Self-organization of planetary turbulence What can we learn by studying the statistical state dynamics

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# Turbulent flows are organized into vortices and jets



(Richards et al 2006)

#### Jets appear "steady" as rock...



Vasavada & Showman 2005

# Simplest model: barotropic flow on a beta-plane

Simplest setting

non-divergent flow in a doubly periodic β-plane channel

β-plane channel : 
$$f = 2\Omega \sin\theta \approx 2\Omega \sin\theta_0 + 2\Omega \cos\theta_0 (\theta - \theta_0) = f_0 + \beta y$$

$$\zeta = \partial_x v - \partial_y u = \Delta \psi \qquad \qquad \left(\partial_t + \vec{u} \cdot \nabla\right) \zeta + \beta v = -r\zeta - v\nabla^4 \zeta + \xi(t)$$



Spatially homogeneous forcing that is delta-correlated in time

$$\left\langle \xi(x_1, y_1, t_1) \xi(x_2, y_2, t_2) \right\rangle = \delta(t_1 - t_2) \Xi(x_1, x_2, y_1, y_2)$$
  
$$\Xi(x_1, x_2, y_1, y_2) = \Sigma \widehat{\Xi}(k_1) e^{ik(x_1 - x_2) + il(y_1 - y_2)}$$



• Isotropic forcing injecting energy at rate  $\varepsilon$  in a narrow ring at  $K_f$ 

$$K_f = 10$$
 ,  $\Delta K_f = 1$  ,  $\beta = 10$  ,  $r = 0.01$  ,  $v = 10^{-6}$ 

#### Two regime transitions in the flow



#### Two regime transitions in the flow



## Non-zonal westward propagating coherent structures



#### Two regime transitions in the flow

![](_page_7_Figure_1.jpeg)

# Zonal jets emerge, NZCS persist but slow down

![](_page_8_Figure_1.jpeg)

#### Jet merging & asymmetric jet structure

![](_page_9_Figure_1.jpeg)

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# Our goal

Develop a theory that accurately predicts:

• The regime transitions in the flow (NZCS, jet emergence)

• The characteristics (scale, amplitude, phase speed, form) of the emergent structures

• Captures nuances of the dynamics such as jet merging

### Theory for the statistical state dynamics: S3T

- Stochastic Structural Stability Theory (S3T)
  - Farrell & Ioannou 2003

Related: Cumulant Expansion (CE2) Marston et al. 2008

• Variables : ensemble mean + deviation :  $\zeta = Z + \zeta$ '

$$\left(\partial_{t} + U\partial_{x} + V\partial_{y}\right) \zeta' + \left(\beta + Z_{y}\right) v' + Z_{x} u' = \xi - r\zeta' - v\nabla^{4}\zeta' + \langle \overline{u}' \cdot \nabla \zeta' \rangle - \overline{u}' \cdot \nabla \zeta'$$
$$\left(\partial_{t} + U\partial_{x} + V\partial_{y}\right) Z + \beta V = -\partial_{x} \langle u'\zeta' \rangle - \partial_{y} \langle v'\zeta' \rangle - rZ - v\nabla^{4}Z$$

#### Second order closure of the cumulant expansion

$$\left( \partial_{t} + U \partial_{x} + V \partial_{y} \right) \mathbf{Z} + \beta V = - \partial_{x} \langle u' \zeta' \rangle - \partial_{y} \langle v' \zeta' \rangle - r \mathbf{Z} - v \nabla^{4} \mathbf{Z}$$

evolution of 1<sup>st</sup> cumulant  $Z = \langle \zeta \rangle$ 

$$-\partial_{x} \langle u'\zeta' \rangle - \partial_{y} \langle v'\zeta' \rangle = F(C)$$

$$C = \langle \zeta_{1}'\zeta_{2}' \rangle, \quad \zeta_{i}' = \zeta'(x_{i}, y_{i}, t)$$

$$\frac{dZ}{dt} = -\left(U\partial_x + V\partial_y\right)Z - \beta V - rZ - \nu \nabla^4 Z + F(C)$$

$$\partial_{t}\zeta_{i}' = A_{i}\zeta_{i}' + \xi_{i} + \langle \overline{u}_{i}' \cdot \nabla \zeta_{i}' \rangle - \overline{u}_{i}' \cdot \nabla \zeta_{i}'$$

$$A_{i} = -\left(U_{i}\partial_{x_{i}} + V_{i}\partial_{y_{i}}\right) - \left(\beta + Z_{y_{i}}\right)\partial_{x_{i}}\nabla_{i}^{-2} + Z_{x_{i}}\partial_{x_{i}}\nabla_{i}^{-2} - r - v\nabla_{i}^{4}$$

$$\downarrow$$
evolution of 2<sup>nd</sup> cumulant  $C = \langle \zeta_{1}'\zeta_{2}' \rangle$ 

$$\frac{dC}{dt} = \left(A_{1} + A_{2}\right)C + \Xi + G\left(\langle \zeta_{1}'\zeta_{2}'\zeta_{3}' \rangle\right)$$

$$G = 0 \quad \text{or} \quad G = \Xi' - rC$$

$$\downarrow$$

$$\frac{dC}{dt} = \left(A_{1} + A_{2}\right)C + \Xi$$

## Examples of S3T equilibria

$$\frac{dC}{dt} = (A_1 + A_2)C + \Xi = 0$$
  
$$\frac{dZ}{dt} = -(U\partial_x + V\partial_y)Z - \beta V - rZ + F(C) = 0$$
  $\rightarrow Z^E, C^E$ 

S3T dynamical system : find fixed points & study their stability

![](_page_13_Figure_3.jpeg)

# Regime transitions in turbulence as an instability

$$\frac{dC}{dt} = (A_1 + A_2)C + \Xi = 0$$
  
$$\frac{dZ}{dt} = -(U\partial_x + V\partial_y)Z - \beta V - rZ + F(C) = 0$$
  $\rightarrow Z^E, C^E$ 

• Linearization: study the evolution of small perturbations in the mean structure  $\delta Z$  and in the eddy statistics  $\delta C$ :

$$\frac{d}{dt} \begin{pmatrix} \delta Z \\ \delta C \end{pmatrix} = L(Z^E, C^E) \begin{pmatrix} \delta Z \\ \delta C \end{pmatrix}$$

turbulent eddies

intensify the mean structure through upgradient vorticity fluxes

organizes the eddies so that the eddy fluxes are reinforced

mean structure

#### Can we address the regime transitions ?

![](_page_15_Figure_1.jpeg)

#### Emergence of structures as a structural instability

$$\begin{array}{c} Z^{E} = 0 \\ C^{E} = \frac{\Xi}{2r} \end{array} \rightarrow \quad \delta Z = e^{in_{x}x + in_{y}y + \sigma t}, \ \delta C = e^{in_{x}(x_{1} + x_{2})/2 + in_{y}(y_{1} + y_{2})/2 + \sigma t} \end{array}$$

• Linearization: study the evolution of small perturbations in the coherent structure  $\delta Z$  and in the eddy statistics  $\delta C$ :

$$\frac{d}{dt} \begin{pmatrix} \delta Z \\ \delta C \end{pmatrix} = L(Z^E, C^E) \begin{pmatrix} \delta Z \\ \delta C \end{pmatrix} \rightarrow \widetilde{\sigma}_{\widetilde{n}, \widetilde{m}} = g\left(\widetilde{\beta}, \widetilde{\varepsilon}\right)$$

$$\widetilde{\sigma} = \frac{\sigma}{r}$$
,  $\widetilde{\beta} = \frac{\beta}{rK_f}$ ,  $\widetilde{\varepsilon} = \frac{\varepsilon K_f^2}{r^3}$ ,  $\widetilde{n} = \frac{n}{K_f}$ 

## Critical curve

![](_page_17_Figure_1.jpeg)

$$\widetilde{\varepsilon}_{t}:\operatorname{Re}\left(\widetilde{\sigma}_{\widetilde{n},\widetilde{m}}\right)=0$$
$$\widetilde{\varepsilon}_{c}=\min_{\widetilde{n},\widetilde{m}}\widetilde{\varepsilon}_{t}$$

### Equilibration of instabilities: emergent structures

![](_page_18_Figure_1.jpeg)

## Are the traveling wave states stable ?

![](_page_19_Figure_1.jpeg)

the finite amplitude traveling wave states become unstable to zonal jets

## Are the zonal jets (mixed states) stable ?

Some analytical progress close to the critical curve

 $U = A(Y,T)e^{imy}$ 

 $\lambda_1 \partial_T A = \lambda_2 A + \lambda_3 \partial_{YY}^2 A - \lambda_4 |A|^2 A$ 

![](_page_20_Figure_4.jpeg)

Parker & Krommes 2013

Eckhaus instability leading to jet mergers !!!

**GL** equation

Numerical progress away from it (stay tuned for Navid)

#### Accurate prediction of regime transition

![](_page_21_Figure_1.jpeg)

nzmf = 
$$\frac{\sum_{k,l:K < K_f} \hat{E}(k,l)}{\sum \hat{E}(k,l)}$$
 - zmf

#### Accurate prediction of scale, amplitude

![](_page_22_Figure_1.jpeg)

#### Accurate prediction of phase speed

![](_page_23_Figure_1.jpeg)

#### Accurate prediction of the second transition

![](_page_24_Figure_1.jpeg)

## Accurate prediction of jet merging & jet structure

![](_page_25_Figure_1.jpeg)

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#### Take home messages...

Using S3T, we are able to accurately predict:

• The regime transitions in the flow with the emergence of non-zonal westward propagating coherent structures and the emergence of zonal jets

• The scale, amplitude and phase speed of the emergent coherent structures in the turbulent flow

• Even nuances of the dynamics such as jet mergers

Navid will talk about how within the S3T framework we can shed light into the eddy-mean flow dynamics that lead to the emergence of these structures and support them

# Thank you !

Bakas & Ioannou, 2013 : Emergence of large scale structure in planetary turbulence. *PRL*, **110**, 224501

Bakas & Ioannou, 2014 : A theory for the emergence of coherent structures in beta-plane turbulence. *JFM*, **740**, 312-341

Bakas & Ioannou, 2015 : Emergence of non-zonal coherent structures. In Galperin, P. and Read P., eds. *Zonal jets*, Cambridge Univ. Press (subm.)