

### 4.5.3. Kolmogorov - Sinai entropy

How to quantify sensitive dependence on initial conditions?

idea: repeated approximate measurements  
give more new information

for "chaotic" dynamics than for "regular" dynamics

rigorous approach: **partitions** and how they change under dynamics

Def.: partition  $\alpha$  :

		$A_i$	

$N$  regions with measure  $\mu_i = \mu(A_i)$

$$\sum_i \mu_i = 1$$

Def.: **entropy** of partition  $\alpha$  :

$$h(\alpha) = - \sum_{i=1}^N \mu_i \ln \mu_i$$

Def.: entropy of partition  $\alpha$  relative to map  $T$ :

$$h(\alpha, T) = \lim_{n \rightarrow \infty} \frac{1}{n} h(\alpha \vee T\alpha \vee T^2\alpha \vee \dots \vee T^{n-1}\alpha)$$

$\alpha \vee T\alpha$  : combined partition, up to  $N^2$  regions

$\alpha \vee \dots \vee T^{n-1}\alpha$  : up to  $N^n$  regions

Def.: Kolmogorov-Sinai entropy (or metric entropy) of map  $T$

$$h(T) = \sup_{\alpha} h(\alpha, T)$$

- remarks:
- $h(T) \geq 0$
  - $h(T) > 0$  is rigorous version of sensitive dependence on initial cond.
  - numerically inconvenient
  - linear map on torus (cat map):  $h = \sum_{\lambda_i > 0} \lambda_i$  (Lyapunov exponents, 4.5.4)
  - Baker map  $\leftarrow$  exercise

Def.: **K-system** :  $h(T) > 0$

- very few examples : Sinai billiard  
Bunimovich stadium billiard

Def.: **C-system** (Anosov) : hyperbolic at every point

- example : cat map
- not Sinai billiard nor Bunimovich stadium billiard:  
family of bouncing ball orbits (measure zero) is not hyperbolic

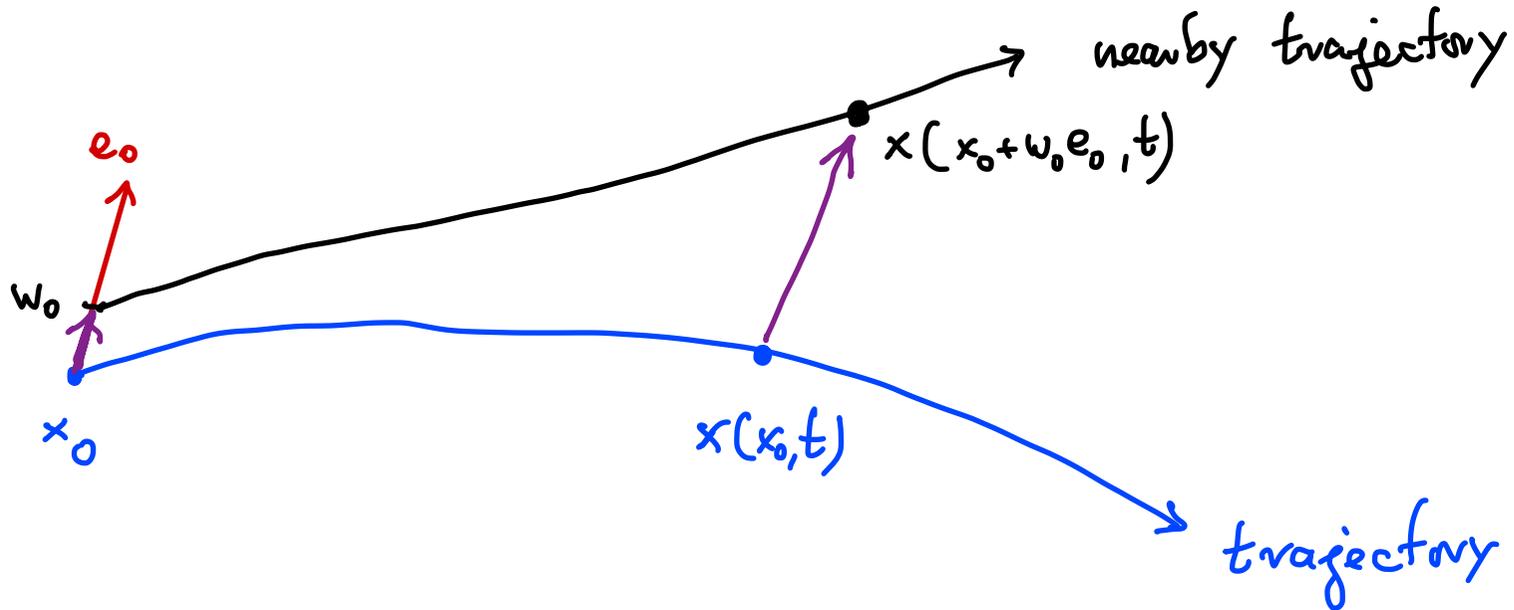
Def.: **Bernoulli system** : equivalent to coin flip

- example : Baker map

one can show: Bernoulli  $\Rightarrow$  C-system  $\Rightarrow$  K-system  $\Rightarrow$  mixing  $\Rightarrow$  ergodic

## 4.5.4. Lyapunov exponents

- motivation:
- show exponential divergence of trajectories directly
  - numerically relevant method



$$\text{Def.: } \lambda(x_0, e_0) := \lim_{\substack{w_0 \rightarrow 0 \\ t \rightarrow \infty}} \frac{1}{t} \ln \frac{|x(x_0 + w_0 e_0, t) - x(x_0, t)|}{w_0}$$

remarks:

- $\lambda > 0 \hat{=}$  exponentially increasing distance  $e^{\lambda t}$

- $M$ -dim. system:  $M$  Lyapunov exponents  $\lambda_i(x_0) = \lambda(x_0, e_i)$
- $\lambda_i = \lambda_i(x_0)$  are independent of  $x_0$  for almost all  $x_0$  within ergodic component
- ordering:  $\lambda_1 \geq \lambda_2 \geq \dots \geq \lambda_M$
- Hamiltonian system,  $N$  d.o.f.:  $M = 2N$ ,  $\lambda_i = -\lambda_{M+1-i}$ 
  - $\Rightarrow$ 
    - $\sum_i \lambda_i = 0$  area conservation
    - $\lambda_N = \lambda_{N+1} = 0$ :
      - along trajectory
      - perpendicular to energy shell
    - $N = 2$ :
      - regular dynamics:  $\lambda_1 = \lambda_2 = \lambda_3 = \lambda_4 = 0$
      - chaotic dynamics:  $\lambda_1 > 0$   $\lambda_2 = \lambda_3 = 0$   $\lambda_4 = -\lambda_1 < 0$
- $p$ -dim. volume element: changes exponentially with first  $p$  Lyapunov exponents
$$\lambda^{(p)} = \lambda_1 + \dots + \lambda_p$$

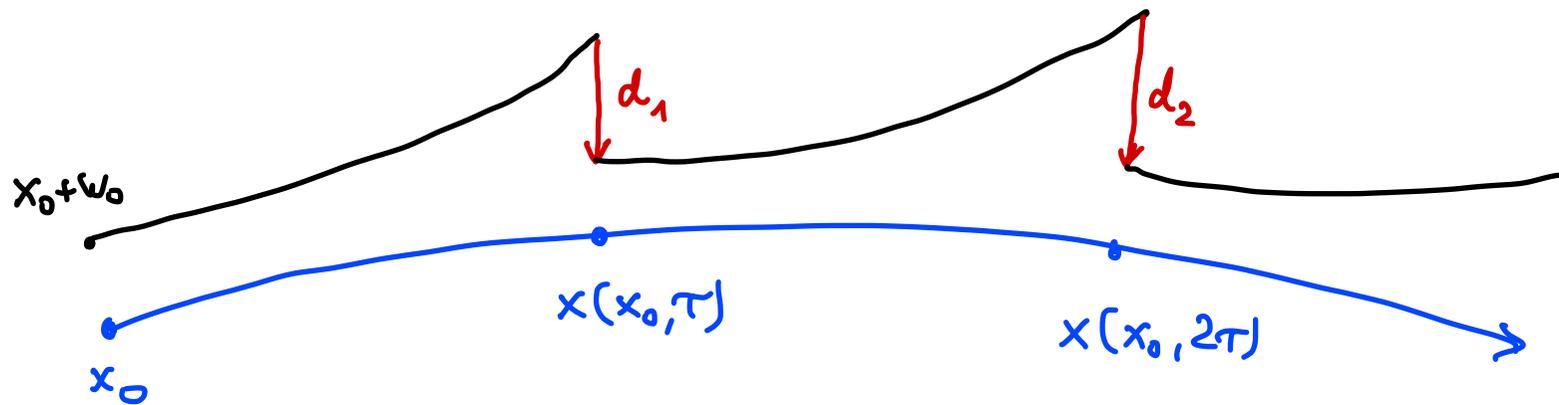
- numerical approach for  $\lambda_1$

problem:  $w_0 > 10^{-14}$   
 $|w(x_0, t)| \ll 1$

}  $\Rightarrow$  finite time  $t$   
 $\Rightarrow \lambda$  would depend on  $x_0$   
 (finite time Lyapunov exponent)

Solution: reduce norm of  $w(x_0, t)$   
 at times  $\tau, 2\tau, \dots$   
 to  $w_0$

$\Rightarrow$  factor  $d_j = \frac{|w(x_0, j\tau)|}{w_0}$



$$\lambda_1 = \lim_{k \rightarrow \infty} \frac{1}{k\tau} \sum_{j=1}^k \ln d_j$$

## 4.5.5. Shadowing Theorem

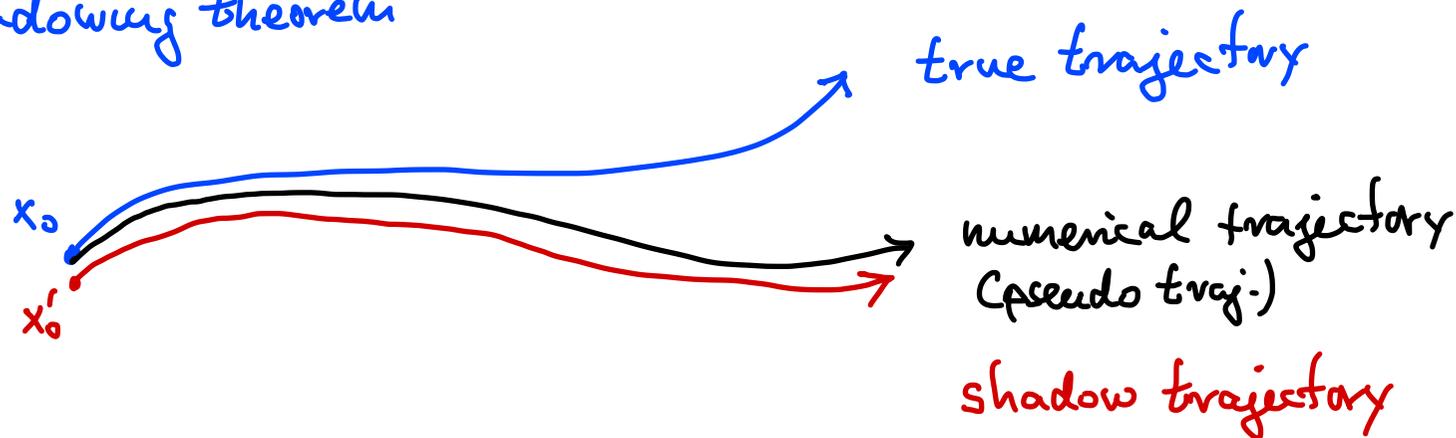
Numerics for chaotic dynamics has serious problem:  
( $\lambda_1 > 0$ )

round-off errors lead after short time  
to completely wrong trajectory

Numerics useless?

e.g.  $\lambda = \ln 2$ ,  $t = 50$ :  $e^{\lambda t} = 2^{50} \approx 10^{15}$

Solution: Shadowing theorem



idea: use hyperbolicity to find shadow trajectory  
with slightly different initial condition  $x_0$   
which is everywhere close to numerical trajectory

a) map contracting in all directions

$\exists$  shadow traj.: take same initial cond. as numerical trajectory  
 $\Rightarrow$  all errors of num. traj. are contracted to shadow traj.

b) map expanding in all directions

$\exists$  shadow traj.: take last point of numerical trajectory  
iterate backwards

c) general map (e.g. Hamiltonian system)

$\exists$  shadow traj.: use beginning of numerical trajectory  
in contracting direction  
and use end of numerical trajectory  
in expanding direction

hyperbolic system:  $\exists$  shadow traj. for arbitrarily long times

general system:  $\exists$  shadow traj. at least for finite times