

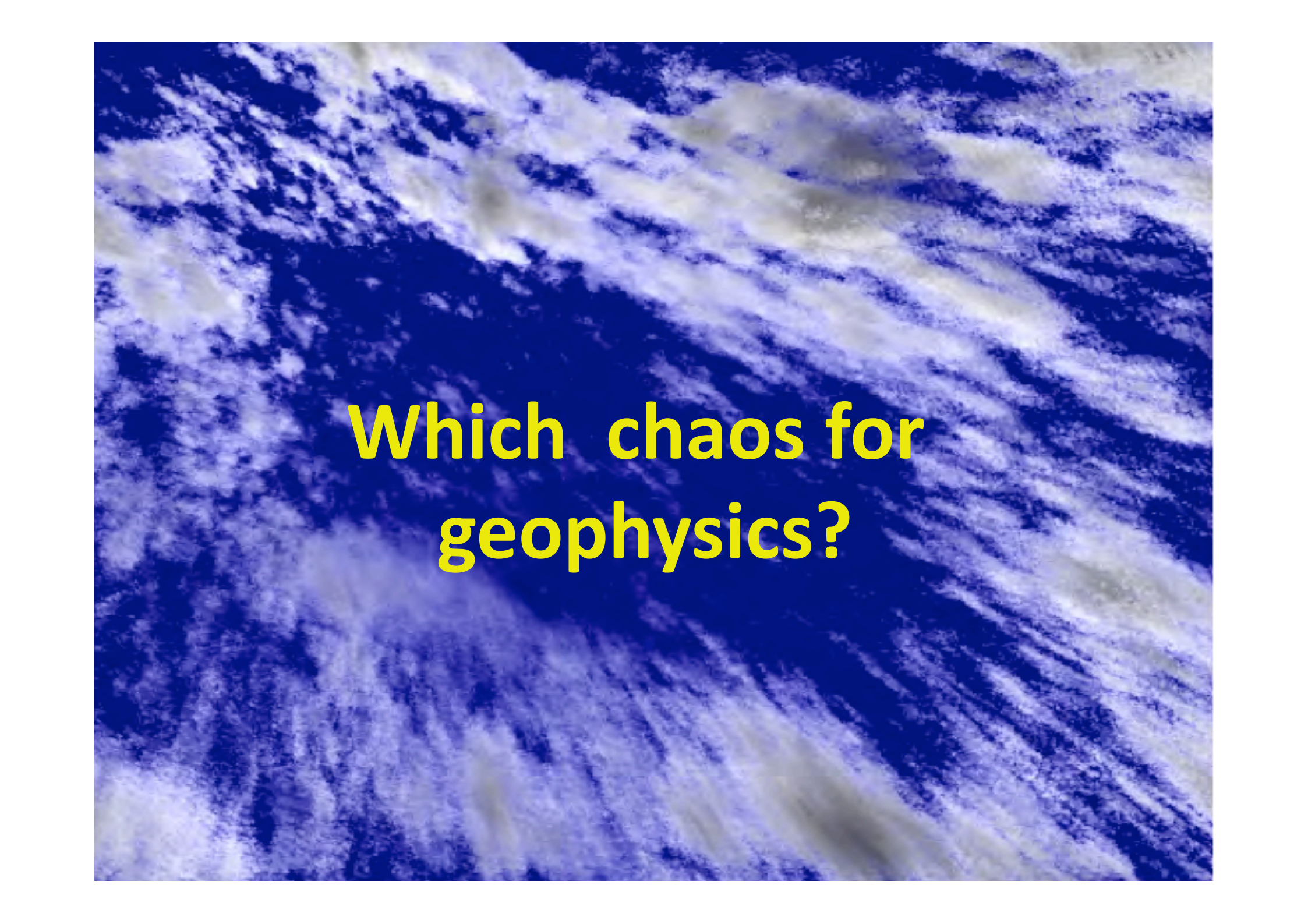


PHYS 616 Multifractals and Turbulence

Lecture 1:

Introduction:

Our multifractal world

An aerial photograph of a river with white-water rapids. The water is a deep blue color, and the rapids are a bright white color. The rapids are located in the center of the image, and the water flows from the top left towards the bottom right. The rapids are surrounded by a dense forest of green trees.

**Which chaos for
geophysics?**

Deterministic Chaos?

Low Dimensional Nonlinear Dynamics I

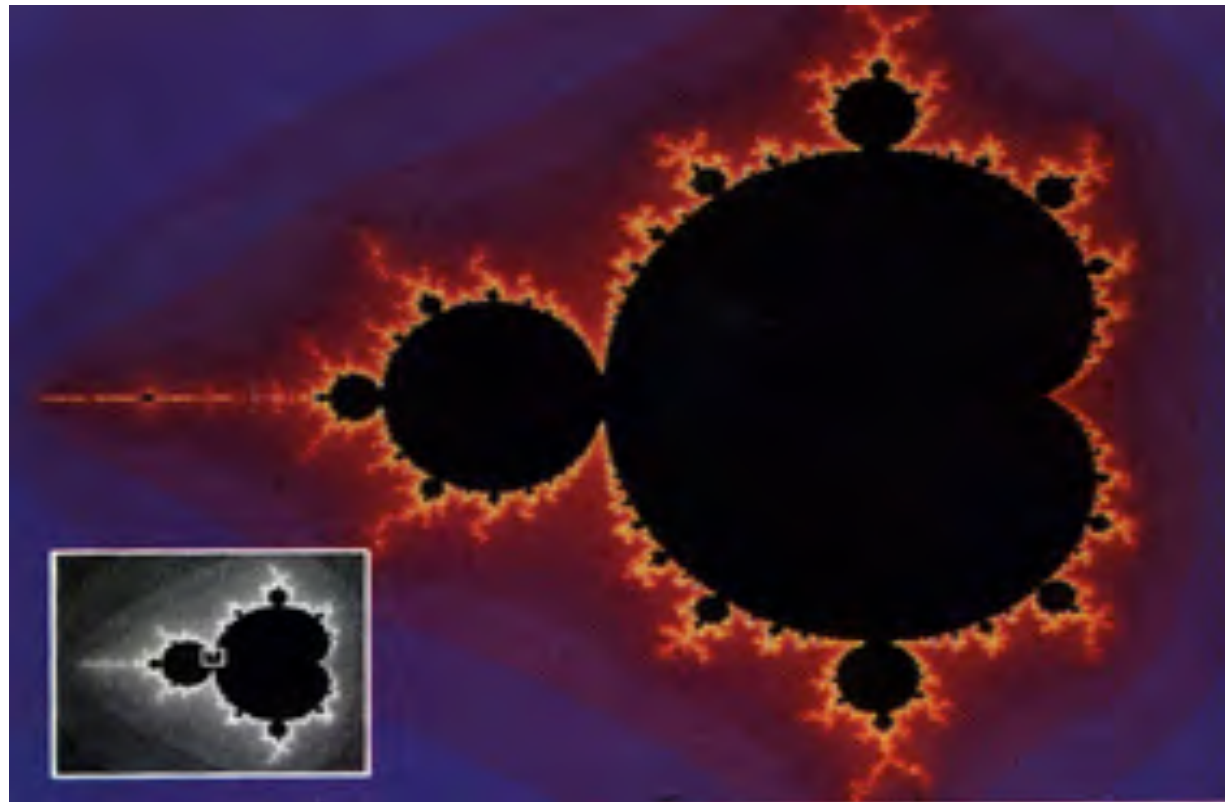
Nonlinear Mappings

Discrete time (=n) evolution of a few variables (\underline{x}):

Z, C are complex numbers

$$Z_{n+1} = Z_n^2 + C$$

The Mandelbrot set



Low Dimensional Nonlinear Dynamics II

Flows

Continuous time (=t) evolution of a few degrees of freedom (\underline{X}):

$$\frac{d\underline{X}}{dt} = \underline{F}(\underline{X})$$

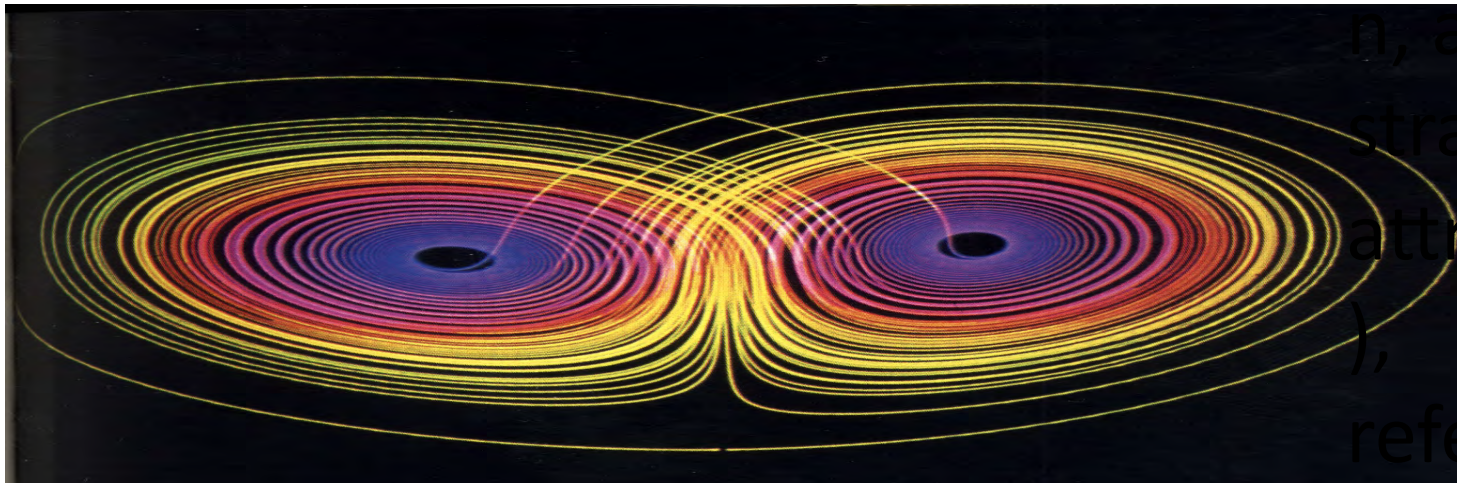
Lorenz equations:

$$\begin{aligned}\frac{dx}{dt} &= \sigma(y - x) \\ \frac{dy}{dt} &= rx - y - xz \\ \frac{dz}{dt} &= xy - bz\end{aligned}$$

where r , b , σ are positive constants.

Few degrees of freedom... few applications

Give some details about chaos (definition, also strange attractors), reference





**Or stochastic
chaos?**

High Dimensional Nonlinear Dynamics

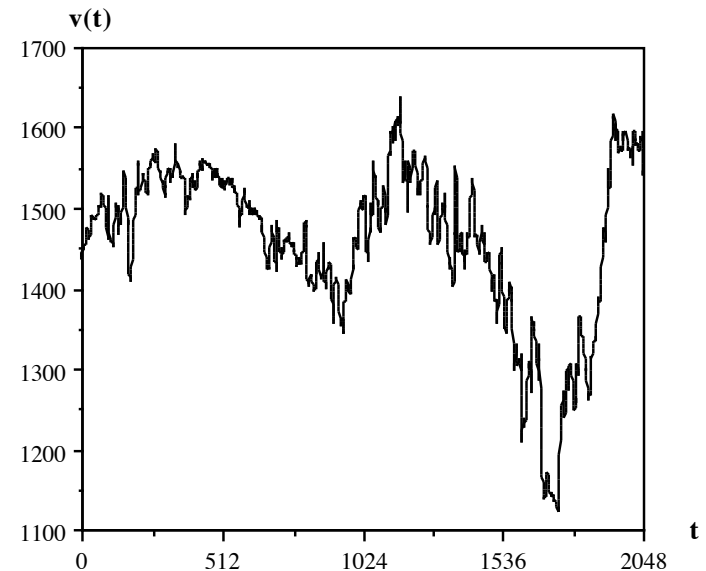
Nonlinear PDE 's

Fields/spatial structures evolving in time

Example: Navier-Stokes Equations:

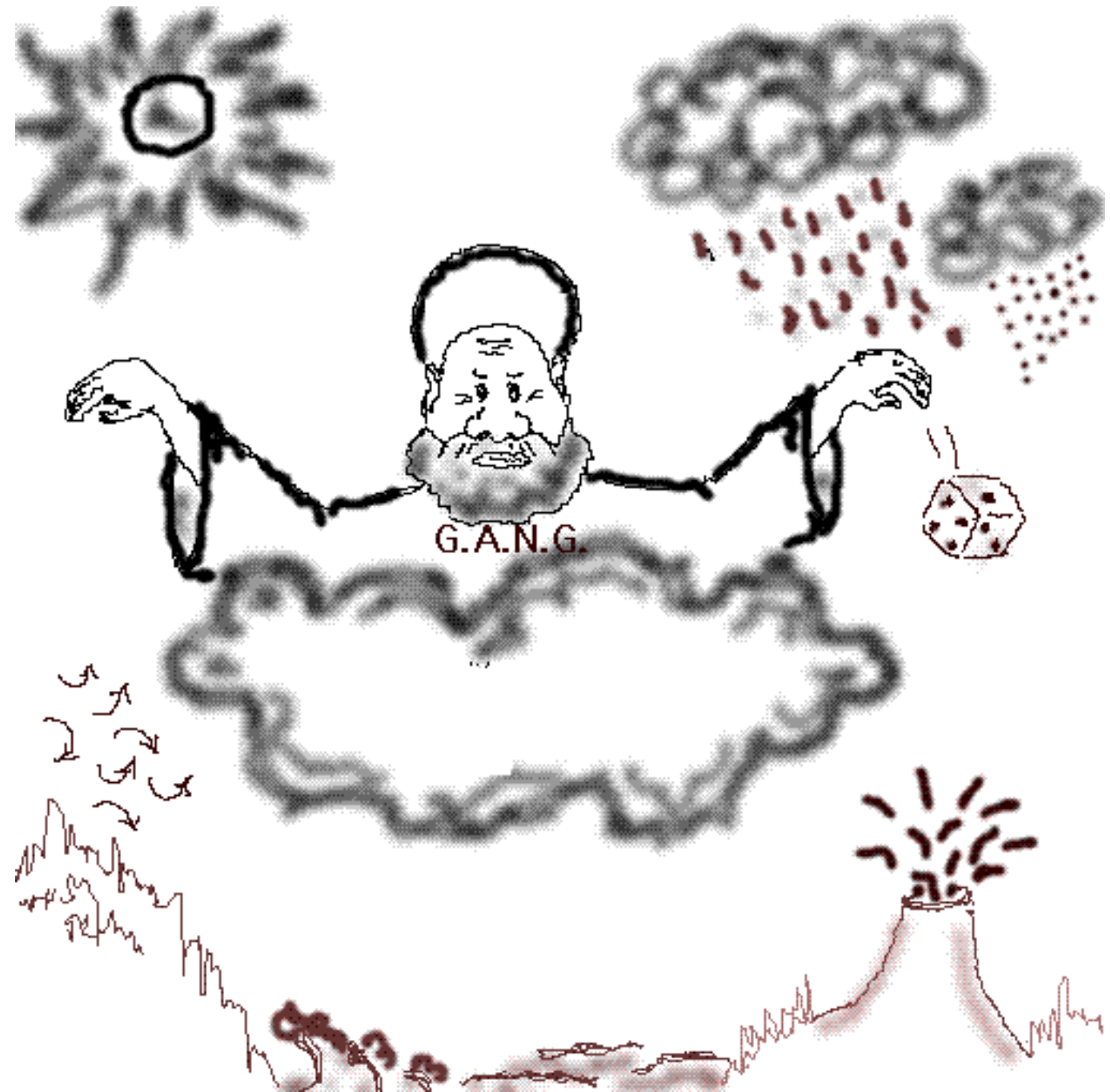
$$\frac{\partial \underline{v}}{\partial t} + (\underline{v} \cdot \nabla) \underline{v} = -\frac{\nabla p}{\rho} + \nu \nabla^2 \underline{v} + \underline{f}$$
$$\nabla \cdot \underline{v} = 0$$

where \underline{v} = velocity, t = time, p = pressure, ρ = density, ν = viscosity, \underline{f} = body forces (e.g. stirring, gravity).



**1 second of wind
data**

How
does He
play
Dice?

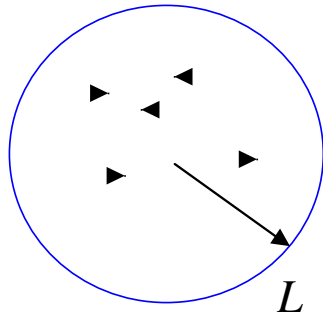




Scale Invariance

The simplest scale invariant system: Isotropic Scale Invariance and fractal sets

Fractal Dimension:



$$n(L) \propto L^D$$

Number of points

$$\rho(L) = \frac{n(L)}{L^d} \propto L^{D-d} = L^{-C}$$

Density of points

d=dimension of space
D= fractal dimension of set
C=d-D= fractal codimension

Scale invariance:

$$n(\lambda L) = \lambda^D n(L)$$

D=scale invariant

Same form after zoom by factor λ .

Meteorological measuring network

Fractal set: each
point is a
station

9962 stations (WMO)



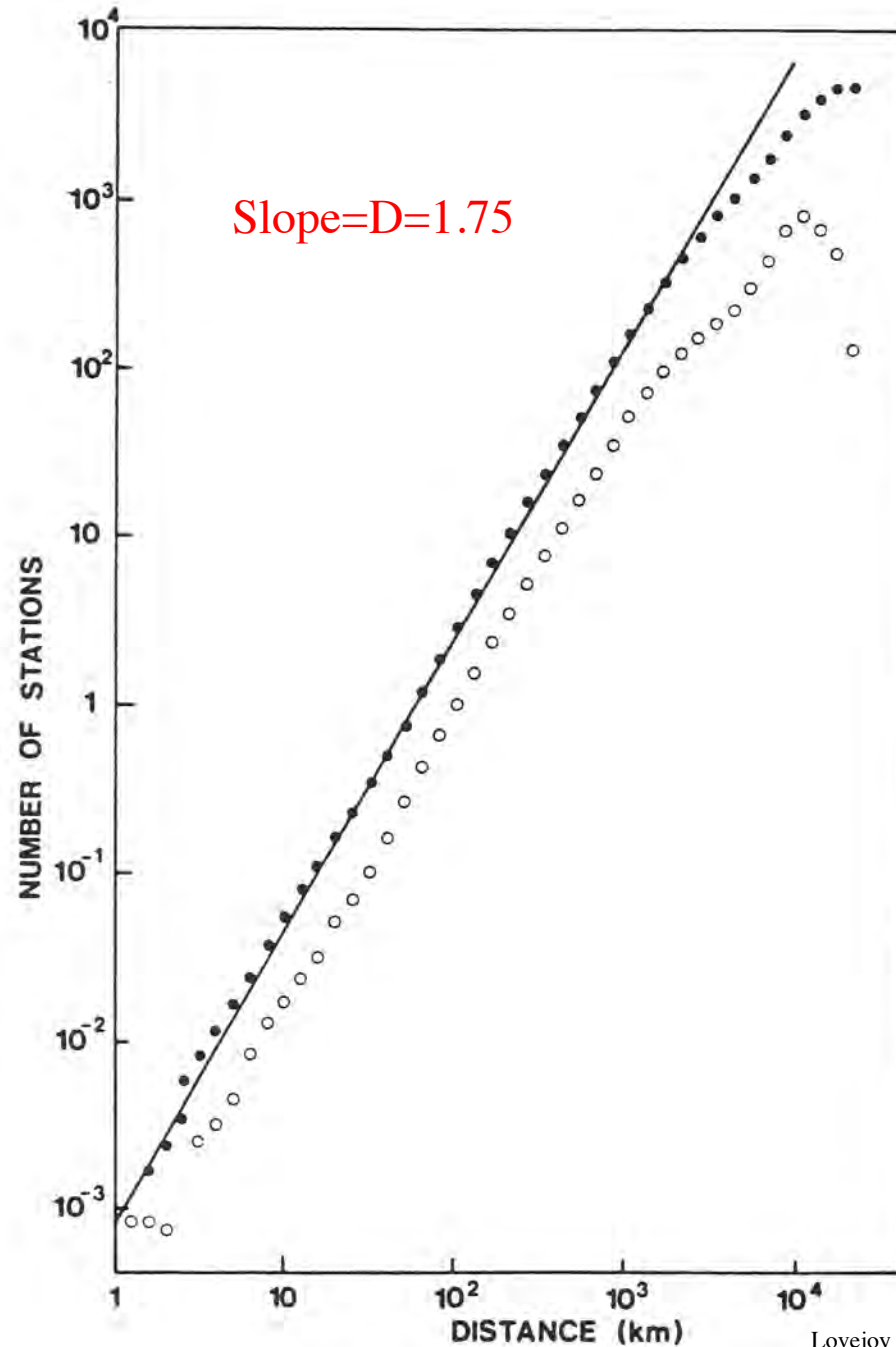
Number

$$n(L) \propto L^D$$

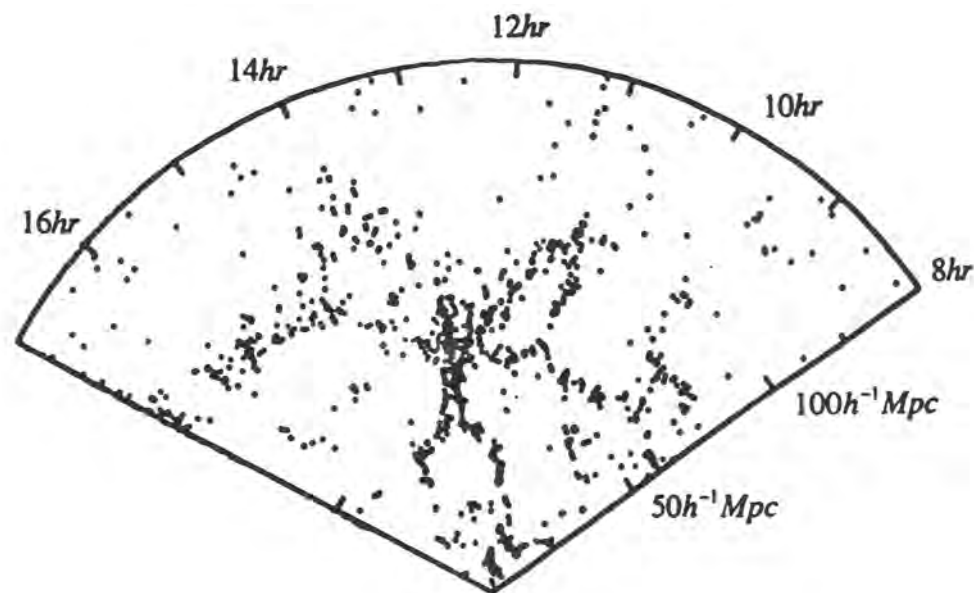
Density

$$\rho(L) = n(L)L^{-2} \propto L^{-C}; \quad C = d - D; \quad d = 2$$

The fractal dimension of the network=
1.75



Slice of the Universe

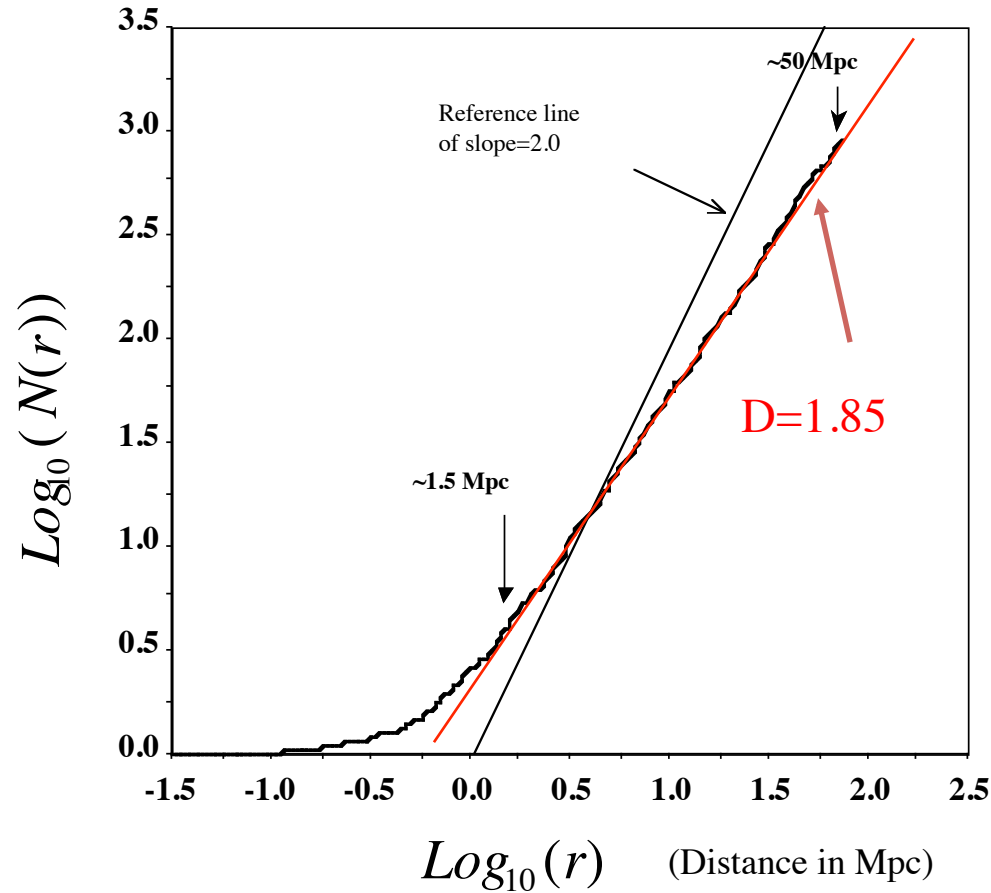


cfA2 catalogue

de Lapparent *et al* 1986

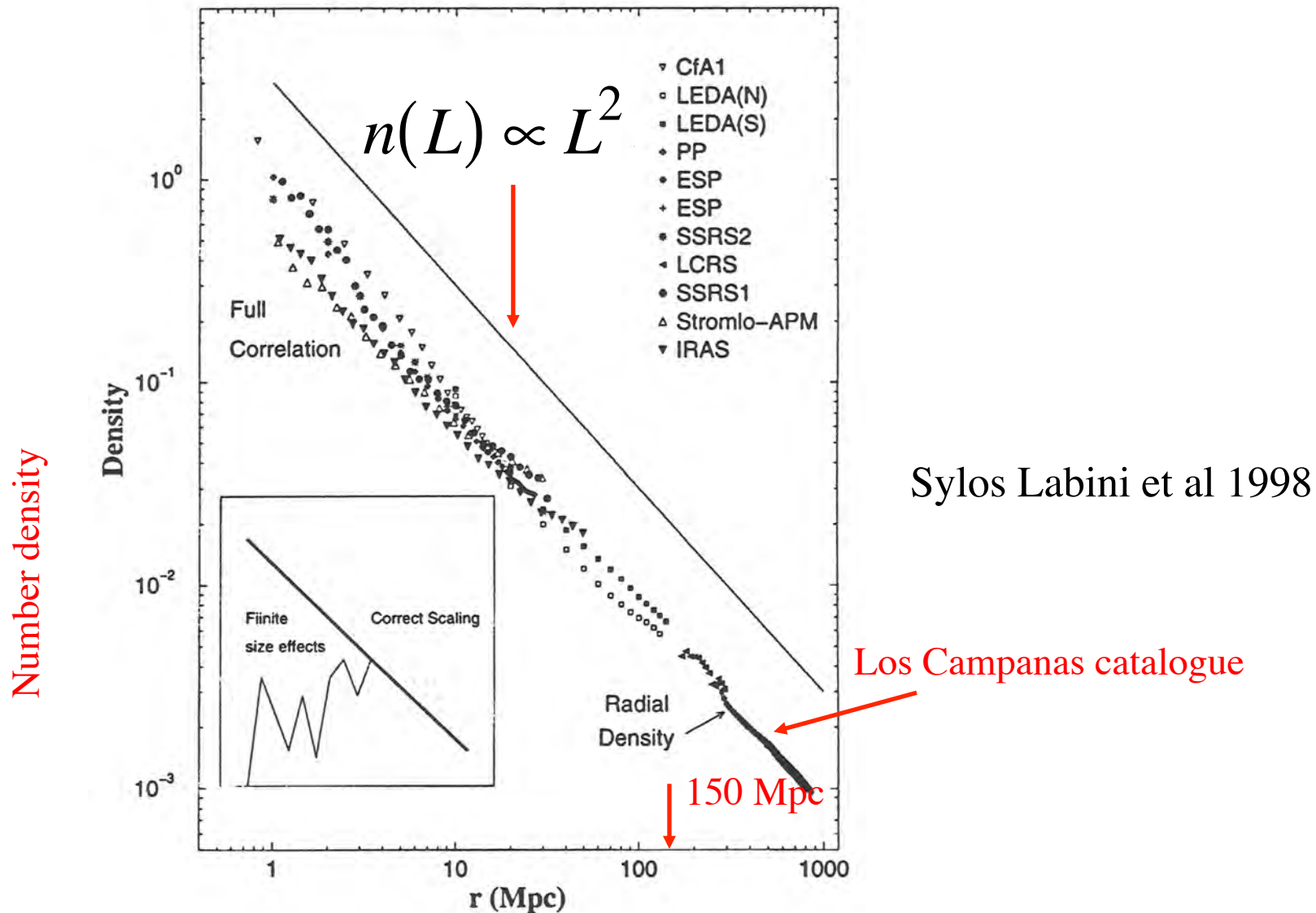
1068 galaxies with apparent magnitude $m < 15.5$ and located in the region $8\text{hr} < \alpha < 17\text{hr}$ and $26.5'' < \delta < 32.5''$. The sample's depth is 150 Mpc (units of 100 km sec Mpc).

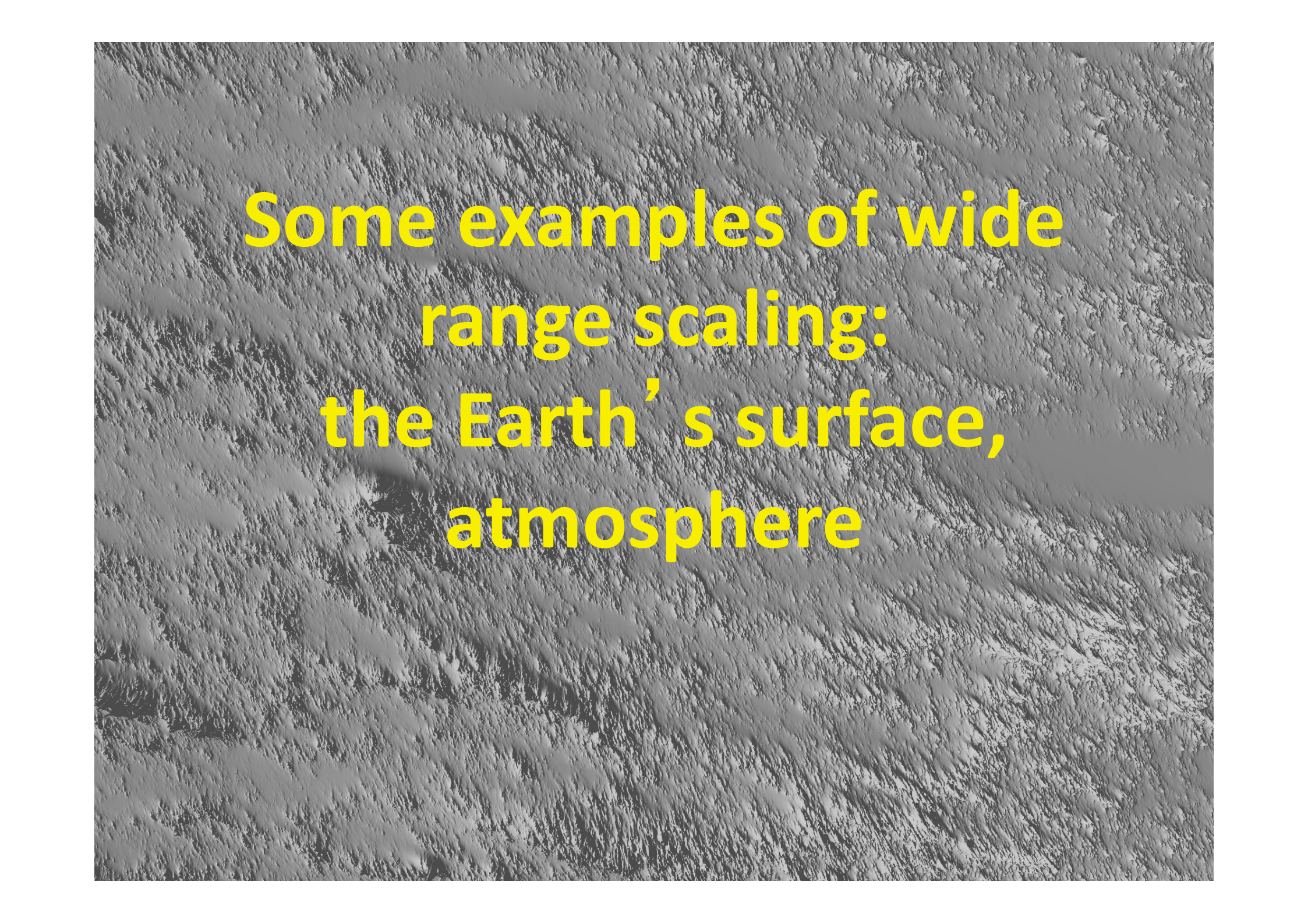
Fractal analysis of galaxies as points



Scaling analysis of a "Slice of the Universe". The linear scaling range extends from a few up to about 50 Mpc, the size of the largest circle embedded in the sample. From Garrido, Lovejoy and Schertzer 1996.

Is the large scale structure of the universe scaling to 1000Mpc?





**Some examples of wide
range scaling:
the Earth's surface,
atmosphere**

Multiscaling of the Navier-Stokes equations

Zoom factor λ $\vec{x} \rightarrow \frac{\vec{x}}{\lambda}$

Rescaling
of the
velocity

$\vec{v} \rightarrow \frac{\vec{v}}{\lambda^H}$

H is an
arbitrary
scaling
exponent

$t \rightarrow \frac{t}{\lambda^{1-H}}$

Rescaling of
time, viscosity,
forcing follow
from dimensional
considerations

$\nu \rightarrow \frac{\nu}{\lambda^{1+H}}$

$\vec{f} \rightarrow \frac{\vec{f}}{\lambda^{2H-1}}$

$$\frac{\partial \vec{v}}{\partial t} + (\vec{v} \cdot \nabla) \vec{v} = -\frac{\nabla p}{\rho} + \nu \nabla^2 \vec{v} + \vec{f}$$

$$\nabla \cdot \vec{v} = 0$$

(constraint used to eliminate p) where \vec{v} = velocity, t = time, p = pressure, ρ = density, ν = viscosity, \vec{f} = body forces (stirring, gravity)

Kolmogorov's Law:

Considering $\varepsilon = -\frac{\partial v^2}{\partial t}$ energy flux to smaller scales to be invariant, we obtain

H = 1/3, hence for mean shear

$$\Delta \vec{v} \approx \varepsilon^{1/3} \Delta x^{1/3}; \quad E(k) = k^{-5/3}$$

This already leads to singularities:

$$\frac{\partial \vec{v}}{\partial x} = \lim_{\Delta x \rightarrow 0} \frac{\Delta v}{\Delta x} \approx \Delta x^{-2/3} \rightarrow \infty$$

The Emergence of physical laws

Quantum mechanics

stochastic



Large scales
(usually)

Classical Mechanics

deterministic

Statistical mechanics

stochastic



Large
numbers of
particles

Continuum
mechanics,
thermodynamics

deterministic



Low level
(fundamental)



high level

The emergence of atmospheric dynamics (Classical)

Continuum mechanics

deterministic

Low level
(fundamental)

Large Re



Laws of turbulence

Classical:

Richardson, Kolmogorov,
Corrsin, Obukhov, Bolgiano

High level

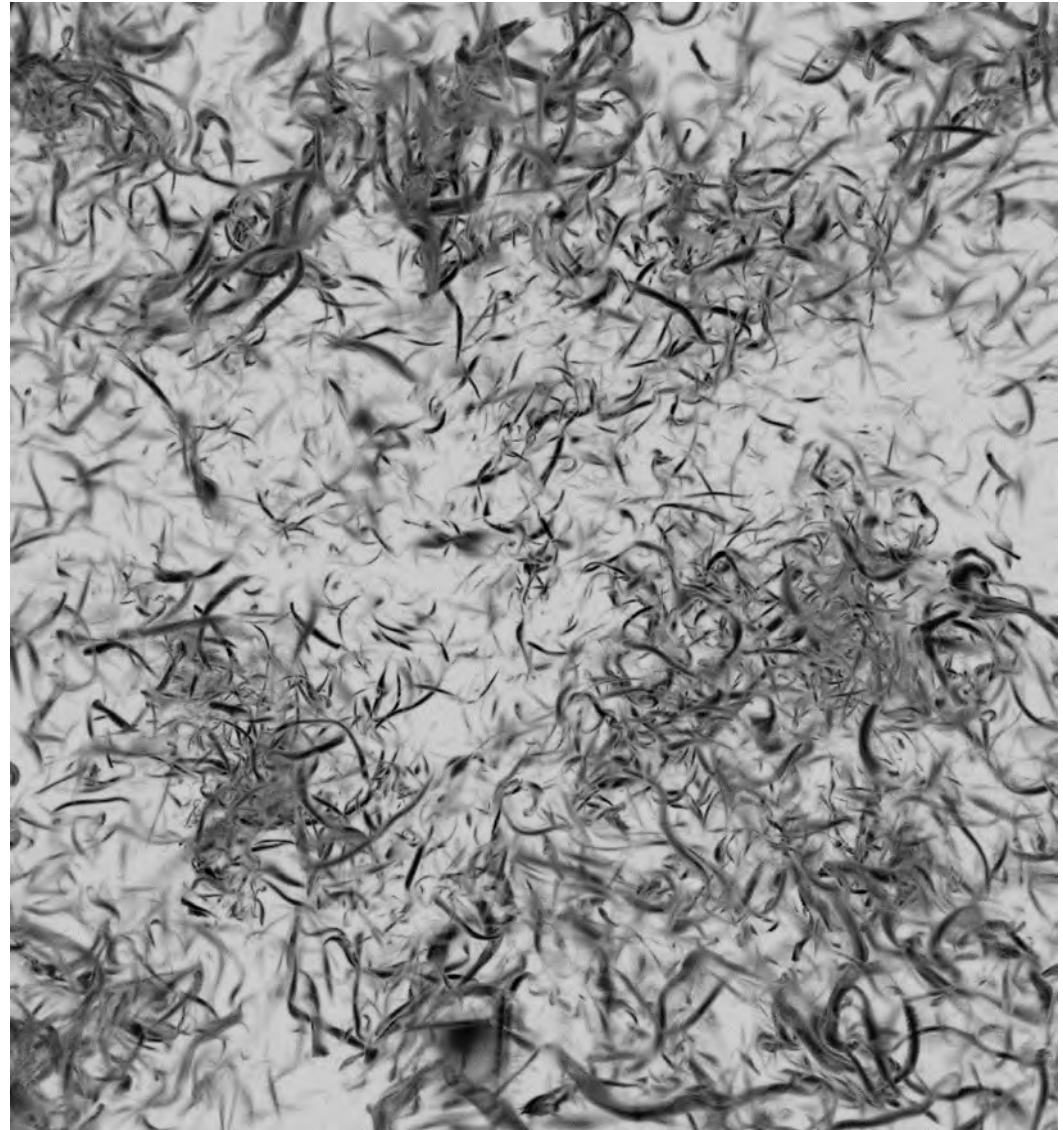
stochastic

$$\Delta v(\underline{\Delta r}) = \varphi |\underline{\Delta r}|^H$$

e.g. Kolmogorov $\varphi = \varepsilon^{1/3}$, $H = 1/3$

Vortices in strongly turbulent fluid

(M. Wiczek, numerical simulation, 2010)



a) $|\underline{\Delta r}| \ll 100m$ b) isotropic

c) $\varphi \approx \text{constant}$, quasi Gaussian

Emergent laws and Complexity

The relative simplicity of the high level laws is
due to a
reduction of the complexity
of the system

If all existing emergent laws are used to describe
a system, the remaining complexity is *irreducible*

Emergence of Atmospheric laws

$$\text{Fluctuations} \approx (\text{turbulent flux}) \times (\text{scale})^H$$

Differences,
tendencies,
wavelet
coefficients

Cascading
Turbulent flux

Anisotropic
Space-time
Scale function

Fluctuation
/conservation
exponent

Fourier domain:

$$\left(\frac{\text{Variance}_{\text{observables}}}{\text{wavenumber}} \right) = \left(\frac{\text{Variance}_{\text{flux}}}{\text{wavenumber}} \right) (\text{wavenumber})^{-2H}$$

Space: $E(k) \approx k^{-\beta}$

Time: $E(\omega) \approx \omega^{-\beta}$

$= (\text{wavenumber})^{-\beta}$

The weather regime:
The emergent laws hold up to
planetary scales
(Horizontal scaling)

$$E(k) = k^{-\beta}$$

Energy Spectra

Scaling geometric sets of points = fractals

Scaling fields = multifractals

$$E(k) \propto k^{-\beta}$$

$k=2\pi/L$ = wavenumber, β = spectral exponent

Scale invariance

$$E(\lambda^{-1}k) = \lambda^{\beta} E(k)$$

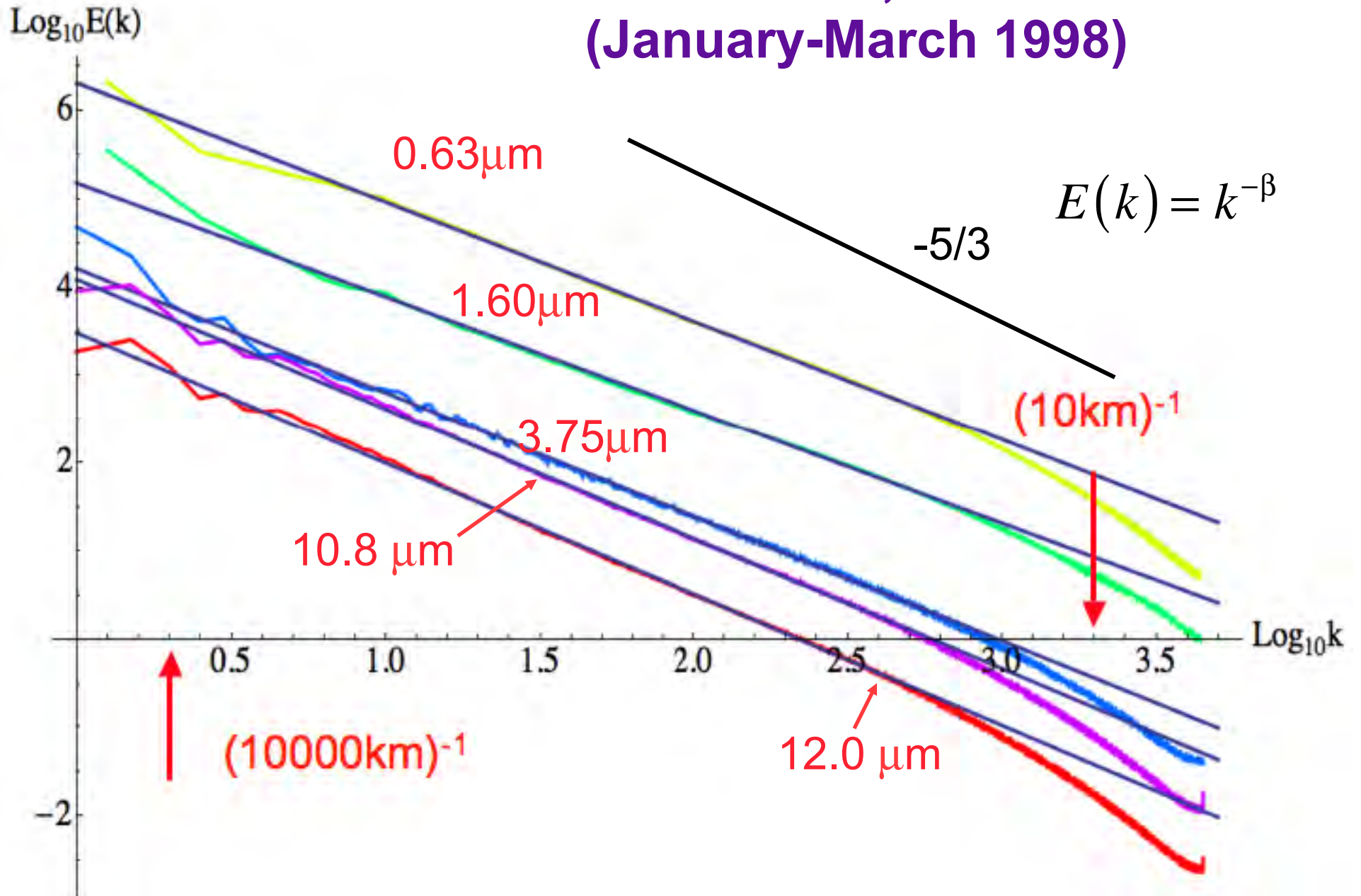
β Invariant under zoom by factor λ in real space.

Examples in the spatial domain

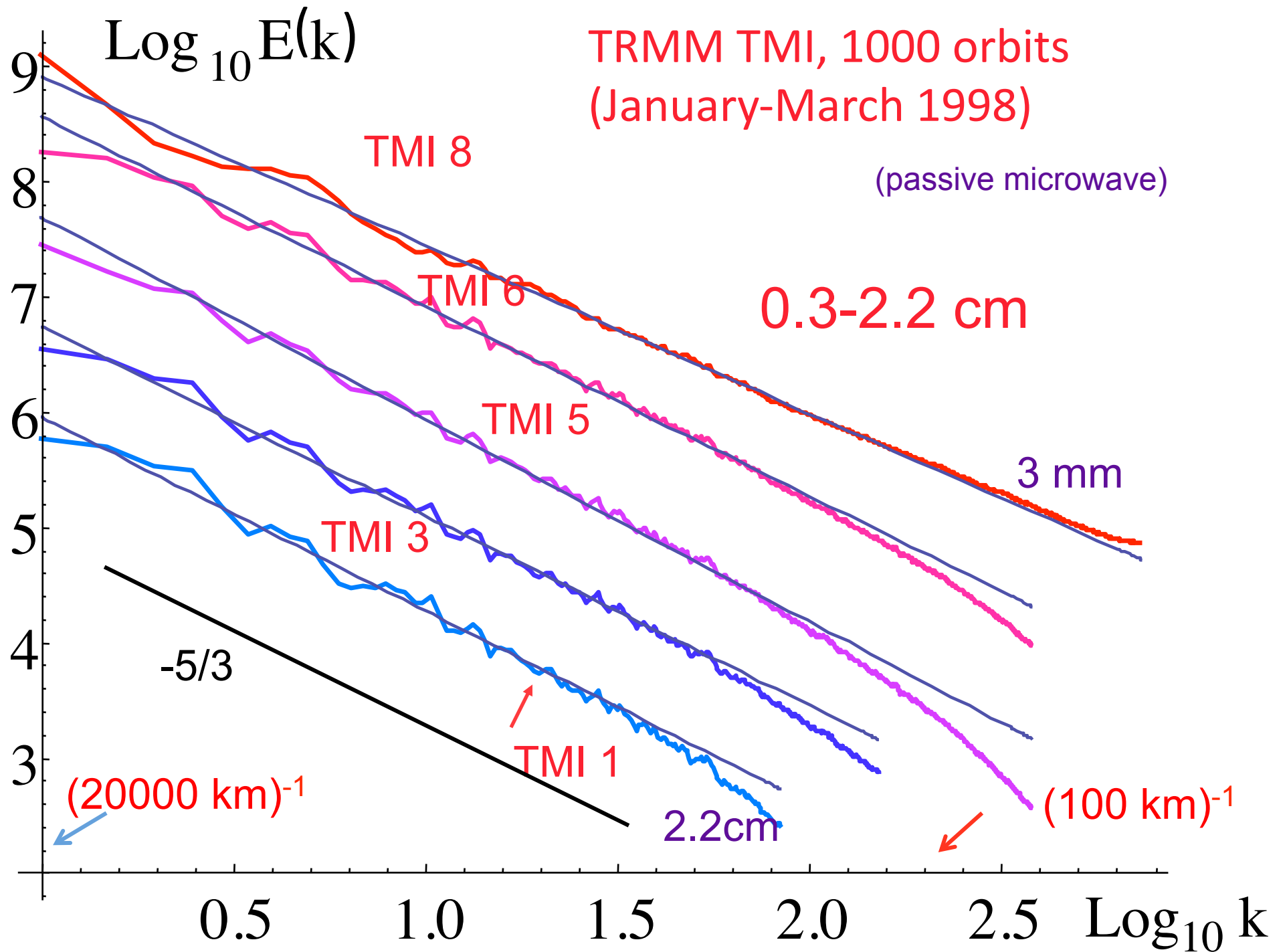
The Atmosphere

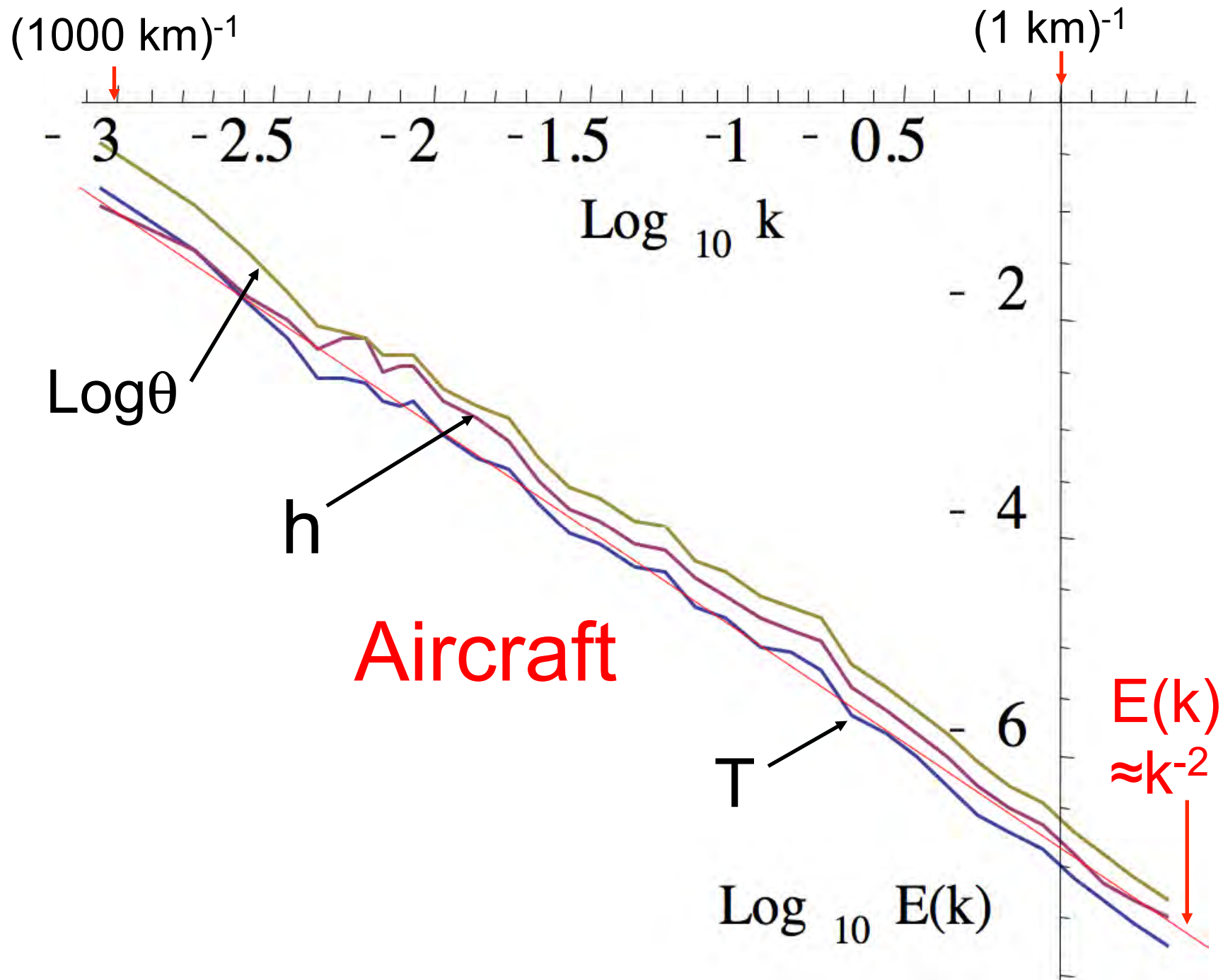
1) horizontal

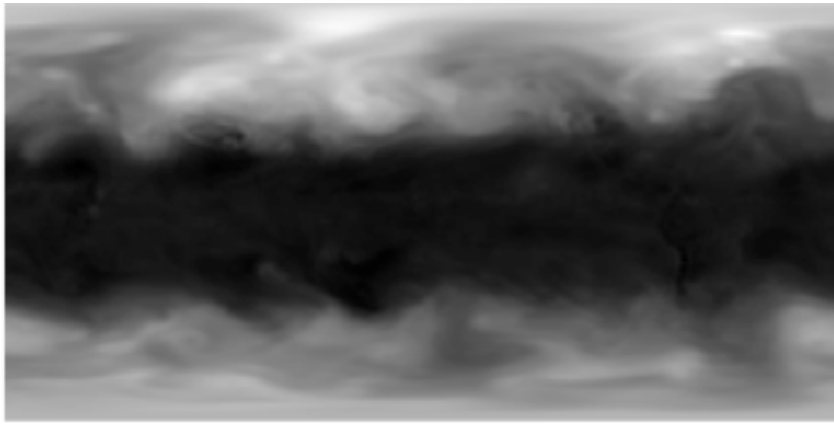
TRMM VIRS, 1000 orbits (January-March 1998)



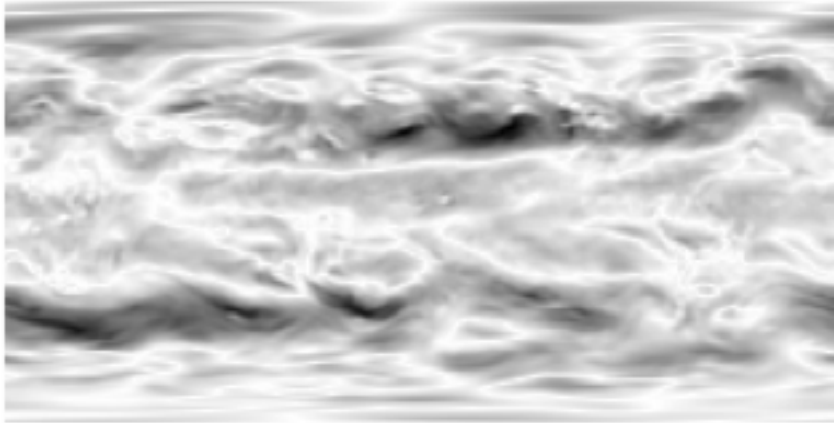
Visible, near infra red, thermal infra red



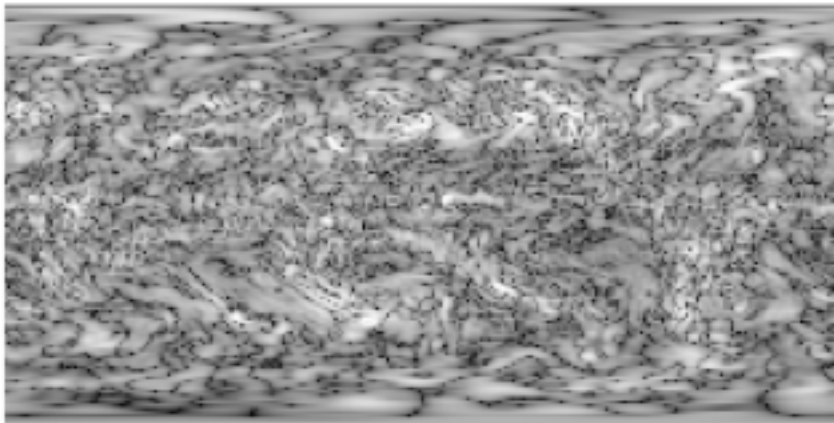




h

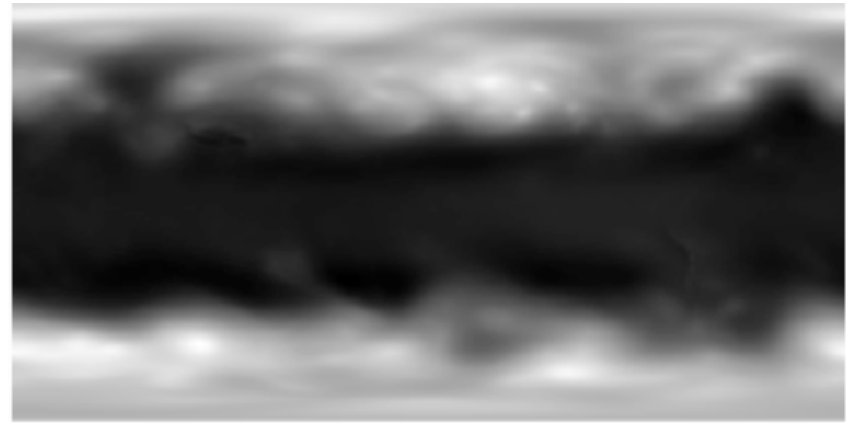


u

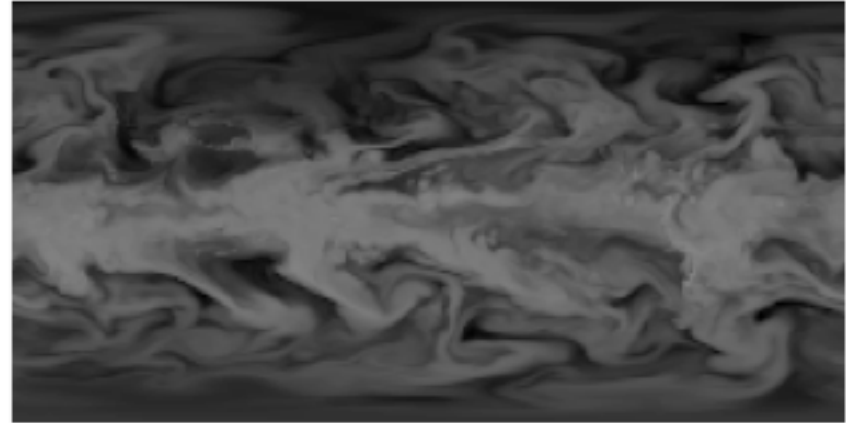


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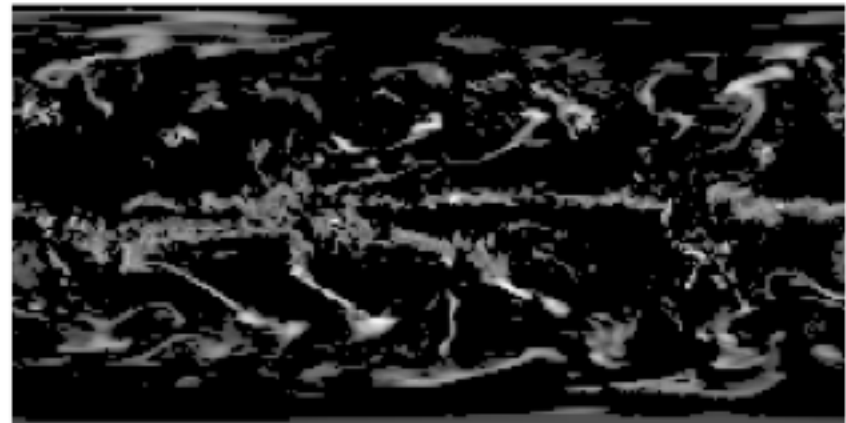
1.5a:



T

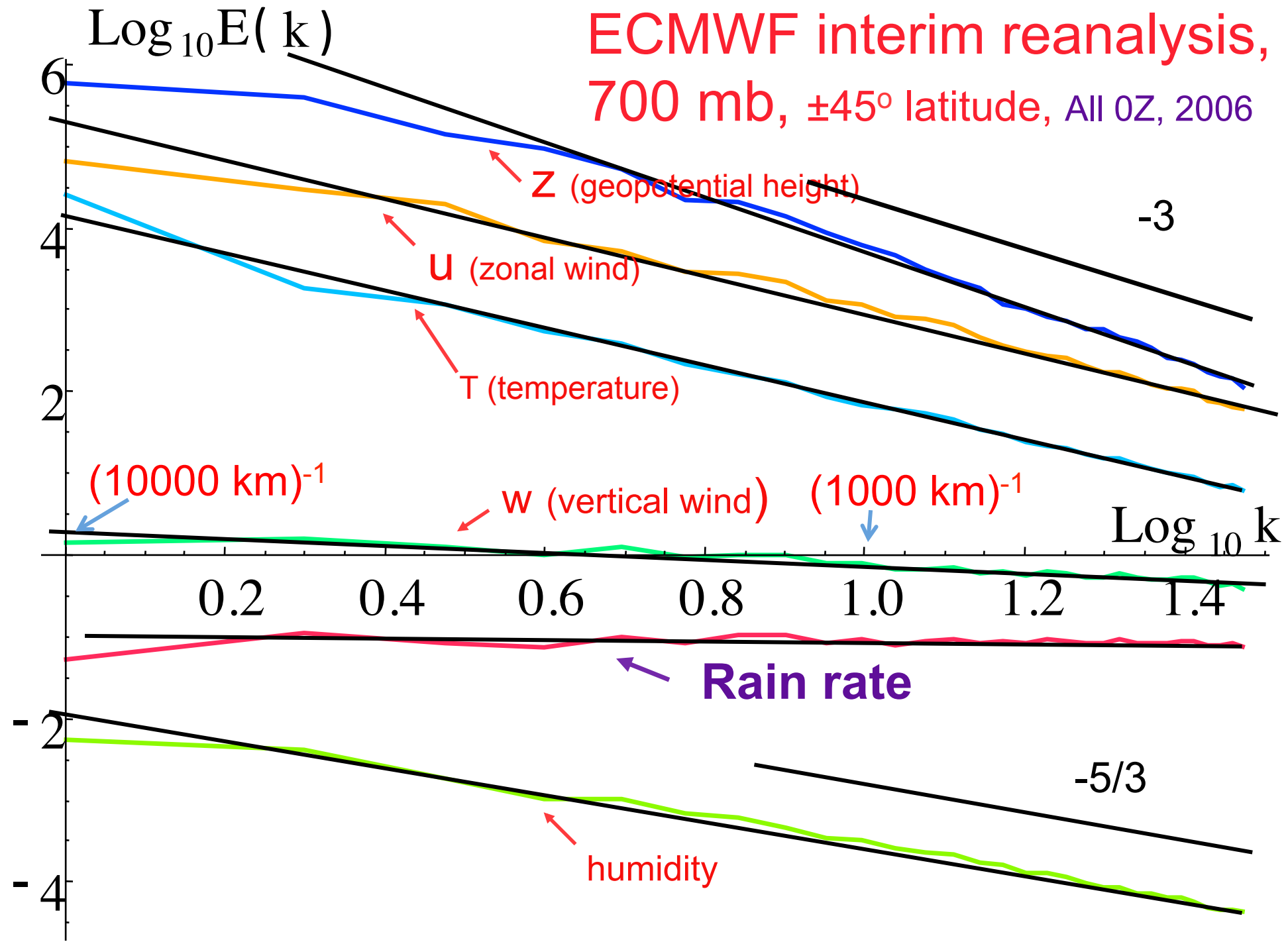


v



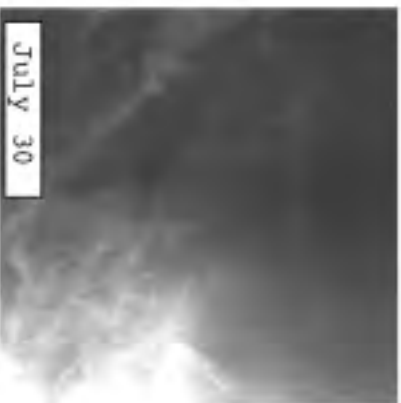
z

ECMWF interim reanalysis,
700 mb, $\pm 45^\circ$ latitude, All OZ, 2006

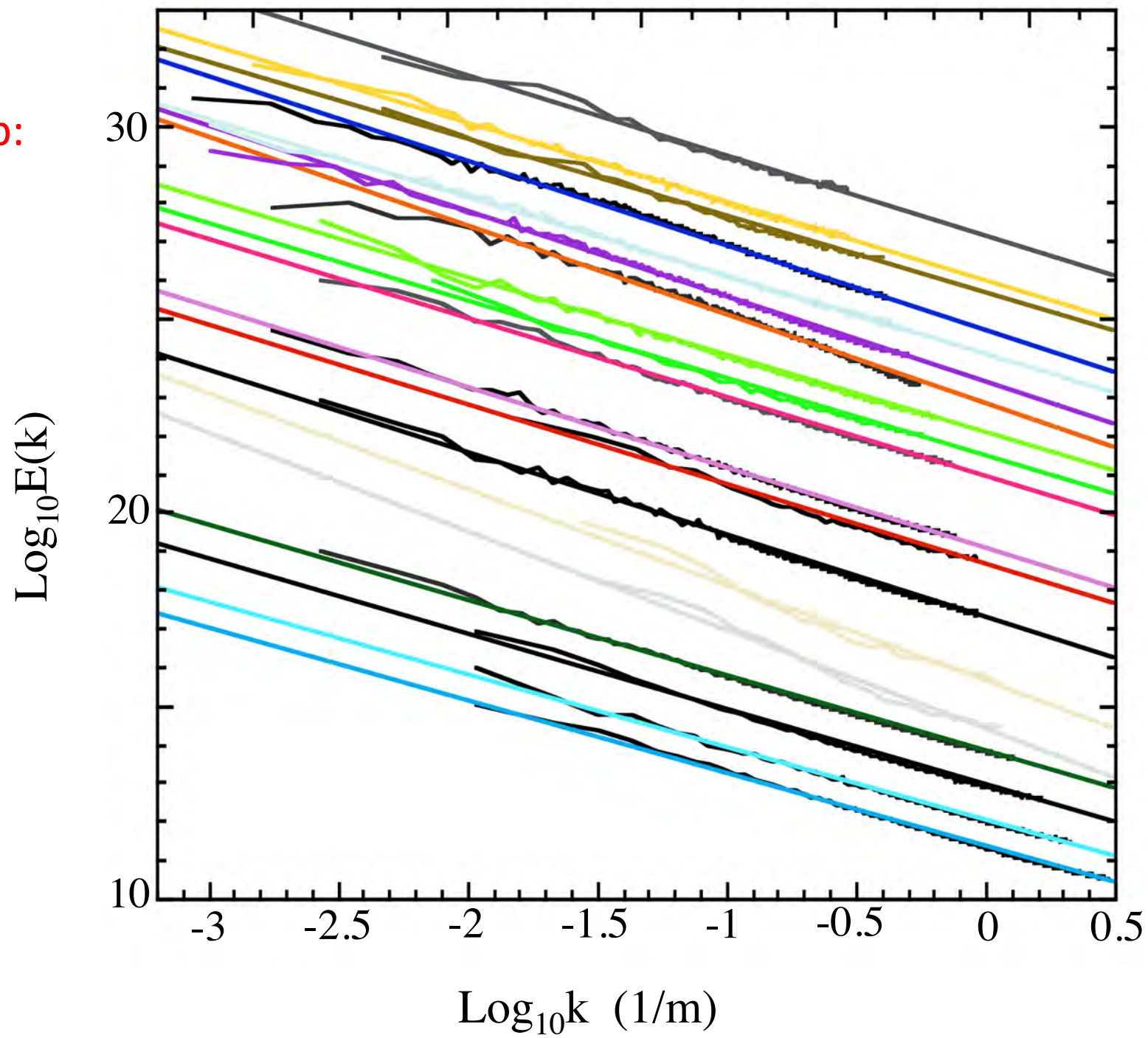




1.4a:

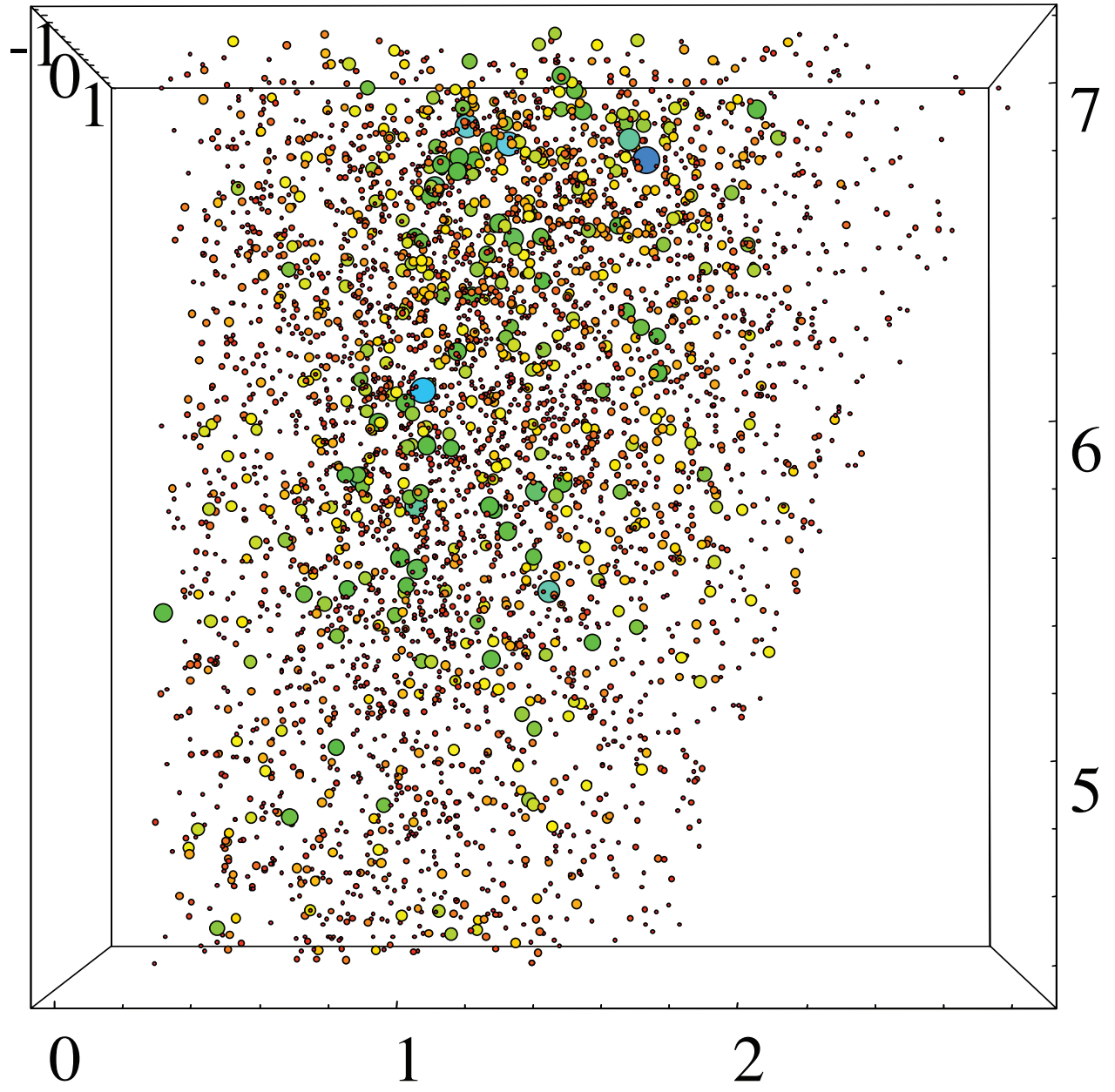


1.4b:



The atmosphere:
2) The inner scale... in rain

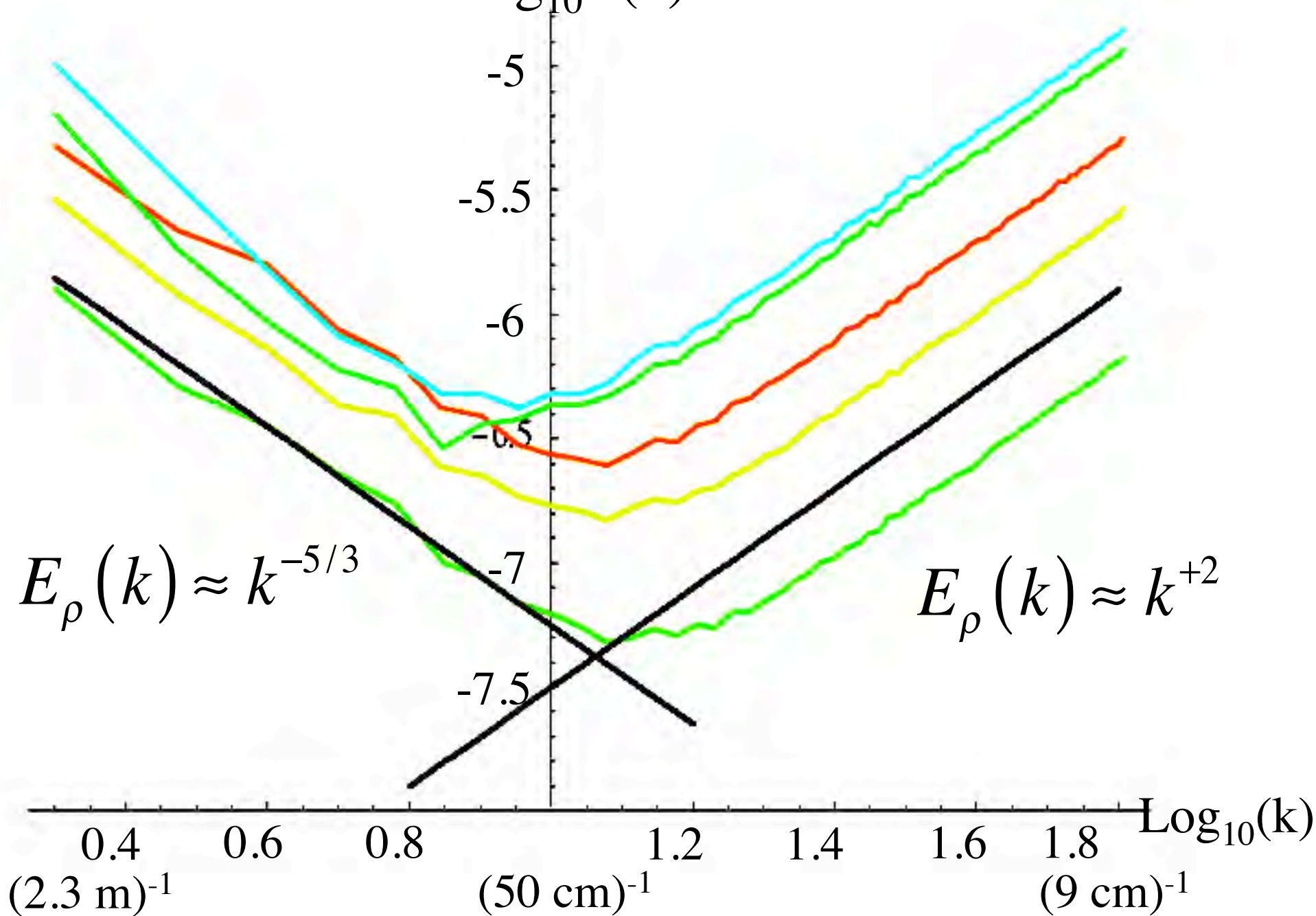
Stereophotography of rain drops (the 10% largest), roof of the physics building



$\text{Log}_{10}E(k)$

Spectrum of drop mass 5 storms

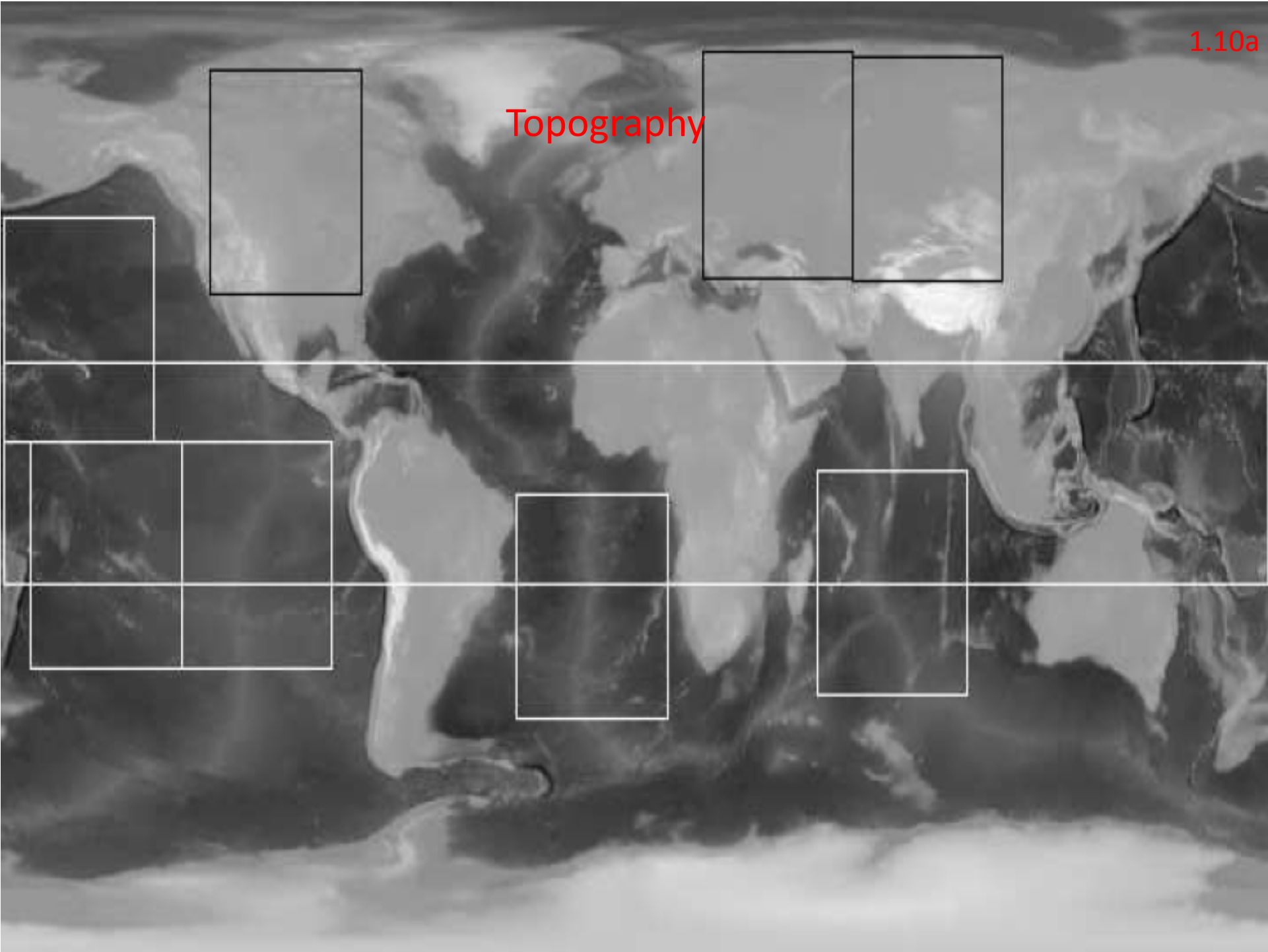
1.8b

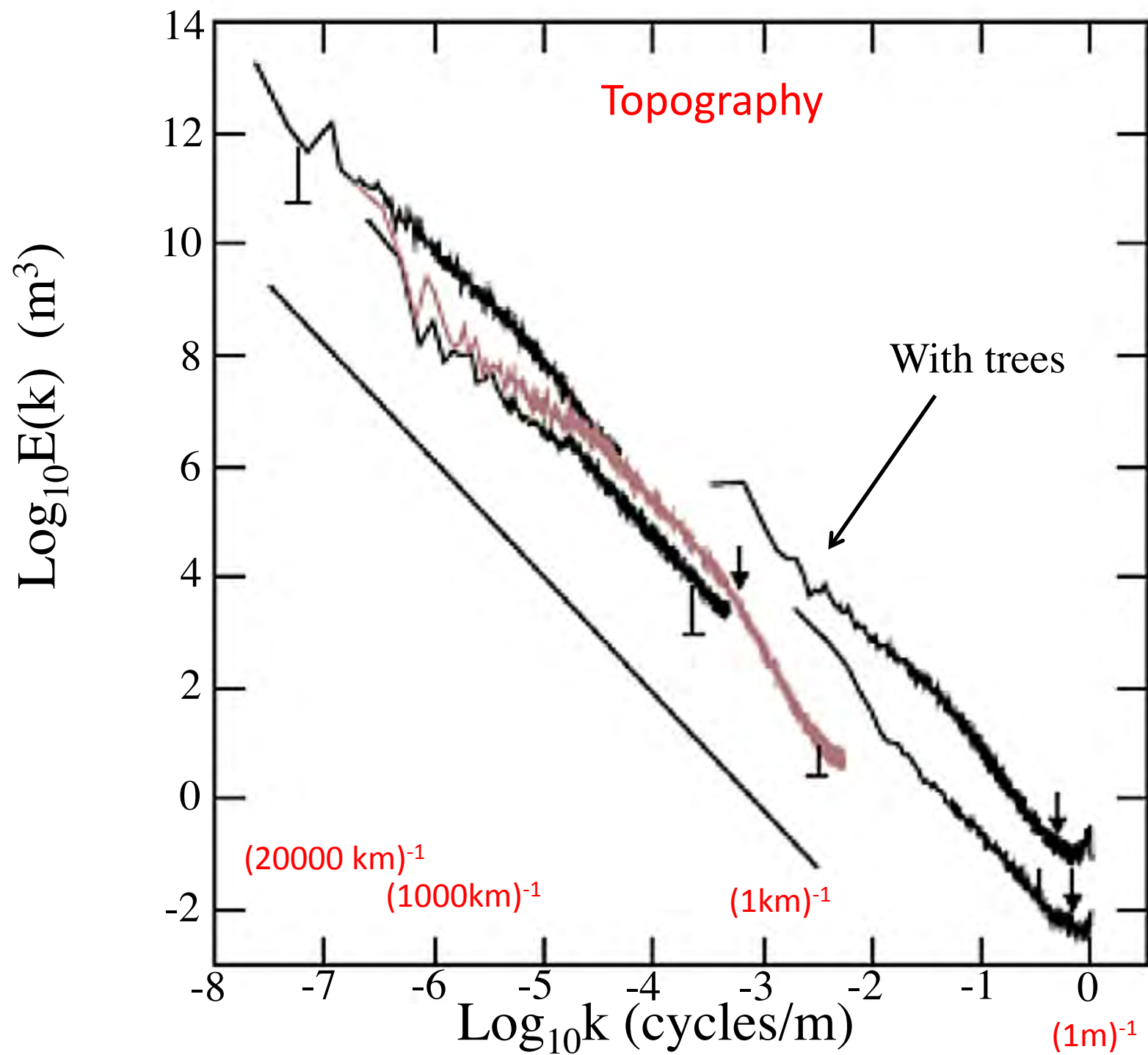


The atmosphere:

3) Atmospheric Boundary Conditions

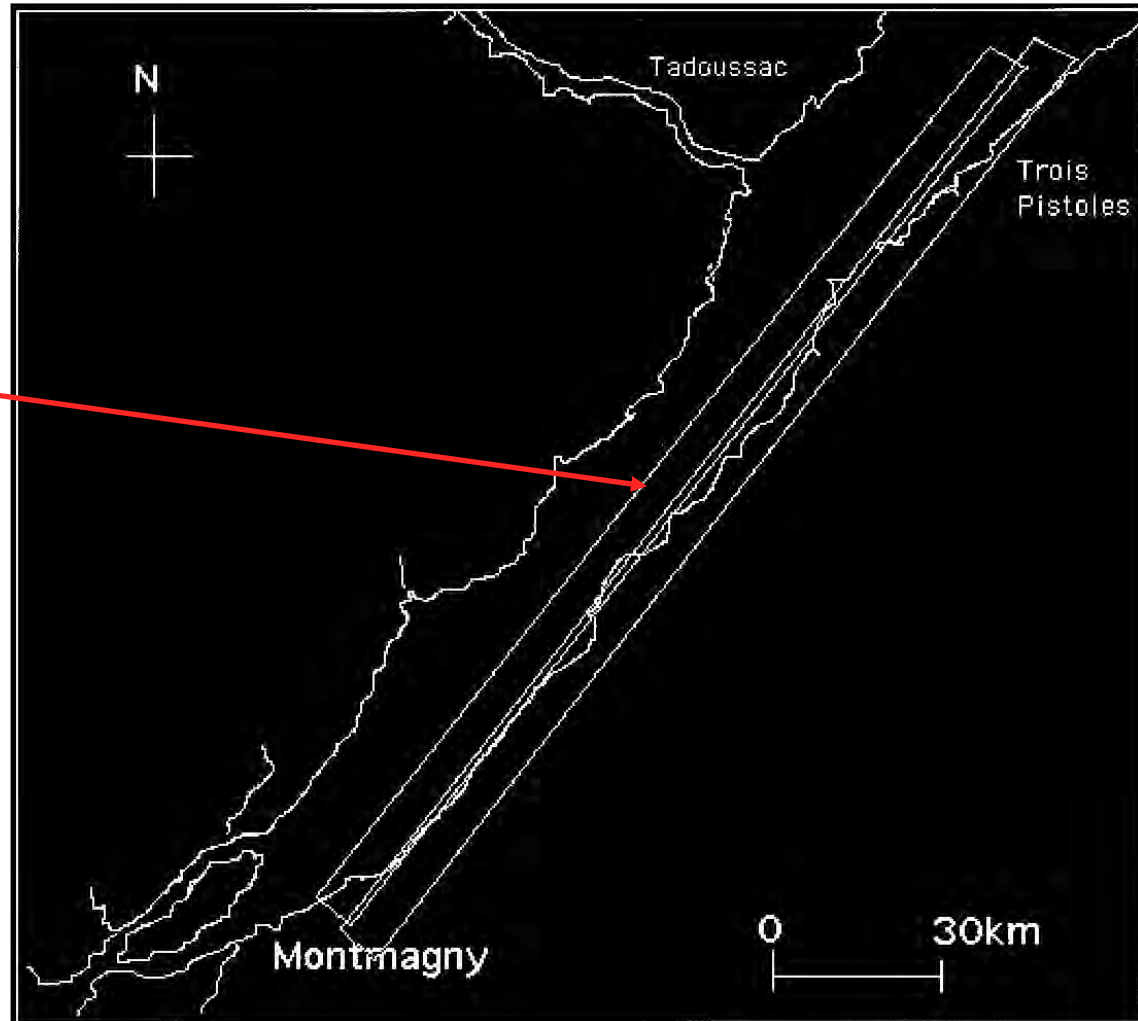
Topography





Ocean Colour: Mies sensor, experimental region

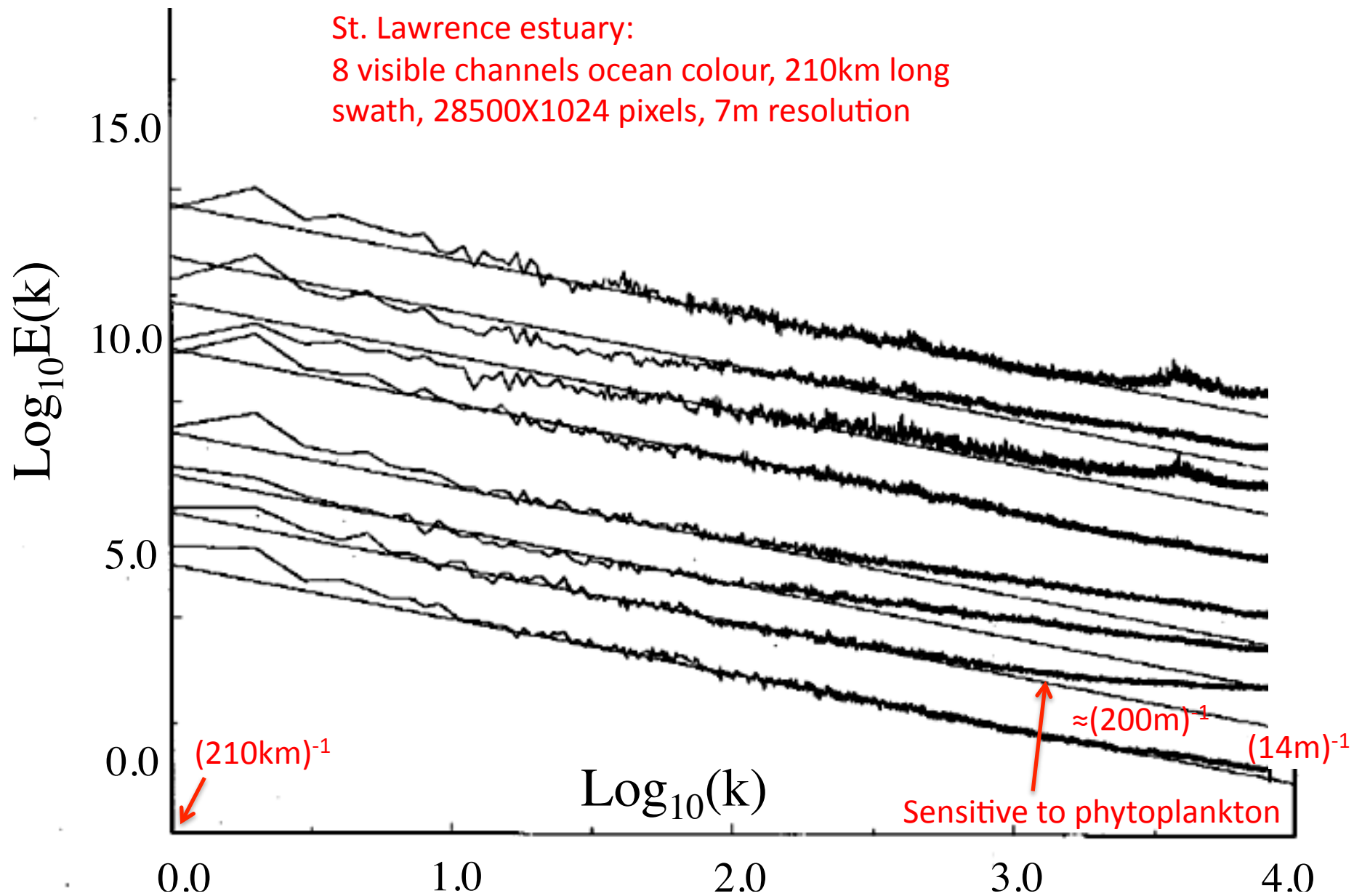
210km long swath,
28500X1024 pixels,
7m resolution,
(8 visible channels)



Ocean surface

St. Lawrence estuary:

8 visible channels ocean colour, 210km long
swath, 28500X1024 pixels, 7m resolution



Vegetation and soil moisture indices

$\text{Log}_{10} E(k)$

Spectra of six bands of MODIS radiances over a 512x512 pixel region of Spain (at 250 m resolution; k=1 corresponds to 128 km):

channel 1: 620–670, 2: 841–876, 3: 459–479, 4: 545–565, 5: 1230–1250, 6: 1628–1652, 7: 2105–2155.

