



**The Weather
and Climate**

Emergent Laws and Multifractal Cascades

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Emergent space-time scaling laws in precipitation: Weather, macroweather and climate regimes

Hydrofractals 2013, Kos
18 October, 2013

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The Emergence of physical laws

Quantum mechanics  Classical Mechanics

Classical Statistical
mechanics
(Boltzmann equation)  Continuum
mechanics,
thermodynamics

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

Emergence of Atmospheric laws (Modern)

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

Differences,
tendencies,
wavelet
coefficients

Cascading
Turbulent flux

Anisotropic
Space-time
Scale function

Fluctuation
/conservation
exponent

Fourier domain:

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

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

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

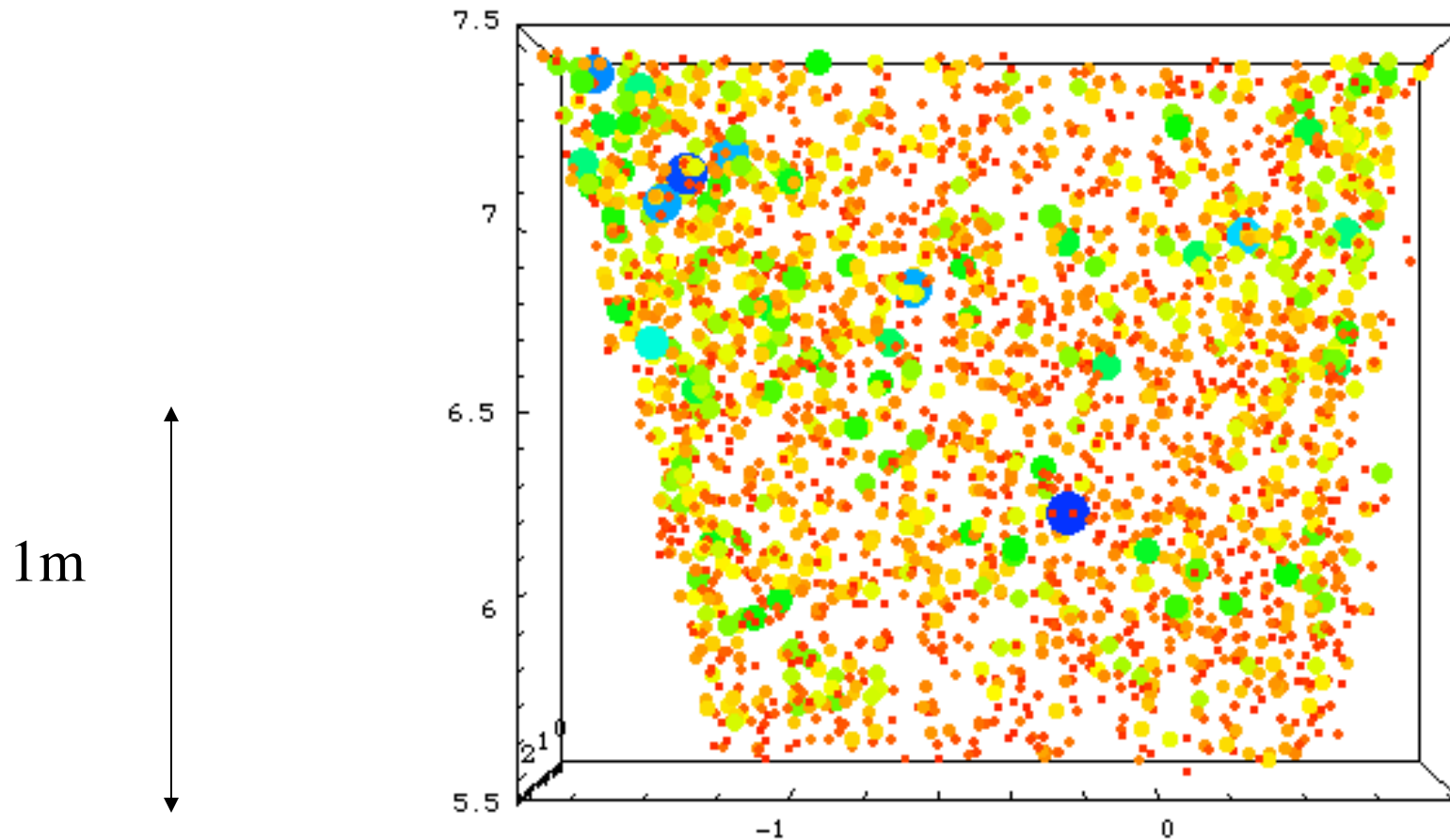
Time: $E(\omega) \approx \omega^{-\beta}$

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

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

From small scales

Stereophotography of drops (HYDROP experiment) (storm 295 no. 2)

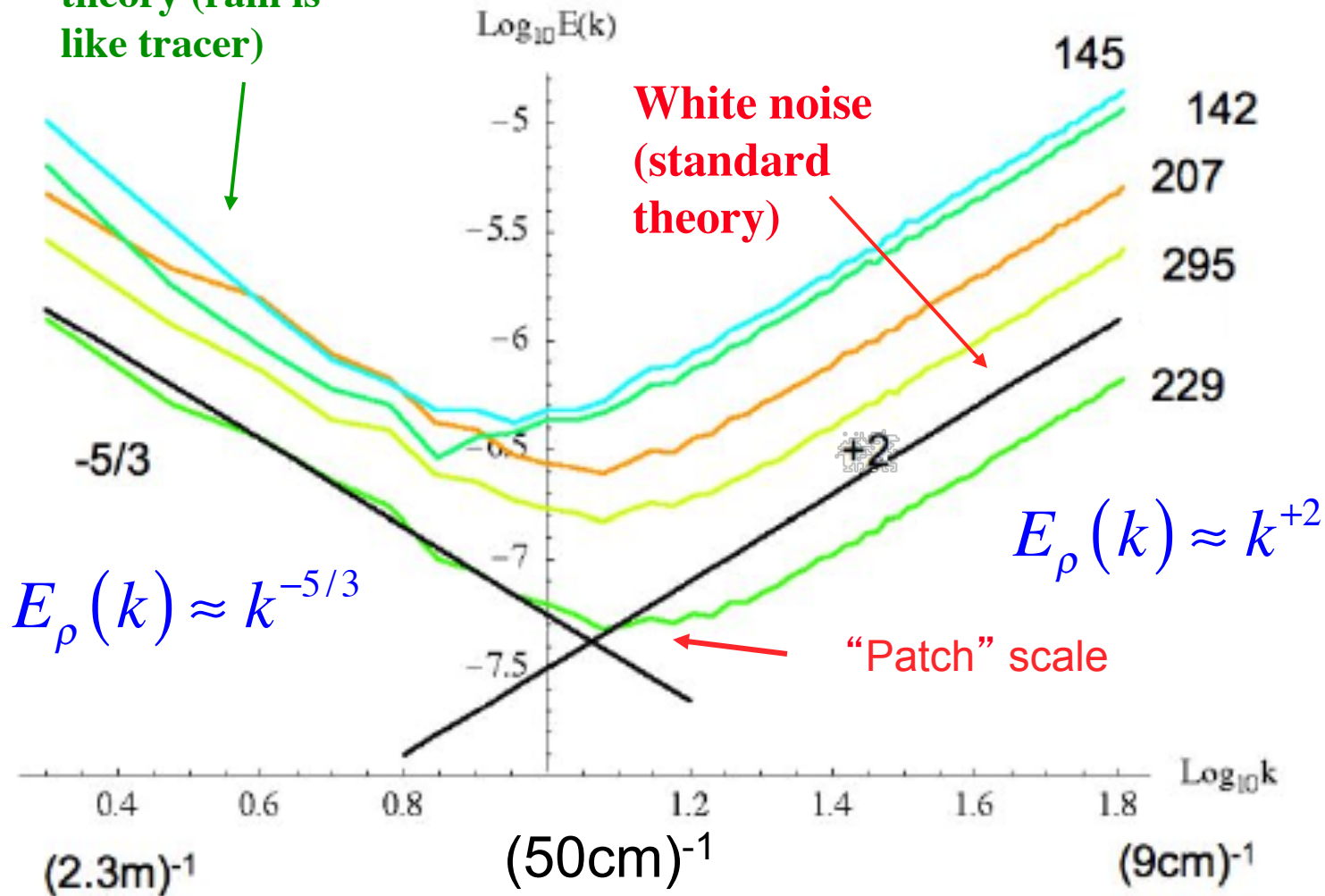


The angle averaged drop spectra

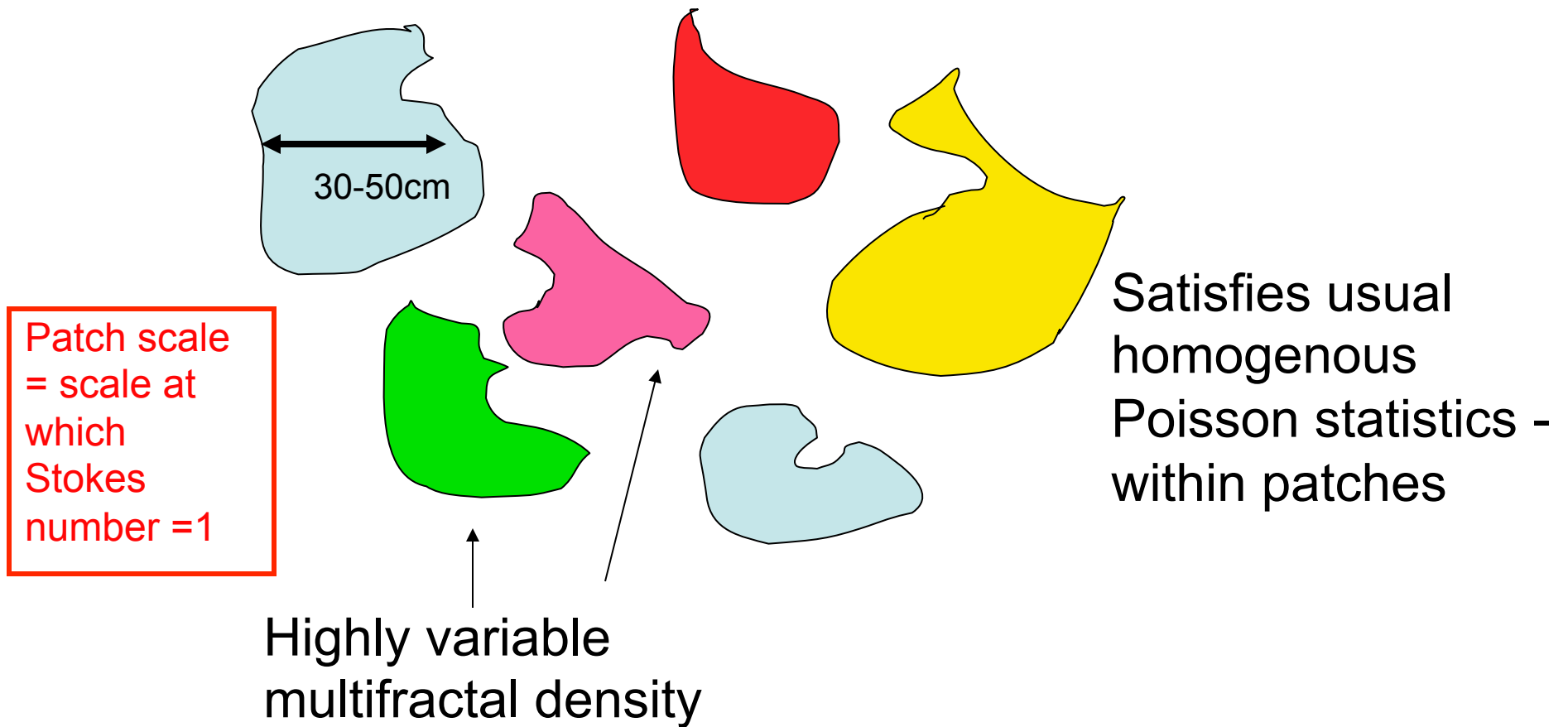
5 storms, 18 triplets

Corrsin-Obukov
passive scalar
theory (rain is
like tracer)

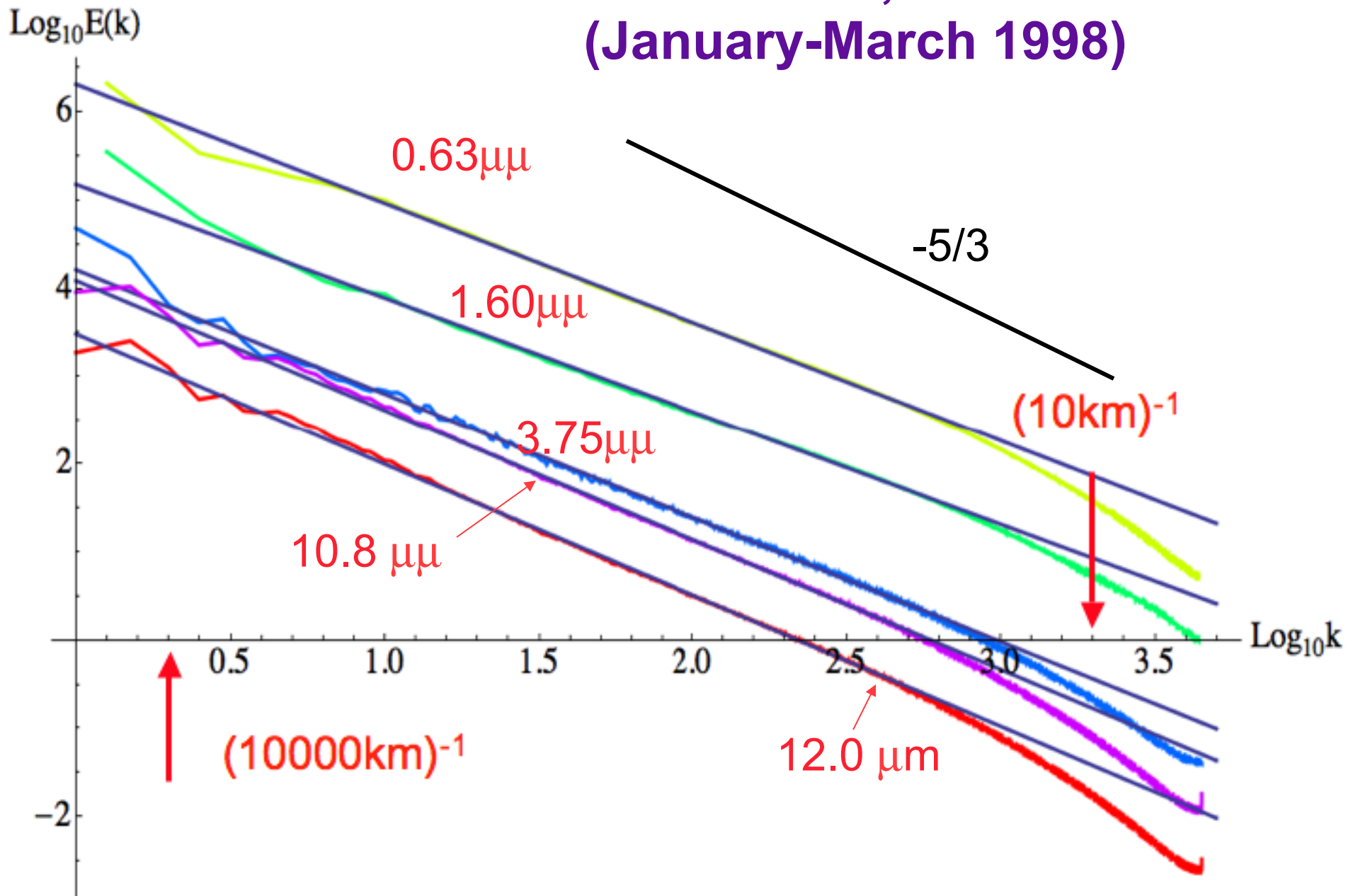
Direct evidence
that rain behaves
as a passive
scalar at large
enough scales



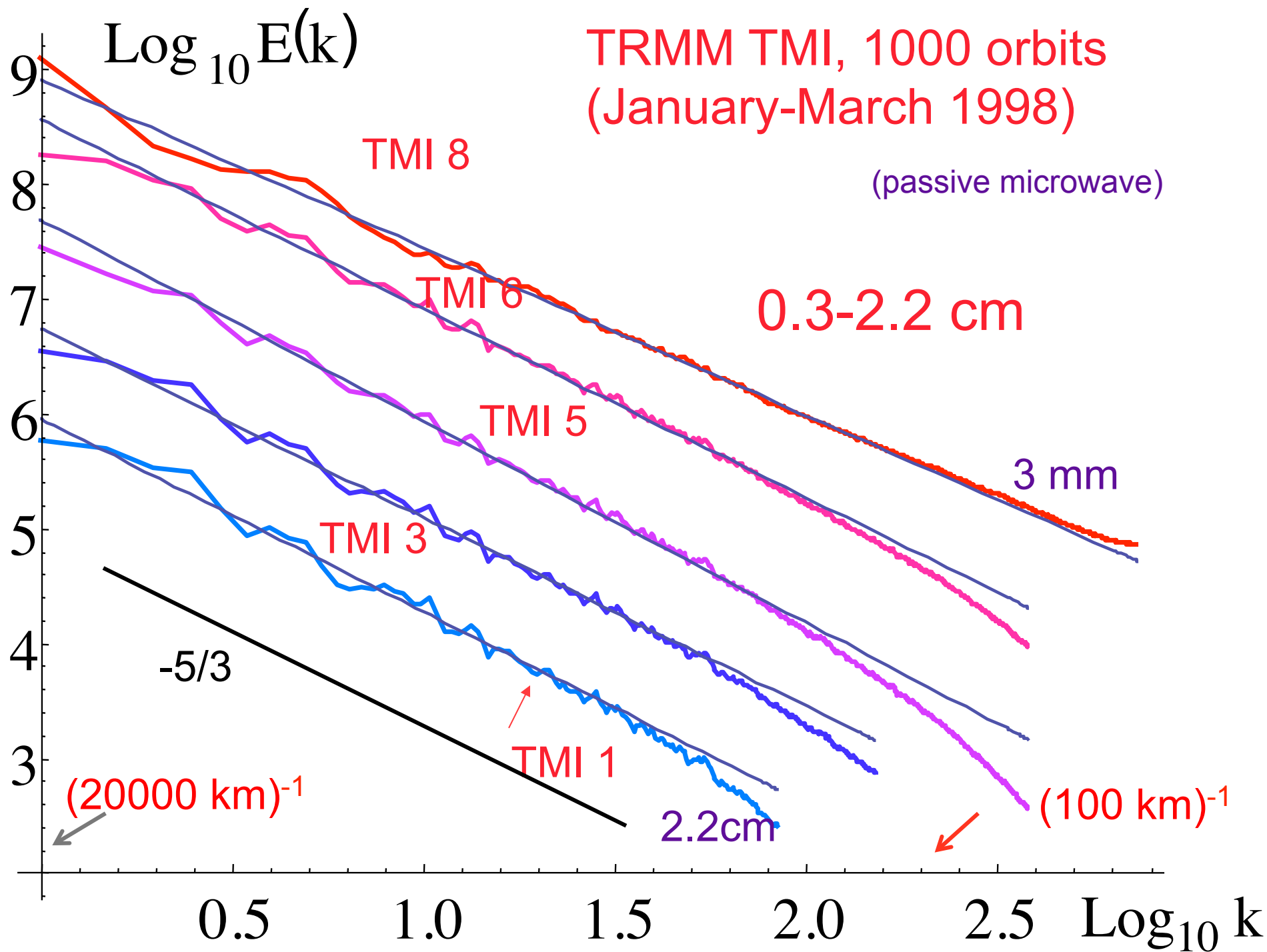
Interpretation of HYDROP spectra, moment analysis: Patches



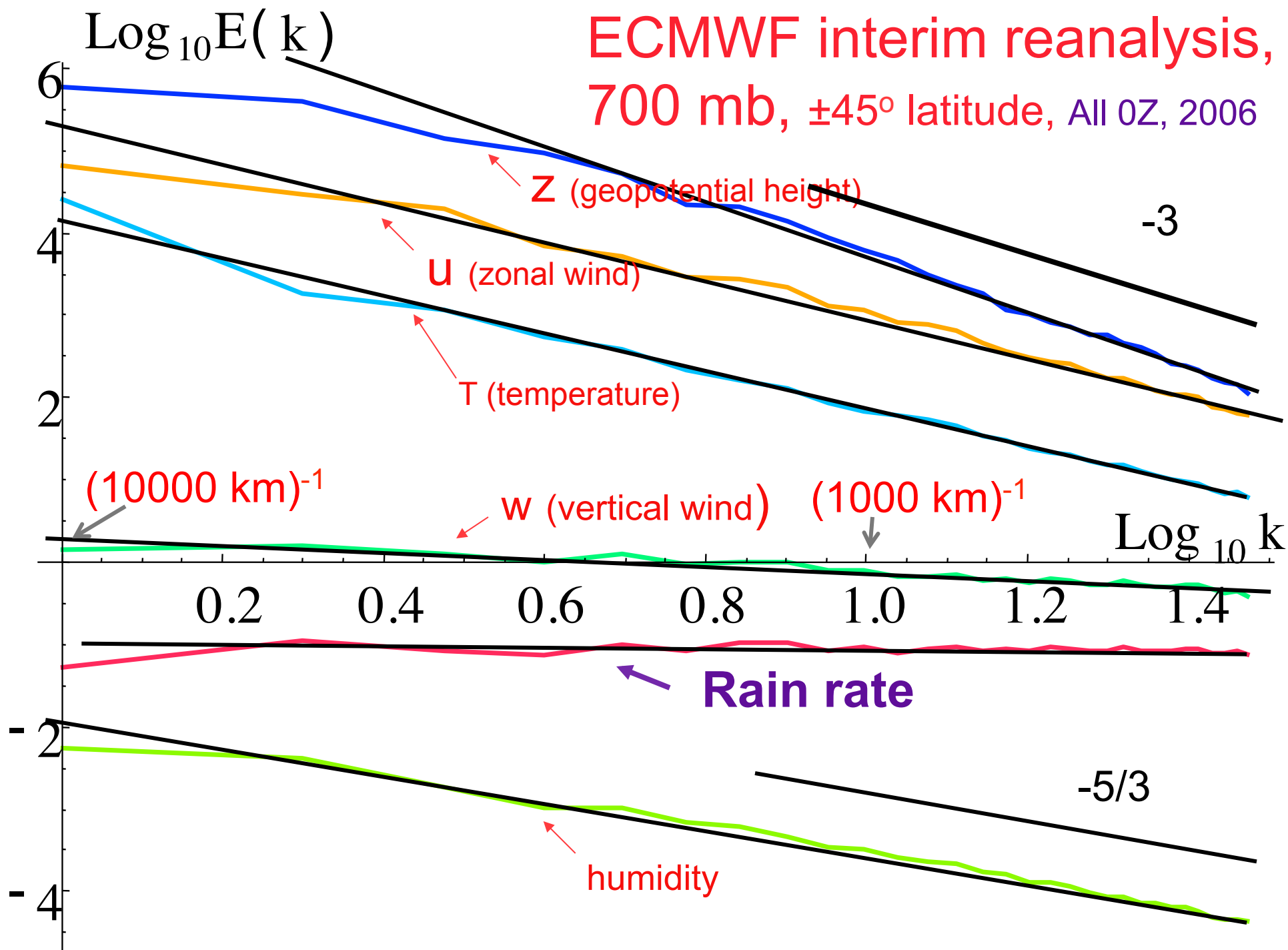
TRMM VIRS, 1000 orbits (January-March 1998)



Visible, near infra red, thermal infra red



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



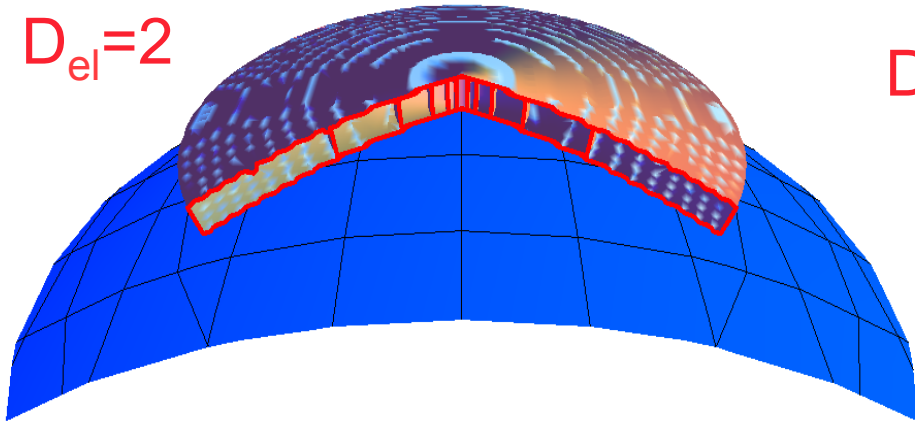
These huge scaling ranges
are possible because the
scaling is *anisotropic*

Isotropic turbulence - including Geostrophic turbulence - is
irrelevant in the atmosphere!

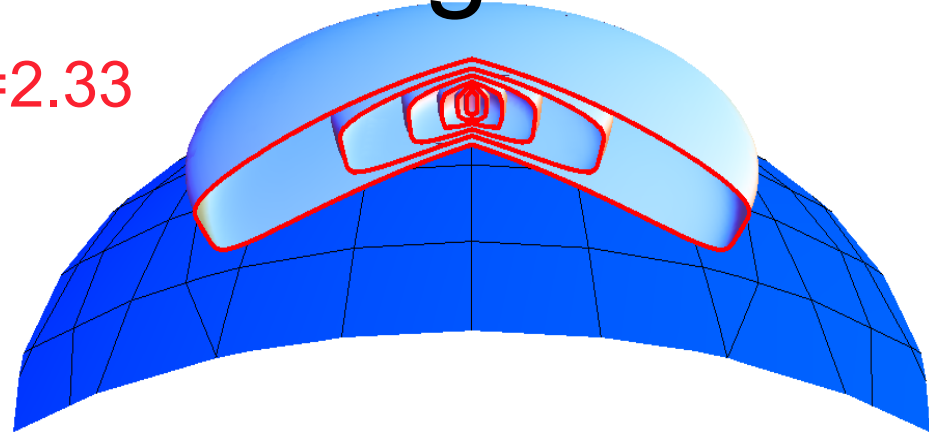
$$|\underline{\Delta r}| \rightarrow \|\underline{\Delta r}\|$$

Anisotropic Scaling

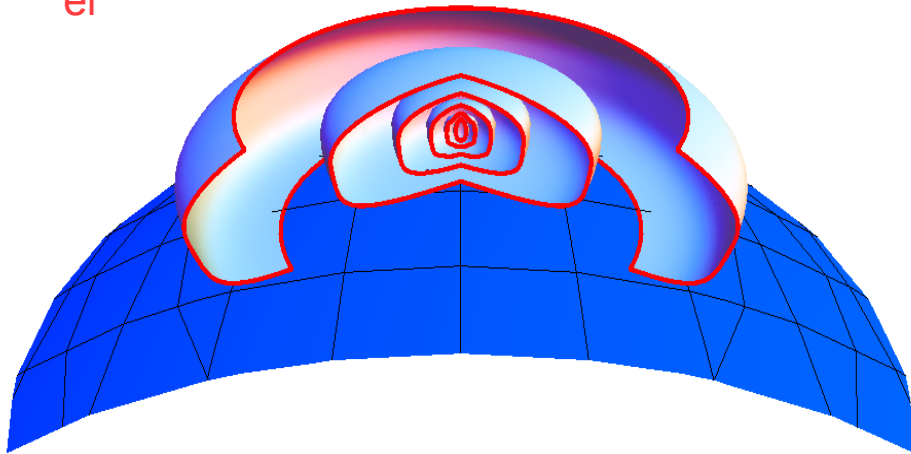
$$D_{el}=2$$



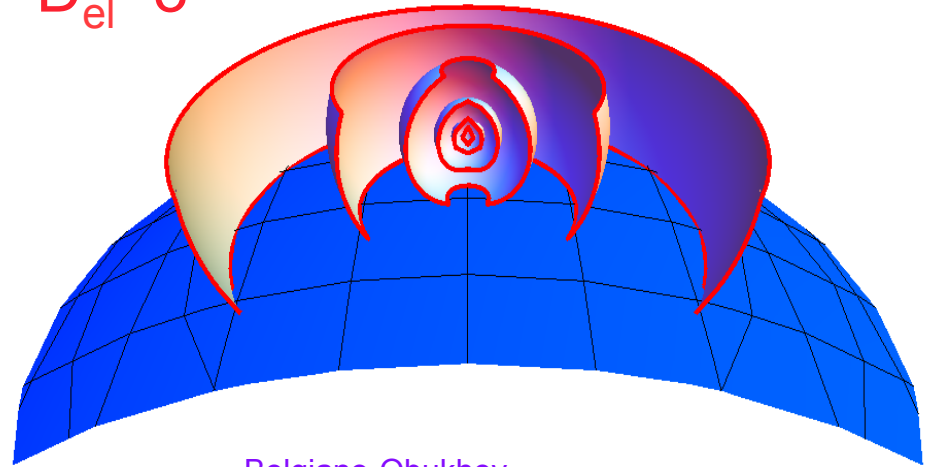
$$D_{el}=2.33$$



$$D_{el}=23/9=2.55$$



$$D_{el}=3$$



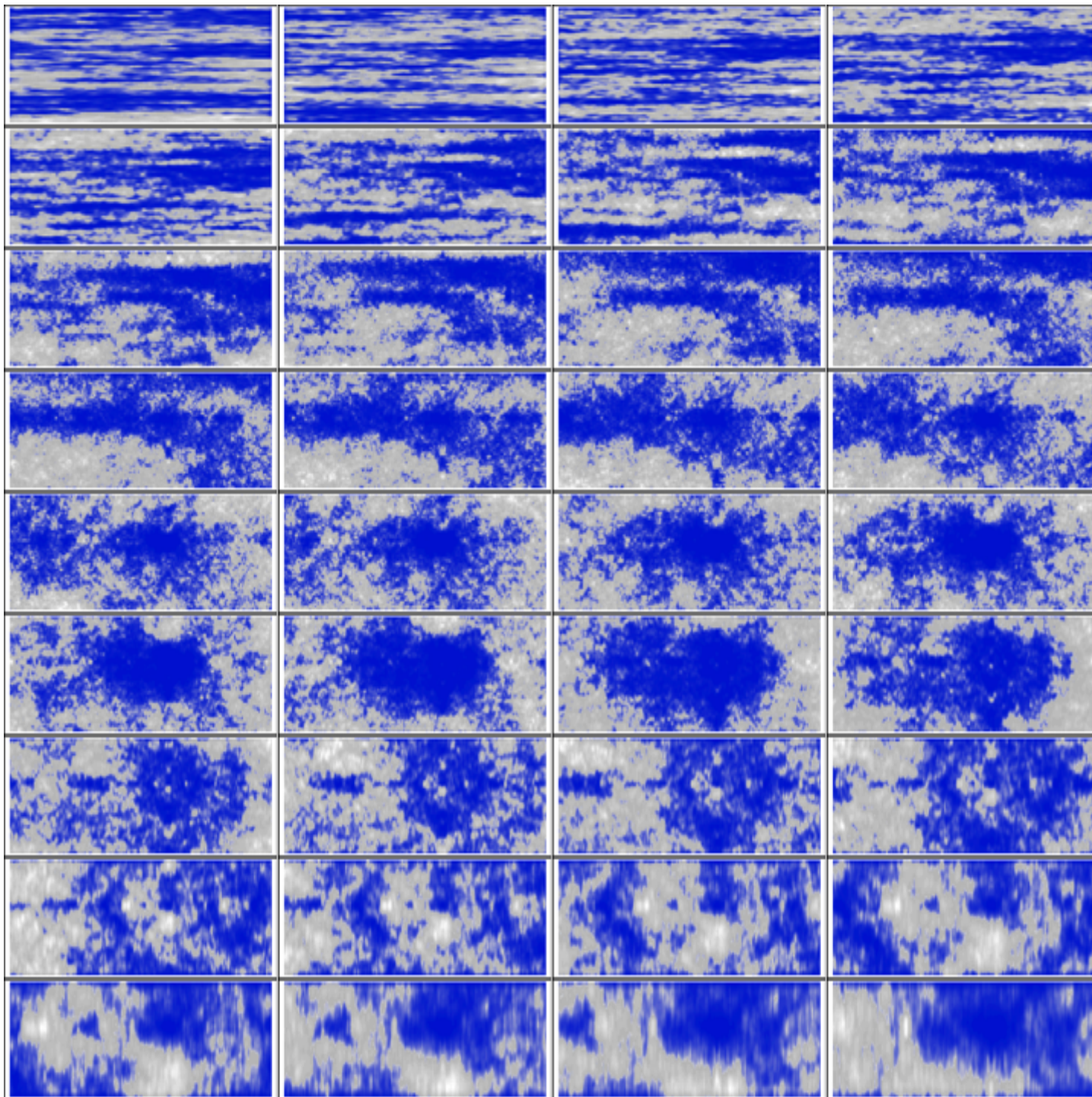
The 23/9D model:

$$\underbrace{\Delta v(\Delta x) = \varepsilon^{1/3} \Delta x^{1/3}}_{\text{Kolmogorov}}; \quad \underbrace{\Delta v(\Delta z) = \phi^{1/5} \Delta z^{3/5}}_{\text{Bolgiano-Obukhov}} \quad H_z = (1/3)/(3/5) = 5/9$$

$$\text{Volume} \approx L_x L_y L_z \approx L^{D_{el}} \quad D_{el} = 2 + H_z = 23/9$$

Zoom
factor
1000

Vertical cross-
section



The turbulent fluxes follow
multiplicative cascades,
multifractal behaviour

$$\Delta I = \varphi \left[\left(\Delta x, \Delta y, \Delta z, \Delta t \right) \right]^H$$

$$\frac{\varphi}{\langle \varphi \rangle} = \frac{\Delta I}{\langle \Delta I \rangle}$$

Multiplicative Cascades

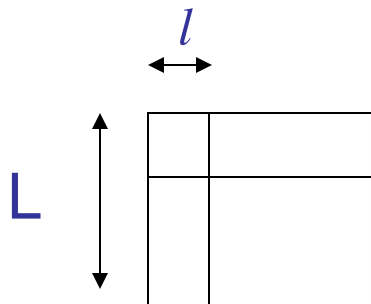
Generic statistical behaviour:

scaling Scale invariant

$$\left\langle \varphi_{\lambda}^q \right\rangle \approx \lambda^{K(q)}$$

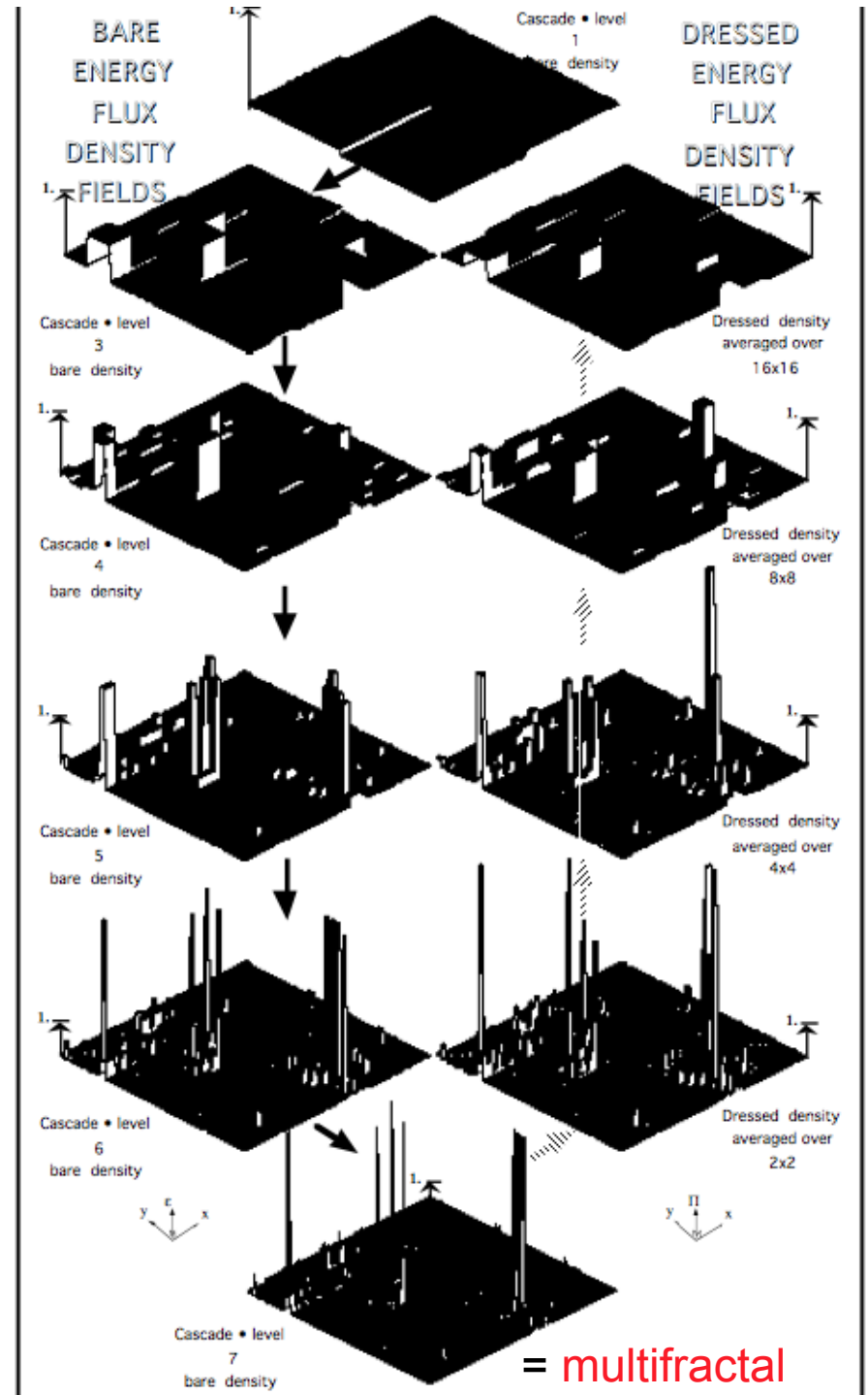
Statistical averaging

Resolution: ratio $\lambda=L/l$



Probabilities:

$$\Pr(\varphi_{\lambda} > \lambda^{\gamma}) \approx \lambda^{-c(\lambda)}$$



Early evidence of cascades:

Precipitation 1987

(70 Radar Scans, Montreal, horizontal 3 weeks of rain data)

Schertzer and Lovejoy 1987

$$M = \frac{\langle Z_\lambda^q \rangle}{\langle Z \rangle^q}$$



Large scales

?

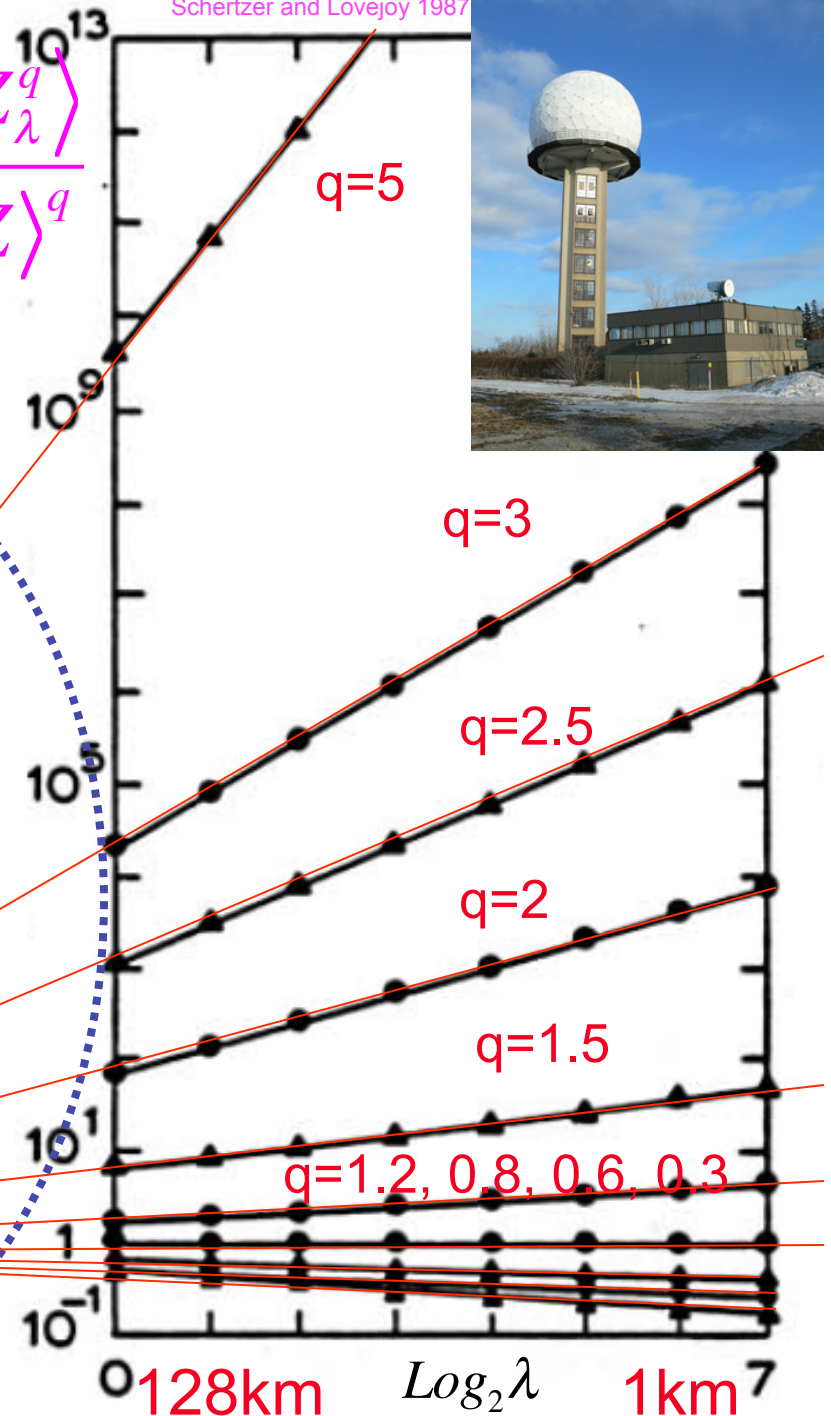
?

32,000km

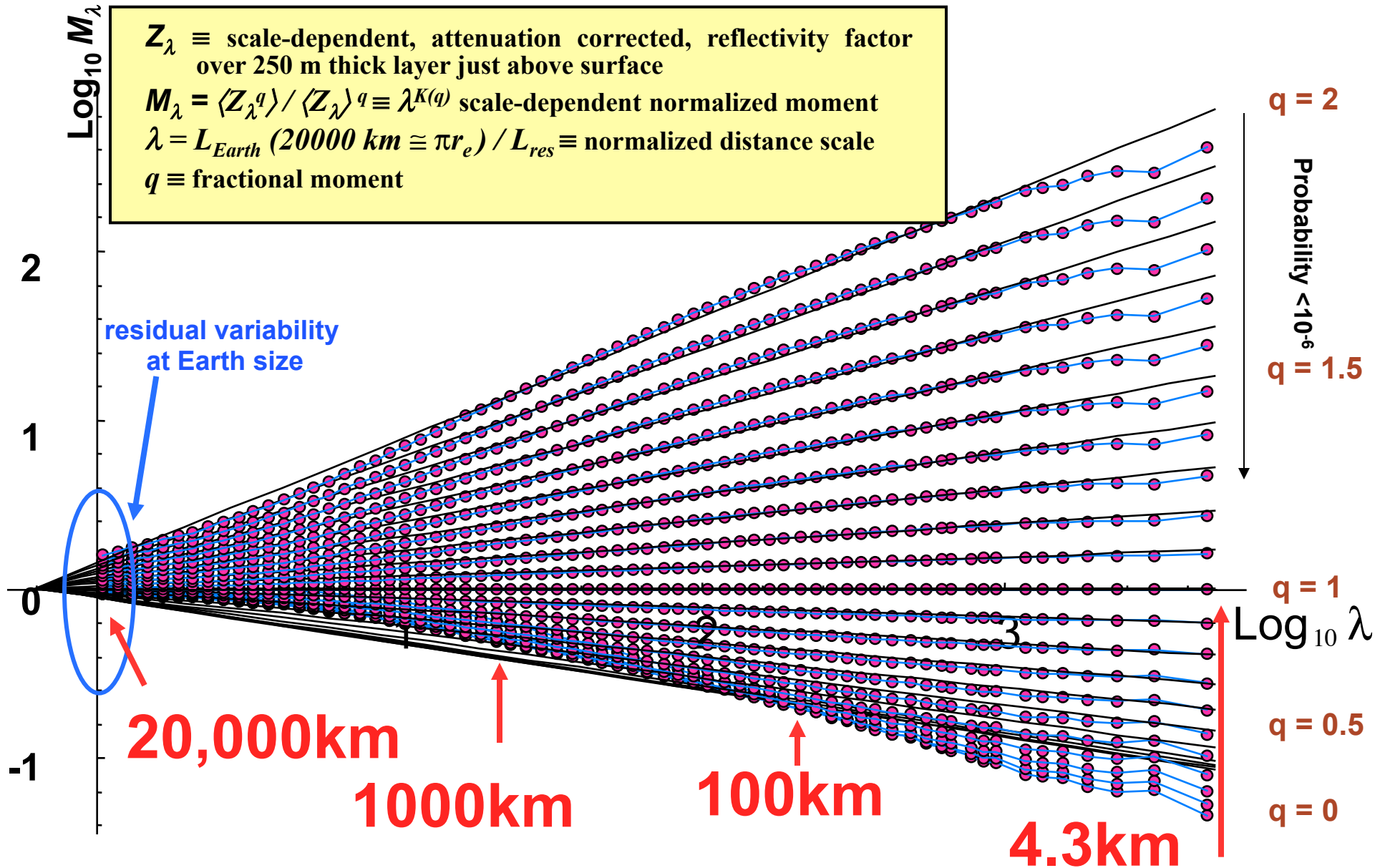
Cascade prediction:

$$\langle Z_\lambda^q \rangle / \langle Z_1 \rangle^q = \lambda^{K(q)}$$

$$\lambda = L_{\text{eff}} / L_{\text{res}}$$

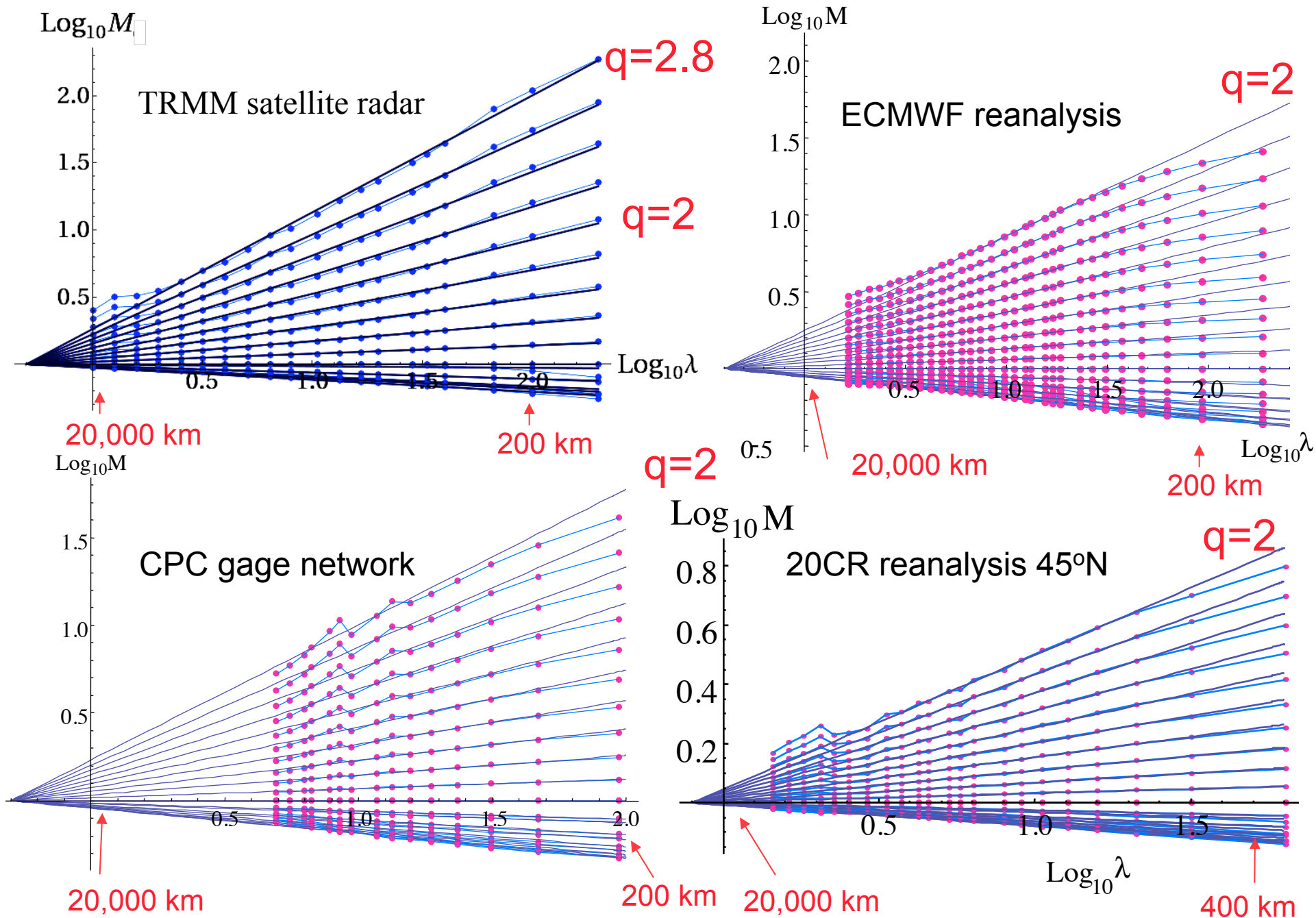


Scale-dependent TRMM PR Attenuation Corrected Reflectivity Factor [Z_λ] (1176 consecutive orbits -- ~70 days)

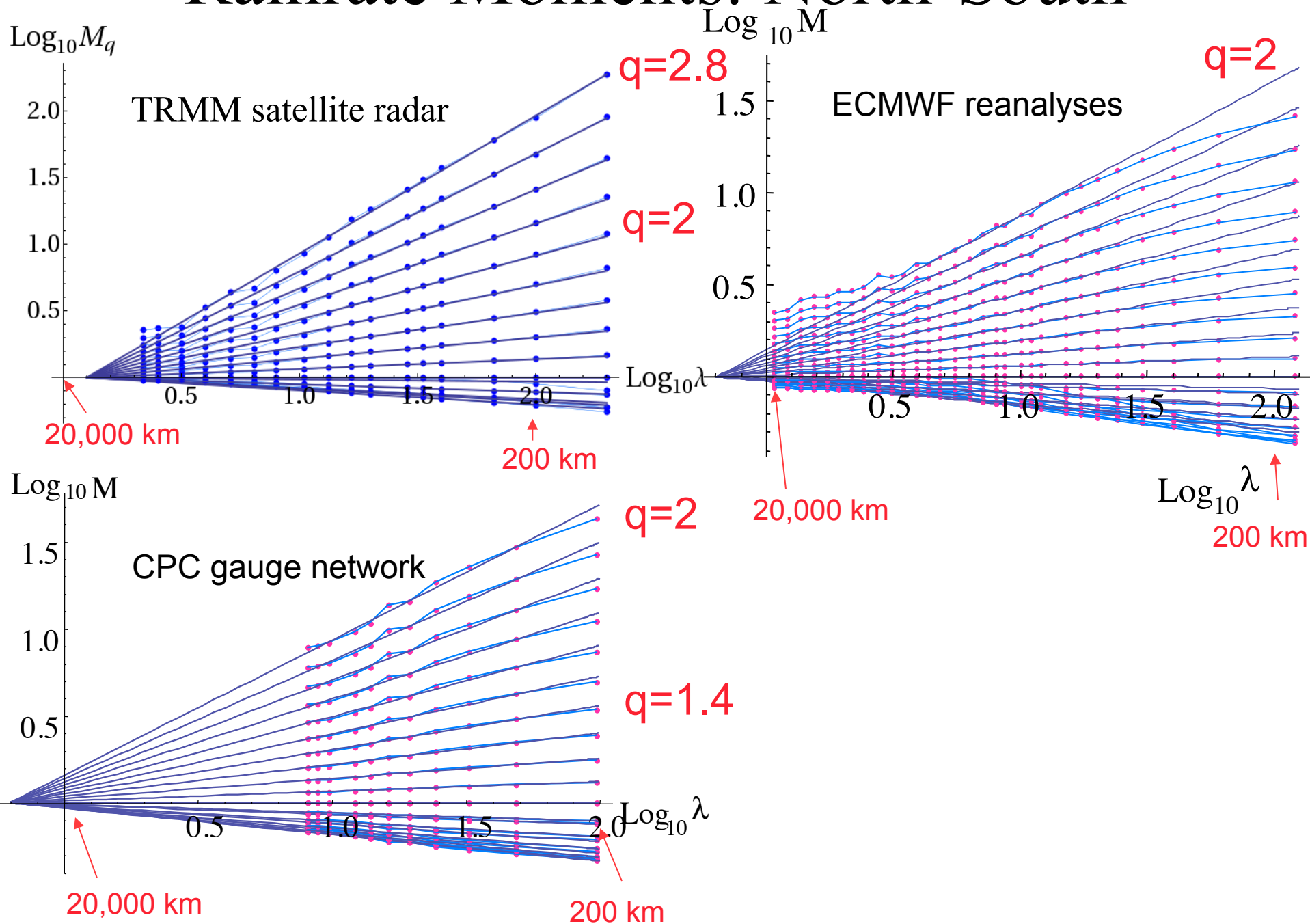


$$M = \langle \phi_\lambda^q \rangle / \langle \phi \rangle^q$$

Rainrate Moments: East-West

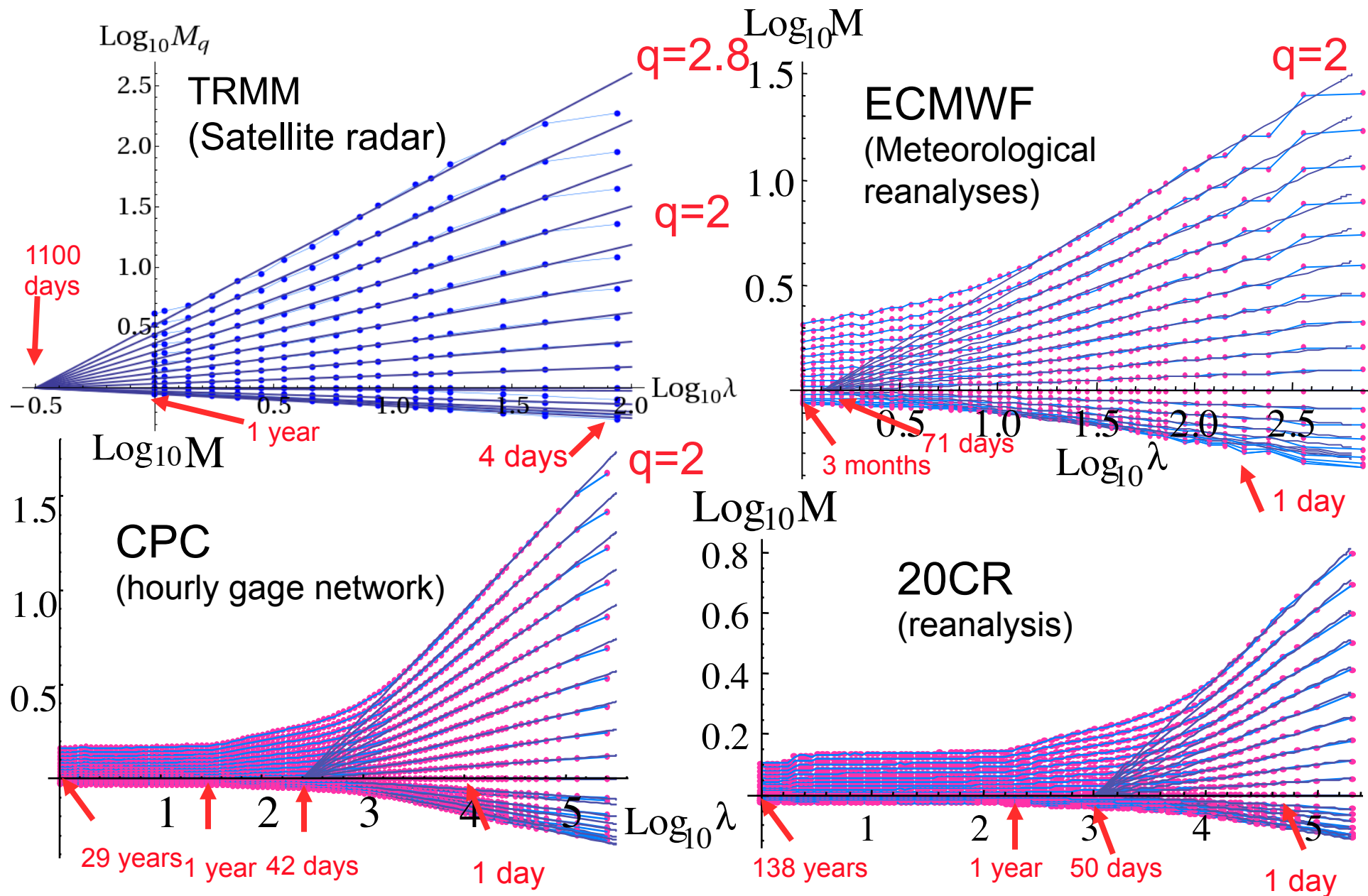


$M = \langle \phi_\lambda^q \rangle / \langle \phi \rangle^q$ Rainrate Moments: North-South



$$M = \langle \phi_\lambda^q \rangle / \langle \phi \rangle^q$$

Rainrate Moments: (time)



Conclusion:

Qualitatively:

gauges, radar, reanalyses have
similar space-time cascade
structures

Quantitatively:

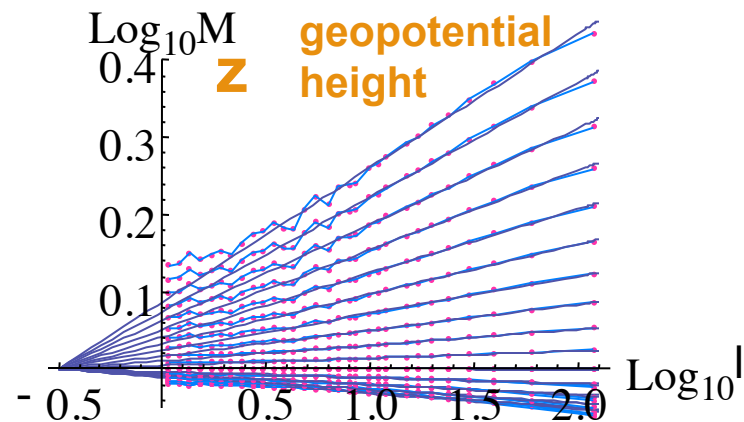
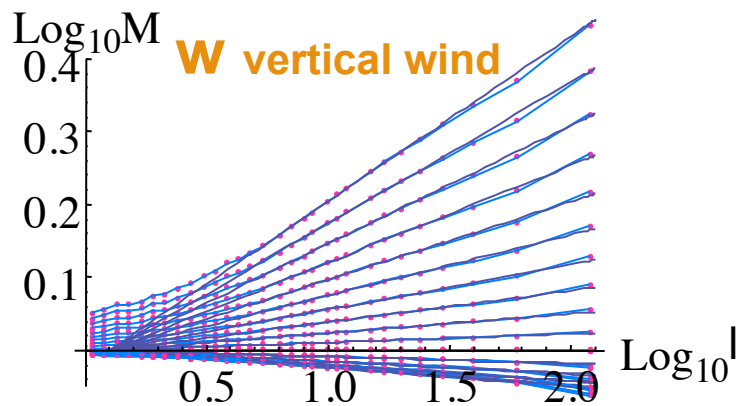
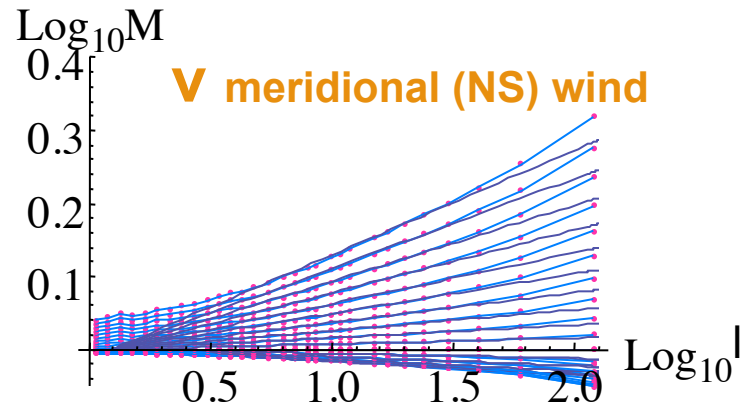
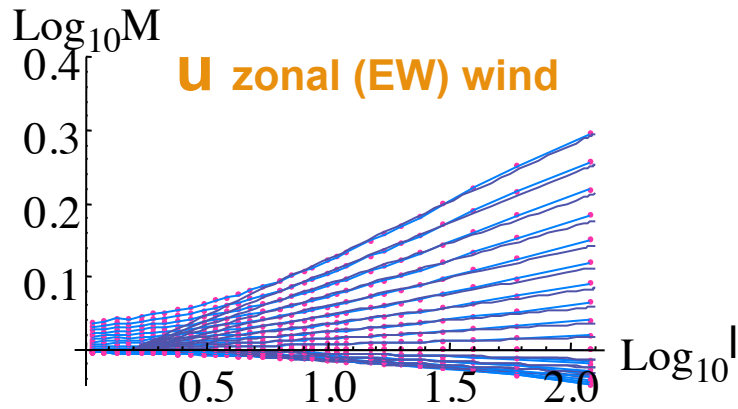
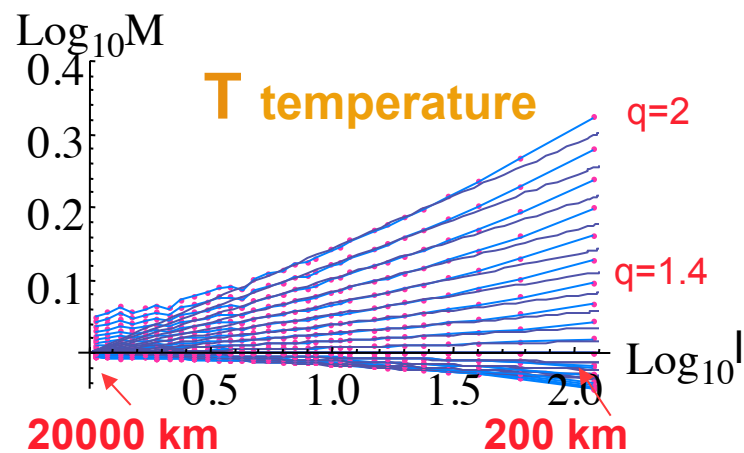
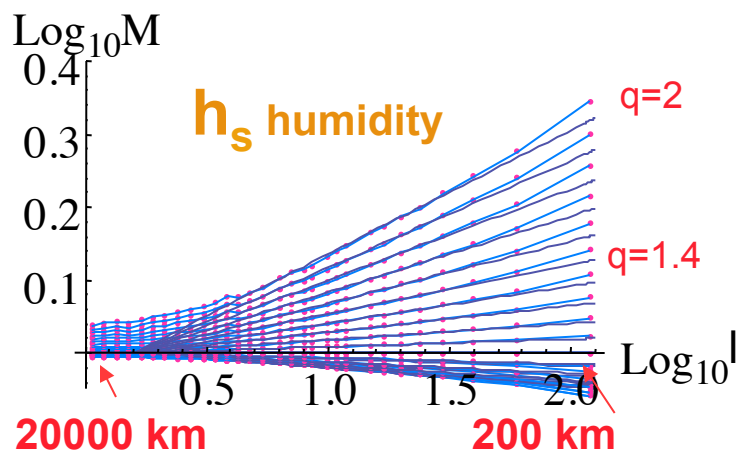
They are all different: which one
is right?

$$M = \langle \phi_\lambda^q \rangle / \langle \phi \rangle^q$$

ECMWF
reanalysis

East-West

(2006, 0Z, 700 mb)

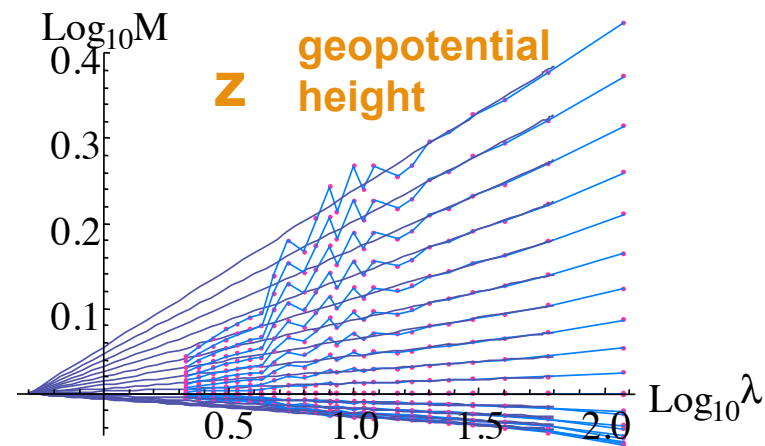
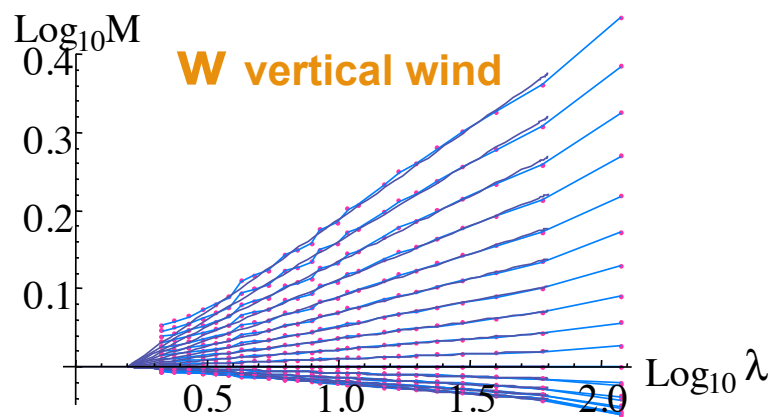
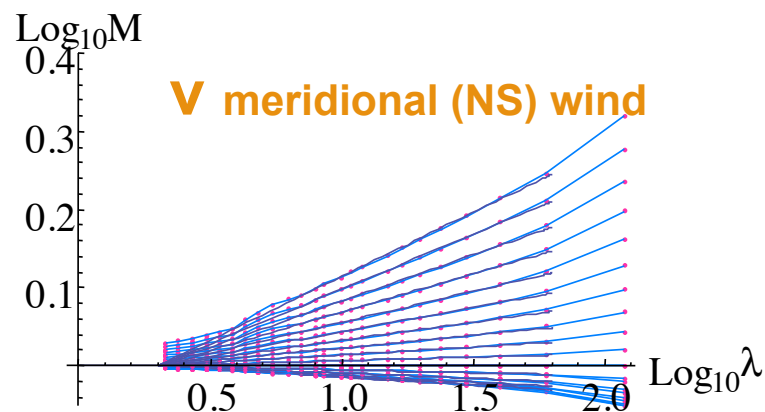
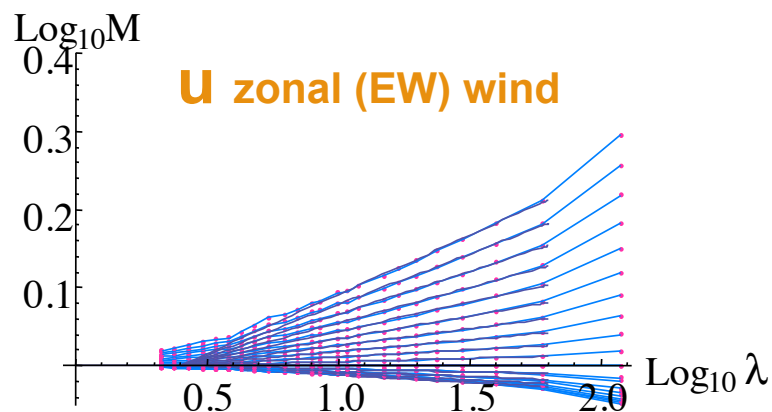
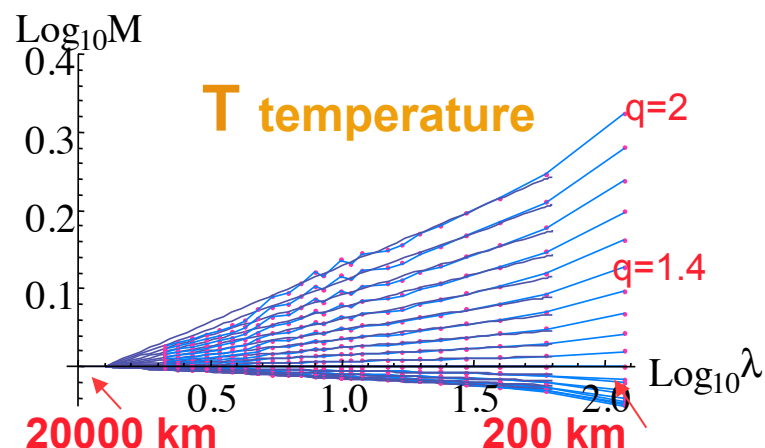
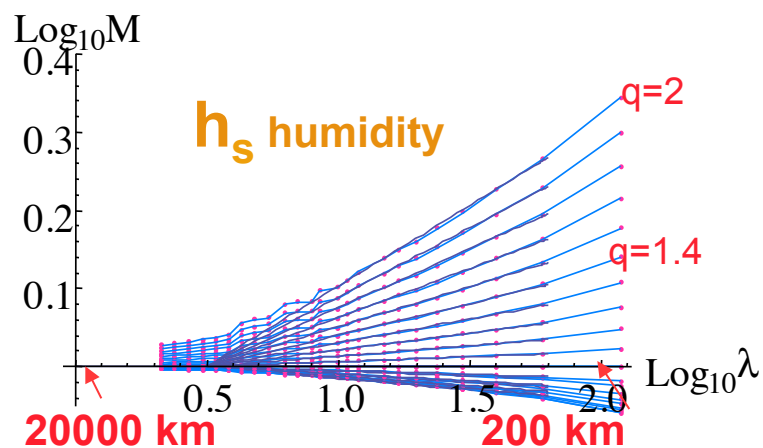


$$M = \langle \phi_\lambda^q \rangle / \langle \phi \rangle^q$$

ECMWF
reanalysis

North-
South

(2006, 0Z, 700 mb,
 $\pm 45^\circ$)



Spatial Scaling: Comparison other geofields

		C_1	α	H	β	L_{eff} (km)
State variables	u, v	0.09	1.9	1/3, (0.77)	1.6, (2.4)	(14000)
	w	(0.12)	(1.9)	(-0.14)	(0.4)	(15000)
	T	0.11, (0.08)	1.8	0.50, (0.77)	1.9, (2.4)	5000 (19000)
	h	0.09	1.8	0.51	1.9	10000
	z	(0.09)	(1.9)	(1.26)	(3.3)	(60000)
Precipitation	R	0.4	1.5	0.00	0.2	32000
Radiances	Infra Red	0.08	1.5	0.3	1.5	15000
	visible	0.08	1.5	0.2	1.5	10000
	Passive microwave	0.1-0.26	1.5	0.25-0.5	1.3-1.6	5000- 15000
Topography	Altitude	0.12	1.8	0.7	2.1	20000

↑
Sparseness
of mean

↑
Index of
multi-
fractality

↑
Scale by
scale
conservation

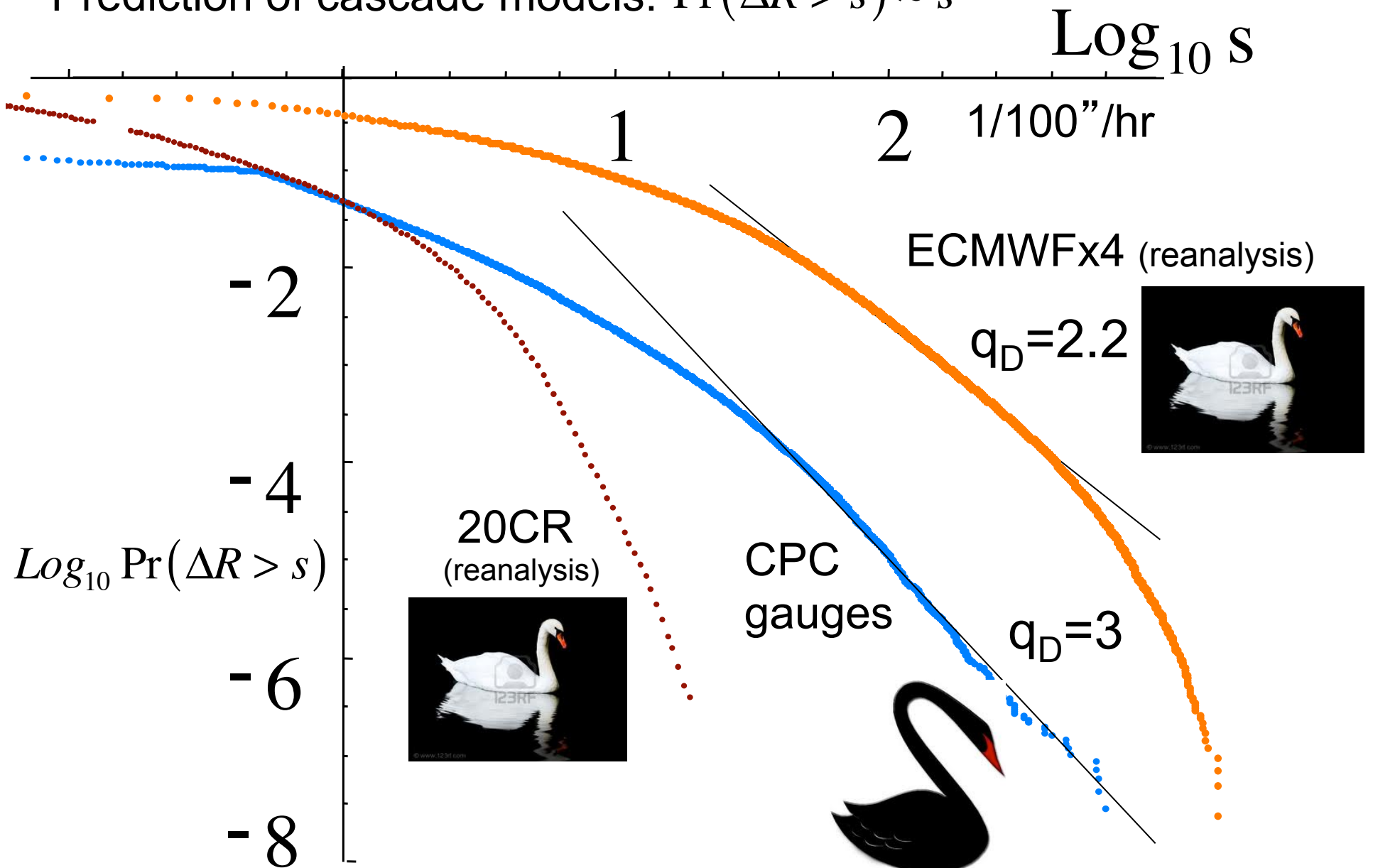
↑
Spectral
exponent

↑
Effective
External
scale

Parentheses = reanalysis values

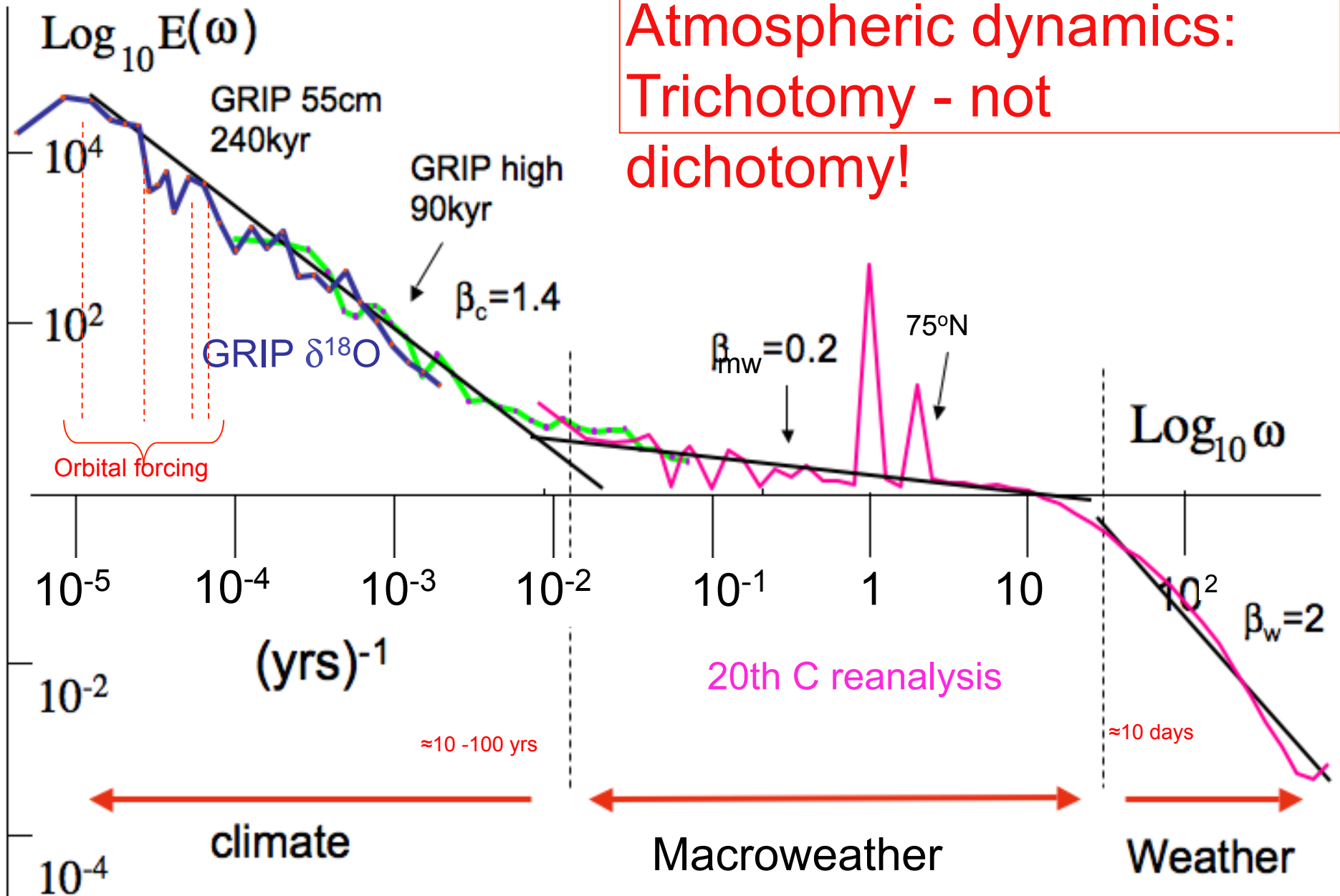
Extremes

Prediction of cascade models: $\Pr(\Delta R > s) \approx s^{-q_D}$



Temporal structure

Atmospheric dynamics:
Trichotomy - not
dichotomy!

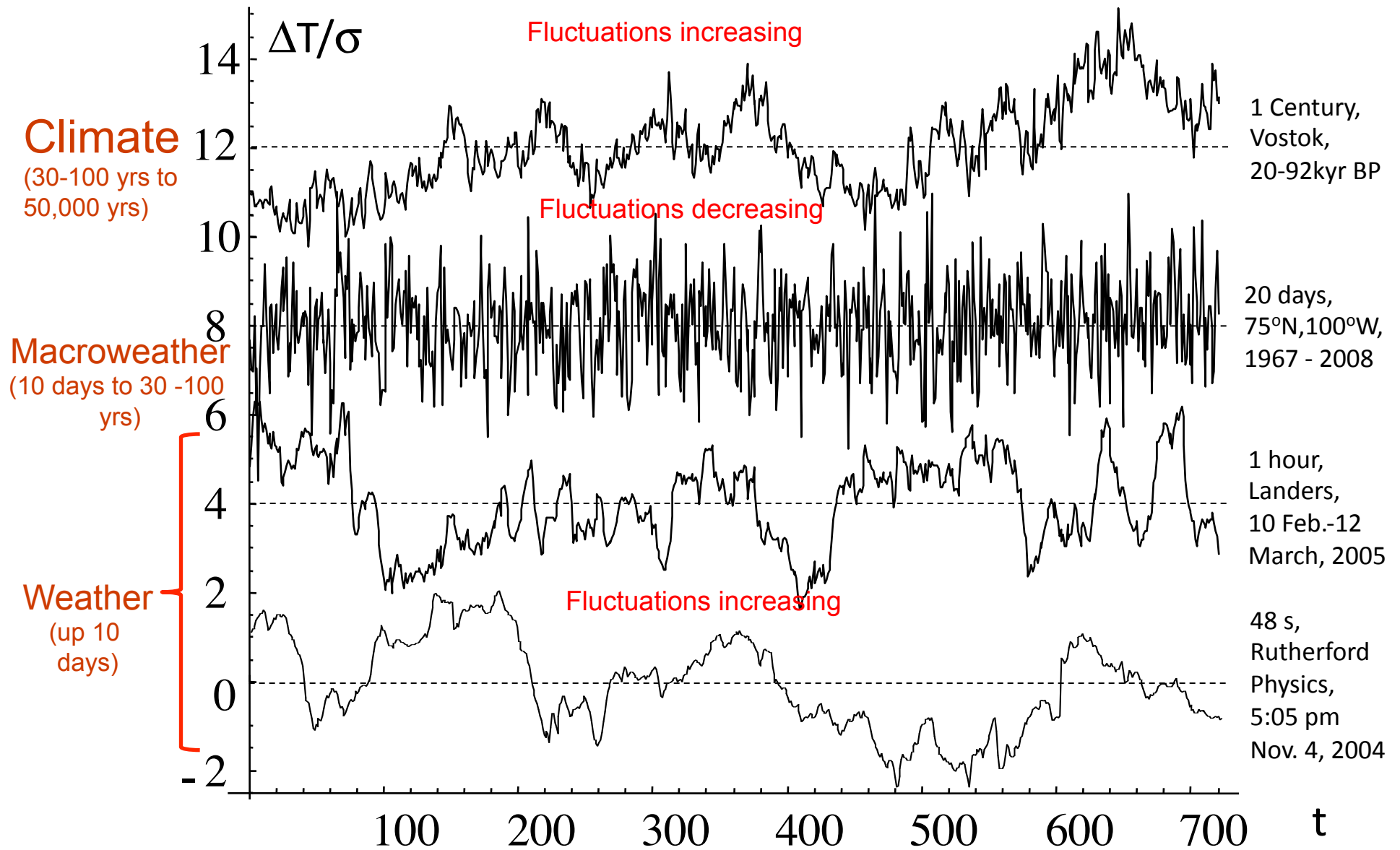


Two data sources only GRIP, 20CR

Trichotomy:

Weather – macroweather - climate

Temperature



Basic characteristics of the three regimes

Fluctuation $\rightarrow \langle \Delta I \rangle = \langle \varphi \rangle \Delta t^H$ \rightarrow = constant

"Climate is what you expect, weather is what you get."
-Lazarus Long, character in R. Heinlein 1971

Weather:

$\Delta t < \tau_w$ (≈ 10 days): $H > 0$,
Fluctuations grow with scale "unstable"

"...Weather is what you get"

Macroweather:

(10 days \approx) $\tau_w < \Delta t < \tau_c$ (≈ 10 - 100 yrs): $H < 0$,
Fluctuations diminish with scale;
atmospheric states are "stable".

"Macroweather is what you expect..."

Climate:

(10- 100 yrs \approx) $\tau_c < \approx \Delta t < \approx 100$ kyrs: $H > 0$,
Fluctuations grow with scale; atmospheric states are "unstable",
subject to "climate change".

"The climate is not what you expect..."

Real space analysis

Range of exponents over which average fluctuations at scale Δt corresponds to frequency $1/\Delta t$

Fluctuation $\langle \Delta I \rangle = \langle \varphi \rangle \Delta t^H = \text{constant}$

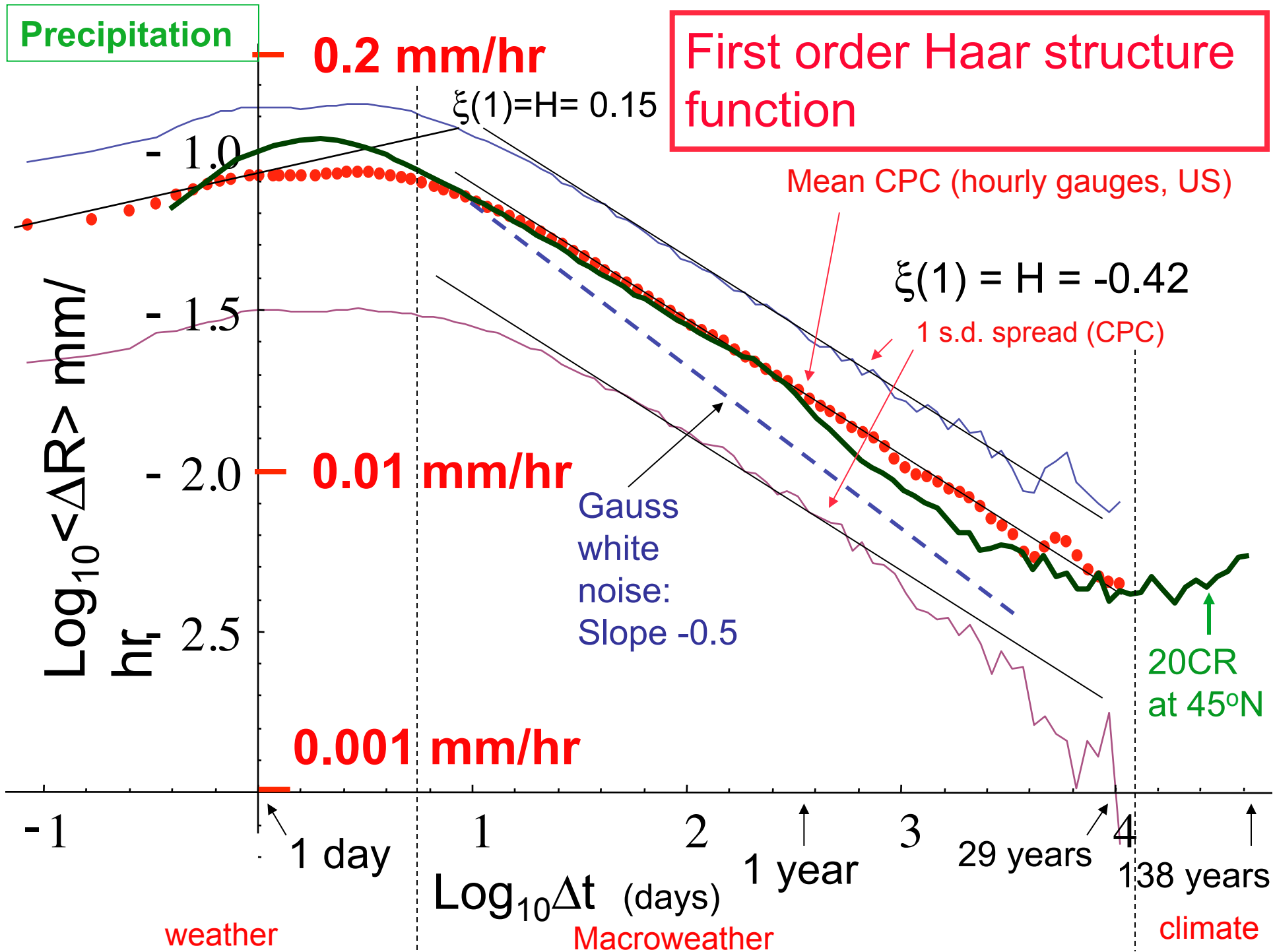
$$E(\omega) = \langle |\tilde{I}(\omega)|^2 \rangle = \omega^{-\beta}$$

$$\beta = 1 + 2H - K(2)$$

Statistic	Range of H	Range of β	Comment
Spectrum	$-\infty < H < \infty$	$-\infty < \beta < \infty$	$E(\omega) \approx \omega^{-\beta}$
Difference	$0 < H < 1$	$1 < \beta + K(2) < 3$	"Poor man's wavelet"
Tendency Fluctuation	$-1 < H < 0$	$-1 < \beta + K(2) < 1$	Average with overall mean removed (standard deviation = "Climactogram", also called the "Aggregated Standard Deviation")
Haar	$-1 < H < 1$	$-1 < \beta + K(2) < 3$	Difference of means of first and second halves of interval
Detrended Fluctuation Analysis (DFA, polynomial order n)	$-1 < H < (n+1)$	$-1 < \beta + K(2) < 3+2n$	Also multifractal extension (MFDFA), usually linear: n=1, Not a wavelet
Mexican Hat Wavelet	$-1 < H < 2$	$-1 < \beta + K(2) < 5$	2 nd Derivative of a Gaussian
Generalized Haar	$-m < H < n$	$1-2m < \beta + K(2) < 3+2n$	Interpretation not simple

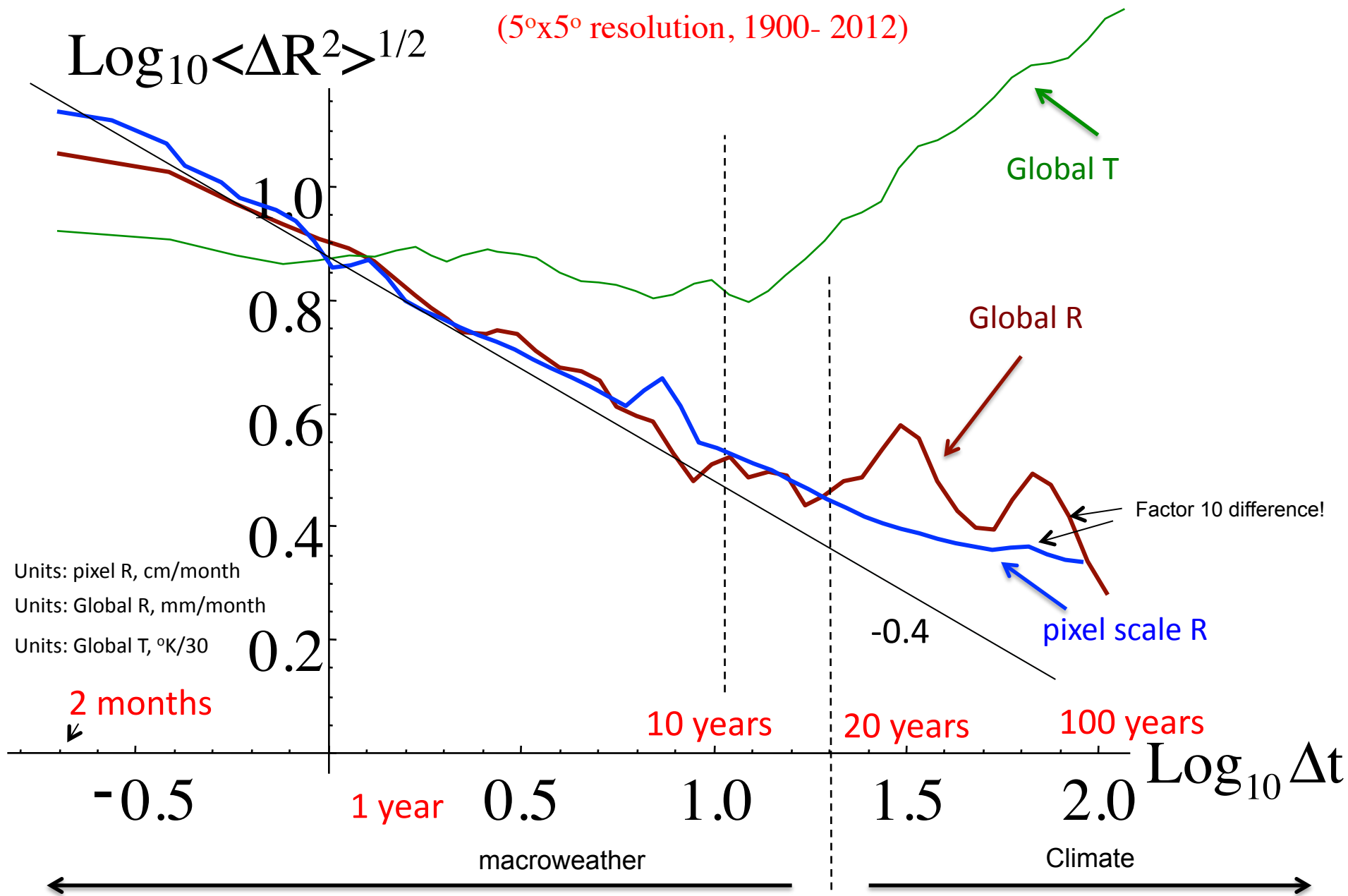
Multifractal "correction"

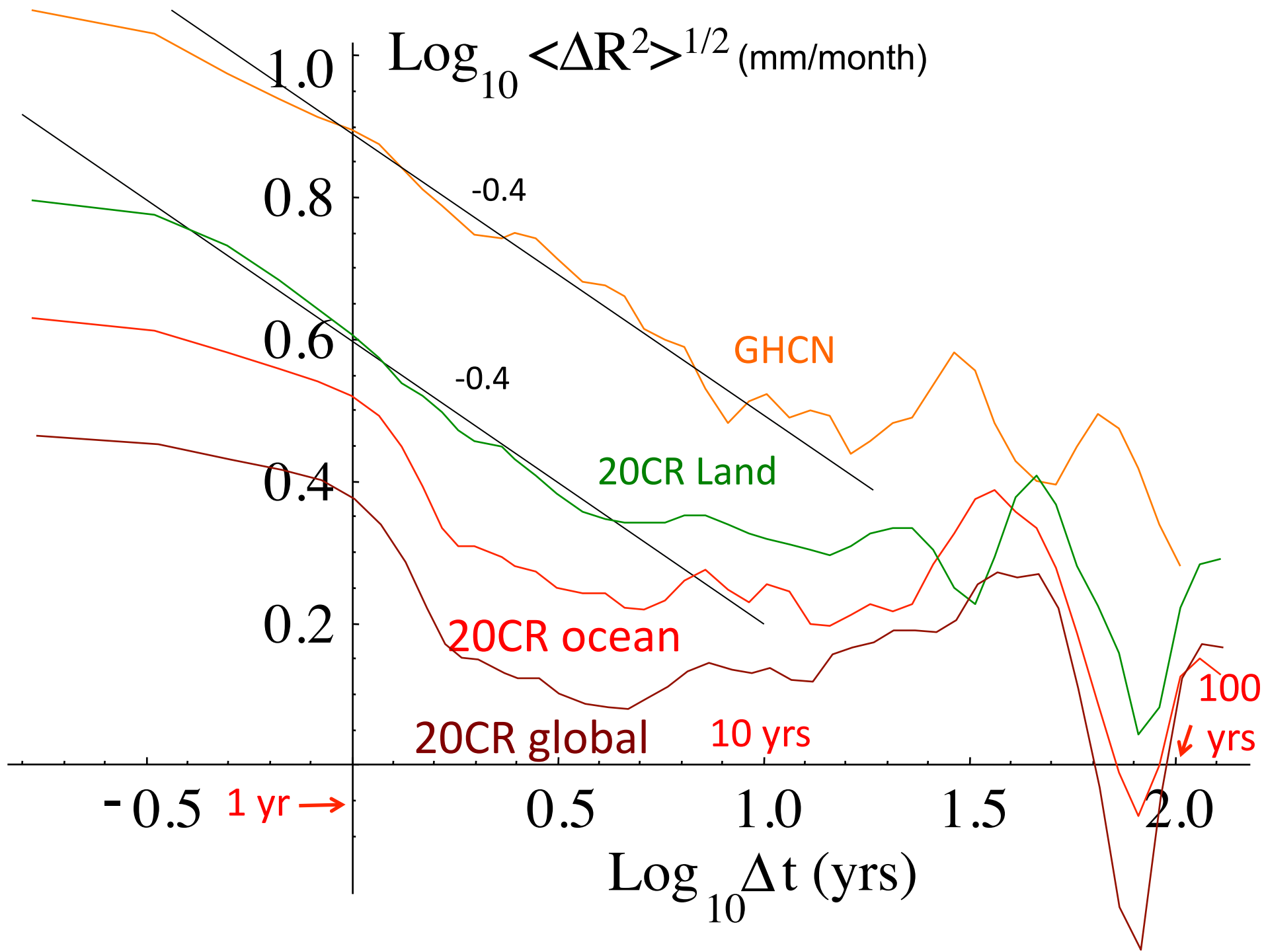
Simple interpretation



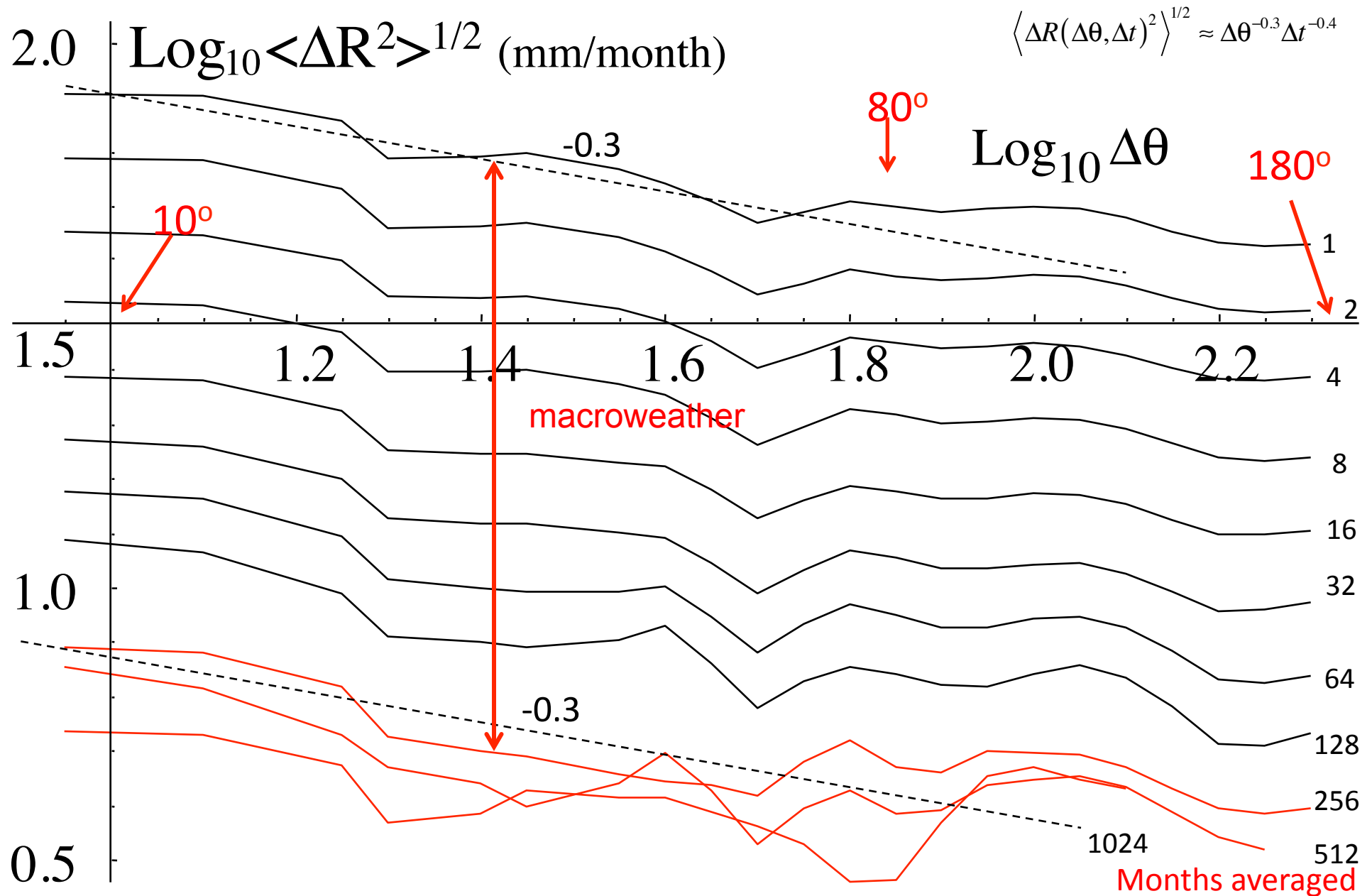
Precipitation and temperature:

GHCN=Global Historical Climate Network
(5°x5° resolution, 1900- 2012)





GHCN in EW direction for increasing averaging times (anomalies)



Conclusions

High level (emergent) turbulent space-time laws

Precipitation as a turbulent process

Cascades:

-Multiplicative Cascades in space-time, data, models, reanalyses

-Cascades are Anisotropic: vertical and horizontal cascades are different.

-Power law extremes

**Temporal scaling trichotomy:
weather-macroweather-climate**

Applications

-Stochastic space-time precipitation modelling

-Solving the problem of measuring areal precipitation

-Improving numerical models (of atmosphere and hydrology)

-climate, climate change, anthropogenic effects