## The nucleon-nucleus scattering and structure Markov-chain Monte Carlo parameter inference for a phenomenological dispersive optical-model potential

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#### Optical-model potentials (a.k.a. irreducible self-energy)

Projection of the Hamiltonian on the elastic channel (Feshbach formalism, e.g. A. Moro, 2019, doi.org/10.3254/978-1-61499-957-7-129)

The projected interaction, U, is the optical-model potential:

$$U = PVP + PVQ \frac{1}{E - QHQ + i\epsilon} QVP \quad P, Q$$
 projections

- Degrees of freedom: motion between reactants center-of-mass.
- A completely consistent U will be complex, non-local, and energy-dependent.
- Imaginary part: flux leaving the elastic channel.

Exact framework (if detailed information on inelastic is not needed).

R

#### Optical potentials are a staple of current nuclear physics

Optical-model potentials (OMP) give a simple, concise description of the nuclear interaction.

Countless applications... (fig. from A. Moro, 2019, doi.org/10.3254/ 978-1-61499-957-7-129)

Add in bound-state properties!



### Traditional optical-model potentials

- Phenomenological:  $\chi^2$  fit on data.
- Only scattering (no structure).

Local.

- "Error-propagation" superficial or absent.
- Extraordinarily successful! (*in interpolation*) [Fig. from A. J. Koning et al. Nuclear Physics A 713.3 (2003)].



#### Goal

Design and train a (physics-informed) phenomenological optical model that

- Has all features required for a fully consistent microscopic potential: fully non-local and dispersive.
- Has sound uncertainty quantification, also accounting for model defects.
- Provides a good description on a wide area of the chart (global) and can be reliable in extrapolation.

# Introduction

- Dispersive optical-model
- Inference and uncertainty quantification
- Resources and preliminary results

#### The dispersive optical model

Causality principle requires (J. S. Toll. *Phys. Rev.* 104.6 (1956)) OMP, *U*, to follow a dispersion (Kramers-Kronig) relation in energy:

 $U(\alpha,\beta,E) = U_{\mathsf{HF}}(\alpha,\beta) + U_{D}(\alpha,\beta,E), \quad \operatorname{Re}U_{D}(\alpha,\beta,E) = \frac{1}{\pi}\mathsf{PV}\int_{\mathbb{R}}\frac{\operatorname{Im}U_{D}(\alpha,\beta,\mathcal{E})}{E-\mathcal{E}}\,\mathrm{d}\mathcal{E}$ 

Use forms analytic in E whose dispersion integral is known for faster calculations.



### The adopted potential (as of June 2024)

Start by the "simplest possible" and add more only if data require it.

-imaginary surface symmetric around  $E_F$  + imaginary spin-orbit+

+dispersive correction( $E, W_1, \ldots$ )

$$R = (R_1 + R_2)/2$$
 ,  $NLP = \frac{2\sqrt{R_1R_2}}{\beta^2} \exp\left(-\frac{R_1^2R_2^2}{\beta^2}\right) J(L + 0.5, 2R_1R_2/\beta^2)$ 

#### How to compute observables from the optical potential

For scattering: solve (find the phase-shifts)

$$-\frac{\hbar^2 \nabla_{\vec{r}}^2}{2m} \chi(\vec{r}) + \int_{\mathbb{R}^3} U(\vec{r},\vec{r}') \chi(\vec{r}') \,\mathrm{d}^3\vec{r}' - E\chi(\vec{r}) = 0$$

For bound-state properties:

Given the Hamiltonian in a basis for the nucleus-nucleon motion  $\{\alpha\}$ ,  $H_{\alpha\beta}(E)$ , **1** Compute the propagator (requires inverting *H*) and hole spectral functions

$$G_{\alpha\beta}(E) = \lim_{\eta \to 0} \frac{1}{E - H_{\alpha\beta}(E) + i\eta} \quad , \quad S^h_{\alpha}(E) = \frac{1}{\pi} \operatorname{Im} G_{\alpha\alpha}(E)$$

for all  $E < E_F$  on a suitable finite grid.

Derive one-body observables of interest, e.g.

s.p. energies 
$$E_a = \int_{-\infty}^{\mathcal{E}_F} S_a(E) E \, \mathrm{d}E \longrightarrow$$
 binding energy

## Examples of ${}^{40}Ca$ bound-state observable predictions



# Introduction

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# • Resources and preliminary results



#### ebooks.iospress.nl/ publication/48604



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High-dimensional parameter space. Posterior expected unimodal.

### Limitations of OMP fitting: past literature shows that...



(C. D. Pruitt et al. Phys. Rev. C 107.1 (2023)

and e.g. A. J. Koning et al. Nuclear Physics A 713.3 (2003))

• Uncertainties are underestimated.

Errors due to experiment and model defects are not disentangled.

- There are outliers.
- Observations are not independent.
- $\chi^2 \gg 1$  and error estimation based on it is not meaningful

#### Past literature shows that...



#### Unaccounted-for-uncertainties estimation

Covariance matrix in C. D. Pruitt et al. *Phys. Rev. C* 107.1 (2023) (the expression was simplified for illustrative purposes):

$$\tilde{\Sigma} = \frac{k}{N} \operatorname{diag}(\vec{\Delta}) \quad , \quad \vec{\Delta} = \left\{ \delta_y^2 + \left( y \, \delta_{\hat{t}(y)} \right)^2 \right\}$$

 $\delta_y$  reported data error, y observation.  $\hat{t}(y)$  "type" of y (proton elastic  $\sigma$ , neutron analyzing power, ...),  $\delta_{\hat{t}}$  fitted parameters.

Likelihood (being  $r = y - M(\vec{\theta}, x)$ ):

$$L = \left[ (2\pi)^k \left| \tilde{\Sigma} \right| \right]^{-1/2} \exp \left[ -\frac{1}{2} \frac{\vec{r}^2}{\left| \tilde{\Sigma} \right|} \right]$$

"Sigma capping": Residuals are capped at  $r_{\max} = \Delta_y \cdot R_{\hat{t}(y)}$  ("*R* standard deviations")  $R_{\hat{t}(y)}$  chosen manually, different for each data "type" (3 for ECS,  $\infty$  for particle number, ...)

Suspect outliers add constant penalty

 $\Rightarrow$  don't affect the fit unless they can be reasonably reproduced by the model.

E.g., a  $d\sigma/\,d\Omega$  with 100 data points, and a single point for the binding energy.

Case 1: data are independent (up to the model's k degrees of freedom),

$$\tilde{\Sigma} = \frac{k}{N} \operatorname{diag}(\Delta_1, \dots, \Delta_N)$$

Case 2: data in a dataset are fully correlated,

$$\tilde{\Sigma} = \frac{k}{n_s} \operatorname{diag} \left( \frac{1}{N_1} \Delta_1, \dots, \frac{1}{N_1} \Delta_{N_1}, \frac{1}{N_2} \Delta_{N_1+1}, \dots, \frac{1}{N_{n_s}} \Delta_N \right)$$

In reality, data points for a given measurement are not fully independent, neither fully correlated.

- Introduction
- Dispersive optical-model
- Inference and uncertainty quantification
- Resources and preliminary results
  - Resources
  - Recent results

#### How much computing power do we need?

- $\bullet\,$  Currently,  $0.7\,\text{s}$  for one Green's function,  $0.04\,\text{s}$  for one scattering energy.
- $10^4$  MCMC steps (at least, if fitted UAU and outlier rejection desired)
- 150 target nuclei (for a "global" fit).
- 2 projectiles (proton and neutron) per target.
- 400 MCMC walkers ( $\sim 40$  fit parameters)

 $\sim 114$  years in serial.

- Half walkers can run in parallel (stretch move): 200 cores,  $\sim 208$  days.
- Each system can run in parallel:  $6 \times 10^4$  cores,  $\sim 17$  hours.



# Introduction

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# Resources and preliminary results

#### Resources

#### Recent results

# Fit on ${ m ^{40,48}Ca}$ , ${ m ^{58,64}Ni}$ , ${ m ^{90}Zr}$ bound properties only; fit UAU, no rejections



Nuclides

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#### The nucleon-nucleus scattering and structure

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- Reliable global optical model, fully dispersive and non-local, trained on scattering and bound-state data, with sound uncertainty quantification, is within reach. (Nucleon numbers, binding energies, etc., available for very unstable systems).
- User-friendly library handling such potentials (TOMFOOL) will be released.
- Careful choice of likelihood function required for the problem at hand.

To do:

- Include more quantities (single-particle energies, charge exchange, skins, ...).
- Improve computational efficiency (parallelization, emulators).

#### Thank you for your attention



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