# Uses of eigenvector continuation in nuclear structure and reaction theory

## Sebastian König

ESNT Workshop: Eigenvector continuation and related techniques in nuclear structure and reaction theory

CEA Saclay, France, May 30, 2023



# Nuclear theory tower



- **QCD** = underlying theory of strong interaction
- **EFT** = effective description in terms of hadrons
- degrees of freedom depend on resolution scale

# Nuclear effective field theories

- choose degrees of freedom approriate to energy scale
- only restricted by symmetry, ordered by power counting

Hammer, SK, van Kolck, RMP 92 025004 (2020)

• ~> ab initio predictions with fully quantified uncertainties



- degrees of freedom here: nucleons (and clusters thereof)
- even more effective d.o.f.: rotations, vibrations

Papenbrock, NPA 852 36 (2011); ...

# Outline

Introduction <

**Emulators** 

Resummation

Outlook

# Part I

## **Efficient Emulators via Eigenvector Continuation**

# **Chiral interactions**

### Many remarkable results based on chiral potentials

• Chiral EFT: expand in  $(Q\sim M_\pi)/M_{
m QCD}$ , derive potential (2N, 3N, ...)

Weinberg (90); Rho (91); Ordoñez + van Kolck (92); van Kolck (93); Epelbaum et al. (98); Entem + Machleidt (03); ...



Hebeler et al., PRC 91 044001 (2015)

### However...

- potential expansion not necessarily consistent with EFT paradigm
- typically needs high orders  $\rightsquigarrow$  rather large number of parameters
  - e.g. 14 (two-body) + 2 (three-body) at third order

# Recap

Recall the general EC idea as presented earlier today...

# **Scenario**

- consider physical state (eigenvector) in a large space
- parametric dependence of Hamiltonian H(c) traces only small subspace

## Prerequisite

- smooth dependence of H(c) on c
- enables analytic continuation of  $|\psi(c)
  angle$  from  $c_{\mathrm{easy}}$  to  $c_{\mathrm{target}}$

# **Procedure**

- calculate  $|\psi(c_i)\rangle$ ,  $i = 1, \dots N_{\rm EC}$  in "easy" regime
- solve generalized eigenvalue problem  $H|\psi
  angle=\lambda N|\psi
  angle$ 
  - $H_{ij} = \langle \psi_i | H(c_{ ext{target}}) | \psi_j 
    angle$
  - $\blacktriangleright N_{ij} = \langle \psi_i | \psi_j \rangle$
- particular case of a reduced basis method

Bonilla et al., PRC 106 054322; Melendez et al., JPG 49 102001 talk by Pablo on Thursday, talk by Kyle on Friday



Martin Grandjean, via Wikimedia Commons (CC-AS 3.0)



talk by Dean

# Need for emulators

### 1. Fitting of LECs to few- and many-body observables

- common practice now to use A>3 to constrain nuclear forces, e.g.:
  - JISP16, NNLO<sub>sat</sub>,  $\alpha$ - $\alpha$  scattering

Shirokov et al., PLB 644 33 (2007); Ekström et al., PRC 91 051301 (2015); Elhatisari et al., PRL 117 132501 (2016)

• fitting needs many calculations with different parameters

### 2. Propagation of uncertainties

- statistical fitting gives posteriors for LECs
- LEC posteriors propagate to observables
  - typically achieved via Bayesian statistics
     Wesolowski et al., JPG 46 045102 (2019)
- need to sample a large number of calculations
  - expensive already in few-body sector
  - typically not doable for many-body problems!



Exact calculations can be prohibitively expensive!

# **Emulators**

• an emulator (also called surrogate model) can help overcome this problem!

### **Options for emulator construction**

- Multi-dimensional Polynomial Interpolation
  - simplest possible choice
  - generally too simple, no way to assess uncertainty
- Gaussian Process (GP)



Ekström et al., JPG **46** 095101 (2019)

- statistical modeling, iteratively improvable
- interpolation with inherent uncertainty estimate
- Eigenvector Continuation
  - ► typically fast, efficient, and accurate!

# Hamiltonian parameter spaces

• original EC: single parameter, H = H(c)

• consider a Hamiltonian depending on several parameters:

$$H = H_0 + V = H_0 + \sum_{k=1}^d c_k V_k$$
 (1)

- ▶ in particular, V can be a chiral potential with LECs  $c_k$
- Hamiltonian is element of d-dimensional parameter space
- convenient notation:  $ec{c} = \{c_k\}_{k=1}^d$
- ▶ typical for  $\mathcal{O}(Q^3)$  calculation: 14 two-body LECs + 2 three-body LECs

Frame et al., PRL **121** 032501 (2018)

# **Chiral interactions**

### Many remarkable results based on chiral potentials

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m QCD}$ , derive potential (2N, 3N, ...)

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### **Generalized EC**

- EC construction is straightforward to generalize to this case:
- simply replace  $c_i 
  ightarrow ec{c}_i$  in construction
  - $|\psi_i
    angle=|\psi(ec{c}_i)
    angle$  for  $i=1,\cdots N_{
    m EC}$
  - F  $H_{ij} = \langle \psi_i | H(ec{c}_{ ext{target}}) | \psi_j 
    angle$ ,  $N_{ij} = \langle \psi_i | \psi_j 
    angle$
- the sum in Eq. (1) can be carried out in small (dimension  $= N_{
  m EC}$ ) space!
  - ► this permits an **offline/online decomposition** of the problem

Frame et al., PRL **121** 032501 (2018)

# Interpolation and extrapolation

## Hypercubic sampling

- want to cover parameter space efficiently with training set  $S = \{ \vec{c}_i \}$
- Latin Hypercube Sampling can generate near random sample
- for examples that follow:
  - ullet sample each component  $c_k \in [-2,2]$
  - vary d LECs, fix the rest at NNLO<sub>sat</sub> point

Ekström et al., PRC **91** 051301 (2015)

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### **Convex combinations**

- distinguish interpolation and extrapolation target points
- interpolation region is convex hull of the  $\{\vec{c}_i\}$ 
  - $\operatorname{conv}(S) = \sum_i lpha_i ec{c}_i$  with  $lpha_i \geq 0$  and  $\sum_i lpha_i = 1$
- extrapolation for  $ec{c}_{ ext{target}} 
  ot \in \operatorname{conv}(S)$
- EC emulators can handle both!



Ekström et al., PRC 91 051301 (2015)

### **Cross validation**

- compare emulation prediction agains exact result for set  $\{\vec{c}_{\text{target},j}\}_{j=1}^N$
- underlying calculation: Jacobi NCSM Ekström
  - Ekström implementation of Navratil et al., PRC 61 044001 (2000)
- observable: <sup>4</sup>He ground-state energy
- transparent symbols indicate extrapolation targets



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# Performance comparison: radius

### **Operator evaluation**

- generalized eigenvalue problem
- EC gives not only energy, but also a continued wavefunction
- straightforward (and inexpensive) to evaluate arbitrary operators



# EC uncertainty estimate

- EC is a variational method
  - projection of Hamiltonian onto a subspace
  - dimension of this subspace determines the accuracy
  - excellent convergence properties

Sarkar+Lee, PRL 126 032501 (2021)

### Bootstrap approach

- construct a training data set larger than necessary
- sample different training data sets, take mean and standard deviation



# Application: correlation analysis

- take  $10^4$  LEC samples 10% around NNLO<sub>sat</sub> point, correlate different observables
  - known energy-radius correlation well reflected
  - $\blacktriangleright$  <sup>2</sup>H radius only gives lower bound for <sup>4</sup>He radius



• already this kind of analysis would be very expensive without EC!

# EC emulators have since been extended in various ways

Let's look at a few!

# Subspace-projected coupled cluster method

- coupled cluster (CC) is a well established and powerful many-body technique
  - ► based on non-unitary similarity transformation of the Hamiltonian

$$ar{H}(ec{lpha}) = \mathrm{e}^{-T(ec{lpha})} H(ec{lpha}) \mathrm{e}^{T(ec{lpha})}$$

- the cluster operator  $T(\vec{\alpha})$  is truncated in the space of particle-whole excitations
- ► eigenvector continuation was developed for this non-Hermitian scenario

talk by Gaute tomorrow Ekström+Hagen, PRL **123** 252501 (2019)

### **Application: Global Sensitivity Analysis**





- study sensitivity of  $^{16}\mathrm{O}$  ground state to individual LECs
- plot based on >1 million emulator evaluations!
- recent extension to nuclear matter calculations Jiang et al., arXiv:2212.13216

# Scattering observables

- different methods have been developed to apply EC to scattering calculations
- this is particularly relevant for LEC fitting, that is primarily based on scattering data

### EC via Kohn variational principle

Furnstahl et al., PLB 809 135719 (2020)

- consider Hamiltonian  $H = H(\boldsymbol{\theta})$ , training points  $\boldsymbol{\theta}_i$
- trial wave function  $|\psi_{ ext{trial}}
  angle = \sum_i c_i \psi_E(oldsymbol{ heta}_i)
  angle$  for energy E>0
- the condition that

$$eta\left[|\psi_{ ext{trial}}
ight
angle ]\equiv au_{ ext{trial}}-2\mu\langle|\psi_{ ext{trial}}|H(oldsymbol{ heta})-E|\psi_{ ext{trial}}
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should be stationary yields solutions for the  $c_i$ 

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talk by Xilin on Thursday

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### **Extensions and generalizations**

- Newton's variational principle makes it possible to use trial scattering matrices
   instead of trial wave functions
   Melendez et al., PLB 821 136608 (2021)
- the approach has been extended to three-body scattering

#### a momentum-space formulation makes it possible to mitigate problems due to so-called Kohn anomalies Zhang+Furnstahl, PRC 105 064004 (2022) Garcia et al., PRC 107 054001 (2023)

• alternative strategy: simultaneous evaluation of multiple boundary conditions

talk by Christian tomorrow Drischler et al., PLB 821 13677 (2021)

# Resonances

- many states in nuclear physics are resonances
  - ► i.e., metastable states with a finite lifetime to decay
- in stationary scattering theory, resonances are described as generalized eigenstates
  - S-matrix poles at comples energies  $E=E_R-{
    m i}\Gamma/2$  (lifetime  $\sim 1/\Gamma$ )
  - ▶ wave functions are not normalizable (exponentially growing in *r*-space)

### **Resonance continuation**

• one way to circumvent this problem is the complex scaling method:

$$r 
ightarrow {
m e}^{{
m i} \phi} r \;\;,\;\;\; p 
ightarrow {
m e}^{-{
m i} \phi} p$$

- along the rotated contour, resonance wave functions become normalizable
- formalism changes the inner product!
- eigenvector continuation has been extended to this scenario

Yapa, SK, Fossez, 2303.06139 [nucl-th] talk by Nuwan on Friday



### **R**-matrix formalism for fusion observables

- use of calculable R-matrix formalism with boundary condition to simulate absorption Bai+Ren, PRC **103** 014612 (2021); Bai, PRC **106** 024611 (2022)
- EC applied based on solutions of the Bloch-Schrödinger equation
  - based on previously mentioned EC scattering developments

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### Single-neutron spectra of heavy nuclei Anderson et al., PRC 106 L031302 (2022)

- spherical mean-field Hamiltonian tuned to reproduce an energy density functional
- prescription to train an emulator that discribes simultaneously all spherical nuclei

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### More structure emulators

• use EC as emulator and Lanczos preprocessor for shell-model calculations

talk by Yoshida-san tomorrow Yoshida+Shimizu, PTEP 2022 053D02

• collectivity and clustering via symmetry-adapted NCSM Becker et al., FP 11 1064601

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### **Pairing Hamiltonian**

- exactly solvable model for nuclear supefluidity
- also uses EC as a resummation tool  $\rightarrow$  next part of this talk

Companys Franzke et al., arXiv:2302.08373

talk by Margarida on Friday

# Part II

### Accurate Resummation via Eigenvector Continuation

• consider a Hamiltonian diagonalized in a (small) subspace

$$H=egin{pmatrix} H_{\phi\phi} & H_{\phi\psi}\ H_{\psi\phi} & H_{\psi\psi} \end{pmatrix}$$

 $N_0 = \dim H_{\phi\phi} \ll \dim H = N_1$ 

 $H_{\phi\phi}= ext{diag}(\{\lambda_i\}_{i=1, dots N_0})$ 



- factor out large number X from diagonal entries of  $H_{\psi\psi}$
- perturbative expansion for lowest eigenvalue and vector

$$|\psi
angle = \sum_{n=0}^{\infty} X^{-n} \left( \sum_{i=1}^{N_0} lpha_i^{(n)} |\phi_i
angle + \sum_{j=N_0+1}^{N_1} lpha_j^{(n)} |\psi_j
angle 
ight) \;,\; E = \sum_{n=0}^{\infty} X^{-n} E^{(n)}$$

• matching powers gives coupled recursive expressions for  $\alpha_i^{(n)}$  and  $E^{(n)}$ 

Diagonalizing a small space can still be too expensive...

### Diagonalizing a small space can still be too expensive...

- actually, a partial diagonalization *per se* is still doable ( $\rightarrow$  Lanczos)
- but transforming the Hamiltonian is problematic...



- cost for adjusting off-diagonal elements is significant
  - ▶ scales with size of the full (large) space

### Simplest case

- start from one-dimensional space  $(N_{
  m max}=0)$ 
  - ► i.e., directly use the given Hamiltonian



• this is equivalent to a simple (many-body) perturbation theory expansion

• 
$$H_0 |\Phi^{(0)}
angle = E^{(0)} |\Phi^{(0)}
angle$$
: orthonormal basis,  $H(c) = H_0 + c H_1$   
•  $|\Psi_P(c)
angle = \sum_{p=0}^P c^p |\Phi^{(p)}
angle$ , want  $c = 1, P o \infty \implies E = E^{(0)} + E^{(1)} + \cdots$ 

# Failure of perturbation theory

# <sup>3</sup>H NCSM calculation, $N_{\rm max} = 12$ model space

• EMN N3LO 500 interaction, plus SRG evolution

Entem et al., PRC 96 024004 (2017)



#### perturbation theory does not converge!

- however, interaction clearly "more perturbative" for small SRG  $\lambda$
- $\blacktriangleright$  convergence perhaps for very small  $\lambda$
- **note:** the situation can be somewhat improved with better reference states

A. Tichai, private communication

# Resummation via eigenvector continuation

- span space by the wavefunction corrections  $|\Phi^{(p)}
  angle$
- evaluate Hamiltonian between these states
- i.e., use energy and wavefunction information



- this uses the same input as PT, but now the series converges!
  - rapid convergence to the correct result!
  - ▶ smooth behavior, significant oscillations are gone

# Continued perturbation theory

• let's recap what exactly we have done:

### **General setup**

- $H = H_0 + c \, H_1$ , EC-extrapolate to c = 1
- $\bullet\,$  perturbation theory converges for sufficiently small  $c\,$

$$\begin{pmatrix} |\Psi_{P}(c_{1})\rangle \\ |\Psi_{P}(c_{2})\rangle \\ \vdots \\ |\Psi_{P}(c_{N_{\rm EC}})\rangle \end{pmatrix} = \begin{pmatrix} 1 & c_{1} & c_{1}^{2} & \cdots & c_{1}^{P} \\ 1 & c_{2} & c_{2}^{2} & \cdots & c_{2}^{P} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & c_{N_{\rm EC}} & c_{N_{\rm EC}}^{2} & \cdots & c_{N_{\rm EC}}^{P} \end{pmatrix} \begin{pmatrix} |\Phi^{(0)}\rangle \\ |\Phi^{(1)}\rangle \\ \vdots \\ |\Phi^{(P)}\rangle \end{pmatrix}$$

### **Eigenvector continuation**

Demol, SK, et al., PRC **101** 041302(R) (2020)

- assume we have eigenvetors for some set  $\{c_i\}_{i=1}^{N_{
  m EC}}$  of such c
- linear combinations of perturbative corrections up to order P
- we can instead use the perturbative corrections directly as EC basis!

# Application to larger systems

# Consider <sup>18</sup>O in Bogoliubov MBPT as example

- break particle number conservation in reference state
- restore average particle number to target value at each order
- perturbation theory under constraint

Demol et al., Annals Phys. 424 168358 (2021)

talk by Pepijn on Thursday

- for proof of principle study, consider a very limited model space
  - one-body cutoff at  $e_{\max}=2n+l=4$
  - symmetry-broken Hartree-Fock-Bogoliubov reference state
  - ► two-, four-, and selected six-quasiparticle excitations on top
- recursive theme makes it possible to go high orders P
  - $\blacktriangleright$  realistic in practice with larger model spaces:  $P\leq 3$

# Application to larger systems

### Results

- EM500 interaction
- SRG evolved to  $\lambda=2.0{
  m fm}^{-1}$
- full CI calculation as reference
- compare various methods
  - simple perturbation theory
  - eigenvector continuation
  - Padé resummation



- EC is accurate and reliable
- Padé becomes erratic at high orders

• recent further application: EC resummation for pairing Hamiltonian

talk by Margarida on Friday Companys Franzke et al., arXiv:2302.08373

 $\lambda = 2.0 \, \mathrm{fm}^{-1}$ 



Demol, SK, et al., PRC 101 041302(R) (2020)

# **Outlook**

# Finite-volume eigenvector continuation

- finite-volume spectra encode infinite-volume properties Lüscher, CMP 104 177 (1986); ...
- resonances can be identified from avoided crossings in finite-volume spectra Wiese, NPB (Proc. Suppl.) **9** 609 (1989), Klos, SK et al., PRC **98** 034004 (2018)
- to find/exclude low-energy resonances, one needs many calculations in large boxes
- this comes with a substantial numerical cost
- finite-volume eigenvector continuation can be used to mitigate this
  - extrapolation/interpolation across substantial volume ranges
  - ► parametric dependence directly in basis

talk by Nuwan on Friday



# Quantum computing and chemistry

• EC has found new exciting applications outside nuclear physics

cf. also talk by Andreas earlier today

### Subspace diagonalization

Francis et al., arXiv:2209.10571

- quantum-classical hybrid method
- Hamiltonian projected to a smaller subspace
- ideal scenario to apply EC!
  - extension to space of unitary matrices that

generate states



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### **Potential energy surfaces**



 $|\phi_2\rangle$   $|\phi_3\rangle$ 

 $|\phi_1\rangle$ 

Mejuto-Zaera+Kemper, arXiv:2305.00060

- application to full configuration interaction of molecular orbitals
- involves inner products between separate sets of atomic orbitals
  - similar to basis matching in FVEC!
- accurate results for pot. energy surfaces with moderate number of training points
  - demonstrates access to excited states

cf. also Companys Franzke et al., arXiv:2108.02824

Francis et al., arXiv:2209.10571

 $|\phi_k\rangle = U_k|0\rangle$ 

# Summary and outlook

### **Eigenvector continuation as efficient emulator**

- highly competitive, accurate and efficient
- can both interpolate and extrapolate from training sets
- possible to provide extrapolation uncertainty estimates
- broadly applied to nuclear structure and reactions

### **Eigenvector continuation as resummation tool**

- possible to effectively tame divergent expansion coefficients
- interesting as computational method
- applications to finite nuclei and nuclear matter models

### More exciting applications and surely more to come!

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Thanks very much for your attention!

Backup slides

# NCSM EC emulator: computational cost

#### • setup of EC subspace basis

- combination of Hamiltonian for given  $\vec{c}_i$ , Lanczos diagonalization
- ullet total cost  $=M^2 imes (2n+N_{
  m mv})$  flops
- calculation of norm matrix:  $2n^2M$  flops
- reduction of Hamiltonian parts:  $(d+1) imes (2nM^2 + 2n^2M)$  flops
- cost per emulated sample point
  - combination of Hamiltonian parts in small space:  $2dn^2$  flops
  - ▶ orthogonalization + diagonalization:  $26n^3/3 + \mathcal{O}(n^2)$  flops

 $M = M(N_{\rm max})$ : model-space dim., n: training data, N: samples,  $N_{\rm mv}$ : matrix-vector prod. (Lanczos)

### Example

- $N_{\rm max} = 16$
- d=16,  $N_{
  m EC}=64$
- max. speed-up factor  $\sim 600$



# **Complete correlation analysis**



**Reverse SRG Evolution** 

# Similarity Renormalization Group (SRG)

- nuclear potentials (from EFT or otherwise) can be difficult to handle numerically
- unitary transformation of Hamiltonian:  $H \to H_\lambda = U_\lambda H U_\lambda^\dagger \rightsquigarrow V_\lambda$  -decouple low and high momenta at scale  $\lambda$



R. Furnstahl, HUGS 2014 lecture slides

- interaction becomes more amenable to numerical methods...
- ...at the cost of induced many-body forces!



Bogner et al., PPNP 65 94 (2010)



# SRG evolution = ODE solving

$$rac{\mathrm{d} H_s}{\mathrm{d} s} = rac{\mathrm{d} V_s}{\mathrm{d} s} = [[G,H_s],H_s]$$
,  $\lambda = 1/s^{1/4}$ 

ordinary differential equation ensures smooth parametric dependence

### $\hookrightarrow$ SRG evolution satisfies EC prerequisites!

# **Reverse SRG**

### Consider A = 3,4 test cases

• EMN N3LO(500) interaction, Jacobi NCSM calculation

Entem et al., PRC 96 024004 (2017); A. Ekström implementation of Navratil et al., PRC 61 044001 (2000)

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- possible to extrapolate back from small  $\lambda$  to bare interaction
- information about missing many-body forces in wavefunctions
  - not in any single wavefunction, but in how they change

# Mind the gap

### Still no free lunch, however...

- EC is a variational method
- cannot go beyond what bare interaction gives in same model space!

