

Regularisation Methods to Stabilise Nuclear Inverse Problem via Physics-Based Improvements

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Shapes and Symmetries in Nuclei: from Experiment to Theory
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The Method Employed:

Inverse Problem Theory

[A Branch of Applied Mathematics]

Inverse Problem in Quantum Theories

- Given parameters $\{p\}$ \rightarrow Schrödinger equation produces 'data':

$$\hat{H}(p) \rightarrow \{E_p, \psi(p)\} \leftrightarrow \hat{O}_H(p) = d^{th} \leftarrow \text{Direct Problem}$$

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- In physics this issue remains unsolved: Instead of finding optimal parameters by solving the Inverse Problem $\rightarrow \rightarrow$ “one minimises χ^2 ”

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$$\chi^2(p) = \sum_{j=1}^{n_d} [e_j^{exp} - e_j^{th}(p)]^2 \rightarrow \frac{\partial \chi^2}{\partial p_k} = 0, \quad k = 1 \dots n_m$$

with n_d - number of data points; n_m - number of model parameters

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- Usually we iterate this non-linear problem using Taylor linearisation

$$e_j^{th}(p^{[it+1]}) \approx e_j^{th}(p^{[it]}) + \sum_{k=1}^{n_m} \left(\frac{\partial e_j^{th}}{\partial p_k} \right) \Bigg|_{p=p^{[it]}} (p_k^{[it+1]} - p_k^{[it]})$$

Short-hand notation: $J_{jk}^{[it]} \stackrel{df}{=} \left(\frac{\partial e_j^{th}}{\partial p_k} \right) \Bigg|_{p=p^{[it]}}$ and $b_j^{[it]} = [e_j^{exp} - e_j^{th}(p^{[it]})]$

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- Inserting into $\chi^2(p)$ gives the linearised iterative representation

$$\chi^2(p^{[it+1]}) = \sum_{j=1}^{n_d} \left[\sum_{k=1}^{n_m} J_{jk}^{[it]} \cdot (p_k^{[it+1]} - p_k^{[it]}) - b_j^{[it]} \right]^2$$

Inverse Problem in Algebraic [Matrix] Representation

- One may easily show that within the new, linearised representation

$$\frac{\partial \chi^2}{\partial p_i} = \mathbf{0} \quad \rightarrow \quad (J^T J) \cdot p = J^T b \quad \leftrightarrow \quad J^T J \stackrel{df}{=} \mathcal{A}$$

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$$\{p\} \rightarrow \mathcal{P} : \text{'Causes'} \text{ and } \{J^T b\} \rightarrow \mathcal{D} : \text{'Effects'} \Rightarrow \mathcal{A} \cdot \mathcal{P} = \mathcal{D}$$

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- From the measured 'Effects', called Data, represented by \mathcal{D} , we extract information about the optimal parameters, \mathcal{P} , by inverting the matrix \mathcal{A} :

$$\underbrace{\mathcal{A} \cdot \mathcal{P} = \mathcal{D}}_{\text{Direct Problem}} \rightarrow \underbrace{\mathcal{P} = \mathcal{A}^{-1} \cdot \mathcal{D}}_{\text{Inverse Problem}}$$

Possibly Losing Correlation Between Data and Parameters

- We consider linear equations: $\mathcal{P} = \mathcal{A}^{-1} \cdot \mathcal{D}$

$$\begin{bmatrix} \mathcal{P}_1 \\ \mathcal{P}_2 \\ \dots \\ \mathcal{P}_m \end{bmatrix} = \underbrace{\begin{bmatrix} \mathcal{A}_{11} & \mathcal{A}_{12} & \dots & \mathcal{A}_{1d} \\ \mathcal{A}_{21} & \mathcal{A}_{22} & \dots & \mathcal{A}_{2d} \\ \dots & \dots & \dots & \dots \\ \mathcal{A}_{m1} & \mathcal{A}_{m2} & \dots & \mathcal{A}_{md} \end{bmatrix}^{-1}}_{\mathcal{A}^{-1}: m \times d \text{ rectangular matrix: Singular?}} \begin{bmatrix} \mathcal{D}_1 \\ \mathcal{D}_2 \\ \dots \\ \mathcal{D}_d \end{bmatrix}$$

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- If this happens \rightarrow \mathcal{A} -matrix becomes singular [Ill-Posed Problem]

Ill-Posed \rightarrow Correlation between parameters and the data is lost!

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... especially if the inverse problem is ‘just about’ ill posed!

About Parametric Correlations within the Inverse Problem:

- a. How to determine their presence?**
- b. How to counteract their negative consequences
which are likely to destroy the predictive power?**

Selection of the Model Mean-Field Hamiltonian for This Project

Woods-Saxon Hamiltonian: Central Potential

- We present here only the spherical variant of the Woods-Saxon potential

$$V_{\text{cent}}^{\text{WS}} = \frac{V_c}{1 + \exp[(r - R_c)/a_c]} ; \quad R_c = r_c A^{1/3}.$$

It has unique features among most of the mean field potentials, namely, each parameter is related to an independent class of experiments:

- V_c - depth parameter; from specific transfer reactions
 - r_c - radius parameter; from e.g. electron scattering
 - a_c - diffuseness parameter; from hadron scattering
- In principle each of these parameters can be determined separately thus helping to counteract certain parametric correlations
 - The importance – This potential is broadly used for deformed nuclei:

$$V_{\text{cent}}^{\text{WS}} = \frac{V_c}{1 + \exp[\text{dist}_{\Sigma}(\vec{r}; R_0)/a_c]}$$

with a fixed parameter set for thousands of nuclei \Rightarrow Thus the name ‘**universal**’

The spherical Woods-Saxon spin-orbit potential has the form

$$V_{so}^{ws} = \frac{\lambda_{so}}{r} \frac{d}{dr} \left[\frac{1}{1 + \exp[(r - R_{so})/a_{so}]} \right] \hat{\ell} \cdot \hat{s}; \quad R_{so} = r_{so} A^{1/3}$$

- λ_{so} - strength parameter
- r_{so} - radius parameter
- a_{so} - diffuseness parameter

In total two sets of six parameters $\{V_c, r_c, a_c; \lambda_{so}, r_{so}, a_{so}\}_{\pi, \nu}$

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- They use WS-Universal Hamiltonian for nuclear structure calculations

Back to Parametric Correlations

Detecting Parametric Correlations

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- **Parametric correlations can be also detected by projecting the $\chi^2(p)$ onto a (p_j, p_k) -plane:**

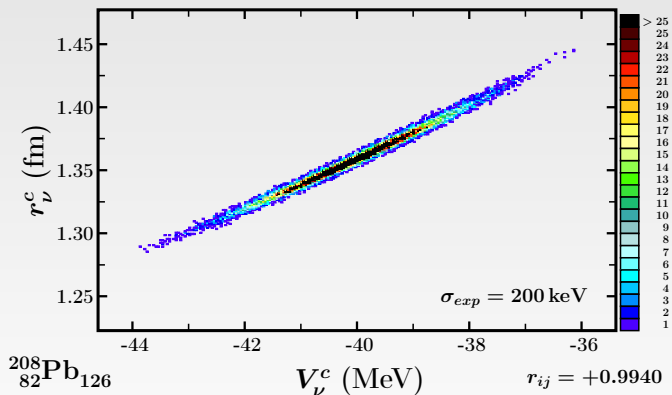
$$\min_{i \neq j, k} \chi^2(p_1, p_2, \dots, p_m)$$

Parametric Correlations within WS-Central Potential: I

- Using Monte Carlo Simulations and imposing $\sigma_{exp} = 200$ keV to the experimental neutron single particle energy levels of ^{208}Pb we find

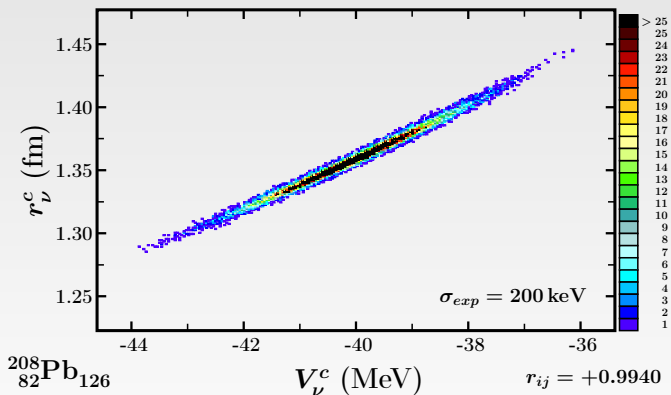
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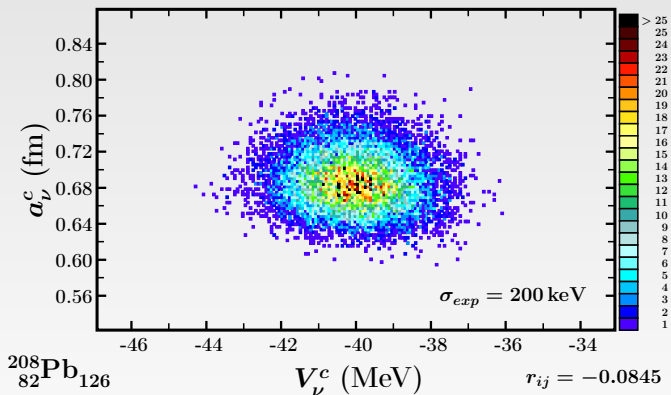
- Using Monte Carlo Simulations and imposing $\sigma_{exp} = 200$ keV to the experimental neutron single particle energy levels of ^{208}Pb we find



- These results show that the central potential **depth** and central potential **radius** are correlated: $V_c \times r_c^2 \approx \text{const.}$ A possible ad hoc choice: $r_c \rightarrow r_c^{\text{exp}}$

Parametric Correlations within WS-Central Potential: II

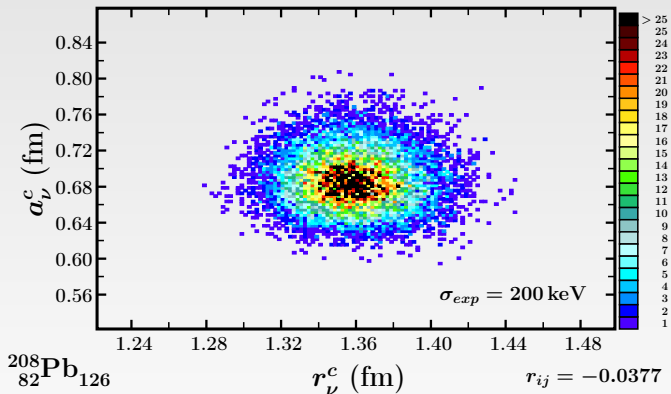
- Using Monte Carlo Simulations and imposing $\sigma_{exp} = 200$ keV on the experimental neutron single particle energy levels of ^{208}Pb



- An approximate circular symmetry of this diagram shows ($r_{ij} \approx 0$) that the central potential **depth** and the central potential **diffuseness** are not correlated - therefore no danger to the predictive power!

Parametric Correlations within WS-Central Potential: III

- Using Monte Carlo Simulations and imposing $\sigma_{exp} = 200$ keV on the experimental neutron single particle energy levels of ^{208}Pb we find:



- Once again, the circular symmetry of this diagram shows ($r_{ij} \approx 0$) that the central potential radius and central potential diffuseness are not correlated - thus no danger to the predictive power

Conclusion:

The central potential has only one correlation

$$V_0^c = V_0^c(r_0^c)$$

easy to remove

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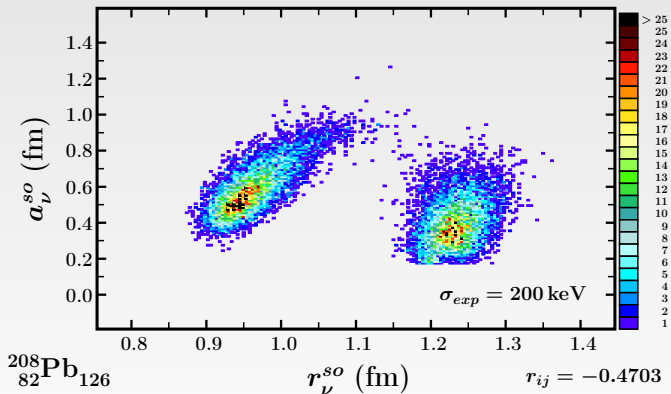
easy to remove

Next:

Checking the Spin-Orbit Potential

Spin-Orbit Potential: New Forms of Correlations

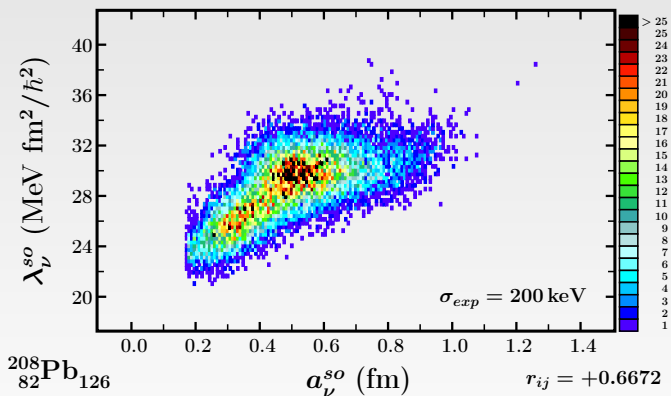
- Using Monte Carlo simulations and imposing $\sigma_{exp} = 200$ keV on the experimental neutron single particle energy levels of ^{208}Pb we find two distributions:



- These results show that the spin-orbit **diffuseness** and the spin-orbit **radius** parameters are correlated: $r_{ij} \approx -0.5$

Spin-Orbit Potential: New Forms of Correlations

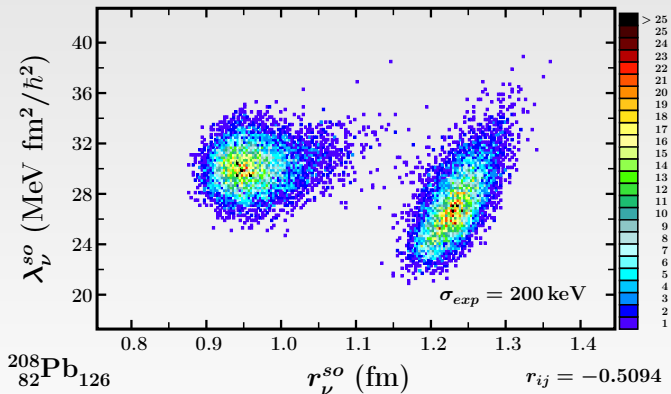
- Using Monte Carlo simulations and imposing $\sigma_{exp} = 200$ keV to the experimental neutron single particle energy levels of ^{208}Pb we find a linear-like relation



- These results show that the spin-orbit **diffuseness** and the spin-orbit **strength** parameters are correlated: $r_{ij} \approx +0.7$

Spin-Orbit Potential: New Forms of Correlations

- Using Monte Carlo simulations and imposing $\sigma_{exp} = 200$ keV to the experimental neutron single particle energy levels of ^{208}Pb we find two distributions:



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CONCLUSIONS:

The Spin-Orbit potential contains complex correlations:
Double-hump structures

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We identify two solutions for the spin-orbit parameters depending on the two 'optimal values' of r_v^{so} , generating two hump maxima:

- Compact configuration, $r_v^{so} \sim 0.93$ fm
- Non-compact configuration, $r_v^{so} \sim 1.22$ fm

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The Spin-Orbit potential contains complex correlations:
Double-hump structures

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- Compact configuration, $r_v^{so} \sim 0.93$ fm
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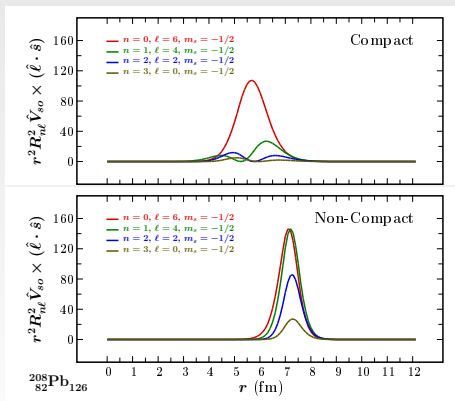
A question arises:

What is a possible physical difference between these solutions?

Comparing \hat{V}_{so} Integrand Profiles

- The potential 'communicates with the spectrum' via matrix elements

$$\langle n\ell | \hat{V}_{so} | n'\ell' \rangle \propto \int \underbrace{r^2 R_{n\ell}(r) \hat{V}_{so}(r) R_{n'\ell'}(r)}_{\text{Integrand}} dr$$



- Clearly the compact solution manifests some microscopic structure absent in the other

Comparing \hat{V}_{SO} Integrand Profiles

- Compact and Non-Compact solutions produce microscopically different structures
- The compact solution in contrast to the non-compact one manifests microscopic sub-structures and offers better r.m.s. deviations

Type/name	neutron ^{208}Pb -r.m.s. [MeV]
compact	0.18
non-compact	0.29

- This is an interesting observation: The wave-functions in the nuclear interior carry seemingly a very useful structural information
- Moreover, N. Schunck has shown that the compact solutions generate systematically better rotational properties of nuclei!!

- It is well known that the microscopic structure of the mean field, \hat{V}_{mf} , is based on the 2-body interactions, \hat{v}_2 :

$$\hat{v}_2 \leftrightarrow \hat{v}_{\text{two-body}}(\vec{r}_i - \vec{r}_j) \rightarrow V_{\text{mean-field}}(\vec{r}_i) \leftrightarrow \hat{V}_{\text{mf}}(\vec{r}_i)$$

$$\hat{V}_{\text{mf}}(\vec{r}_i) \propto \sum_{j \neq i} \int \psi_j^*(\vec{r}_j) \hat{v}_2(\vec{r}_i - \vec{r}_j) \psi_j(\vec{r}_j) d^3\vec{r}_j, \quad \sum_j \psi_j^*(\vec{r}_j) \psi_j(\vec{r}_j) \equiv \rho(\vec{r})$$

- Here we follow the ‘microscopic generalisation of the WS-universal’ in:

Realistic Nuclear Mean Field Approach with the Density-Dependent Spin-Orbit Term;

B. Belgoumène, J. Dudek and T. Werner, *Phys. Lett.* **B267** (4) (1991) 431-437

⇒

$$\hat{V}_{so}^{\pi} = \lambda_{\pi\pi} \frac{1}{r} \frac{d\rho_{\pi}}{dr} + \lambda_{\pi\nu} \frac{1}{r} \frac{d\rho_{\nu}}{dr} \quad \text{Eq.(A)}$$

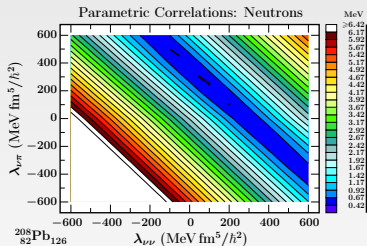
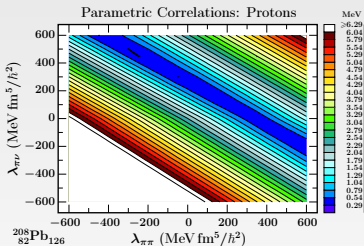
$$\hat{V}_{so}^{\nu} = \lambda_{\nu\pi} \frac{1}{r} \frac{d\rho_{\pi}}{dr} + \lambda_{\nu\nu} \frac{1}{r} \frac{d\rho_{\nu}}{dr} \quad \text{Eq.(B)}$$

Advantages: The new expression includes the iterative self-consistency condition like in the microscopic HF approach rather than pure phenomenology and contains 4 parameters rather than 6. **What are their correlations?**

Density-Dependent Spin-Orbit: Linear Correlations

- One can show that the parametric correlations can be detected through the projecting of the $\chi^2(p)$ onto a (p_j, p_k) -plane: $\min_{i \neq j, k} \chi^2(p_1, p_2, \dots, p_m)$

- Correlation on the planes $(\lambda_{\pi\pi}, \lambda_{\pi\nu})$ and $(\lambda_{\nu\nu}, \lambda_{\nu\pi})$ for ^{208}Pb



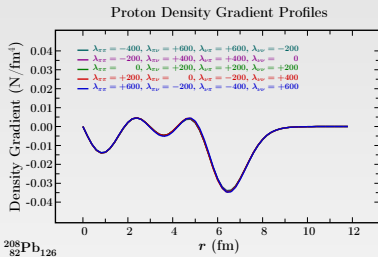
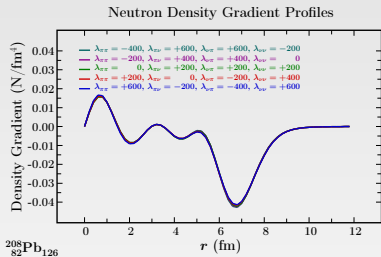
- Realistic calculations indicate that the density-dependent spin-orbit potential parameters are correlated – but the **correlations are perfectly linear**

$$\lambda_{qq'} = \alpha \cdot \lambda_{qq} + \beta$$

Microscopic Justification: Density-Dependent Profiles

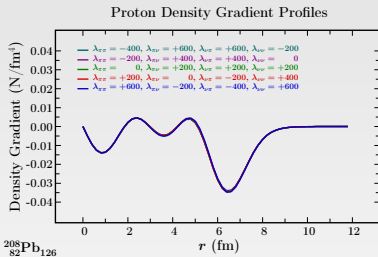
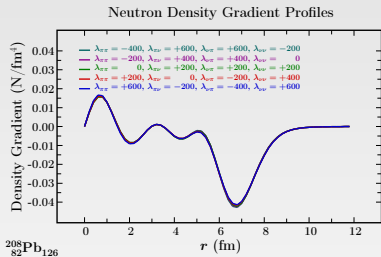
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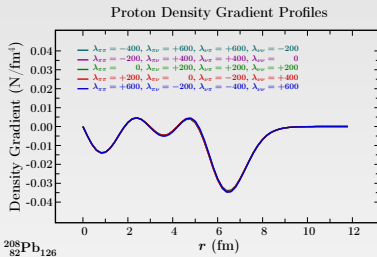
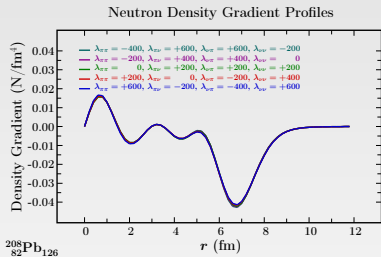


- For big- r values, corresponding to the vicinity of the nuclear surface Σ

$$\nabla\rho_{\pi}(r) \propto \nabla\rho_{\nu}(r) \implies \nabla\rho_{q'}(r) \approx \mu\nabla\rho_q(r)$$

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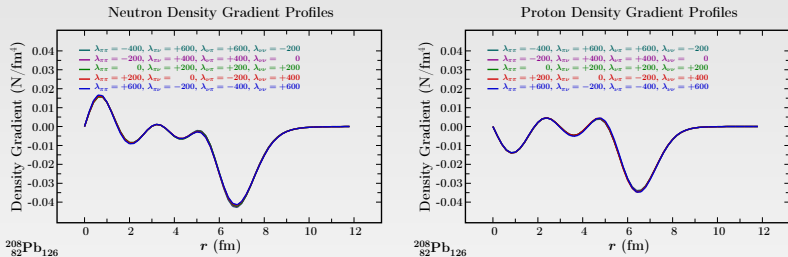
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and so

$$\hat{V}_q^{so}(r) = \left(\lambda_{qq} \frac{1}{r} \frac{d\rho_q}{dr} + \lambda_{qq'} \frac{1}{r} \frac{d\rho_{q'}}{dr} \right)$$

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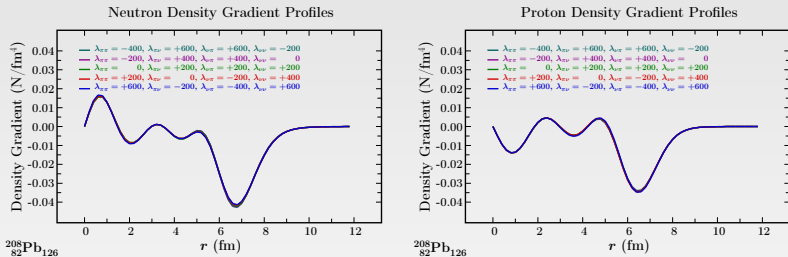
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A Working Conclusion

- A more detailed analysis shows that the valleys on the planes

$$(\lambda_{\pi\pi}, \lambda_{\pi\nu}) \text{ and } (\lambda_{\nu\nu}, \lambda_{\nu\pi})$$

cross at the common point for all the nuclei analysed where:

$$\lambda_{\pi\pi} \approx \lambda_{\pi\nu} \approx \lambda_{\nu\nu} \approx \lambda_{\nu\pi}$$

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We may significantly decrease the number of independent spin-orbit potential parameters thus eliminating correlations

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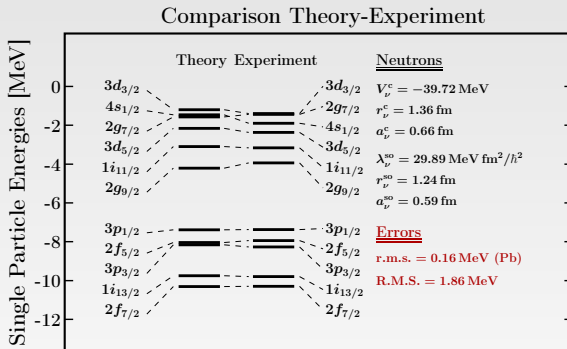
- **Conclusion:**

We may significantly decrease the number of independent spin-orbit potential parameters thus eliminating correlations

\Rightarrow But: Do we loose/gain something? What?

We Fit All the Six Parameters of Traditional \hat{V}_{so}

- We fit six parameters - $\{\lambda_{\pi}^{SO}, r_{\pi}^{SO}, a_{\pi}^{SO}\}$ for protons and $\{\lambda_{\nu}^{SO}, r_{\nu}^{SO}, a_{\nu}^{SO}\}$ for neutrons



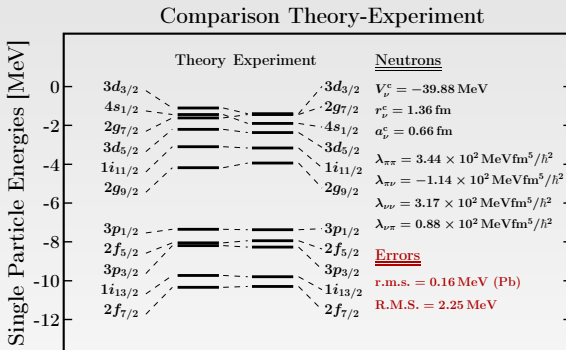
$^{208}_{82}\text{Pb}_{126}$

Spherical Woods-Saxon Hamiltonian

- Results for ^{208}Pb : Neutrons \rightarrow **Resulting r.m.s. = 0.16 MeV**
- Results for 8 nuclei, neutrons: ^{16}O , ^{40}Ca , ^{48}Ca , ^{56}Ni , ^{90}Zr , ^{132}Sn , ^{146}Gd , ^{208}Pb
Parameters fitted to ^{208}Pb only: Neutrons \rightarrow **Resulting R.M.S. = 1.86 MeV**

We Fit All the Four Parameters of the Density-Dependent $\hat{V}_{so}[\rho(r)]$

- We fit $\lambda_{nn}, \lambda_{np}, \lambda_{pn}, \lambda_{pp}$ of the density-dependent – WS to ^{208}Pb levels



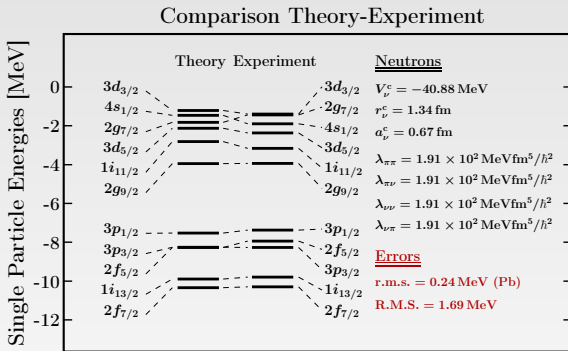
$^{208}_{82}\text{Pb}_{126}$

Spherical Woods-Saxon Hamiltonian

- ^{208}Pb -neutrons \rightarrow **Results r.m.s. = 0.16 MeV** (unchanged)
- Results for ^{16}O , ^{40}Ca , ^{48}Ca , ^{56}Ni , ^{90}Zr , ^{132}Sn , ^{146}Gd , ^{208}Pb , the same parameters
8 nuclei neutrons \rightarrow **Results R.M.S. = 2.25 MeV** (huge deterioration!)

How Many Degrees of Freedom Does the $\hat{V}_{so}[\rho(r)]$ REALLY Have?

- We introduce the constraint $\lambda_{nn} = \lambda_{np} = \lambda_{pn} = \lambda_{pp} \equiv \lambda$, and fit ^{208}Pb levels



$^{208}_{82}\text{Pb}_{126}$

Spherical Woods-Saxon Hamiltonian

- ^{208}Pb -neutrons → **Results r.m.s. = 0.24 MeV** (small deterioration)
- Results for ^{16}O , ^{40}Ca , ^{48}Ca , ^{56}Ni , ^{90}Zr , ^{132}Sn , ^{146}Gd , ^{208}Pb , the same parameters
 8 nuclei neutrons → **Solution R.M.S. = 1.69 MeV** (improvement!)
- Conjecture: **Equivalent to 1 parameter - common for protons and for neutrons**

What If We Increase the Sampling?

- We fit the parameters to ^{132}Sn and ^{208}Pb energy levels
- Neutron Results:

	^{208}Pb r.m.s. [MeV]	R.M.S. [MeV]
Density Dependent SO - 4 parameters	0.30	1.58
Density Dependent SO - 1 parameter	0.30	1.20

- Proton Results:

	^{208}Pb r.m.s. [MeV]	R.M.S. [MeV]
Density Dependent SO - 4 parameters	0.20	1.67
Density Dependent SO - 1 parameter	0.35	1.17

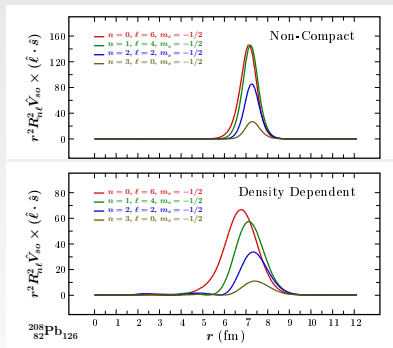
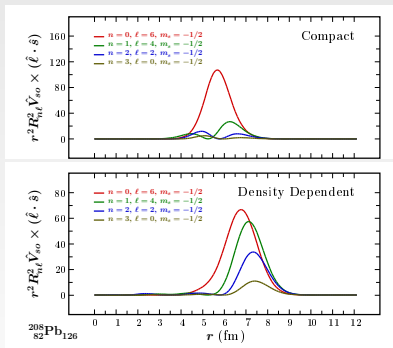
- **Conclusion I:** individual ^{208}Pb r.m.s. increased for both protons and neutrons, but still it can be considered a very good description
- **Conclusion II:** global R.M.S. improved for both protons and neutrons
⇒ **Improvement in terms of Predictive Power!**

**Back to Physical Significance
of the Compact vs. Non-Compact
Spin-Orbit Variants**

Comparing \hat{V}_{so} -Density Dependent Integrand Profiles

- The potential ‘communicates with the spectrum’ via matrix elements

$$\langle n\ell | \hat{V}_{so} | n'\ell' \rangle \propto \int \underbrace{r^2 R_{n\ell}(r) \hat{V}_{so}[\rho(r)] R_{n'\ell'}(r)}_{\text{Integrand}} dr$$



- The density dependent spin-orbit manifests similarities with the compact solution!
- These structures deserve attention since they improve the r.m.s-deviations!!
- In this project they were discovered when of analysing parametric correlations

FINAL CONCLUSIONS:

The self-consistent density-dependent,
and thus ‘more microscopic’ spin-orbit potential,
depends effectively on one parameter rather than six

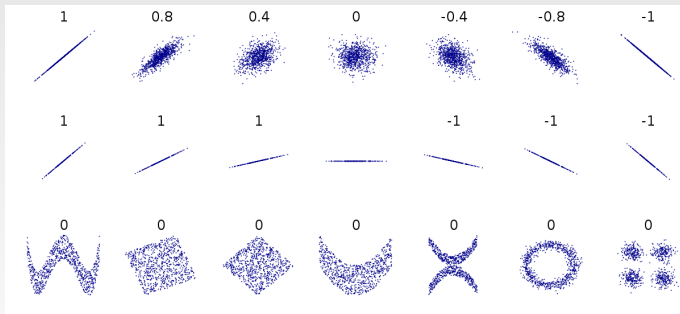
- By introducing the density-dependent spin-orbit potential we arrive at the eliminating of all parametric correlations→thus the implied problems
- We obtain better or equal quality of comparison with experiment
- Parametric correlations in the form of double hump distributions
- We show the microscopic background of the compact spin-orbit potential and certain parallels with the density-dependent one

Thank you!

ANNEXE - Extra slides

Parametric Correlations, General Illustrations

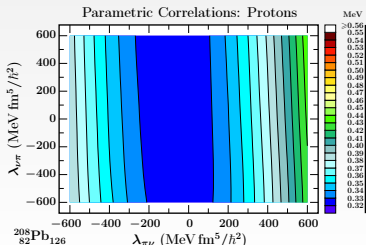
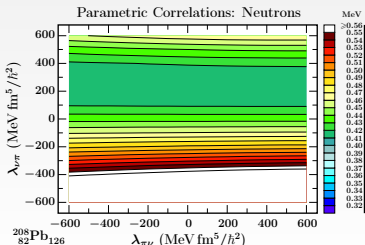
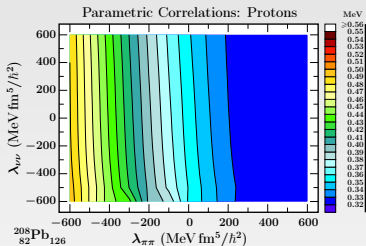
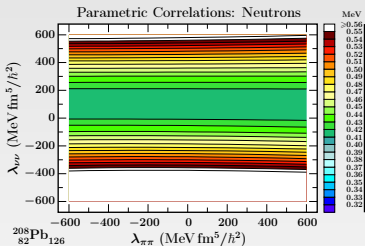
- From *Wikipedia*: two-dimensional (x, y) distributions of data-points with their corresponding values of Pearson Coefficient r_{ij} .



- Observation:** the bottom row results show **correlated distributions** which give $r_{ij} \approx 0$

No Correlations in the Density-Dependent Spin-Orbit

- χ^2 -projection onto the planes $(\lambda_{\pi\pi}, \lambda_{\nu\nu})$ and $(\lambda_{\pi\nu}, \lambda_{\nu\pi})$



Parametric Correlations

[Illustrations for Skyrme Hartree-Fock Hamiltonian]

To follow the discussion it will be sufficient to know that the Skyrme Hamiltonian depends on the adjustable constants:

$$C_0^\rho, C_1^\rho, C_o^{\rho\alpha}, C_0^\tau, C_1^\tau, C_0^{\nabla J}$$

Parametric Correlations:

Strongly Present the Skyrme-Hartree-Fock Mean Fields

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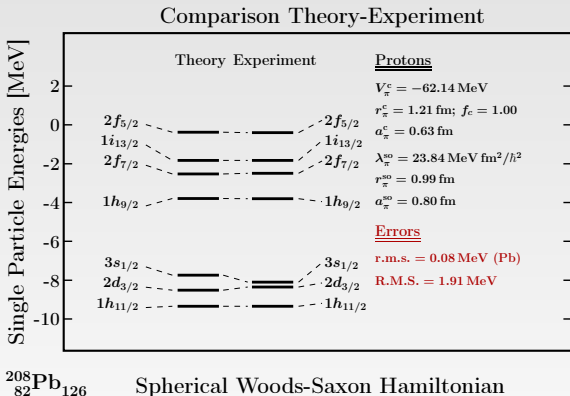
**In other words: This type of the Hamiltonian
may very well allow to fit the data:
Stable extraneous predictions is another issue^{*)}**

^{)}J. Rikovska-Stone, J. Phys. G31 (2005) R211-R230: Cites over 100 distinct,
non-equivalent parameterisations of the Skyrme Hartree-Fock Hamiltonian so far
published in the literature*

We repeat the test for the protons

How Many Degrees of Freedom Does the V_{SO} Have?

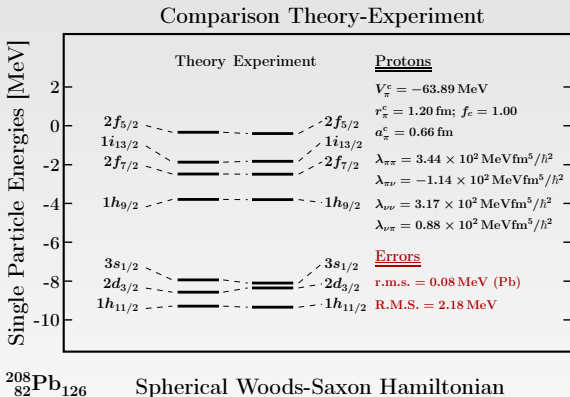
- We fit all the traditional – **WS** potential parameters to ^{208}Pb levels



- Results for ^{208}Pb -neutrons → **Solution r.m.s. = 0.08 MeV**
- Results for 8 nuclei neutrons → **Solution R.M.S. = 1.91 MeV**
- The answer: **6 parameters** - $\{\lambda^{so}, r_0^{so}, a_0^{so}\}$ for protons and $\{\lambda^{so}, r_0^{so}, a_0^{so}\}$ for neutrons

How Many Degrees of Freedom Does the V_{SO} Have?

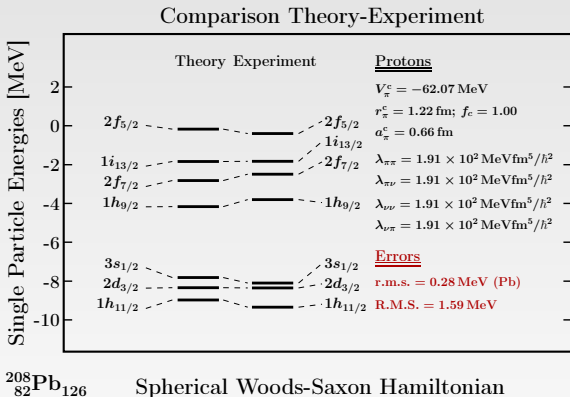
- We fit the density-dependent – WS: $\lambda_{nn}, \lambda_{np}, \lambda_{pn}, \lambda_{pp}$, to ^{208}Pb levels



- Results for ^{208}Pb -neutrons → **Solution r.m.s. = 0.08 MeV** (unchanged)
- Results for 8 nuclei neutrons → **Solution R.M.S. = 2.18 MeV** (huge deterioration!)
- The answer: **4 parameters** - for protons and neutrons

How Many Degrees of Freedom Does the V_{SO} Have?

- We fit the density-dependent – WS: $\lambda_{nn} = \lambda_{np} = \lambda_{pn} = \lambda_{pp} \equiv \lambda$, to ^{208}Pb levels



- Results for ^{208}Pb -neutrons → **Solution r.m.s. = 0.28 MeV** (small deterioration)
- Results for 8 nuclei neutrons → **Solution R.M.S. = 1.59 MeV** (improvement!)
- The answer: **1 parameter** - common for protons and for neutrons