

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



Navid Constantinou
Scripps Institution of Oceanography
UC San Diego



in collaboration with:

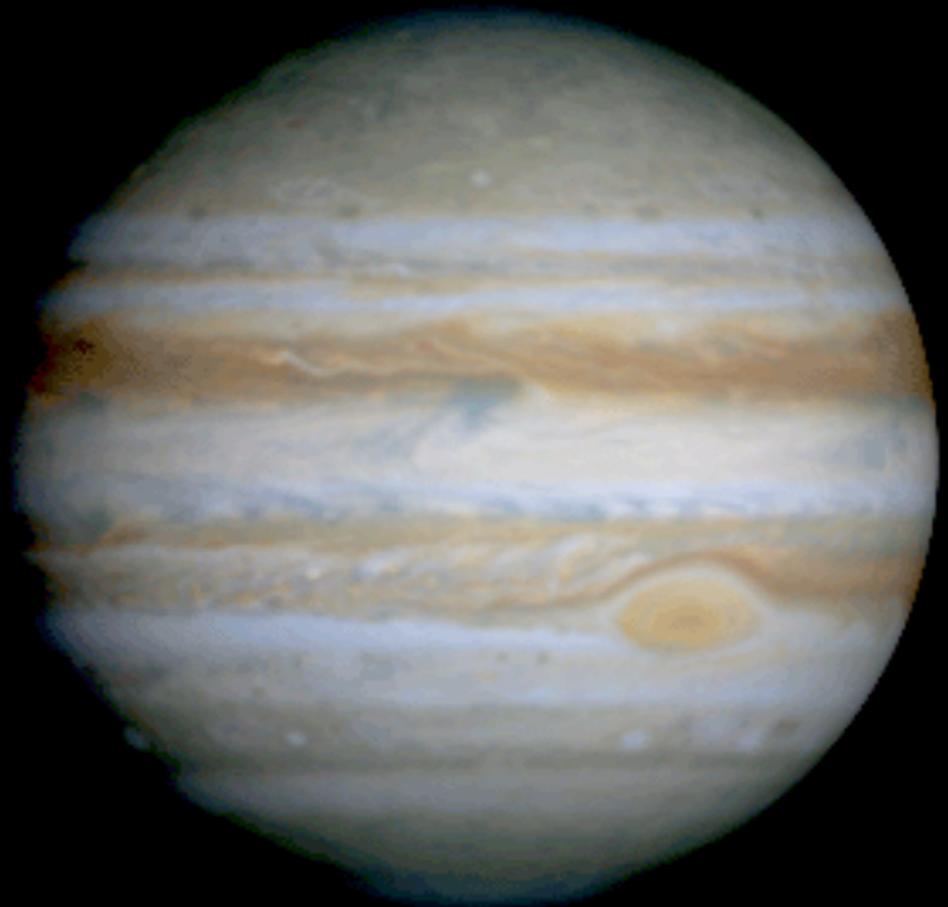
Brian Farrell (Harvard University)
Petros Ioannou (University of Athens, Greece)
Nikolaos Bakas (University of Ioannina, Greece)
Marios-Andreas Nikolaidis (University of Athens, Greece)

KITP
11 Jan. 2017

Planetary turbulence

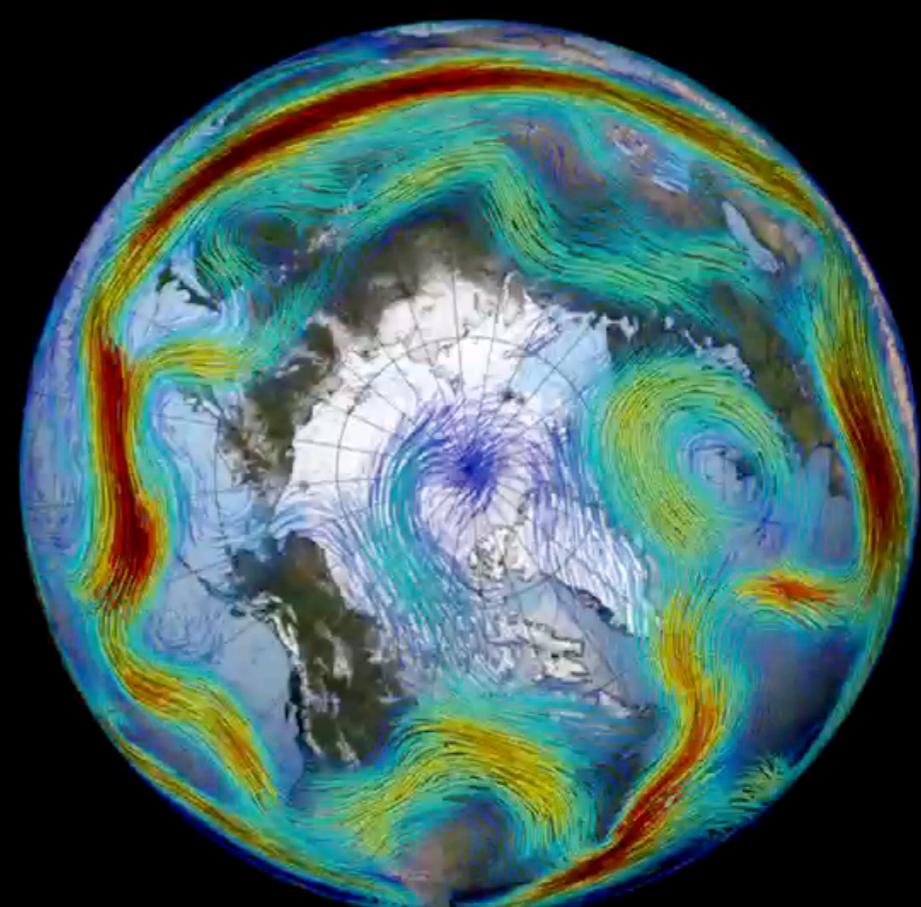
most of the energy of the flow is in large-scale coherent jets and vortices of specific form

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

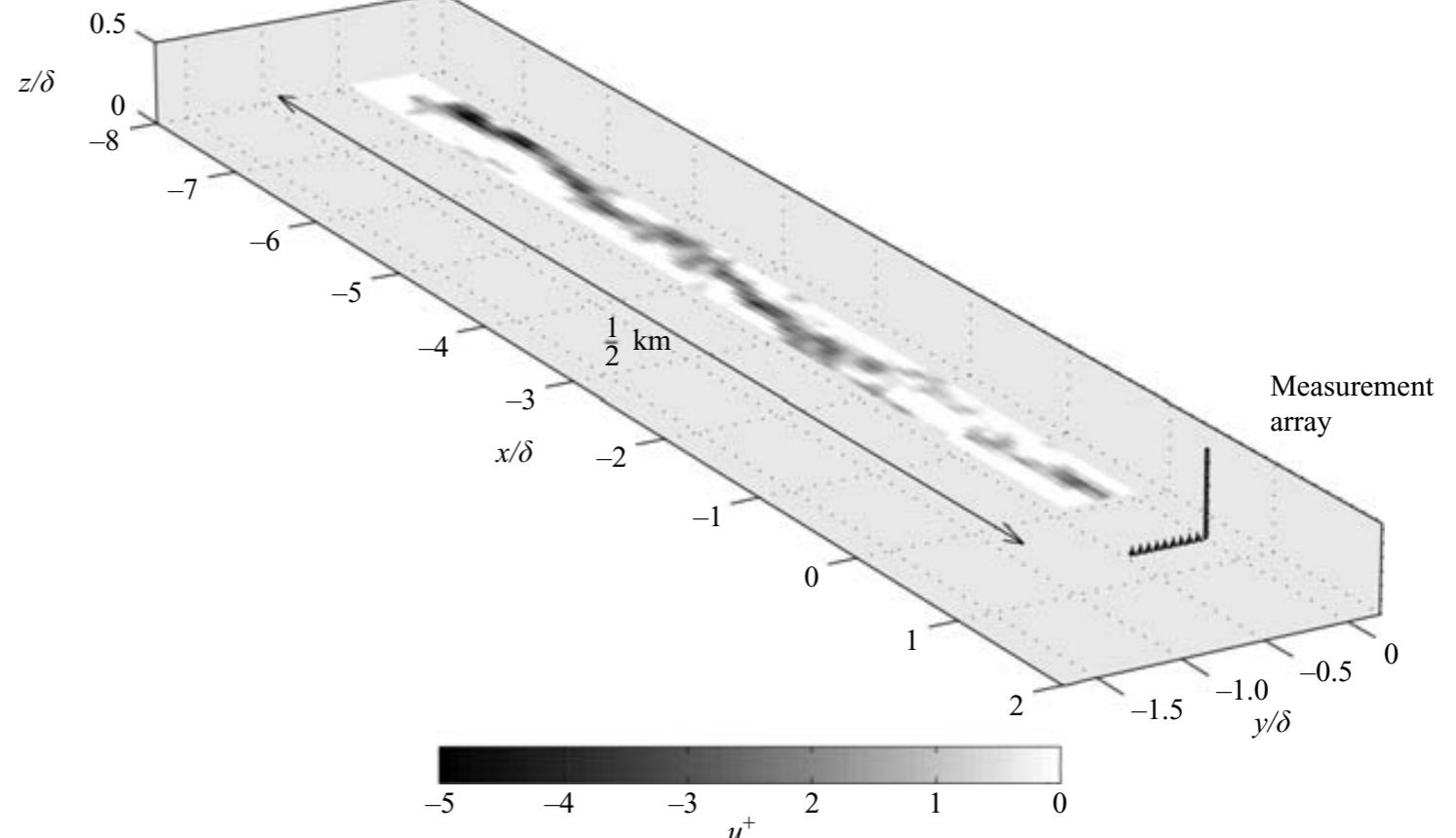
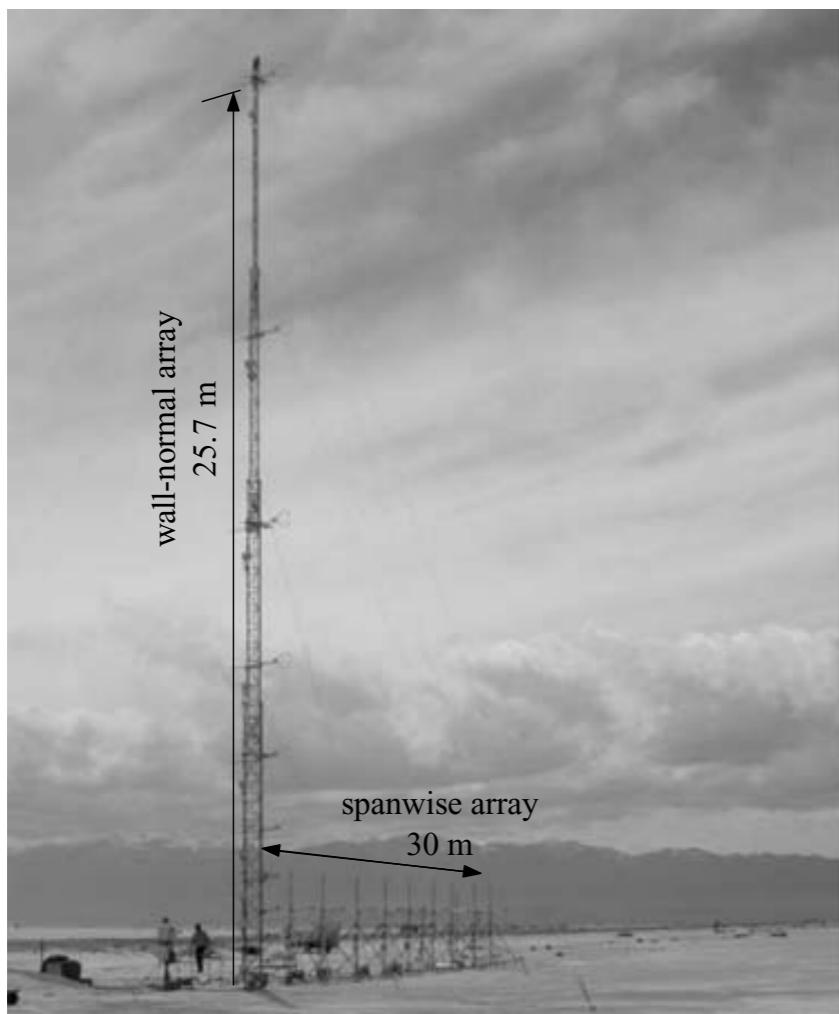
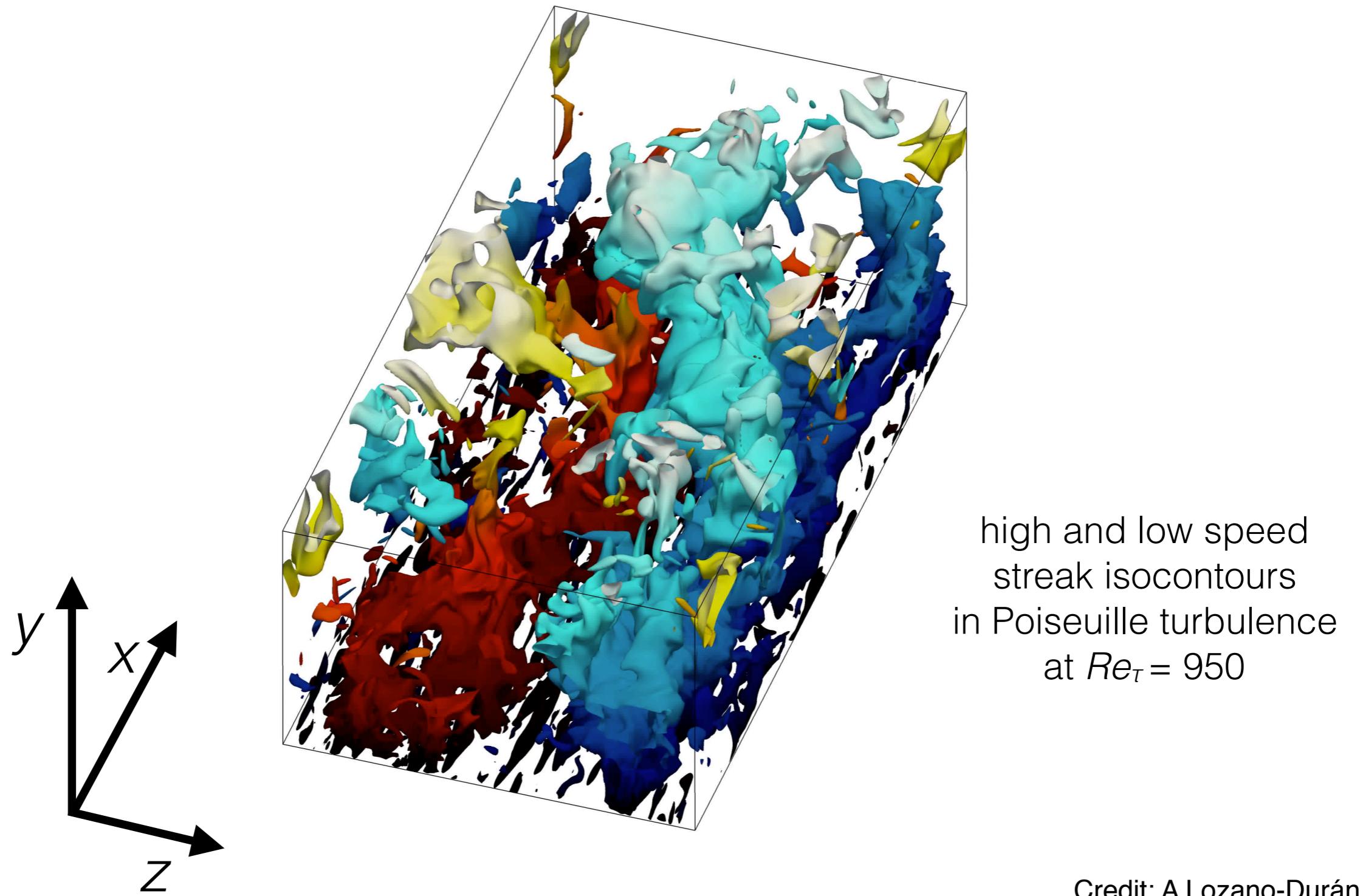


FIGURE 12. View of the measurement array installed at the SLTEST site.

Wall-bounded turbulence



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

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

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

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

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

Remarks on SSD — What is novel here?

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

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Remarks on SSD — What is novel here?

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

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



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

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

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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: $\partial_t = 0$

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



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

$$0 = \mathcal{F}_2 \left(C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)} \right)$$

$$0 = \mathcal{F}_3 \left(C_a^{(1)}, C_{ab}^{(2)}, C_{abc}^{(3)}, C_{abcd}^{(4)} \right) , \text{ etc ...}$$

Remarks on SSD — What is novel here?

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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:

Jet/large-scale wave emerge in planetary turbulence

A. as an instability of the SSD

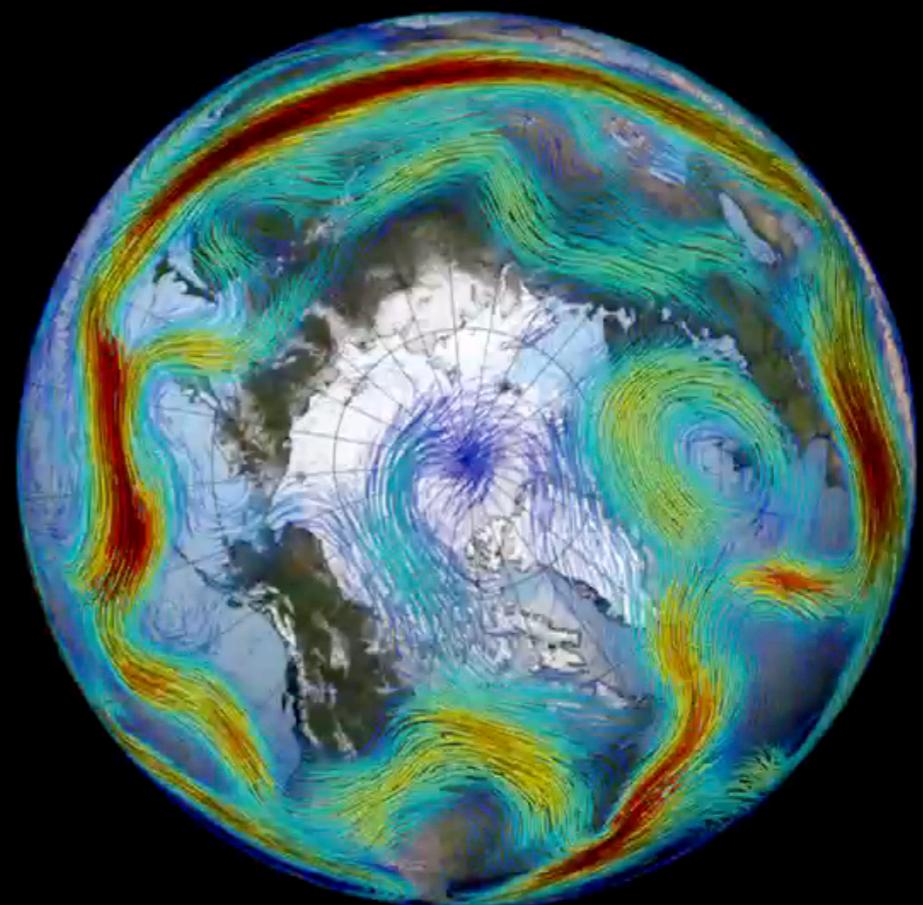
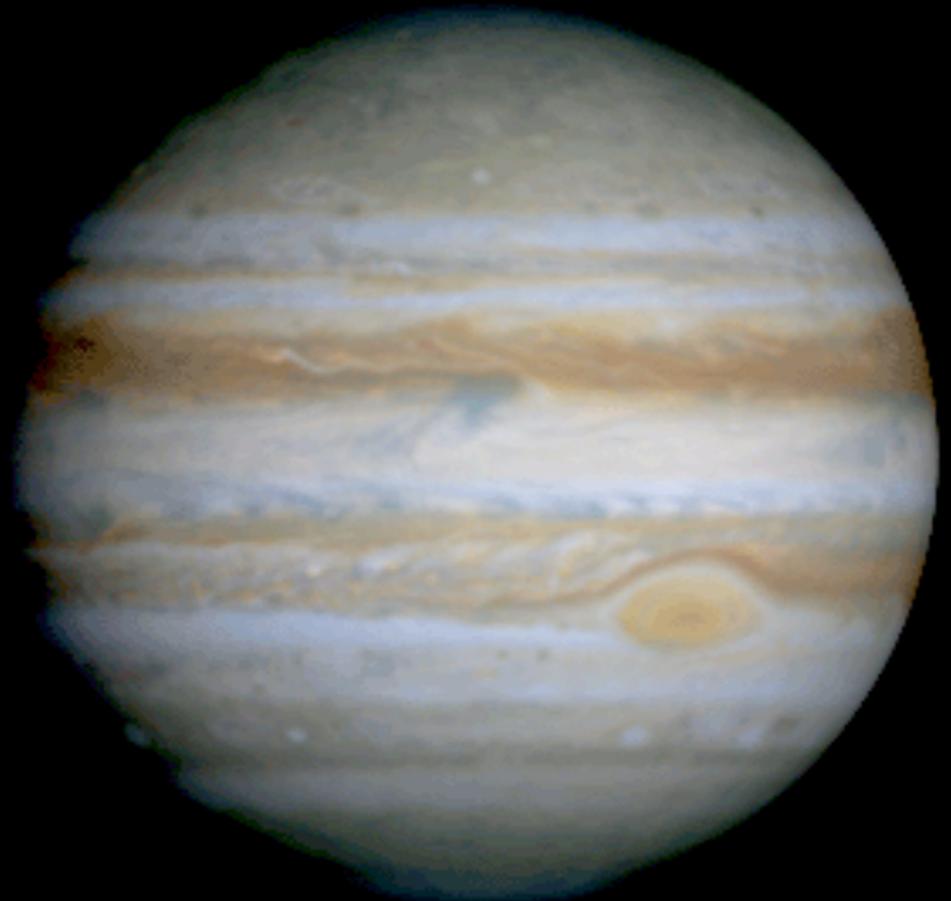
(this shows that SSD capture the mechanism)

Roll/streak structures

B. 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 β -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

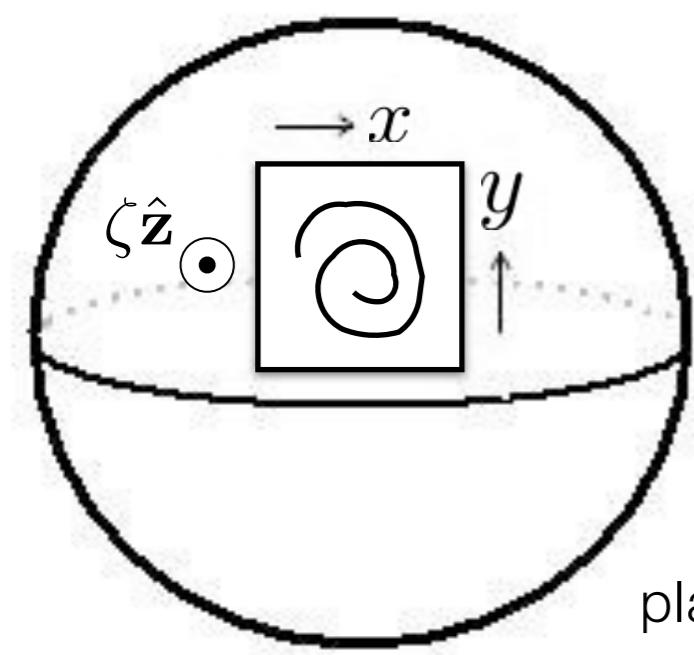
stochastic
forcing

zero mean
white in time
&

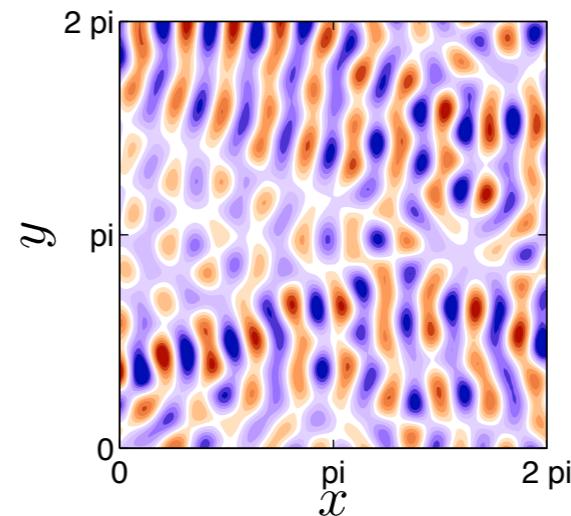
statistically homogeneous

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

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



β : gradient of
planetary vorticity



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

barotropic vorticity equation on a β -plane

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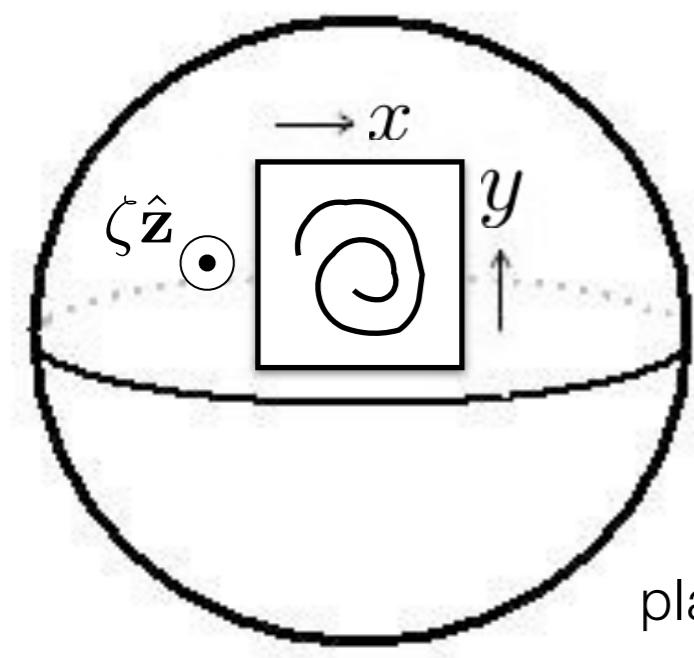
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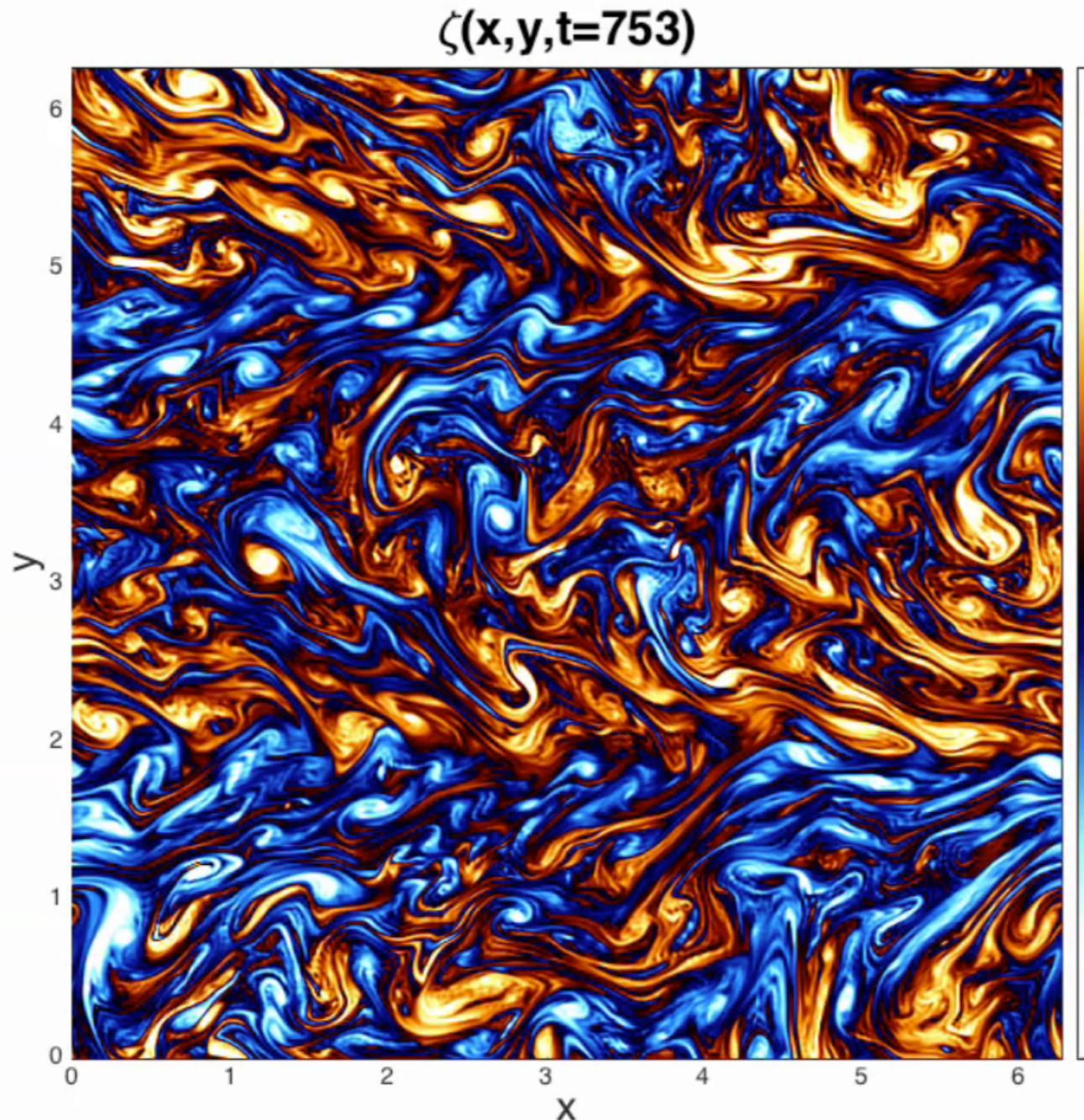
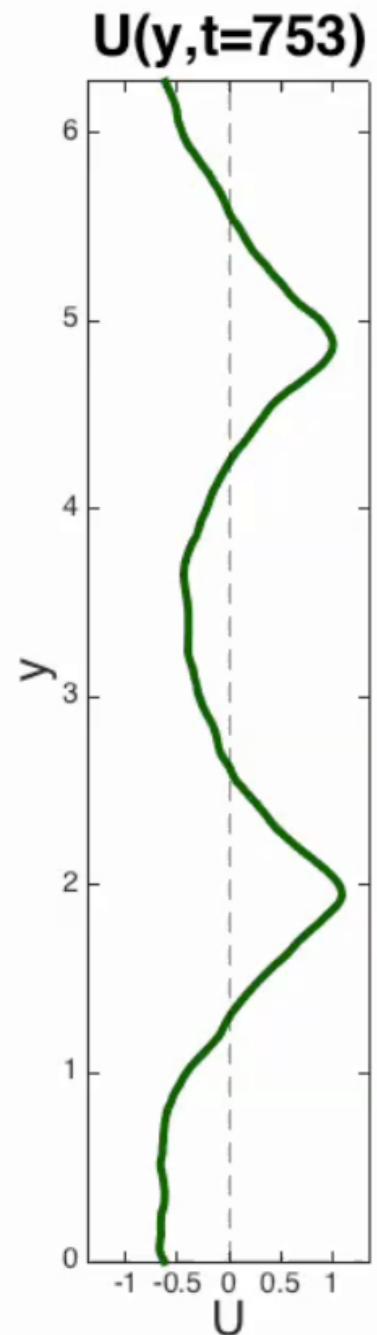
β : gradient of
planetary vorticity

two non-dimensional
parameters

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

$$\beta / (k_f r)$$

barotropic β -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 β -plane turbulence flows
at statistically steady state:

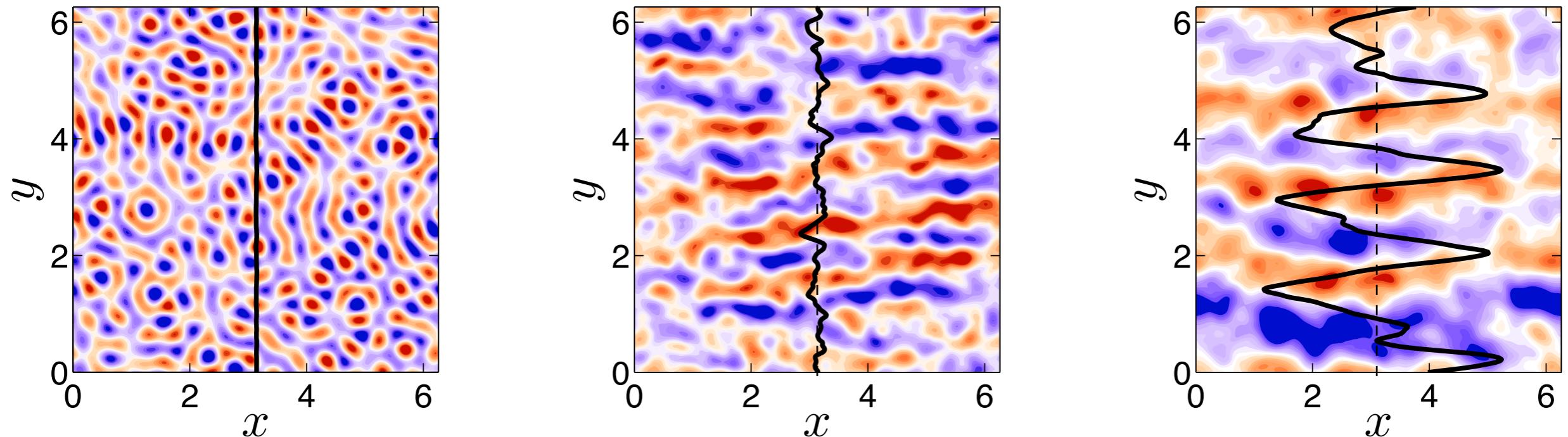
homogeneous — traveling waves — zonal jets

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

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

$$5 \times 10^3$$

$$5 \times 10^4$$



this suggests that there is some kind of transition as ε 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

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

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

1st cumulant

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

2nd cumulant

S3T closure of SSD

$$\partial_t Z + \mathbf{U} \cdot \nabla (Z + \beta y) = \mathcal{R}(C_{ab}^{(2)}) - rZ$$

$$\partial_t C_{ab}^{(2)} = [\mathcal{A}(\mathbf{U})_a + \mathcal{A}(\mathbf{U})_b] C_{ab}^{(2)} + \varepsilon Q_{ab}$$

with

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

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

$Q_{ab} \stackrel{\text{def}}{=} Q(\mathbf{x}_a - \mathbf{x}_b) \longrightarrow$ 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

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$$\partial_t C_{ab}^{(2)} = [\mathcal{A}(\mathbf{U})_a + \mathcal{A}(\mathbf{U})_b] C_{ab}^{(2)} + \varepsilon Q_{ab}$$

neglect of third cumulant
is *equivalent* with

neglect of the eddy—eddy term in eddy equation in the EOM

(→ 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

$$\partial_t Z + \mathbf{U} \cdot \nabla (Z + \beta y) = \mathcal{R}(C_{ab}^{(2)}) - rZ$$

$$\partial_t C_{ab}^{(2)} = [\mathcal{A}(\mathbf{U})_a + \mathcal{A}(\mathbf{U})_b] C_{ab}^{(2)} + \varepsilon Q_{ab}$$

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

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

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

S3T equilibria for homogeneous forcing

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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 $(\mathbf{U}^e(\mathbf{x}), C^e(\mathbf{x}_a, \mathbf{x}_b))$

Consider the homogeneous turbulent equilibrium:

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

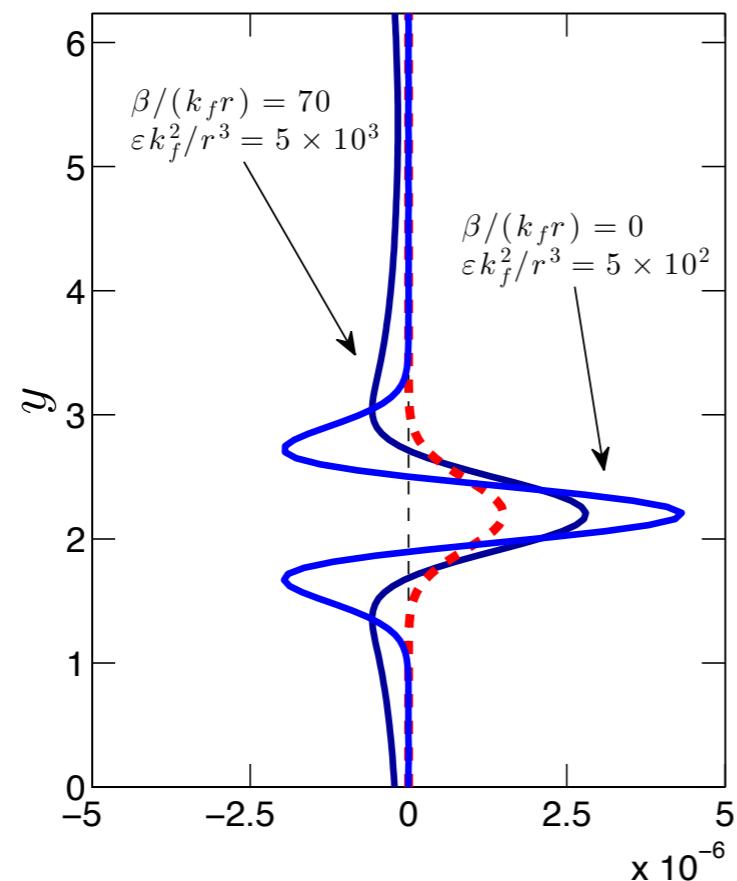
zero mean flow + non-zero second-order eddy statistics

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

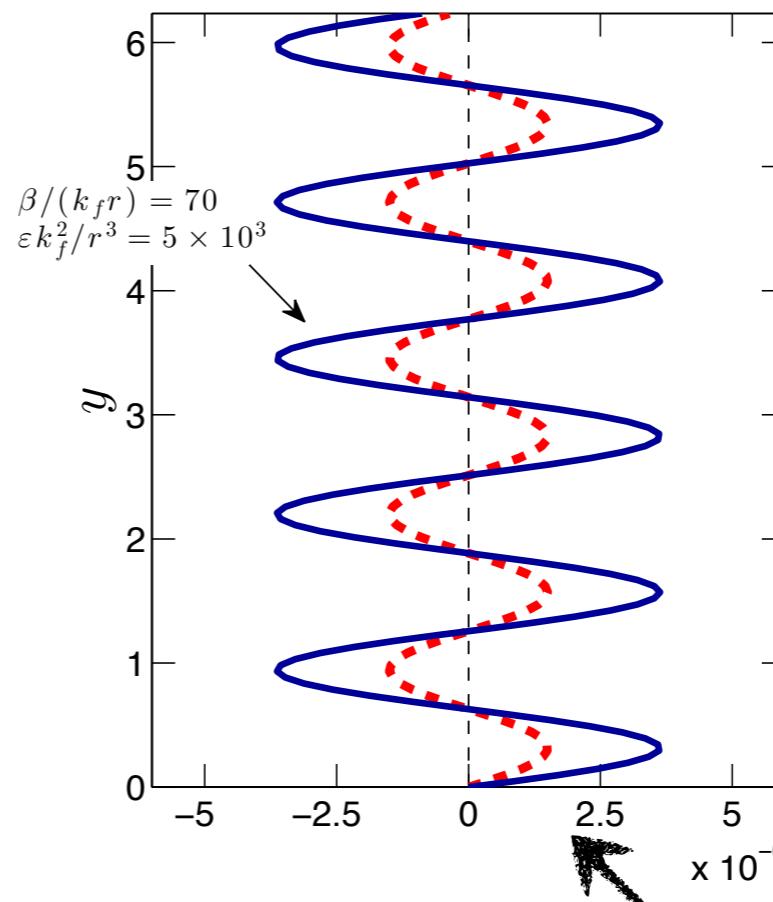
proof of concept

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

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



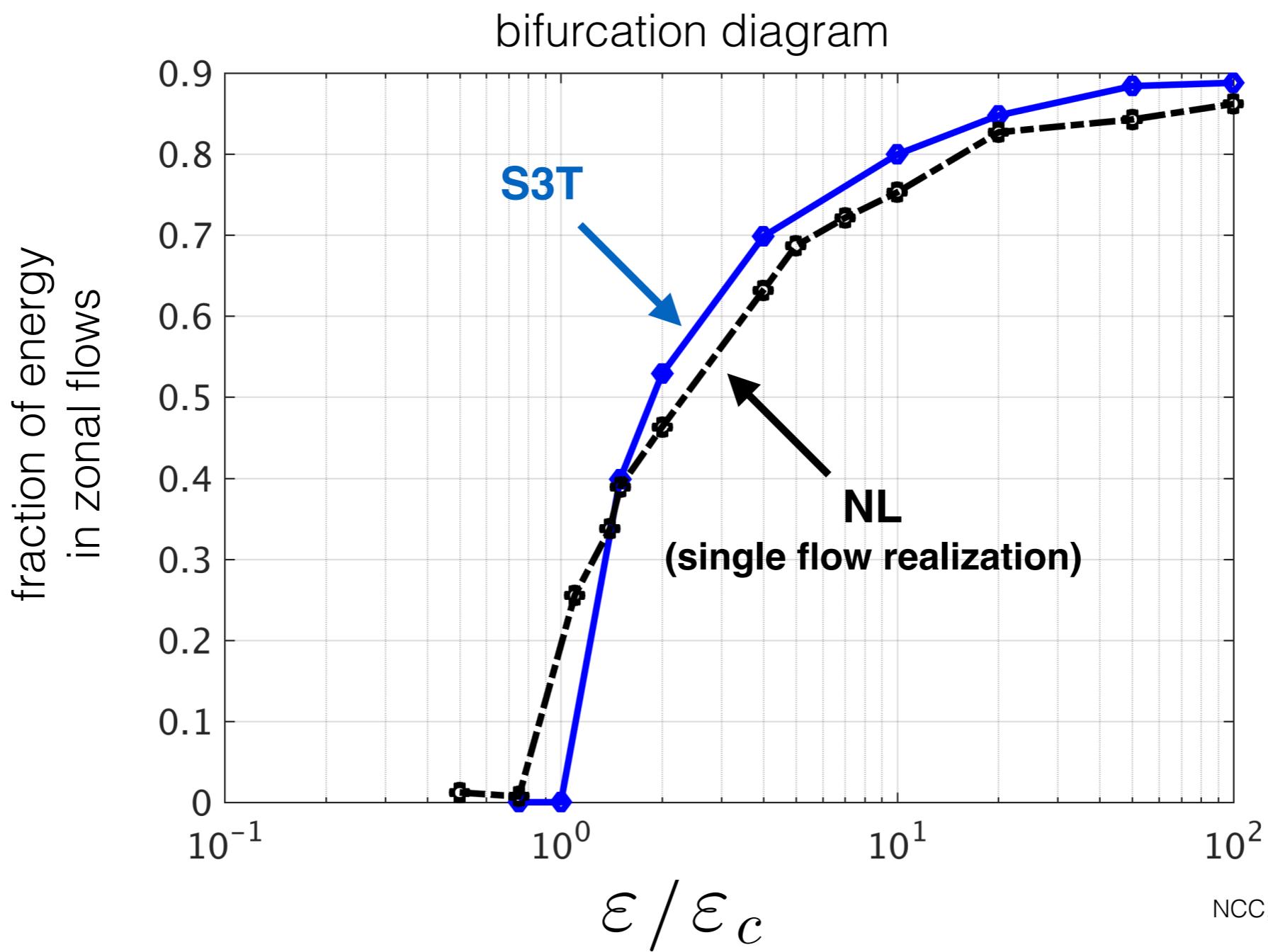
(--) δU , (—) $\mathcal{R}(\delta C)$



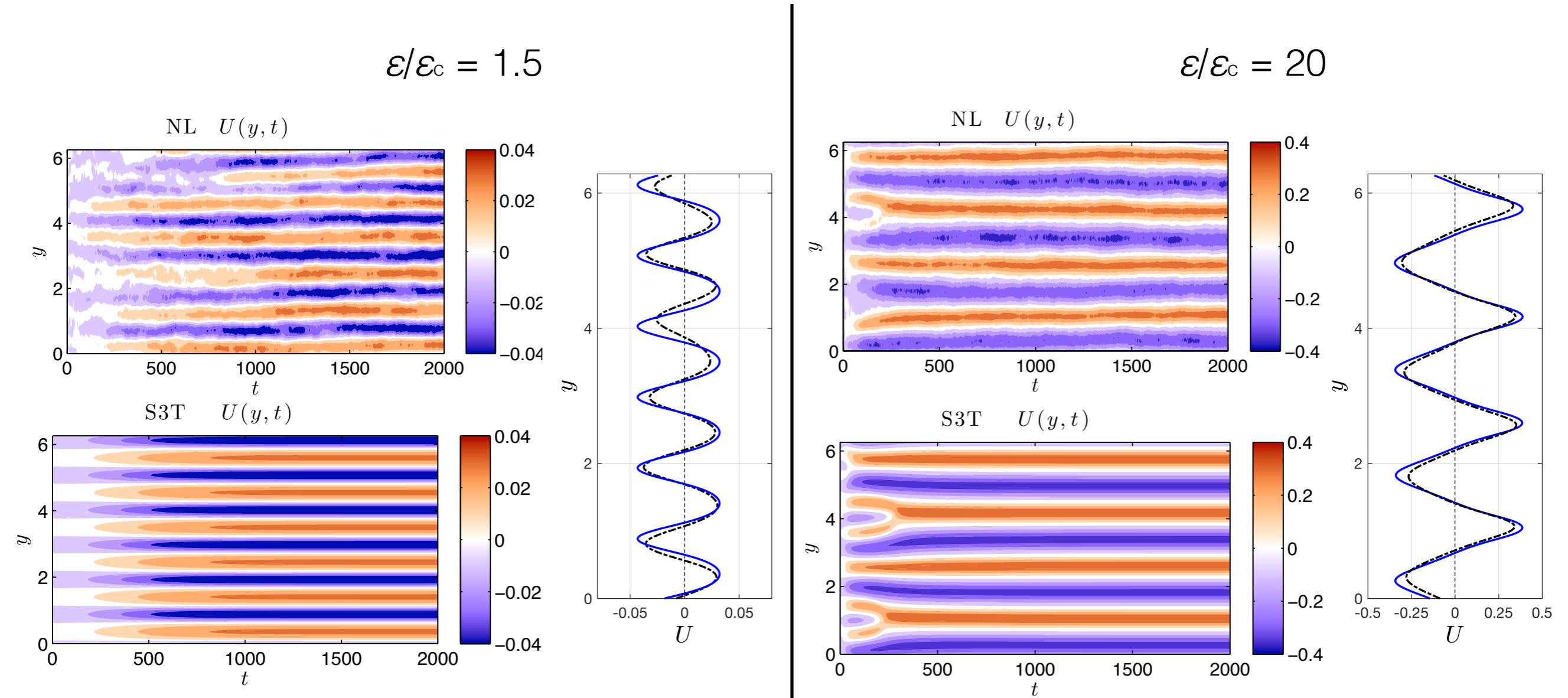
S3T
eigenfunction

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

Verification of S3T predictions for the jet formation bifurcation



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

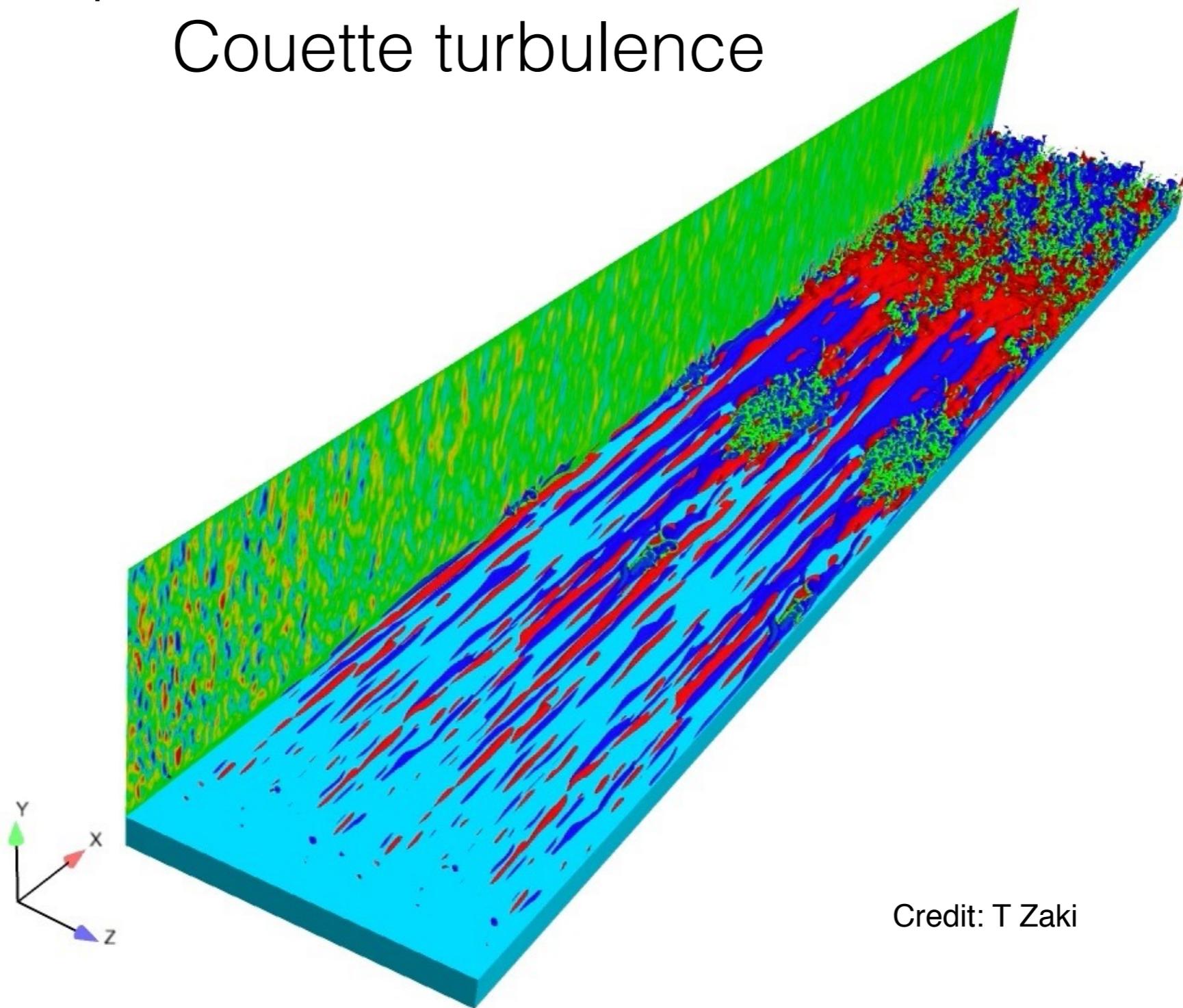


S3T instabilities grow and reach finite amplitude to produce new inhomogeneous S3T equilibria

NCC, Farrell & Ioannou 2014

B.

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



Credit: T Zaki

roll/streak formation in free-stream Couette turbulence

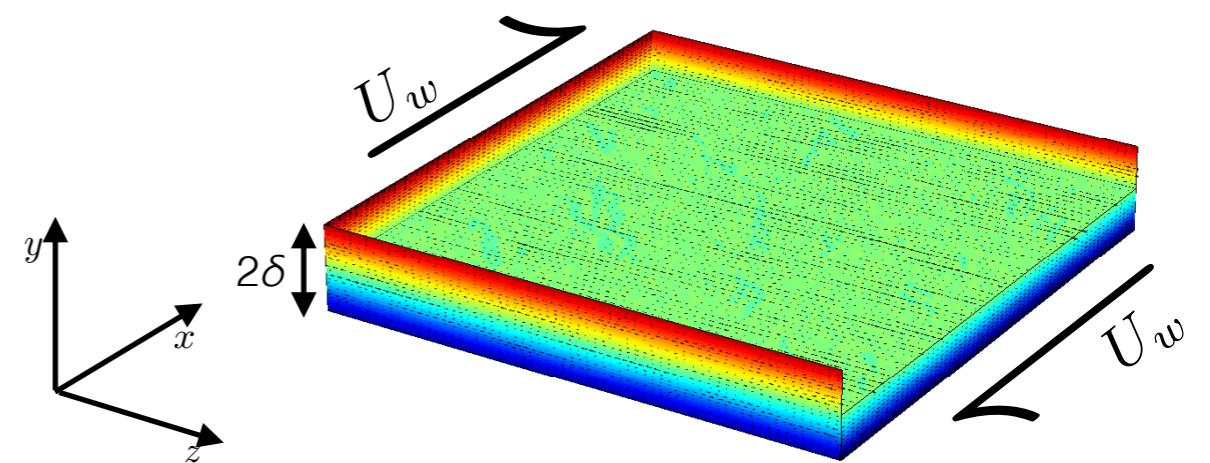
$$\begin{aligned}\text{flow} &= \begin{matrix} \text{streamwise} \\ \text{mean} \end{matrix} + \text{perturbations} \\ \mathbf{u} &= \mathbf{U} + \mathbf{u}'\end{aligned}$$

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

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

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

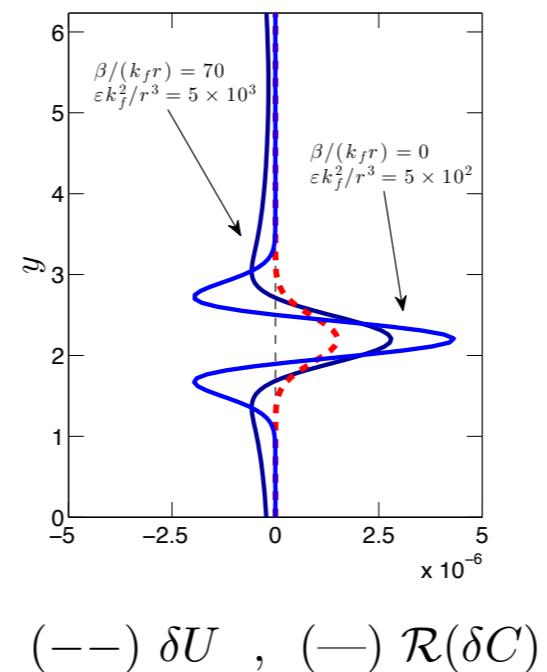
$$Re = \frac{U_w \delta}{\nu}$$



Credit: V Thomas

proof of concept

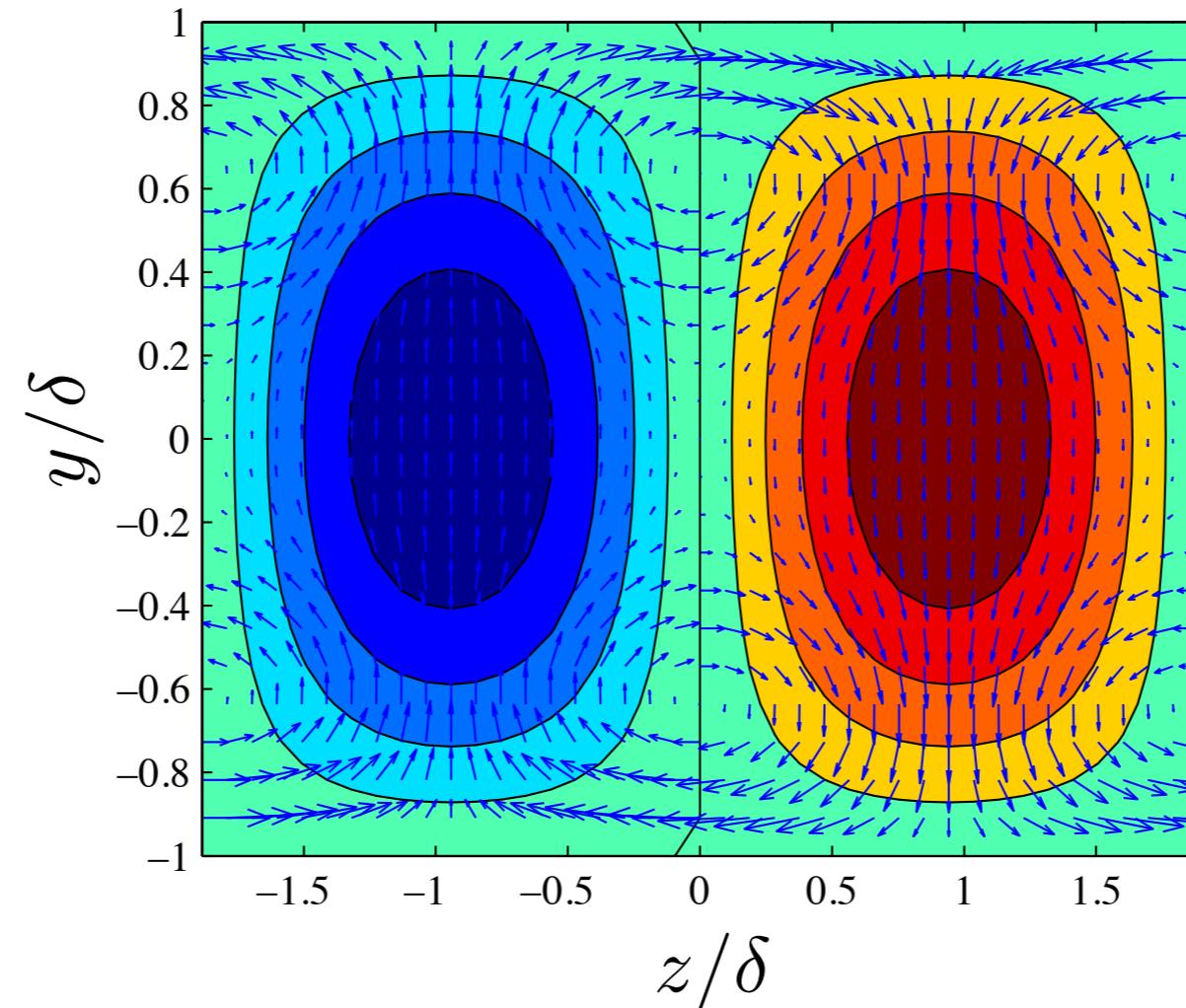
2D problem



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.



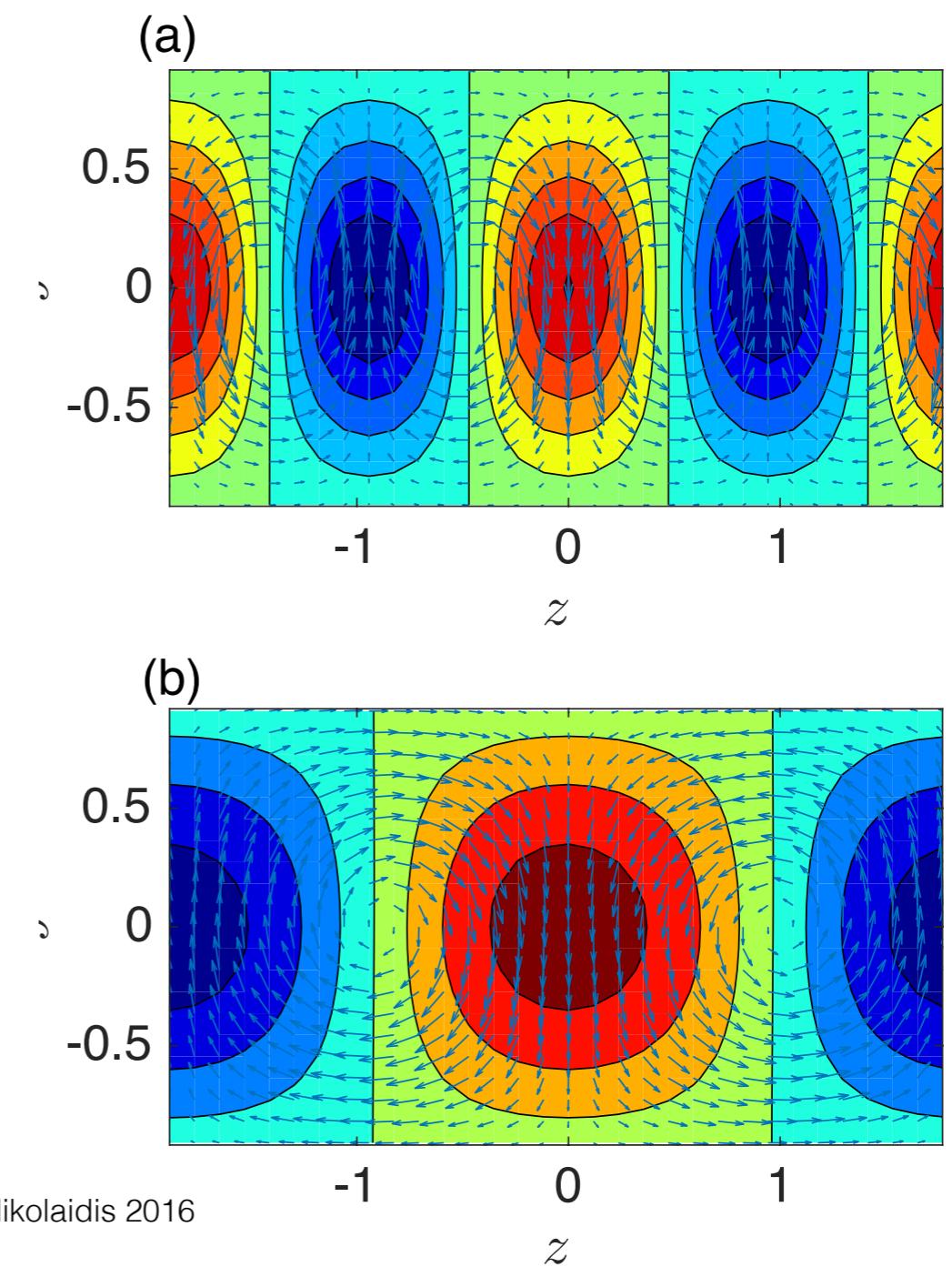
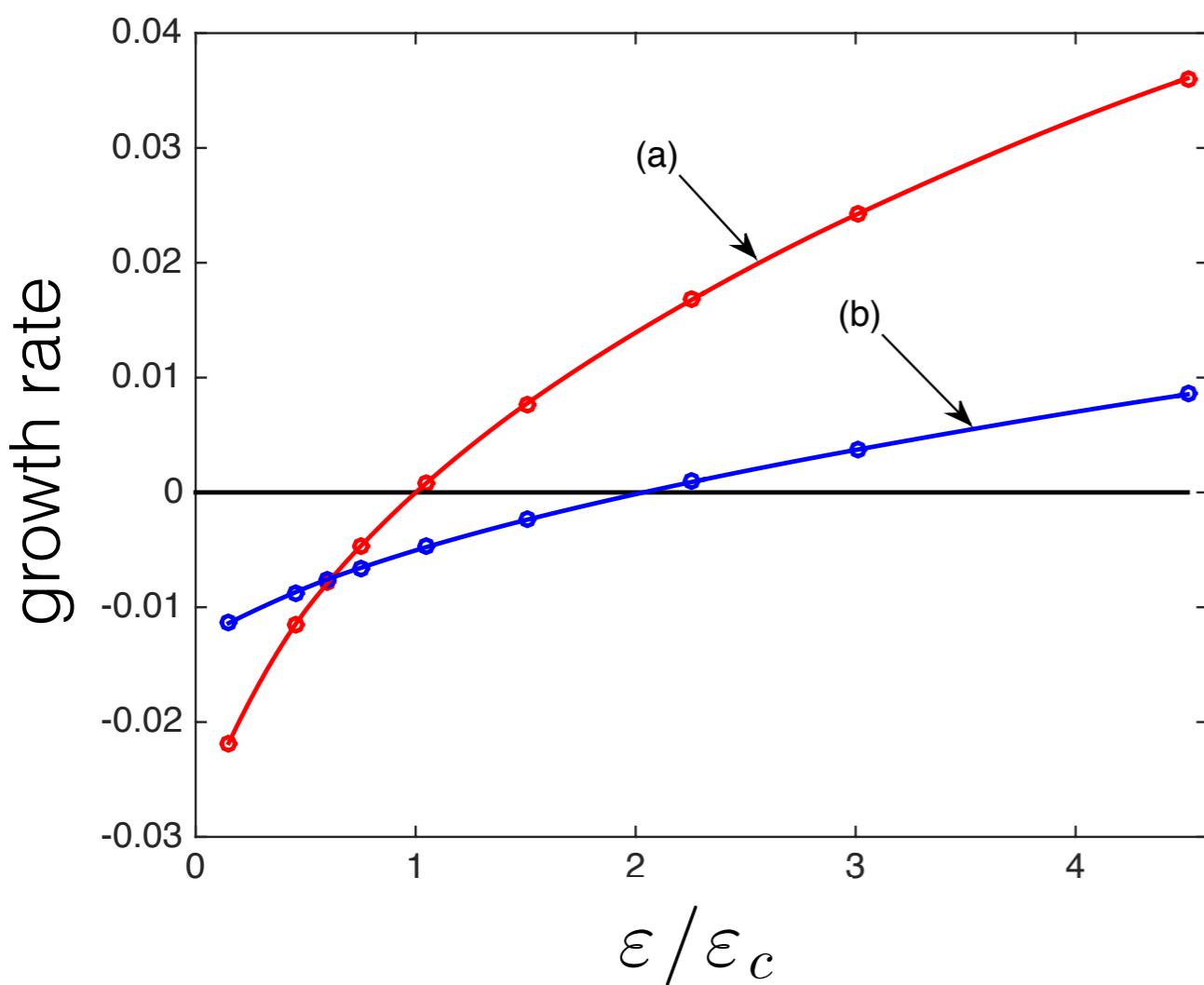
Farrell & Ioannou 2012

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

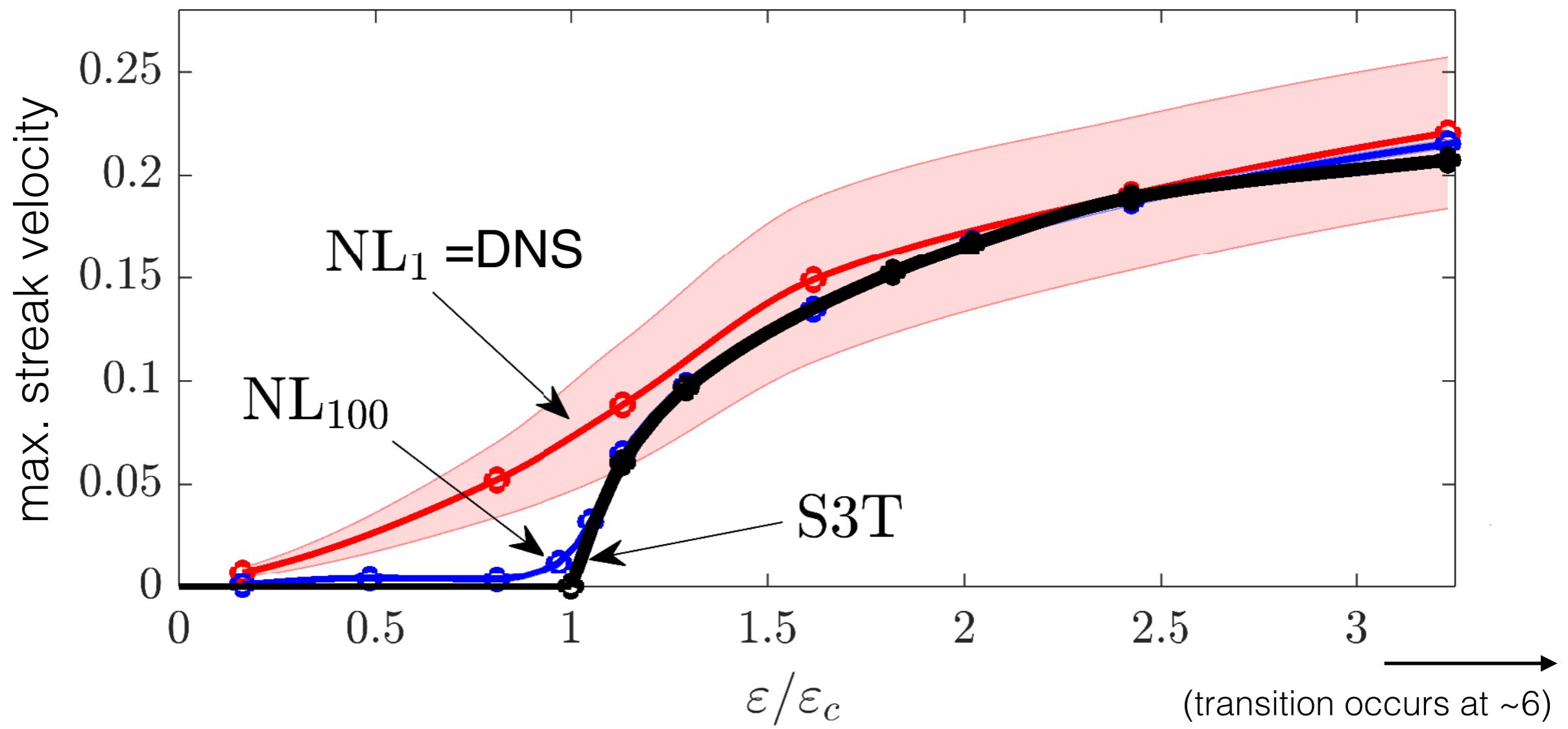
eigenvalues/eigenmodes of the least stable S3T roll/streak modes



Farrell, Ioannou & Nikolaidis 2016

minimal channel: $L_x = 1.75\pi$, $L_z = 1.2\pi$, $Re = 400$, stochastic excitation at $k_x = 2\pi/L_x$
 ε_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