### PARTICLE IN A BOX SIMULATION

#### DAVID FLEMING

#### 1. Simulation Model

1.1. Initial Conditions. The particles in this code were modeled off of protons with the fundamental mass and size units being  $m_p = 1.6726219 \times 10^{-24}$  g and  $a = 8.775 \times 10^{-14}$  cm, respectively. Specifically, a is the charge radius which is a measure of the size of an atomic nucleus (see here for the NIST value). The initial velocity was computed by solving the following equation after specifying a temperature

$$\frac{3}{2}k_bT = \frac{1}{2}mv^2$$

This velocity was decomposed into components by computing  $v_x = v\cos(\theta)$  and  $v_y = v\sin(\theta)$  where  $\theta$  was randomly sampled from  $[0, 2\pi]$ . The initial (x, y) were computed by randomly sampling from [0, L] where L is the size of the box. As per the problem description, the size of the box, L, was set such that the particle size was equal to 0.05 of L. Finally, the time step  $\Delta t$  for each particle was set to  $\frac{a}{3v}$  in order to ensure that not too many particles pass through each other on a given time step.

1.2. Collision Handling. Particles, assumed to be hard spheres, were treated as collided when the following condition was met

$$\sqrt{(x_1 - x_2)^2 + (y_1 - y_2)^2} < 2a$$

where  $(x_i, y_i)$  is the center of the *i*th particle with radius a. When this condition held, the two particles trajectories were integrated in reverse by  $\delta t$  until just before they collide, that is when the distance between their centers of mass was 2a. The time step  $\delta t$  is given by

$$\frac{2a - \sqrt{(x_1 - x_2)^2 + (y_1 - y_2)^2}}{v_{rol}}$$

where  $v_{rel}$  is the relative velocity between particles i and j and  $(x_k, y_k)$  is the center of the kth particle. Now the particles collide and their respective velocities

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are updated such that momentum and energy are conserved. To do this, the collision between them was modeled as an elastic force directed along the line connected the centers of the spheres. The new velocity for particle i after colliding with particle j is given by

$$\vec{v_i'} = \vec{v_i} - \frac{2m_j}{m_i + m_j} \frac{\langle \vec{v_i} - \vec{v_j}, \vec{x_i} - \vec{x_j} \rangle}{||\vec{x_i} - \vec{x_j}||^2} (\vec{x_i} - \vec{x_j})$$

See here for a description of the equation. After the collision, the particles were then advanced forward by  $\delta t$  to keep them on the same time as the rest of the particles.

- 1.3. Box Boundaries. In this simulation, the box walls were periodic. If a particle was found to be outside the box at a given time step, it would be placed on the opposition end of the box. For example, if x > L, x was set to x L.
- 1.4. **Pressure.** The pressure the gas exerts on the walls was calculated each time a particle passed through the right wall. In two dimensions, pressure is given by force per length where  $F = \frac{\Delta p}{\Delta t}$  for momentum p. The average force exerted on the right wall by a particle is  $F = \frac{2mv_x}{\Delta t}$  where  $\Delta t = \frac{l}{v_x}$  since for periodic boundary conditions, it takes the particle on average that much time to interact with the right wall again. To account for motion in both the x and y directions, note that  $\bar{v}_x^2 + \bar{v}_y^2 = \bar{v}^2$  where  $\bar{v}_x^2 = \bar{v}_y^2$  so  $\bar{v}_x^2 = \frac{1}{2}\bar{v}^2$  Therefore, the pressure a particle exerts on the walls assuming a perfectly elastic collision is

$$P = \frac{m_p v^2}{l^2}$$

Each pressure event is recorded in a vector whose average is found and outputted at the end of the simulation. In general, the simulated pressure is within a factor of a few of P = nkT which is a fine result given the periodic boundary conditions contributing a factor of 2 and the intrinsic scatter in the initial conditions.

1.5. **Algorithm.** The code, written in C++, was structured around two nested for loops. During a given time step, the first loop iterated over each particle. For each particle i, the then code looped over every other particle j to see if the two collided. If they collided according to the criterion given above, their velocities were updated while conserving energy and momentum. After the loop over every other particle ended, the code checked to see if the particle was still within the bounds of the box and applied periodic boundary conditions if it was not. At the end of each step for particle i, its position was updated by  $\vec{x}'_i = \vec{x} + \Delta t \vec{v}$ . Throughout the execution, the positions and velocities were stored for future output into a text file. The full code can be found at https://github.com/dflemin3/boxSim.

1.6. Simulation Evolution. Ten simulations were ran with 100 particles. The radius of each particle was 2% of the lengths of the walls and evolved for a sufficiently long time such that the velocity distribution converged to a steady-state solution in which the initial velocity distribution has been forgotten. Figure 1 displays the initial and final particle positions. The figure demonstrates that all the particles do indeed move around while remaining bounded by the box. Figure 2 shows the initial and final velocity distributions and demonstrates how it converges into a Maxwellian (discussed below).

#### 2. Simulation Velocity and Energy Distributions

2.1. **a.** As derived on the attached sheet (see Fleming 1), the 2D Maxwellian distributions for velocity and energy are

$$\frac{dN}{dv} = \frac{Nm}{k_b T} v e^{\frac{-mv^2}{2k_b T}}$$

and

$$\frac{dN}{dE} = \frac{N}{k_b T} e^{\frac{-E}{k_b T}}$$

respectively.

- 2.2. **b.** After running 10 simulations for a sufficient length of time, the velocity and energy distributions reached a steady state. For both velocity v and energy E, the average histogram of the ten simulations for v and E at the initial and final states of the simulation are shown in Figures 2 and 3 over plotted with the theoretical expectation discussed above in 2.a. As shown in the figures, there is good agreement between the simulation results and theory.
- 2.3. c. For one set of ten simulations, I made half of the particle masses 10 times larger. The average histograms of v and E of the simulations are shown in Figures 4 and 5. For the velocity distributions, it appears like the velocity distribution for the simulation with half of the particles being more massive is composed of two Maxwellians with a lower peak velocity than the standard simulation's distribution although the peaks are hard to resolve. The mass dependence in  $\frac{dN}{dv}$  causes a distribution to become tighter and centered around lower velocity values at a given temperature. Since the temperature of the gas determines its energy and  $E = \frac{1}{2}mv^2$ , the more massive the particle, the slower it is. Therefore it makes sense that the simulation with a higher average particle mass would have a tighter peak and at a lower velocity as is observed. The two Maxwellian bumps in the distribution is likely due to the more massive particles kicking the lower mass particles to high velocity giving rise to the higher velocity bump. For the energy distribution shown in Figure 5, we see that the two simulations are effectively identical. This is because  $\frac{dN}{dE}$  has no mass dependence as the temperature of the

gas specifies the shape of the distribution. The results in more massive particles moving more slowly and lighter particles moving faster at the same temperature to produce the same distribution shape.

#### 3. Relaxation Timescale

3.1. a. To numerically determine when the system has relaxed, at each time step i, the simulated velocity distribution is compared to the theoretical Maxwell distribution at the given temperature. The system is considered relaxed once the simulated velocity distribution first comes near to the shape of the Maxwell distribution. This condition is defined to occur when the following condition first occurs

$$\Sigma_{j}\left(\frac{(sim_{ij} - maxwell_{j})^{2}}{maxwell_{j}}\right) < \epsilon$$

where  $sim_i$  is the simulated velocity distribution at the ith step summed over all j velocity bins, maxwell is the Maxwell distribution, and  $\epsilon$  is the tolerance and is set to 0.01. As a sanity check, the velocity distribution  $sim_i$  that first satisfies this criterion is plotted for visual confirmation.

3.2. **b.** The relaxation time for a particle as a function of the initial velocity, cross section, and number density is given by the following formula

$$\tau = \frac{1}{2anv}$$

for particle size a, number density n and initial particle velocity v.

This formula, derived on an attached sheet (see Fleming 2), stems from the assumption that the system approaches equilibrium after each particle has on average collided once. This occurs after  $\tau = \frac{\lambda}{v}$  where  $\lambda = \frac{1}{n\sigma}$  is the mean free path of the particle and n and  $\sigma$  are the number density of the gas and particle cross section, respectively. After  $\tau$  has elapsed, a sufficient amount of energy and momentum has been redistributed throughout the system such that the particle's velocity and energy distributions approach Maxwellian.

3.3. **c.** To confirm the agreement between my numerical and theoretical relaxation times, I ran simulations varying the number density, n, and particle size, a, while holding the other fixed. I averaged the results of the simulations to reduce the noise. For fixed n, I varied a from [0.1a, 0.5a, a, 5.0a] and for fixed a, I varied n from [n, n/4, n/16, n/32] and the results are plotted in Figure 6.

The theoretical relaxation time is found to be in excellent agreement with my numerical estimate.

#### 4. IDEAL GAS LAW

The simulation ran for several values of both number density n and temperature T to see if the ideal gas law  $P = nk_bT$  held. For each (n,T) pair, the simulation outputted the pressure computed by determining the average force on a wall due to incident particles (for a more complete discussion see the "Pressure" section). For fixed n, T was varied from [100, 300, 500, 1000, 2500, 5000, 7500, 10000, 20000] Kelvin and for fixed T, n was varied from [n, n/4, n/16, n/32, n/64]. The simulation results were then plotted vs. the Ideal Gas Law in Figure 7 to see if it indeed held for the simulations. The results of the simulation matched the Ideal Gas Law quite well within a factor of 2 or so. The linear behavior of the Ideal Gas Law was recovered when both n and T were varies with the other held fixed.

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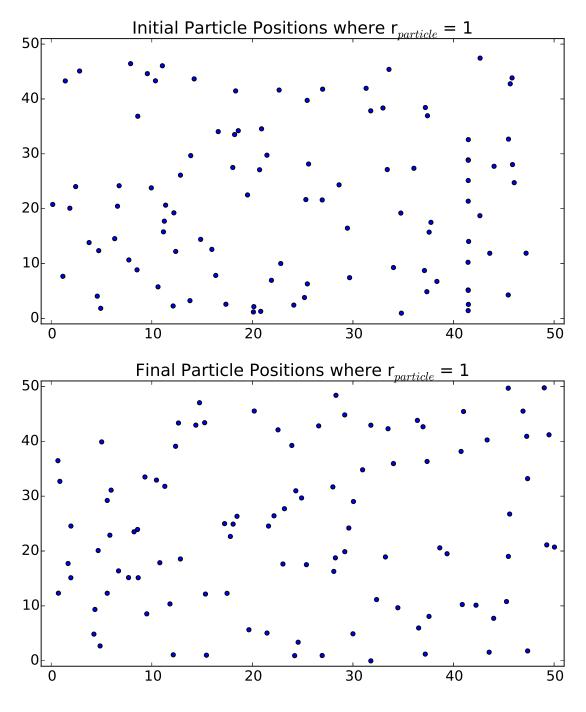


FIGURE 1. Initial and final particle positions.

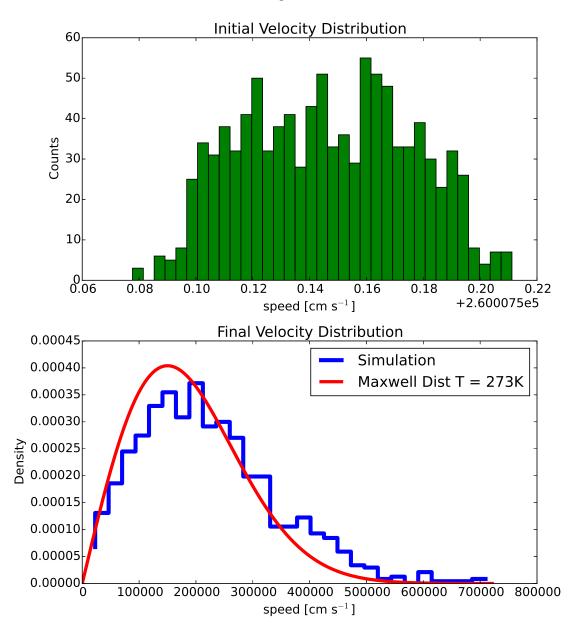


FIGURE 2. Simulated velocity distribution compared with theory.

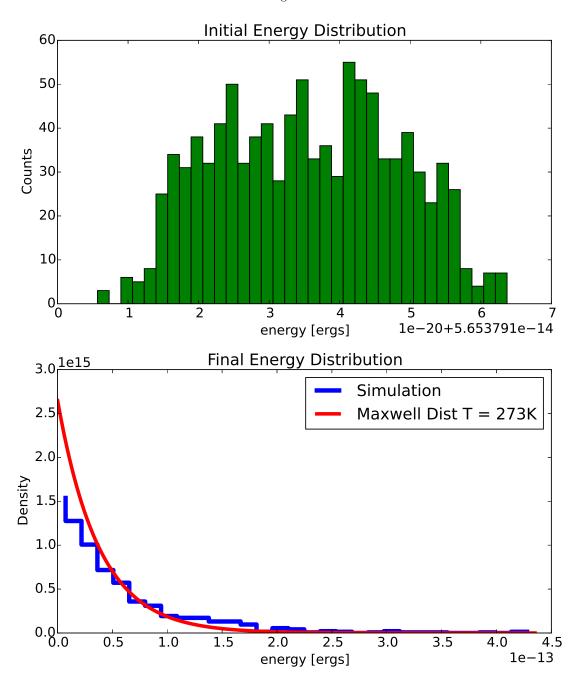


FIGURE 3. Simulated energy distribution compared with theory.

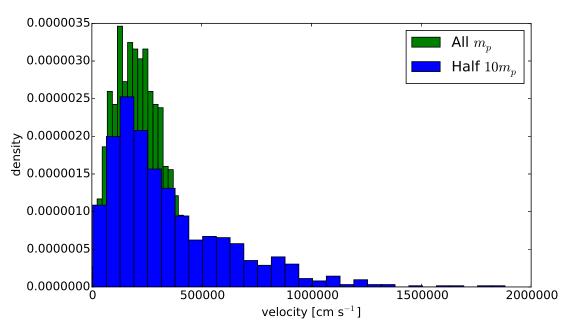


FIGURE 4. Comparison of the velocity distributions for all particle masses being  $m_p$  (green) and for half being  $10m_p$  (blue).

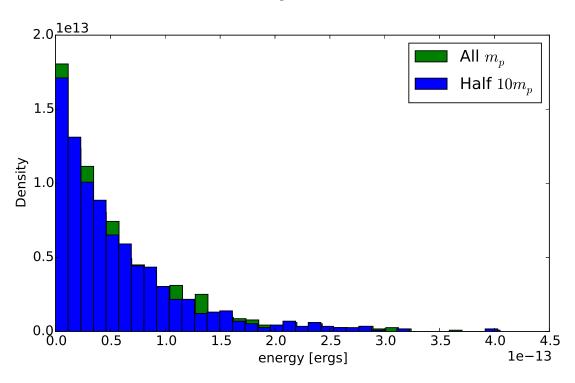


FIGURE 5. Comparison of the energy distributions for all particle masses being  $m_p$  (green) and for half being  $10m_p$  (blue).

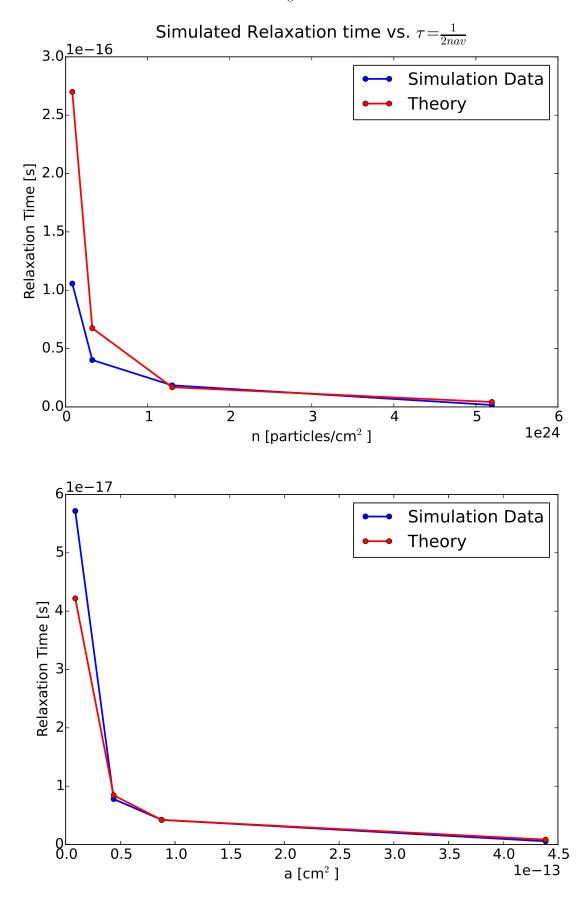


FIGURE 6. Comparison of numerical and theoretical relaxation times.

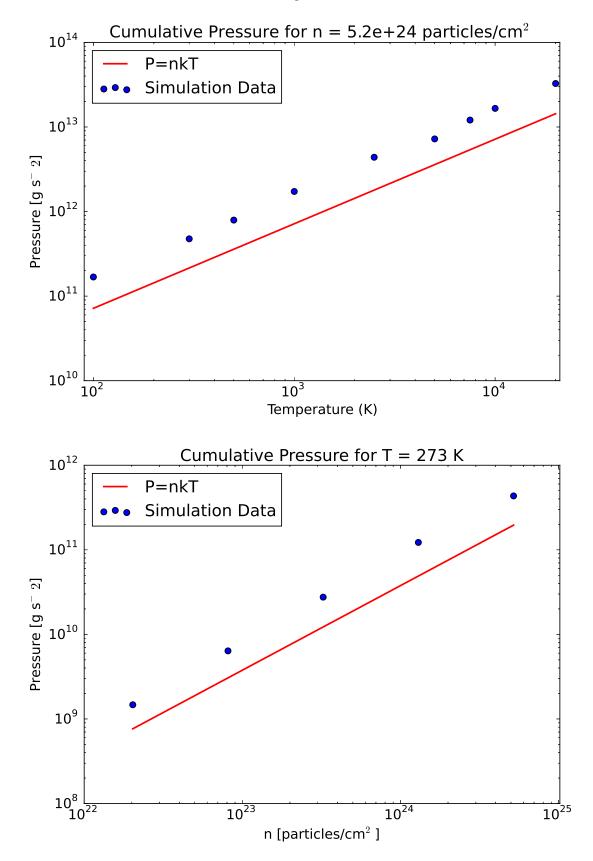


FIGURE 7. Comparison of simulation results with the Ideal Gas Law.