

Exploring Turbulence: A Personal Journey through Critical Behavior, Anomalous Scaling, and Data-Driven Approaches



$$\partial_t \hat{v} + \hat{v} \cdot \partial \hat{v} = -\partial \hat{p} + \frac{1}{Re} \Delta \hat{v} + \hat{F}_{mech}$$

Leonardo da Vinci (~ 1500): “doue la turbolenza de l’aqua si genera **[injected]**; doue la turbolenza dell aqua si mantiene **[advected/conserved]** plugho; doue la turbolenza dell acqua si posa **[dissipated]**”

- OUT OF EQUILIBRIUM (**INJECTED**-**DISSIPATED**)
- NONLINEAR (**ADVECTED/CONSERVED**)

U. Chicago 2023



AQTIVATE



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$$\partial_t \hat{v} + \hat{v} \cdot \partial \hat{v} = -\partial \hat{p} + \frac{1}{Re} \Delta \hat{v} + \hat{F}_{mech}$$

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- OUT OF EQUILIBRIUM (**INJECTED-DISSIPATED**) -> DISSIPATIVE ANOMALY
- (STRONGLY) NONLINEAR (**ADVECTED/CONSERVED**)
- NON-GAUSSIAN (EXTREME EVENTS +ANOMALOUS SCALING)
- MULTI-SCALE (TRILLION OF DEGREES OF FREEDOM)
- IMPORTANT FOR MANY REAL WORLD APPLICATIONS

U. Chicago 2023

TURBULENCE OR TURBULENCES?

MASS X ACCELERATION = INTERNAL FORCES + EXTERNAL FORCES

$$\rho[\partial_t v + v \cdot \partial v] = -\partial p + \nu \Delta v + g\theta + F(B, B) + 2\Omega \times v + \hat{F}_{mech}$$

EULERIAN

$$\partial_t \theta + v \cdot \partial \theta = \chi \partial^2 \theta \leftarrow \text{TEMPERATURE}$$

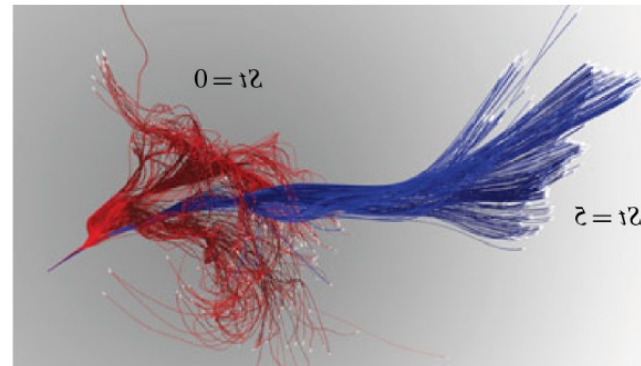
$$\partial_t B + v \cdot \partial B = B \cdot \partial v + \chi \partial^2 B \leftarrow \text{MAGNETIC FIELD}$$

$$\partial \cdot v = 0$$

+ BOUNDARY CONDITIONS: (2D, 3D, THIN/THICK LAYERS ETC...)

LAGRANGIAN

$$\dot{X}(t) = v(X(t), t)$$



THE HYDROGEN ATOM OF TURBULENCE (not solvable though!)

$$\partial_{\hat{t}} \hat{v} + \hat{v} \cdot \hat{\partial} \hat{v} = -\hat{\partial} \hat{p} + \frac{1}{Re} \hat{\Delta} \hat{v} + \hat{F}_{mech}$$

+PERIODIC BOUNDARY CONDITIONS

ENERGY INJECTION

ENERGY DISSIPATION

$$\left\{ \begin{array}{l} \hat{t} = t/t_0 \\ \hat{x} = x/l_0 \\ \hat{v} = v/v_0 \\ \hat{F} \sim F l_0 / v_0^2 \end{array} \right.$$

$$Re \sim \frac{v \partial v}{\nu \partial^2 v} \quad Re = \frac{l_0 v_0}{\nu}$$

Reynolds number $\sim$ (Non-Linear)/(Linear terms)

$$Re \rightarrow \infty$$

Fully Developed Turbulence:

1. Strongly non-linear & non-perturbative system

DIFFICULT TO DISSIPATE? WAIT AND SEE...

BASIC FUNDAMENTAL OPEN PROBLEMS ABOUT GLOBAL AND LOCAL PROPERTIES

1. WE DO NOT CONTROL THE **MEAN ENERGY FLUX**: DOES THE INJECTED ENERGY FLOW TOWARDS SMALL-SCALES OR TOWARDS LARGE-SCALES (OR BOTH)?
2. WE DO NOT CONTROL THE SCALE-BY-SCALE **MEAN ENERGY SPECTRUM**
3. WE DO NOT CONTROL NEITHER EULERIAN NOR LAGRANGIAN **FLUCTUATIONS** AROUND THE MEAN GLOBAL PROPERTIES

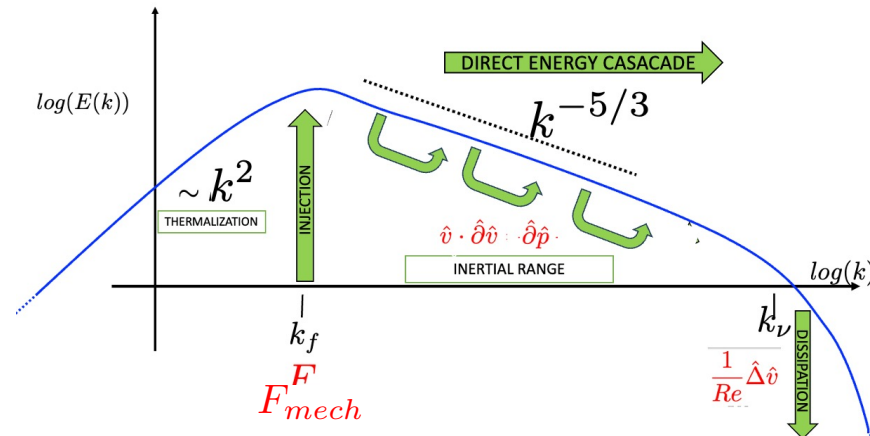
3D

Entry #: 84174

Vortices within vortices: hierarchical nature of vortex tubes in turbulence

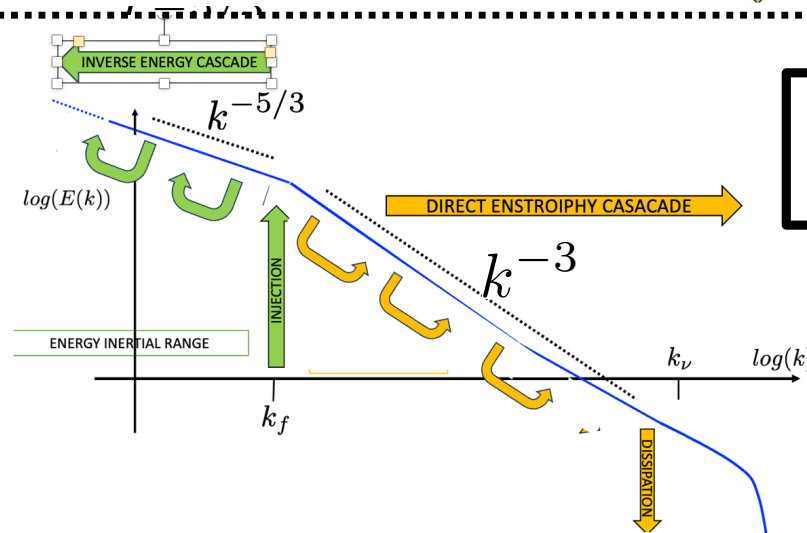
Kai Bürger¹, Marc Treib¹, Rüdiger Westermann¹,
Suzanne Werner², Cristian C Lalescu³,
Alexander Szalay², Charles Meneveau⁴, Gregory L Eyink^{2,3,4}

¹ Informatik 15 (Computer Graphik & Visualisierung), Technische Universität München
² Department of Physics & Astronomy, The Johns Hopkins University
³ Department of Applied Mathematics & Statistics, The Johns Hopkins University
⁴ Department of Mechanical Engineering, The Johns Hopkins University



3D

2D



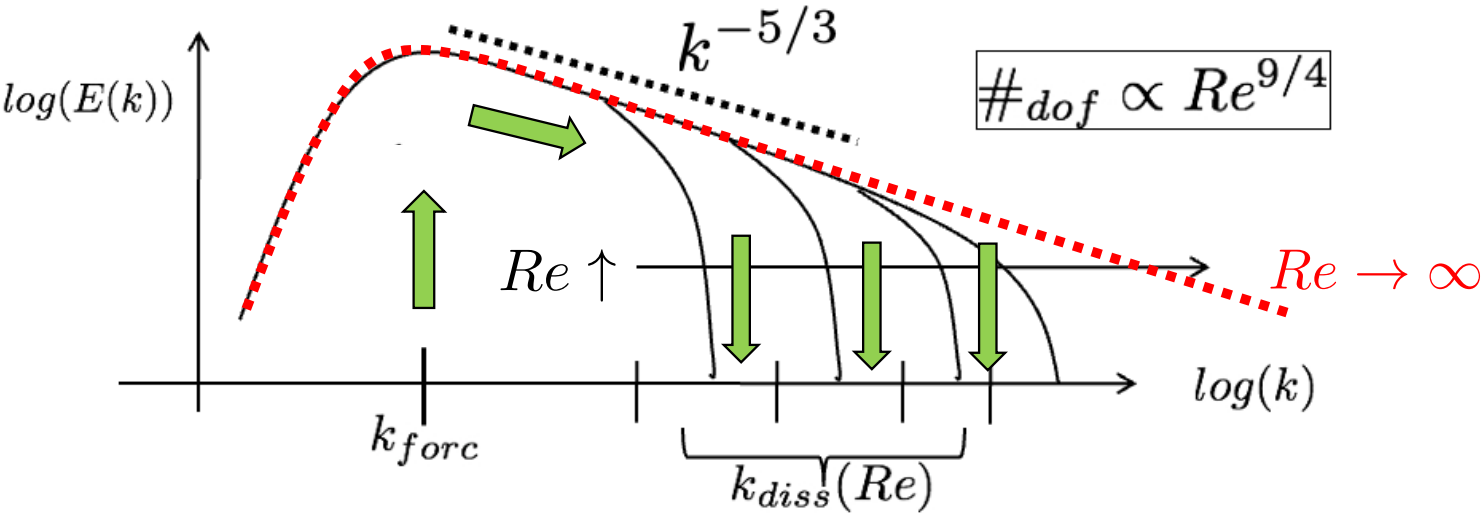
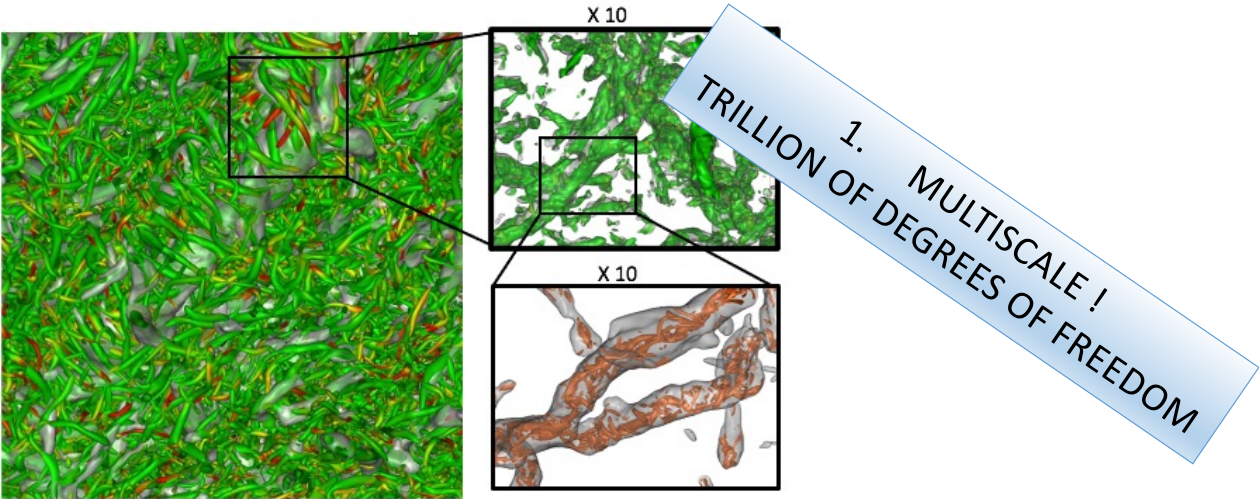
2 invariants (positive definite)

$$\Omega = \int d^3x \, \omega \cdot \omega \quad E = \int d^3x \, \mathbf{v} \cdot \mathbf{v}$$

2D

3D – DIRECT CASCADE

$$\partial_{\hat{t}} \hat{v} + \hat{v} \cdot \hat{\partial} \hat{v} = -\hat{\partial} \hat{p} + \frac{1}{Re} \hat{\Delta} \hat{v} + \hat{F}_{mech}$$



3D – DIRECT CASCADE

$$\partial_{\hat{t}} \hat{v} + \hat{v} \cdot \hat{\partial} \hat{v} = -\hat{\partial} \hat{p} + \frac{1}{Re} \hat{\Delta} \hat{v} + \hat{F}_{mech}$$

76th Annual Meeting of the Division of Fluid Dynamics

Sunday–Tuesday, November 19–21, 2023; Washington, DC

Session T02: Turbulence: DNS

4:25 PM–5:56 PM, Monday, November 20, 2023

Room: Ballroom B

Chair: Robert Moser, University of Texas at Austin

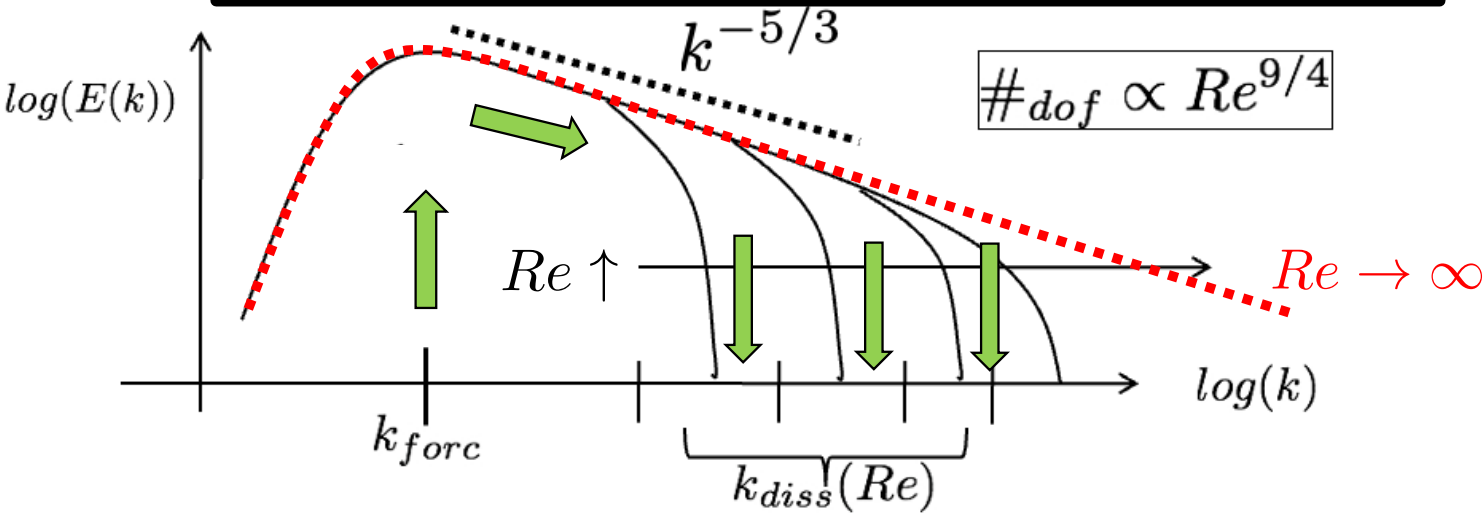
Abstract: T02.00005 : Turbulence simulations at grid resolution up to 32768^3 enabled by Exascale computing*

5:17 PM–5:30 PM

$32768^3 \sim 35$ TRILLION GRID POINT
1 CONF $\sim$ 1 PETABYTE

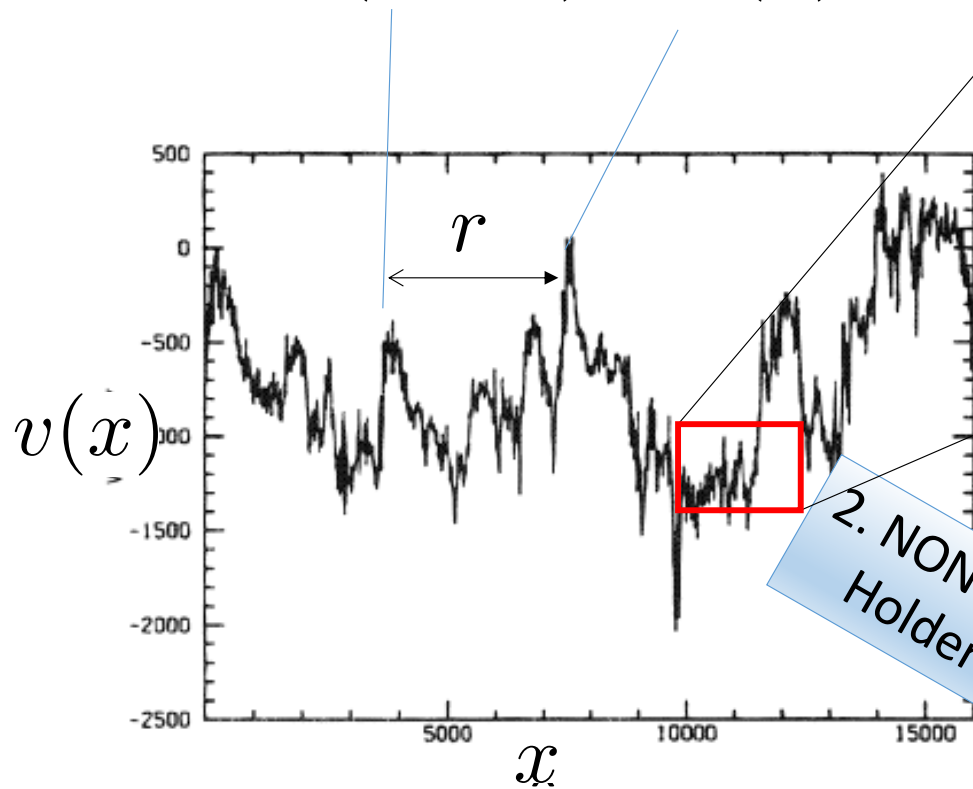
Presenter:

Pui-Kuen (P.K) Yeung
(Georgia Institute of Technology)



$$\partial_{\hat{t}} \hat{v} + \hat{v} \cdot \hat{\partial} \hat{v} = -\hat{\partial} \hat{p} + \frac{1}{Re} \hat{\Delta} \hat{v} + \hat{F}$$

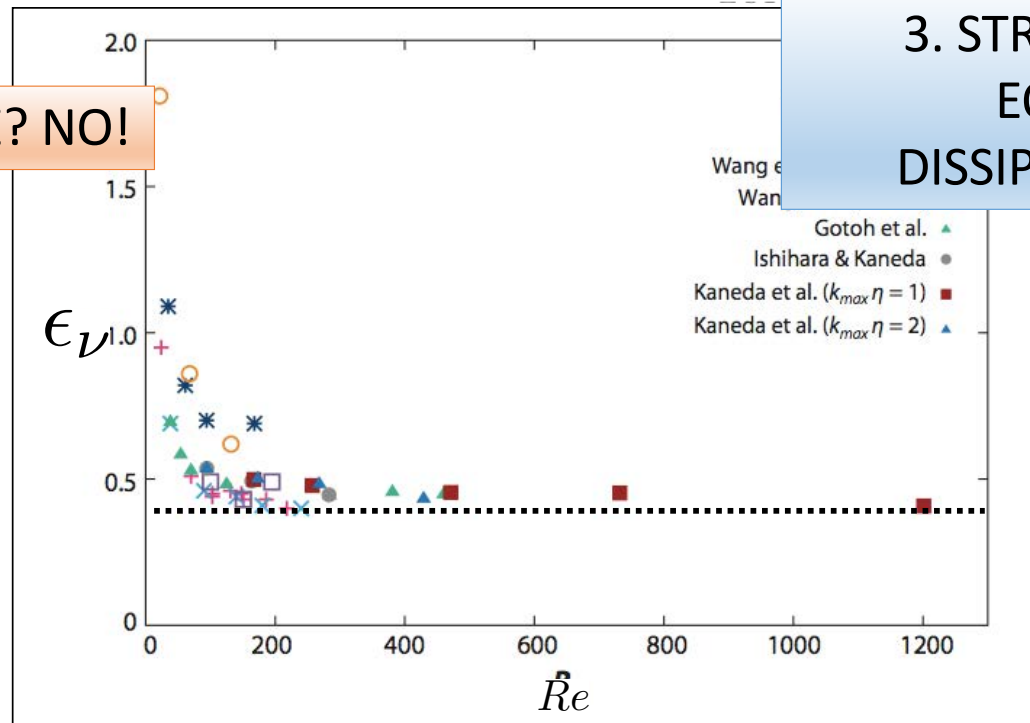
$$\delta_r v = v(x+r) - v(x) \sim r^{\frac{1}{3}}$$



2. NON-DIFFERENTIABLE!
Holder Continuous $1/3$

$$\partial_{\hat{t}} \hat{v} + \hat{v} \cdot \hat{\partial} \hat{v} = -\hat{\partial} \hat{p} + \frac{1}{Re} \hat{\Delta} \hat{v} + \hat{F}$$

DIFFICULT TO DISSIPATE? NO!



3. STRONGLY OUT-OF-EQUILIBRIUM DISSIPATIVE ANOMALY

$$\lim_{Re \rightarrow \infty} \epsilon_{\nu} = \lim_{Re \rightarrow \infty} \frac{1}{Re} \langle \hat{v} \Delta \hat{v} \rangle \rightarrow O(1)$$

NO ROOM FOR QUASI-EQUILIBRIUM STAT MECH!

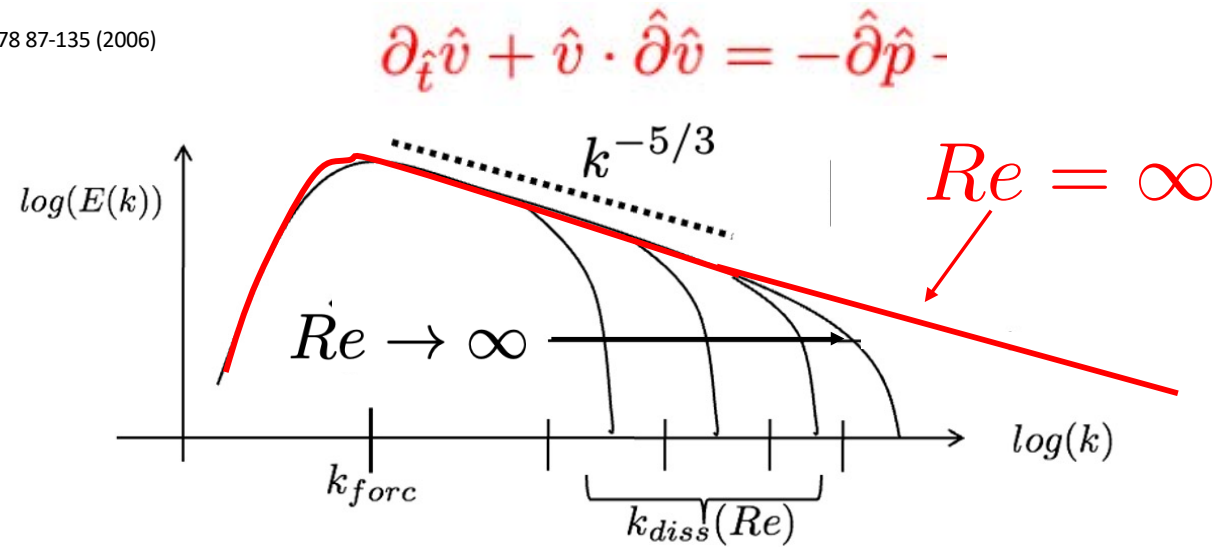
Statistical Hydrodynamics.

L. ONSAGER

New Haven, Conn.

NUOVO CIMENTO, 1949

THERE EXIST
DISSIPATIVE WEAK SOLUTIONS OF EULER EQUATIONS:
DISSIPATION IN DRY FLUIDS !



It is of some interest to note that in principle, turbulent dissipation as described could take place just as readily without the final assistance by viscosity. In the absence of viscosity, the standard proof of the conservation of energy does not apply, because the velocity field does not remain differentiable! In fact it is possible to show that the velocity field in such "ideal" turbulence cannot obey any LIPSCHITZ condition of the form

$$(26) \quad v(x+r) - v(x) \sim r^h \quad h \leq 1/3$$

Annals of Mathematics 188 (2018), 871–963
<https://doi.org/10.4007/annals.2018.188.3.4>

A proof of Onsager's conjecture

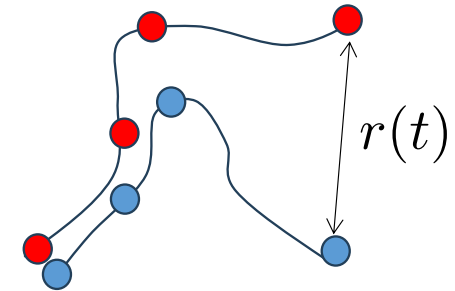
By PHILIP ISETT

RICHARDSON DISPERSION: SPONTANEOUS STOCHASTICITY OF ADVECTED PARTICLES

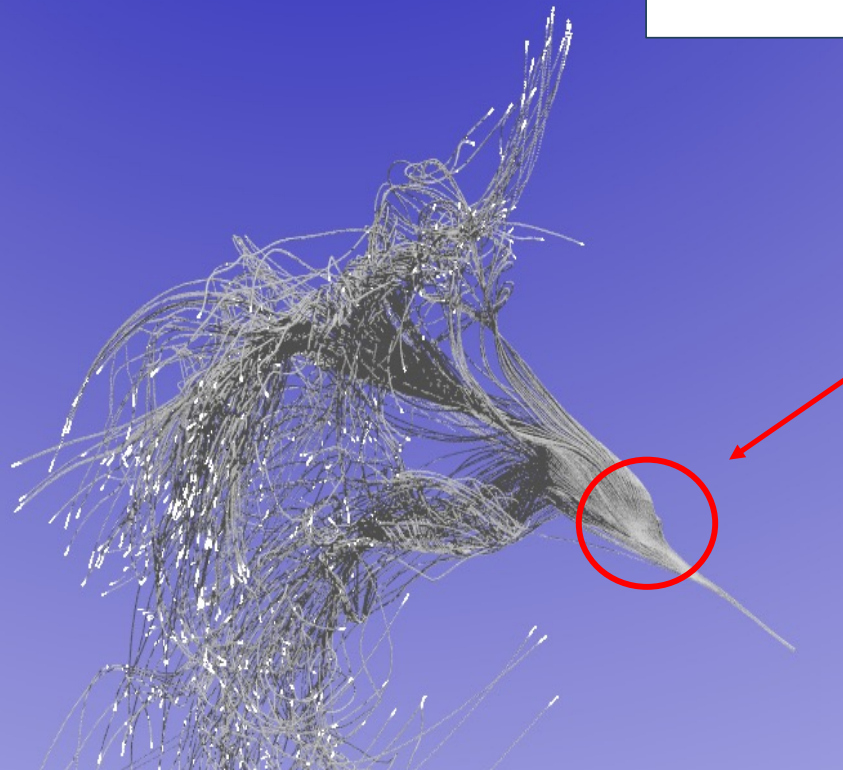
LAGRANGIAN

$$\dot{X}(t) = v(X(t), t)$$

$$r(t) = X_1(t) - X_2(t)$$



-G. Falkovich, K. Gawedzki, M. Vergassola, Particles and fields in fluid turbulence, Rev. Modern Phys. 73 (4) (2001) 913
 -R. Scatamacchia, L. B., F. Toschi, Extreme events in the dispersions of two neighboring particles under the influence of fluid turbulence, Phys. Rev. Lett. 109 (14) (2012) 144501.



$$\frac{1}{2} \frac{d}{dt} \langle r^2 \rangle = \langle r \delta_r v \rangle \sim \epsilon^{\frac{1}{3}} r^{\frac{4}{3}}$$

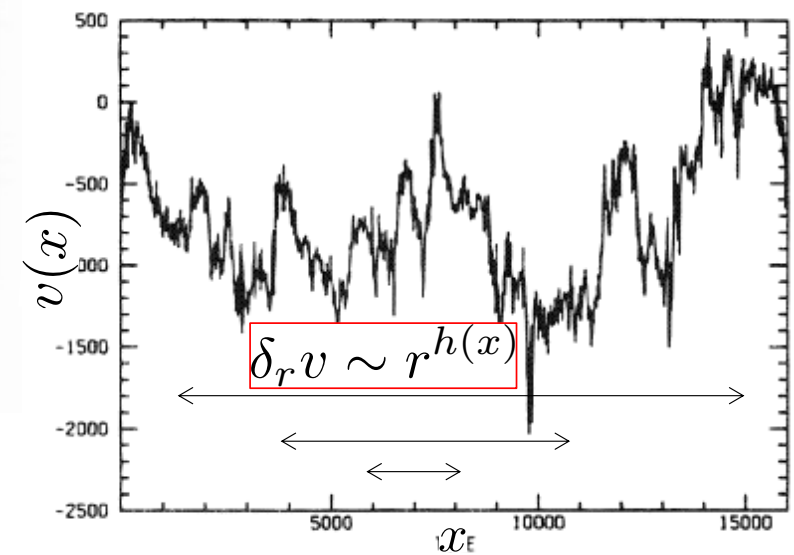
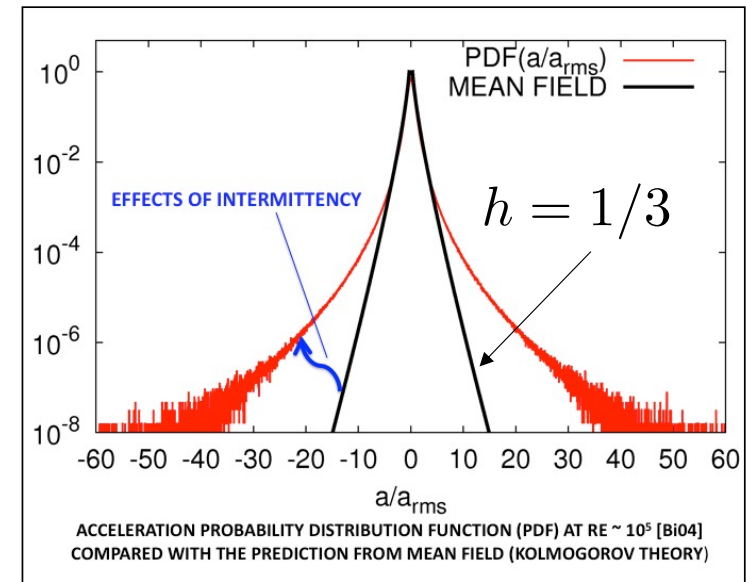
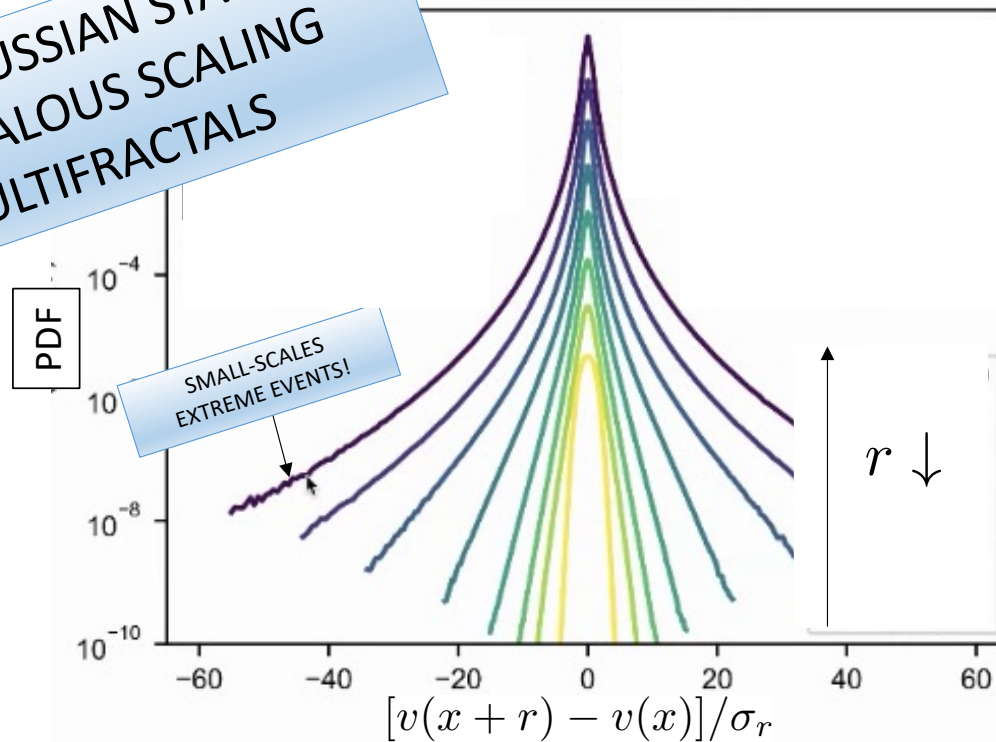
$$\langle r(t)^2 \rangle \sim r(0)^2 + g \epsilon t^3$$

$$P(r, t) \sim \frac{r^2}{t^{\frac{9}{2}}} \exp \left[-b r^{\frac{2}{3}} / t \right]$$

TWO PARTICLES SEPARATE EVEN IF STARTING ON THE SAME POSITION!

$$\delta_r v \sim r^{h(x)} \longleftrightarrow h(x) \in [h_m, h_M]$$

4. NON-GAUSSIAN STATISTICS ANOMALOUS SCALING MULTIFRACTALS

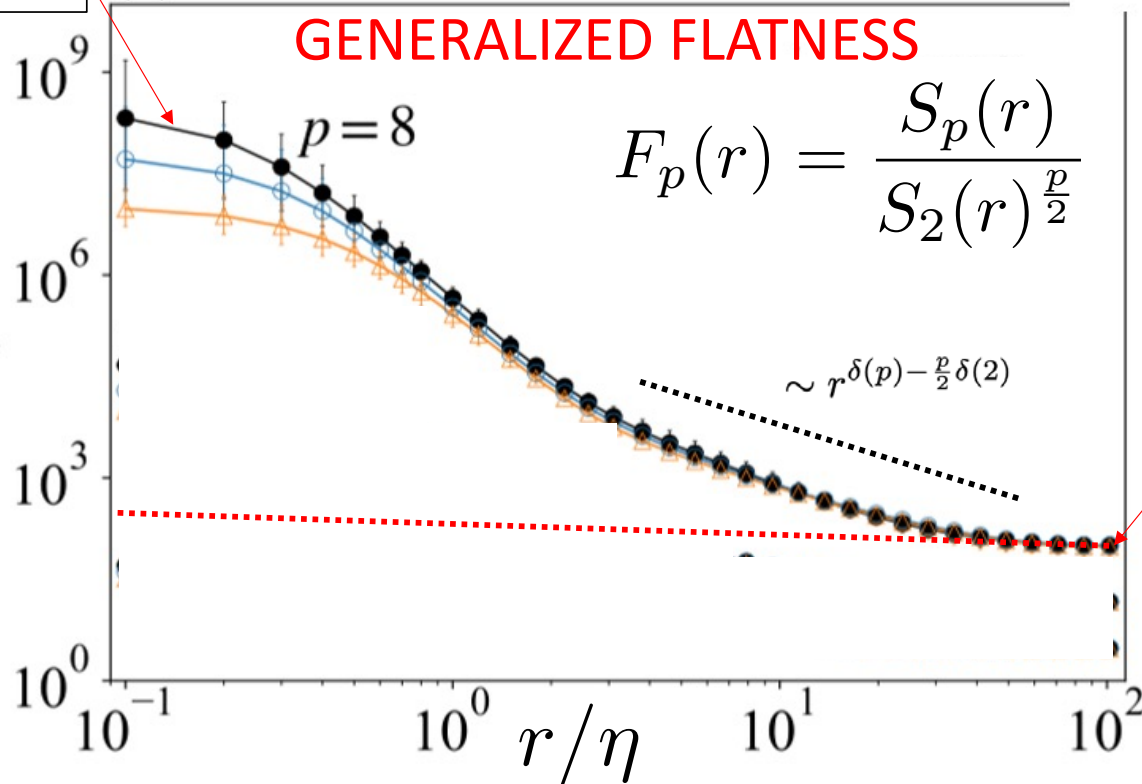
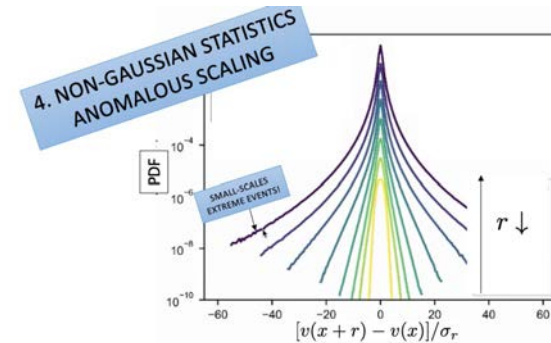


$$S_p(r) = \langle [v(x+r) - v(x)]^p \rangle \sim \epsilon^{\frac{p}{3}} r^{\zeta(p)}$$

$$\zeta(p) = \frac{p}{3} + \delta(p)$$

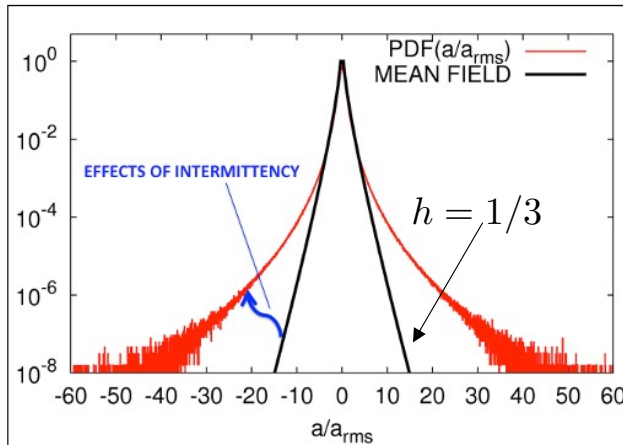
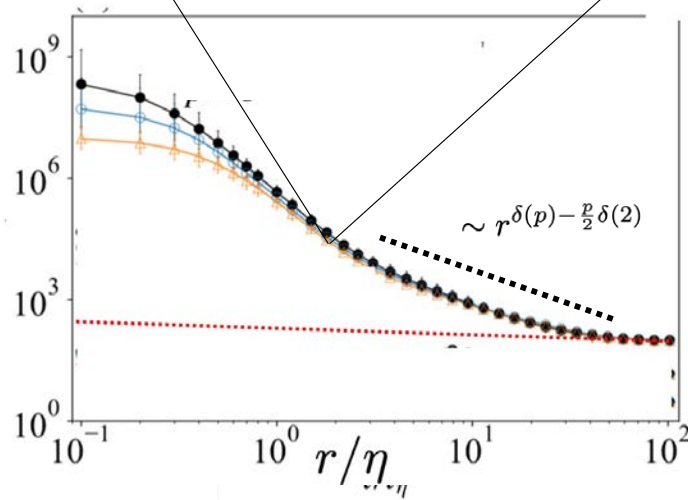
MULTIFRACTALS

$$h(x) \in [h_m, h_M]$$



GAUSSIAN
 $h \sim 1/3$

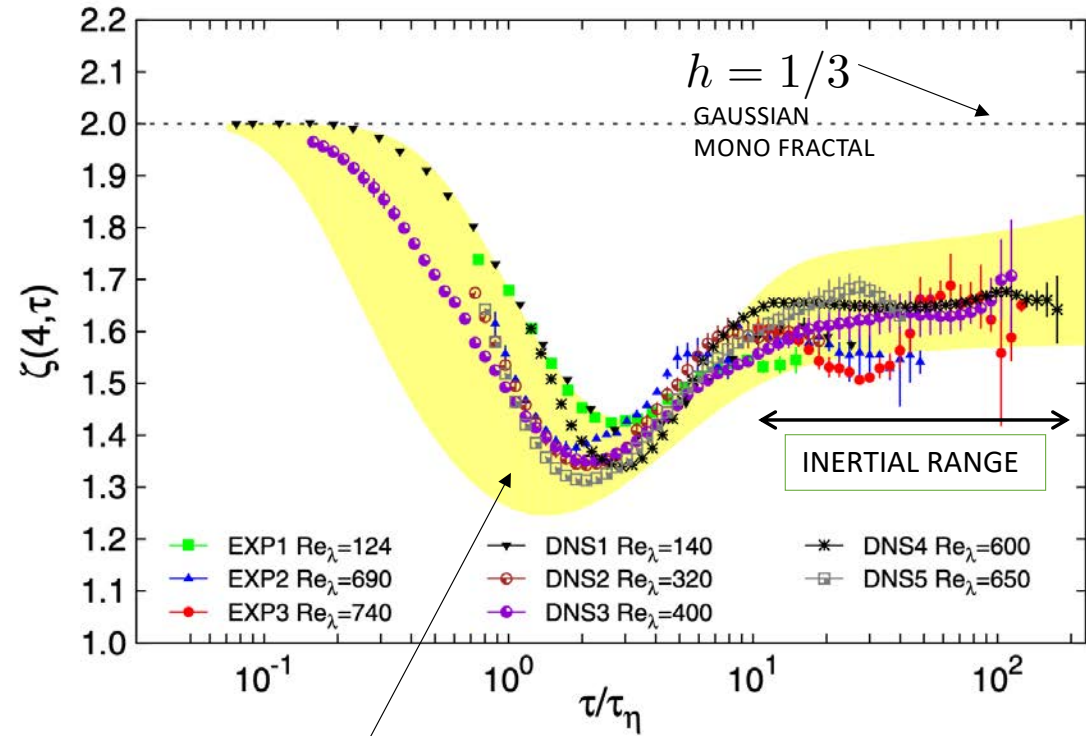
$$\zeta(4, \tau) = \frac{d \log S^{(4)}(\tau)}{d \log S^{(2)}(\tau)}$$



Universal Intermittent Properties of Particle Trajectories in Highly Turbulent Flows

A. Arnéodo,¹ R. Benzi,² J. Berg,³ L. Biferale,^{4,*} E. Bodenschatz,⁵ A. Busse,⁶ E. Calzavarini,⁷ B. Castaing,¹ M. Cencini,^{8,*} L. Chevillard,¹ R. T. Fisher,⁹ R. Grauer,¹⁰ H. Homann,¹⁰ D. Lamb,⁹ A. S. Lanotte,^{11,*} E. Lévêque,¹ B. Lüthi,¹² J. Mann,³ N. Mordant,¹³ W.-C. Müller,⁶ S. Ott,³ N. T. Ouellette,¹⁴ J.-F. Pinton,¹ S. B. Pope,¹⁵ S. G. Roux,¹ F. Toschi,^{16,17,*} H. Xu,⁵ and P. K. Yeung¹⁸

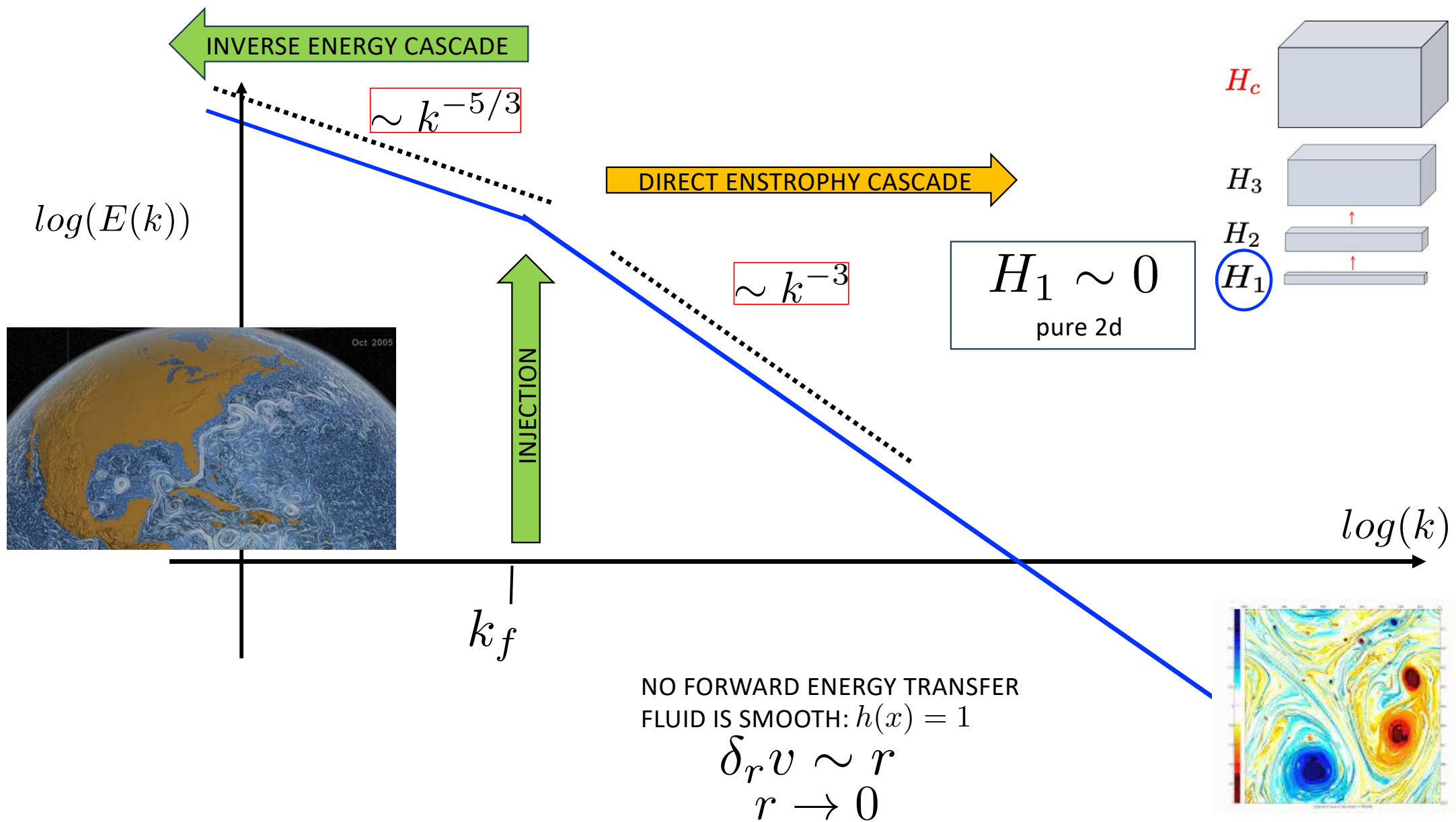
(International Collaboration for Turbulence Research)



$$\frac{1}{Re} \hat{\Delta} \hat{v}$$

TURBULENCE IS:

- STRONGLY NON-LINEAR (NON PERTURBATIVE)
- MULTI-SCALE (TRILLION OF HYDRODYNAMICAL DEGREES OF FREEDOM)
- STRONGLY OUT-OF-EQUILIBRIUM (DISSIPATIVE ANOMALY)
- NON-GAUSSIAN (INTERMITTENCY AND ANOMALOUS SCALING)
- IMPORTANT FOR MANY REAL WORLD APPLICATIONS



TURBULENCE OR TURBULENCES? THIN/THICK LAYERS

MASS X ACCELERATION = INTERNAL FORCES + EXTERNAL FORCES

$$\rho[\partial_t v + v \cdot \partial v] = -\partial p + \nu \Delta v + g\theta + F(B, B) + 2\Omega \times v + F$$

EULERIAN

$$\partial_t \theta + v \cdot \partial \theta = \chi \partial^2 \theta$$

$$\partial_t B + v \cdot \partial B = B \cdot \partial v + \chi \partial^2 B$$

$$\partial \cdot v = 0$$

+ BOUNDARY CONDITIONS: (2D, 3D, THIN/THICK LAYERS ETC...)

H_c



H_3

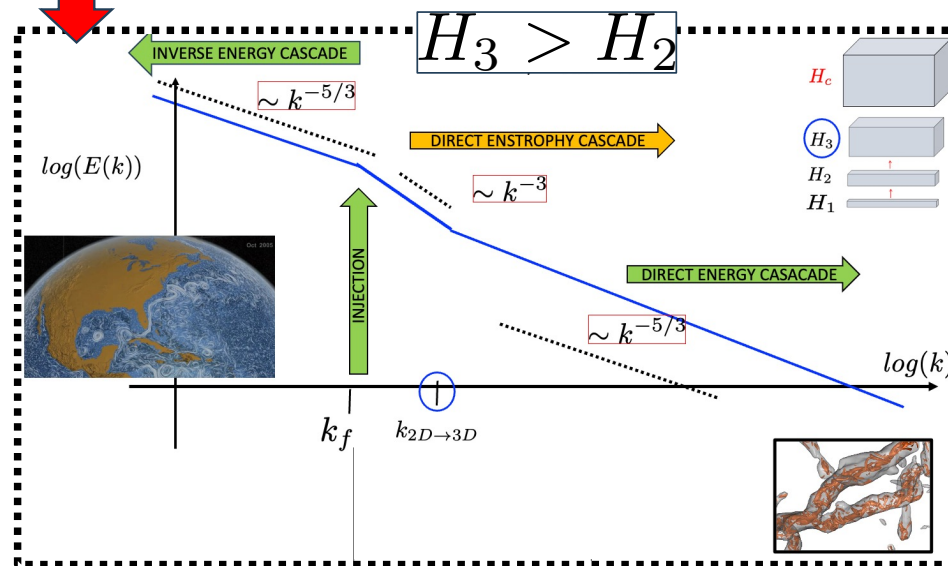
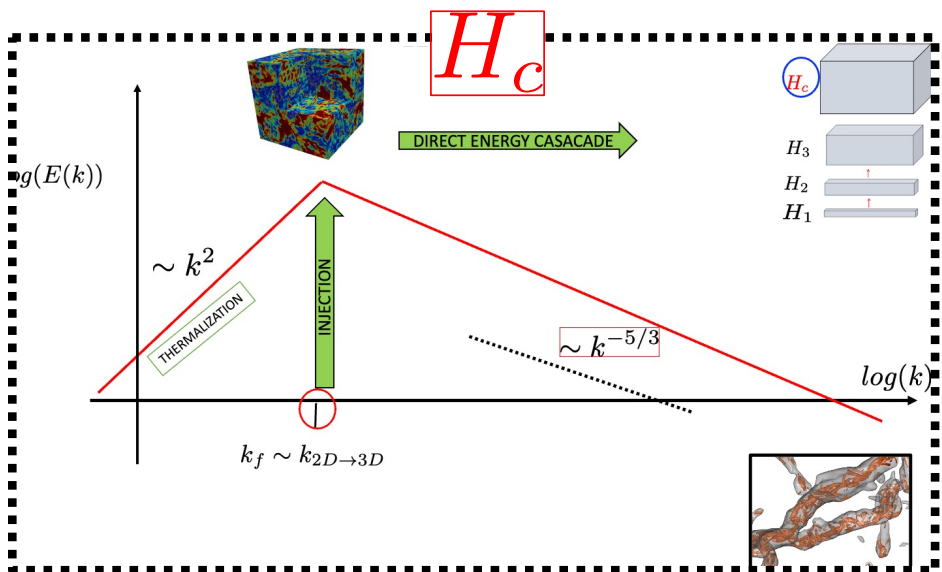
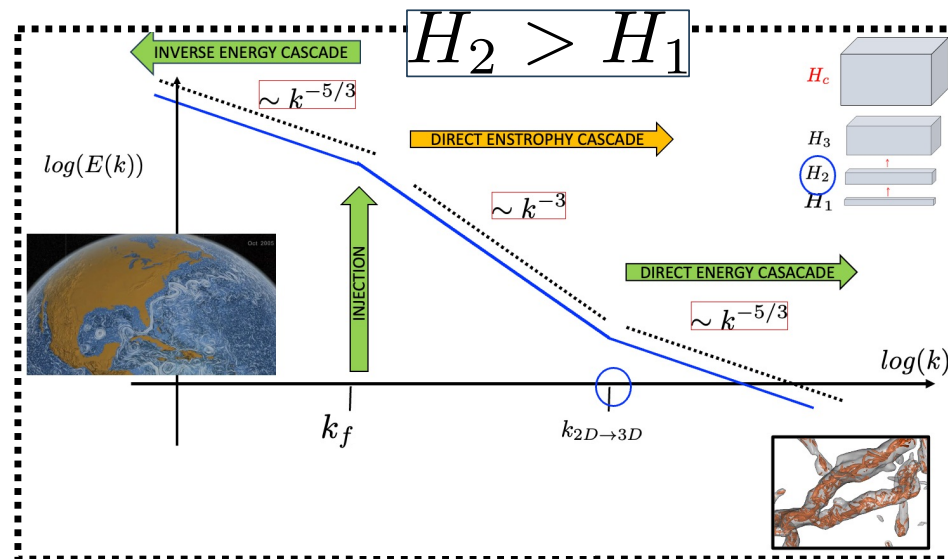
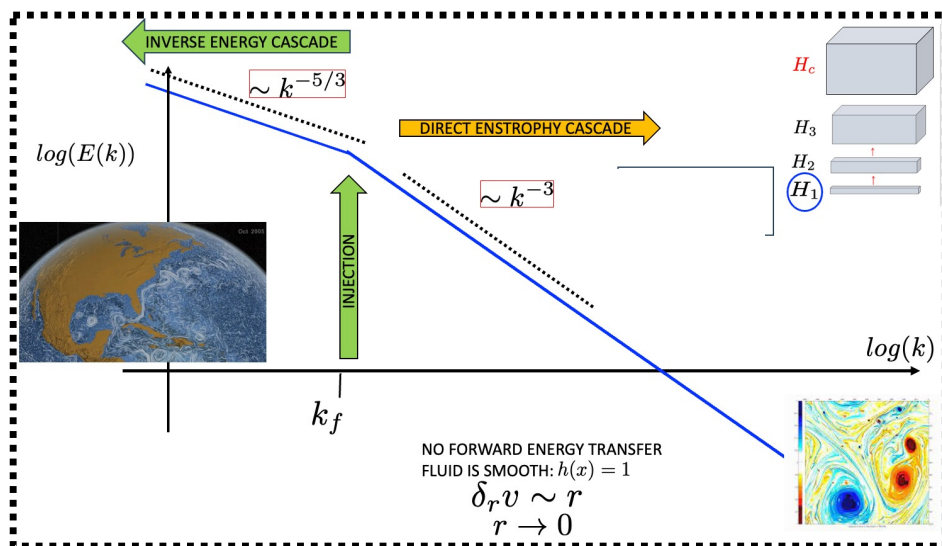


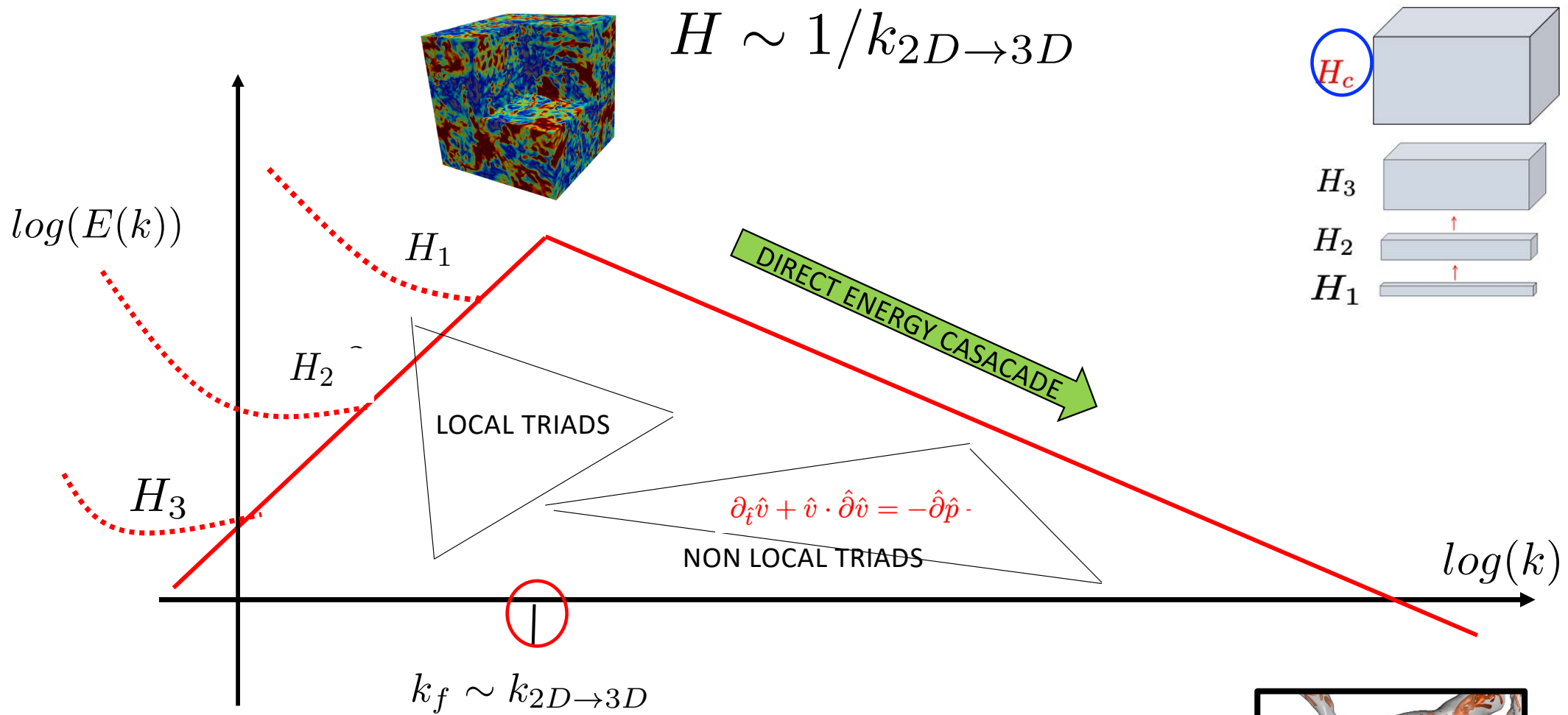
H_2



H_1







Celani, S. Musacchio, D. Vincenzi, Turbulence in more than two and less than three dimensions. Phys. Rev. Lett. 104(18), 184506 (2010)

A. Alexakis, L. B. , Cascades and transitions in turbulent flows. Phys. Rep. 767, 1–101 (2018)

DIRECT FLUX

INVERSE FLUX

$$\mathcal{I}_{\mathcal{E}} = \epsilon_{\nu} + \epsilon_{\alpha}$$

$$\partial_t \mathcal{E}_{2D}(t) = \epsilon_{in}^{2D} - \mathcal{T} - \epsilon_{\nu}^{2D} - \epsilon_{\alpha}^{2D}$$

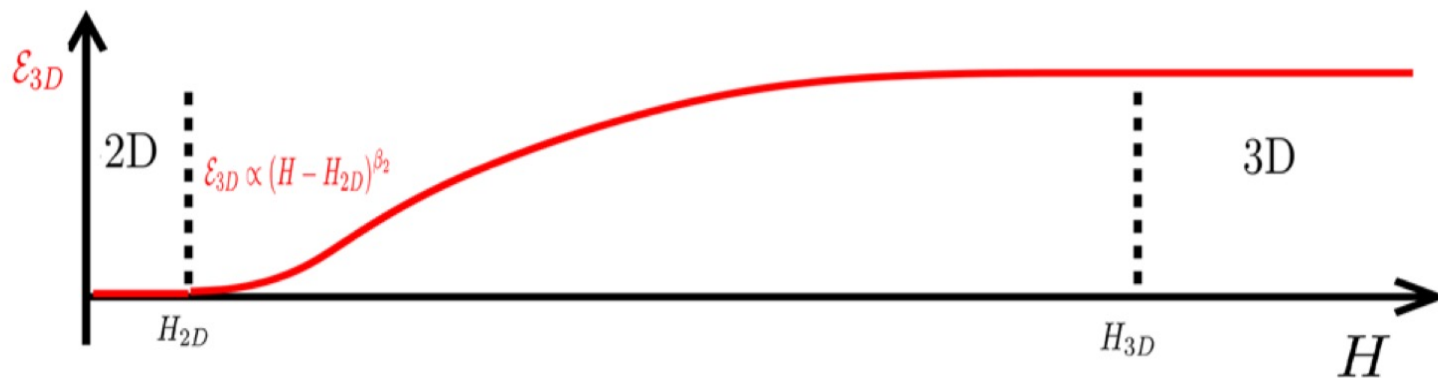
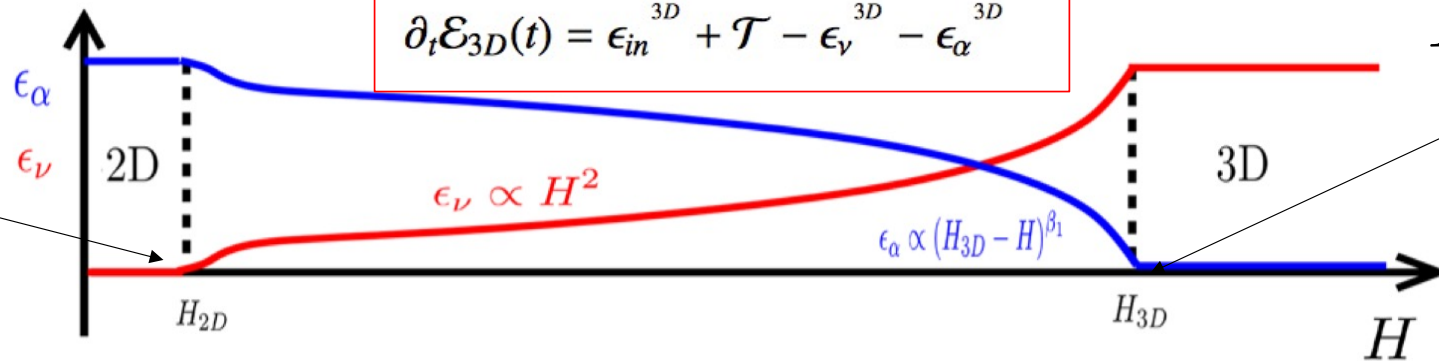
$$\partial_t \mathcal{E}_{3D}(t) = \epsilon_{in}^{3D} + \mathcal{T} - \epsilon_{\nu}^{3D} - \epsilon_{\alpha}^{3D}$$

VERY THICK

$$H > 1/k_f$$

VERY THIN

$$H < 1/k_{\nu}$$



TURBULENCE OR TURBULENCES? ROTATION

MASS X ACCELERATION = INTERNAL FORCES + EXTERNAL FORCES

$$\rho[\partial_t v + v \cdot \partial v] = -\partial p + \nu \Delta v + \cancel{g\theta + F(B, B)} + 2\Omega \times v + F$$

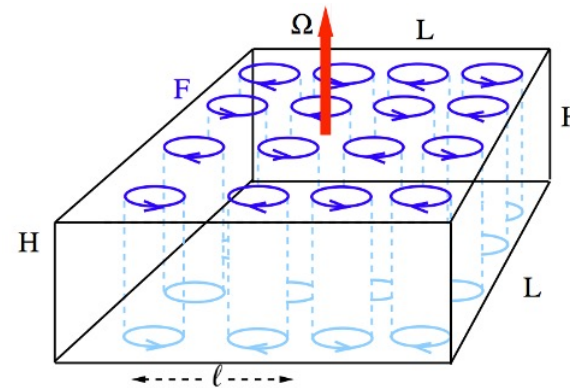
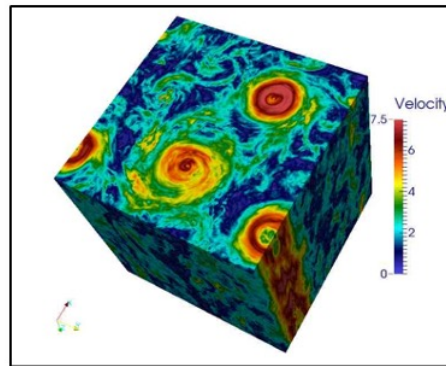
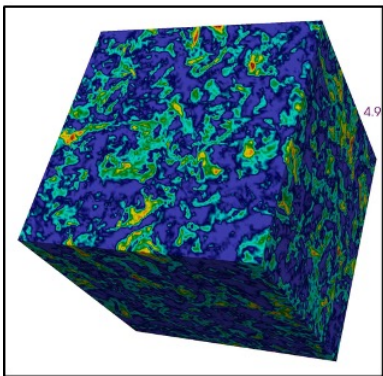
EULERIAN

$$\partial_t \theta + v \cdot \partial \theta = \chi \partial^2 \theta$$

$$\partial_t B + v \cdot \partial B = B \cdot \partial v + \chi \partial^2 B$$

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+ BOUNDARY CONDITIONS: (2D, 3D, THIN/THICK LAYERS ETC...)



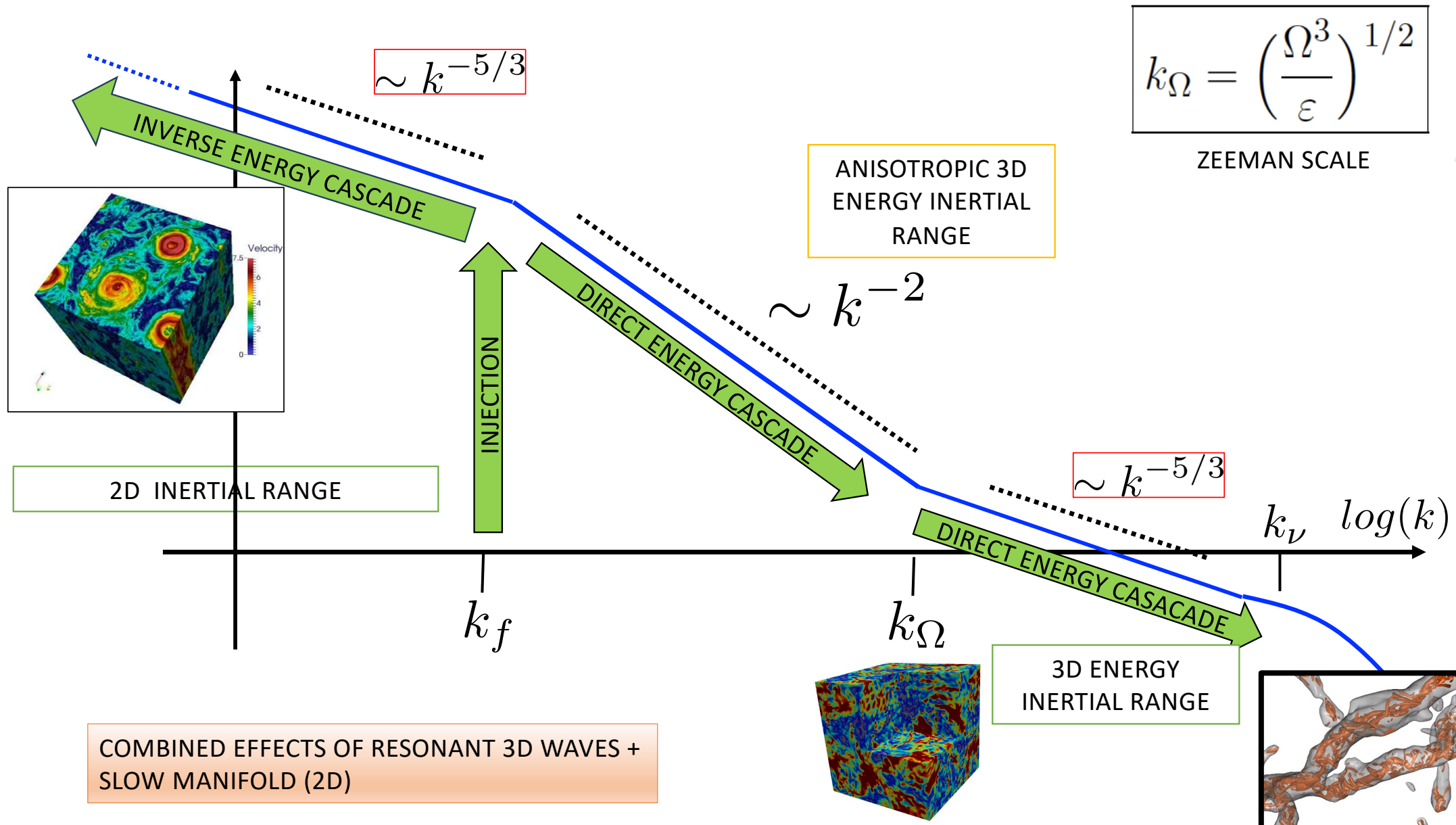
NEW CONTROL PARAMETER

ROOSBY NUMBER

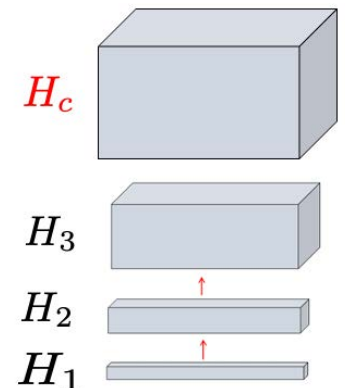
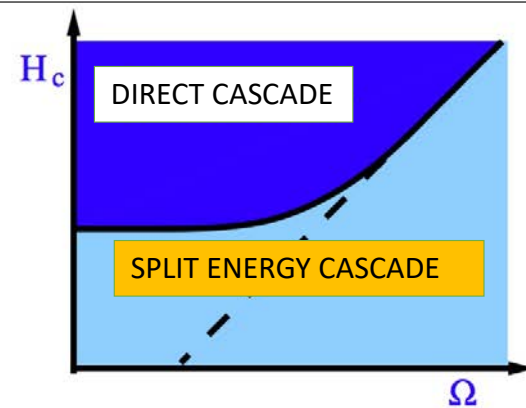
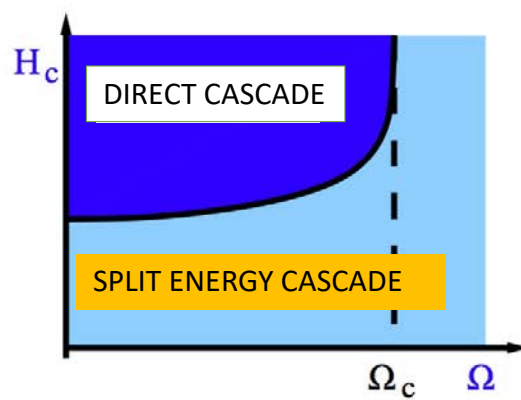
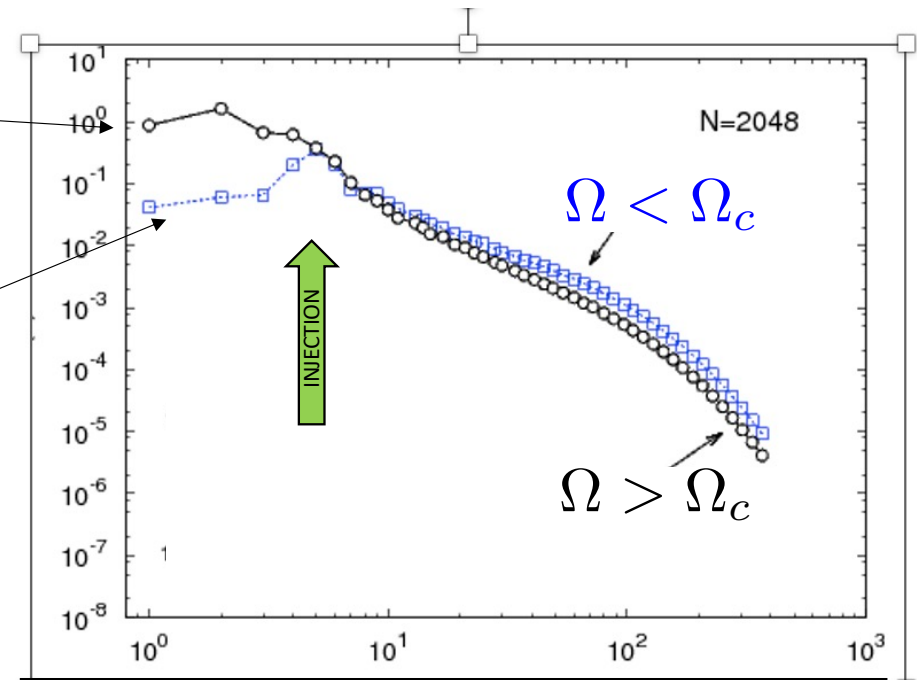
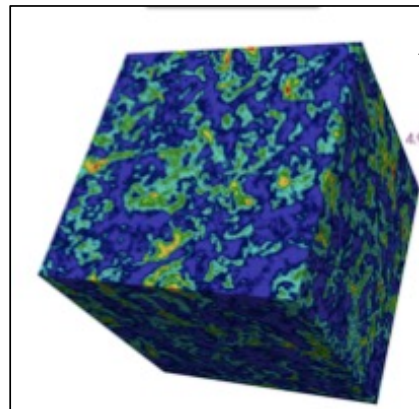
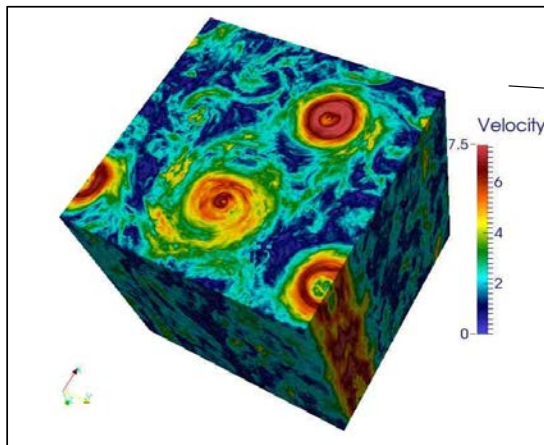
$$Ro = \frac{U}{2\Omega \ell_{in}}$$

$$k_{\Omega} = \left(\frac{\Omega^3}{\varepsilon} \right)^{1/2}$$

ZEEMAN SCALE



DOES THE INVERSE CASCADE PERSIST FOR ANY ASPECT RATIO? AND ROTATION STRONG ENOUGH?



- A. Sen et al Jour Atmos Science 68, 2757 (2011)
- E. Yarom et al PoF 25, 085105 (2013)
- A. Campagne et al PoF 26, 125112 (2014)
- L.B. F. Bonaccorso et al PRX 6, 041036 (2016)
- E. Deusebio et al PRE 90, 023005 (2014)
- A. Alexakis JFM 769, 46 (2015)

TURBULENCE OR TURBULENCES? STRATIFICATION

MASS X ACCELERATION = INTERNAL FORCES + EXTERNAL FORCES

$$\rho[\partial_t v + v \cdot \partial v] = -\partial p + \nu \Delta v + g\theta + F(B, B) + 2\Omega \times v + F$$

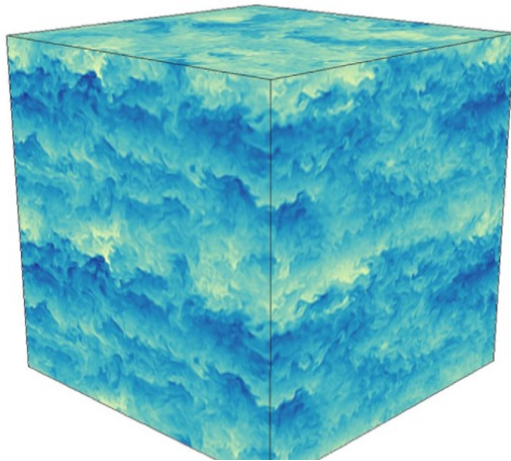
EULERIAN

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$$\partial_t B + v \cdot \partial B = B \cdot \partial v + \chi \partial^2 B$$

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+ BOUNDARY CONDITIONS: (2D, 3D, THIN/THICK LAYERS ETC...)

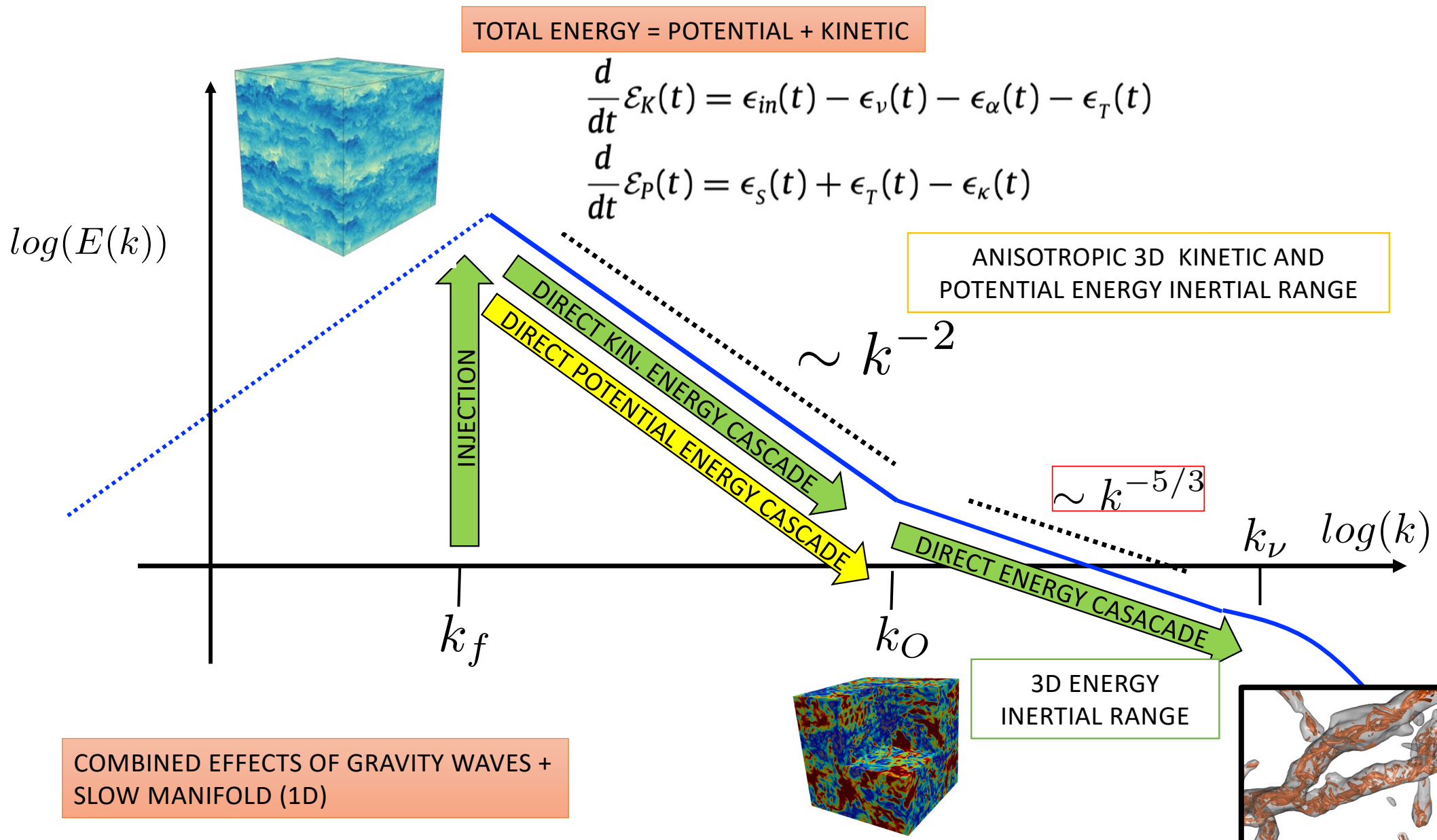


NEW CONTROL PARAMETER
BRUNT-VAISALA FREQUENCY -> FROUDE NUMBER

σ = MEAN STRATIFICATION

$$N = \sqrt{g\sigma}$$

$$Fr = \frac{U}{N\ell_{in}}$$



DOES THE INVERSE CASCADE PERSIST FOR ANY ASPECT RATIO? AND STRATIFICATION STRONG ENOUGH?

MASS X ACCELERATION = INTERNAL FORCES + EXTERNAL FORCES

$$\rho[\partial_t v + v \cdot \partial v] = -\partial p + \nu \Delta v + g\theta + \nabla(B, B) + 2\Omega \times v + F$$

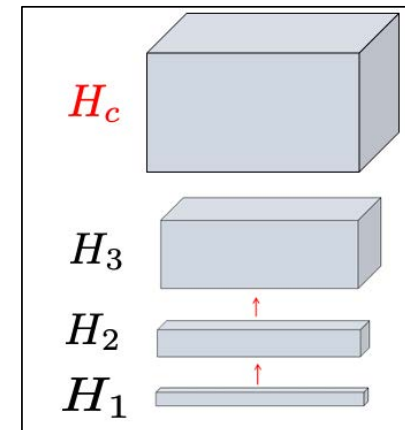
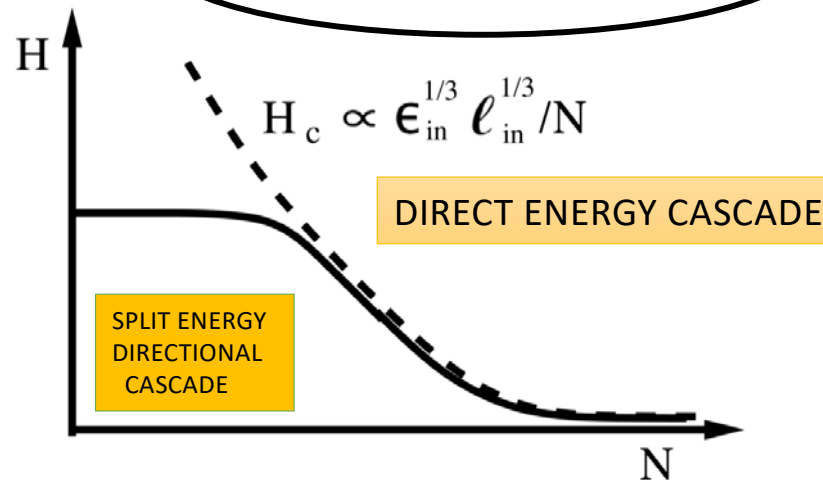
EULERIAN

$$\partial_t \theta + v \cdot \partial \theta = \chi \partial^2 \theta$$

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TURBULENCE OR TURBULENCES? ROTATION+STRATIFICATION

MASS X ACCELERATION = INTERNAL FORCES + EXTERNAL FORCES

$$\rho[\partial_t v + v \cdot \partial v] = -\partial p + \nu \Delta v + g\theta + \nabla(B, B) + 2\Omega \times v + F$$

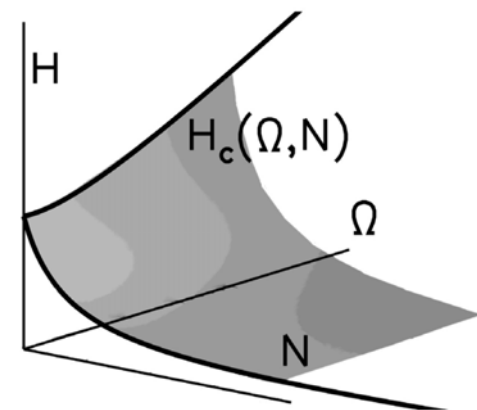
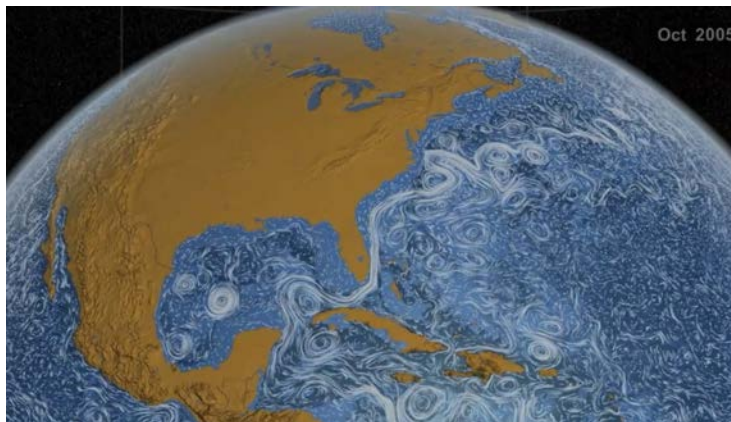
EULERIAN

$$\partial_t \theta + v \cdot \partial \theta = \chi \partial^2 \theta$$

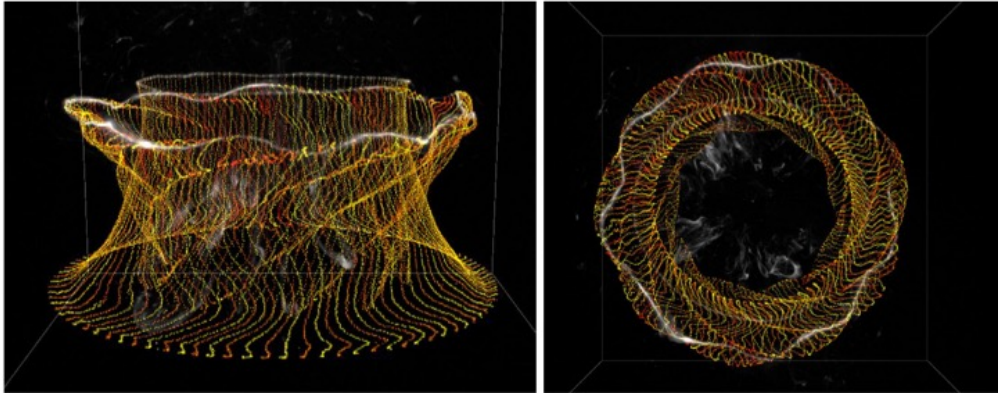
$$\partial_t B + v \cdot \partial B = B \cdot \partial v + \chi \partial^2 B$$

$$\partial \cdot v = 0$$

+ BOUNDARY CONDITIONS: (2D, 3D, THIN/THICK LAYERS ETC...)



HELICITY INJECTION



M.W. Scheeler, W.M. van Rees, H. Kedia, D. Kleckner, W.T. Irvine,

INVERSE ENERGY CASCADE IN 3D!

$$\begin{cases} E = \sum_{\mathbf{k}} |u^+(\mathbf{k})|^2 + |u^-(\mathbf{k})|^2; \\ H = \sum_{\mathbf{k}} k(|u^+(\mathbf{k})|^2 - |u^-(\mathbf{k})|^2). \end{cases}$$

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Complete measurement of helicity and its dynamics in vortex tubes

MARTIN W. SCHEELER, WIM M. VAN REES, HRIDESH KEDIA, DUSTIN KLECKNER, AND WILLIAM T. M. IRVINE Authors Info & Affiliations

ODD VISCOSITY

Pattern formation by non-dissipative arrest of turbulent cascades

Xander M. de Wit,¹ Michel Fruchart,^{2,3} Tali Khain,³ Federico Toschi,^{1,4} and Vincenzo Vitelli^{3,5}

¹Department of Applied Physics and Science Education

FLUX-LOOP CASCADE: ZERO-FLUX & OUT-OF-EQUILIBRIUM

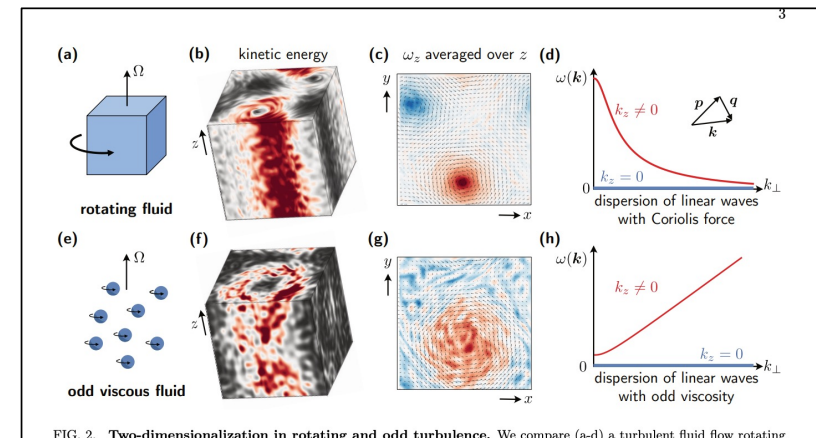
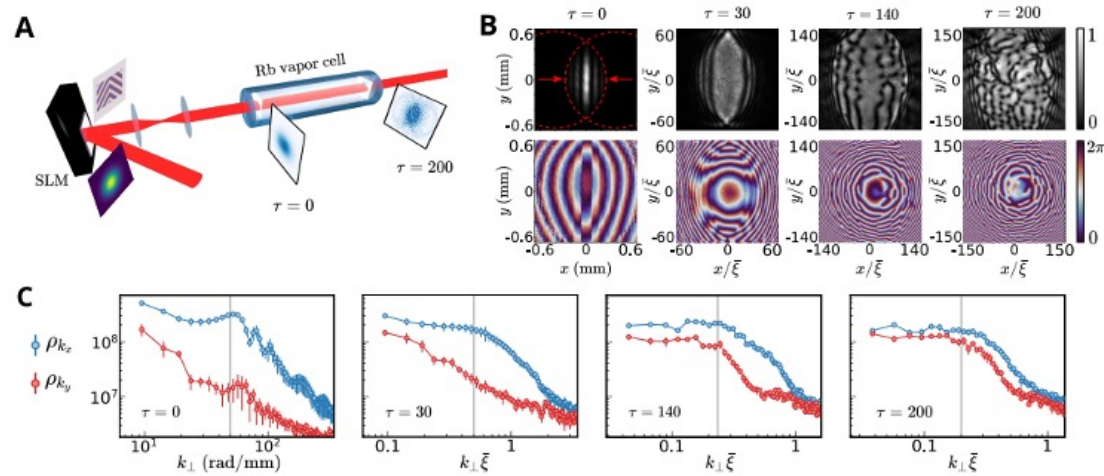


FIG. 2. Two-dimensionalization in rotating and odd turbulence. We compare (a-d) a turbulent fluid flow rotating

Inverse energy cascade in two-dimensional quantum turbulence in a fluid of light

Myrann Abobaker, Wei Liu, Tangui Aladjidi, Alberto Bramati, and Quentin Glorieux*



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REPORT

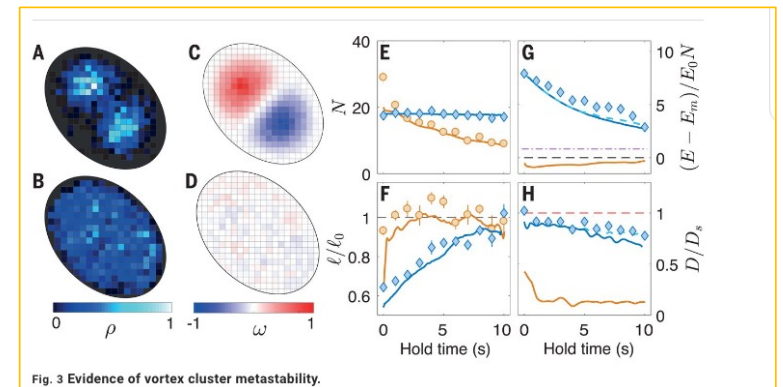
f t in

Giant vortex clusters in a two-dimensional quantum fluid

GUILLAUME GAUTHIER, MATTHEW T. REEVES, XIAOQUAN YU, ASHTON S. BRADLEY, MARK A. BAKER, THOMAS A. BELL

HALINA RUBINSZTEIN-DUNLOP, MATTHEW J. DAVIS, AND TYLER W. NEELY [Authors Info & Affiliations](#)

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TURBULENCE IS

HIGH COMPLEXITY:

- STRONGLY NON-LINEAR (NON PERTURBATIVE)
- MULTI-SCALE (BILLIONS OF HYDRODYNAMICAL DEGREES OF FREEDOM)
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- FLUX-LOOP (0 FLUX $\rightarrow$ BIDIRECTIONAL CASCADE) ODD-VISCOSITY FLUIDS, STRATIFICATION 2D

MULTI FEATURES:

A STORY OF: LOCAL VS NON-LOCAL FOURIER INTERACTIONS, INERTIAL AND GRAVITY WAVES, SLOW-MANIFOLDS, TOPOLOGICAL CONSTRAINTS

J. von NEUMANN (1949)

These considerations justify the view that a considerable mathematical effort towards a detailed understanding of the mechanism of turbulence is called for. The entire experience with the subject indicates that the purely analytical approach is beset with difficulties, which at this moment are still prohibitive. The reason for this is probably as was indicated above: That our intuitive relationship to the subject is still too loose — not having succeeded at anything like deep mathematical penetration in any part of the subject, we are still quite disoriented as to the relevant factors, and as to the proper analytical machinery to be used.

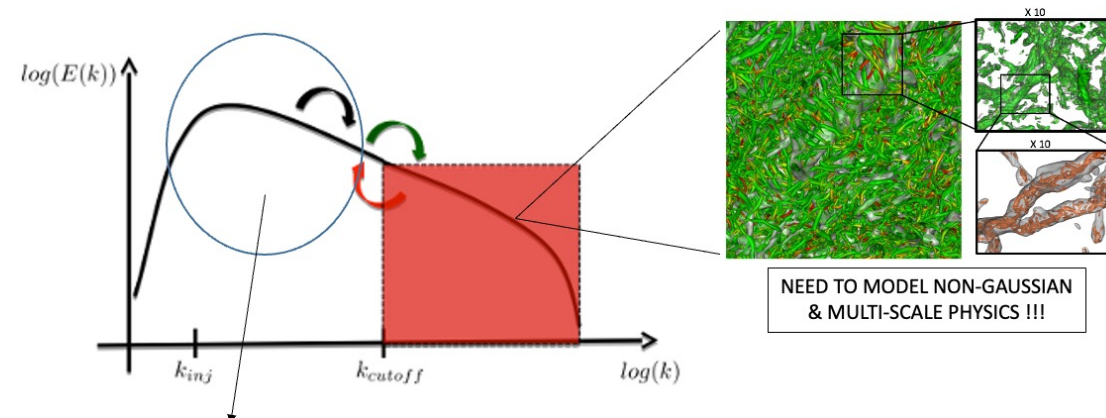
Under these conditions there might be some hope to 'break the deadlock' by extensive, but well-planned, computational efforts. It must be admitted that the problems in question are too vast to be solved by a direct computational attack, that is, by an outright calculation of a representative family of special cases. There are, however, strong indications that one could name certain strategic points in this complex, where relevant information must be obtained by direct calculations. If this is properly done, and the operation is then repeated on the basis of broader information then becoming available, etc., there is a reasonable chance of effecting real penetrations in this complex of problems and gradually developing a useful, intuitive relationship to it. This should, in the end, make an attack with analytical methods, that is truly more mathematical, possible.¹

HOW/WHERE TO USE DATA-DRIVEN TOOLS TO ATTACK TURBULENCE?

1. TO SUPER-RESOLVE/MODEL SMALL-SCALES PROPERTIES IN DNS MODELS:

$$\partial_t v + \nabla(v \otimes v) = -\nabla p + \nu \Delta v$$

$$\bar{v}(x, t) \equiv \int_{\Omega} dy G(|x - y|) v(y, t) = \sum_{k \in \mathbb{Z}^3} G(k) \hat{v}(k, t) e^{ikx}$$



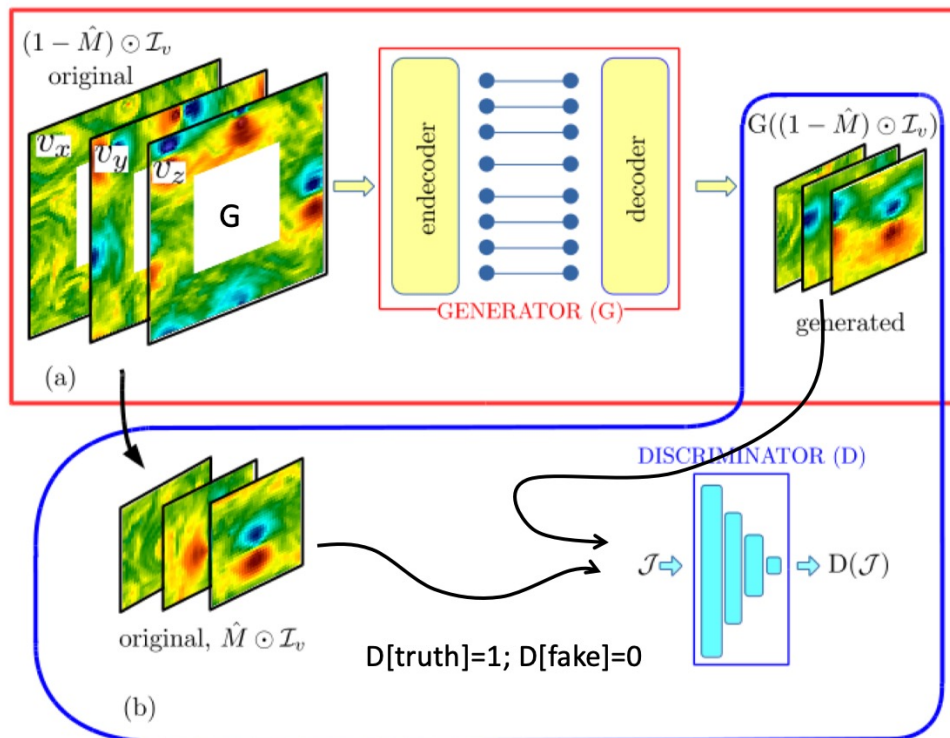
$$\partial_t \bar{v} + \nabla \cdot (\bar{v} \otimes \bar{v}) = -\nabla \bar{p} + \nabla \cdot \tau^{\Delta}(\mathbf{v}, \mathbf{v}) + \nu \Delta \bar{v}$$

$$\tau_{ij}^{\Delta}(\mathbf{v}, \mathbf{v}) = \overline{v_i v_j} - \bar{v}_i \bar{v}_j \xrightarrow{\text{?????}} \tau(\bar{\mathbf{v}}, \bar{\mathbf{v}})$$

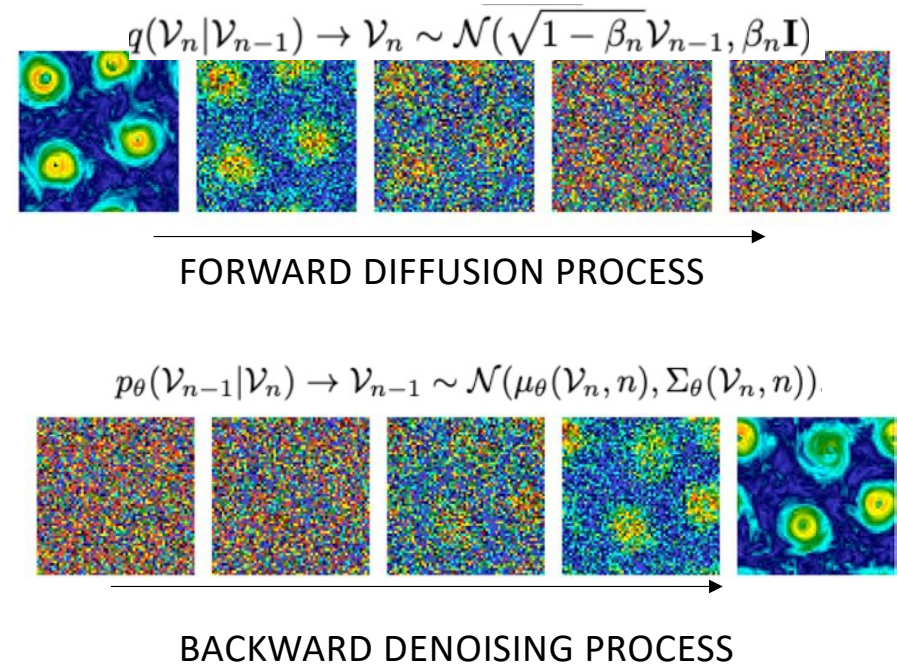
HOW/WHERE TO USE DATA-DRIVEN TOOLS TO ATTACK TURBULENCE?

2. TO GENERATE/AUGMENT PARTIAL FIELD OBSERVATIONS/MEASUREMENT

GENERATIVE ADVERSARIAL TOOLS



GENERATIVE DIFFUSION MODELS

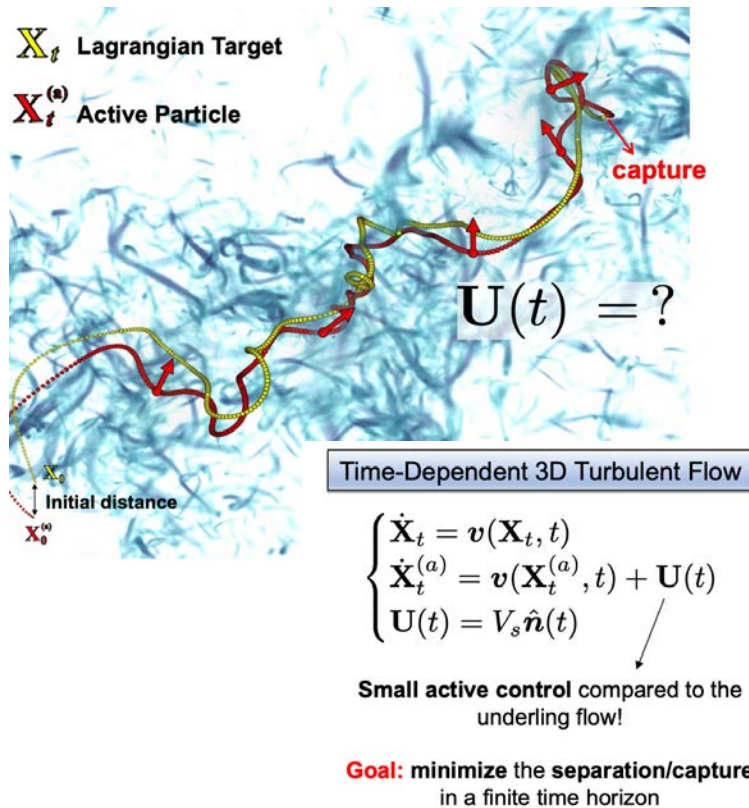


Multi-scale reconstruction of turbulent rotating flows with proper orthogonal decomposition and generative adversarial networks T Li, M Buzzicotti, L B., F Bonaccorso, S Chen, M Wan
Journal of Fluid Mechanics 971, A3 (2023)

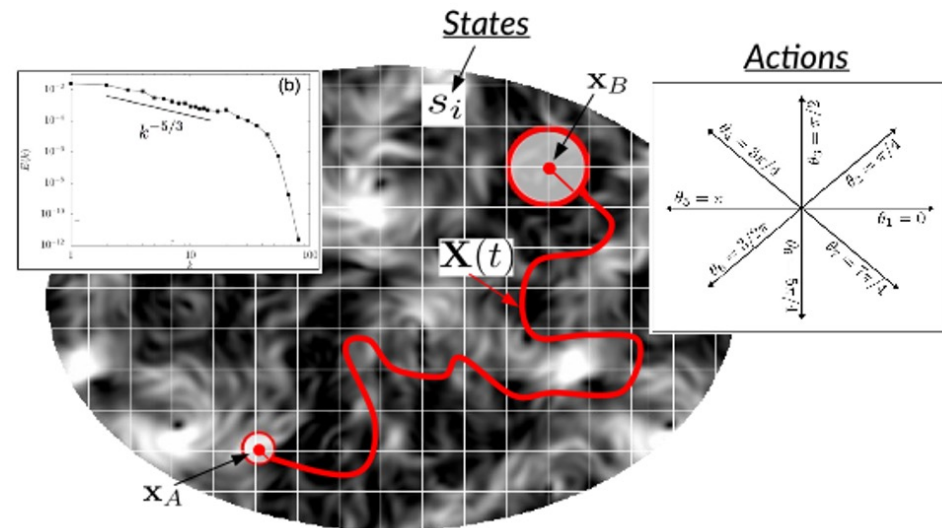
Synthetic lagrangian turbulence by generative diffusion models
T Li, L B., F Bonaccorso, MA Scarpolini, M Buzzicotti arXiv:2307.08529

HOW/WHERE TO USE DATA-DRIVEN TOOLS TO ATTACK TURBULENCE?

3. FOR OPTIMAL NAVIGATION POLICIES OF LAGRANGIAN ACTIVE SMALL OBJECTS



Reinforcement Learning; Policy Gradient Methods



Optimal tracking strategies in a turbulent flow. Calascibetta, C., B. L., Borra, F. et al. *Commun Phys* 6, 256 (2023).

Zermelo's problem: optimal point-to-point navigation in 2D turbulent flows using reinforcement learning. L B. F Bonaccorso, M Buzzicotti, P Clark Di Leoni, K Gustavsson *Chaos: An Interdisciplinary Journal of Nonlinear Science* 29 (2019)

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HOW TO BREAK THE DEADLOCK?

USE ANY POSSIBLE TOOL: SYNERGIES BETWEEN GOOD ANALYTICAL THEORIES/MODELS + WELL PLANNED EXPERIMENTS/NUMERICAL SIMULATIONS + DATA-DRIVEN APPROACH

BASIC FUNDAMENTAL OPEN PROBLEMS ABOUT GLOBAL AND LOCAL PROPERTIES

1. WE DO NOT CONTROL THE **MEAN ENERGY FLUX**: DOES THE INJECTED ENERGY FLOW TOWARDS SMALL-SCALES OR TOWARDS LARGE-SCALES (OR BOTH)?
2. WE DO NOT CONTROL THE SCALE-BY-SCALE **MEAN ENERGY SPECTRUM**
3. WE DO NOT CONTROL NEITHER EULERIAN NOR LAGRANGIAN **FLUCTUATIONS** AROUND THE MEAN GLOBAL PROPERTIES

3D

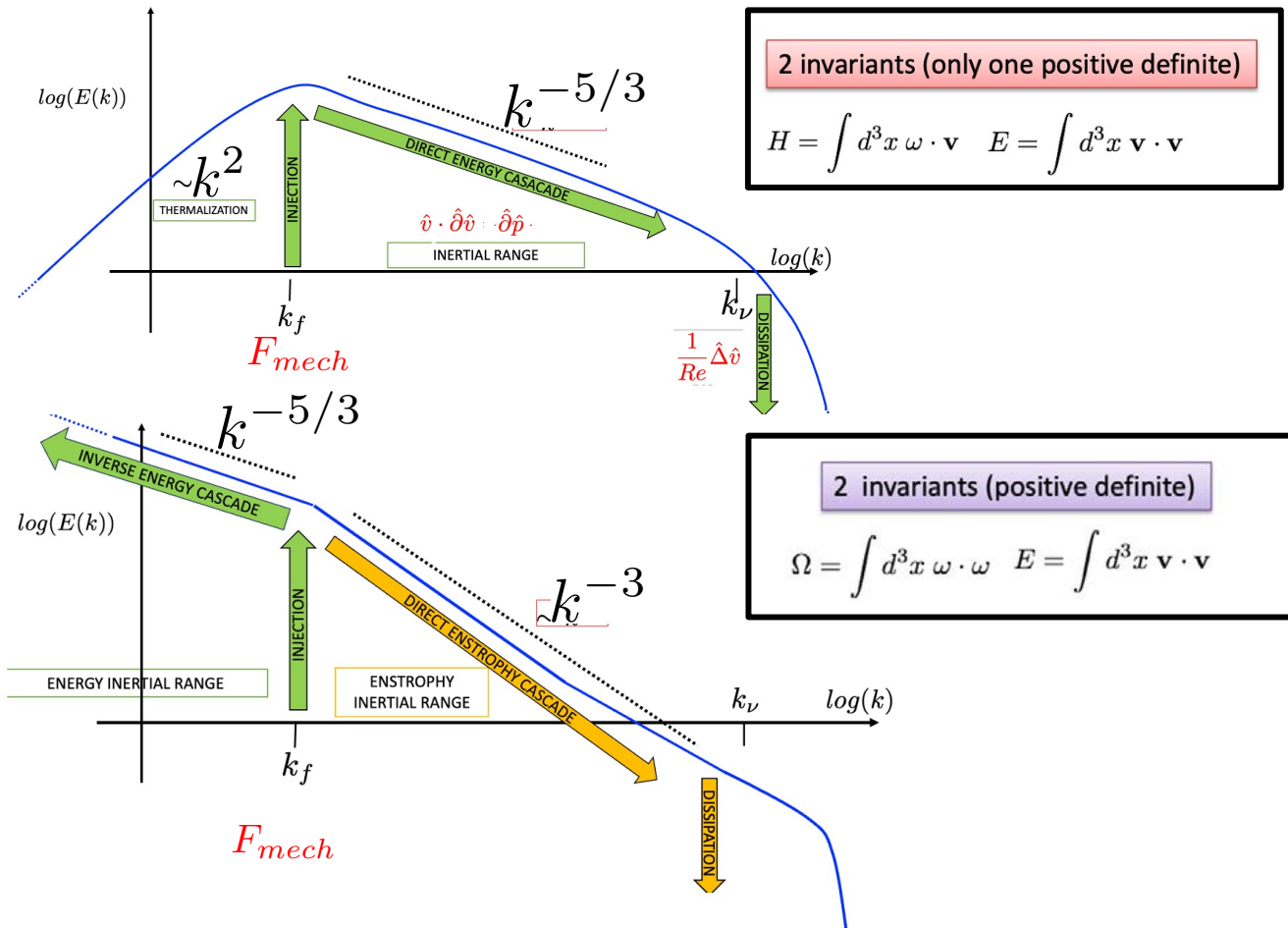
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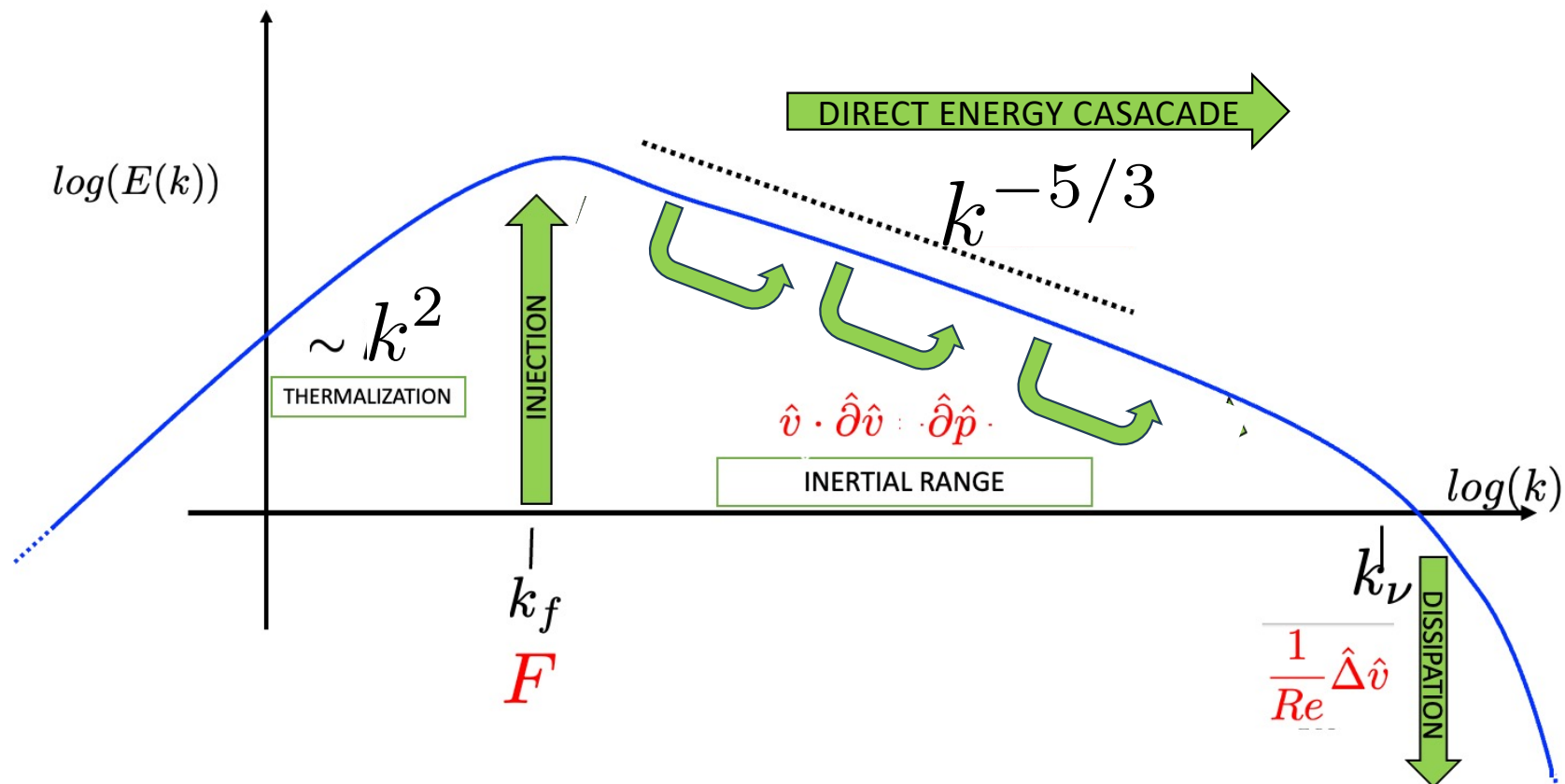
Vortices within vortices: hierarchical nature of vortex tubes in turbulence

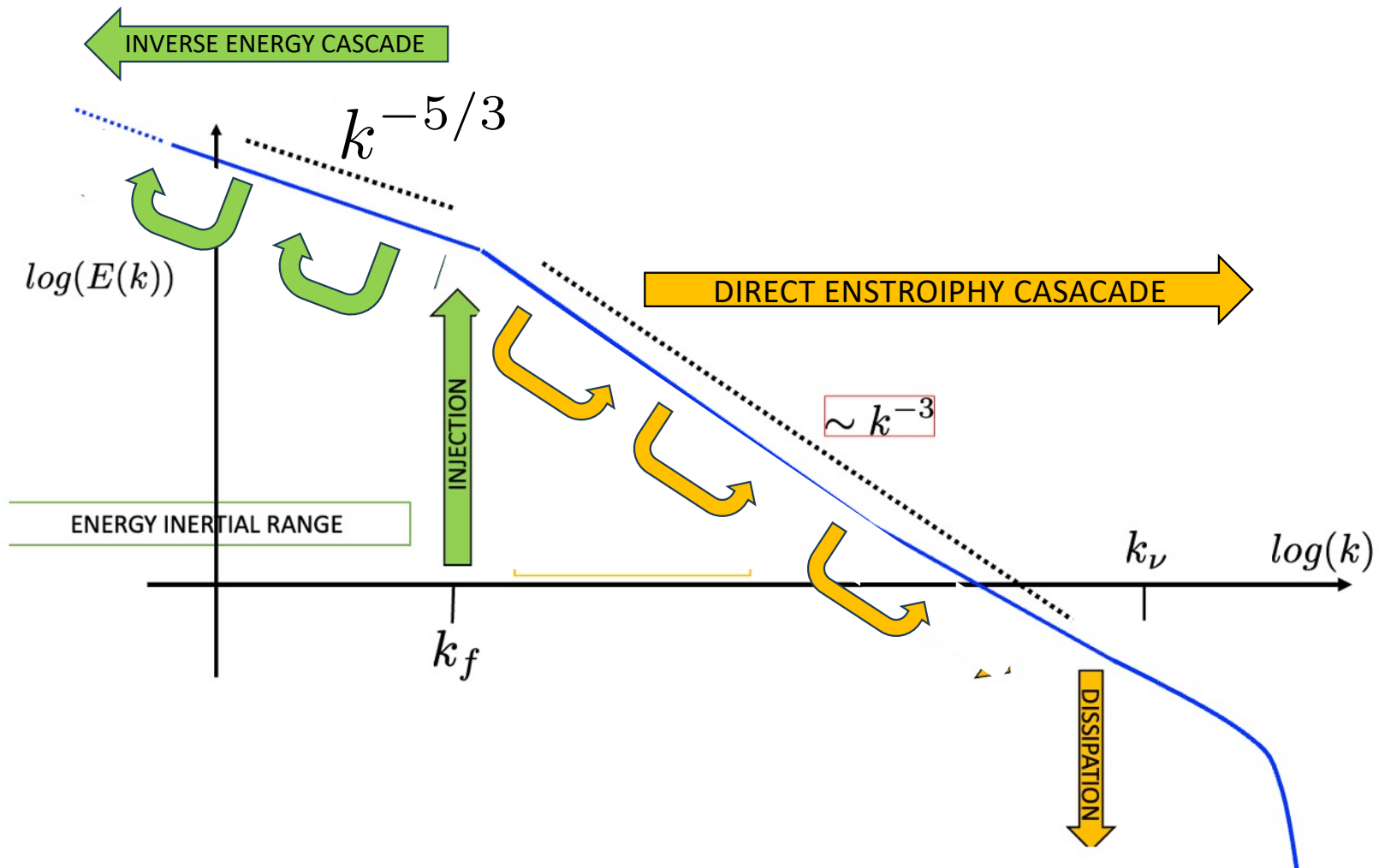
Kai Bürger¹, Marc Treib¹, Rüdiger Westermann¹,
Suzanne Werner², Cristian C Lalescu³,
Alexander Szalay², Charles Meneveau⁴, Gregory L Eyink^{2,3,4}

¹ Informatik 15 (Computer Graphik & Visualisierung), Technische Universität München
² Department of Physics & Astronomy, The Johns Hopkins University
³ Department of Applied Mathematics & Statistics, The Johns Hopkins University
⁴ Department of Mechanical Engineering, The Johns Hopkins University

2D







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Vortices within vortices: hierarchical nature of vortex tubes in turbulence

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2D

