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 Construction
 Apple de Maurel
 Apple de Maurel
 Noisy dissipative dynamics

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Motivation:

standard map, diffusion, and dissipation

- Randomly perturbed dissipative dynamics: from invariant attractors over escape from pseudo attractors to hopping between attractors
- Randomly perturbed dissipative standard map: simulation results for escape and diffusive spreading
- Continuous Time Random Walk theory: match simulation results to analytical predictions from stochastic theory



• paradigmatic Hamiltonian dynamical system:

standard map

 $x_{n+1} = x_n + y_n \mod 2\pi$

 $y_{n+1} = y_n + K \sin x_{n+1}$

derived from kicked rot(at)or where $x_n \in \mathbb{R}$ is an angle, $y_n \in \mathbb{R}$ the angular velocity with $n \in \mathbb{N}$ and K > 0 the kick strength

• define diffusion coefficient as

$$D(K) = \lim_{n\to\infty} \frac{1}{n} < (y_n - y_0)^2 >$$

with ensemble average over the initial density $< \ldots >= \int dx \, dy \, \varrho(x, y) \ldots , \, x \in [0, 2\pi) , \, y = y_0 \in [0, 2\pi)$

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Diffusion in the standard map

analytical (Rechester, White, 1980) and numerical studies of parameter-dependent diffusion D(K):



Manos, Robnik, PRE (2014)

- D(K) is highly irregular
- for some *K* there is superdiffusion with mean square displacement $\langle y_n^2 \rangle \sim n^{\gamma}$, $\gamma > 1$ due to accelerator modes

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The dissipative standard map

model damping in the standard map by $x_{n+1} = x_n + y_n \mod 2\pi$ $y_{n+1} = (1 - \nu)y_n + f_0 \sin x_{n+1}$ with $\nu \in [0, 1]$:



Feudel, Grebogi, Hunt, Yorke, PRE (1996) • islands in phase space for $\nu = 0$ (left) become coexisting attractors (right): 150 found for $\nu = 0.02$, $f_0 = 4$ • no long-time diffusion: points converge onto attractors



Question: What happens to dissipative deterministic dynamics under random perturbations?

Consider the dissipative standard map with additive noise:

 $x_{n+1} = x_n + y_n + \epsilon_{x,n} \mod 2\pi$ $y_{n+1} = (1-\nu)y_n + f_0 \sin x_{n+1} + \epsilon_{y,n}$

with iid random variables $\epsilon_n = (\epsilon_{x,n}, \epsilon_{y,n})$ drawn from uniform distribution bounded by $||\epsilon_n|| < \xi$ of noise amplitude ξ

perturbed dynamics:





Consequences of the random perturbations:

• beyond a noise threshold $\xi \ge \xi_0$ the attracting sets $W^S(\Lambda_i)$ lose their stability due to holes



- the (invariant) attractors become (quasi-invariant) pseudo attractors from which there is noise-induced escape
- the noise induces a hopping process between all coexisting pseudo attractors

Diffusion in randomly perturbed dissipative dynamics

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Intermittency and stickingen								

Intermittency and stickiness

the resulting perturbed dissipative dynamics is intermittent:



 $f_0 = 4 \;,\; \xi = 0.06 \;,\; \nu = 0.002$

• stickiness to pseudo attractors measured by criterium that maximal eigenvalue of the Jacobian matrix along orbit < 1

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Escape time distribution							

probability distributions P(t) of escape times t from pseudo attractors computed by using eigenvalue criterium (and a Markov assumption by averaging over all non-uniform pseudo attractors):



dissipation $\nu = 0.002$ with different noise strength ξ

- transition from power law (stickiness) to exponential
- transition takes longer when $\xi \rightarrow 0$

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Diffusion							

probability distribution function $P_n(y)$ for position y_n at different time steps *n*:



- there is Gaussian-like diffusive spreading up to n < 1000
- localization trivvially due to boundedness of pseudo attractors

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Mean square displacement

mean square displacement $\langle y_n^2 \rangle$ for position y_n and different noise amplitudes ξ at $\nu = 0.002$:



- transient subdiffusion $\langle y_n^2 \rangle \sim n^{\gamma}$ up to n < 1000
- only small variation of the subdiffusive exponent $0.85 < \gamma < 0.95$ for different ξ

Continuous time random walk theory

reproduce simulation results by **CTRW theory** (Montroll, Weiss, Scher, 1973): define stochastic process by master equation with *waiting time distribution* w(t) and *jump distribution* $\lambda(x)$

$$\varrho(\mathbf{x},t) = \int_{-\infty}^{\infty} d\mathbf{x}' \lambda(\mathbf{x}-\mathbf{x}') \int_{0}^{t} dt' \ w(t-t') \ \varrho(\mathbf{x}',t') + (1-\int_{0}^{t} dt' \ w(t')) \delta(\mathbf{x})$$

structure: jump + no jump for points starting at (x, t) = (0, 0)Fourier-Laplace transform yields Montroll-Weiss eqn (1965)

$$\hat{\hat{\varrho}}(k,s) = rac{1- ilde{w}(s)}{s} rac{1}{1-\hat{\lambda}(k) ilde{w}(s)}$$

with mean square displacement $\langle x^2(s) \rangle = -\frac{\partial^2 \hat{\varrho}(k,s)}{\partial k^2}$

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CTRW theory predicts that solving the MW eqn. for a power law waiting time distribution $w(t) \sim t^{-(\gamma+1)}$ with jump distribution $\lambda(x) = \delta(|x| - 1)$ yields $\langle x^2(t) \rangle \sim t^{\gamma}$



for $\nu = 0.002$, $\xi = 0.06$ we have $\langle y_n^2 \rangle \sim n^{\gamma}$ with $\gamma \simeq 0.95$

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CTRW theory and escape time distribution



the dashed red line represents the CTRW theory prediction of $P(t) \sim t^{-1.95}$ corresponding to $< y_n^2 > \sim n^{0.95}$

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CTRW theory and position pdf

CTRW theory also predicts a stretched exponential position pdf, here: $P_n(y) \sim \exp(-cx^{2/(2-\gamma)})$



green lines represent the CTRW theory pdf for $\gamma = 0.95$: corrects the mismatch to Gaussian in the tails

Diffusion in randomly perturbed dissipative dynamics

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- **central theme:** study of *diffusion generated by randomly perturbing dissipative deterministic dynamics*
- main result: for the dissipative standard map non-hyperbolic stickiness to pseudo attractors under random perturbations generates
 - power law escape time distributions and
 - stretched exponential position distributions leading to
 - subdiffusion

simulation results consistently explained by CTRW theory

• **outlook:** similar phenomena in other randomly perturbed deterministic dynamical systems?

reference:

Christian S. Rodrigues et al., submitted (soon on arXiv)