

# Chaotic diffusion in randomly perturbed dynamical systems

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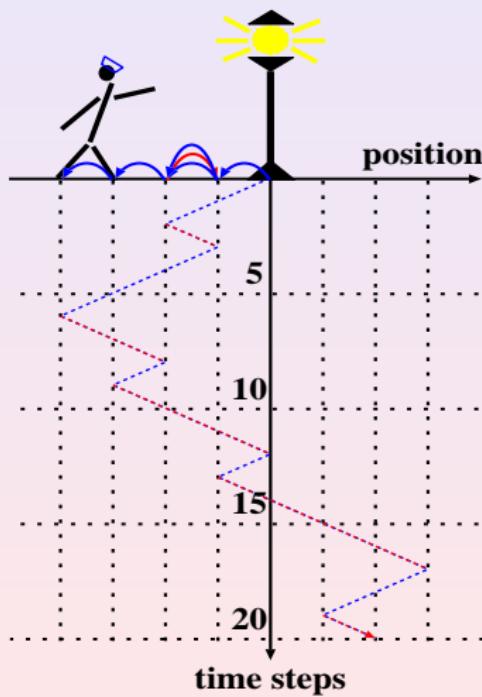


# Outline

- 1 **Motivation:**  
random walk, chaotic diffusion and fractal diffusion coefficients
- 2 **Chaotic diffusion and random perturbations:**  
four different types of perturbations; computer simulations in comparison to simple analytical approximations
- 3 **Theoretical approximations:**  
derivations for chaotic maps explaining transitions between deterministic and stochastic diffusion

# The drunken sailor at a lamppost

**random walk** in one dimension (K. Pearson, 1905):



- steps of **length  $s$**  with probability  $p(\pm s) = 1/2$  to the **left/right**
- single steps *uncorrelated*: **Markov process**
- define diffusion coefficient as

$$D := \lim_{n \rightarrow \infty} \frac{1}{2n} \langle (x_n - x_0)^2 \rangle_\varrho$$

with discrete time step  $n \in \mathbb{N}$  and average over the initial density  $\langle \dots \rangle_\varrho := \int dx \varrho(x) \dots$  of positions  $x = x_0, x \in \mathbb{R}$

- for **sailor**:  $D = s^2/2$

# A deterministic random walk

study **diffusion** on the basis of **dynamical systems theory**

piecewise linear deterministic map

$$M_a(x) = \begin{cases} ax, & 0 < x \leq \frac{1}{2} \\ ax + 1 - a, & \frac{1}{2} < x \leq 1 \end{cases}$$

lifted onto the real line by

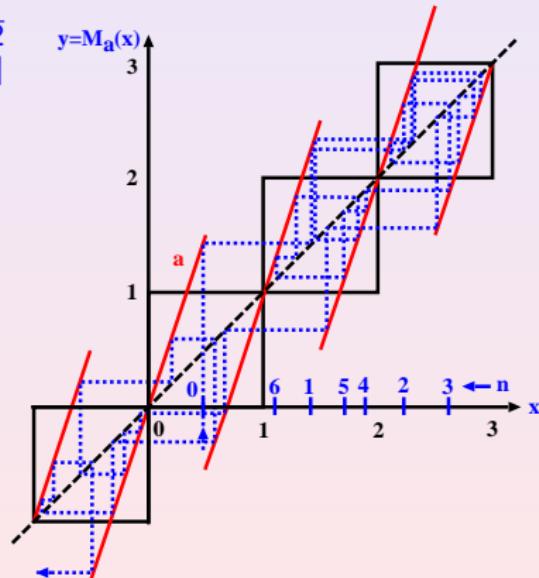
$$M_a(x+1) = M_a(x) + 1$$

with control parameter  $a \geq 2$

equation of motion:

$$x_{n+1} = M_a(x_n)$$

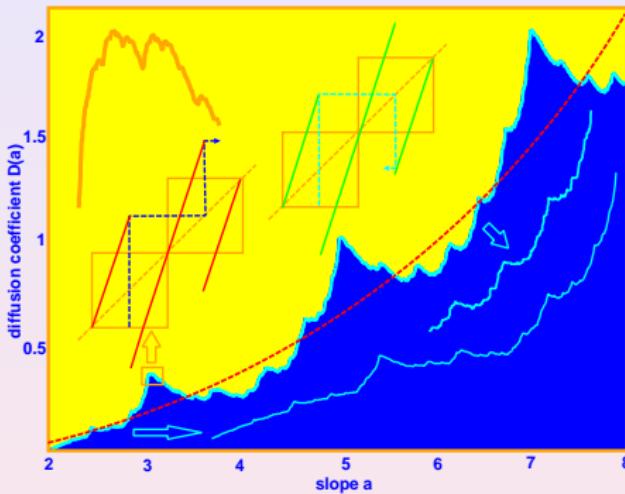
Lyapunov exponent  $\lambda = \ln a > 0$ :  
map is **chaotic**



Grossmann/Geisel/Kapral (1982)

# Fractal diffusion coefficient

$D(a)$  exists and is a **fractal function of the control parameter**



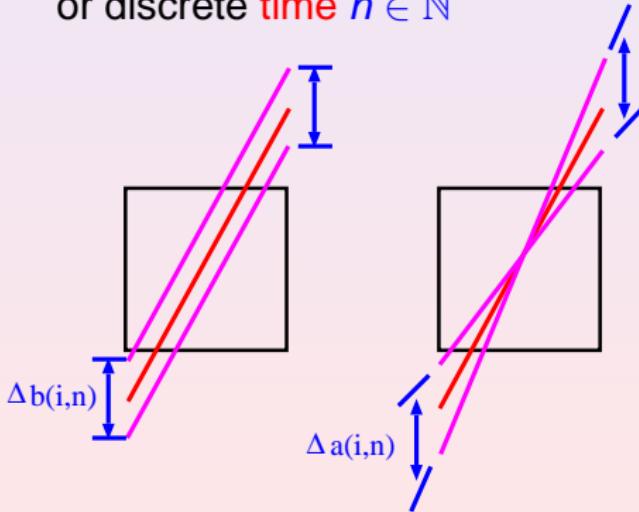
- exact results: R.K., Dorfman (1995); Groeneveld, R.K. (2002); Cristadoro (2006); cp. with random walk
- fractality from topological instability under parameter variation
- proof:  $D(a)$  is Lipschitz continuous up to quadratic logarithmic corrections (Keller, Howard, R.K., 2008)

# Deterministic diffusion and random perturbations

What happens to  $D(a)$  by imposing **random perturbations** onto the map? Four basic types:

$$M_a(x) = (a + \Delta a(i, n))x + \Delta b(i, n), \quad i - 0.5 \leq x < i + 0.5$$

with iid **random shifts** or **random slopes** in discrete **space**  $i \in \mathbb{Z}$   
or discrete **time**  $n \in \mathbb{N}$



- (1)  $\Delta b(i)$  : quenched shifts
- (2)  $\Delta a(i)$  : quenched slopes
- (3)  $\Delta a(n)$  : noisy slopes
- (4)  $\Delta b(n)$  : noisy shifts

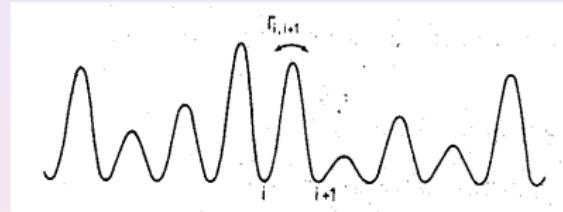
# Deterministic diffusion and quenched disorder

(1): quenched random shifts  $\Delta b(i)$ ; Radons (1996ff):

Golosov localization/Sinai diffusion: no normal diffusion

(2): quenched random slopes  $\Delta a(i)$

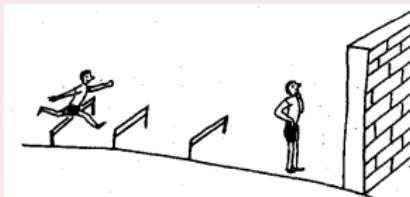
random walk in disordered lattices like random barrier model



transition rates  $\Gamma_{i,i+1} = \Gamma_{i+1,i} \equiv \Gamma_i$ ; exact diffusion coefficient

$d = \langle 1/\Gamma \rangle_\Gamma^{-1} s^2$  Alexander et al (1981), Derrida (1983), ...

disorder average  $\langle 1/\Gamma \rangle_\Gamma = 1/N \sum_{i=0}^N 1/\Gamma_i$ , distance of sites  $s$



Haus, Kehr (1987)

# Quenched slopes: an educated guess

apply formula to **deterministic diffusion with quenched slopes**:

rewrite  $d = \langle 1/\Gamma \rangle_{\Gamma}^{-1} s^2 = \langle 1/d(s, \Gamma) \rangle_{\Gamma}^{-1}$  with  $d(s, \Gamma) = \Gamma s^2$

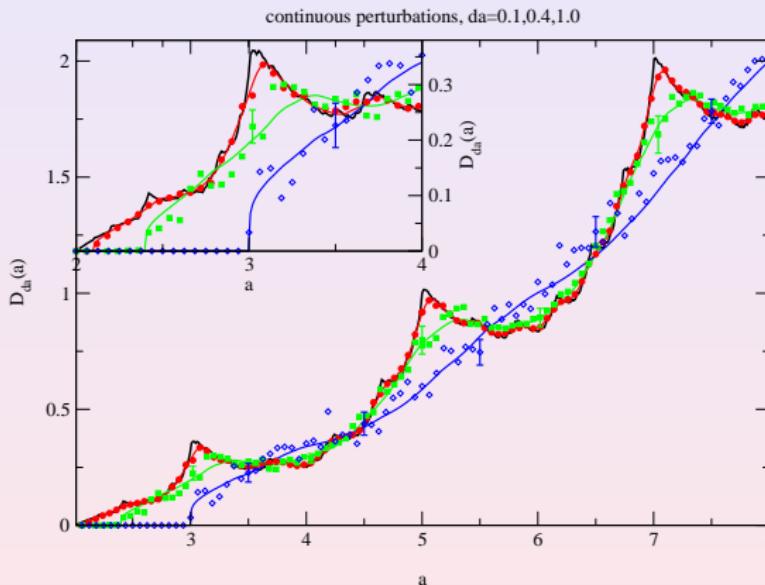
but for the map  $M_a(x)$  we have  $d(s, \Gamma) = d(s, \Gamma(s))$

**approximation:** identify  $d(s, \Gamma(s))$  with  $D(a + \Delta a)$ , where  $D(\cdot)$  is the **unperturbed deterministic diffusion coefficient**  $D(a)$  with random variable  $\Delta a$  sampled from pdf  $\chi_{da}(\Delta a)$  at perturbation strength  $da \geq 0$ ,  $-da \leq \Delta a \leq da$

$$\Rightarrow D_{\text{app}}(a, da) = \left[ \int_{-da}^{da} d(\Delta a) \frac{\chi_{da}(\Delta a)}{D(a + \Delta a)} \right]^{-1}$$

# Quenched slopes: simulations $D_{da}(a)$

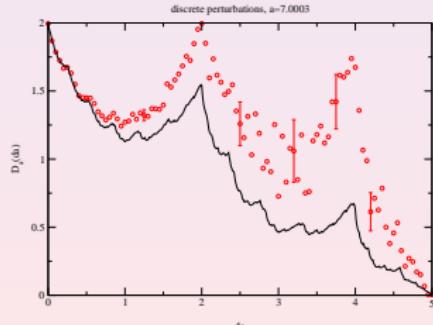
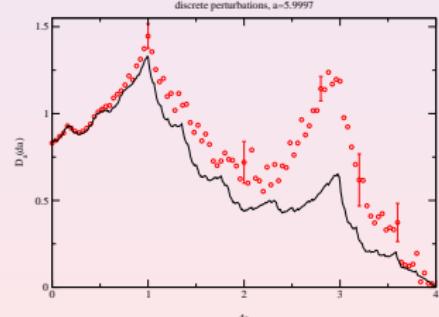
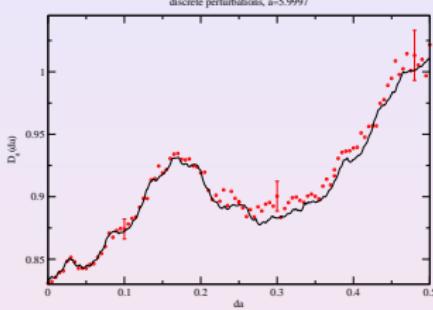
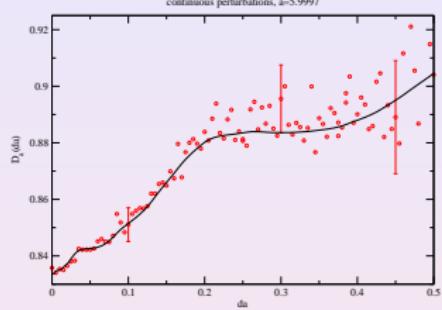
$\Delta a(i)$  uniformly distributed on  $[-da, da]$ :



- **oscillatory structure** persists under small perturbations
- **dynamical phase transition** for small parameters

# Quenched slopes: simulations $D_a(da)$

$\Delta a(i)$  uniformly and  $\delta$ -distributed on  $[-da, da]$ :

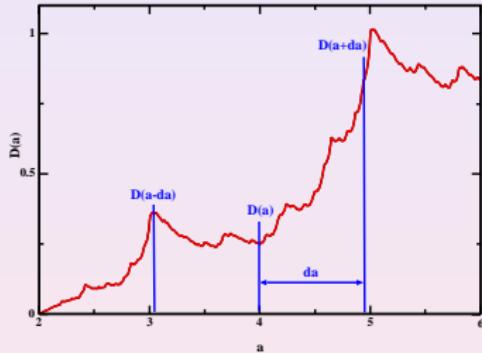


- excellent match theory and simulations for small  $da$
- multiple suppression and enhancement with  $da$

# Deterministic diffusion and noise

approximate the diffusion coefficient by the unperturbed  $D(a)$   
(cp. to Geisel et al. (1982), Reimann (1994ff)):

**basic idea** for slopes with iid dichotomous noise  $\pm da$ :



$$D_{app}(a, da) = (D(a - da) + D(a + da))/2$$

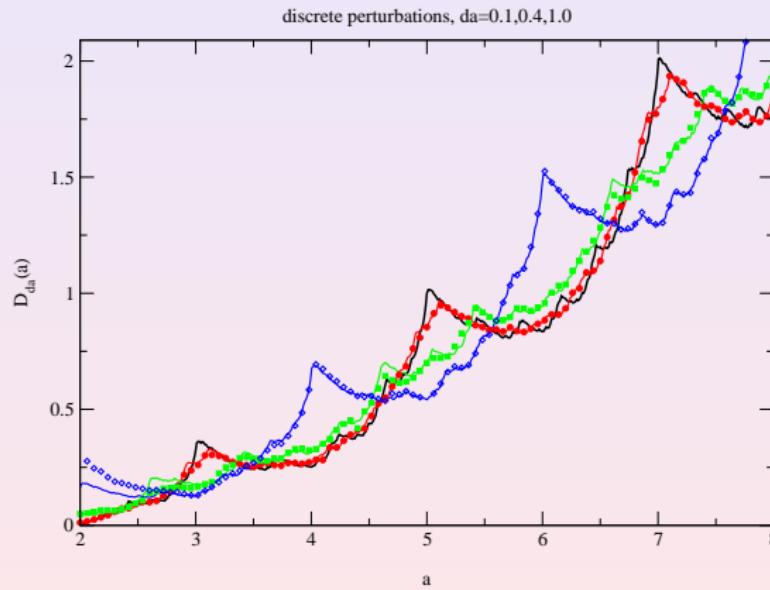
for a general disorder distribution  $\chi_{da}(\Delta a)$

$$D_{app}(a, da) = \int_{-da}^{da} d(\Delta a) \chi_{da}(\Delta a) D(a + \Delta a)$$

- cp. to quenched diffusion formula expanded for  $da \rightarrow 0$

# Noisy slopes: simulations of $D_{da}(a)$

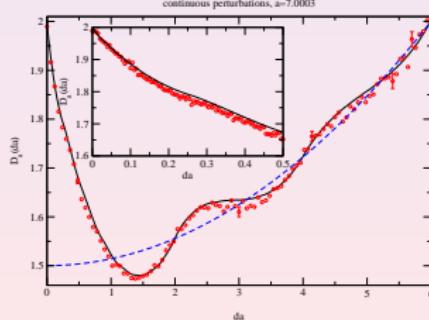
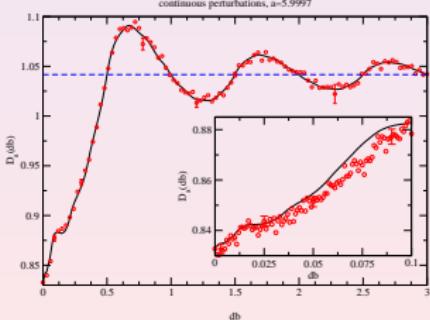
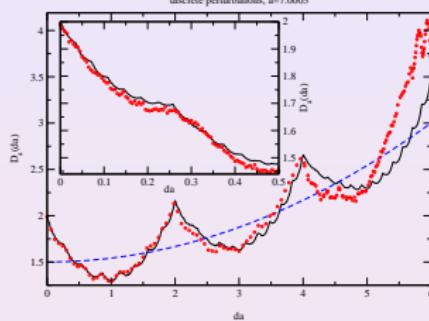
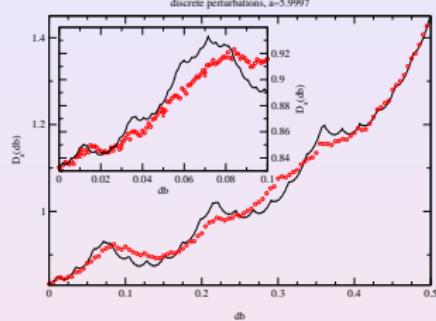
$\Delta a(n)$   $\delta$ -distributed with  $\pm da$ :



- shift of fractal structure under perturbations

# Noisy shifts and slopes: simulations of $D_a(db)$ , $D_a(da)$

$\Delta a(n)$  and  $\Delta b(n)$   $\delta$ - and uniformly distributed on  $[-da, da]$ :



- transitions from deterministic to stochastic diffusion by suppression and enhancement

# Theoretical aspects: precise definition of $D(a, da)$

Let  $\Delta_n$  be iid random variables with pdf  $\chi_d(\Delta_n)$  of perturbation strength  $d \geq 0$ . Let  $\varrho(x)$  be the initial pdf of points  $x$ . Then

$$D(a, d) = \lim_{n \rightarrow \infty} \frac{1}{2n} \left( \langle x_n^2 \rangle_{\varrho, \chi_d} - \langle x_n \rangle_{\varrho, \chi_d}^2 \right)$$

with

$$\begin{aligned} \langle x_n^k \rangle_{\varrho, \chi_d} &= \int dx \int d(\Delta_0) d(\Delta_1) \dots d(\Delta_{n-1}) \\ &\quad \varrho(x) \chi_d(\Delta_0) \chi_d(\Delta_1) \dots \chi_d(\Delta_{n-1}) x_n^k \end{aligned}$$

special case: **noisy slopes** as an example (wlog),

$$d = da, \Delta_n = \Delta a_n \Rightarrow \langle x_n \rangle_{\varrho, \chi_d} = 0$$

# Deriving approximations in terms of the exact $D(a)$

Let  $\Delta a_n$  be uniformly distributed in  $[-da, da]$  and  $\Delta a = \Delta a_0$ .

It holds:  $\boxed{\Delta a_{n-1} = \Delta a + \epsilon, -2da \leq \epsilon \leq 2da}$

notation:  $x_{n,a+\Delta a_{n-1}} = M_{a+\Delta a_{n-1}}(x_{n-1})$

**step 1:**  $da \ll 1 \Rightarrow \epsilon \ll 1 \Rightarrow \Delta a_{n-1} \simeq \Delta a$

$$\begin{aligned} \langle x_n^2 \rangle_{\varrho, \chi_{da}} &= \int dx \int d(\Delta a) d(\Delta a_1) \dots d(\Delta a_{n-1}) \\ &\quad \rho_0(x) \chi_{da}(\Delta a) \chi_{da}(\Delta a_1) \dots \chi_{da}(\Delta a_{n-1}) x_{n,a+\Delta a_{n-1}}^2 \\ &= \int dx \int d(\Delta a) \varrho(x) \chi_{da}(\Delta a) x_{n,a+\Delta a}^2 \end{aligned}$$

**step 2:** exchange time limit with integration

$$\begin{aligned} D_{app}(a, da) &= \lim_{n \rightarrow \infty} \langle x_n^2 \rangle_{\varrho, \chi_{da}} / (2n) \\ &= \int d(\Delta a) \chi_{da}(\Delta a) \lim_{n \rightarrow \infty} \int dx \varrho(x) x_{n,a+\Delta a}^2 / (2n) \\ &= \int d(\Delta a) \chi_{da}(\Delta a) D(a + \Delta a, 0) \end{aligned}$$

# Validity of this approximation

**note:**

This approximation needs to be handled with much care!

- does not work for **quenched shifts**
- works for **noisy shifts**, but *only* in the limit of *very small* perturbations, because  $\exists$  current; cp. to numerical results
- works well for **noisy slopes** in the limit of small perturbations

# Random walk approximation

unperturbed diffusion coefficient

$$D(a) = \lim_{n \rightarrow \infty} \frac{1}{2n} \int_0^1 dx \varrho_a^*(x) (x_n - x)^2$$

with invariant density  $\varrho_a^*(x)$  of map  $M_a(x) \bmod 1$

**random walk approximation:**

1. **no memory in jumps:** replace  $\Delta x_n = x_n - x$  by single jump at time  $n = 1$  over distance  $\Delta x = \Delta x_1$
2. **no memory in invariant density:** assume  $\varrho_a^*(x) \simeq 1$

$$\Rightarrow D_{rw}(a) = \frac{1}{2} \int_0^1 dx \Delta x^2$$

# Deriving random walk approximations

$$D_{rw}(a) = \frac{1}{2} \int_0^1 dx \Delta x^2$$

consider **two limiting cases of jumps:**

- random walk I:  $a \ll 3$ ;

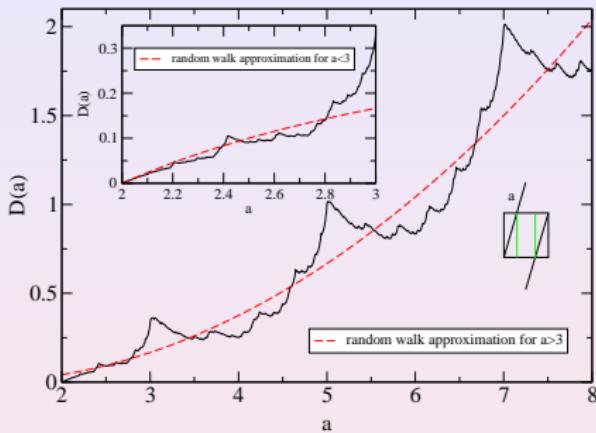
set  $\Delta x = 0$  if  $0 \leq M_a(x) \leq 1$  and  $|\Delta x| = 1$  otherwise,

$$D_{rwI}(a) = 1/2 \int_0^1 \mathbf{1}_{esc} dx = (a - 2)/(2a) \simeq (a - 2)/4 (a \rightarrow 2)$$

- random walk II:  $a \gg 3$ ; set  $\Delta x = M_a(x) - x$  exactly,

$$D_{rwII}(a) = 1/2 \int_0^1 dx (M_a(x) - x)^2 = (a - 1)^2 / 24$$

# Fractal diffusion coefficient and random walks



R.K., Dorfman (1997)

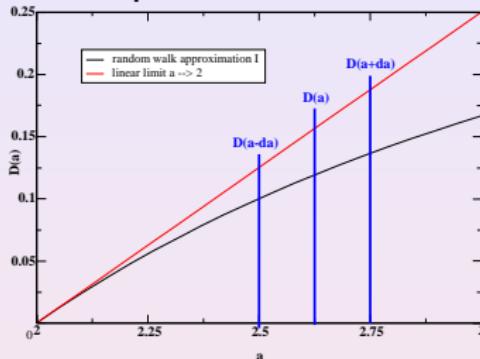
feed back results into **perturbed random walk** approximation

$$D_{app}(a, da) = \int d(\Delta a) \chi_{da}(\Delta a) D(a + \Delta a)$$

by replacing  $D(a + \Delta a) \rightarrow D_{rw}(a + \Delta a)$

# Perturbed random walk approximations

**example:** Let random slopes  $\Delta a$  be  $\delta$ -distributed,



- for  $2 \ll a \leq 3$  random walk I yields suppression of diffusion due to concavity (Reimann, 1994ff)
- for  $a \rightarrow 2$  random walk I yields no change at all in the diffusion coefficient due to linearity
- for  $3 \ll a$  random walk II yields enhancement of diffusion due to convexity,  $D_{rwII}(a, da) = D_{rwII}(a) + \Delta a^2/c$
- in simulations random walk II well seen but not I

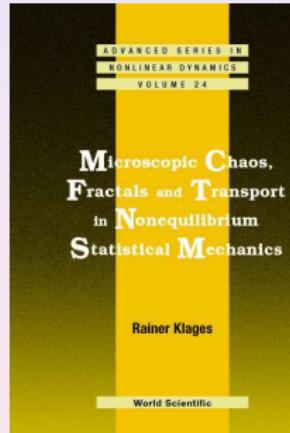
# Summary

simple model with diffusion due to **deterministic chaos** under random perturbations:

1. in three of four cases of random perturbations the **diffusion coefficient exists**
2. the unperturbed **fractal diffusion coefficient is quite stable** against perturbations
3.  $\exists$  simple **approximations for the perturbed diffusion coefficient** in terms of the unperturbed diffusion coefficient
4. multiple (irregular) **suppression and enhancement of deterministic diffusion by stochastic perturbations**
5. **transitions from deterministic to stochastic diffusion** via suppression and enhancement

# Literature

- spatial disorder: R.K., PRE **65**, 055203(R) (2002)
- noise: R.K., EPL **57**, 796 (2002)
- all together:



see Part 1

Merry Xmas!