

# Monte Carlo Methods - Fall 2017/18

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## Exercise Nr. 7

Discussion on December 18th, 14:00-15:00

### 19) Hard Sphere Markov Chain Sampling (10 points)

Migrate the direct sampling algorithm to the Markov chain sampling algorithm and find a good value for  $\delta$  such that you can access larger densities.

### 20) Maxwell Distribution (4 points)

From the Maxwell distribution for one velocity coordinate,

$$\pi(v_x) = \frac{1}{\sqrt{2\pi}\sigma} \exp\left(-\frac{v_x^2}{2\sigma^2}\right), \quad \sigma = \sqrt{\frac{2}{m} \frac{E_{\text{kin}}}{dN}},$$

determine the corresponding distribution  $\pi(v)$ , with  $v = |\vec{v}|$ , for arbitrary dimension  $d$ .

### 21) Hydrodynamic aspects of hard spheres (6 points)

Express the mean square displacement

$$\frac{1}{t} \langle (\vec{x}(t) - \vec{x}(0))^2 \rangle$$

in terms of the velocity autocorrelation function

$$C_{\vec{v}}(\tau) = \langle \vec{v}(0) \cdot \vec{v}(\tau) \rangle.$$

The diffusion constant  $D$  is defined to be

$$\lim_{t \rightarrow \infty} \frac{1}{t} \langle (\vec{x}(t) - \vec{x}(0))^2 \rangle = 2D.$$

which is sensible for exponential decay (explain why). For the hard spheres in  $d$  dimensions, however,

$$C_{\vec{v}}(\tau) \propto \frac{1}{\tau^{d/2}}.$$

Discuss whether diffusion is possible in  $d$  dimensions, and why there is no time scale in a molecular dynamics simulation of hard spheres.

## James Clerk Maxwell

(13 June 1831 - 5 November 1879)

Scottish mathematician and physicist who published physical and mathematical theories of the electromagnetic field. When he first became interested in electricity, he wrote Kelvin asking how best to proceed. Kelvin recommended that Maxwell read the published works in the order Faraday, Kelvin, Ampère, and then the German physicists. Maxwell wanted to present electricity in its most simple form. He started out by writing a paper entitled “On Faraday’s Lines of Force” (1856), in which he translated Faraday’s theories into mathematical form, presenting the lines of force as imaginary tubes containing an incompressible fluid. He then published “On Physical Lines of Force” (1861) in which he treated the lines of force as real entities, based on the movement of iron filings in a magnetic field and using the analogy of an idle wheel. He also presented a derivation that light consists of transverse undulations of the same medium which is the cause of electric and magnetic phenomena. Finally, he published a purely mathematical theory in “On a Dynamical Theory of the Electromagnetic Field” (1865).



Maxwell’s formulation of electricity and magnetism was published in *A Treatise on Electricity and Magnetism* (1873), which included the formulas today known as the Maxwell equations. Maxwell also showed that these equations implicitly required the existence of electromagnetic waves traveling at the speed of light. He also proposed a physical theory of ether. He abandoned attempts to formulate a specific mechanical model, instead using the formalism of Lagrangian mechanics.

With Clausius, he developed the kinetic theory of gases. In “*Illustrations of the Dynamical Theory of Gases*” (1860), he showed the velocity distribution of molecules was “Maxwellian.” His studies of kinetic theory led him to propose the Maxwell’s demon paradox in a 1867 letter to Tait. Maxwell’s demon (termed a “finite being” by Maxwell) is a tiny hypothetical creature that can see individual molecules. He can make heat flow from a cold body to a hot one by opening a door whenever a molecule with above average kinetic energy approaches from the cold body, or below average kinetic energy approaches from the hot body, then quickly closing it. This process appears to violate the second law of thermodynamics, but was used by Maxwell to show that the second law of thermodynamics is a statistical law describing the properties of a large number of particles. Maxwell also observed in private correspondence that the time reversal of all events was consistent with the laws of dynamics, but inconsistent with the Second Law of Thermodynamics. Maxwell published his views on the limitations of the Second Law in *Theory of Heat* (1871).

Maxwell made numerous other contributions to the advancement of science. He argued that the rings of Saturn were small individual particles, performed experiments which showed the viscosity varied directly with temperature, derived the equipartition theorem, and tried to describe spectral lines using a vibrational model.

[from: <http://scienceworld.wolfram.com/biography/Maxwell.html>]