

# Deterministic chaos and diffusion in maps and billiards

Rainer Klages

Queen Mary University of London, School of Mathematical Sciences

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# Outline

## 1 diffusion in simple chaotic maps

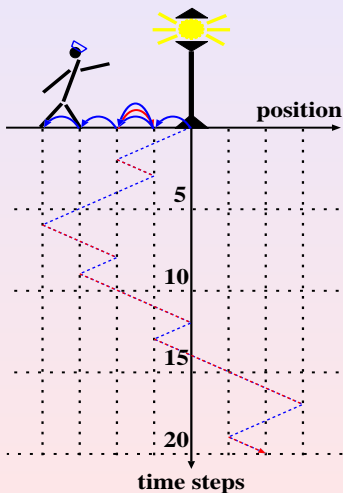
- **motivation:** from stochastic to deterministic random walks
- simple maps with **non-trivial diffusion coefficients**

## 2 diffusion in chaotic particle billiards

- **density-dependent diffusion** in the periodic Lorentz gas
- from theory towards **applications**

# 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

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

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

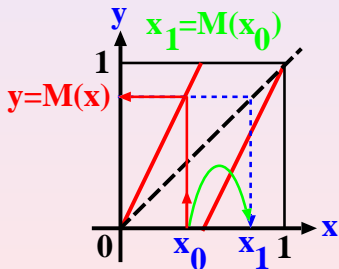
- for sailor:  $D = s^2/2$

# Dynamics of a chaotic map

**goal:** study **diffusion** on the basis of **deterministic chaos**

**key idea:** use **chaos** instead of **stochasticity** for drunken sailor  
**why?** **determinism** preserves all **dynamical correlations**

model a single step  $x_0 \rightarrow x_1$  by a *deterministic map*:



steps are iterated in discrete time  $n$   
according to the equation of motion

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

with

$$M(x) = 2x \bmod 1$$

**Bernoulli shift**

Lyapunov exponent:  $\lambda = \ln 2 > 0$   
paradigm of a *chaotic map*

# A deterministic random walk

- 2 study **diffusion** in the piecewise linear deterministic map

$$M_h(x) = \begin{cases} 2x + h & 0 \leq x < \frac{1}{2} \\ 2x - 1 - h & \frac{1}{2} \leq x < 1 \end{cases}$$

lifted onto the real line by

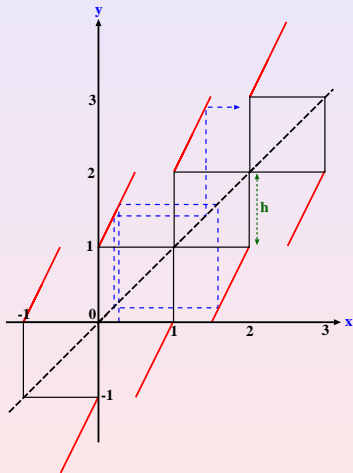
$$M_h(x + 1) = M_h(x) + 1$$

with symmetric shift  $h \geq 0$  as a **control parameter** (Gaspard, RK, 1998)

**deterministic random walk** generated by

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

**problem:** calculate  $D(h)$



Geisel/Grossmann/Kapral (1982)

# The Takagi function method

start from the **Einstein formula**

$$D = \lim_{n \rightarrow \infty} \frac{1}{2n} \langle (x_n - x_0)^2 \rangle, \quad x = x_0,$$

with  $\langle \dots \rangle = \int_0^1 dx \varrho_h(x) \dots$  over the invariant density  $\varrho_h(x)$  of  $m_h(x) := M_h(x) \bmod 1$ ; it is  $\forall_h \varrho_h(x) = 1$ !

define *integer jumps*  $j_k = \lfloor x_{k+1} \rfloor - \lfloor x_k \rfloor$  at discrete time  $k$  and rewrite  $D(h)$  via telescopic summation to

$$D(h) = \frac{1}{2} \langle j_0^2 \rangle + \sum_{k=1}^{\infty} \langle j_0 j_k \rangle$$

**Taylor-Green-Kubo formula**

**structure of formula:**

**first term:** random walk solution

**other terms:** higher-order dynamical correlations

# Generalized Takagi/de Rham functions

**problem:** calculate  $\langle j_0 \sum_{k=0}^{\infty} j_k \rangle = \int_0^1 dx j_0 \sum_{k=0}^{\infty} j_k$

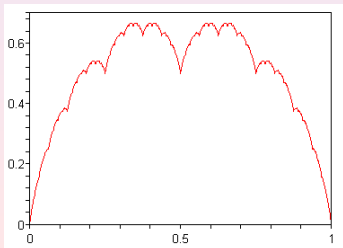
defining  $T_h^n(x) = \int_0^x dy \sum_{k=0}^n j_k(y)$  yields the **de Rham-type equation**

$$T_h^n(x) = t(x) + \frac{1}{2} T_h^{n-1}(m_h(x))$$

with  $dt(x)/dx := j_0(x)$ .

**example:** for  $h = 1$  we get the famous **Takagi function (1903)**

$$T_1^n(x) = \begin{cases} x + \frac{1}{2} T_1^{n-1}(2x) & 0 \leq x < \frac{1}{2} \\ 1 - x + \frac{1}{2} T_1^{n-1}(2x - 1) & \frac{1}{2} \leq x < 1 \end{cases}$$



# Solving the functional recursion relation

$$T_h^n(x) = t(x) + \frac{1}{2} T_h^{n-1}(m_h(x))$$

can be solved to

$$T_h^n(x) = \sum_{k=0}^n \frac{1}{2^k} t(m_h^k(x))$$

For  $0 \leq h$  and  $T_h(x) = \lim_{n \rightarrow \infty} T_h^n(x)$  this leads to

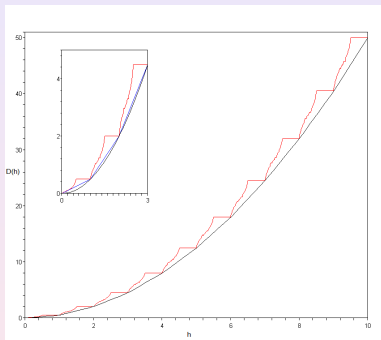
$$D(h) = \frac{[h]^2}{2} + \left(\frac{1-\hat{h}}{2}\right) (1 - 2[h]) + T_h(\hat{h})$$

**Knight, RK, Nonlinearity (2011)**

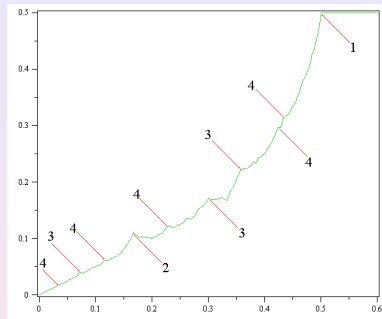
(with  $\hat{h} := h \bmod 1$  ( $h \notin \mathbb{N}$ ),  $\hat{h} := 1$  ( $h \in \mathbb{N}$ ),  $\hat{h} := 0$  ( $h = 0$ ))



# Diffusion coefficient for the lifted Bernoulli shift



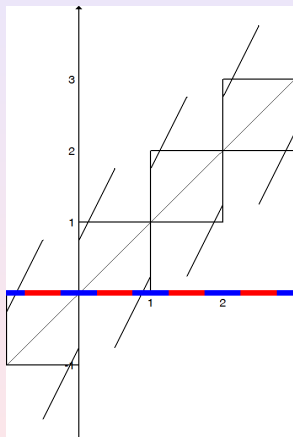
On large scales we recover the **drunken sailor's result**,  $D(h) \sim h^2/2$  ( $h \gg 1$ ).



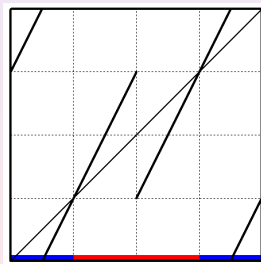
On small scales,  $D(h)$  is *partially* a **fractal function**. Local maxima are the solutions to  $m_h^n(1/2) = 1/2$ : **topological instability** under parameter variation.

# Why the plateau regions?

For  $0.5 \leq h \leq 1$  ergodicity is broken and topology conserved:



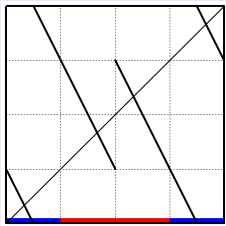
The phase space is split up into two invariant sets, see the **mod 1** map:



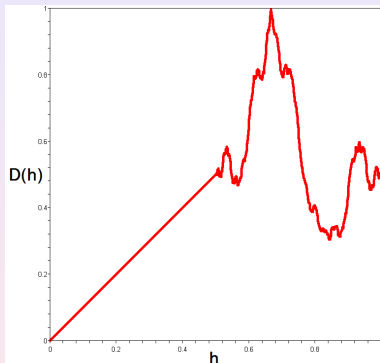
For a *uniform initial density*, the diffusion coefficient is calculated to  $D(h) = D(h) + D(h) = (1 - h) + (h - \frac{1}{2}) = \frac{1}{2}$ .

# More maps: the lifted negative Bernoulli shift

Same Takagi function method:



$0 \leq h \leq 0.5$ : again  
ergodicity breaking

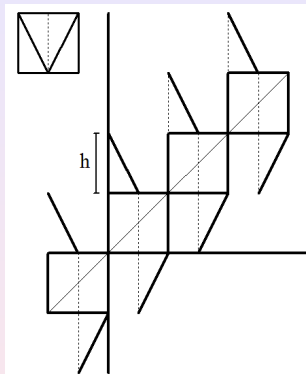


$0.5 \leq h \leq 1$ : topological instability

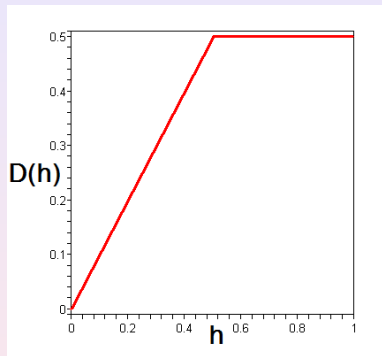
which suggests:

topological instability  $\Leftrightarrow$  fractal diffusion coefficient  
non-ergodicity  $\Leftrightarrow$  linear diffusion coefficient

# The lifted V-map



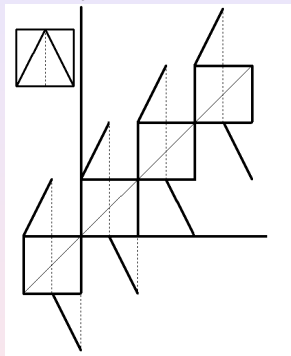
This map suggests topological instability under parameter variation and no ergodicity breaking...



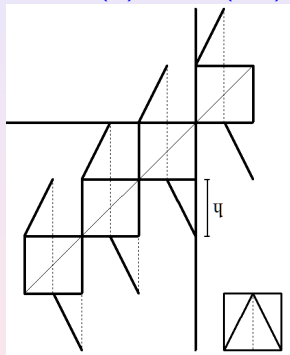
...but Takagi function method yields a piecewise linear  $D(h)$ : explanation via *dominating branch*

# The lifted tent map

Finally, the lifted tent map  $T(x)$ ...



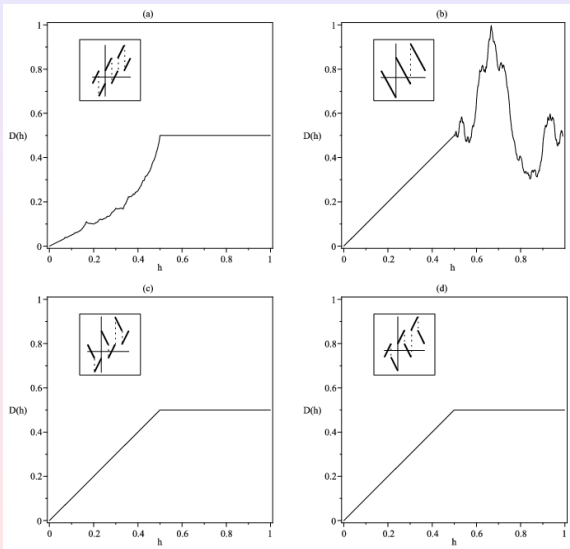
...via  $T(x) = -V(-x)$ :



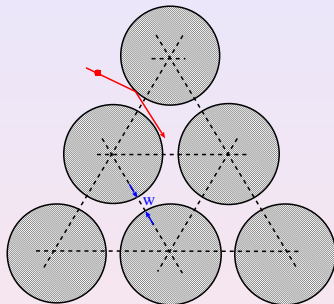
...is **topologically conjugate**  
to the V-map  $V(x)$ ...

Fortunately,  $D(h)$  is invariant under topological conjugacy  
(Korabel, RK, 2004):  $\exists$  Takagi function solution for this map!

# Summary: Linear and fractal diffusion coefficients



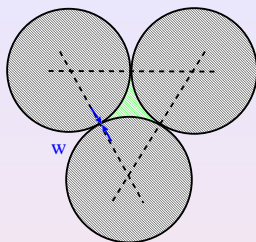
# The periodic Lorentz gas



Lorentz (1905)

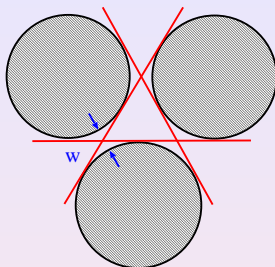
**moving point particle** of unit mass with unit velocity scatters elastically with **hard disks** of unit radius on a **triangular lattice**  
only nontrivial **control parameter**: gap size  $w$

two limiting cases for diffusion under parameter variation:



$$w_0 = 0, D(w_0) = 0$$

trivial localization



$$w_\infty \simeq 0.3094, D(w_\infty) \rightarrow \infty$$

ballistic flights

paradigmatic example of a **chaotic** Hamiltonian particle billiard:

$\exists$  positive Lyapunov exponent;  $\exists D(w), w_0 < w < w_\infty$

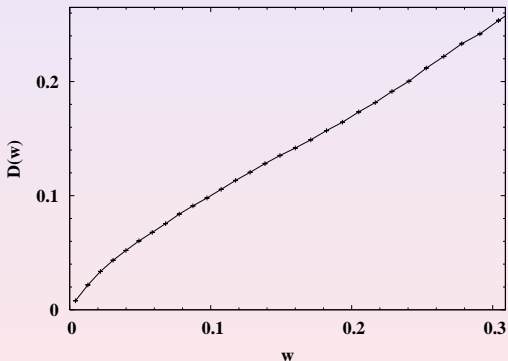
Bunimovich, Sinai (1980)

How does the diffusion coefficient  $D(w)$  look like?



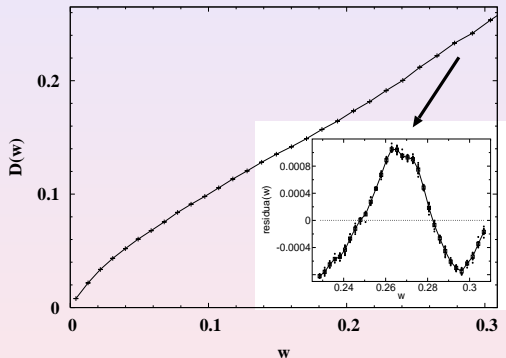
# Diffusion coefficient for the periodic Lorentz gas

diffusion coefficient  $D(w) = \lim_{t \rightarrow \infty} \frac{\langle (\mathbf{x}(t) - \mathbf{x}(0))^2 \rangle}{4t}$  from MD simulations (RK, Dellago, 2000):



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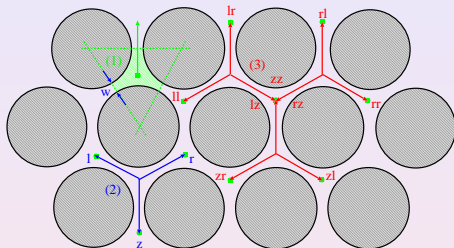


⇒ **irregularities** on fine scales

Can one understand these results on an analytical basis?

# Taylor-Green-Kubo formula for billiards

map diffusion onto *correlated random walk* on hexagonal lattice:



rewrite diffusion coefficient as **Taylor-Green-Kubo formula**:

$$D(w) = \frac{1}{4\tau} \langle \mathbf{j}^2(\mathbf{x}_0) \rangle + \frac{1}{2\tau} \sum_{n=1}^{\infty} \langle \mathbf{j}(\mathbf{x}_0) \cdot \mathbf{j}(\mathbf{x}_n) \rangle$$

$\tau$ : rate for a particle leaving a **trap**;  $\mathbf{j}(\mathbf{x}_n)$ : *inter-cell jumps* over distance  $\ell$  at the  $n$ th time step  $\tau$  in terms of lattice vectors  $\ell_{\alpha\beta\gamma\dots}$

RK, Korabel (2002)

TGK formula can be evaluated to

$$D_n(w) = \frac{\ell^2}{4\tau} + \frac{1}{2\tau} \sum_{\alpha\beta\gamma\dots}^n p(\alpha\beta\gamma\dots) \ell \cdot \ell(\alpha\beta\gamma\dots)$$

$p(\alpha\beta\gamma\dots)$  : probability for lattice jumps with this symbol sequence

**first term:** random walk solution for diffusion on a two-dimensional lattice, calculated to (Machta, Zwanzig, 1983)

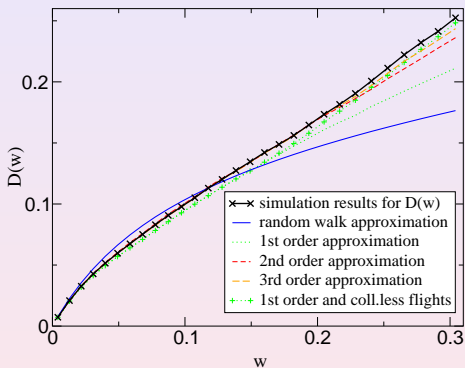
$$D_0(w) = \frac{w(2+w)^2}{\pi[\sqrt{3}(2+w)^2 - 2\pi]}$$

**other terms:** higher-order dynamical correlations;

for time step  $2\tau$ :  $D_1(w) = D_0(w) + D_0(w) [1 - 3p(z)]$

$3\tau$ :  $D_2(w) = D_1(w) + D_0(w) [2p(zz) + 4p(lr) - 2p(ll) - 4p(lz)]$

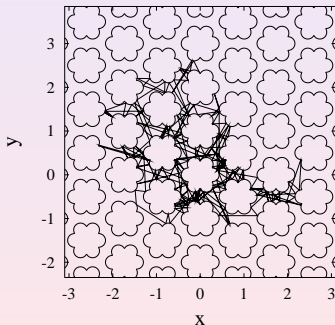
open problem: conditional probabilities  $p(\alpha\beta\gamma\dots)$  analytically?  
here results obtained from simulations:



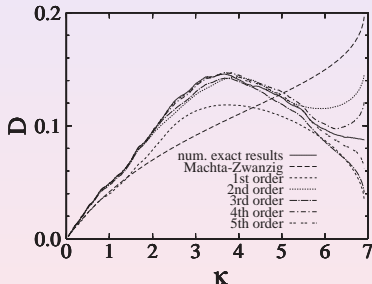
⇒ variation of convergence as a function of  $w$  indicates presence of **memory due to dynamical correlations**

# Diffusion in the flower-shaped billiard

hard disks replaced by  
**flower-shaped scatterers**  
 with petals of **curvature  $\kappa$** :



simulation results for the  
**diffusion coefficient** and  
 analysis as before:



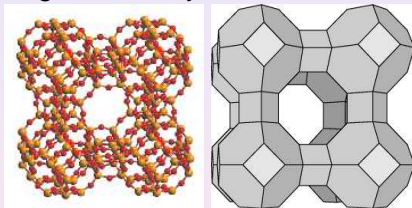
Harayama, RK, Gaspard (2002)

$\Rightarrow \exists$  **irregular diffusion coefficient** due to dynamical correlations

# Outlook: molecular diffusion in zeolites

**zeolites:** nanoporous crystalline solids serving as molecular sieves, adsorbants; used in detergents, catalysts for oil cracking

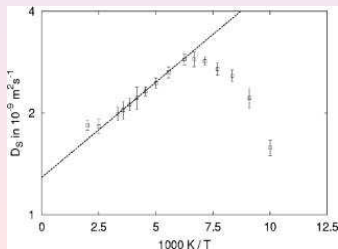
**example:** unit cell of **Linde type A zeolite**; periodic structure built by silica and oxygen forming a “cage”



**Schüring et al. (2002):** MD simulations with ethane yield **non-monotonic temperature dependence** of *diffusion coefficient*

$$D(T) = \lim_{t \rightarrow \infty} \frac{\langle [\mathbf{x}(t) - \mathbf{x}(0)]^2 \rangle}{6t}$$

in Arrhenius plot; explanation similar to previous TGK expansion



# Summary

- ∃ **fractal transport coefficients in simple maps**
- ∃ **irregular transport coefficients** of the same origin in **particle billiards**

I expect this phenomenon to be **typical** for *classical* transport in *low-dimensional, deterministic, spatially periodic chaotic systems*.



# 'Advertisement'

- **similar results for:**

- current and diffusion in the **piecewise linear map**  
 $M_{a,b}(x) = ax + b, x \in [0, 1)$
- diffusion in the **climbing sine map**  $C_a(x) = x + k \sin(2\pi x)$
- diffusion in a **dissipative particle billiard** with oscillatory driving

- **furthermore:**

- fractal parameter dependencies for **mobility, chemical reaction rate, anomalous diffusion** in simple maps
- stability of such curves with respect to **random perturbations**
- some indication of such phenomena in **experiments**: *antidot lattices, granular vibratory conveyors, surface diffusion, Josephson junctions, zeolites*

# Acknowledgements and literature

work performed in  
collaboration with:

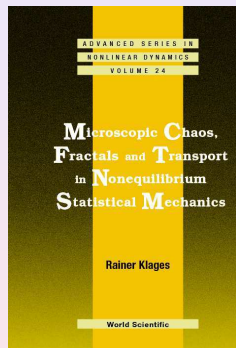
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Part 1