

MOLECULAR DYNAMICS SIMULATION OF ARGON

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ABSTRACT

The motion of a collection of 864 particles has been simulated using Molecular Dynamics techniques to compute values for pressure, specific heat and the static pair correlation function in reduced units. The computed properties were compared with experimental results for the properties of argon. The simulation was done with a Lennard-Jones pair-potential and the system was allowed to reach equilibrium. The computed results are in good agreement with the known properties of argon.

1 INTRODUCTION

Molecular dynamics is a method to simulate a many-particle system by numerically solving Newton's classical equations of motion for all particles for a period of time. The main limitations are the fact that simulations are only realizable for small systems and times compared to experimental systems in general. Furthermore, the systems to be simulated can only be classical in the usual molecular dynamics approach.

In this report we discuss the results of simulations for a system of argon gas with 864 particles. Molecular dynamics simulations of argon are reported to be in good agreement with experimental results[1]. The particles are placed in a FCC lattice, considering the fact that the ground state configuration is a FCC lattice for argon. A Lennard-Jones Potential is implemented for the calculation of the force between the particles where a pair potential is assumed. The initial velocities of the particles are randomly generated for each velocity component while obeying a Maxwell-Boltzmann distribution for all particles.

After initialization the system's equations of motion are solved numerically after each time step using Verlet's algorithm. The system is allowed to relax to its equilibrium using a thermostat to rescale the velocities and enforce energy conservation. After the equilibrium has been reached, the simulation continues and collects results for calculating the time average of different properties of the system. The virial's theorem allows the calculation of the pressure, specific heat is evaluated using a formula derived by Lebowitz using the fluctuations of the kinetic energy[2].

2 THEORY

2.1 FCC Lattice

2.2 Lennard Jones Potential

2.3 Virial Theorem

2.4 Specific Heat

The specific heat at constant volume C_V is defined as:

$$C_V = \left(\frac{\delta E}{\delta T} \right)_V$$

In molecular dynamics simulations, a quantity that can be calculated is the ensemble average of the total energy $\langle E \rangle_{NVT}$:

$$\langle E \rangle_{NVT} = \frac{\sum_X e^{-\beta \mathcal{H}(X)} \mathcal{H}(X)}{\sum_X e^{-\beta \mathcal{H}(X)}} = -\frac{\delta \ln(Z)}{\delta \beta}$$

Using the ensemble average for the total energy, the formula for the specific heat can be rewritten as a function of the fluctuations in the total energy:

$$C_V = \frac{1}{k_B T^2} \frac{\delta^2 \ln(Z)}{\delta \beta^2} \quad (1)$$

$$= \frac{1}{k_B T^2} \left(\langle E^2 \rangle_{NVT} - \langle E \rangle_{NVT}^2 \right) \quad (2)$$

This is still difficult to use in a program simulating a system in the microcanonical ensemble as the total energy is kept fixed, but following the derivation by Lebowitz[2] this can be related to the fluctuation in kinetic energy:

$$\frac{\langle \delta K^2 \rangle}{\langle K \rangle^2} = \frac{2}{3N} \left(1 - \frac{3N}{2C_V} \right)$$

2.5 Pair correlation function

3 METHODS FOR SIMULATION

3.1 Initialization

3.1.1 *FCC Lattice*

3.1.2 *Velocity Distribution*

3.1.2.1 BOX MULLER ALGORITHM

3.2 Dynamics

3.2.1 *Boundary Conditions*

3.2.2 *Lennard Jones Potential*

3.2.3 *Force Calculation*

3.2.3.1 VERLET ALGORITHM

3.2.3.2 LEAP FROG METHOD

3.2.4 *Pressure Calculation*

3.2.4.1 VIRIAL THEOREM

3.2.5 *Thermostat*

3.3 Information Processing

3.3.1 *Specific Heat*

The implementation in our simulation is inside the algorithm for the dynamics of the particles. For each time step the new velocities are calculated, the kinetic energy is also calculated and the relevant sums of the kinetic energy are updated in a subroutine "calc_specific_heat":

```

subroutine calc_specific_heat(end_of_routine,N_part, kin_energy,
    sum_kin_energy, sum_kin_energy_sqr)
    ....

    sum_kin_energy_sqr = sum_kin_energy_sqr + kin_energy**2
    sum_kin_energy = sum_kin_energy + kin_energy
    ....
end subroutine

```

Listing 1: Updating the relevant sums of the kinetic energy

3.3.1.1 LEBOWITZ ALGORITHM As discussed earlier, the specific heat is related to the fluctuations in kinetic energy using a formula derived by Lebowitz[2]:

$$\frac{\langle \delta K^2 \rangle}{\langle K \rangle^2} = \frac{2}{3N} \left(1 - \frac{3N}{2C_V} \right)$$

Rewriting this to get an expression for the specific heat:

$$C_V = \left(\frac{2}{3N} - \frac{\langle \delta K^2 \rangle}{\langle K \rangle^2} \right)^{-1} \quad (3)$$

$$= \left(\frac{2}{3N} - \frac{\langle K^2 \rangle - \langle K \rangle^2}{\langle K \rangle^2} \right)^{-1} \quad (4)$$

Using the time average instead of the ensemble average, the averages can be expressed as a sum over all time steps n_t divided by the time steps:

$$\langle K^2 \rangle = \frac{\sum_{i=1}^{n_t} K(i)^2}{n_t}$$

$$\langle K \rangle^2 = \left(\frac{\sum_{i=1}^{n_t} K(i)}{n_t} \right)^2$$

Now the specific heat can be calculated as:

$$C_V = \left(\frac{2}{3N} - \frac{\langle K^2 \rangle - \langle K \rangle^2}{\langle K \rangle^2} \right)^{-1} \quad (5)$$

$$= \left(\frac{2}{3N} - \frac{\sum_{i=1}^{n_t} K(i)^2 * n_t - (\sum_{i=1}^{n_t} K(i))^2}{(\sum_{i=1}^{n_t} K(i))^2} \right)^{-1} \quad (6)$$

This is implemented in our code within the same subroutine "calc_specific_heat" after an if statement is enabled at the end of the simulation:

```

subroutine calc_specific_heat(end_of_routine,N_part, kin_energy,
    sum_kin_energy, sum_kin_energy_sqr, step)
    ....

    if (end_of_routine .eqv. .true.) then
        specific_heat = ((2d0/(3d0*N_part)) - (((sum_kin_energy_sqr * step) -
            sum_kin_energy**2) / (sum_kin_energy**2))**(-1)

        print *, "The specific heat is ", specific_heat
    end if
end subroutine

```

Listing 2: Calculating the specific heat

3.3.2 Pair Correlation Function

4 RESULTS AND DISCUSSION

4.1 Pressure

4.2 Temperature

4.3 Specific Heat

Some text with a citation [1] The other citation [3] and another[4]

4.4 Pair Correlation function

4.5 Phase Transitions

REFERENCES

- [1] L. Verlet. 'Computer "Experiments" on Classical Fluids. I. Thermodynamical Properties of Lennard-Jones Molecules'. *Physical Review*, 159, 1967.
- [2] S. Duane. 'Stochastic quantization versus the microcanonical ensemble – getting the best of both worlds'. *Nucl. Phys.*, 275:398–420, 1985.
- [3] Glosser C. 'ICCP Coding Manual'. 2015.
- [4] J. Thijssen. 'Computational Physics'. 2013.

A MAIN FORTRAN SOURCE CODE

```

!argon gas in a box simulation, molecular dynamics.

!the cubic geometry sides of length = L
!initial positions initialized according to fcc lattice structure
!number of fcc cells per cartesian dimension = Ncell,
5 !number of particles is N, (4 particles per cube)

!velocity verlet method:  $v' = v + 1/2 * F(x) / m * dt$ ;  $x = x + v' * dt$ ;  $v = v' + 1/2 * F(x) / m * dt$ .
! (converted from initially an implementation of the semi implicit euler
  method)
10 !time evolution for particles in lennard jones potential:  $U = 4 * e * ((s/r)^{12} - (s/r)^6)$ ,
     $F_{ij} = -du/dx = -du/dr * dr/dx = e * (48 * s^{12} / r^{13} - 6 * s^6 / r^7) * x/r$ ,
     $r = \sqrt{x^2 + y^2 + z^2}$ 

program argon_box
15   use argon_box_init
   use argon_box_dynamics
   use argon_box_results
! use md_plot
   implicit none

20   integer, parameter :: N_cell_dim = 6, velocity_rescale_steps = 50
   real(8), parameter :: dt = 0.004_8, T_initial = 1d0, rho = 0.8_8, t_stop =
     5d0

   integer, parameter :: N_cell = N_cell_dim**3, N_part = N_cell*4
25   real(8), parameter :: L_side = (N_part/rho)**(1./3)

   real(8), parameter :: s = 1d0, e = 1d0, r_cut = 5d-1*L_side ! lennard
     jones potential
   real(8), parameter :: m = 1d0, Kb = 1d0 !mass and boltzman constant

30   integer, parameter :: hist_num_intervals = 500
   integer, dimension(1:hist_num_intervals) :: histogram_vector,
     tot_histogram_vector

   !integer, parameter :: N_avSteps = 100 ! #steps used for ensemble average
35   ! integer :: i ,j,k,l,n, step !iteration variables
   integer :: step
   real(8), dimension(1:3, 1:N_part) :: pos, vel
   real(8) :: time, kin_energy, pot_energy, virial !, sum_kin_energy_sqr,
     sum_kin_energy
   real(8) :: Pressure, Temperature, tot_energy

40   ! Create initial state
   call cubic_fcc_lattice(N_cell_dim, L_side, pos)
   call init_random_seed
   call init_vel(T_initial, Kb, m, N_part, vel)

45   ! call plot_init(0d0, L_side, 0d0, L_side, 0d0, L_side)
   time = 0d0
   step = 0
   !!!!!!!!!!!
50   sum_kin_energy_sqr = 0d0
   sum_kin_energy = 0d0
   tot_histogram_vector = 0

   do while (time < t_stop)
55     time = time + dt
     step = step + 1

```

```

!velocity verlet integration method, .true. triggers the calculation of
!thermodynamic quantities.
call calc_dynamics(.false., N_part, L_side, dt, m, e, s, r_cut, pos,
60 kin_energy, pot_energy, &
& virial, vel, hist_num_intervals,
histogram_vector)
call new_pos(N_part, L_side, dt, vel, pos)
call calc_dynamics(.true., N_part, L_side, dt, m, e, s, r_cut, pos,
kin_energy, pot_energy, &
& virial, vel, hist_num_intervals,
histogram_vector)

65 !Temperature control
if (step < velocity_rescale_steps) then
call rescale_vel(T_initial, kin_energy, Kb, N_part, vel)
end if

70 tot_energy = pot_energy + kin_energy
Temperature = 2*kin_energy/(3* (N_part-1) *Kb) !Center of mass degrees
of freedom subtracted..
Pressure = (1 + 1/(3*Kb*Temperature*N_part)* virial) !P/(Kb T rho) +
TODO: correction cutoff

!call plot_points(pos)

75 tot_energy = tot_energy/N_part
pot_energy = pot_energy/N_part
kin_energy = kin_energy/N_part

80 print *, step, "t=", time, "H=", tot_energy, "K=", kin_energy, "U=",
pot_energy, "T =", Temperature, "P =", Pressure
!print *, histogram_vector

tot_histogram_vector = tot_histogram_vector + histogram_vector

85 !call write_histogram_file(histogram_vector, hist_num_intervals, N_part,
step)
!call write_energy_file(tot_energy, kin_energy, pot_energy, Temperature,
step)
call calc_specific_heat(.false., N_part, kin_energy, sum_kin_energy,
sum_kin_energy_sqr)
end do
! call plot_end
90 call write_histogram_file(tot_histogram_vector, hist_num_intervals, N_part
, step)
end program

```

Listing 3: argon_box.f90

B FORTRAN SOURCE CODE FOR SETTING THE INITIAL CONDITIONS

```

module argon_box_init
  implicit none
  private

5   public cubic_fcc_lattice, init_vel, init_random_seed

contains

  function fcc_cell(i) result(output)
10    implicit none
    integer, intent(in) :: i
    real(8) :: output(3)
    ! face centered cubic unit cell with basis particle positions:
    real(8), dimension(1:3), parameter :: &
15    fcc_part1 = (/0d0, 0d0, 0d0/), &
    fcc_part2 = (/0d0, 5d-1, 5d-1/), &
    fcc_part3 = (/5d-1, 0d0, 5d-1/), &
    fcc_part4 = (/5d-1, 5d-1, 0d0/)
    real(8), dimension(1:3,1:4), parameter :: &
20    R_cell = reshape( (/fcc_part1, fcc_part2, fcc_part3, fcc_part4/),
        (/3,4/))
    output = R_cell(:,i)

    ! print *, "face centered cubic unit cell"
    ! do i = 1,3    ! print *, (R_cell(i,j), j=1,4)
25    ! end do
end function fcc_cell

  subroutine cubic_fcc_lattice(N_cell_dim, L_side, pos)
    !initial positions of all particles according to an fcc lattice
    structure
30    integer :: i,j,k,l,n
    integer, intent(in) :: N_cell_dim
    real(8), intent(in) :: L_side
    real(8), intent(out), dimension(1:3, 1:(4*N_cell_dim*3)) :: pos

35    n = 0
    do i = 1,N_cell_dim
        do j = 1,N_cell_dim
            do k = 1,N_cell_dim
                do l = 1,4
                    n = n + 1
40                    pos(:,n) = L_side/N_cell_dim*(/ i-1, j-1, k-1 /) + fcc_cell(l)
                    ! print *, "particle:", n, "/", N_part, "position:", pos(:,
                        n)
                end do
            end do
        end do
45    end do
end subroutine

  subroutine init_vel(T, Kb, m, N_part, vel)
50    !initial particles velocities according to the maxwell distribution
    ! in the maxwell boltzman distribution each velocity component is
    normally distributed:
    ! Box muller transform used for converting uniform dist to normal dist
    !
    ! f(v) = sqrt(m/(2*PI*Kb*T)) * exp(-(v**2)/2 *m/(Kb*T))
    ! sigma**2 = Kb*T/m, and zero mean
55    real(8), intent(in) :: T, Kb, m
    integer, intent(in) :: N_part
    real(8), intent(out), dimension(1:3, 1:N_part) :: vel
    real(8), parameter :: pi = 4*atan(1d0)

```

```

60  real(8) :: xs(2) !two random numbers
    integer :: n, i

    do n = 1,N_part
        do i = 1,3
65          CALL RANDOM_NUMBER(xs(1))
            CALL RANDOM_NUMBER(xs(2))
            vel(i,n) = sqrt(Kb*T/m) * sqrt(-2d0*log(xs(1)))*cos(2*pi*xs(2)) !
                sigma * box_muller
        end do
    end do
70    !Set center of mass velocity to zero
    do i = 1,3
        vel(i,:) = vel(i,:) - sum(vel(i,:))/N_part
    end do
end subroutine

75  ! copied from ICCP coding-notes
subroutine init_random_seed()
    implicit none
    integer, allocatable :: seed(:)
80    integer :: i, n, un, istat, dt(8), pid, t(2), s
    integer(8) :: count, tms

    call random_seed(size = n)
    allocate(seed(n))
85    open(newunit=un, file="/dev/urandom", access="stream",&
        form="unformatted", action="read", status="old", &
        iostat=istat)
    if (istat == 0) then
        read(un) seed
90    close(un)
    else
        call system_clock(count)
        if (count /= 0) then
            t = transfer(count, t)
95        else
            call date_and_time(values=dt)
            tms = (dt(1) - 1970)*365_8 * 24 * 60 * 60 * 1000 &
                + dt(2) * 31_8 * 24 * 60 * 60 * 1000 &
                + dt(3) * 24 * 60 * 60 * 60 * 1000 &
100            + dt(5) * 60 * 60 * 1000 &
                + dt(6) * 60 * 1000 + dt(7) * 1000 &
                + dt(8)
            t = transfer(tms, t)
        end if
        s = ieor(t(1), t(2))
        pid = getpid() + 1099279 ! Add a prime
        s = ieor(s, pid)
        if (n >= 3) then
            seed(1) = t(1) + 36269
110            seed(2) = t(2) + 72551
            seed(3) = pid
            if (n > 3) then
                seed(4:) = s + 37 * (/ (i, i = 0, n - 4) /)
            end if
        end if
115    else
        seed = s + 37 * (/ (i, i = 0, n - 1) /)
    end if
end if
    call random_seed(put=seed)
120 end subroutine init_random_seed

end module

```

Listing 4: argon_box_init.f90

THE SYSTEM

```

module argon_box_dynamics
  implicit none
  private

  public calc_dynamics, rescale_vel, new_pos

contains

  subroutine calc_dynamics(calc_quant, N_part, L_side, time_step, m, e, s,
    r_cut, pos, kin_energy, pot_energy,&
    & virial, vel, num_intervals,
    histogram_vector)

    logical, intent(in) :: calc_quant !for improving efficiency with
    velocity verlet method
    integer, intent(in) :: N_part, num_intervals
    real(8), intent(in) :: e, s, r_cut !Lennard Jones
    real(8), intent(in) :: m, time_step, L_side
    real(8), intent(inout), dimension(1:3, 1:N_part) :: vel
    real(8), intent(in), dimension(1:3, 1:N_part) :: pos
    integer :: i,j,k,l,n
    real(8), intent(out) :: kin_energy, pot_energy, virial
    real(8) :: sum_v_2, F(3), dF(3), r, r_vec(3)

    integer, intent(out), dimension(1:num_intervals) :: histogram_vector
    integer :: hist_i
    real(8) :: delta_r_hist
    delta_r_hist = L_side / num_intervals

    virial = 0
    pot_energy = 0
    sum_v_2 = 0
    histogram_vector = 0

    do n = 1,N_part
      F = 0
      do i = 1,N_part !integrate over all particles inside box except i = n
        do j = -1, 1
          do k = -1, 1 !periodic boundary condition
            do l = -1, 1
              if (n/=i) then
                r_vec = (/pos(1,n)-pos(1,i), pos(2,n)-pos(2,i), pos(3,n)-pos(3,i)
                  &)/ + L_side*(/j,k,l/)
                r = sqrt(dot_product(r_vec, r_vec))
                ! histogram for the pair correlation function
                if ((n > i) .and. (calc_quant .eqv. .true.)) then! .and. (k==0)
                  .and. (j==0) .and. (l==0)) then
                  hist_i = 1 + floor(r/delta_r_hist)
                  if (hist_i < num_intervals + 1) then ! defines a cut off
                    distance
                    histogram_vector(hist_i) = histogram_vector(hist_i) + 1
                  !else
                  ! histogram_vector(num_intervals) = histogram_vector(
                    num_intervals) + 1
                end if
              end if
            end do
          end do
        end do
        !force calculation
        if (r<r_cut) then
          dF = e*(48*s**12/r**14 - 24*s**6/r**8) * r_vec
          F = F + dF
          ! calculate other quantities:
          if (calc_quant .eqv. .true.) then
            if (n > i) then

```

```

        pot_energy = pot_energy + 4*e*((s/r)**12-(s/r)**6)
        virial = virial + dot_product(r_vec, dF)
    end if
    end if
    end if
    end do
    end do
    end do
    end do
    vel(:,n) = vel(:,n) + F/m*time_step/2 ! velocity verlet method ->
        factor 1/2 !
    if (calc_quant .eqv. .true.) then
        sum_v_2 = sum_v_2 + dot_product(vel(:,n),vel(:,n))
    end if
    end do
    kin_energy = m/2*sum_v_2

end subroutine

subroutine rescale_vel(T_intended, kin_energy, Kb, N_part, Vel)
    !rescale velocities in order to keep temperature constant

    real(8), intent(in) :: T_intended, kin_energy, kb
    integer, intent(in) :: N_part
    real(8), intent(inout), dimension(1:3, 1:N_part) :: vel
    real(8) :: scaling_factor

    scaling_factor = sqrt((N_part - 1)*3/2*kb*T_intended/kin_energy)
    vel = scaling_factor*vel

end subroutine

subroutine new_pos(N_part, L_side, dt, vel, pos)
    ! Position calculation

    real(8), intent(in) :: L_side, dt
    integer, intent(in) :: N_part
    real(8), intent(in), dimension(1:3, 1:N_part) :: vel
    real(8), intent(inout), dimension(1:3, 1:N_part) :: pos
    integer :: n, i

    do n = 1,N_part
        pos(:,n) = pos(:,n) + vel(:,n)*dt
        do i = 1,3 !implements periodic boundary conditions
            if (pos(i,n) < 0d0) then
                pos(i,n) = pos(i,n) + L_side
            else if (pos(i,n) > L_side) then
                pos(i,n) = pos(i,n) - L_side
            end if
        end do
    end do

end subroutine

end module

```

Listing 5: argon_box_dynamics.f90

D FORTRAN SOURCE CODE FOR OUTPUT OF RESULTS

```

module argon_box_results
  implicit none
  private

5   public write_energy_file, write_histogram_file ,calc_specific_heat

contains

  subroutine write_energy_file(H, kin_energy, pot_energy, T, cnt)
10    real(8), intent(in) :: H, kin_energy, T, pot_energy
        integer, intent(in) :: cnt
        open (unit=1,file="energy_matrix.dat",action="write")
        write (1,"(I6, 4F18.6)") cnt, H, kin_energy, pot_energy, T
  end subroutine

15  subroutine write_histogram_file(average_number, num_intervals, N_part,
        step )
        integer, intent(in) :: num_intervals, N_part, step
        integer, intent(in), dimension(1:num_intervals) :: average_number
        real(8) :: constant_factor, temp_factor, temp_factor2, temp_factor3
20    integer :: i

        temp_factor = 2d0 * num_intervals / N_part
        temp_factor2 = 1d0 * num_intervals / (N_part - 1)
        temp_factor3 = 1d0 * num_intervals / step
25    constant_factor = (temp_factor * temp_factor2 * temp_factor3) / ( 4 *
        abs(atan(1d0)) * 4)

        open (unit=6,file="histogram.dat",action="write")
        do i=1,num_intervals

30          write (6,"(I3, 4F18.6)") i, (constant_factor * average_number(i)) / (
            i**2)

        end do

35  end subroutine

  subroutine calc_specific_heat(end_of_routine,N_part, kin_energy,
        sum_kin_energy, sum_kin_energy_sqr, step)
40    logical, intent(in) :: end_of_routine
        real(8), intent(in) :: kin_energy
        real(8), intent(out) :: sum_kin_energy, sum_kin_energy_sqr
        integer, intent(in) :: N_part, step
        real(8) :: specific_heat

45    sum_kin_energy_sqr = sum_kin_energy_sqr + kin_energy**2
        sum_kin_energy = sum_kin_energy + kin_energy

        if (end_of_routine .eqv. .true.) then
50          specific_heat = ((2d0/(3d0*N_part)) - (((sum_kin_energy_sqr * step) -
            sum_kin_energy**2) / (sum_kin_energy**2)))*(-1)

          print *, "The specific heat is ", specific_heat
        end if
  end subroutine

55  end module

```

Listing 6: argon_box_results.f90