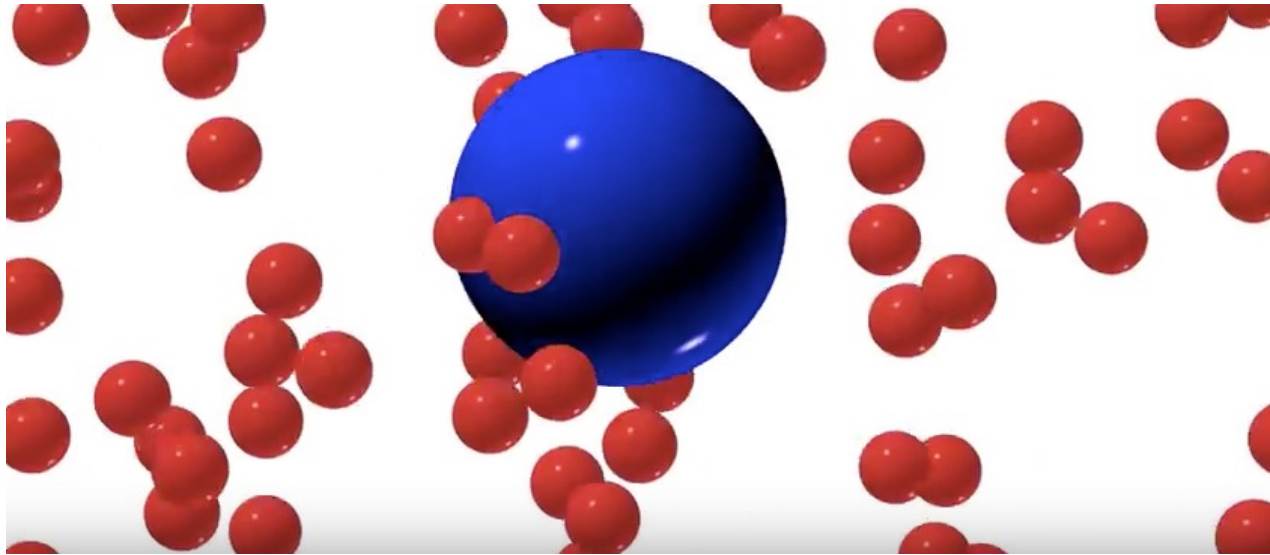


# The Physics of Energy

Luca Gammaitoni

Corso di Laurea in Fisica

# Brownian motion



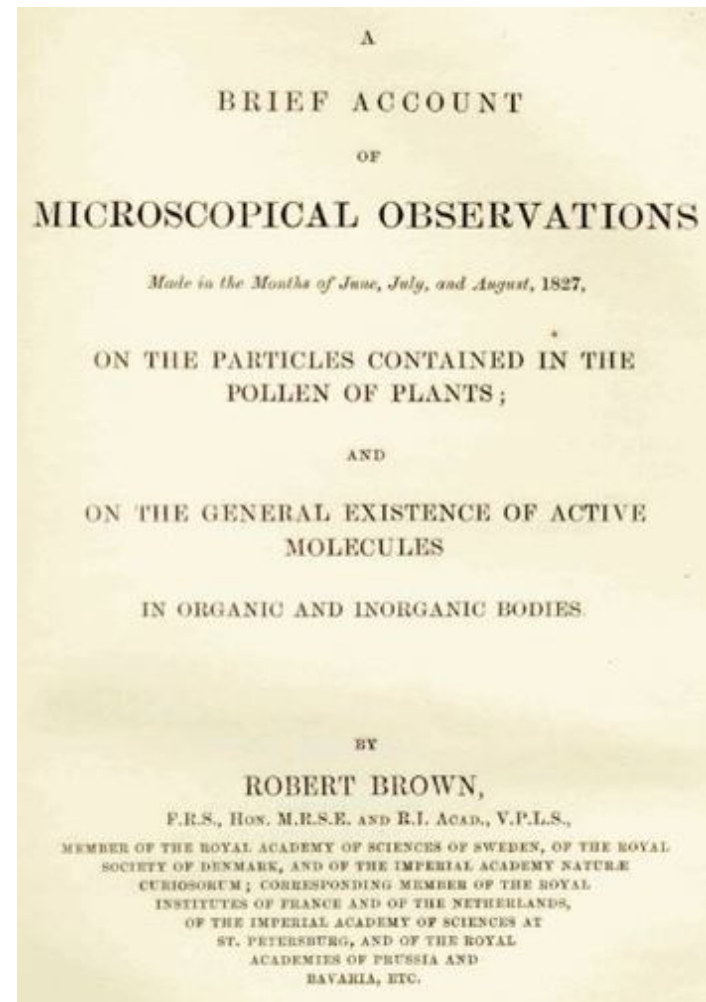
Per la fenomenologia, vedere: <https://www.youtube.com/watch?v=cVkRnEpbeal>  
<https://www.youtube.com/watch?v=R4t32aGtO3c>

# Robert Brown

(Montrose, 21 dicembre 1773 – Londra, 10 giugno 1858)



Jan Ingenhousz described the irregular motion of coal dust particles on the surface of alcohol in 1785. However, the discovery of this phenomenon is often credited to the botanist Robert Brown in 1827.



# Sviluppi

. . . il moto browniano ci fornisce una delle più belle e dirette dimostrazioni sperimentali dei fondamentali principi della teoria meccanica del calore, manifestando quell'assiduo stato vibratorio che esser deve e nei liquidi e nei solidi ancor quando non si muta in essi la temperatura.

Giovanni Cantoni

*(Su alcune condizioni fisiche dell'affinità, e sul moto browniano, in Rendiconti del Regio istituto lombardo di scienze e lettere, s. 2, I (1868), pp. 56-57)*

## I protagonisti



Albert Einstein  
(1879 - 1955)



Marian Smoluchowski  
(1872 - 1917)



Paul Langevin  
(1872 - 1946)



Jean Baptiste Perrin  
(1870 - 1942)



# Timeline

J. Ingenhousz 1795

R. Brown 1827

A. Einstein 1905

M. Smoluchowski 1906

J. Perrin 1908

P. Langevin 1908

## Moto Browniano

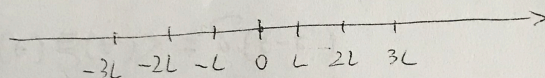
1

Robert Brown 1827 (J. Ingenhousz 1785)

A. Einstein 1905 - H. Smoluchowski (1906)

### Analogie con il modello RANDOM WALK

- Considero il random walk semplice:
- 1 dimensione
  - passi di uguale ampiezza  $L$
  - 50% proba di andare  $+L$  e  $-L$



Domande: - dove si trova in media dopo  $n$  passi?  $\langle x_n \rangle = 0$

- quanto si allontana in media  $\langle x_n^2 \rangle$ ?  $\langle x_n^2 \rangle = nL^2$   
(la varianza delle distanze  $\sigma_{x_n}^2$ )

$$\begin{aligned} x_n &= x_{n-1} \pm L \quad \Rightarrow \quad \langle x_n^2 \rangle = \langle (x_{n-1} \pm L)^2 \rangle = \\ &= \langle x_{n-1}^2 + L^2 \pm 2x_{n-1}L \rangle = \\ &= \langle x_{n-1}^2 \rangle + L^2 \pm \underbrace{\langle x_{n-1} \rangle}_{=0} L = \\ &= \langle x_{n-1}^2 \rangle + L^2 \end{aligned}$$

$$\begin{aligned} \text{Ora se } n=1 \text{ e } x_0=0 \text{ si ha } \langle x_1^2 \rangle &= 0 + L^2 = L^2 \\ \langle x_2^2 \rangle &= \langle x_1^2 \rangle + L^2 = 2L^2 \\ &\vdots \\ \langle x_n^2 \rangle &= nL^2 \end{aligned}$$

Ovvero la varianza cresce con  $t$



2  
Tomano ora il problema del moto Browniano: particelle  
di massa  $m$  immerse nel liquido.

Seguiranno le derivazioni dovuta a Langevin (per non far  
sempre di quello di Einstein).

Equazione del moto di <sup>Newton</sup> ~~Einstein~~ (1 dim)

$$(1) \quad m \ddot{x} = f \quad f = -\gamma \dot{x} + \xi(t)$$

$$\langle \xi(t) \rangle = 0$$

$$\langle \xi(t) \xi(t') \rangle = \delta(t-t')$$

$$\gamma = 6\pi\eta r$$

legge di Stokes  
regno dello sferra  
coefficiente di viscosità

↑  
forza di attrito  
viscoso  
↑  
forza fluttuante

la (1) diventa

$$m \ddot{x} = -\gamma \dot{x} + \xi(t)$$

Moltiplico tutto per  $x$

$$(2) \quad m x \ddot{x} = -\gamma x \dot{x} + x \xi(t)$$

osservo che  ~~$\frac{d}{dt} x^2$~~   $\frac{d}{dt} x^2 = 2x \dot{x}$

quindi  $\frac{d^2}{dt^2} x^2 = \frac{d}{dt} (2x \dot{x}) = 2x \ddot{x} + 2\dot{x}^2$



da cui  $x\ddot{x} = \frac{1}{2} \frac{d^2}{dt^2} x^2 - \dot{x}^2$  e  $x\dot{x} = \frac{1}{2} \frac{d}{dt} x^2$

soluzione delle (1)

$$\frac{m}{2} \frac{d^2}{dt^2} x^2 - m \dot{x}^2 = -\gamma \frac{1}{2} \frac{d}{dt} x^2 + x \xi(t)$$

prendo il valore medio ~~che~~ (integrale e media canonica)

$$\frac{m}{2} \frac{d^2}{dt^2} \langle x^2 \rangle - m \langle \dot{x}^2 \rangle = -\gamma \frac{1}{2} \frac{d}{dt} \langle x^2 \rangle + \langle x \xi(t) \rangle$$

ove  $\langle x \xi(t) \rangle = 0$  perché non correlati

$$\frac{1}{2} m \langle \dot{x}^2 \rangle = \frac{1}{2} kT \quad (\text{Equip dell'energy e})$$

ipotesi dell'eq. canonica

quindi

$$\frac{m}{2} \frac{d^2}{dt^2} \langle x^2 \rangle - kT = -\gamma \frac{1}{2} \frac{d}{dt} \langle x^2 \rangle$$

chiamo  $\alpha = \frac{d}{dt} \langle x^2 \rangle$

$$\frac{m}{2} \dot{\alpha} - kT + \gamma \frac{1}{2} \alpha = 0$$

$$\frac{1}{2} m \dot{\alpha} + \gamma \frac{1}{2} \alpha - kT = 0$$

$$\dot{\alpha} + \frac{\gamma}{m} \alpha - \frac{2kT}{m} = 0$$

Eq. differenziale lineare e  
Coeff. cost.



$$\ddot{x} + \frac{\gamma}{m} \dot{x} - \frac{2kT}{m} = 0$$

$$x = a + b e^{-ct}$$

$$\dot{x} = -b c e^{-ct}$$

substituendo  $-b c e^{-ct} + \frac{\gamma}{m} a + \frac{\gamma}{m} b e^{-ct} - \frac{2kT}{m} = 0$

il componente  $+\frac{\gamma}{m} a = \frac{2kT}{m} \Rightarrow a = \frac{2kT}{\gamma}$

$$c = \frac{\gamma}{m}$$

$b = \text{cost. qualunque}$   
perché vale  $ct=0$

quindi  $x = \frac{2kT}{\gamma} + C e^{-\frac{\gamma}{m}t}$   
 $\nwarrow$  transiente

dopo un tempo  $t_0$  (grande numero?)

$$x = \frac{2kT}{\gamma} \Rightarrow \dot{x} = \frac{d}{dt} \langle x^2 \rangle = \frac{2kT}{\gamma}$$

da cui  $\langle x^2 \rangle = \frac{2kT}{\gamma} t$   
 $\nwarrow$  Rem!

Nel caso tridimensionale

$$\langle x^2 \rangle = 3 \cdot 2 \frac{kT}{\gamma} t = \frac{6kT}{\gamma} t$$

Se sostituisco  $\gamma = 6\pi r \eta \Rightarrow \langle x^2 \rangle = \frac{kT}{\pi r \eta} t$  (Einstein)

To learn more:

**Probabilità in Fisica**

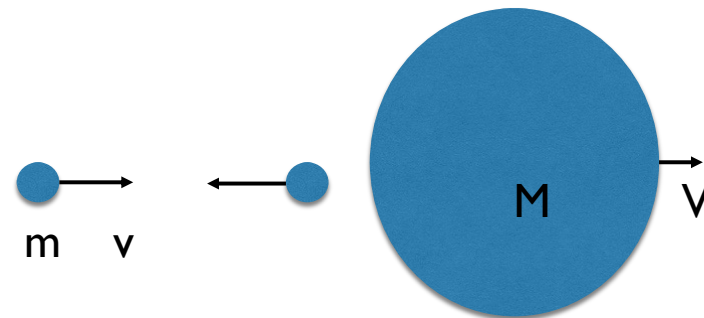
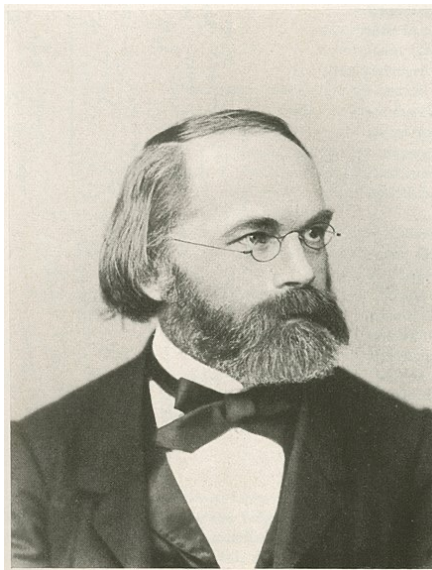
Guido Boffetta, Angelo Vulpiani

Chap. 4 Il moto Browniano: primo incontro con i processi stocastici

# Peculiarities in the treatment of stochastic processes: the Brownian motion misinterpreted

Before Einstein 1905 model of the Brownian motion, other attempts have been made, but the atomistic interpretation was erroneously discarded.

**1879** Carl Wilhelm von Nägeli (26 March 1817 – 10 May 1891) Swiss botanist



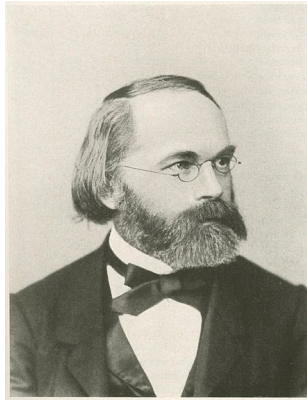
Momentum acquired by the pollen grain:  $M V = 2 m v$

$$V = 2 \frac{m}{M} v \quad \text{but} \quad \frac{m}{M} = \left(\frac{r}{R}\right)^3 = \left(\frac{5 \cdot 10^{-10}}{10^{-6}}\right)^3 \sim 10^{-10}$$

thus  $V \sim 10^{-10} v$  Due to the equipartition, we have  $v = \sqrt{3 \frac{KT}{m}} \sim 6 \cdot 10^2 \text{ m/s}$   
and thus  $V \sim 6 \cdot 10^{-8} \text{ m/s}$

This is roughly 2 orders of magnitude smaller than the observed velocity!

# The stochastic force is **not** the sum of independent kicks



On the base of a significant disagreement with the observations, von Nageli concluded that the kinetic theory model did not work.

The stochastic force is often **misrepresented** as the sum of independent kicks, half favourable, half unfavourable. This is not the case.

We should think at it as the results of a large number  $N$  kicks that happen in a very short time. The effectiveness of this force goes roughly as the  $\sqrt{N}$ , where  $N$  is the number of kicks per second.

This is the result of a «vision» that takes into account a time scale separation: fast (molecular motion) vs (slow) the pollen grain motion.



# Another common mistake: mind the observation time

If we calculate the standard deviation of the velocity of the pollen grain using the kinetic theory we have:

$$\frac{1}{2}M\langle V^2 \rangle = \frac{3}{2}KT \quad \text{which gives} \quad \sqrt{\langle V^2 \rangle} \sim 2 \cdot 10^{-3} \text{ m/s} \quad \text{orders of magnitude larger than the observed one.}$$

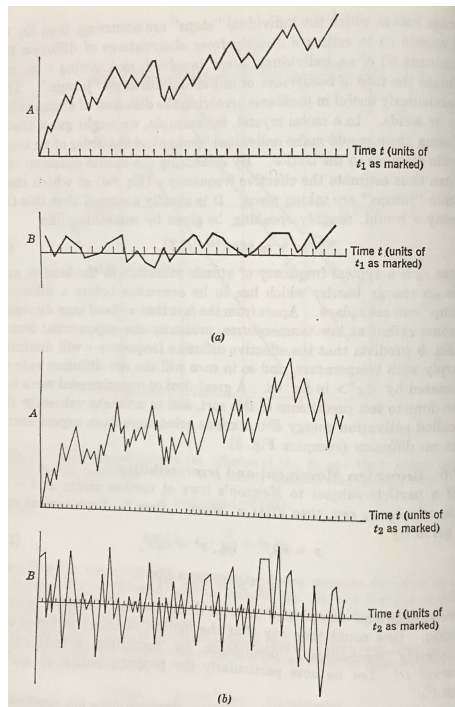
**Why ?**

Apparently the amplitude of the velocity in this process depends on the sampling time.

Why?

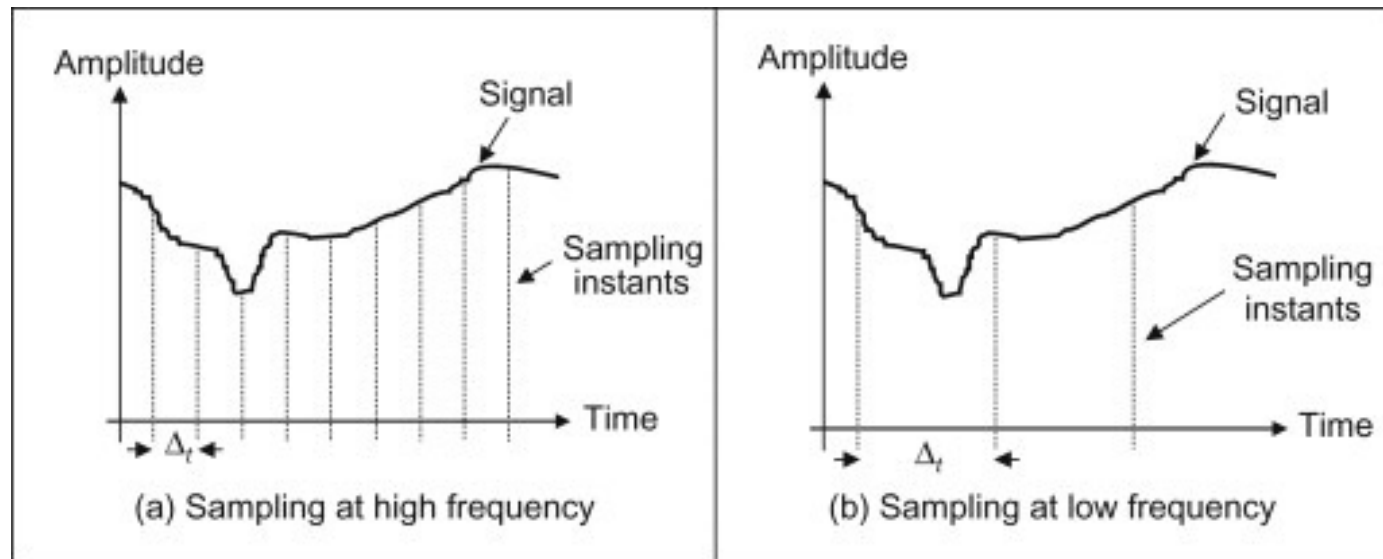
## The Nyquist–Shannon sampling theorem

Is a theorem in the field of digital signal processing which serves as a fundamental bridge between continuous-time signals and discrete-time signals. It establishes a sufficient condition for a sample rate that permits a discrete sequence of samples to capture all the information from a continuous-time signal of finite bandwidth.



# Time discretization

If we have a continuous signal  $x(t)$  we can represent it by means of a series of time discret samples, each separated by a time distance  $\Delta T$ :  $x(t_0 + i \Delta T)$  for  $i = 1 \dots n$ .



## The Nyquist–Shannon sampling theorem

If a function  $x(t)$  contains no frequencies higher than  $B$  hertz, it is completely determined by giving its ordinates at a series of points spaced  $1/(2B)$  seconds apart.

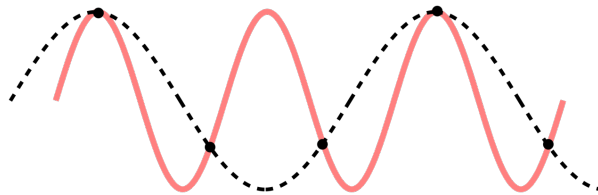
$$\Delta T < \frac{1}{2B}$$

From the sampled values we can reconstruct the continuous function as follows:

$$x(t) = \sum_{n=-\infty}^{\infty} x(nT) \cdot \text{sinc}\left(\frac{t - nT}{T}\right) \quad \text{with} \quad \text{sinc}(x) = \frac{\sin x}{x}$$

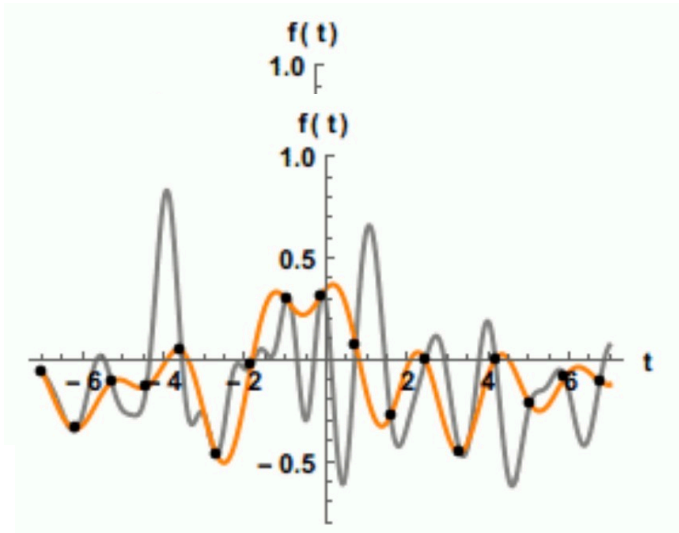
Whittaker–Shannon interpolation formula

If we do not respect the prescription of the Nyquist–Shannon sampling theorem, we have an error called **aliasing**.



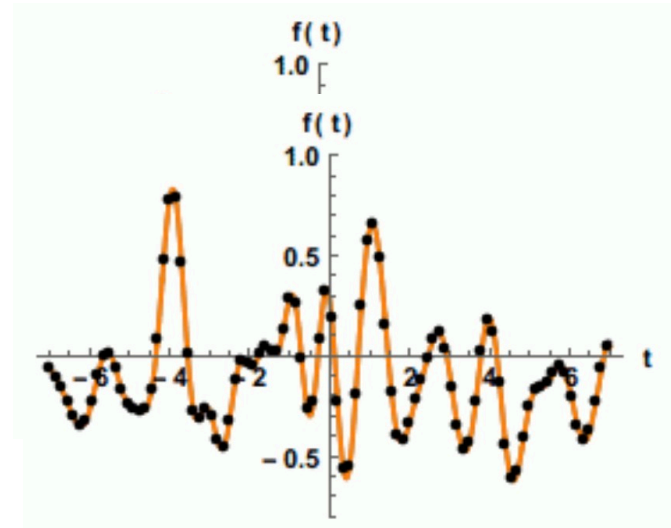
The reconstructed signal is different from the original one and, specifically has amplitude in lower frequency regions with respect to the original.

# Aliasing error



Undersampled signal

$$\Delta T > \frac{1}{2B}$$

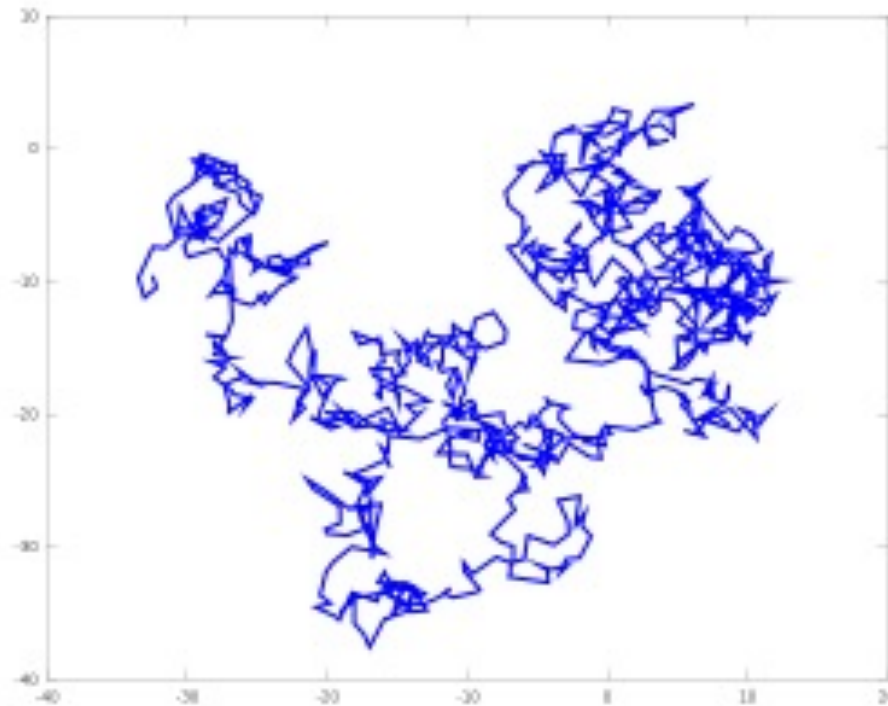


Properly sampled signal

$$\Delta T < \frac{1}{2B}$$

If we calculate the standard deviation of the velocity of the pollen grain using the kinetic theory we have:

$$\frac{1}{2}M\langle V^2 \rangle = \frac{3}{2}KT \quad \text{which gives } \sqrt{\langle V^2 \rangle} \sim 2 \cdot 10^{-3} \text{ m/s} \text{ orders of magnitude larger than the observed one.}$$



Rem: mind the sampling interval