

## Variational Monte Carlo for the Hydrogen Atom

The Hydrogen atom is a system with two particles, electron and proton. The configuration space in which the system moves is therefore six dimensional. By moving to the center-of-mass system, the problem becomes effectively 3 dimensional, with Hamiltonian

$$H = -\frac{\hbar^2}{2m} \nabla^2 - \frac{e^2}{r} ,$$

where  $\mathbf{r} = \mathbf{r}_e - \mathbf{r}_p$  is the relative coordinate of the electron with respect to the proton,  $e$  is the magnitude of the electron's charge, and  $m = m_e m_p / (m_e + m_p)$  is the reduced mass.

### Reduction to a one-dimensional problem

By using conservation of angular motion and the fact that the ground state is spherically symmetric, i.e., it has zero orbital angular momentum, the problem can be reduced to one dimension with Hamiltonian operator

$$H = -\frac{\hbar^2}{2m} \left[ \frac{d^2}{dr^2} + \frac{2}{r} \frac{d}{dr} \right] - \frac{e^2}{r} ,$$

which depends on the radial coordinate  $r$ .

### Exact solution for the ground state

The exact ground state energy and wavefunction are given by

$$E_0 = -\frac{e^2}{2a_0} , \quad \psi_0(r) \sim e^{-r/a_0} .$$

where the *Bohr radius*

$$a_0 = \frac{\hbar^2}{me^2} .$$

It is convenient to use *atomic units* in which  $\hbar = m = e = 1$  so

$$H = -\frac{1}{2} \left[ \frac{d^2}{dr^2} + \frac{2}{r} \frac{d}{dr} \right] - \frac{1}{r} , \quad E_0 = -\frac{1}{2} , \quad \psi_0(r) \sim e^{-r} .$$

## Variational trial wave function and local energy

A simple trial wave function for the Hydrogen atom ground state is

$$\psi_{T,\alpha}(r) = e^{-\alpha r}.$$

The local energy for this choice can easily be computed:

$$E_L(r) = \frac{1}{\psi_{T,\alpha}} H \psi_{T,\alpha}(r) = -\frac{1}{2} \left[ \alpha^2 - \frac{2\alpha}{r} \right] - \frac{1}{r}.$$

Note two important points about this local energy:

- It is minimum and also independent of  $r$  at  $\alpha = 1$ , which gives the exact ground state energy and eigenfunction.
- For  $\alpha \neq 1$  it is *singular* at  $r = 0$  where the potential diverges. For more complex problems, like the Helium atom to be considered next, these singularities can cause problems with the numerical calculation. To deal with these singularities, *cusp conditions* are used to restrict the variational parameters.

The textbook gives results for a VMC simulation of the ground state energy of Hydrogen: the harmonic oscillator program can be adapted to reproduce these results by changing the form of the trial wave function and local energy.

Two additional problems need to be addressed. Since  $r \geq 0$ , a one-dimensional Metropolis walker should not be allowed to cross the origin to  $r < 0$ . Also, the probability that the one-dimensional walker is found between  $r$  and  $r + dr$  must be proportional to  $4\pi r^2$ , which is the surface area of a sphere of radius  $r$ . The textbook suggests using a walker in 3 dimensional space. Given a walker position  $\mathbf{r}$  and a maximum step size  $\delta$ , the next trial step is chosen uniformly at random within a cube of side  $2\delta$  centered on the point  $\mathbf{r}$  and aligned with the coordinate axes. This solves both of the problems above at the expense of making three calls to the random number generator for each trial move.

## Variational Monte Carlo for the Helium Atom

The Helium atom is a 3-particle problem: two electrons orbit around a nucleus, which consists of two protons with charge  $e$  each and two neutral neutrons. The nucleus, which is  $\sim 8,000$  times more massive than an electron, can be assumed

to be at rest at the origin of the coordinate system. The electrons have positions  $\mathbf{r}_1$  and  $\mathbf{r}_2$ . This is simpler than making a transformation to the center-of-mass system of the three particles, and it is sufficiently accurate.

If we use atomic units with  $\hbar = m_e = e = 1$ , the Hamiltonian for the motion of the two electrons can be written

$$H = -\frac{1}{2}\nabla_1^2 - \frac{1}{2}\nabla_2^2 - \frac{2}{r_1} - \frac{2}{r_2} + \frac{1}{r_{12}},$$

where  $r_{12} = |\mathbf{r}_{12}| = |\mathbf{r}_1 - \mathbf{r}_2|$ . The terms  $-2/r_i$  represent the negative (attractive) potential energy between each electron with charge  $-1$  and the Helium nucleus with charge  $+2$ , and the term  $+1/r_{12}$  represents the positive (repulsive) potential energy between the two electrons.

### A simple choice of variational trial wave function

If the repulsive term  $1/r_{12}$  were not present, then the Hamiltonian would be that of two independent Hydrogen-like atoms. It can be shown that the energy and ground state wave function of a Hydrogen-like atom whose nucleus has charge  $Z$  are given by

$$E_0 = -\frac{Z^2}{2}, \quad \psi_0 \sim e^{-Zr}.$$

The wave function of the combined atom with two non-interacting electrons would be the product of two such wave functions:

$$\psi(\mathbf{r}_1, \mathbf{r}_2) \sim e^{-2r_1} e^{-2r_2}.$$

This suggests a trial wave function of the form

$$\Psi_{T,\alpha} = e^{-\alpha r_1} e^{-\alpha r_2},$$

similar to what was done for the Hydrogen atom. If the electron-electron interaction is neglected, then the average energy with this wave function can be calculated

$$\left\langle -\frac{1}{2}\nabla_1^2 - \frac{1}{2}\nabla_2^2 - \frac{2}{r_1} - \frac{2}{r_2} \right\rangle = 2 \times \frac{\alpha^2}{2} - 2 \times \alpha,$$

which has a minimum at  $\alpha = 1$ , which gives  $\langle E \rangle = -1$ . The experimentally measured ground state energy is  $E_0 = -2.904$ .

In fact, the average energy can be evaluated exactly for this trial wave function even if the electron-electron interaction is included:

$$\left\langle -\frac{1}{2}\nabla_1^2 - \frac{1}{2}\nabla_2^2 - \frac{2}{r_1} - \frac{2}{r_2} + \frac{1}{r_{12}} \right\rangle = \alpha^2 - \frac{27}{8}\alpha ,$$

which has a minimum at  $\alpha = 27/16$ , which gives  $\langle E \rangle = -2.8477$ . This shows that the repulsion between the electrons is important and lowers the energy.

### Padé-Jastrow wave function

The textbook suggest using a trial wave function

$$\Psi(\mathbf{r}_1, \mathbf{r}_2) = e^{-2r_1} e^{-2r_2} e^{\frac{r_{12}}{2(1+\alpha r_{12})}} ,$$

with  $\alpha$  as a variational parameter. The local energy with this wave function can be calculated

$$E_L(\mathbf{r}_1, \mathbf{r}_2) = -4 + \frac{\alpha}{(1+\alpha r_{12})} + \frac{\alpha}{(1+\alpha r_{12})^2} + \frac{\alpha}{(1+\alpha r_{12})^3} \\ - \frac{1}{4(1+\alpha r_{12})^4} + \frac{\hat{\mathbf{r}}_{12} \cdot (\hat{\mathbf{r}}_1 - \hat{\mathbf{r}}_2)}{(1+\alpha r_{12})^2} .$$

### VMC program for the Helium Atom

The following program `vmc-he.cpp` implements this trial function choice.

`vmc-he.cpp`

```
// Variational Monte Carlo for the Helium Atom
```

1

```
#include <cmath>
```

3

```
#include <cstdlib> 4
#include <iostream> 5
#include "rng.h" 6

using namespace std; 8

const int NDIM = 3; // dimensionality of space 10
const int NELE = 2; // number of electrons 11
int N; // number of walkers 12
double (*r)[NELE][NDIM]; // walker coordinates in 6-D configuration space 13

double alpha; // Pade-Jastrow variational parameter 15
double delta; // trial step size 16

void initialize() { 18
    r = new double [N][NELE][NDIM]; 19
    for (int n = 0; n < N; n++) 20
        for (int e = 0; e < NELE; e++) 21
            for (int d = 0; d < NDIM; d++) 22
                r[n][e][d] = qadran() - 0.5; 23
    delta = 1; 24
} 25

double eSum; 27
double eSqdSum; 28

void zeroAccumulators() { 30
    eSum = eSqdSum = 0; 31
} 32
```

```
double Psi(double *rElectron1, double *rElectron2) { 34

    // value of trial wave function for walker n 36
    double r1 = 0, r2 = 0, r12 = 0; 37
    for (int d = 0; d < 3; d++) { 38
        r1 += rElectron1[d] * rElectron1[d]; 39
        r2 += rElectron2[d] * rElectron2[d]; 40
        r12 += (rElectron1[d] - rElectron2[d]) 41
            * (rElectron1[d] - rElectron2[d]); 42
    } 43
    r1 = sqrt(r1); 44
    r2 = sqrt(r2); 45
    r12 = sqrt(r12); 46
    double Psi = - 2*r1 - 2*r2 + r12 / (2 * (1 + alpha*r12)); 47
    return exp(Psi); 48

} 50

double eLocal(double *rElectron1, double *rElectron2) { 52

    // value of trial wave function for walker n 54
    double r1 = 0, r2 = 0, r12 = 0; 55
    for (int d = 0; d < 3; d++) { 56
        r1 += rElectron1[d] * rElectron1[d]; 57
        r2 += rElectron2[d] * rElectron2[d]; 58
        r12 += (rElectron1[d] - rElectron2[d]) * 59
            (rElectron1[d] - rElectron2[d]); 60
    } 61
```

```
r1 = sqrt(r1);
r2 = sqrt(r2);
r12 = sqrt(r12);
double dotProd = 0;
for (int d = 0; d < 3; d++) {
    dotProd += (rElectron1[d] - rElectron2[d]) / r12 *
               (rElectron1[d] / r1 - rElectron2[d] / r2);
}
double denom = 1 / (1 + alpha * r12);
double denom2 = denom * denom;
double denom3 = denom2 * denom;
double denom4 = denom2 * denom2;
double e = - 4 + alpha * (denom + denom2 + denom3)
           - denom4 / 4 + dotProd * denom2;
return e;
}

int nAccept;

void MetropolisStep(int walker) {

    // make a trial move of each electron
    double rElectron1[3], rElectron2[3], rTrial1[3], rTrial2[3];
    for (int d = 0; d < 3; d++) {
        rElectron1[d] = r[walker][0][d];
        rTrial1[d] = rElectron1[d] + delta * (2 * qadran() - 1);
        rElectron2[d] = r[walker][1][d];
        rTrial2[d] = rElectron2[d] + delta * (2 * qadran() - 1);
    }
```

```
// Metropolis test 92
double w = Psi(rTrial1, rTrial2) / Psi(rElectron1, rElectron2); 93
if (qadran() < w * w) { 94
    for (int d = 0; d < 3; d++) { 95
        r[walker][0][d] = rElectron1[d] = rTrial1[d]; 96
        r[walker][1][d] = rElectron2[d] = rTrial2[d]; 97
    } 98
    ++nAccept; 99
} 100

// accumulate local energy 102
double e = eLocal(rElectron1, rElectron2); 103
eSum += e; 104
eSqSum += e * e; 105
} 106

void oneMonteCarloStep() { 108

    // do Metropolis step for each walker 110
    for (int n = 0; n < N; n++) 111
        MetropolisStep(n); 112
} 113

int main() { 115

    cout << " Variational Monte Carlo for Helium Atom\n" 117
         << " -----\n"; 118
    cout << " Enter number of walkers: "; 119
```



```
cin >> N; 120
cout << " Enter parameter Pade-Jastrow parameter alpha: "; 121
cin >> alpha; 122
cout << " Enter number of Monte Carlo steps: "; 123
int MCSteps; 124
cin >> MCSteps; 125

initialize(); 127

// perform 20% of MCSteps as thermalization steps 129
// and adjust step size so acceptance ratio ~50% 130
int thermSteps = int(0.2 * MCSteps); 131
int adjustInterval = int(0.1 * thermSteps) + 1; 132
nAccept = 0; 133
cout << " Performing " << thermSteps << " thermalization steps ..." 134
    << flush; 135
for (int i = 0; i < thermSteps; i++) { 136
    oneMonteCarloStep(); 137
    if ((i+1) % adjustInterval == 0) { 138
        delta *= nAccept / (0.5 * N * adjustInterval); 139
        nAccept = 0; 140
    } 141
} 142
cout << "\n Adjusted step size delta = " << delta << endl; 143

// production steps 145
zeroAccumulators(); 146
nAccept = 0; 147
cout << " Performing " << MCSteps << " production steps ..." << flush; 148
```

```
for (int i = 0; i < MCSteps; i++)           149
    oneMonteCarloStep();                     150

// compute and print energy                 152
double eAve = eSum / double(N) / MCSteps;   153
double eVar = eSqdSum / double(N) / MCSteps - eAve * eAve; 154
double error = sqrt(eVar) / sqrt(double(N) * MCSteps); 155
cout << "\n <Energy> = " << eAve << " +/- " << error 156
    << "\n Variance = " << eVar << endl;      157
}                                             158
```