USU and Covariance

Georg Schnabel NAPC-Nuclear Data Section, IAEA

Annual CSEWG meeting, 6 November 2024

More than 40 years of GMA

BNL-NCS-51363 VOL. I OF II DOE/NDC 23 NEANDC(US)-209 INDC(USA)-85 UC-80 -(General Reactor Technology - TIC-4500)

PROCEEDINGS OF THE CONFERENCE ON NUCLEAR DATA Evaluation methods and procedures

HELD AT BROOKHAVEN NATIONAL LABORATORY UPTON, NEW YORK 11973 September 22-25, 1980

Conference Chairman: R.J. Howerton Lawrence Livermore National Laboratory Proceedings Editors: B.A. Magurno and S. Pearlstein Brookhaven National Laboratory

March 1981

DATA INTERPRETATION, OBJECTIVE EVALUATION PROCEDURES AND MATHEMATICAL TECHNIQUES FOR THE EVALUATION OF ENERGY-DEPENDENT RATIO, SHAPE AND CROSS SECTION DATA*

W. P. Poenitz

Applied Physics Division Argonne National Laboratory 9700 South Cass Avenue Argonne, Illinois 60439 USA.

ABSTRACT

The evaluation of several energy-dependent cross sections which are of importance for practical applications is considered. The evaluation process is defined as the procedure which is used to derive the best knowledge of these cross sections based on the available direct experimental data information, and, using theoretical models, on the auxiliary data base. The experimental data base represents a multiple overdetermination of the unknown cross sections with various correlations between the measured values. Obtaining the least-squares estimator is considered as the standard mathematical procedure to derive a consistent set of evaluated cross section values. Various approximations made in order to avoid the monstrous system of normal equations are considered and the feasibility of the exact solution is demonstrated. The variance - covariance of the result. its reliability and the improvements obtained in iterative steps are discussed. Finally, the inclusion of auxiliary, supplementary information is considered.

International Evaluation of Neutron Cross-Section Standards





Available online at www.sciencedirect.com
ScienceDirect

Nuclear Data Sheets

Nuclear Data Sheets 148 (2018) 143-188

www.elsevier.com/locate/nds

Evaluation of the Neutron Data Standards

A.D. Carlson,^{1,*} V.G. Pronyaev,² R. Capote,³ G.M. Hale,⁴ Z.-P. Chen,⁵ I. Duran,⁶ F.-J. Hambsch,⁷ S. Kunieda,⁸ W. Mannhart,⁹ B. Marcinkevicius,^{3,10} R.O. Nelson,⁴ D. Neudecker,⁴ G. Noguere,¹¹ M. Paris,⁴ S.P. Simakov,¹² P. Schillebeeckx,⁷ D.L. Smith,¹³ X. Tao,¹⁴ A. Trkov,³ A. Wallner,^{15,16} and W. Wang¹⁴ ¹National Institute of Standards and Technology, 100 Bureau Drive, Stop 8463, Gaithersburg, MD 20899-8463, USA ²PI Atomstandart, State Corporation Rosatom, 117342, Moscow, Russia ³NAPC-Nuclear Data Section, International Atomic Energy Agency, Vienna, Austria ⁴Los Alamos National Laboratory, Los Alamos, NM 87545, USA ⁵Tsinghua University, Beijing, 100084, China ⁶Universidad de Santiago de Compostela, Spain ⁷EC-JRC-Directorate G, Unit G.2, B-2440 Geel, Belgium ⁸ Japan Atomic Energy Agency, Nuclear Data Center, Ibaraki 319-1195, Japan ⁹ Physikalisch-Technische Bundesanstalt, Org. 6.4, 38116 Braunschweig, Germany ¹⁰ Uppsala University, Uppsala, Sweden ¹¹SPRC/LEPh, CEA Cadarache, 13108 Saint Paul Les Durance, France ¹²Karlsruhe Institute of Technology, Hermann-von-Helmholtz-Platz 1 76344 Eggenstein-Leopoldshafen, Germany ¹³Argonne National Laboratory, Argonne, IL 60439, USA ¹⁴China Nuclear Data Center (CNDC). China Institute of Atomic Energy, Beijing, China ¹⁵ Vera Laboratory, Faculty of Physics, University of Vienna, A-1090 Vienna, Austria ¹⁶Dept. of Nuclear Physics, The Australian National University, Canberra ACT 0200, Australia (Received 3 September 2017; revised received 30 October and 12 November 2017; accepted 20 November 2017)

Generalized Least Squares equation



 $\vec{d}_{\rm ref} = f(\vec{\sigma}_{\rm ref})$

Underlying statistical model

$$\vec{d} \sim \mathcal{N}\left(f(\vec{\sigma}_{\text{true}}), \boldsymbol{\Sigma}_{\text{exp}}\right)$$

$$\rho(\vec{d} \,|\, \vec{\sigma}_{\text{true}}) = \frac{1}{\sqrt{(2\pi)^N \det(\boldsymbol{\Sigma}_{\text{exp}})}} \exp\left(-\frac{1}{2}(\vec{d} - f(\vec{\sigma}_{\text{true}}))^T \boldsymbol{\Sigma}_{\text{exp}}^{-1}(\vec{d} - f(\vec{\sigma}_{\text{true}}))\right)$$

How to estimate the "truth"?

$$\vec{d} \sim \mathcal{N}\left(f(\vec{\sigma}_{\text{true}}), \boldsymbol{\Sigma}_{\text{exp}}\right)$$

Maximize this...

$$\rho(\vec{d} \mid \vec{\sigma}_{\text{true}}) = \frac{1}{\sqrt{(2\pi)^N \det(\boldsymbol{\Sigma}_{\text{exp}})}} \exp\left(-\frac{1}{2}(\vec{d} - f(\vec{\sigma}_{\text{true}}))^T \boldsymbol{\Sigma}_{\text{exp}}^{-1}(\vec{d} - f(\vec{\sigma}_{\text{true}}))\right)$$

$$\dots \text{ by adjusting this}$$

Giving GMA a pie (GMA modernization)



E () IAEA-NDS / gmapy			Q + - O II A 🚺	
<> Code 🕑 Issues 1 👬 Pu	Il requests 🕟 Actions 🖽 F	Projects 🛱 Wiki	() Security 🗠 Insights	
gmapy Public	🖍 Edit Pins 👻	⊙ Watch 1 ▼	♥ Fork 1 ▼ Image: A star 6 ▼	
ç9 dev → ç9 🟷	Go to file +	<> Code -	About 錄	
This branch is 379 commits ahead o	f master.	Contribute 👻	gmapy: a Python package for nuclear data evaluation	
gschnabel remove examples/ fr	older from gma 🚥 e61c302 -	3 months ago 🕚	🛱 Readme কা্ <u>র</u> MIT license	
docs	first commit of documentatio	2 years ago	-∿ Activity □ Custom properties	
🖿 gmapy	<pre>Set experimental_use_pfor=Fa</pre>	5 months ago	☆ 6 stars	
legacy-tests	rename gmapi to gmapy	2 years ago	1 watching	
tests	update test to use original Li	5 months ago	😵 1 fork Report repository	
🗋 .gitignore	add .gitignore file to repo	2 years ago		
DOCUMENTATION.md	correct variable name in DOC	2 years ago	Releases	
	add MIT license	2 years ago	Create a new release	
README.md	correct install instruction	2 years ago		
environment.yml	fix spelling error in package n	last year	Packages	
D poetry.lock	update poetry.lock	5 months ago	No packages published Publish your first package	
pyproject.toml	bump version of pytest to 7.2	5 months ago		

Becoming more uncertain

$$\vec{d} \sim \mathcal{N}\left(f(\vec{\sigma}_{\text{true}}), \boldsymbol{\Sigma}_{\text{exp}}\right)$$

Maximize this...

$$\rho(\vec{d} \mid \vec{\sigma}_{\text{true}}) = \frac{1}{\sqrt{(2\pi)^N \det(\boldsymbol{\Sigma}_{\text{exp}})}} \exp\left(-\frac{1}{2}(\vec{d} - f(\vec{\sigma}_{\text{true}}))^T \boldsymbol{\Sigma}_{\text{exp}}^{-1}(\vec{d} - f(\vec{\sigma}_{\text{true}}))\right)$$
... by adjusting this ...

USU-augmented covariance matrix

$$\Sigma'_{\rm exp}(\vec{u}) = \Sigma_{\rm exp} + \Sigma_{\rm USU}(\vec{u})$$

$$\boldsymbol{\Sigma}_{\text{USU}}(\vec{u}) = \text{Diag}(u_1^2, u_2^2, \cdots)$$

USU-augmented covariance matrix



Side note: TensorFlow and computational graph



Beyond optimization

$$ho(ec{\sigma}_{
m true}, \mathbf{\Sigma}_{
m exp}' \,|\, ec{\sigma}_{
m exp}) \propto
ho(ec{\sigma}_{
m exp} \,|\, ec{\sigma}_{
m true}, \mathbf{\Sigma}_{
m exp}') \,
ho(ec{\sigma}_{
m true})
ho(\mathbf{\Sigma}_{
m exp}')$$

Metropolis-Hastings to sample from posterior distribution

Hamiltonian Monte Carlo

- Specific instance of Metropolis-Hastings algorithm
- Augment "phase space" (cross section vectors) with momentum variables
- MH Proposal step: Simulate Hamiltonian dynamics with potential given by logarithmized posterior pdf

$$egin{aligned} rac{\mathrm{d}x_i}{\mathrm{d}t} &= rac{\partial H}{\partial p_i} & ext{and} & rac{\mathrm{d}p_i}{\mathrm{d}t} = -rac{\partial H}{\partial x_i} \ & H(\mathbf{x},\mathbf{p}) = U(\mathbf{x}) + rac{1}{2}\mathbf{p}^\mathrm{T}M^{-1}\mathbf{p} \ & U(\mathbf{x}) = -\ln f(\mathbf{x}) \end{aligned}$$



TensorFlow Probability

GMA database updates (from STD2017 until ENDF/B-VIII.1 submission)

- **2020:** Neudecker et al: Revision of PU9(n,f) cross sections based on uncertainty templates (Nuclear Data Sheets 163)
- **2022**: Neudecker et al: Inclusion of relative U8(n,f) and PU9(n,f) TPC measurements from NIFFTE collaboration in GMA database (LA-UR-21-24093; TRN: US2216234)
- **2023**: Capote et al: Evaluation of experimental spectrum averaged cross sections (SACS) in ²⁵²Cf(sf) neutron field (EPJ WoC 281)

U5(n,f)





USU uncertainty distribution at 1.0 MeV

PU9(n,f)

0008 counts

1000 ·



PU9(n,f) comparison



Evaluated uncertainties (USU vs no-USU)



PU9(n,f) comparison – latest prelim. STD eval



SACS comparison

latest w.recom (1e8ce5e) (git: 1e8ce5e)

#	Reaction	Optim	MCMC
0	U5(n,f) SACS	1.2203	1.2248
1	PU9(n,f) SACS	1.8187	1.8257
2	U8(n,f) SACS	0.3224	0.3247
3	PU9(n,f) / U5(n,f) SACS RATIO	1.4903	1.4907
4	U8(n,f) / U5(n,f) SACS RATIO	0.2642	0.2651

b81 cutoff (ea40e40) (git: ea40e40)

#	Reaction	Optim	MCMC
0	U5(n,f) SACS	1.2216	1.2256
1	PU9(n,f) SACS	1.8043	1.8126
2	U8(n,f) SACS	0.3218	0.3241
3	PU9(n,f) / U5(n,f) SACS RATIO	1.4770	1.4790
4	U8(n,f) / U5(n,f) SACS RATIO	0.2634	0.2644

Summary

- GMA modernized and validated (now gmapy)
- Supports rigorous optimization and MCMC at scale
- Inclusion of SACS ratios possible
- Energy-dependent USU treatment
- Everything open-source and reproducible (once there is sufficient documentation...)

IAEA-NDS/gmapy			다 Notifications 양 Fork 1 ☆ Star
<> Code 📀 Issues 1 🕄 Pull requests	🕑 Actions 🗄 Projects 🙂 Security 🗠 Insights	s	
ি master ▼ টি 10 Branches 🛇 18 Tags	Q Go to file	<> Code •	About
iii gschnabel fix one unittest for MCMC ✓	1afed81 · last year	🕙 1,281 Commits	gmapy: a Python package for nuclear data evaluation
docs	first commit of documentation stub	2 years ago	C Readme
examples	change interface of CompoundMap class	last year	MIT license
g mapy	improve MH algo stuff: relativ errors, seeding and par	last year	 Custom properties
legacy-tests	rename gmapi to gmapy	2 years ago	☆ 6 stars
tests	fix one unittest for MCMC	last year	● 1 watching ♀ 1 fork
🗋 .gitignore	add .gitignore file to repo	2 years ago	Report repository

Liso_rel_low_unc) switch Lisowski (1028) to shape (eval_liso_abs_low_unc) strongly reduce uncertainty of lisowski (1028) (eval_liso_abs) switch Lisowski (U5, 1028) to absolute 6dfb0 (eval_only_le_50_mev) only include prior & data smaller/equal 50 MeV * bd98c9a (eval_only_le_39_mev) only include prior & data smaller/equal 39 MeV * 4199563 (eval_only_ge_20_mev) only use prior and experiments >= 20 MeV * 6653c69 (eval_only_le_35_mev) only use prior and experiments <= 35 MeV * afd2267 (eval_only_29_30_mev) only include points between (and including) 29 and 30 MeV * 8a600bd (eval_abs_nousu_drop1012) regard uncs constituing likelihood as absolute * 5a3a340 (eval_rel_nousu_drop1012, eval_abs_liso_lowunc) remove USU treatment completely * 04cc6d2 (eval_drop_1012) remove Scherbakov PU9/U5(n,f) data (1012) * 4174ee3 (eval_no_tpc_below_20mev) remove NIFFTE TPC (6001) below 20 MeV * cfc7e61 (eval_no_tpc_above_20mev) remove NIFFTE TPC data (6001) above 20 MeV * 7eb0fac (eval_no_tpc_below_7mev) remove NIFFTE TPC (6001) below 7 MeV * fc8634c (eval_no_tpc_above_7mev) remove NIFFTE TPC (6001) above 7 MeV * 01a02a0 (eval_8007_removed) eval_8007_removed * f42e55d (eval_1013_to_shape) make Scherbakov (1013) shape le8ce5e (eval recommend) remove USU component from NIFFTE TPC PU9/U5 fission measurement (6001) a7746 remove Maslov's patch * b3876f1 (eval_decreased_tpc_weight) decrease NIFFTE TPC PU9/U5 weight * 4944a70 (eval_increased_tpc_weight) increase NIFFTE TPC PU9/U5 weight * 89dc6bf (eval_drop_tpc) remove dataset 6001 - NIFFTE TPC Pu9(n,f)/U5(n,f) * Of2311f (eval_recommend_no_shape_usu) removed USU on shape data 649a9e8 (tag: eval_recommend_baseline) implement recommendations e40 (main) add STD2017 evaluation add evaluation scripts) add current database and explaining README.md d1f2a8 add STD2017 data add gmapy submodule

https://github.com/iaea-nds/neutron-standards-evaluation

https://github.com/iaea-nds/gmapy



Thank you