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Optimisation of the shell-model Hamiltonian for heavy nuclei

and the underlying uncertainty

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Outline

- Introduction (to the black box)
- The shell model effective interaction (the parameters)
- Optimization of the effective Hamiltonian (parameter estimation)
- Problems
- Summary

there are known knowns...

there are known unknowns...

But there are also unknown unknowns – the ones we don't know we don't know Donald Rumsfeld, 2002

What is the difference between model calibration and parameter estimation? (http:// ² bayesint.github.io/)





Motivation microscopic shell-model description of (super)heavy nuclei



Computational challenge







Computational challenge







Computational challenge



Two new computers became available from 2016



PDC's supercomputer Beskow



- $\begin{array}{c} 126 \\ p_{1/2} \\ f_{5/2} \\ i_{13/2} \\ p_{3/2} \\ h_{9/2} \\ f_{7/2} \\ 82 \\ d_{3/2} \\ h_{11/2} \\ s_{1/2} \\ g_{7/2} \end{array}$
- Most shell-model codes are in M-scheme: Simple algorithm; avoid the complicated angular momentum coupling
- N~Z Systems are relatively easier to solve by applying the so-called factorization technique (as in ANTOINE)
- System with identical particles can be more difficult to treat.
 Possible factorization under⁷ development.



Shell model as a local theory

We are still not able to build a universal Hamiltonian;

Even if we can, we will not be able to solve it.





"Bare" Nucleon-Nucleon Potentials:

Argonne V18: PRC 56, 1720 (1997)
CD-Bonn 2000: PRC 63, 024001 (2000)
N³LO: PRC 68, 041001 (2003)
INOY: PRC 69, 054001 (2004)....

Perturbation treatment





and many others. Usually we stop at the second on third order

Can do:

Reproduce NN scattering data with a high precision (~40 parameters)
 Benchmark calculations for very light nuclei

Cannot do:

>Nuclear saturation (wrong by ~1MeV/A)

Shell structure (N=14, 28...)

>May be due to the missing three-body force

Quest of the effective interaction



◆ Empirical effective interaction

◆USD, B. A. Brown and W. A. Richter, Phys. Rev. C 74, 034315 (2006).
◆fp (KB3, gxpf), 1990s
◆fpg, M. Honma et al., Phys. Rev. C 80, 064323 (2009)

♦gdsh, CQ, Z. Xu, Phys. Rev. C 86, 044323 (2012)

*Cross-shell fpg+gdsh to understand the effect of the N=50 shell

T. Bäck, CQ et al.PRC 87, 031306 (2013).

One has to consider:

- The core polarization effects induced by the assumed inert core
- Optimization of the monopole interaction due to the neglect of three-body and other effects





Monopole Hamiltonian

Determines average energy of eigenstates in a given configuration.

• Important for binding energies, shell gaps

$$H_{m} = \sum_{a} \varepsilon_{a} n_{a} + \sum_{a \le b} \frac{1}{1 + \delta_{ab}} \left[\frac{3V_{ab}^{1} + V_{ab}^{0}}{4} n_{a} (n_{a} - \delta_{ab}) + (V_{ab}^{1} - V_{ab}^{0})(T_{a} \cdot T_{b} - \frac{3}{4} n_{a} \delta_{ab}) \right]$$

 n_a , T_a ... number, isospin operators of orbit a

- Monopole centroids
- Angular-momentum averaged effects of two-body interaction
- The monopole interaction itself does not induce mixing between different configurations.
- Strong mixture of the wave function is mainly induced by the residual J=0 pairing and QQ np interaction

$$V_{ab}^{T} = \frac{\sum_{J} (2J+1) V_{abab}^{JT}}{\sum_{J} (2J+1)}$$

The monopole terms represent only a very small part of the total 'parameter' space.



1D to 2D shell structure Shell evolution at drip lines



O. Sorlin, M.-G. Porquet, Prog. Part. Nucl. Phys. 61, 602 (2008). Z. Xu, CQ, Phys. Lett. B (2013)



Large uncertainties Shell model predictions for the 2+ energies,

which are one of the key quantities for determining the shell gap



Mass Number A

"Just because it's correct, doesn't mean it's right"



Model predictions diverges when extrapolated to unknown regions: Other examples





FIG. 2. (Color online) Differences (in MeV) between DZ10 mass model calculations with the parameter set II from Table I and the macroscopic-microscopic liquid drop model calculation of Ref. [20] (upper), the finite-range droplet model [26] (middle) and the HFB-21 model [32] (bottom).



Two neutrino and neutrinoless double beta decay

Experiment	Isotope	Mass	Technique	Present Status	Location	o ⁻
AMoRE ^{89,90}	¹⁰⁰ Mo	50 kg	CaMoO ₄ scint. bolometer crystals	Development	Yangyang	e "v
CANDLES ⁹¹	^{48}Ca	0.35 kg	CaF ₂ scint. crystals	Prototype	Kamioka	K e
CARVEL ⁹²	^{48}Ca	1 ton	CaF ₂ scint. crystals	Development	Solotvina	
COBRA ⁹³	¹¹⁶ Cd	183 kg	enrCd CZT semicond. det.	Prototype	Gran Sasso	
CUORE-0 ⁶⁹	¹³⁰ Te	11 kg	TeO ₂ bolometers	Construction - 2012	Gran Sasso	
CUORE ⁶⁹	¹³⁰ Te	203 kg	TeO ₂ bolometers	Construction - 2013	Gran Sasso	A CONTRACTOR
DCBA ⁹⁴	¹⁵⁰ Ne	20 kg	^{enr} Nd foils and tracking	Development	Kamioka	
EXO-200 ⁵⁷	¹³⁶ Xe	160 kg	Liq. enrXe TPC/scint.	Operating - 2011	WIPP	e
EXO^{70}	¹³⁶ Xe	1-10 t	Liq. enrXe TPC/scint.	Proposal	SURF	¥ ~ ~
GERDA ⁷¹	76 Ge	$\approx 35 \text{ kg}$	^{enr} Ge semicond. det.	Operating - 2011	Gran Sasso	<u>.</u>
GSO^{95}	¹⁶⁰ Gd	2 ton	Gd ₂ SiO ₅ :Ce crys. scint. in liq. scint.	Development		V
KamLAND-Zen ⁹⁶	¹³⁶ Xe	400 kg	enrXe disolved in liq. scint.	Operating - 2011	Kamioka	е
LUCIFER ^{97,98}	⁸² Se	18 kg	ZnSe scint. bolometer crystals	Development	Gran Sasso	
Majorana ^{77,78,79}	⁷⁶ Ge	26 kg	^{enr} Ge semicond. det.	Construction - 2013	SURF	
MOON 99	¹⁰⁰ Mo	1 t	enr Mofoils/scint.	Development		
SuperNEMO-Dem ⁸⁷	⁸² Se	7 kg	enr Se foils/tracking	Construction - 2014	Fréjus	
SuperNEMO ⁸⁷	⁸² Se	100 kg	^{enr} Se foils/tracking	Proposal - 2019	Fréjus	
NEXT ^{82,83}	¹³⁶ Xe	100 kg	gas TPC	Development - 2014	Canfranc	*
$SNO+^{84,85}$	150 Nd	55 kg	Nd loaded liq. scint.	Construction - 2013	SNOLab	

$[T^{0\nu}_{1/2}]^{-1} = G^{0\nu} \ |M^{0\nu}|^2 \ |\langle m_\nu\rangle|^2/m_e^2$



The nightmare of matrix elements



Uncertainties



"Remember that all models are wrong; the practical question is how wrong do they have to be to not be useful" Box G E P and Draper N R 1987 Empirical Model Building and Response Surfaces (New York: Wiley)

"The difference between the right word and the almost right word is the difference between lightning and a lightning bug" Mark Twain

http://www.riksbank.se/sv/Penningpolitik/Prognoser-ochrantebeslut/Aktue<mark>ll-prognos-for-reporanta-inflation-och-BNP/</mark>



Optimization of the effective interaction



Optimization of the effective interaction

The experimental (negative) binding energy of a given state i is given by

$$E_i^{\exp} = BE_{gs}^{\exp}(N) + Ex(i), \qquad (2)$$

where BE and Ex denote the binding energy of the nucleus (with N valence nucleons) and the corresponding excitation energy of the state relative to the ground state,

$$\begin{split} E_i^{\text{cal}} = & \left\{ \begin{matrix} C + N\varepsilon_0 + \frac{N(N-1)}{2} V_m \end{matrix} \right\} + \langle \Psi_I | H | \Psi_I \rangle, \\ & \mathsf{CORE}, \mathsf{eg}, ^{100}\mathsf{Sn} \end{split}$$

$$E^{\text{SM}} = \langle \Psi_{I} | H | \Psi_{I} \rangle$$

$$= \sum_{\alpha} \varepsilon_{\alpha} < \hat{N}_{\alpha} > + \sum_{\alpha \leq \beta} V_{m;\alpha\beta} \left\langle \frac{\hat{N}_{\alpha} (\hat{N}_{\beta} - \delta_{\alpha\beta})}{1 + \delta_{\alpha\beta}} \right\rangle$$

$$+ \langle \Psi_{I} | H_{M} | \Psi_{I} \rangle, \qquad (4)$$
where $\sum_{\alpha} < \hat{N}_{\alpha} > = N$ and $\qquad \text{interaction}$

$$\sum_{\alpha \leq \beta} \left\langle \frac{\hat{N}_{\alpha} (\hat{N}_{\beta} - \delta_{\alpha\beta})}{1 + \delta_{\alpha\beta}} \right\rangle = \frac{N(N-1)}{2}. \qquad (5)$$



least mean square criterion

We optimize the single-particle energies and monopole terms of the realistic effective interaction by minimizing the quantity

$$\chi^{2} = \sum_{i}^{D} \left[E_{i}^{\text{cal}} - E_{i}^{\text{exp}} \right]^{2}, \qquad (6)$$

$$E_i^{\text{Cal.}} = \sum_k^P V_k x_k + \varepsilon_{1d_{5/2}} \langle N_{1d_{5/2}} \rangle + \langle H_M \rangle,$$

Linear approximation

 $\langle \Psi_I(n) | \Psi_I'(n) \rangle \sim 1$. One has

$$E_i^{\text{Cal.}}(n)' - E_i^{\text{Cal.}}(n) \approx \sum_k^P [V_k'(n) - V_k(n)] x_k,$$

That is, I assume the wave function does not change between two iterations

Monte Carlo/Simulated annealing Optimization

To find the optimal solution of an algorithmically hard problem.

Need to move in wrong directions sometimes to escape local minima (traps).

Algorithm:

- Choose a $\delta > 0$.
- Start at \vec{x}_i . Propose a Move to $\vec{x}_t \ni 0 < |\vec{x}_t \vec{x}_i| < \delta$. •
- If $f(\vec{x}_t) \le f(\vec{x}_i)$, let $\vec{x}_{i+1} = \vec{x}_t$. If $f(\vec{x}_t) > f(\vec{x}_i)$, let $\vec{x}_{i+1} = \vec{x}_t$ with probability $g(f(\vec{x}_t) f(\vec{x}_i))$, Where g is a decreasing function.











FIG. 2. (Color online) The convergence of the mean-square deviations χ^2 as a function of iteration number within the singular value decomposition (SVD) and Monte Carlo global optimization (MC) approaches starting from a random monopole Hamiltonian.





FIG. 3. (Color Online) The convergence of the mean-square deviations χ^2 as a function of iteration number for fittings that are started from the realistic CD-Bonn interaction. The insert shows the maximal deviation $r=\max|E_i^{\rm cal}-E_i^{\rm exp}|$ in each step.



FIG. 4. (Color Online) Differences between experimental and calculated binding energies, $E_i^{exp} - E_i^{cal}$, as a function of valence neutron number.

The binding energies of 157 states in tin isotopes can be reproduced within an average deviation ~130 keV.

Controllable calculations with error bars

Understanding the uncertainties and limitations of the theory. Otherwise large-scale calculations can be very misleading.

TABLE II. The final mean square deviation χ^2 (in MeV²) given by the SVD and MC fittings and the predicted values of the variables C, ε_0 and V_m and their uncertainties (in MeV).

	χ^2	С	ε_0	V_m
MC	2.697	-825.5 ± 0.288	-10.666 ± 0.0410	0.167 ± 0.00249
SVD	2.686	-825.5 ± 0.288	-10.669 ± 0.0410	0.172 ± 0.00249

data new: -824.9+-0.5606 data old: -824.8+-0.7054

The largest uncertainties of the optimized monopole Hamiltonian are related to the single-particle energies. The values predicted by the MC approach are $\underline{\varepsilon_{1d_{3/2}}} = 5.013 \pm 3.10$, $\underline{\varepsilon_{2s_{1/2}}} = 0.369 \pm 2.63$ and $\underline{\varepsilon_{0h_{11/2}}} = 3.249 \pm 0.83$ MeV. The single-particle energies given by the SVD



How to choose the criterion?

The object of the minimax fit is to find the minimum of the Chebyshev norm as

$$\varepsilon = \arg\min_{\mathbf{x}} \max_{A} |\mathrm{BE}^{\mathrm{Expt.}}(A) - \mathrm{BE}^{\mathrm{Calc.}}(A, \mathbf{x})|, \qquad (10)$$

where \mathbf{x} denote the coefficients to be determined. arg min (arg max) stand for the argument of the minimum (maximum) for which the value of the given expression attains its minimum (maximum) value within a given set of values for argument \mathbf{x} .

-		_		
	Term	Ι	IV	
	Coulomb	0.705 ± 0.001	0.710	 if the fitting has N adjustable
	Symmetry Surface comments	149.033 ± 0.408	204 424	n the fitting had it adjustable
	Surface symmetry	202.042 ± 1.848	204.424	narameters there will be $N + 1$
	Pairing	5.167 ± 0.138	5.143	μ arameters, there will be $N \rightarrow 1$
Δ	$\mathcal{M} + \mathcal{T}$	18.552 ± 0.037	18.834	anitical manages and all a shate ant
	$(\mathcal{M}+\mathcal{T})/ ho$	15.120 ± 0.125	15.626	critical members of the data set
mass	FS	1.069 ± 0.040	1.186	
mass	fs-	4.414 ± 0.259	5.416	that have a residual equal to ε .
model	fc+	-10.353 ± 0.753	-10.074	
mouci	PM+	-0.498 ± 0.011	-0.552	These N + 1 critical cases are the
	PS+	-0.082 ± 0.008	-0.077	
	S3	0.515 ± 0.015	0.413	ones being used in determining
	\$3	2.381 ± 0.069	2.001	oneo boing abea in acternining
	SO-	0.393 ± 0.022	0 441	the narameters
	50	1.581 ± 0.120	1 841	life parameters.
		7.301 ± 0.120	5 060	ultimate criterion for a perfect
		7.204 ± 0.109	3.909	
	DO	-21.535 ± 0.099	-20.403	
	dO	-89.904 ± 3.220	-115.392	
	SS	0.431 ± 0.050	0.064	
	χ (Ι)	0.425	0.712	
				RIVIS deviation



Differential evolution

- DE optimizes a problem by maintaining a population of candidate solutions (N) and creating new candidate solutions, and then keeping whichever candidate solution has the best fitness.
- The optimization problem is again treated as a black box.
- Easy to parallelize



FIG. 2. Convergence of the root-mean-square deviation between the shell-model mass formula and experimental binding energies as a function of the iteration. The dotted line corresponds to calculation within a smaller uncertainty range.

http://www1.icsi.berkeley.edu/~storn/code.html https://en.wikipedia.org/wiki/Differential_evolution







- We have six 0+ states for 206Pb within the model space
- 3- state in 206Pb is understood to be a core excited collective state.
- 194Pb is the lighest system we solved in the full model space

Energy (MeV)



The excited 0⁺ states



To how much extent those spherical components contribute to the observed excited 0+ states?



Physics beyond the model



A. N. Andreyev et al., Nature 405, 430 (2000).

- Shell-model calculations of Pb may provide A Better description of the (spherical) low-lying levels which may be beyond the scope of symmetry truncated models like IBM
- Critical test of the effective interaction
- Benchmarks for approximation/truncation methods
- Further constraint on the role of (coexisting) deformed shapes





Binding energy and odd-even staggering in Sn and Pb isotopes



FIG. 9. (Color online) Neutron pairing gaps in Sn isotopes extracted from the experimental and calculated binding energies.

FIG. 9. (color online) Left: Experimental [80] and calculated shell-model correlation energies as a function of neutron number; Right: The empirical pairing gaps as extracted according to Eq. (5).

$$E_i^{ ext{cal}} = C + N \varepsilon_0 + rac{N(N-1)}{2} V_m + \langle \Psi_I | H | \Psi_I
angle,$$

Experience can lead to wrong

PHYSICAL REVIEW C 72, 061305(R) (2005)

¹⁰⁸Sn studied with intermediate-energy Coulomb excitation

A. Banu,^{1,2,*} J. Gerl,¹ C. Fahlander,³ M. Górska,¹ H. Grawe,¹ T. R. Saito,¹ H.-J. Wollersheim,¹ E. Caurier,⁴ T. Engeland,⁵ A. Gniady,⁴ M. Hjorth-Jensen,⁵ F. Nowacki,⁴ T. Beck,¹ F. Becker,¹ P. Bednarczyk,^{1,6} M. A. Bentley,⁷ A. Bürger,⁸ F. Cristancho,^{3,†} G. de Angelis,⁹ Zs. Dombrádi,¹⁰ P. Doornenbal,^{1,11} H. Geissel,¹ J. Grębosz,^{1,6} G. Hammond,^{12,‡}
M. Hellström,^{1,5} J. Jolie,¹¹ I. Kojouharov,¹ N. Kurz,¹ R. Lozeva,^{1,II} S. Mandal,^{1,4} N. Märginean,⁹ S. Muralithar,^{1,**} J. Nyberg,¹³ J. Pochodzalla,² W. Prokopowicz,^{1,6} P. Reiter,¹¹ D. Rudolph,³ C. Rusu,⁹ N. Saito,¹ H. Schaffner,¹ D. Sohler,¹⁰ H. Weick,¹

E2 decay properties in Sn isotopes" and M. Winkler





Systematical error underfitting



Now we know this particular model is inadequate.



How to identify the limitations of a model in general?



Alpha formation probability from experiments

$$\log |RF(R)|^{-2} = \log T_{1/2}^{\text{Expt.}} - \log \left[\frac{\ln 2}{\nu} |H_0^+(\chi, \rho)|^2 \right],$$

R should be large enough that the nuclear interaction is negligible, i.e., at the nuclear surface.



CQ et al, Phys.Rev.C80,044326 (2009); 81,064319 (2010).PLB B 734, 203-206 (2014)



What happens if the model is/was overcomplete?

It ain't what you don't know that gets you into trouble. It's what you know for sure that just ain't so. Mark Twain

Shell structure at the drip lines



- Mean field near stability
- Strong spin-orbit term
- Mean field for N >> Z?
- Reduced spin-orbit
- Diffuse density
- Tensor force



FIG. 1. (Color online) The evolution of the shell structure as a function of (N - Z)/A with the HO potential plus SO coupling of the form $\lambda(1 + \kappa_{SO} \frac{N-Z}{A})\hbar\omega \mathbf{l} \cdot \mathbf{s}$. We take $\lambda = 0.2$ and $\kappa_{SO} = -1$ (left) and 1 (right). The $0g_{9/2}$ orbital is shifted upwards by $0.3\hbar\omega$ for a clearer presentation.

► N=8, 20 shells disappear in neutron-rich nuclei ►N=14,16, 32 emerge as new magic numbers Role played by tensor force and three body force A comprehensive review can be found in: O. Sorlin, M.-G. Porquet, Prog. Part. Nucl. Phys. 61, 602 (2008).³⁴



Mean-field for dripline nuclei

> Orbitals with higher *l* loses its energy faster when going towards the dripline I. Hamamoto, Phys. Rev. C 85, 064329 (2012).

This naturally explains the disappearing of N=14 subshell in C and N isotopes [It is due to a complicated interplay between NN and NP interactions from a shell-model point of view, C.X. Yuan, C. Qi, F.R. Xu, Nucl. Phys. A 883, 25 (2012).].

Choice of the Central and SO potential

$$V = V_0(1 + rac{4\kappa}{A}\mathbf{t}\cdot\mathbf{T}_d),$$

and

The standard WS potential

$$V_{SO} = \lambda V_0 (1 + rac{4\kappa_{SO}}{A} \mathbf{t} \cdot \mathbf{T}_d),$$

A. Bohr and B.R. Mottelson, Nuclear Structure (Benjamin, New York, 1969), Vol. I.

$$\kappa = \kappa_{SO} = -\frac{33}{51},$$



The binding energies for known nuclei are not sensitive to the sign of Kso



 $\kappa_{SO} = -\kappa,$



The model fails to predict new shell closures





Why not a opposite value?



$$\kappa_{SO} = -\kappa,$$

We assume

>Orbitals with higher *l* loses its energy faster;

>The SO coupling is 'relatively' enhanced at the neutron drip line

TABLE I. Woods-Saxon potential parameters obtained by fitting to single-particle and single-hole states around doubly-magic nuclei with the restriction $\kappa_{SO} = -\kappa$ and comparison with some existing parameters.

	V_0 (MeV)	$r_0 ~({\rm fm})$	r_{SO} (fm)	a, a_{SO} (fm)	λ	κ	
	50.92	1.285	1.146	0.691	24.07	0.644	$\kappa_{SO} = -\kappa$
Refs. [5, 12	2] 51	1.27	1.27	0.67	32.13	0.647	$\kappa_{SO} = \kappa$
Ref. [14]	49.6	1.347(n)/1.275(p)	1.31(n)/1.32(p)	0.7	35(n)/36(p)	0.86	$\kappa_{SO} = \kappa$
Ref. [15]	52.06	1.260	1.16	0.662	24.1	0.639	$\kappa_{SO} = 0$

[5]A. Bohr and B.R. Mottelson, Nuclear Structure (Benjamin, New York, 1969), Vol. I.

[12]J. Blomqvist and S. Wahlborn, Ark. Fys. 16 543 (1960).

[14] J. Dudek, Z. Szymanski, T. Werner, A. Faessler and C. Lima, Phys. Rev. C26 1712 (1982).

[15] N. Schwierz, I. Wiedenho ver, and A. Volya, arXiv:0709.3523 (2007).

Such a simple picture can explain all known data Simple rules of shell evolution

≻HO magic numbers like N=8, 20 disappear;

New SO magic numbers like N = 6, 14, 16, 32 and 34 will appear;

The traditional SO magic numbers N = 28 and 50 and the magic number N = 14 will be eroded somehow but are more robust than the HO magic numbers;

>Pseudospin symmetry breaks, resulting in new shell closures like N = 56 and 90;

>HO shell closures like N = 40 and 70 will not emerge.

Z. Xu, C. Qi, Phys. Lett. B 724, 247 (2013)



Single-particle structure of Ca isotopes

HO shell closures like N = 40 and 70 will not emerge.



Binding energies of Ca isotopes

WS + constant pairing



FIG. 6. (Color online) Experimental [34, 37] and calculated ground-state energies of Ca isotopes, relative to that of 40 Ca, as a function of mass number A.



Calculations with three-body interaction

J.D. Holt, T. Otsuka, A. Schwenk, and T. Suzuki, J. Phys. G 39, 085111 (2012). G. Hagen, M. Hjorth-Jensen, G.R. Jansen, R. Machleidt, T. Papenbrock, Phys.Rev.Lett. 109, 032502 (2012).



Unknown unknown? Overfitting?

With four parameters I can fit an elephant, and with five I can make him wiggle his trunk.

--John von Neumann





How to identify parameters that can not be controlled by available data?

Mass model: 33 terms vs 19 terms

Term	Ι		
Coulomb	0.702 ± 0.002	Term	Ι
Symmetry	149.744 ± 0.721	Grandrauch	0.705 . 0.001
Surface symmetry	209.351 ± 2.731	Coulomb	0.705 ± 0.001
Pairing (I)	6.195 ± 0.162	Symmetry	149.033 ± 0.468
Pairing (II)	9.741 ± 3.594	Surface symmetry	202.642 ± 1.848
$\mathcal{M} + \mathcal{T}$	18.382 ± 0.183	Doiring	5167 ± 0120
$(\mathcal{M} + \mathcal{T})/\rho$	14.965 ± 0.911	Pairing	5.107 ± 0.150
FS+	5.160 ± 0.456	$\mathcal{M} + \mathcal{T}$	18.552 ± 0.037
fs+	23.679 ± 2.429	$(\mathcal{M} + \mathcal{T})/ ho$	15.120 ± 0.125
FS-	1.692 ± 0.152	FS	1.060 ± 0.040
fs-	7.708 ± 0.726	15	1.009 ± 0.040
FC+	-4.900 ± 1.518	fs–	4.414 ± 0.259
tc+	-41.955 ± 4.159	fc+	-10.353 ± 0.753
PM+	-0.453 ± 0.081	PM+	-0.498 ± 0.011
pm+	-0.116 ± 0.400	DC	0.092 ± 0.002
P3+	-0.842 ± 0.084 -4.264 ± 0.469	F3+	-0.082 ± 0.008
PS-	-4.204 ± 0.409 -0.106 ± 0.025	\$3	0.515 ± 0.015
ns-	-0.100 ± 0.023 -0.562 ± 0.121	s3	2.381 ± 0.069
S3	0.427 ± 0.024	SO-	0.393 ± 0.022
s3	1.964 ± 0.115	sq_	1.581 ± 0.120
SQ-	0.334 ± 0.040		7.001 ± 0.120
sq-	1.320 ± 0.221	d3+QQ+	7.204 ± 0.169
D3	-0.081 ± 2.514	D0	-21.533 ± 0.699
d3	8.205 ± 14.560	dO	-89.904 ± 3.220
QQ+	6.150 ± 6.190	88	0.431 ± 0.050
qq+	5.322 ± 33.201	55	0.431 ± 0.030
D0	-33.197 ± 2.131	$\chi(1)$	0.425
d0	-158.619 ± 10.380		
QQ-	-2.777 ± 6.405		
qq–	-24.519 ± 34.650		
SS	1.152 ± 0.215		
SS	3.728 ± 0.919		
χ(I)	0.356		



FIG. 2. (Color online) Differences (in MeV) between DZ10 mass model calculations with the parameter set II from Table I and the macroscopic-microscopic liquid drop model calculation of Ref. [20] (upper), the finite-range droplet model [26] (middle) and the HFB-21 model [32] (bottom).



The uncertainty propagation The statistical error is usually small



where BE denotes the binding energy, x_i is the parameter and N denotes the total number of parameters. Cov (x_i, x_j) is the covariance matrix

CQ, J. Phys. G 42 (4), 045104 (2015)

How do we propagate theoretical uncertainties? http://bayesint.github.io/index.html



Mini-Minimax Uncertainty Quantification for Emulators

Jeffrey C. Regier[†] and Philip B. Stark[†]

Abstract. Consider approximating a "black box" function f by an emulator \hat{f} based on n noiseless observations of f. Let w be a point in the domain of f. How big might the error $|\hat{f}(w) - f(w)|$ be? If f could be arbitrarily rough, this error could be arbitrarily large: we need some constraint on f besides the data. Suppose f is Lipschitz with known constant. We find a lower bound on the number of observations required to ensure that for the best emulator \overline{f} based on the n data, $|f(w) - f(w)| \leq \epsilon$. But in general, we will not know whether f is Lipschitz, much less know its Lipschitz constant. Assume optimistically that f is Lipschitz-continuous with the smallest constant consistent with the n data. We find the maximum (over such regular f) of $|\hat{f}(w) - f(w)|$ for the best possible emulator \hat{f} ; we call this the "mini-minimax uncertainty" at w. In reality, f might not be Lipschitz or—if it is—it might not attain its Lipschitz constant on the data. Hence, the mini-minimax uncertainty at w could be much smaller than $|\hat{f}(w) - f(w)|$. But if the mini-minimax uncertainty is large, then even if f satisfies the optimistic regularity assumption $-|\hat{f}(w) - f(w)|$ could be large, no matter how cleverly we choose \hat{f} . For the Community Atmosphere Model, the maximum (over w) of the mini-minimax uncertainty based on a set of 1154 observations of f is no smaller than it would be for a single observation of f at the centroid of the 21-dimensional parameter space. We also find lower confidence bounds for quantiles of the mini-minimax uncertainty and its mean over the domain of f. For the Community Atmosphere Model, these lower confidence bounds are an appreciable fraction of the maximum. To know that the emulator estimates f accurately would require evidence that fis typically more regular than it is across the *n* sample values.



We take liquid drop model as an example to test the extrapolation property of a constraint model



Portion of the samples taken for fitting



Model truncation





- The idea behind is that the Hamiltonian is dominated by the diagonal monopole channel. The monopole interaction can change significantly the (effective) mean field and drive the evolution of the shell structure.
- Easy to implement and keeps the simplicity of the M-scheme algorithm
- Possibility to include certain intruder configurations



 $H = H_m + H_M$

$$E^{\rm SM} = \langle \Psi_I | H | \Psi_I \rangle$$

$$= \sum_{\alpha} \varepsilon_{\alpha} < \hat{N}_{\alpha} > + \sum_{\alpha \leq \beta} V_{m;\alpha\beta} \left\langle \frac{\hat{N}_{\alpha} (\hat{N}_{\beta} - \delta_{\alpha\beta})}{1 + \delta_{\alpha\beta}} \right\rangle$$

$$+ \langle \Psi_I | H_M | \Psi_I \rangle, \qquad (4)$$

'Monopole' truncation

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- Easy to implement and k
- Possibility to include cert





When does the calculation converge? How to quantify the uncertainty at a given truncation?



CQ, LY Jia, GJ Fu, to appear in PRC



 Introduction to the nuclear shell model/full configuration interaction approach

Properties of the effective interaction
Applications in Sn, Pb and neighboring isotopes
(Empirical) shell model can be a reliable tool for simulating

- the spectroscopy of intermediate mass and heavy nuclei
- How to quantify the uncertainty related to the effective interaction and model space truncation
- How many terms do I need? Whether *f* is adequate?

$$y = f(A_i, x_i) + e$$

How should one do basic regression analysis? (http:// bayesint.github.io/index.html)

Thank you



Fitting criterion

- Least-square is based on the assumption that the likelihood is characterized by Gaussian distribution;
- Systematic deviations may not following Gaussian.

Mini-max

 $\varepsilon = \arg\min_{\mathbf{x}} \max_{A} |\mathrm{BE}^{\mathrm{Expt.}}(A) - \mathrm{BE}^{\mathrm{Calc.}}(A, \mathbf{x})|,$

Does this criterion make sense? What are the risks behind?

Maximum likelihood (by assuming student's t distribution) coincide with Bayesian estimator for uniform prior distribution

