

# Dynamical Systems : Chaos and Equilibrium

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## Motivations:

- Modeling physical phenomena
- Describe future asymptotic behavior

Given a map  $f$  and  $x$  consider the *orbit of  $x$*  as the set

$$\mathcal{O}^+(x) = \{x, f(x), f^2(x), f^3(x), \dots\}$$

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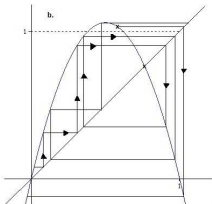
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## Example 1:

$f(x) = ax(1-x)$  describes population size in a time instant



## Example 2:

The position of a person in a giant wheel at constant velocity can be modelled by

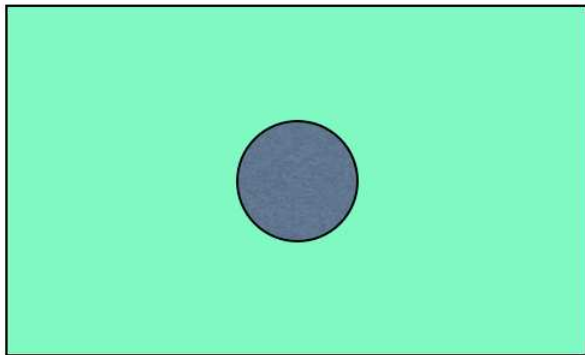
$$R_\alpha: \begin{array}{ccc} S^1 & \rightarrow & S^1 \\ e^{2\pi i\theta} & \mapsto & e^{2\pi i(\theta+\alpha)} \end{array}$$

where  $S^1 = \{z \in \mathbb{C} : z = e^{2\pi i\theta} \text{ with } \theta \in \mathbb{R}\}$ .

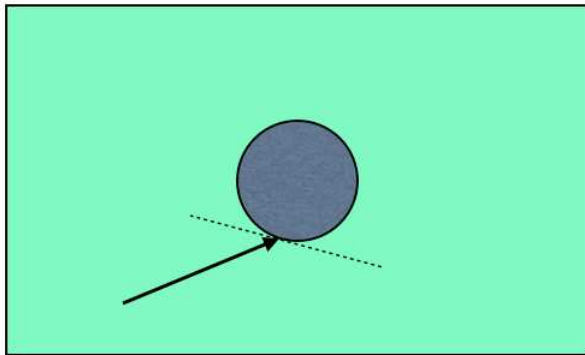
Position of a person at time  $n$  seconds =  $R_\alpha^n(x) = e^{2\pi i(\theta+\alpha n)}$

**Order! Not chaos!**

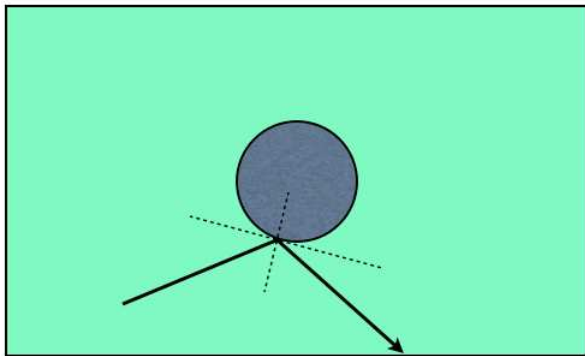
**Example 3:** Description of the position of a ball in a billiard table without holes



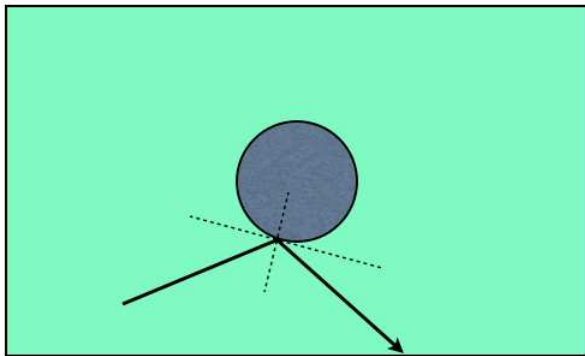
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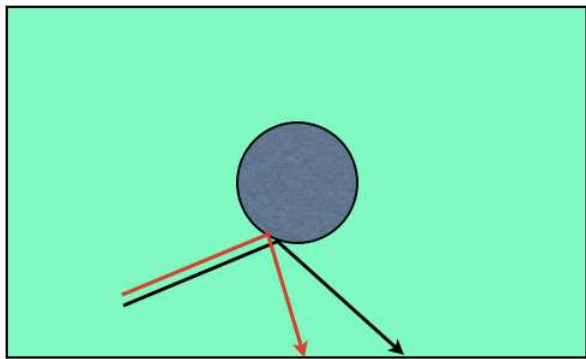
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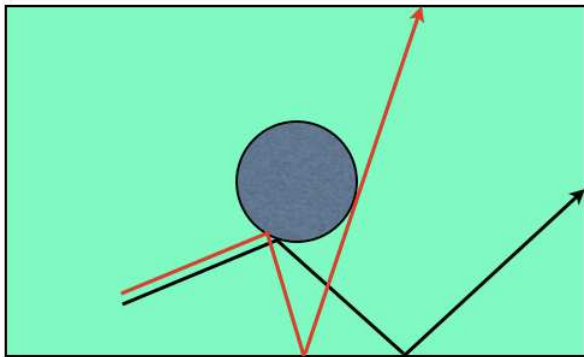
What happens if one consider different trajectories?



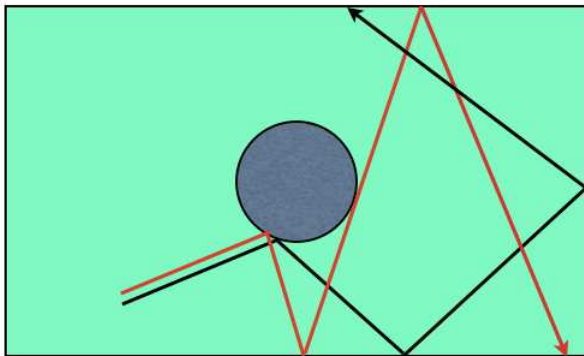
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Sensitivity to initial conditions!

Example 4: Lorenz equations for weather forecast  
 $a = 10, r = 28, b = 8/3$

$$\begin{cases} \dot{x} = a(y - x) \\ \dot{y} = rx - y - xz \\ \dot{z} = xy - bz \end{cases}$$

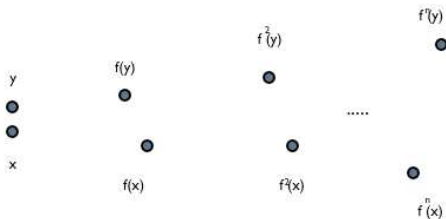


Sensitivity to initial conditions!

# Chaotic dynamical systems

Sensitivity to initial conditions (topological sense)

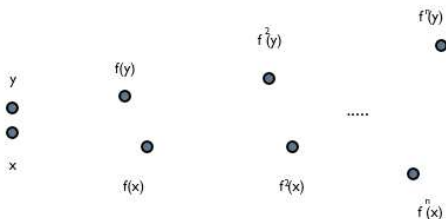
$\exists \varepsilon > 0$  so that if  $x \neq y$  there exists  $n \in \mathbb{N}$  s.t.  $d(f^n(x), f^n(y)) > \varepsilon$



# Chaotic dynamical systems

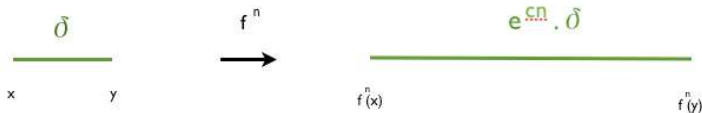
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Positive Lyapunov exponents (measure theoretical sense)

$$\lambda(f, x) := \lim_{n \rightarrow +\infty} \frac{1}{n} \log |(f^n)'(x)| \quad (\text{Lyapunov exponent at } x \text{ if exists})$$



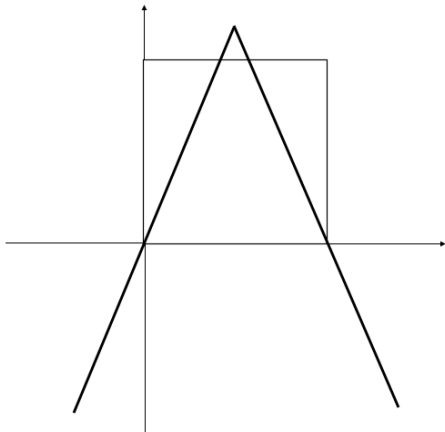
# Order in chaotic dynamical systems

Going back to the original questions:

**Question 1:** Do chaotic dynamical systems have some “good” topological/geometrical structure?

**Question 2:** Do chaotic dynamical systems have invariant probability distributions? Among those do equilibrium states exist?

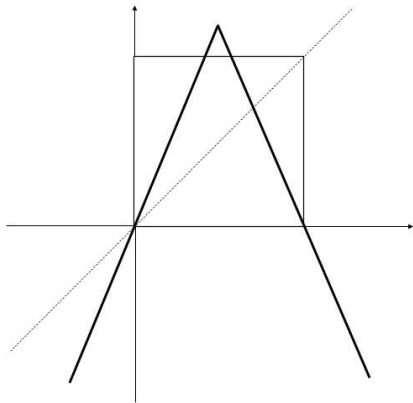
## Very simple model



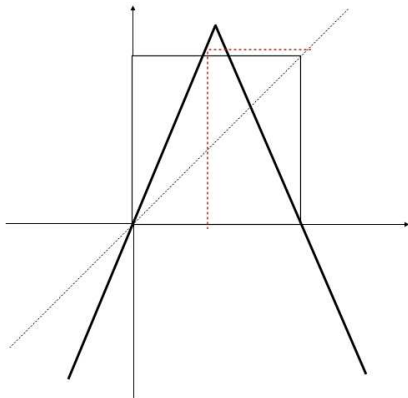
Since  $|f'(x)| > 1$  at “every” point then  $f$  is chaotic in both senses (exercise!)



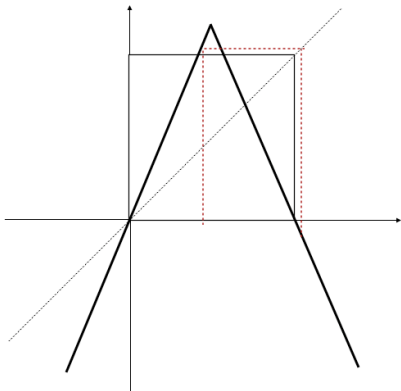
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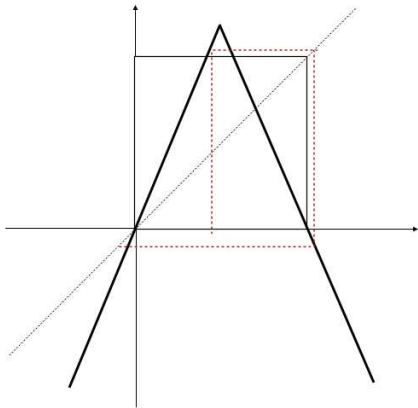
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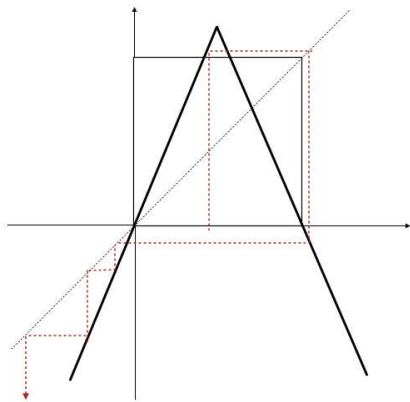
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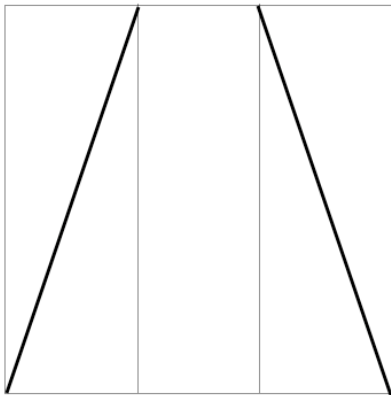
## Very simple model



In fact:  $x \notin [0, \frac{1}{3}] \cup [\frac{1}{3}, \frac{2}{3}] \Rightarrow f^n(x) \rightarrow -\infty$  as  $n$  tends to infinity

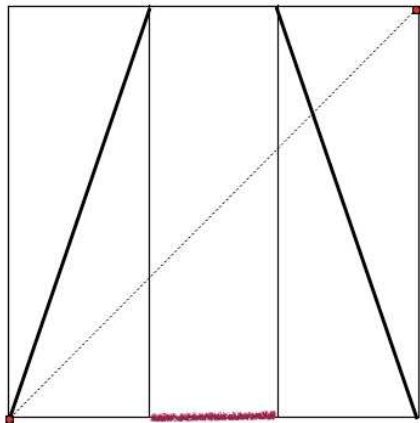
## Very simple model

Study of  $f \mid ([0, \frac{1}{3}] \cup [\frac{2}{3}, 1])$



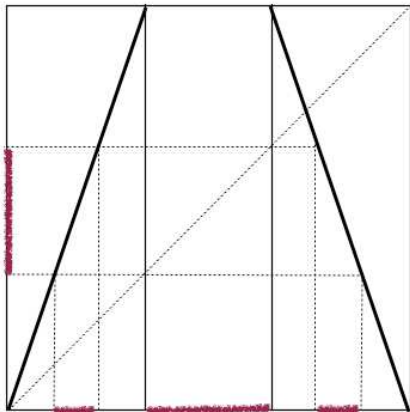


## Very simple model



“Hole”

## Very simple model



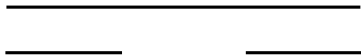
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So. the points that do not fall in the “hole” form ...



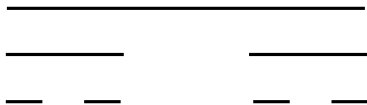
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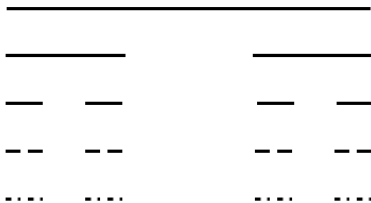
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.... a Cantor set.

# Simple Model

**Answer 1:** YES, this chaotic dynamical system has a good geometrical invariant set, a *fractal set* as relevant part of the dynamics! (self-similar Cantor set)



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**Answer 1:** YES, this chaotic dynamical system has a good geometrical invariant set, a *fractal set* as relevant part of the dynamics! (self-similar Cantor set)

**Answer 2:** YES, there exists a unique *equilibrium state* for smooth potentials! (selection of invariant probability measures)



Inspired by statistical mechanics

## Crash course in measure theory:

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- Probability measure

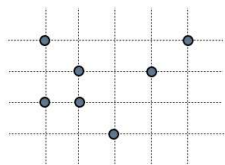
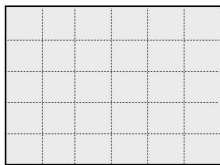
$$\begin{aligned}\mu : \mathcal{A} \subset \mathcal{P}(X) &\rightarrow [0, 1] \\ A &\mapsto \mu(A)\end{aligned}$$

Example:



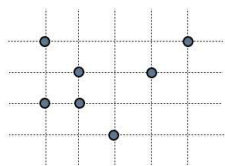
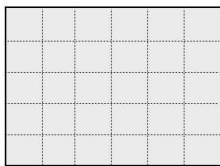


## Motivation from statistical mechanics:



External action of a potential  $\phi$   
Discretization  $\leadsto$  simplification

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### 1 dim lattice



$(0,0,1,1,1,0,0,0,1,1,0,1,1,1,\dots)$

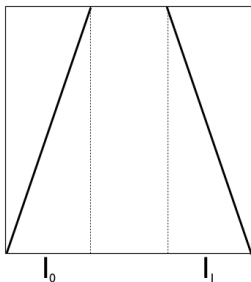
Configurations = elements in  $\{0,1\}^{\mathbb{N}}$

**Question:** Is the gas “distributed” according to some probability?

## Reduction to symbolic space

$K$  Cantor set

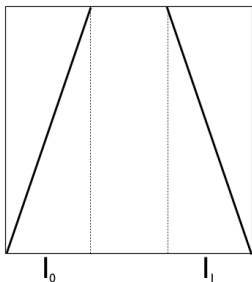
$x \in K \rightsquigarrow \iota(x) = (a_0, a_1, a_2, a_3, a_4, \dots) \in \{0, 1\}^{\mathbb{N}}$  itinerary



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$$a_i = 0 \leftrightarrow f^i(x) \in I_0$$

Moreover,

$$\iota(f(x)) = (a_1, a_2, a_3, a_4, \dots)$$

**Shift:**  $\sigma(a_0, a_1, a_2, a_3, a_4, \dots) = (a_1, a_2, a_3, a_4, \dots)$



## Equilibrium probability distribution for shifts

**Probability measures on  $\{0, 1\}$ :  $(p, 1 - p)$**

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$$\nu_p([a_0, a_1, \dots, a_n]) = p^{\#\{0's\}}(1 - p)^{\#\{1's\}}$$

These are  $\sigma$ -invariant probability measures (easy exercise!)

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**Classical result:** Given a regular potential  $\phi$  is there a unique probability  $\nu_p$  maximizing the **pressure**

$$P(\phi) = \sup_{\substack{(p_0, p_1) \\ p_0 + p_1 = 1}} \left\{ \underbrace{\sum_i -p_i \log p_i}_{\text{entropy}} + \frac{1}{\beta} \underbrace{\sum_i p_i \phi_i}_{\text{potential energy}} \right\}$$

## Reformulation of Question 2

$f : K \rightarrow K$  dynamical system on the Cantor set  $K$

$\phi : M \rightarrow R$  (regular) potential

Set the **topological pressure** of  $f$  with respect to  $\phi$  as

$$P(f, \phi) = \sup_{\mu} \left\{ h_{\mu}(f) + \int \phi d\mu \right\}$$

**Question 2:** Does there exist (unique) invariant probabilities that realize the topological complexity of the dynamics?

## Some recent results

- (Pinheiro, V. 2010) The description of invariant measures in the chaotic region of a dynamical system is equivalent to the one for a shift  $\sigma : S^{\mathbb{N}} \rightarrow S^{\mathbb{N}}$  with  $S$  countable; moreover equilibrium states do exist
- (V., Viana 2009) There are many examples where the chaotic region is more relevant for computing the topological pressure

## Further questions and open problems

A LOT!!

Many thanks to Fundação Calouste Gulbenkian for the excellent program!



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Hope to attend:

New and “not so new” Talents in Mathematics 2020