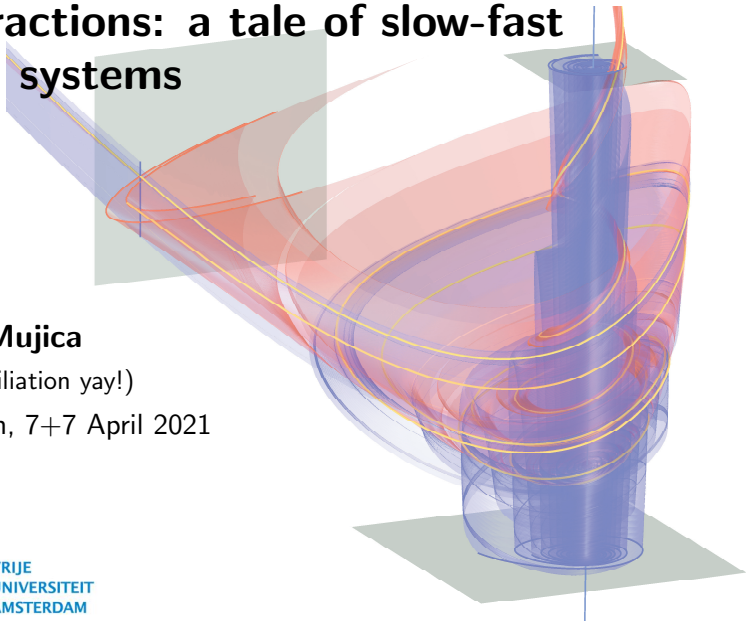


# Slow Manifolds, Invariant Manifolds and their interactions: a tale of slow-fast dynamical systems

**José Mujica**

VU (new affiliation yay!)

VU Colloquium, 7+7 April 2021



# General context

- Systems with slow and fast episodes I: Neurons (Spiking, bursting).



Periodic Spiking

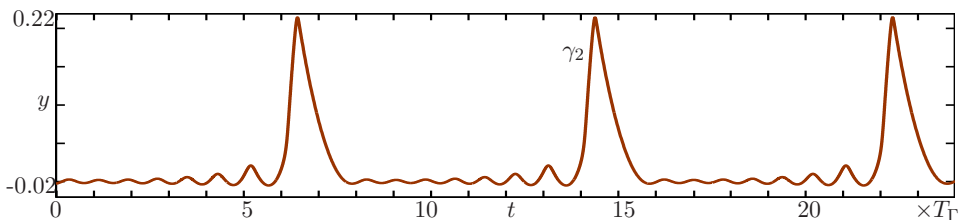


Periodic Bursting

[C. Morris, H. Lecar, *Voltage oscillations in the Barnacle giant muscle fiber*, *Biophys. J.* 35 (1981), 193–213.]

## General context

- Systems with slow and fast episodes II: Chemical reactions.
- Mixed-mode oscillations (MMOs).



- Aim: To study new mechanisms for such dynamics.

# Slow-Fast Systems

Slow time-scale ( $t$ ):

$$\begin{aligned}\varepsilon \dot{x} &= f(x, y) \\ \dot{y} &= g(x, y)\end{aligned}$$

$$\Downarrow_{\varepsilon \rightarrow 0}$$

$$\begin{aligned}0 &= f(x, y) \\ \dot{y} &= g(x, y)\end{aligned}$$

Fast time-scale ( $\tau$ ):

$$\begin{aligned}x' &= f(x, y) \\ y' &= \varepsilon g(x, y)\end{aligned} \quad \begin{array}{l} t = \varepsilon \tau \\ \Rightarrow \end{array}$$

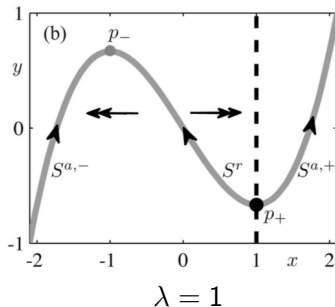
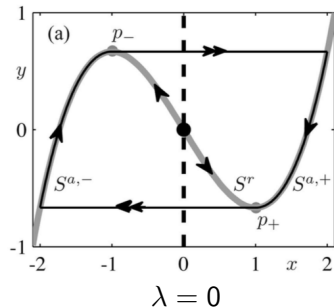
$$\Downarrow_{\varepsilon \rightarrow 0}$$

$$\begin{aligned}x' &= f(x, y) \\ y' &= 0\end{aligned}$$

- ▶  $0 < \varepsilon \ll 1$ .
- ▶  $x \in \mathbb{R}^n$ : fast variables;  $y \in \mathbb{R}^m$ : slow variables.
- ▶ Solutions have slow and fast segments ( $\varepsilon > 0$  small).
- ▶ Singular limit ( $\varepsilon \rightarrow 0$ ): slow subsystem and fast fibers.
- ▶ Critical manifold:  $\{f = 0\} = S^a \cup S^r \cup S^s \cup F$ .
- ▶ Singularly perturbed system ( $\varepsilon \neq 0$ ).

## 2D example: Van der Pol relaxation-oscillator

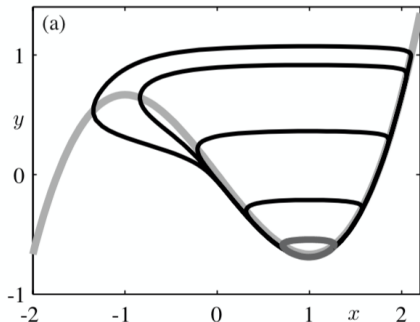
$$\begin{aligned}\varepsilon \dot{x} &= y - \frac{1}{3}x^3 + x && \text{(fast)} \\ \dot{y} &= \lambda - x && \text{(slow)}\end{aligned}$$



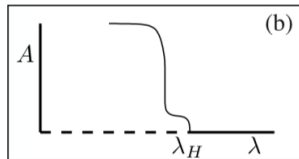
**(Hopf Bif.)**

# 2D example: Van der Pol relaxation-oscillator

$$\begin{aligned}\varepsilon \dot{x} &= y - \frac{1}{3}x^3 + x && \text{(fast)} \\ \dot{y} &= \lambda - x && \text{(slow)}\end{aligned}$$

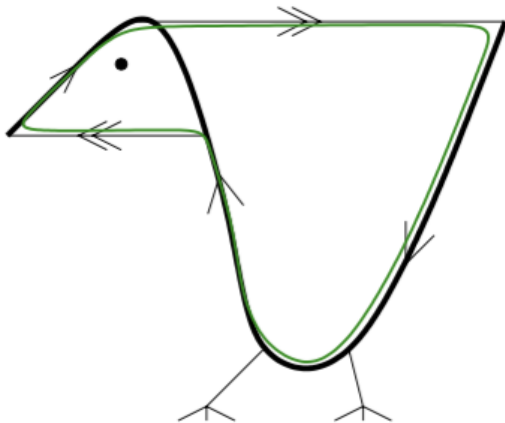


*Canard explosion*



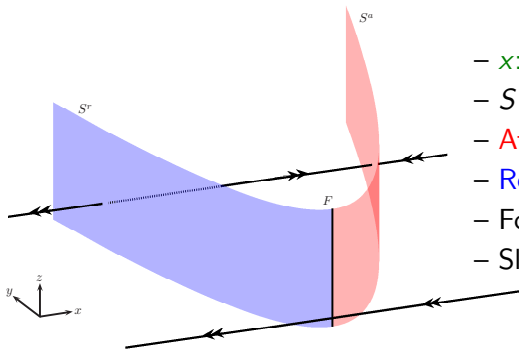
*Singular Hopf bifurcation*

# A canard...



[Figure: M. Wechselberger, Existence and bifurcation of Canards in  $\mathbb{R}^3$  in the case of a Folded Node, SIADS (2005).]

# $\mathbb{R}^3$ : One fast, two slow



## Critical Manifold

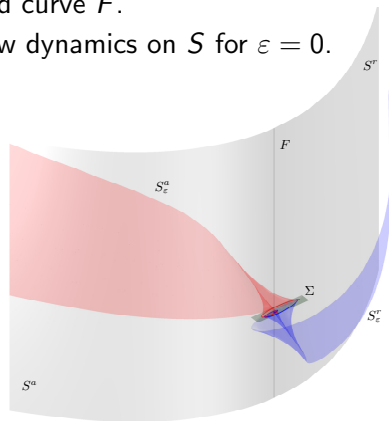
- $x$ : fast;  $y, z$ : slow.
- $S = \{f(x, y, z) = 0\} = S^a \cup S^r \cup F$ .
- Attracting sheet  $S^a$ .
- Repelling sheet  $S^r$ .
- Fold curve  $F$ .
- Slow dynamics on  $S$  for  $\varepsilon = 0$ .

## Slow Manifold

- GSPT: For  $\varepsilon > 0$ ,  $S^a \approx S_\varepsilon^a$  and  $S^r \approx S_\varepsilon^r$ .
- Away from folds (normally hyperbolic).
- Solutions remain slow on  $S_\varepsilon^a$  and  $S_\varepsilon^r$ .
- Source of interesting dynamics.

Picture: Slow manifolds in the Koper Model

[J. M., B. Krauskopf, H.M. Osinga, JCD, 4(1) (2017)]





# Folds and folded singularities

$$\varepsilon \dot{x} = f(x, y, z)$$

$$\dot{y} = g(x, y, z)$$

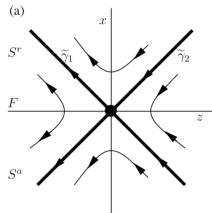
$$\dot{z} = h(x, y, z)$$

- $p^*$  is a fold point (generic):

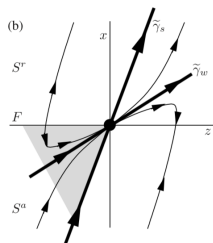
$$f(p^*) = 0, \quad \frac{\partial f}{\partial x}(p^*) = 0,$$

$$\frac{\partial^2 f}{\partial x^2}(p^*) \neq 0, \quad D_{(y,z)}f(p^*) \text{ has full rank one}$$

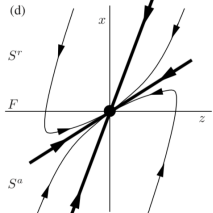
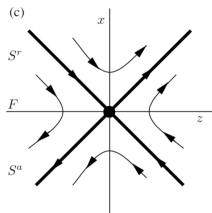
- The slow flow is not well defined ...before desingularization.
- Folded singularities (singularities of the desingularized flow).
- Not (necessarilly) equilibria.



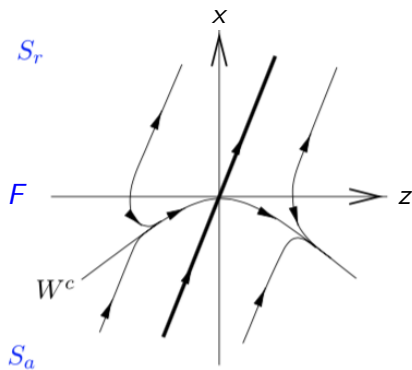
Folded saddle



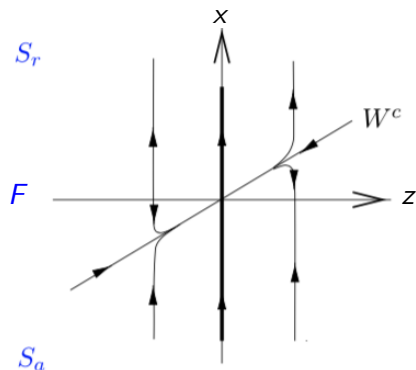
Folded node  
(canards)



## Folded saddle-node (of type II)



folded saddle-node (type I)



folded saddle-node (type II)

- Folded singularities can undergo bifurcations.
- FSNII involves folded singularity and equilibrium point.
- Fact: FSNII is  $O(\varepsilon)$  from Singular Hopf bifurcation.

# Model: Singular Hopf bifurcation

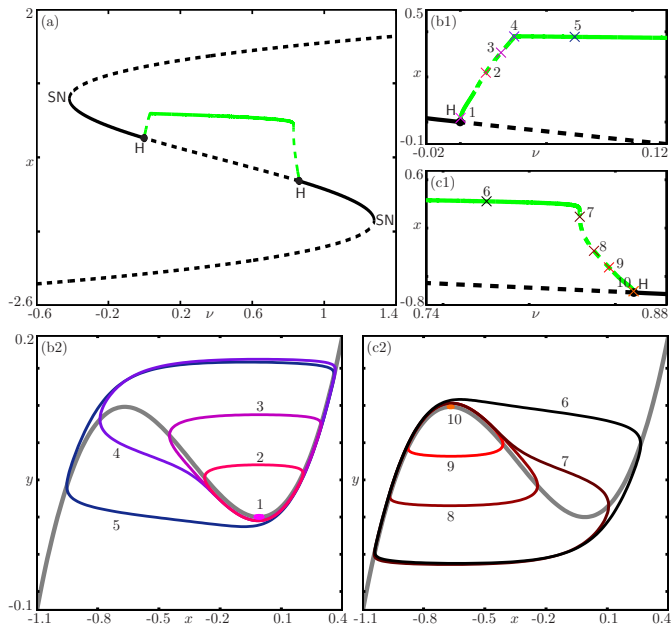
$$\begin{aligned}\varepsilon \dot{x} &= f(x, y, z) = y - x^2 - x^3 \\ \dot{y} &= g(x, y, z) = z - x \\ \dot{z} &= h(x, y, z) = -\nu - ax - by - cz\end{aligned}$$

## Why???

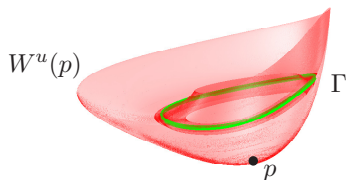
- ▶ For  $0 < \varepsilon \ll 1$ : slow-fast system.
- ▶  $x$ : fast variable;  $y, z$ : slow variables.
- ▶ 'Normal form' introduced by Guckenheimer \*.
- ▶ Generic/typical.
- ▶ Equilibrium  $p$  undergoes a Singular Hopf Bifurcation.
- ▶ Contains the Koper Model: Shilnikov homoclinic scenario.
- ▶ Novel and different scenario for MMOs.
- ▶ Folded singularity and equilibrium.
- ▶ Slow manifolds and invariant manifolds involved.
- ▶ Mix between **classical ingredients** and **slow-fast ingredients**.

\*[J. Guckenheimer, P. Meerkamp, SIAM J. Appl. Dyn. Syst., 11 (2012), pp. 1325–1359.]

# The basics: bifurcation diagram



## Classical ingredients



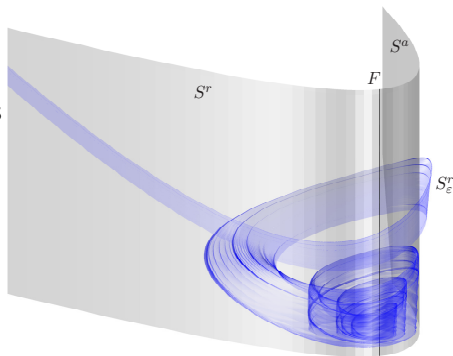
- $p$ : Saddle-focus equilibrium.
- $W^u(p)$ : Unstable manifold of  $p$ .  
 $\{q \in \mathbb{R}^3 : \varphi_q(t) \rightarrow p, \text{ when } t \rightarrow -\infty\}$
- $\Gamma$ : Attracting periodic orbit.  
(Boundary of  $W^u(p)$ )

## Slow-fast ingredients

– Slow manifolds: Surfaces of solutions that remain slow for an  $O(1)$ -time on the slow-time scale.

(Fenichel theory, GSPT)

–  $S_\varepsilon^r$ : Repelling slow manifold.



**DYNAMICS?**

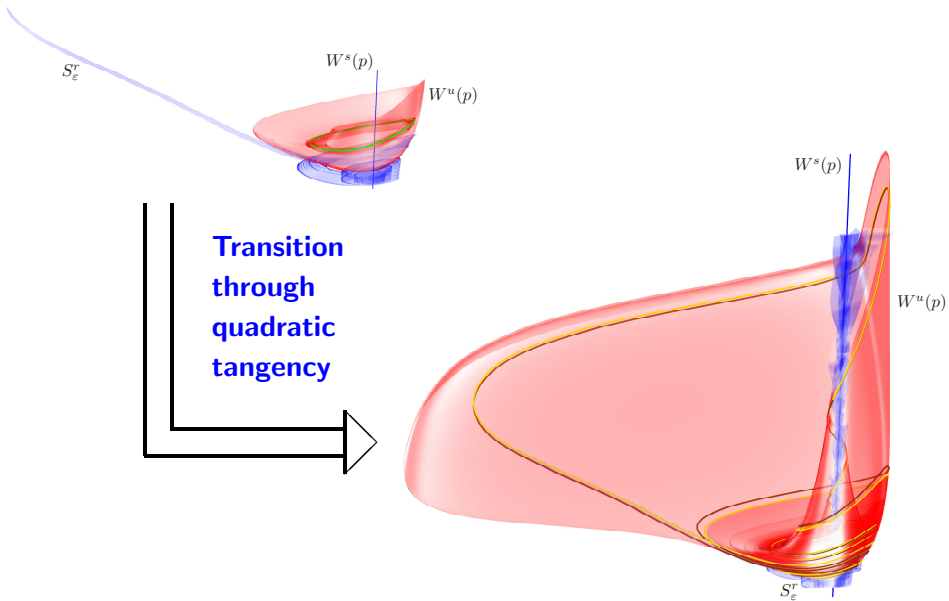
Tool: **BVP setup + continuation (AUTO)**

# Interlude I: (Numerical) Continuation

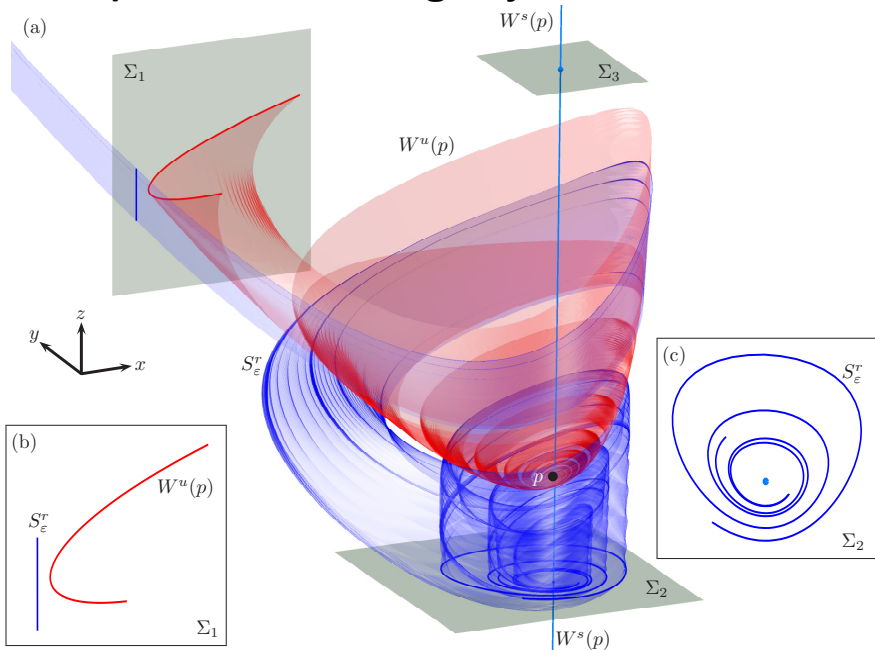
$$\begin{aligned} \dot{x} &= f(x, \lambda), \quad x \mapsto f(x, \lambda) \\ x &\in \mathbb{R}^n(\mathbb{C}^n), \lambda \in \mathbb{R}^p, f \in \mathbb{C}^r, r \geq 1 \end{aligned}$$

- ▶ Basic idea: to compute an implicitly defined curve that defines a dynamical object.
- ▶ Find position of equilibria/fixed points:  $x^* = x^*(\lambda)$ .
- ▶ Determine stability of equilibria/fixed points:  $x^* = x^*(\lambda)$ .
- ▶ Find position and stability of periodic solutions.
- ▶ Detect (local and global) bifurcations as  $\lambda$  is varied.
- ▶ Calculate and visualize higher-dimensional global invariant sets and other relevant objects.
- ▶ Ultimate goal: to understand and describe the overall dynamics in phase space.
- ▶ Numerical methods: Newton's method, Pseudo-arclength continuation, boundary-value problems.
- ▶ Software packages: AUTO, MATCONT, CONTENT, COCO, etc.

# Interactions between $W^u(p)$ and $S_\varepsilon^r$

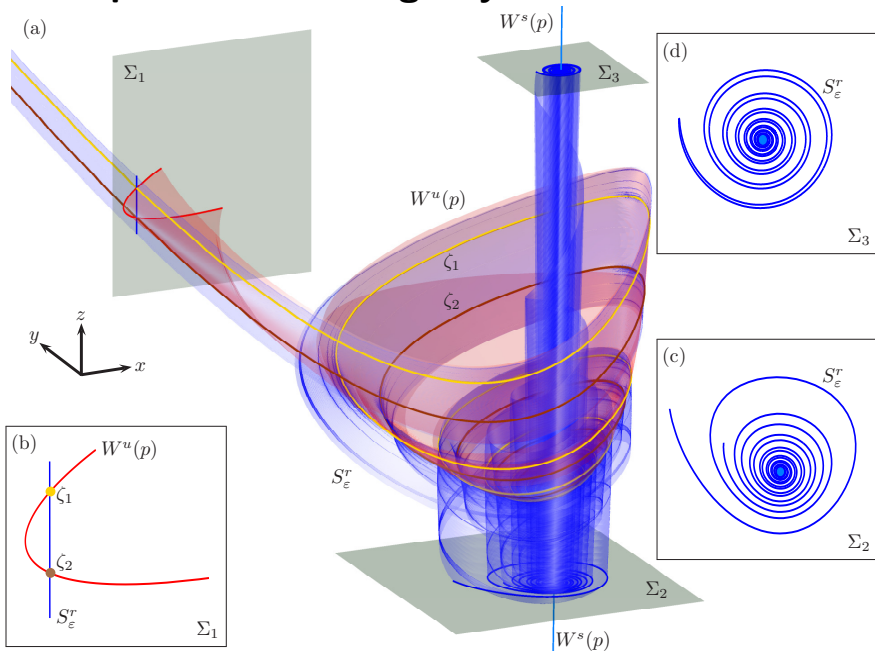


# Local picture before tangency

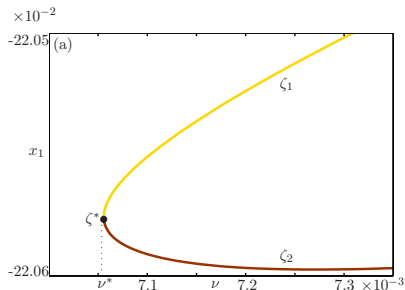
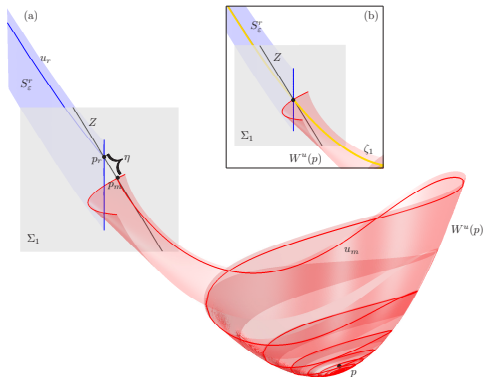




# Local picture after tangency

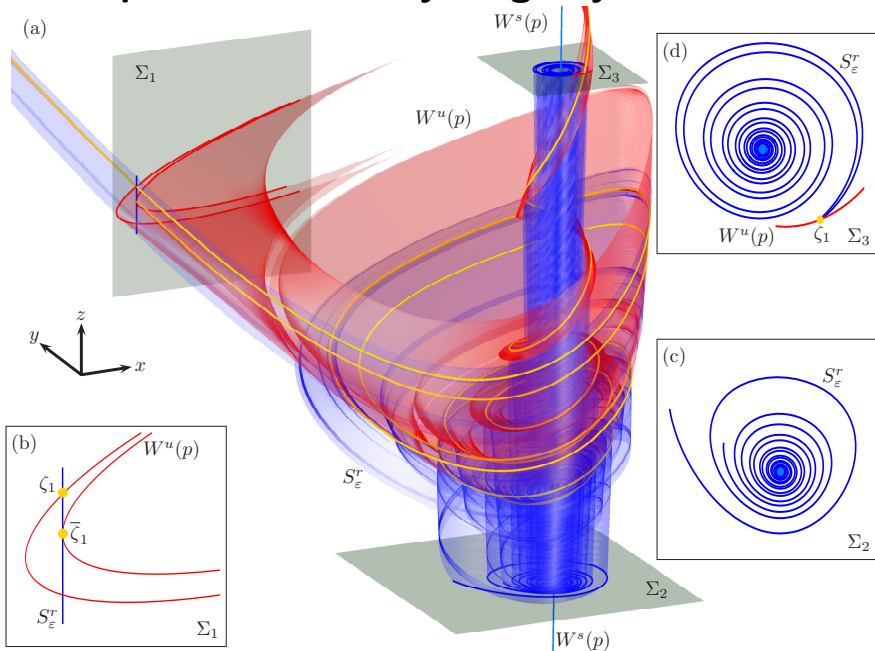


# Interlude II: Finding connecting canard orbits and tangency

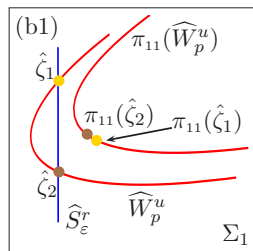
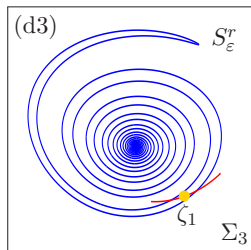
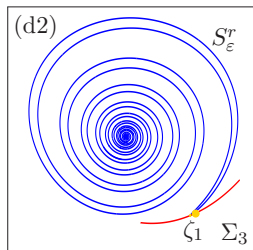
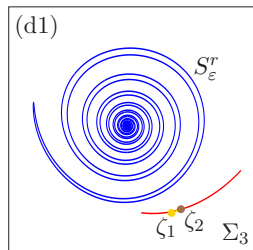


- Lin's method approach; also implemented for the systematic detection of canard orbits near folded nodes in other 3D models.
- Tangency as a fold.

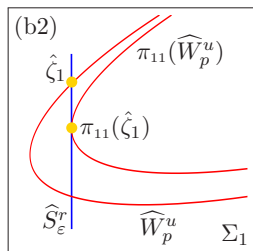
# Consequence: Secondary tangency



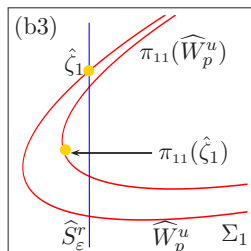
# Secondary intersections



$$\nu = 0.00712$$

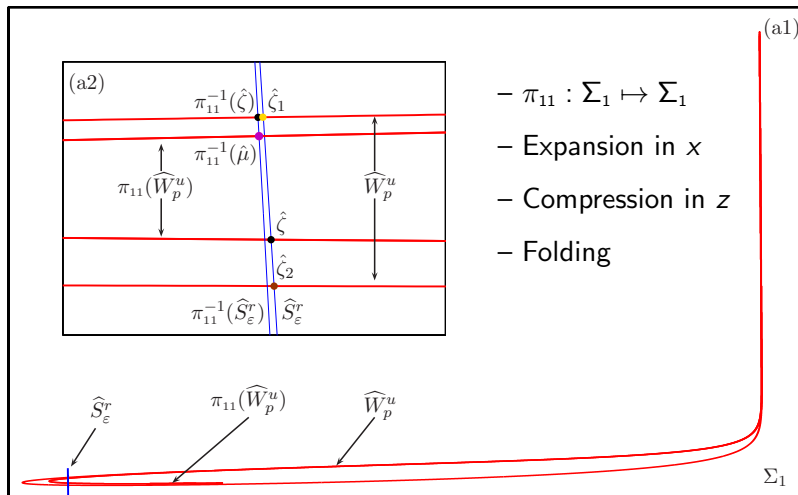


$$\nu = \nu^{**}$$



$$\nu = 0.00722$$

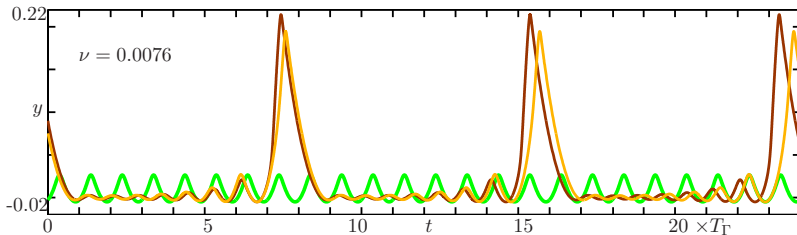
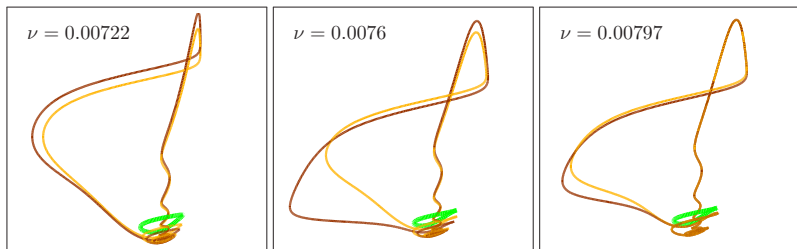
# Global intersection in $\Sigma_1$



Horseshoe structure implies periodic orbits!

# Interactions between $W^u(p)$ and $S_\epsilon^r$

Consequence: Global return available +  $1^7$  MMO (linked) P.O.



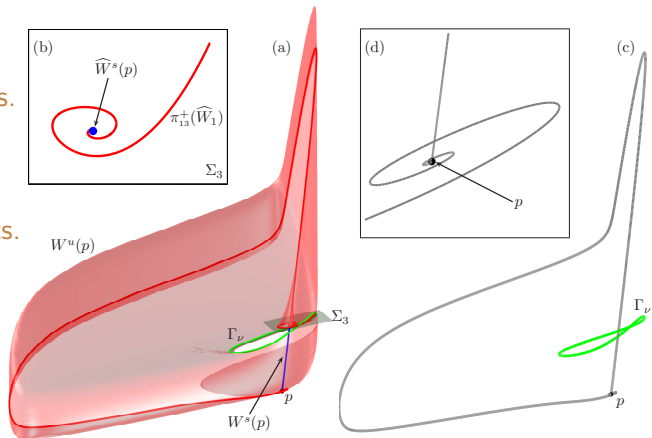
# Ensuing dynamics

- Period doubled MMOs.

- Long MMOs transients.

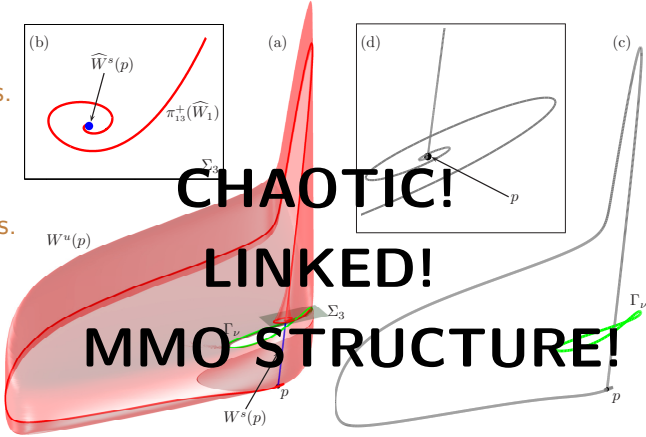
- New MMO signature.

- Shilnikov Homoclinic scenario.



# Ensuing dynamics

- Period doubled MMOs.
- Long MMO transients.
- New MMO signature.
- Shilnikov Homoclinic scenario.



**CHAOTIC!**  
**LINKED!**  
**MMO STRUCTURE!**



# Ensuing dynamics

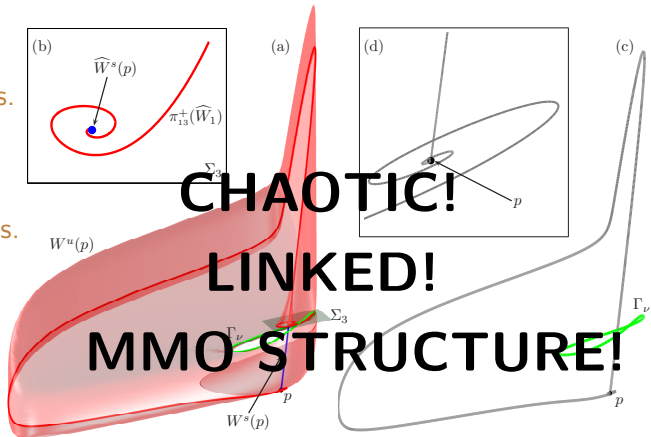
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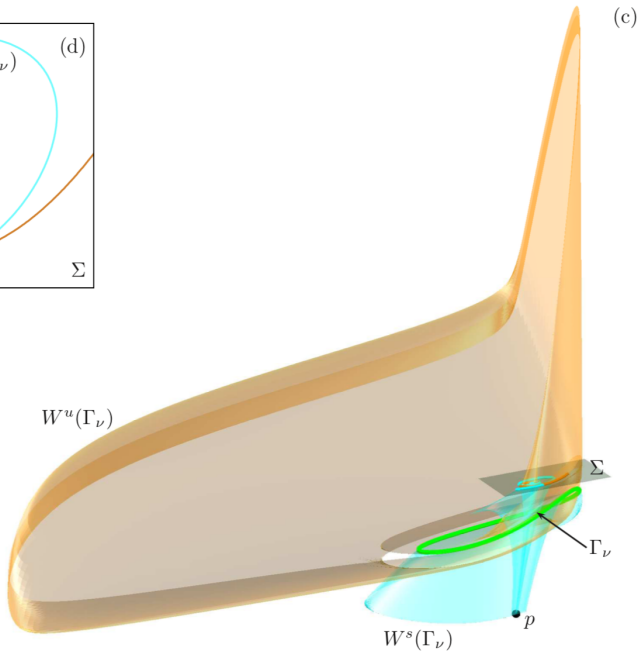
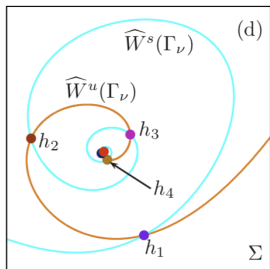
- New MMO signature.

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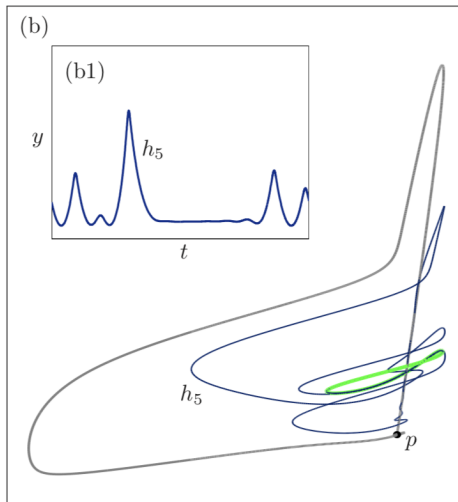
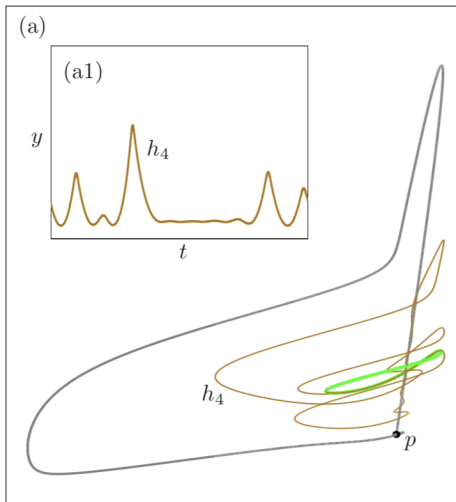
... and more.



# Homoclinic orbits to $\Gamma_\nu$

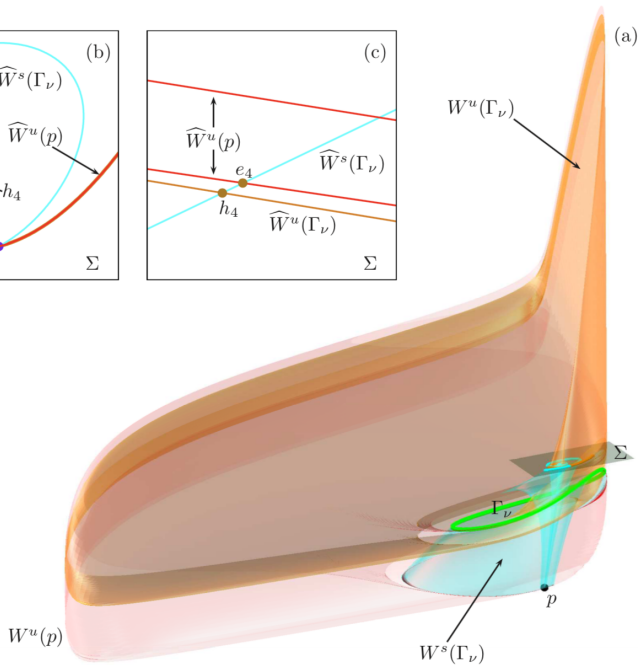
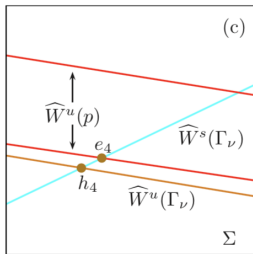
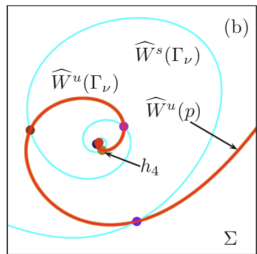


# Homoclinic orbits to $\Gamma_\nu$



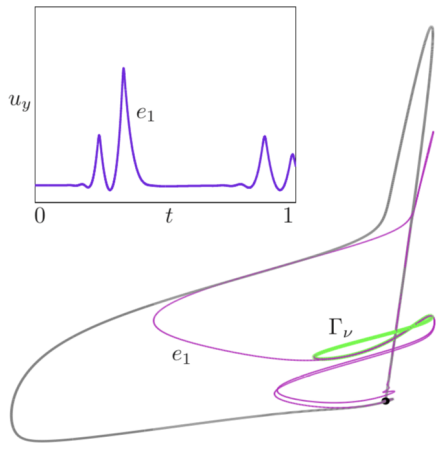
Close to EtoP!

# Robust EtoP

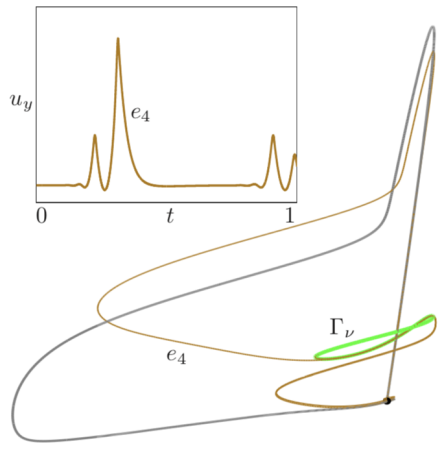


# Robust EtoP

(a)

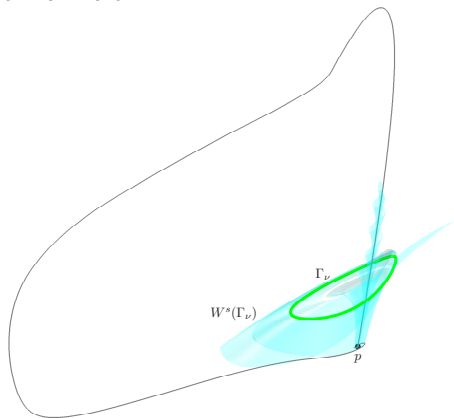


(b)



# To sum up...

- Interacting slow manifold and invariant manifold
- Period doubled MMOs.
- Long MMOs transients.
- New observed MMO signature.
- Shilnikov homoclinic orbits.
- Homoclinic orbits to  $\Gamma_\nu$ .
- Robust EtoP connections.



# Future directions

- Codimension-one EtoP.
- Two-parameter bifurcation diagram.
- Organizing center.
- Nonorientable manifolds and Shilnikov.
- Organization of Chaos.
- Chaotic attractor.
- Canard explosion of homoclinics.

