Many-Body Quantum Physics with Machine Learning ECT* Sept 4-8, 2023

AND

A simple NQS model in a discrete lattice **Diagrammatic Monte Carlo for paired fermions**

Carlo Barbieri





Thesis work by:

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<u>All preliminary work!</u>



Overview of low-energy nuclear physics

Composite system of interacting fermions

Binding and limits of stability Coexistence of individual and collective behaviors Self-organization and emerging phenomena EOS of neutron star matter



I) Understanding the nuclear force QCD-derived; 3-nucleon forces (3NFs) First principle (ab-initio) predictions



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Experimental programs

RIKEN, FAIR, FRIB, ISAC...

Extreme mass

II) Ab Initio computations of nuclear structure

[Frontiers in Physics 8, 626976 (2021)] Correlations known better for stable isotopes [C. Barbieri and W. H. Dickhoff, Prog. Part. Nucl. Phys 52, 377 (2004)] Neutron-rich nuclei; Shell evolution (far from stability)

- 283 st
 ≈3,000
- ≈7,00(

Nature **473**,

III) Interdisciplinary character Astrophysics Tests of the standard model Other fermionic systems: ultracold gasses; molecules;







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Editors: L. Coraggio, S. Pastore, CB



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FRONTIERS topical review (doi: 10.3389/fphy.2020.626976):

Frontiers in Physics 8, 626976 (2021)







Reach of ab initio methods across the nuclear chart



Legnaro Natl' Lab Mid Term Plan; Eur. Phys. J. Plus 138, 709 (2023)



Quest to predict exotic (unstable) isotopes



Neutron number, N Nature 473, 25 (2011); 486, 509 (2012)

- 283 stable isotopes
- ≈3,000 are known
- ≈7,000 predicted to exist



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Most isotopes are deformed (even triaxially) and change shape under external action



0.075 0.100 0.00 0.25 0.50 0.75

 $-\pi$ $-\pi/2$ 0

1.00

 $\pi/2 \pi$

- Fission of ²⁴⁰Pu:
 - time dependent DFT inspired, in 3D

0.000 0.025

0.050

- 30 x 30 x 60 fm³ box
- $-24 \times 24 \times 48 = 27,000 \text{ pts mesh}$





NQS for fermions confined in a box



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Confined fermions w/ a discrete coordinate space mesh

- Discretise coordinate space
- Use occupation number to locate particles



- Use a Fock space basis to represent particle configurations:

$$|\psi\rangle = \prod_{i} \psi^{\dagger}(x_{i}) |0\rangle = |n_{0}=0, n_{1}=1, n_{2}=0, n_{3}=0, n_{4}=0, n_{5}=1, \dots n_{L}=0\rangle$$

- Can be mapped into a system of spins (*with fixed magnetisation*):



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(0, 1, 0, 0, 0, 1, 0, 0, 0)

no need to worry about antisymmetrization!

$$\langle x|\psi\rangle \rightarrow \langle S|\psi\rangle \Leftrightarrow \begin{cases} c_{\uparrow\uparrow\uparrow\ldots} \doteq \langle\uparrow\uparrow\uparrow\ldots|\psi\rangle = \psi(\uparrow\uparrow\uparrow\ldots) \\ c_{\downarrow\uparrow\uparrow\ldots} \doteq \langle\downarrow\uparrow\uparrow\ldots|\psi\rangle = \psi(\downarrow\uparrow\uparrow\ldots) \\ \vdots \\ c_{\downarrow\downarrow\downarrow\ldots} \doteq \langle\downarrow\downarrow\downarrow\ldots|\psi\rangle = \psi(\downarrow\downarrow\downarrow\ldots) \end{cases}$$

Can be solved as in Carleo and Troyer, Science **355**, 602 (2017)









NQS representation

- Use a Restricted Boltzmann Machine with complex parameter to represent the w.f.:

$$\mathcal{P}(\mathbf{v} \cap \mathbf{h}) = \frac{1}{\mathcal{Z}} \exp(\mathbf{a}^{\mathsf{T}}\mathbf{v} + \mathbf{b}^{\mathsf{T}}\mathbf{h} + \mathbf{h}^{\mathsf{T}}\underline{W}\mathbf{v}) \qquad \mathbf{v}$$

- Marginalize w.r.t. the hidden nodes:

$$\langle x|\psi\rangle \rightarrow \mathcal{P}(\mathbf{v}) = \sum_{\{\mathbf{h}\}} \mathcal{P}(\mathbf{v} \cap \mathbf{h})$$

$$\mathbf{a} = \mathbf{a}^{(0)} + \Delta \mathbf{a} = \mathbf{a}^{(0)} + \sum_{i=1}^{N_h} \mathbf{a}^{(i)}$$

$$1/\mathcal{Z} = \exp\left(\sum_{i=1}^{N_h} \mathcal{K}^{(i)}\right)$$

$$\mathbf{W}^{(i)} = \begin{pmatrix} W_{1,i} \\ W_{2,i} \\ \vdots \\ W_{N_v,i} \end{pmatrix} \in \mathbb{C}^{N_v},$$

$$\omega_i(\mathbf{v}) = \mathbf{W}^{(i)} \mathbf{v} + b_i = \sum_j W_{ji} \mathbf{v}_j + b_i,$$

Restricted Boltzmann Machine

$$\psi(\mathbf{v}) = 2^{N_h} \exp\left(\mathbf{a}^{(0)\mathsf{T}}\mathbf{v}\right) \prod_{i=1}^{N_h} \left[\exp\left(K^{(i)} + \mathbf{a}^{(i)\mathsf{T}}\mathbf{v}\right) \cosh(\omega_i(\mathbf{v}))\right]$$



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ith:
$$\begin{cases} \mathbf{v} \in \{-1, 1\}^{N_{v}} \\ \mathbf{h} \in \{-1, 1\}^{N_{h}} \end{cases}$$

$$\begin{cases} \mathbf{a} \in \mathbb{C}^{N_{V}} \\ \mathbf{b} \in \mathbb{C}^{N_{h}} \\ W \in \operatorname{Mat}_{N_{h} \times N_{V}}(\mathbb{C}) \end{cases}$$

- Note that **a**⁽ⁱ⁾ are site dependent and no hidden nodes are necessary for a single particle $(N_h=0)$.





Energy minimization

- The Hamiltonian for N_v fermions fermions will be

$$\mathcal{H} = T + V = \sum_{j} \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j - 2\psi_j^{\dagger} \psi_j + \frac{-\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j+1}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j(\Delta x)^2} \sum_{j} \left[\psi_{j}^{\dagger} \psi_j + \frac{\hbar^2}{2m_j($$

- Sample E_{loc} from $|\psi(x)|^2 \sim \text{RBM}^2$ using MCMC:

$$E_{\rm loc}(\mathbf{x}) = \int d\mathbf{x}' \,\mathcal{H}_{\mathbf{x}\mathbf{x}'} \frac{\psi(\mathbf{x}')}{\psi(\mathbf{x})}$$

$$\frac{\langle \psi | \mathcal{H} | \psi \rangle}{\langle \psi | \psi \rangle} = \langle E_{\text{loc}} \rangle_{|\psi(\mathbf{x})|^2}$$

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$\vdash \psi_{j-1}^{\dagger}\psi_{j} + V$ + appropriate conditions at the walls.

Use gradient descent w/ SR:

$$D_{k}(\mathbf{x};\theta) = \frac{\partial_{\theta_{k}}\psi^{\theta}(\mathbf{x})}{\psi^{\theta}(\mathbf{x})}$$

$$\partial_{\theta_k} \langle \mathcal{H} \rangle_{\psi} = \langle G_k \rangle_{|\psi(\mathbf{x})|^2}$$

$$G_{k}(\mathbf{x};\theta) = 2\operatorname{Re}\left[D_{k}^{*}(\mathbf{x};\theta)\left(E_{\operatorname{loc}}(\mathbf{x}) - \langle E_{\operatorname{loc}}\rangle_{|\psi(\mathbf{x})|^{2}}\right)\right]$$

Stochastic Reconfiguration

$$\theta^{(t+1)} = \theta^{(t)} - \eta^{(t)} S^{-1} \nabla_{\theta} \langle \mathcal{H} \rangle_{\psi},$$
$$S_{ij} = \langle D_i^* \rangle \langle D_j \rangle - \langle D_i^* D_j \rangle,$$



One fermion — optimization





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Two fermions — optimization

Convergence with $N_v=10$



Figure 1: Solution for the two particles non-interacting problem with an RBM built with only 10 hidden nodes. This simulation proves that it is possible to have a satisfying approximation also with relatively few hyper parameters.



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Hyperparameter optimization

| N _h | $\langle t \rangle$ / iteration | $\Delta E/E$ |
|----------------|---------------------------------|--------------|
| 40 | 2.75 min | 2% |
| 30 | 1.8 min | 2.6% |
| 20 | 1 min | 0.03% |
| 10 | 16.2 s | 0.05% |
| 5 | 4 S | 60% |

Table 1: Efficiency and quality of convergence of RBMs with various N_h to model the two non-interacting fermions in a box. N_v is set to 10 for every simulation.







Two fermions — NQS wave function

Neural network ground state





Figure 2: *Physical* learning process of an RBM with $N_h = 20$ from the starting wave function (upper left). The NN seems to be learning boundaries and antisimmetry in the following iterations (number 15, 30 and 300 are reported).



Hydrogen atom on the 3D lattice

Convergence



Figure 3.4: The optimization of the network for the hydrogen atom confined in a box Nv=4913(17x17x17) and a zoom of the last iterations on the right. The network seems to converge to the exact value in the continuum limit but it misses the correct result for the discretized problem.'

The cusp at the proton site is recovered



Figure 3.7: One-dimensional section of the hydrogen wave function in correspondence of the nucleus compared with theoretical behavior $\propto exp(-r)$.







RBM wave function (x-y plane at z=cons)













Self-consistent Green's function (SCGF) and **Diagrammatic Monte Carlo (DiagMC)**



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Green's function theory for nuclei

The Green's function is found as the exact solution of the Dyson equation:

$$G_{\alpha\beta}(\omega) = G_{\alpha\beta}^{(0)}(\omega) + \sum_{\gamma\delta} G_{\alpha\gamma}^{(0)}(\omega) \Sigma_{\gamma\delta}^{(0)}(\omega) \Sigma_{\gamma\delta}^{(0)}(\omega) = G_{\alpha\beta}^{(0)}(\omega) \Sigma_{\gamma\delta}^{(0)}(\omega) + \sum_{\gamma\delta} G_{\alpha\gamma}^{(0)}(\omega) \Sigma_{\gamma\delta}^{(0)}(\omega) = G_{\alpha\beta}^{(0)}(\omega) + \sum_{\gamma\delta} G_{\alpha\gamma}^{(0)}(\omega) \sum_{\gamma\delta} G_{\alpha\gamma}^{(0)}(\omega) = G_{\alpha\gamma}^{(0)}(\omega) + \sum_{\gamma\delta} G_{\alpha\gamma}^{(0)}(\omega) = G_{\alpha\gamma}^{(0)}(\omega) = G_{\alpha\gamma}^{(0)}(\omega) + \sum_{\gamma\delta} G_{\alpha\gamma}^{(0)}(\omega) = G_{\alpha\gamma$$

It requires knowing the self-energy which is the sum of an *infinite series* of Feynman diagrams:





UNIVERSITÀ DEGLI STUDI DI MILANO DIPARTIMENTO DI FISICA $G_{\gamma\delta}^{\star}\left(\omega\right)G_{\delta\beta}\left(\omega\right)$





The Faddev-RPA and ADC(3) methods in a few words

Compute the nuclear self energy to extract both scattering (optical potential) and spectroscopy. F-RPA: Both ladders and rings are needed for atomi nuclei: Phys. Rev. C63, 034313 (2001)



All Ladders (GT) and ring modes (GW) are coupled to all orders. Two approaches:

- Faddev-RPA allows for RPA modes
- ADC(3) Tamn-Dancoff version using 3rd order diagrams as 'seeds':

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The Self-Consistent Green's Function with Faddev-RPA

| 501 (2 | 012)] |
|-------------------------|-------|
| Expt. | |
| 16.05 20.0 | |
| 14.01 16.91 19.72 | |
| 12.62 14.74 18.51 | |

Ab-initio Nuclear Computation & BcDor code

BoccaDorata code: https://gitlab.com/cbarbieri/BoccaDorata

- C++ class library for handling many-body propagators (MPI & OpenMP based).
- Computation of nuclear spectral functions, many-body propagators, RPA responses, coupled cluster equations and effective interaction/charges for the shell model.

- (V. Soma, 2010–)
- Three-nucleon forces (A. Cipollone, 2011–2015)

Gorkov at 3rd order (will become massively parallel...)

Lecture Notes in Physics 936

Morten Hjorth-Jensen Maria Paola Lombardo Ubirajara van Kolck Editors

An Advanced Course in Computational Nuclear Physics

Bridging the Scales from Quarks to Neutron Stars

Deringer

Self-consistent Green's function formalism and methods for **Nuclear Physics**

Benchmark of ab-initio methods for oxygen isotopic chain

K. Hebeler et al., Annu. Rev. Nucl. Part. Sci. 65, 457 (2015)

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 \rightarrow 3NF tensor and 3NF near flourine's dripline

Role of intermediate state configurations (ISCs)

n-16O, total elastic cross section

[A. Idini, CB, Navrátil, Phys. Rev. Lett. **123**, 092501 (2019)]

Inclusion of NNN forces

3p2h/3h2p terms relevant to next-generation high-precision methods.

Formalism already laid out: F. Raimondi, CB, Phys. Rev. C97, 054308 (2018).

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FIG. 5. 1PI, skeleton and interaction ir reducible self-energy diagrams appearing at 3^{r d}-order in perturbative expansion (7), making use of the e+ective hamiltonian of Eq. (9).

Nambu-Covariant approach to build (Gorkov) propagators

Gorkov at 2nd order:

₹---₹) **‡---₹**)

Gorkov at 3rd order: (ONLY NN forces)

(NN ONLY forces) LI STUDI DI MILANO

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INFN

Nambu-Covariant approach to build (Gorkov) propagators

Gorkov at 2nd order:

Thomas Duguet IRFU, CEA, Université Paris-Saclay, 91191 Gif-sur-Yvette, France and KU Leuven, Instituut voor Kern- en Stralingsfysica, 3001 Leuven, Belgium

Gorkov at 3rd order: (ONLY NN forces)

hh-interactions (hh int. among pp ladders

(NN ONLY forces) LI STUDI DI MILANO DIPARTIMENTO DI FISICA

PHYSICAL REVIEW C 105, 044330 (2022)

Gorkov algebraic diagrammatic construction formalism at third order

Carlo Barbieri Department of Physics, Via Celoria 16, 20133, Milano, Italy and INFN, Via Celoria 16, 20133, Milano, Italy

Vittorio Somà IRFU, CEA, Université Paris-Saclay, 91191 Gif-sur-Yvette, France

$$\widetilde{\Sigma}^{11}_{\alpha\beta}(\omega) = \sum_{rr'} \left\{ \mathcal{C}_{\alpha,r} \left[\frac{1}{\omega \mathbb{I} - \mathcal{E} + i\eta} \right]_{r,r'} \mathcal{C}^{\dagger}_{r',\beta} + \bar{\mathcal{D}}^{\dagger}_{\alpha,r} \left[\frac{1}{\omega \mathbb{I} + \mathcal{E}^{T} - i\eta} \right]_{r,r'} \bar{\mathcal{D}}_{r',\beta} \right\},$$
(29a)

$$\widetilde{\Sigma}^{12}_{\alpha\beta}(\omega) = \sum_{rr'} \left\{ \mathcal{C}_{\alpha,r} \left[\frac{1}{\omega \mathbb{I} - \mathcal{E} + i\eta} \right]_{r,r'} \mathcal{D}^*_{r',\beta} + \bar{\mathcal{D}}^{\dagger}_{\alpha,r} \left[\frac{1}{\omega \mathbb{I} + \mathcal{E}^T - i\eta} \right]_{r,r'} \bar{\mathcal{C}}^T_{r',\beta} \right\},$$
(29b)

$$\mathcal{C}_{\alpha,r}^{(\text{IIa})} = \frac{1}{\sqrt{6}} \mathcal{P}_{123} \sum_{\substack{\mu\nu\lambda\\k_4k_5}} \frac{v_{\alpha\lambda,\mu\nu}}{2} \left(\bar{\mathcal{V}}_{\mu}^{k_4} \bar{\mathcal{V}}_{\nu}^{k_5}\right)^* t_{k_4k_5}^{k_1k_2} \bar{\mathcal{V}}_{\lambda}^{k_3}, \quad (43a)$$

$$\mathcal{C}_{\alpha,r}^{(\text{IIb})} = \frac{1}{\sqrt{6}} \mathcal{P}_{123} \sum_{\substack{\mu\nu\lambda\\k_4k_5}} v_{\alpha\lambda,\mu\nu} \left(\bar{\mathcal{V}}_{\nu}^{k_4} \mathcal{U}_{\lambda}^{k_5}\right)^* t_{k_4k_5}^{k_1k_2} \mathcal{U}_{\mu}^{k_3}, \quad (43b)$$

$$\mathcal{C}_{\alpha,r}^{(\text{IIc})} = \frac{1}{\sqrt{6}} \mathcal{P}_{123} \sum_{\substack{\mu\nu\lambda\\k_4k_5}} \frac{v_{\alpha\lambda,\mu\nu}}{2} \left(\bar{\mathcal{V}}_{\mu}^{k_4}\bar{\mathcal{V}}_{\nu}^{k_5}\right)^* t_{k_1k_2}^{k_4k_5} \bar{\mathcal{V}}_{\lambda}^{k_3}, \quad (47a)$$
$$\mathcal{C}_{\alpha,r}^{(\text{IId})} = \frac{1}{\sqrt{6}} \mathcal{P}_{123} \sum_{\substack{\mu\nu\lambda\\k_4k_5}} v_{\alpha\lambda,\mu\nu} \left(\bar{\mathcal{V}}_{\nu}^{k_4}\mathcal{U}_{\lambda}^{k_5}\right)^* t_{k_1k_2}^{k_4k_5} \mathcal{U}_{\mu}^{k_3}, \quad (47b)$$

$$\mathcal{E}_{k_1k_2,k_4k_5}^{(pp)} = \sum_{\alpha\beta\gamma\delta} \left(\mathcal{U}_{\alpha}^{k_1} \mathcal{U}_{\beta}^{k_2} \right)^* v_{\alpha\beta,\gamma\delta} \mathcal{U}_{\gamma}^{k_4} \mathcal{U}_{\delta}^{k_5}, \qquad (45)$$

$$\mathcal{E}_{k_1k_2,k_4k_5}^{(hh)} = \sum_{\alpha\beta\gamma\delta} \bar{\mathcal{V}}_{\alpha}^{k_1} \bar{\mathcal{V}}_{\beta}^{k_2} v_{\alpha\beta,\gamma\delta} \big(\bar{\mathcal{V}}_{\gamma}^{k_4} \bar{\mathcal{V}}_{\delta}^{k_5} \big)^*.$$
(46)

$$\mathcal{L}_{\alpha,r}^{(\text{IIe})} = \frac{1}{\sqrt{6}} \mathcal{A}_{123} \sum_{\substack{\mu\nu\lambda\\k_{7}k_{0}}} v_{\alpha\lambda,\mu\nu} \left(\bar{\mathcal{V}}_{\nu}^{k_{7}} \mathcal{U}_{\lambda}^{k_{8}}\right)^{*} \mathcal{U}_{\mu}^{k_{1}} t_{k_{7}k_{3}}^{k_{8}k_{2}}, \quad (50)$$

$$\mathcal{C}_{\alpha,r}^{(\text{IIf})} = \frac{1}{\sqrt{6}} \mathcal{A}_{123} \sum_{\substack{\mu\nu\lambda\\k_7k_8}} v_{\alpha\lambda,\mu\nu} \left(\mathcal{U}_{\lambda}^{k_7} \bar{\mathcal{V}}_{\mu}^{k_8} \right)^* \mathcal{U}_{\nu}^{k_1} t_{k_7k_3}^{k_8k_2}, \quad (501)$$

$$\mathcal{C}_{\alpha,r}^{(\mathrm{IIg})} = \frac{1}{\sqrt{6}} \mathcal{A}_{123} \sum_{\substack{\mu\nu\lambda\\k_7k_8}} v_{\alpha\lambda,\mu\nu} \big(\bar{\mathcal{V}}_{\mu}^{k_7} \bar{\mathcal{V}}_{\nu}^{k_8}\big)^* \bar{\mathcal{V}}_{\lambda}^{k_1} t_{k_7k_3}^{k_8k_2}, \quad (50)$$

$$\mathcal{E}_{r,r'}^{(\text{Ic})} = \frac{1}{6} \mathcal{A}_{123} \mathcal{A}_{456} \left(\delta_{k_1,k_4} \mathcal{E}_{k_2k_3,k_5k_6}^{(ph)} \right)$$

Diagrams grow factorially (more than exponentially) with the order A direct calculation of all diagrams beyond order three is unfeasible.

Order: IV V

Diagrammatic Monte Carlo (DiagMC) *samples diagrams in their topological space* using a Markov chain.

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Overview of the math

$$\Sigma_{\alpha\beta}^{\star}(\omega) = \sum_{\mathcal{T}} \sum_{\gamma_1 \dots \gamma_n} \int d\omega_1 \dots d\omega_m \ \mathcal{D}_{\alpha}^{\omega}$$

We define $\mathcal{C} := (\mathcal{T}; \gamma_1 ... \gamma_n; \omega_1 ... \omega_m)$

$$\Sigma_{\alpha\beta}^{\star}(\omega) = \int d\mathcal{C} \, |\mathcal{D}_{\alpha\beta}^{\omega}(\mathcal{C})| e^{i \arg \left[\mathcal{D}_{\alpha\beta}^{\omega}(\mathcal{C})\right]} 1_{\mathcal{T}}$$

$$\Sigma_{\alpha\beta}^{\star}(\omega) = \mathcal{Z}_{\alpha\beta}^{\omega} \int d\mathcal{C} \; \frac{|\mathcal{D}_{\alpha\beta}^{\omega}(\mathcal{C})|W_{o}(N)|}{\mathcal{Z}_{\alpha\beta}^{\omega}} \frac{e^{i \arg[\mathcal{D}_{\alpha\beta}^{\omega}]}}{W_{o}(N)}$$

$$w^{\omega}_{\alpha\beta}\left(\mathcal{C}\right) := \frac{|\mathcal{D}^{\omega}_{\alpha\beta}\left(\mathcal{C}\right)|W}{\mathcal{Z}^{\omega}_{\alpha\beta}}$$

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 $\mathcal{T}_{\mathcal{A}_{\mathcal{B}}}(\mathcal{T};\gamma_{1}...\gamma_{n};\omega_{1}...\omega_{m}) 1_{\mathcal{T}\in\mathcal{S}_{\Sigma^{\star}}}$

 $W_o(N)$ is an order dependent reweighting factor

 $W_o(N)$ is a normalization factor

 $V_o(N)$ is a probability distribution function

The Markov chain must have the correct equilibrium distribution $w^{\omega}_{lphaeta}\left(\mathcal{C}
ight)$:

$$\Sigma_{\alpha\beta}^{\star}(\omega) = \mathcal{Z}_{\alpha\beta}^{\omega} \left[\lim_{n \to \infty} \frac{1}{n} \sum_{i=1}^{n} \frac{e^{i \arg[\mathcal{D}_{\alpha\beta}^{\omega}]}}{W_o(N_{\alpha\beta})} \right]$$

where the normalization $\mathcal{Z}_{\alpha\beta}^{\omega}$ is unknown but it can be estimated.

We turn propagators that close on themselves into zigzag lines with an arbitrary value

$$e^{i\omega_{1}\eta}G_{\alpha}\left(\omega_{1}\right) = \overset{\alpha}{\alpha} \overbrace{\qquad}^{\omega_{1}} \longrightarrow$$

with k an arbitrary constant that can be used to optimize the convergence.

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 $\frac{g\left[\mathcal{D}_{\alpha\beta}^{\omega}(\mathcal{C}_{i})\right]}{V_{o}(N)} \mathbb{1}_{\mathcal{T}_{i}\in\mathcal{S}_{\Sigma}^{\star}}$

$$\alpha \overset{\mathsf{M}}{\underset{\alpha}{\overset{\omega_{1}}{\overset{\omega_$$

Define the normalisation sector S_N to be made of **both** these diagrams:

 S_N has weight:

$$\mathcal{Z}_{N\alpha}^{\omega} := \int_{\mathcal{S}_N} d\mathcal{C} \ w_{\alpha}^{\omega} = \frac{|g|}{4\sqrt{\pi k}} + \frac{g^2}{16\pi k} |G_{\alpha}(\omega)| W_o(2)$$

Then, we get the fundamental equation of DiagMC:

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 \odot These diagrams belong to w^ω_lpha but not to $\mathcal{S}_{\Sigma^\star}$ They are easy to integrate and to simulate with the Monte Carlo method

The expected number of times the normalization sector is visited (\mathcal{N}) gives the normalization $\mathcal{Z}^{\omega}_{\alpha}$:

$$\frac{\mathcal{Z}_N{}_{\alpha}^{\omega}}{\mathcal{Z}_{\alpha}^{\omega}} = \lim_{n \to \infty} \frac{\mathcal{N}}{n}$$

$$\Sigma_{\alpha}^{\star}(\omega) = \mathcal{Z}_{N\alpha}^{\omega} \lim_{n \to \infty} \frac{1}{\mathcal{N}} \sum_{i=1}^{n} \frac{e^{i \arg[\mathcal{D}_{\alpha}^{\omega}(\mathcal{C}_{i})]}}{W_{o}(N)} \mathbb{1}_{\mathcal{T}_{i} \in \mathcal{S}_{\Sigma^{\star}}}$$

Application to the Richardson-Gaudin pairing model with D levels (of spin 1/2) and M=4 fermions:

$$H = \xi \sum_{\alpha=0}^{D-1} \sum_{\sigma=+,-} \alpha c^{\dagger}_{\alpha\sigma} c_{\alpha\sigma} - \frac{g}{2} \sum_{\alpha,\beta=0}^{D-1} c^{\dagger}_{\alpha+\beta}$$

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Pairing Hamiltonian

- Change Frequency 1
- Change Single-Particle Quantum Numbers 2
- Add Loop 3
- Reconnect 5

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Standard Monte Carlo

Change Frequency

2 Change Single-Particle Quantum Numbers

Change Frequency:

Change Single-Particle Quantum Numbers:

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The updates

Standard Monte Carlo

 ω'_1 is drawn from the probability distribution $W_f(\omega'_1)$.

$$q_{AL} = \frac{|g|}{4\pi} \frac{1}{W_f(\omega_1')} e^{-k\omega_1'^2} |G_{\alpha}(\omega)| \frac{W_o(3)}{W_o(2)}$$

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The unphysical propagators are turned into physical ones when reconnected.

$$\begin{split} \Sigma_{\alpha\beta}^{\star}(\omega) &= \Sigma_{\alpha\beta}^{(\infty)} + \sum_{i,j} \mathbf{M}_{\alpha,i}^{\dagger} \left(\frac{1}{E - (\mathbf{K}^{>} + \mathbf{C}) + i\Gamma} \right)_{i,j} \mathbf{M}_{j,\beta} \\ &+ \sum_{r,s} \mathbf{N}_{\alpha,r} \left(\frac{1}{E - (\mathbf{K}^{<} + \mathbf{D}) - i\Gamma} \right)_{s,j} \mathbf{M}_{j,\beta} \end{split}$$

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Results of the simulation for D=4

Figure 4.1: Components $\alpha = 0$ and $\alpha = 2$ of the imaginary part of the self-energy for different values of the coupling g. The blue line is the results obtained with the BDMC simulation, while the red line is the best fit as a sum of two Lorentzians. The results for the two values of $\alpha = 0, 2$ are displayed respectively on the left and on the right of the graph. The error bars are calculated as explained in the main text.

Imaginary part of the component $\alpha = 0$ of the diagonal self-energy for different values of the coupling:

We fitted the imaginary part of the self-energy as a sum of Lorentzians.

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Results of the simulation for D=4

D-1 $H = \xi \sum_{\alpha=0}^{-} \sum_{\sigma=+,-} \alpha c_{\alpha\sigma}^{\dagger} c_{\alpha\sigma}$ D - 1 $-\frac{g}{2}\sum_{\alpha,\beta=0}^{\nu-1}c_{\alpha+}^{\dagger}c_{\alpha-}^{\dagger}c_{\beta-}c_{\beta+}$

Correlation energy $\Delta E = E - E_{HF}$ as a function of interaction strength (g):

Results of the simulation for D=4

$$\Gamma^{(0)} := \bullet - \bullet + \bullet + \bullet + \bullet + \bullet + \bullet + \cdots \bullet + \bullet + \cdots \bullet$$

- -> New resummations scheme, now <u>up to 3rd oder in Γ (actually, we find convergence at order 1)</u>
- -> New set of diagrammatic update rules
- -> New normalisation sectors.

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It restores the correct spectral representation also for g < -0.4!

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| 0.00 - | - |
|--|------------|
| 0.01 - | - |
| 0.02 - | |
| 0.03 - | <i>g</i> = |
| | |
| | r |
| 0.1 - | - |
| 0.1 - 0.0 - | + |
| 0.1 - 0.0 - -0.1 - | ••••• |
| 0.1 - 0.0 - -0.1 - -0.2 - | |
| 0.1 - 0.0 - -0.1 - -0.2 - | |
| 0.1 - 0.0 - -0.1 - -0.2 - -0.3 - | |

Reorganization in terms of ladders (Γ)

Take home messages on DiagMC

- We were able to obtain results in good agreement with the exact ones and the ones predicted by other state-of-the-art techniques.
- In future developments we need to extend the algorithm to higher order diagrams.
- A different updating scheme or a different method to sample higher order contributions can be considered.
- The application to realistic interactions is something that has to be studied in the next years

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All merits goes to:
  L. Lazzarino, G. Paravizzini (NQS)
   S. Brolli (DiagMC)
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