

High-Performance Computing for Nuclear Physics

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James P. Vary 80th Jubilee
Planet Earth, June 05, 2023

Hadrons: Relativistic Quantum Field Theory

▶ Lattice QCD

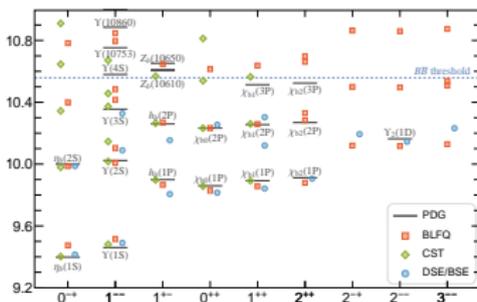
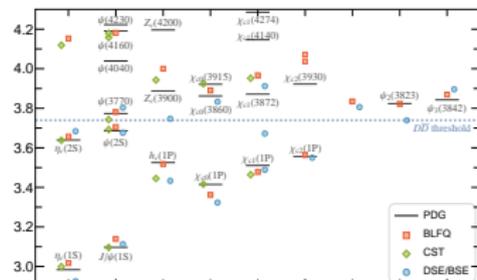
- ▶ highly efficient computational methods and implementations thanks to decades of code development and optimization by dedicated computational scientists

▶ Dyson–Schwinger Equations

- ▶ Dynamical Chiral Symmetry Breaking pions emerge as Goldstone bosons
- ▶ Bethe–Salpeter Eqn for mesons
- ▶ Relativistic Faddeev Eqn for baryons
- ▶ Spectra, decay constants, form factors

▶ Light-front methods

- ▶ Direct access to light-front observables
- ▶ Discrete Light-Cone Quantization
- ▶ **Basis Light-Front Quantization**



Gross *et al*, 50 Years QCD, 2212.11107 [hep-th]

Nuclei: Nonrelativistic Quantum Mechanics

▶ Few-Body methods

- ▶ Faddeev Equation for $A = 3$ system
 - ▶ typically in momentum space
- ▶ Faddeev–Yakubosky Equations for $A = 4$ systems
 - ▶ can nowadays be pushed to $A = 5$ and 6
- ▶ Hyperspherical Harmonics
 - ▶ up to $A = 6$

▶ Many-Body methods

- ▶ Monte-Carlo methods
- ▶ Nuclear Lattice Simulations
- ▶ Configuration Interaction (CI) methods
 - ▶ Valence-Space Shell Model
 - ▶ **No-Core Shell Model (NCSM)**
 - ▶ In-Medium Similarity Renormalization Group (IM-SRG)
 - ▶ Coupled Cluster (CC)
- ▶ Self-Consistent Green's Function (SCGF) methods
- ▶ Many-Body Perturbation Theory (MBPT)
- ▶ Density Functional Theory (DFT)
- ▶ ...

Computational resources: Moore's Law

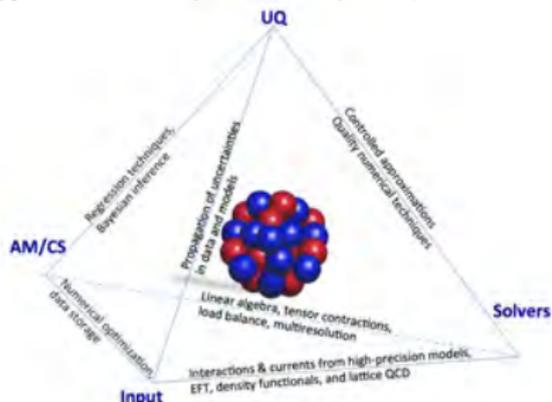
All computational methods benefit from High-Performance Computing
Highly nontrivial to achieve good performance

- ▶ Multi-level parallelism
 - ▶ Distributed memory
MPI between nodes
 - ▶ Shared memory
OpenMP multi-threading
 - ▶ Accelerators (GPUs)
- ▶ Increasing performance gap between processing and memory performance
- ▶ **Need to collaborate with applied mathematicians and computer scientists**



SciDAC

- ▶ Partnerships between DOE Office of Advanced Scientific Computing Research and DOE Domain Science programs
- ▶ Five-year collaborative grants, created in/around 2000
- ▶ Currently in 5th cycle
- ▶ Three SciDAC-5 programs in Nuclear Physics
 - ▶ Femtoscale Imaging of Nuclei using Exascale Platforms (Cloët)
 - ▶ Fundamental nuclear physics at the exascale and beyond (Edwards)
 - ▶ Nuclear Computational Low Energy Initiative (NUCLEI) (Papenbrock)
- ▶ **James Vary** and **Esmond Ng** (AM/CS, LBNL) played essential role in creating successful SciDAC-2 UNEDF proposal in 2006
- ▶ UNEDF evolved to NUCLEI



UNEDF (2007–2012), NUCLEI (2012–2017; 2017–2022; 2022–2027)



UNEDF SciDAC Collaboration Universal Nuclear Energy Density Functional

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Color denotes:

- Physics
- Computer Science & Applied Mathematics



About People Science Deliverables Tools Internal Links

Participating Institutions and Investigators (SciDAC-5)

[Color denotes **Physics** or **Computer Science & Applied Mathematics**

Postdocs are indicated by (p) and graduate students by (g); all others are faculty or laboratory staff.]

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For more information on NUCLEI, please contact ipacmor@utk.edu

Early-Science Projects

- ▶ **Collaboration with Computer Scientists** to port and optimize select codes to next-generation HPC hardware
 - ▶ Support from HPC centers and hardware vendors
 - ▶ Early access to proto-type and/or actual production hardware
 - ▶ New hardware & software not necessarily stable: finding and reporting bugs is 'part of the job'
- ▶ **Early-Science Projects for Many-Fermion-Dynamics-nuclear**
 - ▶ Pre-2007: Distributed parallel only, using MPI
 - ▶ **Early Science Project for Jaguar @ ORNL, 2008 – 2010**
 - ▶ Implementing hybrid MPI/OpenMP in MFDn
PM, Vary, Navratil, Ormand, Nam, and Dean,
Origin of the anomalous long lifetime of ^{14}C , PRL106, 202502 (2011)
 - ▶ **NESAP for Cori-KNL @ NERSC, 2014 – 2017**
 - ▶ Expose at least two levels of parallelism in inner-loops, such that most inner-loop can be vectorized on KNL
 - ▶ **NESAP for Perlmutter-GPU @ NERSC, 2019 – 2022**
 - ▶ Port to GPUs using OpenACC target offload

Collaborating with AM/CS

- ▶ **Both SciDAC and Early Science Projects resulted in significant performance improvements**
- ▶ SciDAC also resulted in algorithmic improvements
- ▶ Early Science Projects: focus on hard-ware specific performance
 - ▶ often also leads to performance improvements on other hardware
- ▶ **Building long-term personal connections** with applied mathematicians and computer scientists
 - ▶ collaborating with Esmond Ng and Chao Yang for nearly 20 years
 - ▶ ongoing collaboration with former postdocs
- ▶ **Taken seriously** in design criteria for future HPC platforms
Evaluating the Potential of Disaggregated Memory Systems for HPC applications, Nan Ding, PM, Hai Ah Nam, *et al.*, submitted for publication
 - ▶ performance consequences of having modest memory on each compute node, with separate memory banks for codes that need it
 - ▶ **Hai Ah Nam**, now project director for NERSC-10
<https://www.nersc.gov/systems/nersc-10/>

Computational Challenges

- ▶ **Self-bound quantum many-body problem**, with $3A$ degrees of freedom in coordinate (or momentum) space, as well as spin degrees of freedom
- ▶ **Strong interactions**, with both short-range and long-range pieces
- ▶ Not only 2-body interactions, but also **intrinsic 3-body interactions** and possibly 4- and higher N -body interactions
- ▶ **Uncertainty quantification** for calculations needed
 - ▶ for comparisons with experiments
 - ▶ for comparisons between different methods
- ▶ Sources of numerical uncertainty
 - ▶ statistical and round-off errors
 - ▶ systematical errors inherent to the computational method
 - ▶ **Configuration Interaction** methods: finite basis space
 - ▶ Monte Carlo methods: sensitivity to the trial wave function
 - ▶ Lattice Simulations: finite volume and lattice spacing
 - ▶ **uncertainties in the nuclear interactions**

Nuclear Interactions

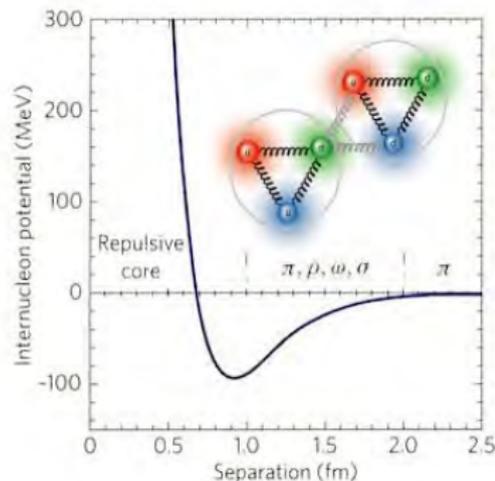
$$\hat{H}_{\text{rel}} = \hat{T}_{\text{rel}} + \sum_{i<j} V_{ij} + \sum_{i<j<k} V_{ijk} + \dots$$

Nuclear interaction not well-determined

- ▶ In principle calculable from QCD
- ▶ Constrained by (fitted to) experimental (scattering) data

Alphabet of realistic NN potentials

- ▶ Argonne potentials (AV18 + ...)
- ▶ Bonn potentials
- ▶ Chiral EFT interactions
 - ▶ Δ -less
 - ▶ Δ -full
 - ▶ pion-less
- ▶ Daejeon16 (based on Idaho-N³LO)
- ▶ ...



Most NN potentials need 3N forces for agreement with data for nuclei

NN Potential and Scattering Data

- ▶ Typically, cross-section data converted to phase-shifts
- ▶ **NN potentials fitted** to phase-shifts
 - ▶ propagation of experimental uncertainties?
 - ▶ fitted up to what energy?
- ▶ Experimental cross-section data for pp and pn scattering, but not for nn scattering
 - ▶ analysis in terms of isoscalar $T = 0$ and isovector $T = 1$ channels
- ▶ **NN scattering data constrain only the on-shell NN potential**, but not the off-shell behavior
 - ▶ many NN potentials describe NN scattering data, but differ for $A > 2$
 - ▶ some give good description of
 - ▶ binding energies & spectra (may need 3NFs)
 - ▶ select electroweak observables (may need corrections beyond IA)
 - ▶ wave functions not unique (unitary transformations)
- ▶ Additional (physics) input
 - ▶ chiral effective field theory
 - ▶ select observables from light nuclei (which?)
 - ▶ more or less suitable for intended computational framework

Nuclear Interactions from chiral EFT

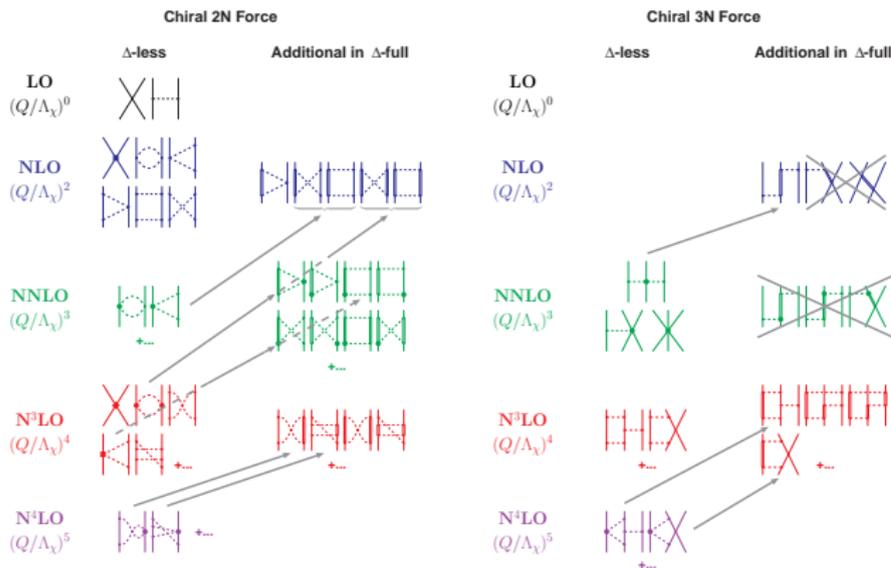
- ▶ Controlled power series expansion in $Q = \max(p, M_\pi)/\Lambda_B \sim 0.3$
- ▶ Hierarchy for many-body forces $V_{NN} \gg V_{NNN} \gg V_{NNNN}$
 - ▶ 3NFs appear at N²LO, 4NFs appear at N³LO

Chiral expansion of nuclear forces

	Two-nucleon force	Three-nucleon force	Four-nucleon force
LO (Q^0)		—	—
NLO (Q^2)		—	—
N ² LO (Q^3)			—
N ³ LO (Q^4)			

- ▶ Allows for quantification of uncertainties due to the interaction

Δ -full Chiral EFT Interactions



$$m_\pi \sim 140 \text{ MeV}$$

$$m_\rho \sim 770 \text{ MeV}$$

$$m_N \sim 940 \text{ MeV}$$

$$m_N \sim 1210 \text{ MeV}$$

$$m_\Delta - m_N \sim 270 \text{ MeV}$$

several diagrams
get 'promoted'
to lower orders

3NFs start at NLO
in particular
Fujita–Miyazawa term

If pions are relevant for chiral EFT,
then what about the role of the nucleon- Δ mass difference?

Machleidt and Entem, Phys. Rept. 503 (2011);
see also Piarulli and Tews, Front. Phys. doi: 10.3389/fphy.2019.00245

Daejeon16 Potential

Shirokov, Shin, Kim, [Sosonkina](#), Maris, Vary, PLB761, 87 (2016)

Nonlocal NN potential in finite Harmonic Oscillator (HO) basis, based on χ EFT interactions

- ▶ Start with Idaho N³LO NN potential ($\Lambda = 500$ MeV)
- ▶ Similarity Renormalization Group (SRG) evolution at 2-body level to $\lambda = 1.5 \text{ fm}^{-1}$ to improve convergence in HO basis
- ▶ Tuned to select **light nuclei including excited states** using Phase-Equivalent Transformations (PETs)
 - ▶ Seven PET angles: $^1s_0, ^3sd_1, ^1p_1, ^3p_0, ^3p_1, ^3pf_2, ^3d_2$
 - ▶ Energy of eleven states:
 - ▶ ground states of $^3\text{H}, ^4\text{He}, ^6\text{Li}, ^8\text{He}, ^{10}\text{B}, ^{12}\text{C}, ^{16}\text{O}$
 - ▶ several excited states
 - ($3^+, 0$) in ^6Li
 - ($0^+, 1$) in ^6Li (equivalent to gs ^6He),
 - ($1^+, 0$) in ^{10}B
 - ($2^+, 0$) in ^{12}C
- ▶ **Same description of NN scattering data as Idaho N³LO NN potential, but better description of p -shell nuclei**

No-Core Shell Model

Barrett, Navrátil, Vary, *Ab initio no-core shell model*, PPNP69, 131 (2013)

Given a Hamiltonian operator

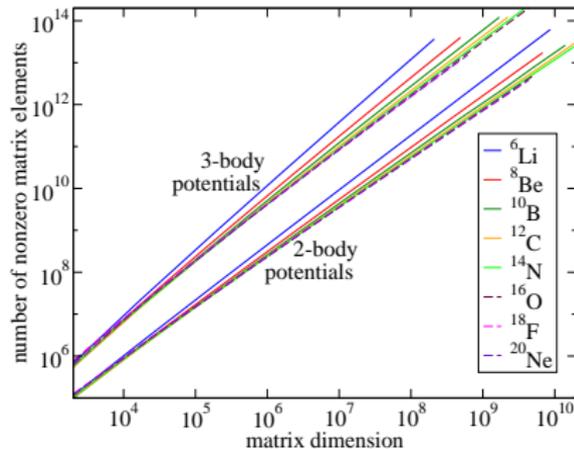
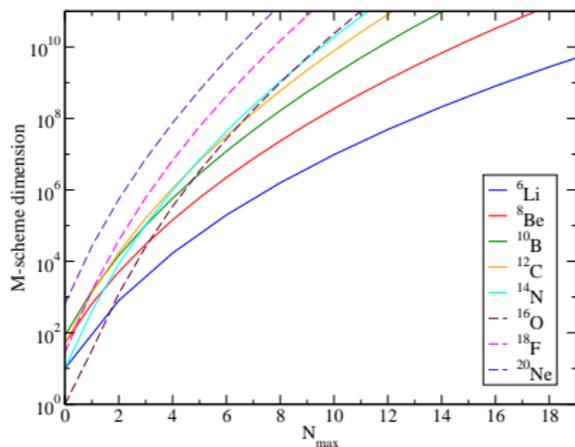
$$\hat{H} = \sum_{i<j} \frac{(\vec{p}_i - \vec{p}_j)^2}{2mA} + \sum_{i<j} V_{ij} + \sum_{i<j<k} V_{ijk} + \dots$$

solve the **eigenvalue problem for wave function of A nucleons**

$$\hat{H}\Psi(r_1, \dots, r_A) = \lambda\Psi(r_1, \dots, r_A)$$

- ▶ Expand wavefunction in basis states $|\Psi\rangle = \sum a_i|\Phi_i\rangle$
- ▶ Express Hamiltonian in basis $\langle\Phi_j|\hat{H}|\Phi_i\rangle = H_{ij}$
- ▶ Diagonalize Hamiltonian matrix H_{ij}
- ▶ Use wavefunction for evaluating observables
- ▶ Complete basis \rightarrow exact result
 - ▶ caveat: complete basis is infinitely large
- ▶ In practice: truncate basis, extrapolation to complete basis
 - ▶ truncation error, extrapolation uncertainties
- ▶ **Computational challenge**
 - ▶ construct large ($10^{10} \times 10^{10}$) sparse symmetric matrix H_{ij}
 - ▶ obtain lowest eigenvalues & -vectors

Main Challenge



- ▶ Relevant measures for computational needs
 - ▶ basis size and number of nonzero matrix elements
- ▶ Increase of basis with increasing A and N_{\max}
 - ▶ use symmetry considerations to control basis size
 - ▶ medium-heavy nuclei: CC, IM-SRG, ab initio Valence-Space, ...
- ▶ Higher N -body interactions
 - ▶ significant increase in computational cost

Extrapolation to the Complete Basis

Challenge: **achieve numerical convergence for No-Core CI calculations using a finite amount of CPU time on current HPC systems**

- ▶ Perform a series of calculations with increasing N_{\max} truncation
- ▶ Extrapolate to infinite model space \rightarrow exact results
 - ▶ Empirical: binding energy exponential in N_{\max}

$$E^{\hbar\omega}(N) = E_{\infty}^{\hbar\omega} + a_1 \exp(-a_2 N)$$

to determine $E_{\infty}^{\hbar\omega}$

- ▶ use $\hbar\omega$ and N_{\max} dependence to estimate numerical error bars

Maris, Shirokov, Vary, PRC79, 014308 (2009)

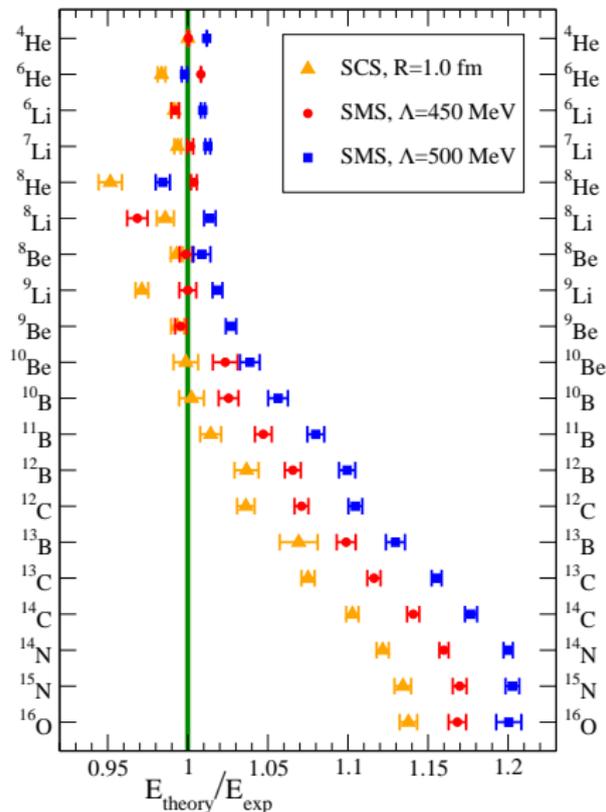
- ▶ Extrapolate using exponentials in $\sqrt{\hbar\omega/N}$ and $\sqrt{\hbar\omega N}$ motivated by IR and UV behavior of wavefunction, based on s.p. asymptotics

Coon *et al*, PRC86, 054002 (2012); Furnstahl *et al*, PRC86, 031301(R) (2012); More *et al*, PRC87, 044326 (2013); Wendt *et al*, PRC91, 061301 (2015); Gazda *et al*, PRC106, 054001 (2022);...

- ▶ Use Machine Learning/Artificial Neural Networks

Negoita *et al*, PRC99, 054308 (2019); Jiang *et al*, PRC100, 054326 (2019); Knöll *et al*, PLB839, 137781 (2023);...

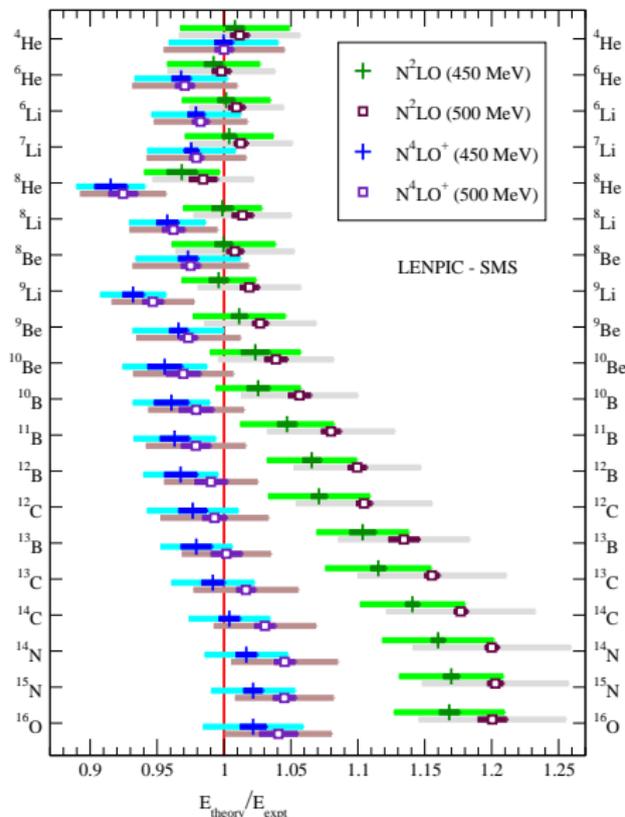
- ▶ Bayesian analysis emerged from **collaborations with statisticians**

Ground State Energies with LENPIC up to $N^2\text{LO}$ 

PRC103, 054001 (2021)

- ▶ Two- and three-body forces up to $N^2\text{LO}$
- ▶ SRG evolved to improve numerical convergence
- ▶ No parameter adjustments
- ▶ Large-scale runs with MFDn at ALCF and NERSC
- ▶ Error bars: Numerical uncertainty from extrapolation to complete basis
- ▶ Systematic overbinding for $A > 10$

Binding Energies with LENPIC-SMS chiral EFT



Front.Phys. 11 1098262 (2023)

- ▶ NN potential up to $N^4\text{LO}^+$
- ▶ 3NFs at $N^2\text{LO}$
- ▶ SRG evolved to improve numerical convergence
- ▶ LECs fitted to
 - ▶ NN scattering data
 - ▶ ^3H binding energy
 - ▶ Nd scattering
- ▶ Parameter-free predictions
- ▶ Error bars
 - ▶ numerical uncertainty
 - ▶ chiral EFT uncertainty from Bayesian analysis

Excitation Energies with UQ

Incorporating correlations

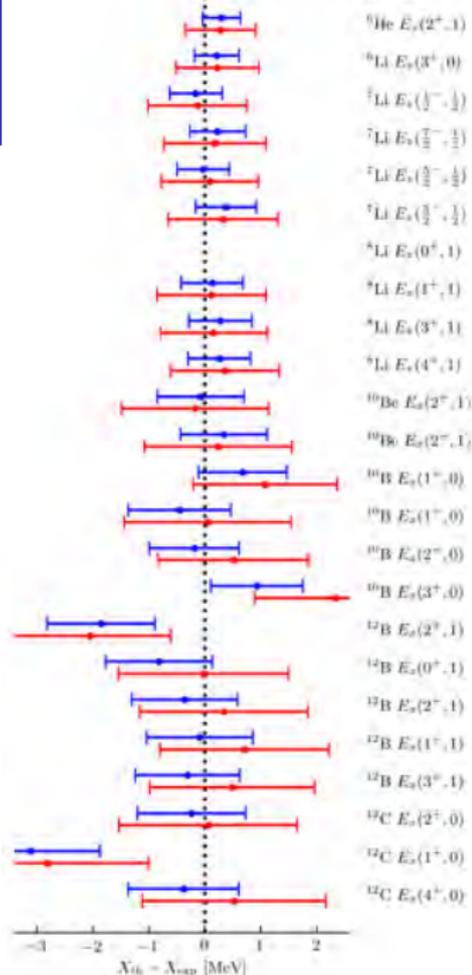
PRC103, 054001 (2021);

following Melendez *et al* PRC100, 044001 (2019)

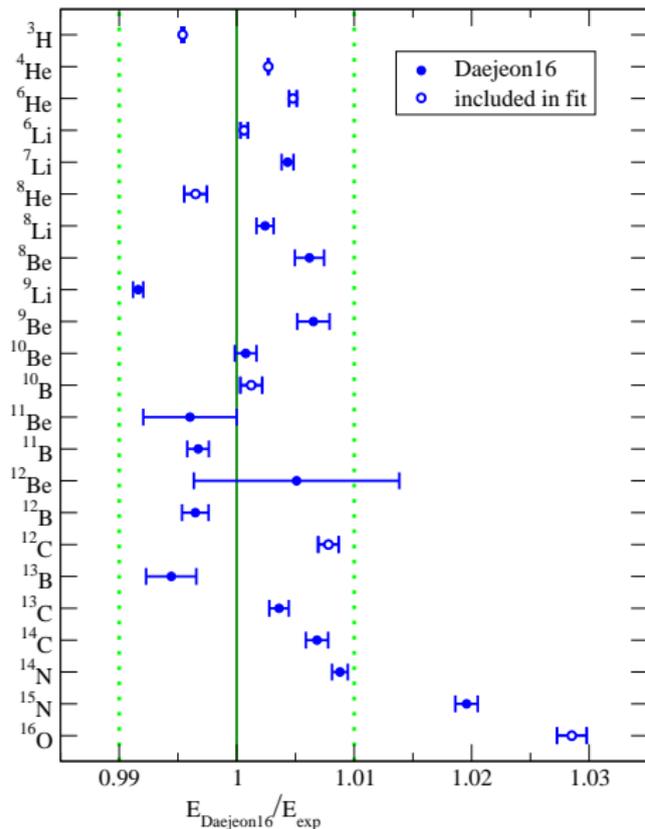
- ▶ Need to learn variance \bar{c} and Q but only limited orders up to $N^2\text{LO}$
- ▶ Use just c_3 to find posterior for Q gives $Q \approx 0.3$
- ▶ Use c_2 and c_3 to fit empirical covariance matrix

Excitation energies with 95% DoB

- ▶ Uncertainties noticeably smaller than uncertainties on gs energies
- ▶ Two outliers: 2^+ in ^{12}B and 1^+ in ^{12}C
- ▶ Outliers less correlated with gs, suggesting different structure

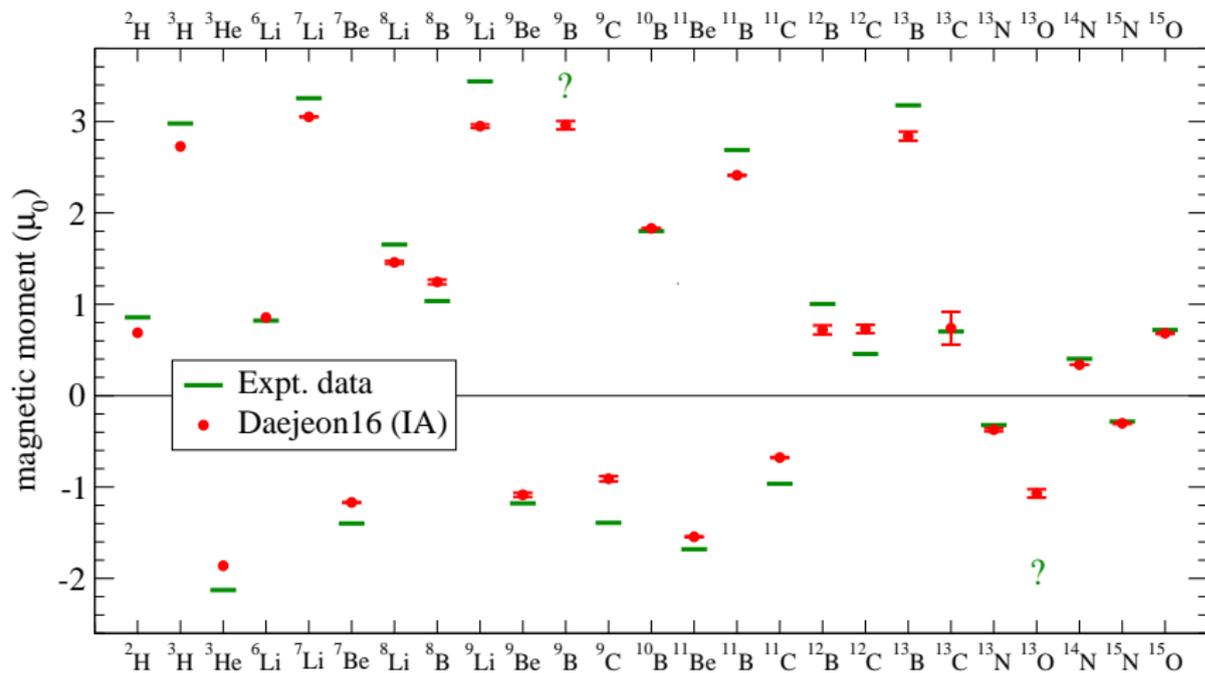


Binding energies with Daejeon16



(PM, Shin, Caprio, Vary, in preparation)

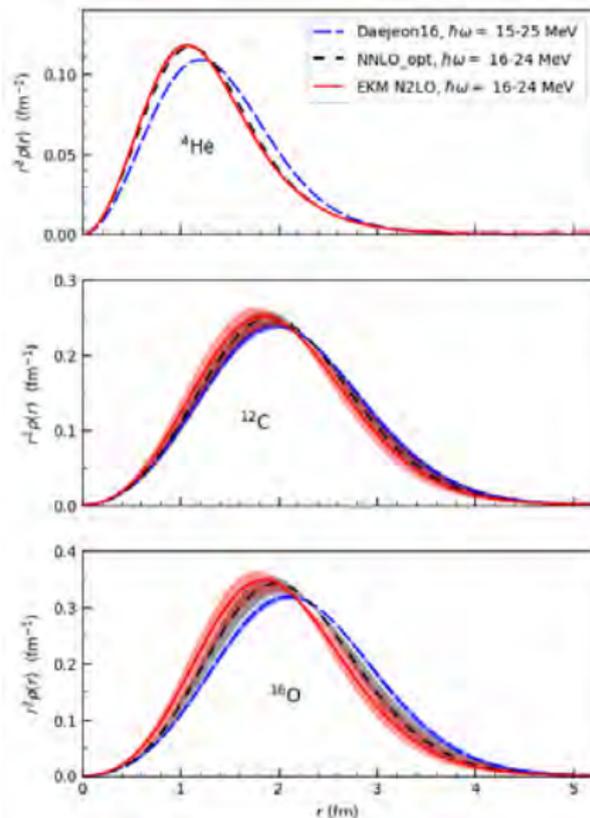
- ▶ NN interaction, based on SRG evolved chiral EFT, using phase-equivalent transformations to fit select p -shell nuclei
- ▶ Ground state energies agree with experiment to within 1% for all p -shell nuclei up to $A=14$
- ▶ Correct J^π for ^{10}B (fitted)
- ▶ Parity inversion ^{11}Be
- ▶ Correct J^π for ^{12}B

Magnetic Moments throughout p -shell with Daejeon16

- ▶ Deviation from data agree with expected MEC corrections
- ▶ Nontrivial to construct consistent M1 corrections due to PETs

Charge distribution

- ▶ Charge distribution
 - ▶ dominated by local proton one-body density
 - ▶ center-of-mass motion factorizes in NCSM with N_{\max} truncation
 - ▶ depends on interaction
 - ▶ slow convergence of asymptotic behavior
 - ▶ corrections due to internal structure of nucleons
 - ▶ electromagnetic current corrections
 - ▶ relativistic corrections
- ▶ Elastic form factors
 - ▶ Fourier transform of charge distribution



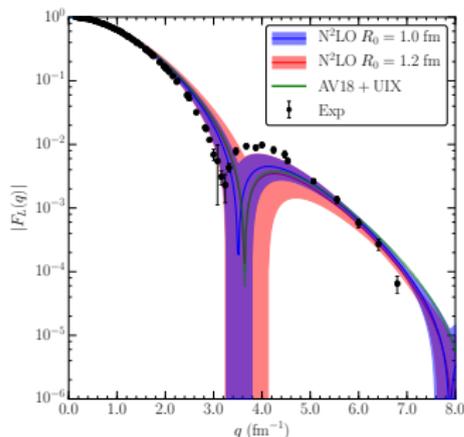
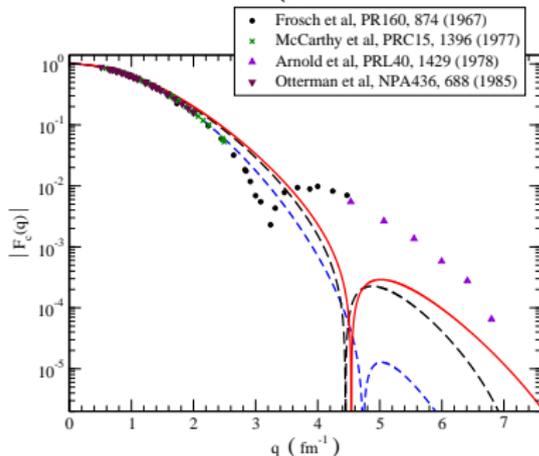
Elastic form factor

work in progress

$$F_c(q) = \frac{G_p(Q)F_p(q) + (N/Z)G_n(Q)F_n(q)}{\sqrt{1 + Q^2/4m_N^2}}$$

with $G_{p,n}$ proton and neutron form factors

and $Q^2 = q^2 - (\sqrt{q^2 + m_A^2} - m_A)^2 \approx q^2$ for $q^2 \ll m_A^2$



work in progress

P. Maris (ISU)

Lynn *et al.*, PRC96, 054007 (2017)

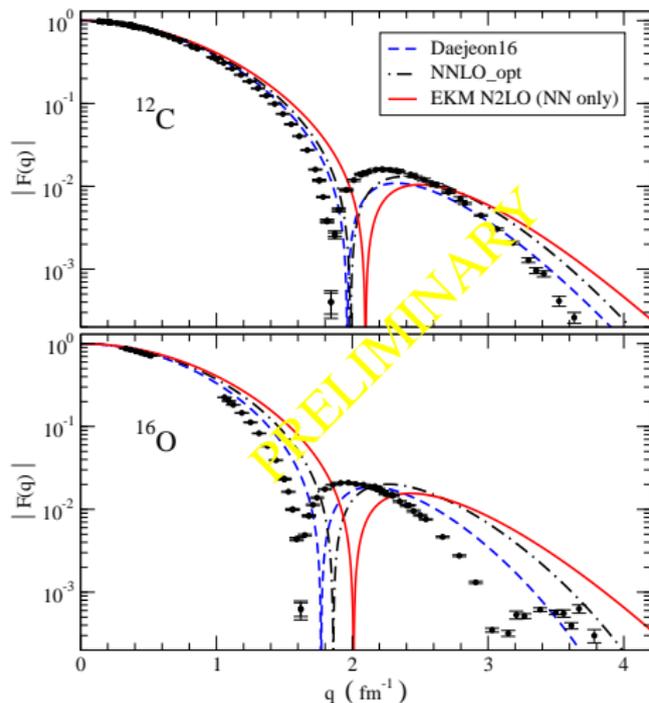
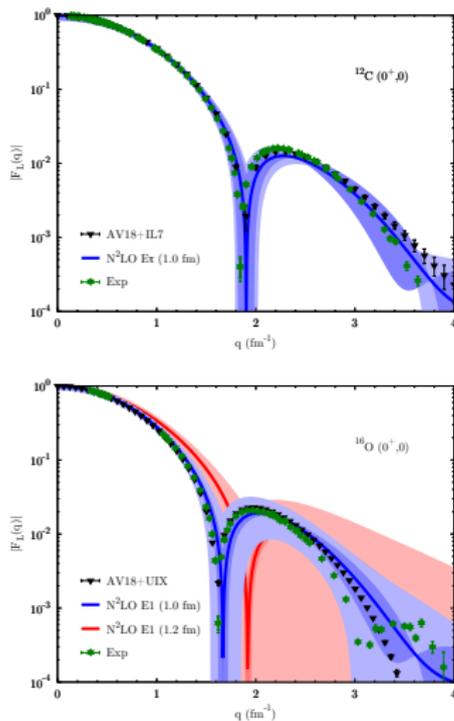
HPC for Nuclear Physics

James Vary 80

24 / 30

Elastic form factors: ^{12}C and ^{16}O

work in progress

Lonardoni *et al*, PRC97, 044318 (2018)

Leading-order spectator expansion for NA scattering

Effective (optical) potential

$$\hat{U}(q, \mathcal{K}_{NA}, \epsilon) = \sum_{\alpha=n,p} \sum_{K_s} \int d^3\mathcal{K} \eta(q, \mathcal{K}, \mathcal{K}_{NA}) \hat{\tau}_{\alpha}^{K_s} \left(q, \frac{1}{2} \left(\frac{A+1}{A} \mathcal{K}_{NA} - \mathcal{K} \right); \epsilon \right) \rho_{\alpha}^{K_s} \left(\mathcal{K} - \frac{A-1}{A} \frac{q}{2}, \mathcal{K} + \frac{A-1}{A} \frac{q}{2} \right)$$

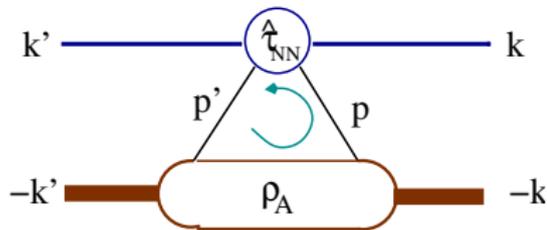
with $\eta(\dots)$ the Moller factor, relating the NN frame to the NA frame

$\hat{\tau}_{n,p}^{K_s}$ the NN amplitude between projectile and target nucleon ($K_s = 0, 1$)

$\rho_{n,p}^{K_s}$ the (nonlocal) one-body density of the target ($K_s = 0, 1$) and

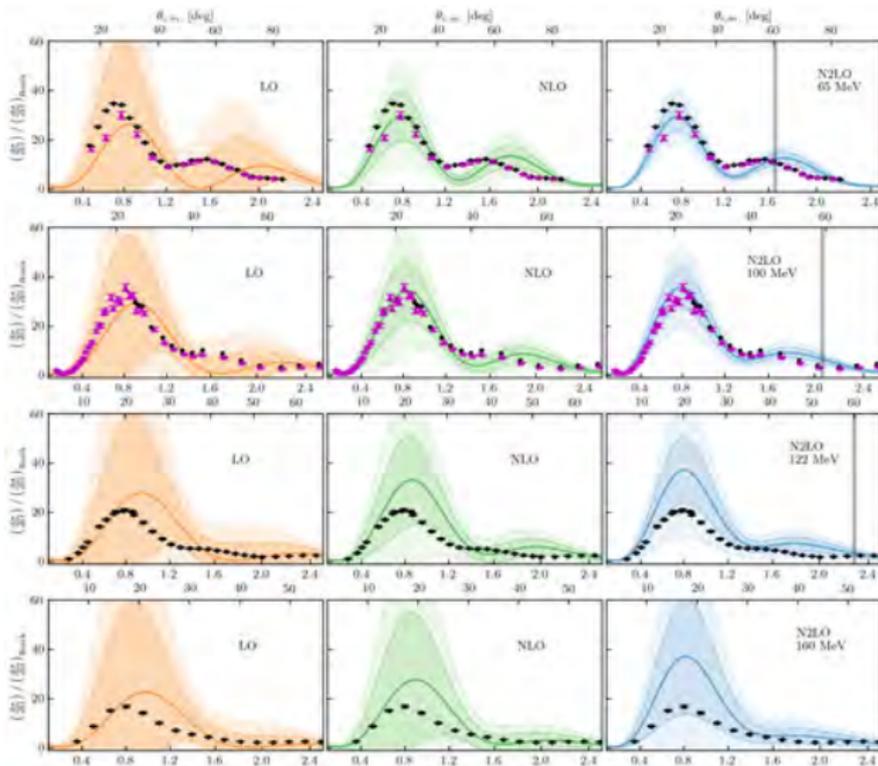
$$q = p' - p \quad \mathcal{K} = \frac{1}{2} (p' + p)$$

$$\mathcal{K}_{NA} = \frac{A}{A+1} \left[(k' + k) + \frac{1}{2} (p' + p) \right]$$



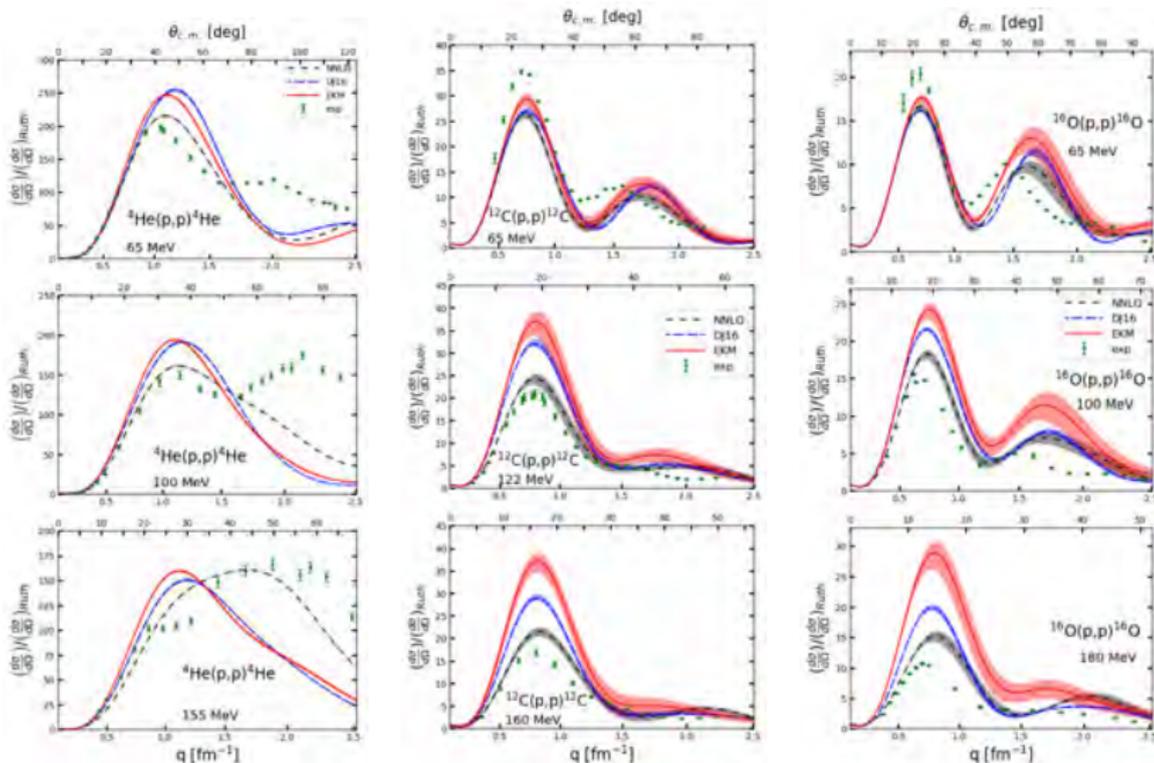
Differential cross section, $^{12}\text{C}(p, p)^{12}\text{C}$

Baker, Burrows, Elster, Launey, PM, Popa, Weppner, Front.Phys. 10 1071971 (2022)



and with different interactions, for different 0^+ nuclei

in preparation, Burrows, Elster, Popa, Weppner, ...



Concluding remarks

- ▶ Significant progress in last 20–30 years
in computational low-energy nuclear physics
- ▶ Made possible by ongoing collaborations between applied mathematicians, computer scientists, and domain scientists
- ▶ Collaboration with applied mathematicians and computer scientists was also crucial for initial BLFQ efforts
 - ▶ Vary, Honkanen, Jun Li, PM, Brodsky, Harindranath, Teramond, P. Sternberg, E.G. Ng, C. Yang, *Hamiltonian light-front field theory in a basis function approach*, PRC81, 035205 (2010)
- ▶ Long-term collaborations essential for success
- ▶ James has been a leading example
fostering such long-term collaborations
- ▶ Looking forward to continue working with James
and with other collaborators world-wide

