## Multiscale Approach to the Direct Statistical Simulation of Flows

#### Brad Marston

with Greg Chini (University of New Hampshire) and Steve Tobias (University of Leeds)





# Second-order Cumulant Expansions and Unhappiness

"An alternative procedure which does not suffer this disadvantage consists of deriving a new system of equations whose unknowns are the statistics themselves...."

Edward Lorenz, The Nature and Theory of the General Circulation of the Atmosphere (1967)

"Direct Statistical Simulation" (DSS)

## DSS vs. DNS

Low-order statistics are smoother in space than the instantaneous flow.

Statistics evolve slowly in time, or not at all, and hence may be described by a fixed point, or at least a slow manifold.

Correlations are *non-local* and highly anisotropic and inhomogeneous.

Statistical formulations must respect this.

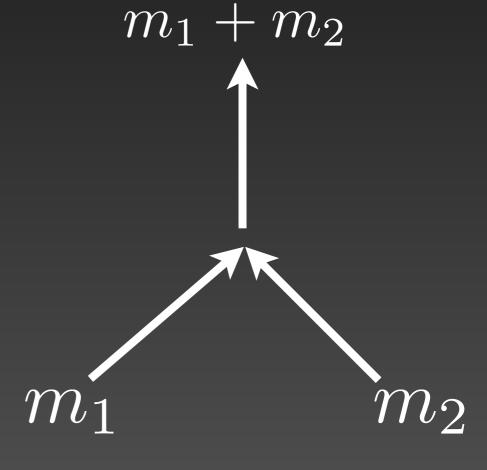
## Barotropic Toy Model of Jets

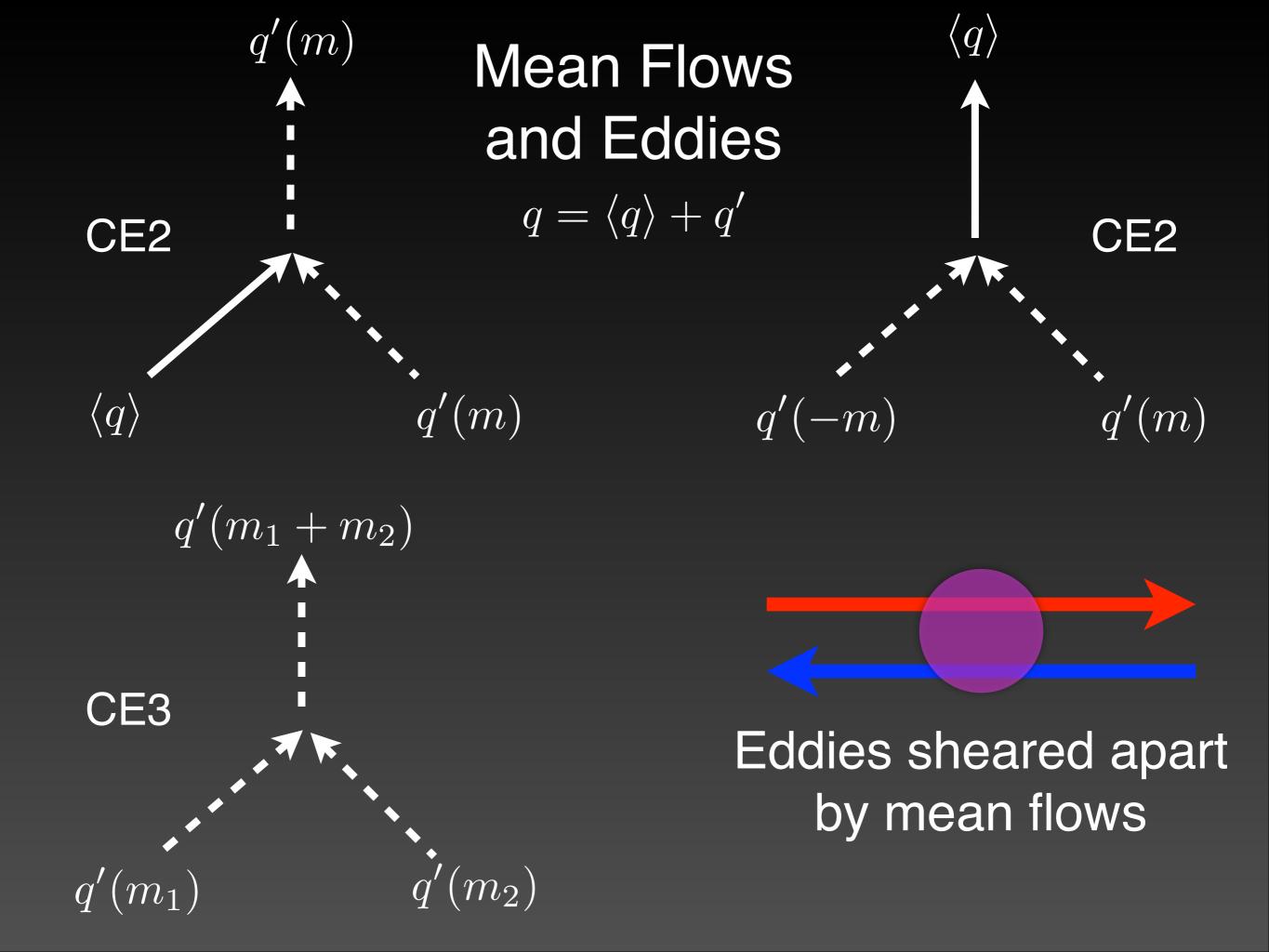
$$\partial_t \zeta + \vec{v} \cdot \vec{\nabla} (\zeta + f) = -\kappa \zeta - \nu_2 \nabla^4 \zeta + \eta$$

$$\zeta = \hat{r} \cdot \vec{\nabla} \times \vec{v}$$

$$f = 2\Omega\sin(\phi)$$

$$\zeta(\theta,\phi) = \sum_{\ell=0}^{L} \sum_{m=-\ell}^{\ell} \zeta_{\ell,m} Y_{\ell}^{m}(\theta,\phi)$$





## **Zonal Averages**

$$\langle q_{\ell_1 m_1} \ q_{\ell_2 m_2} \ q_{\ell_3 m_3} \rangle$$

$$\langle q_{\ell_1 m} \ q_{\ell_2 m}^* \ q_{\ell_3,0} \rangle = \langle q_{\ell_1 m} \ q_{\ell_2 m}^* \rangle \ \langle q_{\ell_3,0} \rangle = c_{\ell_1 \ell_2 m} \ c_{\ell_3}$$

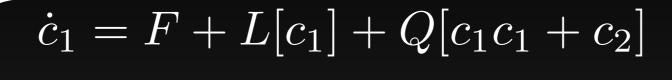
CE2: 
$$\langle q_{\ell_1 m_1} \ q_{\ell_2 m_2} \ q_{\ell_3 m_1 + m_2}^* \rangle = 0 \text{ if } m_1 > 0 \text{ and } m_2 > 0$$

$$\dot{c}_{\ell} = A_{\ell} + B_{\ell;\ell_{1}0} c_{\ell_{1}} + C_{\ell;\ell_{1}m;\ell_{2}m}^{(-)} c_{\ell_{1}\ell_{2}m} 
\dot{c}_{\ell_{1}\ell_{2}m} = 2\Gamma_{\ell_{1}m}\delta_{\ell_{1}\ell_{2}} + B_{\ell_{1};\ell_{m}} c_{\ell\ell_{2}m} + B_{\ell_{2};\ell_{m}} c_{\ell_{1}\ell_{m}} 
+ C_{\ell_{1};\ell_{0};\ell'm}^{(+)} c_{\ell} c_{\ell'\ell_{2}m} + C_{\ell_{2};\ell_{0};\ell'm}^{(+)} c_{\ell} c_{\ell_{1}\ell'm}$$

CE2 pprox SSST (Brian Farrell & Petros Ioannou)

Srinivasan & Young; Parker & Krommes; Tobias & JBM; Bouchet, Nardini & Tangarife; Ait-Chaalal, Schneider & Sabou; ...

### CE3 & CE2.5



$$\dot{c}_2 = L[c_2] + Q[c_1c_2 + c_3] + \Gamma$$

$$\dot{c}_3 = L[c_3] + Q[c_1c_3 + c_2c_2 + c_4]$$

Remove eigenvectors of c2 with negative eigenvalues

$$\dot{c}_3 = L[c_3] + Q[c_1c_3 + c_2c_2] - c_3/\tau$$

CE2.5: 
$$c_3 = \tau Q[c_2 c_2]$$

Demonstration at end of talk (if time)

## A Conservative Approximation

CE2 conserves total angular momentum, energy, and enstrophy in absence of forcing and damping.

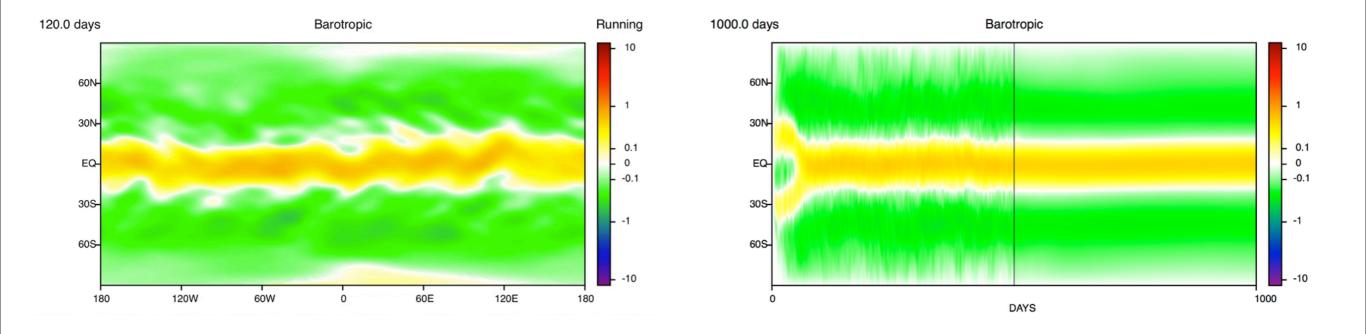
CE3 additionally conserves the 3rd Casimir prior to projection (see poster by Wanming Qi).

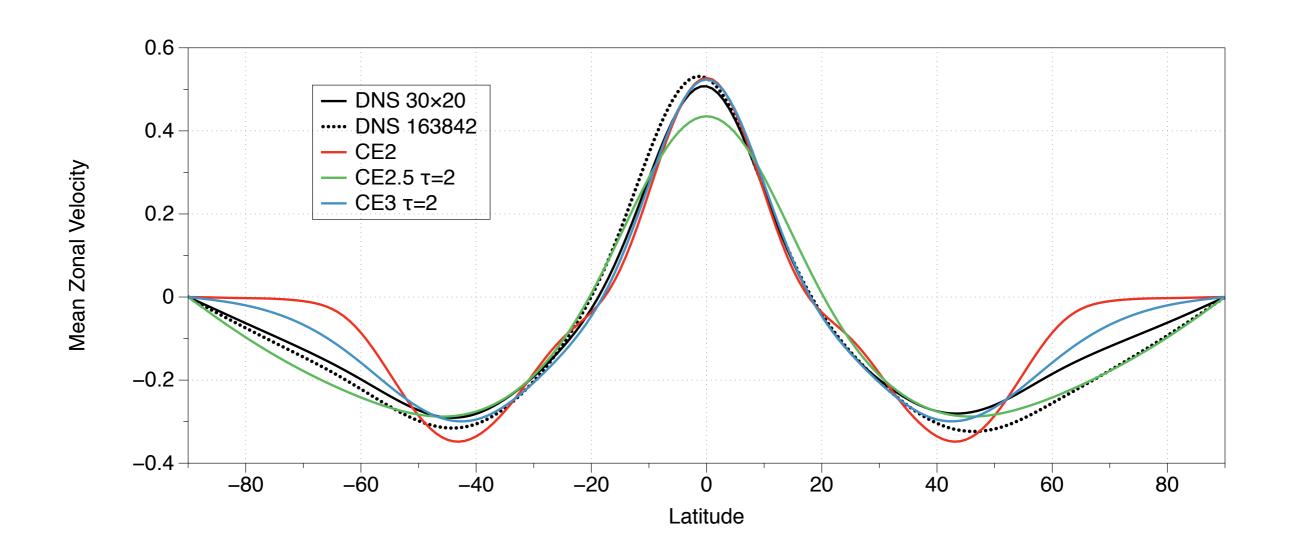
## Realizability

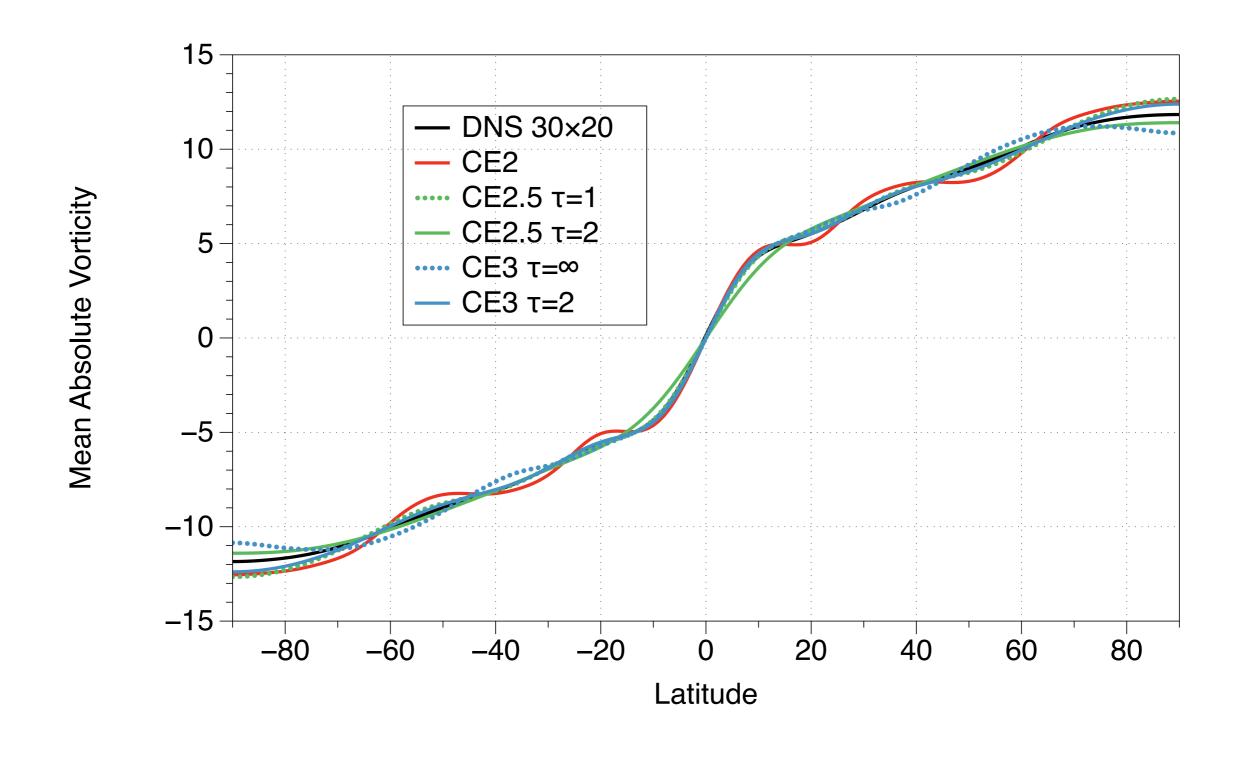
CE2 = Quasilinear = Gaussian PDF = Realizable

CE2.5 = generalized EDQNM = realizable?

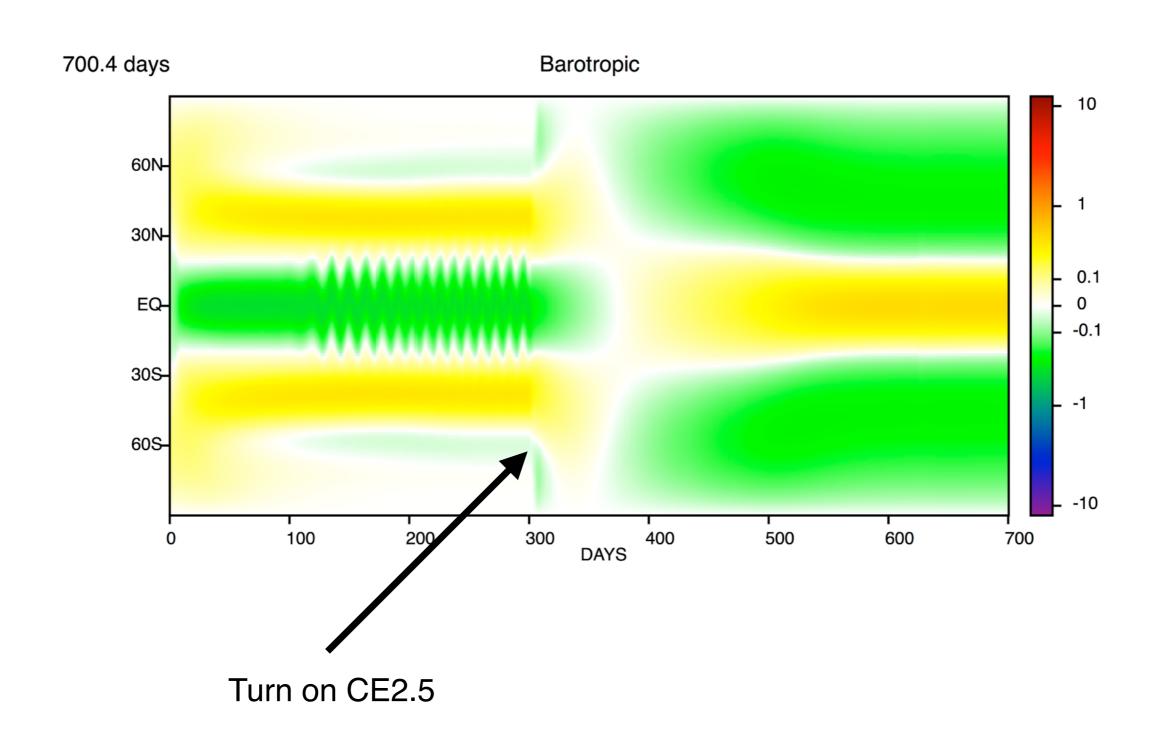
CE3: Not realizable [Kraichnan (1980)]. Fixed this by projecting out offending eigenvectors.







## **Backwards Jet**

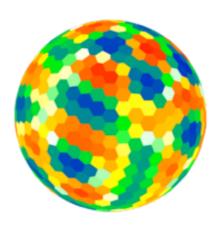


#### Mac App Store Preview

#### **GCM**

#### By Brad Marston

Open the Mac App Store to buy and download apps.



#### **Description**

Idealized General Circulation Models (GCMs) of planetary atmospheres, solved by a variety of methods.

#### **GCM Support**

#### What's New in Version 1.0.4

New wave lifecycle model, better organized menu. Bug fixes to CE3 (now conserves 3rd Casimir) and the calculation of the eddy diffusivity.

#### Free

Category: Education Updated: May 23, 2013

Version: 1.0.4 Size: 1.4 MB Language: English Seller: Brad Marston © 2013 M3 Research

Rated 4+

**Requirements:** OS X 10.8.3 or later, 64-bit processor

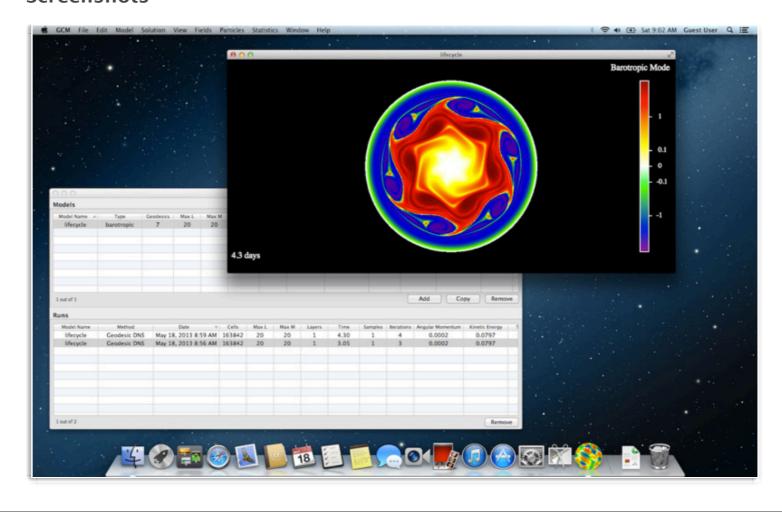
#### **Customer Ratings**

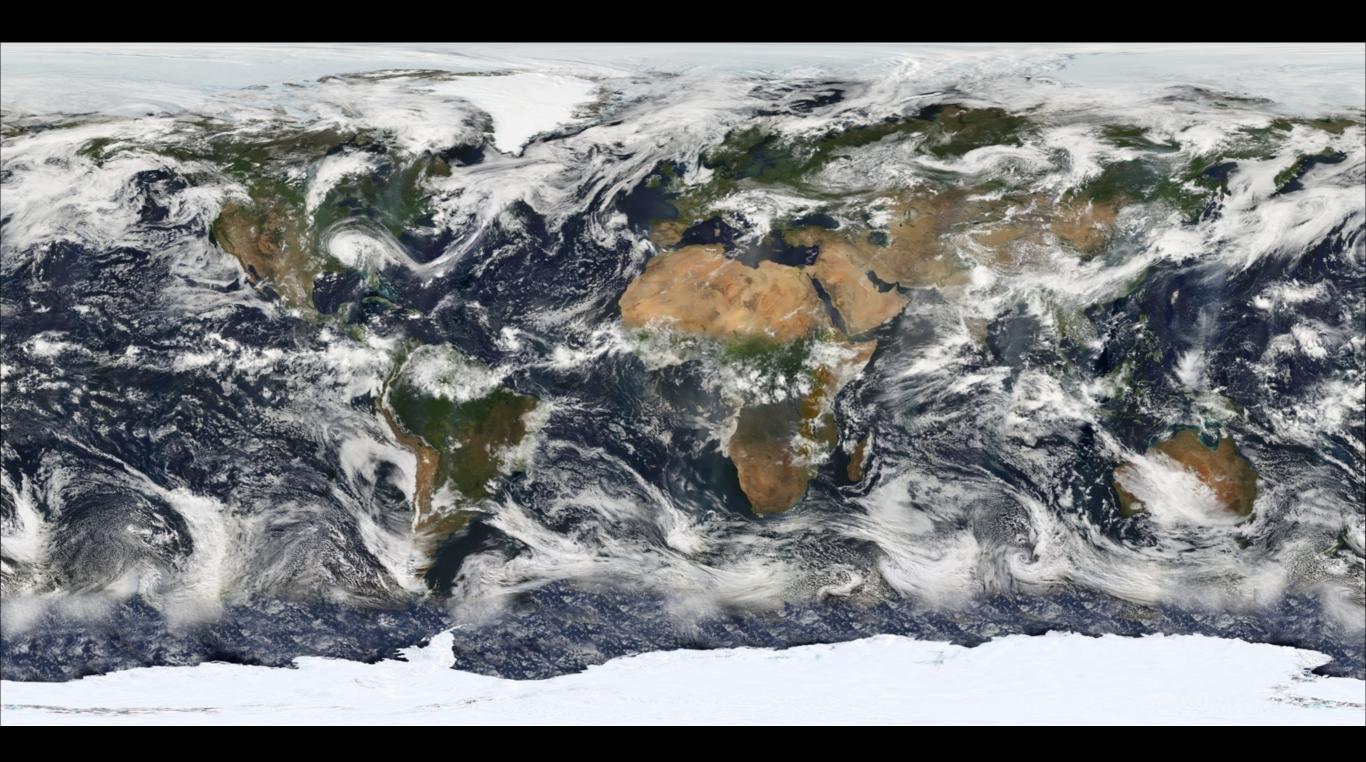
We have not received enough ratings to display an average for the current version of this application.

All Versions:

8 Ratings

#### **Screenshots**





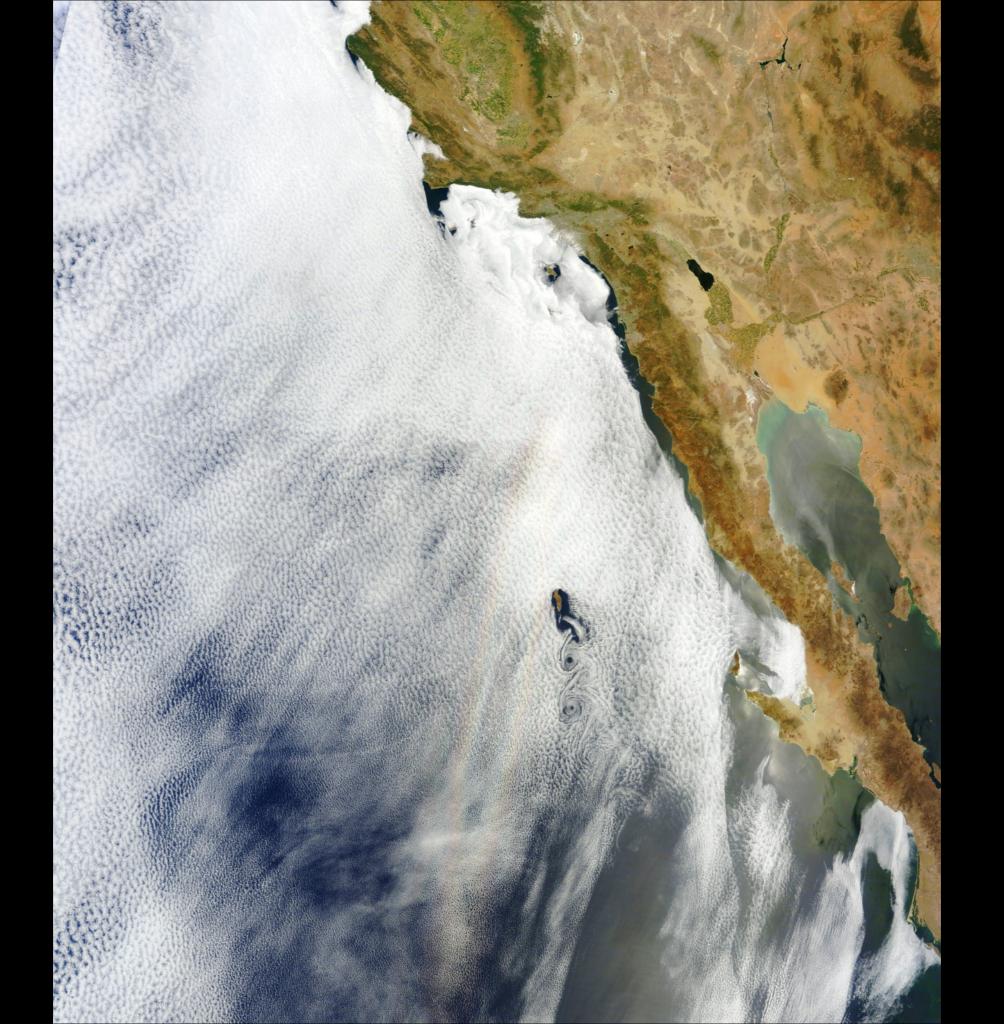


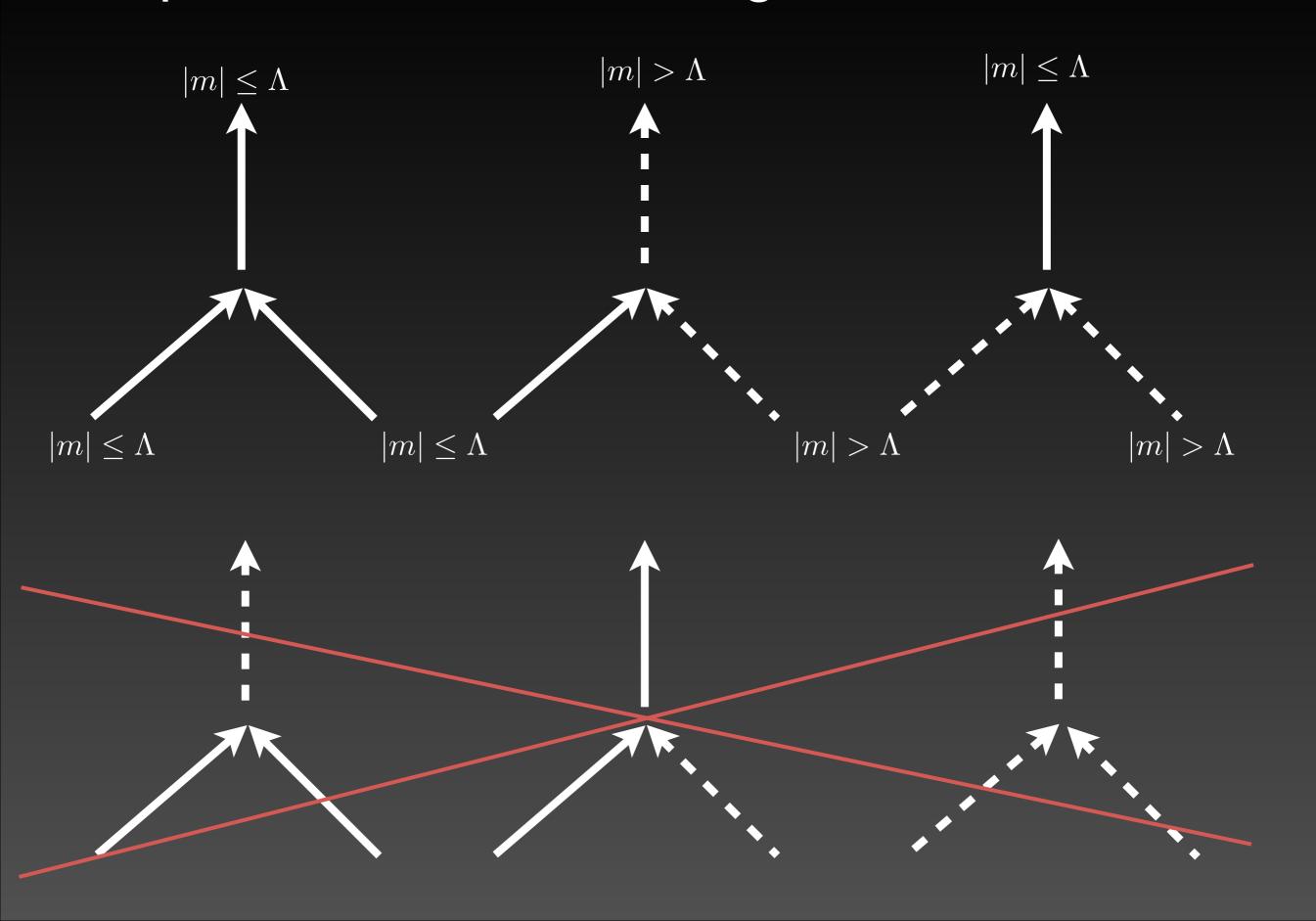
Image: NASA



Image: NASA



## Separate Triads Into Long and Short Scales



## Generalized 2nd Order Cumulant Expansion (GCE2)

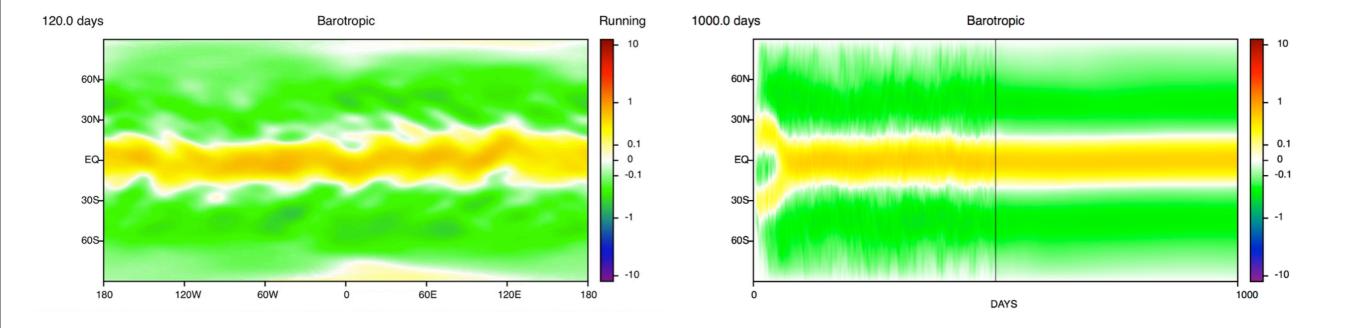
$$\frac{\partial}{\partial t}q = L[q] + Q[q, q]$$

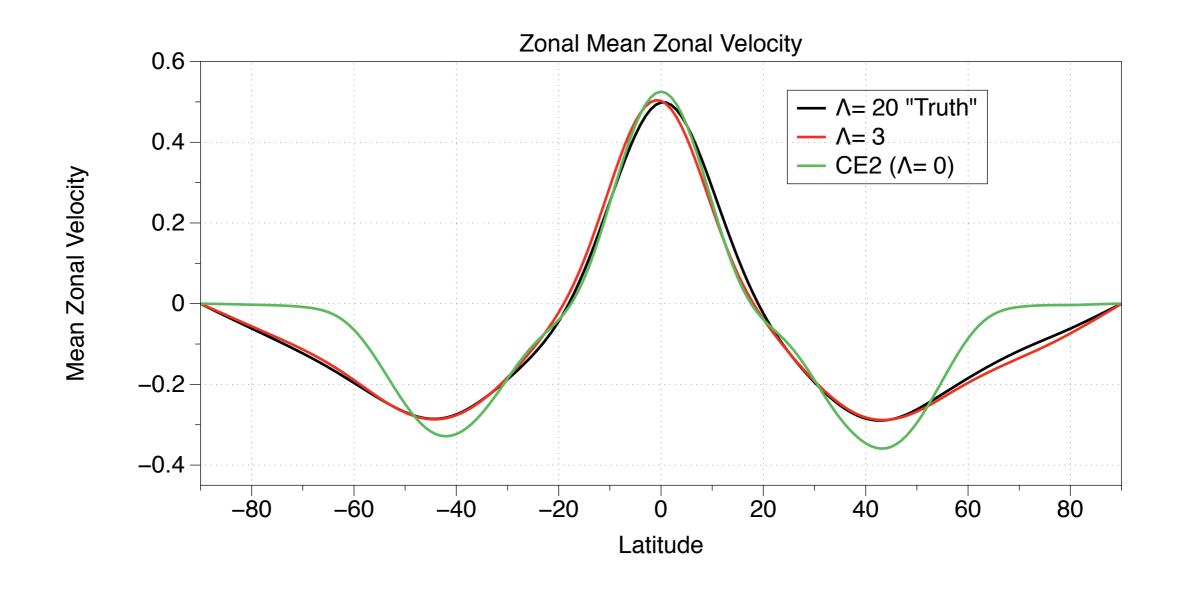
$$q = \ell + h$$

$$\frac{\partial}{\partial t}\ell = Q[\ell, \ \ell] + Q[(h, \ h)] \qquad \frac{\partial}{\partial t}h = Q[\ell, \ h]$$

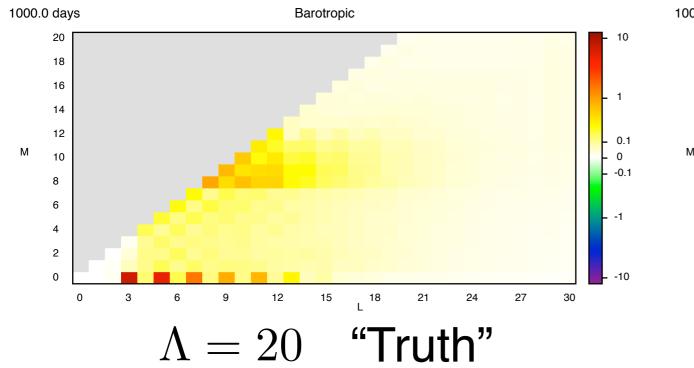
$$\frac{\partial}{\partial t}(h\ h) = 2Q[\ell,\ (h]\ h)$$
 Closure

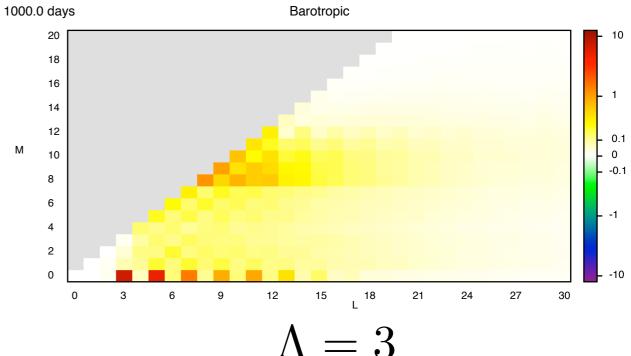
Malecha, Chini, and Julien, J. Comp. Phys. (2013); Bakas and Ioannou, PRL **110**, 224501 (2013)

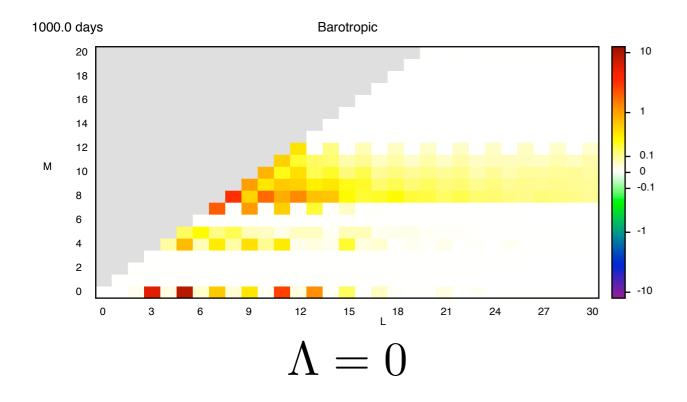




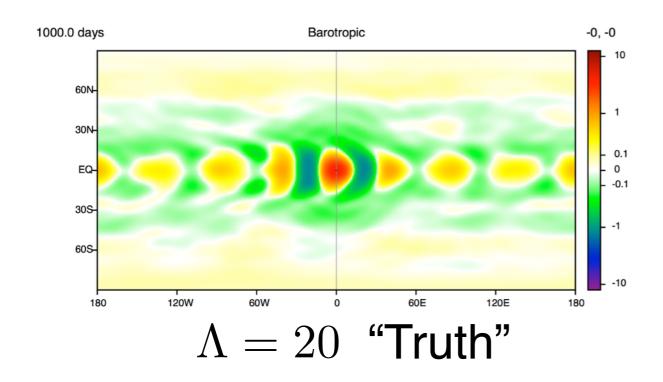
## Vorticity Power Spectra

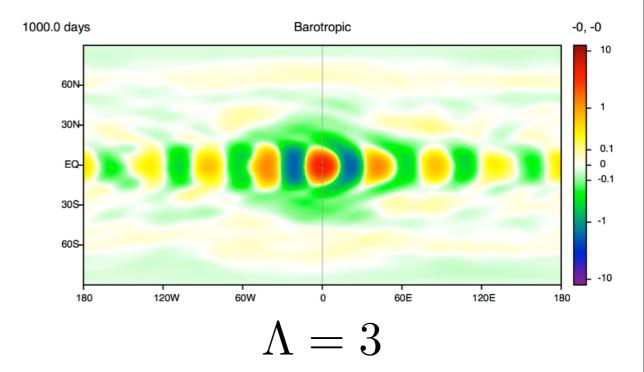


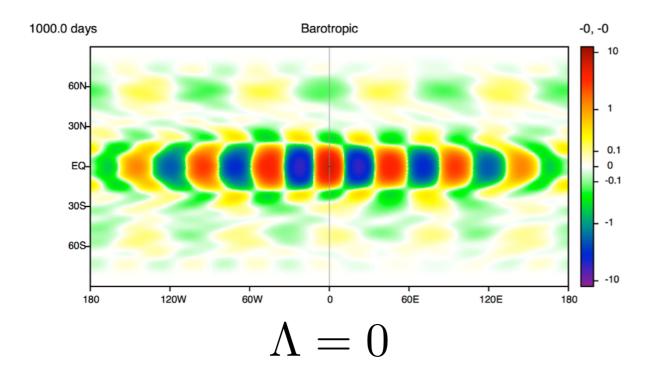




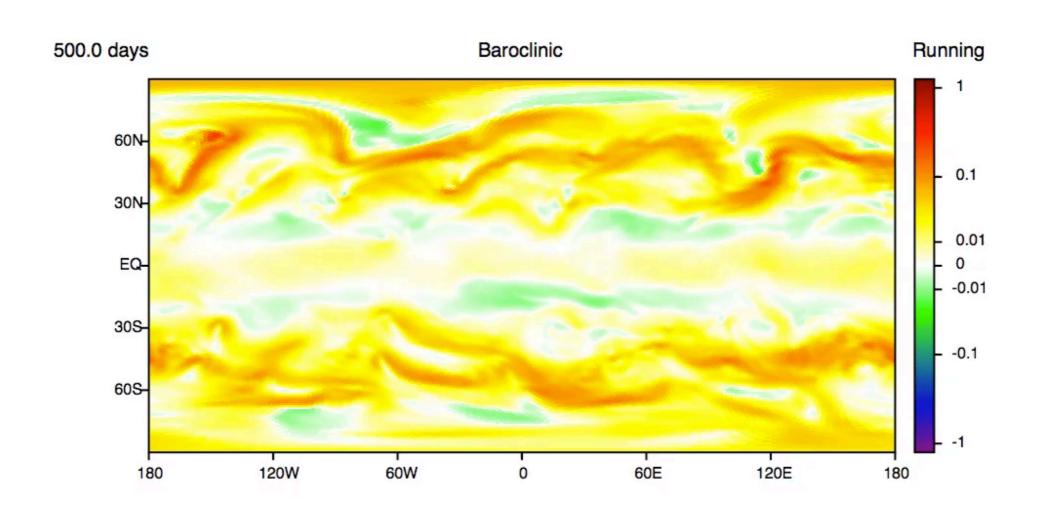
## **Two-Point Vorticity Correlations**

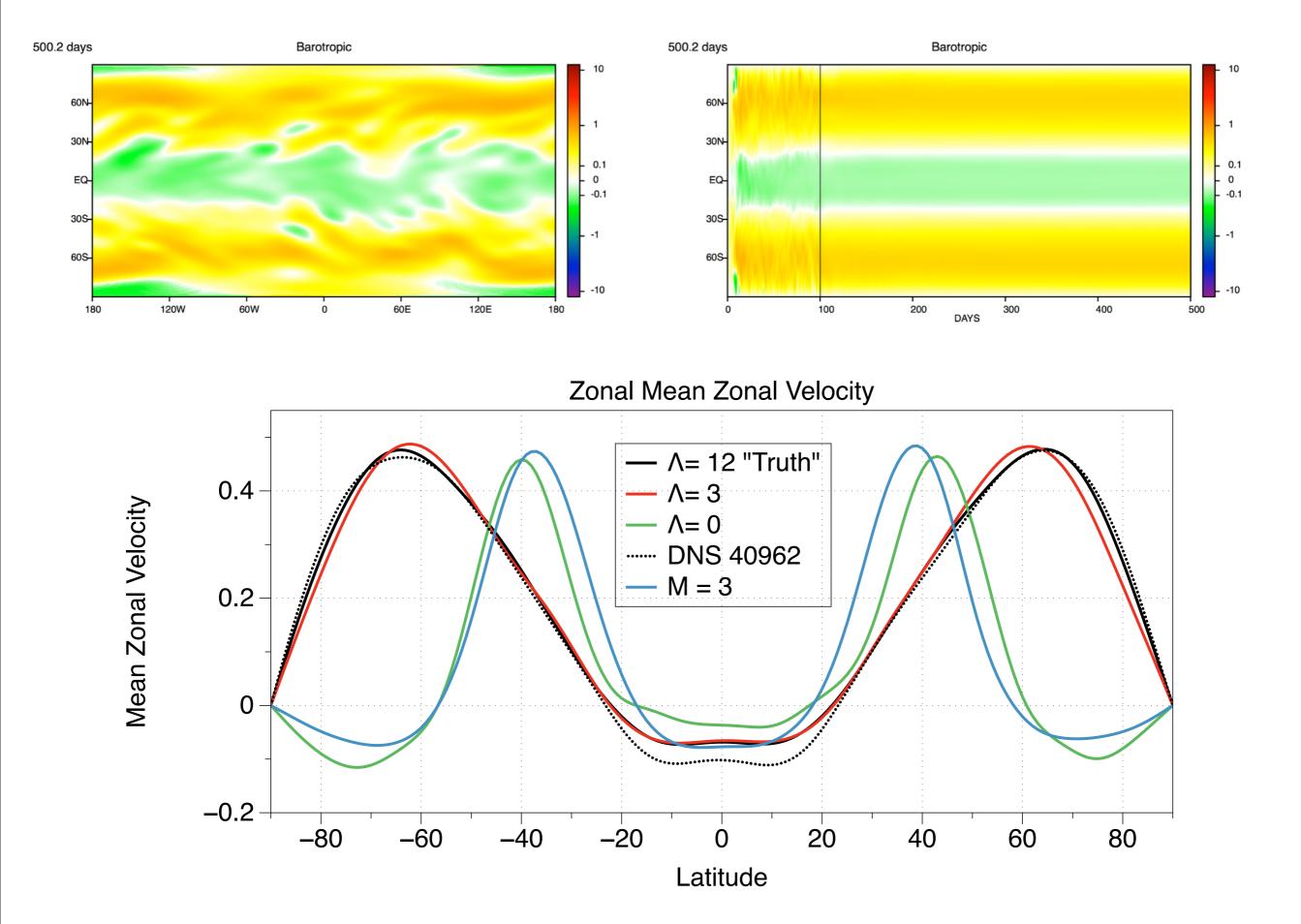




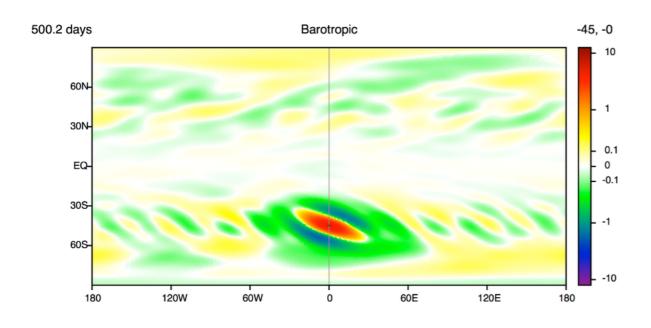


# Two-layer primitive equations: Relaxation to a prescribed equator-to-pole temperature difference

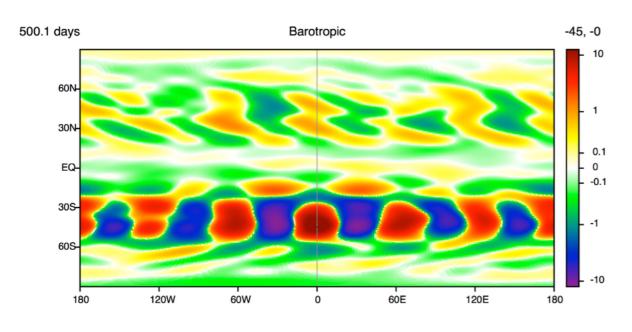


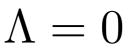


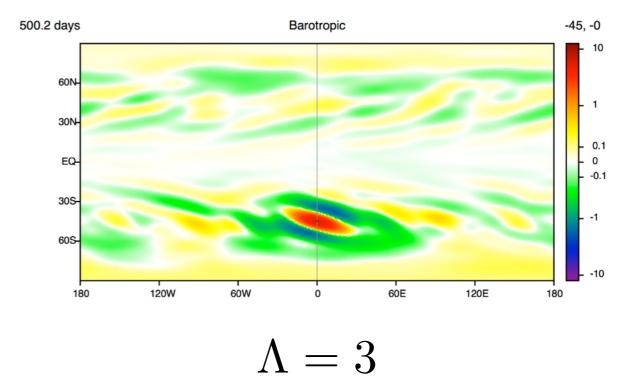
## **Two-Point Vorticity Correlations**



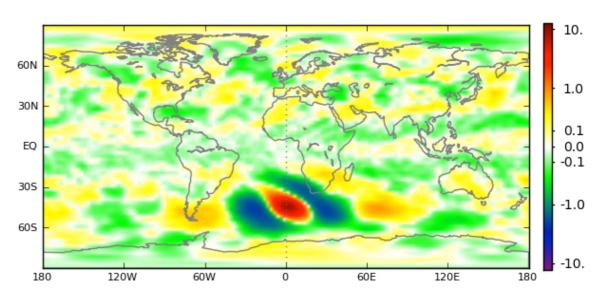
$$\Lambda = 12$$
 "Truth"







### Observation



(Courtesy F. Sabou)

## A Systematic Approximation

Exact in  $\Lambda \to \infty$  limit and often accurate for  $\Lambda = 3$ 

## A Conservative Approximation

GCE2 conserves total angular momentum, energy, and enstrophy in absence of forcing and damping.

## Realizable

GCE2 = Closed under selected triads = Realizable

## Parallelism

Well suited for parallel computation: GPUs / OpenCL