# Quantum Monte Carlo in a discrete space 

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## Slater Determinant Space



- $N$ HF spin-orbitals are chosen out of $2 M$ spin-orbitals $\left\{\phi_{1}, \phi_{2}, \ldots, \phi_{2 M}\right\}$
- Orthogonal and antisymmetric
- Complete space of determinants is finite, but exponentially growing in N and M


## Full Configuration Interaction

- Iterative diagonalisation of the sparse Hamiltonian in this space gives the "Full Configuration Interation" (FCI) solution.
- Matrix elements between determinants a simple combination of one- and two-electron Hamiltonian integrals.
- Variationally minimised energy Eigenvalue - total basis set correlation energy captured.


## Monte Carlo

- Aim is to perform Monte Carlo simulation in the full space of determinants without a priori information.
- Due to the fundamental properties of the space, the Fermionic ground state is the lowest energy solution, so nodal surface should hopefully emerge naturally.
- This removes uncontrolled approximations, but introduces a basis-set dependence.
- "Exact", Size-consistent, Multireference and systematically improvable.

Movie shows the convergence of the algorithm.

## Derivation of algorithm I

- Begin with imaginary-time TDSE

$$
\begin{equation*}
\frac{\partial \Psi}{\partial \tau}=-H \Psi \tag{1}
\end{equation*}
$$

- Perform a long-time integration to project out ground state.

$$
\begin{equation*}
\Psi_{0}=\lim _{\tau \rightarrow \infty} e^{-\tau\left(H-E_{0}\right)} D_{0} \tag{2}
\end{equation*}
$$

- Expressing wavefunction as linear combination of Slater Determinants ensures Fermionic solutions only.

$$
\begin{equation*}
\Psi(\tau)=\sum_{\mathbf{i}} C_{\mathbf{i}}(\tau)\left|D_{\mathbf{i}}\right\rangle \tag{3}
\end{equation*}
$$

- Discretize amplitudes as a signed sum of walkers

$$
\begin{equation*}
C_{\mathbf{i}} \propto N_{\mathbf{i}}=\sum_{\alpha} s_{\alpha} \delta_{\mathbf{i}, \mathbf{i}_{\alpha}} \tag{4}
\end{equation*}
$$

## Derivation of algorithm II

- Define $K$ as $H-I\left\langle D_{0}\right| H\left|D_{0}\right\rangle$ to ensure positive diagonal elements and obtain:

$$
\begin{aligned}
-\frac{d C_{\mathbf{i}}}{d \tau} & =\sum_{\mathbf{j}}\left(K_{\mathrm{ij}}-S \delta_{\mathbf{i j}}\right) C_{\mathbf{j}} \\
& =\left(K_{\mathbf{i j}}-S\right) C_{\mathbf{i}}+\sum_{\mathbf{j} \neq \mathbf{i}} K_{\mathrm{ij}} C_{\mathbf{j}}
\end{aligned}
$$

where $S$ is an arbitrary energy "shift" which controls rate of population change. If we have

$$
\begin{equation*}
\sum_{\mathrm{j}} K_{\mathrm{ij}} C_{\mathrm{j}}=S C_{\mathrm{i}} \tag{5}
\end{equation*}
$$

then we are at our eigenstate.

## Spawing step

- Each iteration, for each particle, select coupled determinant $D_{\mathbf{j}}$ with normalised probability $p_{\text {gen }}(\mathbf{j} \mid \mathbf{i})$ and attempt to spawn a child there with probability

$$
\begin{equation*}
p_{s}(\mathbf{j} \mid \mathbf{i})=-\frac{\delta \tau\left|K_{\mathrm{ij}}\right|}{p_{\operatorname{gen}}(\mathbf{j} \mid \mathbf{i})} \tag{6}
\end{equation*}
$$

- Positive $K_{\mathrm{ij}}$ connections will flip the sign of the spawned walker w.r.t the parent


## Death step

- The particle attempts to die with probability

$$
\begin{equation*}
p_{d}(\mathbf{i})=\delta \tau\left(K_{\mathbf{i i}}-S\right) \tag{7}
\end{equation*}
$$

- If we desire to keep the total population of walkers constant, we can periodically ( $A$ iterations) adjust the $S$ "shift" value to raise it if there has been a net decrease in walkers over the time period, or lower it if there has been a gain, according to

$$
\begin{equation*}
S(\tau)=S(\tau-A \delta \tau)-\frac{\zeta}{A \delta \tau} \ln \frac{N_{w}(\tau)}{N_{w}(\tau-A \delta \tau)} \tag{8}
\end{equation*}
$$

## Projected energy

We can calculate the energy in another way as the projection of $H|\Psi\rangle$ onto any wavefuntion with overlap with the ground state.

$$
\begin{aligned}
E(\tau) & =\frac{\left\langle D_{\mathbf{0}}\right| H e^{-\tau H}\left|D_{\mathbf{0}}\right\rangle}{\left\langle D_{0}\right| e^{-\tau H}\left|D_{\mathbf{0}}\right\rangle} \\
& =E_{\mathrm{HF}}+\sum_{\mathbf{j} \neq \mathbf{0}}\left\langle D_{\mathbf{j}}\right| H\left|D_{\mathbf{0}}\right\rangle \frac{C_{\mathbf{j}}(\tau)}{C_{\mathbf{0}}(\tau)} \\
& =E_{\mathrm{HF}}+\sum_{\mathbf{j} \neq \mathbf{0}}\left\langle D_{\mathbf{j}}\right| H\left|D_{\mathbf{0}}\right\rangle \frac{N_{\mathbf{j}}(\tau)}{N_{\mathbf{0}(\tau)}} \\
& =E_{\mathrm{HF}}+\sum_{\mathbf{j} \in\{\text { Sings, Doubs }\}}\left\langle D_{\mathbf{j}}\right| H\left|D_{\mathbf{0}}\right\rangle \frac{N_{\mathbf{j}}(\tau)}{N_{\mathbf{0}}(\tau)}
\end{aligned}
$$

## Walker Annihilation

- Walkers of opposite sign on the same determinant are annihilated after each iteration.
- This interaction between positive and negative walkers crucial in breaking symmetry between $\pm \Psi$ states.
- Without this, we observe the classic exponential decay of signal to noise ratio, seen in say nodal-release DMC, due to the dreaded 'sign problem'
- Walker annihilation has been studied previously in real spaces, but difficulty in achieving exact cancellation means this was not entirely successful.
- Annihilation effects give rise to a plateau in the particle growth - indicates critical sampling needed for sign-coherence of walkers and difficulty to converge energy of system

No annihilation vs. Annihilation movies.

## Typical walker growth



## Sign-Coherence

- Whole space become sign-coherent over the course of the plateau - tested by looking at ACF
- Simplest space with sign-problem is a 3-cycle

- Determinants which are weakly coupled (high energy or small matrix elements) to the rest of the space do not pose a problem.
- There is also no need to identify these determinants a priori


## Timestep Errors



## Convergence of energy for water molecule



## New molecular energies

| System | $(N, M)$ | $N_{F C I} / 10^{6}$ | $N_{c} / 10^{6}$ | $f_{c}$ | $E_{\text {total }}$ | $E_{\mathrm{CCSD}(\mathrm{T})}$ |
| :--- | :---: | ---: | :---: | :---: | :---: | :---: |
| Be: cc-V5Z | $(4,91)$ | 2.11 | 0 | 0 | $-14.64638(2)$ | -14.64629 |
| CN: cc-pVDZ | $(9,26)$ | 246 | 173 | 0.704 | $-92.4938(3)$ | -92.49164 |
| HF: cc-pCVDZ | $(10,23)$ | 283 | 0.998 | 0.0035 | $-100.27098(3)$ | -100.27044 |
| CH $:$ cc-pVDZ | $(8,33)$ | 419 | 377 | 0.898 | $-40.38752(1)$ | -40.38974 |
| CO: cc-pVDZ | $(10,26)$ | 1,080 | 777 | 0.719 | $-113.05644(4)$ | -113.05497 |
| $\mathrm{H}_{2} \mathrm{O}:$ cc-pCVDZ | $(10,28)$ | 2,410 | 47.4 | 0.0196 | $-76.28091(3)$ | -76.28028 |
| $\mathrm{O}_{2}:$ cc-pVDZ | $(12,26)$ | 5,409 | 2,651 | 0.490 | $-149.9875(2)$ | -149.98562 |
| $\mathrm{NaH}^{\text {c cc-pCVDZ }}$ | $(12,32)$ | 205,300 | 63.8 | 0.00031 | $-162.6090(1)$ | -162.60901 |
| $\mathrm{Mg}^{2+}:$ cc-pV5Z | $(10,95)$ | $420 \times 10^{6}$ | 139 | $3.3 \times 10^{-7}$ | $-198.8878(3)$ | -198.88779 |

- It can be seen that in all cases, the number of walkers needed to achieve convergence is smaller than the full size of the space.


## Neon Atom

| Basis Set | Orbitals | $N_{\text {FCI }} / 10^{6}$ | $N_{c} / 10^{6}$ | $f_{c} / 10^{-3}$ | $E_{\text {corr }}$ |
| :--- | :---: | ---: | :---: | :---: | :---: |
| VDZ | 14 | 0.502 | 0 | 0 | $0.19211(4)$ |
| CVDZ | 18 | 9.19 | 0 | 0 | $0.23365(3)$ |
| AVDZ | 23 | 142 | 0.248 | 1.7 | $0.21510(3)$ |
| VTZ | 30 | 2540 | 0.506 | 0.199 | $0.28341(9)$ |
| CVTZ | 43 | 116,000 | 2.3 | 0.0198 | $0.33628(2)$ |
| AVTZ | 46 | 235,000 | 338 | 1.43 | $0.2925(4)$ |
| VQZ | 55 | $1.51 \times 10^{6}$ | 681 | 0.451 | $0.3347(10)$ |
| CVQZ | 84 | $119 \times 10^{6}$ | 2200 | 0.0185 | $0.3691(1)$ |
| Extrap. |  |  |  |  | 0.3930 |
| Exact |  |  |  |  | 0.3905 |

- The fact that $f_{c}$ is relatively constant for a given basis set family indicates exponential scaling.


## HF Binding Curve I



## HF Binding Curve II



## Binding Plateaus



## Ionisation Potentials I



## Ionisation Potentials II

|  | DMC | CCSD $(\mathrm{T})$ | "Best" FCIMC | Extrap. FCIMC |
| :--- | :---: | :---: | :---: | :---: |
| A.M.Err $(\mathrm{mH})$ | 4.39 | 2.45 | 2.04 | 1.76 |
| Max $\operatorname{Err}(\mathrm{mH})$ | 9.58 | 5.65 | 4.369 | 3.428 |

- Results are work in progress
- If error $>0$, cation is not as well described as neutral species and vice versa (same for DMC values)
- Generally, bottleneck is storage of $N^{4}$ integrals - simple computational problem
- Errors are simply due to basis set incompleteness, which are not optimized for this problem.
- Note the ease for the Na atom - space more than $10^{15}$ - also allowed calculation of K .

Materials Transactions, 47, 11 (2006), Yasuhara
JCP 124224104 (2006), Drummond et al.
Theor. Chem. Acc. (1997), Takewaki

## Current Code Scaling



## Spin-coupled determinant pairs

- Swap alpha and beta electrons
- FCI amplitude equal up to a sign change
- Create objects which are (anti-)symmetric combination of open-shell determinants
- Space reduced by a factor tending to two
- Plateau height is also reduced by same factor
- Also spin-contamination in instantaneous energy value is reduced
- Partway towards working in a space of CSFs


## Orbital basis rotations

- Energies invariant w.r.t. rotation of initial orbitals
- We can use this to hopefully find orbitals which are better suited to the algorithm and achieving sign-coherence of particles
- This will hopefully lower plateaus heights
- Various orbital localizations attempts, as well as Kohn-Sham orbitals and Bruckner orbitals.
- Some limited success with Edminsten-Reudenburg localization (Maximize $\langle i i \mid i i\rangle$ orbital self-repulsion), but still no consistent scheme.
- Ultimate aim is to reduce not just prefactor further, but also scaling!


## Plane wave basis

- Interface to use VASP produced orbitals and integrals
- k-point expansion of energy for LiH similar to MP2 from $1 \times 1 \times 2$ supercell
- Hoping to provide benchmark result for periodic systems
- LiH $2 \times 2 \times 2$ supercell -8 LiH pairs (16 electrons)
- Pseudopotential on Li 1s orbital and PAW method used

| Truncated Level | Orbitals | Plateau height $/ 10^{6}$ | $N_{\mathrm{CI}} / 10^{6}$ | $f_{c}$ |
| :--- | :---: | :---: | :---: | :---: |
| CISDTQ | 40 | 162 | 348 | 0.465 |
| CISDTQ5 | 40 | 6,152 | 9,374 | 0.646 |
| CISDTQ56 | 40 | 97,040 | 162,300 | 0.598 |
| CISDTQ | 51 | 499 | 1,151 | 0.433 |
| CISDTQ | 64 | 1,430 | 3,344 | 0.428 |

## Approximate schemes

- Perturbative approximations for high energy virtuals
- CASSCF
- Other partitioning scheme for the space
- Dominant determinants as a nodal surface for DMC (Norbert and Priyanka)
- CCMC (Alex Thom)


## Systems focus

- Application to more systems!
- Have recently found energy for $\mathrm{C}_{2}$ cc-pVTZ basis set
- Binding curves with FCl accuracy for first row diatomics with extrapolation to complete basis set
- Multireference transistion metal dimers, Hubbard models ...


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