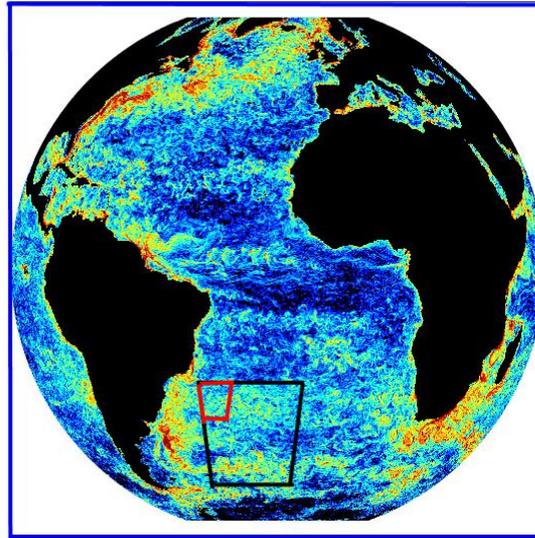


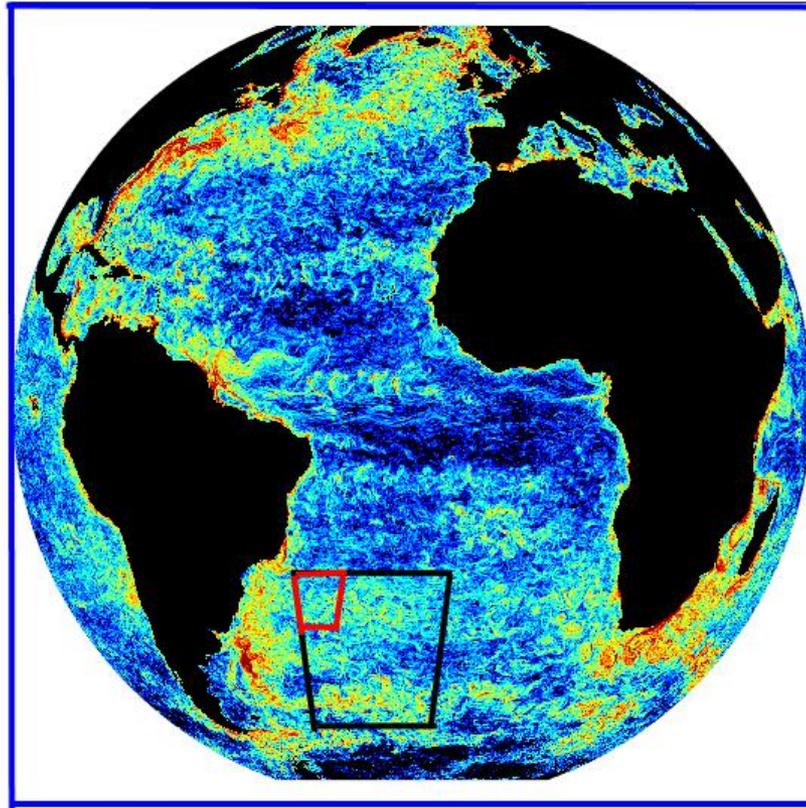
Structure Functions as a Tool for Measuring the Mesoscale

Brodie Pearson
Baylor Fox-Kemper
Jenna Pearson
Brown University



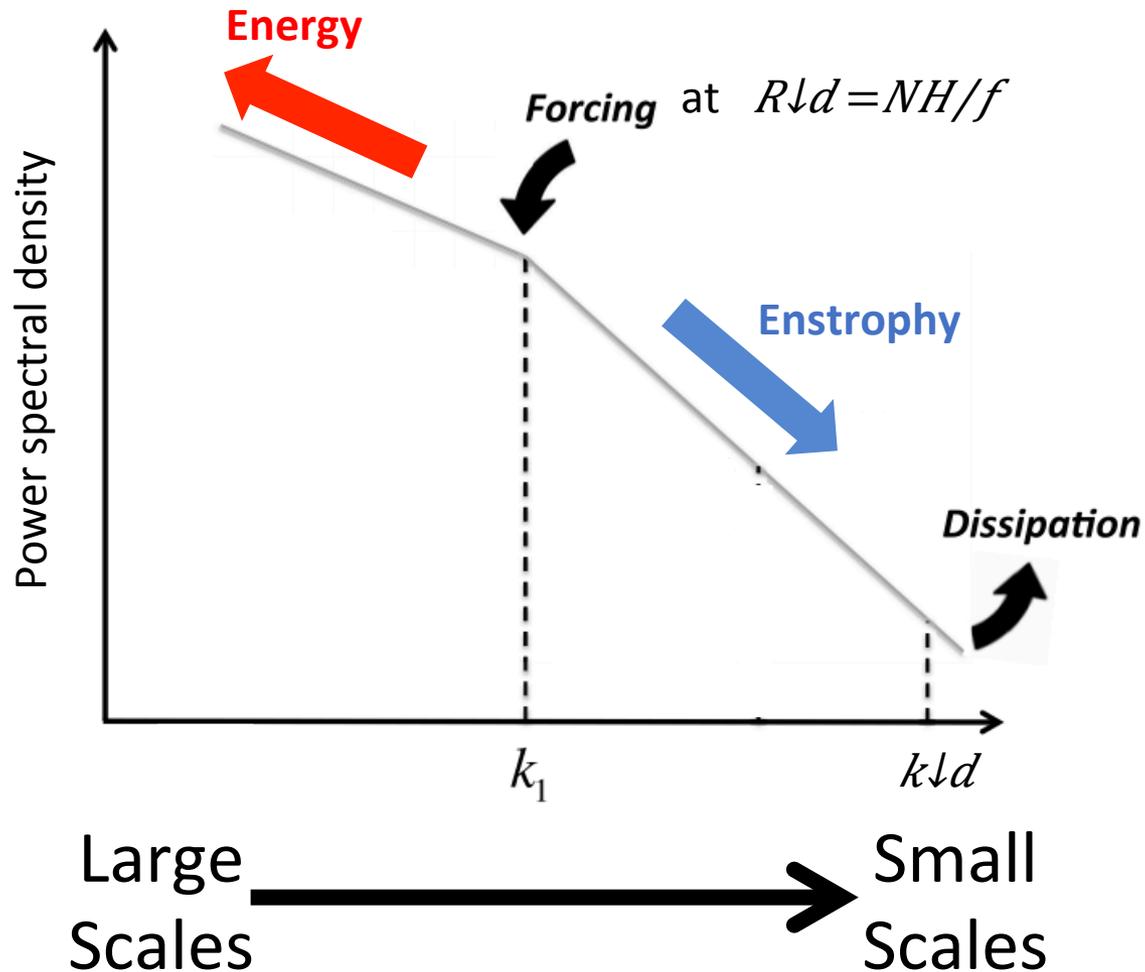
Mesoscale Turbulence

- The dynamics of the ocean are heterogeneous and spatially intermittent, even at small scales

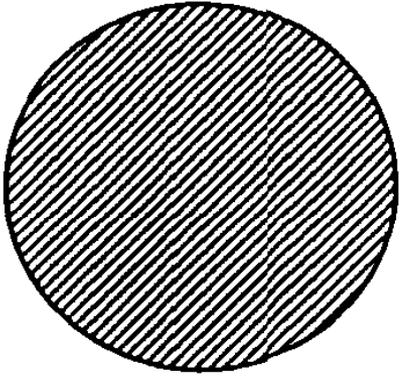


Pearson & Fox-Kemper
Physical Review Letters (2018)

Inertial Cascades



Inertial Cascades

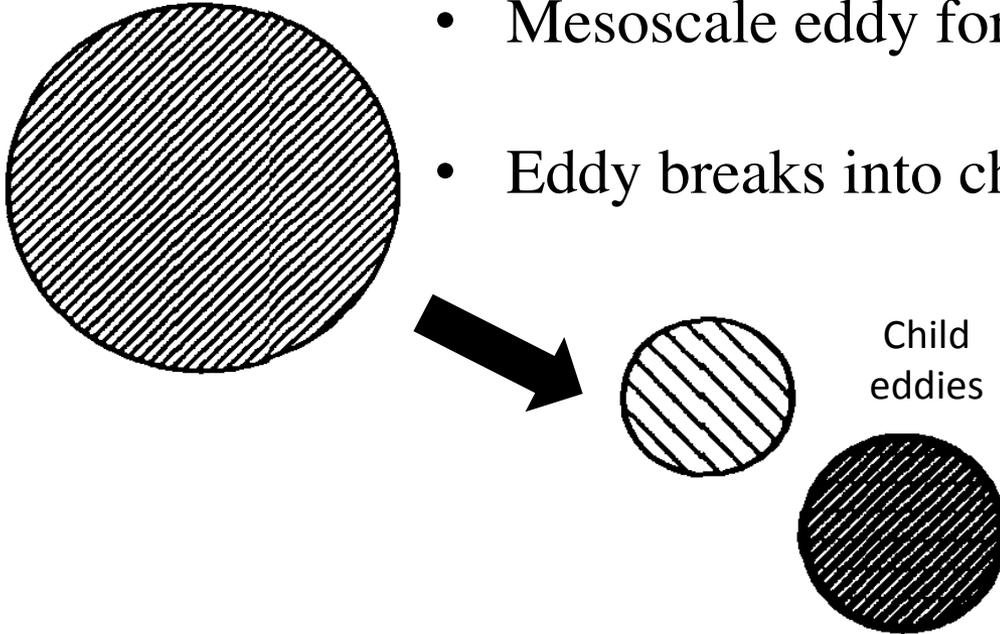


- Mesoscale eddy forced at deformation radius
- Eddy breaks into child eddies conserving properties

Adapted from Meneveau
& Sreenivasan,
JFM (1991)

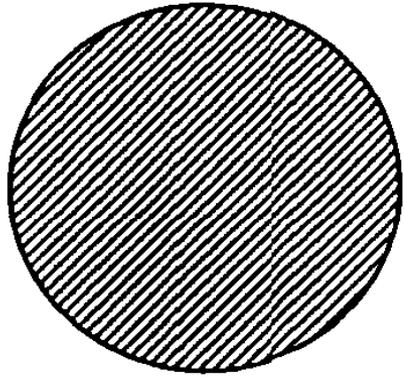
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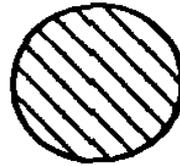
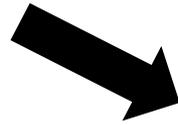


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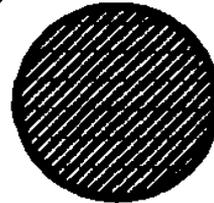
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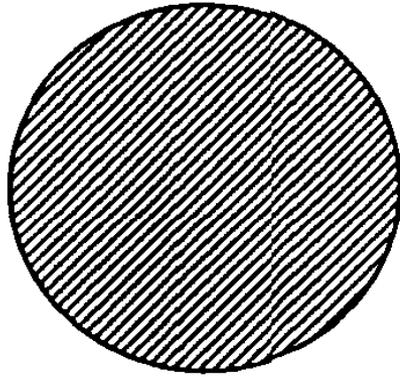
Child
eddies



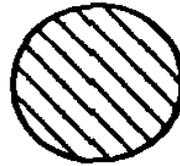
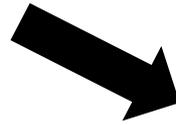
- Child eddies take fraction β of initial property

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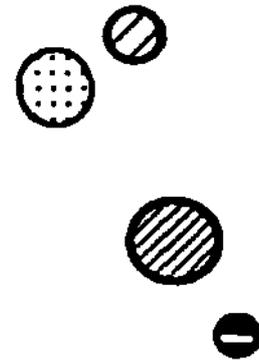
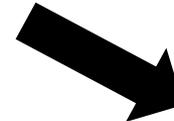
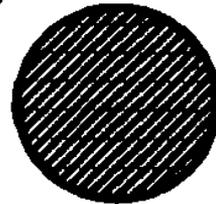


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Child eddies

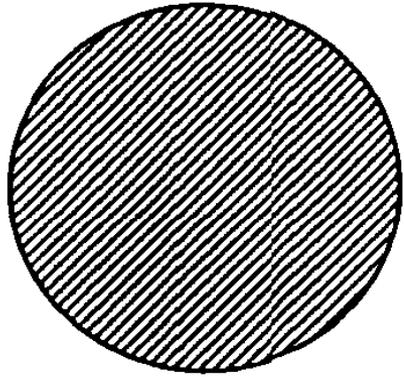
- This cascade to smaller scales repeats



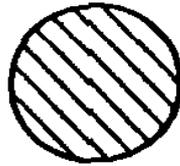
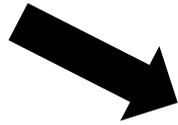
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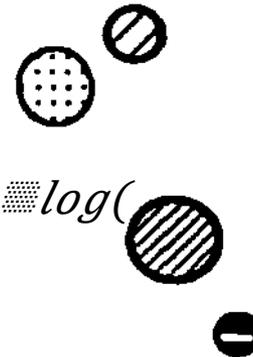
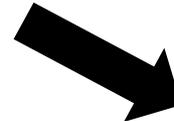
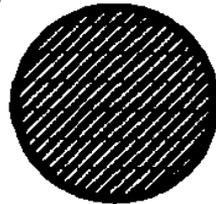


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Child eddies

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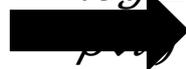
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- After n cascade steps then

$$\epsilon \downarrow n = \epsilon \downarrow 0$$

$$\prod_{i=1}^n \beta \downarrow i$$

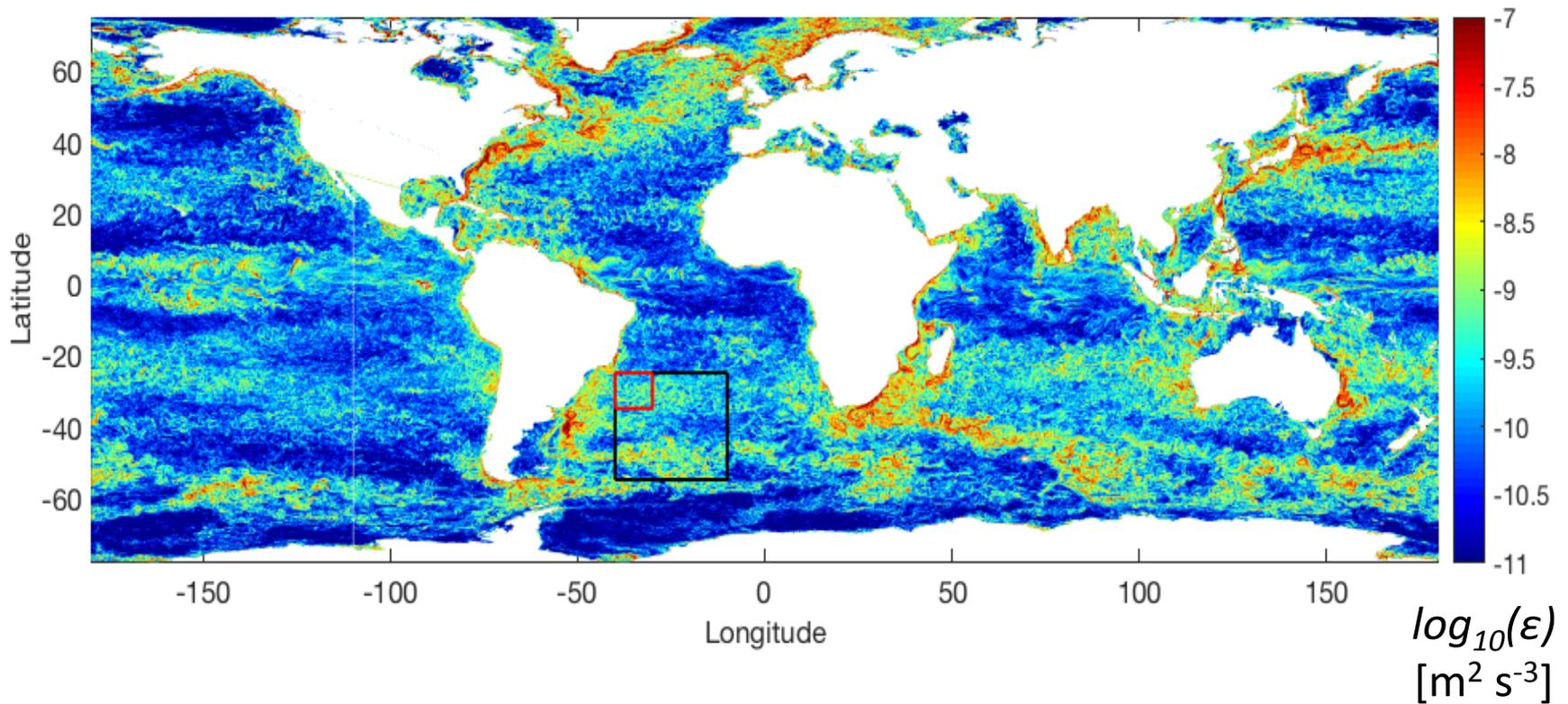
$$\log \left(\frac{\epsilon \downarrow n}{\epsilon \downarrow 0} \right) = \sum_{i=1}^n \log(\beta \downarrow i)$$



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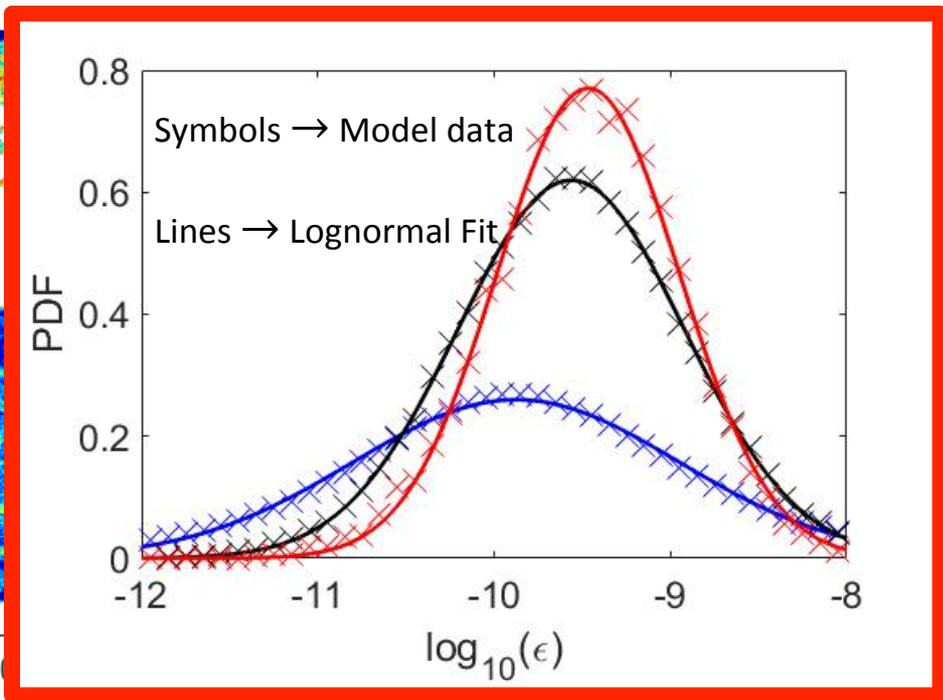
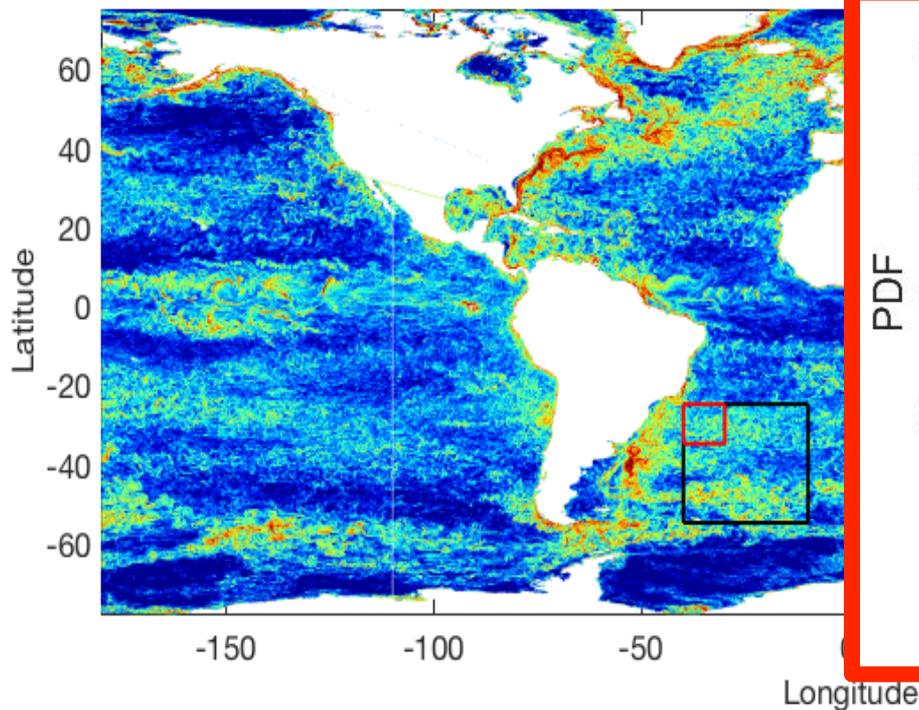
Spatial Distribution of Turbulence Statistics

- KE dissipation in Parallel Ocean Program (POP) 1/10 τ_o model



Pearson & Fox-Kemper,
Physical Review Letters (2018)

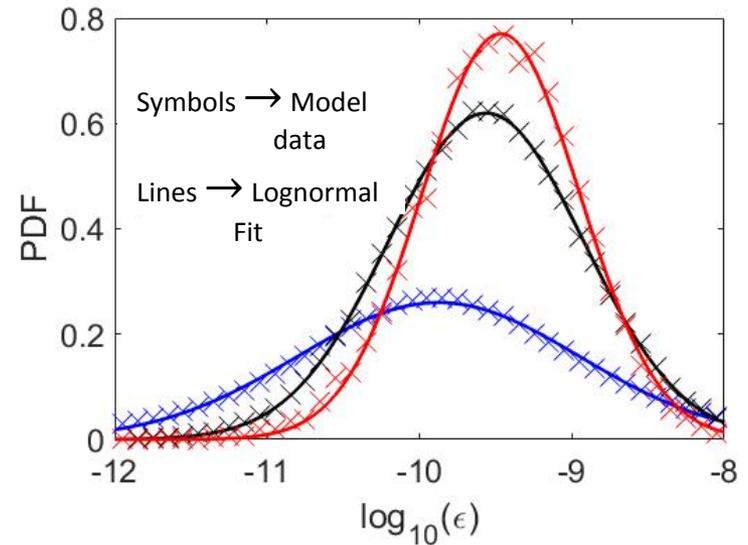
Spatial Distribution of Turbulence Statistics



Pearson & Fox-Kemper,
Physical Review Letters (2018)

Spatial Distribution of Turbulence Statistics

- Modelled mesoscale turbulence has log-normal statistics
- How can we observe and diagnose the spatial variations in mesoscale spectral fluxes?



Pearson & Fox-Kemper,
Physical Review Letters (2018)

Structure Functions

- Structure functions depend on spatial differences in variables

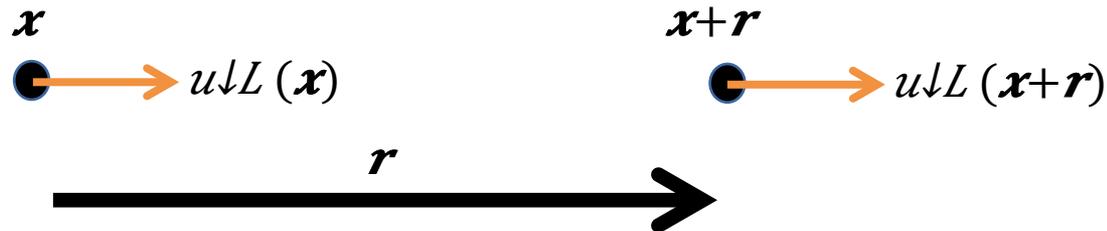
$$\delta\phi = \phi(\mathbf{x} + \mathbf{r}) - \phi(\mathbf{x})$$

- Exact laws relate structure functions to spectral fluxes in inertial cascades of isotropic, homogeneous turbulence

3D turbulence:

$$\text{Spectral KE Flux} = \varepsilon = -5/4 \cdot \delta u \downarrow L \delta u \downarrow L \delta u \downarrow L / r$$

Kolmogorov (1941)



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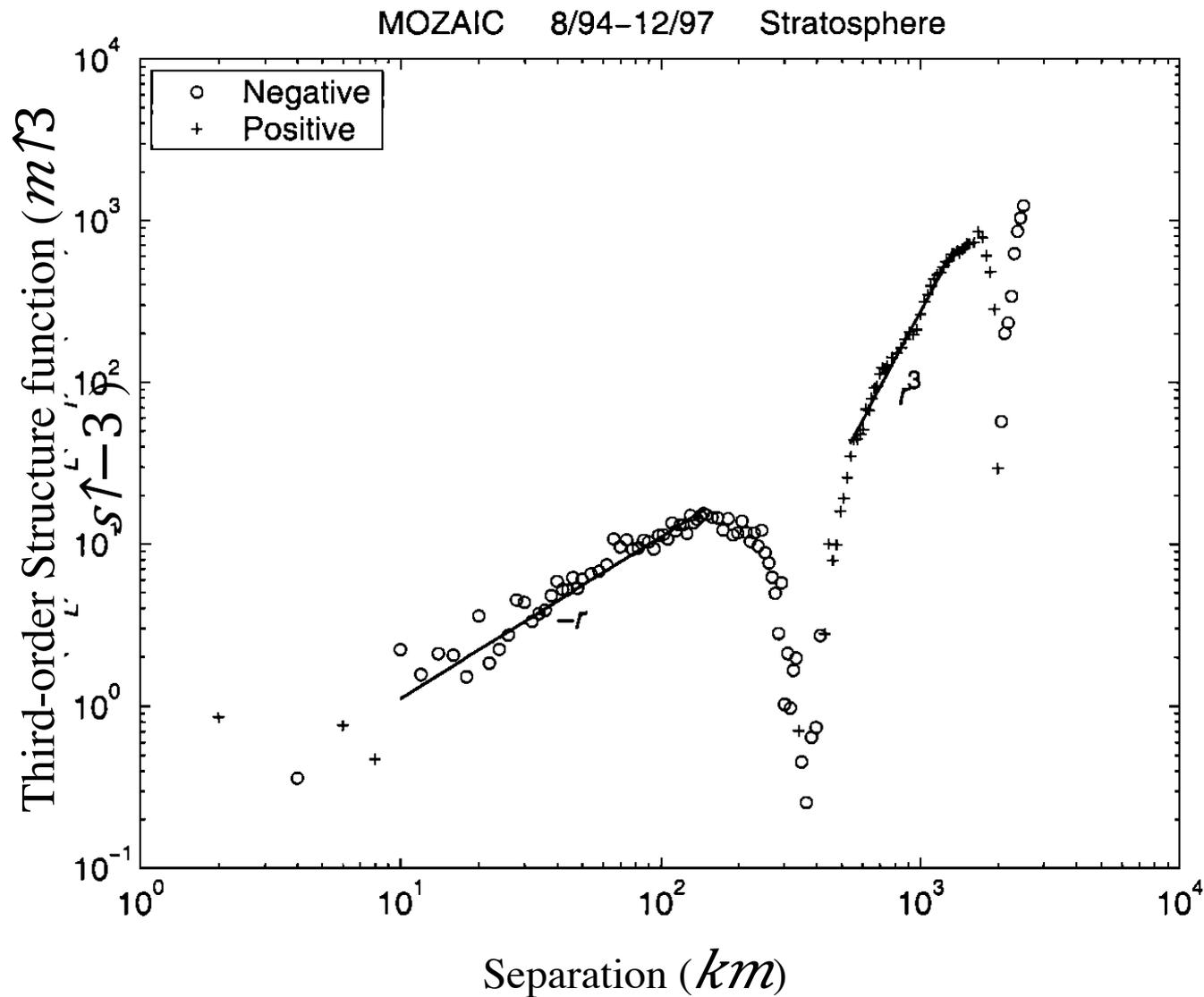
Kolmogorov (1941)

QG turbulence:

$$\text{Spectral Enstrophy Flux} = \varepsilon \downarrow q = -1/2 \cdot \delta u \downarrow L \delta q \delta q / r$$

Lindborg (2007)

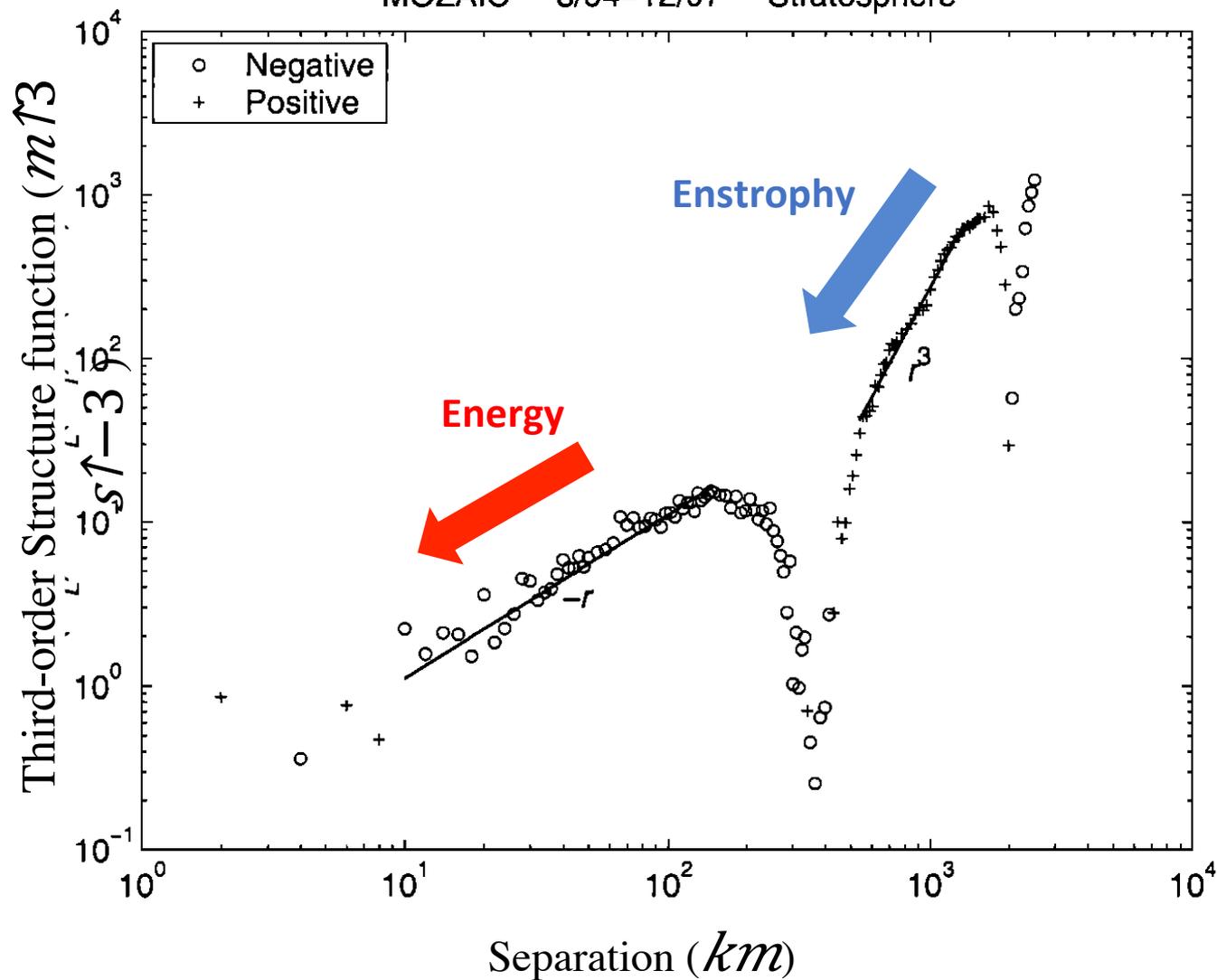
Structure Functions



Cho & Lindborg
(2001)

Structure Functions

MOZAIC 8/94–12/97 Stratosphere



Cho & Lindborg
(2001)

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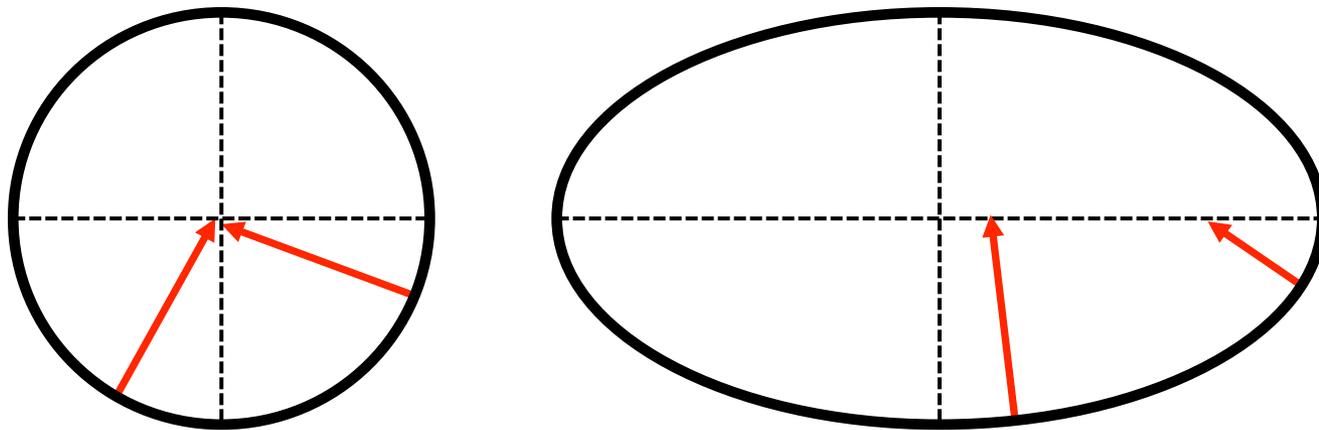
Anisotropic Structure Functions

Isotropic QG:

$$\varepsilon_{\downarrow q} = -1/2 \cdot \delta u_{\downarrow L} \delta q \delta q / r$$

Anisotropic QG:

$$\varepsilon_{\downarrow q} = -1/4 \nabla \cdot (\delta \mathbf{u} \delta q \delta q)$$



Augier et al
(2012)

- Requires complete prior knowledge of anisotropy to quantify $\varepsilon_{\downarrow q}$

New Anisotropic Structure Functions

$$\varepsilon_{\downarrow q} = -1/2 \delta q \delta A_{\downarrow q} \quad \text{where} \quad A_{\downarrow q} = -\mathbf{u}_{\downarrow g} \cdot \nabla q$$

New statistic has the following benefits over $\varepsilon_{\downarrow q} = -1/4 \nabla \cdot (\delta \mathbf{u} \delta q \delta q)$:

1. Does not require integration
2. Can be evaluated without prior quantification of anisotropy
3. Has two, rather than three, differences (potential convergence benefits)

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However, it does require knowledge of local flow gradients (amenable to numerical models, and future data [i.e. SWOT])

Extension to other dynamical regimes

$$\varepsilon \downarrow q = -1/2 \delta q \delta A \downarrow q \quad \text{in the QG enstrophy cascade}$$

Analogous relations for diagnosing spectral fluxes in the;

1. QG inverse energy cascade
2. Surface QG cascades
3. Two-dimensional cascades

Pearson, Pearson &
Fox-Kemper *In prep. (GRL)*

Pearson, Pearson &
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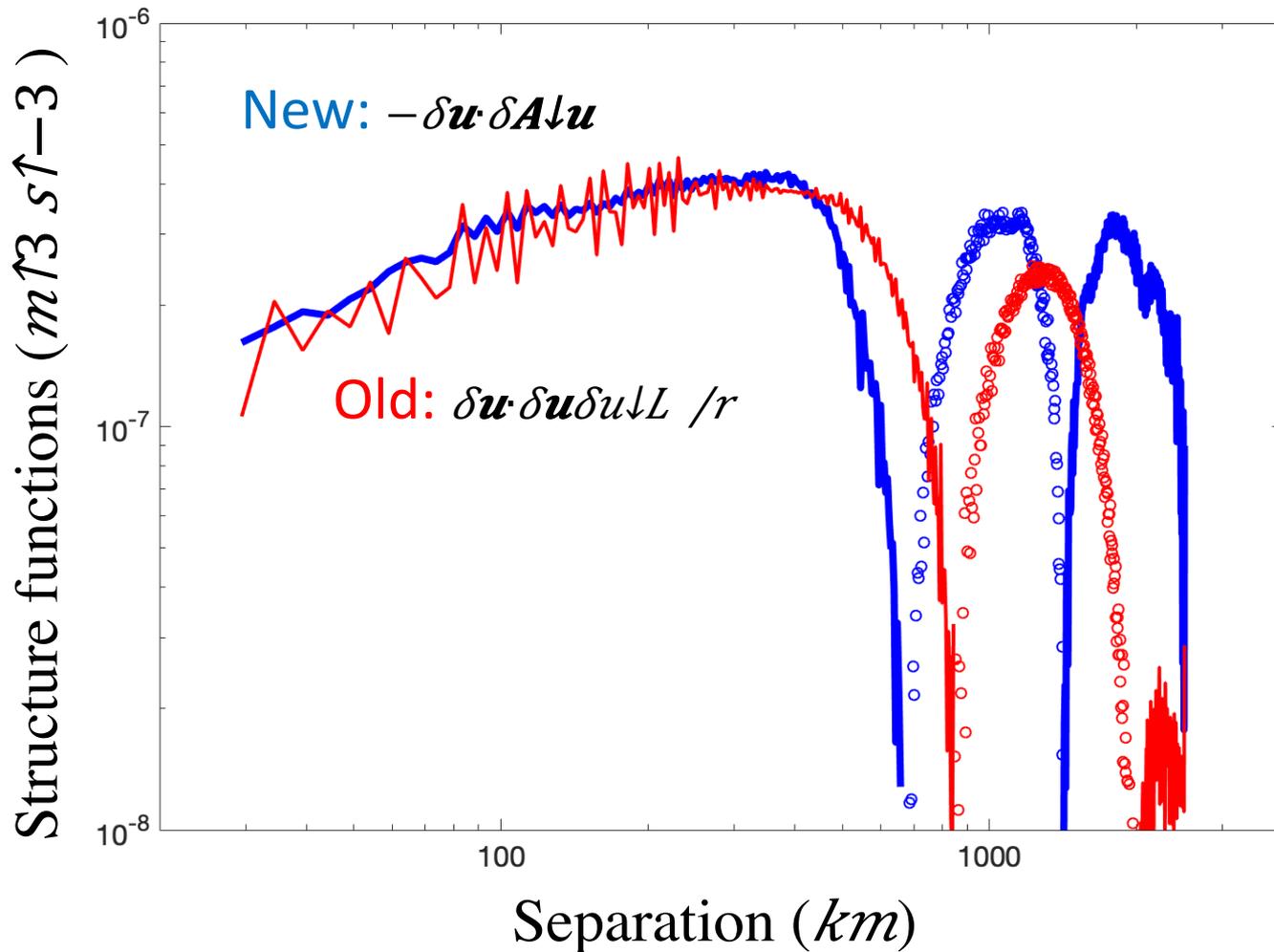
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In isotropic limit, new and old structure functions converge

New comparable to old under anisotropic conditions



Surface QG dynamics
Simulated by **pyQG**
Abernathey et al
(2015)

Summary & Conclusions

- **Mesoscale turbulence has log-normal statistics** in numerical models

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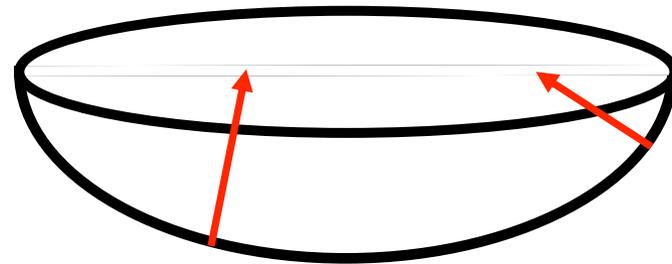
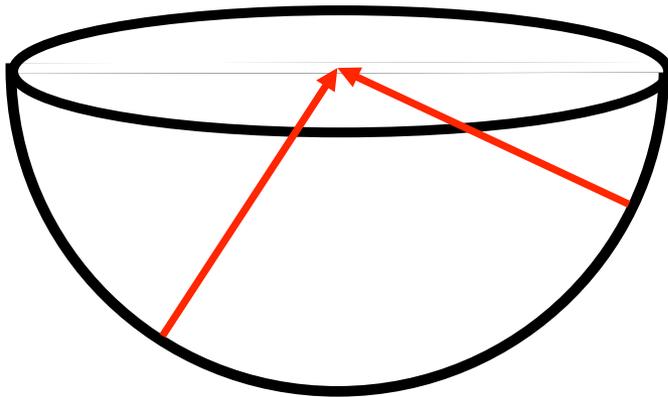
Summary & Conclusions

- **Mesoscale turbulence has log-normal statistics** in numerical models
- Log-normality allows us to accurately quantify observational data and develop more precise turbulence parameterizations
- New structure functions could diagnose spectral fluxes from patchy or irregular data
- New structure functions for **anisotropic QG, SQG, and 2D** inertial cascades

Anisotropic Structure Functions

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Augier et al
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