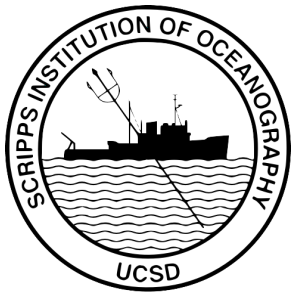
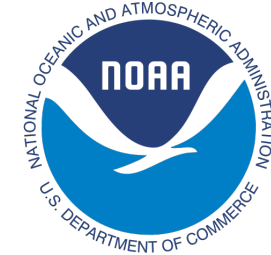


# Understanding coherent structure emergence in homogeneously forced turbulence by means of the statistical state dynamics

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in collaboration with:

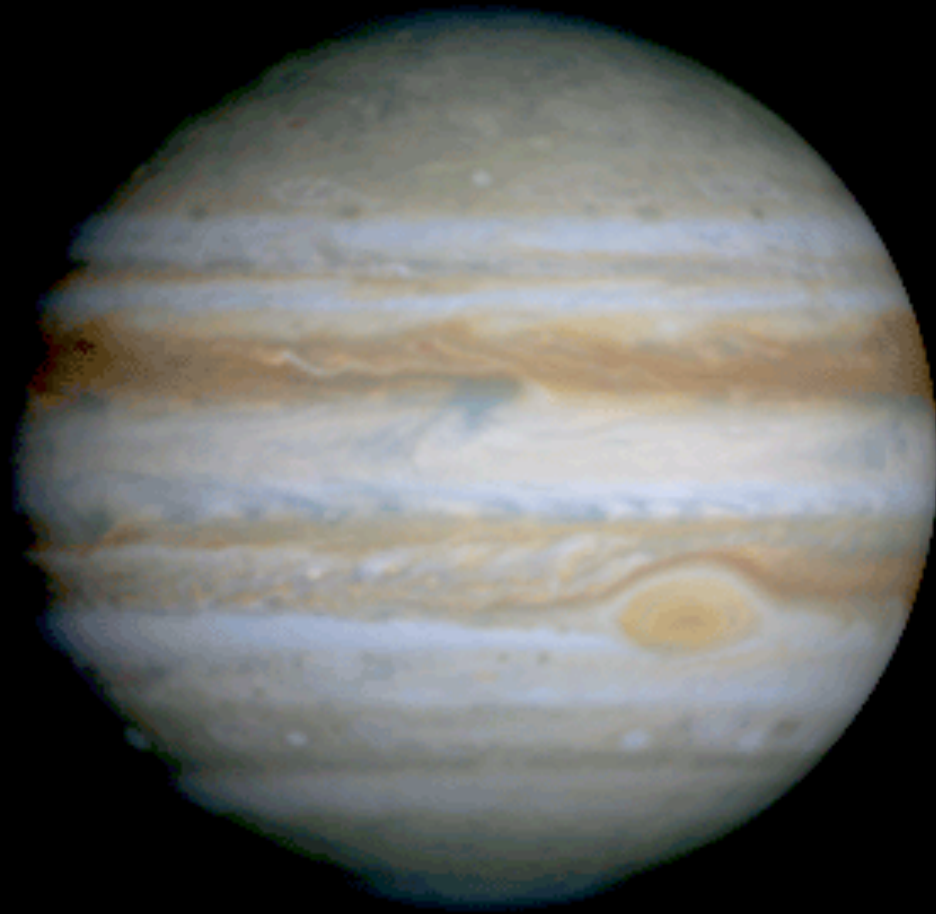
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Nikolaos Bakas (University of Ioannina, Greece)  
Marios-Andreas Nikolaidis (University of Athens, Greece)

KITP  
11 Jan. 2017

# Planetary turbulence

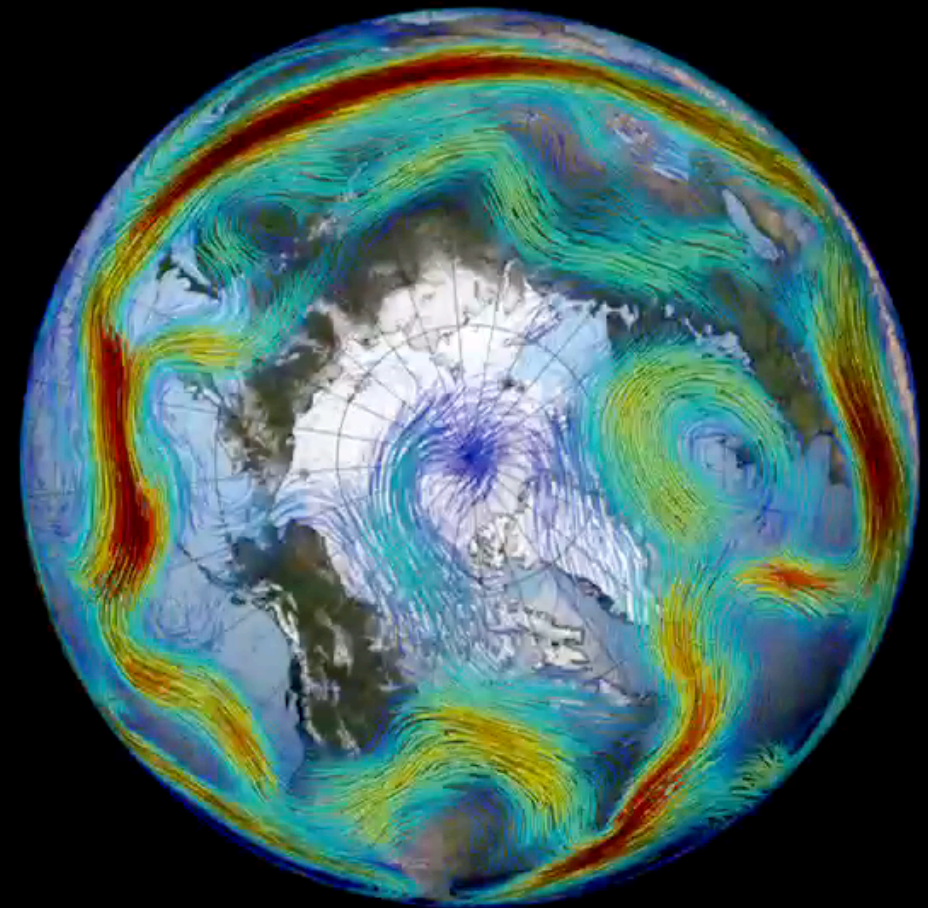
most of the energy of the flow is in large-scale coherent jets and vortices of specific form

not at the largest allowed scale (as inverse cascade might imply)  
arrest of the cascade by jets



banded Jovian jets

NASA/Cassini Jupiter Images



polar front jet

NASA/Goddard Space Flight Center

# Boundary layer turbulence

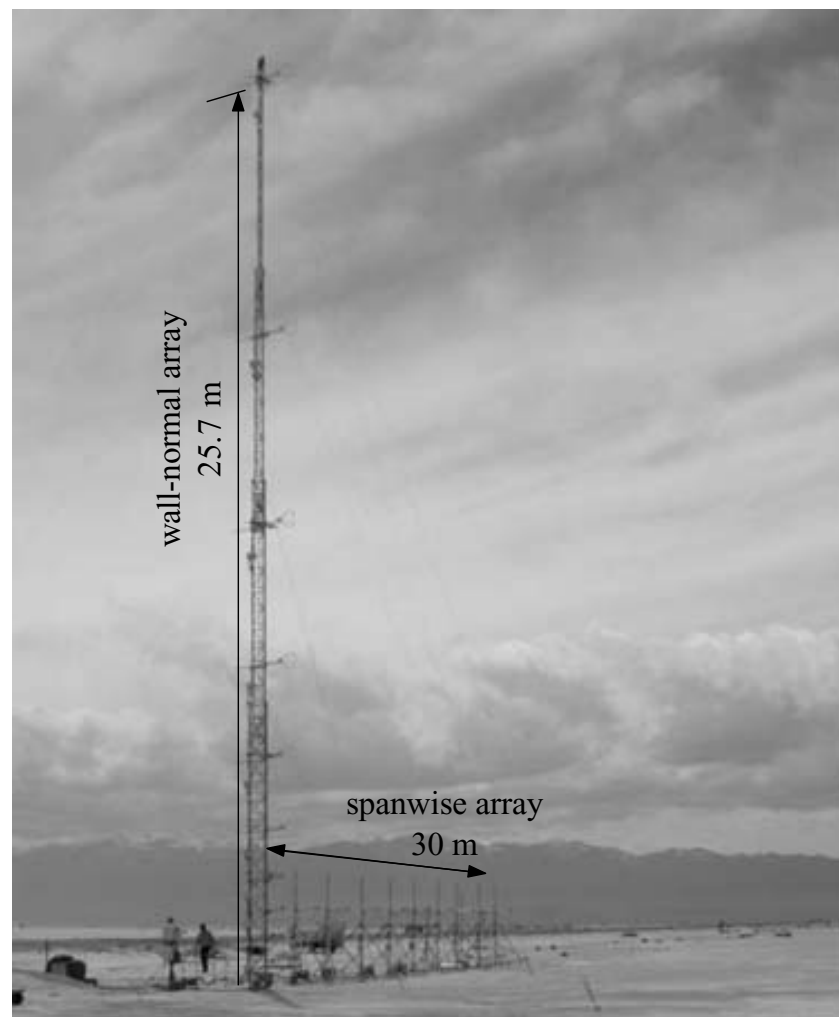
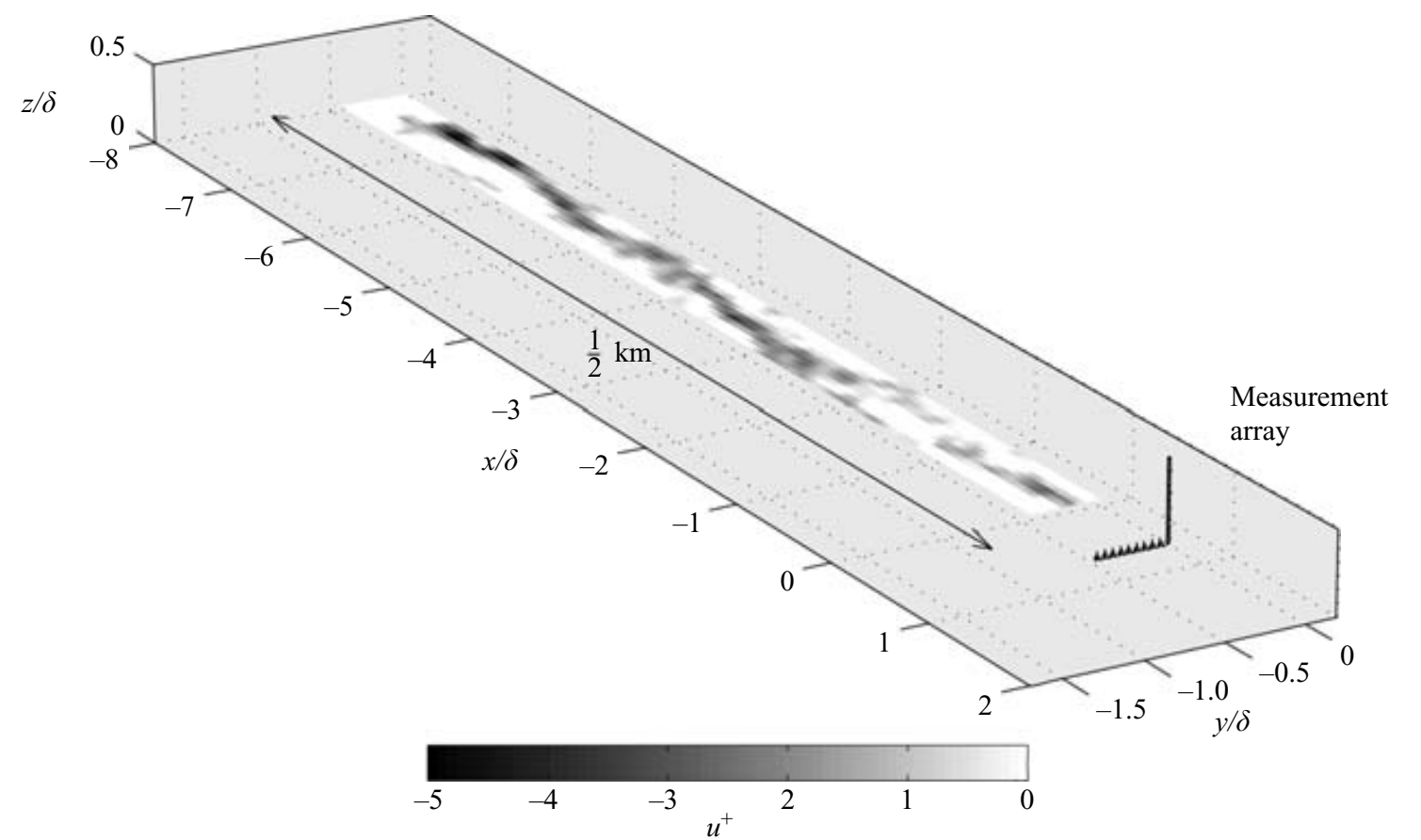
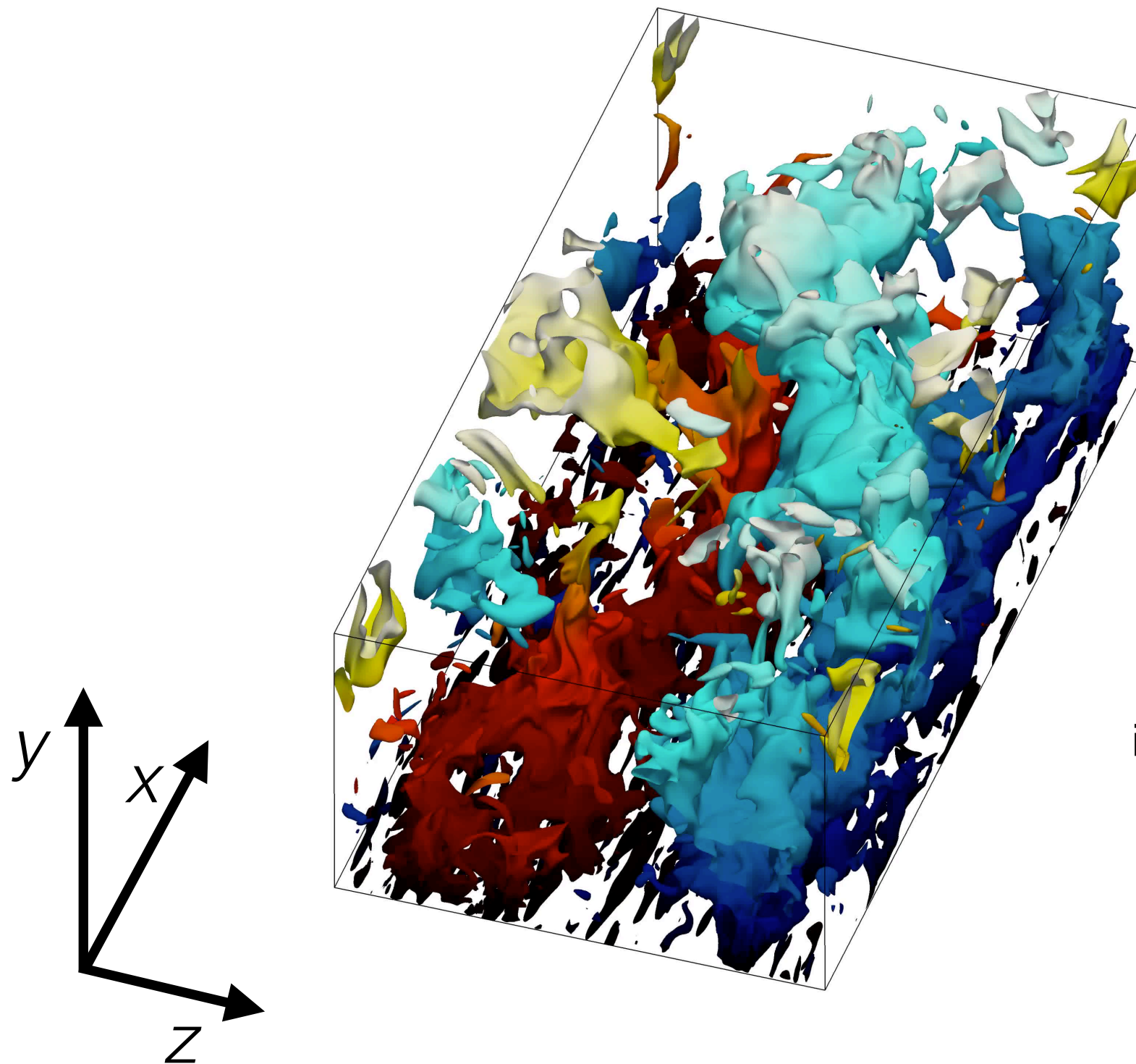


FIGURE 12. View of the measurement array installed at the SLTEST site.



# Wall-bounded turbulence



high and low speed  
streak isocontours  
in Poiseuille turbulence  
at  $Re_\tau = 950$

Credit: A Lozano-Durán



The problem to be addressed:

Understand how these *specific* structures arise  
and how are they maintained

# Claims

- I.** The underlying dynamics of structure formation lies in the interaction of turbulent eddies with mean flows
- II.** Often, structure formation has analytic expression *only* in the Statistical State Dynamics (SSD/DSS)  
(the dynamics that govern the statistics of the flow  
rather than the dynamics governing single flow realizations)
- III.** Because of **(I)** a second-order closure of the SSD is adequate

# Statistical State Dynamics (SSD)

- 1.** split the flow variables into:  $\langle \text{mean} \rangle + \text{eddy}'$

$$\mathbf{u}(\mathbf{x}, t) = \langle \mathbf{u}(\mathbf{x}, t) \rangle + \mathbf{u}'(\mathbf{x}, t)$$

- 2.** form the hierarchy of same-time statistical moments/cumulants

$$\underbrace{\langle \mathbf{u}(\mathbf{x}_a, t) \rangle}_{=C_a^{(1)}}, \quad \underbrace{\langle \mathbf{u}'(\mathbf{x}_a, t) \mathbf{u}'(\mathbf{x}_b, t) \rangle}_{=C_{ab}^{(2)}}, \quad \underbrace{\langle \mathbf{u}'(\mathbf{x}_a, t) \mathbf{u}'(\mathbf{x}_b, t) \mathbf{u}'(\mathbf{x}_c, t) \rangle}_{=C_{abc}^{(3)}}, \quad \dots$$

- 3.** find how each one of the moments/cumulants evolve

$$\partial_t C_a^{(1)} = \mathcal{F}_1 \left( C_a^{(1)}, C_{ab}^{(2)} \right)$$

$$\partial_t C_{ab}^{(2)} = \mathcal{F}_2 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)} \right)$$

$$\partial_t C_{abc}^{(3)} = \mathcal{F}_3 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)}, C_{abcd}^{(4)} \right), \text{ etc } \dots$$

# Statistical State Dynamics (SSD)

1. split the flow variables into:  $\langle \text{mean} \rangle + \text{eddy}'$

$$\mathbf{u}(\mathbf{x}, t) = \langle \mathbf{u}(\mathbf{x}, t) \rangle + \mathbf{u}'(\mathbf{x}, t)$$

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$$\cancel{\partial_t C_{abc}^{(3)} = \mathcal{F}_3 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)}, C_{abcd}^{(4)} \right)}, \quad \cancel{\text{etc} \dots}$$

4. **S3T/CE2**: closure at second-order



# Remarks on SSD — What is novel here?

$$\partial_t C_a^{(1)} = \mathcal{F}_1 \left( C_a^{(1)} , C_{ab}^{(2)} \right)$$

$$\partial_t C_{ab}^{(2)} = \mathcal{F}_2 \left( C_a^{(1)} , C_{ab}^{(2)} , C_{abc}^{(3)} \right)$$

$$\partial_t C_{abc}^{(3)} = \mathcal{F}_3 \left( C_a^{(1)} , C_{ab}^{(2)} , C_{abc}^{(3)} , C_{abcd}^{(4)} \right) , \text{ etc } \dots$$

# Remarks on SSD — What is novel here?

Usually (inspired by homogeneous isotropic turbulence) people took  $\langle \mathbf{u}(\mathbf{x}, t) \rangle = 0$

$$\begin{aligned}\partial_t C_a^{(1)} &= \mathcal{F}_1 \left( C_a^{(1)}, C_{ab}^{(2)} \right) \\ \partial_t C_{ab}^{(2)} &= \mathcal{F}_2 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)} \right) \\ \partial_t C_{abc}^{(3)} &= \mathcal{F}_3 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)}, C_{abcd}^{(4)} \right), \text{ etc ...}\end{aligned}$$

← but this is fundamental for  
structure formation (claim **(I)**)

# Remarks on SSD — What is novel here?

Usually (inspired by homogeneous isotropic turbulence) people took  $\langle \mathbf{u}(\mathbf{x}, t) \rangle = 0$

Main effort/interest was to obtain the equilibrium statistics:  $\partial_t = 0$

$$\begin{aligned} \partial_t C_a^{(1)} &= \mathcal{F}_1 \left( C_a^{(1)}, C_{ab}^{(2)} \right) && \longleftarrow \text{but this is fundamental for} \\ &&& \text{structure formation (claim (I))} \\ 0 &= \mathcal{F}_2 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)} \right) \\ 0 &= \mathcal{F}_3 \left( C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)}, C_{abcd}^{(4)} \right), \text{ etc ...} \end{aligned}$$

# Remarks on SSD — What is novel here?

$$\begin{aligned}\partial_t C_a^{(1)} &= \mathcal{F}_1 \left( C_a^{(1)} , C_{ab}^{(2)} \right) \\ \partial_t C_{ab}^{(2)} &= \mathcal{F}_2 \left( C_a^{(1)} , C_{ab}^{(2)} , C_{abc}^{(3)} \right) \\ \partial_t C_{abc}^{(3)} &= \mathcal{F}_3 \left( C_a^{(1)} , C_{ab}^{(2)} , C_{abc}^{(3)} , C_{abcd}^{(4)} \right) , \text{ etc } \dots\end{aligned}$$

By studying the *dynamics* of the statistics new phenomena arise that are either not present or are obscured in single flow realizations

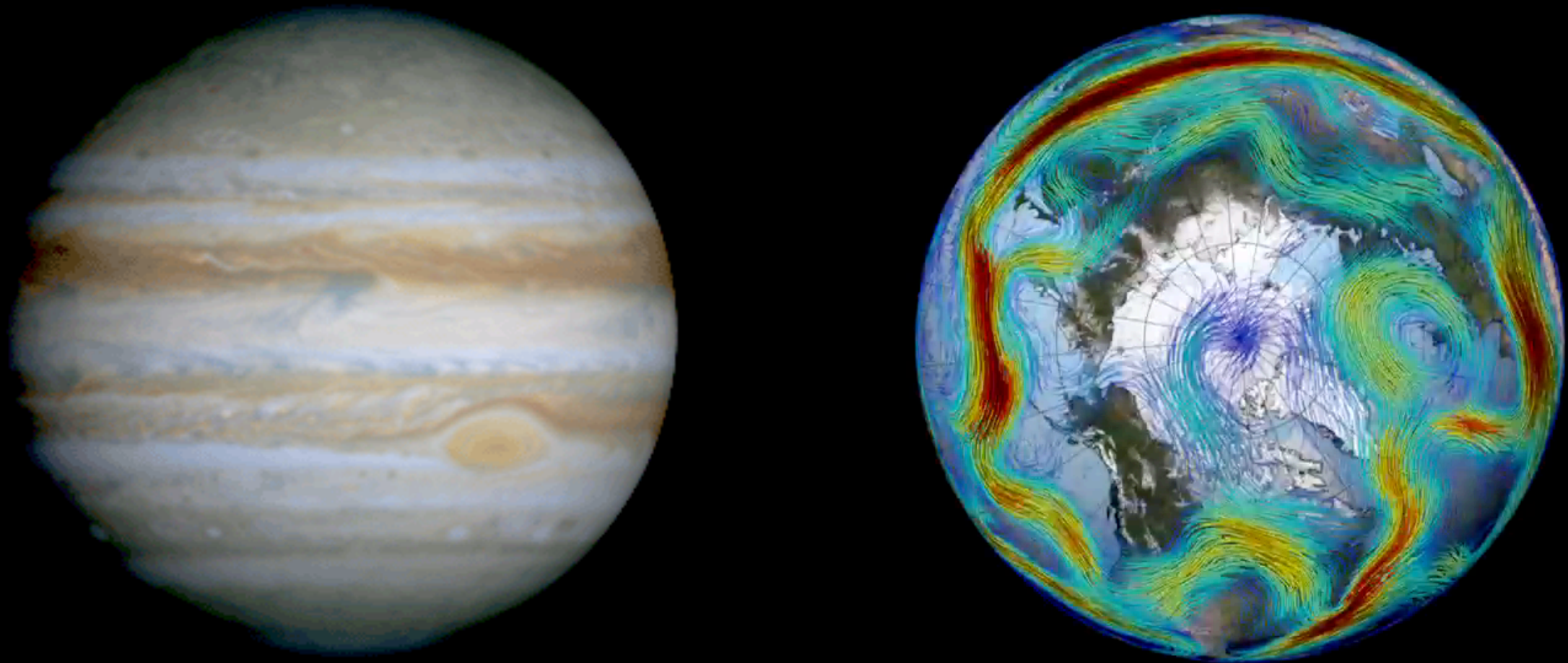


I will show that within the framework of SSD we understand:

**A.** Jet/large-scale wave emerge in planetary turbulence  
as an instability of the SSD  
(this shows that SSD capture the mechanism)

**B.** Roll/streak structures  
in pre-transitional free-stream Couette turbulence  
emerge as an instability of the SSD

# A. Jet/Large-scale wave emergence in planetary turbulence



Farrell & Ioannou 2003, 2007; Srinivasan & Young 2012; Tobias & Marston 2013; NCC, Farrell & Ioannou 2014, 2016  
Bakas, NCC & Ioannou 2015, Bakas & Ioannou 2013, 2014; Parker & Krommes 2013, 2014, Marston, Tobias, Chini, 2016;  
Ait-Chaalal, Schneider, Meyer, Marston 2016

# barotropic vorticity equation on a $\beta$ -plane

$$\partial_t \zeta + \mathbf{u} \cdot \nabla (\zeta + \beta y) = -r\zeta + \sqrt{\varepsilon} \xi$$

$$\nabla \cdot \mathbf{u} = 0$$

$$\mathbf{u} = (u, v) = (-\partial_y \psi, \partial_x \psi)$$

$$\zeta = (\nabla \times \mathbf{u}) \cdot \hat{\mathbf{z}} = \Delta \psi$$

linear  
dissipation  
at rate  $r$

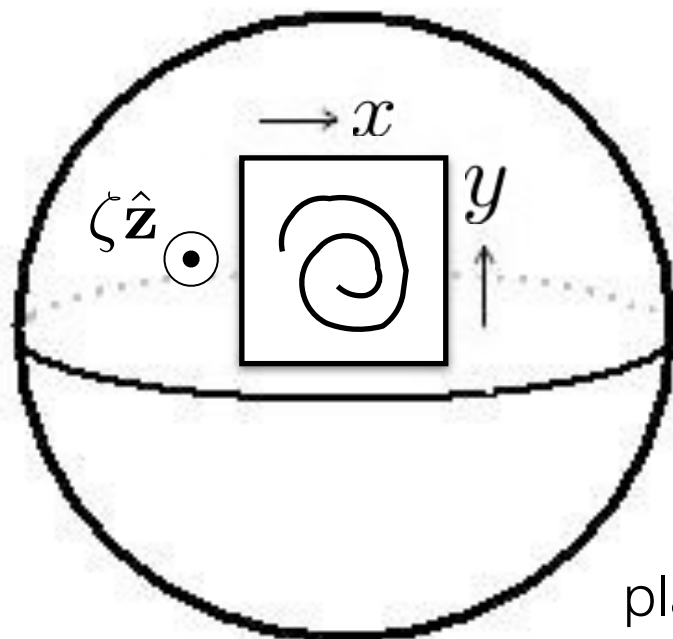
stochastic  
forcing

zero mean  
white in time  
&

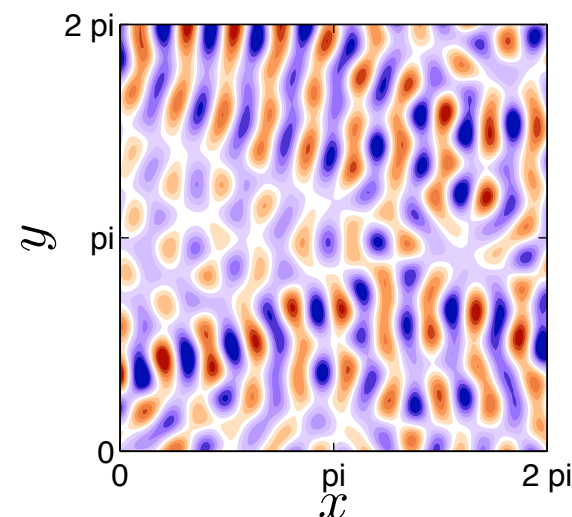
statistically homogeneous

$$\langle \xi(\mathbf{x}_a, t_a) \xi(\mathbf{x}_b, t_b) \rangle = Q(\mathbf{x}_a - \mathbf{x}_b) \delta(t_a - t_b)$$

$$\xi(\mathbf{x}, t)$$



$\beta$ : gradient of  
planetary vorticity



anisotropic Earth-like forcing  
modeling energy injected to  
the barotropic mode  
by baroclinic instability

barotropic vorticity equation on a  $\beta$ -plane

$$\partial_t \zeta + \mathbf{u} \cdot \nabla (\zeta + \beta y) = -r\zeta + \sqrt{\varepsilon} \xi$$

$$\nabla \cdot \mathbf{u} = 0$$

$$\mathbf{u} = (u, v) = (-\partial_y \psi, \partial_x \psi)$$

$$\zeta = (\nabla \times \mathbf{u}) \cdot \hat{\mathbf{z}} = \Delta \psi$$

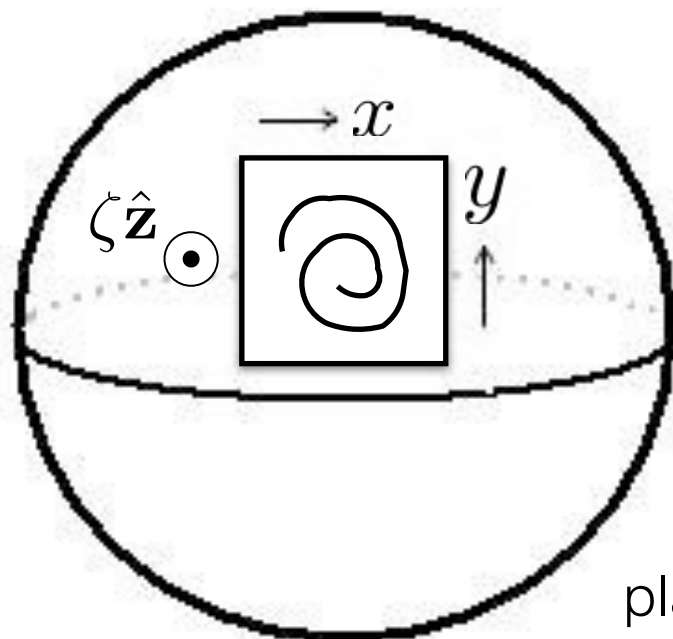
linear  
dissipation  
at rate  $r$

stochastic  
forcing

zero mean  
white in time  
&

statistically homogeneous

$$\langle \xi(\mathbf{x}_a, t_a) \xi(\mathbf{x}_b, t_b) \rangle = Q(\mathbf{x}_a - \mathbf{x}_b) \delta(t_a - t_b)$$



$\beta$ : gradient of  
planetary vorticity

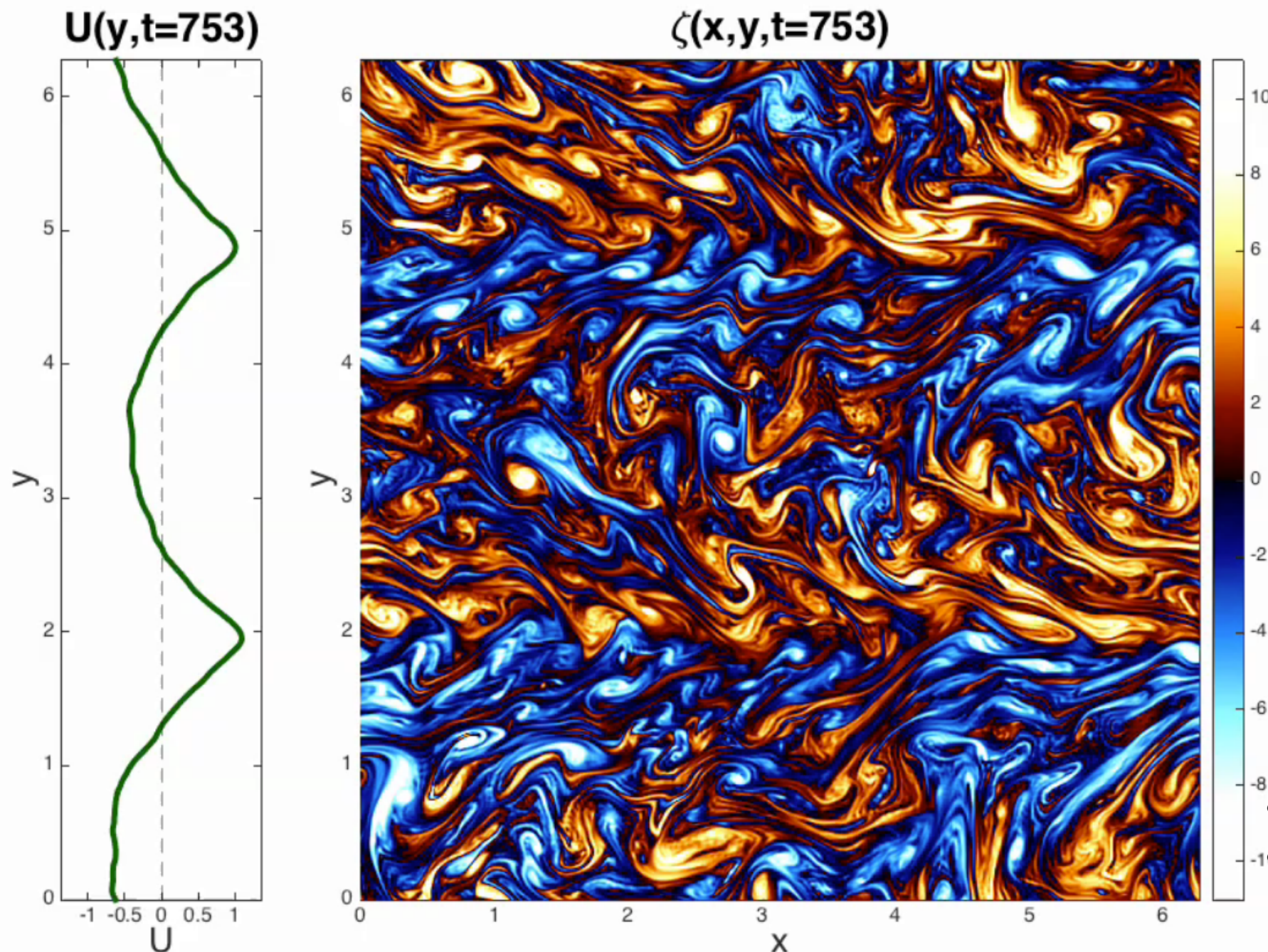
two non-dimensional  
parameters

$$\varepsilon k_f^2 / r^3$$

$$\beta / (k_f r)$$



# barotropic $\beta$ -plane turbulence exhibits large-scale structure formation



$$\varepsilon k_f^2 / r^3 = 10^6$$
$$\beta / (k_f r) = 67$$

statistically  
homogeneous forcing  
(no inhomogeneity  
is imposed by the forcing)

any random flow  
inhomogeneities organize the  
turbulence in a manner so that  
they are reinforced

we observe:

- jet emerge
- jets appear to change much slower compared to the eddies
- jet have a particular structure



various  $\beta$ -plane turbulence flows  
at statistically steady state:

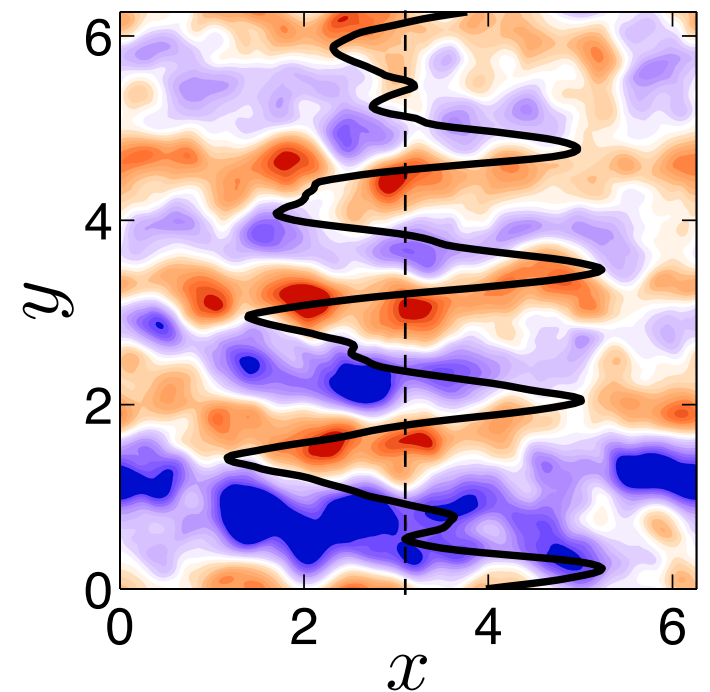
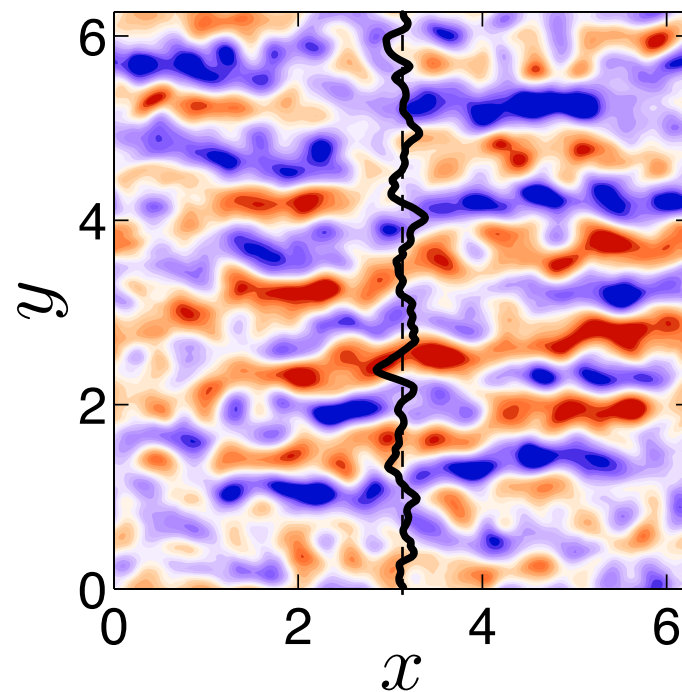
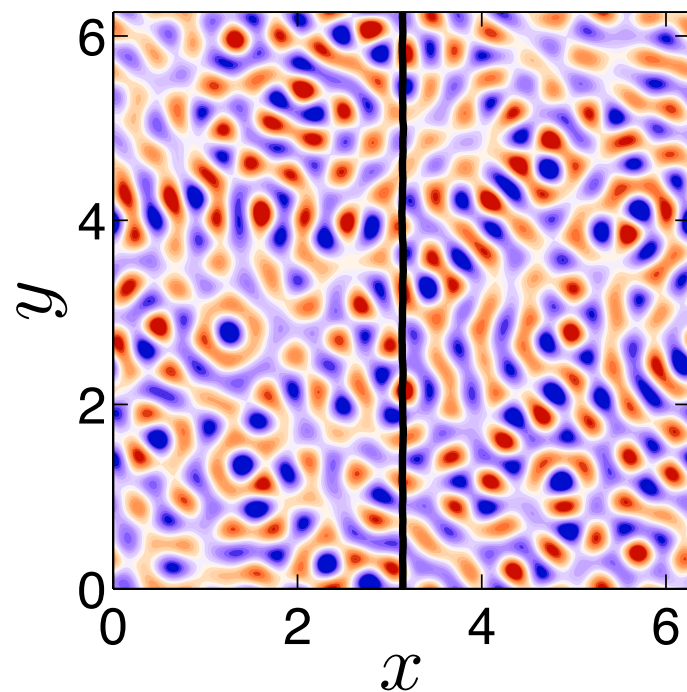
homogeneous — traveling waves — zonal jets

$$\beta/(k_f r) = 67$$

$$\varepsilon k_f^2 / r^3 = 10^2$$

$$5 \times 10^3$$

$$5 \times 10^4$$



this suggests that there is some kind of transition as  $\varepsilon$  is increased

[ snapshots of the streamfunction  $\psi(\mathbf{x}, t)$  with instantaneous zonal mean zonal flow  $U(y, t)$  ]

# S3T closure of SSD

take the  $\langle \text{mean} \rangle$  as a zonal mean  
under the ergodic assumption that

$\langle \text{mean} \rangle$  = ensemble average over forcing realizations

$$Z(\mathbf{x}, t) = \langle \zeta(\mathbf{x}, t) \rangle \quad ,$$

1st cumulant

$$C_{ab}^{(2)} = \langle \zeta'(\mathbf{x}_a, t) \zeta'(\mathbf{x}_b, t) \rangle$$

2nd cumulant

# S3T closure of SSD

$$\begin{aligned}\partial_t Z + \mathbf{U} \cdot \nabla (Z + \beta y) &= \mathcal{R}(C_{ab}^{(2)}) - rZ \\ \partial_t C_{ab}^{(2)} &= [\mathcal{A}(\mathbf{U})_a + \mathcal{A}(\mathbf{U})_b] C_{ab}^{(2)} + \varepsilon Q_{ab}\end{aligned}$$

with

$$\mathbf{U} \stackrel{\text{def}}{=} (-\partial_y, \partial_x) \Delta^{-1} Z$$

$$C_{ab}^{(2)} \stackrel{\text{def}}{=} \langle \zeta'(\mathbf{x}_a, t) \zeta'(\mathbf{x}_b, t) \rangle$$

$$Q_{ab} \stackrel{\text{def}}{=} Q(\mathbf{x}_a - \mathbf{x}_b) \longrightarrow \text{the spatial covariance of the statistically homogeneous stochastic forcing}$$

$$\mathcal{R}(C_{ab}^{(2)}) \stackrel{\text{def}}{=} -\langle \mathbf{u}' \cdot \nabla \zeta' \rangle = \nabla \cdot \left[ \frac{\hat{\mathbf{z}}}{2} \times (\nabla_a \Delta_a^{-1} + \nabla_b \Delta_b^{-1}) C_{ab}^{(2)} \right]_{a=b}$$

(the Reynolds stresses are given as a linear function of  $C$ )



# S3T closure of SSD

$$\begin{aligned}\partial_t Z + \mathbf{U} \cdot \nabla (Z + \beta y) &= \mathcal{R}(C_{ab}^{(2)}) - rZ \\ \partial_t C_{ab}^{(2)} &= [\mathcal{A}(\mathbf{U})_a + \mathcal{A}(\mathbf{U})_b] C_{ab}^{(2)} + \varepsilon Q_{ab}\end{aligned}$$

neglect of third cumulant  
is *equivalent* with  
neglect of the eddy—eddy term in eddy equation in the EOM  
( $\longrightarrow$  PainInNeck-term Tobias was talking about on Monday)

Note: The dynamics of the 1st & 2nd cumulants is necessarily quasi-linear (Herring 1963)

# S3T closure of SSD

$$\begin{aligned}\partial_t Z + \mathbf{U} \cdot \nabla (Z + \beta y) &= \mathcal{R}(C_{ab}^{(2)}) - rZ \\ \partial_t C_{ab}^{(2)} &= [\mathcal{A}(\mathbf{U})_a + \mathcal{A}(\mathbf{U})_b] C_{ab}^{(2)} + \varepsilon Q_{ab}\end{aligned}$$

The S3T system

- nonlinear
- autonomous, deterministic (central limit theorem)
- admits fixed point solutions  $(\mathbf{U}^e(\mathbf{x}), C^e(\mathbf{x}_a, \mathbf{x}_b))$
- associated perturbation equations used to determine stability of these fixed points

# S3T equilibria for homogeneous forcing

$$\mathbf{U}^e = 0 \quad , \quad C^e(\mathbf{x}_a - \mathbf{x}_b) = \frac{\varepsilon Q}{2r} \quad \text{(for any } \varepsilon, \beta \text{ and homogeneous } Q)$$

zero mean flow + non-zero second-order eddy statistics

$$\mathbf{U}^e(\mathbf{x}) = \left( U^e(y), 0 \right) \quad , \quad C^e(x_a - x_b, y_a, y_b)$$

zonal jet mean flow + non-zero zonally homogeneous 2nd-order eddy statistics

# S3T equilibria for homogeneous forcing

$$\mathbf{U}^e = 0 \quad , \quad C^e(\mathbf{x}_a - \mathbf{x}_b) = \frac{\varepsilon Q}{2r} \quad \text{(for any } \varepsilon, \beta \text{ and homogeneous } Q)$$

zero mean flow + non-zero second-order eddy statistics

$$\mathbf{U}^e(\mathbf{x}) = \left( U^e(y), 0 \right) \quad , \quad C^e(x_a - x_b, y_a, y_b)$$

zonal jet mean flow + non-zero zonally homogeneous 2nd-order eddy statistics

Perturbations about these equilibria are governed by:

hydrodynamic  
stability

$$\partial_t \delta Z = \mathcal{A}(\mathbf{U}^e) \delta Z + \mathcal{R}(\delta C)$$

we linearized about  
a turbulent state!

$$\partial_t \delta C_{ab} = [\mathcal{A}_a(\mathbf{U}^e) + \mathcal{A}_b(\mathbf{U}^e)] \delta C_{ab} + (\delta \mathcal{A}_a + \delta \mathcal{A}_b) C_{ab}^e$$

$$\delta \mathcal{A} \stackrel{\text{def}}{=} \mathcal{A}(\mathbf{U}^e + \delta \mathbf{U}) - \mathcal{A}(\mathbf{U}^e)$$

eigenanalysis of this system determines the stability of  $\left( \mathbf{U}^e(\mathbf{x}), C^e(\mathbf{x}_a, \mathbf{x}_b) \right)$

Consider the homogeneous turbulent equilibrium:

$$\mathbf{U}^e = 0 \quad , \quad C^e(\mathbf{x}_a - \mathbf{x}_b) = \frac{\varepsilon Q}{2r} \quad \text{(for any } \varepsilon, \beta \text{ and homogeneous } Q)$$

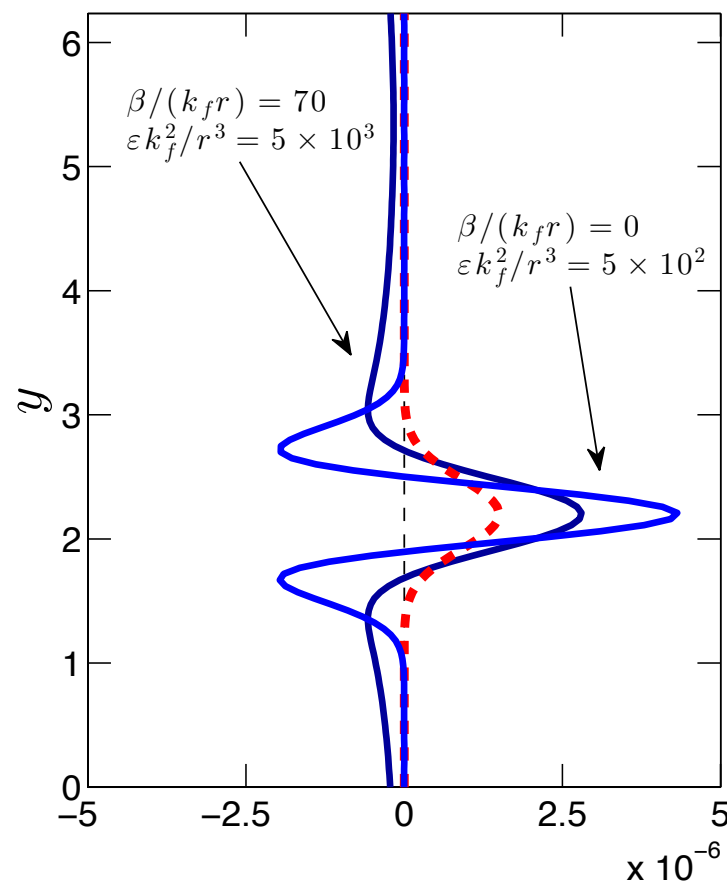
zero mean flow + non-zero second-order eddy statistics

How does the state with *no mean flow* becomes unstable?

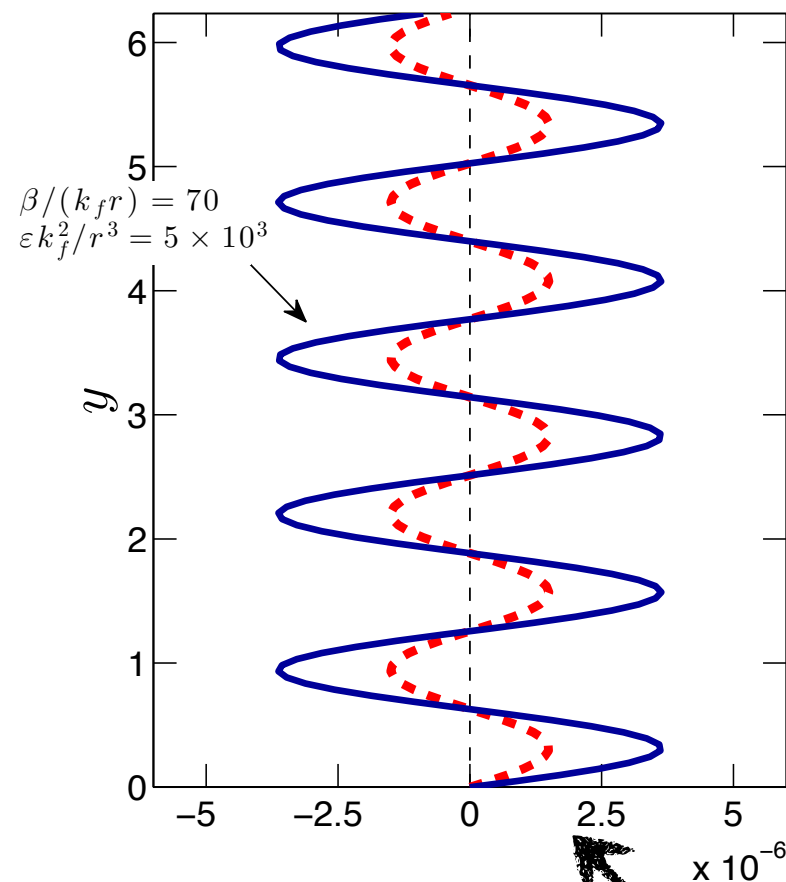
# proof of concept

An infinitesimal mean flow  $\delta U$  distorts the turbulence in a manner so as to produce Reynolds stresses  $\mathcal{R}(\delta C)$  that reinforce the  $\delta U$  itself

$$\partial_t \delta Z = \mathcal{A} \begin{pmatrix} 0 \end{pmatrix} \delta Z + \mathcal{R}(\delta C)$$



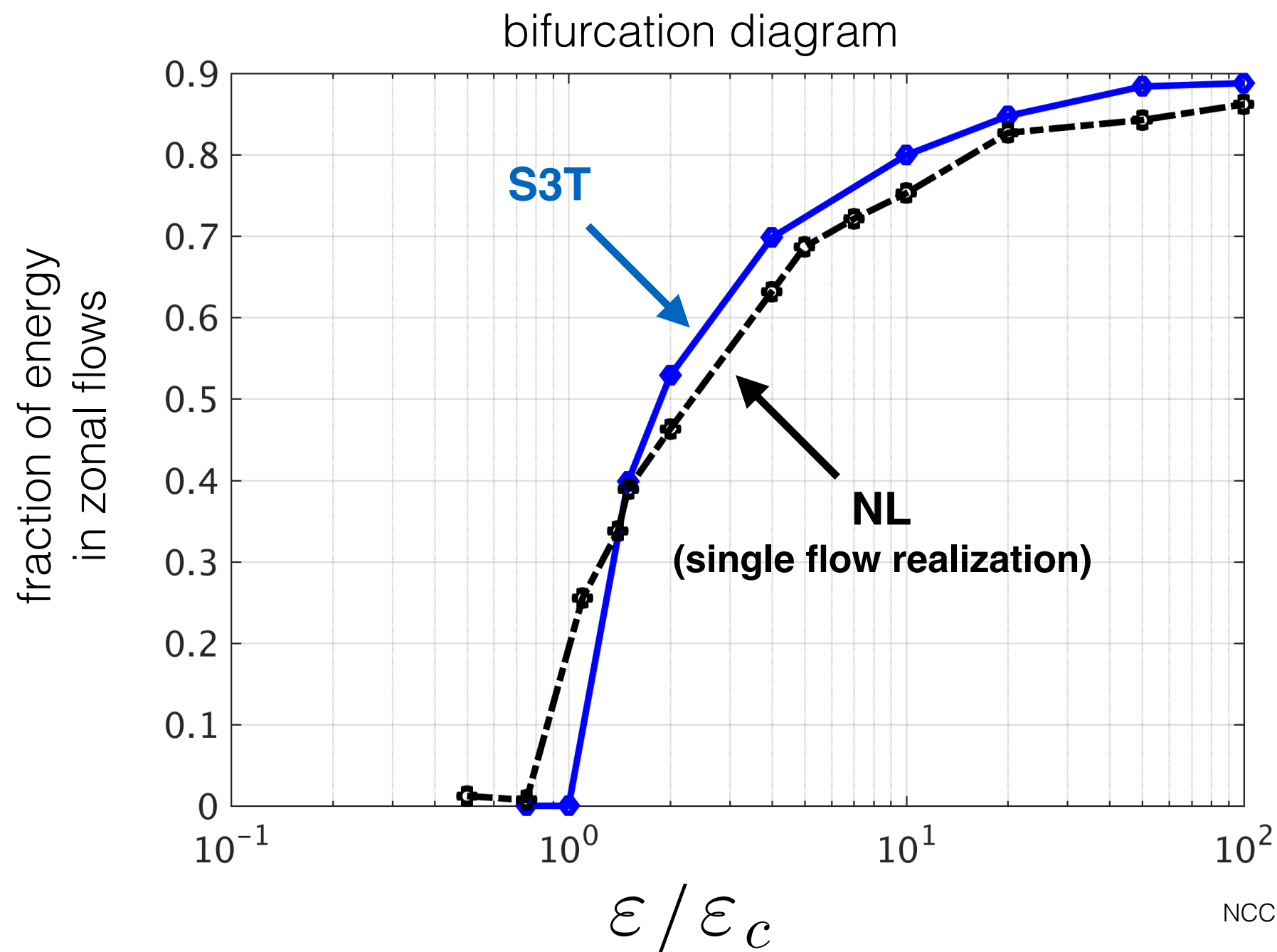
(---)  $\delta U$  , (—)  $\mathcal{R}(\delta C)$



Farrell & Ioannou 2007  
 Srinivasan & Young 2012  
 NCC, Farrell & Ioannou 2014  
 Bakas, NCC & Ioannou 2015

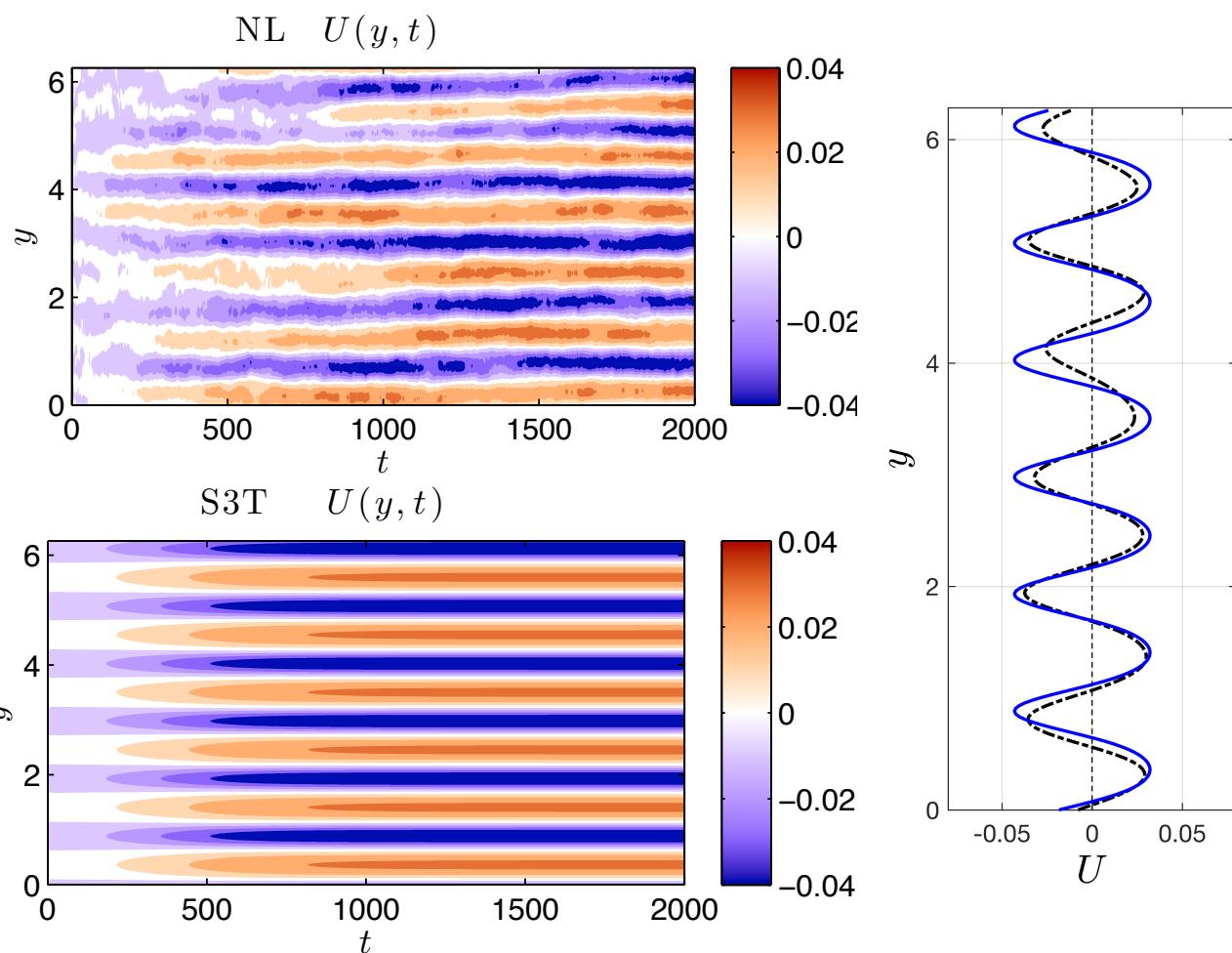
S3T  
 eigenfunction

# Verification of S3T predictions for the jet formation bifurcation

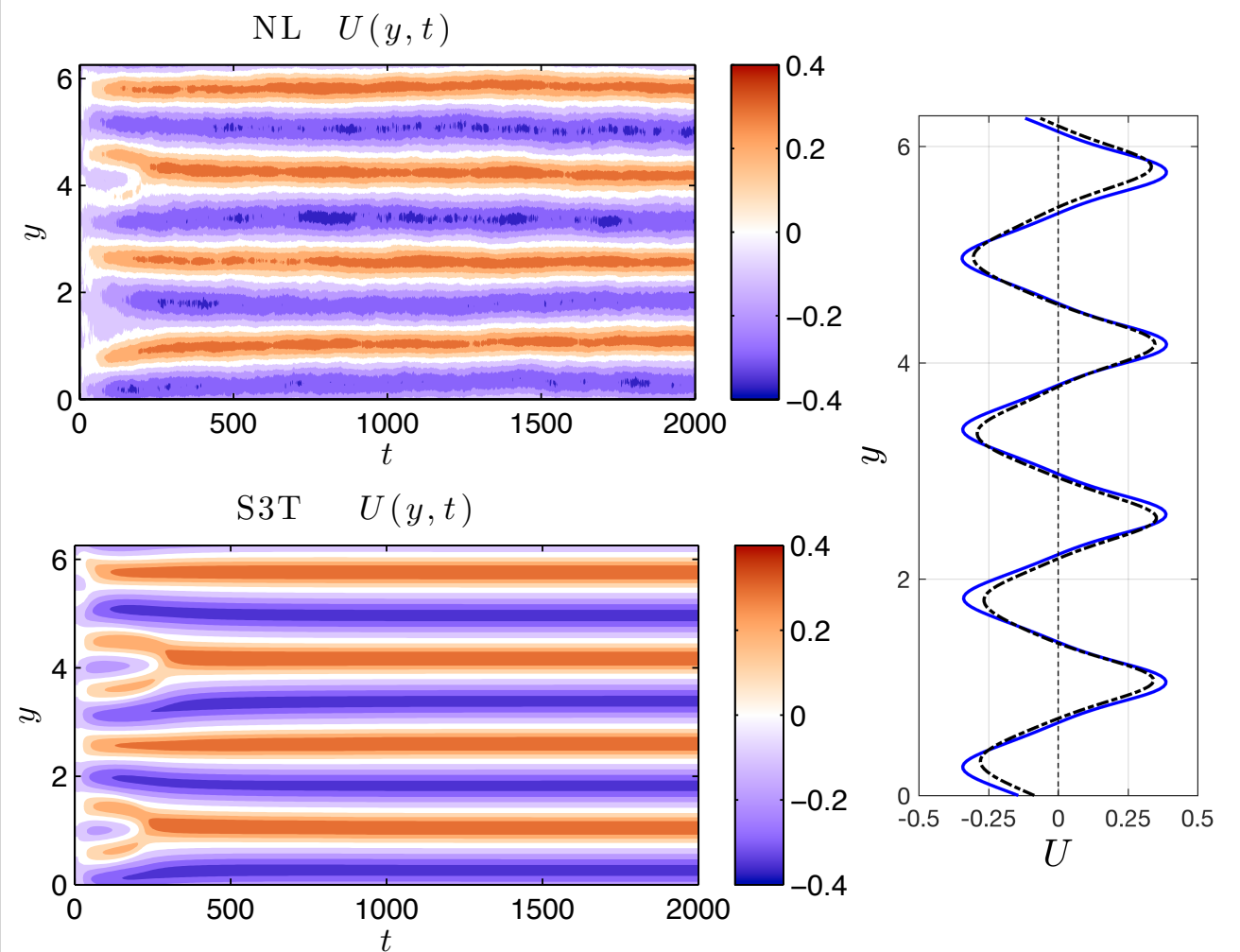


# Verification of the S3T predictions for the structure of the finite amplitude jet equilibria

$$\varepsilon/\varepsilon_c = 1.5$$



$$\varepsilon/\varepsilon_c = 20$$



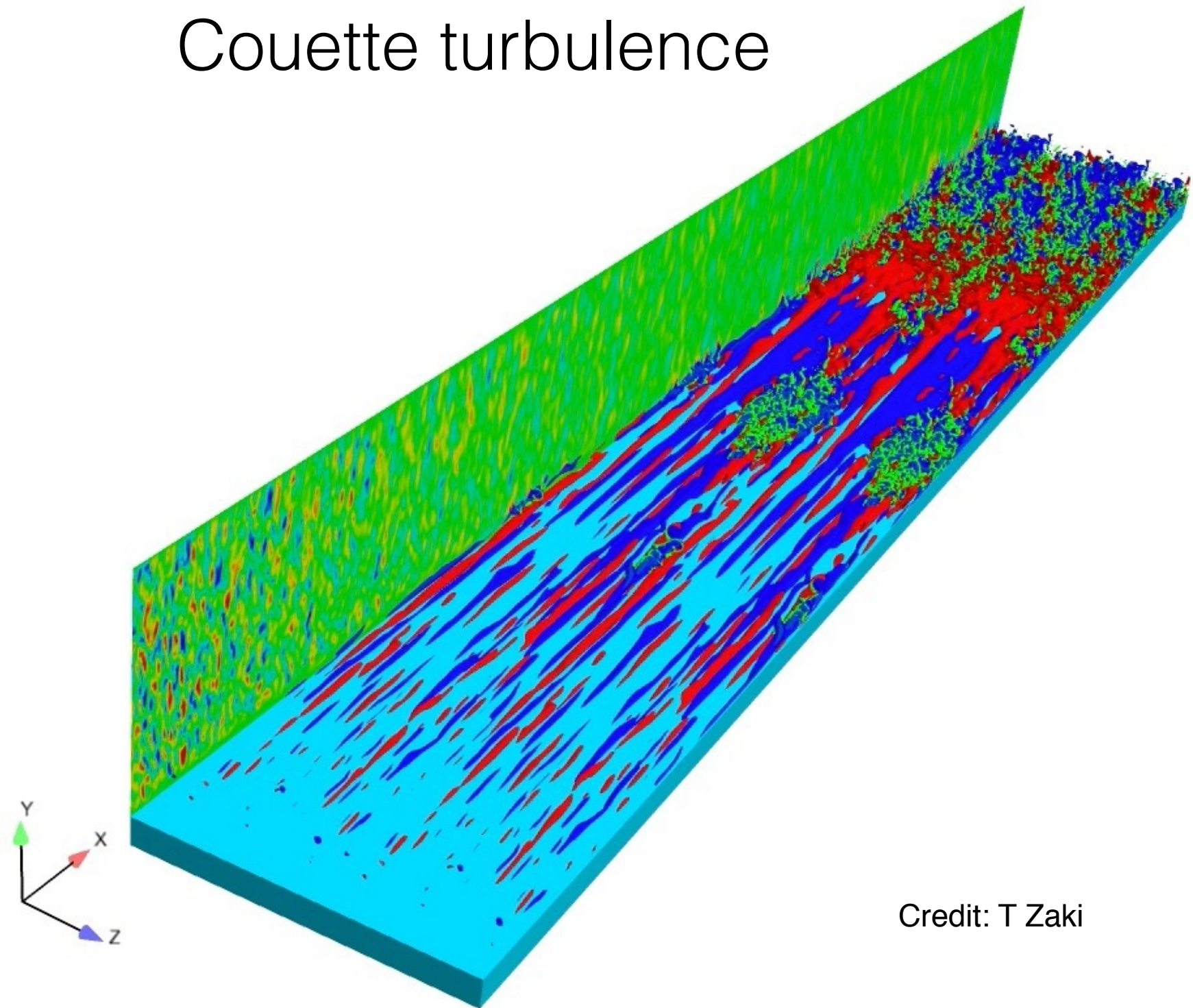
NCC, Farrell & Ioannou 2014

S3T instabilities grow and reach finite amplitude to produce new inhomogeneous S3T equilibria



**B.**

# Roll/streak formation in pre-transitional free-stream Couette turbulence



Credit: T Zaki

# roll/streak formation in free-stream Couette turbulence

flow =  $\begin{matrix} \text{streamwise} \\ \text{mean} \end{matrix}$  + perturbations

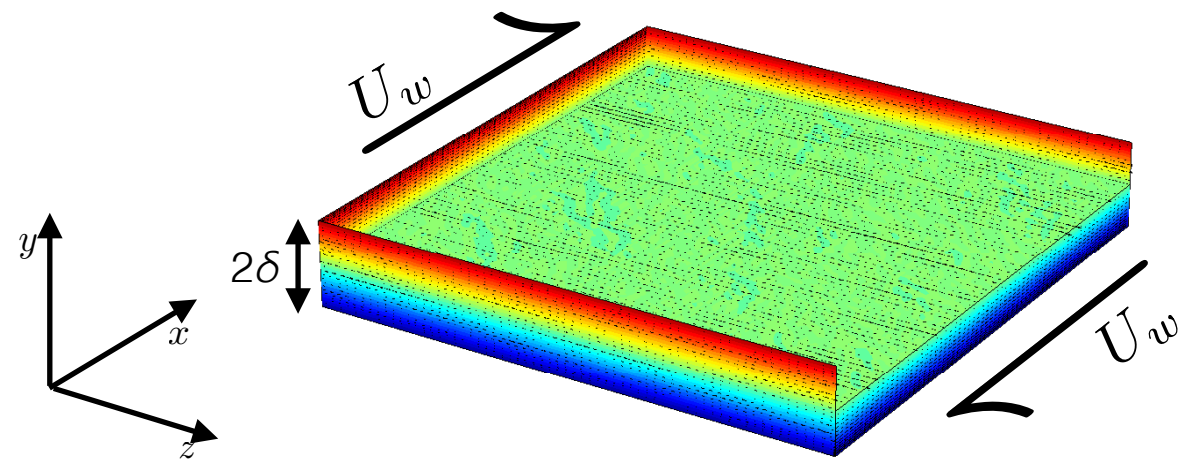
$$\mathbf{u} = \mathbf{U} + \mathbf{u}'$$

$$\partial_t \mathbf{U} + \mathbf{U} \cdot \nabla \mathbf{U} + \nabla P - \frac{1}{Re} \Delta \mathbf{U} = -\langle \mathbf{u}' \cdot \nabla \mathbf{u}' \rangle$$

$$\partial_t \mathbf{u}' + \mathbf{U} \cdot \nabla \mathbf{u}' + \mathbf{u}' \cdot \nabla \mathbf{U} + \nabla p' - \frac{1}{Re} \Delta \mathbf{u}' = -(\mathbf{u}' \cdot \nabla \mathbf{u}' - \langle \mathbf{u}' \cdot \nabla \mathbf{u}' \rangle) + \sqrt{\varepsilon} \boldsymbol{\xi}$$

$$\nabla \cdot \mathbf{U} = \nabla \cdot \mathbf{u}' = \nabla \cdot \boldsymbol{\xi} = 0$$

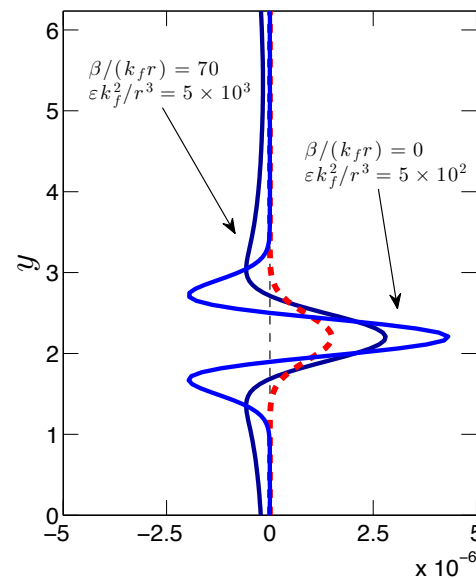
$$Re = \frac{U_w \delta}{\nu}$$



Credit: V Thomas

# proof of concept

## 2D problem

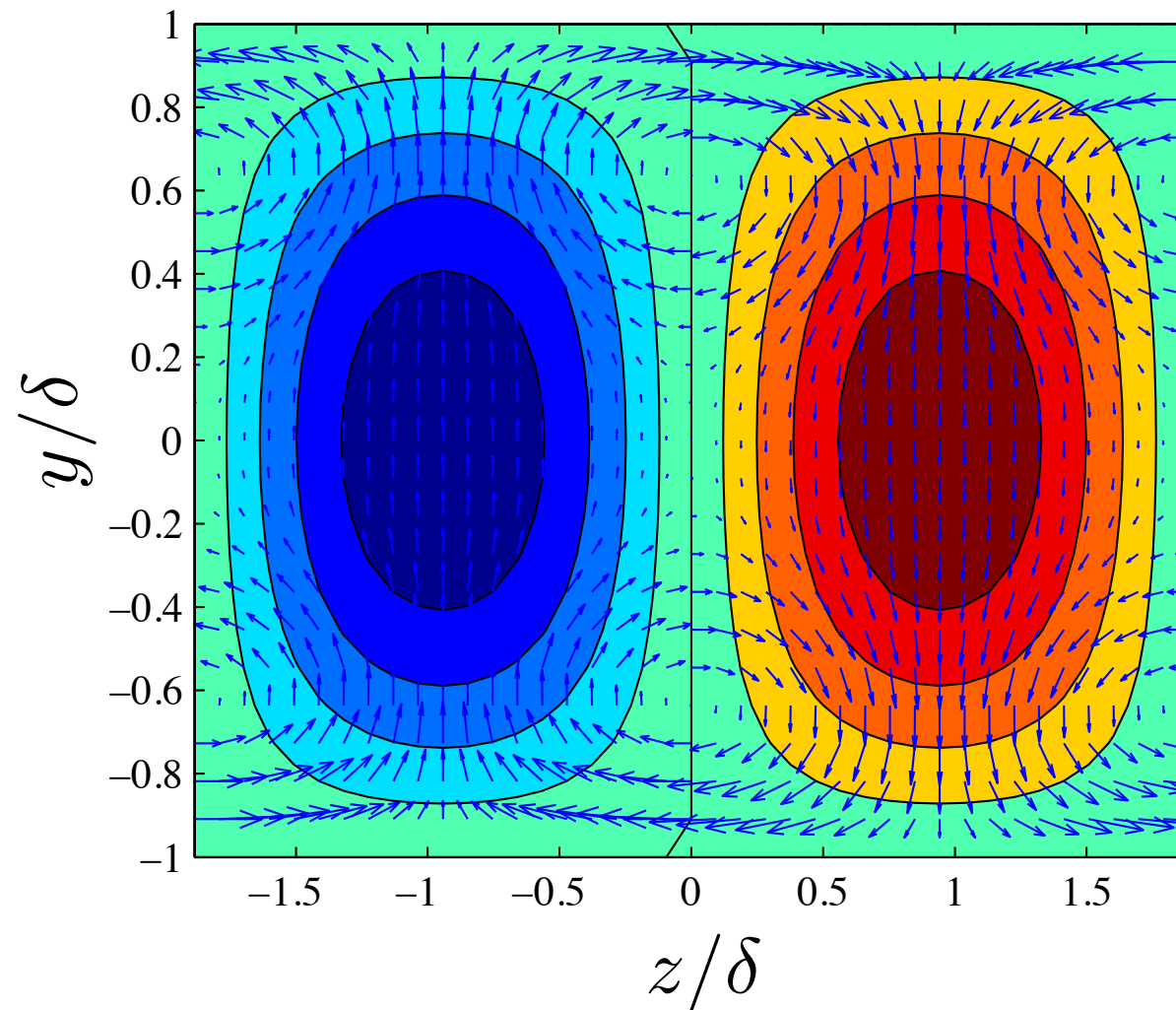


(-- )  $\delta U$  , (—)  $\mathcal{R}(\delta C)$

Analogously, in the 3D problem  
infinitesimal mean flows organize the turbulent Reynolds stresses  
so as to reinforce the very same mean flow

# proof of concept

1. Perturb a shear flow by an infinitesimal streak in the presence of turbulence
2. Calculate the response of the turbulence and the Reynolds stresses the are produce.



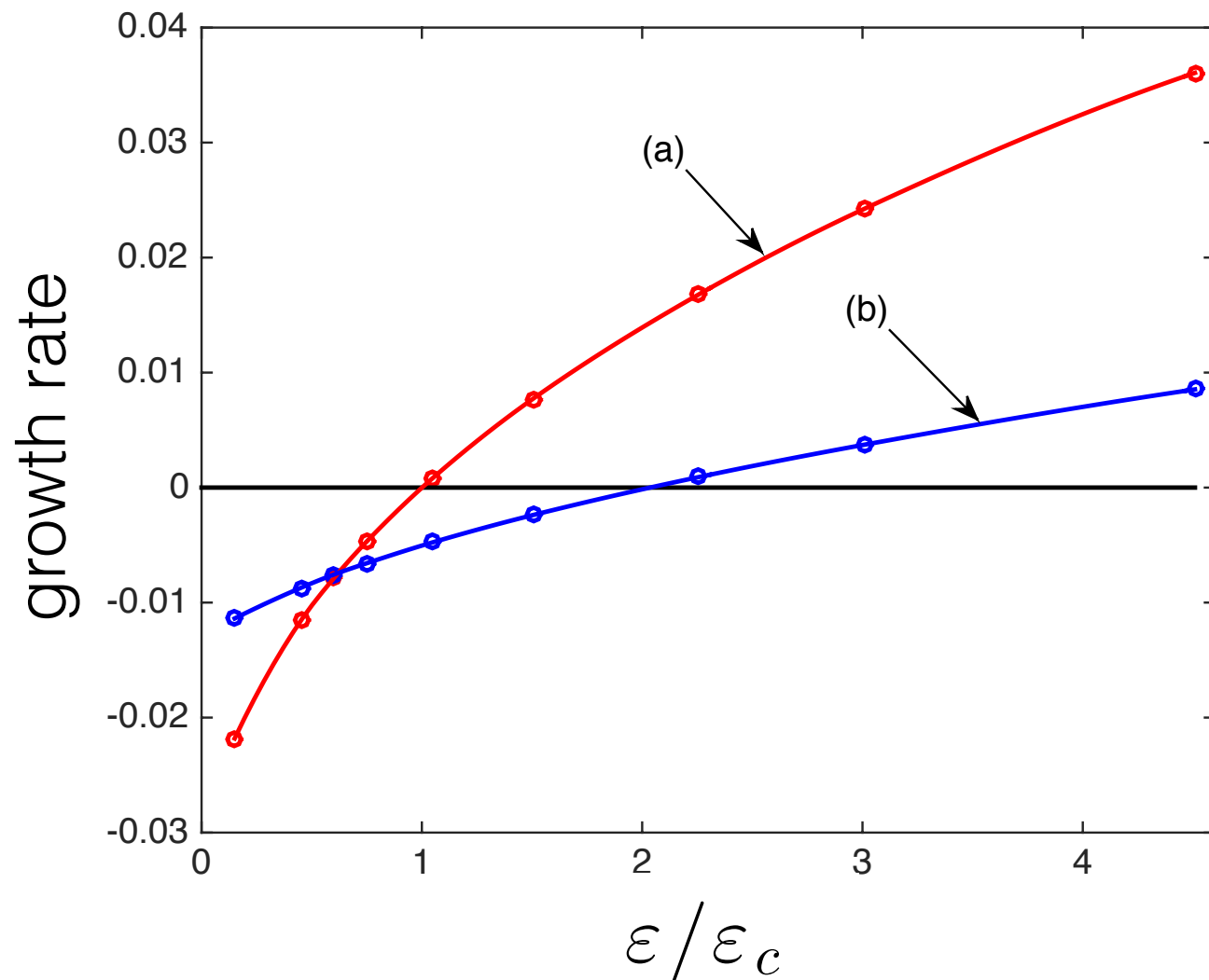
Farrell & Ioannou 2012

minimal channel  
 $Re=400$

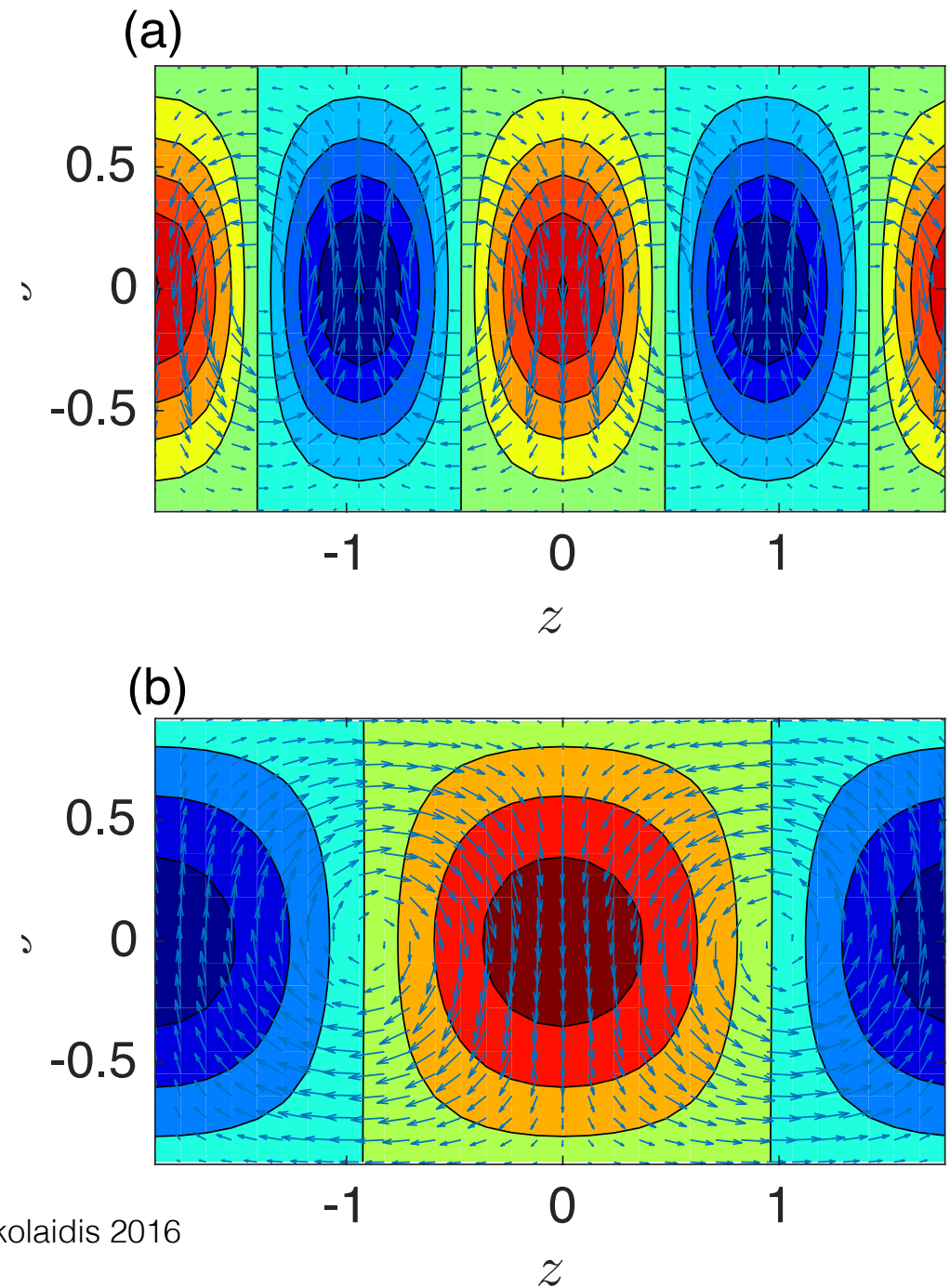
it turns out that the stresses force a roll  $(V, W)$   
*exactly* such as to amplify the streak

**Interpretation:** turbulent Reynolds stresses are organized by the streak to force a roll circulation configured to amplify the streak

# eigenvalues/eigenmodes of the least stable S3T roll/streak modes



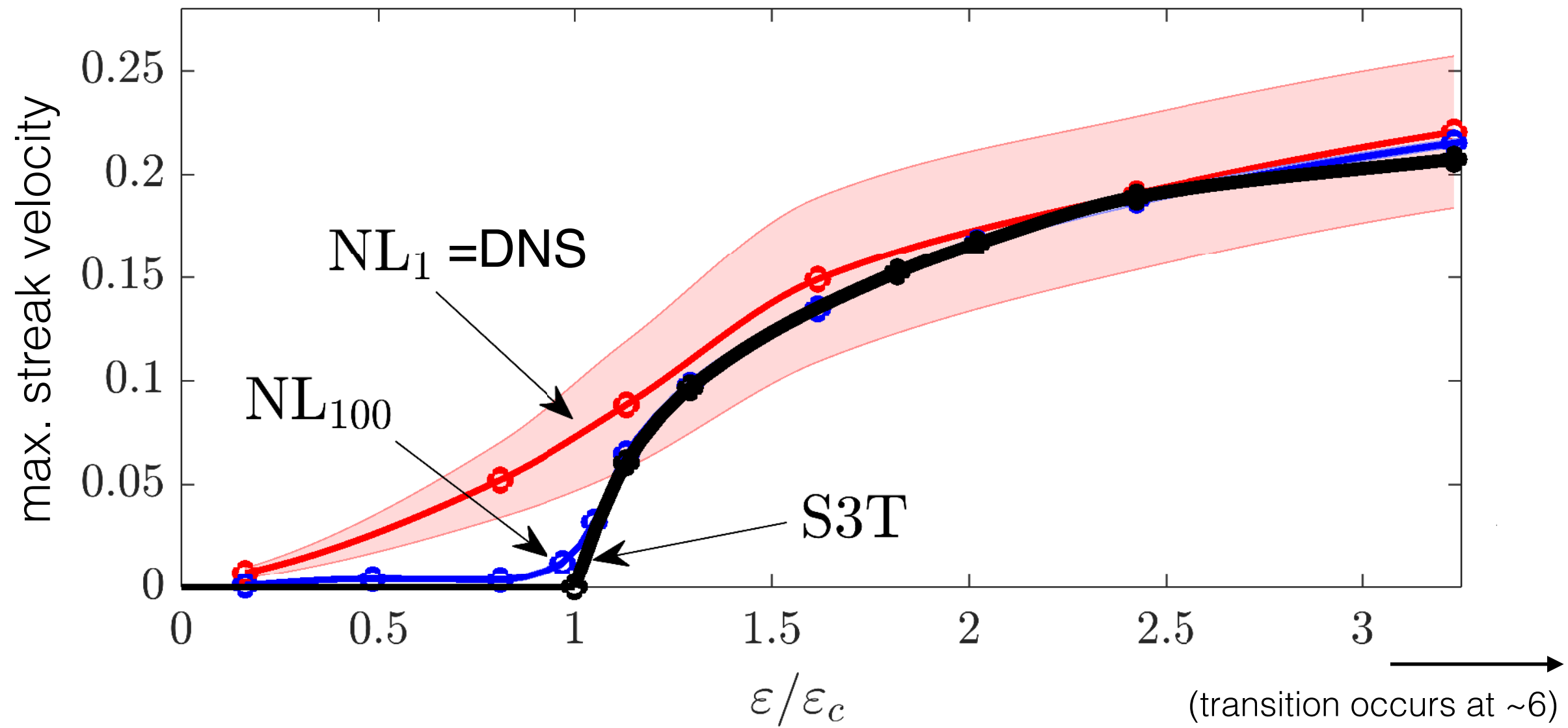
Farrell, Ioannou & Nikolaidis 2016



minimal channel:  $L_x = 1.75\pi$ ,  $L_z = 1.2\pi$ ,  $Re = 400$ , stochastic excitation at  $k_x = 2\pi/L_x$   
 $\varepsilon_c$  sustains turbulence with energy 0.14% of the Couette flow energy.



# bifurcation structure



Farrell, Ioannou & Nikolaidis 2016

minimal channel  
 $Re=400$

# Conclusions

- ▶ S3T generalizes the hydrodynamic stability of Rayleigh and allow us to study the stability of turbulent flows
- ▶ The emergence of coherent structures in a variety of flow settings is (analytically) predicted as an instability of the turbulent state
- ▶ S3T also predicts the final inhomogeneous turbulent state at which the system bifurcates to after the homogeneous state becomes unstable
- ▶ This is a first tool that enables us to determine the tipping points of the climate (climate = statistical turbulent equilibrium state)

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# thanks