

Exact relations in Non-Equilibrium Statistical Mechanics

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Exact relations

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Equilibrium vs non-equilibrium

Equilibrium

- Thermodynamics: minimum of free energy
- Statistical mechanics
 - $\rightarrow \text{Ensembletheory}$
 - \rightarrow Fluctuations

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Equilibrium vs non-equilibrium

Equilibrium

- Thermodynamics: minimum of free energy
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Non-equilibrium

- Transient or steady state
- Athermal systems
- Depends on driving/dissipation mechanisms

Universal statistical mechanical approach?

Exact relations in non-equilibrium statistical mechanics

- Fluctuation theorems for heat, work, currents ("X-Y"-FTs)
 - Transient: Jarzynski, Crooks, Evans-Searles
 - Steady state: Gallavotti-Cohen
 - Generalizations
 - Quantum FTs

$$\lim_{\tau \to \infty} \frac{1}{c\tau} \ln \frac{\Pi_{\tau}(p)}{\Pi_{\tau}(-p)} = p$$

- Fluctuation-dissipation relations for steady states
- Additivity principle
- Ensembletheories
 - ► Ensemble of phase space trajectories → non-equilibrium counterpart to detailed balance
 - \blacktriangleright Edward's statistical mechanics for granular matter: energy \rightarrow volume

How universal? How useful?

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Fluctuations in non-equilibrium steady states

- Next simplest generalization of equilibrium is a *nonequilibrium steady state* (NESS)
- Physically a NESS is maintained by a balance between



- Characteristics of a NESS depend on the particular driving/dissipation (thermostatting) mechanisms
- Use large deviation formalism

$$p = \int_0^{\tau} A(x(t)) \mathrm{d}t, \qquad \lim_{\tau \to \infty} \frac{1}{\tau} \ln \Pi_{\tau}(p) = I(p)$$

• Rate function characterizes fluctuations in the NESS

A nonequilibrium particle model

- Particle in a moving harmonic potential $m\ddot{x}(t) + \alpha \dot{x}(t) = -\kappa(x(t) - vt) + \xi(t)$
- Mechanical work done on the particle

$$W_{\tau} = -\kappa v \int_0^{\tau} (x(t) - vt) \mathrm{d}t$$



• Stationary process in the comoving frame y = x - vt:

$$m\ddot{y}(t) + lpha\dot{y}(t) = -\kappa y(t) - lpha v + \xi(t)$$
 , $W_{ au} = -\kappa v \int_0^{ au} y(t) dt$

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External noise

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- Noise and friction originate from physically *independent* mechanisms
- Investigate role of *time scales* and *singularities* in the context of FTs

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A general type of noise

Poissonian shot noise (PSN)

$$z(t) = \sum_{k=1}^{n_t} \Gamma_k \delta(t-t_k)$$

- n_t Poisson distributed with mean λ
- Γ_k exponentially distributed with mean Γ₀
 White noise
- Characteristic functional

$$G_{z(t)}[g(t)] = \exp\left\{\lambda \int_0^\infty \left(\frac{1}{1-i\Gamma_0 g(t)}-1\right) \mathrm{d}t
ight\}$$

• Consider zero mean noise:

 $\xi(t) = z(t) - \lambda \Gamma_0$

• Gaussian noise in the limits $\lambda \to \infty$, $\Gamma_0 \to 0$, $\lambda \Gamma_0^2 = const$.



Time scales

• Time scales of the harmonic oscillator



Additional time scales due to PSN



• Qualitative transition behavior due to interplay of these time scales

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Zero mean noise

$$\xi(t) = z(t) - \lambda \Gamma_0$$

- Mean position in NESS: $\langle y \rangle = -v \tau_r$
- Mean work in NESS: $\langle W_{\tau} \rangle = \alpha v^2 \tau$



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Zero mean noise

$$\xi(t) = z(t) - \lambda \Gamma_0$$

- Mean position in NESS: $\langle y \rangle = -v \tau_r$
- Mean work in NESS: $\langle W_{\tau} \rangle = \alpha v^2 \tau$
- Distinguish v > 0 and v < 0

Singular features due to noise:

- Effective velocity: $v_e \equiv v + \lambda \Gamma_0 / \alpha$
- Force balance: $v_e = -\frac{1}{\tau_r}y^*$



Zero mean noise

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Effective nonlinearity

- Position cut-off $y^* = -v_e \tau_r$
- Infinite barrier in harmonic potential

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Exact relations

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• Negative v





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• Negative v



• Work given by: $W_{ au} = -\kappa v \int_0^{ au} y(t) \mathrm{d}t$

Work cut-off $v > 0: W_{\tau}^*$ maximal work in time τ $W_{\tau}^* = -\kappa v y^* \tau$ $v < 0: W_{\tau}^*$ minimal work in time τ

• If v < 0 and $\tau_p < \tau_{\lambda}$: minimal work $W_{\tau}^* > 0$ and no negative work fluctuations can occur.

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Generalized Ornstein-Uhlenbeck process

• Overdamped regime $\tau_m \ll \tau_r$

$$\dot{y}(t) = -rac{1}{ au_r}y(t) - v_e + z(t)$$

• Obtain characteristic functional:

$$G_{y(t)}[h(t)] = e^{ik_0y_0 - iv_e \int_0^\infty k(t)dt} G_{z(t)}[k(t)],$$

where $k(t) = \int_t^\infty e^{(t-s)/\tau_r} h(s) ds$.

- **(**) Characteristic function of particle position: $h(t) = h_1 \delta(t t_1)$
- 2 Characteristic function of the work: $h(t) = -qv\kappa\Theta(\tau t)$

$$G_{y(t)}[h(t)] = \left\langle e^{-iqv\kappa \int_0^\tau y(t)\mathrm{d}t} \right\rangle = \left\langle e^{iqW_\tau} \right\rangle$$

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Stationary distribution

• Particle position in the NESS:

$$P(y) \propto \left(rac{lpha}{\Gamma_0}(y-y^*)
ight)^{ au_r/ au_\lambda-1} \mathrm{e}^{-(y-y^*)lpha/\Gamma_0}$$

• Transition behavior for $\tau_r < \tau_\lambda$



Work distribution

• Distribution of rescaled work $p\equiv W_{ au}/\left\langle W_{ au}
ight
angle$ for large au

$$\Pi_{ au}(p) \propto \left(\sqrt{rac{p^*-p}{p^*-1}}
ight)^{-rac{ au_r}{ au_\lambda} \left(\sqrt{rac{p^*-p}{p^*-1}}-1
ight)-rac{3}{2}} \exp\left\{-rac{ au}{ au_\lambda} \left(\sqrt{rac{p^*-p}{p^*-1}}-1
ight)^2
ight\}$$

• Rescaled work cut-off: $p^* = 1 + \sigma(\mathbf{v}) \frac{\tau_p}{\tau_\lambda}$

• Rate function:
$$I(p) = rac{1}{ au_{\lambda}} \left(\sqrt{rac{p^* - p}{p^* - 1}} - 1
ight)^2$$

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Work distribution

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$$\Pi_{\tau}(p) \propto \left(\sqrt{\frac{p^*-p}{p^*-1}}\right)^{-\frac{\tau_r}{\tau_\lambda} \left(\sqrt{\frac{p^*-p}{p^*-1}}-1\right)-\frac{3}{2}} \exp\left\{-\frac{\tau}{\tau_\lambda} \left(\sqrt{\frac{p^*-p}{p^*-1}}-1\right)^2\right\}$$

• Rescaled work cut-off: $p^* = 1 + \sigma(v) \frac{\tau_p}{\tau_\lambda}$

• Rate function: $I(p) = \frac{1}{\tau_{\lambda}} \left(\sqrt{\frac{p^* - p}{p^* - 1}} - 1 \right)^2$



Fluctuation theorem

• Define dimensionless fluctuation function using $a \equiv \frac{\alpha}{\lambda \Gamma_0^2}$

$$f_{ au}(p) = rac{1}{a \left\langle W_{ au}
ight
angle} \ln rac{\Pi_{ au}(p)}{\Pi_{ au}(-p)}$$

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Fluctuation theorem

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• In the asymptotic regime $\tau \to \infty$, v > 0:



Baule and Cohen, PRE (2009)

- ► f(p) defined on [-p*, p*] and only depends on p, p*
- SSFT for $p^* \to \infty$ (Gaussian limit)
- Vertical slope for $p \to p^*$
- Negative fluctuation function for p* > 2 (i.e. τ_p > τ_r)

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Fluctuation theorem

• Define dimensionless fluctuation function using $a\equiv rac{lpha}{\lambda\Gamma_0^2}$

$$f_{ au}(p) = rac{1}{a \left< W_{ au}
ight>} \ln rac{\Pi_{ au}(p)}{\Pi_{ au}(-p)}$$

• In the asymptotic regime $\tau \to \infty$, v < 0 and $\tau_p > \tau_{\lambda}$:



- f(p) always > 0 for p > 0
- SSFT for $p^* \to \infty$ (Gaussian limit)
- Vertical slope for $p \rightarrow p^*$

Baule and Cohen, PRE (2009)

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Additional thermal Gaussian noise

• Add Gaussian noise $\eta(t)$ with $\langle \eta(t) \rangle = 0$, $\langle \eta(t) \eta(t') \rangle = 2 \frac{\alpha}{\beta} \delta(t - t')$

$$m\ddot{x}(t) + \alpha \dot{x}(t) = -\kappa(x(t) - vt) + \xi(t) + \eta(t)$$

• Product of characteristic functionals

$$G_{y(t)}[h(t)] = e^{ik_0y_0 - iv_e \int_0^\infty k(t) dt} G_{z(t)}[k(t)] G_{\eta(t)}[k(t)]$$

Additional thermal Gaussian noise

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$$G_{y(t)}[h(t)] = e^{ik_0y_0 - iv_e \int_0^\infty k(t) dt} G_{z(t)}[k(t)] G_{\eta(t)}[k(t)]$$

• Stationary distribution given by convolution of P(y) and $P_G(y)$ $\tau_r > \tau_\lambda$ $\tau_r < \tau_\lambda$ $P_{\rm GP}$ PGP -B=0.0-B=0.00.7 2.0 B=0.1B=00.6 B=1B=10.5 1.5 -B = 10--- B=10 041.0 0.5 0.1 0 • B = ratio of noise powers Gauss/PSN

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Work fluctuations

• Rate function





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Work fluctuations

• Rate function











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Equilibrium ensembles

Equilibrium

- Thermodynamics: minimum of free energy
- Statistical mechanics
 - $\rightarrow \text{Ensembletheory}$
 - \rightarrow Fluctuations
- Ergodicity: system samples entire phase space over time
 → equivalence of time averages and ensemble averages over
 stationary probability distributions p(x)
- Microcanonical ensemble: p(x) is uniform at constant energy E
- Entropy: $S = -k_B \ln \Omega(E)$
- Canonical ensemble: energy exchange with heat bath $p(x) \propto e^{-\beta H(x)}$ \rightarrow thermal equilibrium fluctuations
- Rules for transition rates: detailed balance

Biased ensemble of trajectories

 Consider time-integrated observable of *equilibrium* dynamics x(t)

$$\gamma_{\Gamma} = \int_0^{\tau} A(x(t)) \mathrm{d}t$$

- Construct biased ensemble:
 - Microcanonical
 - Canonical: $\langle \gamma_{\Gamma} \rangle = \gamma_0$
- Distribution of uncorrelated objects Γ is given by maximizing

$$S = -\sum_{\Gamma} p_{\Gamma} \ln p_{\Gamma}$$

for equilibrium paths Γ subject to **constraint** $\sum_{\Gamma} p_{\Gamma} \gamma_{\Gamma} = \gamma_0$ <u>*Result:*</u>

$$p_{\Gamma}^{dr} \propto p_{\Gamma}^{eq} e^{
u \gamma_{\Gamma}}$$



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Biased ensemble of trajectories

$$p_{\Gamma}^{dr} \propto p_{\Gamma}^{eq} e^{
u \gamma_{\Gamma}}$$

• Calculate *dynamical partition function*

$$Z(
u,t)=\langle e^{
u\gamma_{\Gamma}}
angle$$

• Consider *dynamical free energy*:

$$\psi(
u) = -\lim_{t \to \infty} \frac{1}{t} \log Z(
u, t)$$

- Shear flows of complex fluids (R.M.L. Evans): *shear*
- Models for glass formers (Garrahan et al): *activity*



Garrahan et al, PRL (2007)

Fluid in shear flow

A sheared NESS has much in common with equilibrium:

Sheared NESS

- same Hamiltonian, only boundaries differ
- ergodic
- reproducible phase behavior
- spatial and temporal fluctuations
- ubiquitous



...yet not solved by equilibrium statistical mechanics!

In general, $\dot{\gamma}$ influential, if relaxation times au_r are long: $\dot{\gamma} au_r \gg 1$

Phenomena in shear flows of complex fluids

• Amphiphiles:





Micrograph courtesy of Mark Buchanan

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Phenomena in shear flows of complex fluids

• Amphiphiles:



• Shear banding:



Phase transition

controlled by **shear rate** in addition to temperature, concentration, etc.

Nonequilibrium statistical mechanics of shear flow

• A model fluid

is defined by a set of *n* rates $\{\omega_{ab}\}$ for jumping between microstates *a*, *b*



Can the transition rates be chosen arbitrarily ? Balance equation for the probability distribution p_a :

$$\dot{p}_a = \sum_b \left[\omega_{ba} p_b - \omega_{ab} p_a
ight] = 0$$

Satisfied by (equilibrium condition): $\omega_{ba}p_b - \omega_{ab}p_a = 0$ \rightarrow Equilibrium heat bath:

$$\omega_{ab}/\omega_{ba} = e^{-(E_b - E_a)/k_BT}$$

Condition of *detailed balance*

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Nonequilibrium statistical mechanics of shear flow

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 \rightarrow Do similar constraints apply in a sheared NESS ?

Nonequilibrium statistical mechanics of shear flow

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 \rightarrow Do similar constraints apply in a sheared NESS ?

• A fluid volume in the bulk feels shear only intermediated through surrounding fluid



Postulate: statistics of sheared NESS obtained from a biased ensemble of equilibrium trajectories

Nonequilibrium counterpart to detailed balance

- ightarrow Unnormalized probability of a path: $p_{\Gamma}^{dr} \propto p_{\Gamma}^{eq} e^{\nu \gamma_{\Gamma}}$
- \rightarrow Want: probability of a transition

$$\omega_{ab} = \Pr(a
ightarrow b|a)/\Delta t$$



By counting all trajectories that contain transition $a \rightarrow b$ obtain **exact** relations for the transition rates:

$$\omega_{ab}^{dr} = \omega_{ab}^{eq} e^{\nu \Delta \gamma_{ba} + \Delta q_{ba}}$$

- Local contribution: $\Delta \gamma_{ba}$ is the immediate shear contribution of the transition $a \rightarrow b$
- Global contribution: Δq_{ba} measures the propensity for future shear given $a \rightarrow b$

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Predictions

• Invariant quantities in the sheared NESS



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Predictions

• Invariant quantities in the sheared NESS



• Introduce shear current (rate) $J = \gamma/\tau$ of a trajectory



 \rightarrow Fluctuation theorem

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Baule and Evans, PRL (2008); JSTAT (2010)

Testing the theory: a fluid of rotors

Numerically time-stepping Newtonian eqs of motion

$$I\ddot{\Theta} = F_{i+1,i} - F_{i,i-1}$$

Conserves angular momentum



Inter-neighbour torque:
$$F_{ij} = F_{ij}^{conserv} + F_{ij}^{dissip} + F_{ij}^{random}$$



$$\begin{array}{lll} F_{ij}^{dissip} & \propto & \dot{\Theta}_i - \dot{\Theta}_j \\ F_{ij}^{conserv} & = & -U'(\Theta_i - \Theta_j) \\ F_{ij}^{random} & = & -F_{ji}^{random} \end{array}$$

Testing the theory: a fluid of rotors

At equilibrium

- Boltzmann statistics in $U(\Delta \Theta)$
- Transitions between wells satisfy detailed balance

Impose shear at the boundaries...



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- Dynamics is ergodic
- Correlations are small
- Potential wells=microstates

In order to expedite data collection

- Take overdamped (low mass) limit
- Treat each gap $(\Delta \Theta)$ as "system"

then the theory applies here !



Testing the product constraint

Use equilibrium symmetries



Product constraint	
$\omega_{ab}\omega_{ba}=\omega_{ab}^{eq}\omega_{ba}^{eq}$	$\forall a, b$

$$\rightarrow \qquad \omega_{ab}\omega_{ba} = \omega_{da}\omega_{ad}$$

and similarly for transitions $c \to b$ and $c \to d$

Evans, Simha, Baule, Olmsted, PRE 2010

Testing the product constraint

Use equilibrium symmetries

Product constraint $\omega_{ab}\omega_{ba} = \omega_{ab}^{eq}\omega_{ba}^{eq}$ $\forall a, b$

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Evans, Simha, Baule, Olmsted, PRE 2010



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Testing the product constraint

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Evans, Simha, Baule, Olmsted, PRE 2010



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Use equilibrium symmetries

$$\omega_{ab}^{eq} = \omega_{ad}^{eq}$$
$$\omega_{ba}^{eq} = \omega_{da}^{eq}$$
$$\vdots$$

.



Total exit rate constraint

$$\sum_{a}^{dr} - \sum_{b}^{dr} = \sum_{a}^{eq} - \sum_{b}^{eq} \quad \forall a, b$$

$$\rightarrow \qquad \omega_{ba} + \omega_{bc} = \omega_{da} + \omega_{dc}$$

Evans, Simha, Baule, Olmsted, PRE (2010)

Use equilibrium symmetries

:

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Exact relations

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Evans, Simha, Baule, Olmsted, PRE (2010)



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- Measured ratio close to unity for all parameter values
- Discrepancies in lower left corner
- In low noise regime ergodicity might break down
- Discrepancies do not increase with $\dot{\gamma}$
 - \rightarrow theory is not a

near-equilibrium approximation



Outlook

- Deviations from SSFT for non-Gaussian fluctuations
 - Paradigmatic non-equilibrium particle model
 - PSN as generalization of Gaussion noise (mechanical random force)
- Statistical mechanics of some non-equilibrium systems might be treated using ensemble approaches as in equilibrium
- Connect non-equilibrium trajectory ensemble with thermodynamics of phase transitions under shear
 - Shear thickening in Brownian and non-Brownian colloidal suspensions
 - Needs suitable lattice model where shear can be identified

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