



El Control Parcial de sistemas caóticos

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Control of chaos

Chaotic motion to regular motion

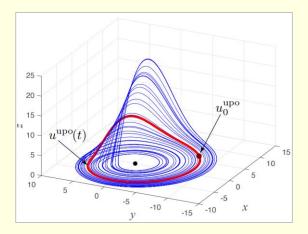
How?

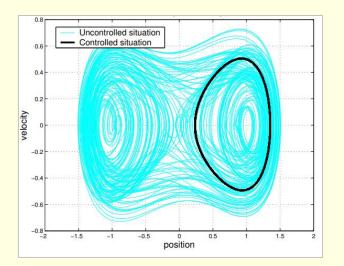
• OGY method (1990)



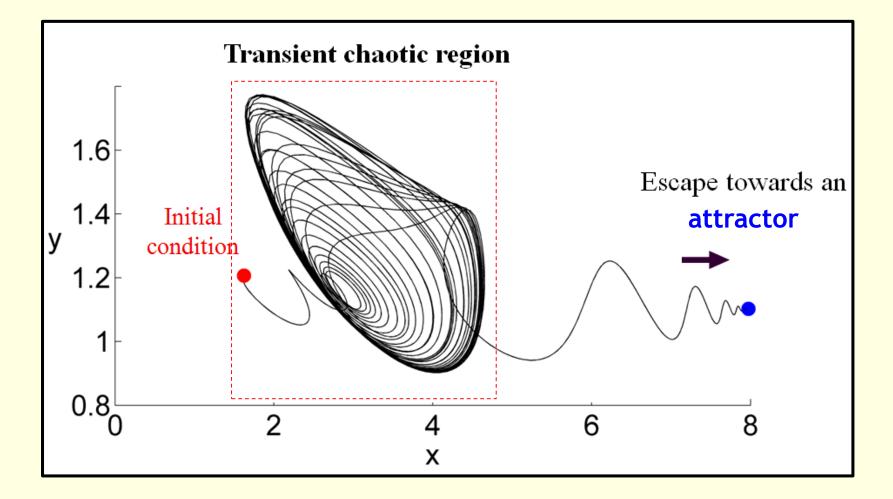
• Delayed Feedback control (1992)

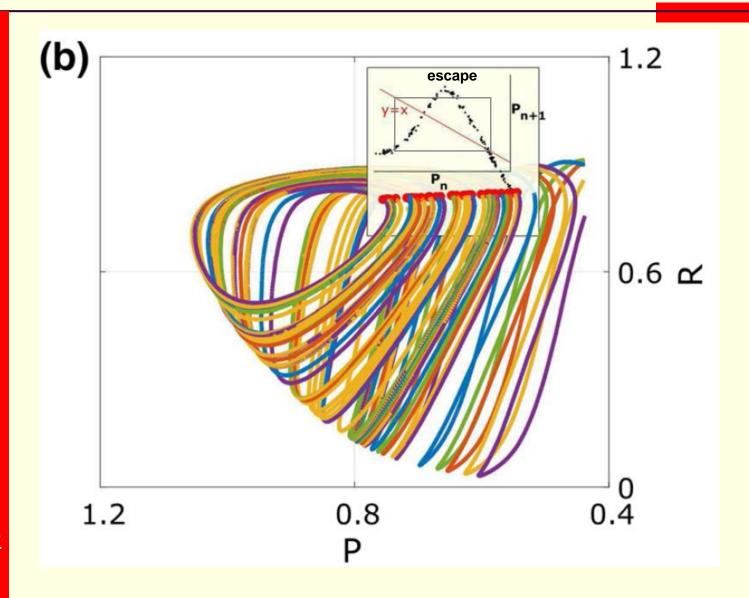


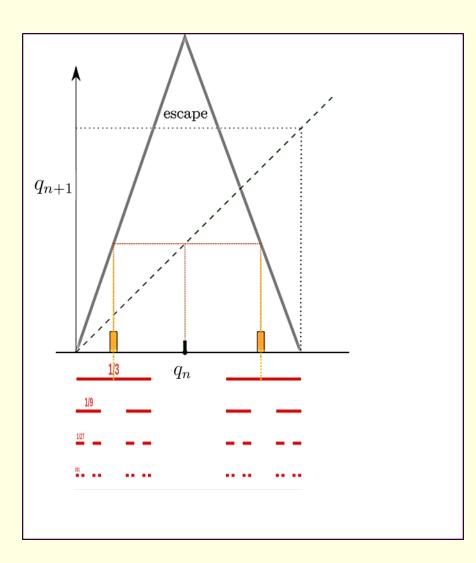




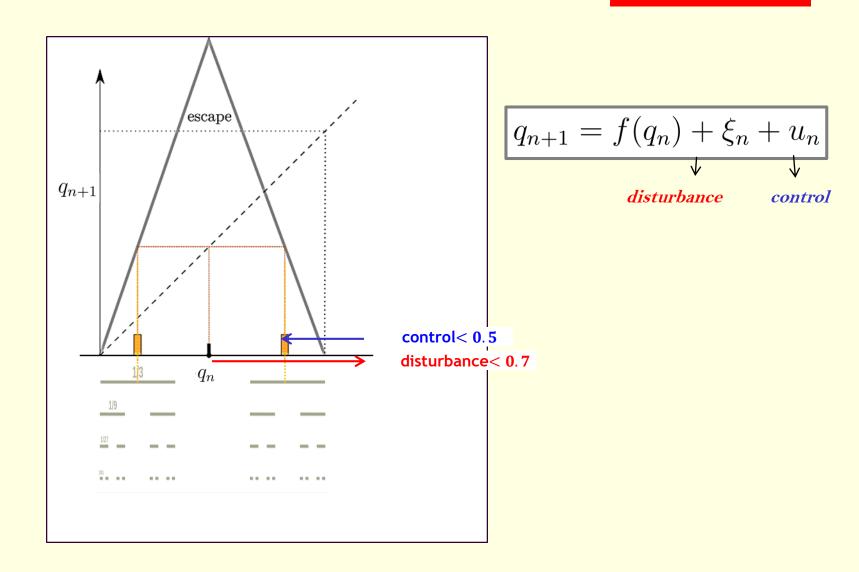
Transient chaos

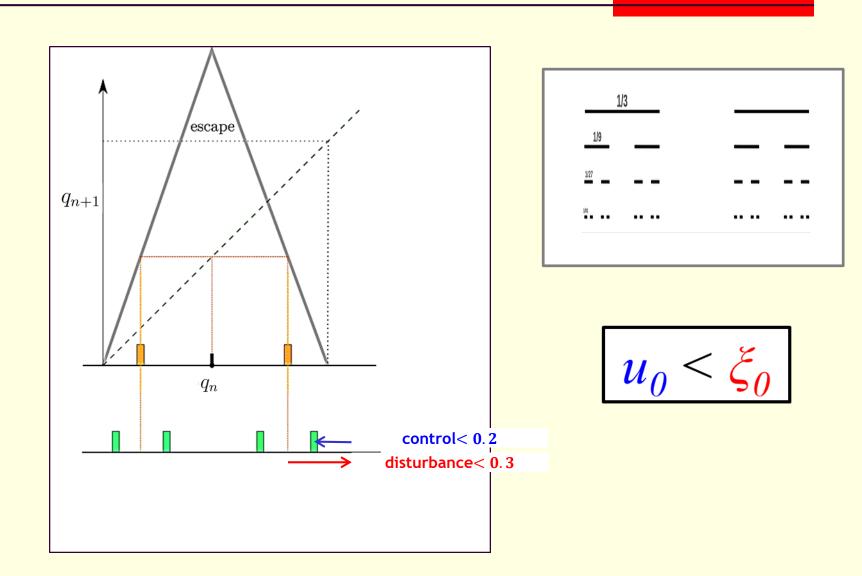




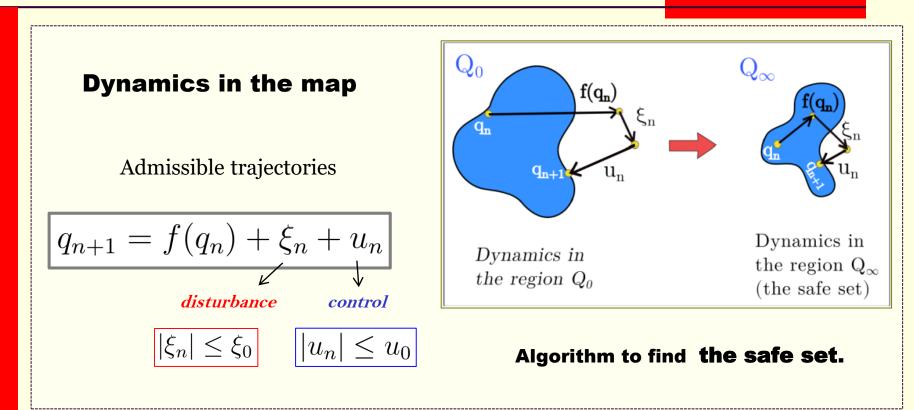


Cantor set of escapes





Partial control algorithm



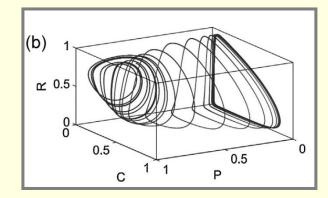
Controlled trajectories in the safe set

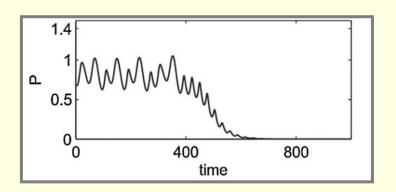
 $< \xi_0$ u_0

Application to an ecological model

$$\begin{array}{c} \overbrace{dR} & \frac{dR}{dt} = R\left(1 - \frac{R}{K}\right) - \frac{x_c y_c CR}{R + R_0} \\ \overbrace{dC} & \frac{dC}{dt} = x_c C\left(\frac{y_c R}{R + R_0} - 1\right) - \psi(P) \frac{y_p C}{C + C_0} \\ \overbrace{dP} & \frac{dP}{dt} = \psi(P) \frac{y_p C}{C + C_0} - x_p P. \end{array}$$

Chaotic transient leads to the predators extinction



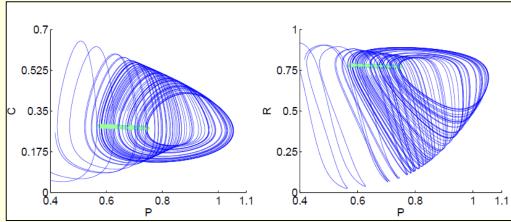


Time series of P

Application to an ecological model

Set of minima of P

$$P_{n+1} = f(P_n)$$

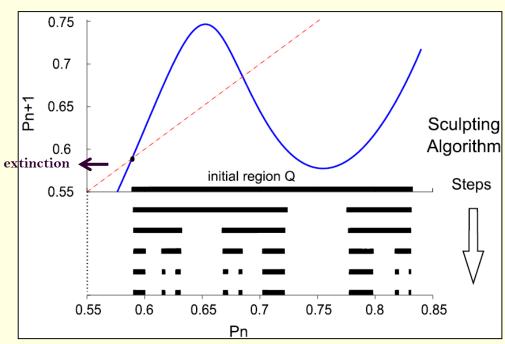


Return Map and the Safe Set

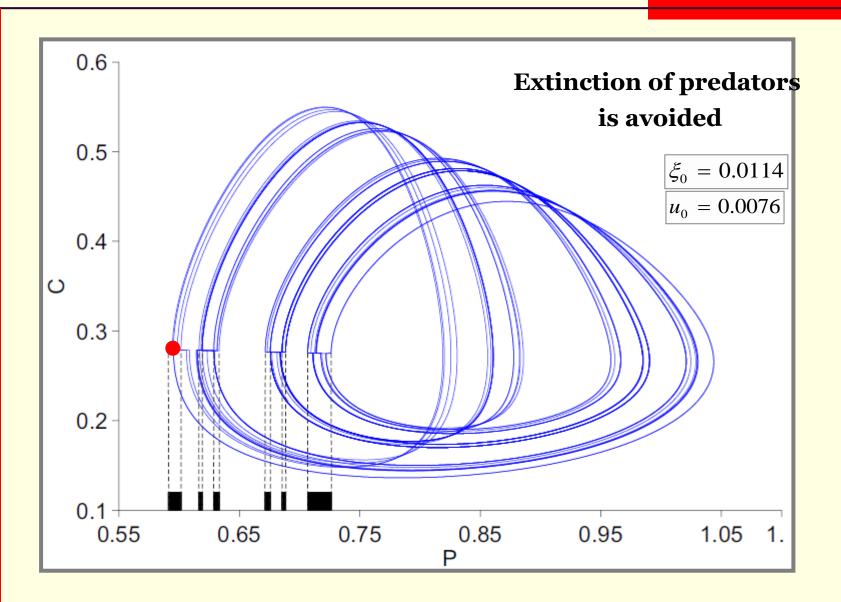
$$P_{n+1} = f(P_n) + \xi_n + u_n$$

$$\xi_0 = 0.0114$$

 $u_0 = 0.0076$



Application to an ecological model



Partial control development

3D safe set

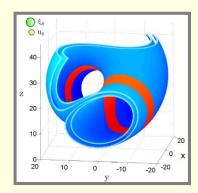
$$q_{n+1} = f(q_n) + \xi_n + u_n$$

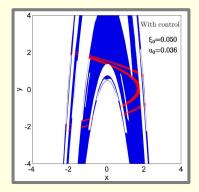
Parametric partial control

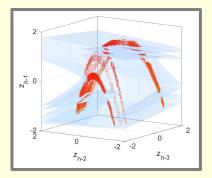
$$q_{n+1} = f(q_n, p + \xi_n + u_n)$$

Time-delay partial control

$$x_n = f(x_{n-1}, x_{n-2}, ...) + \xi_n + u_n$$

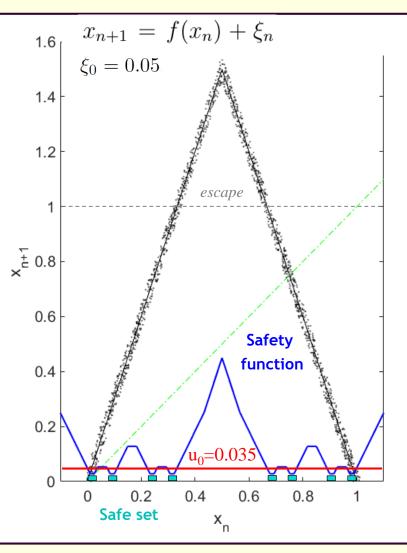


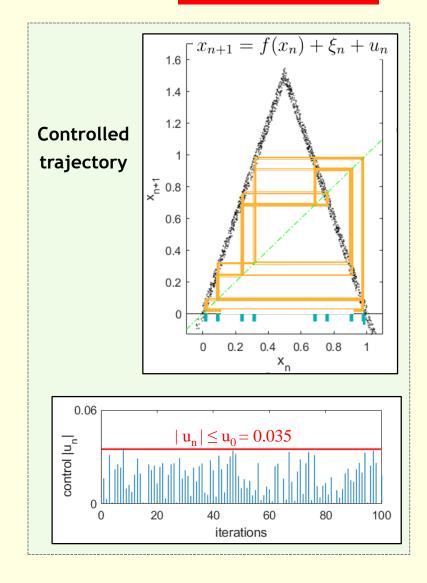






The safety function and the safe set

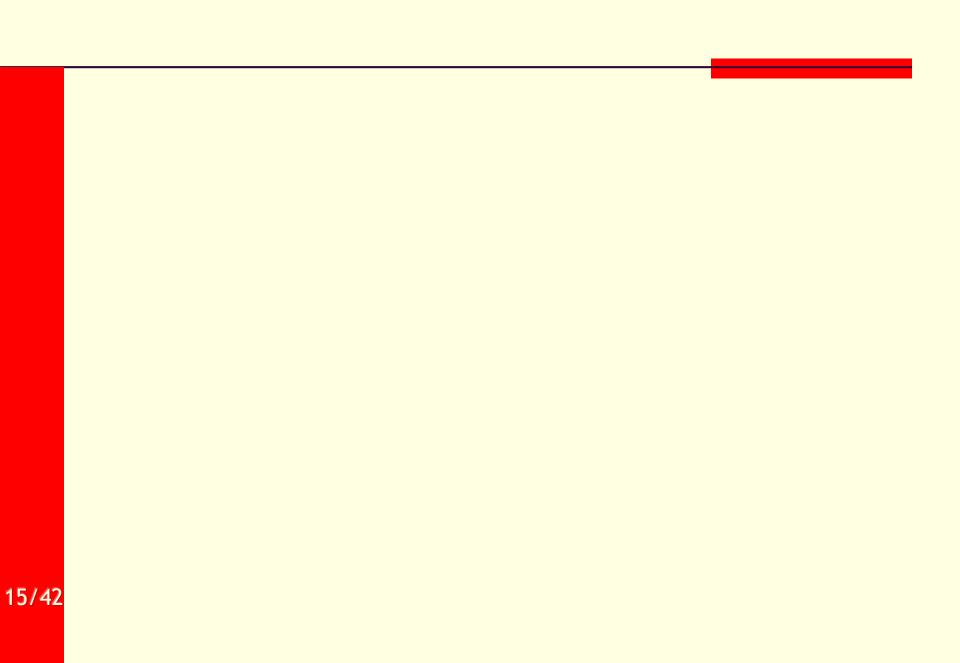




Q=[-0.1, 1.1]

Publicaciones

- 2004 J. Aguirre, F. d'Ovidio and M.A.F. Sanjuán. *Controlling chaotic transients: Yorke's game of survival*. Phys. Rev. E 69, 016203.
- **2008** S. Zambrano, M.A.F. Sanjuán and J.A. Yorke. *Partial control of chaotic systems*. Phys. Rev. E 77, 055201(R).
- **2009** S. Zambrano and M.A.F. Sanjuán. *Exploring partial control of chaotic systems*. Phys. Rev. E 79, 026217.
- **2010** J. Sabuco, S. Zambrano and M.A.F. Sanjuán. *Partial control of chaotic transients using escape times*. New J. Phys. 12, 113038.
- 2012 J. Sabuco, S. Zambrano, M.A.F. Sanjuán and J.A. Yorke. *Finding safety in partially controllable chaotic systems*. Commun.
 Nonlinear. Sci. Numer. Simul.17, 4274-4280, (2012).
- **2012** J. Sabuco, S. Zambrano, M.A.F. Sanjuán and J.A. Yorke. *Dynamics of partial control*. Chaos 22, 047507.
- **2013** M.Coccolo, J.M. Seoane, S. Zambrano and M.A.F. Sanjuán. *Partial control of escapes in chaotic scattering*. 23, 1350008.
- 2014 R. Capeáns, J. Sabuco and M.A.F. Sanjuán. <u>When less is more: Partial control to avoid extinction of predators in an ecological</u> <u>model</u>. Ecol. Complex. 19, 1-8.
- 2014 A.G. Lopéz, J. Sabuco, J.M. Seoane, J. Duarte, C. Januário and M.A.F. Sanjuán. <u>Avoiding healthy cells extinction in a cancer</u> model. J. Theor. Biol.349, 74-81.
- **2015** S. Das and J.A. Yorke. *Avoiding extremes using partial control*. J. Differ. Equations Appl. 22, 217-234.
- **2016** R. Capeáns, J. Sabuco and M.A.F. Sanju'an. *Parametric partial control of chaotic systems*. Nonlinear Dyn. 2, 869-876.
- 2016 S. Naik and S.D. Ross. <u>Geometric aproaches in Phase Space Transport and Partial Control of Escaping Dynamics</u>. PhD Thesis. Virginia. Tech University.
- 2017 R. Capeáns, J. Sabuco, M.A.F. Sanjuán and J.A. Yorke. *Partially controlling transient chaos in the Lorenz equations*. Phil. Trans. R. Soc. A 375, 2088.
- 2017 A. Levi, J. Sabuco and M.A.F. Sanjuán. <u>When the firm prevents the crash: Avoiding market collapse with partial control</u>. Plos One . 12(8).
- 2017 V. Agarwal, J.Sabuco and B. Balachandran. <u>Safe regions with partial control of a chaotic system in the presence of white Gaussian</u>. <u>noise</u>. IJBC 94, 3-1.
- **2018** R. Capeáns, J. Sabuco, and M.A. F. Sanjuán. *Partial control of delay-coordinate maps*. Nonlinear Dynamics 92, 1419-1429.
 - 2019 R. Capeáns, J. Sabuco, and M.A. F. Sanjuán. <u>A new approach of the partial control method in chaotic systems</u>. Nonlinear Dynamics 98, 873-887.



$$r_{n}^{2}$$
 r_{n-2}^{2} r_{n-3}^{2}

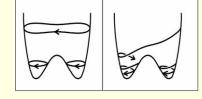
$$x_n = f(x_{n-1}, x_{n-2}, ...) + \xi_n + u_n$$

$$q[j] = f(q[i], \xi[s]) + u[i, s, j]$$

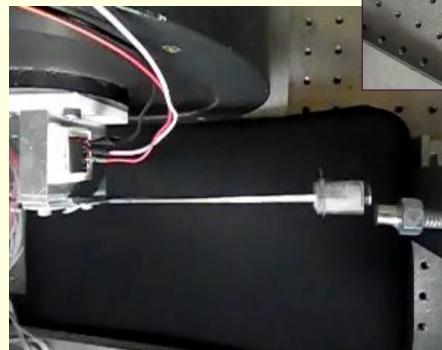
$$U_{k+1}[i] = \max_{1 \le s \le M_i} \left(\min_{1 \le j \le N} \left(\max \left(u[i, s, j], U_k[j] \right) \right) \right)$$

Application to the Duffing oscillator

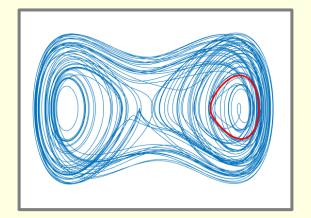
Duffing oscillator



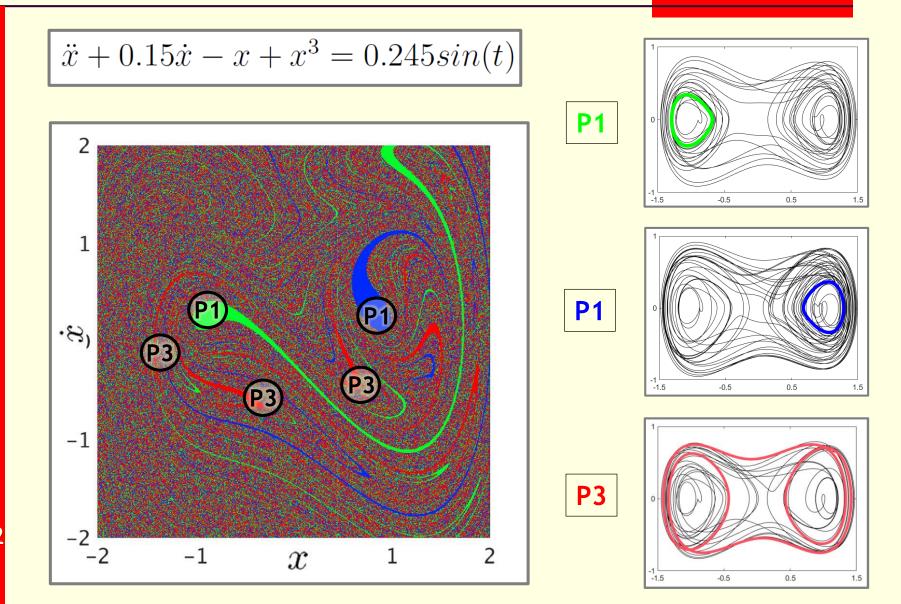
$$\ddot{x} + \delta \dot{x} + \alpha x + \beta x^3 = Fcos(wt)$$





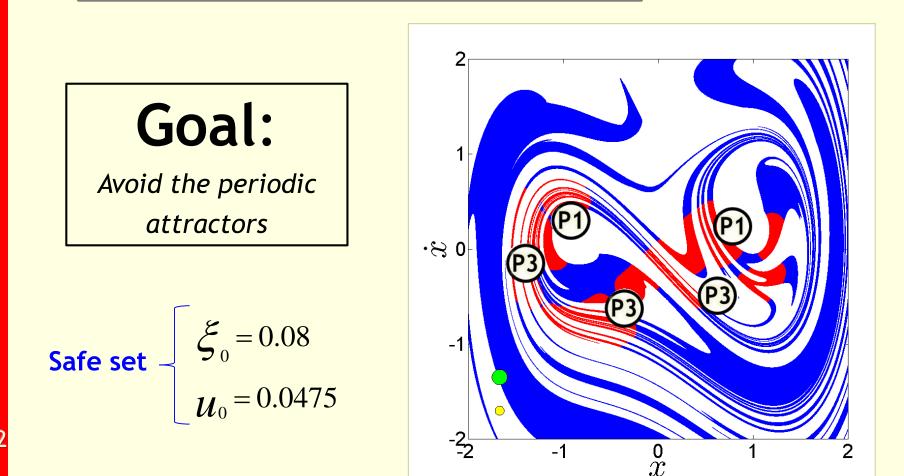


Application to the Duffing oscillator



Application to the Duffing oscillator

$$\ddot{x} + 0.15\dot{x} - x + x^3 = 0.245sin(t)$$



$$\begin{aligned} q_{n+1} &= f(q_n) + \xi_n \\ q_{n+1} &= f(q_n, p) \\ q_{n+1} &= f(q_n, p) \\ q_{n+1} &= f(q_n, p) \\ q_{n+1} &= f(x_{n-1}, x_{n-2}, \dots, + y_n + y_n) \\ q_{n+1} &= f(x_{n-1}, x_{n-2}, \dots, + y_n)$$

1- Introduction

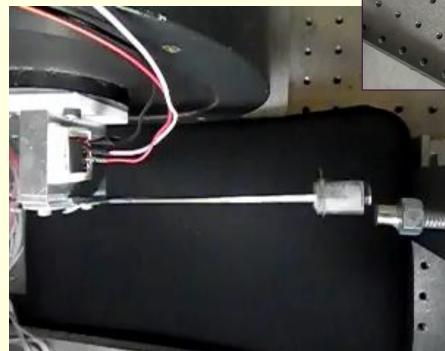
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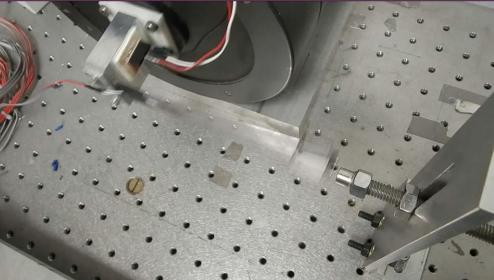
Experimental transient chaos

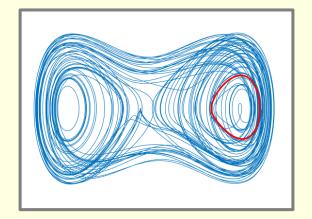
Duffing oscillator



$$\ddot{x} + \delta \dot{x} + \alpha x + \beta x^3 = Fcos(wt)$$

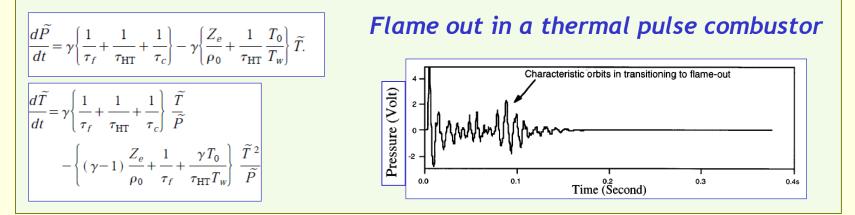






Transient chaos may involve an undesirable state

Visarath In, Mark L. Spano, Joseph D. Neff, William L. Ditto, C. Stuart Daw, K. Dean Edwards and Ke Nguyen. *Maintenance of chaos in a computational model of a thermal pulse combustor. Chaos* **7**, 605, 1997



M. Dhamala and Y.C. Lai. *Controlling transient chaos in deterministic flows with applications to electrical power systems and ecology. Phys. Rev.* E **59**, 1646, 1999

80

100

Electrical power

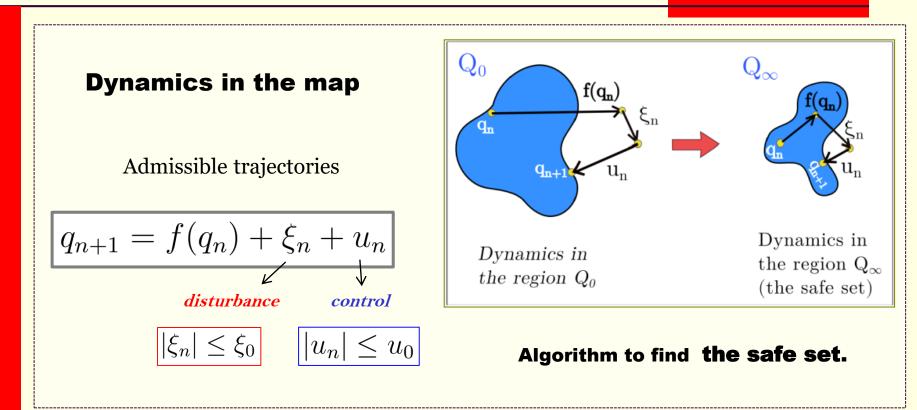
system collapse

$$\begin{split} \dot{\delta}_{m} &= \omega, \\ M\dot{\omega} &= -d_{m}\omega + P_{m} - E_{m}VY_{m}\sin(\delta_{m} - \delta), \\ K_{qw}\dot{\delta} &= -K_{qv2}V^{2} - K_{qv}V + Q(\delta_{m}, \delta, V) - Q_{0} - Q_{1}, \\ TK_{qw}K_{pv}\dot{V} &= K_{pw}K_{qv2}V^{2} + (K_{pw}K_{qv} - K_{qw}K_{pv})V \\ &+ K_{qw}[P(\delta_{m}, \delta, V) - P_{0} - P_{1}] \\ -K_{pw}[Q(\delta_{m}, \delta, V) - Q_{0} - Q_{1}]. \end{split}$$

2- Description of the partial control method

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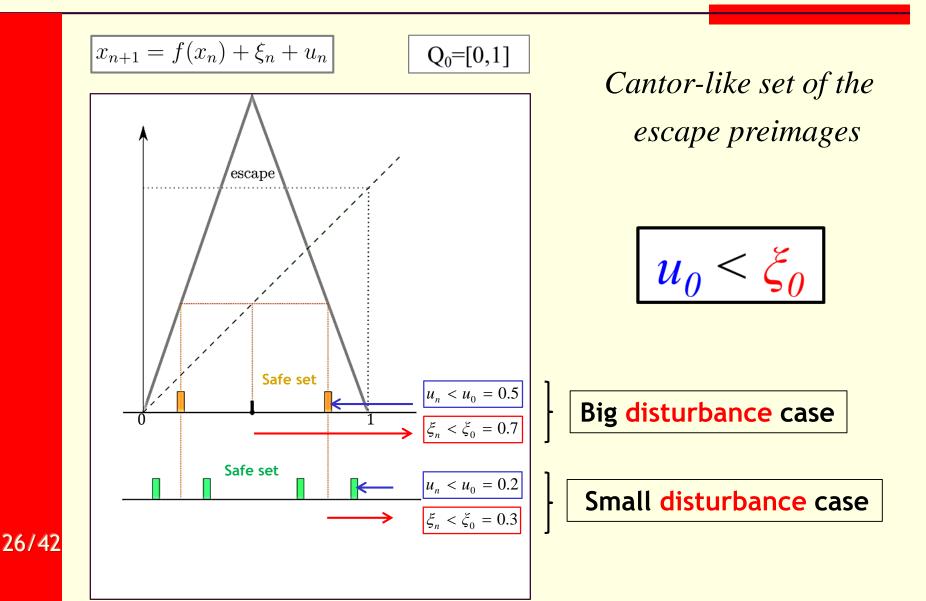
Partial control algorithm



Controlled trajectories in the safe set

 $< \xi_0$ u_0

Partial control: control < disturbance

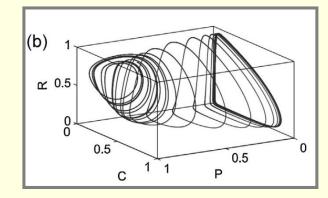


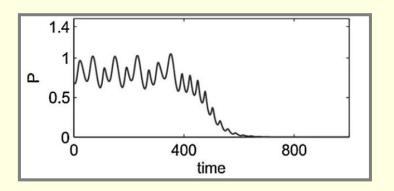
3- Partial control to avoid a species extinction

R. Capeáns, J. Sabuco and M.A.F. Sanjuán. When less is more: Partial control to avoid extinction of predators in an ecological model. *Ecological Complexity* **19**, 1-8 (2014).

An ecological model

Chaotic transient leads to the predators extinction



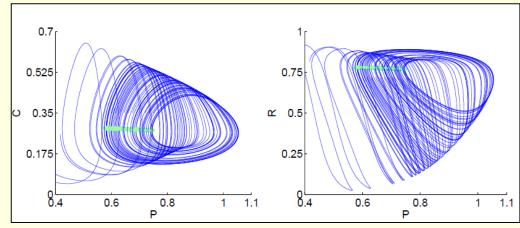


Time series of P

To build a map and implement the partial control

Set of minima of P

$$P_{n+1} = f(P_n)$$

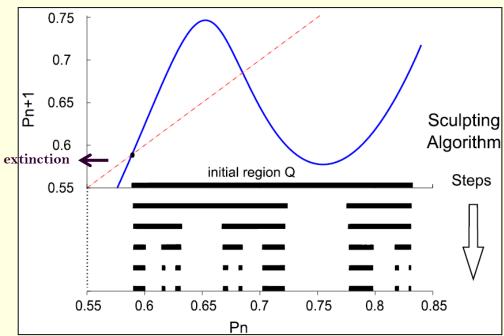


Return Map and the Safe Set

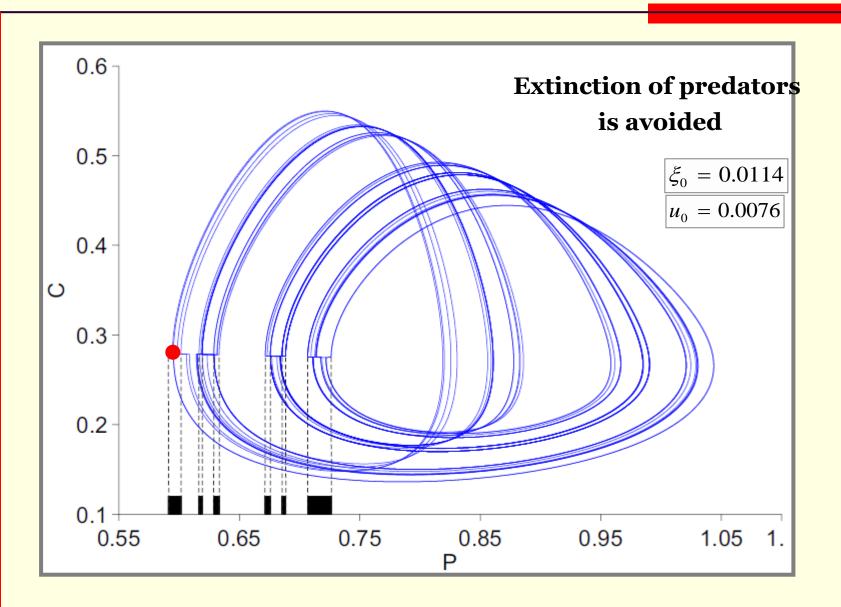
$$P_{n+1} = f(P_n) + \xi_n + u_n$$

$$\xi_0 = 0.0114$$

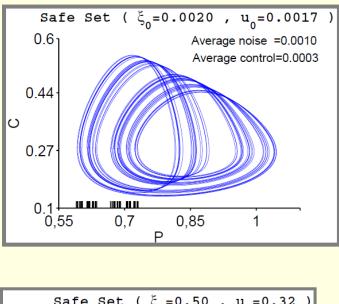
 $u_0 = 0.0076$

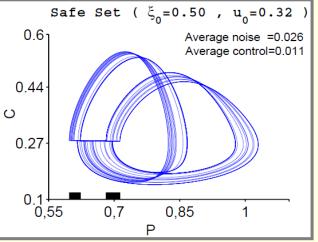


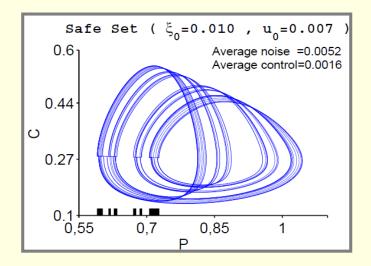
Partial control in the phase space

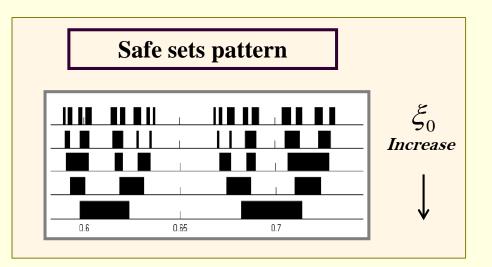


Different disturbance and control









4- Controlling chaos in the Lorenz system

R. Capeáns, J. Sabuco, M. A. F. Sanjuán and J. A.Yorke. Partially controlling transient chaos in the Lorenz equations. *Philosophical Transactions of the Royal Society A* **375**, 2088 (2017).

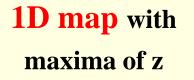
Transient chaos in the Lorenz system

Transient chaos $\dot{x} = -\sigma x + \sigma y$ $\dot{y} = -xz + rx - y$ 30 $\dot{z} = xy - bz.$ N 20 10 *σ*=10 b=8/3 r=20 10 -10 0 -10 ⁰ 10 Х

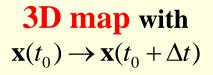
Goal: avoid the attractors:

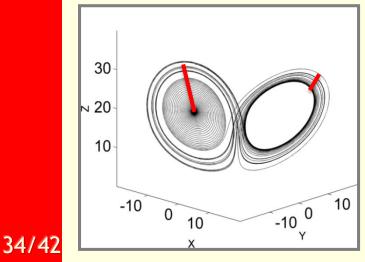
$$C^{-} = (-7.12, -7.12, 19)$$
$$C^{+} = (7.12, 7.12, 19)$$

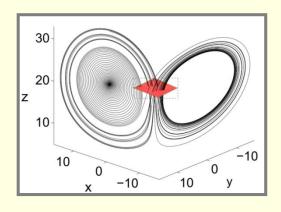
Different ways to build a map :
$$q_{n+1} = f(q_n)$$

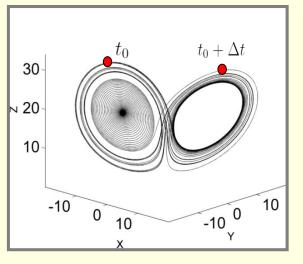


2D map with **Poincaré section**

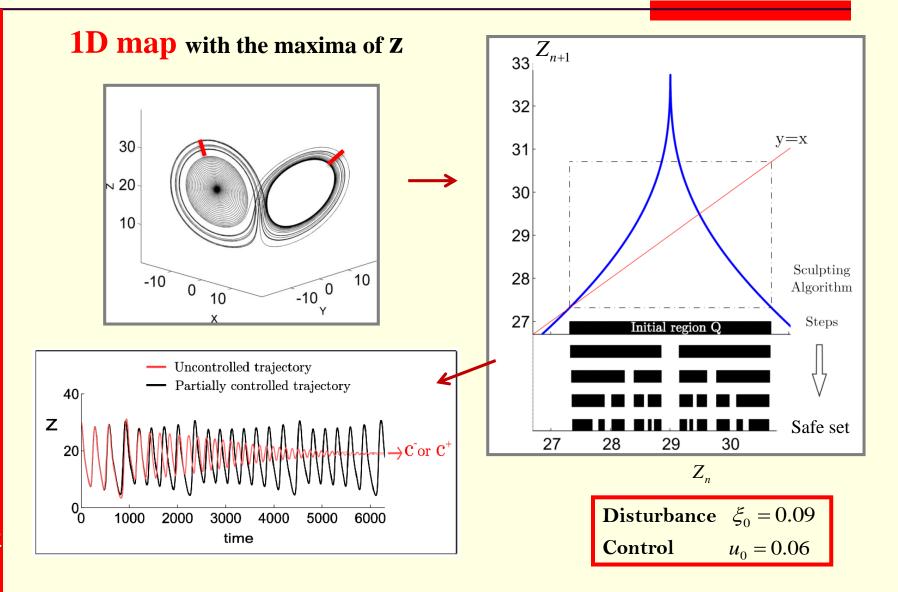






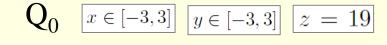


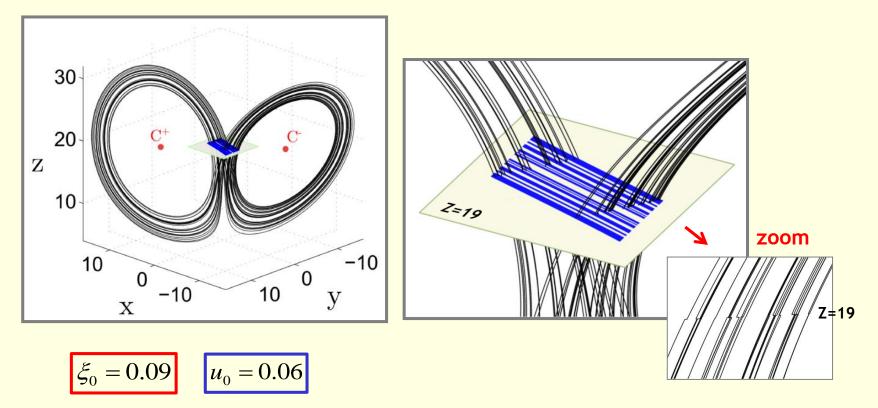
1D safe set



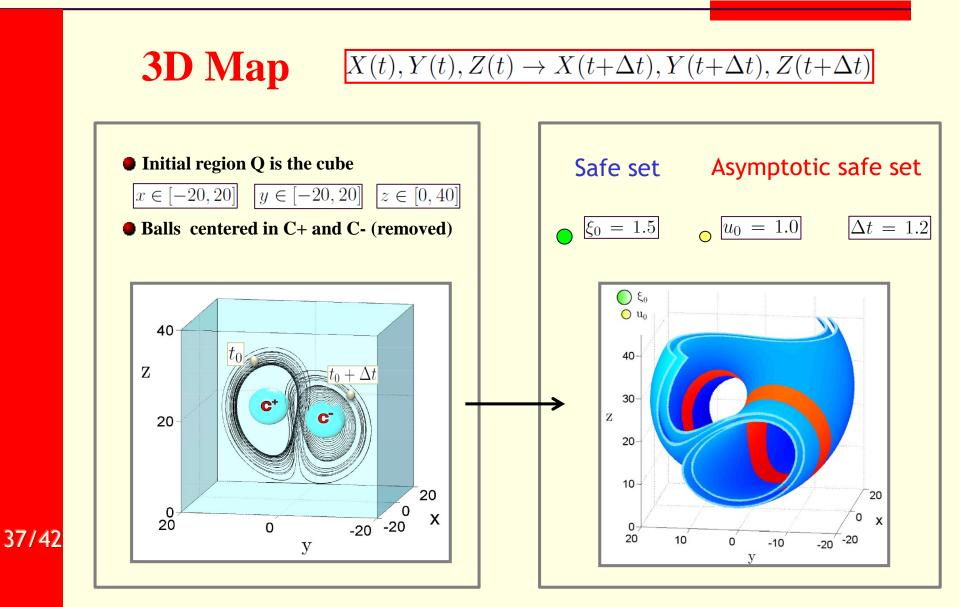
2D safe set

Discretization with a Poincaré section

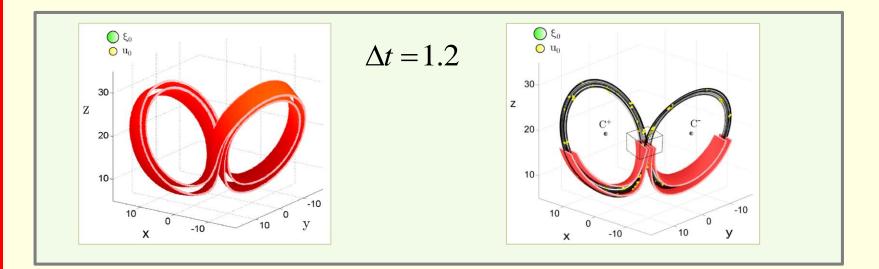


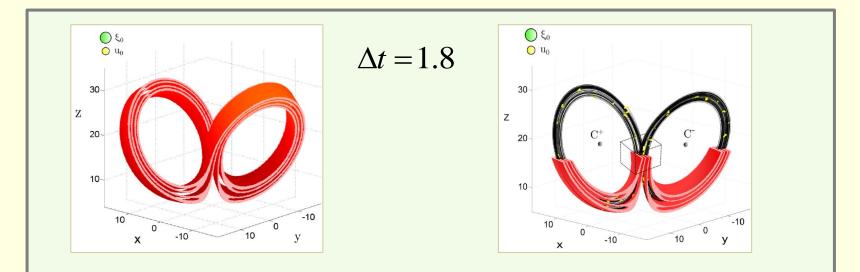


3D safe set



3D asymptotic safe set $u_0 = 1$ $\xi_0 = 1.5$





5- A different application of partial control

R. Capeáns, J. Sabuco and M. A. F. Sanjuán. Escaping from a chaotic saddle in the presence of noise. International Journal of Nonlinear Dynamics and Control 1, 1-8, (2017).

Escape or not: the logistic map

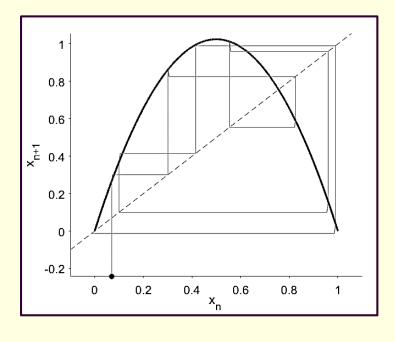
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$$x_{n+1} = 4.1x_n(1 - x_n) + \xi_n$$

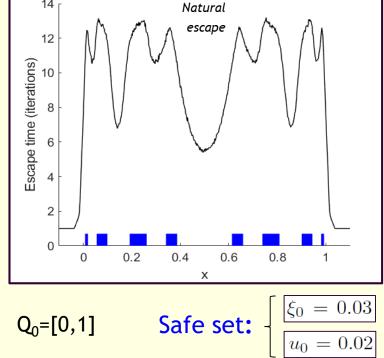
Escape from the safe set to reduce the escape time?

Correlation: escape time and safe set

Logistic map without control



escape 12

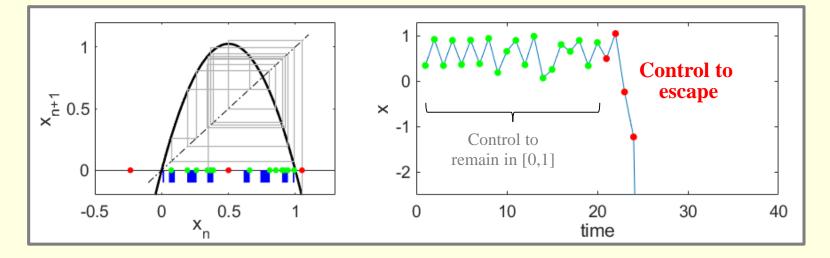


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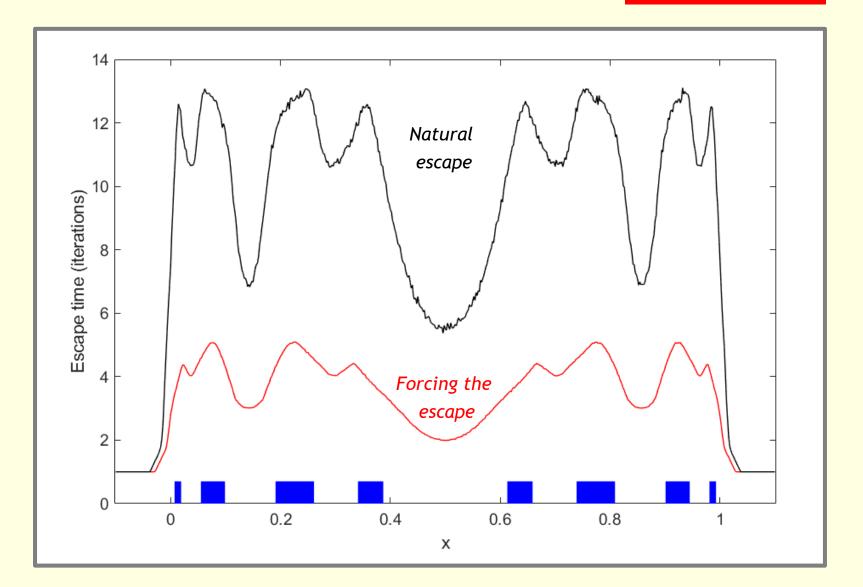
 $|\xi_n| \le \xi_0 = 0.03$

Escape or not: the logistic map (comparison)

 $u_0 = 0.02$ $\xi_0 = 0.03$ 0 x[±] 0.5 \times -1 **Natural** Control to remain in [0,1] escape 0 -2 -0.5 0 0.5 10 20 30 40 0 x_n time



Escape or not: the logistic map (comparison)



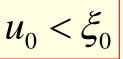
6- When the disturbance affects a parameter

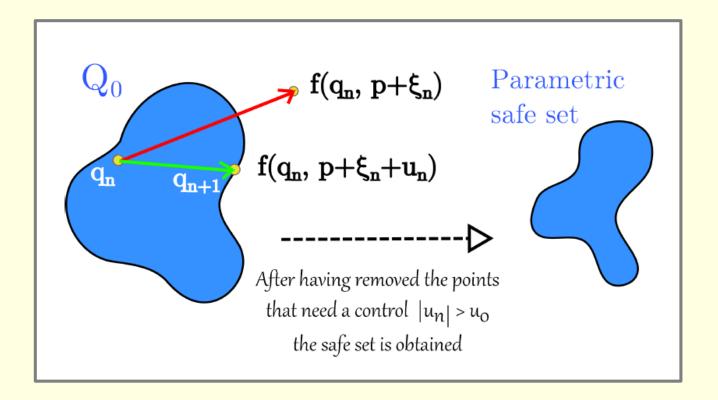
R. Capeáns, J. Sabuco and M. A. F. Sanjuán. Parametric partial control of chaotic systems. *Nonlinear Dynamics* **2**, 869-876, (2016).

Parametric partial control

$$q_{n+1} = f(q_n, p + \xi_n + u_n)$$

$$\begin{aligned} |\xi_n| &\leq \xi_0 \\ |u_n| &\leq u_0 \end{aligned}$$





Parametric partial control in the Duffing oscillator

Parametric partial control in the Duffing oscillator

$$\ddot{x} + 0.15\dot{x} - x + x^{3} = 0.245sin(t)$$

$$0.245 + \xi_{n} + u_{n}$$

$$Goal:$$
Avoid the periodic attractors
$$\int_{0}^{2} \xi_{0} = 0.020$$

$$\int_{0}^{1} \xi_{0} = 0.014$$

-2

-1

0

x

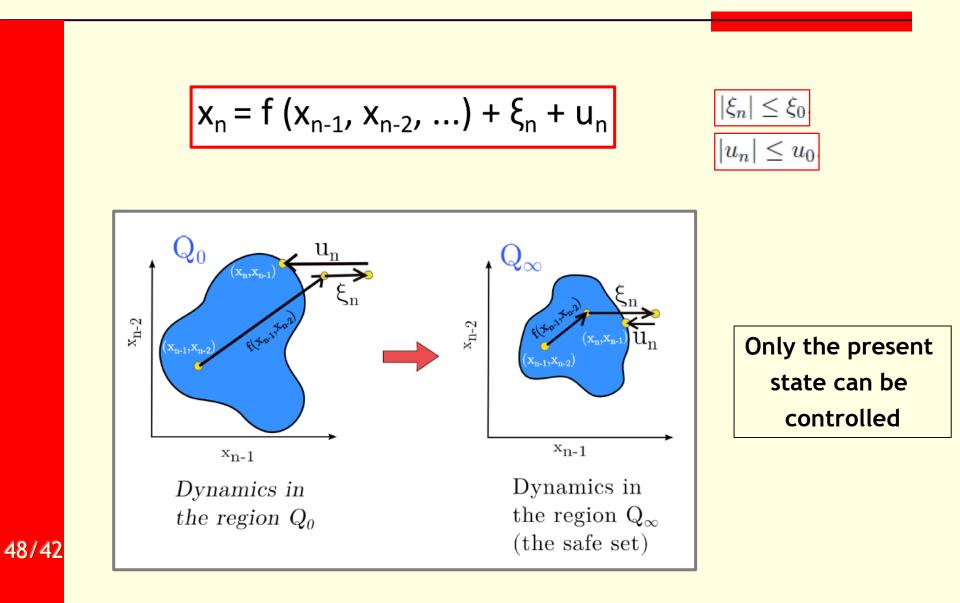
2

1

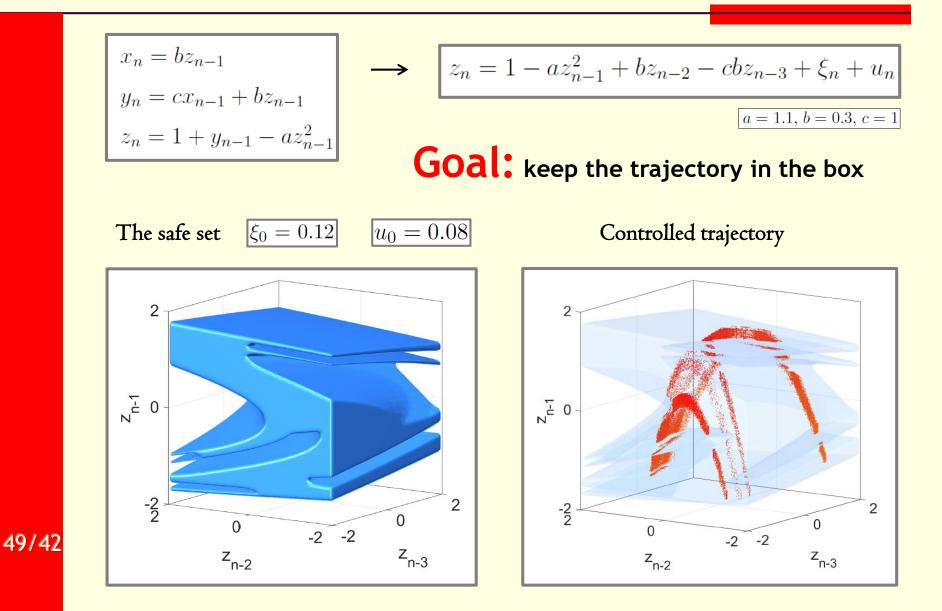
7- Controlling time-delay coordinate maps

R. Capeáns, J. Sabuco and M. A. F. Sanjuán. Partial control of delaycoordinate maps. Nonlinear Dynamics **92**, 1419-1429, (2018).

Time-delay coordinate maps: partial control scheme



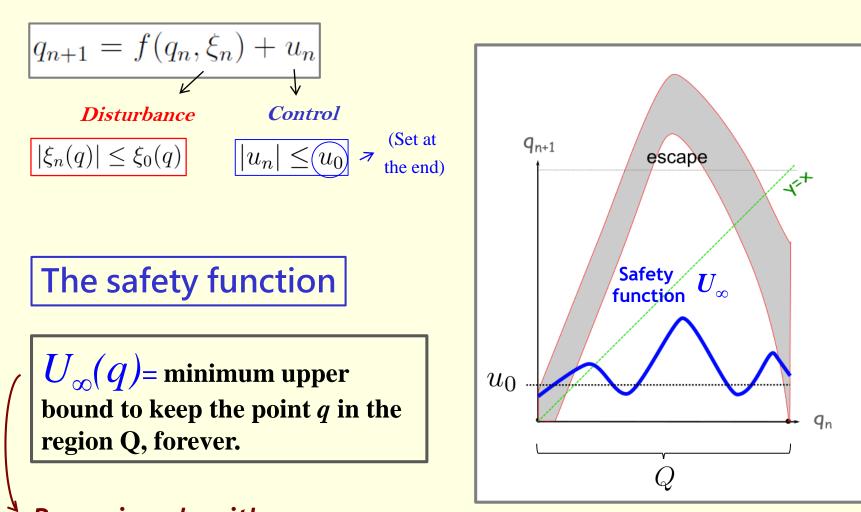
Time-delay coordinate maps: The 3D Hénon map



8- A new approach: the safety function

R. Capeáns, J. Sabuco and M. A. F. Sanjuán. A new approach of the partial control method in chaotic systems. Nonlinear Dynamics (2019) https://arxiv.org/abs/1902.06238

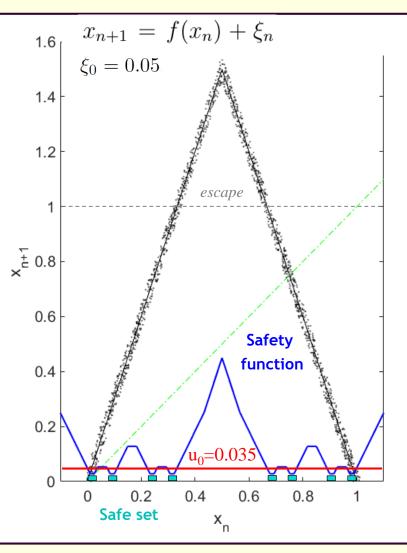
The safety function

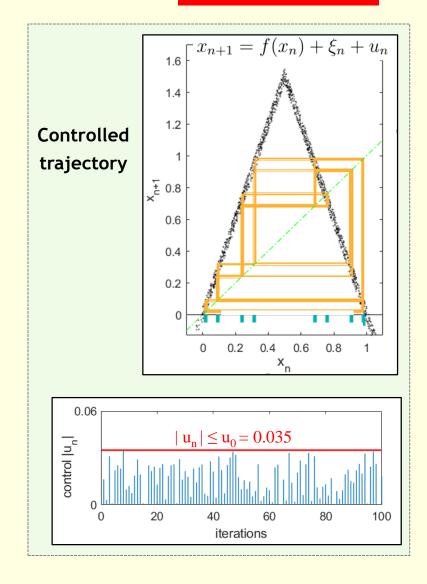


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Recursive algorithm

The safety function and the safe set



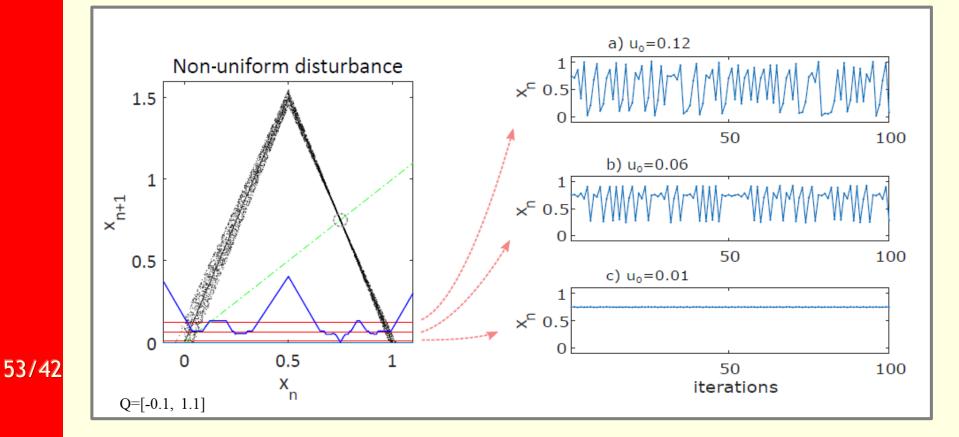


Q=[-0.1, 1.1]

The safety function with non-uniform disturbance

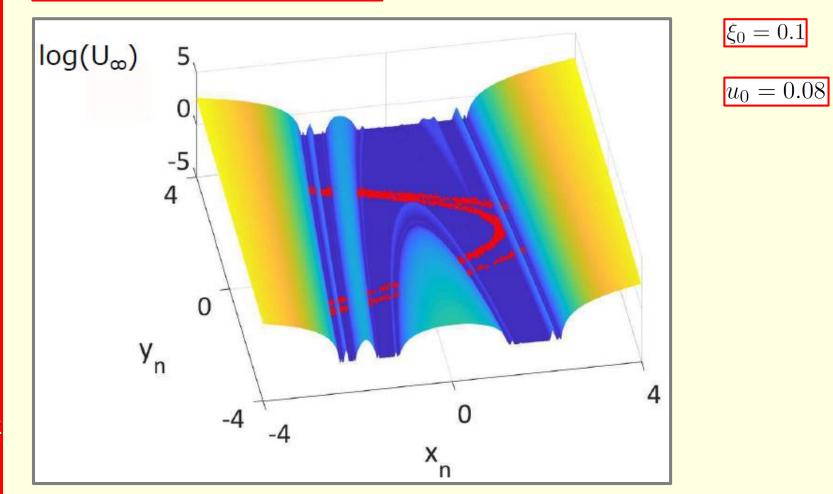
The slope-3 tent map Non-uniform disturbance

$$x_{n+1} = \begin{cases} 3x_n + \xi_n(4x_n - 3) + u_n & \text{for } x_n \le \frac{1}{2} \\ 3(1 - x_n) + \xi_n(4x_n - 3) + u_n & \text{for } x_n > \frac{1}{2}, \end{cases}$$



The safety function in the Hénon map

$$\begin{aligned} x_{n+1} &= a - by_n - x_n^2 + \xi_n^x + u_n^x \\ y_{n+1} &= x_n + \xi_n^y + u_n^y. \end{aligned} \qquad \begin{aligned} a &= 2.16 \text{ and } b = 0.3 \\ \hline Q_0 &= [-4, 4] \times [-4, 4] \end{aligned}$$



8- Conclusions

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Conclusions

Introduction and first applications:

- Partial control is applied on dynamical systems that exhibits transient chaos, with the aim of avoiding the crisis even in presence of noise.
- This method is able to keep the amount of control smaller than the disturbance affecting the system
- An ecological model was considered with the aim of avoiding the extinction of one species. By computing a one-dimensional safe set the crisis was suppressed.
- This control method was also applied to the Lorenz system by using a 1D, 2D and 3D maps, obtaining for the first time a three-dimensional safe set.

Conclusions

The partial control technique was adapted to be applied in different scenarios:

- First, we have shown that safe sets can be used in a dual way, to avoid the escape or to accelerate it.
- Secondly, we considered the scenario where a parameter of the system is affected by the disturbance. We found that parametric safe sets exist when control is applied on the parameter of the system.
- Finally, the family of time-delay coordinates maps was studied. We show that it is possible to control the orbits with the only observation and control of one variable.

Conclusions

A new approach:

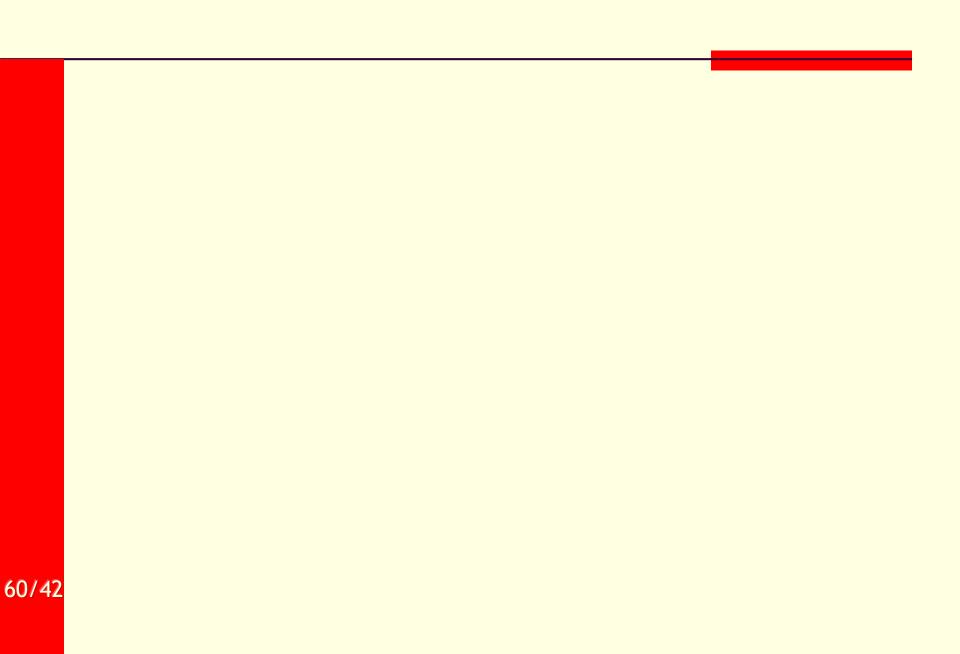
- With the same philosophy of partial control, we introduce the concept of the safety function, which is a generalization of the safe set.
- This function indicates the minimum upper bound of control necessary to keep each initial condition in the region Q forever.
- The use of the safety function allows us to treat more diverse scenarios, being specially useful in case of experimental time series.

Publications

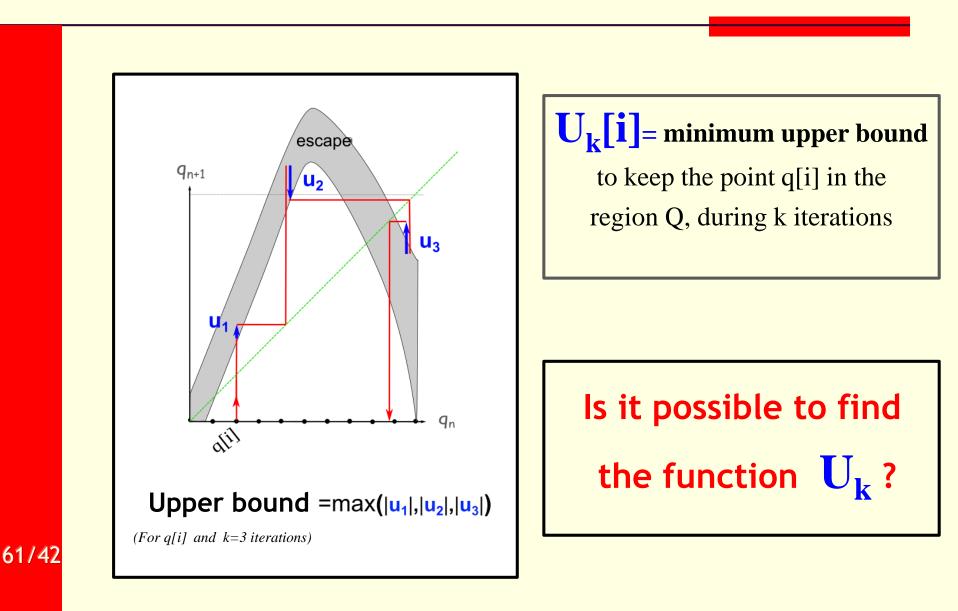
- R. Capeáns, J. Sabuco and M. A. F. Sanjuán. A new approach of the partial control method in chaotic systems. Nonlinear Dynamics (2019) https://arxiv.org/abs/1902.06238
- R. Capeáns, J. Sabuco and M.A.F.Sanjuán. Partial control of chaos: how to avoid undesirable behaviors with small controls in presence of noise. Discrete and Continuous Dynamical Systems - Series B 2, 3237-3274, (2018).
- R. Capeáns, J. Sabuco and M. A. F. Sanjuán. Partial control of delay-coordinate maps. Nonlinear Dynamics 92, 1419-1429, (2018).
- R. Capeáns, J. Sabuco and M. A. F. Sanjuán. Escaping from a chaotic saddle in the presence of noise. International Journal of Nonlinear Dynamics and Control 1, 1-8, (2017).
- R. Capeáns, J. Sabuco, M. A. F. Sanjuán and J. A. Yorke. Partially controlling transient chaos in the Lorenz equations. *Philosophical Transactions of the Royal Society A* 375, 2088, (2017).
- R. Capeáns, J. Sabuco and M. A. F. Sanjuán. Parametric partial control of chaotic systems. Nonlinear Dynamics 2, 869-876, (2016).

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 R. Capeáns, J. Sabuco and M. A. F. Sanjuán. When less is more: Partial control to avoid extinction of predators in an ecological model. *Ecological Complexity* 19, 1-8, (2014).



Meaning and computation of the safety function



The function Uk (in absence of disturbances)

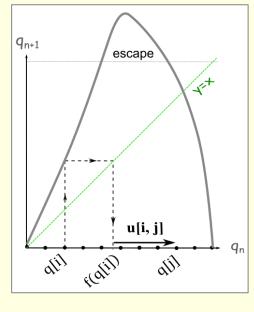
What is the minimum control bound for every point $q \in Q$ to remain in Q during k iterations?

Discretization

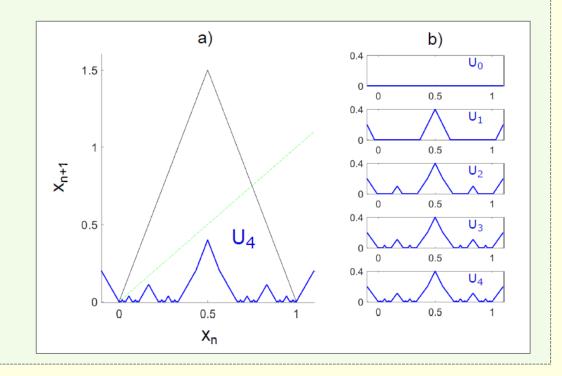
$$q_{n+1} = f(q_n) + u_n$$

$$\mathbf{v}$$

$$q[j] = f(q[i]) + u[i, j]$$



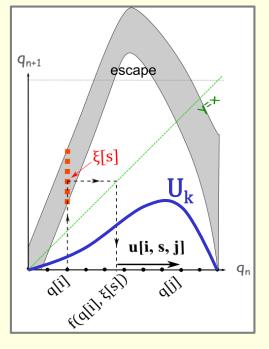
$$U_{k+1}[i] = \min_{1 \le j \le N} \left(\max \left(u[i, j], U_k[j] \right) \right)$$



Meaning and computation of the safety function

Discretization

$$q_{n+1} = f(q_n, \xi_n) + u_n$$
$$\checkmark$$
$$q[j] = f(q[i], \xi[s]) + u[i, s, j]$$



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Recursive algorithm

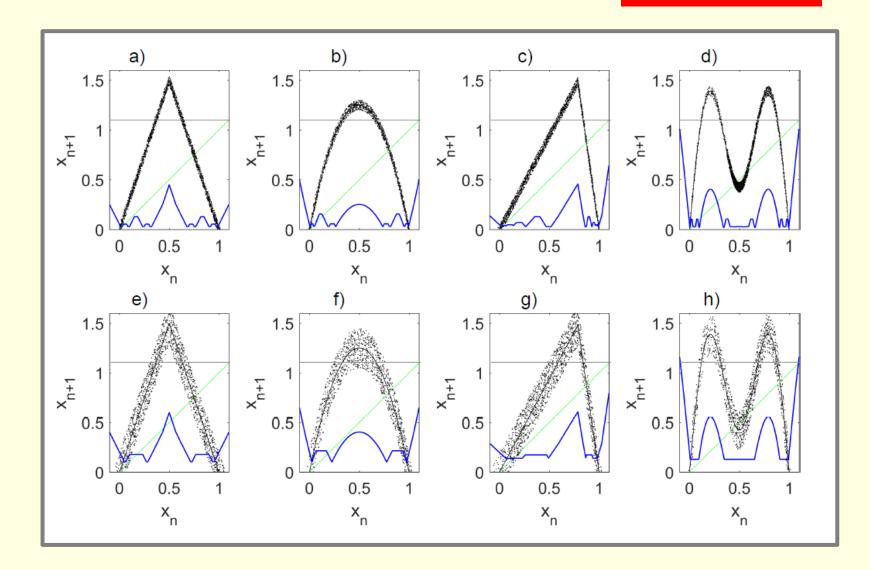
$$U_{k+1}[i] = \max_{1 \le s \le M_i} \left(\min_{1 \le j \le N} \left(\max\left(u[i, s, j], U_k[j] \right) \right) \right)$$

To remain in $\, {\tt Q} \,$ forever we need to find $\, {ar U}_{\scriptscriptstyle \infty} \,$

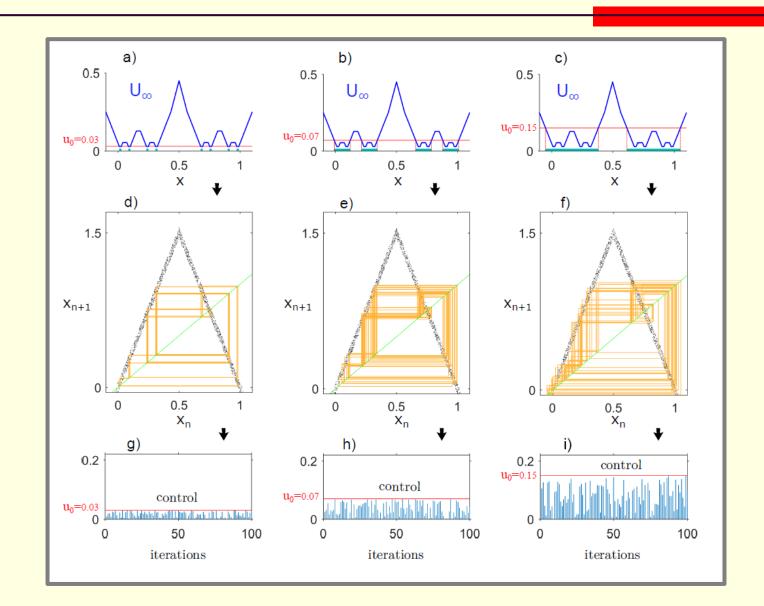
If the algorithm converges... $U_{k+1} = U_k$

and then... $U_{\infty} = U_k$ \downarrow The safety function

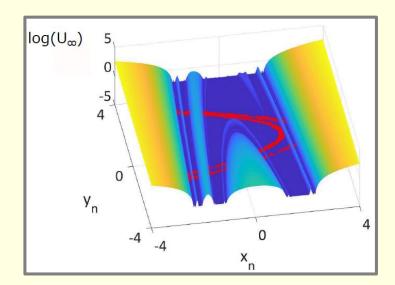
Different safety functions



Recovering the safe set from the safety function



The safety functions in different scenarios



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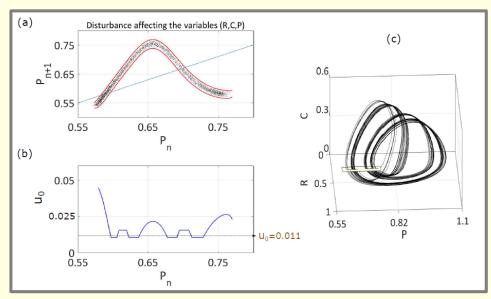
The Hénon map

$$x_{n+1} = a - by_n - x_n^2 + \xi_n^x + u_n^x$$
$$y_{n+1} = x_n + \xi_n^y + u_n^y.$$

$$a = 2.16$$
 and $b = 0.3$

$$\xi_0 = 0.1$$

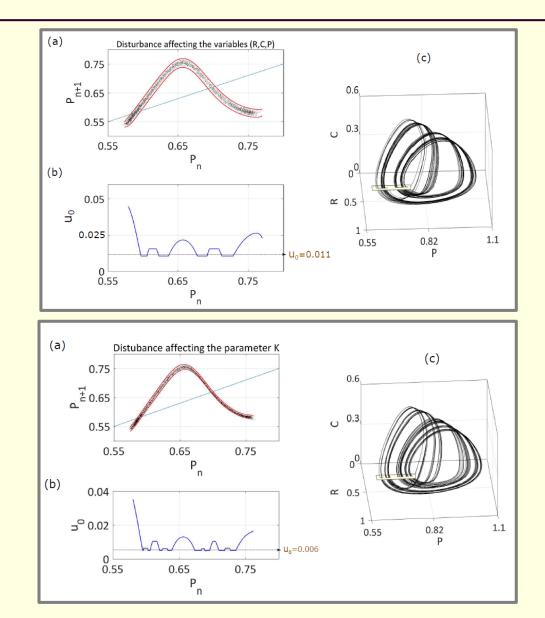
 $u_0 = 0.08$



The ecological model: Continuous noise affecting the variables R,C,P

$$\begin{aligned} \frac{dR}{dt} &= R\left(1 - \frac{R}{K}\right) - \frac{x_c y_c CR}{R + R_0} \\ \frac{dC}{dt} &= x_c C\left(\frac{y_c R}{R + R_0} - 1\right) - \psi(P) \frac{y_p C}{C + C_0} \\ \frac{dP}{dt} &= \psi(P) \frac{y_p C}{C + C_0} - x_p P \end{aligned}$$

The safety functions in different scenarios



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$$\begin{aligned} \frac{dR}{dt} &= R\left(1 - \frac{R}{K}\right) - \frac{x_c y_c CR}{R + R_0} \\ \frac{dC}{dt} &= x_c C\left(\frac{y_c R}{R + R_0} - 1\right) - \psi(P) \frac{y_p C}{C + C_0} \\ \frac{dP}{dt} &= \psi(P) \frac{y_p C}{C + C_0} - x_p P \end{aligned}$$

The ecological model: Continuous noise affecting the variables R,C,P

The ecological model: Continuous noise affecting the parameter k

Control of chaos

Chaotic motion to regular motion

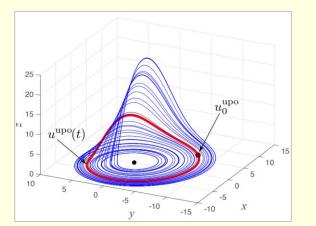
How?

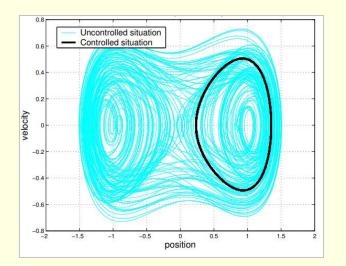
• OGY method (1990)



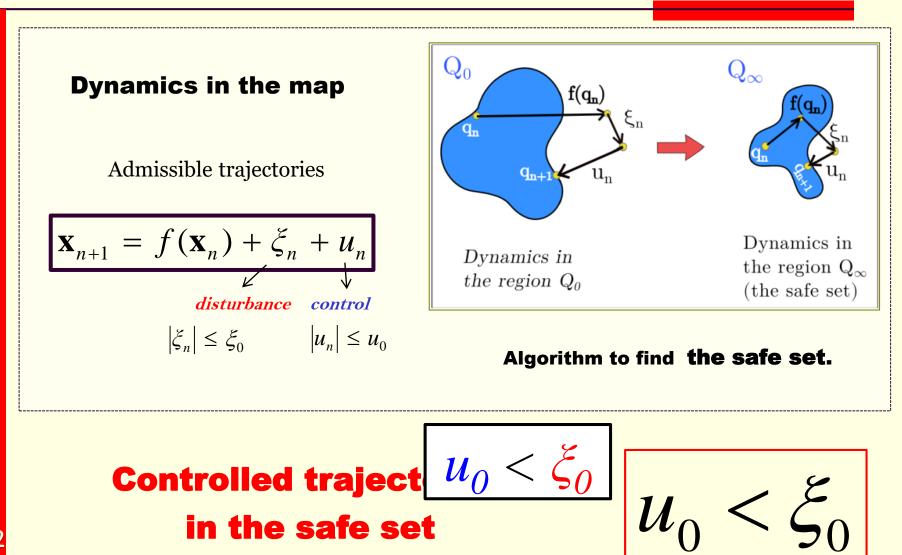
• Delayed Feedback control (1992)





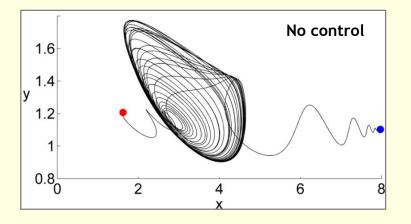


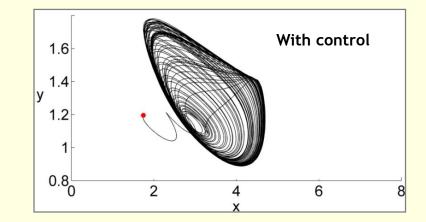
Partial control algorithm



Control of transient chaos

Avoiding the crisis..

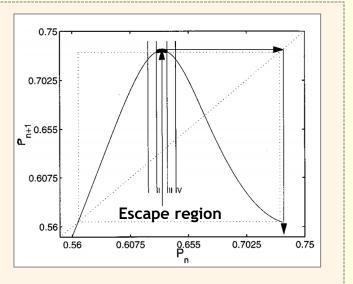




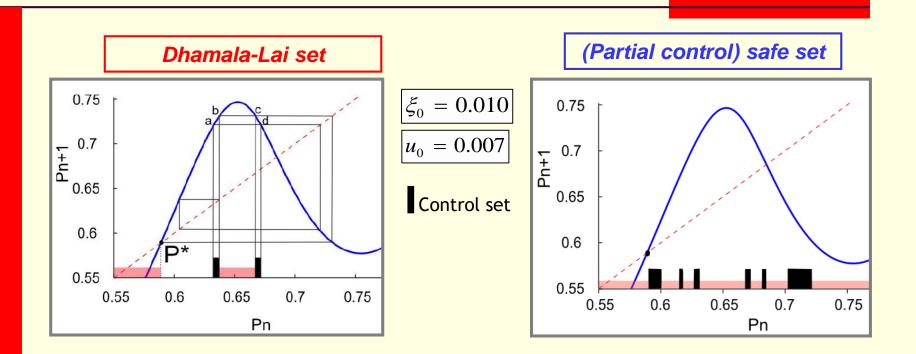
Dhamala and Lai control

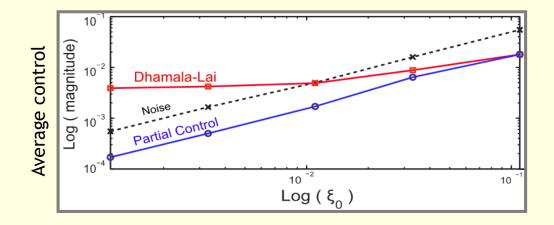
- Identify the escape regions
- Apply control to avoid them
- No noise considered !!

M. Dhamala and Y.C. Lai. *Controlling transient chaos in deterministic flows with applications to electrical power systems and ecology. Phys. Rev.* E **59**, 1646, 1999



Comparing the control methods

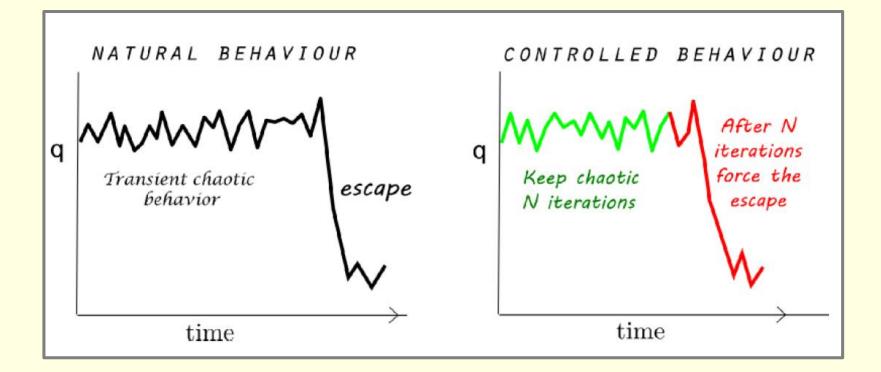




Escape or not

Based on the idea that the escape time

with disturbances resembles the safe set

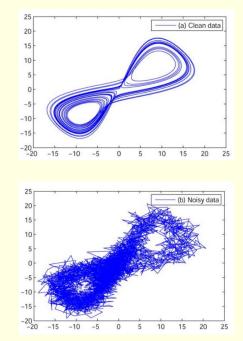


The partial control motivation

Goal: avoid the crisis (escapes) of the transient chaotic trajectory

However:

- Real systems are affected by disturbances
- Source of disturbances: mismatches in model, uncertainty in the exact state of the system, external perturbations..
- Chaotic dynamics is a natural amplifier of noise and therefore control methods may fail.

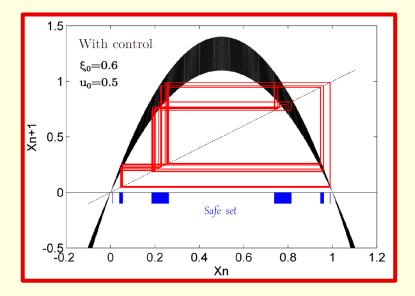


Partial control:

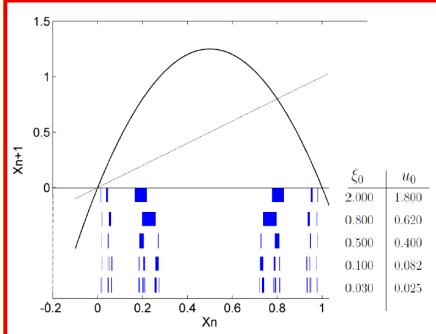
Keep the noise under control and keep the control low

Parametric partial control in the logistic map

$$x_{n+1} = (r + \xi_n + u_n)x_n(1 - x_n)$$

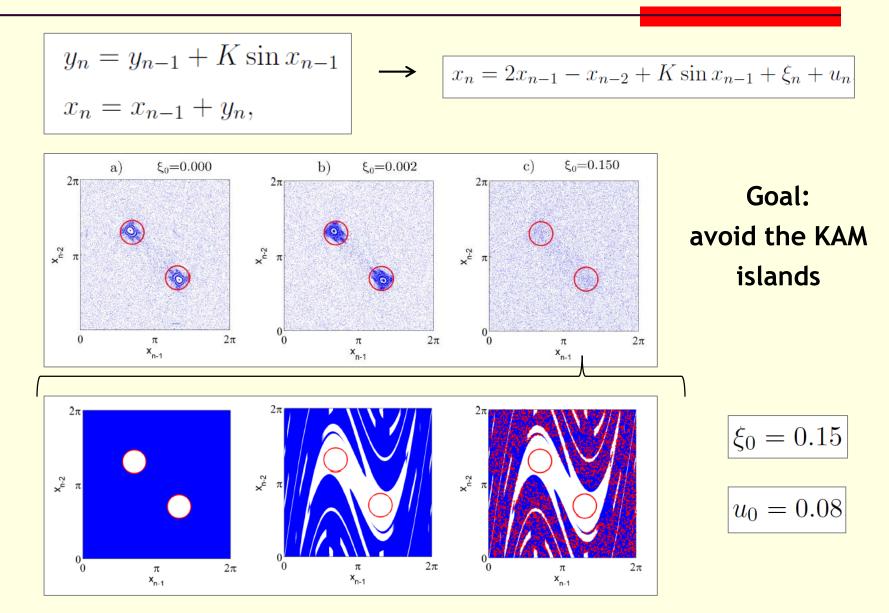


Controlled trajectory using the parametric safe set



How the parametric safe set changes?

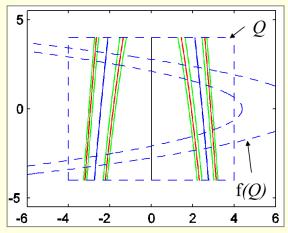
Time-delay coordinate maps: The estandar map



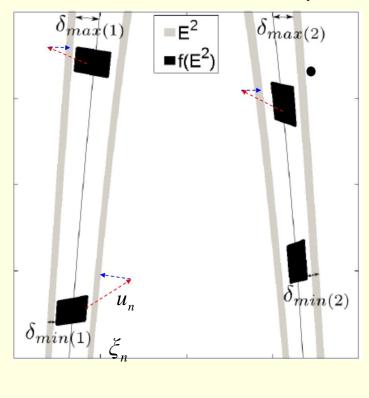
Partial control basics

Smale horseshoe

Hénon horseshoe



Partial control in the Hénon map



$$\mathbf{x}_{n+1} = f(\mathbf{x}_n) + \xi_n + u_n$$

disturbance control

Experimental transient chaos

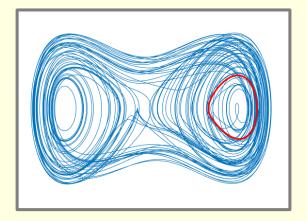
Duffing oscillator



 $\ddot{x} + \delta \dot{x} + \alpha x + \beta x^3 = Fcos(wt)$



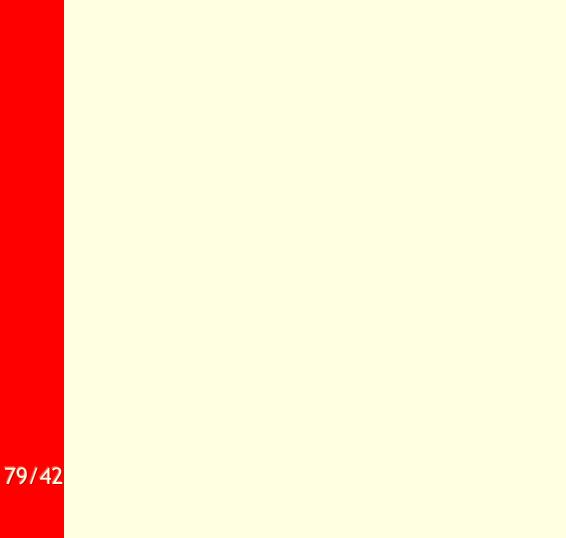




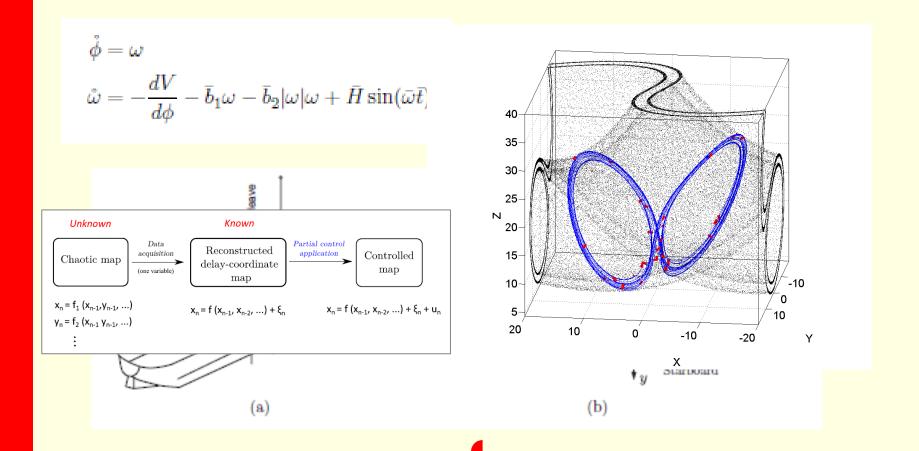
Thank you all for your attention.

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Partial control of a ship capsize model



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Shibabrat Naik and Shane D. Ross. Geometric aproaches in Phase Space Transport and Partial Control of Escaping Dynamics. PhD Thesis. Virginia Tech University.