



U.S. DEPARTMENT OF  
**ENERGY**

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**NUCLEI**  
Nuclear Computational Low-Energy Initiative

# Ab initio nuclear scattering calculations using traps Emulators for scattering using eigenvector continuation

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The Ohio State University

*NSCL Virtual Theory Seminar, Sep. 2020*

Thank my collaborators:

S. R. Stroberg, P. Navrátil, Chan Gwak, J. A. Melendez,  
R. J. Furnstahl, J. D. Holt, A. J. Garcia, and P. J. Millican

9/15/2020

# Outline

- Background on ab initio calculations
  - Our method adapts the principle of the Luscher method from Lattice QCD
  - **Benchmarks** ( $n - \alpha$ ) and applications for **heavier** system ( $n -^{24} O$ )
  - Summary and outlook I
- 
- Broad applications of emulators for bound and scattering states
  - Eigenvector continuation emulators for scatterings
  - Summary and outlook II

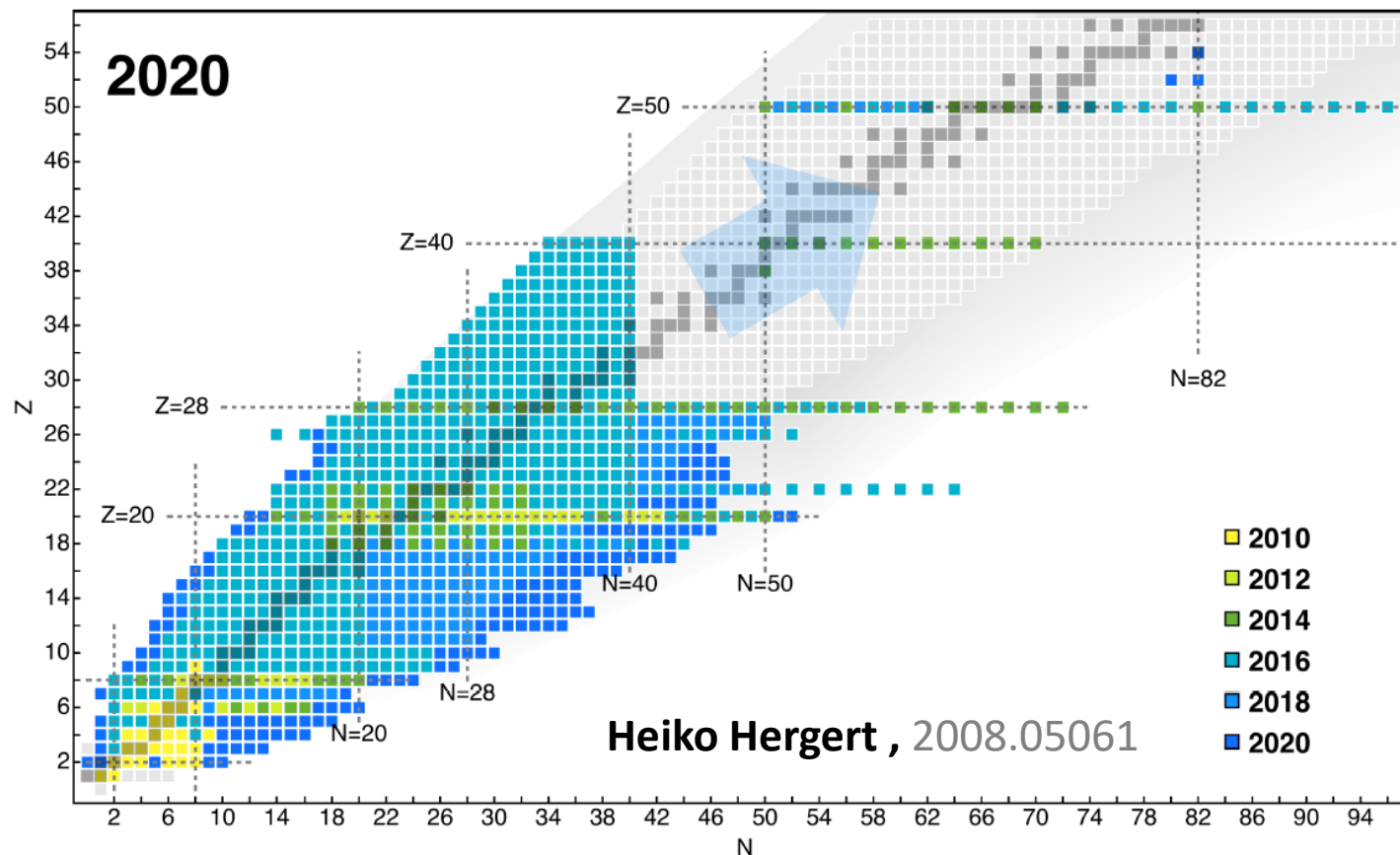
“Ab initio calculations of low-energy nuclear scattering using confining potential traps,”

XZ, S. R. Stroberg, P. Navrátil, Chan Gwak, J. A. Melendez, R. J. Furnstahl, and J. D. Holt, PRL **125**, 112503 (2020)

[[2004.13575](#) ]



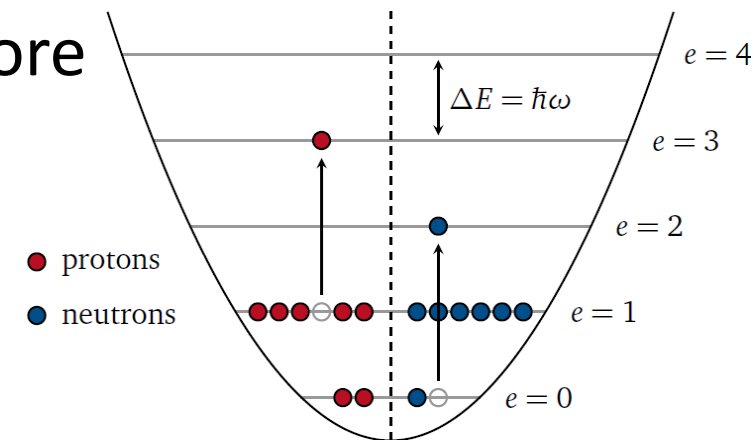
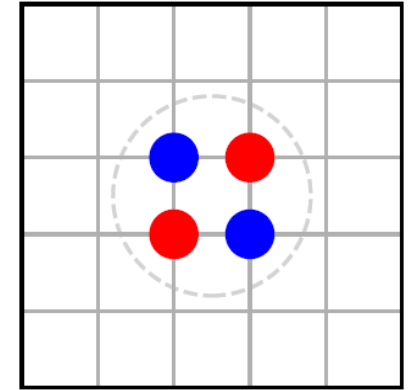
- Nuclear reaction with astrophysical relevance
- Reactions as the tools at FRIB
- Consistent treatment of structure and scattering/reactions for drip-line nuclei
- Ab initio structure calculations have made amazing progress, while scattering/reactions are limited



**Can we take advantage of progress to compute scattering/reactions?**

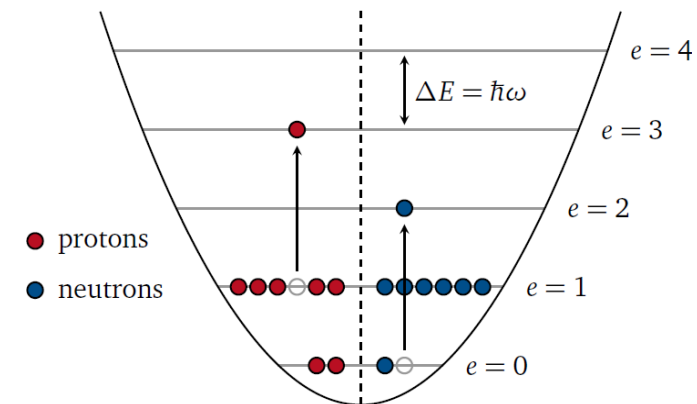
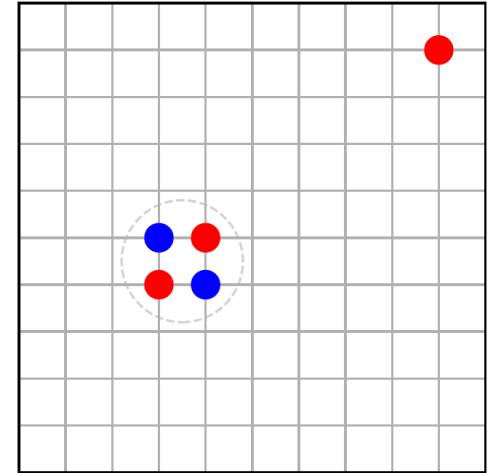
# Ab initio calculations of bound nuclei

- Degrees of freedom (DOF):  $\mathbf{r}$  and  $\mathbf{s}$ . Different treatments:
  - Monte Carlo (MC) sampling: Green's function MC, nuclear lattice effective field theory (NLEFT) (also similarly in lattice QCD)
  - Basis method, e.g. Hamiltonian diagonalization in no-core shell model (NCSM) and in-medium similarity renormalization group (IMSRG), and coupled-cluster



# Ab initio calculations of scattering/reactions

- For scattering/reactions: much more DOF. Various methods:
  - Again MC-sampling of important configurations: NLEFT, GFMC, Lattice QCD
  - NCSM+continuum
  - Gamow shell-model
  - Ab initio optical potential



# Key idea for **two-body** scattering

$$\sigma_l(E) = \frac{4\pi}{p^2} \times (2l + 1) \sin^2 \delta_l(E)$$

$$(E, \omega_T) \rightarrow \delta_l(E)$$

- **Eigen-energies** of trapped projectile-target systems **output from ab initio calculations**  $\rightarrow$  **scattering** (phase-shift) at **those energies**.
- Works with systems computable by structure methods (trap makes unbound system artificially bound)

*Keep an example in your mind:  
neutron-alpha scattering*



# Lüscher's method in Lattice QCD

Discrete **eigen-energies**  
for pi-pi in a **finite**  
**volume** gives the **phase**  
**shift at those energies**

$$(E, V_{Lattice}) \rightarrow \delta_l(E)$$

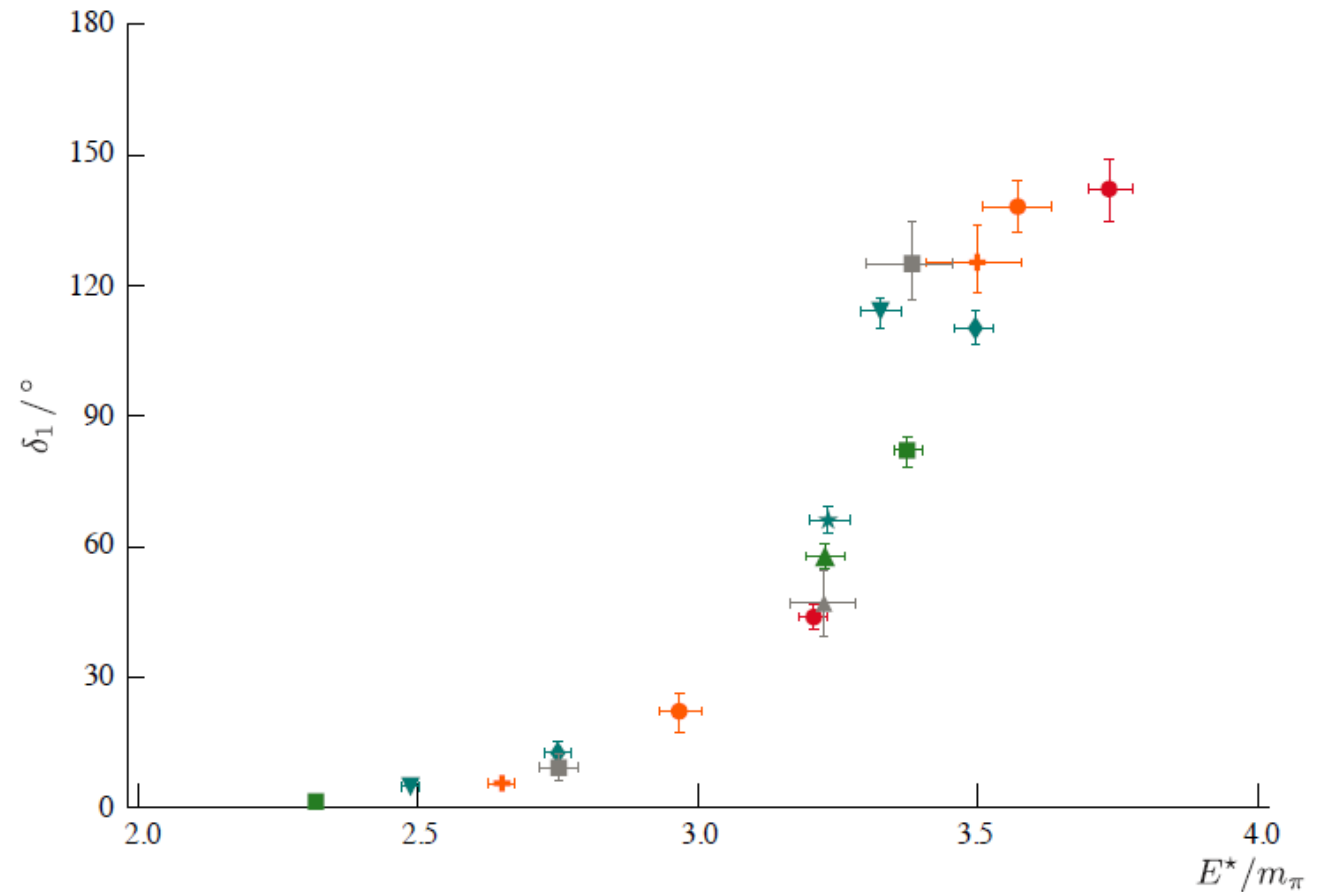
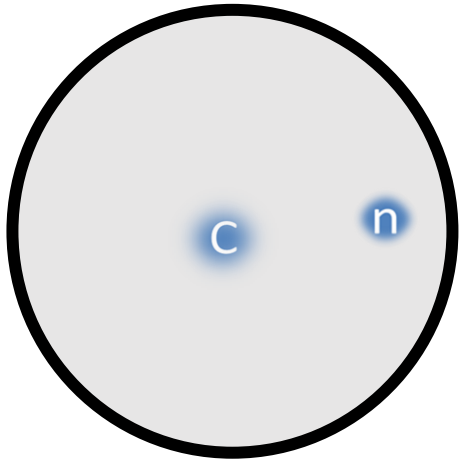


FIG. 14 Elastic  $I = 1$   $\pi\pi$  scattering phase-shifts in  $P$ -wave determined from finite-volume spectra computed the same  $m_\pi \sim 236$  MeV configurations as used in the calculation

Briceno et.al., RMP.90.025002 (2018)



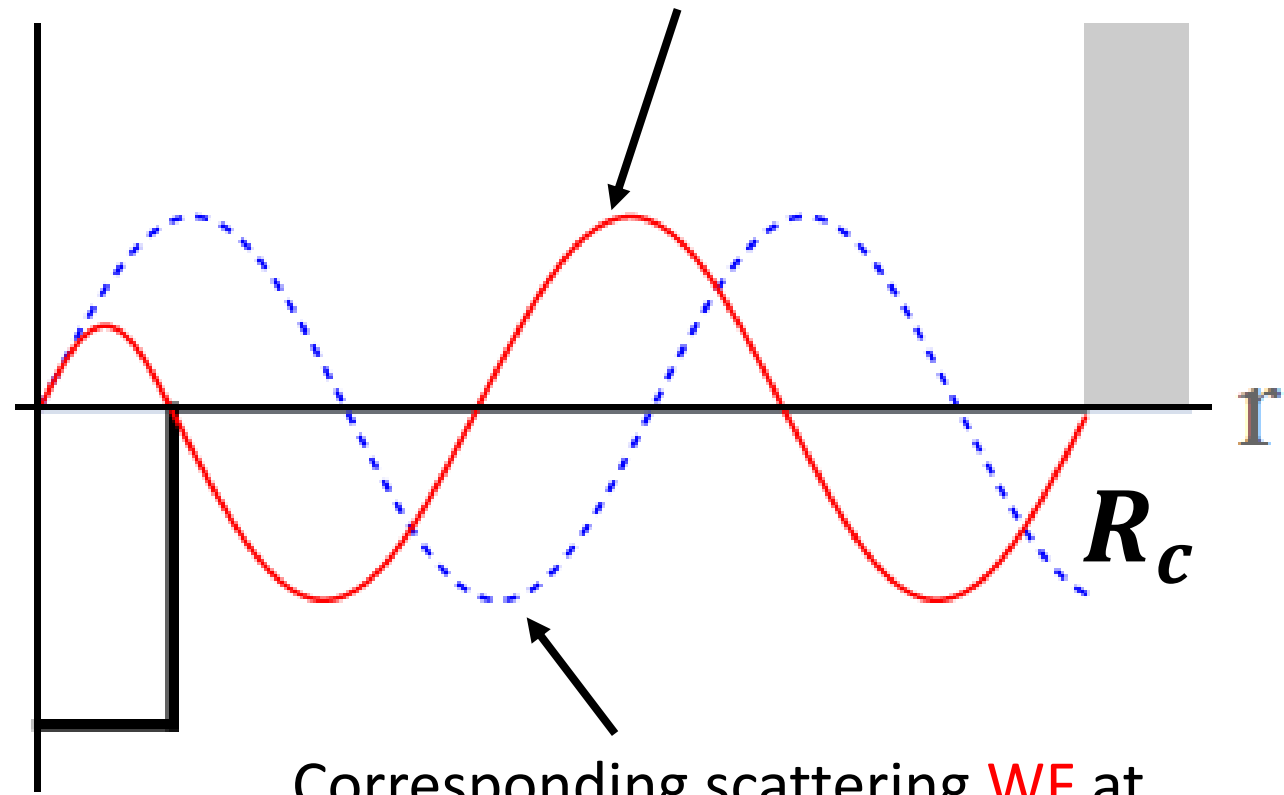
# Cavity boundary condition (for relative motion)



$$\tan \delta_l \times n_l(kR_c) + j_l(kR_c) = 0$$

*i.e.*,  $(E, R_c) \rightarrow \delta_l(E)$

$V$  or  $\psi$



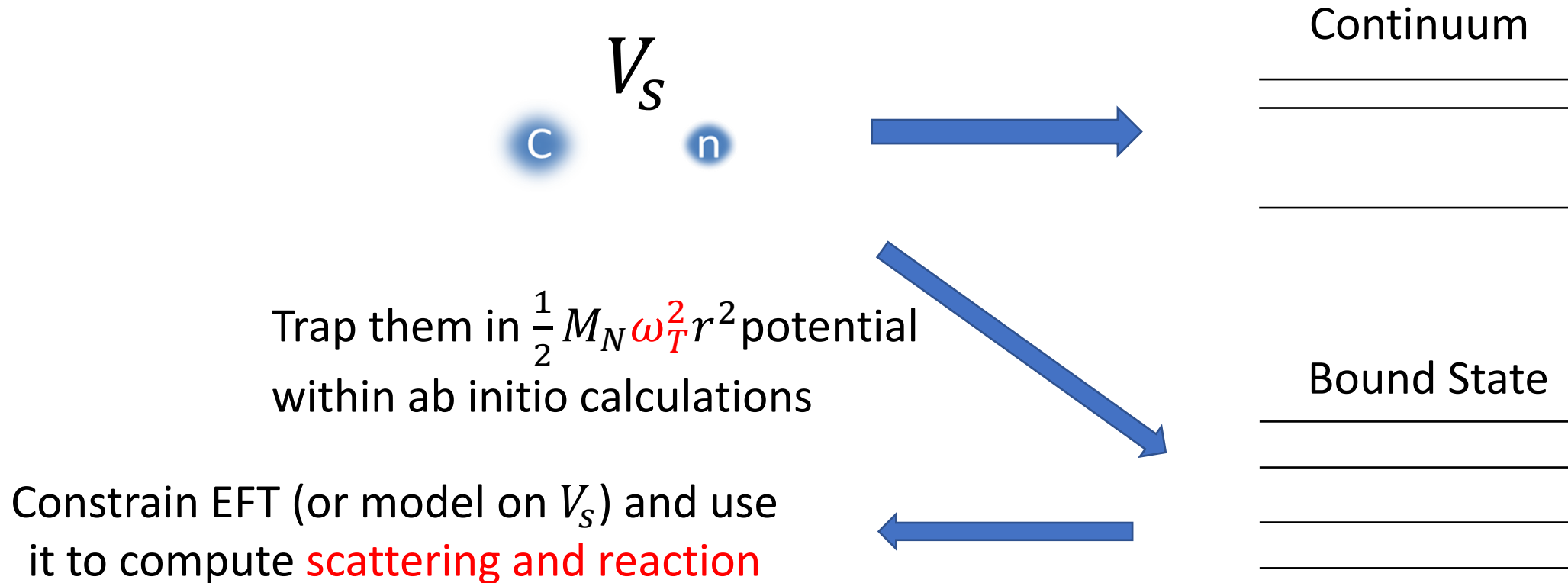
Scattering **wave function (WF)** at **E** with strong-interaction and infinite potential wall at  $r=R_c$

Corresponding scattering **WF** at **E** in free space without any potential

However trapping nucleons using harmonic potential is well suited for nuclear calculations

- Reduces DOF → enable ab initio calculations
- Decouples the center of mass (CM) and internal DOFs
- Preserves rotational invariance

# A different perspective: computer experiment



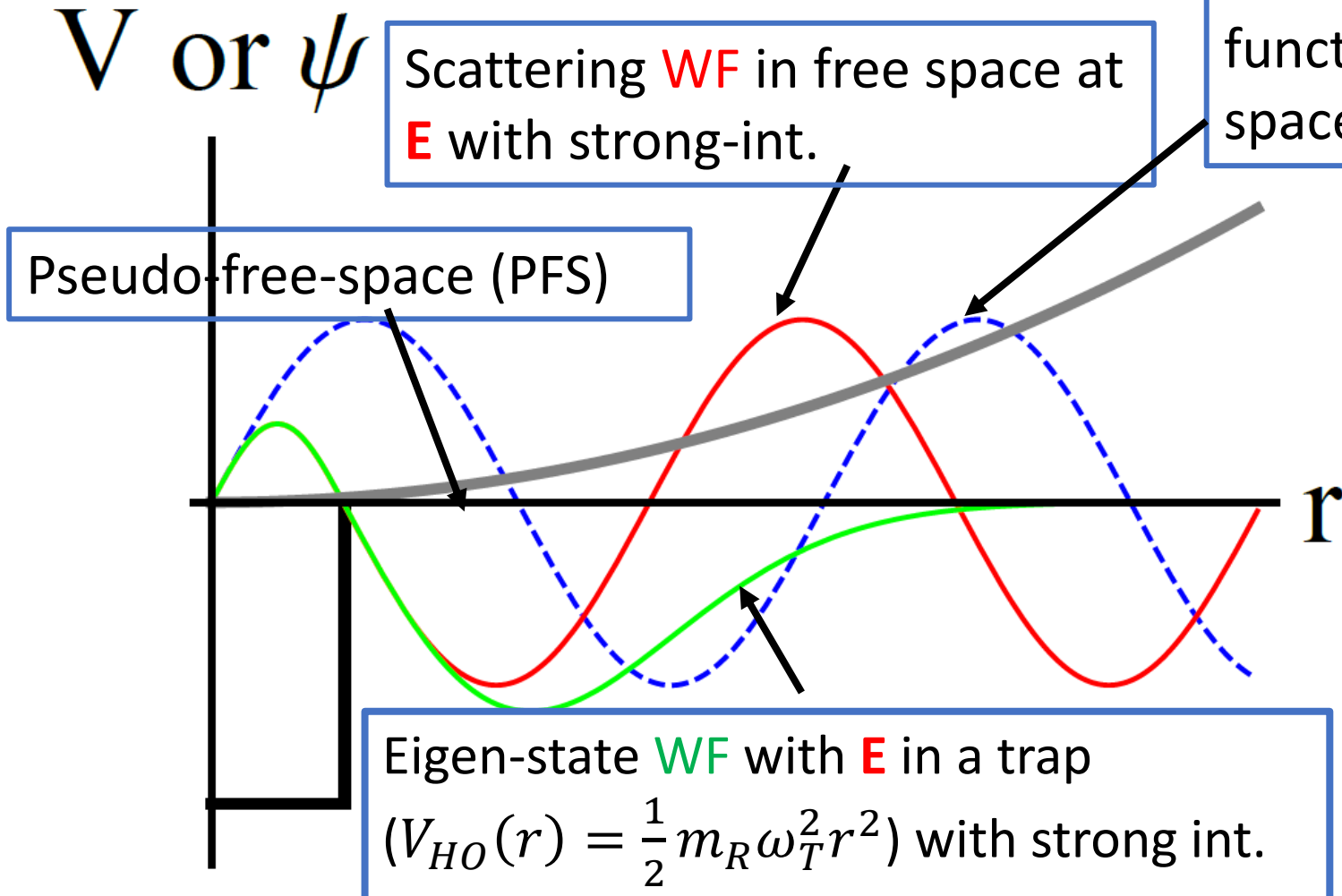
**A universal formula at low energy  $\rightarrow$  BERW (Busch) formula**

$$(E, \omega_T) \rightarrow \delta_l(E)$$

# BERW formula: intuition

Suppose we know the eigen-energy ( $E$ ) of the sys. in a trap for s-wave.

$$p^{2l+1} \cot \delta_l = (-1)^{l+1} (4 M_R \omega_T)^{l+1/2} \frac{\Gamma(\frac{3}{4} + \frac{l}{2} - \frac{E}{2\omega_T})}{\Gamma(\frac{1}{4} - \frac{l}{2} - \frac{E}{2\omega_T})}$$



Scattering WF in free space at  $E$  with strong-int.

Scattering wave function (WF) in free space at  $E$

Pseudo-free-space (PFS)

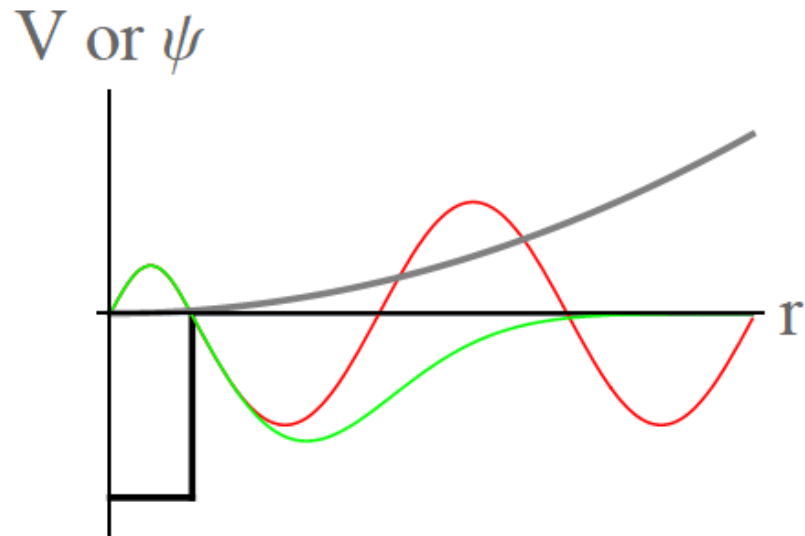
Eigen-state WF with  $E$  in a trap ( $V_{HO}(r) = \frac{1}{2} m_R \omega_T^2 r^2$ ) with strong int.

- The full WF dies off at large  $r$ . Integrate Schrodinger eq. inward  $\rightarrow$  WF outside strong int. range. I.e., it is determined by  $E$  and  $\omega_T$ .

$$\left[ -\frac{\partial_R^2}{2m_R} + V_{HO}(r) \right] \psi(r) = E\psi(r)$$

- At PFS, the full WF is close to the scatt. WF,  $\cos \delta j_0 + \sin \delta n_0$
- Matching them  $\rightarrow$  BERW formula
- BERW: left side  $\rightarrow$  strong int.;**  
**right side  $[U(E)] \rightarrow$  (bound. cond.)**  
**long-dis. physics**

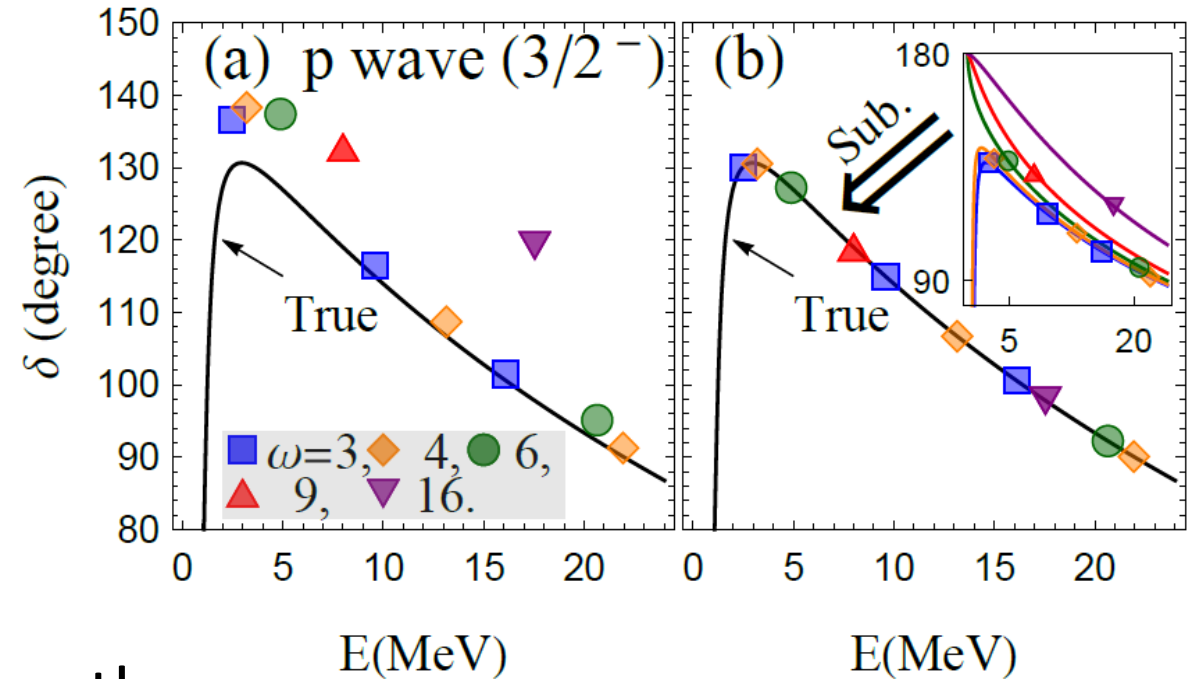
# BERW formula: the issue



However, PFS is not real free space.

- $\omega_T^2$  dependence of extracted  $\delta(E)$  is smooth
- Modify BERW's left side  $\rightarrow$  generalized effective range expansion (GERE)

## $n - \alpha$ two-body potential model



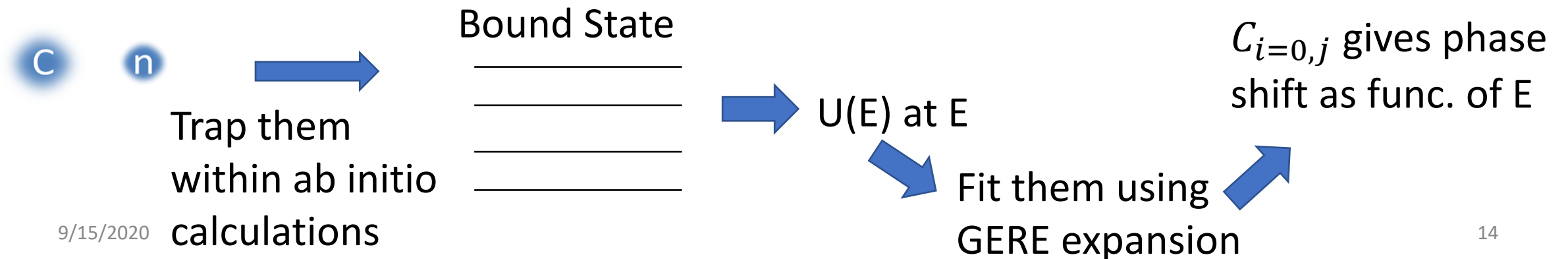
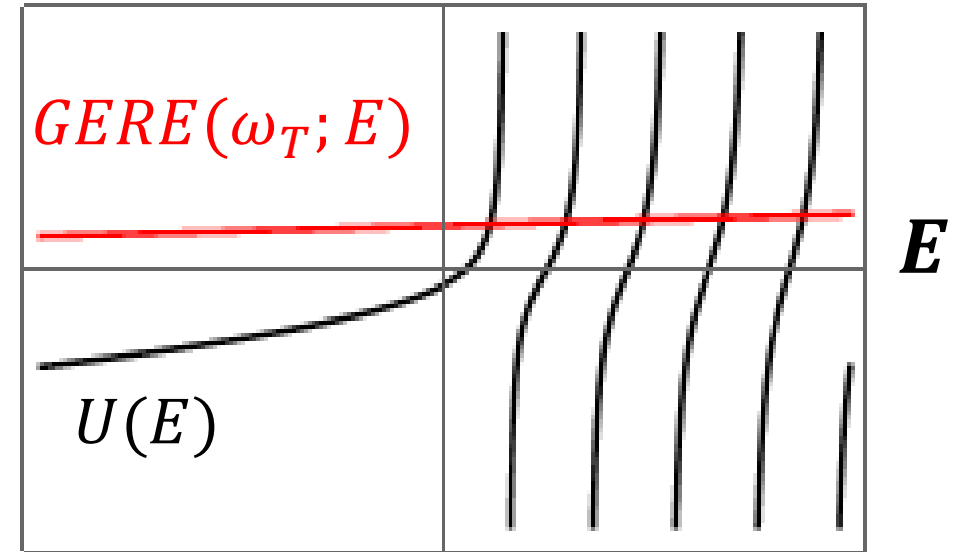
$$\sum_{i,j=0}^{+\infty} C_{i,j} (M_R \omega_T)^{2i} p^{2j} = U(E)$$

# The perfect computer expt. (no errors!)

Quantization conditions:

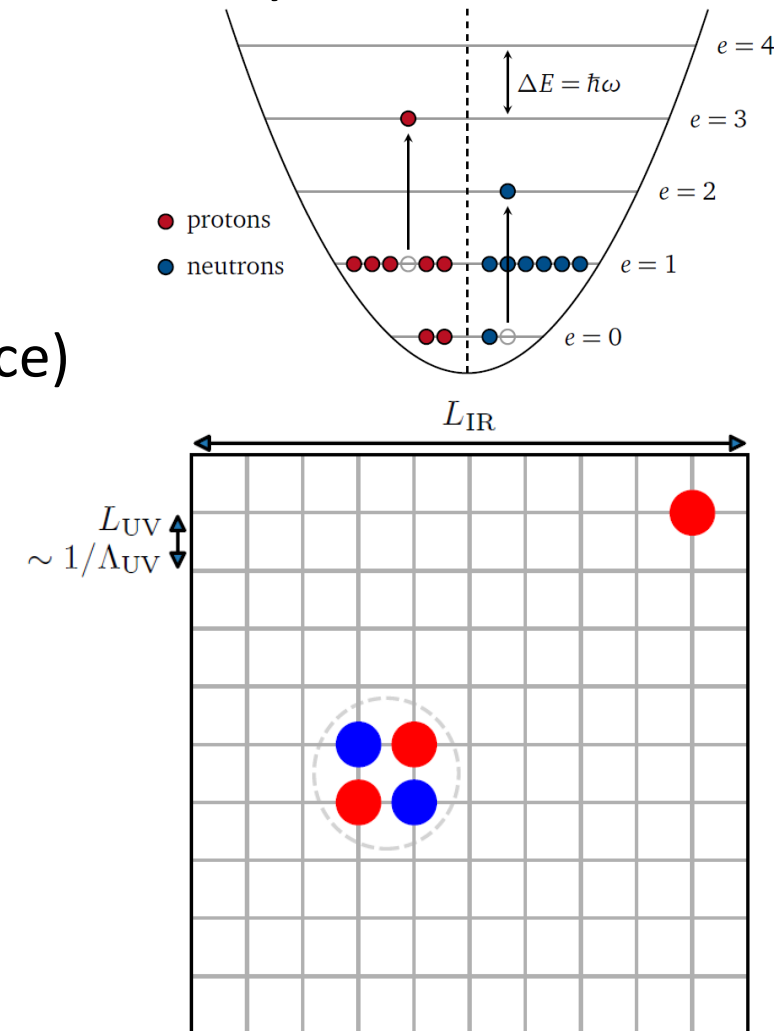
$$\sum_{i,j=0}^{+\infty} C_{i,j} (M_R \omega_T)^{2i} p^{2j} = U(E)$$

$$p^{2l+1} \cot \delta_l = \sum_{j=0}^{+\infty} C_{i=0,j} p^{2j}$$



# Imperfect expts: ab-initio calculations have truncations on Hilbert-space (regulator)

- Use two harmonic-oscillator-WF-based ab initio methods
  - NCSM :  $E < N_{\max} \omega$ ; IMSRG :  $e < e_{\max} \omega$
- Regulators modify both IR (long distance) and UV (short-distance) physics  $\rightarrow$  systematic errors
- To model the IR impact  $\rightarrow$  change U function
- To model the UV impact  $\rightarrow$  the extracted GERE parameters  $C_{i,j}$  depends on the resolution scale  $\Lambda_{uv}$
- $C_{i,j}(\Lambda_{uv}) \xrightarrow{\Lambda_{uv} \rightarrow \infty} \text{reality}$



Ok, does it work?

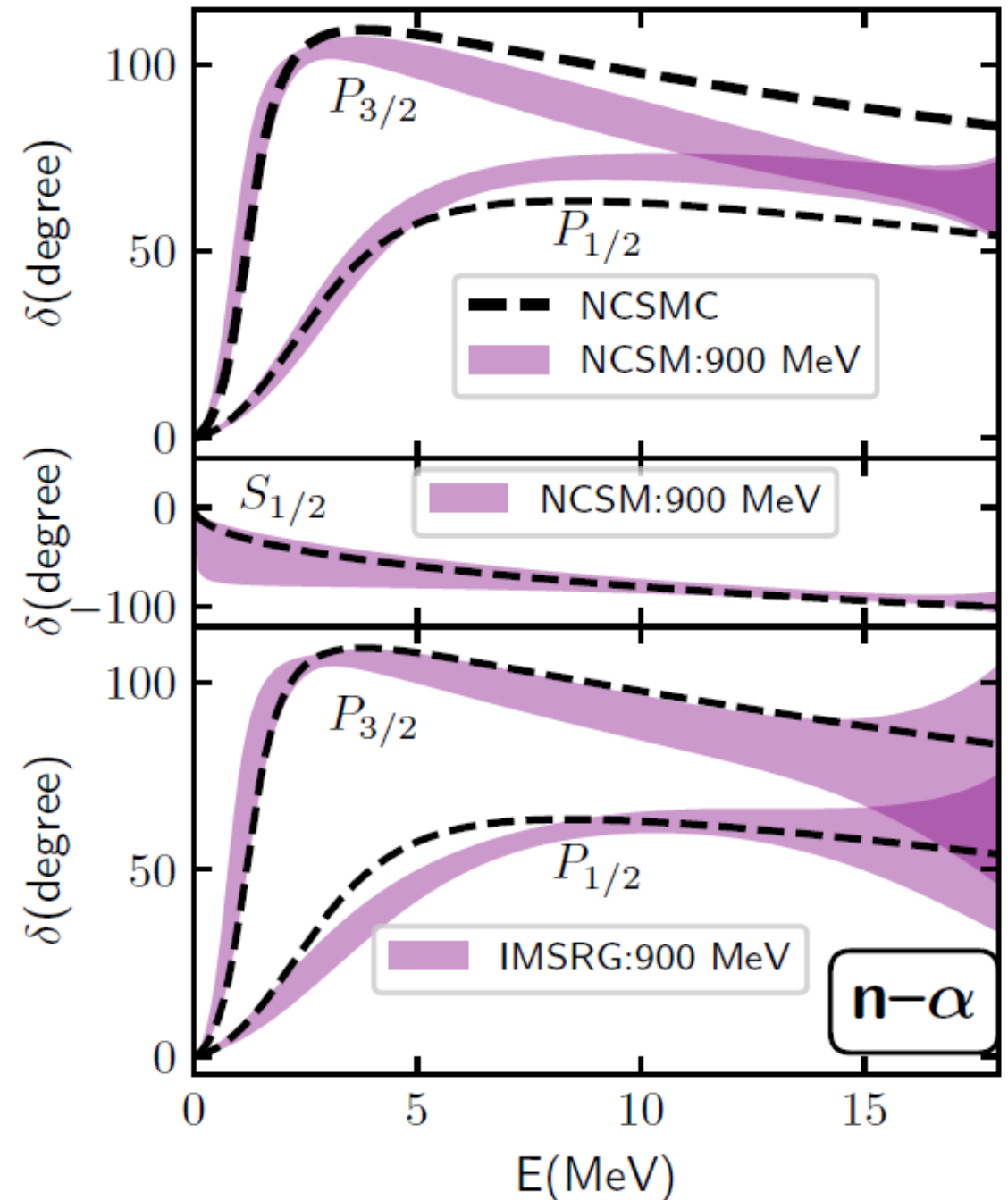
Two sets of results based on NCSM and IMSRG output



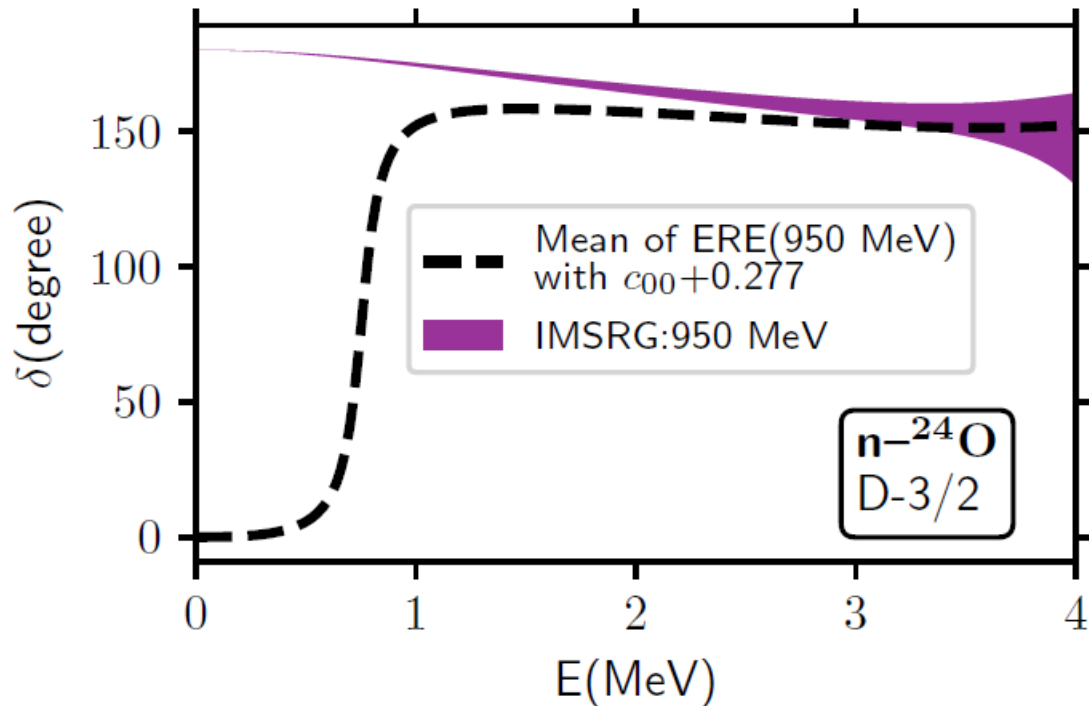
# n- $\alpha$ scatterings in s and p waves

- The NCSM extraction agrees with NCSMC below 5 MeV
- The IMSRG agrees with NCSMC in p-3/2 but not in p-1/2
- Results at different  $\Lambda_{uv}$

N: NCSM, IM: IMSRG,  
Dashed line: NCSM+continuum



# n-<sup>24</sup>O scattering in d-3/2 channel



- Exists a low-energy bound state with 75% prob. and  $BE = -1.4 \pm 0.54$  MeV
- Use the mean value of Cs(950 MeV) and increase  $C_{00}$  by about 0.28  $\rightarrow$  dashed curve (res. at 0.75 MeV and  $\Gamma = 135$  keV, close to expt. info.).
- **Tuning** nucleon int. could improve the prediction

# Summary and outlook I

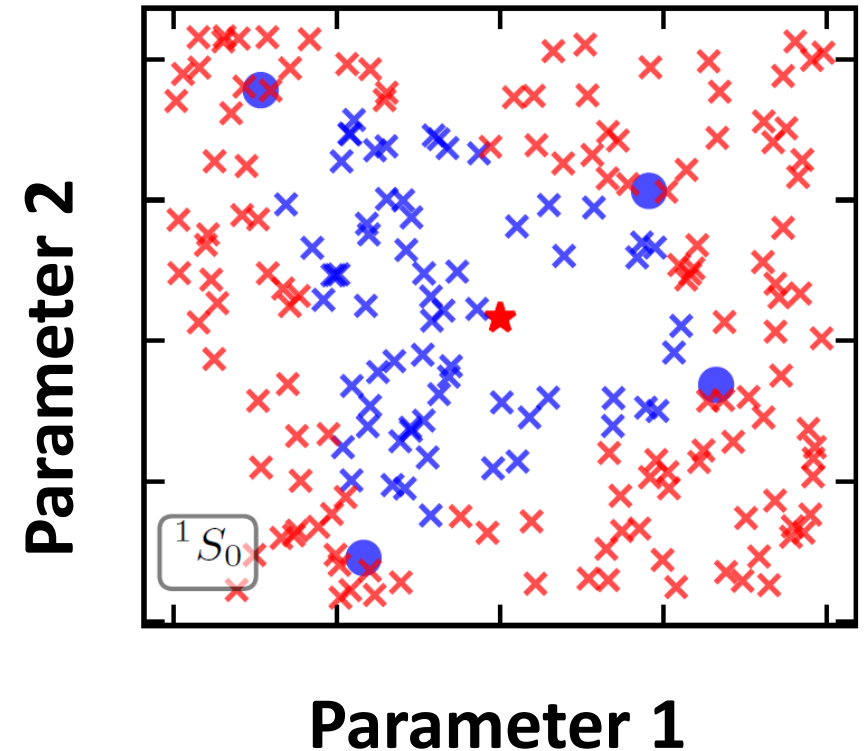
- The Luscher approach is modified for using traps
- Benchmarks:  $n$ - $\alpha$  scatterings
- Works for heavier systems heavier:  $n$ - $O_{24}$  scattering
- Report results as functions of UV resolution scale
  
- Reduce the error bars
- Generalization for charged-particle scattering and reactions
- Apply GFMC to compute trapped systems
- And...

How about three-cluster system?

Emulators could open one avenue.

# Emulator

- Compute model prediction many times in model fittings and error propagations (Bayesian inference and  $\chi^2$ )
- About  $10^6$  samplings in my various studies.
- A bottleneck issue: computation time
- Need efficient and accurate emulators for models (training points in blue dots)



# “Efficient emulators for scattering using eigenvector continuation”

R. J. Furnstahl, A. J. Garcia, P. J. Millican, and XZ ,  
*PLB* **809**, 135719 (2020) [ [2007.03635](#)]

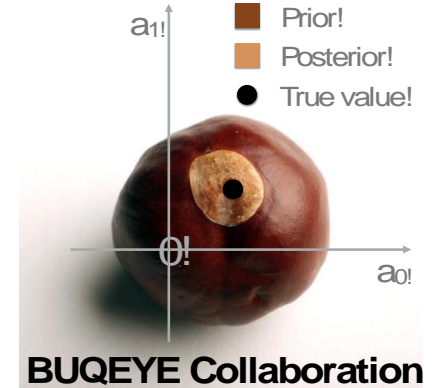
My S@INT seminar talk is available online.  
(<https://sites.google.com/uw.edu/int/seminars/sint>)  
Or search online for “INT seminar Xilin Zhang”.

# Bayesian inference in low energy nuclear phy.

One main paradigm since 90s:

QCD, LQCD  $\rightarrow$  Chiral EFT for NN and NNN ( $L(N, \pi; \mathbf{C})$ )

Study EFT  
truncation errors:  
infinite para. Space  
to finite one



Few-nucleon systems

- Bound state
- Scattering/reactions

Many-nucleon systems

- Compact nuclei
- Dripline nuclei
- scattering/reactions

<https://buqeye.github.io>

Bayesian Analysis of Nuclear  
Dynamics (BAND) Framework  
<https://bandframework.github.io/>

**Need emulators for  
bound state and  
scattering**

One main  
program



- Emulators could enable
- an ab initio calculation of scattering/reactions
  - Fit Chiral NN from LQCD

# Eigenvector continuation (EC)

D. Frame, et.al., *Eigenvector continuation with subspace learning*, *PRL* 121 (2018) 3, 032501

$$\hat{H}(\boldsymbol{\theta}) = \hat{T} + \hat{V}(\boldsymbol{\theta})$$

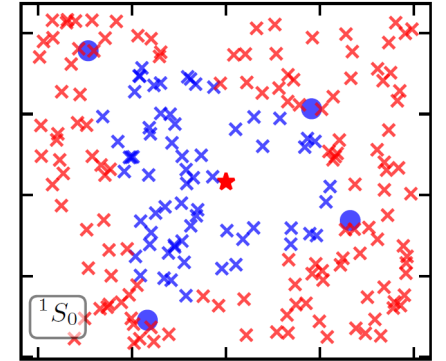
$$\hat{H}(\boldsymbol{\theta}_i) \rightarrow |\psi_{\text{gs}}(\boldsymbol{\theta}_i)\rangle$$

The traced wave functions (WFs) along  $\boldsymbol{\theta}$  trajectory in parameter space lives in a low-dimension space



# EC emulator for bound state calculations

$$|\psi_{\text{trial}}\rangle = \sum_{i=1}^{N_b} c_i |\psi_{\text{gs}}(\boldsymbol{\theta}_i)\rangle$$



$$\delta \left[ \langle \psi_{\text{trial}} | \hat{H}(\boldsymbol{\theta}) | \psi_{\text{trial}} \rangle - \lambda (\langle \psi_{\text{trial}} | \psi_{\text{trial}} \rangle - 1) \right] = 0$$

$$\sum_k (H_{jk} - \lambda N_{jk}) c_k = 0$$

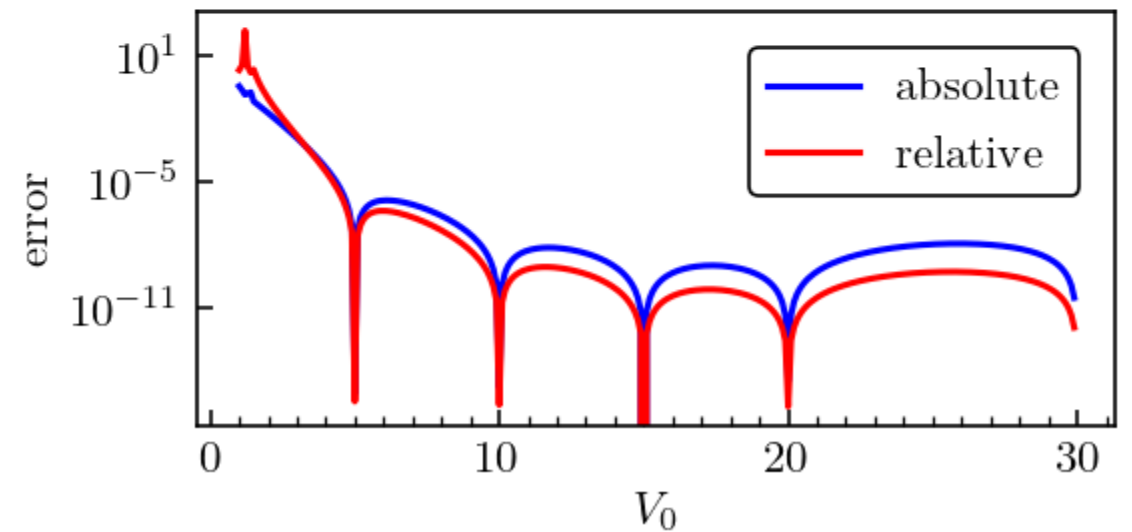
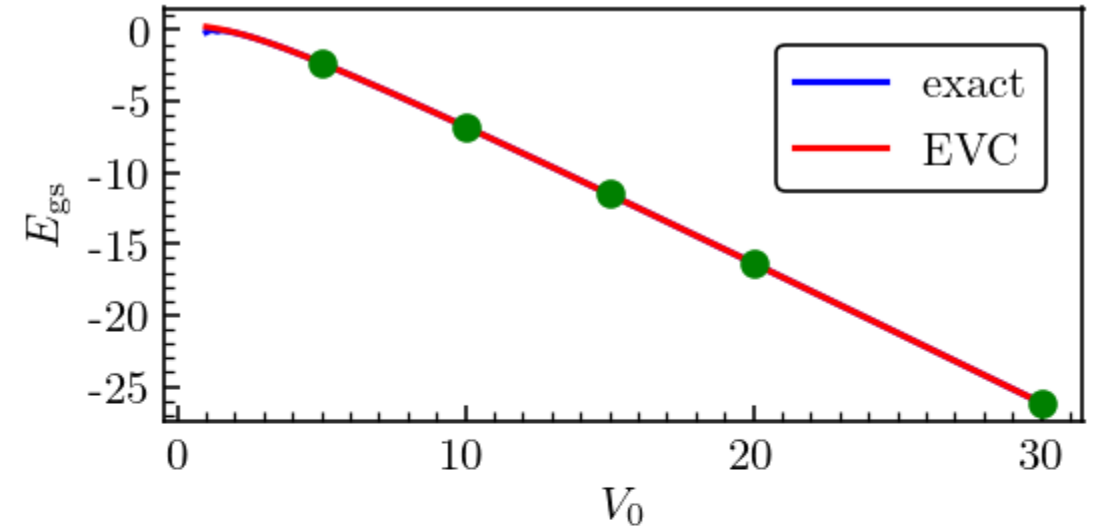
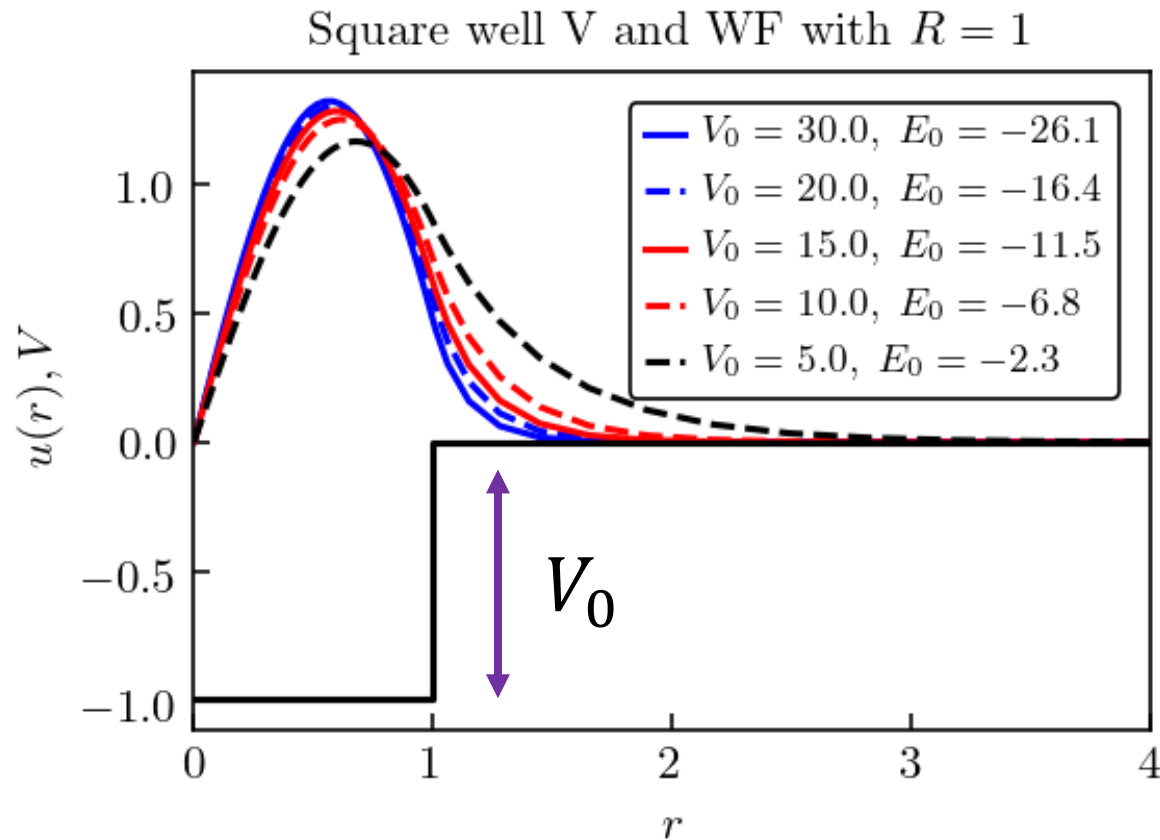
**$N_b$ -dim linear algebra**

$$H_{ij}(\boldsymbol{\theta}) \equiv \langle \psi_{\text{gs}}(\boldsymbol{\theta}_i) | \hat{H}(\boldsymbol{\theta}) | \psi_{\text{gs}}(\boldsymbol{\theta}_j) \rangle \quad \text{and} \quad N_{ij} \equiv \langle \psi_{\text{gs}}(\boldsymbol{\theta}_i) | \psi_{\text{gs}}(\boldsymbol{\theta}_j) \rangle$$

Ground state energy

Ground state WF

# EC emulator for bound state: square well



# EC emulator for bound state: many-body calculations

S. König, A. Ekström, K. Hebeler, D. Lee, A. Schwenk

*Eigenvector Continuation as an Efficient and Accurate Emulator for Uncertainty Quantification*

[arXiv:1909.08446](https://arxiv.org/abs/1909.08446)

A. Ekström and G. Hagen

*Global sensitivity analysis of bulk properties of an atomic nucleus*

*PRL* **123** (2019) 25, 252501, [1910.02922](https://arxiv.org/abs/1910.02922)

“about 1 Million sample in 16-dim space, 20 years calculation → 1 hour on a standard laptop.”

# Kohn variational method for scattering

$$\beta[u_t] = \tau_{\text{trial}} - \int_0^\infty dr u_t(r) D u_t(r)$$

$$D \equiv -\frac{d^2}{dr^2} + \frac{\ell(\ell+1)}{r^2} + U(r) - p^2$$

$$u_t(r) \xrightarrow{r \rightarrow \infty} \frac{1}{p} \sin(pr - \frac{1}{2}\ell\pi) + \tau_{\text{trial}} \cos(pr - \frac{1}{2}\ell\pi)$$

$$\beta[u_{\text{exact}}] = \frac{1}{p} [\tan \delta_\ell(E)]_{\text{exact}}$$

$$\delta\beta = \delta\tau - \int_0^\infty dr u_{\text{exact}}(r) D \delta u(r) + \mathcal{O}(\delta u^2) \quad \delta\beta = 0 + \mathcal{O}(\delta u^2)$$

# Emulators for two-body scattering: Kohn + EC

$$u_t(r) = \sum_i c_i u_i(r; E) \quad u_i : \text{scattering WFs of } \hat{H}(\theta_i)$$

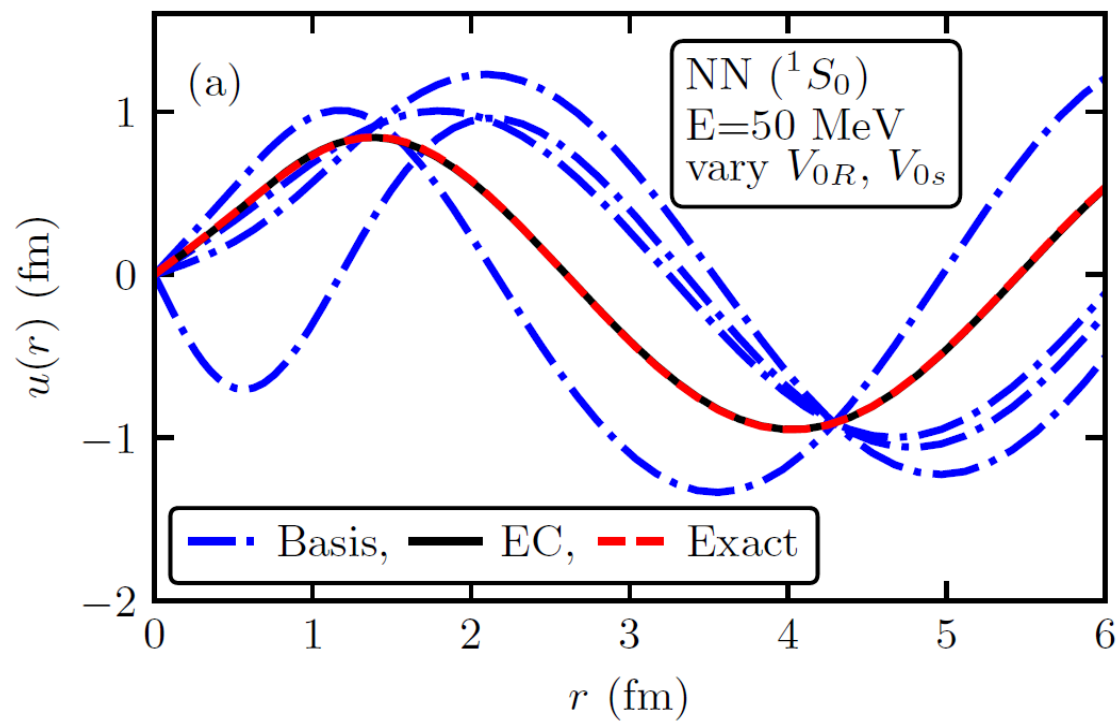
$$u_t(r) \xrightarrow{r \rightarrow \infty} \left( \sum_{i=1}^N c_i \right) \frac{1}{p} \sin(pr - \frac{1}{2} \ell \pi) + \left( \sum_{i=1}^N c_i \tau_i \right) \cos(pr - \frac{1}{2} \ell \pi)$$

$$\sum_j (\Delta U^\top + \Delta U)_{ij} c_j = \tau_i - \lambda$$

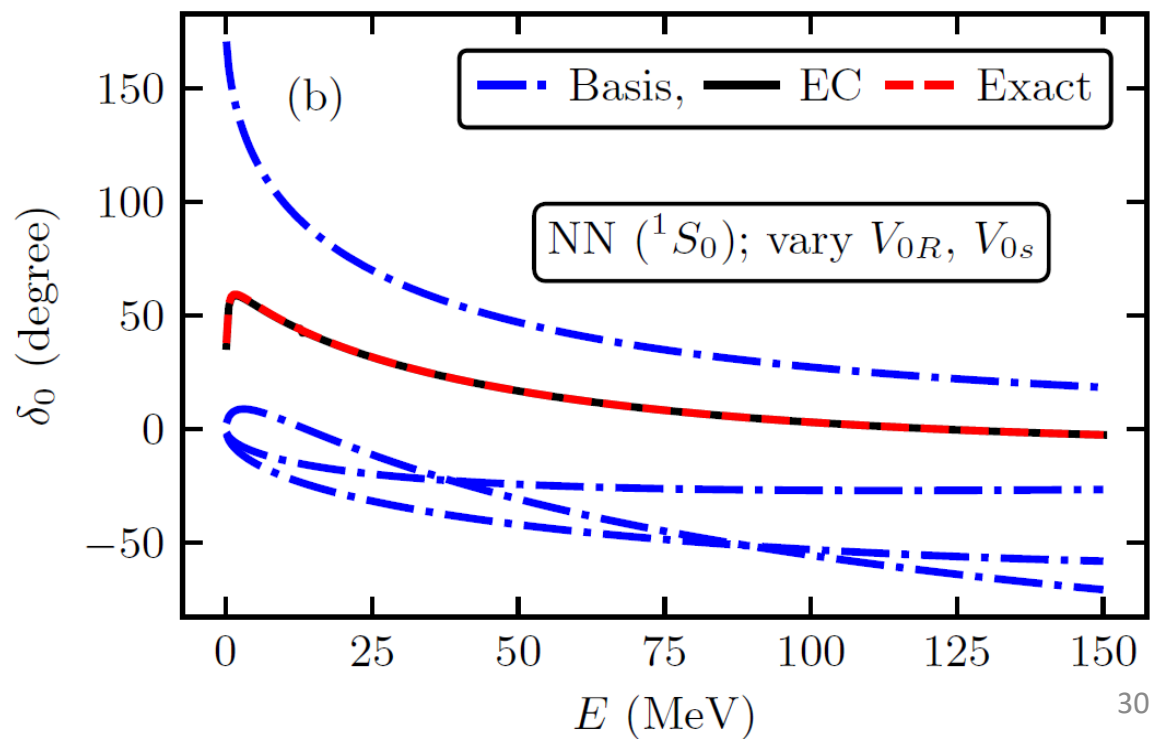
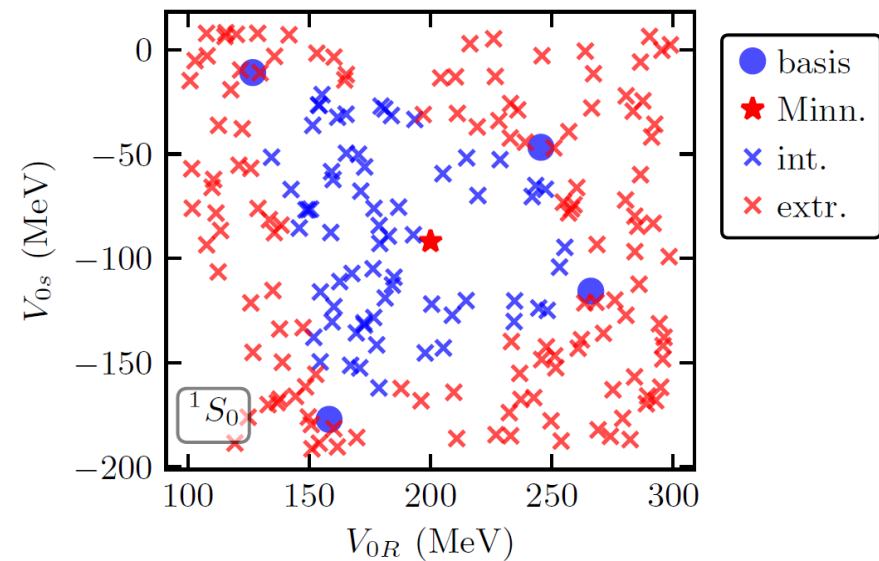
$$\Delta U_{jk} \equiv \int_0^\infty dr u_j(r; E) (2\mu) [V(r; \theta) - V_k(r)] u_k(r; E)$$

- $N_b$ -dim linear algebra
- The long-range part cancelled
- Reduce comp.

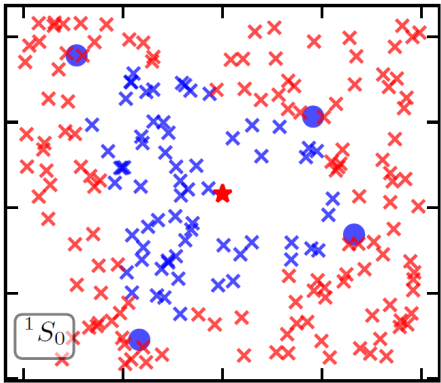
# Tests of the emulators: NN scattering



$$V_{1S_0}(r) \equiv V_{0R}e^{-\kappa_R r^2} + V_{0s}e^{-\kappa_s r^2}$$

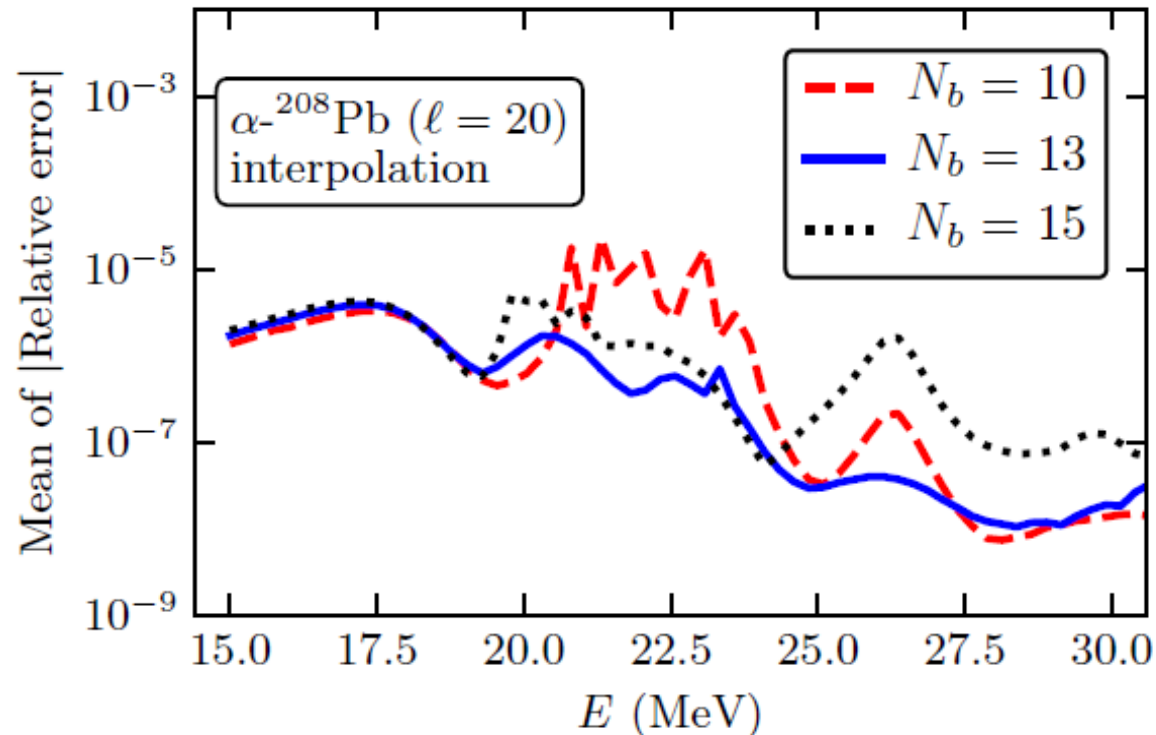


# Tests of the emulators: alpha-Pb scattering



$$V(r) = V_0 f(r, R_R, a_R) + iW_0 f(r, R_I, a_I)$$

Wood-Saxon form



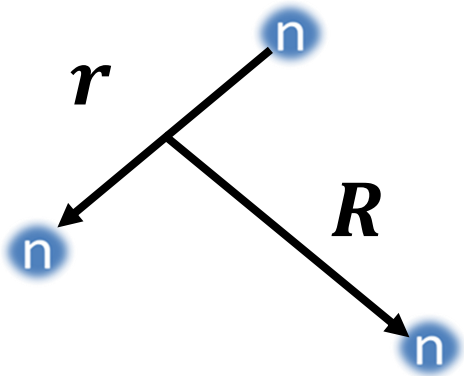
$$V_0 = -100 \text{ MeV} \quad W_0 = -10 \text{ MeV}$$

$$\theta_i = \{V_0, W_0\}$$

Vary parameters by +/- 50% around the “best” values.

Generalization to coupled channel is straightforward and ongoing.

# Generalization to three-body scattering: below breakup threshold



$$H = T_r + T_R + V_{2-body} + V_{3-body}$$

For indistinguishable particles:

$$\Psi(\mathbf{r}, \mathbf{R}) \xrightarrow{R \rightarrow \infty} \phi_b(\mathbf{r}) \left[ \frac{1}{P} \sin \left( PR - \frac{l\pi}{2} \right) + \tau \cos \left( PR - \frac{l\pi}{2} \right) \right]$$

$$\beta[\psi_t] = \tau_t - 2\mu \langle \psi_t | \hat{H}(\boldsymbol{\theta}) - E | \psi_t \rangle$$



# Generalization to three-body scattering: above breakup threshold

KOHN VARIATIONAL PRINCIPLE FOR THREE-PARTICLE SCATTERING\*

J. Nuttall

Texas A & M University, College Station, TX 77843

(Received 30 June 1968)

The Kohn variational principle is extended to apply to scattering above the breakup threshold of a two-particle bound state is broken up by a third particle.

Few-Body Systems 30, 39–63 (2001)

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Few-  
Body  
Systems

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PHYSICAL REVIEW D

VOLUME 5,

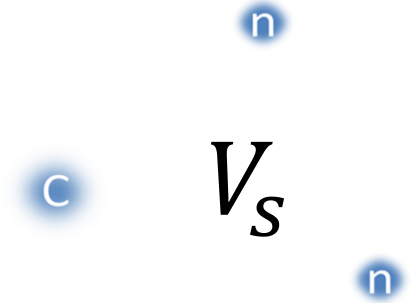
**Kohn-Type Variational Principle for**

M. Lieber,† Leonard Ros  
*Department of Physics, New York University*  
(Received 20 June 1968)

**The Kohn Variational Principle for Elastic  
Proton-Deuteron Scattering Above Deuteron  
Breakup Threshold\***

M. Viviani<sup>1,2</sup>, A. Kievsky<sup>1</sup>, and S. Rosati<sup>1,2</sup>

Fit three-cluster  $V_S$  to experimental data and  
ab initio results using EC emulators



Fit Chiral 3N force from data and LQCD results  
using EC emulators

PHYSICAL REVIEW

VOLUME 87, NUMBER 3

AUGUST 1, 1952

### Variational Methods for Periodic Lattices\*

W. KOHN†

*Carnegie Institute of Technology, Pittsburgh, Pennsylvania, and Institute for Theoretical Physics, Copenhagen, Denmark*

(Received April 21, 1952)

The problem of finding the propagating solutions of the Schrödinger equation in periodic lattices is formulated as a variational principle. This may be used as a starting point to establish the general properties of bands. Furthermore it is shown that by introducing various approximations into the variational principle, the chief existing approximation methods can all be derived from it. Improvements of these methods are suggested. Numerical illustrations are presented and the possibilities of the variational method for more accurate calculations of the energy bands of solids are discussed.

# Summary and outlook II

- The EC emulators for scattering are efficient and accurate in various two-body scattering cases
- Ongoing generalizations to 3-body systems (coupled-channels, too)
- Applications in fitting and error propagations:
  - Chiral 3N interactions against experimental data (e.g., Nd) and LQCD results
  - nuclear optical potentials against data
  - cluster-cluster interactions to ab initio calculations using traps