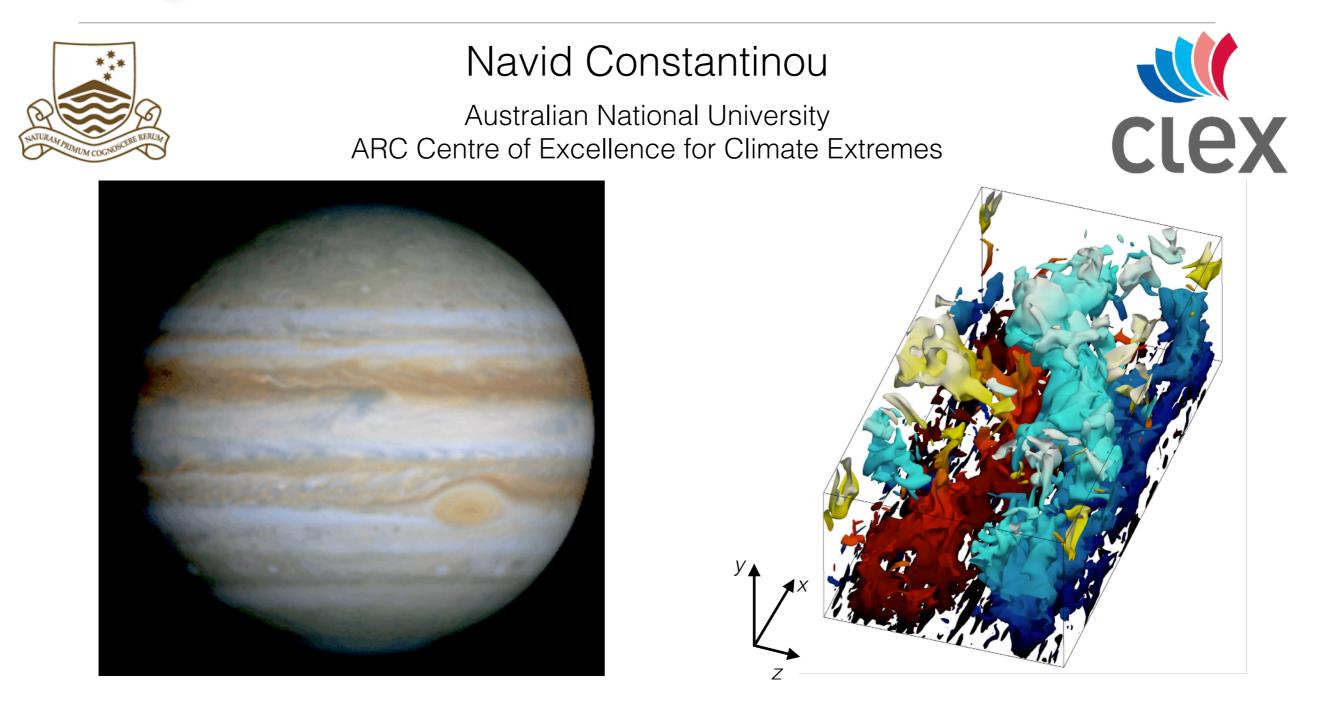
Statistical state dynamics reveals mechanism

for organization of coherent structures in turbulence



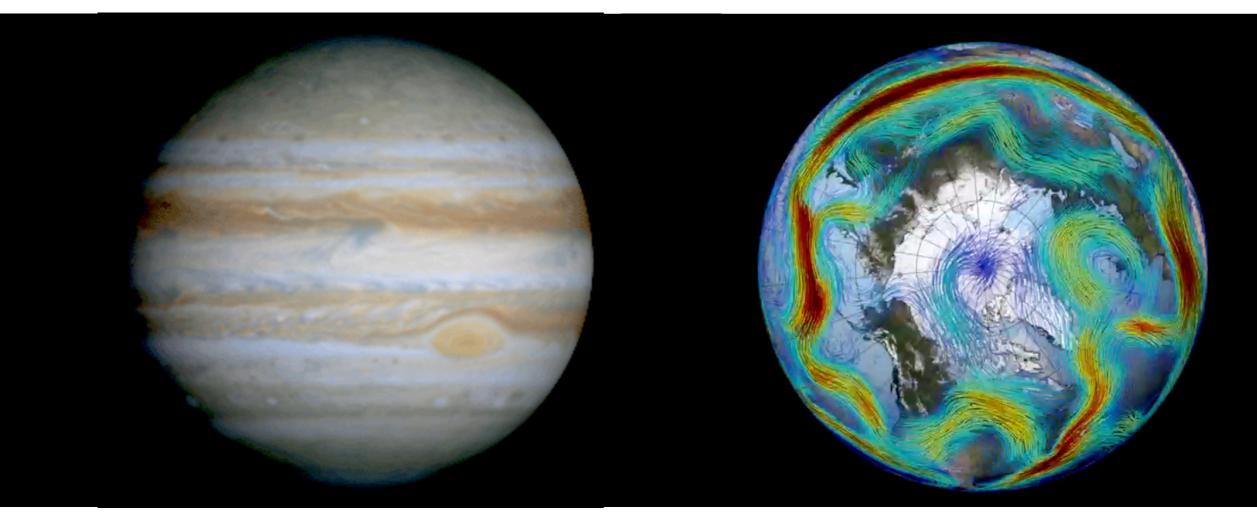
London, August 2018

Acknowledgements go to: N. Bakas, B. Farrell, P. Ioannou, M.-A. Nikolaidis

planetary turbulence

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

not at the largest allowed scale (as 2D inverse energy cascade might imply) arrest of the cascade by jets



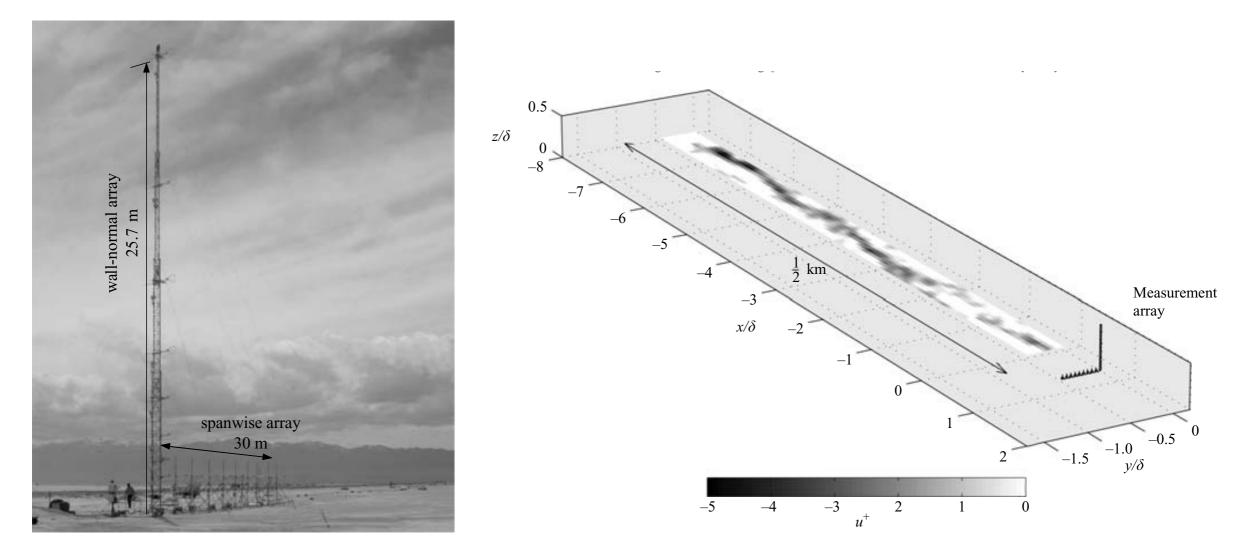
banded Jovian jets

NASA/Cassini Jupiter Images

polar front jet

NASA/Goddard Space Flight Center

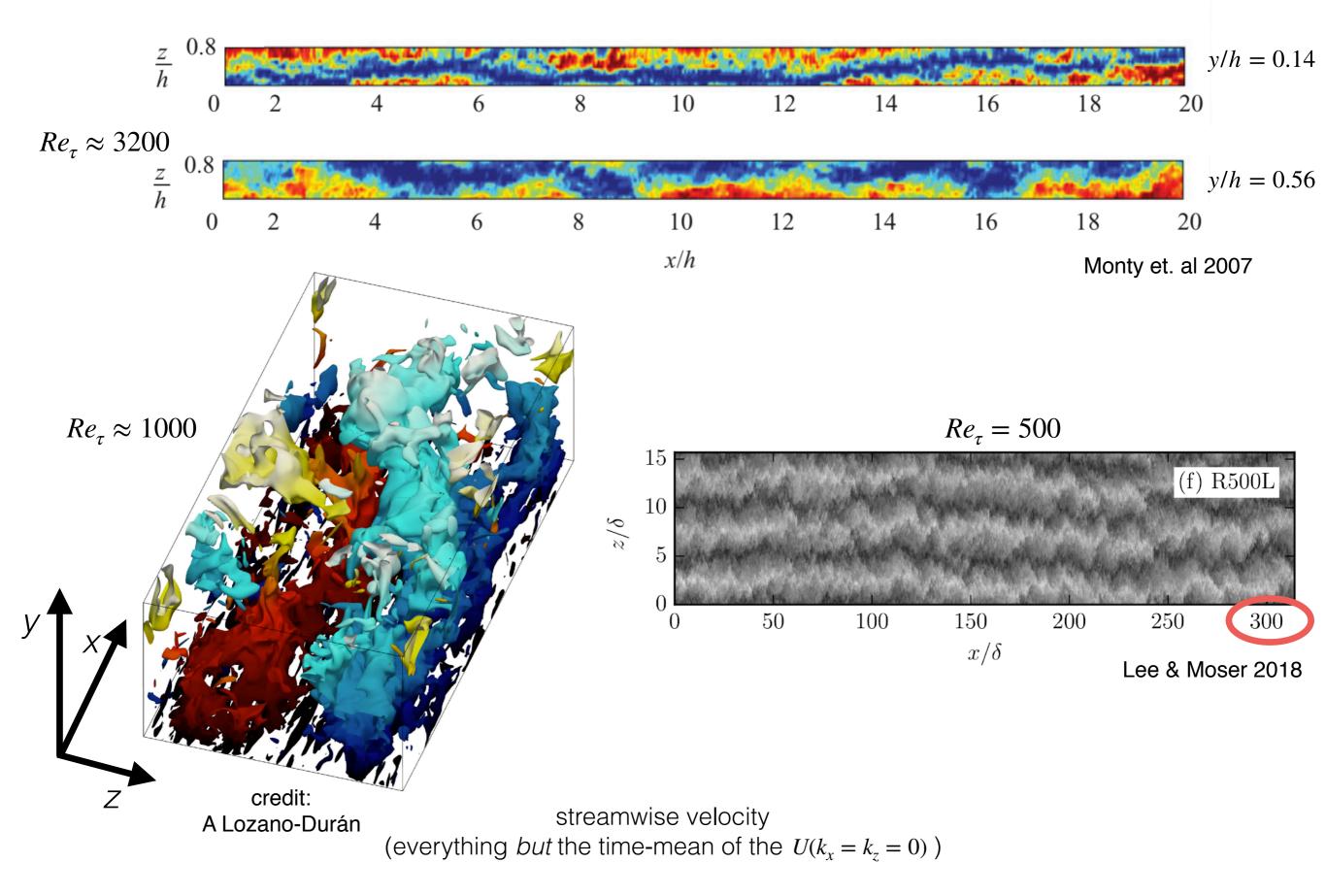
boundary layer turbulence



observing boundary layer in Utah salt lake

Hutchins & Marusic 2007

large-scale motions in wall-bounded turbulence



The problem to be addressed:

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

outline

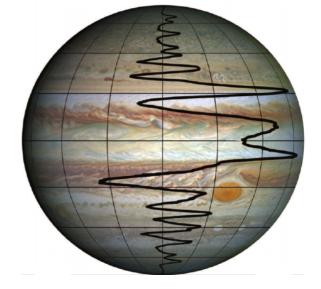
 new framework for studying turbulent flows (statistical state dynamics)

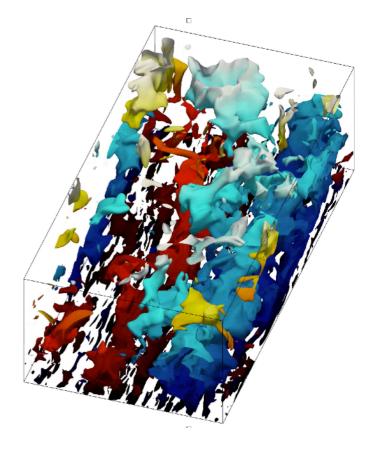
begin with

• zonal jet formation in planetary atmospheres (familiarise with the basic concepts/ideas)

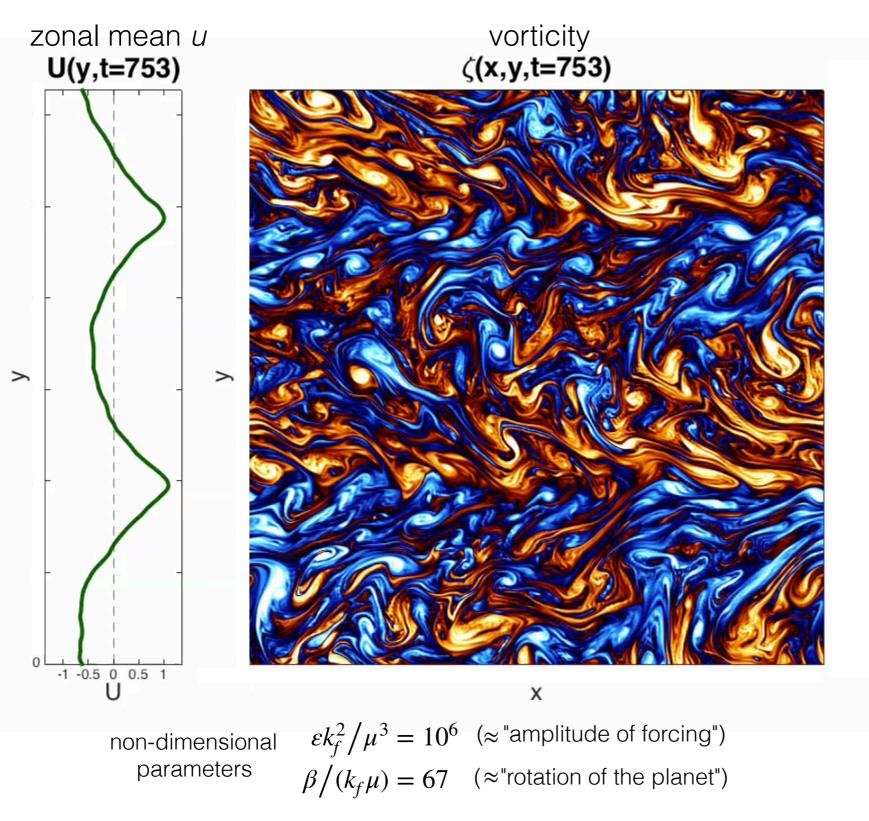
then discuss how SSD illuminates

• streak-roll formation & SSP in wall-bounded turbulence





zonal jet formation in forced-dissipative barotropic β plane



statistically homogeneous small-scale forcing

(forcing **does not** impose any inhomogeneity)

random flow inhomogeneities organize the turbulence so that they are reinforced

we observe:

- jet emerge
- jets appear to change much slower compared to the eddies
- jets may merge

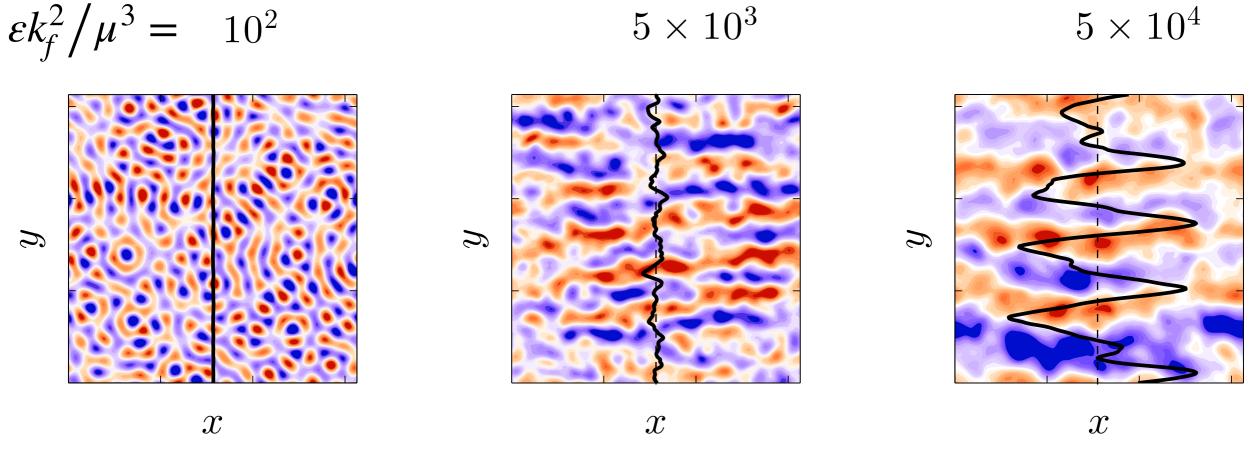
 β gradient of Coriolis parameter, μ linear drag, ε energy injection rate by the forcing; k_f characteristic wavenumber of forcing

various β -plane flow regimes flows at statistically steady state:

homogeneous — traveling waves — zonal jets $\beta/(k_f r) = 67$

 5×10^3

 5×10^4



this suggests that there is some kind of transition as ε is increased

[snapshots of the streamfunction together with instantaneous zonal mean flow U(y,t)]

claims

I. The underlying dynamics of structure formation lies in the interaction of turbulent eddies with mean flows

(what part of the flow is the "mean flow"?)

II. Often, structure formation has analytic expression *only* in the Statistical State Dynamics (SSD)

(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 (given that we decompose our fields into mean+eddies adequately)

Statistical State Dynamics (SSD)

1. split the flow variables into: mean + eddy'

$$u(x,t) = \overline{u(x,t)} + u'(x,t)$$
 [mean is not a time-mean!]

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

$$\underbrace{\overline{u(x_a,t)}}_{=C_a^{(1)}}, \quad \underbrace{\overline{u'(x_a,t)u'(x_b,t)}}_{=C_{ab}^{(2)}}, \quad \underbrace{\overline{u'(x_a,t)u'(x_b,t)u'(x_c,t)}}_{=C_{abc}^{(3)}}, \quad \dots$$

3. use equations of motion to find how each one of the cumulants evolve

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

Statistical State Dynamics (SSD)

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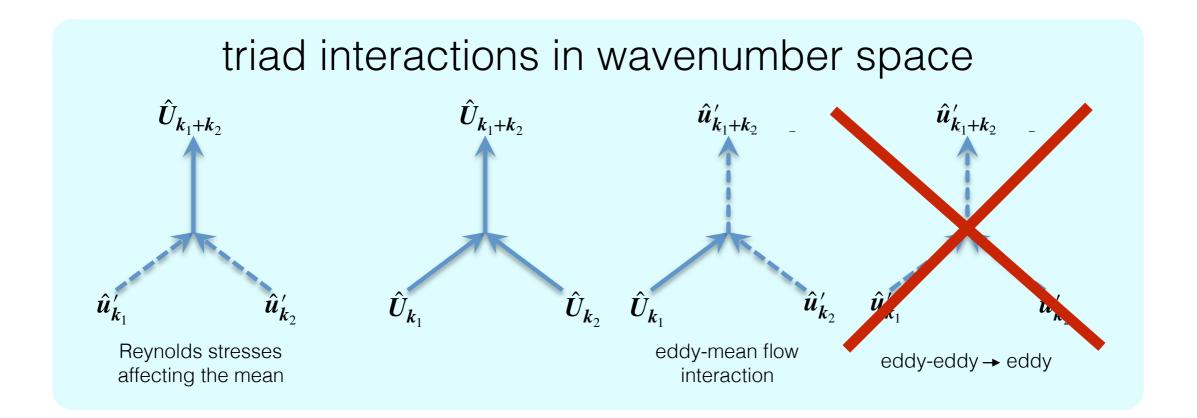
$$\underbrace{\overline{u(x_a,t)}}_{=C_a^{(1)}}, \quad \underbrace{\overline{u'(x_a,t)u'(x_b,t)}}_{=C_{ab}^{(2)}}, \quad \underbrace{\overline{u'(x_a,t)u'(x_b,t)u'(x_c,t)}}_{=C_{abc}^{(3)}}, \quad \dots$$

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4. SSD closure at second order (called S3T or CE2) Farrell & Ioannou 2003 Marston et al. 2008

Navier-Stokes-type quadratic nonlinearities



an SSD closure at second order is **the same** as dropping the eddy-eddy→eddy nonlinearity

does it matter what we identify with the mean?

mean = x, z, t-average

mean = x, z -average

$$\overline{u(x, y, z, t)} = U(y)$$

[Reynolds decomposition] no mean flow dynamics

$$\overline{u(x, y, z, t)} = U(y, t)$$

[see Jimenez & Pinelli (1999) experiments: filtering out the streaks is equivalent with taking here the streaks as part of the incoherent flow]

mean = x-average

 $\overline{u(x, y, z, t)} = U(z, y, t)$

[streamwise mean]

mean = small-
$$k_x$$
 spatial average

[e.g., NCC, Farrell & Ioannou 2016, Marston, Tobias, & Chini 2016; Child et al. 2016; Tobias & Marston 2017]

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[streamwise mean]

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[e.g., NCC, Farrell & Ioannou 2016, Marston, Tobias, & Chini 2016; Child et al. 2016; Tobias & Marston 2017]

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

Usually (motivated by homogeneous isotropic turbulence) people took $\overline{u(x,t)} = 0$

Usually (motivated by homogeneous isotropic turbulence) people took $\overline{u(x,t)} = 0$

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

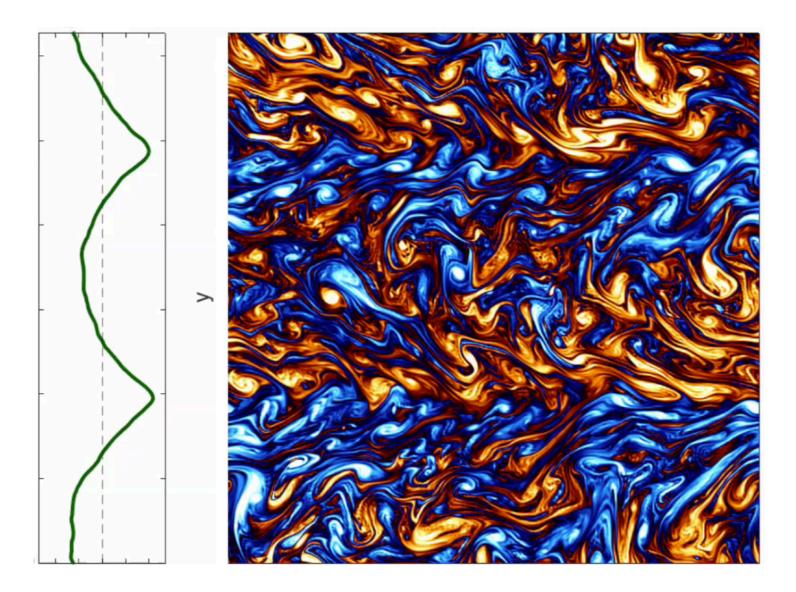
By studying the *dynamics* of the statistics novel explanations for phenomena become available.

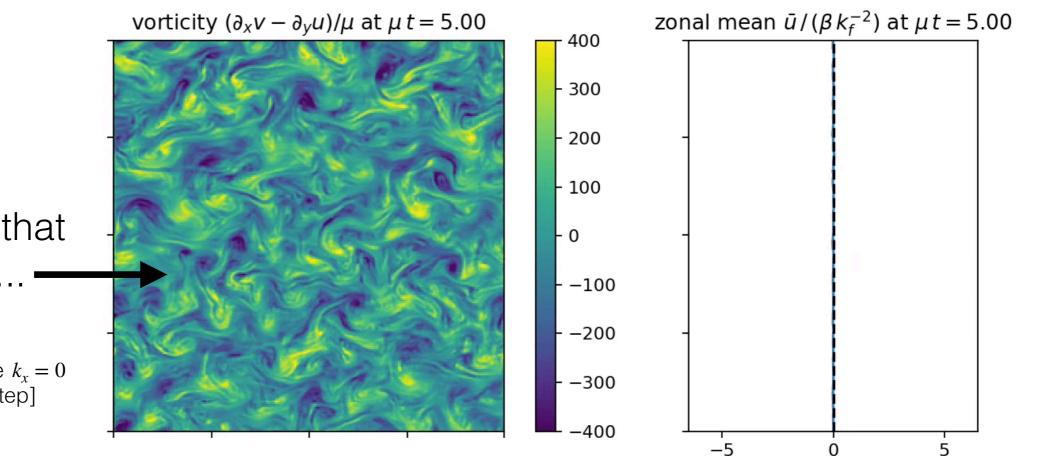
$$\begin{aligned} \partial_t C_a^{(1)} &= \mathcal{F}_1 \left(C_a^{(1)} \ , \ C_{ab}^{(2)} \right) \\ \partial_t C_{ab}^{(2)} &= \mathcal{F}_2 \left(C_a^{(1)} \ , \ C_{ab}^{(2)} \ , \ C_{abc}^{(3)} \right) \\ \partial_t C_{abc}^{(3)} &= \mathcal{F}_3 \left(C_a^{(1)} \ , \ C_{ab}^{(2)} \ , \ C_{abc}^{(3)}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

While flow realizations exhibit the phenomena, analytic expression of the phenomena requires the SSD.

examples?

understanding zonal jet formation through SSD





400

- 300

- 200

- 100

- -100

-200

-300

-400

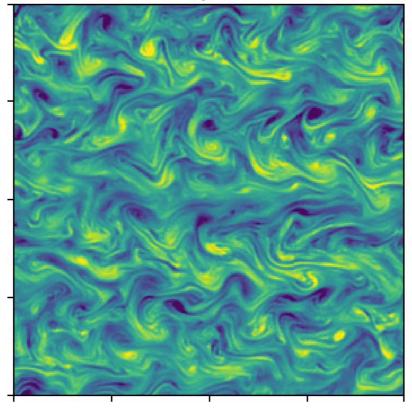
ŀΟ

how do we show that a flow like this ...

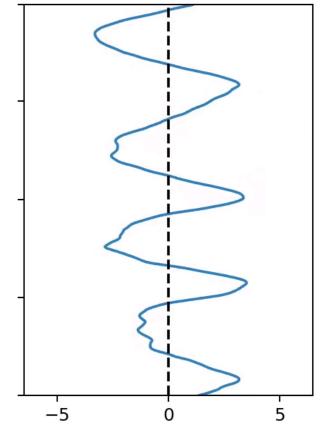
[simulation in which we kill the $k_x = 0$ component at each time step]

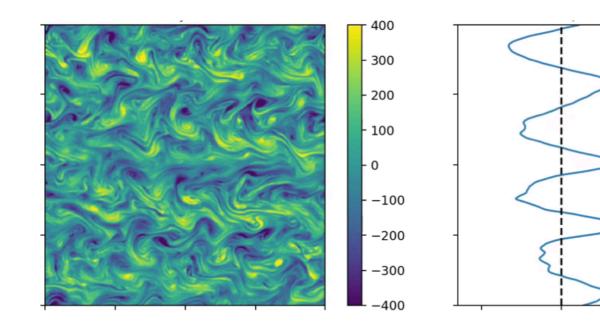
... is **unstable** leading to forming four jets?

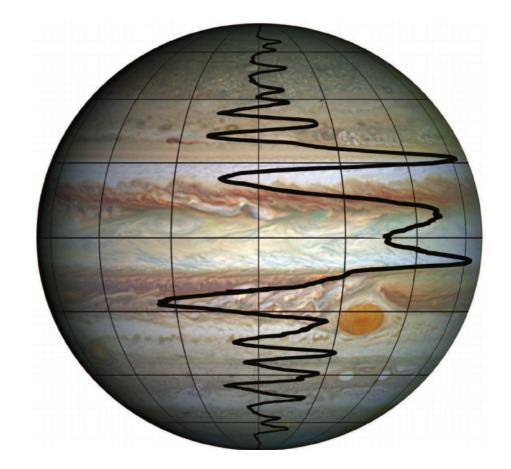
vorticity $(\partial_x v - \partial_y u)/\mu$ at $\mu t = 5.00$





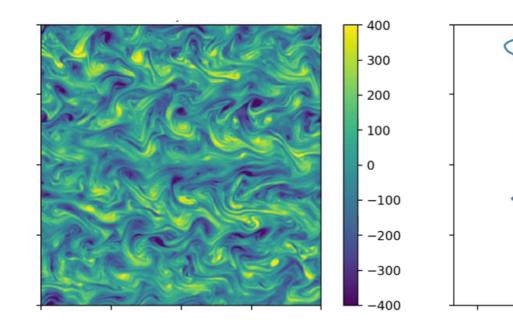


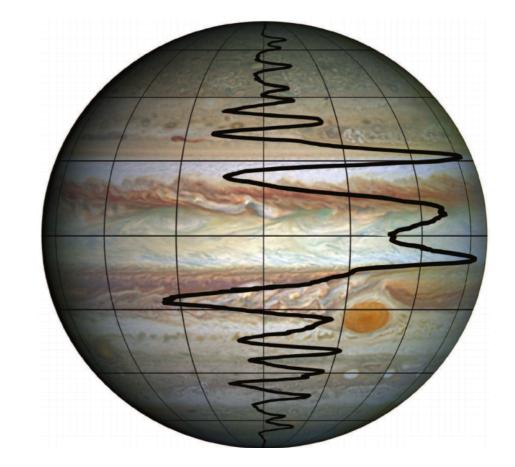




at statistical equilibrium:

realization dynamics	jets	+	turbulent eddies
	≈steady		strongly time-dependent





at statistical equilibrium:

statistical state dynamics + eddystatistics

 \approx steady

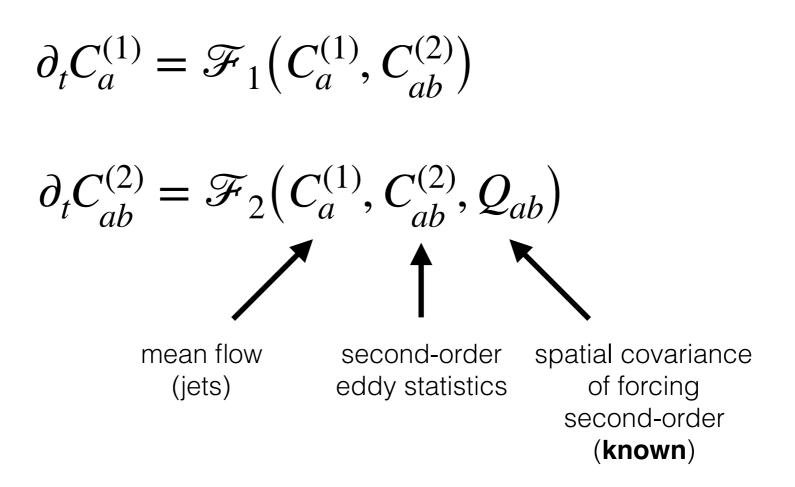
jets

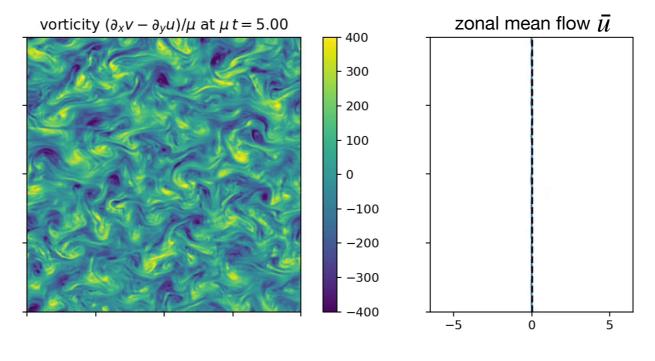
≈stationary

second-order

Farrell & Ioannou 2003, 2007; Srinivasan & Young 2012; Tobias & Marston 2013; NCC, Farrell & Ioannou 2014, 2016; Bakas, NCC & Ioannou 2015, 2018; Bakas & Ioannou 2013, 2014, 2018; Parker & Krommes 2013, 2014;
Marston, Tobias, Chini, 2016; Ait-Chaalal, Schneider, Meyer, & Marston; Marston & Tobias 2017, NCC & Parker 2018

S3T second-order closure of SSD





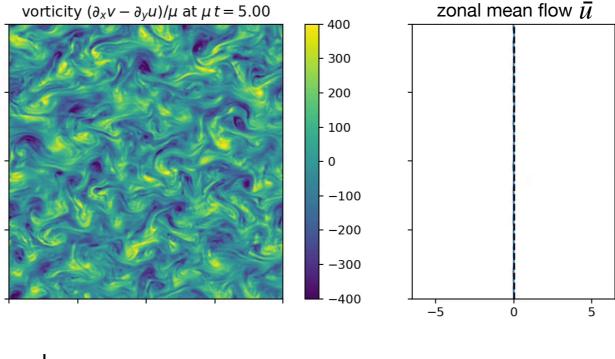
homogeneous stationary second-order eddy statistics

+ no mean flow

this is a fixed point of the SSD closure

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

$$\partial_t C_{ab}^{(2)} = \mathcal{F}_2 \big(C_a^{(1)}, C_{ab}^{(2)}, Q_{ab} \big)$$



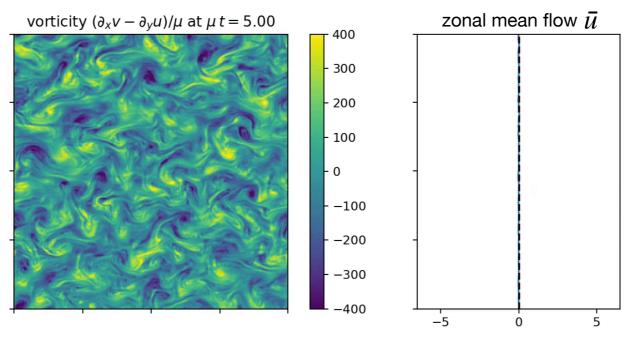
homogeneous stationary second-order eddy statistics

no mean flow

this is a fixed point of the SSD closure

let's perturb it and study its stability... (doable, but we have to solve an eigenvalue problem of dimension $\mathcal{O}(n^4 \times n^4)$)

note: we've linearized about a turbulent state!



homogeneous stationary second-order eddy statistics

no mean flow

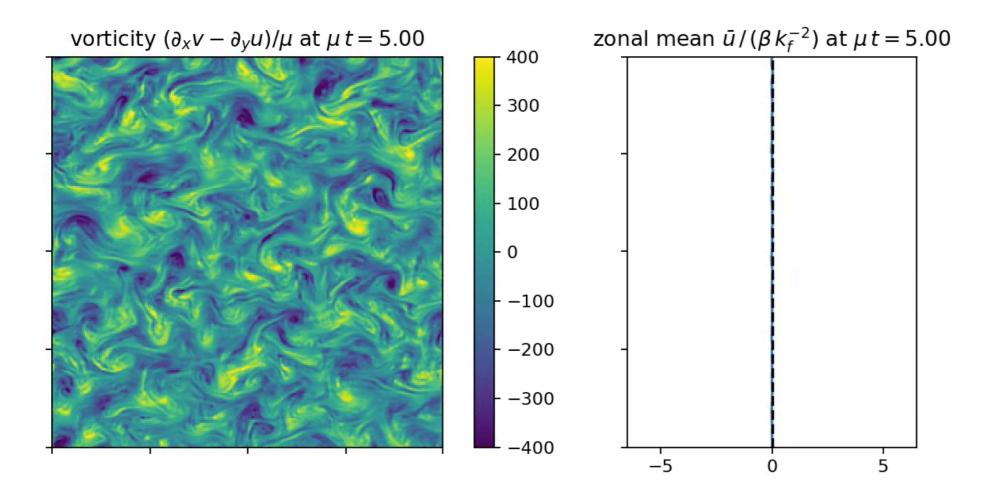
as we cross a threshold value of $\epsilon k_f^2 / \mu^3$ the homogeneous turbulent state **becomes unstable** to infinitesimal zonal jet mean flow perturbations how does this flow-forming instability manifest?

the (infinitesimal) jet organizes the turbulent field so that it produces Reynolds stresses that reinforce *the very jet itself* !

this process is obscured in realization dynamics... but it becomes evident in the statistical state dynamics



$$\partial_t U = -\mu U - \partial_y \overline{u'v'}$$

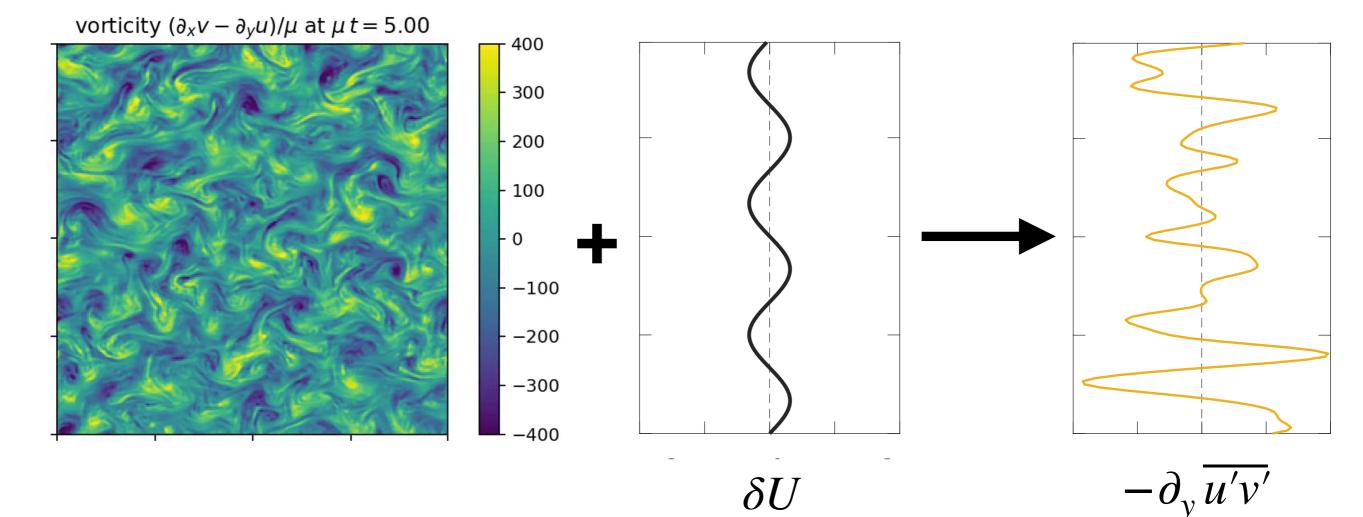


homogeneous turbulence with stationary second-order eddy statistics

no mean flow

 $\partial_t U = -\mu U - \partial_v u' v'$

20 independent perturbation realizations



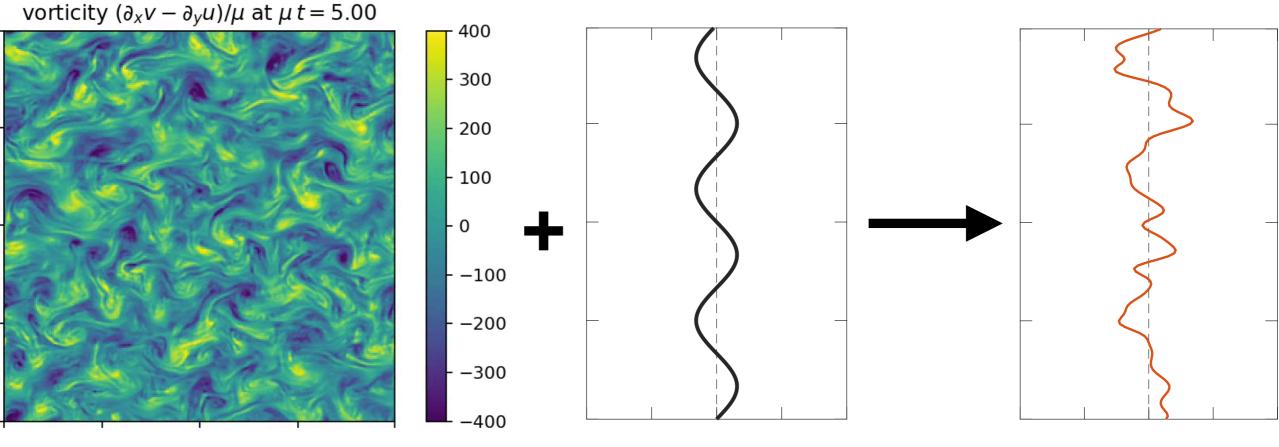
homogeneous turbulence with stationary second-order eddy statistics

infinitesimal zonal jet perturbation

resulting average infinitesimal Reynolds stress divergence

 $\partial_t U = -\mu U - \partial_v u' v'$

200 independent perturbation realizations



 δU

homogeneous turbulence with stationary second-order eddy statistics

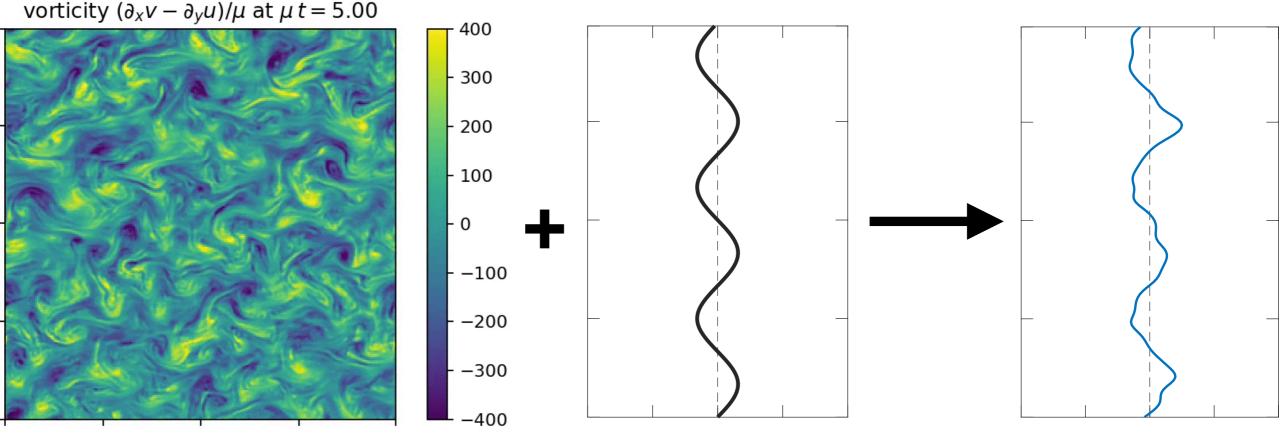
infinitesimal zonal jet perturbation

 $-\partial_y \overline{u'v'}$

resulting average infinitesimal Reynolds stress divergence

 $\partial_t U = -\mu U - \partial_v u' v'$

2000 independent perturbation realizations



 δU

homogeneous turbulence with stationary second-order eddy statistics

infinitesimal zonal jet perturbation

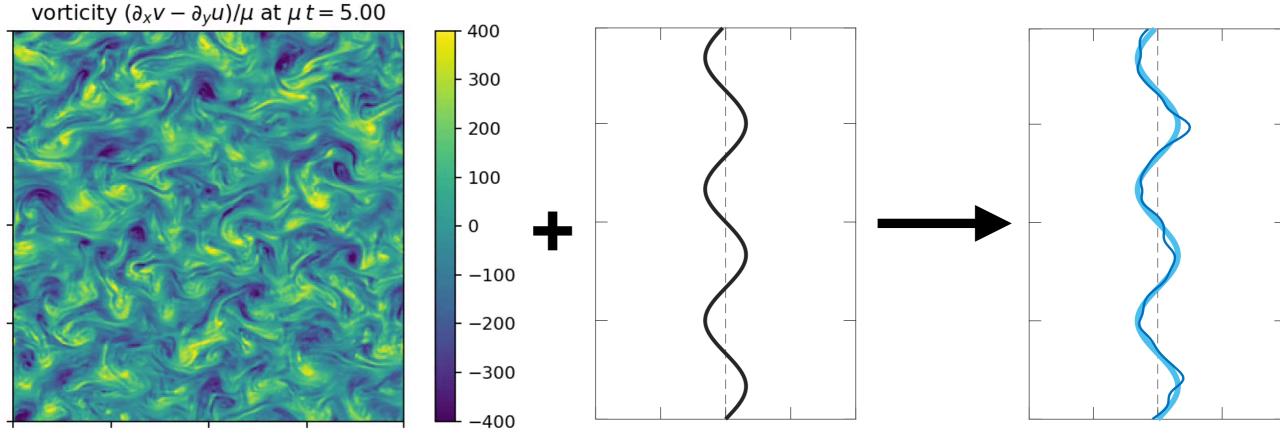
 $-\partial_y \overline{u'v'}$

resulting average infinitesimal Reynolds stress divergence

$$\partial_t U = -\mu U - \partial_y \overline{u'v'}$$

2000 independent perturbation realizations

& SSD closure



 δU

 $-\partial_y \overline{\overline{u'v'}}$

resulting average infinitesimal Reynolds stress divergence

homogeneous turbulence with stationary second-order eddy statistics

infinitesimal zonal jet perturbation

how does this flow-forming instability manifest?

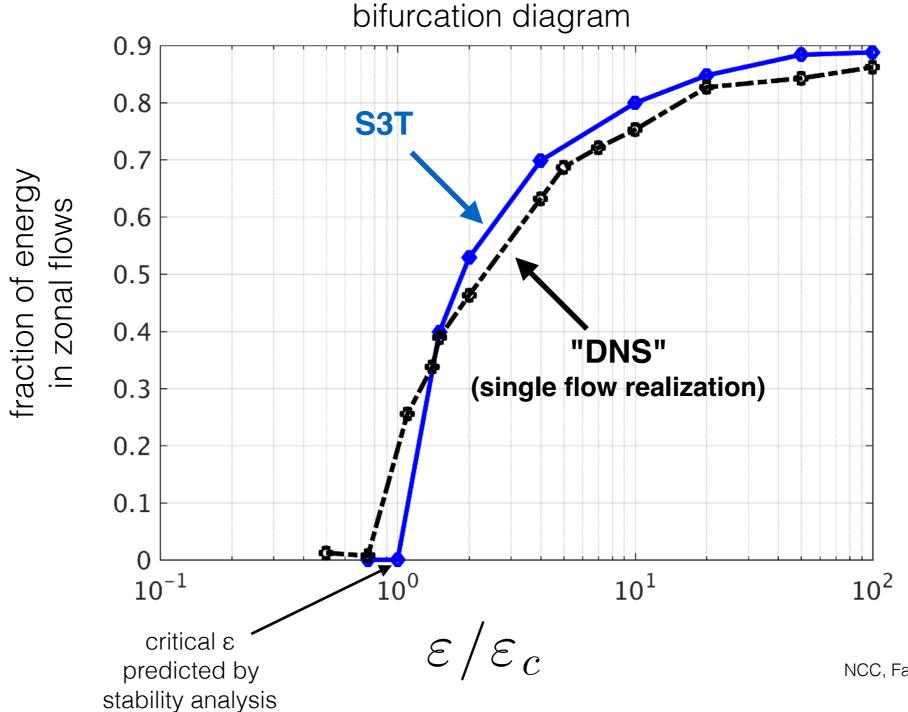
the jet organizes the turbulent field so that it produces Reynolds stresses that reinforce *the very jet itself* !

this is a very robust process; not only in jet formation



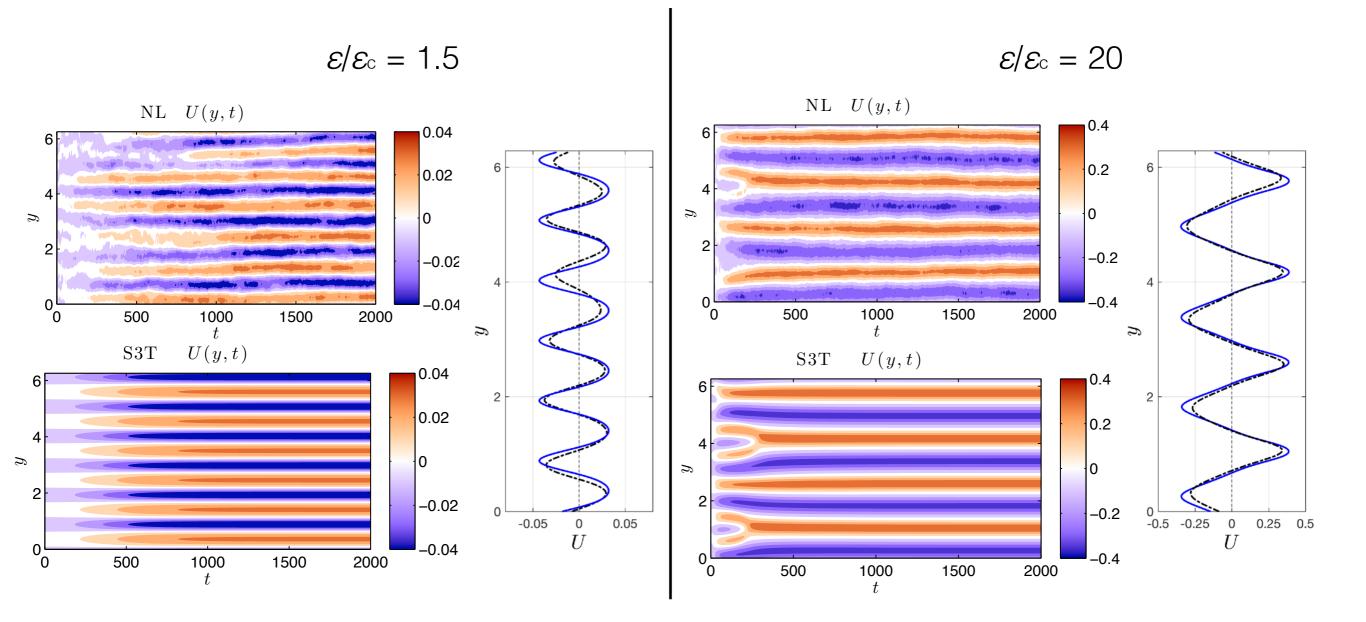
verification of S3T predictions for the jet formation bifurcation





NCC, Farrell & Ioannou 2014

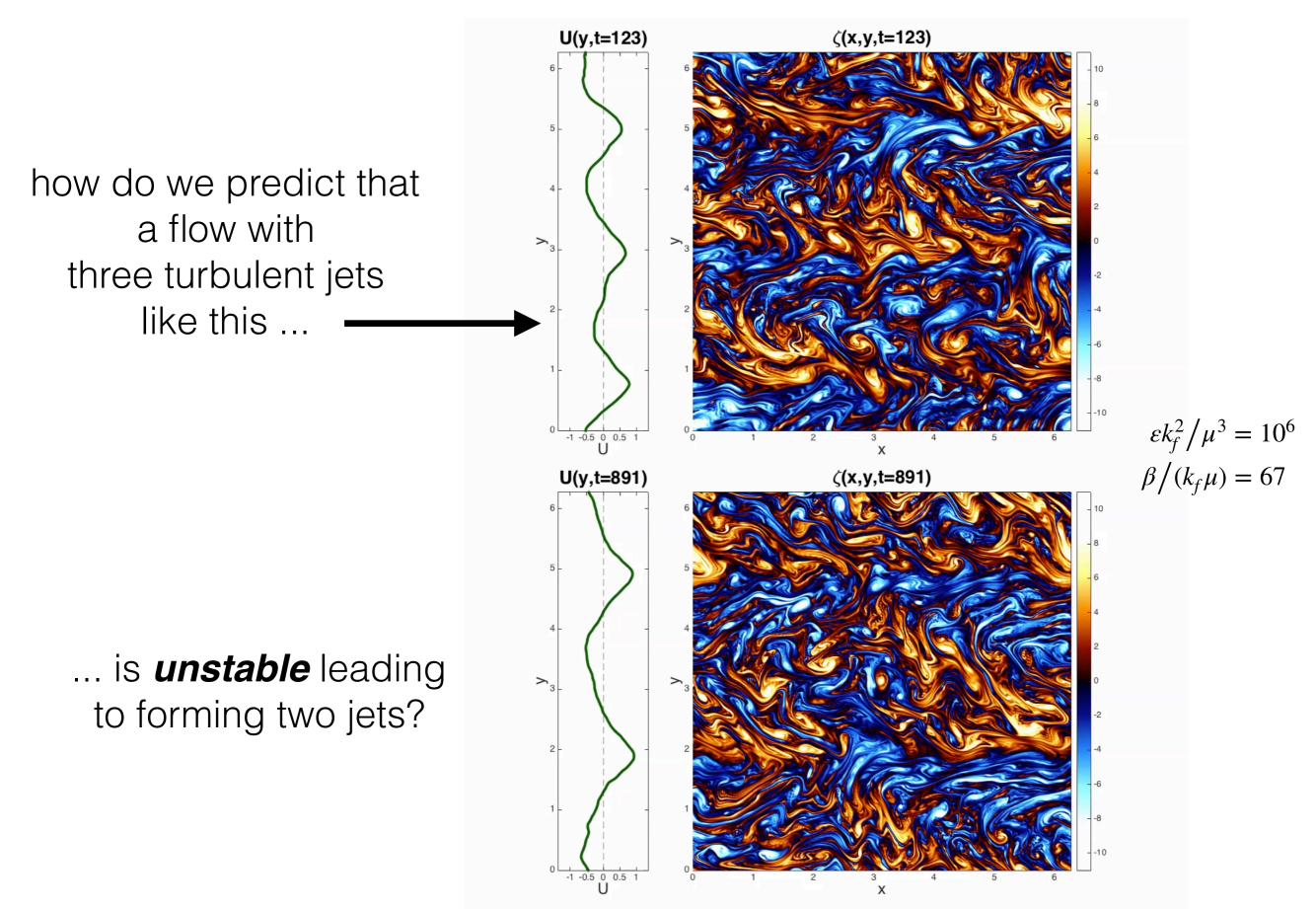
verification of the S3T predictions for the structure of the finite amplitude jet equilibria



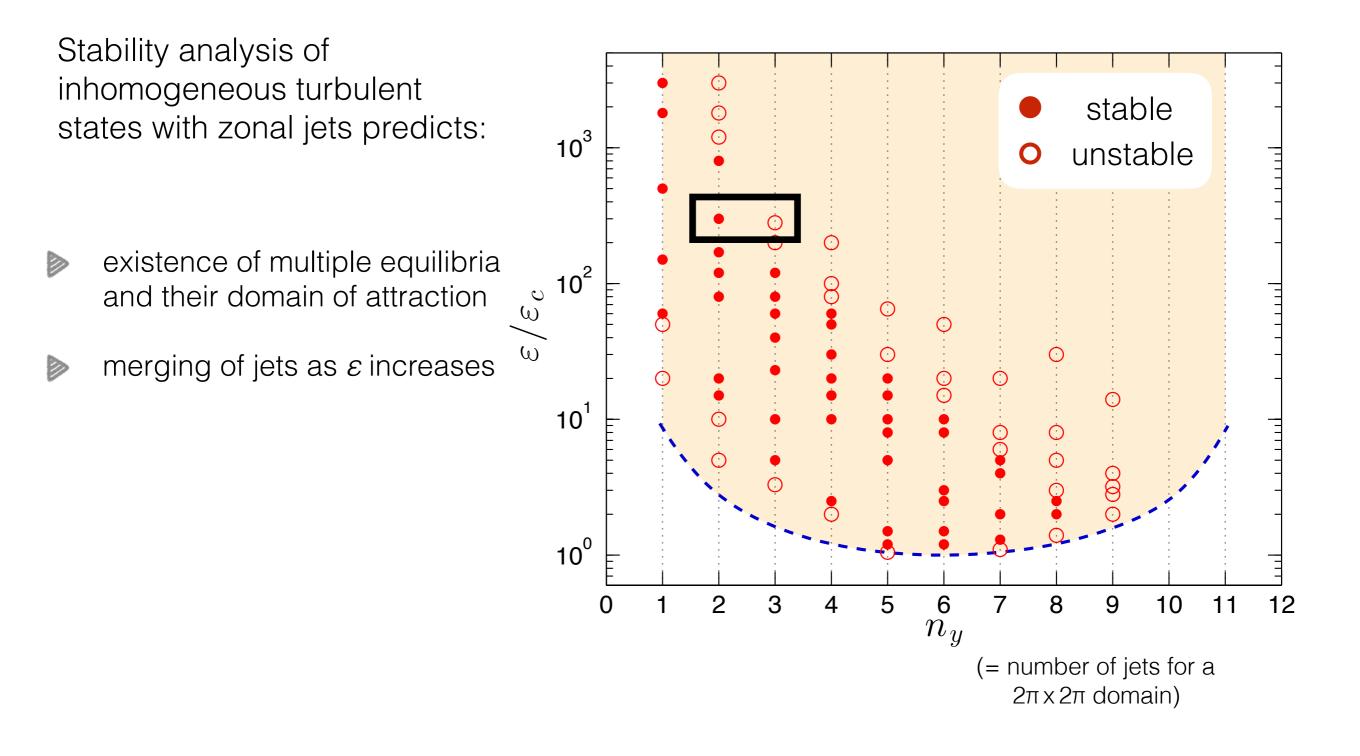
S3T instabilities grow and reach finite amplitude to produce new inhomogeneous S3T equilibria

NCC, Farrell & Ioannou 2014

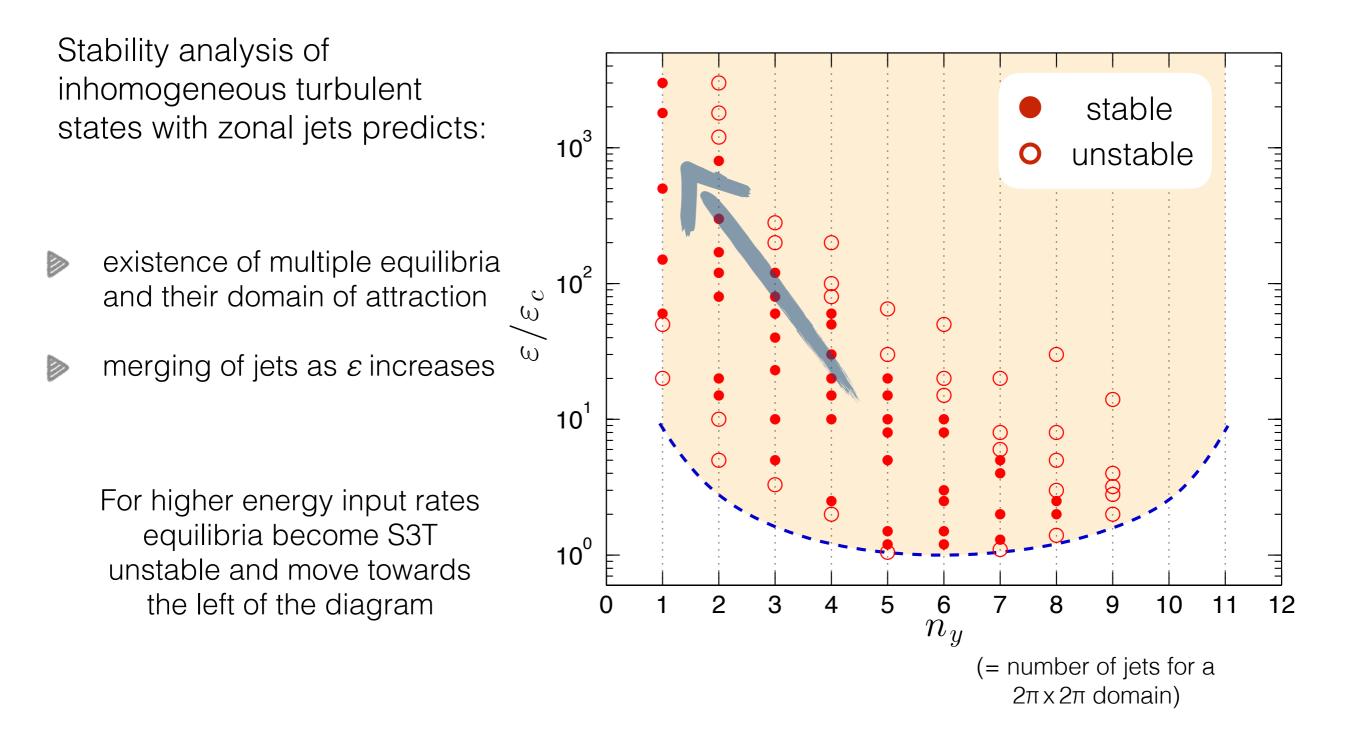
what more can we do?



stability of zonal jet S3T equilibria to zonal jet perturbations



stability of zonal jet S3T equilibria to zonal jet perturbations



streak-roll formation & SSP in wall-bounded turbulence

I'll touch briefly on these topics:

Single realizations of the 2nd-order SSD closure captures the essence of DNS turbulence [RNL models (see Dennice's talk), i.e., DNS with eddy-eddy→ eddy nonlinearity suppressed]

Farrell et al. 2012; NCC et al. 2014b; Thomas et al. 2014, 2015; Bretheim et al. 2015; Farrell et al 2016; Farrell, Gayme, & Ioannou 2017; Bretheim, Meneveau, & Gayme 2018

Identified the roll-streak formation in pre-transitional free-stream Couette turbulence

Farrell, Ioannou, & Nikolaidis 2017

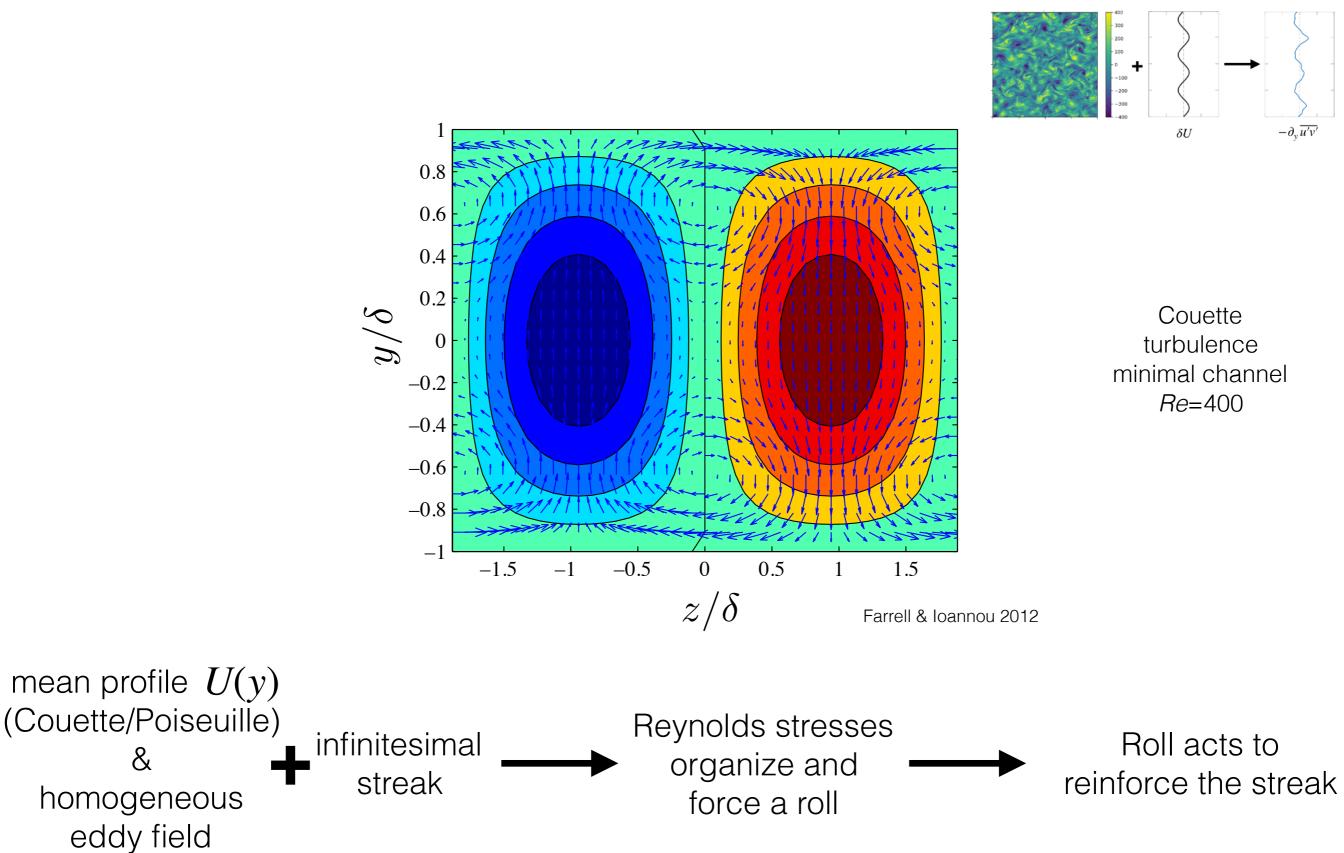
III.

Identified the structures responsible for closing the loop in the SSP [active Lyapunov vectors identified by RNL]

Farrell, Ioannou, & Nikolaidis 2018 CTR

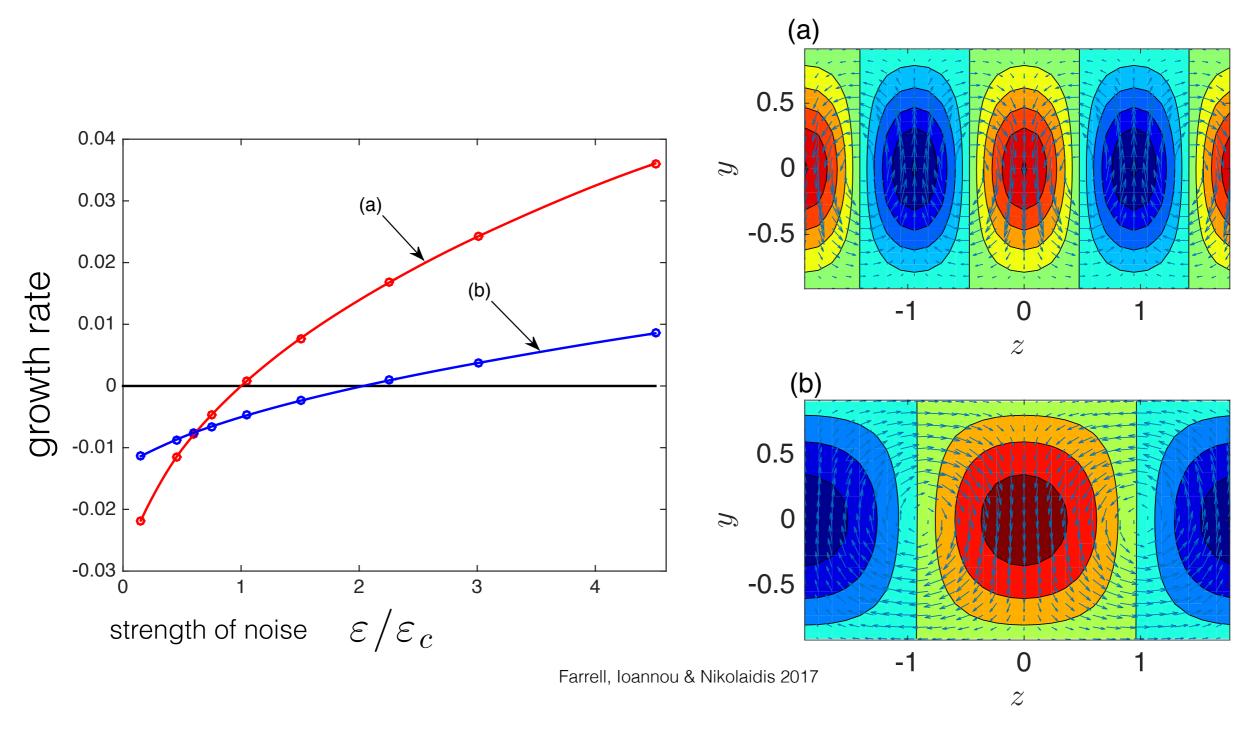
streaks organize the turbulent stresses in such manner to reinforce themselves...

II.



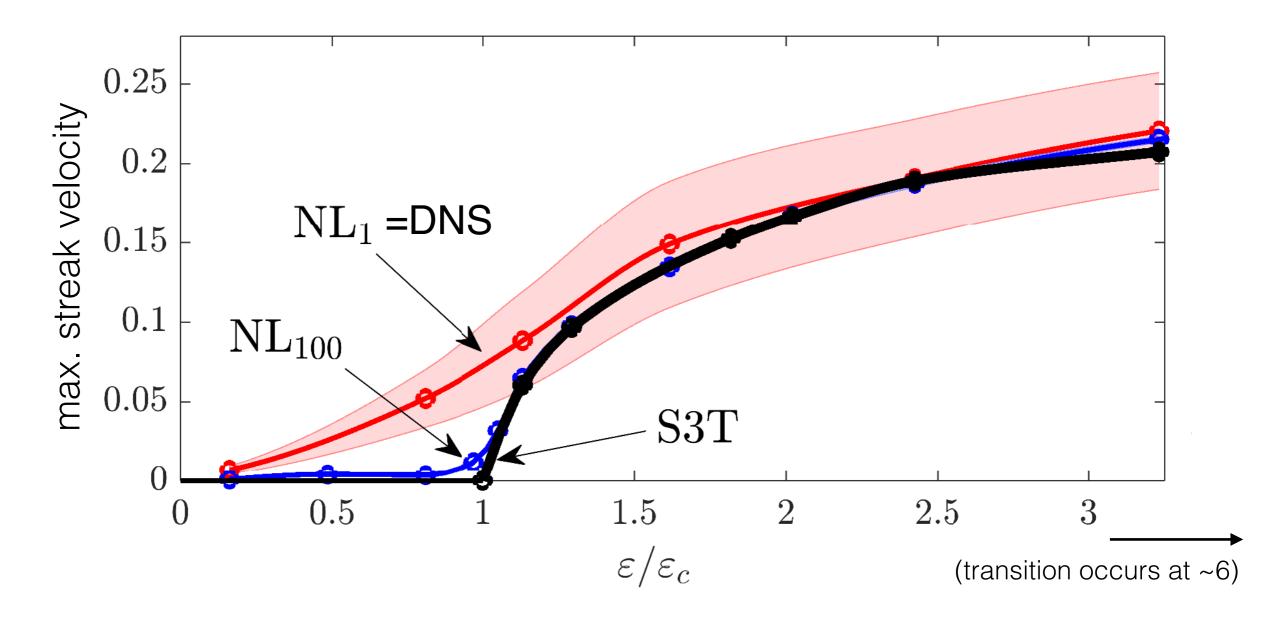
eigenvalues/eigenmodes of the least stable S3T roll/streak modes

II.



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

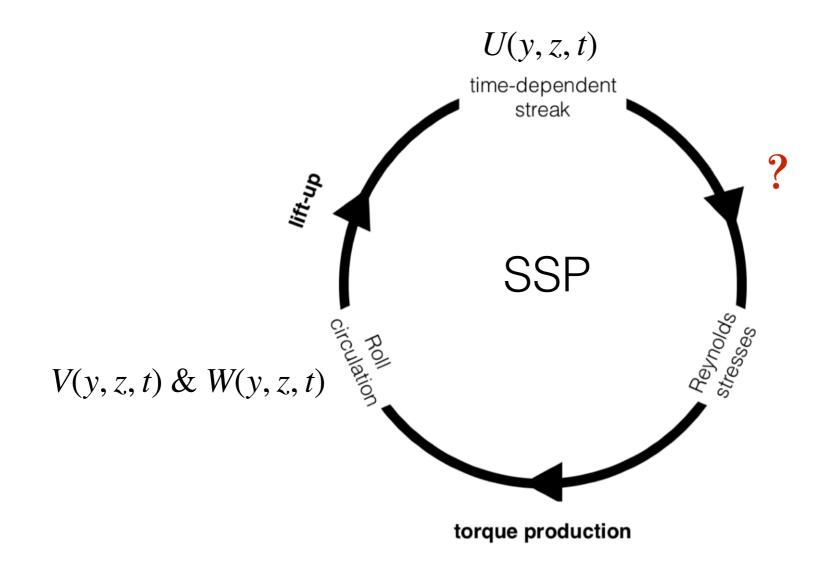
bifurcation structure



Farrell, Ioannou & Nikolaidis 2017

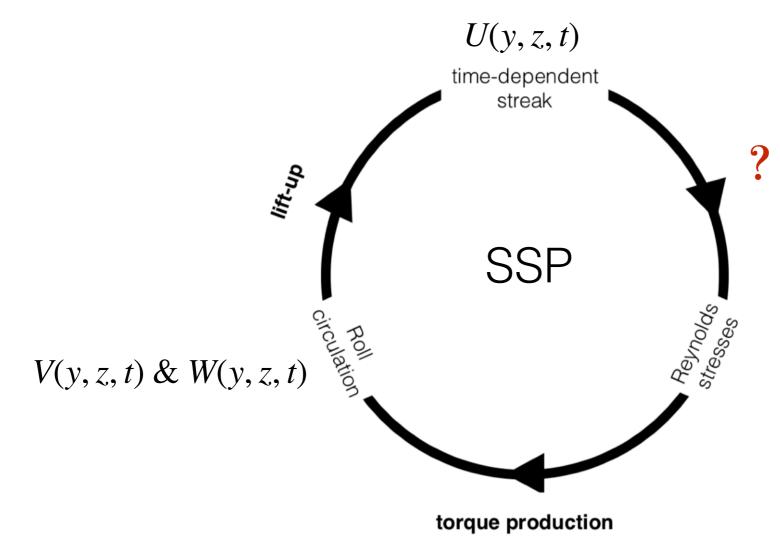
minimal channel *Re*=400

closing the loop in the SSP



III.

closing the loop in the SSP



In RNL the only way energy can transfer from the mean flow to the perturbations is through the parametric instability of the time-dependent streak

Farrell, & Ioannou (2017) PRF, 2 (8), 084608

Is this the case in DNS?

III. closing the loop in the SSP

1. Run DNS

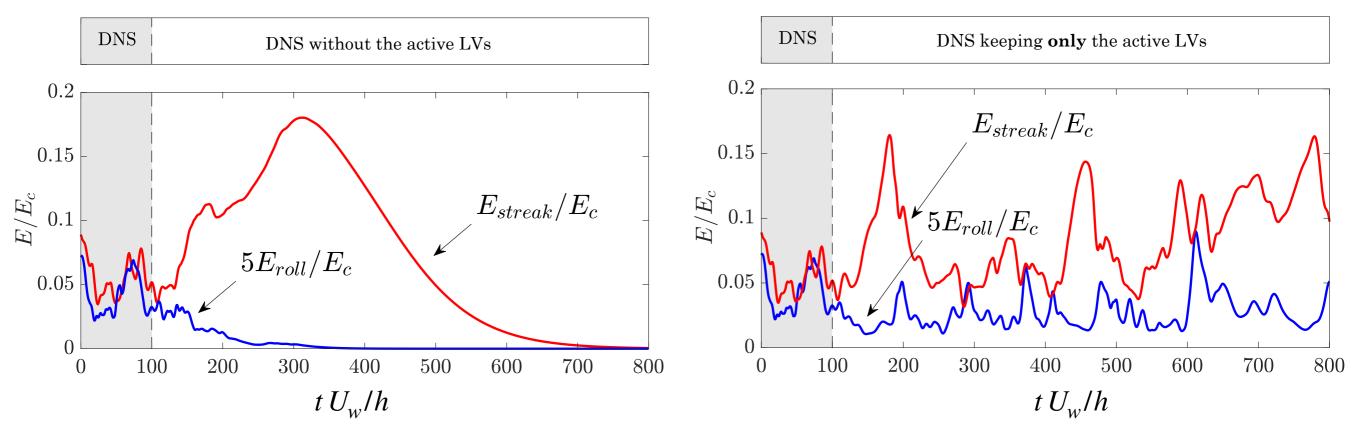
2. Take the U(y, z, t) from DNS and compute the Lyapunov vectors 3. Go back to DNS and project-out the active LVs from perturbations (continuously)

closing the loop in the SSP

1. Run DNS

III.

2. Take the U(y, z, t) from DNS and compute the Lyapunov vectors 3. Go back to DNS and project-out the active LVs from perturbations (continuously)



Couette turbulence at *Re*=600

4 active LVs in this case containing ~20% of the perturbation energy

Conclusions

- Perturbation S3T generalizes the hydrodynamic stability theory of Rayleigh to study stability of statistical equilibria of turbulent flows.
- Emergence of coherent structures in turbulence is predicted analytically and understood to result from instability of the turbulent state.

SSD provides analytical methods for studying dynamics and understanding mechanism in turbulent flows.

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