

So Much Potential Solutions

February 26, 2019

1 Computational Exercise 2-4: A Surface with so much potential

We are going to construct what is often referred to as an *ab initio* potential energy surface of the diatomic molecule carbon monoxide. That is, we are going to use various electronic structure theories (Hartree-Fock theory, Configuration Interaction theory, and Density Functional theory) to compute the electronic energy at different geometries of a simple diatomic molecule. We will use the interpolation capabilities of scipy to simplify the evaluation of the potential energy at separations for which we did not explicitly evaluate the electronic energy. We will also use scipy to differentiate the interpolated potential energy surface to obtain the forces acting on the atoms at different separations.

We will start by importing the necessary libraries:

```
In [2]: import numpy as np
        from matplotlib import pyplot as plt
        from scipy.interpolate import InterpolatedUnivariateSpline
```

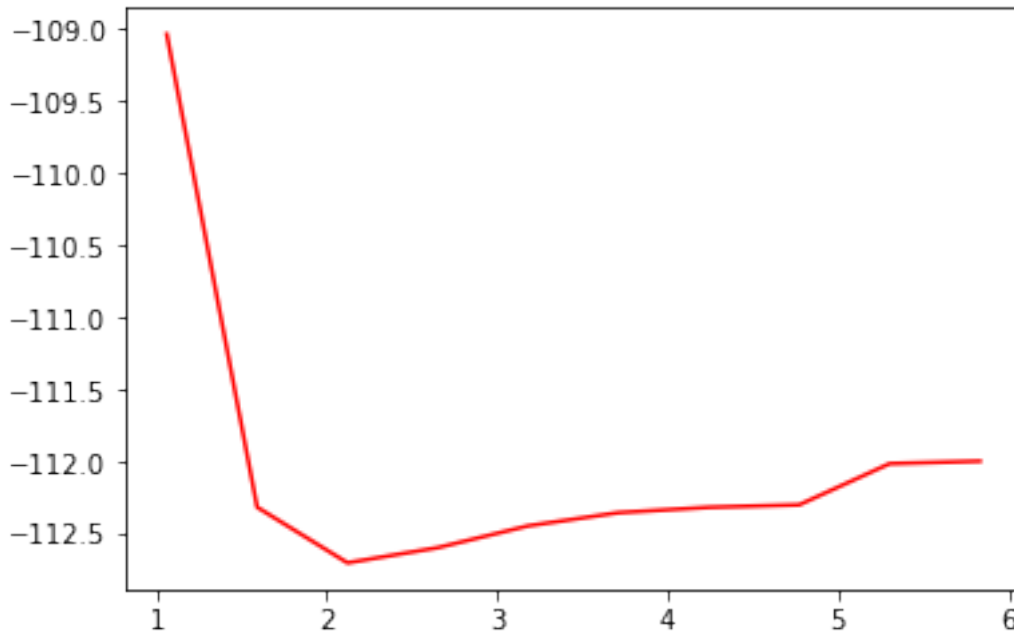
We will now define two arrays: `r_array` will be an array of values for the CO bond length and `E_array` will hold the electronic energy values corresponding to each separation.

```
In [3]: ### create an array of 20 bond lengths spanning 0.5 - 3.5 angstroms
        ### but store in atomic units of length... note 1 angstrom = 1.88973 a.u. of length
        r_array = np.linspace(0.561, 3.087, 10)*1.88973
        print(r_array)

        ### fill in this array with your actual energy values... there should be 20 values in total
        E_array = [-109.0350050004, -112.3137052599, -112.6994904875, -112.5943503269, -112.44321
                    -112.3147098978, -112.2973399066, -112.0120671242, -111.9948057317]

        # TO see the plot of the PES, uncomment the following lines
        plt.plot(r_array, E_array, 'red')
        plt.show()

[1.06013853 1.59052275 2.12090697 2.65129119 3.18167541 3.71205963
 4.24244385 4.77282807 5.30321229 5.83359651]
```



Now that you have the raw data, we will interpolate this data using cubic splines. This will permit us to estimate the potential energy at any arbitrary separation between 0.5 and 3.5 Angstroms (roughly 1 and 5.8 a.u.) with fairly high confidence, and will also allow us to estimate the force

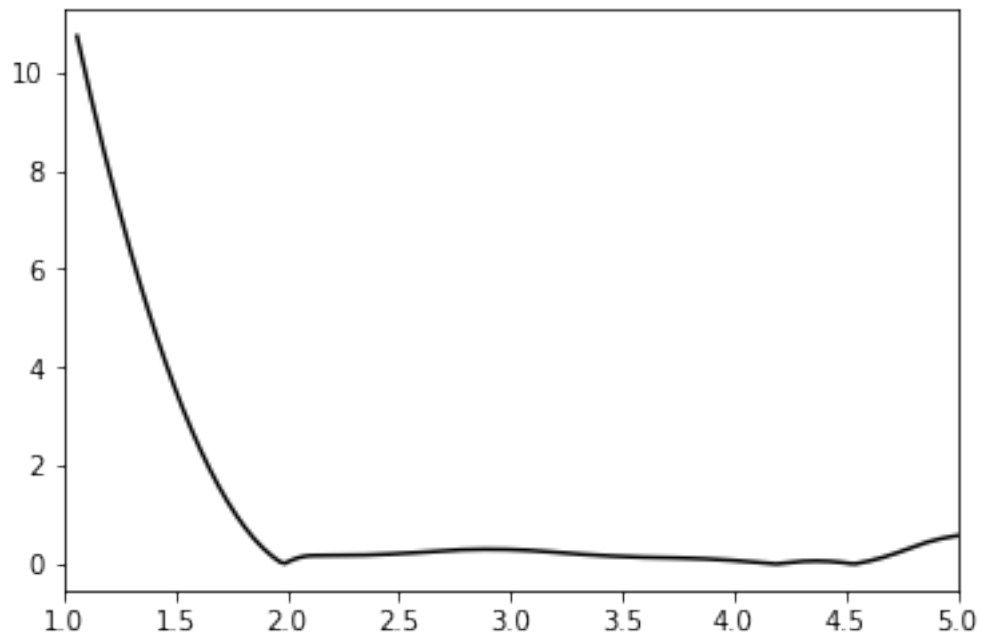
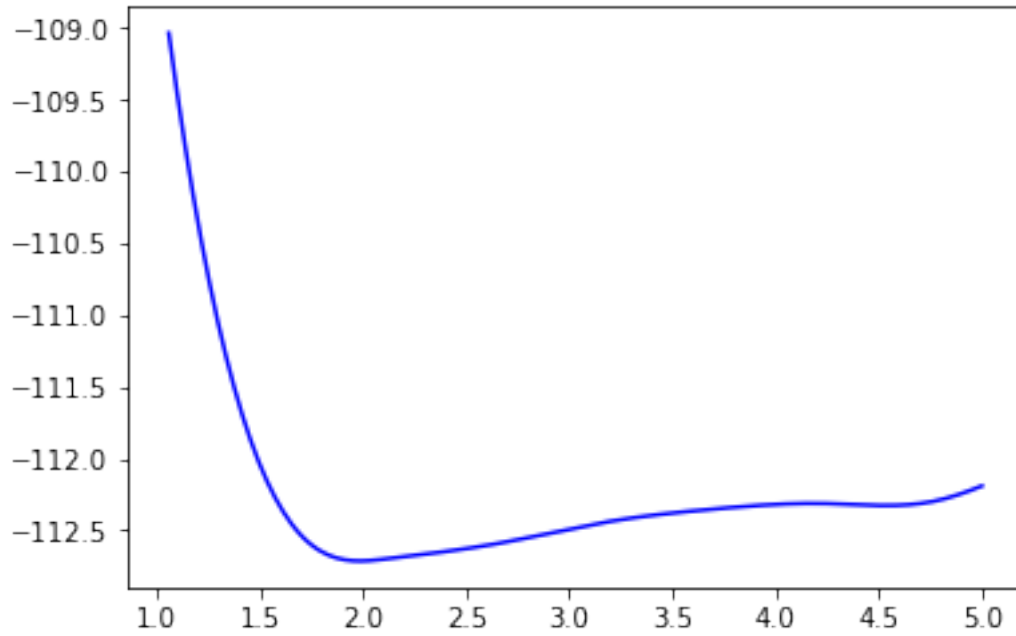
$$F(r) = -\frac{d}{dr}V(r) \quad (1)$$

at any separation between 1.0 and 5.8 a.u. since the derivative of cubic splines are readily available.

```
In [4]: ### use cubic spline interpolation
order = 3
### form the interpolator object for the data
sE = InterpolatedUnivariateSpline(r_array, E_array, k=order)
### form a much finer grid
r_fine = np.linspace(1.06, 5.0, 200)
### compute the interpolated/extrapolated values for E on this grid
E_fine = sE(r_fine)
### plot the interpolated data
plt.plot(r_fine, E_fine, 'blue')
plt.show()

### take the derivative of potential
fE = sE.derivative()
### force is the negative of the derivative
F_fine = -1*fE(r_fine)
```

```
### plot the forces
plt.plot(r_fine, np.abs(F_fine), 'black')
plt.xlim(1,5)
plt.show()
```



We can estimate the equilibrium bond length by finding the separation at which the potential is minimum; note this would also be the position that the force goes to zero:

$$\frac{d}{dr}V(r_{eq}) = -F(r_{eq}) = 0, \quad (2)$$

but there are artificial local minima in the PES at some levels of theory (e.g. Hartree-Fock) that make finding the zeros in the force problematic.

```
In [5]: ### Find index of the PES where it has its global minimum
        r_eq_idx = np.argmin(E_fine)
        ### find the value of the separation corresponding to that index
        r_eq = r_fine[r_eq_idx]
        ### print equilibrium bond-length in atomic units and in angstroms
        print("Equilibrium bond length is ", r_eq, " atomic units")
        print("Equilibrium bond length is ", r_eq*0.529, " Angstroms")
```

```
Equilibrium bond length is  1.9905527638190956  atomic units
Equilibrium bond length is  1.0530024120603017  Angstroms
```

At this point, take a moment to compare your equilibrium bond length with other teams who have used different levels of theory to compute their potential energy surfaces. Which equilibrium bond length should be most trustworthy?

Recall now that the Harmonic Oscillator potential, which is a reasonable model for the motion of diatomic atoms near their equilibrium bond length, is given by

$$V(r) = \frac{1}{2}kr^2 \quad (3)$$

and that the vibrational frequency of the molecule is given by

$$\nu = \frac{1}{2\pi} \sqrt{\frac{k}{\mu}} \quad (4)$$

where μ is the reduced mass of the molecule and k is known as the force constant. We can estimate the force constant as

$$k = \frac{d^2}{dr^2}V(r_{eq}). \quad (5)$$

1.0.1 Question 1: What is the reduced mass of the CO molecule in atomic units?

Answer: Reduced mass of CO is 12590. atomic units; the code below computes this.

```
In [6]: ### first define proton mass in atomic units
        m_p = 1836.15267
        ### mass of Carbon is ~ 12 * proton mass
        m_C = 12*m_p
        ### mass of Oxygen is ~ 16 * proton mass
        m_O = 16*m_p
        ### reduced mass
```

```
mu = m_O*m_C/(m_O + m_C)
print("Reduced mass is ",mu,"atomic units")
```

Reduced mass is 12590.761165714286 atomic units

1.0.2 Question 2: Use your spline fit to the PES of CO to estimate the vibrational frequency of CO. Express your number in atomic units and also convert to a common spectroscopic unit system of your choosing (wavenumbers, nm, microns, Hertz, THz are all acceptable choices).

Answer: Executing the code below will print out the frequency in several different unit systems.

```
In [11]: ### First we need the force constant of CO, which comes from evaluating the second derivative
### at the equilibrium bond length
### get second derivative of PES, which is the same as first derivative of fE
curvature = fE.derivative()
### evaluate curvature at r_eq
k = curvature(r_eq)
print("Force constant is ",k,"atomic units")
### Frequency within harmonic approximation is sqrt(k/mu)
omega = np.sqrt(k/mu)
print("Frequency is ",omega,"atomic units")
### From here we can realize that this frequency in atomic units is also equal
### to the energy of the vibration in atomic units (since E = hbar * omega and hbar = 1)
### and we can convert this energy to a more familiar unit system like eV using 1 atomic unit = 27.211 eV
E_ev = omega * 27.211
print("Energy of vibration is ",E_ev,"eV")
### We can now convert to wavelength using the fact that wavelength in nm = 1240./(Energy in eV)
lambda_nm = 1240./E_ev
print("Wavelength of vibration is ",lambda_nm,"nm")
### Finally we can express this vibration in wavenumbers (cm^-1) using the fact that
### wavenumber in inverse cm is 1e7 * 2 * pi/(wavelength in nm)
wn_icm = 1e7*np.pi*2/lambda_nm
print("Wavenumber of vibration is ",wn_icm,"cm^-1")
```

Force constant is 2.496074550520625 atomic units
 Frequency is 0.014080004163399959 atomic units
 Energy of vibration is 0.3831309932902763 eV
 Wavelength of vibration is 3236.490969709995 nm
 Wavenumber of vibration is 19413.572804569234 cm⁻¹

Next, we want to actually simulate the dynamics of the CO molecule on this *ab initio* potential energy surface. To do so, we need to solve Newton's equations of motion subject to some initial condition for the position (separation) and momentum (in a relative sense) of the particles. Newton's equations can be written

$$F(r) = \mu \frac{d^2}{dr^2} \quad (6)$$

where μ is the reduced mass in atomic units and $F(r)$ is the Force vs separation in atomic units that was determined previously.

1.0.3 Question 3: What will be the accelation of the bond stretch when C is separated by O by 3 atomic units? You can express your acceleration in atomic units, also.

Answer: The acceleration is -2.34e-5 atomic units, meaning there is a small acceleration in the direction that shortens the bondlength when the CO bond is stretched to 3 atomic units. Code to compute this value follows.

```
In [12]: ### To compute the acceleration, we just need to evaluate the force at the separation of
### and divide the force by mass
f_3au = -1*fE(3.)
a_3au = f_3au/mu
print("Acceleration of the bond when it is separated by a length of 3 a.u. is ",a_3au,"
```

Acceleration of the bond when it is separated by a length of 3 a.u. is -2.3423326676709337e-05

If the acceleration, position, and velocity of the bond stretch coordinate are known at some instant in time t_i , then the position and velocity can be estimated at some later time $t_{i+1} = t_i + \Delta t$:

$$r(t_i + \Delta t) = r(t_i) + v(t_i)\Delta t + \frac{1}{2}a(t_i)\Delta t^2 \quad (7)$$

and

$$v(t_i + \Delta t) = v(t_i) + \frac{1}{2}(a(t_i) + a(t_i + \Delta t))\Delta t. \quad (8)$$

This prescription for updating the velocities and positions is known as the Velocity-Verlet algorithm.

Note that we need to perform 2 force evaluations per Velocity-Verlet iteration... one corresponding to position $r(t_i)$ to update the position, and then a second time at the updated position $r(t_i + \Delta t)$ to complete the velocity update. To be able to define the very first update, an initial position and velocity must be specified. Typically, these are chosen at random from a sensible range of values. In this case, we will initialize the position to be a random number between 1.0 and 5.0; for the velocity, we will use the fact that we can estimate the expectation value of kinetic energy for a very similar system (the Harmonic oscillator) in the ground state as follows:

$$\langle T \rangle = \frac{1}{2}E_g, \quad (9)$$

where E_g is the ground state of the Harmonic oscillator (this is making use of the Virial theorem). We can easily find the ground state energy in the Harmonic oscillator approximation of CO using our frequency calculation described above as

$$E_g = \frac{1}{2}h\nu, \quad (10)$$

which implies the kinetic energy expectation value is

$$\langle T \rangle = \frac{1}{8\pi}h\sqrt{\frac{k}{\mu}}. \quad (11)$$

Since we can say classically that the kinetic energy is given by $T = \frac{1}{2}\mu v^2$, we can estimate the velocity of the bond stretch as follows:

$$v = \sqrt{\frac{2\langle T \rangle}{\mu}} = \sqrt{\frac{\hbar \sqrt{\frac{k}{\mu}}}{2\mu}} \quad (12)$$

where we have simplified using the fact that $\hbar = \frac{h}{2\pi}$. We will assume that a reasonable range of velocities spans plus or minus 3 times this "ground-state" velocity.

```
In [13]: ### get second derivative of potential energy curve... recall that we fit a spline to
### to the first derivative already and called that spline function fE.
cE = fE.derivative()

### evaluate the second derivative at r_eq to get k
k = cE(r_eq)

### define reduced mass of CO as m_C * m_O / (m_C + m_O) where mass is in atomic units
mu = 13625.

### define "ground-state" velocity:
v = np.sqrt( np.sqrt(k/mu)/(2*mu))

### get random position and velocity for CO within a reasonable range
r_init = np.random.uniform(0.75*r_eq, 2*r_eq)
v_init = np.random.uniform(-2*v, 2*v)

### print initial position and velocity
print("Initial separation is ", r_init, "atomic units")
print("Initial velocity is ", v_init, "atomic units")
### establish time-step for integration to be 0.2 atomic units... this is about 0.01 fs
dt = 0.02

### get force on particle
F_init = -1*fE(r_init)

Initial separation is  3.791034045495007 atomic units
Initial velocity is   0.0011398726539707774 atomic units
```

Next we need to define our Velocity-Verlet function and call it to update our position and velocity. The following partially-complete function will update the position. You should complete the function to also update the velocity (note: Remove lines that update velocity and have students implement them).

```
In [14]: def Velocity_Verlet(r_curr, v_curr, mu, f_interp, dt):
    ### get acceleration at current time
    a_curr = -1*f_interp(r_curr)/mu
```

```

    ### use current acceleration and velocity to update position
    r_fut = r_curr + v_curr * dt + 0.5 * a_curr * dt**2

    ### use r_fut to get future acceleration a_fut
    a_fut = -1*f_interp(r_fut)/mu
    ### use current and future acceleration to get future velocity v_fut
    v_fut = v_curr + 0.5*(a_curr + a_fut) * dt

    result = [r_fut, v_fut]

    return result

### how many updates do you want to perform?
N_updates = 200000

### Now use r_init and v_init and run velocity verlet update N_updates times, plot results
### these arrays will store the time, the position vs time, and the velocity vs time
r_vs_t = np.zeros(N_updates)
v_vs_t = np.zeros(N_updates)
t_array = np.zeros(N_updates)

### first entry is the initial position and velocity
r_vs_t[0] = r_init
v_vs_t[0] = v_init

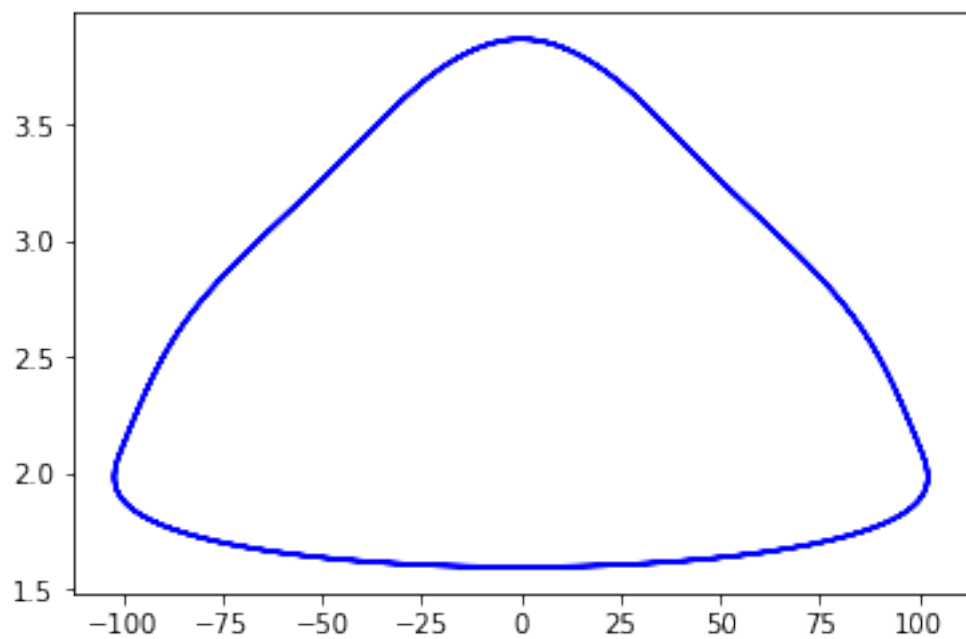
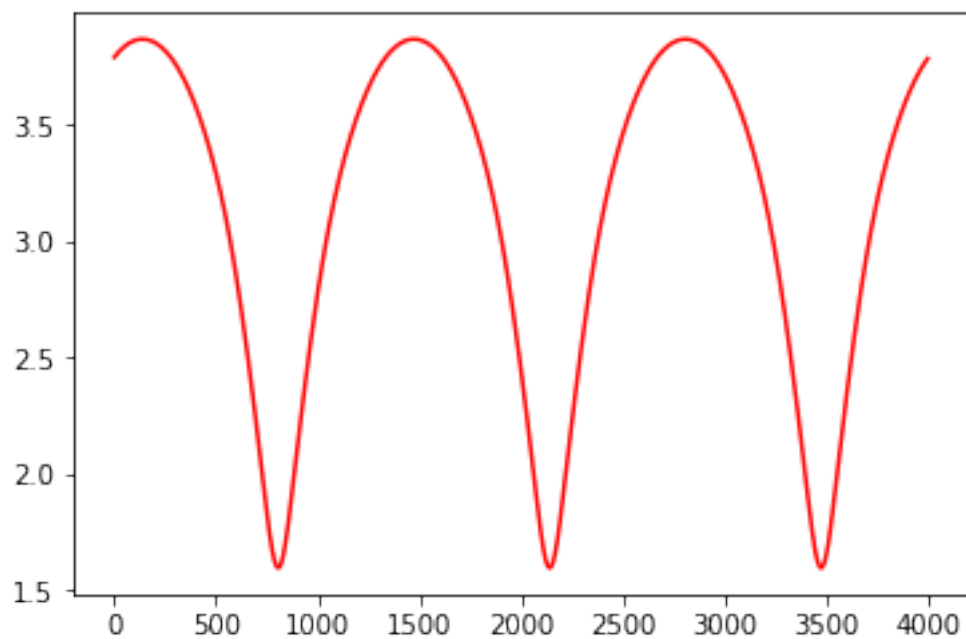
### first Velocity Verlet update
result_array = Velocity_Verlet(r_init, v_init, mu, fE, dt)

### do the update N_update-1 more times
for i in range(1, N_updates):
    tmp = Velocity_Verlet(result_array[0], result_array[1], mu, fE, dt)
    result_array = tmp
    t_array[i] = dt*i
    r_vs_t[i] = result_array[0]
    v_vs_t[i] = result_array[1]

### Plot the trajectory of bondlength vs time:
plt.plot(t_array, r_vs_t, 'red')
plt.show()

### plot the phase space trajectory of position vs momentum
plt.plot(mu*v_vs_t, r_vs_t, 'blue')
plt.show()

```

1.1 Input file templates for the CISD, RHF, and B3LYP levels of theory follow:

CONTRLMAXIT = 199SCFTYP = RHFCITYP = GUGARUNTYP = ENERGYCOORD =
ZMTEND CONTRLUNIT = BOHREND SYSTEMMWORDS = 100END BASISGBASIS =

```

N311NGAUSS = 6END SCFDIRSCF = .T.DISS = .T.DAMP = .T.END
CIDRTIEXCIT = 2NFZC = 0NDOC = 7NVAL = 19END DATACOC1CO11.5END
CONTRLMAXIT = 199SCFTYP = RHFRUNTYP = ENERGYCOORD = ZMTEND
CONTRLUNIT = BOHREND SYSTEMMWORDS = 100END SCFDIRSCF = .T.DISS =
.T.DAMP = .T.END BASISGBASIS = N311NGAUSS = 6END DATACOC1CO11.5END
CONTRLMAXIT = 199SCFTYP = RHFDFTTYP = B3LYPRUNTYP = ENERGYCOORD =
ZMTEND CONTRLUNIT = BOHREND SYSTEMMWORDS = 100END BASISGBASIS =
N311NGAUSS = 6END SCFDIRSCF = .T.DIIS = .T.DAMP = .T.END
DATACOC1CO11.5END

```