

# Microscopic Chaos, Fractals and Transport in Nonequilibrium Statistical Mechanics

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Theory Colloquium, 25 May 2022



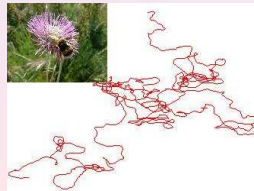
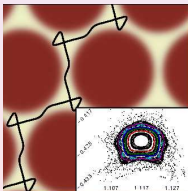
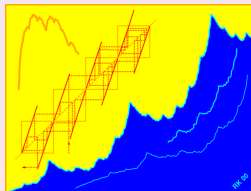
# Outline

- 1 **Motivation:** microscopic chaos and transport; Brownian motion, dissipation and thermalization
- 2 the **thermostated dynamical systems approach** to nonequilibrium steady states and its surprising (fractal) properties
- 3 **generalized Hamiltonian dynamics** and universalities?

# My scientific movements and research interests



my scientific foraging; and my food sources:



chaos, complexity and nonequilibrium statistical physics with applications to small systems and biology

# Why this topic?



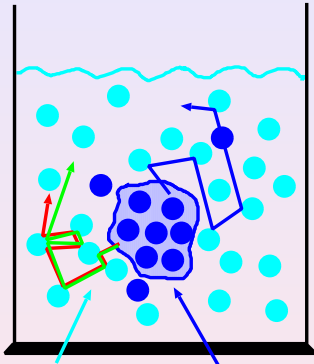
(sorry!)

**but:** R.F. Werner (U. Hannover)

*Generally observed features of the theory, like, e.g., the **approach of equilibrium** in macroscopic systems, deserve a general explanation don't they?*

**point of this talk:** There is a cross-link.

# Microscopic chaos in a glass of water?



water molecules

droplet of ink

- dispersion of a droplet of ink by *diffusion*
- assumption: *chaotic collisions* between billiard balls

**microscopic** chaos  
↕  
**macroscopic** transport

- relaxation to *equilibrium*

J.Ingenhousz (1785), R.Brown (1827), L.Boltzmann (1872),  
P.Gaspard et al. (Nature, 1998)

# Simple theory of Brownian motion

for a single **big tracer particle of velocity  $\mathbf{v}$**  immersed in a fluid:

$$\dot{\mathbf{v}} = -\kappa\mathbf{v} + \sqrt{\zeta} \boldsymbol{\xi}(t) \quad \text{Langevin equation (1908)}$$

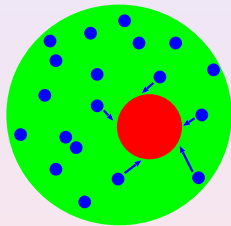
‘**Newton’s law of stochastic physics**’

force decomposed into

viscous damping

and

random kicks of surrounding particles



- models the interaction of a **subsystem** (tracer particle) with a **thermal reservoir** (fluid) in  $(\mathbf{r}, \mathbf{v})$ -space
- two aspects: fluctuations and dissipation; replace the tracer particle by a bottle of beer: **thermalization problem** in  $\mathbf{v}$ -space

# Langevin dynamics

## basic properties:

$$\dot{\mathbf{v}} = -\kappa\mathbf{v} + \sqrt{\zeta} \boldsymbol{\xi}(t)$$

stochastic

dissipative

not time reversible

⇒ **not Hamiltonian**

## however:

see, e.g., **Zwanzig's (1973)** derivation of the Langevin equation from a heat bath of harmonic oscillators

**non-Hamiltonian dynamics** arises from **eliminating** the reservoir degrees of freedom by starting from a **purely Hamiltonian** system

# Summary I

setting the scene:

- microscopic chaos and transport
- Brownian motion, dissipation and thermalization
- **Langevin dynamics: stochastic, dissipative, not time reversible, not Hamiltonian**

now to come:

the **deterministically thermostated dynamical systems approach** to nonequilibrium steady states



# Nonequilibrium and the Gaussian thermostat

- Langevin equation with an electric field

$$\dot{\mathbf{v}} = \mathbf{E} - \kappa \mathbf{v} + \sqrt{\zeta} \boldsymbol{\xi}(t)$$

generates a **nonequilibrium steady state**: physical macro-scale quantities are **constant in time**

numerical inconvenience: slow relaxation

- alternative method via **velocity-dependent friction coefficient**

$$\dot{\mathbf{v}} = \mathbf{E} - \alpha(\mathbf{v}) \cdot \mathbf{v}$$

(for free flight); keep kinetic energy constant,  $d\mathbf{v}^2/dt = 0$ :

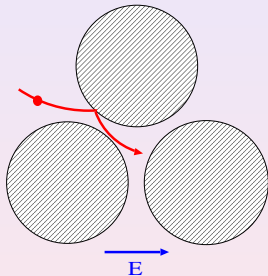
$$\alpha(\mathbf{v}) = \frac{\mathbf{E} \cdot \mathbf{v}}{v^2}$$

**Gaussian** (isokinetic) **thermostat**  
Evans/Hoover (1983)

- follows from *Gauss' principle of least constraints*
- generates a *microcanonical velocity distribution*
- total *internal energy* can also be kept constant

# The Lorentz Gas

free flight is a bit boring: consider the **periodic Lorentz gas** as a microscopic toy model for a conductor in an electric field

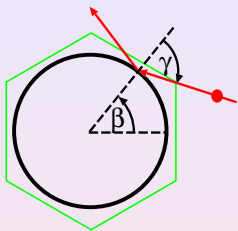


Galton (1877), Lorentz (1905)

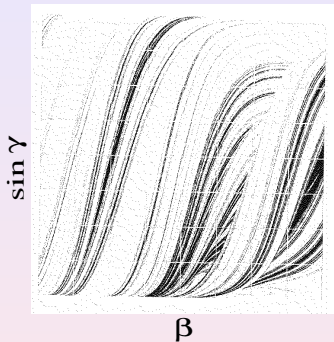
couple it to a Gaussian thermostat - **surprise**: dynamics is **deterministic, chaotic, time reversible, dissipative, ergodic**

Hoover/Evans/Morriss/Posch (1983ff)

# Gaussian dynamics: first basic property



Hoover, Moran (1989)



*reversible* equations of motion



**fractal attractors** in phase space



*irreversible* transport

# Second basic property

- use equipartitioning of energy:  $v^2/2 = T/2$

- consider ensemble averages:  $\langle \alpha \rangle = \frac{\mathbf{E} \cdot \langle \mathbf{v} \rangle}{T}$

absolute value of average **rate of phase space contraction**  
= thermodynamic (Clausius) **entropy production**

that is:

entropy production is due to **contraction onto fractal attractor**  
in nonequilibrium steady states

more generally: identity between Gibbs entropy production and  
phase space contraction (Gerlich, 1973 and Andrey, 1985)

# Third basic property

- define conductivity  $\sigma$  by  $\langle \mathbf{v} \rangle =: \sigma \mathbf{E}$ ; into previous eq. yields

$$\sigma = \frac{T}{E^2} \langle \alpha \rangle$$

- combine with identity  $-\langle \alpha \rangle = \lambda_+ + \lambda_-$  for Lyapunov exponents  $\lambda_{+/-}$ :

$$\sigma = -\frac{T}{E^2} (\lambda_+ + \lambda_-)$$

## **conductivity** in terms of **Lyapunov exponents**

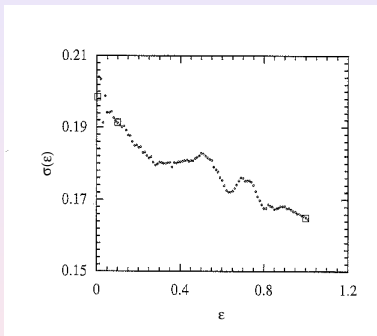
Posch, Hoover (1988); Evans et al. (1990)

similar relations for Hamiltonian dynamics and other transport coefficients from a different theory

Gaspard, Dorfman (1995)

## Side remark: electrical conductivity

field-dependent electrical conductivity from NEMD computer simulations:



Lloyd et al. (1995)

- mathematical proof that there exists **Ohm's Law** for small enough (?) field strength (Chernov et al., 1993)
- but **irregular parameter dependence** of  $\sigma(E)$  in simulations (cf. **book by RK, Part 1** on fractal transport coefficients)

# Summary II

- **thermal reservoirs** needed to create steady states in nonequilibrium
- **Gaussian thermostat** as a deterministic alternative to Langevin dynamics
- Gaussian dynamics for **Lorentz gas** yields nonequilibrium steady states with very interesting dynamical properties

recall that Gaussian dynamics is *microcanonical*

last part:

construct a deterministic thermostat that generates a *canonical* distribution

# The (dissipative) Liouville equation

Let  $(\dot{\mathbf{r}}, \dot{\mathbf{v}})^* = \mathbf{F}(\mathbf{r}, \mathbf{v})$  be the equations of motion for a point particle and  $\rho = \rho(t, \mathbf{r}, \mathbf{v})$  the probability density for the corresponding Gibbs ensemble

balance equation for **conserving the number of points** in phase space:

$$\frac{d\rho}{dt} + \rho \nabla \cdot \mathbf{F} = 0$$

Liouville equation (1838)

For Hamiltonian dynamics there is no phase space contraction,  $\nabla \cdot \mathbf{F} = 0$ , and **Liouville's theorem** is recovered:

$$\frac{d\rho}{dt} = 0$$



# The Nosé-Hoover thermostat

Let  $(\dot{\mathbf{r}}, \dot{\mathbf{v}}, \dot{\alpha})^* = \mathbf{F}(\mathbf{r}, \mathbf{v}, \alpha)$  with  $\dot{\mathbf{r}} = \mathbf{v}$ ,  $\dot{\mathbf{v}} = \mathbf{E} - \alpha(\mathbf{v})\mathbf{v}$  be the equations of motion for a point particle with **friction variable**  $\alpha$

**problem:** derive an equation for  $\alpha$  that generates the **canonical distribution**

$$\rho(t, \mathbf{r}, \mathbf{v}, \alpha) \sim \exp \left[ -\frac{v^2}{2T} - (\tau\alpha)^2 \right]$$

put the above equations into the Liouville equation

$$\frac{\partial \rho}{\partial t} + \dot{\mathbf{r}} \frac{\partial \rho}{\partial \mathbf{r}} + \dot{\mathbf{v}} \frac{\partial \rho}{\partial \mathbf{v}} + \dot{\alpha} \frac{\partial \rho}{\partial \alpha} + \rho \left[ \frac{\partial \dot{\mathbf{r}}}{\partial \mathbf{r}} + \frac{\partial \dot{\mathbf{v}}}{\partial \mathbf{v}} + \frac{\partial \dot{\alpha}}{\partial \alpha} \right] = 0$$

restricting to  $\partial \dot{\alpha} / \partial \alpha = 0$  yields the **Nosé-Hoover thermostat**

$$\dot{\alpha} = \frac{v^2 - 2T}{\tau^2 2T}$$

Nosé (1984), Hoover (1985)

widely used in NEMD computer simulations

# Generalized Hamiltonian formalism for Nosé-Hoover

Dettmann, Morriss (1997): use the Hamiltonian

$$H(\mathbf{Q}, \mathbf{P}, Q_0, P_0) := e^{-Q_0} E(\mathbf{P}, P_0) + e^{Q_0} U(\mathbf{Q}, Q_0)$$

where  $E(\mathbf{P}, P_0) = \mathbf{P}^2/(2m) + P_0^2/(2M)$  is the kinetic and  $U(\mathbf{Q}, Q_0) = u(\mathbf{Q}) + 2TQ_0$  the potential energy of particle plus reservoir for **generalized** position and momentum coordinates

**Hamilton's equations** by imposing  $H(\mathbf{Q}, \mathbf{P}, Q_0, P_0) = 0$ :

$$\dot{\mathbf{Q}} = e^{-Q_0} \frac{\mathbf{P}}{m}, \quad \dot{\mathbf{P}} = -e^{Q_0} \frac{\partial u}{\partial \mathbf{Q}}$$

$$\dot{Q}_0 = e^{-Q_0} \frac{P_0}{M}, \quad \dot{P}_0 = 2(e^{-Q_0} E(\mathbf{P}, P_0) - e^{Q_0} T)$$

uncoupled equations for  $Q_0 = 0$  suggest **relation between physical and generalized coordinates**

$$\mathbf{Q} = \mathbf{q}, \quad \mathbf{P} = e^{Q_0} \mathbf{p}, \quad Q_0 = q_0, \quad P_0 = e^{Q_0} p_0$$

for  $M = 2T\tau^2$ ,  $\alpha = p_0/M$ ,  $m = 1$  Nosé-Hoover recovered

**note:** the above transformation is **noncanonical!**

# Nosé-Hoover dynamics

## summary:

Nosé-Hoover thermostat constructed both from Liouville equation and from generalized Hamiltonian formalism

## properties:

- fractal attractors
- identity between phase space contraction and entropy production
- formula for transport coefficients in terms of Lyapunov exponents

that is, we have the **same class as Gaussian dynamics**

## basic question:

Are these properties **universal** for deterministic dynamical systems in nonequilibrium steady states altogether?

# Non-ideal and boundary thermostats

## counterexample 1:

increase the coupling for the Gaussian thermostat parallel to the field by making the friction **field-dependent**:

$$\dot{v}_x = E_x - \alpha(1 + E_x)v_x, \quad \dot{v}_y = -\alpha v_y$$

- **breaks the identity** between phase space contraction and entropy production and the conductivity-Lyapunov exponent formula
- **fractal attractors** seem to persist
- non-ideal Nosé-Hoover thermostat constructed analogously

## counterexample 2:

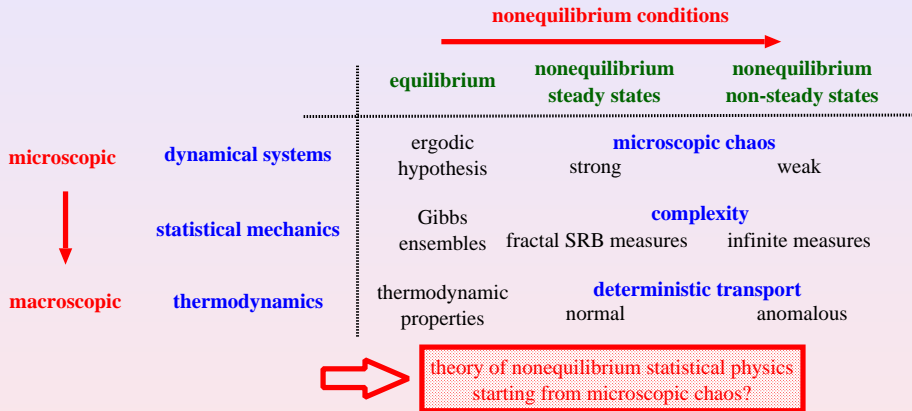
a time-reversible deterministic boundary thermostat generalizing stochastic boundaries (**RK et al., 2000**)

- same results as above

# Universality of Gaussian and Nosé-Hoover dynamics?

- ⊖ in general **no identity** between *phase space contraction and entropy production*
  - ⊖ consequently, relations between *transport coefficients and Lyapunov exponents* in thermostated systems are **not universal**
  - ⊕ existence of *fractal attractors* confirmed (stochastic reservoirs: open question)
- (possible way out: need to take a closer look at first problem...)

# Outlook: the big picture



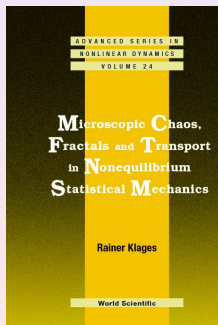
approach should be particularly useful for  
**small nonlinear systems**

# Acknowledgements and literature

**counterexamples developed with:**

K.Rateitschak (PhD thesis in Brussels, 1997-2002),  
Chr.Wagner (postdoc in Brussels, 1998-2000), G.Nicolis

**literature:**



(Part 2)