studies

March 3, 2022

0.1 Plasma Studies

We perform various studies on the plasma system using the simulation.

```
[1]: import import_ipynb
    from run import Run
    from constants import Constants
    import numpy as np

importing Jupyter notebook from run.ipynb
    importing Jupyter notebook from batch.ipynb
    importing Jupyter notebook from particle.ipynb
    importing Jupyter notebook from field.ipynb
    importing Jupyter notebook from constants.ipynb

[2]: constants = Constants()
```

0.1.1 Section 1: Checks

[4]:

Before we can do any studies confidently, we need to know if our program works as we expect it to; or wheather there might be bugs causing some erros. For this we perform a few checks, comparing calculations done by hand against the results of the program.

As of now, we can check if the particle sampling and particle update is performed as expected.

- []:
 - 1.1 Sampling So far we have used the Maxwellian distribution for sampling.
 - 1.1.1 Maxwellian sampling For a Maxwellian distribution, we can calculate the average speeds of the particles based on the input parameters like the Plasma temperature and the mass of the species (assuming the same types of species for now). Here we get the average speeds of the sampled particles; which we will compare with a manual calculation.

```
[3]: # c1Maxwell means checking the Maxwellian sampling c1Maxwell = Run()
```

```
# Create 100 particles based on the data available in the files
    c1Maxwell.create_batch_with_file_initialization('H+', constants.

constants['e'][0],\

                                            constants.constants['m_H'][0] *_
     100, 100, 'H ions', r_index=0,__
     \rightarrowv_index=1)
[5]: # Take the Oth batch of particles
    c1Maxwell_batch = c1Maxwell.batches[0]['H ions']
[6]: # Take the initial positions and velocities of the particles
    c1Maxwell_positions = []
    c1Maxwell_velocities = []
    for particle in c1Maxwell_batch.particles:
        c1Maxwell positions.append(particle.r)
        c1Maxwell_velocities.append(particle.v)
[7]: # Let's look at the positions
    c1Maxwell_positions
    # They look fine, all particles are supposed to be initialized at [-0.5, 0, 0]
    # where a cube of sides 1m is assumed as the chamber and is described between \Box
     \rightarrow coordinates (-0.5, 0.5) for x, y and z coordinates
[7]: [array([-0.5, 0., 0.]),
     array([-0.5, 0., 0.]),
```

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0.,
array([-0.5,
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array([-0.5, 0., 0.]),
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     array([-0.5, 0.,
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     array([-0.5, 0.,
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     array([-0.5, 0.,
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     array([-0.5,
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                        0.]),
     array([-0.5, 0.,
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                        0.]),
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     array([-0.5, 0.,
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     array([-0.5, 0.,
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     array([-0.5,
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     array([-0.5, 0.,
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     array([-0.5, 0.,
     array([-0.5, 0.,
                        0.]),
     array([-0.5, 0.,
                        0.]),
     array([-0.5, 0.,
                        0.]),
     array([-0.5, 0.,
                        0.]),
     array([-0.5, 0., 0.]),
     array([-0.5, 0.,
                        0.]),
     array([-0.5, 0.,
                        0.]),
     array([-0.5, 0., 0.]),
     array([-0.5, 0., 0.])]
[8]: # Let's now look at the velocities
    c1Maxwell velocities
    # We need to check if they are really Maxwellian distributed
[8]: [array([ 1579.629935, -5723.201089, -2863.641674]),
     array([ 897.689953, -5029.491038, -3292.544752]),
     array([ 386.944504, 1027.791639, 756.037653]),
     array([-9204.054924, 9615.130475, -1667.435373]),
     array([ -3641.215516, -10947.299598, -3360.247147]),
     array([-5491.759943, -7127.660213, 2834.606515]),
     array([16625.53181 , 7261.248008, 13182.501854]),
     array([ 3531.057922, -8670.854777, 5576.898277]),
     array([-6468.761439, -1081.00466 , 17040.23406 ]),
     array([-6782.695867, -1185.527177, 5481.859317]),
     array([ 2831.836461, 9814.523398, -4603.758126]),
     array([ 6601.297764, -5010.938691, 3131.004259]),
```

```
arrav([
         310.863591, -1253.75245, -11537.549212]),
array([17607.190221, 10702.738406, 10743.593831]),
array([ 1841.536055, -2739.779189, -12083.999033]),
array([ 4245.610812, 11143.159359, -4244.35843 ]),
array([ 6175.85488 , -5538.932063, -2785.536498]),
array([-18786.399666, -6481.17661,
                                      8700.805047]),
array([ -2630.875393, -12784.228172,
                                      5763.276336]),
array([14103.980493, -5259.190381, 11294.072721]),
array([3218.123565, 2083.965365, 3701.724523]),
array([ 8110.7652 , 1611.055445, -10797.61461 ]),
array([ -5795.493516, -6048.466929, -16270.769749]),
                                      1557.429411]),
array([ -5497.184733, -12480.106514,
array([-13982.702604,
                       4446.07858 ,
                                      8748.309843]),
array([ 6562.348371, 2376.507555, 16756.176696]),
array([ 1564.595443, 4923.296004, -1502.965034]),
array([ 3999.538647, 5265.782508, 20981.06687 ]),
array([2167.907498, 4715.441563, -383.229814]),
array([-8141.437181, -707.79037, 18484.123017]),
array([ 4328.135274, -2726.982622, -17110.480553]),
array([14064.293936, 1939.197086, 8497.465692]),
array([ 15755.484194, 1021.183689, -10923.123019]),
array([-4505.746111, -10715.356198, -4957.862115]),
array([ 311.037312, 10372.211689, -7924.10112]),
        194.746288, -16705.966313, -25158.665103]),
array([3917.707815, 2788.029633, 3845.298211]),
array([-6805.073646, -114.745473, -2991.933822]),
                       1204.886391,
array([-20778.676767,
                                      1224.16076 ]),
array([-1049.374644, 25399.499396, 3260.046569]),
array([-1613.853665, 11450.244641, 6833.552532]),
array([-4450.714515, 15520.095122, -4093.634965]),
array([ -302.040006, -2774.294494, 8039.097495]),
array([ 837.443914, 19004.422265, -3366.240414]),
array([-18089.011037, -3702.184851,
                                       973.063181]),
array([ 1290.989261, -6265.270624, -6101.462157]),
array([ 627.872857, 7529.794087, -9586.239895]),
array([-15877.458159, -1685.890055,
                                      2469.728849]),
         401.980725, 4648.362411, -22877.706831]),
array([
array([ 13391.765702, -13467.286656, -5302.578527]),
array([ 4424.274293,
                       1718.322218, -10218.543702]),
array([-16491.662572, -1376.577214,
                                      1212.84242 ]),
array([ 7398.623459, 12996.316882, -9925.234194]),
array([-5142.450136, -4269.804713, 9158.1664]),
array([ 2574.281443, 12535.307273, 1430.257433]),
array([ 9149.705078, -16458.827279,
                                      3392.746971]),
array([-7809.646458, -9975.384339, 6515.163693]),
array([ 3364.849961, 9514.632099, 10146.688711]),
array([11034.368466, 2228.723503, 10336.824708]),
```

```
array([ 3592.570787, 9359.729427, -15987.66503]),
     array([-9948.531042, 8687.897191, -1985.537473]),
     array([-21346.36499 ,
                              315.575762, -4095.710895]),
     array([8745.421099, 1817.124211, -202.137507]),
     array([-4503.432576, 5444.488763, -4660.01537]),
     array([22320.899741, -285.109853, 10270.464622]),
     array([11379.305971, 5524.826899, 3963.333405]),
     array([-4991.704923, -3821.720667, 2668.679899]),
     array([-1864.217875, -1091.525555, -5304.013859]),
     array([-11280.765472, 14952.883947,
                                            6873.951826]),
     array([ 7157.964588, 10566.45093, -10696.666068]),
     array([-5803.460516, 174.639384, 7935.079774]),
     array([-7054.045335, 4371.138014, 14677.551923]),
     array([6675.742123, 2086.149166, 2812.089298]),
     array([ 1629.343137, 12814.296519, -1575.882811]),
     array([ 1372.398103, 6908.124601, -11080.46534]),
     array([ 4077.427095, 9806.823708, -2952.864354]),
     array([20687.74124 , 10234.694055, 4265.535278]),
     array([-1161.868381, -9148.174165, -5257.7664]),
     array([ -9429.693013,
                            4349.497355, -17731.864223]),
     array([ 4360.301531, -2415.241844, -9765.025732]),
     array([12484.9937 , -5046.17275 , 2094.336482]),
     array([ 920.001379, -2826.506275, -6130.965348]),
     array([ 7977.635576, -14613.882278, -7575.019106]),
     array([ 2208.036015, -9531.481613, 5584.708069]),
     array([ -92.825592, 4472.404515, -2098.645854]),
     array([ -2929.734057, -12483.318971,
                                           -383.726147]),
     array([7781.299771, 7546.658659, -7793.261556]),
     array([ 4995.961777, -9268.285396, 8484.176491]),
     array([11248.219314, 8449.902291, 10343.354335]),
     array([ -9901.37255 , -1143.945737, -11700.414233]),
     array([ 1499.538688, -10332.224092,
                                          1408.641439]),
     array([17961.404303, 15944.610445, 3105.683781]),
     array([17084.296062, -2164.739467, -2088.521291]),
     array([-11764.890976, -4225.774814, 7203.046946]),
     array([ -4983.672944,
                             2659.037113, -14658.970414]),
     array([-2639.873802, -7685.606637, 5666.133006]),
     array([ -3893.19326 , -10739.510159, 12748.028668]),
     array([3349.164108, 527.511892, 1366.528714]),
     array([-11336.739018, 13658.143203, 13176.412033]),
     array([ -765.772707, -3802.623207, -10641.798323])]
[9]: # Get the speeds
    c1Maxwell_speeds = np.sqrt( \
                               [ (c1Maxwell_velocities[i][0] ** 2) +

→ (c1Maxwell_velocities[i][1] ** 2) + \
```

```
(c1Maxwell_velocities[i][2] ** 2) for i in_
       →range(len(c1Maxwell_velocities)) ] )
[10]: c1Maxwell speeds
[10]: array([ 6591.7148811 , 6078.03243632, 1333.29465428, 13414.38413862,
             12016.36716363, 9433.87309001, 22425.70814333, 10897.42570538,
             18258.77932528, 8801.20556986, 11204.40788951, 8859.44842548,
             11609.63277617, 23237.61100611, 12526.79838091, 12657.40060792,
             8751.00939772, 21694.20362969, 14267.91328164, 18818.53947143,
             5329.35224641, 13600.31224062, 18300.5367547, 13725.80361799,
             17082.63773428, 18151.62972763, 5380.12140539, 21998.40771087,
             5204.04430653, 20210.06606342, 17858.82789898, 16546.05005563,
             19198.76857515, 12637.28622839, 13056.45043995, 30200.75605565,
             6156.93609596, 7434.63932187, 20849.54985051, 25629.35153965,
             13431.68143601, 16656.53203751, 8509.70191245, 19318.40967731,
             18489.60099412, 8840.1419512 , 12206.06483031, 16156.59195053,
             23348.62590073, 19718.63427135, 11267.00801696, 16593.39886673,
             17948.653303 , 11337.90269399, 12876.58688088, 19134.28416282,
             14245.91971255, 14311.0352888 , 15283.1423778 , 18871.05012758,
             13356.46609518, 21738.0250732, 8934.49439917, 8463.98878223,
             24572.06333273, 13255.9544479, 6829.67929688, 5727.06725464,
             19952.33374001, 16652.47751145, 9832.40275289, 16861.10712789,
             7538.26223048, 13013.23791256, 13129.44683553, 11023.54801541,
             23471.82121652, 10615.23133073, 20548.87457705, 10963.63763323,
             13628.10230413, 6813.53625941, 18291.77790908, 11265.59048601,
             4941.18742377, 12828.24383664, 13350.49095434, 13521.908112 ,
             17461.62264403, 15370.27922475, 10535.07198209, 24217.51264119,
             17347.08015999, 14427.53332216, 15709.64315252, 9906.69199637,
             17117.42583262, 3655.48488503, 22106.20639955, 11326.7039619 ])
[11]: c1Maxwell_meanspeed = np.sum(c1Maxwell_speeds) / c1Maxwell_speeds.size
      c1Maxwell_meanspeed
[11]: 14202.764572898674
[12]: c1Maxwell_meanspeed_expected = (2 / np.sqrt(np.pi) ) * np.sqrt( (2 * constants.
      →constants['K'][0] * constants.constants['N_A'][0] * 10000)/ ( constants.
      \rightarrowconstants['m H'][0] * 10**(-3)))
      c1Maxwell_meanspeed_expected
[12]: 14492.952993825973
[41]: (c1Maxwell_meanspeed_expected - c1Maxwell_meanspeed) * 100/ c1Maxwell_meanspeed
      # We see a maximum of 2.04 % discrepency
[41]: 2.0431826454479785
```

We see that the numbers are close We were using Hydrogen atom samples. from the second (1th) available velocity sampled file. Now let's use Hydrogen gas samples, from the third (2nd) available velocity sampled file; to see if the numbers are still close.

```
available velocity sampled file; to see if the numbers are still close.

[13]: # Create 100 particles based on the sampled velocities of H2 gas

# We consider just for this test case that a Hydrogen molecule is a particle of the plasma

# We create a new batch on the same Run instance

c1Maxwell.create_batch_with_file_initialization('H2', constants.

constants['e'][0],\

2 * constants.constants['m_H'][0] *_U

constants.constants['amu'][0], \

100, 100, 'H2 gas', r_index=0,_U

c1Maxwell_batch2 = c1Maxwell_batches[1]['H2 gas']

c1Maxwell_positions_batch2 = []

c1Maxwell_velocities_batch2 = []
```

[38]: 10149.754879907316

[39]: 10248.06534135222

```
[42]: (c1Maxwell_meanspeed_expected_batch2 - c1Maxwell_meanspeed_batch2) * 100/

→c1Maxwell_meanspeed_batch2

# We see a maximum of 0.97% discrepency
```

[42]: 0.9685993662716086

Again we see that the numbers are close enough For a sample of large enough number of particles, we would expect the match to be better. However, for now we take this as an indication that our program is working as we expect it to.

```
[]:
```

- 1.2 Update Here we check if our particle update works as expected.
- 1.2.1 Boris Update So far we use the Boris Algorithm to update individual particles in the Electric and Magnetic fields, here we set up a simple configuration, and observe the result of update of a single particle. We compare it to calculations done by hand.

```
[14]: # c2Boris means checking the Boris update c2Boris = Run()
```

```
[17]: c2Boris_positions_and_velocities = c2Boris.

→update_batch_with_unchanging_fields(c2Boris_index_update, \

→c2Boris_dT, c2Boris_stepT, \

→c2Boris_argsE, c2Boris_argsB, \

→c2Boris_particle_track_indices)
```

```
[18]: #Let's inspect the positions and velocities of the particles at index 1 and 7
      c2Boris_p1 = c2Boris_positions_and_velocities[1]
      c2Boris_p7 = c2Boris_positions_and_velocities[7]
[19]: #Let's look at particle 1's positions and velocities
      c2Boris_p1
[19]: [(0,
       array([-4.98921519e-01, -5.02949104e-04, -2.74850639e-04]),
        array([10784.80849437, -5029.491038 , -2748.50639353])),
       (1,
       array([-4.96859534e-01, -1.00589821e-03, -4.00658364e-04]),
        array([20619.85191499, -5029.491038 , -1258.07724484])),
       (2,
       array([-4.93828311e-01, -1.50884731e-03, -2.83282555e-04]),
       array([30312.2320901 , -5029.491038 , 1173.75808561])),
       (3,
       array([-4.89851127e-01, -2.01179642e-03, 1.70051838e-04]),
       array([39771.83801957, -5029.491038 , 4533.34393251])),
       array([-0.48496014, -0.00251475, 0.00104989]),
        array([48909.86581774, -5029.491038 , 8798.39924387])),
       array([-0.47919618, -0.00301769, 0.00244371]),
       array([57639.6443318 , -5029.491038 , 13938.14269746])),
        array([-0.47260843, -0.00352064, 0.00443506]),
        array([65877.44878403, -5029.491038 , 19913.49684507])),
       (7,
       array([-0.4652541 , -0.00402359, 0.00710279]),
       array([73543.29487349, -5029.491038 , 26677.37013834])),
        array([-0.45719793, -0.00452654, 0.01052029]),
        array([80561.70588222, -5029.491038 , 34175.01496554])),
        array([-0.44851169, -0.00502949, 0.01475474]),
       array([86862.44551045, -5029.491038 , 42344.45911554]))]
[20]: #Let's take the positions and velocities of the particle 1 after the 3rd and
      \rightarrow the 4th time steps.
      c2Boris p134 p = [c2Boris p1[3][1], c2Boris p1[4][1]]
      c2Boris_p134_v = [c2Boris_p1[3][2], c2Boris_p1[4][2]]
[21]: #Likewise for particle 7
      c2Boris p734 p = [c2Boris p1[3][1], c2Boris p1[4][1]]
      c2Boris_p734_v = [c2Boris_p1[3][2], c2Boris_p1[4][2]]
```

```
[22]: #Let's look at the positions to check if they match up against the positions
       \rightarrow and velocities from above
      c2Boris_p134_p
[22]: [array([-4.89851127e-01, -2.01179642e-03, 1.70051838e-04]),
       array([-0.48496014, -0.00251475, 0.00104989])]
[23]: #Let's look at the velocities to check if they match up against the positions_
       \rightarrow and velocities from above
      c2Boris_p134_v
[23]: [array([39771.83801957, -5029.491038 , 4533.34393251]),
       array([48909.86581774, -5029.491038 , 8798.39924387])]
[24]: print(f'The velocity changed from \n {[c2Boris p134 v[0][0],
       \hookrightarrowc2Boris_p134_v[0][1], c2Boris_p134_v[0][2]]} \n to \n_\[
       →{[c2Boris_p134_v[1][0], c2Boris_p134_v[1][1], c2Boris_p134_v[1][2]]} \n')
      print(f'The position changed from \n {[c2Boris_p134_p[0][0],__
       \hookrightarrow c2Boris_p134_p[0][1], c2Boris_p134_p[0][2]]} \n to \n_\(
       →{[c2Boris_p134_p[1][0], c2Boris_p134_p[1][1], c2Boris_p134_p[1][2]]} \n')
     The velocity changed from
      [39771.83801956555, -5029.491038, 4533.343932509505]
      [48909.86581773698, -5029.491038, 8798.399243869582]
     The position changed from
      [-0.48985112694809785, -0.0020117964152, 0.00017005183797547688]
      [-0.4849601403663242, -0.0025147455189999997, 0.001049891762362435]
[25]: #Similary for particle 7
      c2Boris_p734_p = [c2Boris_p7[3][1], c2Boris_p7[4][1]]
      c2Boris p734 v = [c2Boris p7[3][2], c2Boris p7[4][2]]
      print(f'The velocity changed from \n {[c2Boris_p734_v[0][0],
       \hookrightarrow c2Boris_p734_v[0][1], c2Boris_p734_v[0][2]]} \n to \n_\(
       →{[c2Boris_p734_v[1][0], c2Boris_p734_v[1][1], c2Boris_p734_v[1][2]]} \n')
      print(f'The position changed from \n {[c2Boris p734 p[0][0],__
       \rightarrowc2Boris_p734_p[0][1], c2Boris_p734_p[0][2]]} \n to \n_\[
       →{[c2Boris_p734_p[1][0], c2Boris_p734_p[1][1], c2Boris_p734_p[1][2]]} \n')
     The velocity changed from
      [38895.85871094631, -8670.854777, 13914.969423620274]
      [47135.881299118584, -8670.854777, 18096.176367366777]
```

```
The position changed from
      [-0.4896669752432719, -0.0034683419108, 0.0038875496903932644]
      [-0.48495338711336006, -0.0043354273885, 0.0056971673271299424]
[26]: c2Boris_qp = (constants.constants['e'][0] * 10**(-7)) / (2 * constants.
      [27]: c2Boris_qp
[27]: 4.78597877761177
[28]: # The velocity after update 4, doing a manual update.
     c2Boris_vminus_p1 = np.add(c2Boris_p134_v[0], c2Boris_qp * np.
      →array(c2Boris_argsE))
     c2Boris_vplus_p1 = np.add(c2Boris_vminus_p1, 2 * c2Boris_qp * np.
      c2Boris_vnew_p1 = np.add(c2Boris_vplus_p1, c2Boris_qp * np.array(c2Boris_argsE))
[29]: c2Boris_vnew_p1
     #This is indeed the same as the velocity of particle 1 after update 4.
     np.isclose(c2Boris_vnew_p1, c2Boris_p134_v[1]) #Indeed the values are close (i.
      \rightarrowe. the same)
[29]: array([ True, True, True])
[30]: #Similarly for position of the particle 1 after update 4
     c2Boris_pnew_p1 = np.add(c2Boris_p134_p[0], c2Boris_stepT * c2Boris_vnew_p1)
[31]: c2Boris_pnew_p1
     #This is indeed the same as the position of particle 1 after update 4.
     np.isclose(c2Boris_pnew_p1, c2Boris_p134_p[1]) #Indeed th values are close (i.e.
      → the same)
[31]: array([ True, True, True])
[32]: c2Boris_p134_p[0]
[32]: array([-4.89851127e-01, -2.01179642e-03, 1.70051838e-04])
[33]: c2Boris_p134_v[0]
[33]: array([39771.83801957, -5029.491038 , 4533.34393251])
[]:
```