r}, E, t')$$

- Uses time–dependent transport solver to compute flux  $\phi$  in response to instantaneous step in forward source term  $Q$
- Time–dependent flux folded with detector cross–section  $\Sigma_d$  and impulse response  $h$
- Integrated over coincidence gate width  $T$



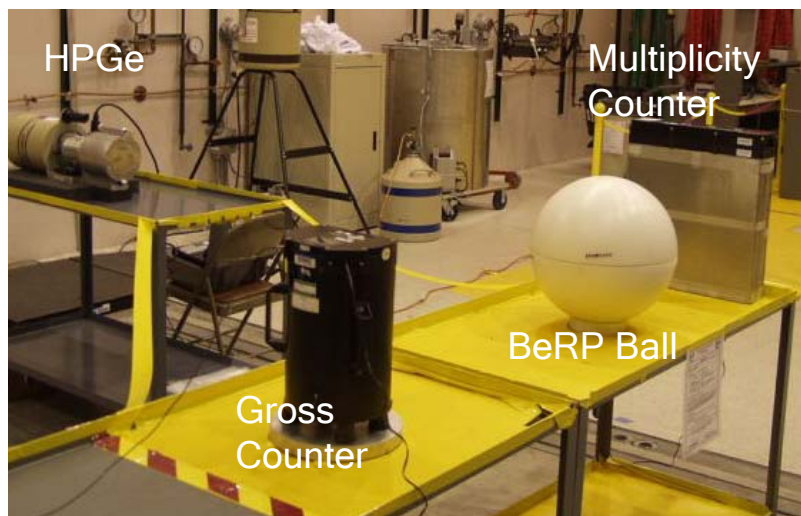
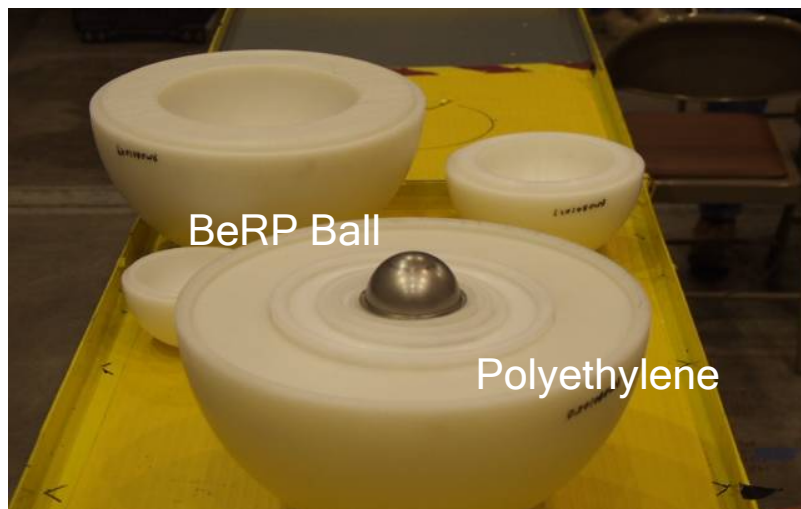


# Dynamic Response Calculation

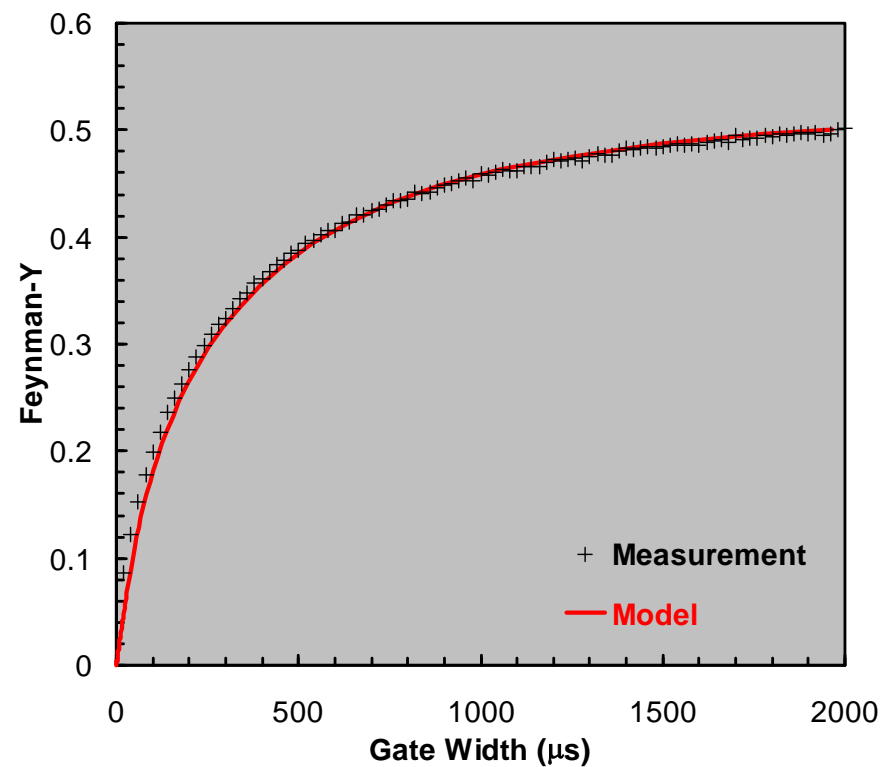




# Initial Test Results



LANL BeRP Ball / 6" Poly Reflector





# Summary

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- Possible to infer configuration of an unknown radiation source from its radiation signatures
- Solutions based on multiple complementary signatures are better constrained
- Sandia is developing methods to solve for source configuration using gamma spectrometry and neutron multiplicity signatures
- Sandia developed fast method to accurately compute Feynman-Y
- Based on original work by Muñoz-Cobo, Perez, and Verdú
- Implementation uses LANL-developed, time-dependent transport solver PARTISN
- Initial test results confirm method's accuracy and potential speed



## Ongoing and Future Work

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- Just started 3-year project with University of Florida (UF) and University of Michigan (UM)
- Increase speed of calculations: UF, Prof. Glenn Sjoden, Dr. Ce Yi
  - Explore alternative cross-section generation schemes
  - Explore different solver options
  - Resolve slow convergence of adjoint solution
- Benchmark accuracy of calculations: UM, Prof. Sara Pozzi, Dr. Shaun Clarke
  - Augment MCNP-PoliMi tallies to accumulate neutron multiplicity distribution for proportional counters
  - Test MCNP-PoliMi against existing benchmark measurements
  - Generate synthetic test data for deterministic calculations