

# Brief introduction to sign problems for many-electron systems in the continuum

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- Quantum Monte Carlo
  - Zero temperature methods
  - Path Integral methods
- The “sign problem”

# Variational Monte Carlo (VMC)

(McMillan 1965)

- Put correlation directly into the wavefunction.
- Integrals are hard to do: need MC.
- VMC has no sign problem, and classical complexity
- Take sequence of increasingly better wavefunctions. Stochastic optimization is important!
- Progress in optimization, multiple determinants, tensor networks,.....
- **Can we make arbitrarily accurate functions?** Method of residuals says how to do this.

- Posit a wavefunction  $\Psi(\mathbf{R},\mathbf{a})$
- sample  $|\Psi(\mathbf{R},\mathbf{a})|^2$  with random walk.
- minimize energy or variance of  $\Psi(\mathbf{R},\mathbf{a})$  with respect to  $\mathbf{a}$
- Zero variance principle

$$e(R) \equiv \Psi(R)^{-1} H \Psi(R) = \text{residual}$$

$$E_V = \langle e(R) \rangle_{|\Psi^2|} \quad \sigma^2 = \langle \delta e(R)^2 \rangle_{|\Psi^2|}$$

$$\Psi_2(R) = \text{Det}\{\phi_i(\mathbf{r}_j)\} e^{-\sum_{i<j} u_{ij}(r_{ij})}$$

$$\Psi_{n+1}(R) \approx \Psi_n(R) e^{-\underbrace{\langle e(R) \rangle}_{\text{smoothing}}}$$

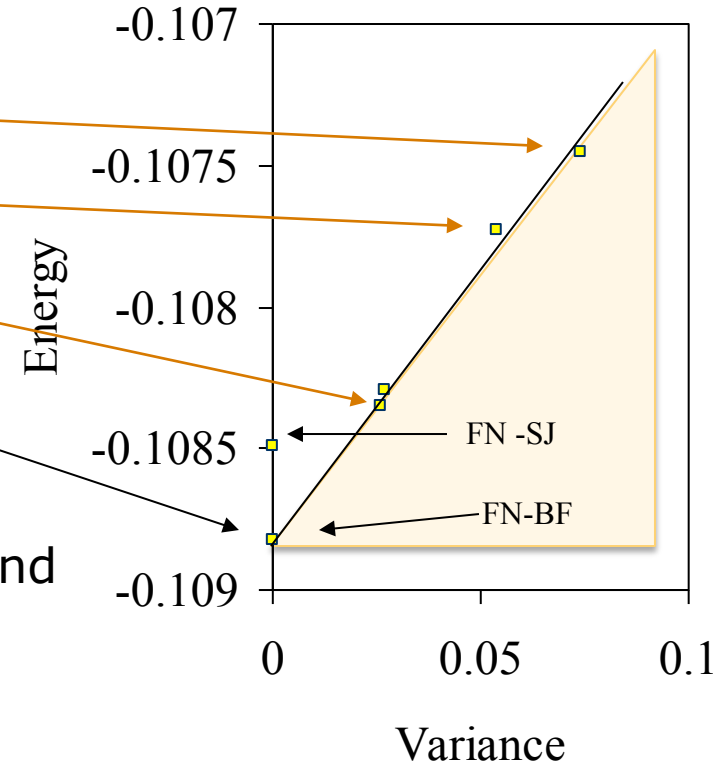
**smoothing**

# Dependence of energy on wavefunction

3d Electron fluid at a density  $r_s=10$

*Kwon, Ceperley, Martin, Phys. Rev. **B58**,6800, 1998*

- Wavefunctions
  - Slater-Jastrow (SJ)
  - three-body (3)
  - backflow (BF)
  - fixed-node (FN)
- Energy  $\langle f | H | f \rangle$  converges to ground state
- Variance  $\langle f | [H-E]^2 | f \rangle$  to zero.
- Temple inequality relates energy and variance
- Using 3B-BF gains a factor of 4.
- Using DMC gains a factor of 4.



Bayesian methods can provide tight upper and lower bounds

# Projector Monte Carlo

e.g. Diffusion Monte Carlo (DMC)

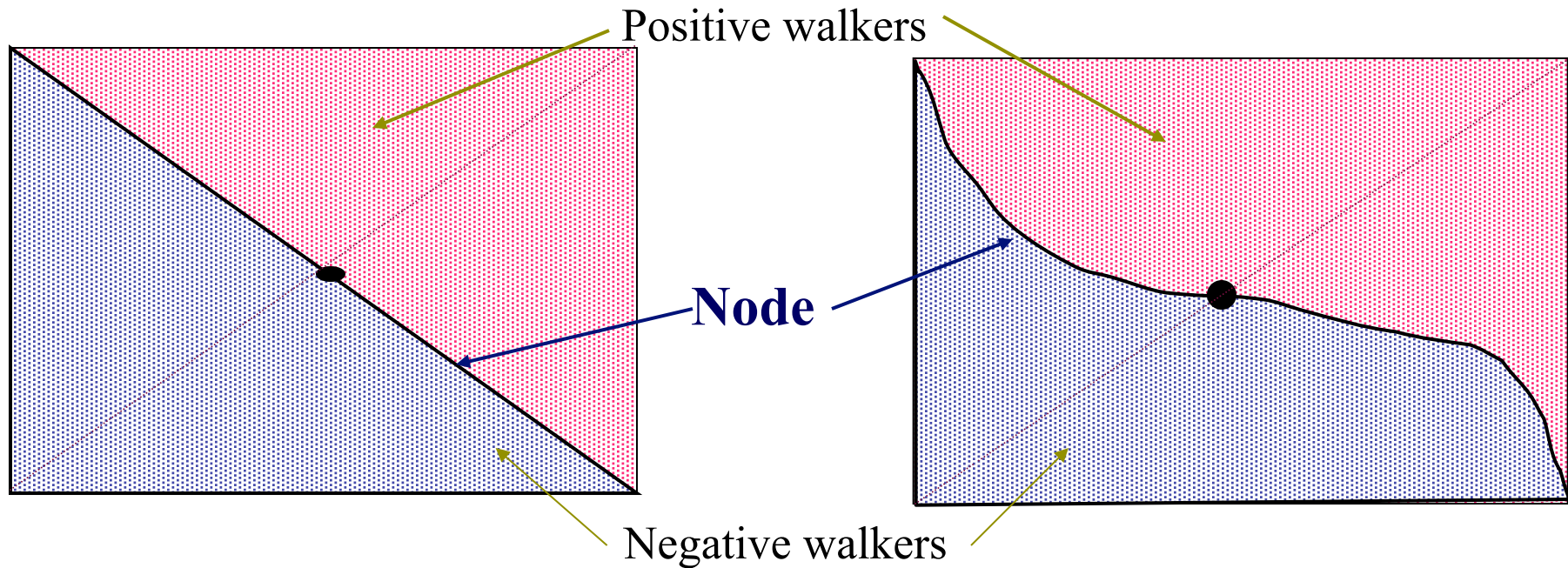
- Automatic way to get better wavefunctions.
- Project single state using the Hamiltonian
$$\Psi(R,t) = e^{-(H-E)t} \Psi(R,0)$$
- This is a diffusion + branching operator.
- **But is this a probability?**
- **Yes!** for bosons since ground state can be made real and non-negative. **But** all excited states must have sign changes.
- In **exact** methods one carries along the sign as a weight and samples the modulus. This leads to the famous sign problem
$$\phi(t) = e^{-(H-E)t} \text{sign}(\phi(R,0)) |\phi(R,0)|$$
- Zero variance principle still applies: fluctuations only due to trial function error.

# Model fermion problem: Particle in a box

Symmetric potential:  $V(\mathbf{r}) = V(-\mathbf{r})$   
Antisymmetric state:  $\Psi(\mathbf{r}) = -\Psi(-\mathbf{r})$

Initial (trial) state

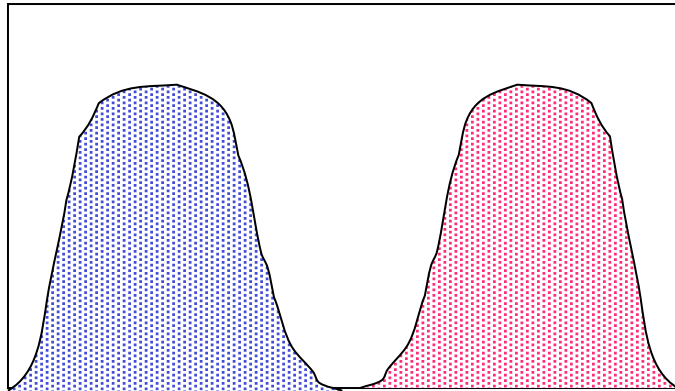
Final (exact) state



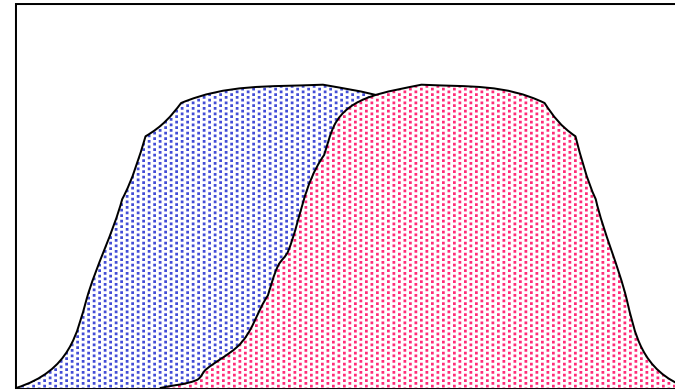
Sign of walkers fixed by initial position. They are allowed to diffuse freely.  
 $\Psi(\mathbf{r}) =$  number of positive-negative walkers.  
Node is dynamically established by cancellation of positive and negative walkers.

## Scaling in Released-Node

Initial distribution



Later distribution



- At any point, positive and negative walkers will tend to cancel so the signal is overwhelmed by the fluctuations.
- Signal/noise ratio is :  $e^{-t[E_F - E_B]}$   $t$ =projection time

$E_F$  and  $E_B$  are Fermion, Bose energy (proportional to  $N$ )

$$CPUtime \propto \varepsilon^{-2(1+\frac{E_F}{E_g})} \approx \varepsilon^{-2N\frac{e_F}{E_g}}$$

# Cancellation Methods

- Keep exactness and try to improve the scaling by coupling positive and negative walkers.
- Let plus and minus walkers annihilate when they are “close.” (Arnow, 1980)
- “Closeness” defined in **3N** dimensions:

$$|\mathbf{R} - \mathbf{R}'|^2 = \sum_{i=1}^N (\mathbf{r}_i - \mathbf{r}'_i)^2 \propto N$$

- The density is too low in many dimensions  
**growth rate >> death rate.**
- The number of walkers needed to achieve dynamical stability grows exponentially in **N**.
- You do not both **solve** the sign problem **and** have a **scalable** algorithm.
- Alavi (2009) FCI-QMC: Work in a finite second quantized basis..
- Can we guide oppositely signed walkers together to annihilate?

# Fixed-node method

- Impose the fixed-node BC condition:

$$\phi(R) = 0 \quad \text{when} \quad \psi_T(R) = 0.$$

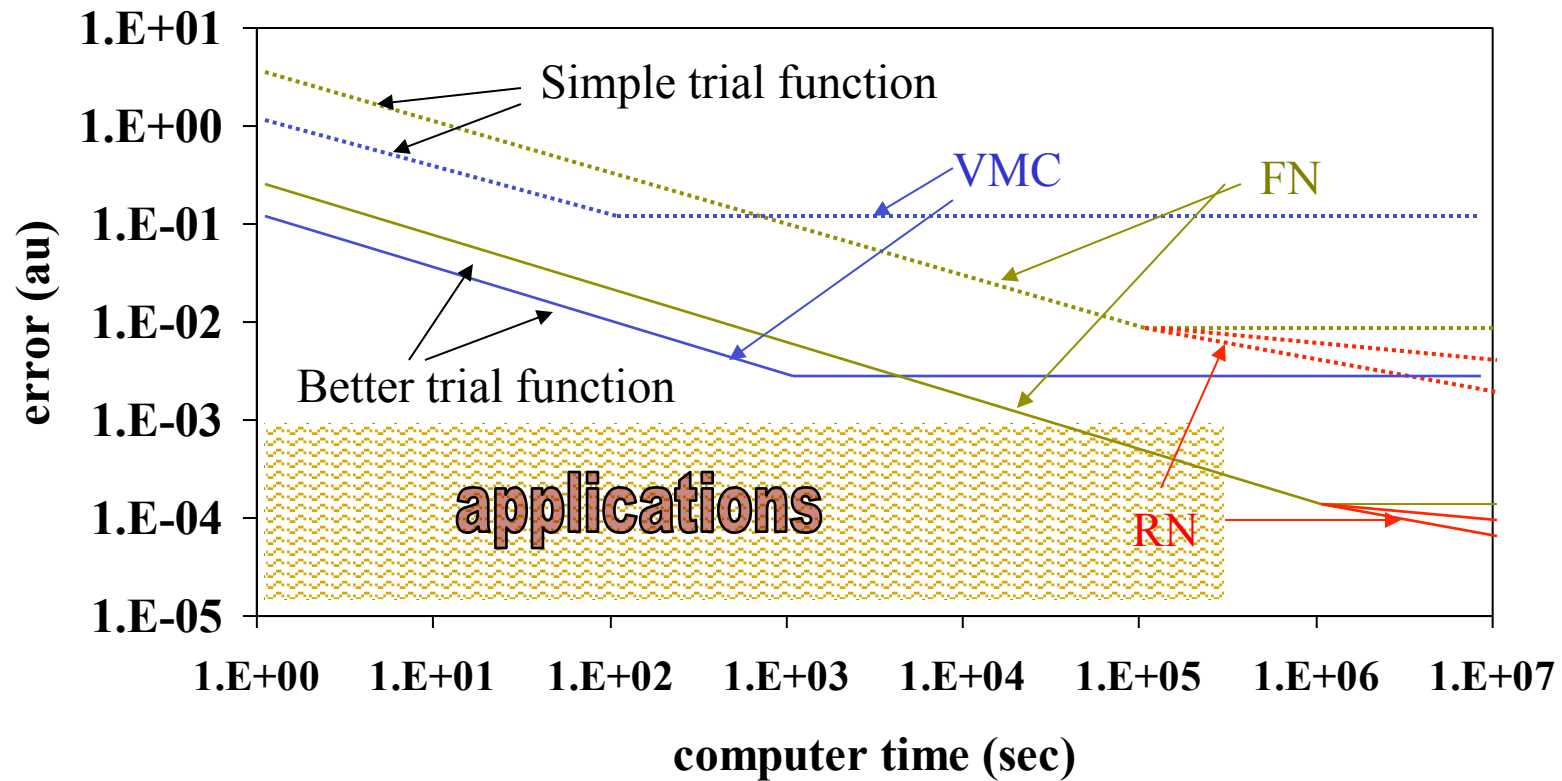
- Will give an upper bound to the exact energy, the best upper bound consistent with the FNBC.

$$E_V \geq E_{FN} \geq E_0$$
$$E_{FN} = E_0 \quad \text{if} \quad \phi_0(R)\psi(R) \geq 0 \quad \text{all } R$$

- $\Phi(R,t)$  has a discontinuous gradient at the nodal location.
- Accurate method because Bose correlations are done exactly.
- Scales like the VMC method, as  $N^3$  or better.
- But we need to know the nodes!



# Summary of T=0 methods: Variational(VMC), Fixed-node(FN), Released-node(RN)



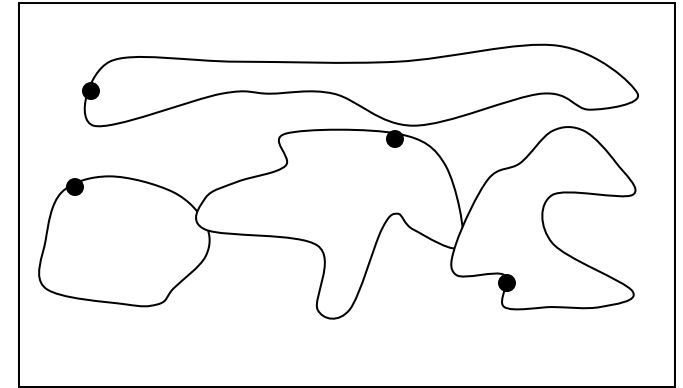
# “Direct” Fermion Path Integrals

- Path integrals map quantum mechanics into a system of cross-linking closed “polymers.”

$$Z = \sum_{p=1}^{N!} \frac{(-1)^P}{N!} \int dR_1 \dots dR_M e^{-\sum_{i=1}^M S(R_i, R_{i+1})}$$

$R_0 = PR_M$ ,  $P$  permutation,  
 $S(R_i, R_{i+1})$  is “boltzmann action”

4 quantum paths



- Bosons are easy: simply sample  $P$ .
- Fermions: sample the “action” and carry  $(-1)^P$  as a weight.
- Observable is **even P - odd P**. scales exponentially in  $N$  and  $T^{-1}$ !

$$\text{CPUtime} \propto \epsilon^{-2} e^{2N[\mu_F - \mu_B]/k_B T}$$

# Generalizations of Fixed-Node method

- **Positive temperature:** restricted fermion path integrals. Similar to zero temperature method: Exact nodes imply exact answer.
- **Lattices with auxiliary fields** (Fahy, Zhang ...). Requires projection on a Slater determinant to be always positive.

**Some methods require magnitude of trial function to be correct, not just the nodes:**

- **Magnetic fields or complex wavefunctions:** fixed-phase method. (Ortiz et al., Carlson) Input phase and solve for modulus.
- **Lattice fixed-node:** (Bemmel et al). Requires trial function "near" the sign changes.

**Can we do quantum dynamics with fixed-node?**

# General statement of the “fermion problem”

- Given a system with **N** fermions and a known Hamiltonian and a property **O** (usually the energy):
  - How much time **T** will it take to estimate **O** to an accuracy  $\epsilon$ ?
  - How does **T** scale with **N** and  $\epsilon$ ?
- If you can map the quantum system onto an equivalent problem in classical statistical mechanics then:

$$T \propto N^\alpha \epsilon^{-2} \quad \text{With } 0 < \alpha < 3$$

This would be a “solved” quantum problem!

- All approximations must be controlled.
- Algebraic scaling in N.

**Materials problem:** “Solve” electronic structure problems with “chemical accuracy” ( $\ll 300\text{K}$  /atom) on systems containing thousands of electrons with available computer power.