

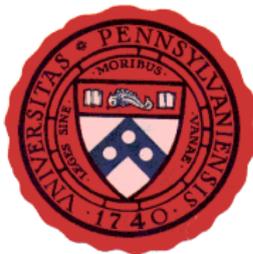
# Dimension Reduction Near Periodic Orbits of Hybrid Systems

Sam Burden\*, Shai Revzen†, S. Shankar Sastry\*

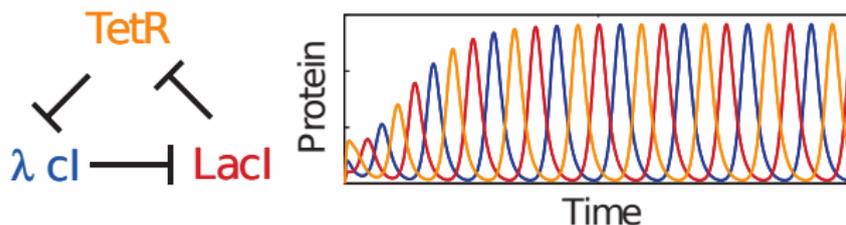
\* Department of Electrical Engineering and Computer Sciences  
University of California, Berkeley, CA, USA

† Department of Electrical and Systems Engineering  
University of Pennsylvania, Philadelphia, PA, USA

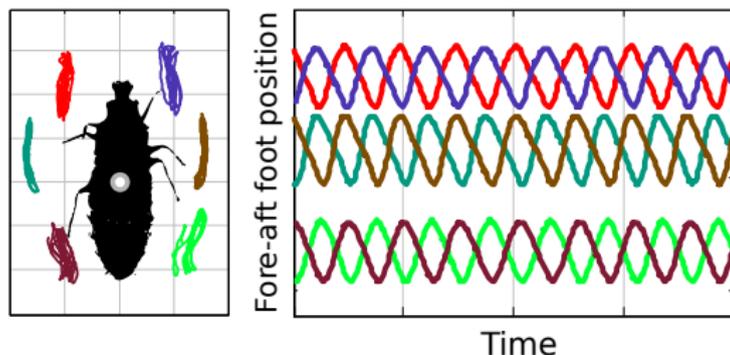
Dec 14, 2011



# Hybrid periodic orbits model interesting physical systems



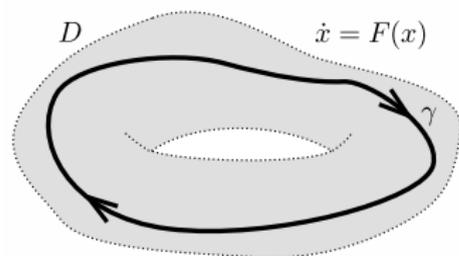
**biochemistry:** chemical reaction networks Elowitz and Leibler 2000, Alur et al. 2001



**biomechanics:** terrestrial locomotion Holmes et al. 2006, Revzen 2009

# Tools for hybrid periodic orbits generalize smooth theory

## smooth dynamical system



Feedback linearization

Sastry 1999

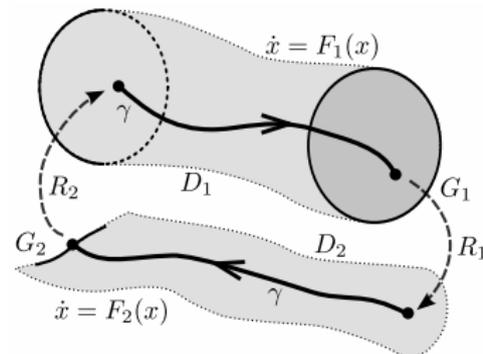
Symmetric reduction

Marsden and Ratiu 1999

Averaging theory

Guckenheimer and Holmes 1983

## hybrid dynamical system



Hybrid zero dynamics

Westervelt et al. 2003

Reduction in mechanical systems

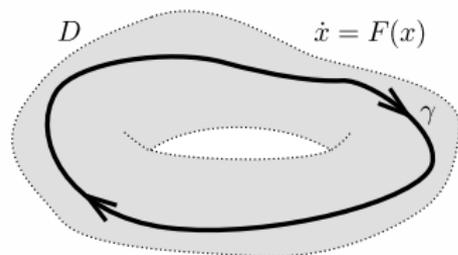
Ames et al. 2006

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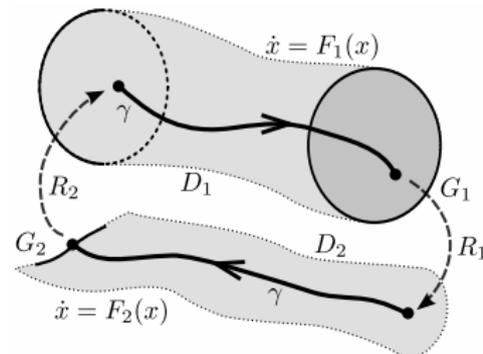
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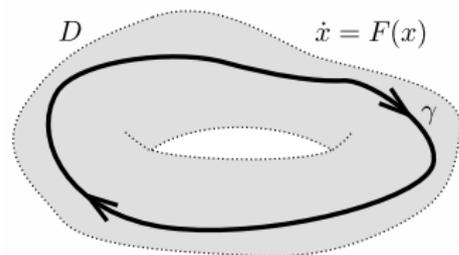
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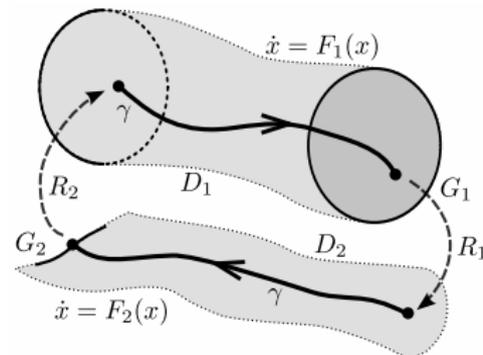
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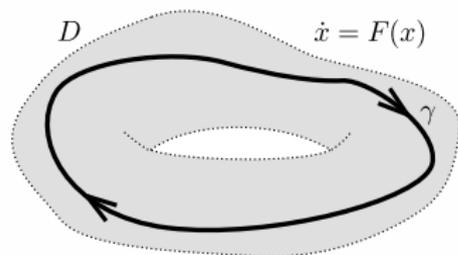
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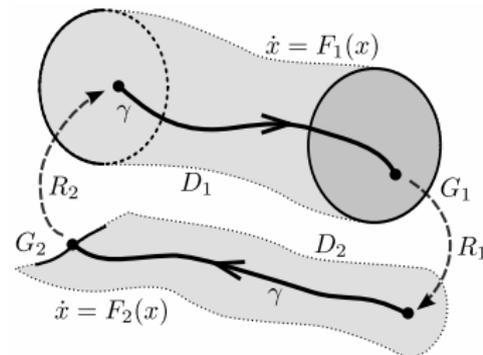
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# Generalizing tools from smooth dynamical systems theory

## Open problem

Can arbitrary tools be generalized from smooth systems to hybrid systems?

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Can arbitrary tools be generalized from smooth systems to hybrid systems?

## Our contribution

We provide a sufficient condition under which hybrid dynamics **exactly** reduce to a smooth dynamical system near a periodic orbit.

# Overview of this talk

## Motivation

hybrid periodic orbits model physical phenomena

## Reduction

model reduction near a hybrid periodic orbit

## Smoothing

smoothing reduced-order hybrid system

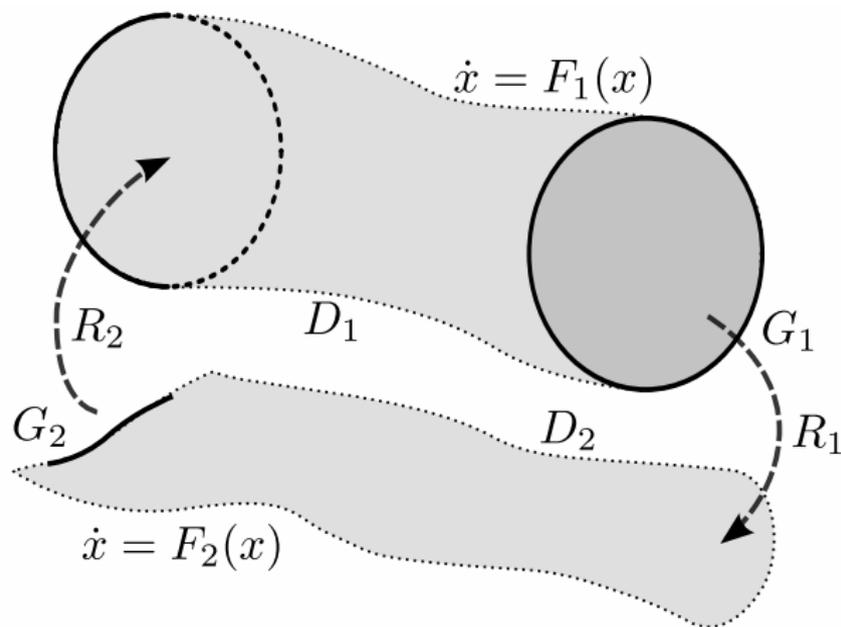
## Example

model reduction in a mechanical hybrid system

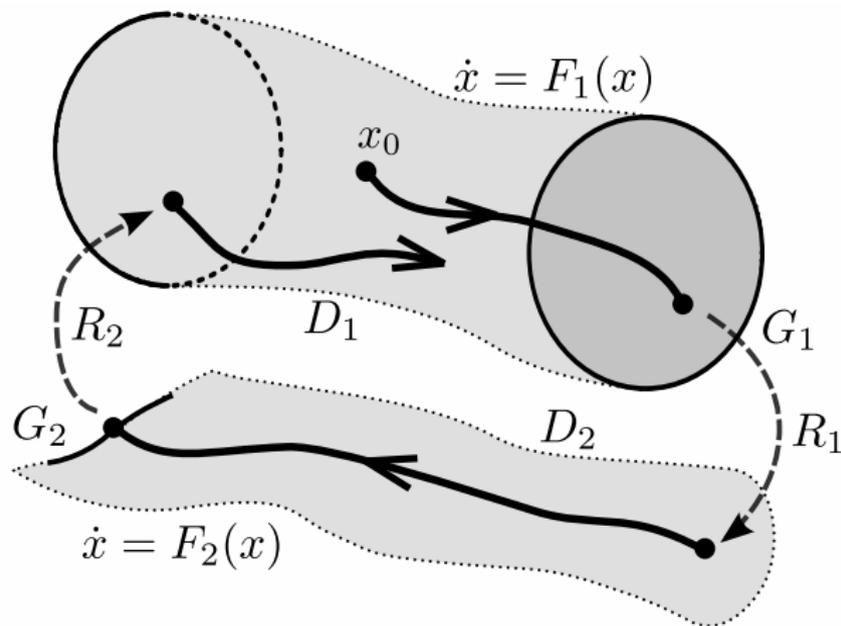
## Conclusion

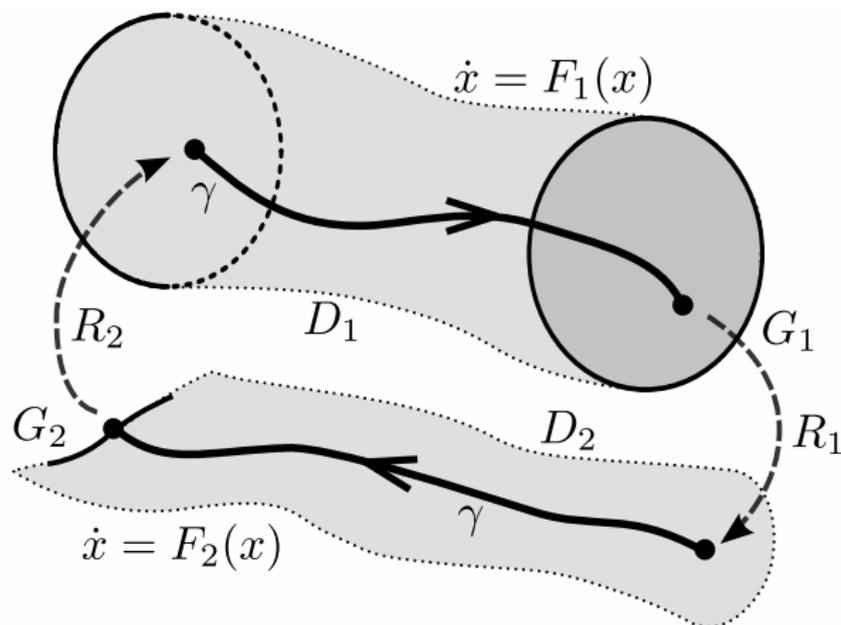
generalizing tools from smooth systems theory

# Hybrid dynamical system

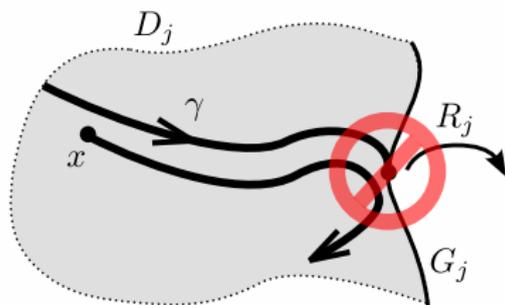
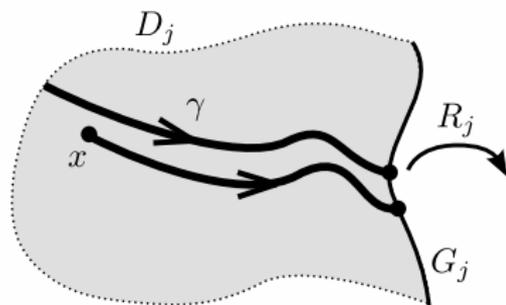


# Trajectory for a hybrid dynamical system



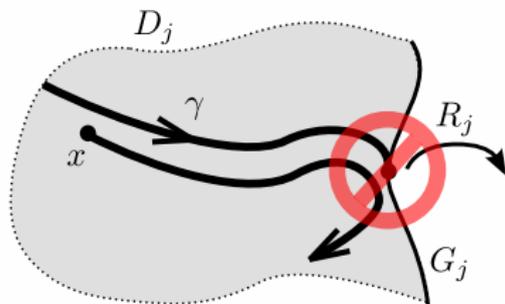
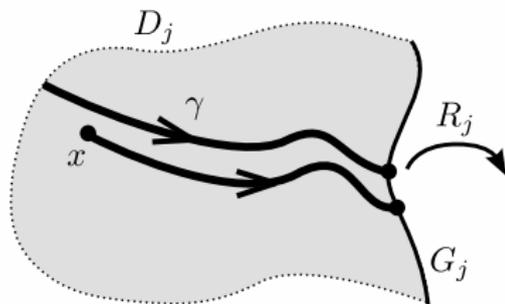
Periodic orbit  $\gamma$  for a hybrid dynamical system

# Assumptions on hybrid periodic orbit $\gamma$

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## Assumption (transversality)

*periodic orbit  $\gamma$  passes transversely through each guard  $G_j$*

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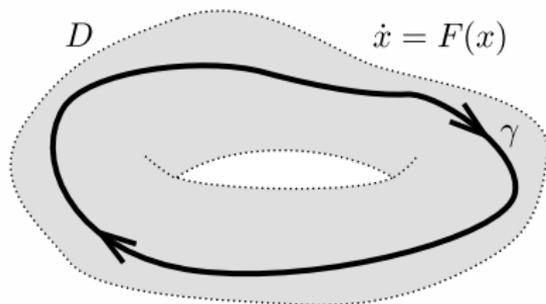
*periodic orbit  $\gamma$  passes transversely through each guard  $G_j$*

## Assumption (dwell time)

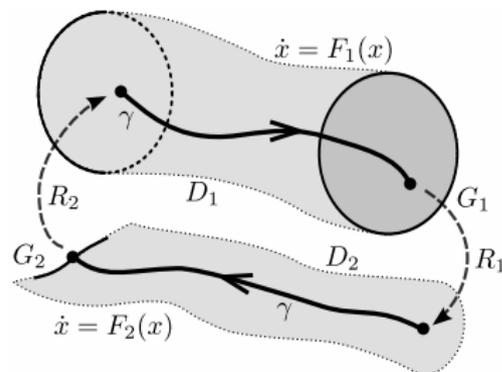
$\exists \varepsilon > 0$  : *periodic orbit  $\gamma$  spends at least  $\varepsilon$  time units in each domain  $D_j$*

# Poincaré map for periodic orbit $\gamma$

## smooth dynamical system

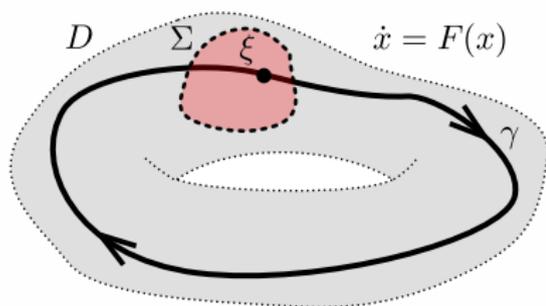


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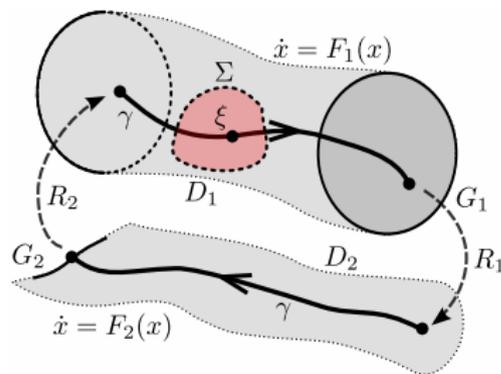


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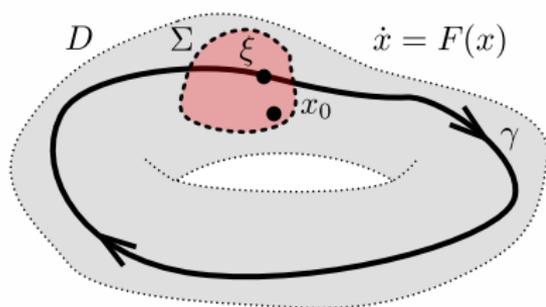


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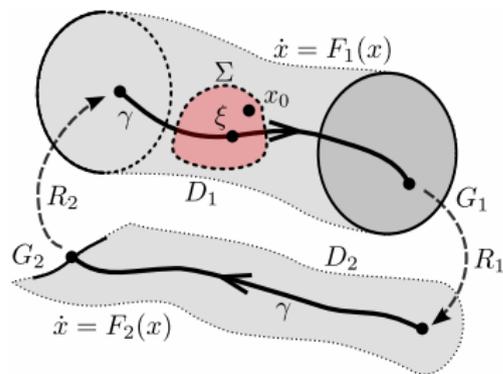


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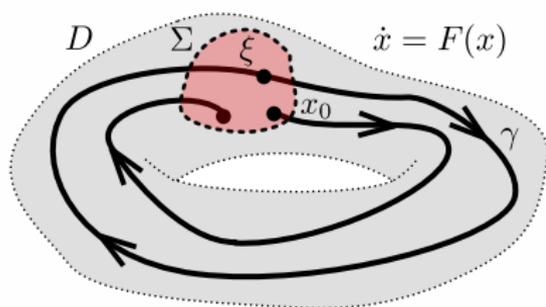


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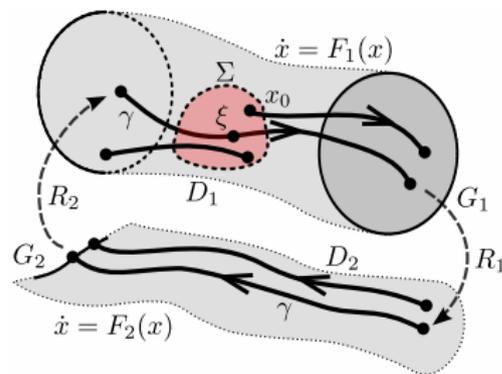


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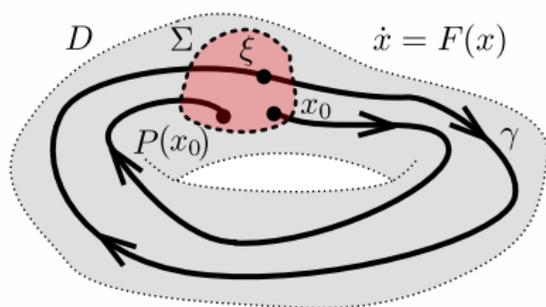


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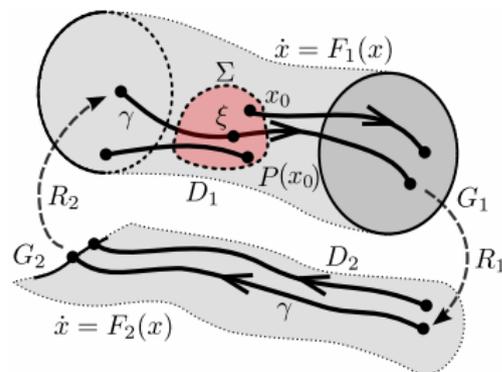


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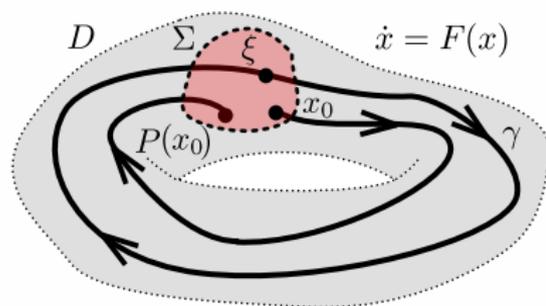


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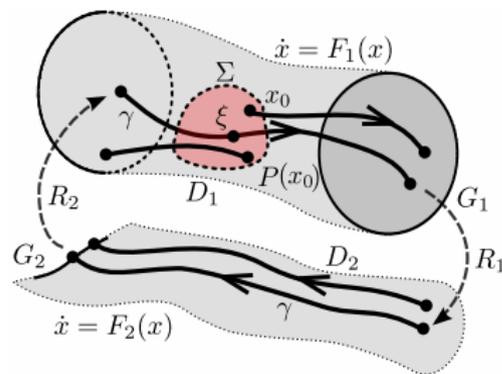


# Poincaré map for periodic orbit $\gamma$

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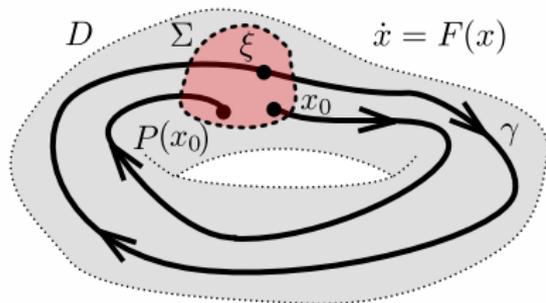


Theorem (Hirsch and Smale 1974, Grizzle et al. 2002)

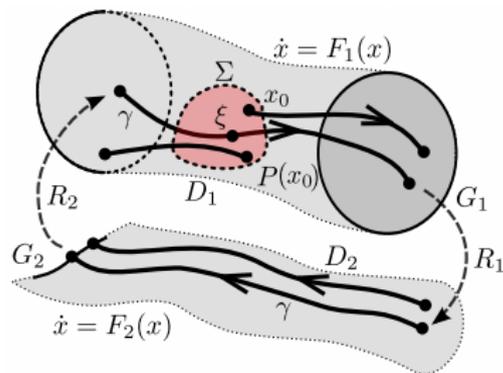
*The Poincaré map  $P$  is smooth in a neighborhood of  $\xi$ .*

# Rank of the Poincaré map $P$ with fixed point $P(\xi) = \xi$

## smooth dynamical system

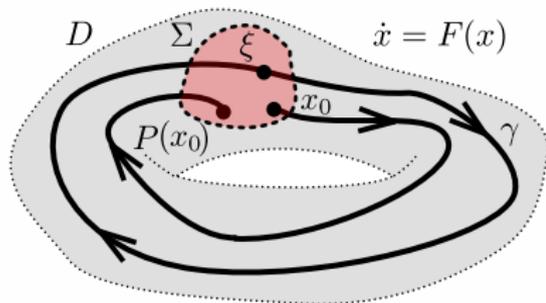


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# Rank of the Poincaré map $P$ with fixed point $P(\xi) = \xi$

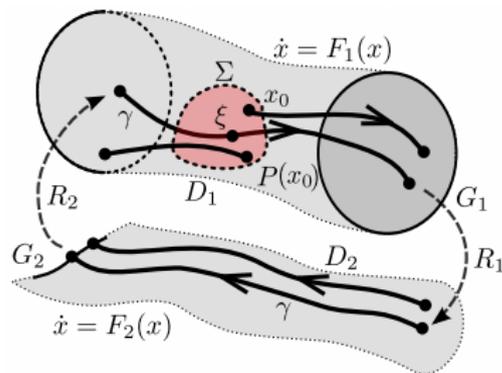
## smooth dynamical system



$$\text{rank } DP(\xi) = \dim D - 1$$

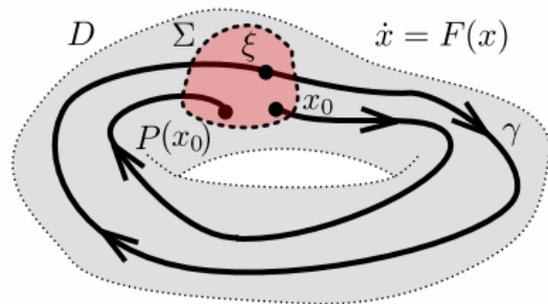
Hirsch and Smale 1974

## hybrid dynamical system



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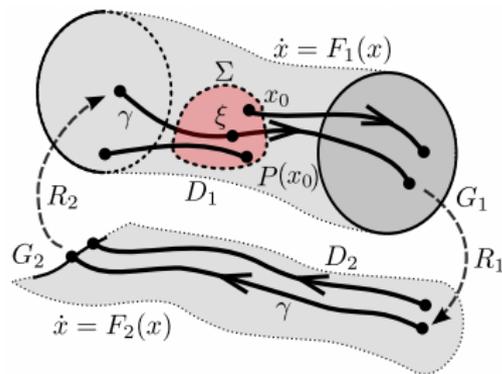
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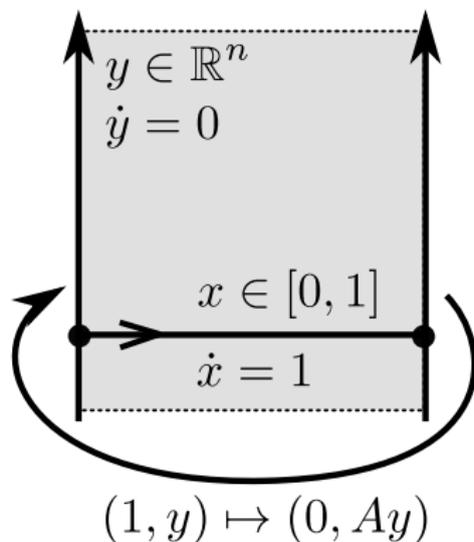


$$\text{rank } DP(\xi) \leq \min_j \dim D_j - 1$$

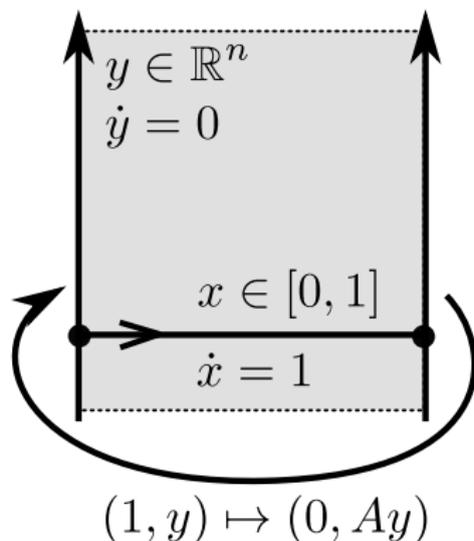
Wendel and Ames 2010

# Example (rank-deficient Poincaré map)

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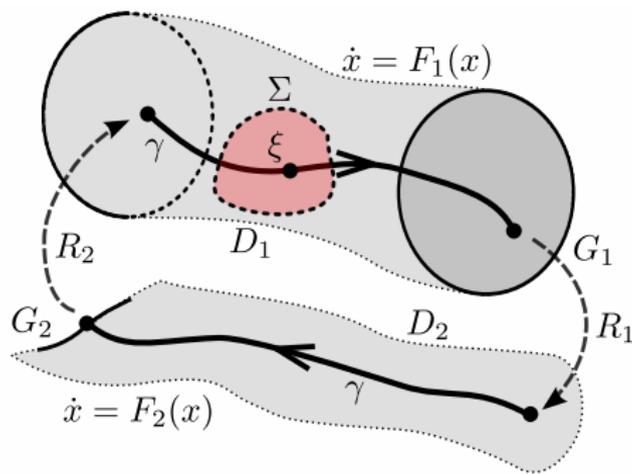


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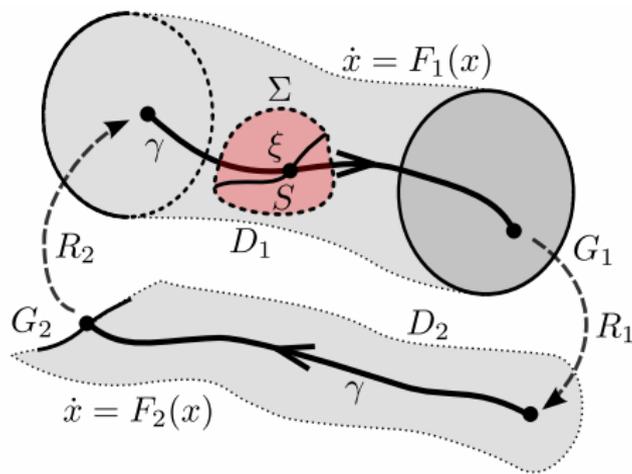


If  $A \in \mathbb{R}^{n \times n}$  nilpotent (i.e.  $A^n = 0_{n \times n}$ ) then  $\text{rank } DP^n = 0$ .

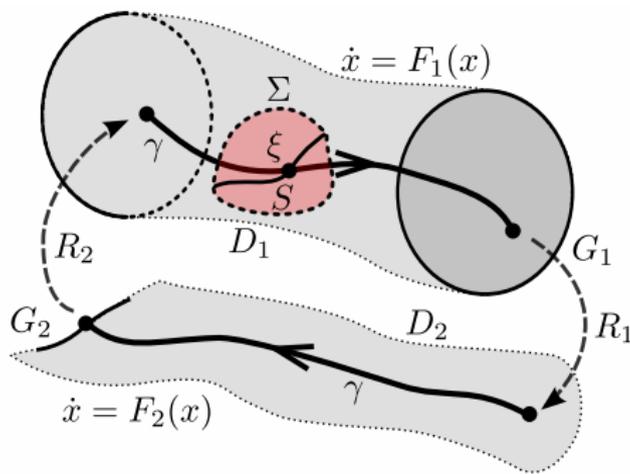
## Invariant submanifold of Poincaré map



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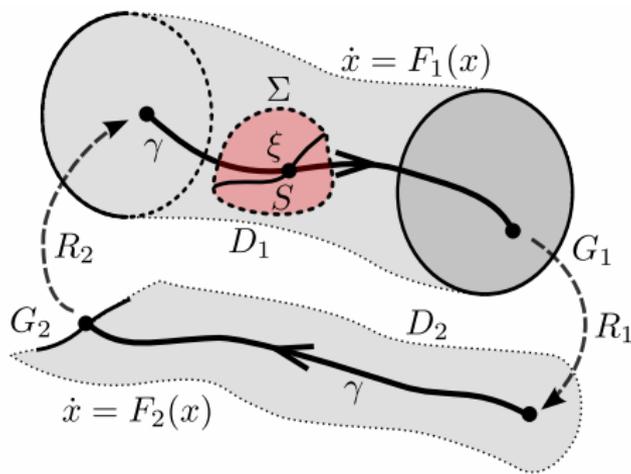


## Lemma

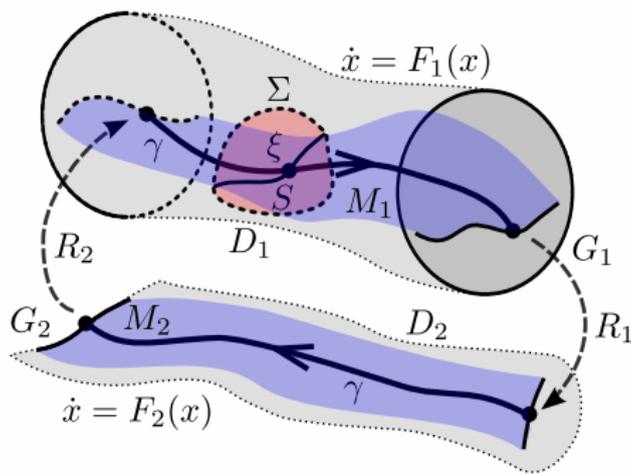
Let  $n = \min_j \dim D_j$ .

If  $DP^n$  has constant rank  $r$  near  $\xi$ , then  $S = P^n(\Sigma)$  is an  $r$ -dimensional submanifold near  $\xi$  and  $P|_S$  is a diffeomorphism of  $S$  near  $\xi$ .

# Model reduction near a periodic orbit

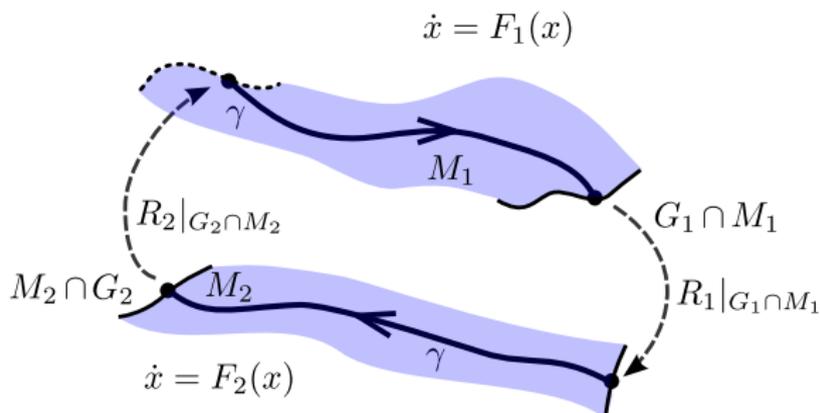


# Model reduction near a periodic orbit





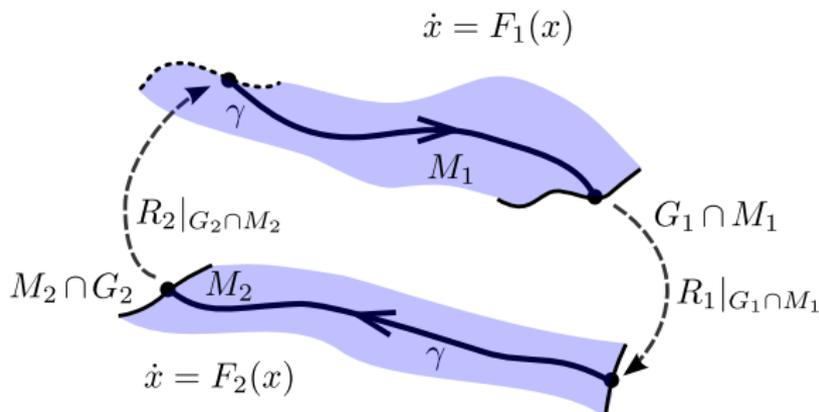
# Model reduction near a periodic orbit



## Corollary

*The submanifolds  $M_j$  determine a hybrid system with periodic orbit  $\gamma$ .*

# Model reduction near a periodic orbit



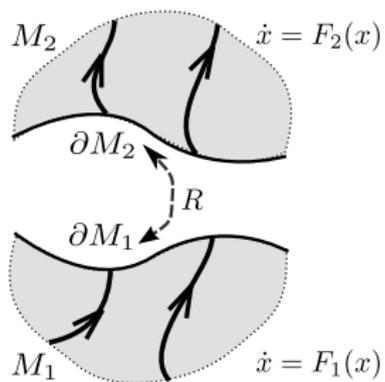
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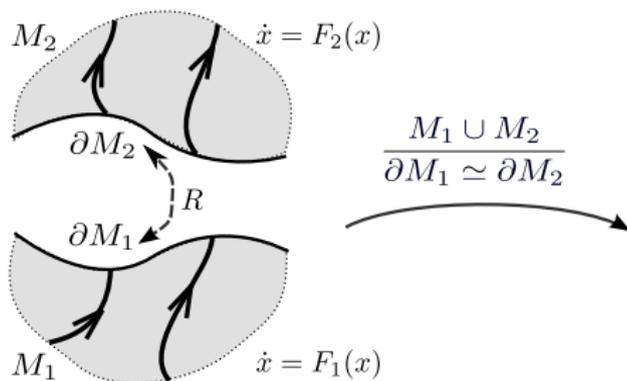
$\gamma$  is asymptotically stable in the original hybrid system

$\iff \gamma$  is asymptotically stable in the reduced hybrid system.

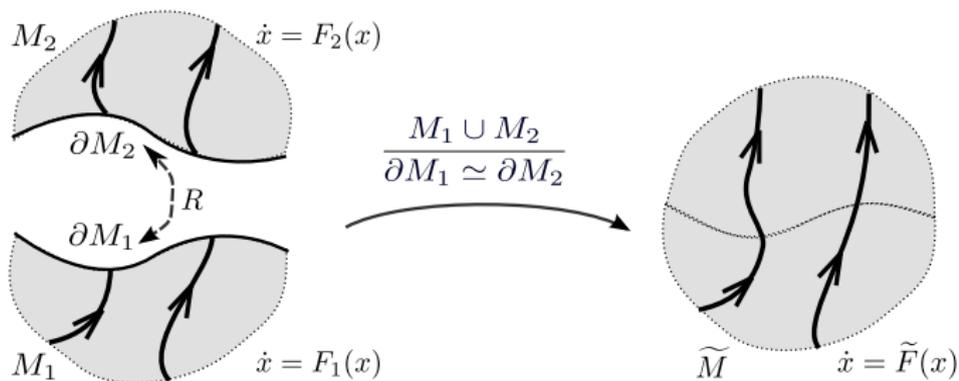
# Gluing smooth dynamical systems



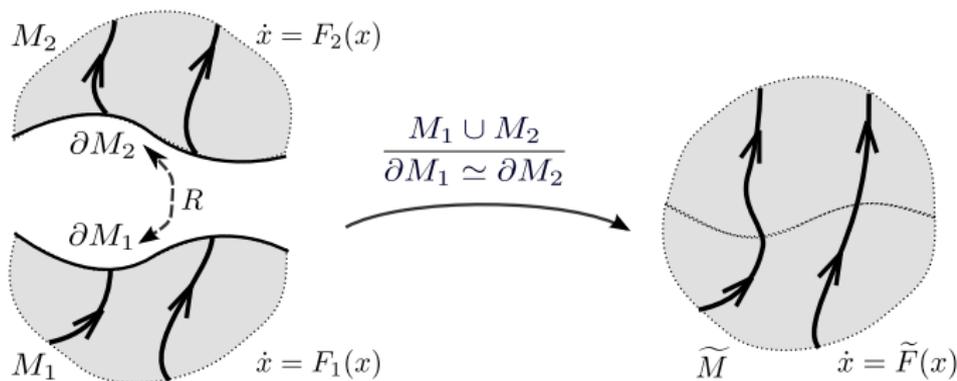
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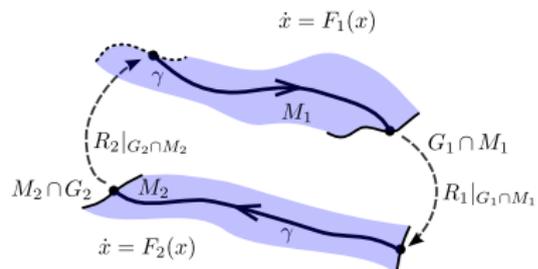


## Lemma (Hirsch 1976)

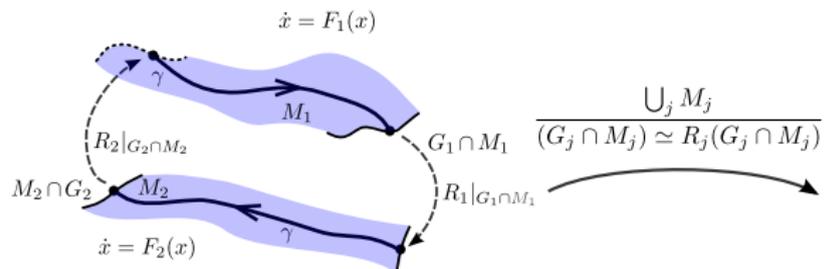
Let  $F_j$  be a smooth vector field on  $n$ -dimensional manifold  $M_j$ ,  $j \in \{1, 2\}$ . If  $R : \partial M_1 \rightarrow \partial M_2$  is a diffeomorphism,  $F_1$  points outward on  $\partial M_1$ , and  $F_2$  points inward on  $\partial M_2$ , then the quotient  $\widetilde{M} = \frac{M_1 \cup M_2}{\partial M_1 \simeq \partial M_2}$  is a smooth manifold,  $M_j \subset \widetilde{M}$  is a smooth submanifold, and the vector field

$$\widetilde{F}(x) = \begin{cases} F_1(x), & x \in M_1; \\ F_2(x), & x \in M_2; \end{cases} \text{ is smooth on } \widetilde{M}.$$

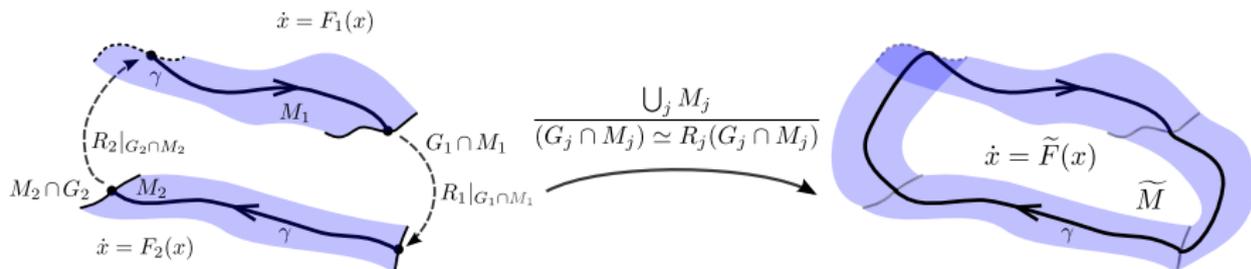
# Smoothing reduced-order hybrid system



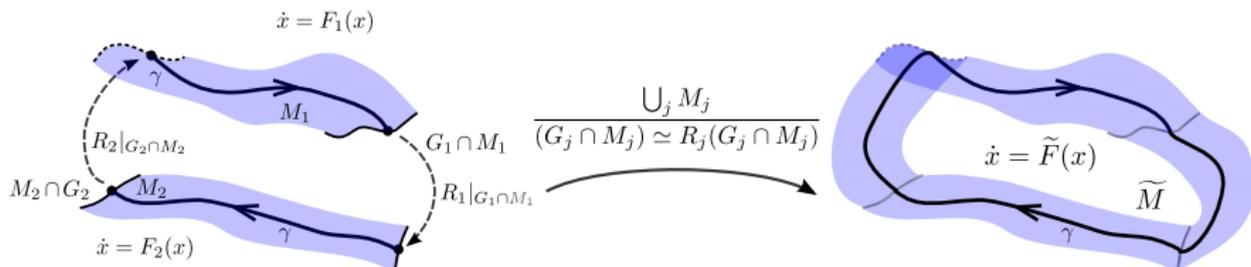
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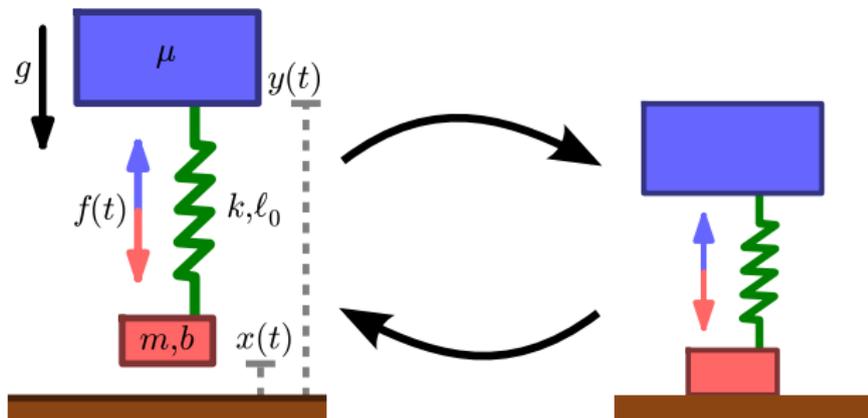
## Corollary

The topological quotient  $\widetilde{M} = \frac{\bigcup_j M_j}{(G_j \cap M_j) \simeq R_j(G_j \cap M_j)}$  is a smooth manifold,  $M_j \subset \widetilde{M}$  is a smooth submanifold, and the vector field

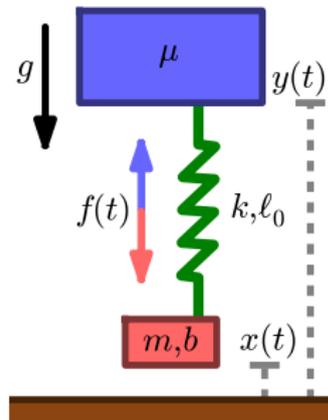
$$\widetilde{F}(x) = \begin{cases} F_1(x), & x \in M_1; \\ \vdots & \vdots \\ F_j(x), & x \in M_j; \\ \vdots & \vdots \end{cases} \quad \text{is smooth on } \widetilde{M}.$$

# Example (vertical hopper)

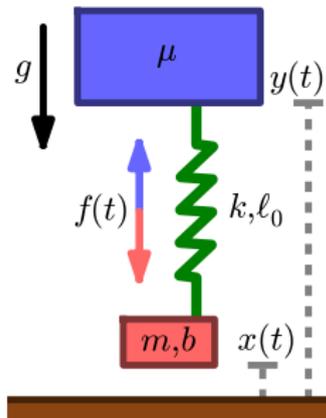
vertical hopper



# Reduction in the vertical hopper



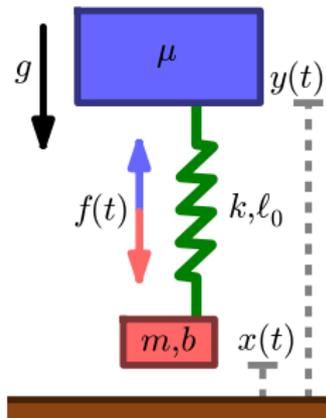
# Reduction in the vertical hopper



With parameters

$$m = 1, \mu = 2, k = 10, b = 5, \ell_0 = 2, a = 20, \omega = 2\pi, g = 2$$

# Reduction in the vertical hopper

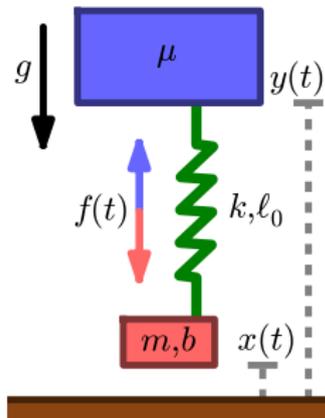


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Numerically linearizing Poincaré map  $P$  on ground

# Reduction in the vertical hopper

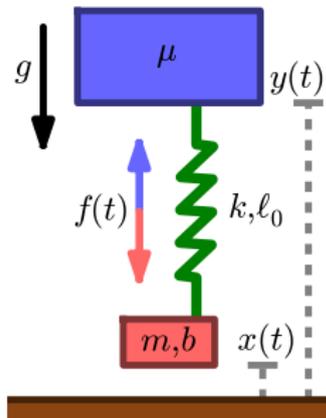


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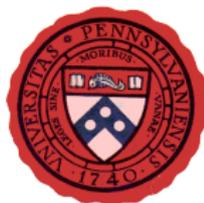
Numerically linearizing Poincaré map  $P$  on ground we find  $DP(\xi)$  has eigenvalues  $\simeq -0.25 \pm 0.70j$  therefore  $DP^2$  is constant rank

**Theorem**  $\implies$  after one cycle, dynamics collapse to 1-DOF hopper

# Discussion & Questions — Thanks for your time!

## Our contribution

We provide a sufficient condition under which hybrid dynamics **exactly** reduce to a smooth dynamical system near a periodic orbit.



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Enables generalization of first-order tools for parameter identification

Burden, Ohlsson, Sastry, Submitted to IFAC SysID 2012

Partially explains empirically-observed dimension loss in animals

Full and Koditschek 1999, Revzen 2009

