

AIM Seminar

U of Michigan

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## Turbulence?

a stroll through 61,506  
dimensions

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# Turbulence: A walk through a repertoire of unstable recurrent patterns?

As a turbulent flow evolves, every so often we catch a glimpse of a familiar pattern:



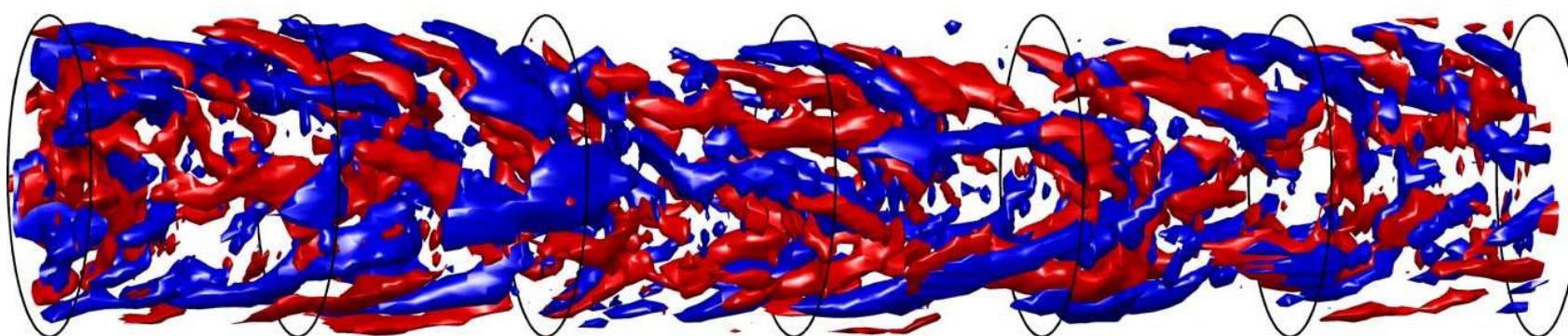
$\Rightarrow$  other swirls  $\Rightarrow$



For any finite spatial resolution, the system follows approximately for a finite time a pattern belonging to a finite alphabet of admissible patterns. The long term dynamics = a walk through the space of such unstable patterns.

## New experiments: Unstable Coherent Structures

Stereoscopic Particle Image Velocimetry → 3-d velocity field over the entire pipe<sup>1</sup>

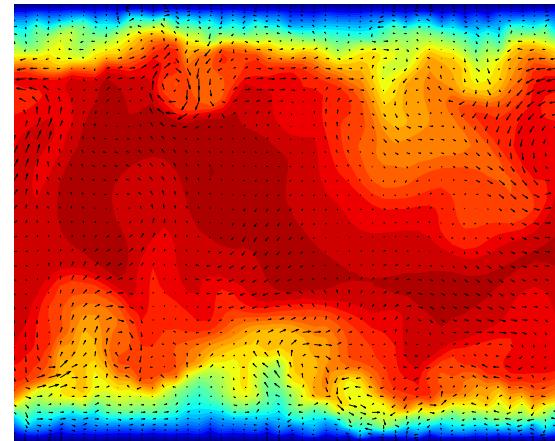


Observed structures resemble numerically computed traveling waves

What lies beyond?

<sup>1</sup>Casimir W.H. van Doorne (PhD thesis, Delft 2004); Hof et al., Science (Sep 10, 2004)

# Wall-bounded turbulence in channel flow



Pressure driven turbulent channel flow,  $Re = 3700$ . Walls top/bottom, periodic BCs front/back and sides. Red/blue is fast/slow into screen.<sup>2</sup>

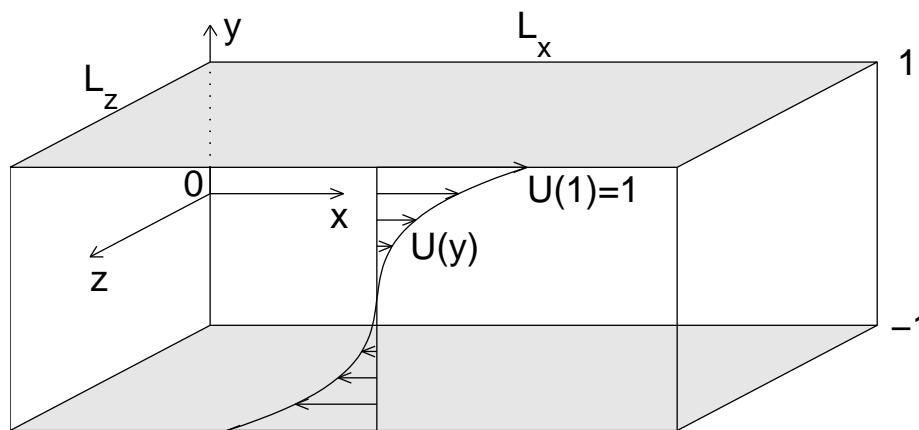
- \* Near-wall rolls generate turbulence.
- \* Mix high and low speed fluids near wall, generating drag.

<sup>2</sup>J.F. Gibson: [www.channelflow.org](http://www.channelflow.org)

## Plane Couette flow

Navier-Stokes for fluid velocity  $\mathbf{u}(x, t)$  and pressure  $p(x, t)$

$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} = -\nabla p + \nu \nabla^2 \mathbf{u}, \quad \nabla \cdot \mathbf{u} = 0$$



periodic, wall-bounded domain  $\Omega = [0, L_x] \times [-1, 1] \times [0, L_z]$  with BCs

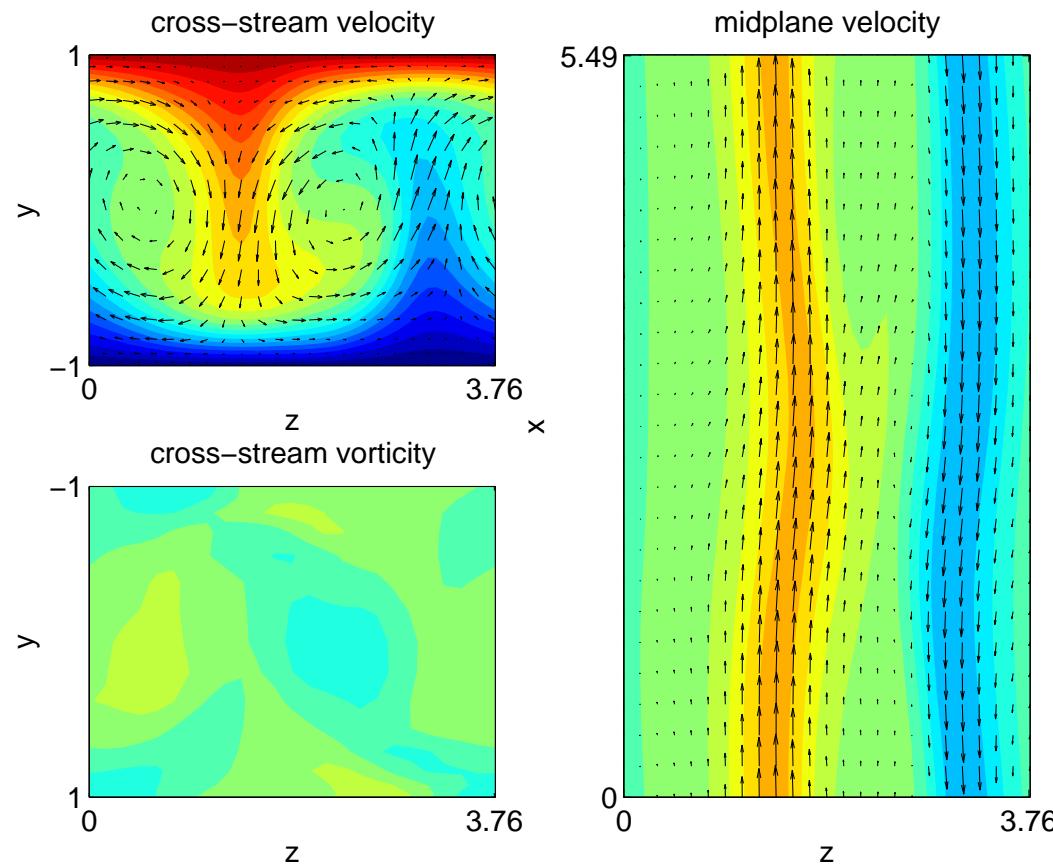
$$\mathbf{u}(x, \pm 1, z, t) = \pm \mathbf{1}$$

$$\mathbf{u}(x+L_x, y, z) = \mathbf{u}(x, y, z, t), \quad \mathbf{u}(x, y, z+L_z) = \mathbf{u}(x, y, z, t).$$

# Turbulent plane Couette Flow

simplest possible  
turbulent flow:

$Re = 400$



3,4

<sup>3</sup>Numerical study: Hamilton, Kim, Waleffe, JFM 287 (1995)

<sup>4</sup>Self-sustaining process: Waleffe, Phys. Fluids 9 (1997)

THE POINT OF THIS TALK



## !!! THE POINT OF THIS TALK !!!

UNLEARN:  
3-d VISUALIZATION

THINK:  
 $\infty$ -d PHASE SPACE

instant in turbulent evolution:  
a **3-d video frame**,  
each pixel a 3-d velocity field

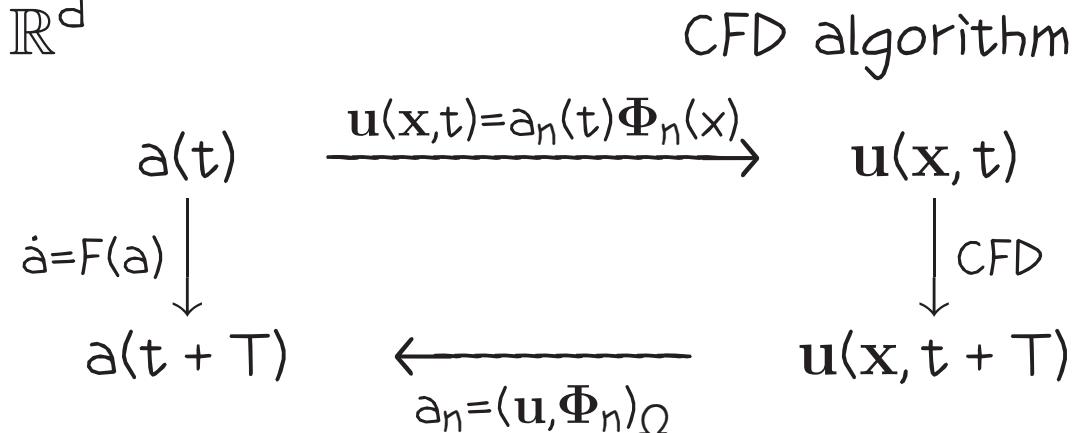
instant in turbulent evolution:  
a **unique point**  
theory of turbulence =  
geometry of the state space

THINK IN STATE SPACE!

Q: How do you treat Navier-Stokes as a dynamical system?

## A: dual ODE/CDF representations

ODE in  $\mathbb{R}^d$



State space portraits = projections on well-chosen states  $\hat{u}_n$ :

$$\hat{a}_n(t) = (\mathbf{u}(t), \hat{\mathbf{u}}_n)_\Omega \quad (\text{integral over the box})$$

# ODE vs. CFD reps. of Navier-Stokes

## ODE formulation

- Closed-form, unconstrained, real-valued dynamical system
- Orthonormal  $\Phi_n$ :  $\|\mathbf{a}\|^2 = \|\mathbf{u}\|_{\Omega}^2$
- Impossible to integrate:  $F$  quadratic in  $\mathbb{R}^d$ ,  $d \approx 10^5$

## CFD algorithm

- Efficient time integration of Navier-Stokes
- Constraints: pressure, BCs, complex symmetries
- No 1-order ODE formulation, no clear set of independent variables

## ODE: Orthonormal, divergence-free basis

inner product:

$$(f, g)_{\Omega} = \frac{1}{V} \int_0^{L_x} \int_{-1}^1 \int_0^{L_z} f \cdot g \, dx \, dy \, dz$$

construct basis  $\{\Phi_n(x) \mid n = 1, \dots, \infty\}$  with properties

real, vector-valued:

$$\Phi_n = \Phi_n^u e_x + \Phi_n^v e_y + \Phi_n^w e_w$$

orthonormal:

$$(\Phi_n, \Phi_m)_{\Omega} = \delta_{mn}$$

divergence-free:

$$\nabla \cdot \Phi_n = 0$$

Dirichlet at walls:

$$\Phi_n(x, \pm 1, z) = 0$$

periodic in  $x, z$ :

$$\Phi_n(x, y, z) = \Phi_n(x + L_x, y, z) = \Phi_n(x, y, z + L_z)$$

# ODE: Galerkin projection of Navier-Stokes

expand  $u$  (deviation of velocity from laminar)

$$u(x, t) = a_n(t) \Phi_n(x), \quad n = 1, \dots, d$$

Galerkin projection of NS onto  $\Phi_m$  produces ODE in  $\mathbb{R}^d$

$$\dot{a}_m = F(a)_m = L_{mn} a_n + N_{mnp} a_n a_p, \quad m, n, p = 1, \dots, d.$$

where

- $L_{mn} = (\nu \nabla^2 \Phi_n - \partial \Phi_n / \partial x, -\Phi_n^\top \cdot e_x, \Phi_m)_\Omega$  and  $N_{mnp} = -(\Phi_n \cdot \nabla \Phi_p, \Phi_m)_\Omega$
- Indices range from 1 to  $d \approx 10^5$  ( $2 \times 32^3$  to  $2 \times 48^3$ )
- ODE system **too big to integrate**

## CFD/ODE: State space portraits

Visualize state space by projecting ODE  $a(t)$  or CFD  $u(t)$  onto a few well-chosen  $\{\mathbf{u}_1, \mathbf{u}_2, \mathbf{u}_3\}$  representative velocity fields (e.g., a few equilibria and their unstable eigenvectors).

Construct  $\{\hat{\mathbf{u}}_1, \hat{\mathbf{u}}_2, \hat{\mathbf{u}}_3\}$  by Gram-Schmidt orthogonalization and inner product

$$(\mathbf{u}_1, \mathbf{u}_2)_\Omega = \frac{1}{V} \int_0^{L_x} \int_{-1}^1 \int_0^{L_z} \mathbf{u}_1 \cdot \mathbf{u}_2 \, dx \, dy \, dz$$

State space portraits = projections

$$\hat{a}_n(t) = (\mathbf{u}(t), \hat{\mathbf{u}}_n)_\Omega$$

The devil is in the details

Turbulent flows **cannot** be modeled by a few modes

Attractor is “**low dimensional**,” but has to be tracked in the full  $10^3$  to  $10^5$  dimensions

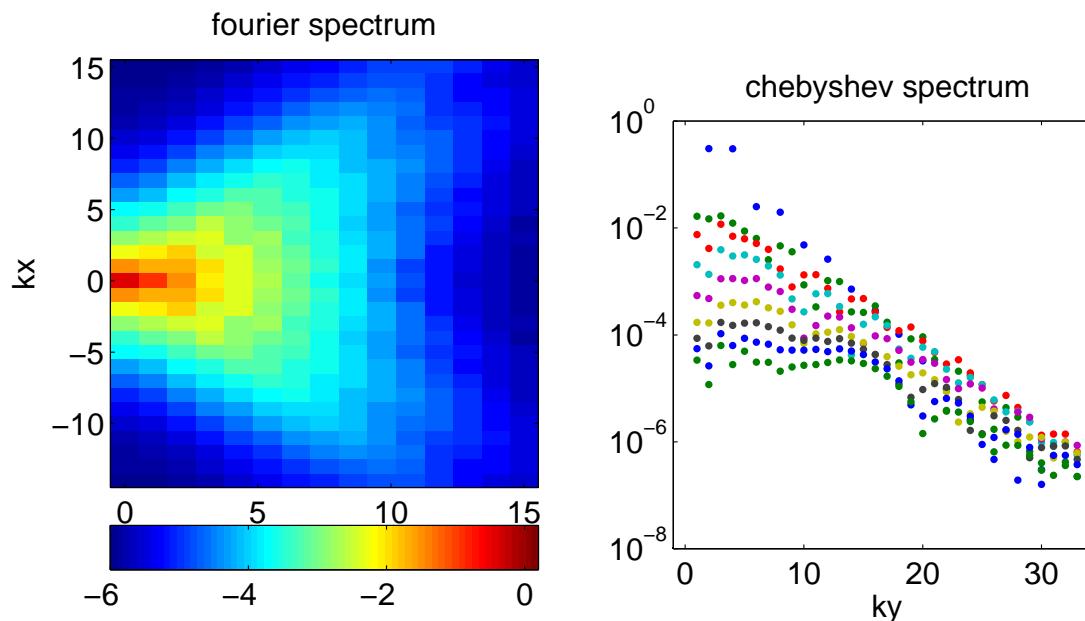
[www.channelflow.org](http://www.channelflow.org) CFD software

## John F. Gibson:

- High-level representation of CFD objects: fields, DNS algorithms, differential operators, etc
- Compact, readable programs
- C++ library of spectral CFD building blocks
- Automated test suite, verification against known solutions

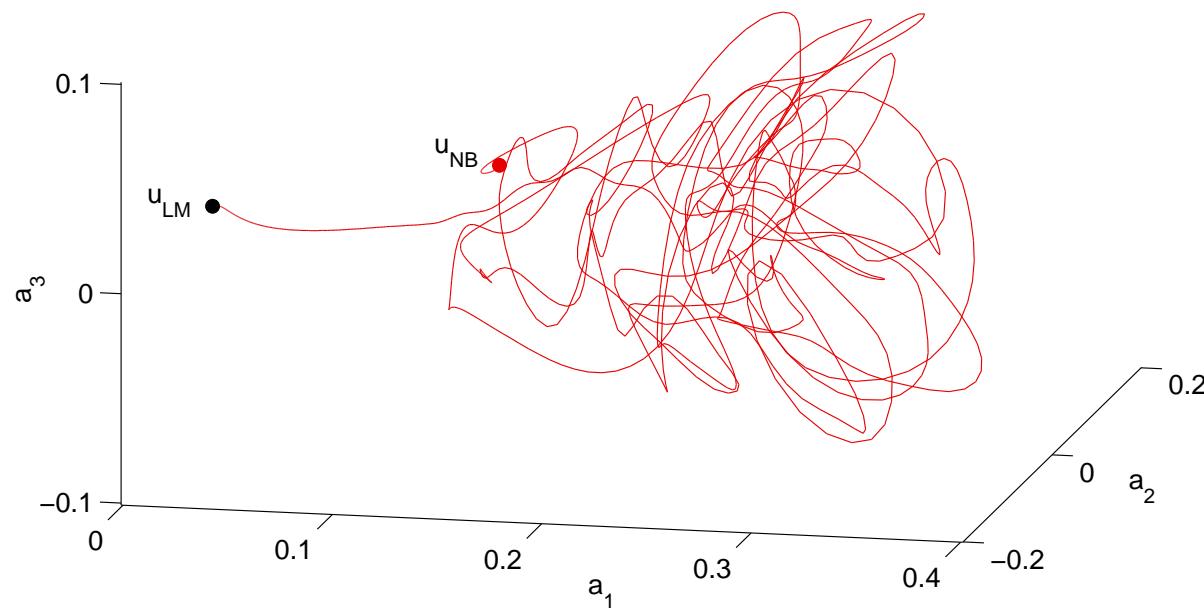
# CFD: Geometry and spectral convergence

	Re	$L_x$	$L_y$	$L_z$	
"Minimal" PCF	$\sim 400$	$\sim 2\pi$	2	$\sim \pi$	
Hamilton, Kim, Waleffe (HWK)	400	$7\pi/4$	2	$6\pi/5$	sustained turbulence



Adequate resolution:  $32 \times 33 \times 32$  to  $48 \times 49 \times 48$  grids

# A "turbulent Plane Couette" trajectory $\text{Re} = 400$



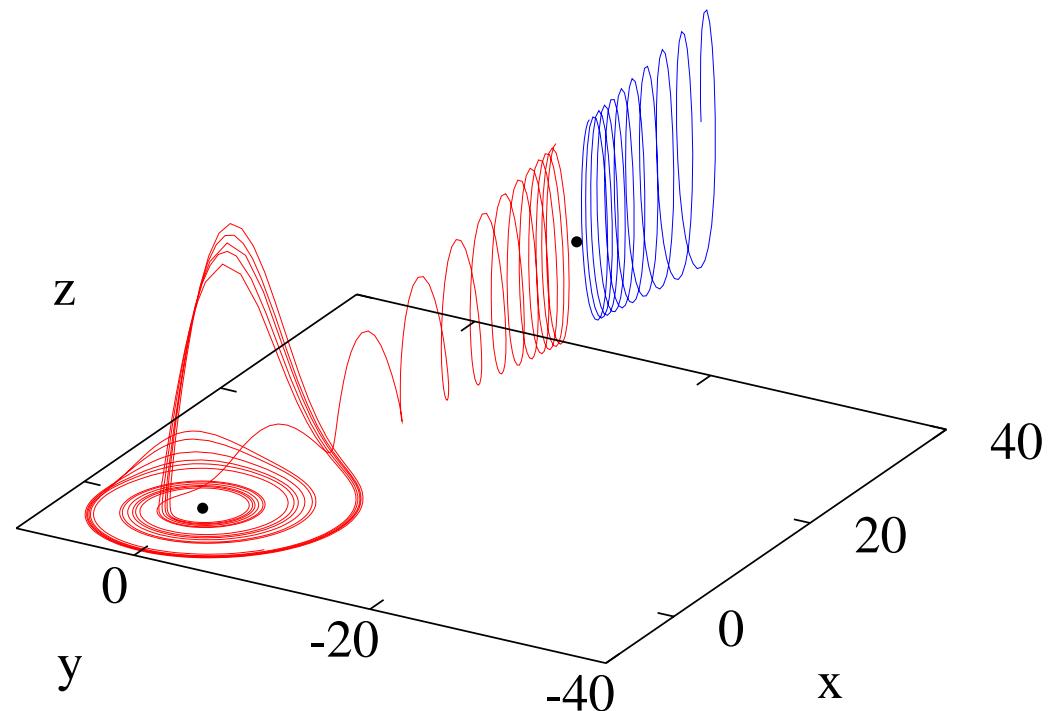
a long transient to the laminar state

60K modes 3D Navier-Stokes DNS, a projection from  
Fourier  $\times$  Fourier  $\times$  Chebyshev  $\rightarrow$  well-chosen statespace 3d frame

Equilibria / Traveling waves

# Role of Rössler flow equilibria

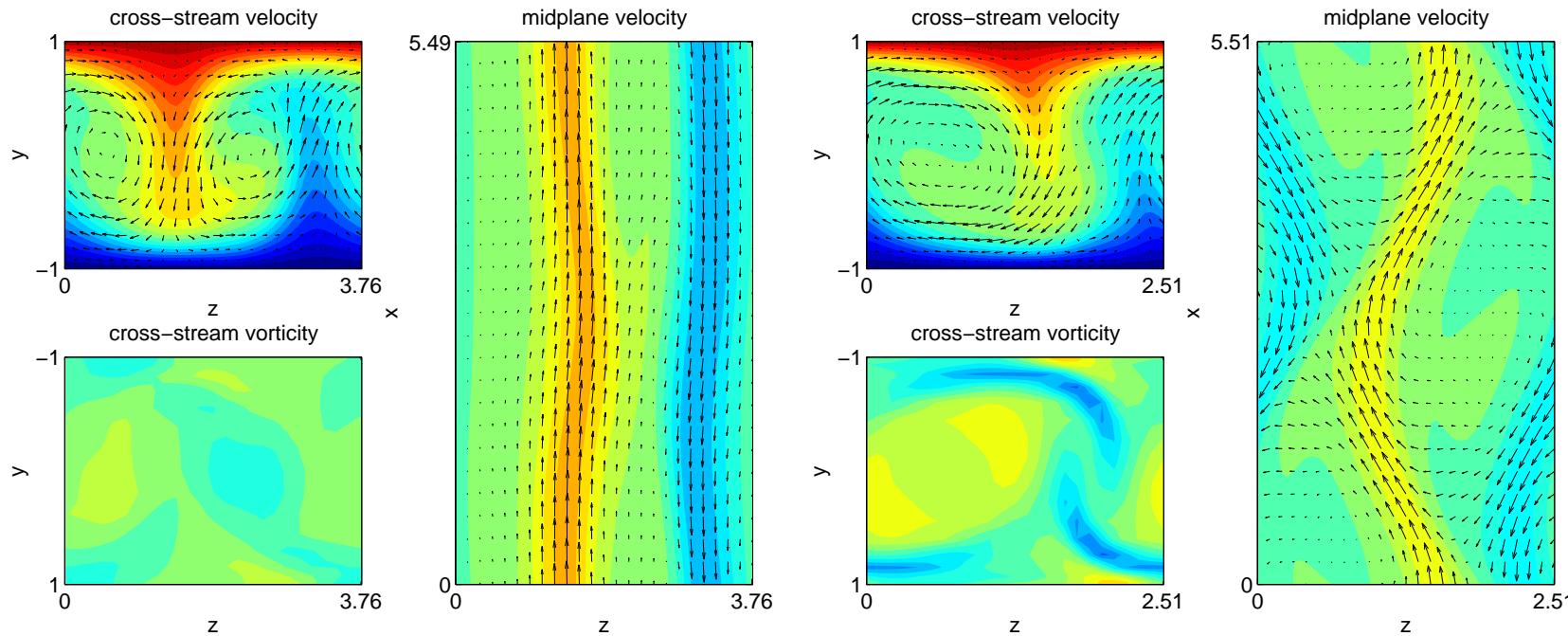
“+” equilibrium point  
stable manifold  
= basin boundary



right of the “+” trajectories escape

left of the “+” fall into chaotic attractor circling the “-” equilibrium point

# Turbulence vs. upper-branch equilibrium

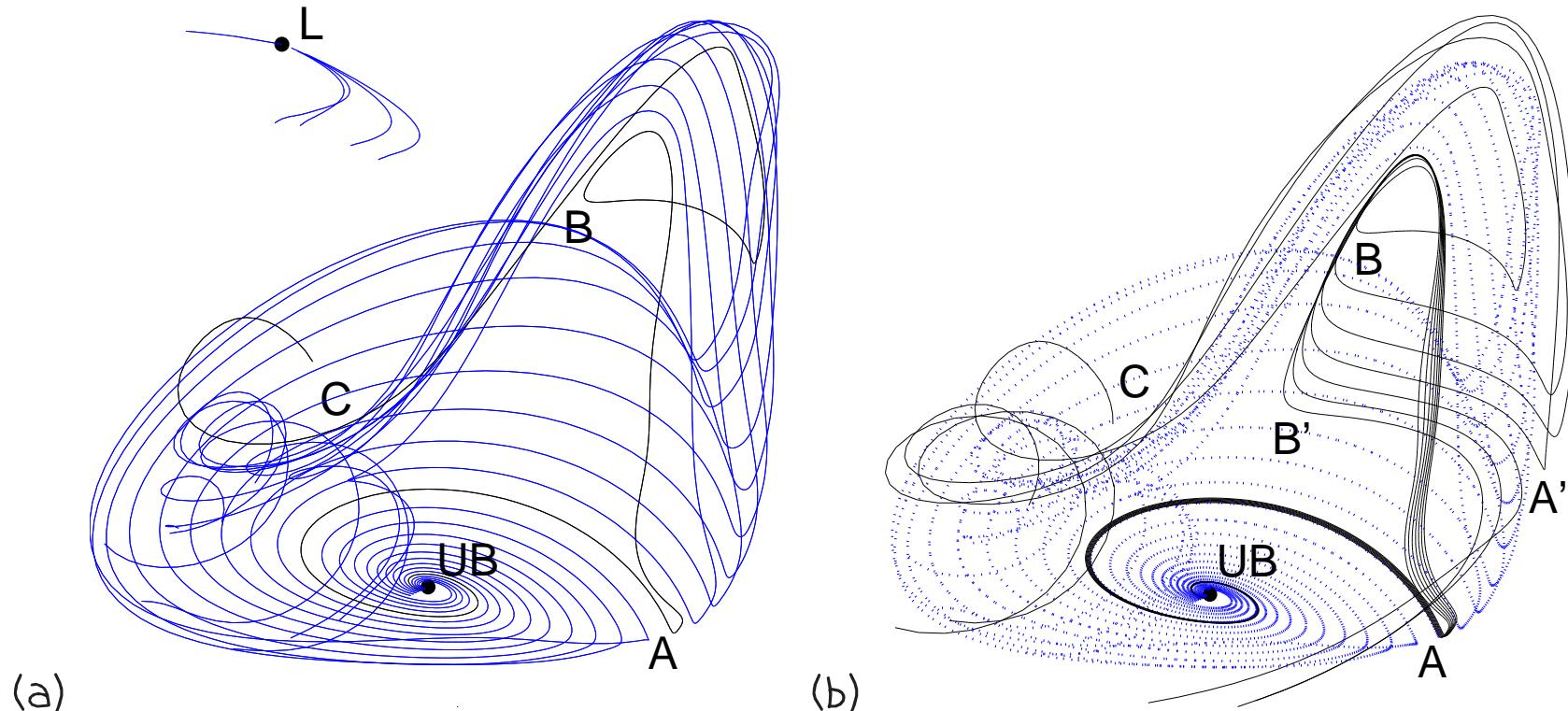


Typical turbulent field

Upper-branch equilibrium<sup>5</sup>

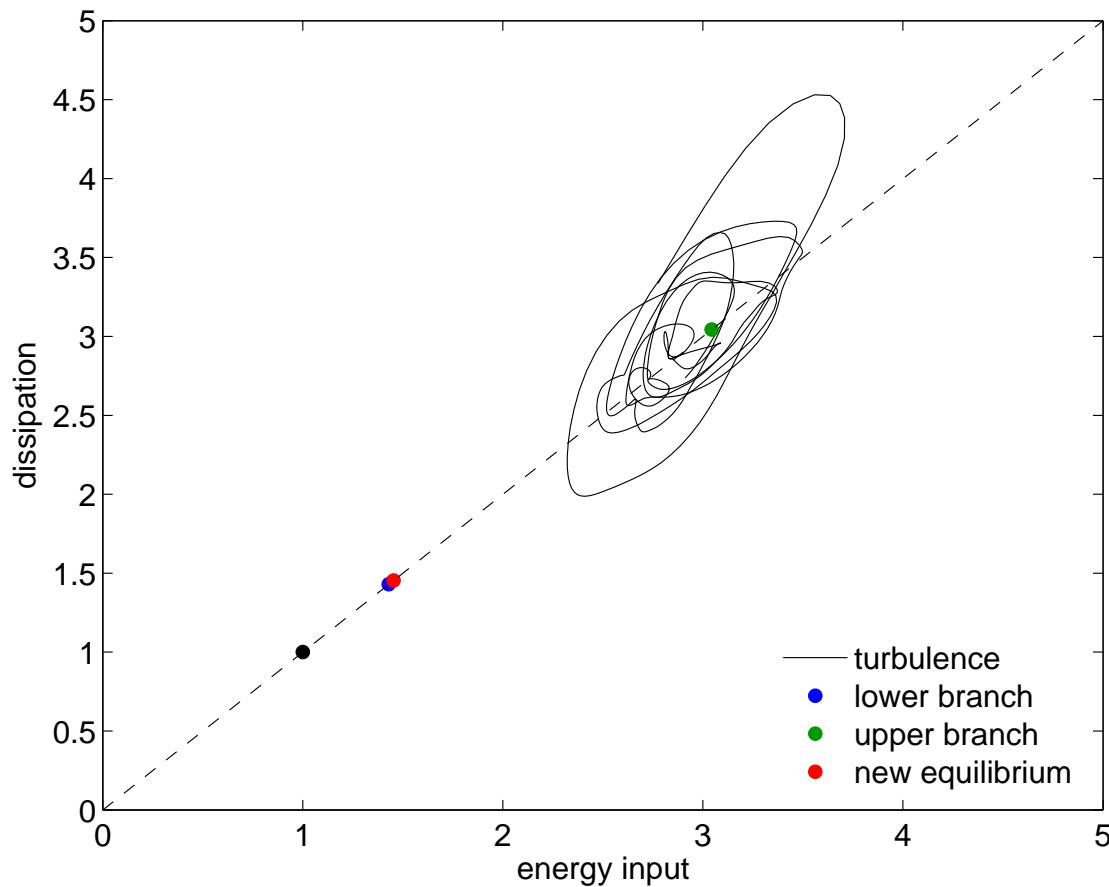
<sup>5</sup>Waleffe, Phys. Fluids 15 (2003)

## UB unstable manifold, symmetric subspace

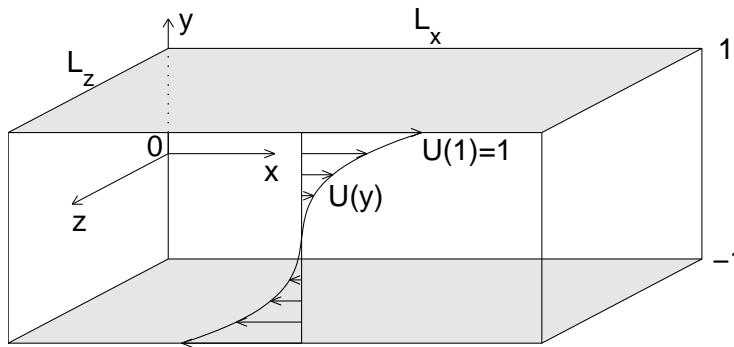


Shift-reflect, shift-rotate unstable manifold of upper branch.

## Dissipation versus energy input

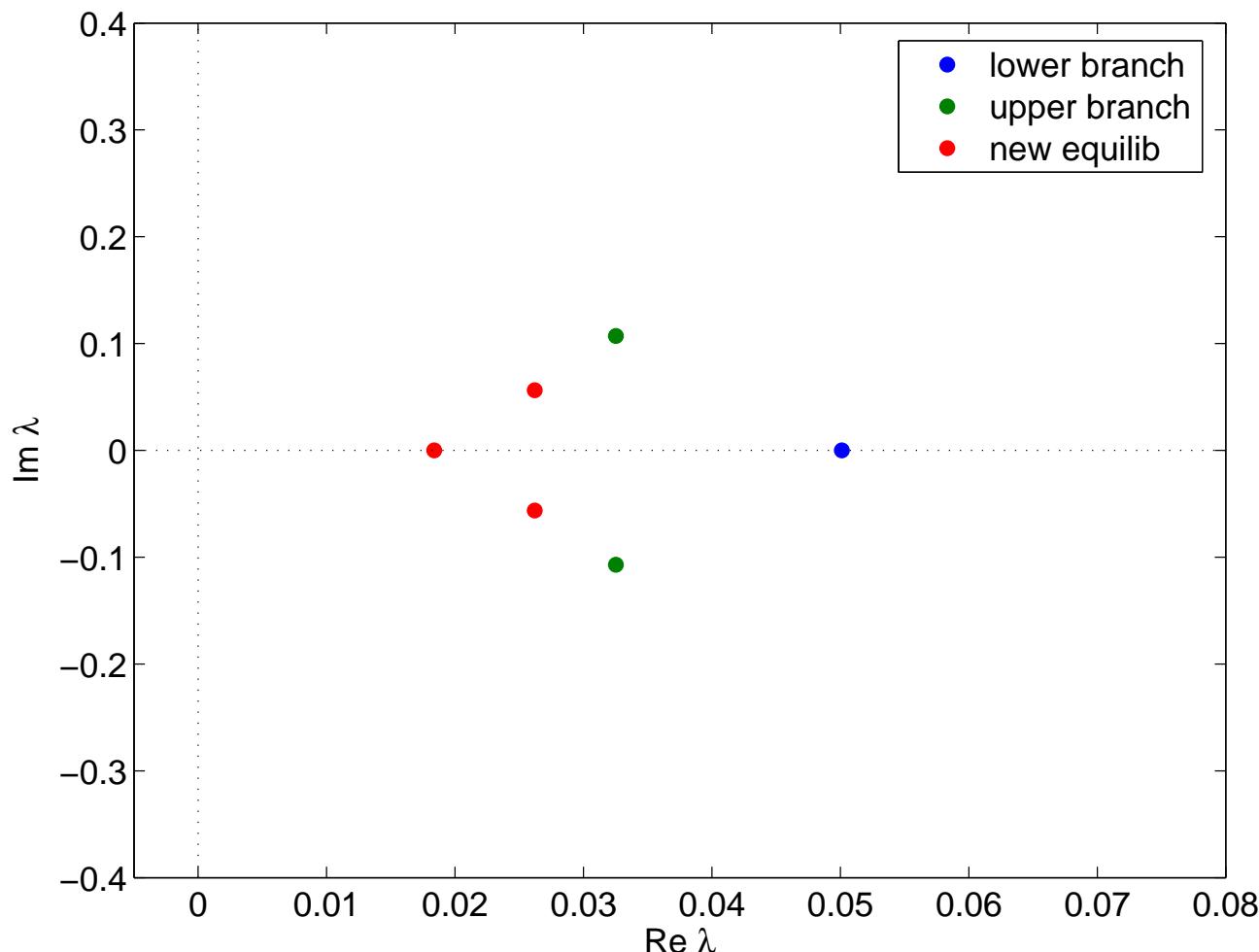


# Symmetries of plane Couette

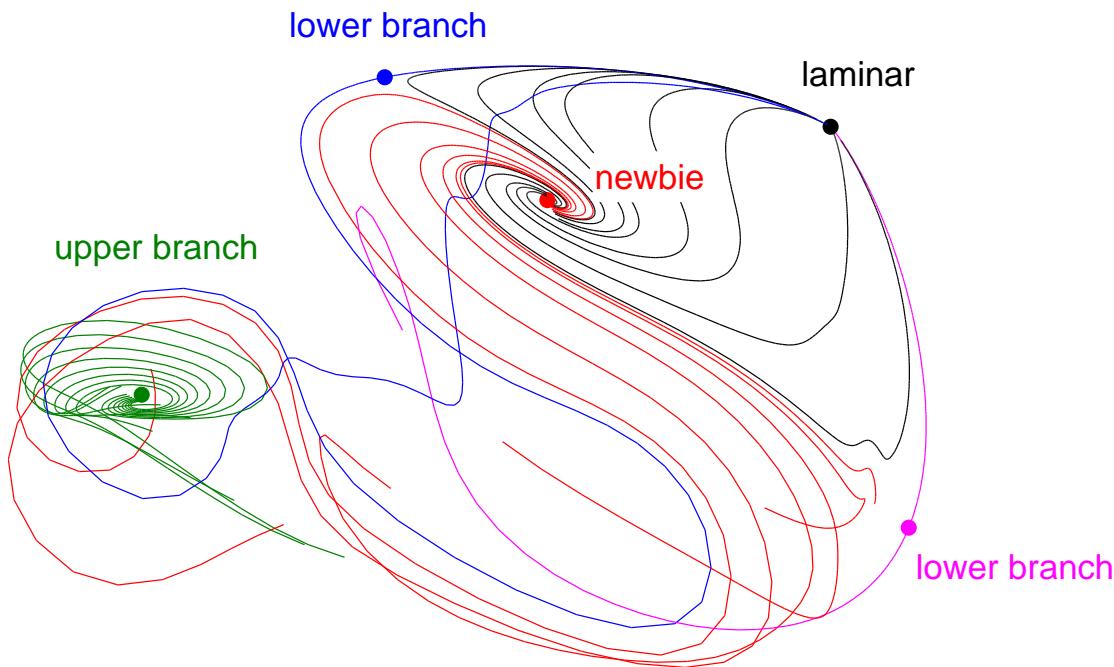


$$\begin{aligned}
 \begin{pmatrix} u \\ v \\ w \end{pmatrix} (x, y, z) &\rightarrow \begin{pmatrix} u \\ v \\ -w \end{pmatrix} \left(\frac{L_x}{2} + x, y, -z\right) && \text{shift-reflect} \\
 &\rightarrow \begin{pmatrix} -u \\ -v \\ w \end{pmatrix} \left(\frac{L_x}{2} - x, -y, \frac{L_z}{2} + z\right) && \text{shift-rotate} \\
 &\rightarrow \begin{pmatrix} u \\ v \\ w \end{pmatrix} (x + \tau_x, -y, z + \tau_z) && \text{translate}
 \end{aligned}$$

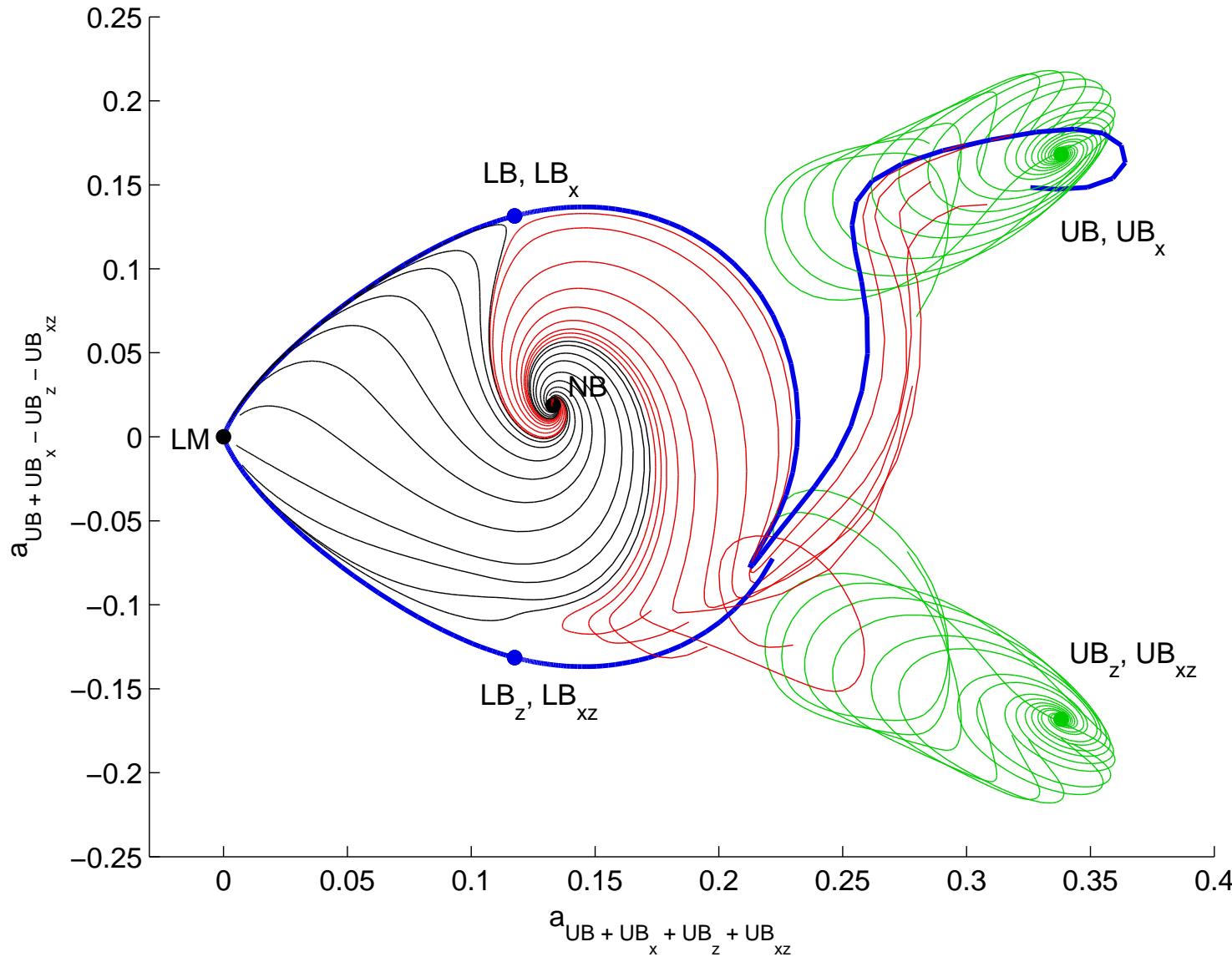
# Unstable symmetric LB, UB, NB eigenvalues



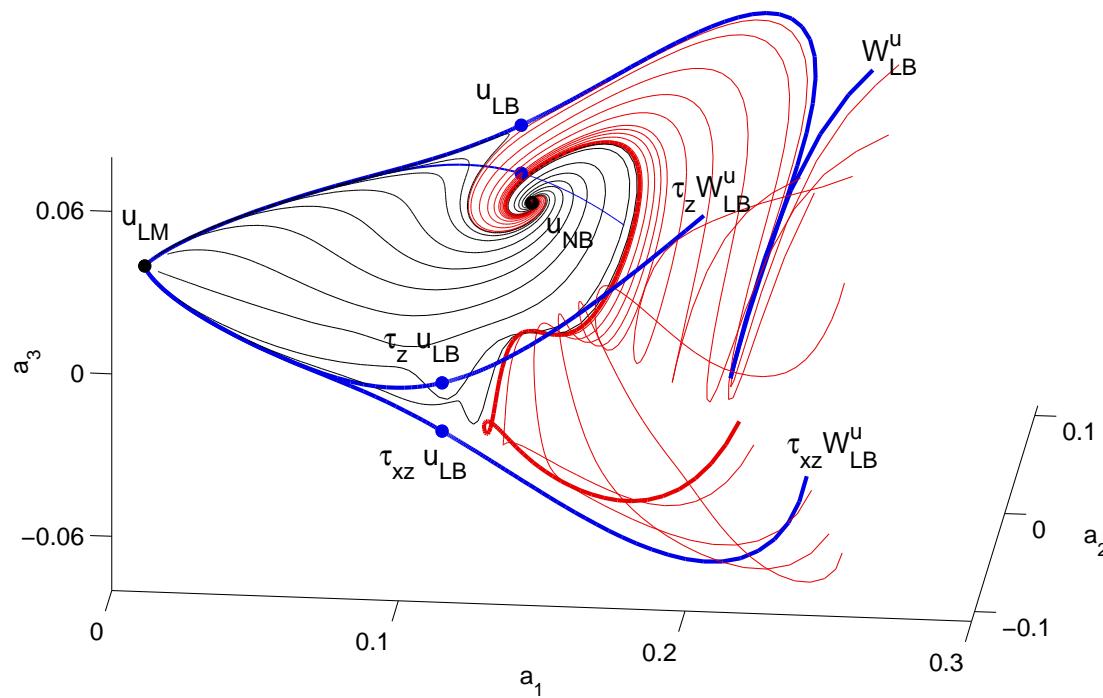
## UB, LB and NB symmetric state-space portrait



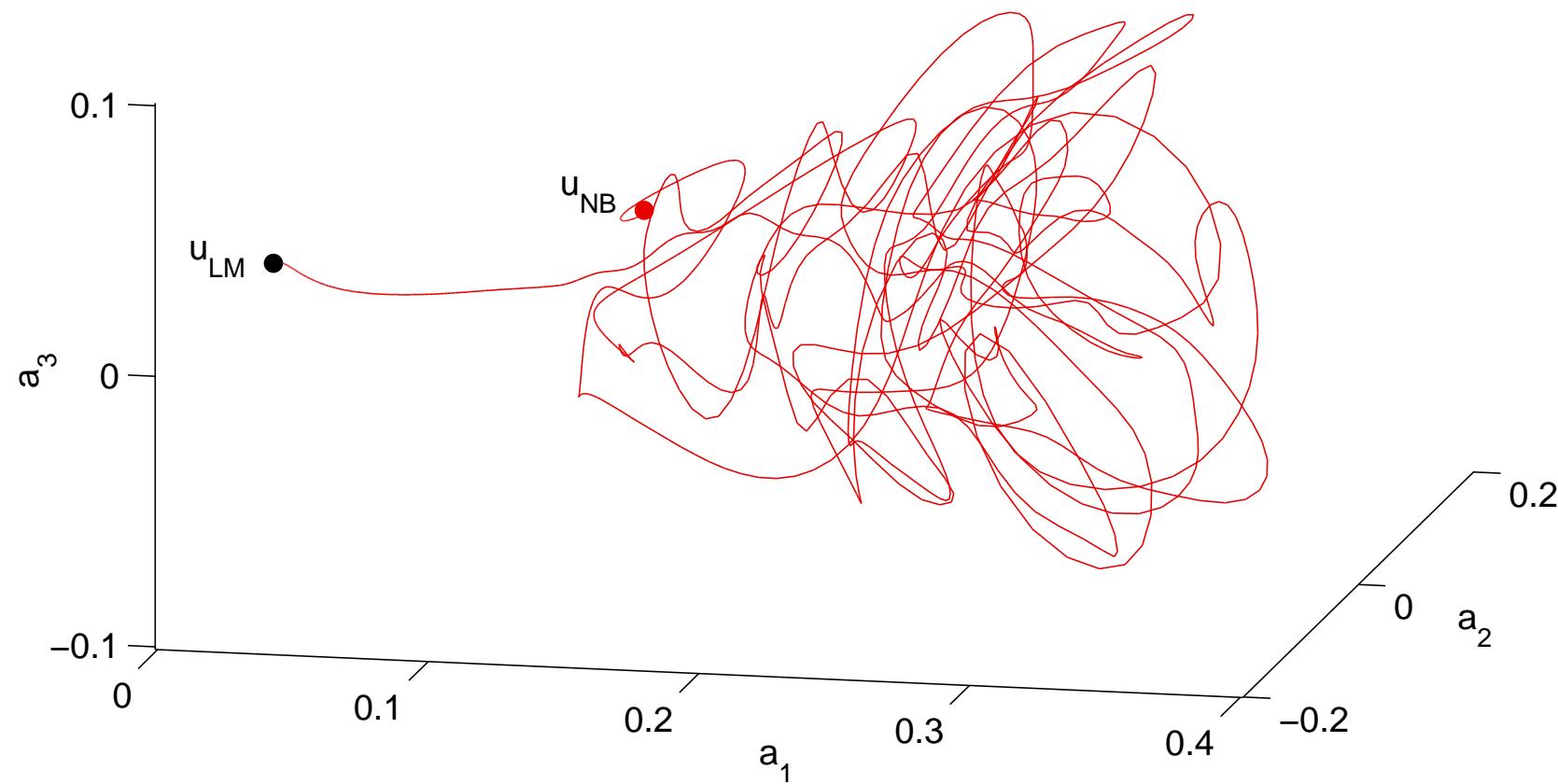
Coordinates of phase portrait are orthogonalized LB, NB, UB.



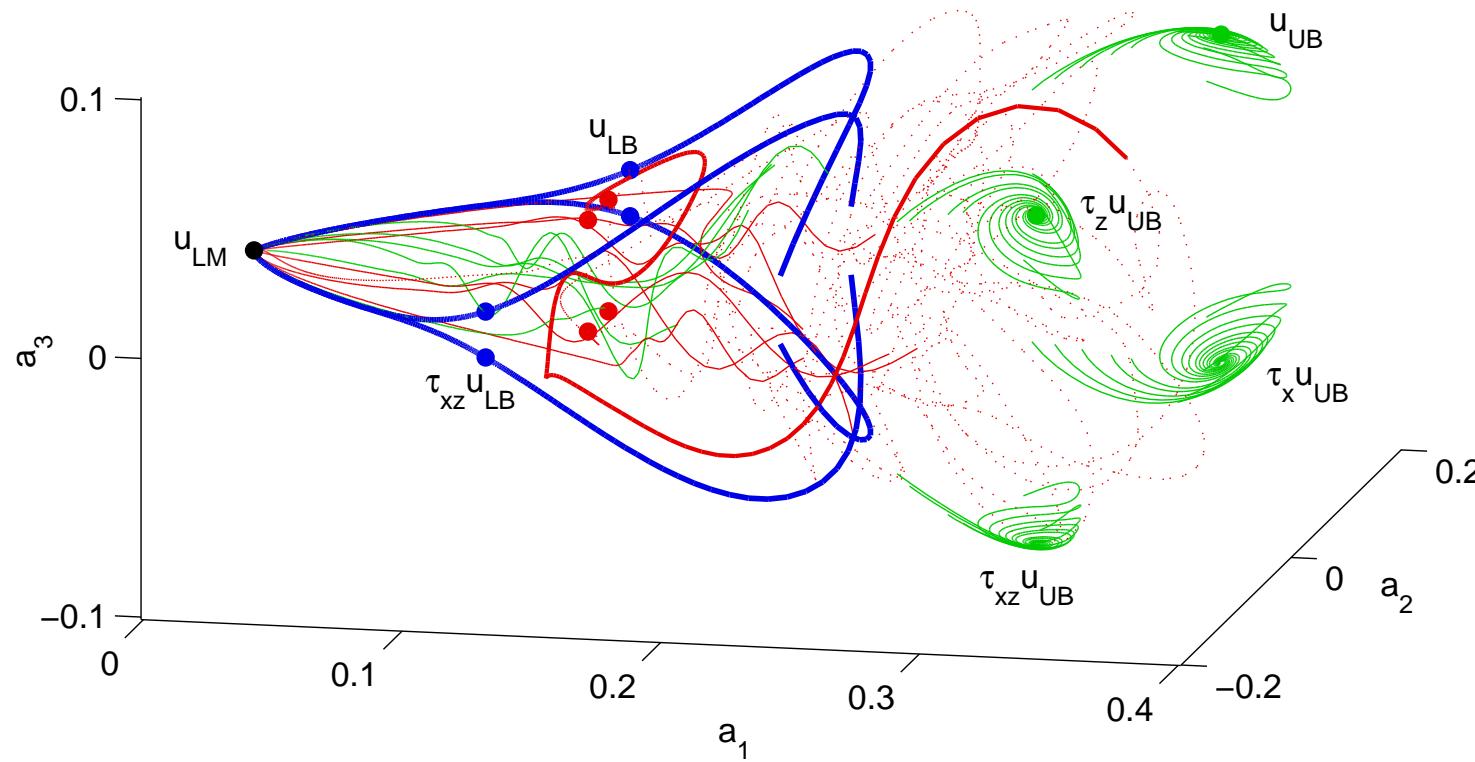
# A stroll in 61,506 dimensions



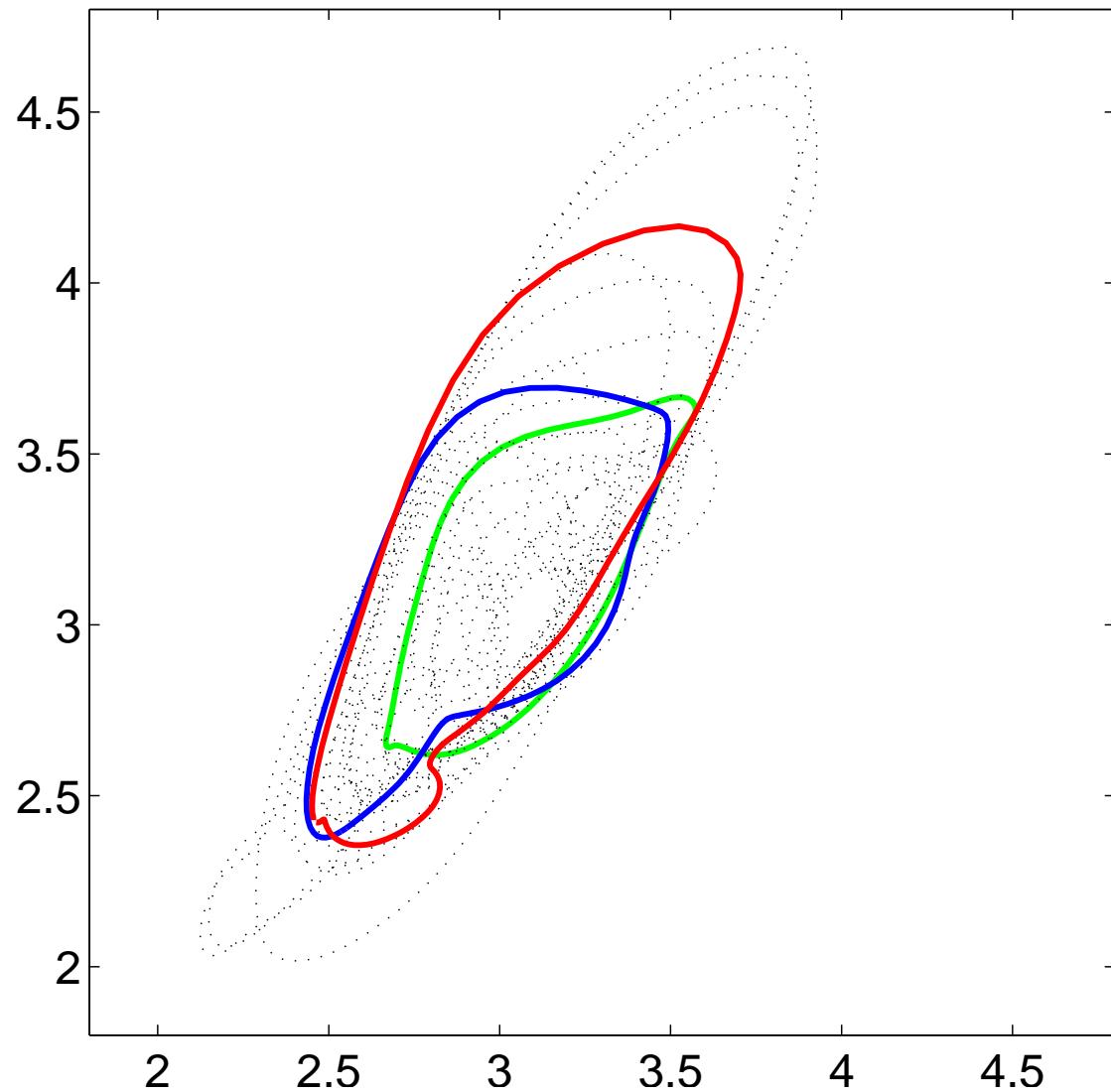
Unstable manifolds of  $u_{LB}$  and its half-cell translations, and a 2d portion of the  $u_{NB}$  unstable manifold, projected from 61,506 dimensions to 3 in the state space global basis



A transiently turbulent trajectory in the  $u_{NB}$  unstable manifold, in isolation.



A transiently turbulent trajectory in the  $\mathbf{u}_{\text{NB}}$  unstable manifold, within the cage formed by  $\mathbf{u}_{\text{LB}}$ ,  $\mathbf{u}_{\text{NB}}$ ,  $\mathbf{u}_{\text{UB}}$ , their half-cell translations, and their unstable manifolds. The final decay to laminar of several other trajectories in the unstable manifolds of  $\mathbf{u}_{\text{NB}}$  and  $\mathbf{u}_{\text{UB}}$  are also shown.



Three periodic orbits: (green)  $T = 74.348$ . (red)  $T = 102.286$  (may be a close recurrence). (blue)  $T = 88.905$ .

## Conclusions: geometry of Navier Stokes

dual ODE / CFD representations of Navier-Stokes

State space portraits

Computed eigenvalues, eigenfunctions of equilibrium states,  
w,w/o symmetry

Heteroclinic connections between equilibria

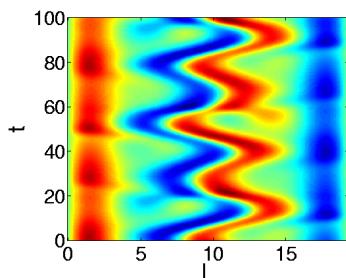
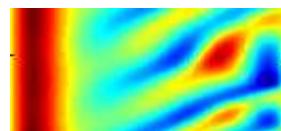
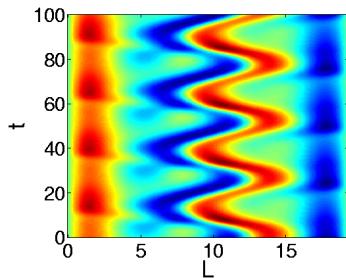
Turbulent dynamics around upper branch

[www.channelflow.org](http://www.channelflow.org) public domain software

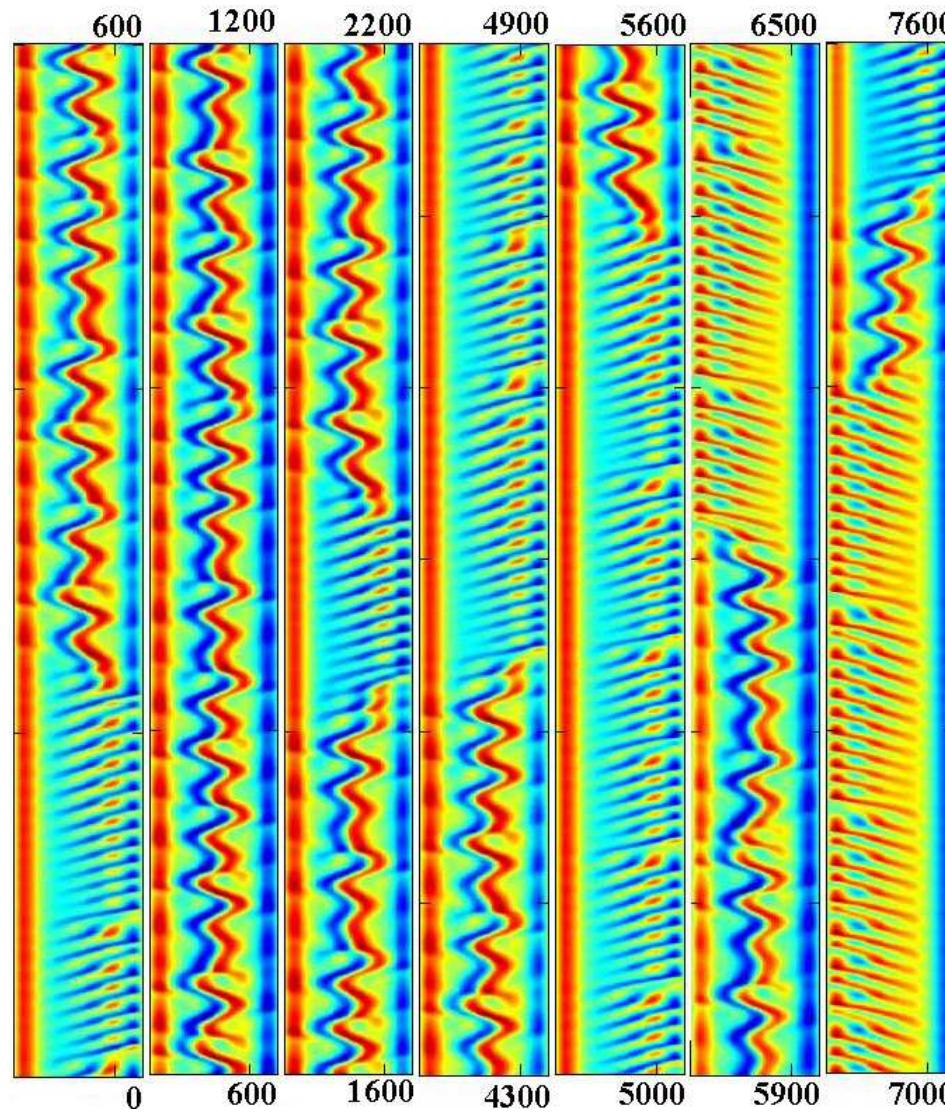
Future looks bright

# Kuramoto-Sivashinsky: Hopf's vision

A long time series:  
jumps between



→ etc.





## Moral of the story

If you raise a group of plumbers, you shouldn't be<sup>6</sup> upset if they can't do theoretical physics.

A retired Army two-star general [who requested anonymity]

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<sup>6</sup>Fred Kaplan, "Challenging the Generals", New York Times Sunday Magazine (August 26, 2007).