

Celia Anteneodo
Puc-Rio



STATISTICAL MECHANICS FOR COMPLEXITY

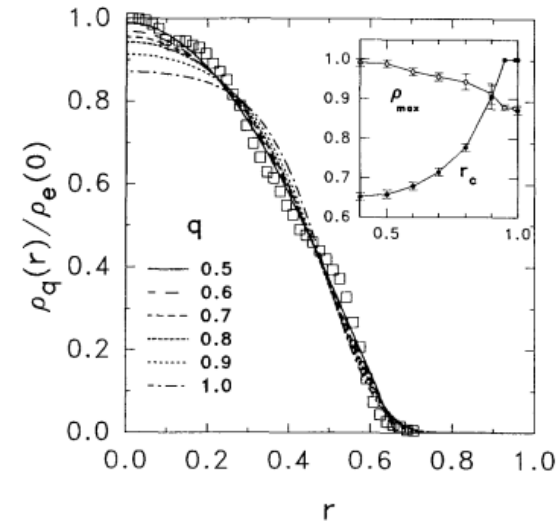
A CELEBRATION OF THE 80TH BIRTHDAY OF CONSTANTINO TSALLIS

RIO DE JANEIRO, 6 TO 10 NOVEMBER 2023

Two-dimensional turbulence in pure-electron plasma: A nonextensive thermostatistical description

Celia Anteneodo, Constantino Tsallis 

Huang and Driscoll (1994) studied the two-dimensional turbulent metaequilibrium state that appears in an experiment in which pure-electron plasma evolves in the interior of a conducting cylinder (of radius R_w) in the presence of an external axial magnetic field. Also related to work by B.M. Boghosian.



Density profiles of metaequilibrium state

<https://www.sciencedirect.com/science/article/pii/S0167732297000160>

Long-range interactions

VOLUME 80, NUMBER 24

PHYSICAL REVIEW LETTERS

15 JUNE 1998

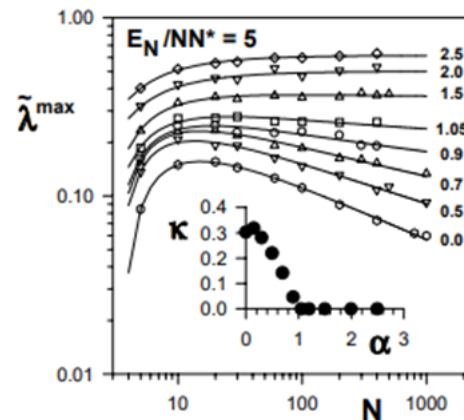
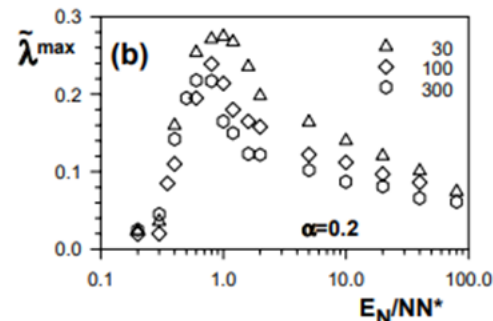
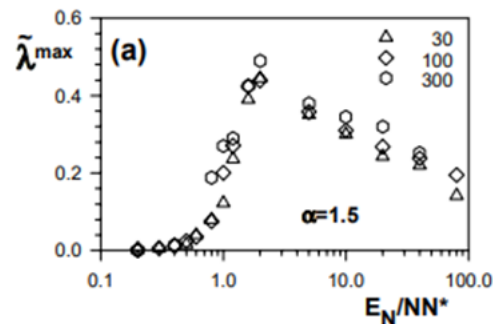
Breakdown of Exponential Sensitivity to Initial Conditions: Role of the Range of Interactions

Celia Anteneodo¹ and Constantino Tsallis²

Let us consider the following $d = 1$ classical Hamiltonian (with periodic boundary conditions):







$$\mathcal{H} = \frac{1}{2} \sum_{i=1}^N L_i^2 + \frac{1}{2} \sum_{i \neq j} \frac{1 - \cos(\theta_i - \theta_j)}{r_{ij}^\alpha}$$

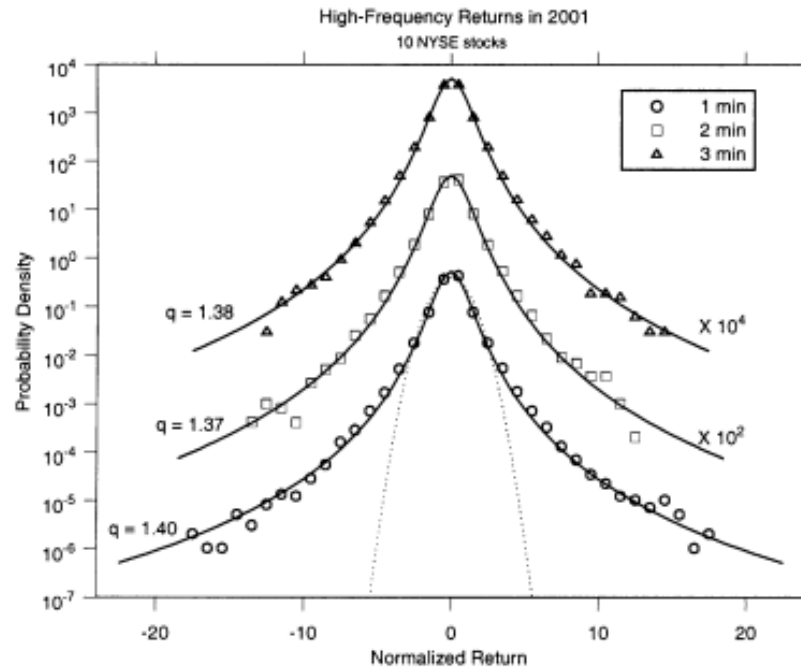
$$= E_k + E_p \quad (\alpha \geq 0; r_{ij} = 1, 2, 3, \dots), \quad (1)$$



<https://journals.aps.org/prl/pdf/10.1103/PhysRevLett.80.5313>

Nonextensive statistical mechanics and economics

Constantino Tsallis^a  , Celia Anteneodo^a  , Lisa Borland^b  , Roberto Osorio^b



Empirical distributions (points) and q -Gaussians (solid lines) for normalized returns

<https://www.sciencedirect.com/science/article/pii/S0378437103000426>

Risk aversion in economic transactions

C. Anteneodo¹, C. Tsallis¹ and A. S. Martinez²

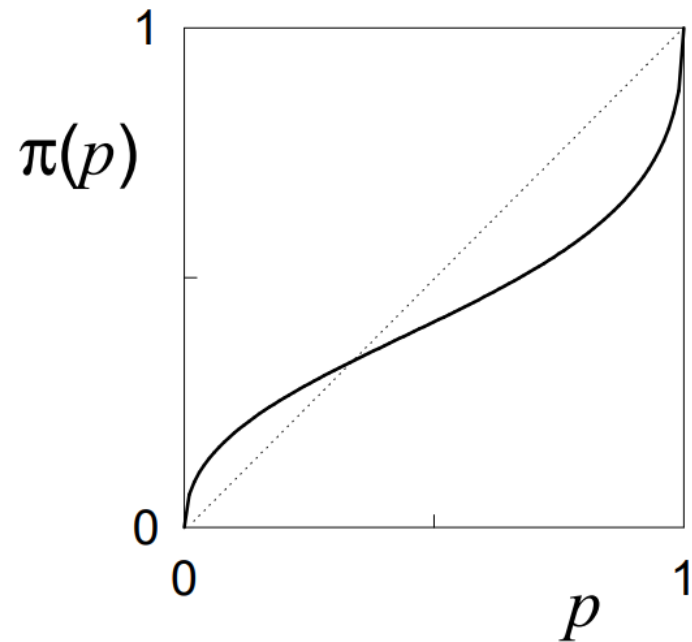
2002 EDP Sciences

[Europhysics Letters, Volume 59, Number 5](#)

Based on generalization of
expected utility theory" (EUT)

$$E(\mathcal{P}) = \sum_{i=1}^n \chi(x_i) \Pi(p_i),$$

Tversky & Kahneman (Nobel 2002)



<https://www.sciencedirect.com/science/article/pii/S0378437103000426>

Risk aversion in economic transactions

C. Anteneodo¹, C. Tsallis¹ and A. S. Martinez²

2002 EDP Sciences

[Europhysics Letters, Volume 59, Number 5](#)

In conclusion, the type of conditions limiting indebtedness are critical for defining the nature of the long term evolution.

The details of this steady state depend, among other factors, on the distribution of the parameter q of the operators. One also observes that the final state is invariant under initial redistribution of money.

Paradoxically enough, some level of cheating avoids extreme wealth inequality to become the stationary state. However, one must keep in mind that the distribution of q is kept fixed along the dynamics and, therefore, the psychological effect of asset position is not taken into account in the present model. Such dynamics would provide an improved, more realistic model.

→ Constantino invited conference at the "International Public Seminar of the Year", 27 August 2002, Jakarta, Indonesia

Multiplicative noise

Multiplicative noise: A mechanism leading to nonextensive statistical mechanics ✓

Celia Anteneodo; Constantino Tsallis



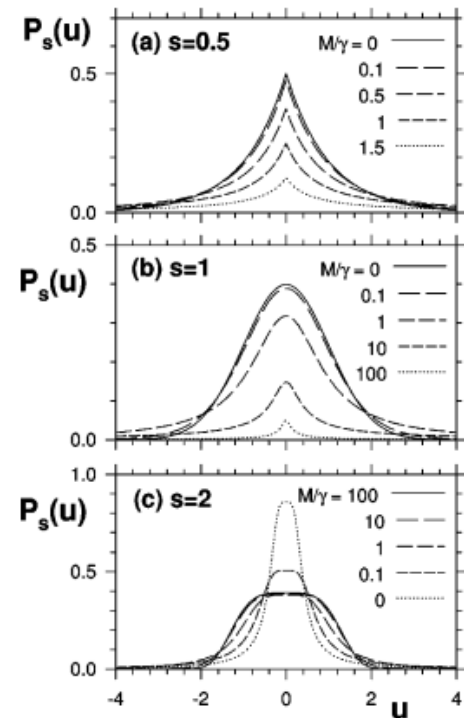
J. Math. Phys. 44, 5194–5203 (2003)

<https://doi.org/10.1063/1.1617365> Article history

$$\dot{u} = f(u) + g(u)\xi(t) + \eta(t),$$

$$\langle \xi(t)\xi(t') \rangle = 2M\delta(t-t'), \quad \langle \eta(t)\eta(t') \rangle = 2A\delta(t-t'),$$

$$\rightarrow P_s(u) \propto [1 + (q-1)\beta[g(u)]^2]^{1/(1-q)},$$



<https://pubs.aip.org/aip/jmp/article/44/11/5194/447749/Multiplicative-noise-A-mechanism-leading-to>

Generalized entropy

Maximum entropy approach to stretched exponential probability distributions

C Anteneodo¹ and A R Plastino²

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[Journal of Physics A: Mathematical and General, Volume 32, Number 7](#)

$$S_\eta = \sum_{i=1}^w s_\eta(p_i)$$

where $s_\eta(p_i) \equiv \Gamma\left(\frac{\eta+1}{\eta}, -\ln p_i\right) - p_i \Gamma\left(\frac{\eta+1}{\eta}\right) \rightarrow$ stretched exponentials

Here, η is a positive real number,

$$\Gamma(\mu, t) = \int_t^\infty y^{\mu-1} e^{-y} dy = \int_0^{\exp(-t)} [-\ln x]^{\mu-1} dx \quad \mu > 0$$

is the complementary incomplete Gamma function, and $\Gamma(\mu) = \Gamma(\mu, 0)$ the Gamma function.

Generalized entropy

Journal of Physics A: Mathematical and General

Maximum entropy approach to stretched exponential probability distributions

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- Kinchin axioms,
- Positivity
- Concavity
- Certainty
- Equiprobability
- Nonextensivity
- Jaynes thermodynamic relations

<https://web.archive.org/web/20050301070437id/http://www.cbpf.br:80/~celia/paper14.pdf>

Constantino,
happy birthday!
congratulations!
and thank you!



EQUILIBRATE OR NOT TO EQUILIBRATE THAT IS THE QUESTION

QUASI-EQUILIBRIUM STATES IN NONCONFINING FIELDS

C Anteneodo, M dos Santos - PUC-Rio, Brazil
E Barkai, D Kessler, L Defaveri - Bar-Ilan U, Israel



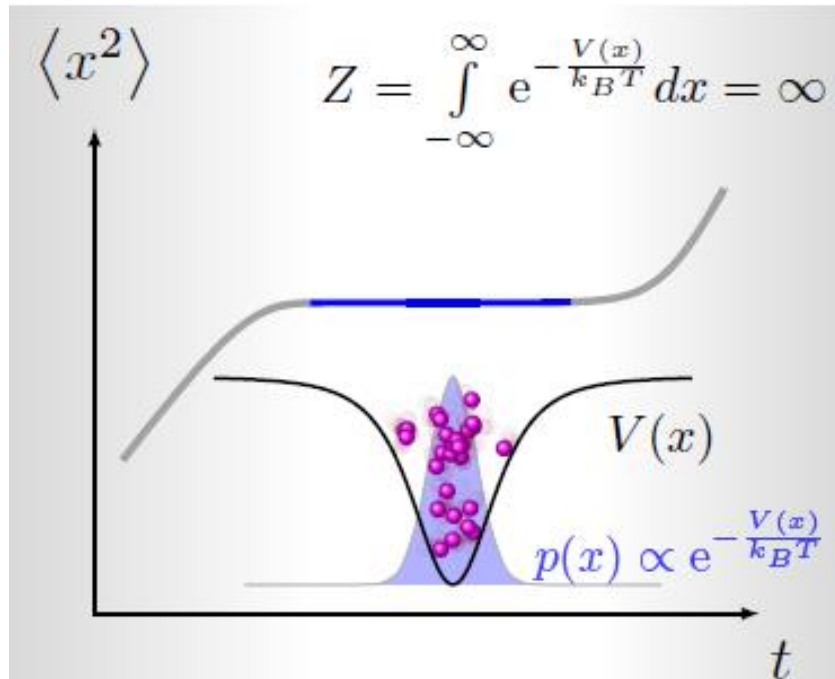
Complex
Systems

PUC-Rio



Outline

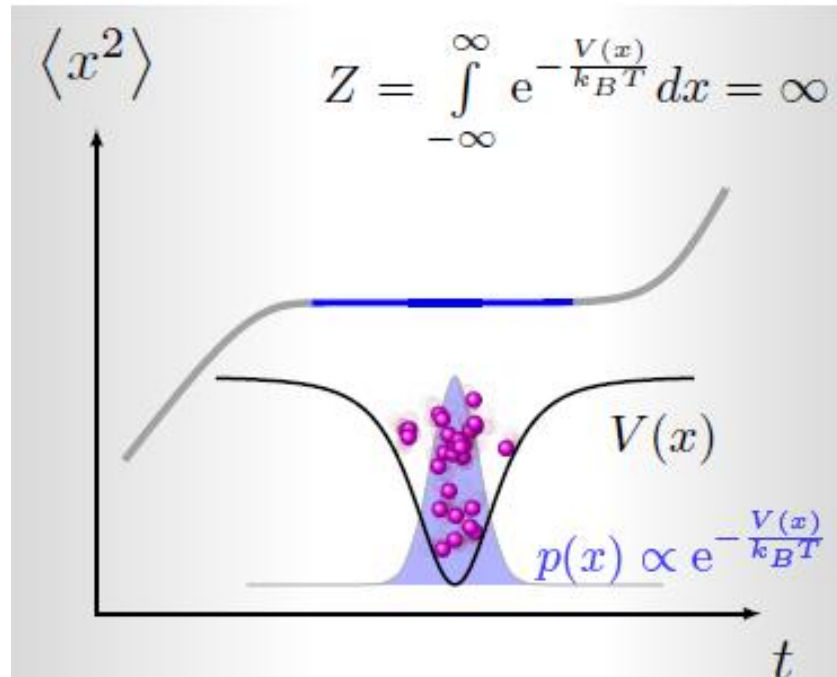
To equilibrate or not to equilibrate,
that is the question.



Regularized Boltzmann statistics
is the answer.

Outline

To equilibrate or not to equilibrate,
that is the question.

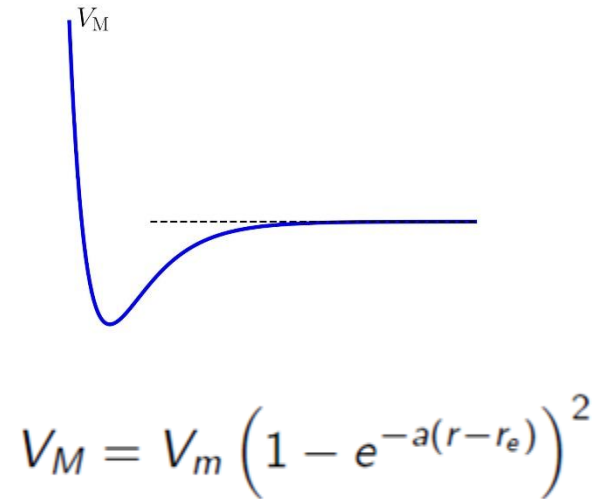
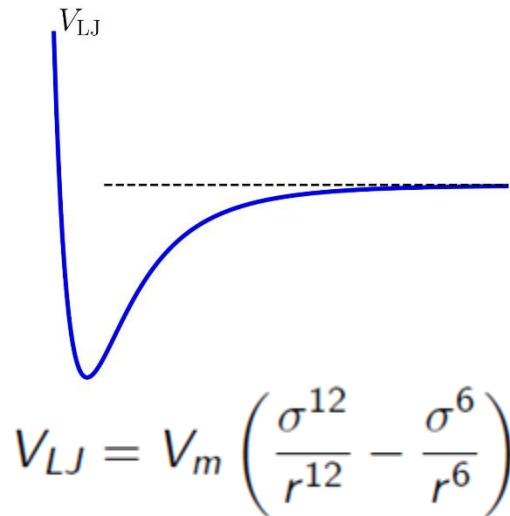


- Non-confinement
- Langevin
- Fokker-Planck
- Quasi-equilibrium
- Regularization
- Bounded domain
- Eigenfunctions
- Fractional
- Final remarks

Regularized Boltzmann statistics
is the answer.

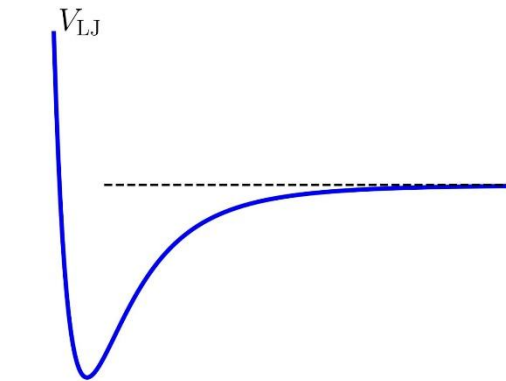
Non-confinement

Non-confining potentials are ubiquitous in Nature

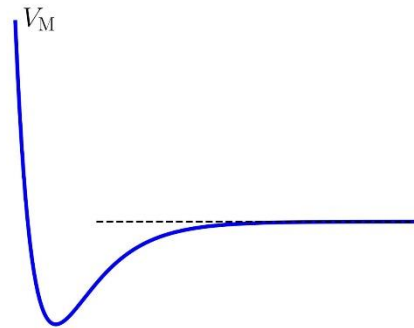


Non-confinement

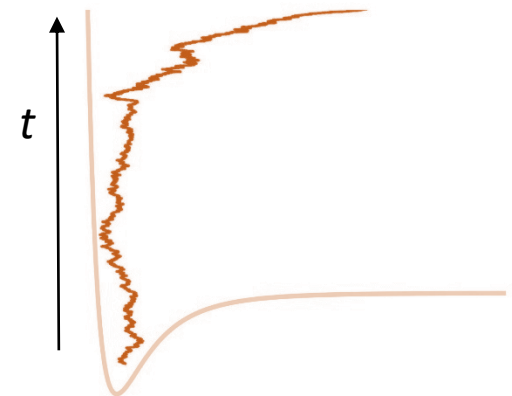
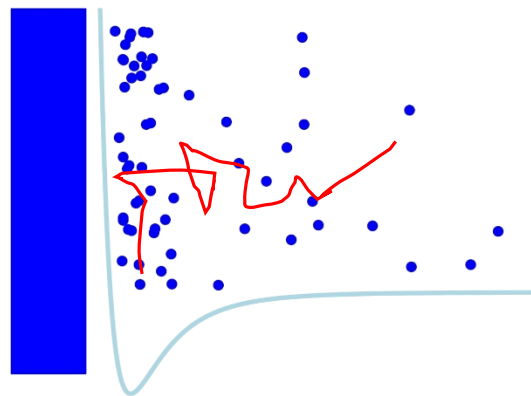
Non-confining potentials are ubiquitous in Nature



$$V_{LJ} = V_m \left(\frac{\sigma^{12}}{r^{12}} - \frac{\sigma^6}{r^6} \right)$$



$$V_M = V_m \left(1 - e^{-a(r-r_e)} \right)^2$$



Non-confinement

Some experiments where transient stagnation emerges

- Particles diffusing in heterogeneous media

[Liu *et al.*, ACS Nano 16 \(2022\)](#)

- Probe particles in micellar solutions

[Bellour *et al.*, Eur. Phys. J. E 8 \(2002\)](#)

[Galvan-Miyoshi *et al.*, Eur. Phys. J. E 26 \(2008\)](#)

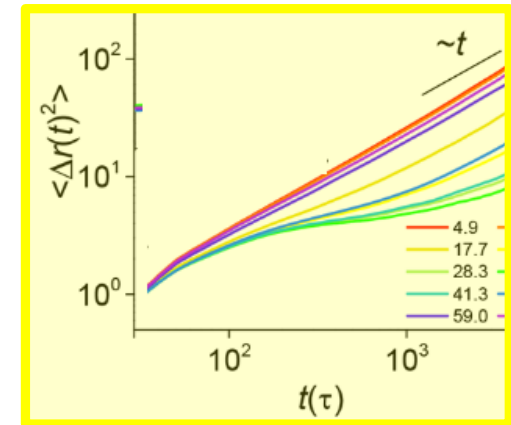
[Jeon *et al.*, New J. Phys. 15 \(2013\)](#)

- Nanoparticles in semi-flexible networks

[Xu *et al.*, ACS Nano 15, \(2021\)](#)

- Excitons in semiconductors

[Kurilovich *et al.*, Phys Ch Ch Phys 22 \(2020\), 24 \(2022\)](#)



[PRE 108, 024133 \(2023\)](#)

[Entropy 23, 131 \(2021\)](#)

[PRR 2, 043088 \(2020\)](#)

Langevin dynamics

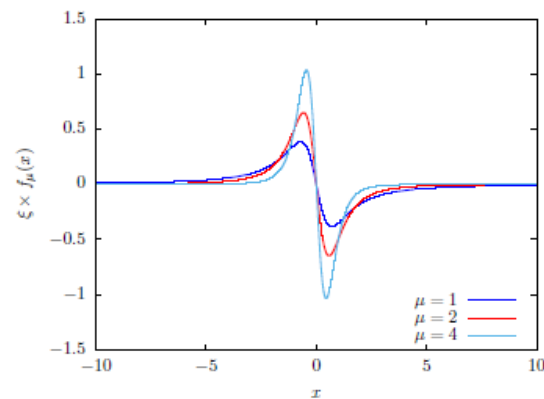
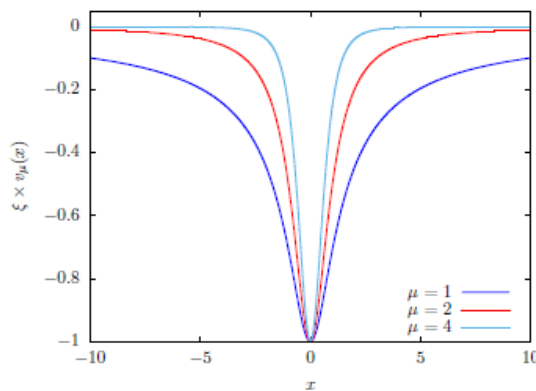
overdamped dynamics of a Brownian particle in 1D

$$\gamma \frac{dx}{dt} = F_\mu(x) + \sqrt{2\gamma k_B T} \eta(t),$$

$\eta(t)$ is a zero-mean Gaussian white noise with $\langle \eta(t)\eta(t') \rangle = \delta(t - t')$, and $F_\mu(x)$ is derived from the (asymptotically flat) potential

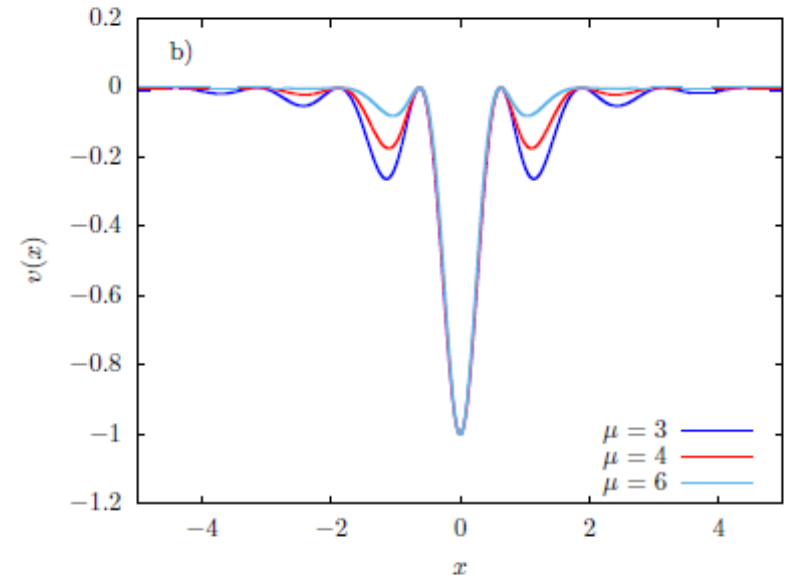
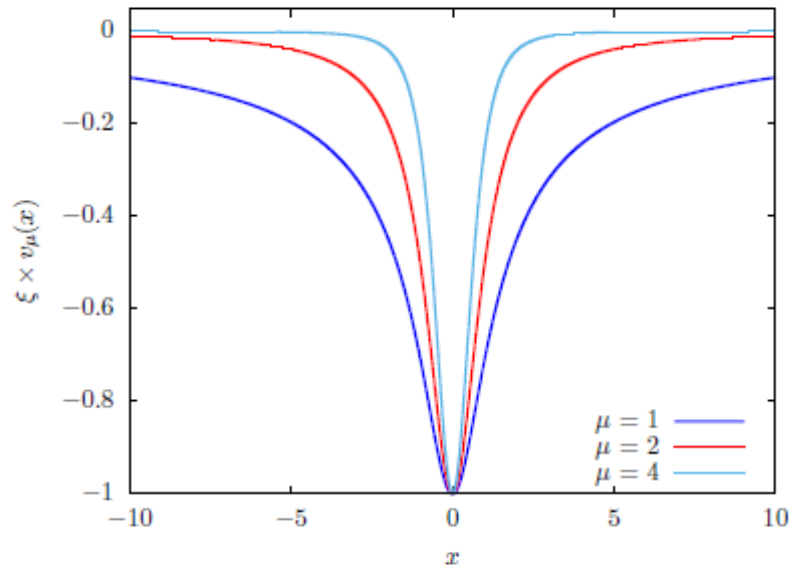
$$V_\mu(x) = -\frac{U_0}{(1 + (x/x_0)^2)^{\frac{\mu}{2}}}$$

$$F_\mu(x) = -V'_\mu$$



Langevin dynamics

asymptotically flat potentials

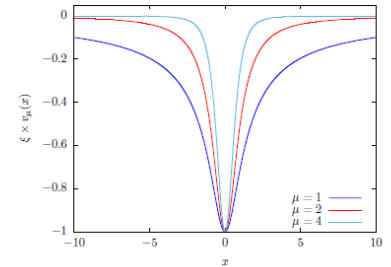


Fokker-Planck approach

for the overdamped dynamics of a Brownian particle in 1D

$$\frac{\partial}{\partial t} P(x, t) = D \left\{ \frac{\partial^2}{\partial x^2} - \frac{\partial}{\partial x} \frac{F_\mu(x)}{k_B T} \right\} P(x, t),$$

$$V_\mu(x) = -\frac{U_0}{(1 + (x/x_0)^2)^{\frac{\mu}{2}}}.$$



where $F_\mu(x)$ is related to the (asymptotically flat) potential

For simplicity, we scale the variables as

$$\frac{x}{x_0} \rightarrow x, \quad -\frac{Dt}{x_0^2} \rightarrow t, \quad \frac{V_\mu(x)}{U_0} \rightarrow v_\mu(x), \quad \frac{k_B T}{U_0} \rightarrow \xi,$$

leading to the reduced FP equation

$$\frac{\partial}{\partial t} P(x, t) = \frac{\partial^2}{\partial x^2} P(x, t) + \frac{1}{\xi} \frac{\partial}{\partial x} \left\{ \frac{\partial v_\mu(x)}{\partial x} P(x, t) \right\}$$

Quasi-equilibrium

If there is a stationary solution, then it must obey

$$\frac{\partial^2}{\partial x^2} P(x, t) + \frac{1}{\xi} \frac{\partial}{\partial x} \left\{ \frac{\partial v_\mu(x)}{\partial x} P(x, t) \right\} = 0,$$

which gives the Boltzmann-Gibbs PDF:

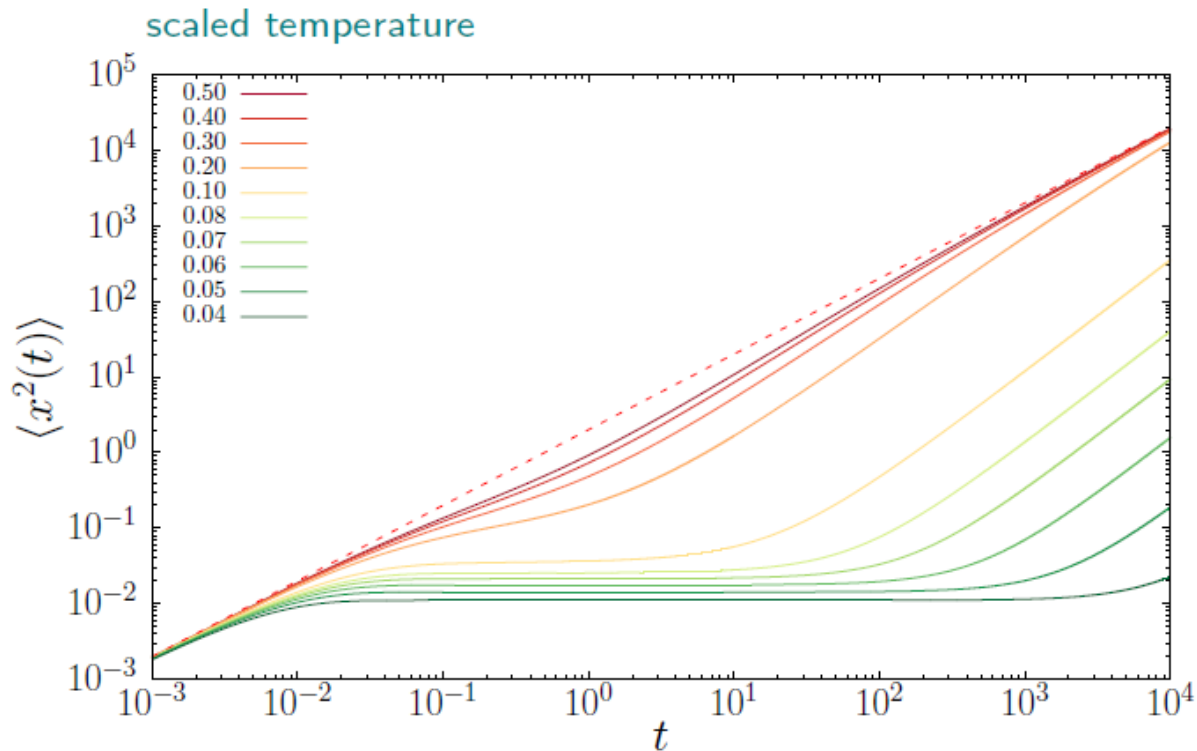
$$P(x) \sim e^{-\frac{v_\mu(x)}{\xi}}.$$

But due to the flatness of the potential, such a distribution is non-normalizable

$$Z = \int_{-\infty}^{\infty} e^{-\frac{v_\mu(x)}{\xi}} dx = \infty.$$

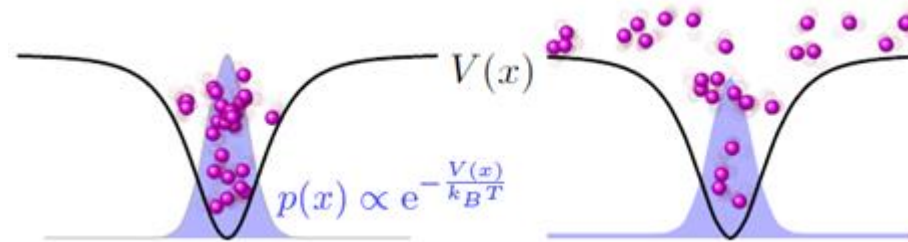
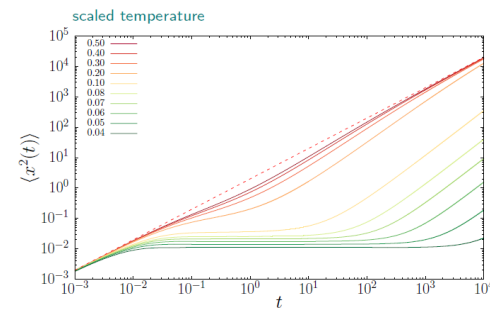
Quasi-equilibrium

Numerically solving the FPE and computing the MSD

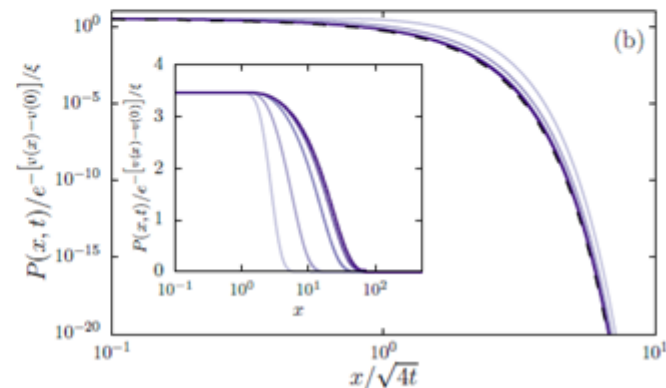
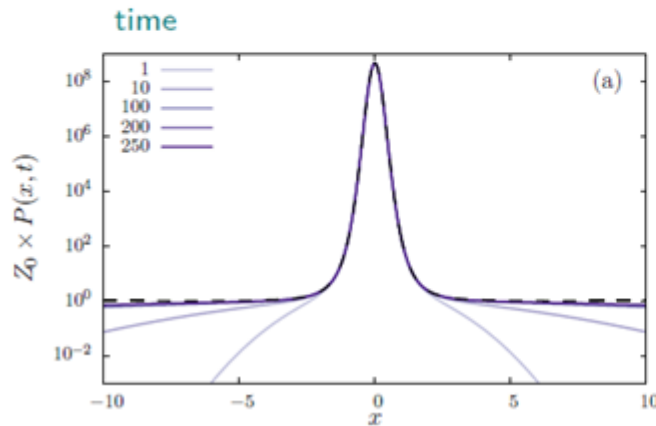


$$v_4(x) = -1/(1+x^2)^2$$

Quasi-equilibrium



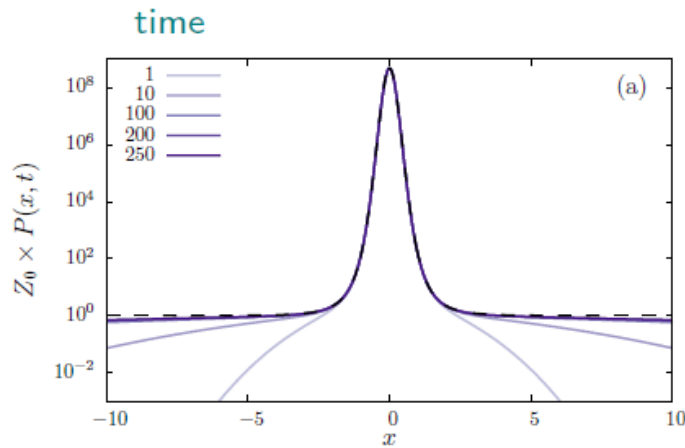
- At early times $P(x, t)$ expands quickly to fill the bottom of the well.
- At intermediate times $P(x, t)$ remains *almost* stationary for small x while continues expanding for large x .
- At very long times, free diffusion.



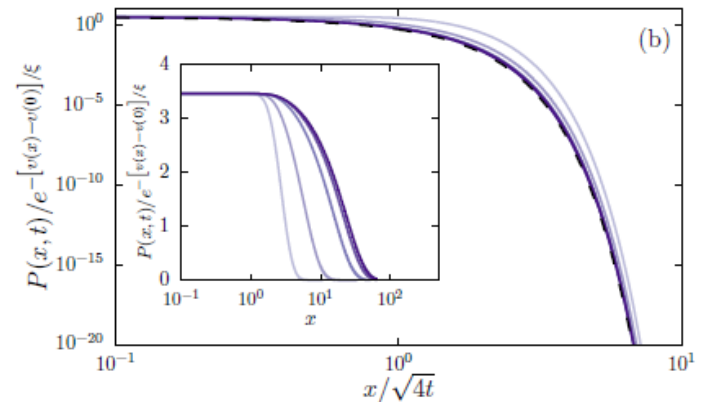
Regularization

First, we consider an approximate solution
(valid for intermediate timescales)

For small x : $P(x, t) \sim e^{-\frac{v_\mu(x)}{\xi}}$



For large x : $P(x, t) \sim \text{erfc}\left(\frac{x}{\sqrt{4t}}\right)$



We can match both solutions to obtain

$$P(x, t) \simeq C e^{-v_\mu(x)/\xi} \text{erfc}(x/\sqrt{4t})$$

Phys Rev Research 2, 043088 (2020)

Expansion in eigenfunctions

To obtain a more formal and complete description of the PDF at intermediate times, we use an expansion in the eigenfunctions of the Fokker-Planck operator.

$$P(x, t) = e^{v(0)/\xi} \left\{ \mathcal{I}(x) N_0^{-1} + \sum_{\{k\}} N_k^{-1} \Psi_k(0) \Psi_k(x) e^{-k^2 t} \right\},$$

The eigenvalue band is continuous with a large contribution arising from values near the zeroth eigenmode.

We find explicitly an approximate result equivalent to our heuristic form

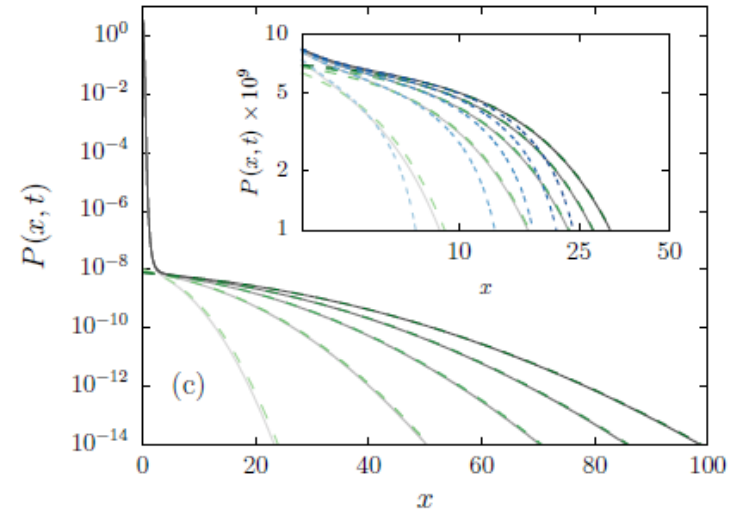
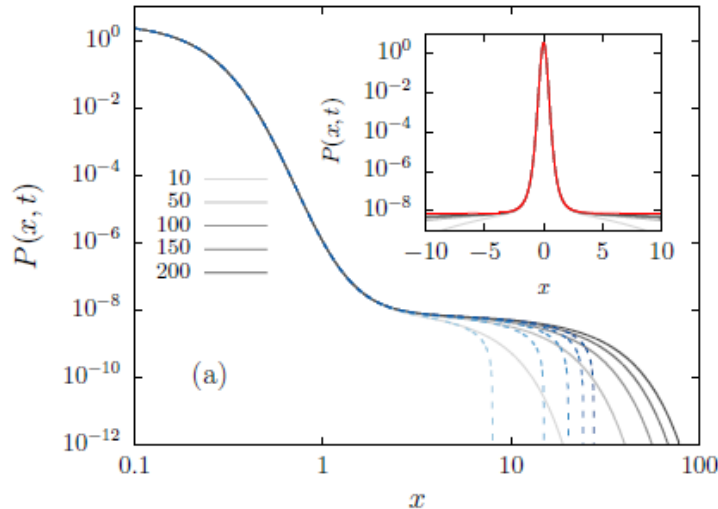
$$P(x, t) \simeq C e^{-v_\mu(x)/\xi} \text{erfc}(x/\sqrt{4t})$$

Entropy 23, 131 (2021)

Expansion in eigenfunctions

$$P^I(x, t) = \frac{e^{-v(x)/\xi}}{2Z_0} \left(1 - \frac{1}{\sqrt{\pi t}} \frac{g^I(x)}{Z_0} \right)$$

$$P^{III}(x, t) = \frac{1}{2Z_0} \operatorname{erfc} \left(\frac{x - \phi}{2\sqrt{t}} \right).$$



This method is very powerful, as it allows us to calculate corrections to the almost time-independent solution.

Entropy 23, 131 (2021)

Regularization

$$P(x, t) \simeq C e^{-v_\mu(x)/\xi} \operatorname{erfc}(x/\sqrt{4t})$$

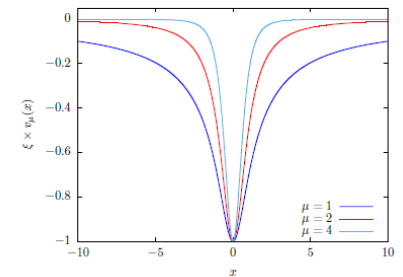
The normalization constant can be evaluated by reorganizing terms

$$\begin{aligned} \frac{1}{2C} &\simeq \int_0^\ell e^{-v(x)/\xi} dx + \int_\ell^\infty \operatorname{erfc}\left(\frac{x}{\sqrt{4t}}\right) dx \\ &\simeq \underbrace{\int_0^\infty (e^{-v(x)/\xi} - 1) dx}_{Z_0/2} - \underbrace{\int_\ell^\infty (e^{-v(x)/\xi} - 1) dx}_R + \int_0^\infty \operatorname{erfc}\left(\frac{x}{\sqrt{4t}}\right) dx \\ &\simeq Z_0/2 + \mathcal{O}(\sqrt{t}) \end{aligned}$$

$$V_\mu(x) = -\frac{U_0}{(1 + (x/x_0)^2)^{\frac{\mu}{2}}}$$

Leading to the regularized partition function ($\mu > 1$)

$$Z_0 = \int_0^\infty (e^{-v(x)/\xi} - 1) dx.$$

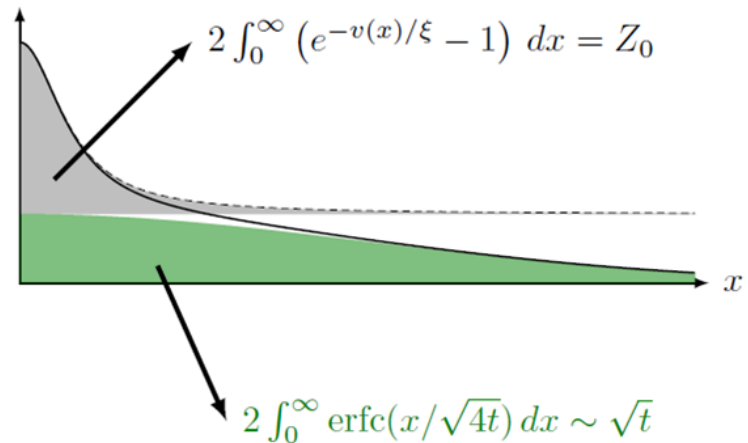
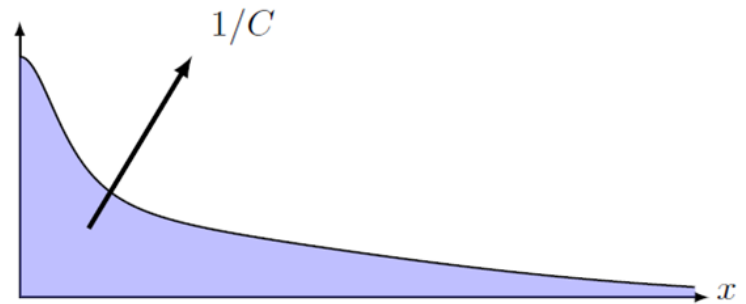


Regularization

$$\frac{1}{2C} \simeq \underbrace{\int_0^\infty (e^{-v(x)/\xi} - 1) dx}_{Z_0/2} - \underbrace{\int_\ell^\infty (e^{-v(x)/\xi} - 1) dx}_R + \int_0^\infty \operatorname{erfc}\left(\frac{x}{\sqrt{4t}}\right) dx$$

$$\simeq Z_0/2 + \mathcal{O}(\sqrt{t})$$

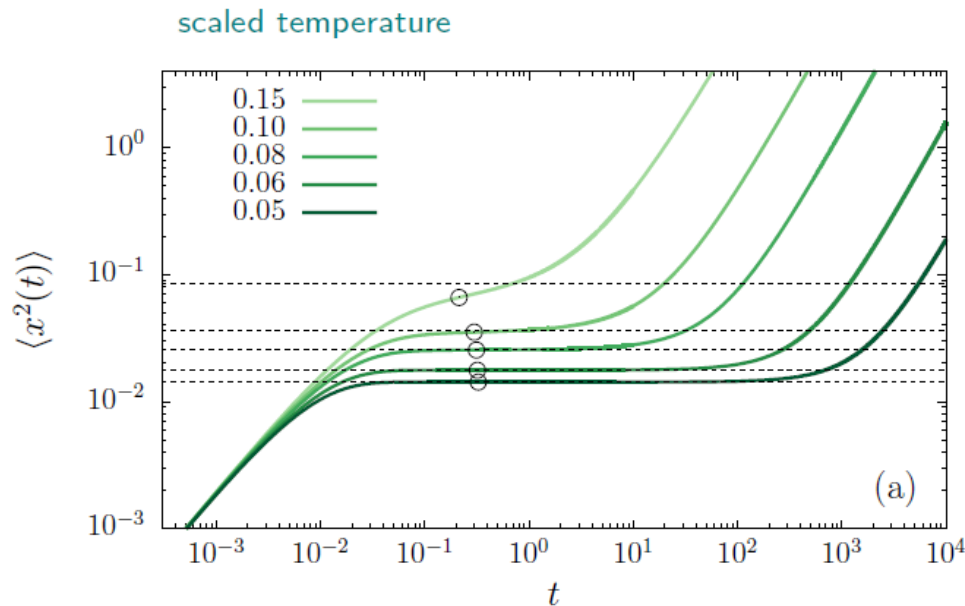
We can visualize the integration as



Regularization

Similarly, we can obtain the quasi-equilibrium MSD ($\mu > 3$)

$$\langle x^2 \rangle_{NQE} = \frac{\int_{-\infty}^{\infty} x^2 (e^{-v(x)/\xi} - 1) dx}{\int_{-\infty}^{\infty} (e^{-v(x)/\xi} - 1) dx}$$



$$v_4(x) = -1/(1 + x^2)^2$$

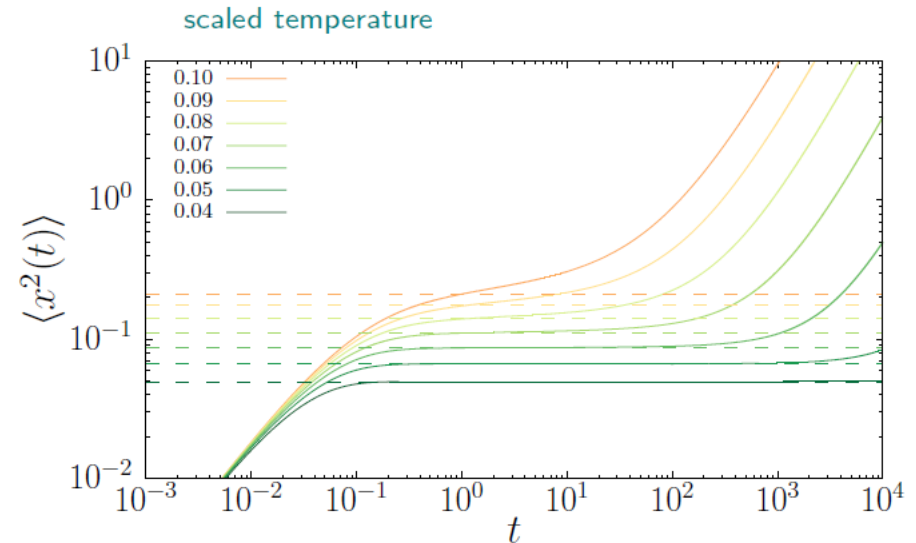
Regularization

We may need to subtract more terms of the exponential to ensure convergence, in other words:

$$Z_K = 2 \int_0^\infty \left(e^{-v(x)/\xi} - \sigma_K(x; \xi) \right) dx, \quad \sigma_K(x; \xi) \equiv \sum_{k=0}^K (-v(x)/\xi)^k / k!.$$

An example where we require more terms, $\mu = 1$ [$-v_1(x) \sim 1/x$]:

$$\langle x^2 \rangle_{NQE} = \frac{\int_{-\infty}^{\infty} x^2 \left(e^{-v_1(x)/\xi} - 1 + \frac{v_1(x)}{\xi} - \frac{v_1^2(x)}{2\xi^2} + \frac{v_1^3(x)}{6\xi^3} \right) dx}{\int_{-\infty}^{\infty} \left(e^{-v_1(x)/\xi} - 1 + \frac{v_1(x)}{\xi} \right) dx}$$

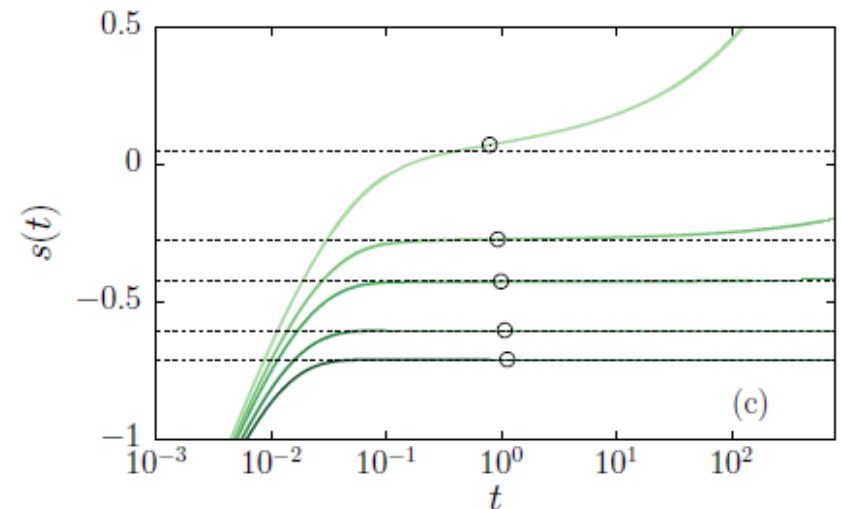
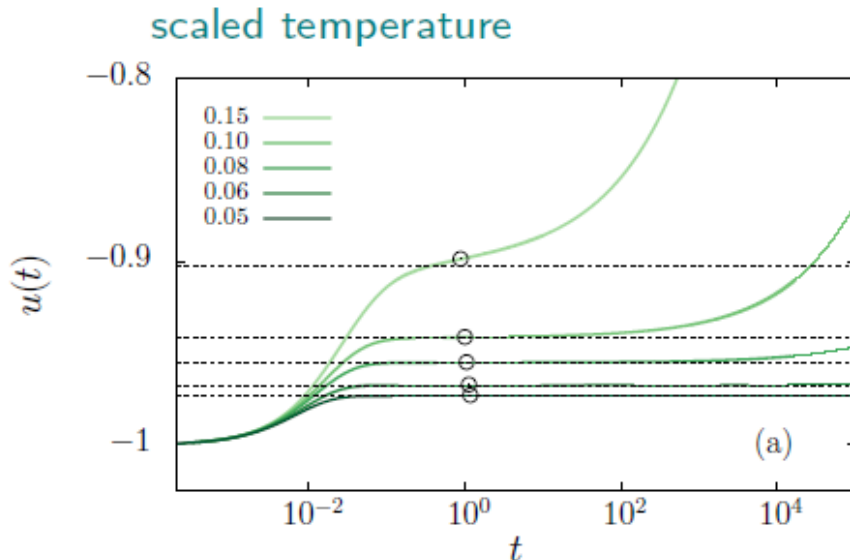


Regularization

Comparison of QE predictions with results obtained from numerical solution

$$u(t) \equiv E(t)/U_0 = \int_{-\infty}^{\infty} v(x)P(x, t)dx,$$

$$s(t) \equiv S(t)/k_B = - \int_{-\infty}^{\infty} \ln (P(x, t)) P(x, t) dx.$$



$$v_4(x) = -1/(1 + x^2)^2$$

Regularization

Using quasi-equilibrium it is possible to recover several relations within Boltzmann-Gibbs statistical mechanical formalism like

energy
$$u_{\text{QE}} = \frac{\int_0^\infty v(x) e^{-v(x)/\xi} dx}{\int_0^\infty (e^{-v(x)/\xi} - 1) dx} \equiv \xi^2 \frac{\partial \ln Z_0}{\partial \xi}$$

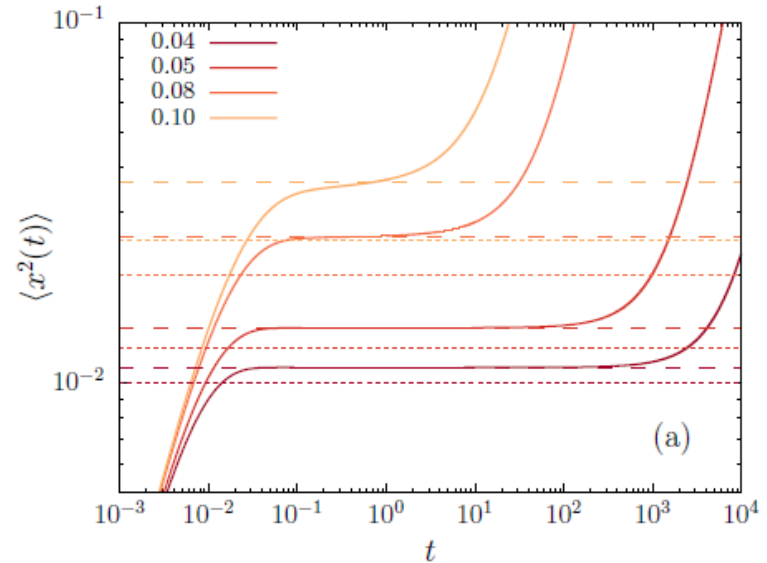
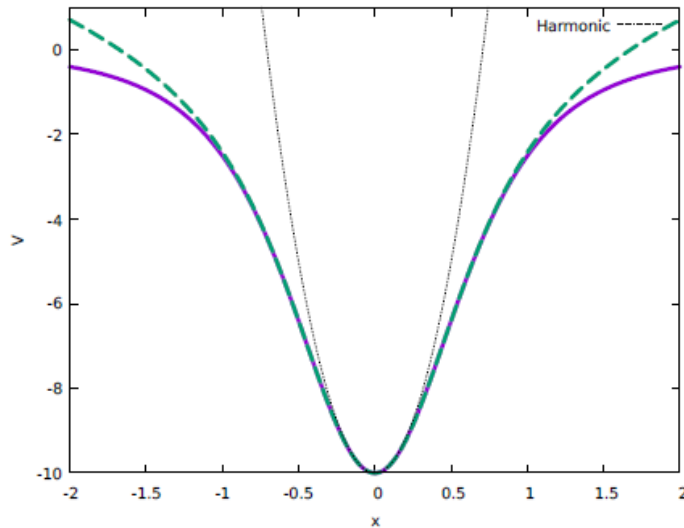
and entropy
$$s_{\text{QE}} = u_{\text{QE}}/\xi - \ln Z_0$$

Regularization

Our regularization corresponds to using the standard BG factor with the

effective potential $v(x) \approx -\xi \log [e^{-v(x)/\xi} - 1]$

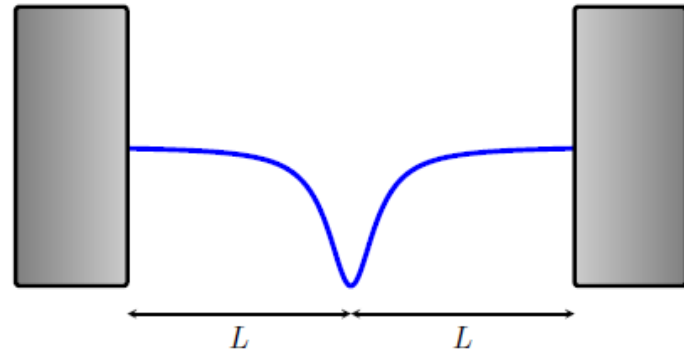
$$\mu = 4, \xi = 0.1$$



This effective potential works in a wider range than the simple low-temperature harmonic approx. for describing the potential at small x while still being confining.

Bounded domain

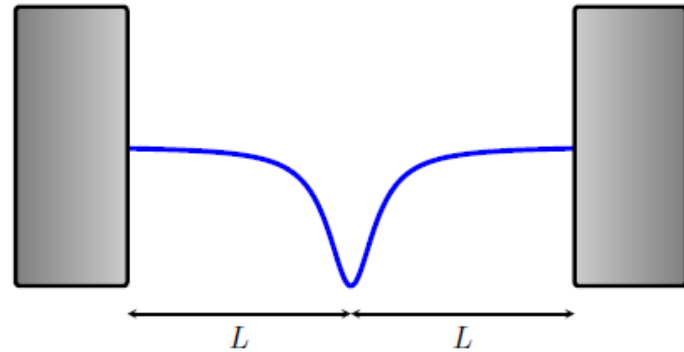
Alternatively, we can place the system in a box of size $2L$ (L is in the x_0 scale). For intermediate box sizes, the partition function becomes L independent.



PRR 2, 043088 (2020)

Bounded domain

Alternatively, we can place the system in a box of size $2L$ (L is in the x_0 scale). For intermediate box sizes, the partition function becomes L independent.

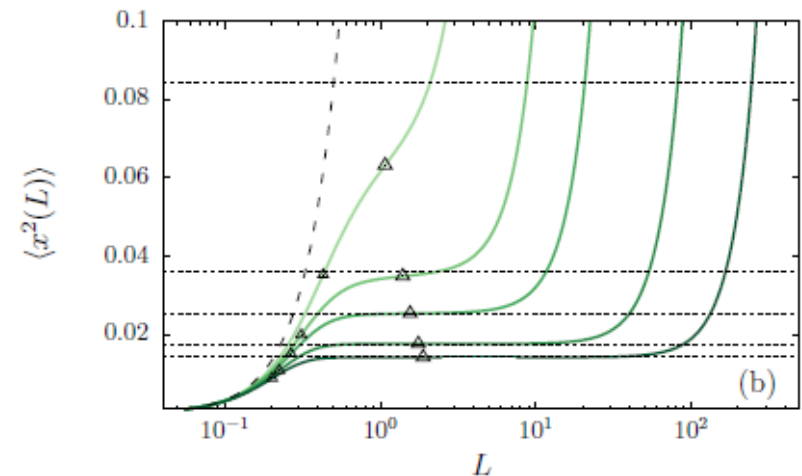
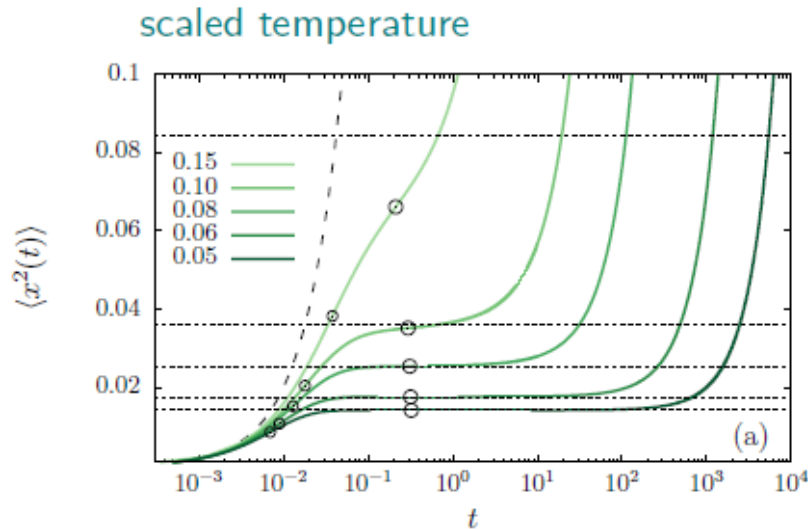
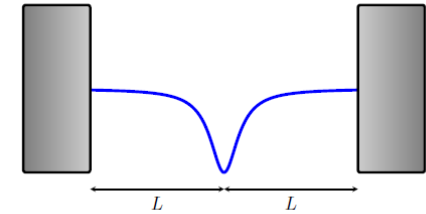


In such approach, for every L the system will be in *true* equilibrium allowing us to evaluate freely

$$Z(L) = 2 \int_0^L e^{-v(x)/\xi} dx, \text{ and}$$

$$P(x) = \frac{1}{Z(L)} e^{-v(x)/\xi}, \text{ for } |x| < L$$

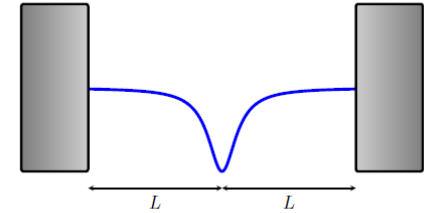
Bounded domain



We can interpret that increasing L is equivalent to allowing the particle to keep diffusing further away from the well.

$$v_4(x) = -1/(1 + x^2)^2$$

Bounded domain



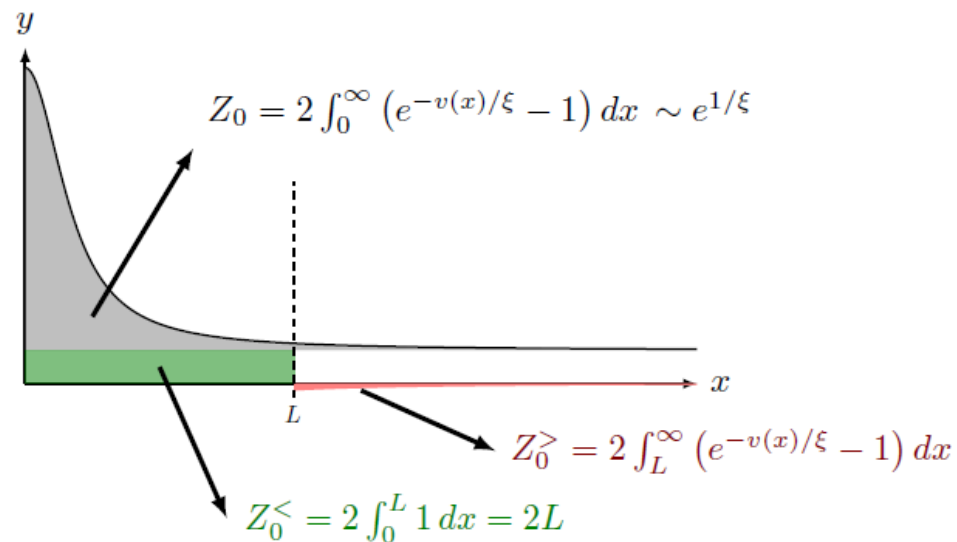
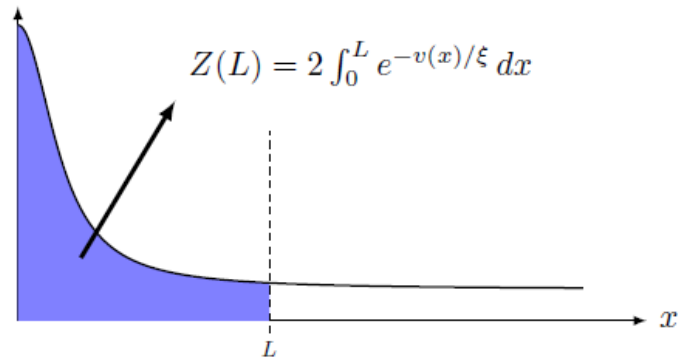
The approach to regularization is the same

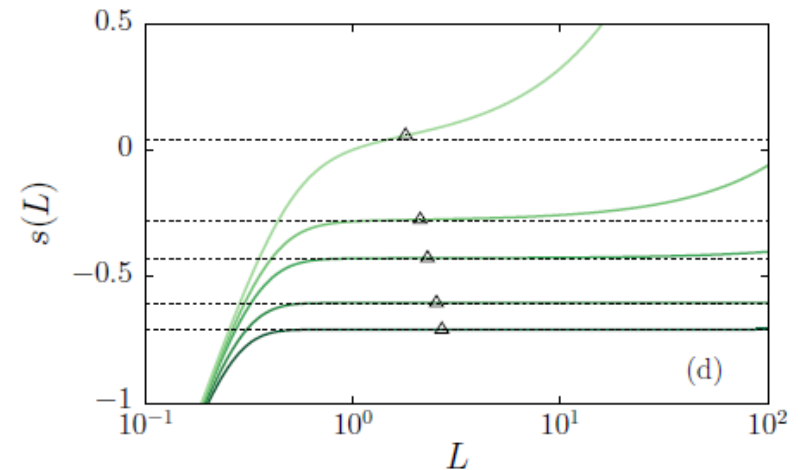
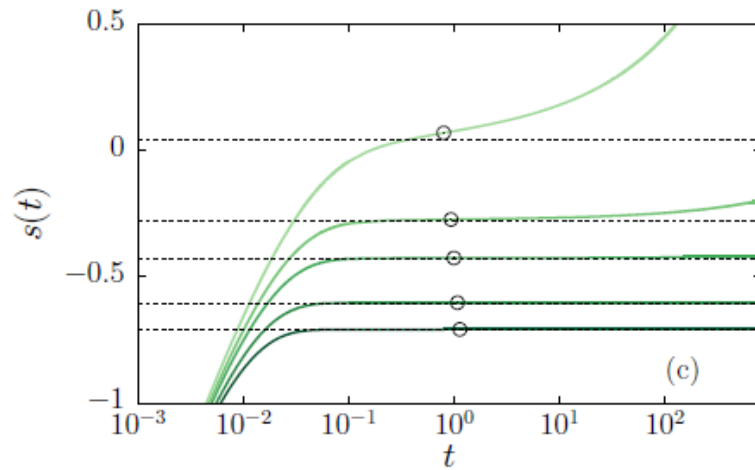
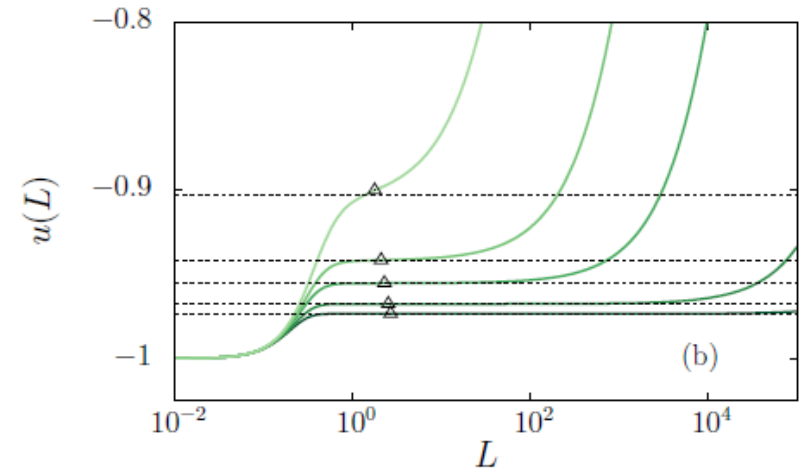
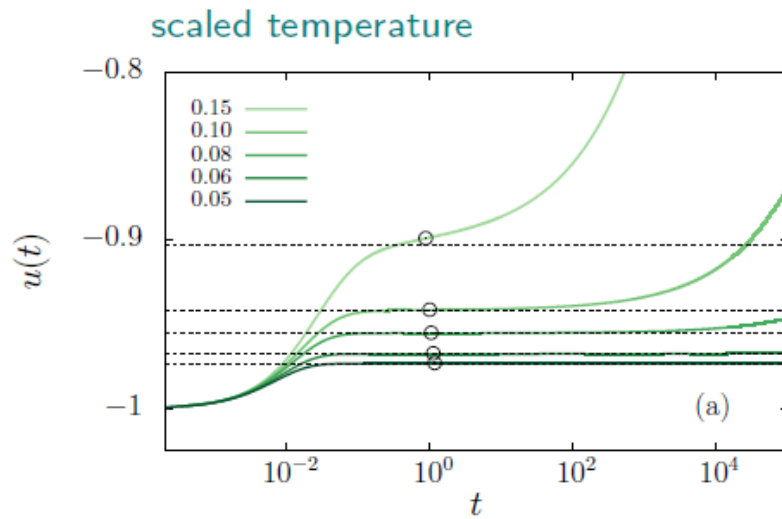
$$Z(L) = 2 \int_0^L \left(e^{-v(x)/\xi} - \sigma_K(x; \xi) \right) dx + 2 \int_0^L \sigma_K(x; \xi) dx.$$

So if we define:

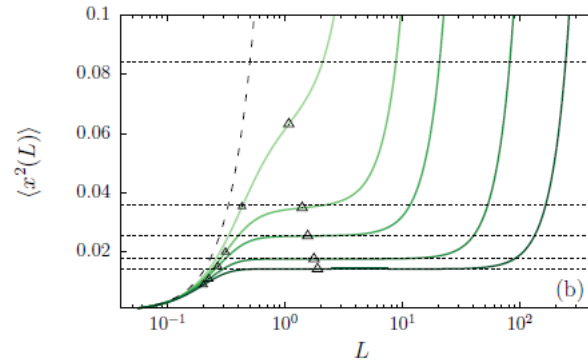
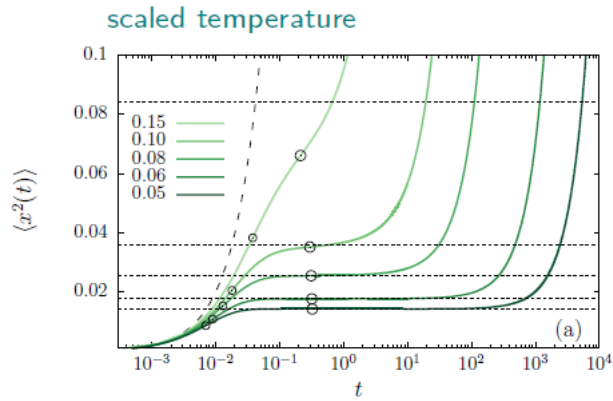
$$\begin{aligned} Z_K &= 2 \int_0^\infty \left(e^{-v(x)/\xi} - \sigma_K(x; \xi) \right) dx \sim e^{1/\xi}, \\ Z_K^>(L) &= -2 \int_L^\infty \left(e^{-v(x)/\xi} - \sigma_K(x; \xi) \right) dx \sim 0, \\ Z_K^<(L) &= 2 \int_0^L \sigma_K(x; \xi) dx \sim 2L. \end{aligned}$$

We can visualize the integration as

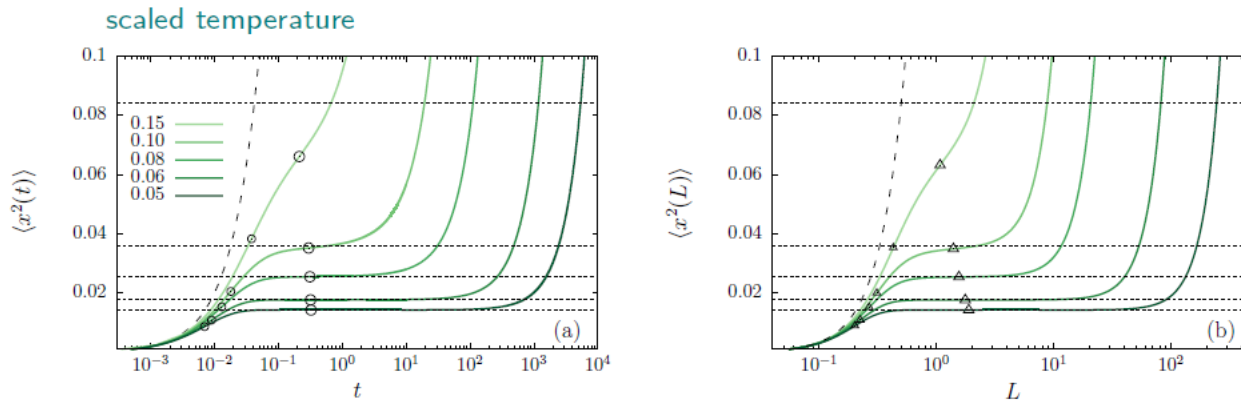




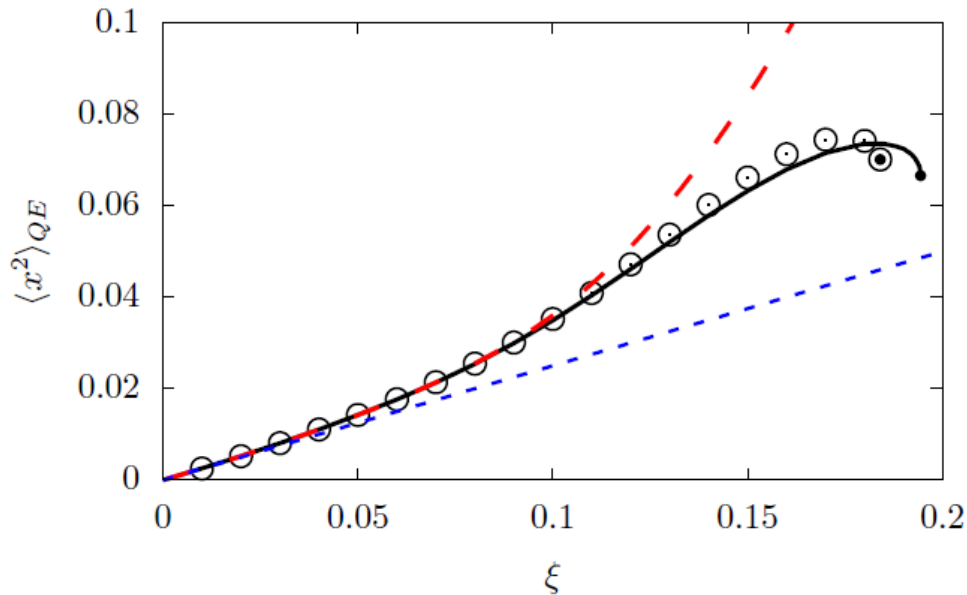
$$v_4(x) = -1/(1+x^2)^2$$



$$\langle x^2 \rangle_{NQE} = \langle x^2(t^*) \rangle = \langle x^2(L^*) \rangle$$



$$\langle x^2 \rangle_{NQE} = \langle x^2(t^*) \rangle = \langle x^2(L^*) \rangle$$

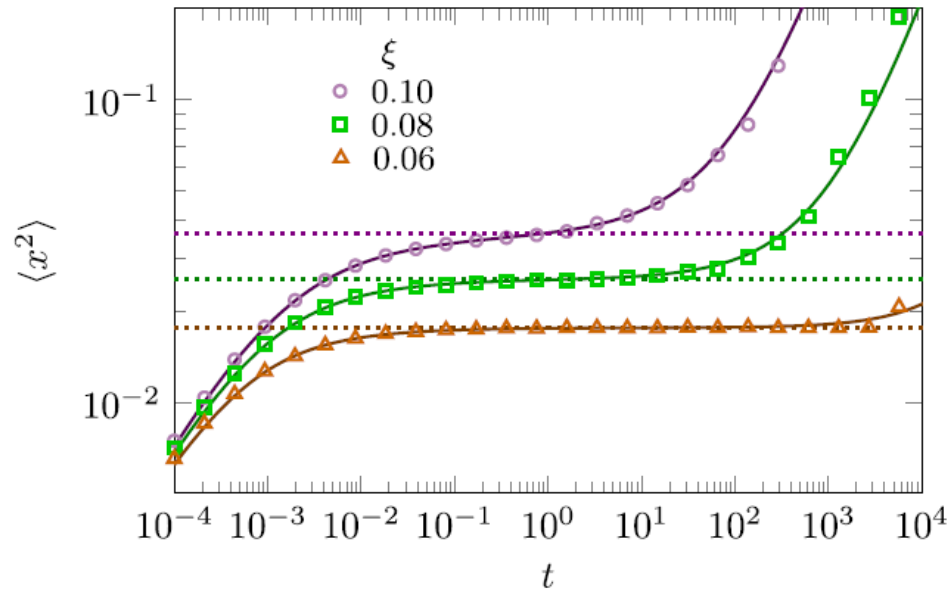


A comparison between the log-inflection in L (black solid line) and in time (circles). Harmonic (blue) and small ξ (red) approxs.

Variant with anomalous diffusion

$$\frac{\partial}{\partial t}P \rightarrow {}^C D_t^\alpha P \equiv \frac{1}{\Gamma(1-\alpha)} \int_0^t \frac{1}{(t-t')^\alpha} \frac{dP}{dt'} dt', \quad \text{for } 0 < \alpha < 1$$

$$\langle (x - \langle x \rangle)^2 \rangle \sim t^\alpha$$



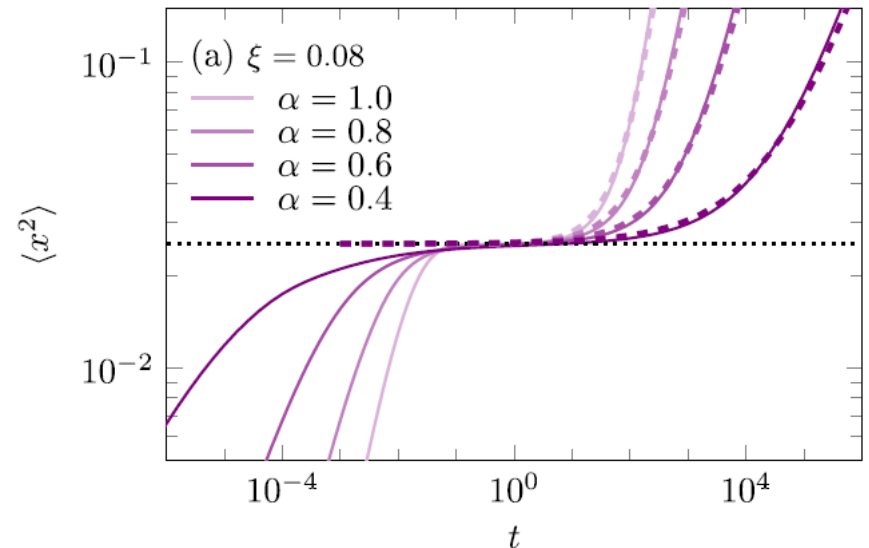
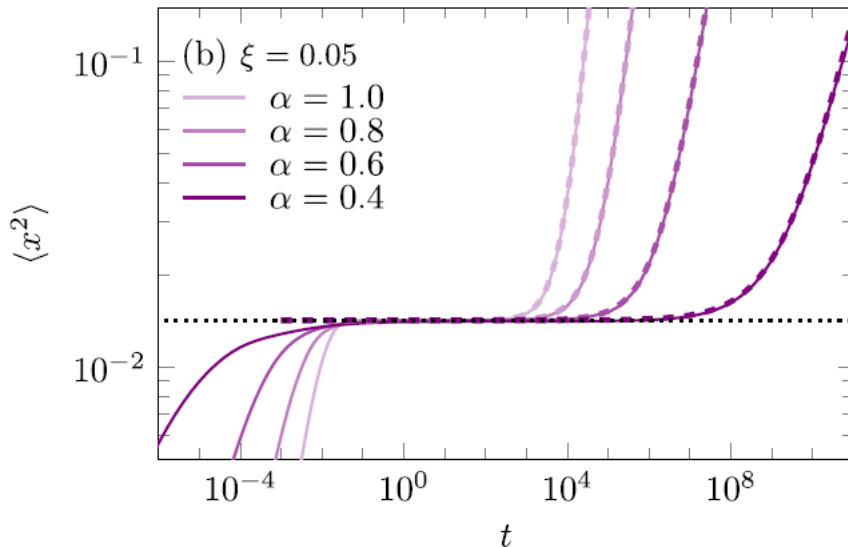
- CTRW (continuous time random walk)
- jumps $p_j = \frac{1}{2}(1 \pm g_j)$,
 - waiting times $\psi(t) = \alpha \tau^{-1} (\tau/t)^{\alpha+1}$, for $t > \tau$

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Variant with anomalous diffusion

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➤ Subdiffusion extends the duration of NNQE

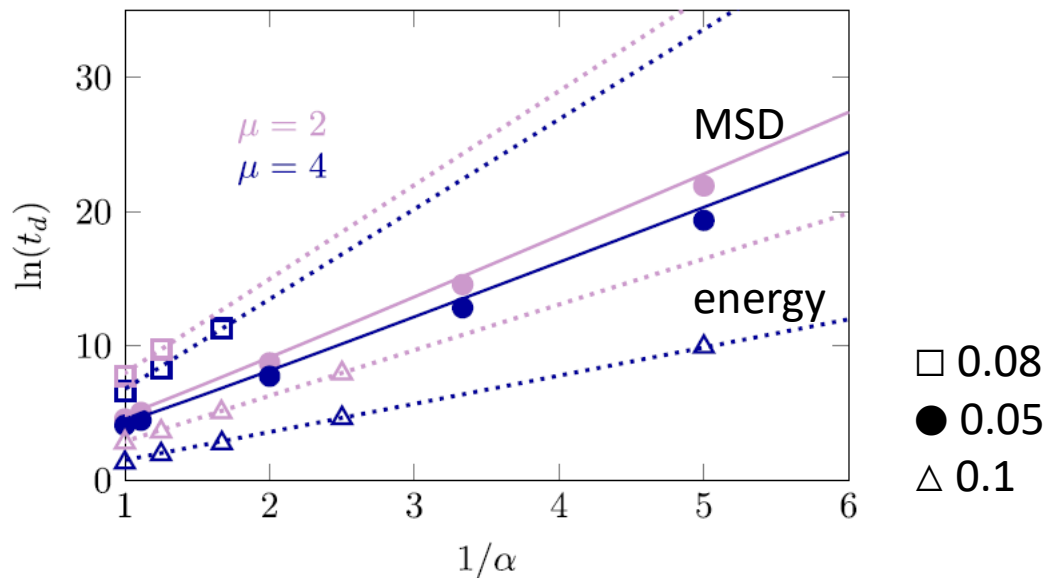


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Variant with anomalous diffusion

$$\frac{\partial}{\partial t} P \rightarrow {}^C D_t^\alpha P \equiv \frac{1}{\Gamma(1-\alpha)} \int_0^t \frac{1}{(t-t')^\alpha} \frac{dP}{dt'} dt', \quad \text{for } 0 < \alpha < 1$$

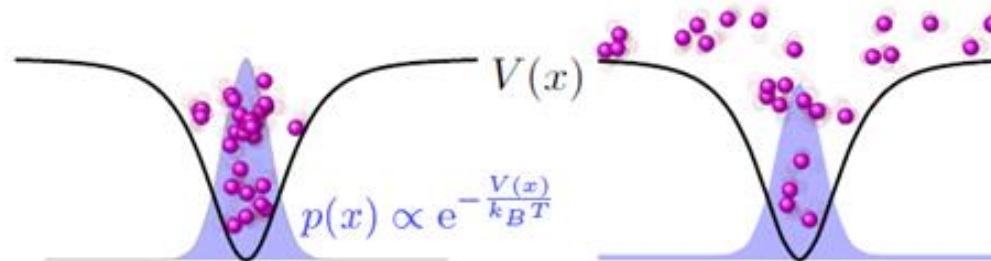
- Subdiffusion extends the duration of NNQE $t_d = t^{**} (\delta/100)^{\frac{2}{3\alpha}} \sim (e^{\frac{1}{5}} \delta/100)^{\frac{2}{3\alpha}}$



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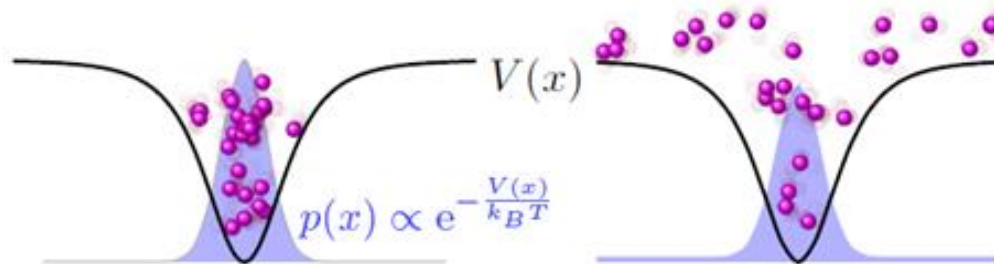
Final remarks

- We have shown that for asymptotically flat potentials, it is still possible to apply the tools from BG-statistical mechanics, using proper regularization.
- The proposed regularization process is simple and capable of accessing the NQE values accurately.
- Rigorous results were obtained through an eigenfunction expansion (corrections to almost time-independent solution).

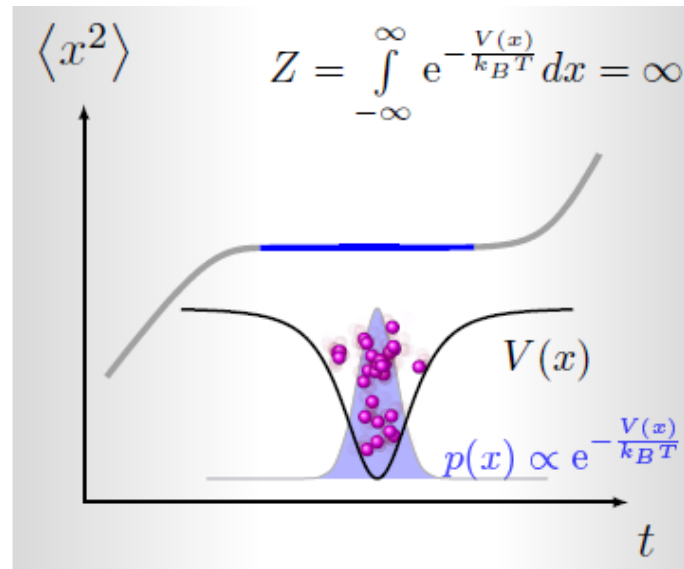


Perspectives

- Relaxation properties, fluctuation-dissipation relations Green–Kubo relations, etc.
- Variant with stochastic resetting.
- We have extended the formalism to fractional dynamics (time derivative), but other variants remain to be done.
- Interacting particles problem.



Thank you!



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Κωνσταντίνο,
Χαρούμενα γενέθλια!
Συγχαρητήρια!
και σας ευχαριστώ!

