Continuous symmetry reduction for high-dimensional flows

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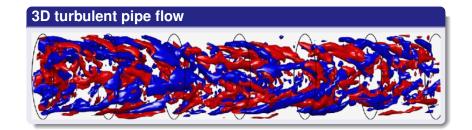
30 Jun 2010

dynamical description of turbulence?

progress 1990-2010:

- flames
- hearts
- pipes
- planes
- cosmos
- gluons

amazing data! amazing numerics!



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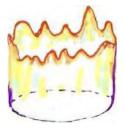
flames: Kuramoto-Sivashinsky equation

1-dimensional "Navier-Stokes"

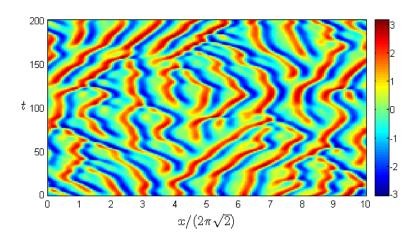
$$u_t + u \nabla u = -\nabla^2 u - \nabla^4 u, \qquad x \in [-L/2, L/2],$$

describes extended systems such as

- reaction-diffusion systems
- flame fronts in combustion
- drift waves in plasmas, . . .



a turbulent flame



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a peak at a pipe flow experiment

a modern pipe flow experiment



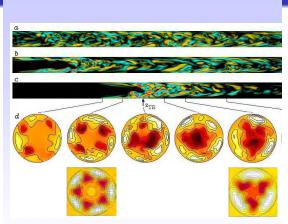


Ludwig Prandtl's office in 2009

B. Hof, "Complex Dynamics and Turbulence,"

one of the groups keeping the Ludwig Prandtl's flame alive in Göttingen.

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solutions are

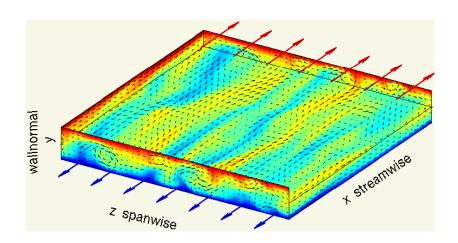
- rotationally equivariant
- translationally equivariant

plane Couette flow: Göttingen experiment



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plane Couette flow: fully resolved simulations



symmetries of Kuramoto-Sivashinsky equation

with periodic boundary condition

$$u(x,t) = u(x+L,t)$$

the symmetry group is O(2):

- translations: $\tau_{\ell/L} u(x,t) = u(x+\ell,t)$, $\ell \in [-L/2,L/2]$,
- reflections: $\kappa u(x) = -u(-x)$.

translational symmetry \rightarrow traveling wave solutions

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translational symmetry \rightarrow traveling wave solutions

traveling (or relative) unstable coherent solutions are ubiquitous in turbulent hydrodynamic flows

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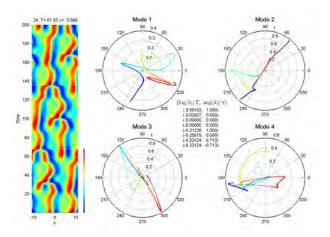
continuous symmetries

translational symmetry \Rightarrow

- traveling wave solutions
- unstable relative periodic orbits

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unstable relative periodic orbits



- have computed 40,000 unstable periodic and relative periodic orbits.
- how are they organized?

continuous symmetries

Navier-Stokes

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continuous symmetries

question

what are the invariant objects that organize phase space in a spatially extended system with translational symmetry and how do they fit together to form a skeleton of the dynamics?

state space

- the space in which all possible states u's live
- ∞ -dimensional: point u(x) is a function of x on interval $x \in L$.
- in practice: a high but finite dimensional space (e.g. through a spectral discretization)

state space

Navier-Stokes

take the hint from low dimensional systems

- low dimensional systems: equilibria, periodic orbits organize the long time dynamics.
- is this true in extended systems?

complex Lorenz flow example

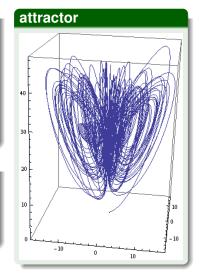
from complex Lorenz flow 5D attractor \rightarrow unimodal map

complex Lorenz equations

$$\begin{bmatrix} \dot{x}_1 \\ \dot{x}_2 \\ \dot{y}_1 \\ \dot{y}_2 \\ \dot{z} \end{bmatrix} = \begin{bmatrix} -\sigma x_1 + \sigma y_1 \\ -\sigma x_2 + \sigma y_2 \\ (\rho_1 - z)x_1 - \rho_2 x_2 - y_1 - e y_2 \\ \rho_2 x_1 + (\rho_1 - z)x_2 + e y_1 - y_2 \\ -b z + x_1 y_1 + x_2 y_2 \end{bmatrix}$$

$$\rho_1 = 28, \rho_2 = 0, b = 8/3, \sigma = 10, e = 1/10$$

- A typical $\{x_1, x_2, z\}$ trajectory
- superimposed: a trajectory whose initial point is close to the relative equilibrium Q₁

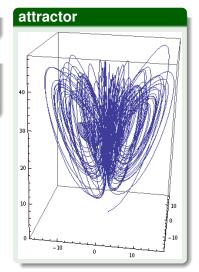


from complex Lorenz flow 5D attractor \rightarrow unimodal map

what to do?

the goal

reduce this messy strange attractor to a 1-dimensional return map

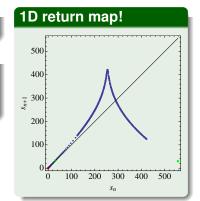


from complex Lorenz flow 5D attractor \rightarrow unimodal map

the goal attained

but it will cost you

after symmetry reduction; must learn how to quotient the SO(2) symmetry



Lie groups elements, Lie algebra generators

An element of a compact Lie group:

$$g(\theta) = e^{\theta \cdot \mathbf{T}}, \qquad \theta \cdot \mathbf{T} = \sum \theta_a \mathbf{T}_a, \ a = 1, 2, \cdots, N$$

 $\theta \cdot \mathbf{T}$ is a *Lie algebra* element, and θ_a are the parameters of the transformation.

Lie groups, algebras

Navier-Stokes

example: SO(2) rotations for complex Lorenz equations

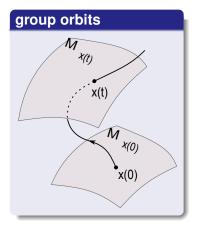
SO(2) rotation by finite angle θ :

$$g(heta) = \left(egin{array}{ccccc} \cos heta & \sin heta & 0 & 0 & 0 \ -\sin heta & \cos heta & 0 & 0 & 0 \ 0 & 0 & \cos heta & \sin heta & 0 \ 0 & 0 & -\sin heta & \cos heta & 0 \ 0 & 0 & 0 & 0 & 1 \end{array}
ight)$$

symmetries of dynamics

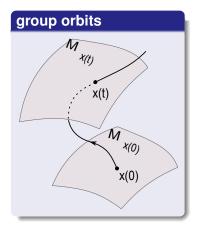
A flow $\dot{x} = v(x)$ is *G*-equivariant if

$$v(x) = g^{-1} v(g x)$$
, for all $g \in G$.

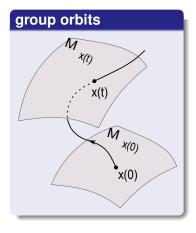


group orbit \mathcal{M}_x of x is the set of all group actions

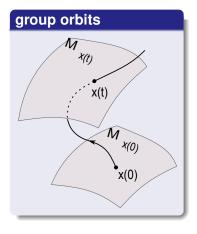
$$\mathcal{M}_{X} = \{g \, X \mid g \in G\}$$



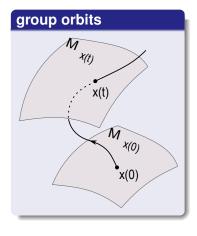
group orbit $\mathcal{M}_{x(0)}$ of state space point x(0), and the group orbit $\mathcal{M}_{x(t)}$ reached by the trajectory x(t) time t later.



any point on the manifold $\mathcal{M}_{x(t)}$ is equivalent to any other.



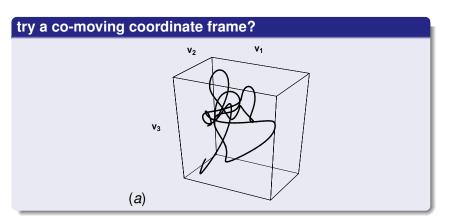
action of a symmetry group endows the state space with the structure of a union of group orbits, each group orbit an equivalence class.



the goal:

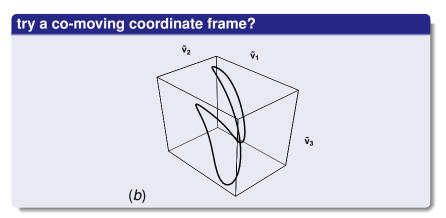
replace each group orbit by a unique point a lower-dimensional *reduced state space* (or orbit space)

relativity for pedestrians



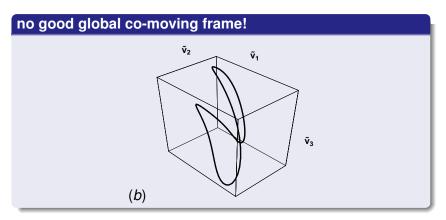
A relative periodic orbit of the Kuramoto-Sivashinsky flow, traced for four periods T_p , projected on (a) a stationary state space coordinate frame $\{v_1, v_2, v_3\}$;

relativity for pedestrians



A relative periodic orbit of the Kuramoto-Sivashinsky flow, traced for four periods T_p , projected on (b) a co-moving $\{\tilde{V}_1, \tilde{V}_2, \tilde{V}_3\}$ frame

relativity for pedestrians



this is no symmetry reduction at all; all other relative periodic orbits require their own frames, moving at different velocities.

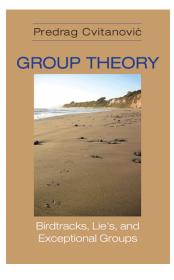
symmetry reduction

- all points related by a symmetry operation are mapped to the same point.
- relative equilibria become equilibria and relative periodic orbits become periodic orbits in reduced space.
- families of solutions are mapped to a single solution

everybody, her mother, and Robert MacKay knows how to do this

except the author of

masters of group theory



- Hilbert polynomial basis: rewrite equivariant dynamics in invariant coordinates
- moving frames, or slices: cut group orbits by a hypersurface (kind of Poincaré section), each group orbit of symmetry-equivalent points represented by the single point

reduction methods

- Hilbert polynomial basis: rewrite equivariant dynamics in invariant coordinates: global
- 2 moving frames, or slices: cut group orbits by a hypersurface (kind of Poincaré section), each group orbit of symmetry-equivalent points represented by the single point: local

Hilbert polynomial basis

Navier-Stokes

invariant polynomials

 rewrite the equations in variables invariant under the symmetry transformation

invariant polynomials

- rewrite the equations in variables invariant under the symmetry transformation
- or compute solutions in original space and map them to invariant variables

invariant polynomials basis

Hilbert basis for complex Lorenz equations

$$u_1 = x_1^2 + x_2^2,$$
 $u_2 = y_1^2 + y_2^2$
 $u_3 = x_1y_2 - x_2y_1,$ $u_4 = x_1y_1 + x_2y_2$
 $u_5 = z$

invariant under SO(2) action on a 5-dimensional state space polynomials related through 1 syzygy:

$$u_1u_2 - u_3^2 - u_4^2 = 0$$

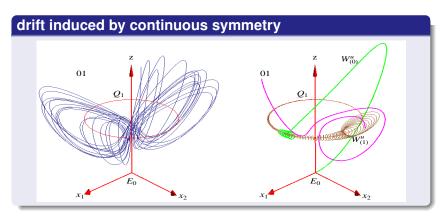
invariant polynomials basis

complex Lorenz equations in invariant polynomial basis

$$\dot{u}_{1} = 2 \sigma (u_{3} - u_{1})
\dot{u}_{2} = -2 u_{2} - 2 u_{3} (u_{5} - \rho_{1})
\dot{u}_{3} = \sigma u_{2} - (\sigma - 1) u_{3} - e u_{4} + u_{1} (\rho_{1} - u_{5})
\dot{u}_{4} = e u_{3} - (\sigma + 1) u_{4}
\dot{u}_{5} = u_{3} - b u_{5}$$

A 4-dimensional $\mathcal{M}/SO(2)$ reduced state space, a symmetry-invariant representation of the 5-dimensional SO(2) equivariant dynamics

state space portrait of complex Lorenz flow



A generic chaotic trajectory (blue), the E_0 equilibrium, a representative of its unstable manifold (green), the Q_1 relative equilibrium (red), its unstable manifold (brown), and one repeat of the $\overline{01}$ relative periodic orbit (purple).

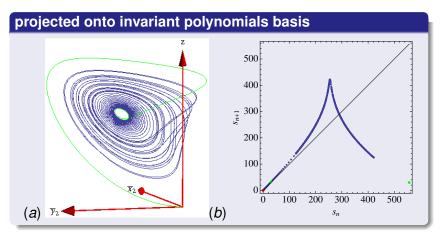
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complex Lorenz equations in invariant polynomial basis

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\dot{u}_{3} = \sigma u_{2} - (\sigma - 1) u_{3} - e u_{4} + u_{1} (\rho_{1} - u_{5})
\dot{u}_{4} = e u_{3} - (\sigma + 1) u_{4}
\dot{u}_{5} = u_{3} - b u_{5}$$

the image of the full state space relative equilibrium Q_1 group orbit is an equilibrium point, while the image of a relative periodic orbit, such as 01, is a periodic orbit

Hilbert invariant coordinates



- (a) The unstable manifold connection from the equilibrium E_0 at the origin to the strange attractor controlled by the rotation around the reduced state space image of relative equilibrium Q_1 :
- (b) The return map projected on invariant polynomials.

higher-dimensional invariant bases? an example

first 11 invariants for the standard action of SO(2)

$$\begin{aligned} u_1 &= r_1 = \sqrt{b_1^2 + c_1^2} \\ u_3 &= \frac{b_2 \left(b_1^2 - c_1^2\right) + 2b_1 c_1 c_2}{r_1^2} \\ u_4 &= \frac{-2b_1 b_2 c_1 + \left(b_1^2 - c_1^2\right) c_2}{r_1^2} \\ u_5 &= \frac{b_1 b_3 \left(b_1^2 - 3c_1^2\right) - c_1 \left(-3b_1^2 + c_1^2\right) c_3}{r_1^3} \\ u_6 &= \frac{-3b_1^2 b_3 c_1 + b_3 c_1^3 + b_1^3 c_3 - 3b_1 c_1^2 c_3}{r_1^3} \end{aligned}$$

higher-dimensional invariant bases? an example

first 11 invariants for the standard action of SO(2)

$$\begin{split} u_7 &= \frac{b_4 \left(b_1^4 - 6b_1^2 c_1^2 + c_1^4\right) + 4b_1 c_1 \left(b_1^2 - c_1^2\right) c_4}{c_1^4} \\ u_8 &= \frac{4b_1 b_4 c_1 \left(-b_1^2 + c_1^2\right) + \left(b_1^4 - 6b_1^2 c_1^2 + c_1^4\right) c_4}{c_1^4} \\ u_9 &= \frac{b_1 b_5 \left(b_1^4 - 10b_1^2 c_1^2 + 5c_1^4\right) + c_1 \left(5b_1^4 - 10b_1^2 c_1^2 + c_1^4\right) c_5}{c_1^5} \\ u_{10} &= \frac{-b_5 c_1 \left(5b_1^4 - 10b_1^2 c_1^2 + c_1^4\right) + b_1 \left(b_1^4 - 10b_1^2 c_1^2 + 5c_1^4\right) c_5}{c_1^5} \\ u_{11} &= \frac{b_6 \left(b_1^6 - 15b_1^4 c_1^2 + 15b_1^2 c_1^4 - c_1^6\right) + 2b_1 c_1 \left(3b_1^4 - 10b_1^2 c_1^2 + 3c_1^4\right) c_6}{c_1^6} \\ u_{12} &= \frac{-2b_1 b_6 c_1 \left(3b_1^4 - 10b_1^2 c_1^2 + 3c_1^4\right) + \left(b_1^6 - 15b_1^4 c_1^2 + 15b_1^2 c_1^4 - c_1^6\right) c_6}{c_1^6} \end{split}$$

Hilbert polynomial basis

Navier-Stokes

invariant polynomials - how to find them?

• invariant polynomials (Hilbert basis)

invariant polynomials - how to find them?

 invariant polynomials (Hilbert basis): computationally prohibitive for high-dimensional flows

invariant polynomials - how to find them?

- invariant polynomials (Hilbert basis)
- Cartan moving frame method / method of slices

invariant polynomials - how to find them?

- invariant polynomials (Hilbert basis)
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invariant polynomials - how to find them?

- invariant polynomials (Hilbert basis)
- Cartan moving frame method / method of slices: singularities

slice & dice

Navier-Stokes

Lie algebra generators

T_a generate infinitesimal transformations: a set of N linearly independent $[d \times d]$ anti-hermitian matrices, $(\mathbf{T}_a)^{\dagger} = -\mathbf{T}_a$, acting linearly on the d-dimensional state space \mathcal{M}

example: SO(2) rotations for complex Lorenz equations

$$\mathbf{T} = \begin{pmatrix} 0 & 1 & 0 & 0 & 0 \\ -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & -1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 \end{pmatrix}$$

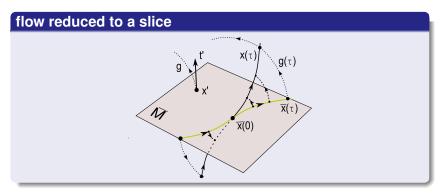
The action of SO(2) on the complex Lorenz equations state space decomposes into m = 0 *G*-invariant subspace (*z*-axis) and m = 1 subspace with multiplicity 2.

group tangent fields

flow field at the state space point x induced by the action of the group is given by the set of N tangent fields

$$t_a(x)_i = (\mathbf{T}_a)_{ij} x_i$$

slice & dice



Slice $\bar{\mathcal{M}}$ through the slice-fixing point x', normal to the group tangent t' at x', intersects group orbits (dotted lines). The full state space trajectory $x(\tau)$ and the reduced state space trajectory $\bar{x}(\tau)$ are equivalent up to a group rotation $g(\tau)$.

flow within the slice

slice fixed by x'

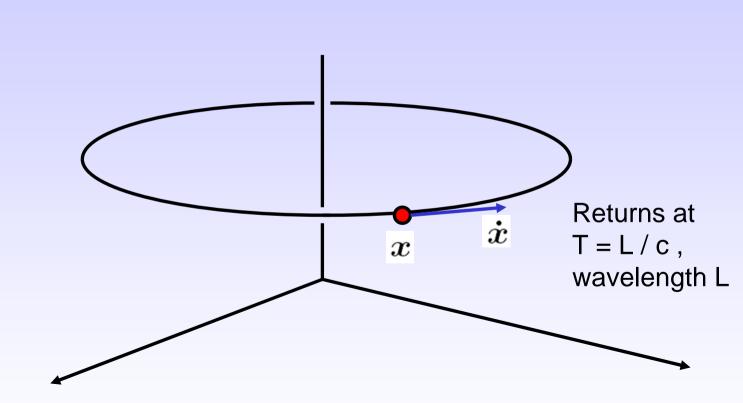
reduced state space $\overline{\mathcal{M}}$ flow $u(\overline{x})$

$$u(\overline{x}) = v(\overline{x}) - \dot{\theta}(\overline{x}) \cdot t(\overline{x}), \qquad \overline{x} \in \overline{\mathcal{M}}$$

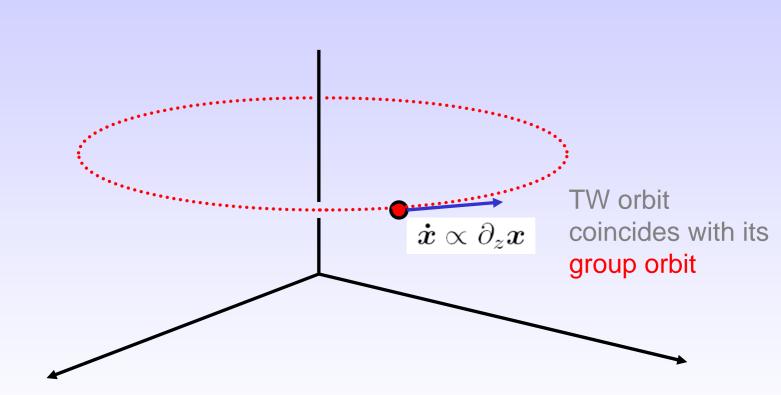
$$\dot{\theta}_a(\overline{x}) = (v(\overline{x})^T t'_a) / (t(\overline{x})^T \cdot t').$$

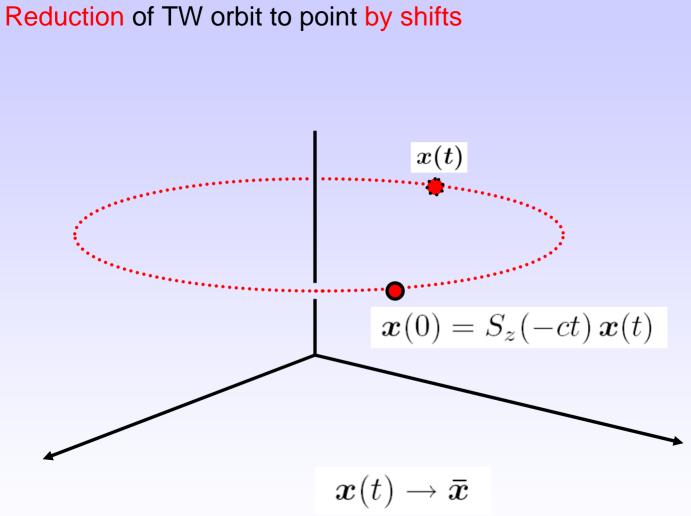
together with the reconstruction equation for the group phases flow $\dot{\theta}$

TW orbit in phase space

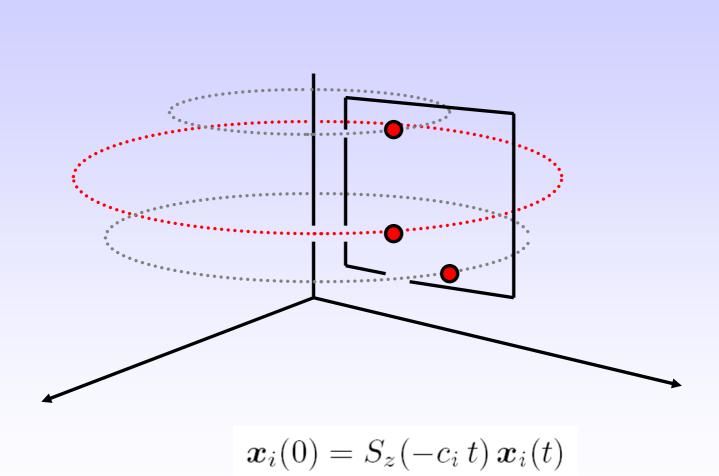


Axial shifts of TW state

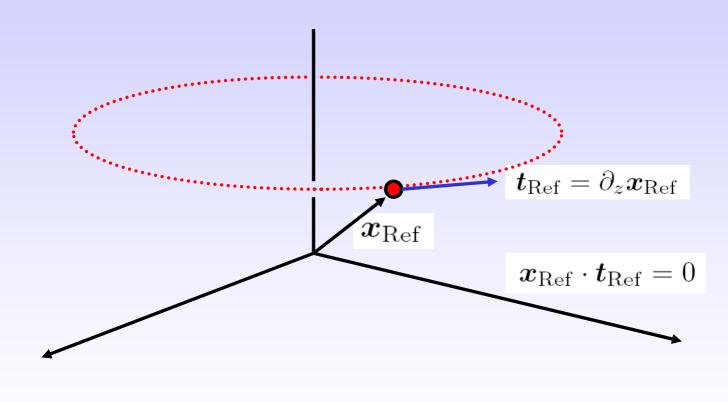


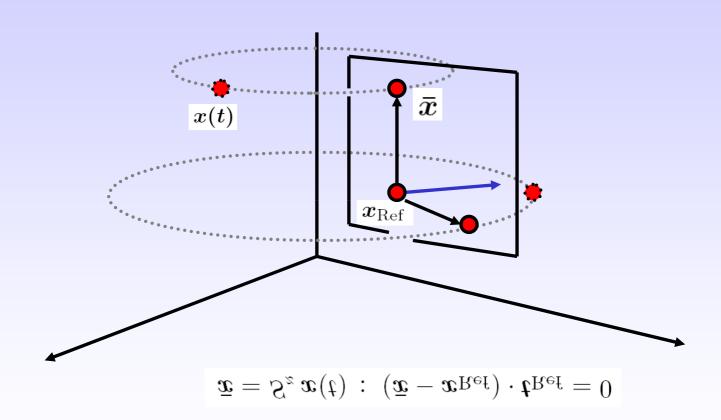


Reduce all TWs into a single slice



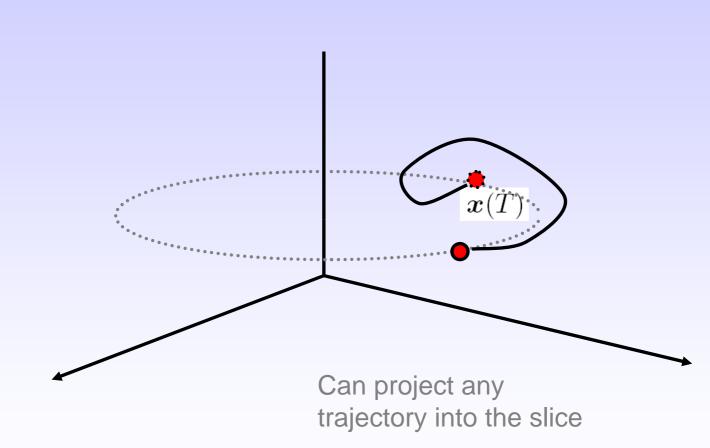
How? - several speeds c, possibly unknown



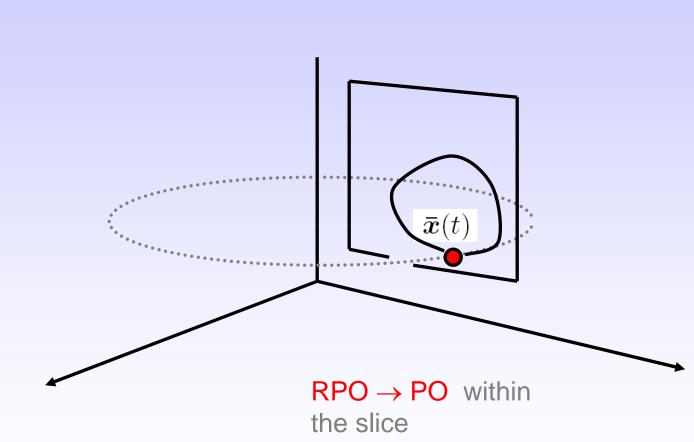


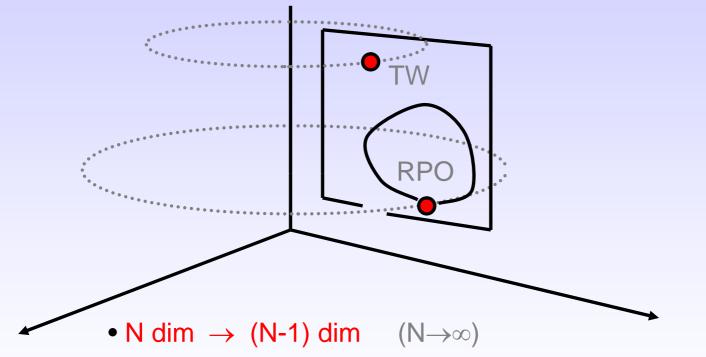
All TWs → points in the slice

Application to a relative periodic orbit (RPO)



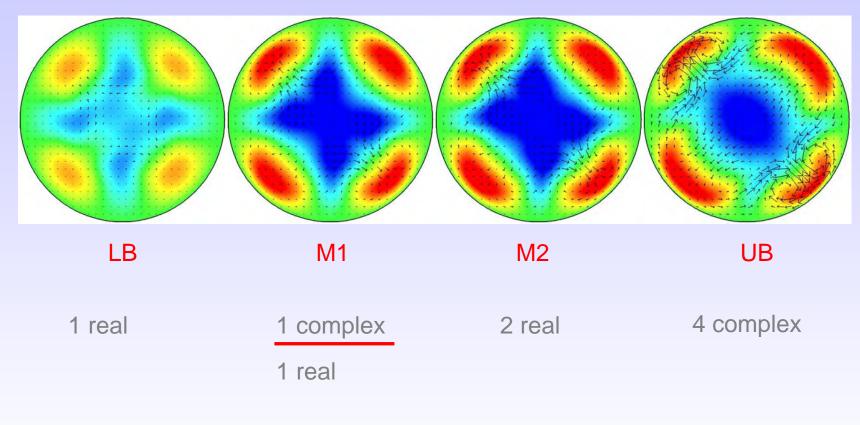
Application to a relative periodic orbit (RPO)





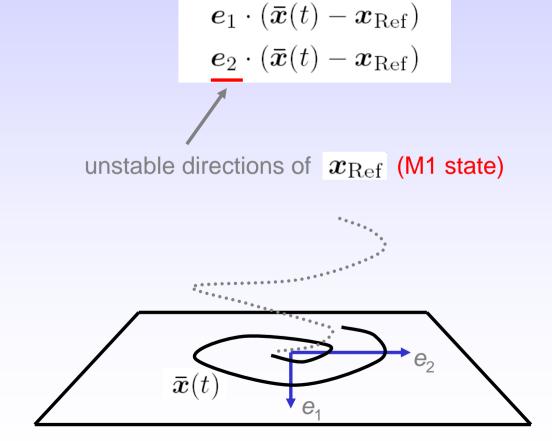
- Automatic removal of strong shift (gives c for TW)
- $\bullet \ \mathsf{TW} \to \mathsf{point}$
- RPO \rightarrow PO

Application to Pipe Flow, N2 L=2.5 D states

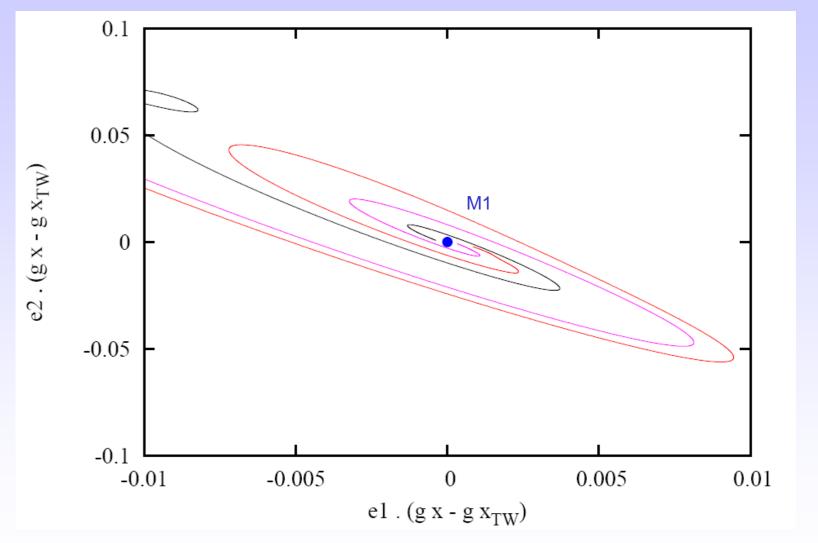


unstable eigenvalues

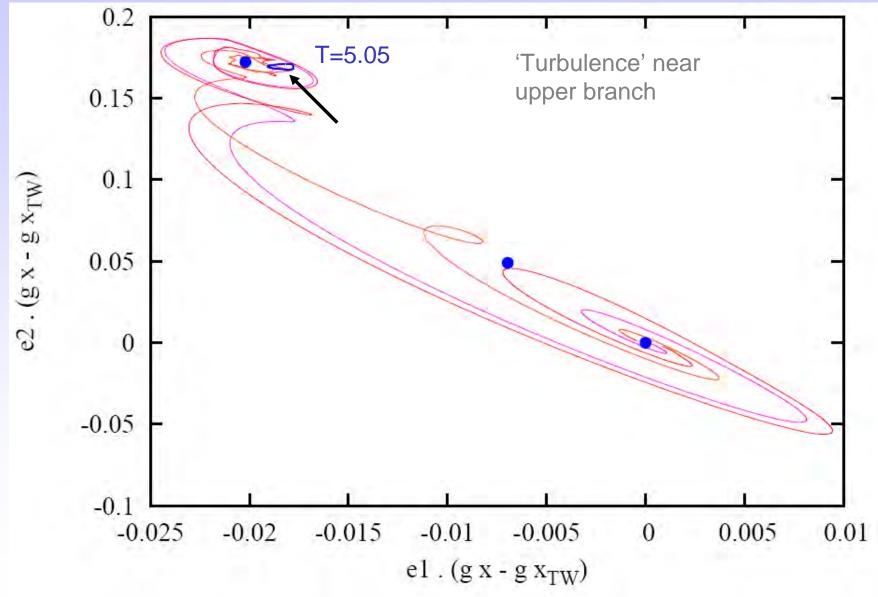
Projection within slice, (N-1) dim \rightarrow 2 dim



Local dynamics, projection within slice



Embedded RPO



slice & dice

Navier-Stokes

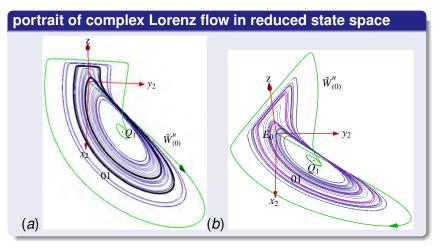
slice trouble 1

glitches!

group tangent of a generic trajectory orthogonal to the slice tangent at a sequence of instants τ_k

$$t(\tau_k)^T \cdot t' = 0$$

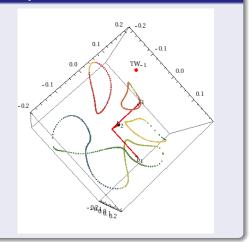
slice trouble 1



all choices of the slice fixing point x' exhibit flow discontinuities / jumps

slice trouble 2

slice cuts a relative periodic orbit multiple times



Relative periodic orbit intersects a hyperplane slice in 3 closed-loop images of the relative periodic orbit and 3 images that appear to connect to a closed loop.

conclusion

- Symmetry reduction by slicing: efficiently implemented, allows exploration of high-dimensional flows with continuous symmetry.
- stretching and folding of unstable manifolds in reduced state space organizes the flow

to be done

- construct Poincaré sections and return maps
- find all (relative) periodic orbits up to a given period.
- use the information quantitatively (periodic orbit theory).

amazing data! amazing numerics! frustration...



"Ask your doctor if taking a pill to solve all your problems is right for you."