

Importamos las bibliotecas correspondientes

```
In [8]: import numpy as np
import matplotlib
matplotlib.use('TkAgg')
import matplotlib.pyplot as plt
from copy import *
%matplotlib notebook
#plt.rcParams["figure.figsize"] = (5,5)
```

```
In [9]: %%javascript
IPython.OutputArea.prototype._should_scroll = function(lines) {
    return false;
}
```

Funciones de inicialización de posiciones y velocidades

```
In [10]: def lattice_pos(npart,r):
    """
    Distribuye homogeneamente npart particulas en una celda
    de 1x1 entre 0 y 1, agregando un r/100% de aleatoriedad.
    Devuelve un np.array de npart de posiciones x 2 coordenadas

    """

    #Calculo cantidad de celdas por lado
    n = int(np.ceil(np.sqrt(npart)))

    #calculo el centro de la celda
    nf = 1.0/float(n)

    #Calculo las posiciones de todas las celdas disponibles agregando
    un r% de randomizacion
    #r = 0.02
    celdas = [[i*nf + 0.5*nf + r*np.random.rand(),j*nf + 0.5*nf+ r*np.r
    andom.rand()]]
        for i in range(n) for j in range(n)]

    #Mezclo las posiciones de las celdas
    np.random.shuffle(celdas)

    X = np.array(celdas[0:npart])
    return X
```

```

def vel_ini(npart,temp_red):
    """
    Asigna velocidades al azar de la distribucion uniforme en el rango
    -0.5 a 0.5
    """
    V = np.random.rand(npart,2)-0.5*np.ones((npart,2), dtype=np.float)

    #Calculamos la velocidad del centro de masa
    Vx = sum(V[:,0])/npart
    Vy = sum(V[:,1])/npart

    #Calculamos la velocidad cuadratica media
    V2 = sum(sum(V**2))/npart

    #Factor de escala para temperatura
    fs = np.sqrt(2*temp_red/V2)

    #Elimino la velocidad del centro de masa y escalo
    V[:,0] = (V[:,0] - Vx)*fs
    V[:,1] = (V[:,1] - Vy)*fs

    return V

def init(npart,box,temp_red,dt_red,sigma):
    """
    inicializa posiciones y velocidades usando lattice_pos y vel_ini
    """
    r = 0.00
    X = lattice_pos(npart,r)

    #Escala posiciones al tamaño de caja y lo reduzco con sigma
    X = (X*box)/sigma
    V = vel_ini(npart,temp_red)

    return X,V

```

Función para calcular las fuerzas usando Lennard-Jones en condiciones periódicas

```
In [11]: def force(npart,X,rcut,box,epsilon):
    """
    Calcula las fuerzas de todas las particulas utilizando un potencia
    l de Lennard-Jones.
    Las distancias ya estan reducidas por sigma y utiliza un radio de
    corte rcut.
    Las fuerzas son devueltas en unidades reducidas y las energias en
    kJ/mol

    """

    #inicializo las fuerzas a 0.0 y la energia a 0.0
    F = np.zeros((npart,2),dtype=np.float)
    Epot = 0.0

    #Calculo la energia de cutoff en unidades reducidas
    rci6 = 1.0/rcut**6
    rci12= rci6**2
    Ecut = 4.0*(rci12 -rci6)

    #Calculo la fuerza sobre todos los pares de particulas
    for i in range(npart-1):
        for j in range(i+1,npart):
            rx = X[i,0] - X[j,0]
            rx = rx - box*np rint(rx/box)
            ry = X[i,1] - X[j,1]
            ry = ry - box*np rint(ry/box)
            r2 = rx**2 + ry**2

            if r2 < rcut**2:
                r2i = 1/r2
                r6i = r2i**3
                ff = 48.0*r2i*r6i*(r6i-0.5)

                # F tiene unidades de reducidas
                F[i,0] = F[i,0] + ff*rx
                F[j,0] = F[j,0] - ff*rx

                F[i,1] = F[i,1] + ff*ry
                F[j,1] = F[j,1] - ff*ry

                Epot = Epot + 4.0*r6i*(r6i-1.0) - Ecut

    return [F,Epot*epsilon] #Fuerza en unidades reducidas y energia en
    kJ/mol
```

Funciones para calcular posiciones y velocidades usando velocity Verlet en condiciones periódicas

```
In [12]: def pos(npart,X,V,F,dt,box,m):
    """
    Calcula las nuevas posiciones usando el algoritmo de velocity Verlet.
    Todas las distancias están reducidas. Las nuevas posiciones son de
    vueltas en
    coordenadas reducidas.

    """

    Xnew = X + V*dt + (F/(2.0*m))*dt**2

    #Se fija si la partícula salió de la caja y la transporta a
    #la posición correspondiente de su imagen
    np.where(Xnew[:,0] > box, Xnew[:,0] - box, Xnew[:,0])
    np.where(Xnew[:,0] < 0.0, box + Xnew[:,0], Xnew[:,0])
    np.where(Xnew[:,1] > box, Xnew[:,1] - box, Xnew[:,1])
    np.where(Xnew[:,1] < 0.0, box + Xnew[:,1], Xnew[:,1])

    return Xnew

def vel(npart,V,F,Fnew,dt,m):
    """
    Calcula las nuevas velocidades usando el algoritmo de velocity Verlet.
    Las nuevas velocidades son devueltas en coordenadas reducidas y la
    energía
    cinética está en kJ/mol

    """

    Vnew = V + (0.5/m)*(Fnew + F)*dt

    V2 = sum(sum(Vnew**2))
    Ekin = 0.5*V2*epsilon

    return Vnew, Ekin
```

Función de inicialización de simulación que genera unidades reducidas y otros parámetros relevantes para simular, y función que genera una corrida (capaz de controlar la temperatura usando un termostato de Berendsen)

```
In [13]: def inicializar(npart, box, temperatura, dt, sigma, epsilon, masa):
    """
    Inicializa una simulación en función de la cantidad de partículas
    (npart),
    el tamaño de la caja en angstroms (box), una temperatura (K), el p
    aso de simulación
```

```

    (dt) en segundos, los parámetros de Lennard-Jones sigma y epsilon
    (en A y kJ/mol)
    y la masa de la partícula (en g/mol). Devuelve coordenadas, veloci-
    dades y fuerzas iniciales en
    unidades reducidas y un diccionario con parámetros de la corrida (
    unit_red)

    """
    NA = 6.02e23 # 1/mol
    kB = 1.381e-23 # J/K

    rcut = box/2.0 # A (unidades reales)

    #reduzco el tiempo
    t_unit = (sigma*1e-10) * np.sqrt(masa*1e-3/(1000*epsilon))
    dt_red = dt/t_unit

    #reduzco la temperatura
    temp_unit = 1.0/(kB/(1000*epsilon/NA))
    temp_red = temperatura/temp_unit

    #reduzco la masa
    m_unit = masa*1e-3/NA
    m = 1

    #Posiciones y Velocidad inicial
    X, V = init(npart,box,temp_red,dt_red,sigma)

    #Calculo fuerzas iniciales
    F,Epot = force(npart,X,rcut/sigma,box/sigma,epsilon)

    unit_red = {'t_unit': t_unit, 'T_unit': temp_unit, 'm_unit': m_uni
t, 'E_unit':epsilon, 'x_unit': sigma,
                'box': box/sigma, 'rcut':rcut/sigma, 'Temp0':temperatur
a, 'sigma':sigma, 'epsilon':epsilon,
                'dt':dt, 'm':m}

    return X, V, F, unit_red

def simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq):
    """
    Corre una simulación nsteps pasos a partir de las coordenadas, vel-
    ocidades
    y fuerzas iniciales. Si se provee un tau_ber > 0, utiliza un termo-
    stato de
    Berendsen para realizar una simulación a T constante (provista en
    los parámetros
    de la corrida). plot_freq define cada cuantos pasos se grafica. Ad-
    emás de los gráficos
    de posición en función del paso, Temperatura y Energías, provee co

```

```

ordenadas, velocidades
y fuerzas finales de la simulación.

"""
sigma = unit_red['sigma']
epsilon = unit_red['epsilon']
dt = unit_red['dt']/unit_red['t_unit']
box = unit_red['box']
temp0 = unit_red['Temp0']
m = unit_red['m']
rcut = unit_red['rcut']
temp_unit = unit_red['T_unit']

if plot_freq < nsteps:
    fig = plt.figure()
    ax1 = fig.add_subplot(2,2,1)
    ax2 = fig.add_subplot(2,2,3)
    ax3 = fig.add_subplot(2,2,2)
    fig.show()
    fig.canvas.draw()

#inicializo
E = np.zeros((nsteps,2))
T = np.zeros((nsteps,1))

if tau_ber > 0:
    berendsen = True
else:
    berendsen = False

for i in range(nsteps):
    #Calculo Posicion
    Xnew = pos(npart,X,V,F,dt,box,m)

    #Calculo Fuerzas nuevas
    Fnew, Epot = force(npart,Xnew,rcut,box,epsilon)
    E[i,0] = Epot

    #Calculo velocidad
    Vnew, Ekin = vel(npart,V,F,Fnew,dt,m)
    E[i,1] = Ekin
    T_i = sum(sum(Vnew**2))/(2*npart)*temp_unit
    T[i] = T_i

    if berendsen:
        l = np.sqrt(1 + (dt/tau_ber)*(temp0/T_i - 1))
        Vnew = Vnew*l

    #Actualizo variables
    X = copy(Xnew)

```

```

V = copy(Vnew)
F = copy(Fnew)

if (plot_freq < nsteps) and (i % plot_freq == 0):
    ax1.clear()
    ax1.plot(X[:,0]*sigma,X[:,1]*sigma,'b.')

    ax1.axis('equal')
    ax1.set_aspect('equal', 'box')
    ax1.set_xlim(0,box*sigma)
    ax1.set_ylim(0,box*sigma)

    ax2.clear()
    ax2.plot((E[0:i,0]+ E[0:i,1])/npart,'r', label = 'Total')
    ax2.plot(E[0:i,0]/npart,'g', label = 'Potencial')
    ax2.plot(E[0:i,1]/npart,'b', label = 'Cinetica')
    ax2.set_xlabel('#Paso')
    ax2.set_ylabel('E(kJ/mol)')
    ax2.legend(loc='upper center', bbox_to_anchor=(0.5, -0.1),
ncol=3, fancybox=True, shadow=True)

    ax3.clear()
    ax3.plot(T[0:i],'r')
    ax3.plot((i+1)*[temp0],'k--')
    ax3.set_xlabel('#Paso')
    ax3.set_ylabel('T(K)')

    fig.canvas.draw()

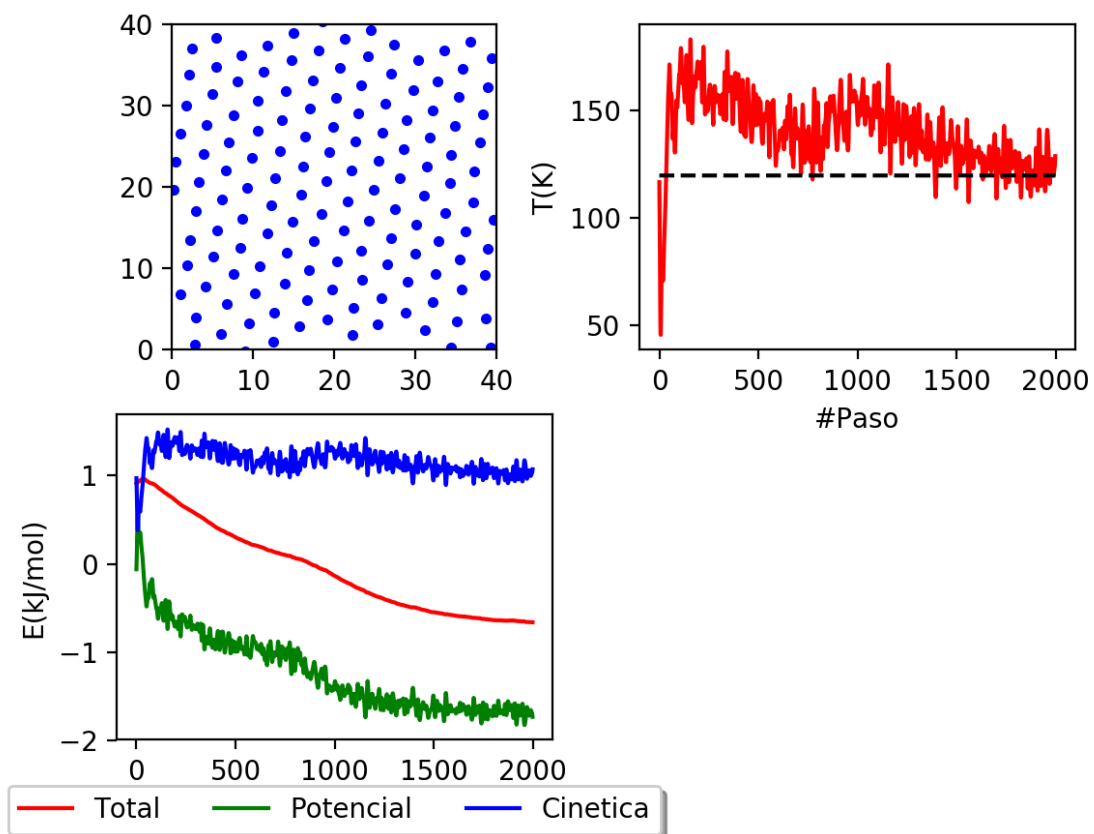
return X, V, F

```

Generación de una corrida. Inicialización de parámetros y simulación. Termalización a 119.8K por 2000 pasos.

```
In [14]: #Corrida
nsteps = 2000
npart = 144
box = 40
temperatura = 119.8 #K
dt = 1e-14 # en segundos
sigma = 3.405 #A
epsilon = 0.996 #kJ/mol
masa = 39.95 #g/mol
tau_ber = 1
plot_freq = 1

#Inicializo con berendsen tau = 1 y corro 2000 pasos
X, V, F, unit_red = inicializar(npart, box, temperatura, dt, sigma, epsilon, masa)
X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
```



```
In [15]: X
```

```
Out[15]: array([[ 2.9807683 ,  2.03025418],
                [10.93873015,  6.42566827],
                [ 2.23639228,  2.71886996],
```



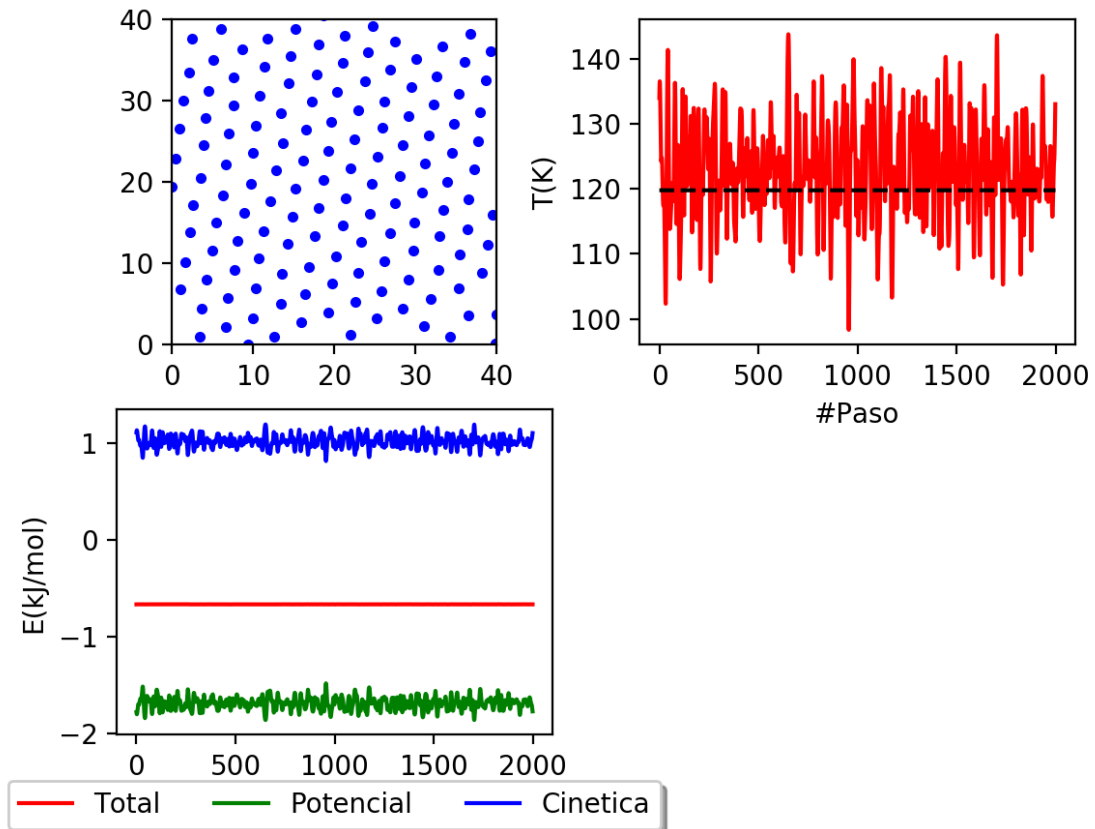
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```

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```

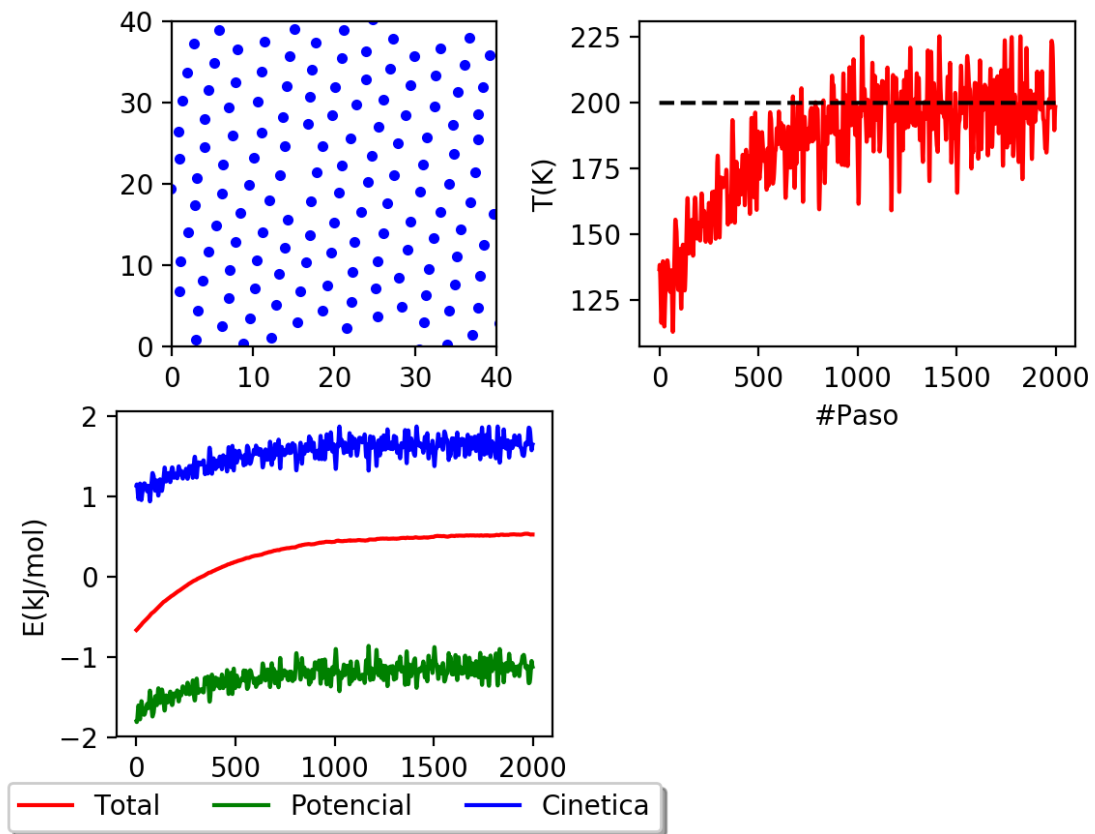
Testeo eliminar el termostato. Corrida de otros 2000 pasos.

```
In [16]: #Pongo berendsen tau = 0 y corro 2000 pasos
nsteps = 2000
tau_ber = 0
X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
V120 = copy(V)
```



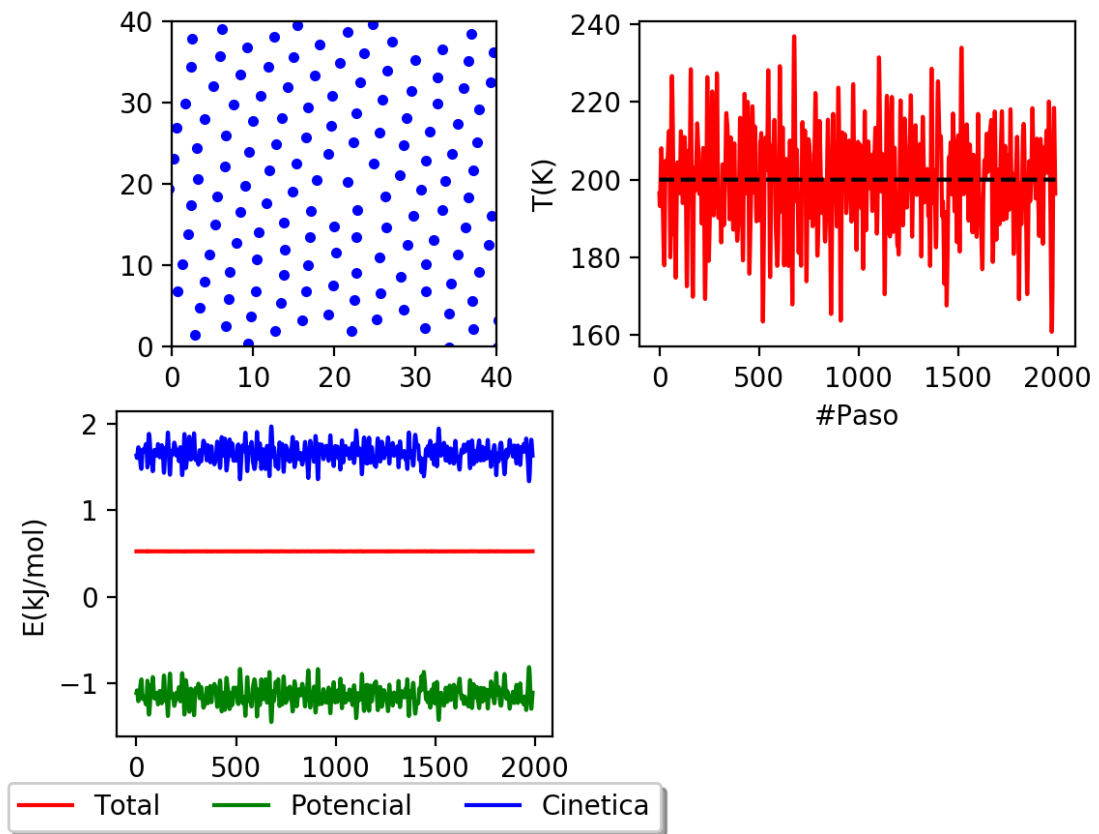
Cambio la  $T$  a 200K y pongo el termostato.

```
In [17]: #Cambio la temperatura del sistema a T = 200K, pongo un berendsen y co  
rro 2000 pasos  
unit_red['Temp0'] = 200  
tau_ber = 1.0  
nsteps = 2000  
X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
```



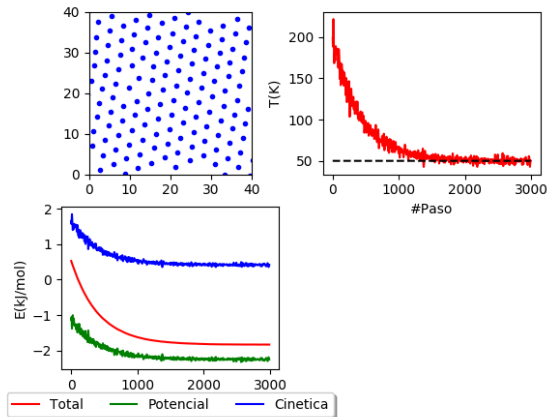
Elimino el termostato y chequeo que la T se mantiene.

```
In [18]: #Pongo berendsen tau = 0 y corro 2000 pasos
nsteps = 2000
tau_ber = 0
plot_freq = 10
X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
V200 = copy(V)
```



Enfrio el sistema a 50K usando el Berendsen.

```
In [19]: #Cambio la temperatura del sistema a T = 50K, pongo un berendsen y corro 1000 pasos
unit_red['Temp0'] = 50
tau_ber = 1.0
nsteps = 3000
X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
```



Elimino el Berendsen y veo la dinámica.

```
In [20]: #Pongo berendsen tau = 0 y corro 2000 pasos
nsteps = 2000
tau_ber = 0
plot_freq = 10
X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
V50 = copy(V)
```

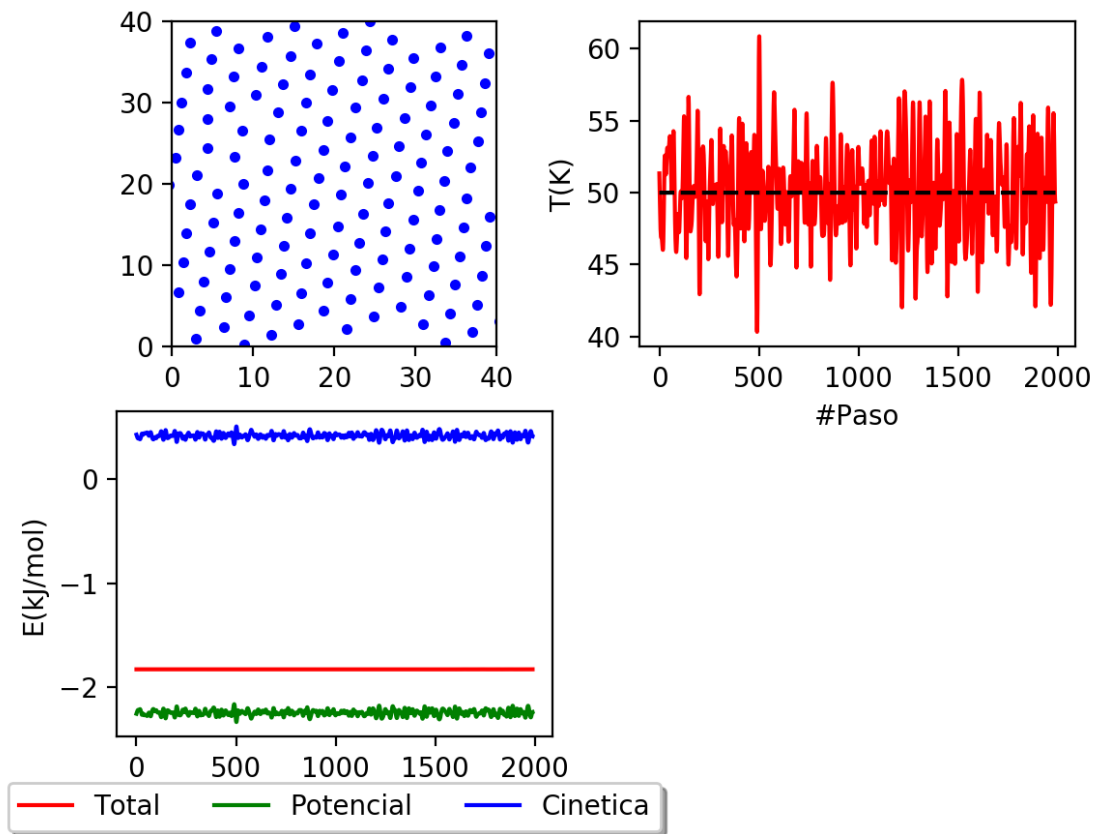


Grafico histogramas de las velocidades a las distintas temperaturas para los sistemas termalizados pero sin termostato.

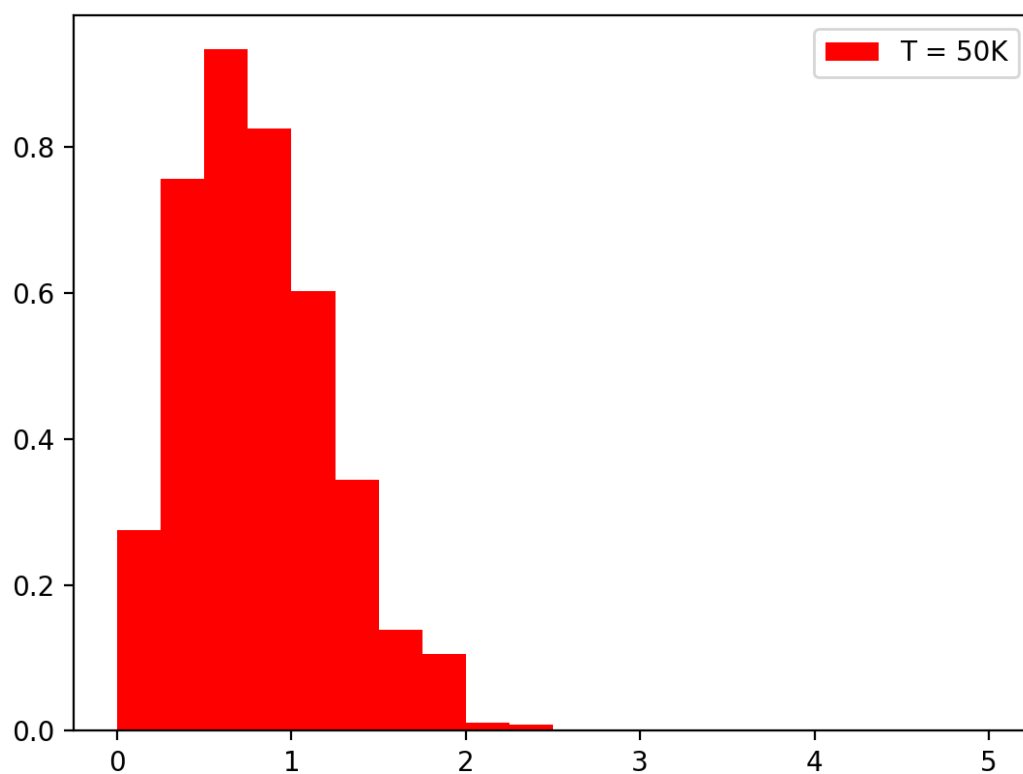


```
In [21]: fig = plt.figure()
ax1 = fig.add_subplot(3,1,1)
ax2 = fig.add_subplot(3,1,2)
ax3 = fig.add_subplot(3,1,3)
ax1.hist(np.sqrt(np.sum(V50**2, axis=1)), range = (0.0, 5.0), bins = 20, label= 'T = 50K', color = 'r', density=True)
ax1.legend()
ax2.hist(np.sqrt(np.sum(V120**2, axis=1)), range = (0.0, 5.0), bins = 20, label= 'T = 120K', color = 'g', density=True)
ax2.legend()
ax3.hist(np.sqrt(np.sum(V200**2, axis=1)), range = (0.0, 5.0), bins = 20, label= 'T = 200K', color = 'b')
ax3.legend()
plt.show()
```

Para aumentar la estadística de los histogramas, termalizo y manteniendo el termostato realizo 10 simulaciones de 500 pasos, guardando las velocidades de las partículas. Asumo que en 500 pasos las velocidades están descorrelacionadas y por lo tanto es como muestrear independientemente las velocidades.

```
In [22]: V50_x10 = []
nsim = 10
for i in range(nsim):
    print(i)
    nsteps = 500
    tau_ber = 1.0
    unit_red['Temp0'] = 50
    plot_freq = 1000
    X, V, F = simular(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
    V50_x10.append(np.sqrt(np.sum(V**2, axis=1)))
V50_x10 = np.array(V50_x10)
V50_x10 = V50_x10.reshape(npart*nsim,1)
fig = plt.figure()
ax1 = fig.add_subplot(1,1,1)
ax1.hist(V50_x10, range = (0.0, 5.0), bins = 20, label= 'T = 50K', color = 'r', density = True)
ax1.legend()
plt.show()
```

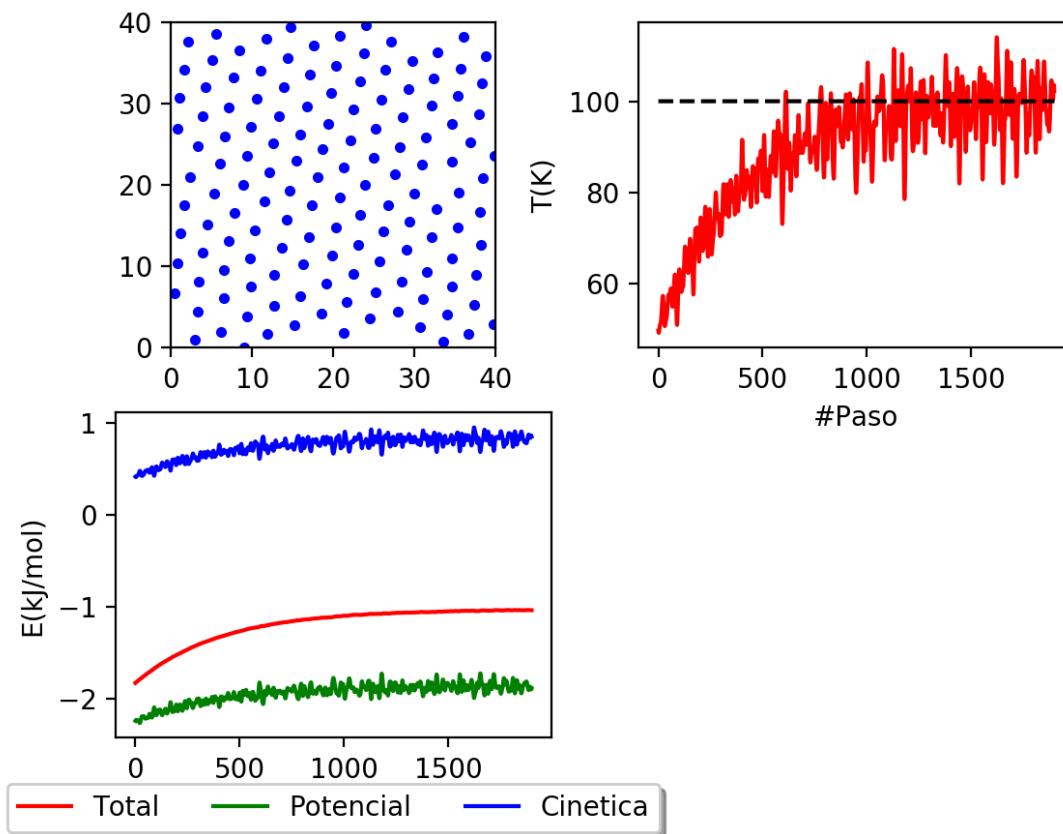
0  
1  
2  
3  
4  
5  
6  
7  
8  
9



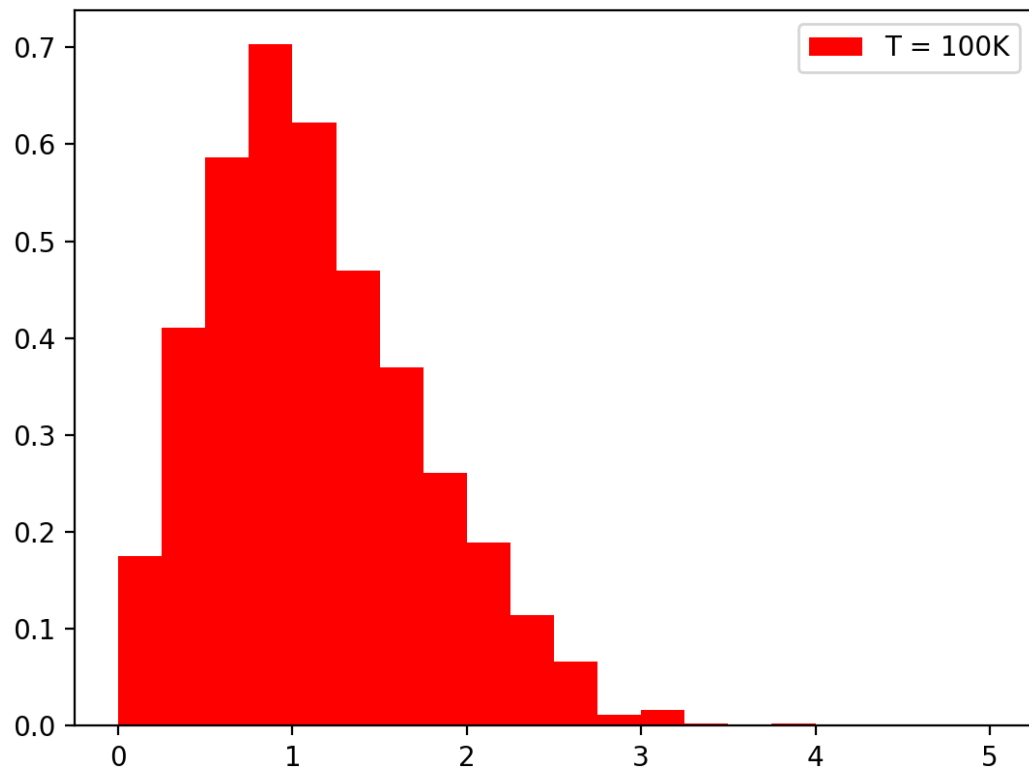
Repito a 100K

```
In [23]: nsteps = 2000
tau_ber = 1.0
unit_red['Temp0'] = 100
plot_freq = 100
X, V, F = similar(nsteps, X, V, F, unit_red, tau_ber, plot_freq)

V100_x10 = []
nsim = 10
for i in range(nsim):
    print(i)
    nsteps = 500
    tau_ber = 1.0
    unit_red['Temp0'] = 100
    plot_freq = 1000
    X, V, F = similar(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
    V100_x10.append(np.sqrt(np.sum(V**2, axis=1)))
V100_x10 = np.array(V100_x10)
V100_x10 = V100_x10.reshape(npart*nsim,1)
fig = plt.figure()
ax1 = fig.add_subplot(1,1,1)
ax1.hist(V100_x10, range = (0.0, 5.0), bins = 20, label= 'T = 100K', c
olor = 'r', density = True)
ax1.legend()
plt.show()
```



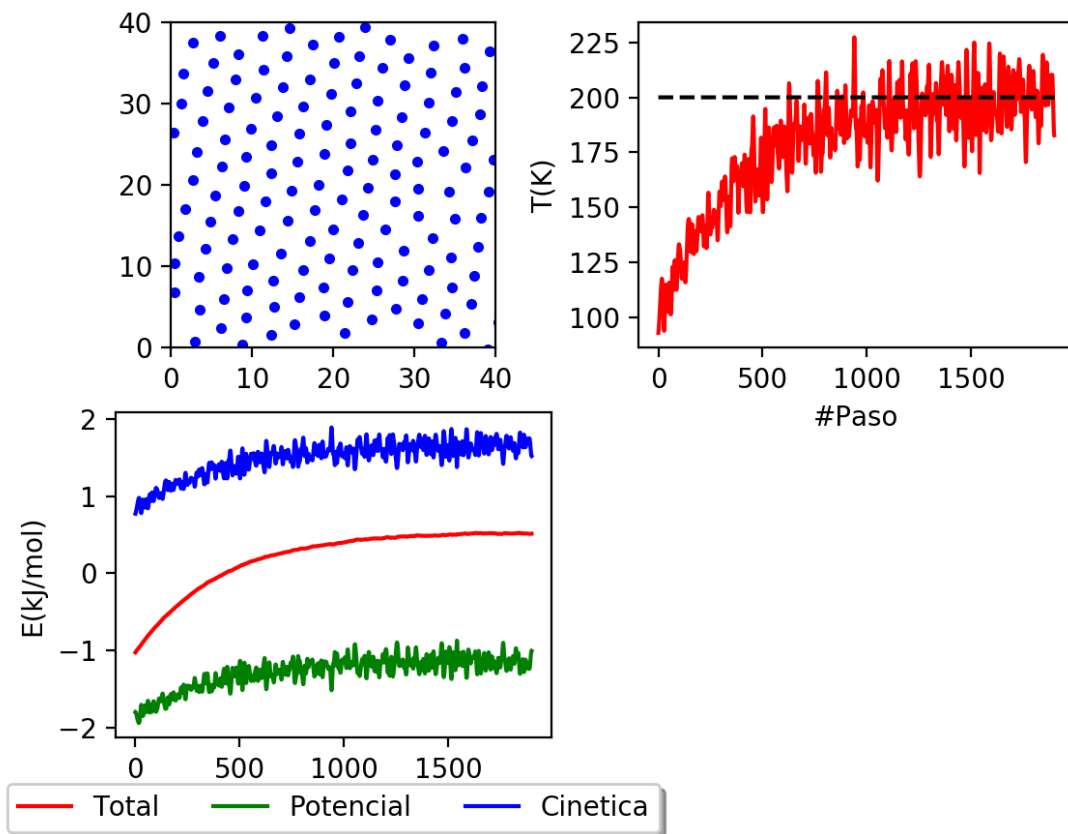
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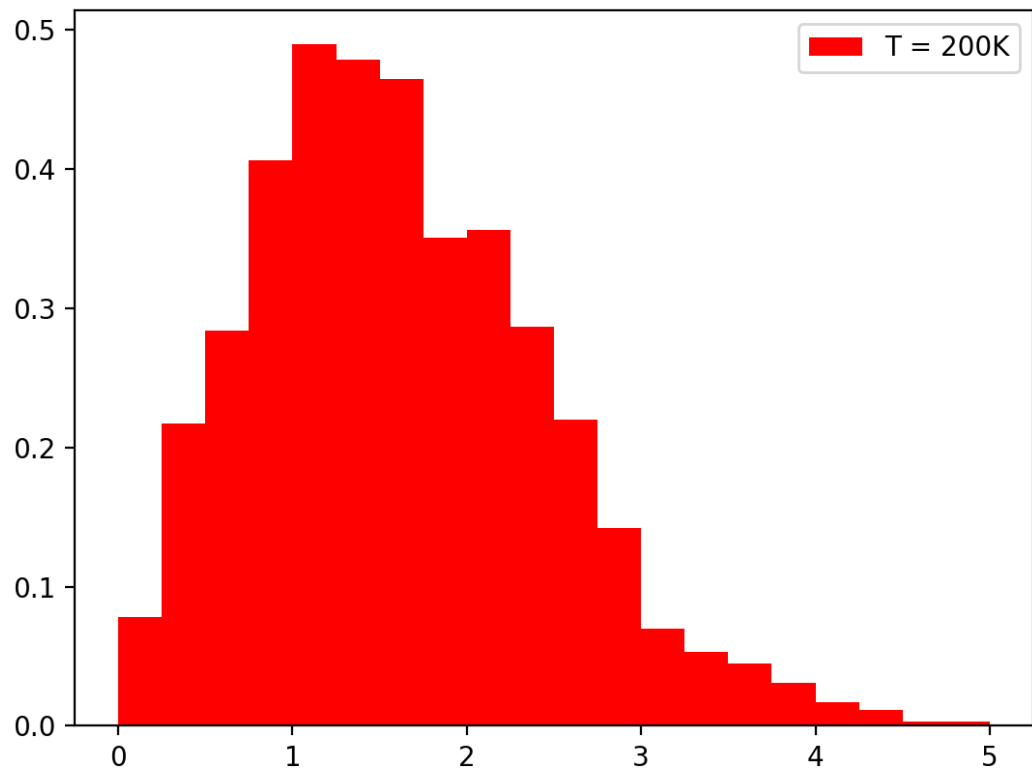
Repito a 200K

```
In [24]: nsteps = 2000
tau_ber = 1.0
unit_red['Temp0'] = 200
plot_freq = 100
X, V, F = similar(nsteps, X, V, F, unit_red, tau_ber, plot_freq)

V200_x10 = []
nsim = 10
for i in range(nsim):
    print(i)
    nsteps = 500
    tau_ber = 1.0
    unit_red['Temp0'] = 200
    plot_freq = 1000
    X, V, F = similar(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
    V200_x10.append(np.sqrt(np.sum(V**2, axis=1)))
V200_x10 = np.array(V200_x10)
V200_x10 = V200_x10.reshape(npart*nsim,1)
fig = plt.figure()
ax1 = fig.add_subplot(1,1,1)
ax1.hist(V200_x10, range = (0.0, 5.0), bins = 20, label= 'T = 200K', c
olor = 'r', density = True)
ax1.legend()
plt.show()
```



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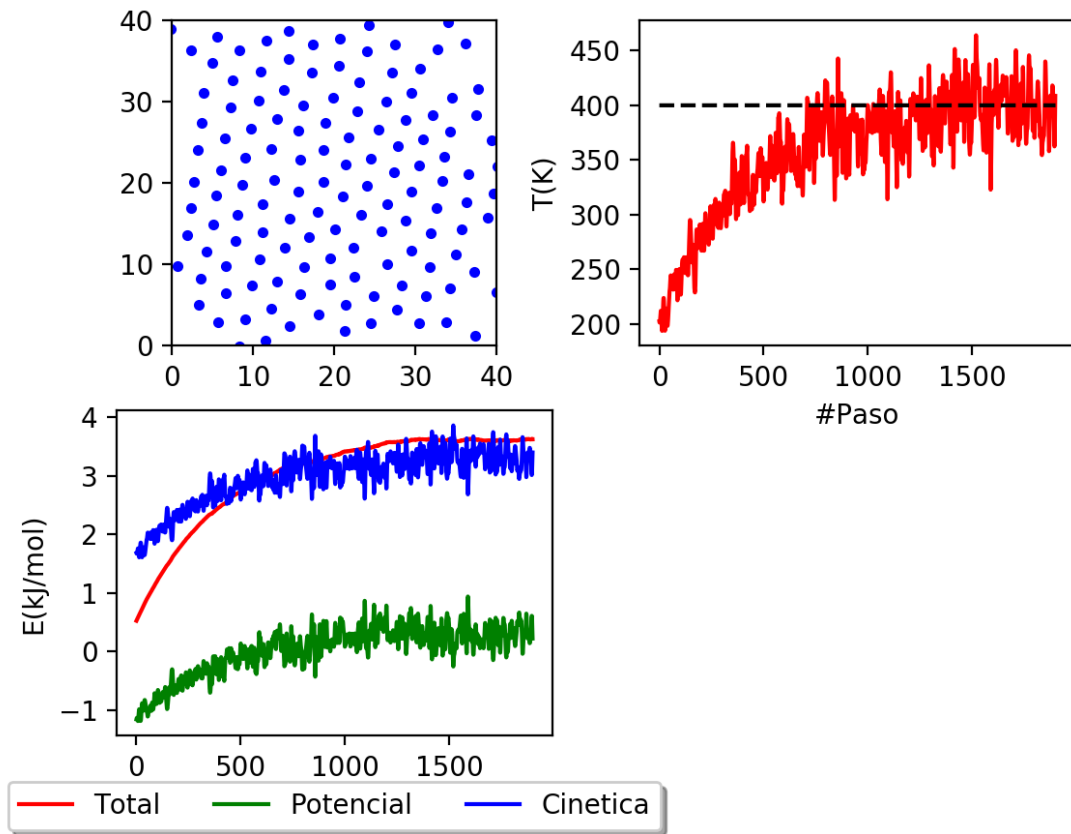


Repito a 400K!



```
In [25]: nsteps = 2000
tau_ber = 1.0
unit_red['Temp0'] = 400
plot_freq = 100
X, V, F = similar(nsteps, X, V, F, unit_red, tau_ber, plot_freq)

V400_x10 = []
nsim = 10
for i in range(nsim):
    print(i)
    nsteps = 500
    tau_ber = 1.0
    unit_red['Temp0'] = 400
    plot_freq = 1000
    X, V, F = similar(nsteps, X, V, F, unit_red, tau_ber, plot_freq)
    V400_x10.append(np.sqrt(np.sum(V**2, axis=1)))
V400_x10 = np.array(V400_x10)
V400_x10 = V400_x10.reshape(npart*nsim,1)
fig = plt.figure()
ax1 = fig.add_subplot(1,1,1)
ax1.hist(V400_x10, range = (0.0, 5.0), bins = 20, label= 'T = 400K', c
olor = 'r', density = True)
ax1.legend()
plt.show()
```



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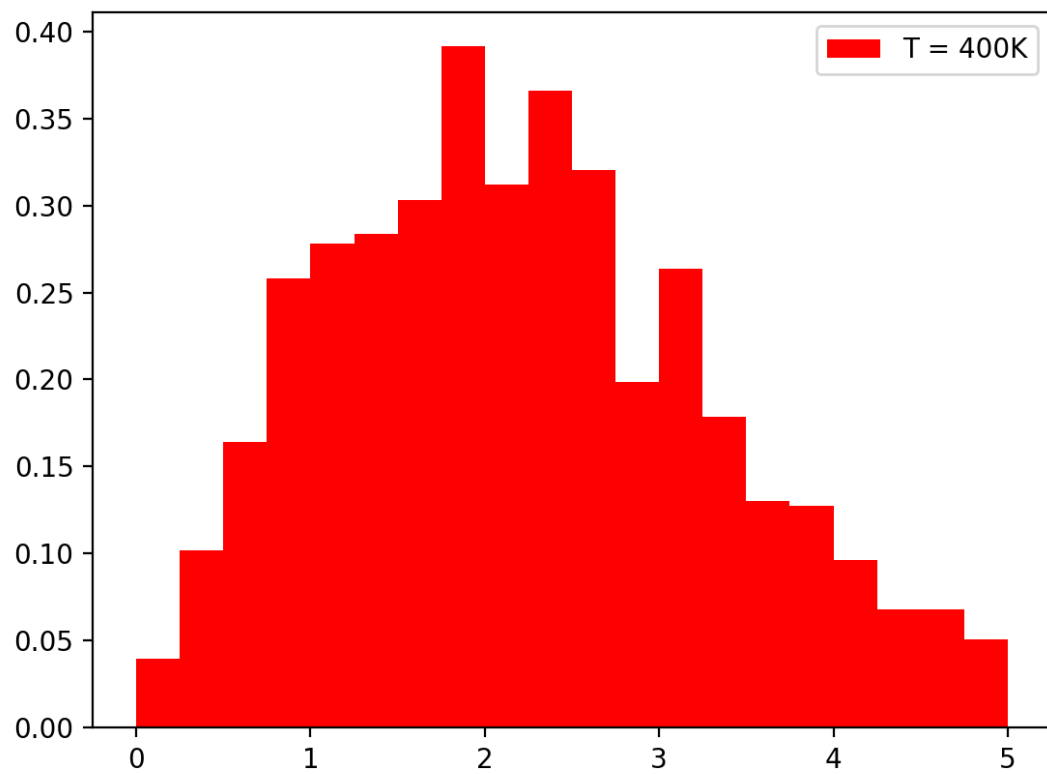
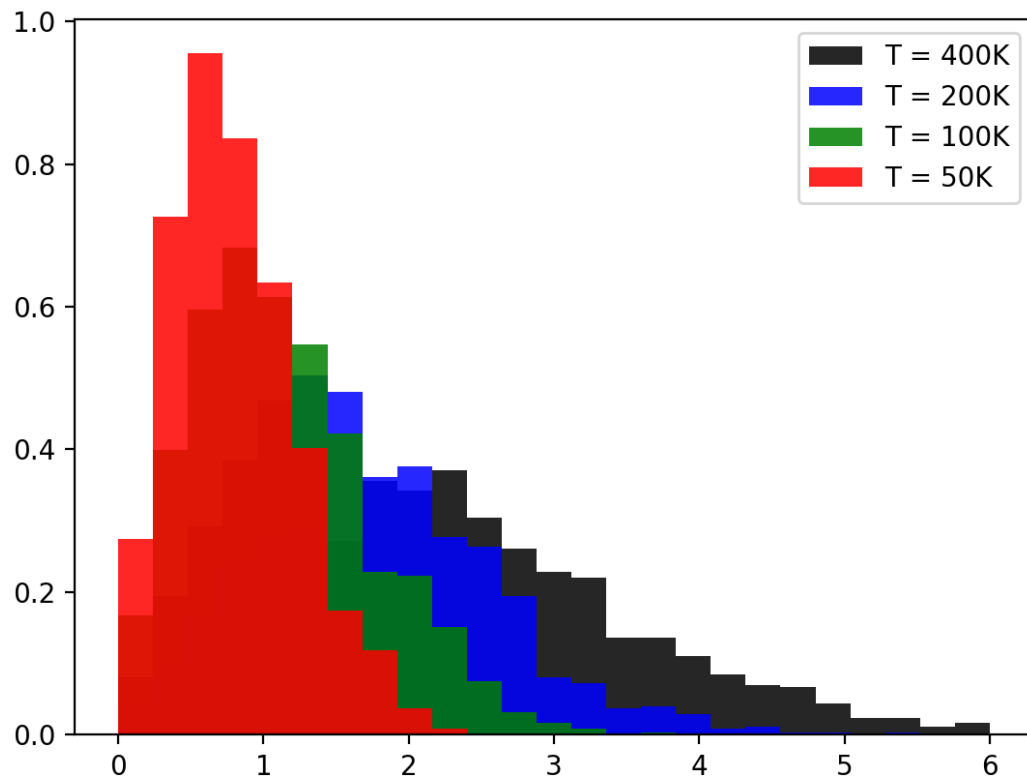


Grafico todos los histogramas juntos... Boltzman!

```
In [26]: fig = plt.figure()
ax1 = fig.add_subplot(1,1,1)
ax1.hist(V400_x10, range = (0.0, 6.0), bins = 25, label= 'T = 400K', c
olor = 'k', alpha = 0.85, density=True)
ax1.hist(V200_x10, range = (0.0, 6.0), bins = 25, label= 'T = 200K', c
olor = 'b', alpha = 0.85, density=True)
ax1.hist(V100_x10, range = (0.0, 6.0), bins = 25, label= 'T = 100K', c
olor = 'g', alpha = 0.85, density=True)
ax1.hist(V50_x10, range = (0.0, 6.0), bins = 25, label= 'T = 50K', col
or = 'r', alpha = 0.85, density=True)
ax1.legend()
plt.show()
```



In [ ]: