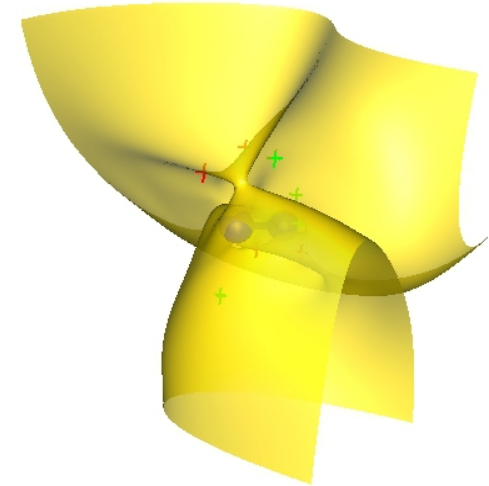
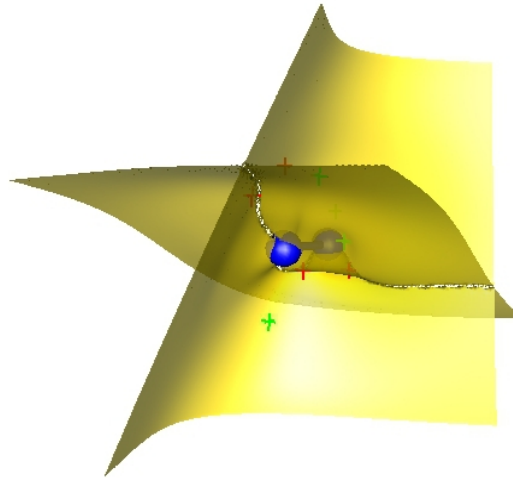
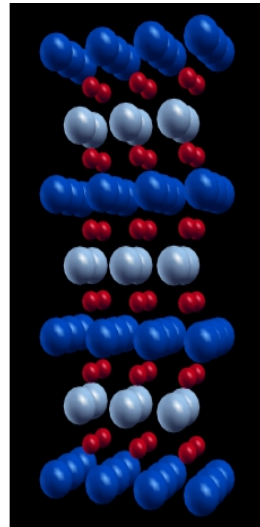
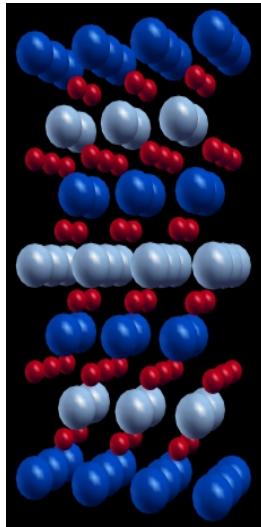


Quantum Monte Carlo: introduction



**J. Kolorenc, M. Bajdich, S. Hu, S. Guo, M. Zhu, M. Dubecky,
C. Melton, M.C. Bennett, A. Kulahlioglu, A. Ambrosetti,
F. Pederiva,**

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Properties of matter: molecules, liquids, solids, ultracold condensates, etc...

→ **stationary Schrödinger equation**

Hamiltonian of interacting electrons and nuclei

$$H = -\frac{1}{2} \sum_i^N \nabla_i^2 - \sum_{i,I} \frac{Z_I}{r_{iI}} + \sum_{i<j} \frac{1}{r_{ij}} + E_{\text{nucl-nucl}}$$

Stationary Schrödinger equation

$$H \psi_k(\mathbf{R}) = E_k \psi_k(\mathbf{R}) \quad \mathbf{R} = (\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_N)$$

Solution, ie, spectrum $\{E_k, \psi_k\}$ contains all what we need for



- **stability/cohesion, eqs. of state, phase diagrams, magnetic order, ...**
- **excitations: optical properties, transport, responses to ext. fields, ...**
→ **key inputs for other methods (T>0, atomistic, etc)**

$\{E_k, \psi_k\}$ have to be astonishingly accurate → precise treatment of many-body effects, ie, correlations, is crucial for any predictions

accuracy: physics of interest at 6th ... 12th digit of total energies

- binding, cohesion, optical excit.: $\rightarrow 1 \text{ eV}$
- magnetism/spins: $T_{\text{Neel}} \sim 1000 - 100\text{K} \rightarrow 0.1 - 0.01 \text{ eV}$
- superconductivity: $T_{\text{c}} \sim 100 - 10\text{K} \rightarrow 0.01 - 0.001 \text{ eV}$
- heavy fermions: $T \sim 1\text{K} \rightarrow 0.0001 \text{ eV}$

Method, in a nutshell

Project out the ground state \rightarrow imaginary time Schrodinger eq. (Schrodinger 1930, Fermi 1933)

$$\underbrace{\psi(\mathbf{R}, t) = \exp(-tH)}_{\text{projector in parameter } t} \underbrace{\psi_T(\mathbf{R})}_{\text{trial wave function}} \rightarrow \psi(\mathbf{R}, t \rightarrow \infty) \propto \underbrace{\phi_0(\mathbf{R})}_{\text{ground state of given symm.}}$$

$H \rightarrow$ interacting quantum particles, eg, electrons + ions

$\mathbf{R} = (\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_N) \rightarrow$ 3N-dim. continuous space

Projection/evolution equation \rightarrow Euclidian/imaginary time Sch. eq.

$$-\partial_t \psi(\mathbf{R}, t) = H \psi(\mathbf{R}, t)$$



$$\psi(\mathbf{R}, t + \tau) = \int G(\mathbf{R}, \mathbf{R}', \tau) \psi(\mathbf{R}', t) d\mathbf{R}'$$

Green's function $G(\mathbf{R}, \mathbf{R}', \tau) = \langle \mathbf{R} | \exp(-\tau H) | \mathbf{R}' \rangle \rightarrow$ transition probability

Stochastic method for solving the evolution

$$\psi(\mathbf{R}, t + \tau) = \int G(\mathbf{R}, \mathbf{R}', \tau) \psi(\mathbf{R}', t) d\mathbf{R}'$$

Map it onto an equivalent stochastic process:

Value of the wavefunction \leftrightarrow density of sampling points in 3N-space

$$\psi(\mathbf{R}, t) = \text{dens} \left[\sum_i^{\text{walkers}} \delta(\mathbf{R} - \mathbf{R}_i(t)) \right] + \epsilon_{\text{statistical}}$$

sampling points \rightarrow “walkers” \rightarrow eigenstates of position operator

Solution: take short-time approx. to $G(\mathbf{R}, \mathbf{R}', \tau)$ and iterate

Essentially: Feynman path integrals in Euclidean time

Toy model: 1D harmonic oscillator

$$H = T + V(x)$$

Propagator

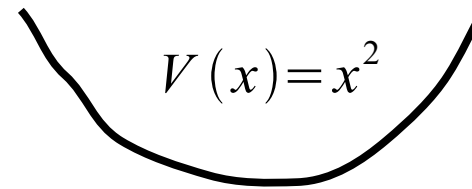
$$G(x, x', \tau)$$



$$C e^{-(x-x')^2/2\tau} \cdot e^{-(V(x) - E_T)\tau}$$

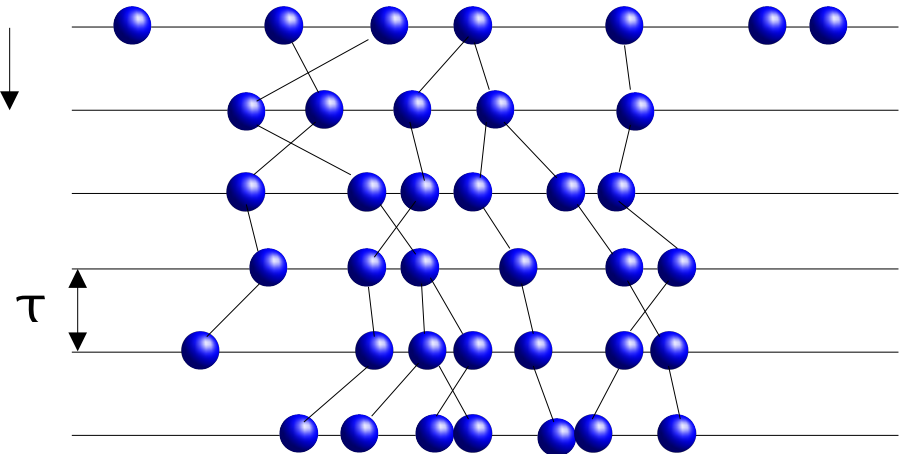
diffusion

weight

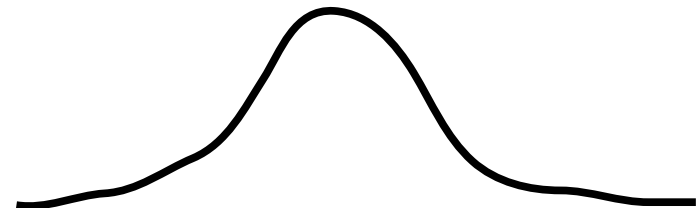


$$\psi_{init}(x)$$

$t \downarrow$



$$\psi_{ground}(x)$$



Sign problem: fermionic wave functions are both + and -

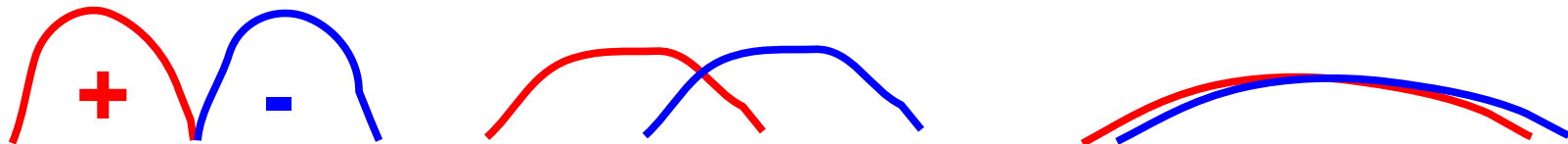
Naïve approach: decompose to + and -

$$\psi_T(\mathbf{R}) = \psi_T^+(\mathbf{R}) - \psi_T^-(\mathbf{R})$$

$$-\partial_t \psi^+(\mathbf{R}, t) = H \psi^+(\mathbf{R}, t)$$

$$-\partial_t \psi^-(\mathbf{R}, t) = H \psi^-(\mathbf{R}, t)$$

However, + and - components are independent (linearity of Sch. eq.) \rightarrow both components converge to the lowest energy solution \rightarrow bosonic !



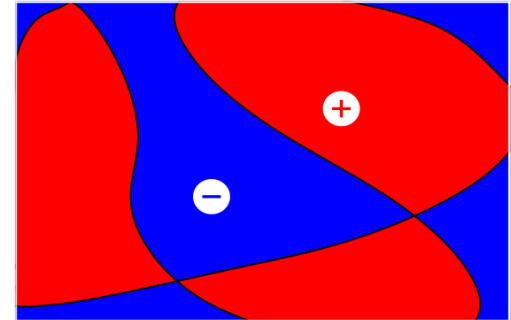
$$\lim_{t \rightarrow \infty} \psi^+(\mathbf{R}, t) - \lim_{t \rightarrow \infty} \psi^-(\mathbf{R}, t) \propto \exp[-(E_{\text{Fermionic}} - E_{\text{Bosonic}})t]$$

Fermionic "signal" decays exponentially quickly into a bosonic "noise"

Solution: impose a constraint \rightarrow fixed-node approximation diffusion Monte Carlo (FNDMC)

Fixed-node (FN) approximation:

$$\text{sign}[\phi(\mathbf{R}, t)] \stackrel{!}{=} \text{sign}[\psi_T(\mathbf{R})]$$



Then the product is nonnegative: $\psi_T(\mathbf{R})\phi(\mathbf{R}, t) = f(\mathbf{R}, t) > 0$

Modify the Schr. eq. accordingly: $f(\mathbf{R}, t + \tau) = \int G^*(\mathbf{R}, \mathbf{R}', \tau) f(\mathbf{R}', t) d\mathbf{R}'$

The projection $f(\mathbf{R}, t \rightarrow \infty) \propto \psi_T(\mathbf{R})\phi_{\text{ground}}(\mathbf{R})$ **now depends on**

the fermion node: $(3N-1)$ -dim. hypersurface defined as $\phi(r_1, r_2, \dots, r_N) = 0$

Clearly, the node divides the configuration space into + and – domains.

Fermion node toy model: excited state of harmonic oscillator

$$H = T + V(x)$$

Propagator

$$G(x, x', \tau)$$

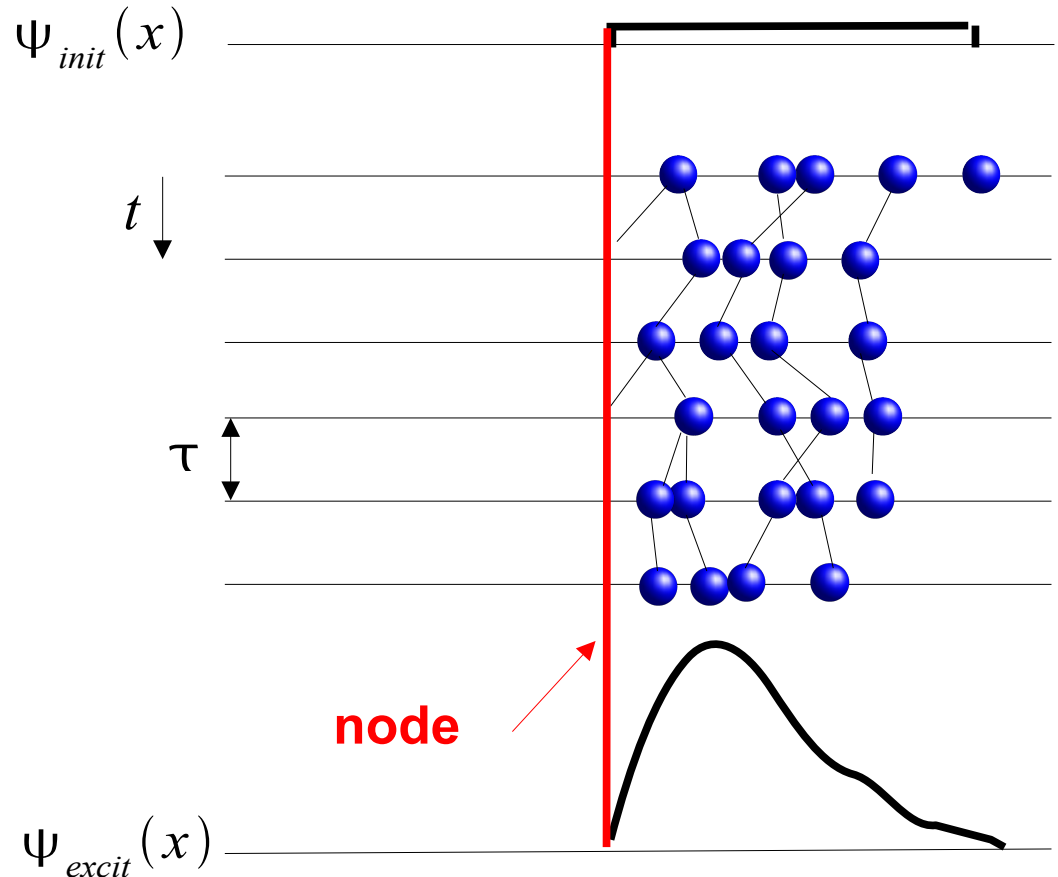
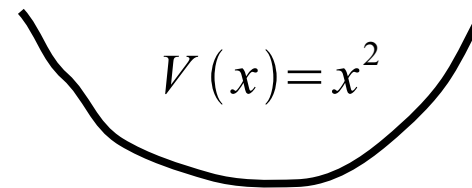


$$C e^{-(x-x')^2/2\tau} \cdot e^{-(V(x)-E_T)\tau}$$

diffusion

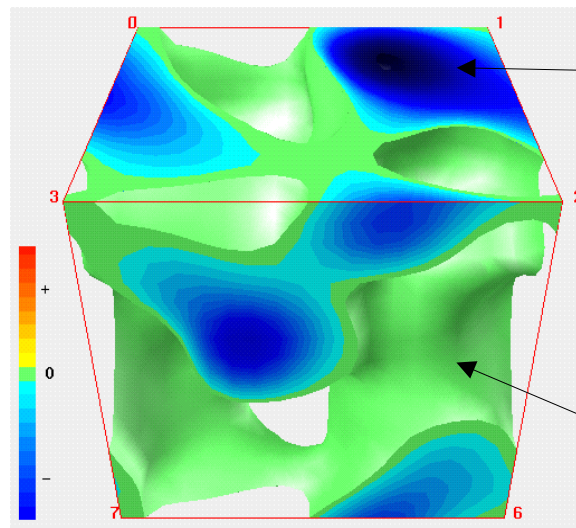
renorm

+ node (boundary cond.)



Fixed-node approximation and fermion nodes

- antisymmetry (nonlocal) replaced by a boundary (local) → boundaries are easy to enforce
- exact node implies recovering exact energy (in polynomial time)



wave function value

3D subset of 59-dim. node

- exact nodes generally unknown, however, **approximate nodes surprisingly accurate (and systematically improvable)**

QMC calculations: basic steps

Hamiltonian: - often valence e- only, using pseudopotentials/ECPs
- explicit e-e interactions, full many-many body

Trial wave functions:

- correct symmetries
- sampling efficiency
- capture the physics

Commonly used **correlated Slater-Jastrow** type:

$$\psi_{Trial} = \det^{\uparrow}[\{\phi_{\alpha}\}] \det^{\downarrow}[\{\phi_{\beta}\}] \exp[U_{corr}]$$

or

$$\psi_{Trial} = \sum_k c_k \det_k^{\uparrow}[\{\phi_{\alpha}\}] \det_k^{\downarrow}[\{\phi_{\beta}\}] \exp[U_{corr}]$$

QMC calculations: basic steps II

Orbitals $\{\phi_\alpha\}, \{\phi_\beta\}$ from : - Hartree-Fock, post-HF
- Density Functional Theory, hybrid DFT
- possibly CI (natural orbitals), etc

→ QMC interfaced with other codes

Explicit correlations: $U_{corr} = \sum_{i,j} f_{e-e}(r_{ij}) + \sum_{i,I} f_{e-ion}(r_{iI}) + \dots$
- optimized variationally

$$E_{VMC} = \frac{\int \psi_T^2 [H \psi_T / \psi_T] d\mathbf{R}}{\int \psi_T^2 d\mathbf{R}} = \frac{1}{M} \sum_{sample}^M \frac{H \psi_T(\mathbf{R}_{sample})}{\psi_T(\mathbf{R}_{sample})} + \epsilon_{stat} (1/\sqrt{M})$$

where the samples are distributed as $\psi_T^2(\mathbf{R})$

QMC calculations: basic steps III

Quantities which do not commute with Hamiltonian are more complicated → DMC produces only mixed estimators

$$\langle A \rangle_{DMC} = \langle \psi_T | A | \psi_{DMC} \rangle$$

Correction:

$$\langle A \rangle \approx 2 \langle \psi_T | A | \psi_{DMC} \rangle - \langle \psi_T | A | \psi_T \rangle$$

Methods such as reptation MC sample the square of the wave function but significantly more expensive

QMC calculations of solids

Solids: periodic supercells

- Coulomb potential energy → Ewald sums
- kinetic energy: sampling of k-points of the supercell Brillouin zone → twist averages
- twist average states are not necessarily periodic with the supercell, neither necessarily real (fixed-node can be generalized to fixed-phase, more on the fixed-phase later)
- thermodynamic limit: finite size corrections
(for metals this could be a challenge, eg, for a complicated Fermi surface)

How does it work ?

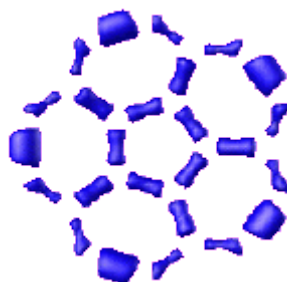
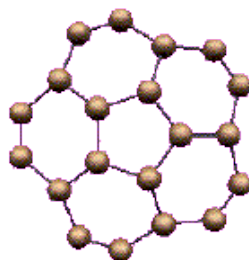
Let us look at a few applications

Some history: what is the lowest energy isomer of C_{20} ???

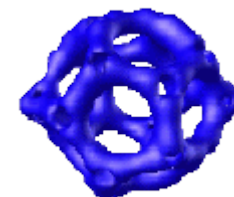
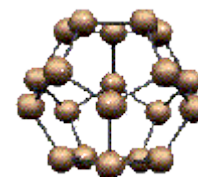
ring



bowl

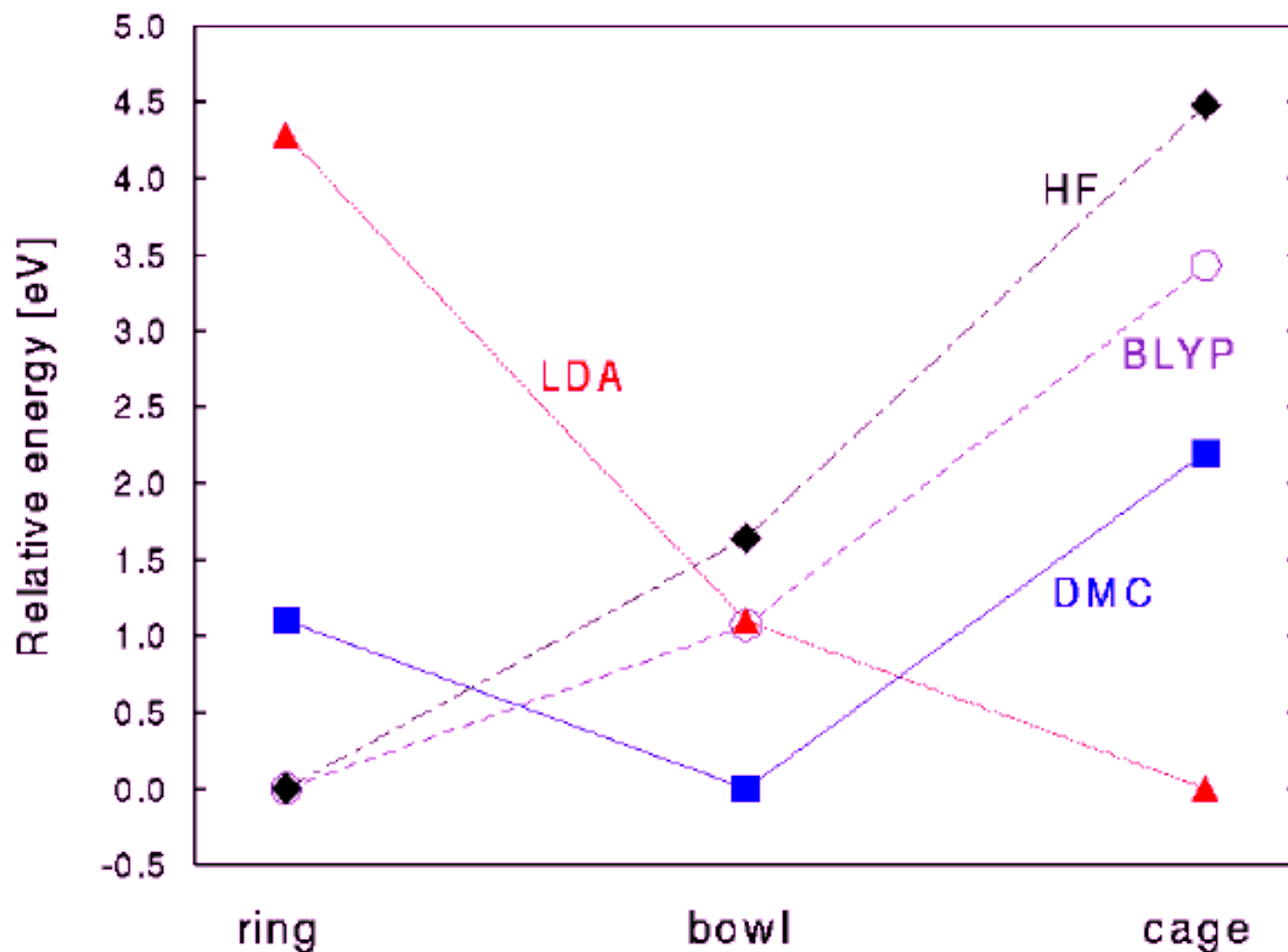


cage



J.C. Grossman, LM, K. Raghavachari, PRL 75, 3870 (1995)

**QMC was the first method to predict this
(later confirmed by independent methods)**

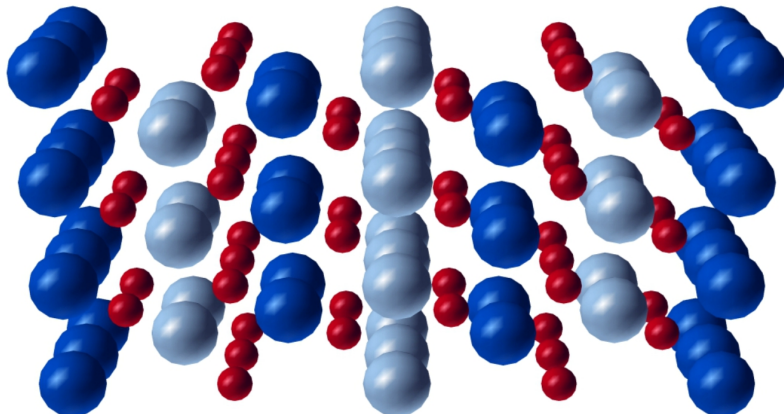


J.C. Grossman, LM, K. Raghavachari, PRL 75, 3870 (1995)

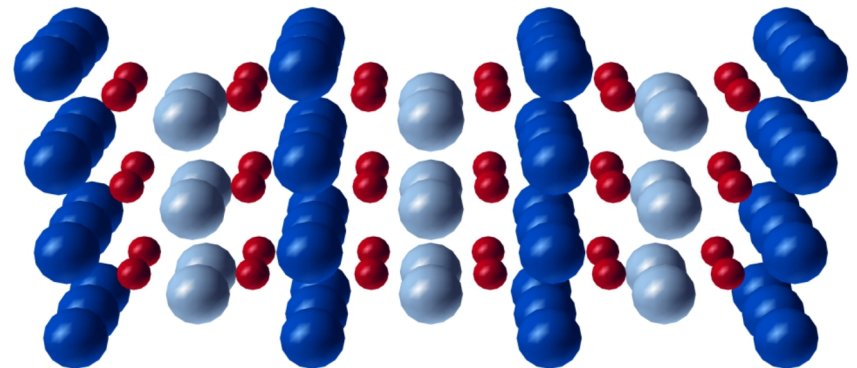
More recent challenge: FeO solid at high pressures

- **large e-e correlations, difficult**: competition of Coulomb, exchange, correlation and crystal-field effects; open d-shell; important **high-pressure physics** (Earth interior, for example)
- mainstream Density Functional Theories (DFT) predict:
 - **metal instead of antiferromagnetic large-gap insulator**
 - **wrong equilibrium atomic structure**

B1 (NaCl) AFII (true equil.)



iB8 (NiAs) AF (high press.)



Plain vanilla fixed-node DMC for the FeO solid

- Ne-core, scalar relativistic pseudopotentials on Fe
- 8 supercells (176 valence e-) of FeO in DMC, larger supercells in VMC
- total energy about 4000 eV, trying for accuracy 0.1 eV
- Slater-Jastrow wf $\psi_{Trial} = \det^{\uparrow}[\phi_{\alpha}] \det^{\downarrow}[\phi_{\beta}] \exp[U_{corr}]$
- one-particle orbitals from hybrid DFT (more on that later)

Comparisons of the FeO solid equilibrium parameters

	DFT/PBE	FNDMC	Exp.(FeO _{1-x})
iB8-B1/AFMII [eV]	- 0.2	0.5 (1)	>0
Cohesion [eV]	~ 11	9.7(1)	9.7(2)
a ₀ [Å]	4.28	4.32(1)	4.31 - 4.33
K ₀ [GPa]	191	170(10)	140 - 180
Gap [eV]	~ 0 (metal)	2.8(4)	~ 2.4

Gap and excitations in QMC

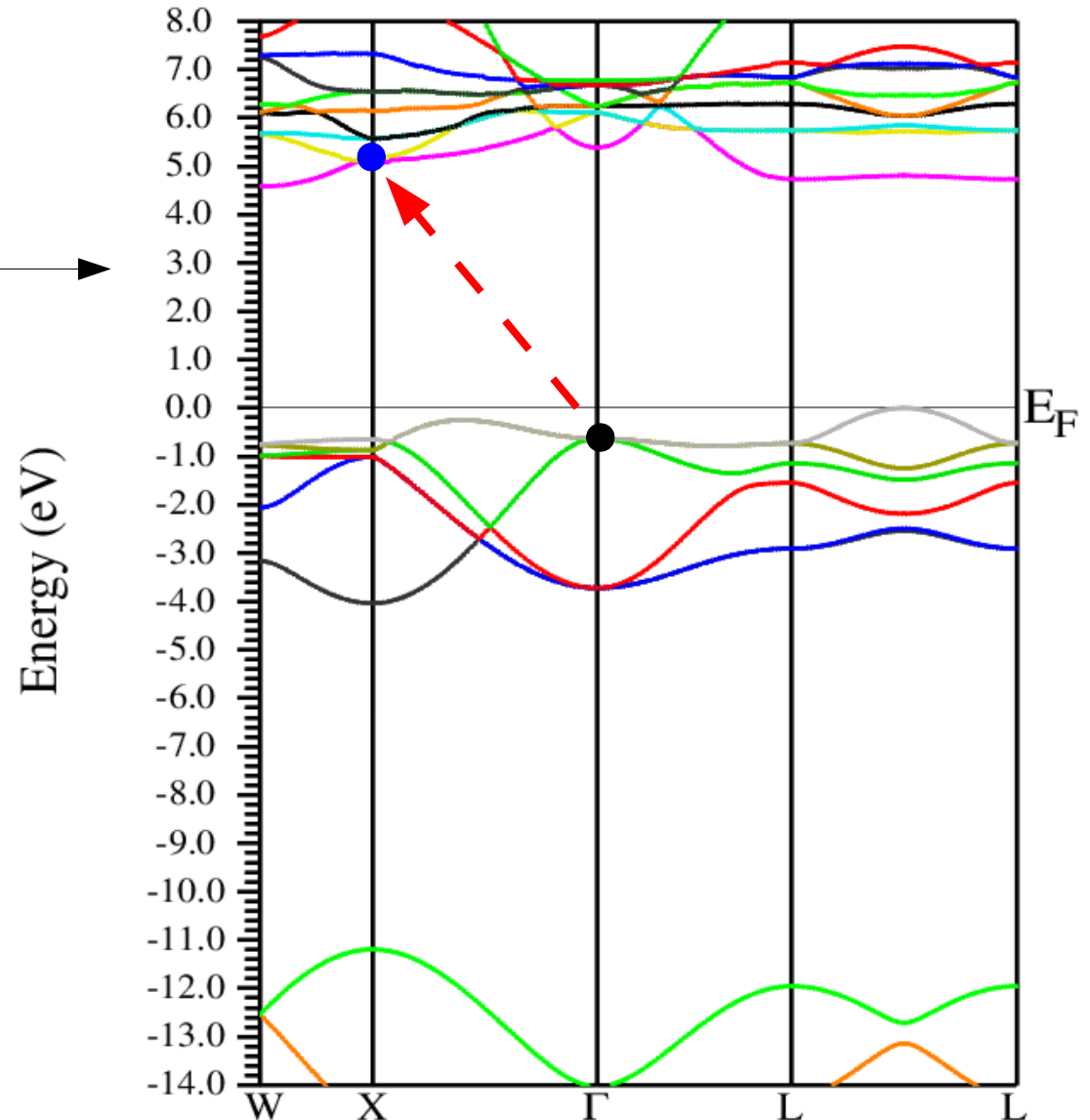
Assume an insulator:

- 1) Excite a valence state into a conduction state

$$E_{\text{gap}} \sim E_{\text{excit}} - E_{\text{ground}}$$

- carry out several of these
→ “band structure scan”

- 2) Add an electron
(technically more complicated, but doable)



Beyond Slater-Jastrow wave functions:

BCS and pfaffians

Why beyond Slater-Jastrow ?

Slater-Jastrow:

$$\psi_{Trial} = \det^{\uparrow}[\phi_{\alpha}] \cdot \det^{\downarrow}[\phi_{\beta}] \exp[U_{corr}]$$



$$node = (node^{\uparrow}) \cdot (node^{\downarrow})$$

Strictly speaking, nodes have such product form only in non-interacting systems → the nodal domains count is **higher** than it should be → sometimes this still an excellent approximation while in other cases it does matter

Possibilities to take unlike spin correlations into account:

- 1) linear combination of determinants (CI)**
- 2) more general antisymmetric forms**

Possible antisymmetric forms (polynomial complexity)

Slater determinant: $\psi_{HF}(1,2,\dots,N) = A \prod_i \phi_i(j) = \det[\phi_i(j)]$
↑
single-particle orbitals

BCS wave function (spin singlet, fixed-number of pairs, in first quantization):

$$\psi_{BCS} = \det[\phi^{\uparrow\downarrow}(i,j)] \quad i,j = 1,\dots,N$$

↑
pair orbital

Pfaffian: (any spin state, antisymmetrized pairs of any spin)

$$\psi_{PF} = A[\phi(1,2)\phi(3,4)\dots] = pf[\phi(i,j)] \quad i,j = 1,\dots,2N$$


↙ ↘
pair spinorbital




Pfaffian: signed sum of all distinct pair partitions of permutations (Pfaff, Cayley ~ 1850) → polynomial complexity

$$pf[a_{ij}] = \sum_P (-1)^P a_{i_1 j_1} \dots a_{i_{2N} j_{2N}}, \quad i_k < j_k, \quad k = 1, \dots, 2N$$

- determinant is a special case of pfaffian (**pfaffian is more general**)
- pfaffian algebra similar to determinants (minors, etc) → fast evaluation, $O(N^3)$
- ψ_{HF}, ψ_{BCS} special cases of ψ_{PF}

$$\phi(x_i, x_j) = \phi^{\uparrow\downarrow}(r_i, r_j)(\uparrow\downarrow - \downarrow\uparrow) + \chi^{\uparrow\uparrow}(r_i, r_j)(\uparrow\uparrow) + \chi^{\downarrow\downarrow}(r_i, r_j)(\downarrow\downarrow) + \chi^{\uparrow\downarrow}(r_i, r_j)(\uparrow\downarrow + \downarrow\uparrow)$$


symmetric/singlet




antisymmetric/triplet

Pfaffian wavefunctions with **both** singlet and triplet pairs (beyond BCS!) → all spin states treated consistently: simple, elegant

$$\Psi_{PF} = pf \begin{bmatrix} \chi^{\uparrow\uparrow} & \phi^{\uparrow\downarrow} & \psi^{\uparrow} \\ -\phi^{\uparrow\downarrow T} & \chi^{\downarrow\downarrow} & \psi^{\downarrow} \\ -\psi^{\uparrow T} & -\psi^{\downarrow T} & 0 \end{bmatrix} \times \exp[U_{corr}]$$

- pairing orbitals (geminals) expanded in one-particle basis

$$\begin{aligned} \phi(i, j) &= \sum_{\alpha \geq \beta} a_{\alpha\beta} [h_{\alpha}(i) h_{\beta}(j) + h_{\beta}(i) h_{\alpha}(j)] \\ \chi(i, j) &= \sum_{\alpha > \beta} b_{\alpha\beta} [h_{\alpha}(i) h_{\beta}(j) - h_{\beta}(i) h_{\alpha}(j)] \end{aligned}$$

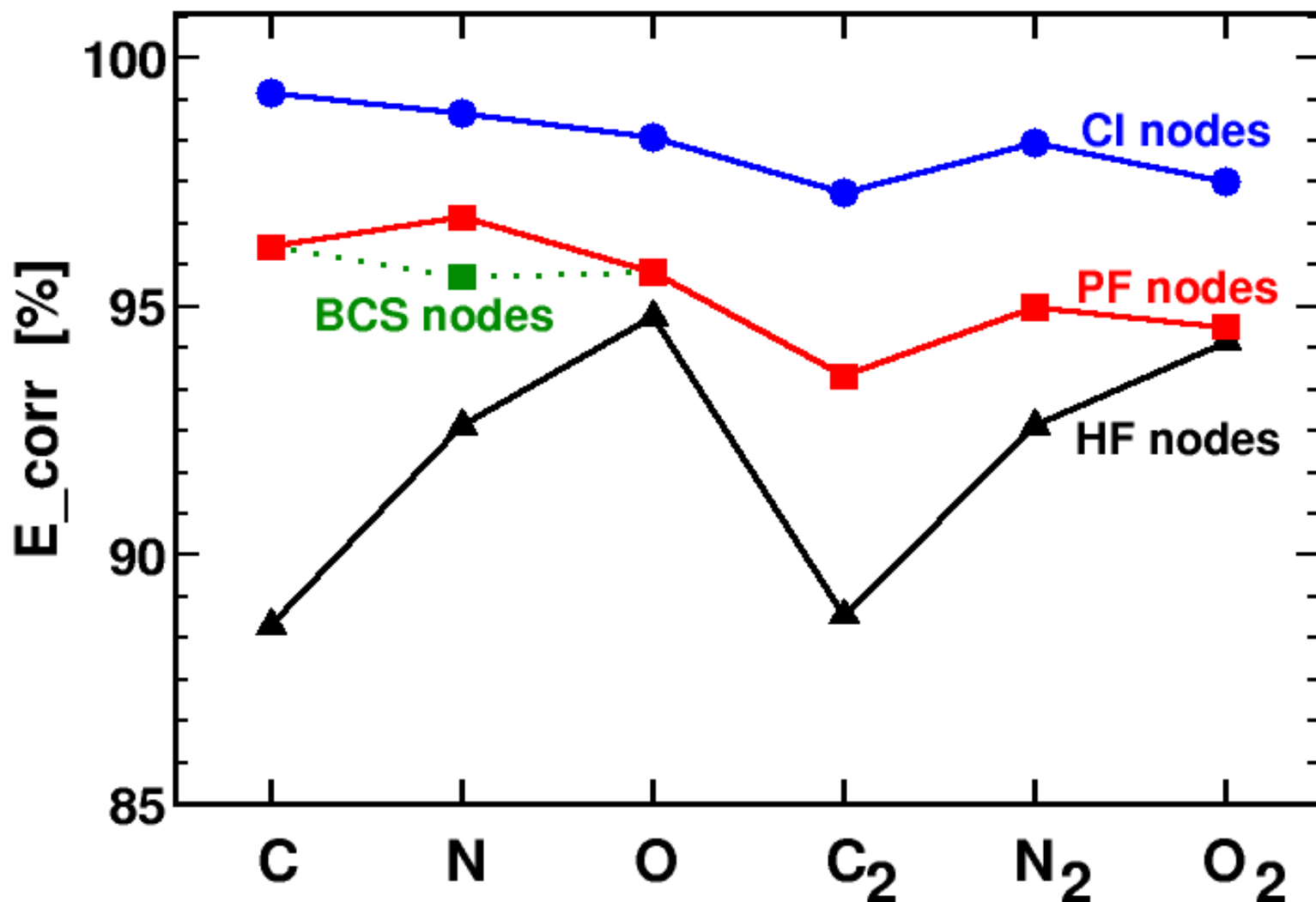
- unpaired

$$\psi(i) = \sum_{\alpha} c_{\alpha} h_{\alpha}(i)$$

BCS wf. for 2N-particle singlet is a special case: $\Psi_{BCS} = \det[\phi^{\uparrow\downarrow}]$

(M. Bajdich et al, PRL '06; PRB '08)

DMC correlation energies of atoms, dimers
Pfaffians: more accurate and **systematic** than HF
while **scalable** (unlike CI)



Expansions in many pfaffians for first row atoms: FNDMC ~ 98 % of correlation with **a few** pfaffians

Table of correlation energies [%] recovered: MPF vs CI nodes

n = # of pfs/dets

WF	n	C	n	N	n	O
DMC/MPF	3	98.9	5	98.4	11	97.2
DMC/CI	98	99.3	85	98.9	136	98.4

- further generalizations: pairing with backflow coordinates, independent pairs, etc (M. Bajdich et al, PRL 96, 130201 (2006))

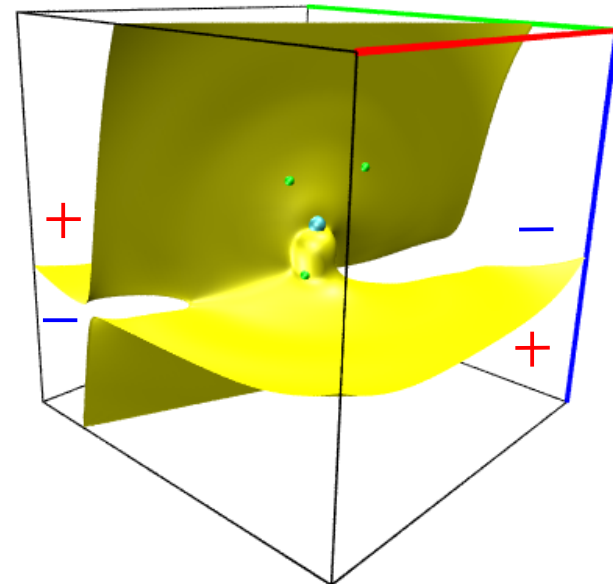
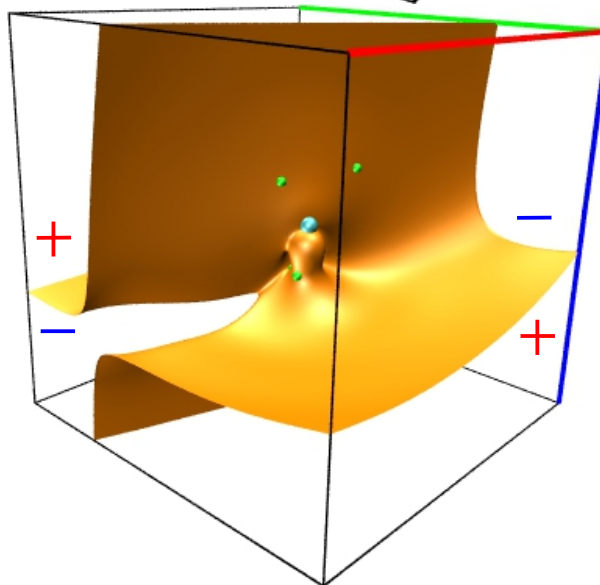
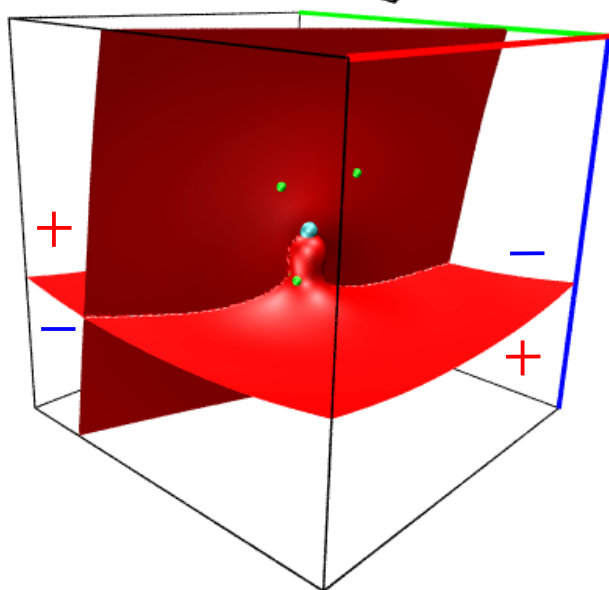
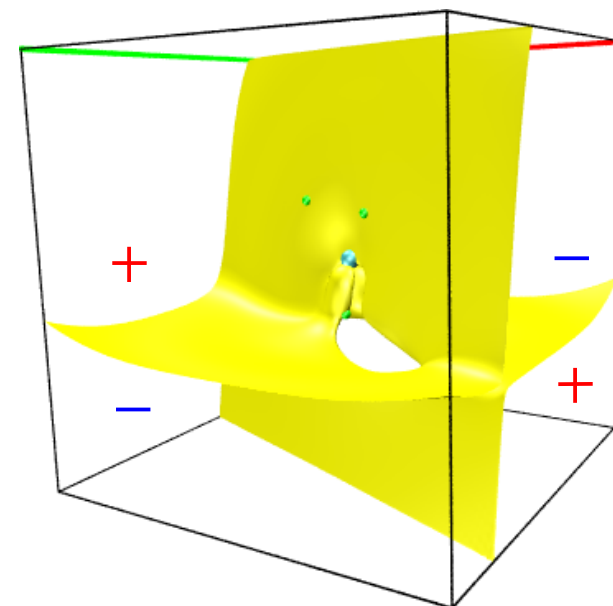
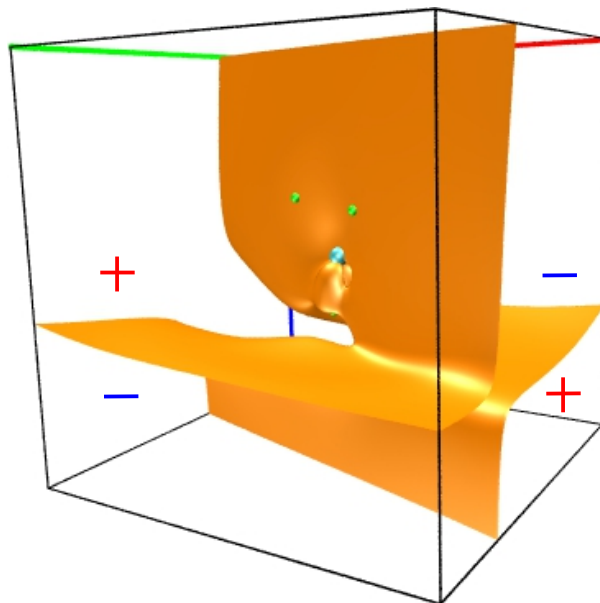
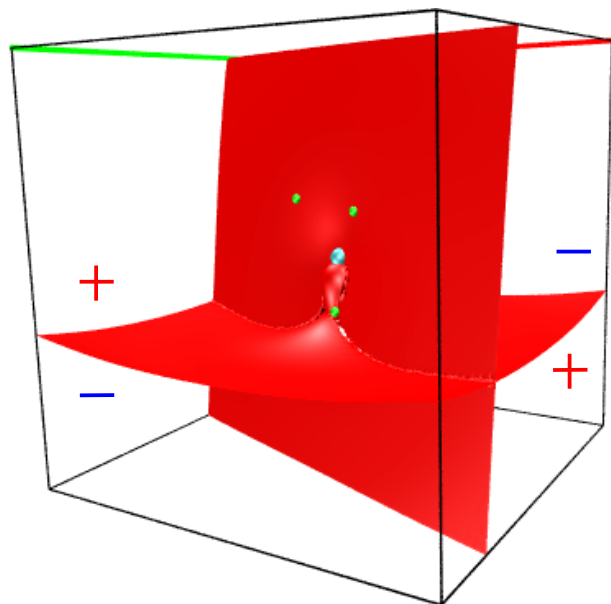
Pfaffians describe nodes more efficiently

**Nodes of different wfs (%E_corr in DMC):
atom wf scanned by 2e- singlet (3D node subset) →
correlation leads to different topologies**

HF (94.0(2)%)

MPF (97.4(1)%)

CI (99.8(3)%)



Spin-orbit: how to treat spins as quantum variables

conventional QMC: spin is fixed - but in reality spins vary

Spinless Hamiltonians commute with **both** individual and total spins → the trial function spin(s) are fixed (spatial problem only)

$$\psi_{Trial} = \sum_k c_k \underbrace{det_k^\uparrow[\phi_\alpha]}_{\text{up}} \underbrace{det_k^\downarrow[\phi_\beta]}_{\text{down}} \exp[U_{corr}] \leftarrow \text{separate spin channels}$$

Hamiltonians with spin-orbit (SO) terms make the spins to vary, eg, one-particle state is a spinor

$$\phi_n(r_i, s_i) = \alpha \phi^\uparrow(r_i) \chi^\uparrow(s_i) + \beta \phi^\downarrow(r_i) \chi^\downarrow(s_i)$$

The simplest antisymm. trial wave function: **determinant of spinors**

$$\psi_{Trial} = det[\phi_n(r_i, s_i)] \exp(U_{corr})$$

key complications for the projector (DMC) methods

- discrete nature of spin (jumps in the sampling path ?)

$$\chi^{\uparrow}(1/2)=\chi^{\downarrow}(-1/2)=1 \quad \chi^{\uparrow}(-1/2)=\chi^{\downarrow}(1/2)=0$$

- inherent complexity of the wave functions
- nonlocality of the SO terms

but also “technicalities”, such as

- find accurate spinors
- multi-reference problems, almost by definition

our approach: keep the spinors fixed, smooth out the spin configurations

we eliminate discontinuities in spin configurations by using overcomplete but compact representation: one possible choice

$$\chi^\uparrow(s) = \exp(+is), \quad \chi^\downarrow(s) = \exp(-is)$$

- smooth projection $\exp(-\tau H) \psi_T$

similarities to Ambrosetti, Gandolfi, Pederiva: “rotating the spinors”, but it is actually **very different: spinors are fixed, not rotating**

advantageous for SO, will see soon

complexity of the wave function, and SOREPs: fixed-phase

$$\psi = \rho(\mathbf{R}, S) \exp[i\phi(\mathbf{R}, S)]$$

so that the Schrodinger equation breaks into Re and Im

$$-\partial_t \rho = [T + V + W^{\Re} + (1/2)(\nabla \phi)^2] \rho$$

$$-\partial_t \phi = [T \phi - \nabla \ln \rho \cdot \nabla \phi + W^{\Im}]$$

the first equation gives the energy eigenvalue and we invoke
the fixed-phase (FP) approximation (Ortiz, Martin, Ceperley '92)

$$\phi \approx \phi_T$$

FP seems looks like a step into an unknown territory, but it is not:
fixed-node is a limit of the fixed-phase (not too difficult to show)

$$(\nabla \phi)^2 \rightarrow C_{\infty} \delta[\mathbf{R} - \mathbf{R}_{node}]$$

sampling of the spin configurations

effective free-particle Hamiltonian (kinetic term) for spins

$$H \rightarrow H + H_{spin}, \quad H_{spin}(s_i) = - \frac{1}{2\mu_s} \left[\frac{\partial^2}{\partial s_i^2} - 1 \right]$$

note that H_{spin} annihilates arbitrary spinor (and arbitrary products)

$$H_{spin}(s_i) [\alpha \phi^\uparrow(r_i) \chi^\uparrow(s_i) + \beta \phi^\downarrow(r_i) \chi^\downarrow(s_i)] = 0$$

therefore, to the leading order, no contribution to the energy

nonlocal SOREP term \rightarrow locality approximation (LM et al '91)

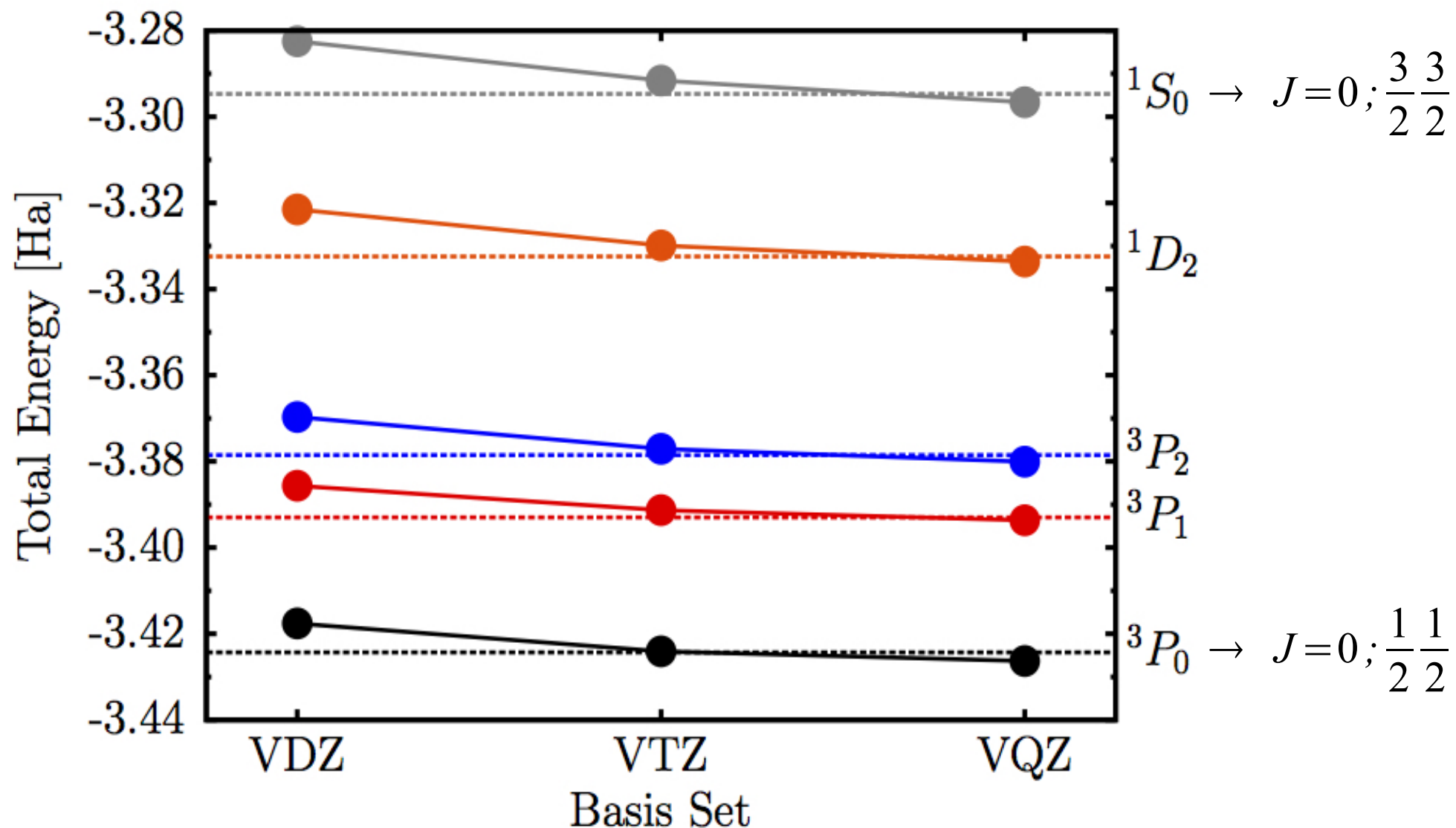
$$W^{\mathfrak{R}} \approx W_T^{\mathfrak{R}} = \mathfrak{R} [\psi_T^{-1} W \psi_T]$$

fixed-phase spin-orbit DMC \rightarrow FPSODMC

**tests on small systems against independent (nominally exact)
vs large-scale CI in explicit two-component/spinor formalism**

**C. Melton, M. Zhu, S. Guo, A. Ambrosetti, F. Pederiva, L.M.,
Phys. Rev. A 93, 042502 (2016)**

total energies Pb atom with valence $6s^26p^2$
 FPSODMC(....) vs CI with ccpVxZ basis(—●—)

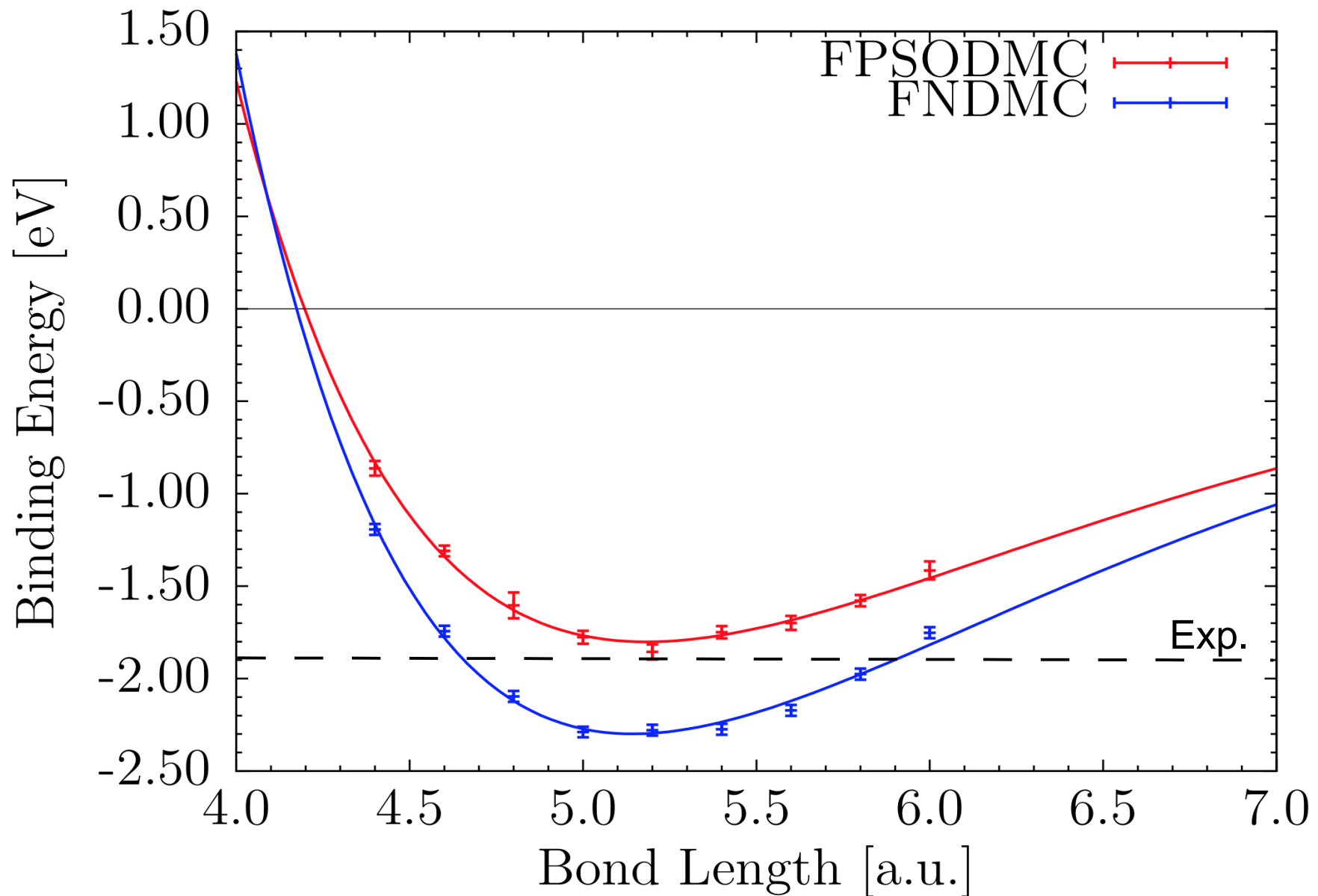


W atom is isovalent with Cr and Mo,
but different ground state: $5d^46s^2 \ ^5D_0$, instead of $5d^56s^1 \ ^7S_3$

Config.	State	COSCI	DMC/COSCI	CISD	DMC/rCISD	Exp
$5d^46s^2$	5D_1	0.10	0.13(1)	0.10	0.15(1)	0.21
$5d^56s^1$	7S_3	- 0.85	- 0.19(1)	0.12	0.19(1)	0.37
$5d^46s^2$	5D_2	0.24	0.30(1)	0.13	0.30(1)	0.41
$5d^46s^2$	5D_3	0.42	0.49(1)	0.29	0.51(1)	0.60
$5d^46s^2$	5D_4	0.60	0.69(1)	0.45	0.69(1)	0.77

both SO and correlation needed to flip the states !

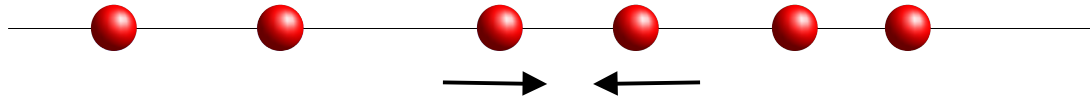
**Sn₂ dimer should be simple, it is in the fourth row ... but
SO correction is ~ 0.5 eV ! (small core SOREP, 44 val. e-)**



QMC is perhaps more than an accurate method only ...

Topology of fermion antisymmetry: what do we know ?

1D: the ground state node of N fermions on a line is known exactly,



since each time two fermions cross each other they hit the node and the system passes from one domain to another \rightarrow $N!$ domains

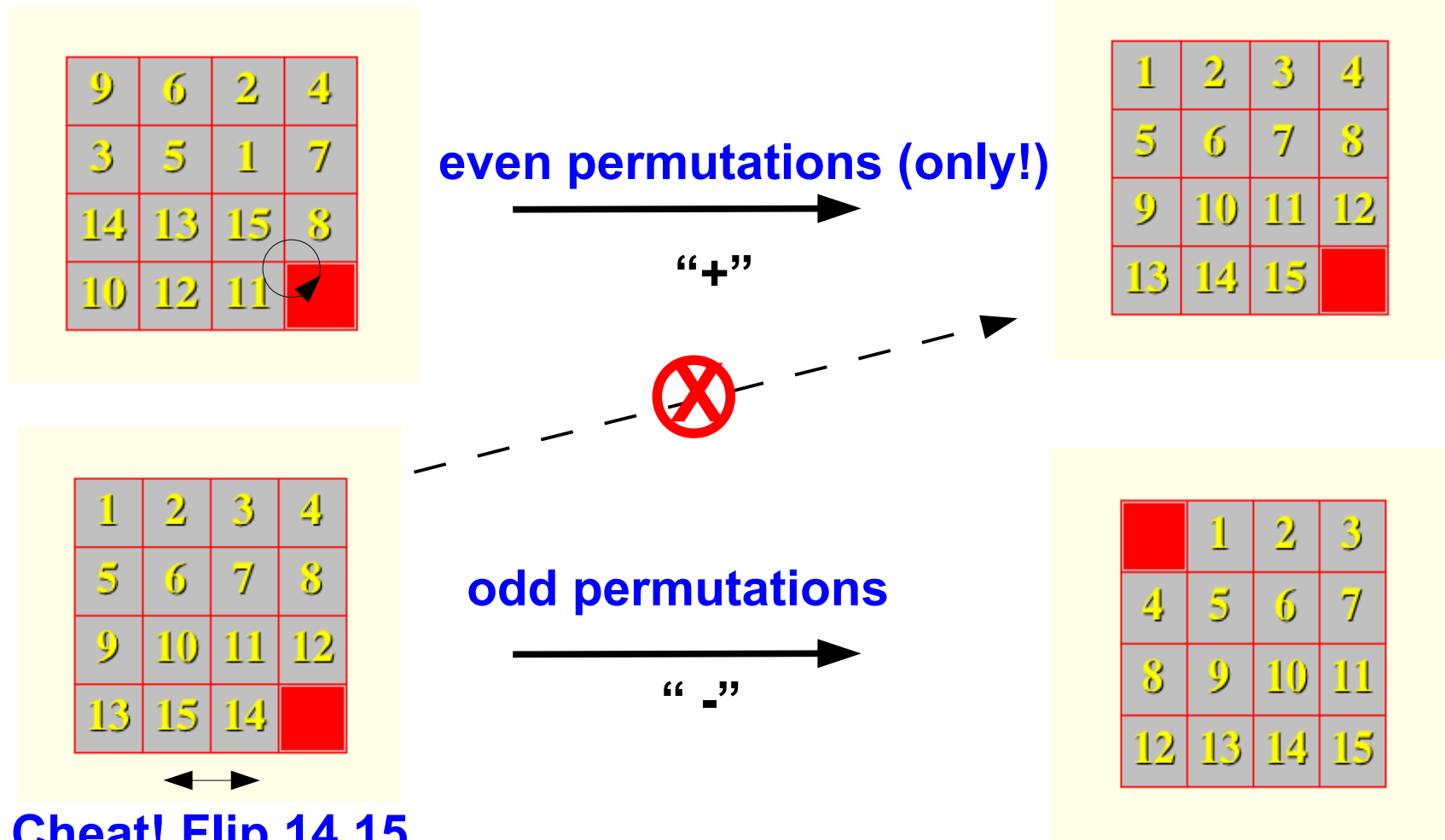
3D: a few special cases of 2e-, 3e- atoms nodes known exactly, eg,

2e- He atom triplet $3S[1s2s]$ exact node: $|r_1|^2 - |r_2|^2 = 0$

two domains (one +, one -) $\rightarrow r_1 > r_2$ or $r_2 > r_1$

In fact, in 2D/3D **the two nodal domains appear to be generic \rightarrow fundamental property of ground state fermionic wave functions \rightarrow global “p-waves”**

“Kiddie proof”: sliding 15-puzzle: an example of 3-cycle (triple exchange) permutation cluster → 15 fermions in 2D



instead of conclusions: working hypothesis

Geometry is not everything, but it is the most fundamental thing

Connolly