# Covariance work at LLNL



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# Nuclear data covariance matrices can be huge and unwieldy



• The FULL covariance matrix of an evaluation is way too big to be used:

| 3 big $\sigma$ 's: (n,tot), (n,el), (n, $\gamma$ ) | 5000 pts. ea. |
|--|---------------|
| ~ 10 discrete level excitation $\sigma$ 's: (n,n') | 100 pts. ea.  |
| ~ 5 threshold σ's: (n,2n), (n,p), (n,3n),<br>etc.  | 100 pts. ea.  |
| If fissions, have fission $\sigma$ too             | 5000 pts. ea. |

- Most channels have ~2 outgoing particles (usu. γ & n)
  - Assume isotropic, but each has ~ 10 outgoing E' points
  - So has 10 x (number of points in  $\sigma$ )
- This comes out to ~ 1.5 x 10<sup>5</sup> points/evaluation (neglecting fission)!
- Note, this neglects cross-isotope correlations:
  - Reaction model, common parameters in modeling
  - Ratio experimental data (e.g. <sup>239</sup>Pu(n,f)/<sup>235</sup>U(n,f))

The FULL covariance matrix (for just one evaluation) would require  $\sim 10^{10}$  entries: it would be impractical to use the entire thing

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- Double precision -> single precision
  - Lowers precision of entries, for sure leads to numerical artifacts (e.g. non-positive eigenvalues)





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- What do I propose to do about it?
  - ... nothing
- I will use the existing covariance data however



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#### Want probability distributions for metrics based on knowledge of the nuclear data **Compute metric** User developed for each lib. a-priori script for particular model problem/client code params & covariance Cross sections, Sample nuclear Weight libs. outgoing particle data; create lib. distributions, ... Kiwi handles this Histogram metrics. **Standard UQ Framework** a-posteriori model DAKOTA params, PDF of metric



### Status of kiwi rewrite vs. requirements

- **Drive using PSUADE or Dakota or stand-alone**
- **Documented** (in progress)
- □ Not so easy to use (can't be helped it seems)

#### Generated libraries:

- Make either Monte-Carlo (mcf), deterministic (ndf), or tdf libraries
- ☑ User defined isotope lists so files not humongous

#### **How data varies:**

- ☑ Use data covariance (e.g. from ENDF/B-VII)
- ☑ Use data uncertainties
- ☑ Use user-imposed uncertainties
- ☑ Simple interface for all kinds of variation (esp. for cov.)





### A sample UQ study on the Jezebel critical assembly

- ICSBEP Handbook case # PU-MET-FAST-001 (NEA/NSC/DOC(95)03, ed. B. Biggs (2009))
- Ball of mostly Pu (%'s by atomic fraction):
  - 92% <sup>239</sup>Pu
  - 3% Ga
  - 5% other Pu
- 1D model using AMTRAN deterministic neutron transport.\*





\* Clouse, C. J., Parallel Deterministic Neutron Transport with AMR, in Computational Methods in Transport, edited by Graziani, F.R., Springer-Verlag, Pages 499 - 512 (2006).



### Jezebel has a "hard" neutron flux, peaking around 3 MeV



# What we varied: <sup>239</sup>Pu(n,f) cross section and prompt neutron multiplicity (prompt nubar) in three energy groups



Option:UCRL#

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# We used the (n,f) cross section and its covariance from the ENDF/B-VII.0 nuclear data library







- Matrix taken from ENDF/B-VII.0 evaluation
- Given in two energy ranges:
  - Resonance region (E < 100 keV)</li>
  - High energy (E > 100 keV)
- Matrix was not positive definite:
  - Perform eigenvalue decomp.
  - Remove small & negative eigenspaces
- Significant off-diag. correlations



# The ENDF/B-VII.0 <sup>239</sup>Pu(n,f) evaluation (used in ENDL2009.0) included beautiful fit to prompt nubar





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### We were forced to manufacture our own nubar covariance



- **Uncertainty not given either!** 
  - Assume 10% rel. uncertainty: way too big by factor of 5 •
  - Actual uncertainty undoubtedly much smaller, but not given in any modern data library (this • is despite efforts of several groups of evaluators)
- Manufactured by
  - Assume off-diagonal correlation shape:  $\exp\left(-\frac{|E_1 E_2|}{\Delta E}\right)$ , with  $\Delta E = 1 MeV$



#### How we varied

- Principal Component Analysis (PCA) of covariance matrix is do-able, but not very user friendly
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- Instead, user requests a variation shape, v<sub>i</sub>, then we give them the closest thing in the eigenbasis of the covariance
- Using new variations, perform standard sampling & variation as in PCA





### What we found





#### 985 realizations

Strong sensitivity to cross section apparent, especially in lower 2 energy groups.

Weak sensitivity to multiplicity probably due to gross over estimate of uncertainties

### What we found





Surprisingly, response of k<sub>eff</sub> to variations in nubar (which were far overstated) are negligible and consistent with zero.

Response to k<sub>eff</sub> to variations in cross section are sizeable in first two groups, negligible from 10 MeV onwards (in the last energy group).



### What we found





## Summary of k<sub>eff</sub> for Jezebel



|                              | k <sub>eff</sub>  |
|------------------------------|-------------------|
| Experiment                   | $1.000 \pm 0.002$ |
| Using mean values            | 1.0006609         |
| Sensitivity matrix approach* | 0.9953 ± 0.00024  |
| Monte Carlo approach         | 1.00069 ± 0.0111  |
| 30 Realizations Gaussian fit |                   |

Not a fair comparison: Gila & Leal used ENDF/B-VI library for mean values, took covariance from JENDL-3.3 library. They also varied (n,el) and  $(n,\gamma)$ cross sections. They used the TSUNAMI and SCALE system.

\* From Choong-Sup Gila and L.C. Leal, "A Sensitivity and Uncertainty Analysis of keff Values on Fast and Thermal Benchmarks with the Covariance Data," International Conference on Reactor Physics, Nuclear Power: A Sustainable Resource Casino-Kursaal Conference Center, Interlaken, Switzerland, September 14-19, 2008.



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