

Anomalous Langevin Dynamics, Fluctuation-Dissipation Relations and Fluctuation Relations

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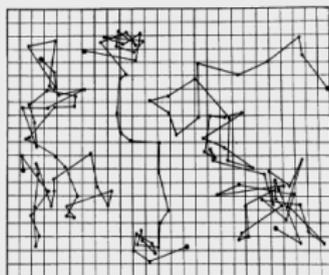
Climate Fluctuations and Non-equilibrium Statistical
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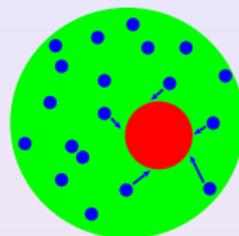
Outline

- **Standard Langevin dynamics:**
very brief review for setting the scene
- **Generalized Langevin dynamics:**
non-Markovian dynamics with memory generates anomalous diffusion; fluctuation-dissipation relations
- **Fluctuation relations:**
test (!) of transient work fluctuation relation

Theoretical modeling of Brownian motion



Brownian motion (Perrin, 1913)



**'Newton's law
of stochastic physics'**

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

for a **tracer particle of velocity \mathbf{v}** immersed in a fluid
force on rhs decomposed into

- **viscous damping** as **Stokes friction**
- **random kicks of surrounding particles** modeled by **Gaussian white noise**

note: **Kac-Zwanzig model (1965, 1973)** for derivation of this eq.

Langevin dynamics

solutions of the Langevin equation (in 1dim); here focus on:

- **mean square displacement** (msd)

$$\sigma_x^2 = \langle (x(t) - \langle x(t) \rangle)^2 \rangle \sim t \quad (t \rightarrow \infty),$$

where $\langle \dots \rangle$ denotes an ensemble average

- **position probability distribution function** (pdf)

$$p(x, t) = \frac{1}{\sqrt{2\pi\sigma_x^2}} \exp\left(-\frac{(x - \langle x \rangle)^2}{2\sigma_x^2}\right)$$

(from solving the corresponding Fokker-Planck eq.)
reflects the Gaussianity of the noise

Langevin dynamics for earth's surface temperature

from previous talk:

analogy between

stochastic energy balance equation

$$C\dot{T} = -\frac{1}{S_{eq}}T + F + k\zeta(t)$$

and Langevin equation (with field F)

$$m\dot{v} = -\kappa v + F + k\zeta(t)$$

mathematically identical

Generalized Langevin equation

Mori, Kubo (1965/66): **generalize** ordinary Langevin equation to

$$m\dot{v} = - \int_0^t dt' \kappa(t-t')v(t') + k \zeta(t)$$

by using a **time-dependent friction coefficient** $\kappa(t) \sim t^{-\beta}$;
cf. polymer dynamics (Panja, 2010) and biological cell migration (Dieterich et al., 2008ff)

solutions of this Langevin equation:

- **position pdf is Gaussian** (as the noise is still Gaussian)
- but for **msd** $\sigma_x^2 \sim t^{\alpha(\beta)}$ ($t \rightarrow \infty$) with **anomalous diffusion** for $\alpha \neq 1$; $\alpha < 1$: subdiffusion; $\alpha > 1$: superdiffusion

(nb: the 1st term on the rhs defines a **fractional derivative**)

Fluctuation-dissipation relations

Kubo (1966): two fundamental relations characterizing Langevin dynamics

- 1 **fluctuation-dissipation relation of the 2nd kind (FDR2)**,

$$\langle \zeta(t)\zeta(t') \rangle \sim \kappa(t-t')$$

defines **internal noise**, which is correlated in the same way as the friction; if broken: **external noise**

- 2 **fluctuation-dissipation relation of the 1st kind (FDR1)**,

$$\langle x \rangle \sim \sigma_x^2$$

implies that current and msd have the same time dependence (linear response)

(nb: some technical subtleties neglected)

Implications of fluctuation-dissipation relations

- for generalized Langevin dynamics with power-law correlated **internal (FDR2) Gaussian noise**, $\kappa(t) \sim t^{-\beta}$, **FDR2 implies FDR1** (Chechkin, Lenz, RK, 2012)
- **see previous talk:** similar generalized Langevin dynamics used to model **long-range memory effects in the earth's temperature dynamics**
- **but:** modeling implies **breaking of FDR2**; meaningful?

⇒ **explore consequences of breaking/conserving FDR for fluctuation relations**

Fluctuation Relations

Consider a (classical) particle system evolving from some initial state into a nonequilibrium steady state.

Measure the probability distribution $\rho(\xi_t)$ of **entropy production** ξ_t during time t :

$$\ln \frac{\rho(\xi_t)}{\rho(-\xi_t)} = \xi_t$$

Transient Fluctuation Relation (TFR)

Evans, Cohen, Morriss (1993); Gallavotti, Cohen (1995)

note: ξ_t **not necessarily identical** to definition via stochastic thermodynamics (or Evans et al.)

Fluctuation relation for normal Langevin dynamics

check TFR for the **overdamped Langevin equation**

$$\dot{x} = F + \zeta(t) \quad (\text{set all irrelevant constants to 1})$$

for a particle at position x with constant field F and noise ζ .

entropy production ξ_t is equal to (mechanical) **work** $W_t = Fx(t)$

with $\rho(W_t) = F^{-1} \varrho(x, t)$; choose initial condition $x(0) = 0$ (!)

the position pdf is Gaussian which implies straightforwardly

$$\text{(work) TFR holds if } \langle x \rangle = \sigma_x^2/2$$

hence **FDR1 \Rightarrow TFR**

see, e.g., **van Zon, Cohen, PRE (2003)**

Fluctuation relation for anomalous Langevin dynamics

check TFR for overdamped **generalized Langevin equation**

$$\int_0^t dt' \dot{x}(t') \kappa(t-t') = F + \zeta(t)$$

both for internal and external power-law correlated Gaussian noise $\kappa(t) \sim t^{-\beta}$

1. internal Gaussian noise:

- as FDR2 implies FDR1 and $\rho(W_t) \sim \varrho(x, t)$ is Gaussian, it straightforwardly follows the existence of the transient fluctuation relation

for correlated **internal Gaussian noise** \exists TFR

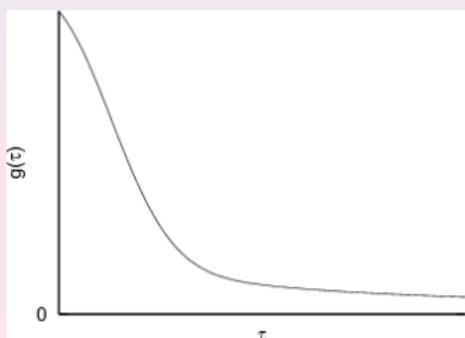
- diffusion and current may both be **normal or anomalous** depending on the memory kernel

Correlated external Gaussian noise

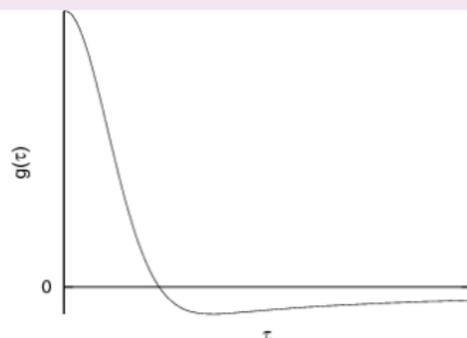
2. external Gaussian noise: break FDR2, modelled by the overdamped generalized Langevin equation

$$\dot{x} = F + \zeta(t)$$

consider **two types of Gaussian noise correlated** by
 $g(\tau) = \langle \zeta(t)\zeta(t') \rangle_{\tau=t-t'} \sim (\Delta/\tau)^\beta$ for $\tau > \Delta$, $\beta > 0$:



persistent



anti-persistent

it is $\langle x \rangle = Ft$ and $\sigma_x^2 = 2 \int_0^t d\tau (t - \tau)g(\tau)$

Results: TFRs for correlated external Gaussian noise

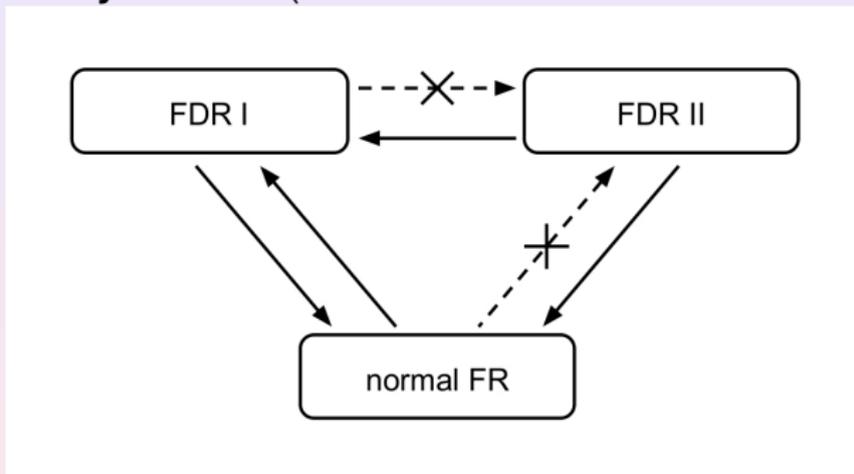
σ_X^2 and the **fluctuation ratio** $R(W_t) = \ln \frac{\rho(W_t)}{\rho(-W_t)}$ for $t \gg \Delta$ and $g(\tau) = \langle \zeta(t)\zeta(t') \rangle_{\tau=t-t'} \sim (\Delta/\tau)^\beta$:

β	persistent		antipersistent *	
	σ_X^2	$R(W_t)$	σ_X^2	$R(W_t)$
$0 < \beta < 1$	$\sim t^{2-\beta}$	$\sim \frac{W_t}{t^{1-\beta}}$	regime does not exist	
$\beta = 1$	$\sim t \ln\left(\frac{t}{\Delta}\right)$	$\sim \frac{W_t}{\ln\left(\frac{t}{\Delta}\right)}$		
$1 < \beta < 2$			$\sim t^{2-\beta}$	$\sim t^{\beta-1} W_t$
$\beta = 2$	$\sim 2Dt$	$\sim \frac{W_t}{D}$	$\sim \ln(t/\Delta)$	$\sim \frac{t}{\ln\left(\frac{t}{\Delta}\right)} W_t$
$2 < \beta < \infty$			$= \text{const.}$	$\sim t W_t$

* antipersistence for $\int_0^\infty d\tau g(\tau) > 0$ yields **normal diffusion** with **generalized TFR**; above antipersistence for $\int_0^\infty d\tau g(\tau) = 0$

Summary: FDR and TFR

relation between **TFR** and **FDR I,II** for **correlated Gaussian stochastic dynamics**: ('normal FR' = conventional TFR)



in particular:

FDR2 \Rightarrow FDR1 \Rightarrow TFR

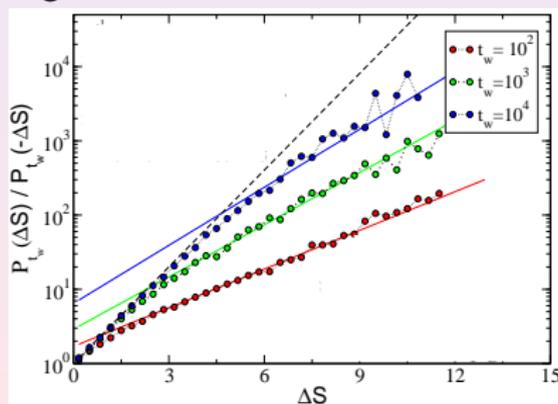
\nexists TFR \Rightarrow \nexists FDR2 : check in experiments?

Checking TFR in experiments

$$R(W_t) = \ln \frac{\rho(W_t)}{\rho(-W_t)} = \mathbf{f}_\beta(\mathbf{t}) W_t$$

means by plotting R for different t the **slope might change**.

example: computer simulations for a **binary Lennard-Jones mixture** below the glass transition



Crisanti, Ritort (2013); also Sellitto (2009)

similar results for chemotaxis of biological cells (Dieterich et al.)

Summary

- model **long-range memory effects** for stochastic climate dynamics by **generalized Langevin equations**?
- be careful of how you define your Langevin model with respect to **fluctuation-dissipation relations**:
 - is the **physics modelled correctly** in view of internal/external noise?
 - important **consequences for (transient) fluctuation relation**
- testing **fluctuation relations for climate dynamics**?

References

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