Pre-processing the Quantum Many-Body Problem

The curse of dimensionality ... and how to beat it!

de la recherche à l'industrie

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Wise men say ...

$$H |\Psi_k^A\rangle = E_k^A |\Psi_k^A\rangle$$

'... only fools rush in ... ' Elvis Presley

$$H |\Psi_k^A\rangle = E_k^A |\Psi_k^A\rangle$$

'... instead of storing one big file you can store many small files ...' Kai Hebeler

Tensors and many-body theory

• Many-body calculations employ mode-*n* tensors and compute tensor networks (TN)

$$H_{\text{nucl}} = \frac{1}{(1!)^2} \sum_{pq} t_{pq} c_p^{\dagger} c_q$$

+ $\frac{1}{(2!)^2} \sum_{pqrs} \bar{v}_{pqrs} c_p^{\dagger} c_q^{\dagger} c_s c_r$
+ $\frac{1}{(3!)^2} \sum_{pqrstu} \bar{w}_{pqrstu} c_p^{\dagger} c_q^{\dagger} c_r^{\dagger} c_u c_t c_s$
storage cost N^{2k} (here p=2,4,6)

I) Input

2) Output

CC:
$$E_0 = E_0^{\text{HF}} + \frac{1}{2} \sum_{ijab} \bar{v}_{ijab} t_i^a t_b^b + \frac{1}{4} \sum_{ijab} \bar{v}_{ijab} t_{ij}^{ab}$$

MSRG: $E_0(s) = \sum_{ab} (n_a - n_b) \eta_b^a f_a^b + \frac{1}{2} \sum_{abcd} \eta_{cd}^{ab} \Gamma_{ab}^{cd} n_a n_b \bar{n}_c \bar{n}_d$

evaluation cost
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 (here $p=4$)

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$$evaluation cost N^p (here p=4)$$

$$\mathbf{MSRG:} \quad E_0(s) = \sum (n_a - n_b) n_a^a f^b + \frac{1}{2} \sum n_b^{ab} \Gamma_b^{cd} n_a n_b \bar{n}_c \bar{n}_d$$

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- Tensors and tensor networks provide the universal language of many-body theory
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 - Going to larger model spaces for 3B operators -
 - Relaxing many-body truncations yielding higher-mode tensors
 - Working in deformed basis

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 - Going to larger model spaces for 3B operators
 - Relaxing many-body truncations yielding higher-mode tensors
 - Working in deformed basis
- More computational power will not resolve this problem

We need new tools to account for such large data!



Computational scaling might be prohibitive but: **Not all tensor entries are equally important!**



Computational scaling might be prohibitive but: Not all tensor entries are equally important!









• MBPT expansion w.r.t. particle-number-broken HFB vacuum:

$$\left\{U_k,V_k,E_k>0\right\}$$

- Hamiltonian replaced by grand potential operator $\Omega = H \lambda A$
- Natural formulation in quasi-particle space (change of algebra!)

$$\beta_k^{\dagger} = \sum_p U_{pk} c_p^{\dagger} + V_{pk} c_p \qquad \beta_k = \sum_p U_{pk}^{\star} c_p + V_{pk}^{\star} c_p^{\dagger}$$

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- Single-reference open-shell technique but all sums run over full basis!
- Bulk correlation from second-order energy correction

$$\Delta \Omega_0^{(2)} = -\frac{1}{24} \sum_{k_1 k_2 k_3 k_4} \frac{\Omega_{k_1 k_2 k_3 k_4}^{40} \Omega_{k_1 k_2 k_3 k_4}^{04}}{E_{k_1} + E_{k_2} + E_{k_3} + E_{k_4}}$$

$$\left\{U_k, V_k, E_k > 0\right\}$$

BMBPT(2) Feynman diagram

$$\tau_1 + \Omega_{k_5k_6k_7k_8}^{04}$$
 k_5
 k_6
 k_7
 k_8
 k_7
 k_8
 k_1
 k_2
 k_3
 k_4
 0
 $+O_{k_1k_2k_3k_4}^{40}$

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• Extension of diagrammatic formalism and development of automised tools

see talk of **Pierre Arthuis** !

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• Ultimate restoration of broken symmetry mandatory (work in progress!)

Particle-number projected Bogoliubov coupled cluster theory. Application to the pairing Hamiltonian

Qiu, Henderson, Duguet, Scuseria, arXiv:1810.11245



 $\left\{U_k, V_k, E_k > 0\right\}$

BMBPT - consistency and complexity



- Excellent agreement of all methods with 'exact' results (IT-NCSM)
- Different truncation schemes yield consistent description of open-shell nuclei
- BMBPT is optimal for cheap survey calculations of next-generation chiral Hamiltonians

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• Numerical procedure: truncated SVD + least-square minimization of Frobenius norm

$$\Delta T = \frac{\|T - \hat{T}\|}{\|T\|} \qquad \|T\| = \sqrt{T_{k_1 k_2 \dots} T^*_{k_1 k_2 \dots}}$$

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• Numerous formats available: CPD, (hierarchical) Tucker, HOSVD, RI, MPS, ...

Very active field of research

Tensor decomposition of the Hamiltonian

- Better approximation for larger ranks
- Small dependence on normal-ordered component
- THC works independent of target nucleus
- Better compression for sparse J channels
 - Parity constraints
 - Isospin constraints
 - Angular-momentum triangle inequalities
- Efficient black-box data compression tool
- Confirms observations for HO and HF matrix elements

AT, Schutski, Scuseria, Duguet, 2018, arXiv:1810.08419



SRG-evolved 2N+3N Hamiltonian (NO2B) quasi-particle basis in 5 major shells



The BMBPT tensor network

• Second-order energy correction to ground-state correlations

The THC-BMBPT(2) tensor network

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- Full-fledged decomposition using
 - Factorized form of nuclear matrix elements
 - Quadrature for decomposition of denominator

$$\frac{1}{E_{k_1} + E_{k_2} + E_{k_3} + E_{k_4}} = \int_0^\infty e^{-t(E_{k_1} + E_{k_2} + E_{k_3} + E_{k_4})} dt$$



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• Measures for gauging THC performance from error on observable and compression ratio

$$\Delta(\Delta\Omega_0^{(2)}) \equiv \frac{\left|\Delta\Omega_0^{(2)}(\text{THC}) - \Delta\Omega_0^{(2)}\right|}{\left|\Delta\Omega_0^{(2)}\right|} \qquad \qquad R_C = \frac{\text{\#elements of } T}{\text{\#elements of } \hat{T}}$$

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• Using factorisation always requires non-trivial reformulation of many-body formalism

Tensor-structured coupled cluster theory

Schutski et al., JCP 147, 184113 (2017)

THC - accuracy and compression



Compression ratio and second-order error as function of decomposition error

- Strong correlation between accuracy and data compression
- Sub-percent accuracy only for compression ratio $R_C < 10$
- <u>Advantage: flexible tool for compressing many-body tensors</u>
- <u>Tradeoff</u>: calculation of decomposition factors is numerically challenging

Development of parallelized code suite for arbitrary tensors!

Calculation details

Chiral NN+3N Hamiltonian
α = 0.08 fm⁴
5 major shells
HFB reference state
BMBPT(2) energy correction

Desire: Non-perturbative open-shell framework with full account of triples in mid-mass nuclei

Bogoliubov CC theory up to triples (BCCSDT)

 $|\Psi\rangle = \exp\left(\mathcal{T}_1 + \mathcal{T}_2 + \mathcal{T}_3\right)|\Phi\rangle, \qquad \langle\Phi^{k_1k_2\dots}|(\Omega e^{\mathcal{T}})_c|\Phi\rangle = 0, \qquad \mathcal{T}_n \equiv \frac{1}{(2n)!} \sum_{k_1\dots k_{2n}} t_{k_1\dots k_{2n}}^{2n0} \beta_{k_1}^{\dagger} \cdots \beta_{k_{2n}}^{\dagger}$ Signoracci, Duguet, Hagen and Jansen, PRC 91 06432

Problem: storage of amplitude tensors requires several TB of memory (in *J*-scheme)

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- Introduction of importance-truncated tensor based on a priori measure

$$\mathcal{T}_{n}(\kappa_{\min}^{(p)}) \equiv \{t_{k_{1}...k_{2n}}^{2n0} \text{ such that } |t_{k_{1}...k_{2n}}^{2n0(p)}| \ge \kappa_{\min}^{(p)}\}$$

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Define importance measure based on perturbation theory arguments

$$t_{k_1k_2k_3k_4}^{40(1)} = -\frac{\Omega_{k_1k_2k_3k_4}^{40}}{E_{k_1k_2k_3k_4}}, \qquad t_{k_1k_2k_3k_4k_5k_6}^{60(2)} = \mathcal{P}(\dots/\dots)\sum_{k_7} \frac{\Omega_{k_1k_2k_3k_7}^{31} \Omega_{k_7k_4k_5k_6}^{40}}{E_{k_7k_4k_5k_6}E_{k_1k_2k_3k_4k_5k_6}}$$

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- Store only IT tensor and restrict all summations in tensor network to 'IT-allowed' states
- Practitioners of other frameworks may feel free to replace CC amplitudes by:
 - Flowing Hamiltonian and generator (IMSRG)
 - Intermediate-state configurations and coupling matrices (Green's function theory)

Analysis of double amplitudes



- Storage requirements by three orders of magnitude lowered at 1% accuracy
- Estimate error on observable from 2nd-order energy correction in CC-like form
- Essentially all physics are recovered from a selected model space with $e_{\max}^{(eff)} \in [4, 5]$

Analysis of triple amplitudes



- Explosion of storage requirements without data compression (> 10 Tb)
- Estimate error on observables via BCCSD[T] correction

$$\Delta \Omega_0^{[4_T]} = \sum_{k_1 k_2 k_3 k_4 k_5 k_6} |t_{k_1 k_2 k_3 k_4 k_5 k_6}^{60(2)}|^2 E_{k_1 k_2 k_3 k_4 k_5 k_6}$$

Storage of pre-processed amplitudes possible: full IT-BCCSDT in reach!

A. Tichai — 'Progress in Ab Initio Techniques in Nuclear Physics' — 13

Theoretical perspectives

Solving the A-body Schrödinger equation

- Fully consistent restoration of broken U(I) gauge symmetry
- Doubly open-shell nuclei from simultaneously breaking SU(2) symmetry
- Going to heavier systems: treatment of 3B forces is a computational bottleneck
- Systematic account of spectroscopy and electromagnetic response

Pre-processing the many-body problem ...

- What is the optimal tensor format for a given many-body tensor?
- Extension of tensor factorizations to large model spaces and higher-mode tensors
- Non-perturbative IT measures (QMC was used in quantum chemistry)
- Application of TF/IT to non-perturbative frameworks (CC, IMSRG, SCGF)

... and going beyond

- Is it possible to construct tensor-decomposed chiral matrix elements?
- Tensor-decomposed reformulation of (free-space) SRG evolution

Epilogue

- CEA group
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 - R. Schutski Skoltech, Russia









