



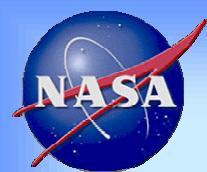
# Scaling properties of aerosol optical thickness from sun-photometric and satellite data

Mikhail Alexandrov<sup>1,2</sup>, Alexander Marshak<sup>3</sup>  
Brian Cairns<sup>1,2</sup>, Andrew Lacis<sup>2</sup>, and  
Barbara Carlson<sup>2</sup>

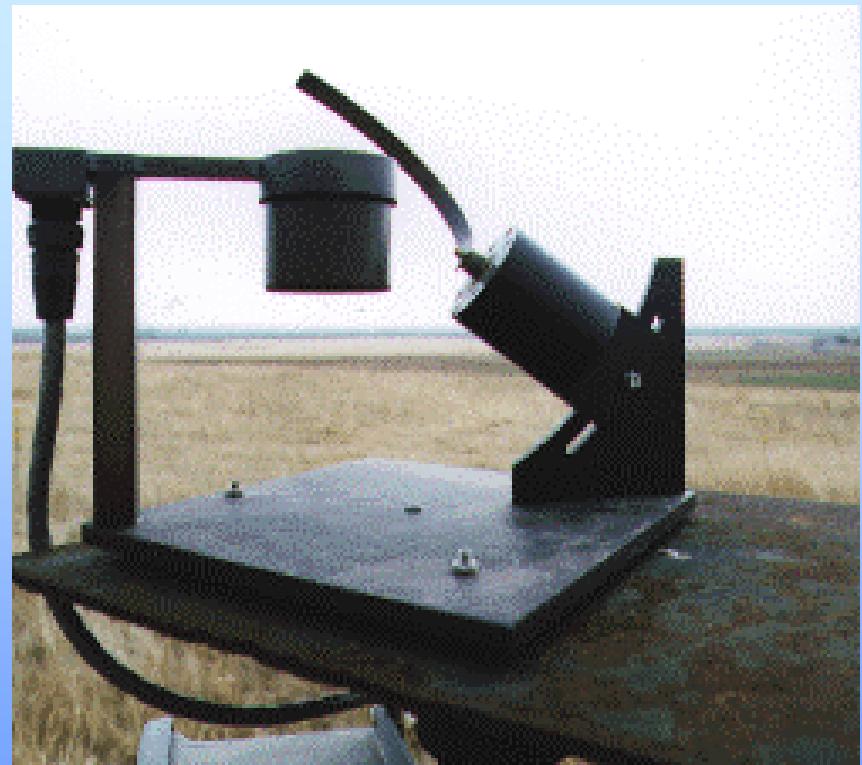
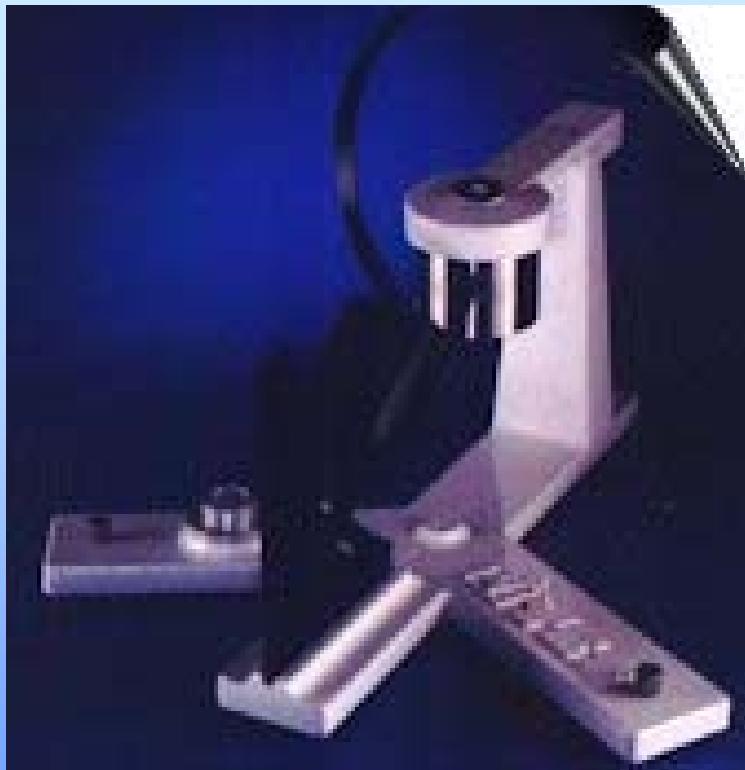
<sup>1</sup>Columbia University, New York

<sup>2</sup>NASA Goddard Institute for Space Studies, New York

<sup>3</sup>NASA Goddard Space Flight Center, Greenbelt, MD

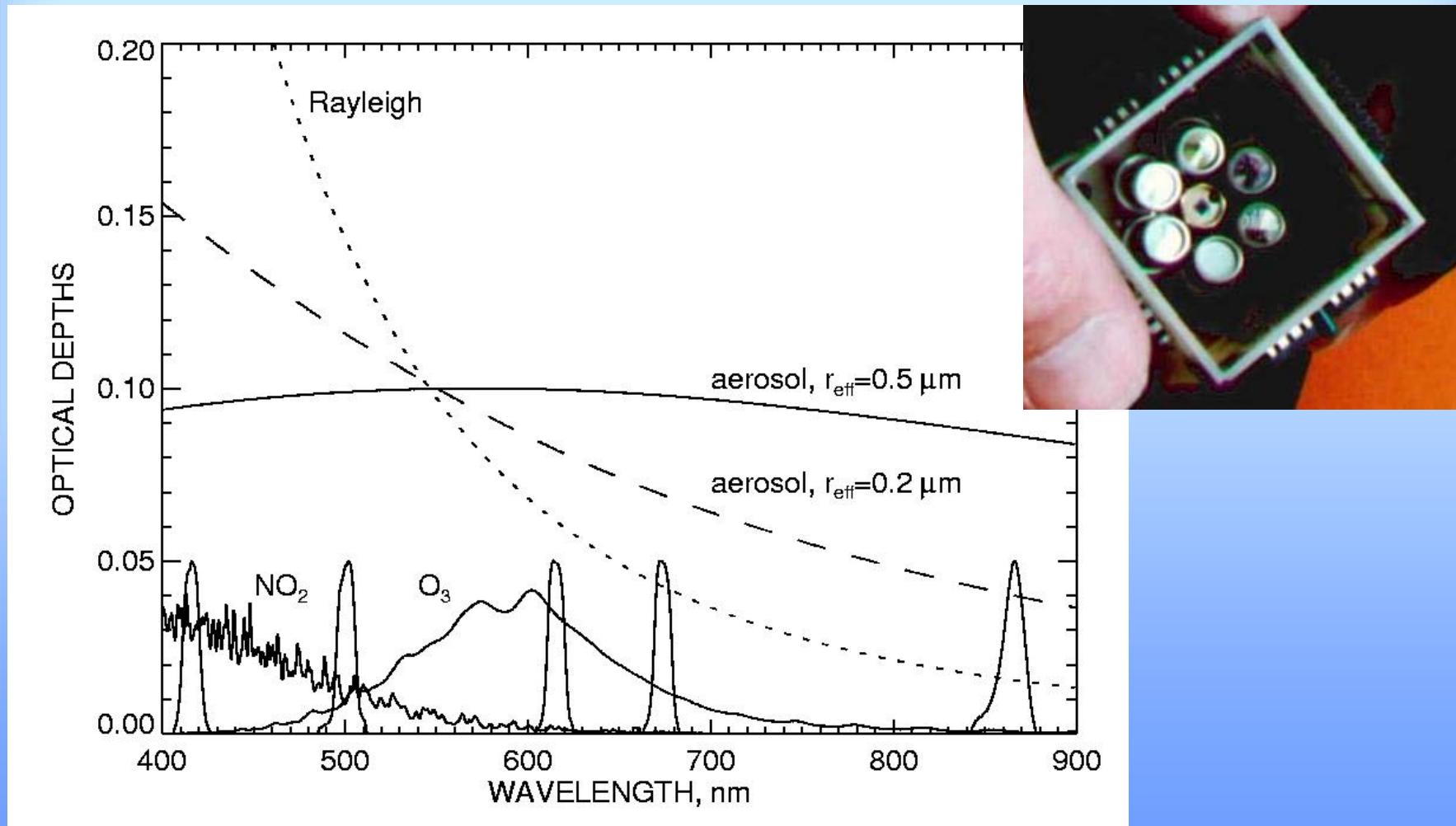


# MFRSR instrument



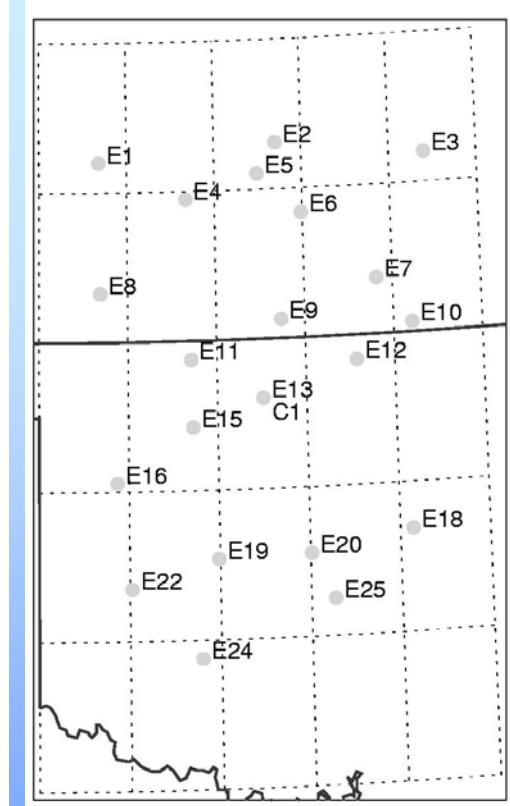
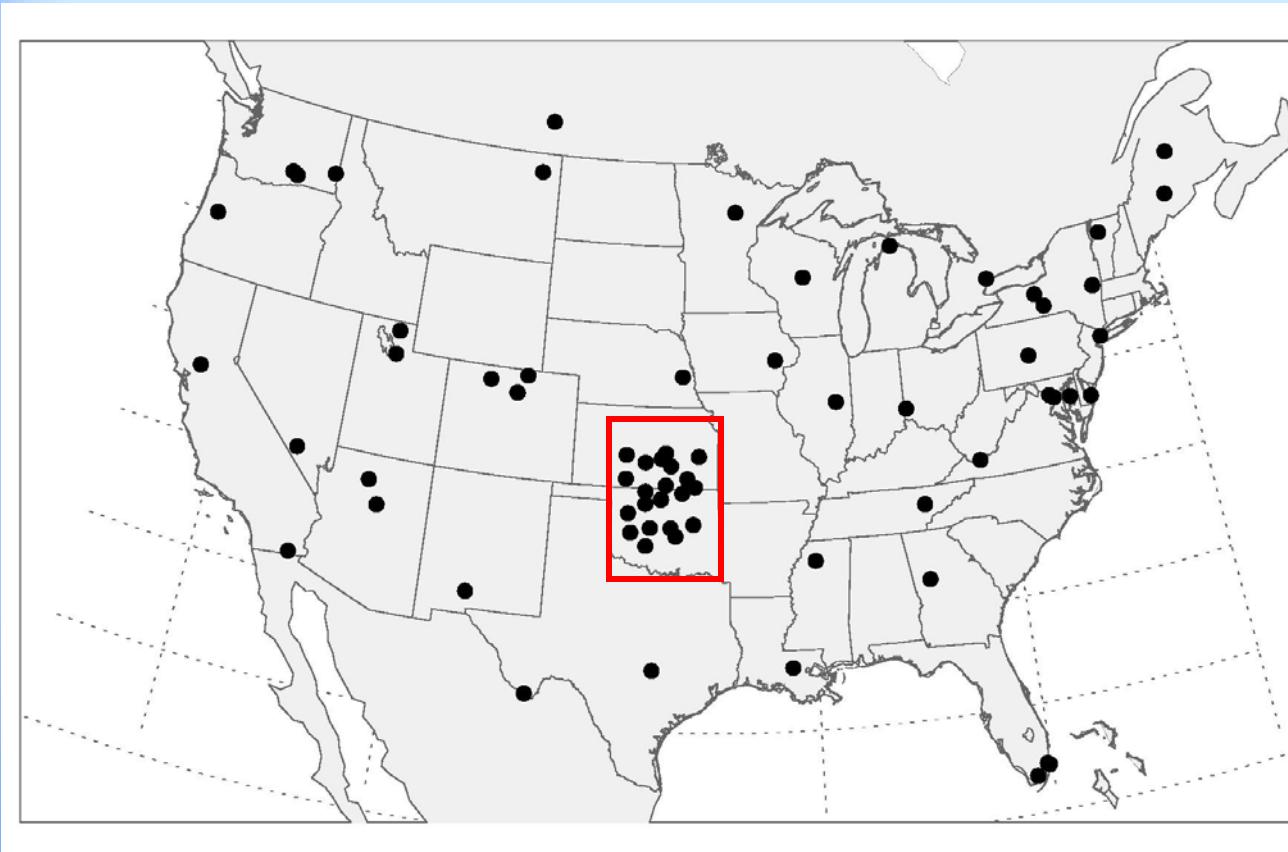


# MFRSR spectral sensitivity





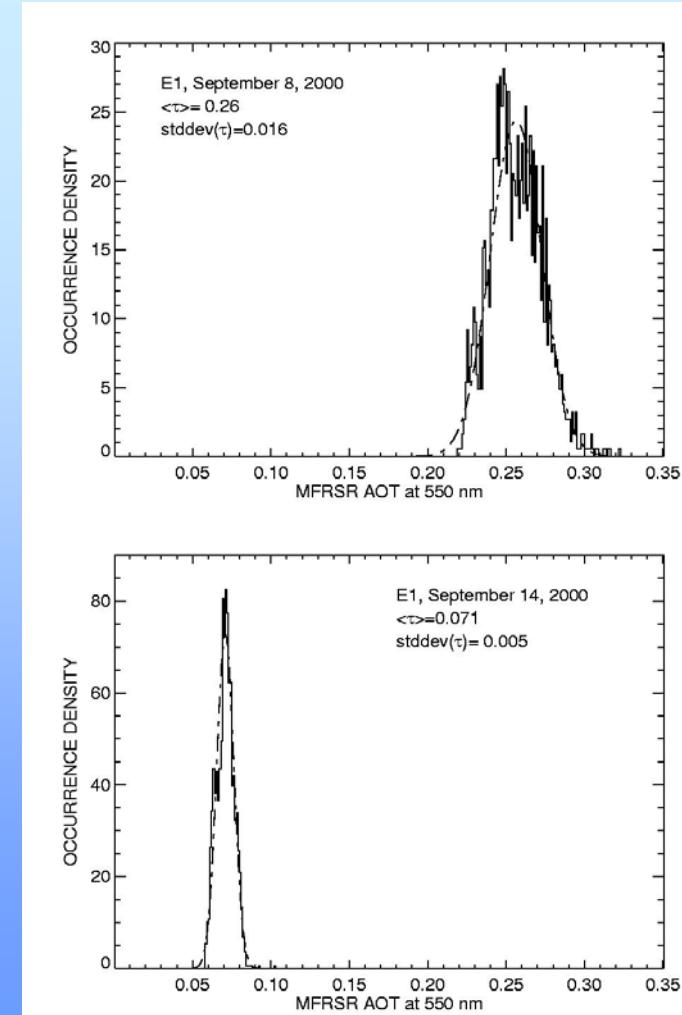
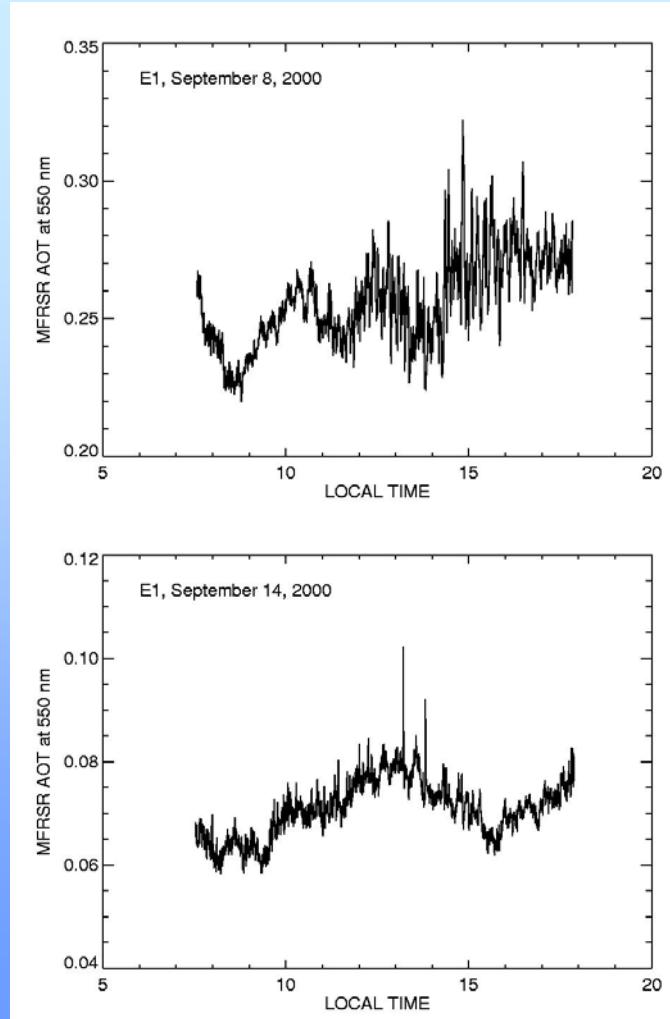
# MFRSR networks



**Southern Great Plains  
Network (DOE ARM)**



# Gaussian statistics of aerosol optical thickness





# Two-point statistics, scale invariance

$\tau(x)$  is a stochastic AOT field,  $\hat{\tau}(k)$  - its Fourier transform

Power Spectrum:

$$E(k) = \frac{2}{L} |\hat{\tau}(k)|^2 \propto k^{-\beta}$$

Structure functions:

$$S_q(r) = \overline{|\tau(x+r) - \tau(x)|^q} \propto r^{\zeta(q)}$$

$$\beta = \zeta(2) + 1 \approx 2H_2 + 1 \quad H_q = \zeta(q)/q$$



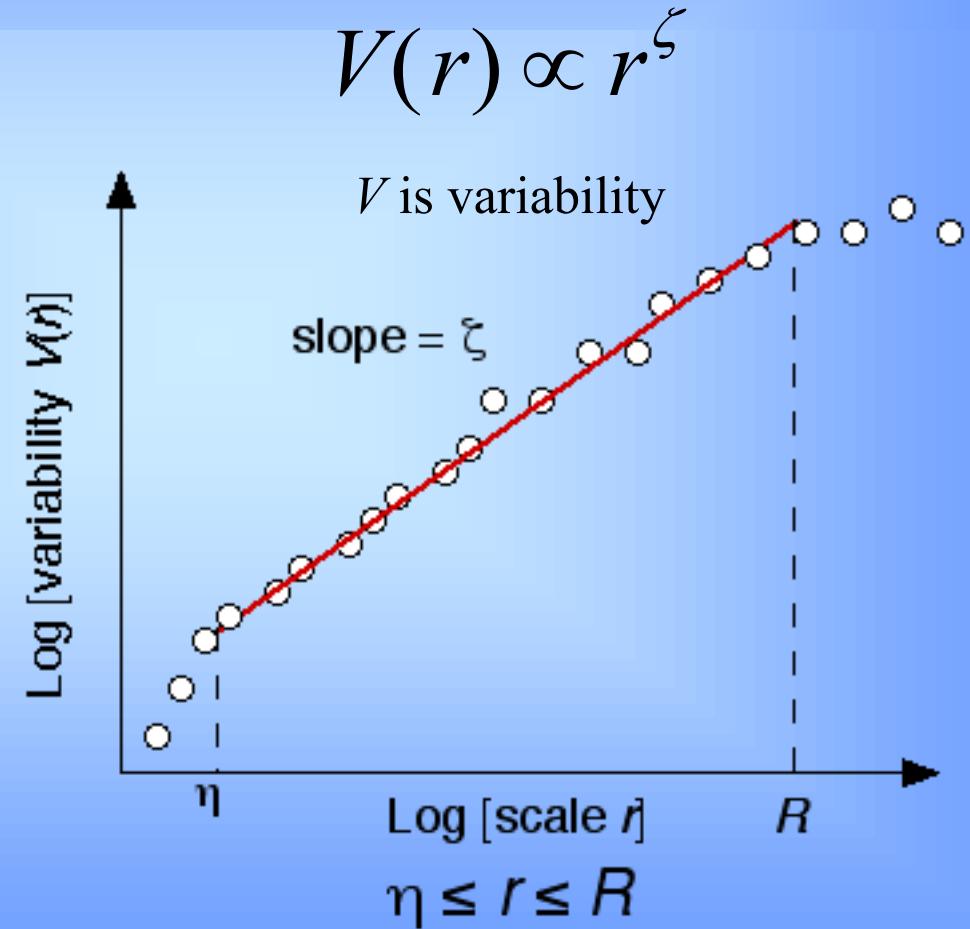
# Scale-Invariance

Scale-Invariance  
—a powerful  
unifying concept

Scale-invariance (scaling):

- statist. invariance under change in scale  $r$
- power-law in  $r$  over large range of scales

$$V(\lambda r) \propto \lambda^\zeta V(r)$$

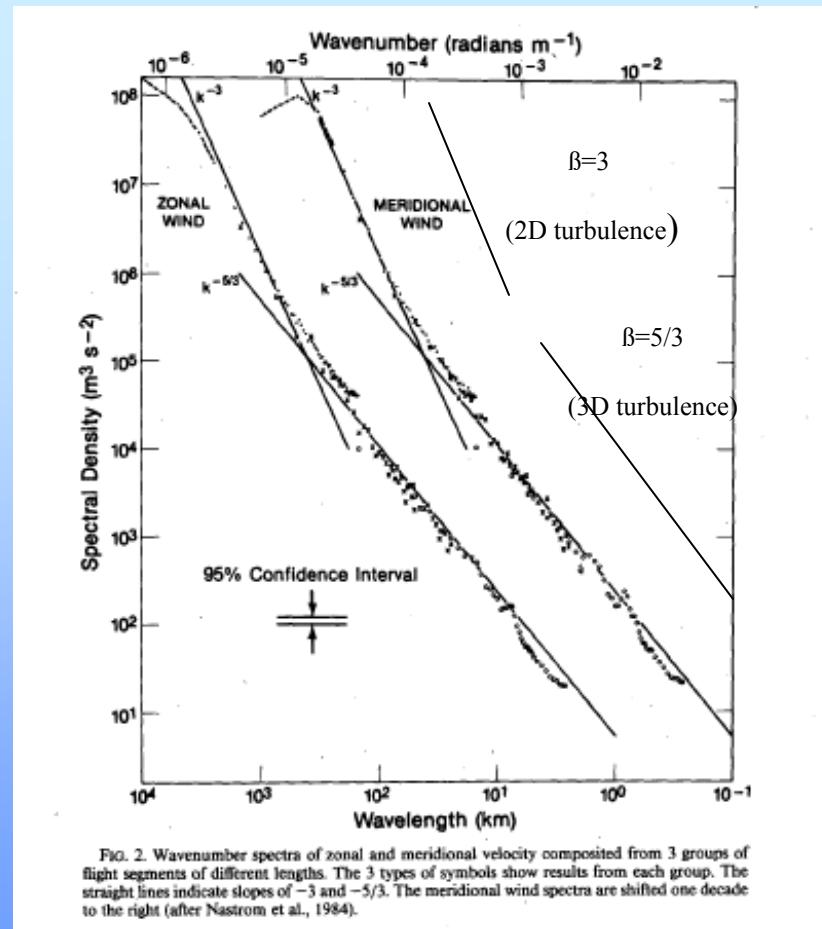




# Example for atmospheric wind

*2D turbulence*  
 $\beta=3$

*3D turbulence*  
 $\beta=5/3$

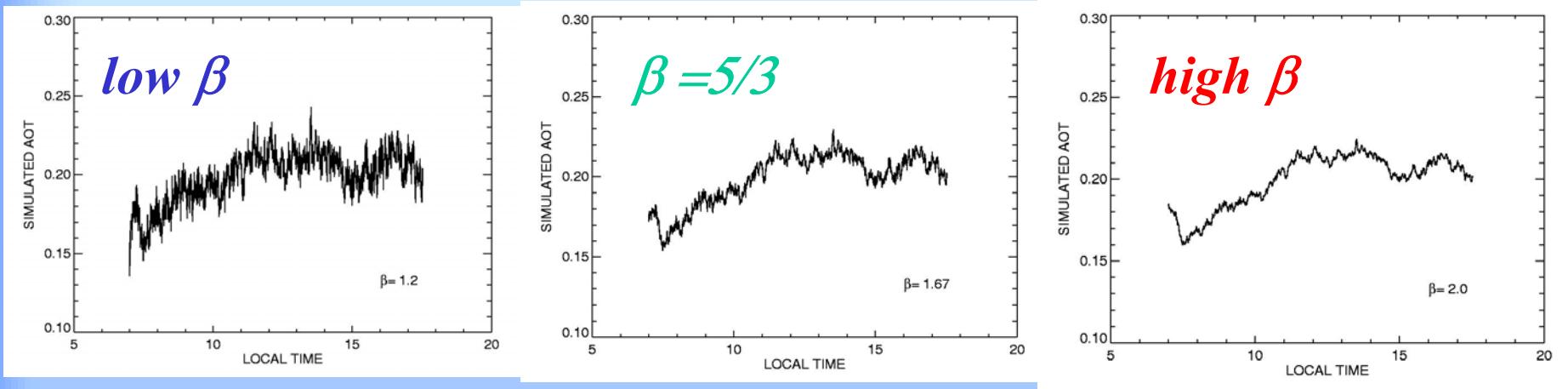


Wind fluctuations in the free troposphere at 9-14 km altitude

From Gage and Nastrom, 1989



# Simulated examples of scale-invariant AOT



$$\beta = 1.2$$

$$\beta = 1.67$$

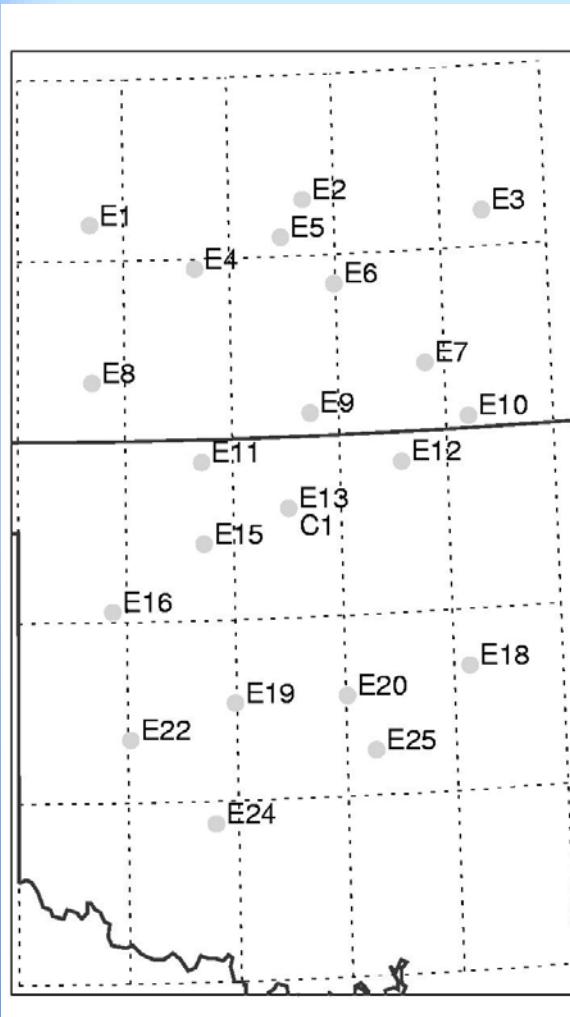
$$\beta = 2.0$$

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

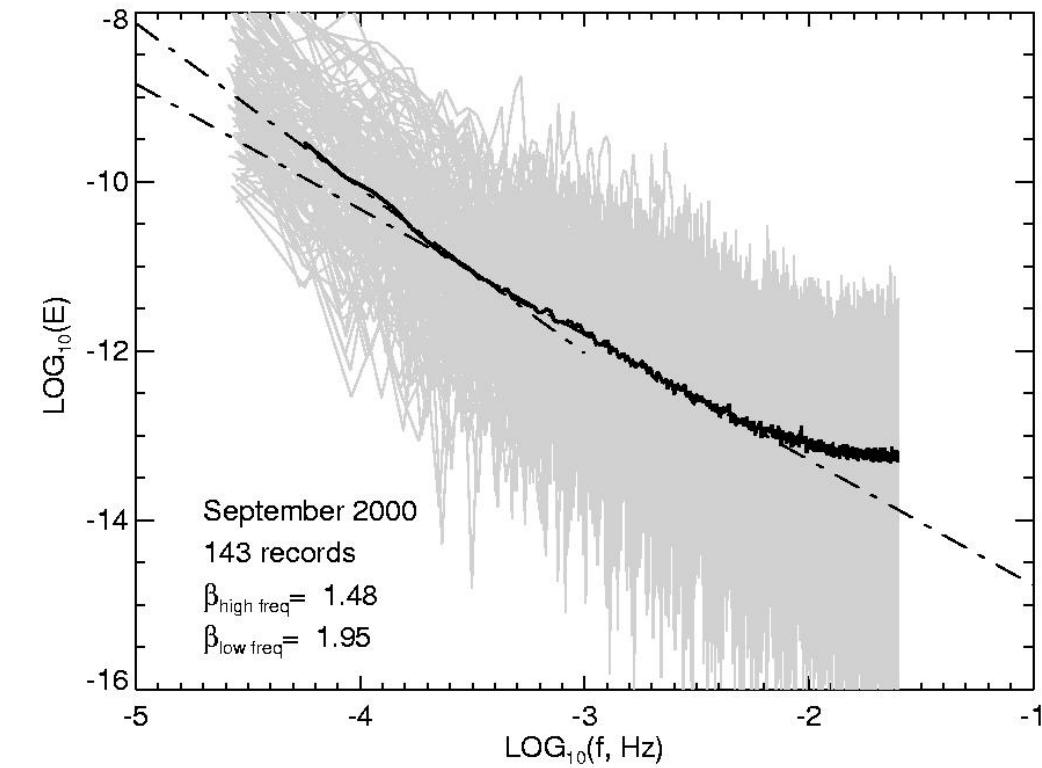
*All three curves have the same mean and standard deviation*



# AOT from MFRSR network



Power spectrum

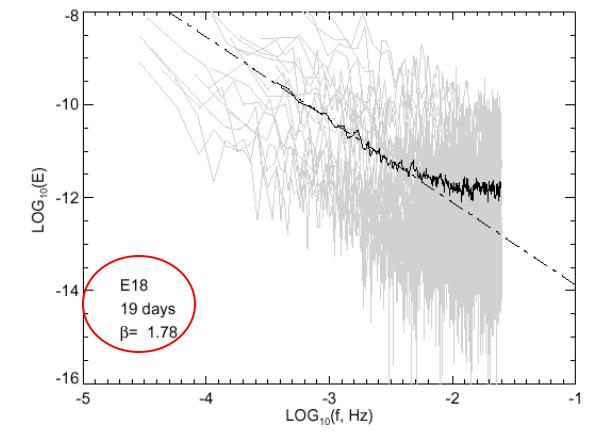
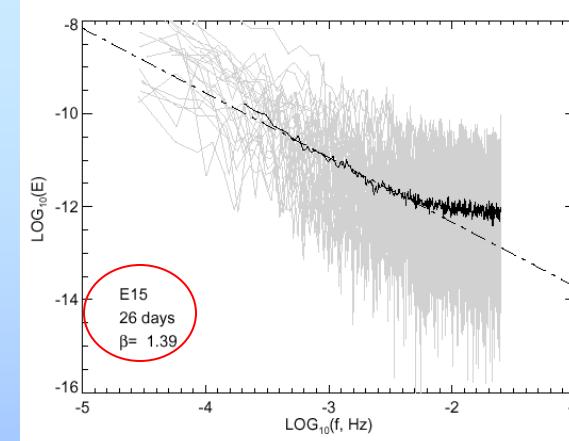




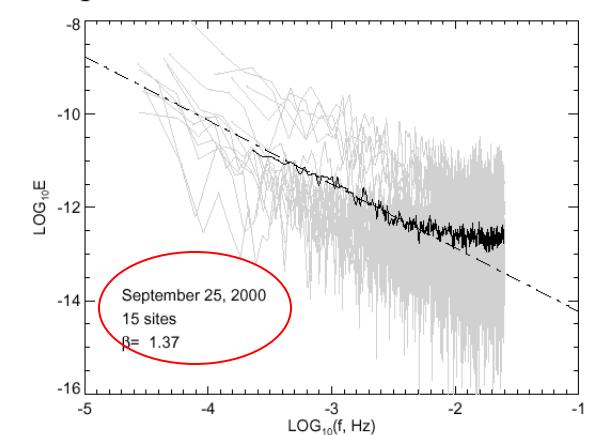
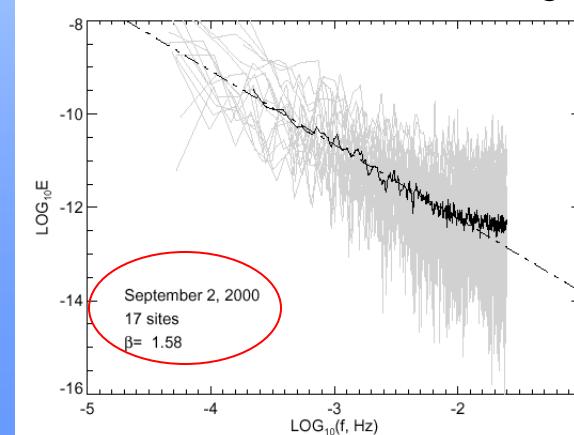
# AOT from MFRSR network

## Power spectrum

averaged over time



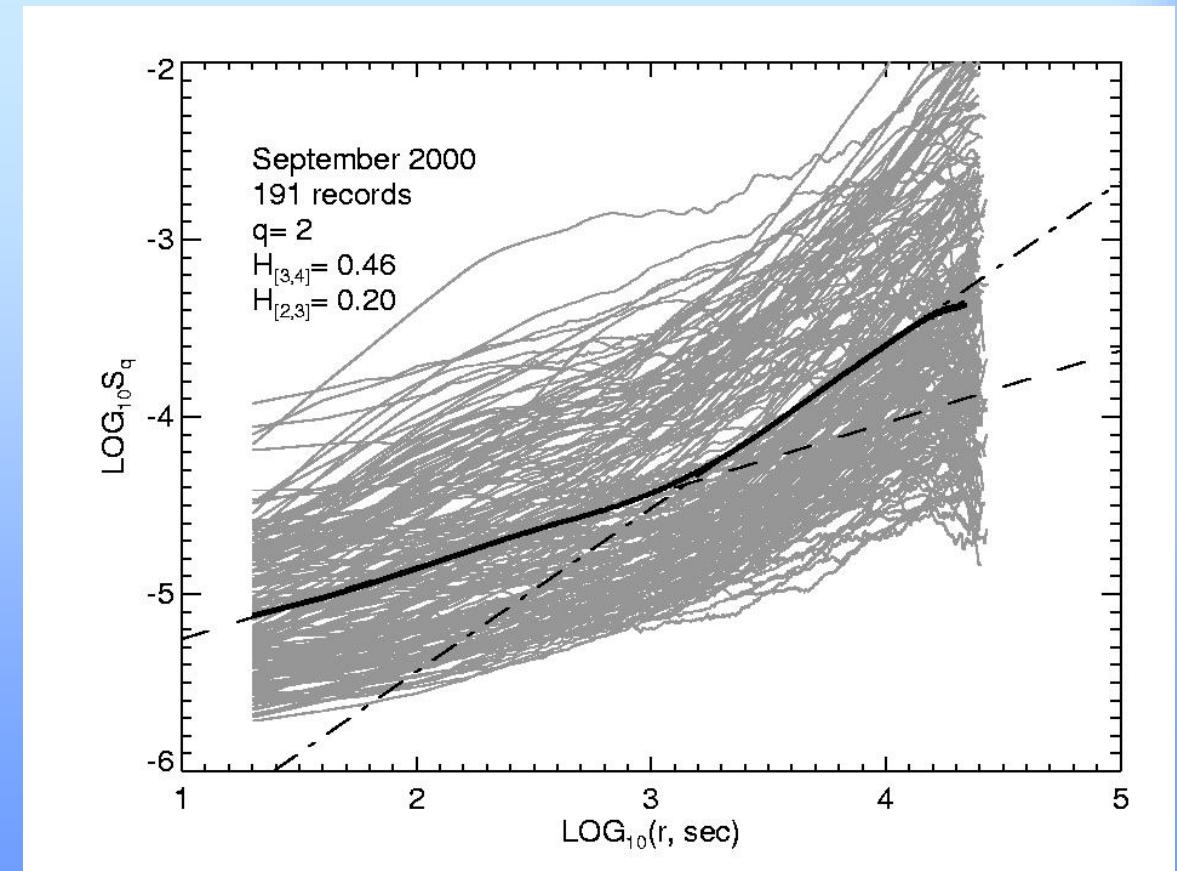
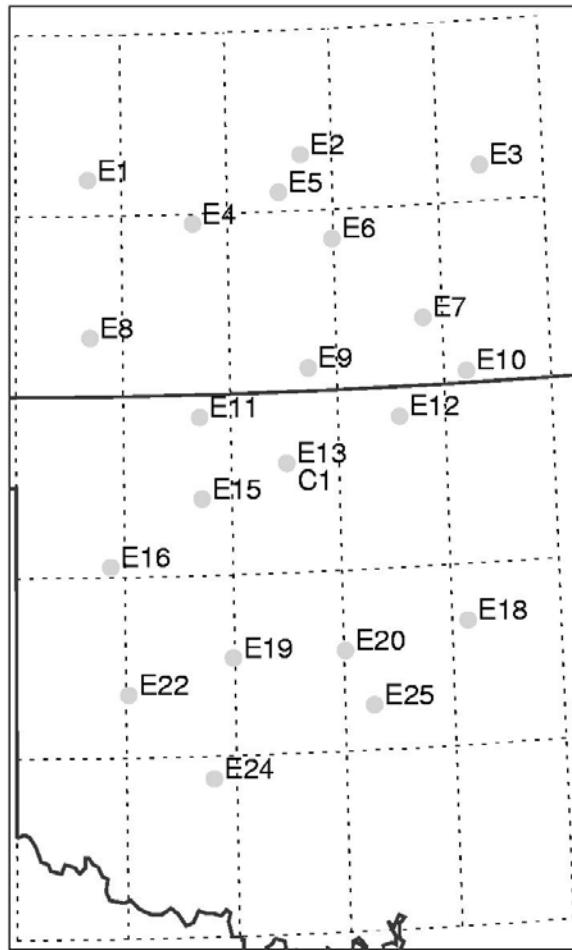
averaged over space





# AOT from MFRSR network

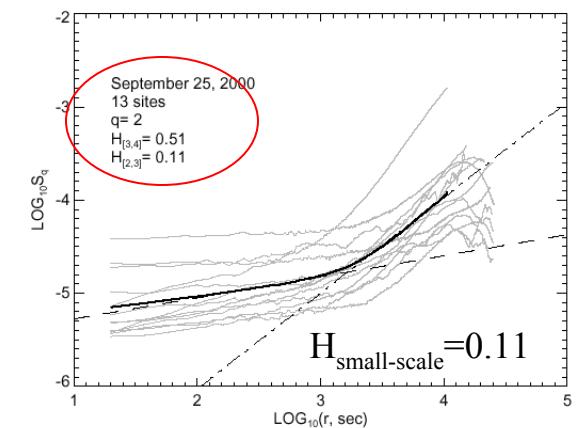
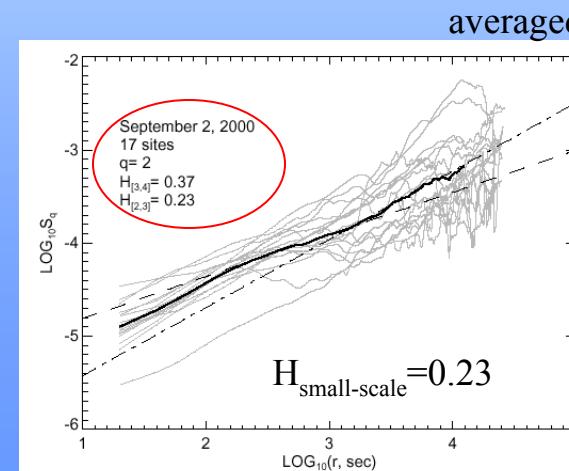
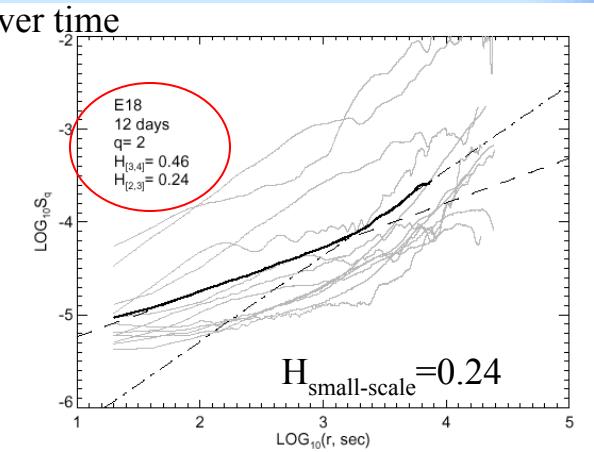
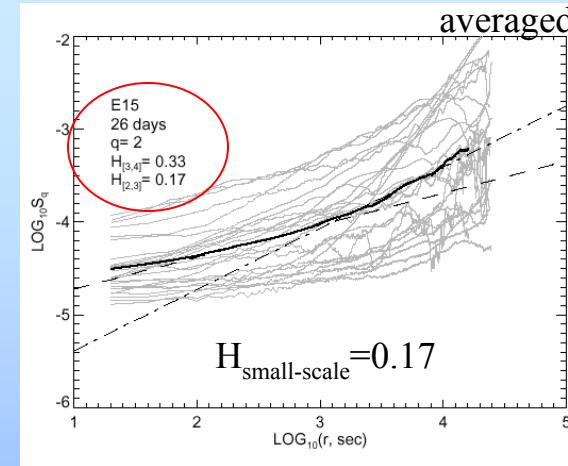
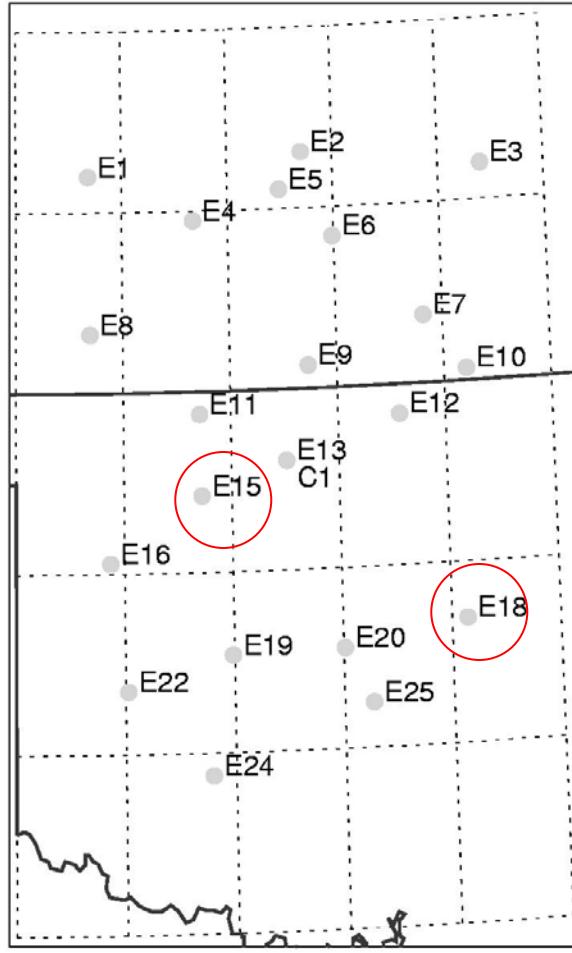
Structure functions (2nd order)





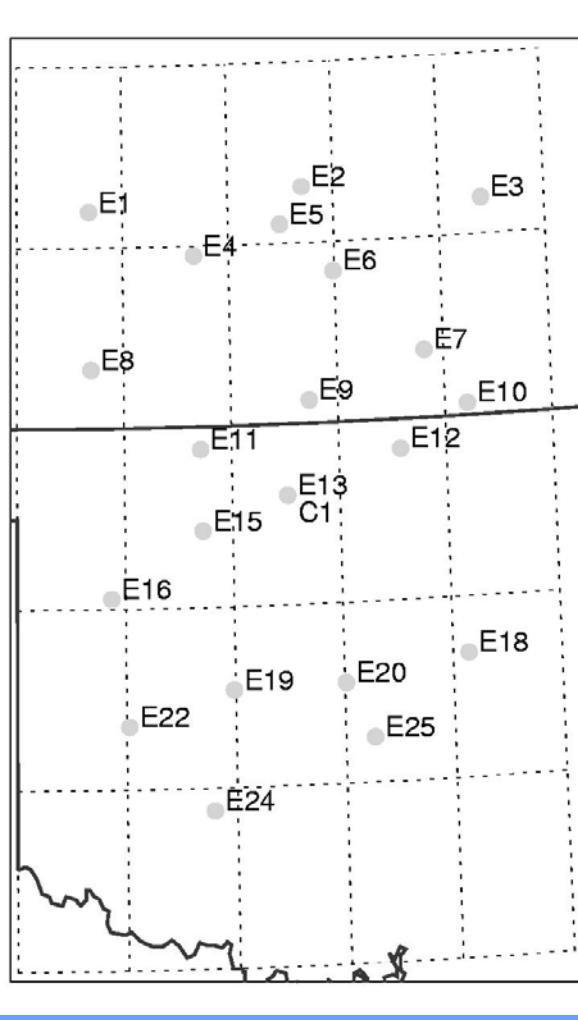
# AOT from MFRSR network

## Structure functions





# AOT from MFRSR network

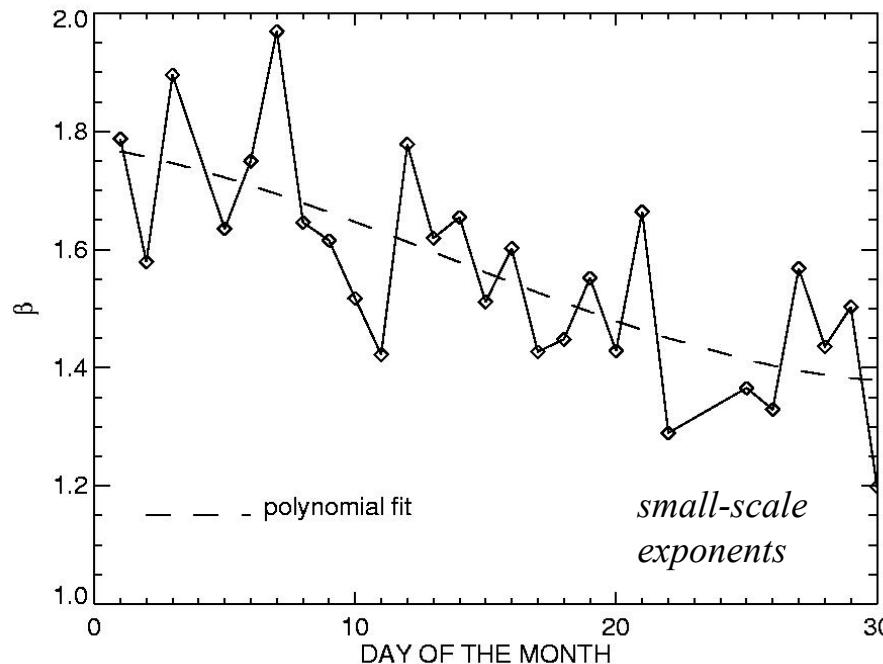


## Questions to ask:

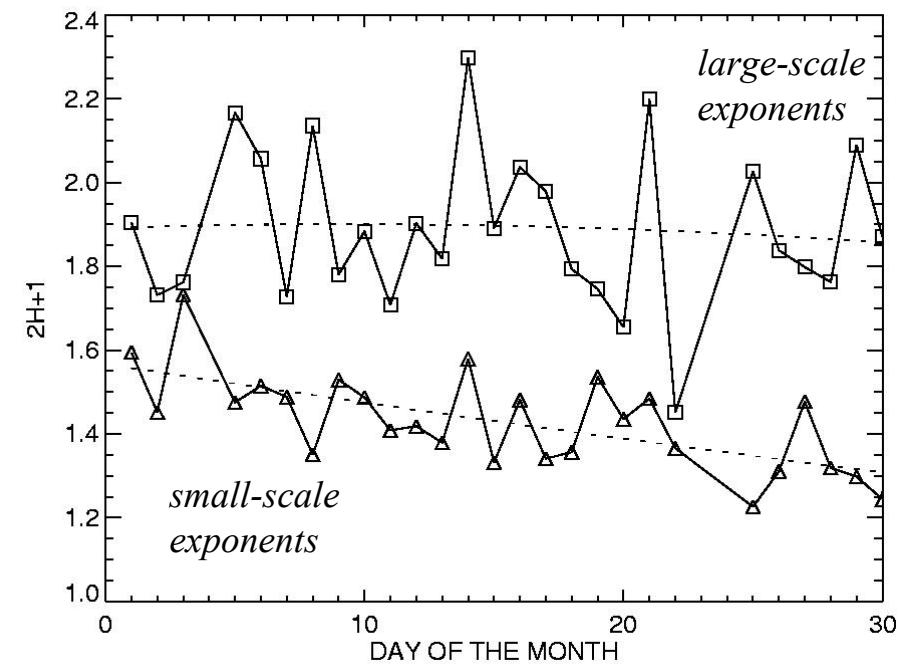
- What the small-scale spectral exponents are driven by? Or what fluctuations of the AOT (in time and space) depend on?
- What physics is behind the scale break?



# Time dependence of scaling exponents



small-scale  
exponents



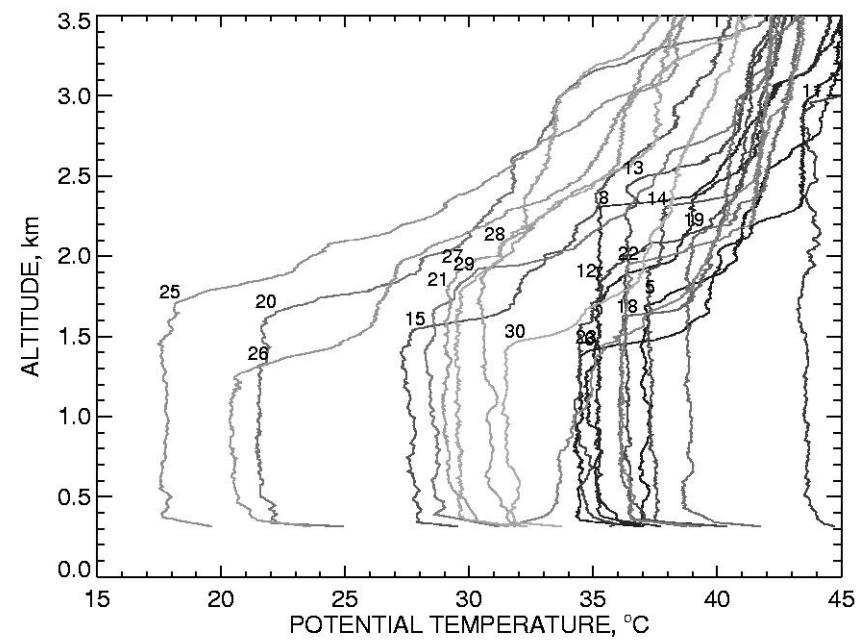
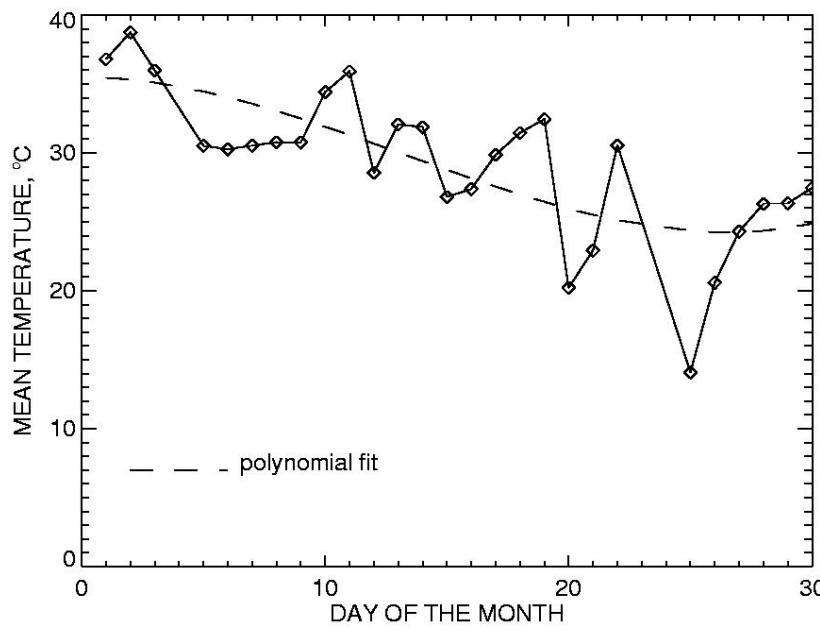
large-scale  
exponents

$\beta$

$2H+1$



# Temperature decrease

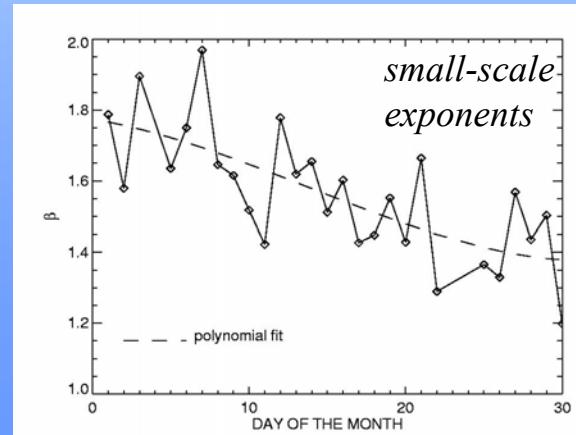
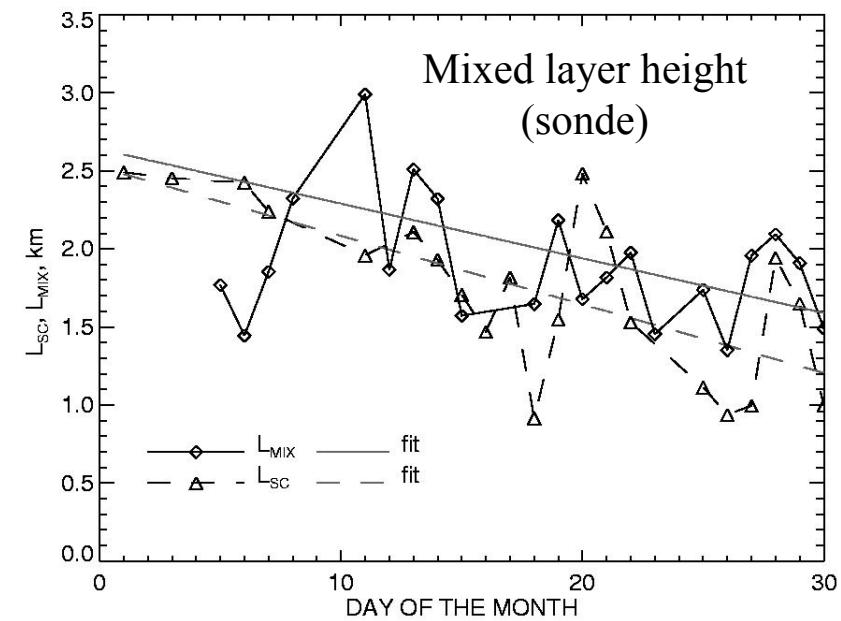
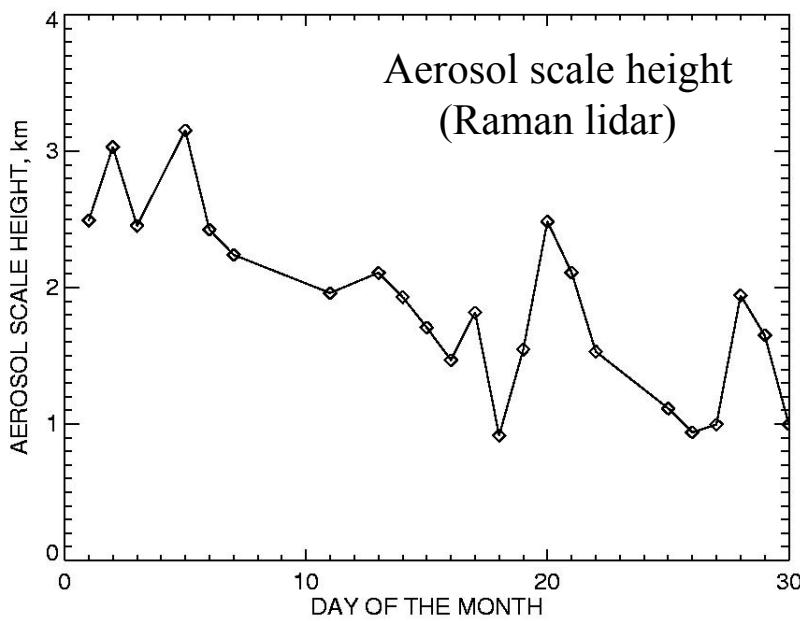


Ground temperature

Potential temperature  
profiles (sonde)

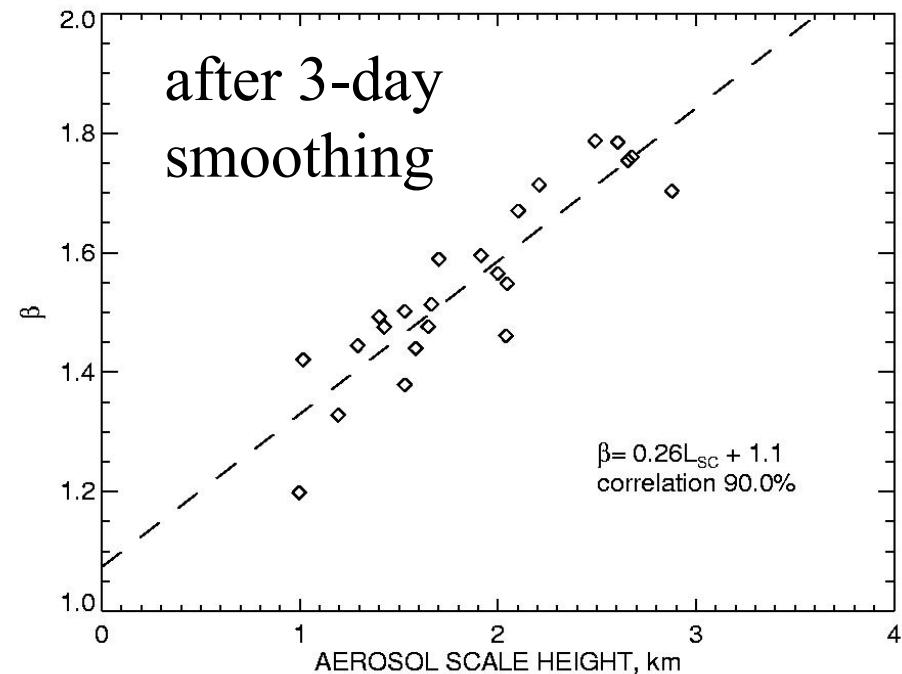
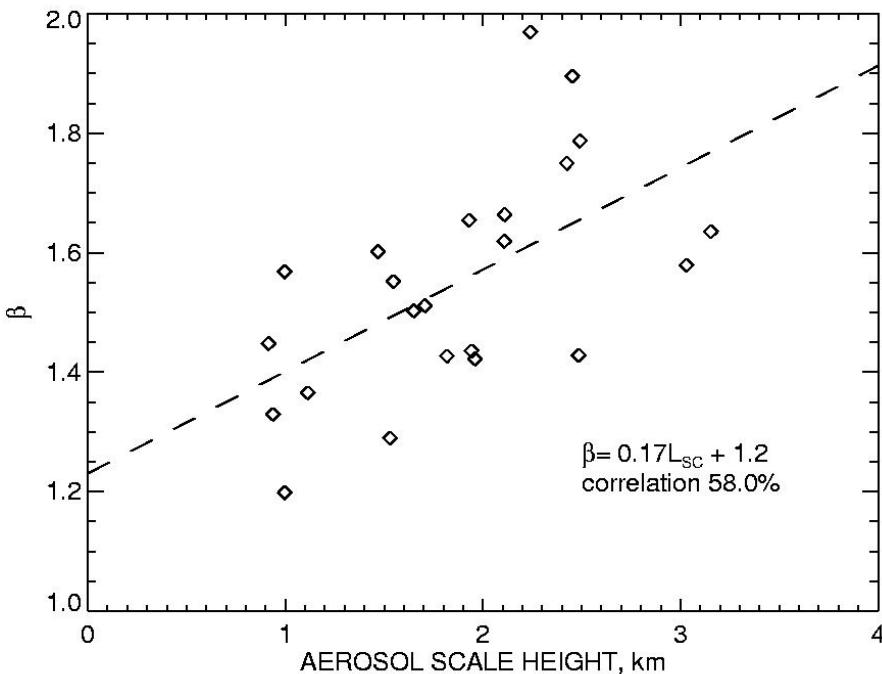


# $\beta$ vs. aerosol scale height



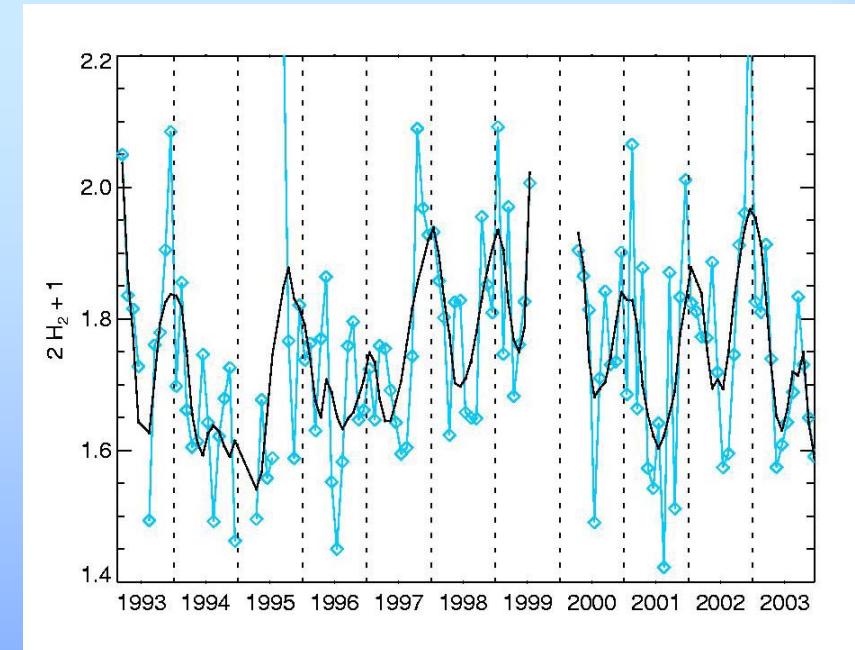
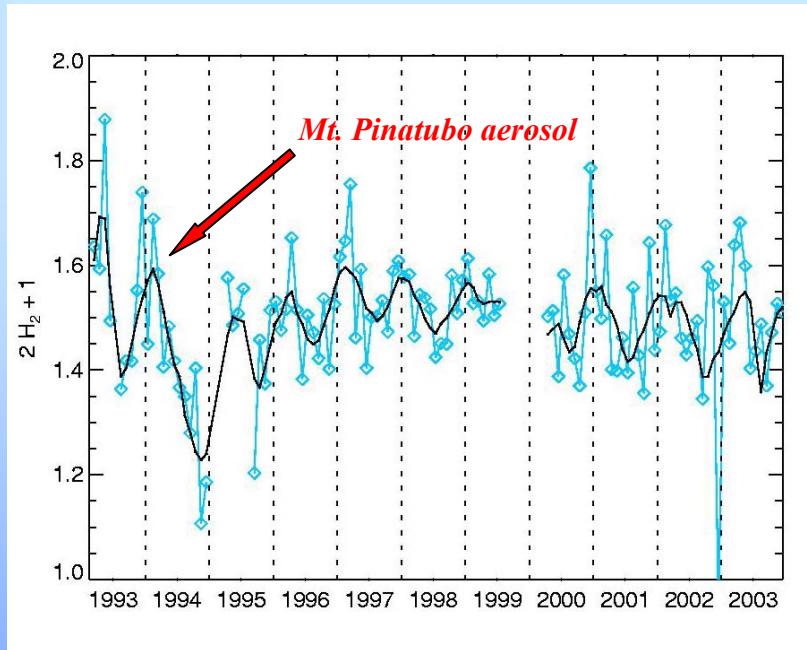


# Correlation between daily values of $\beta$ and aerosol scaling heights



# Variability in 1993-2003

Monthly mean scaling exponents  $2H_2+1$  for SGP CF (870 nm)



## Small-scale

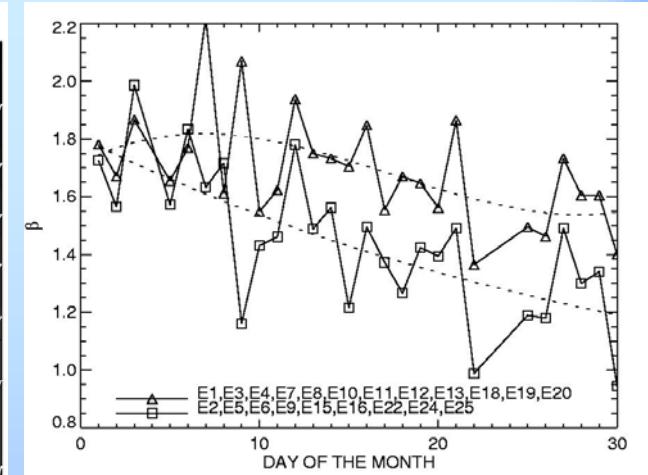
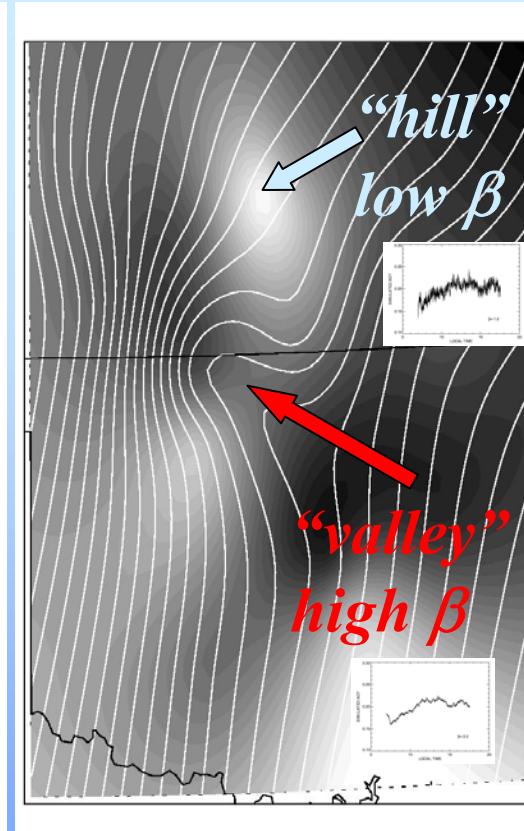
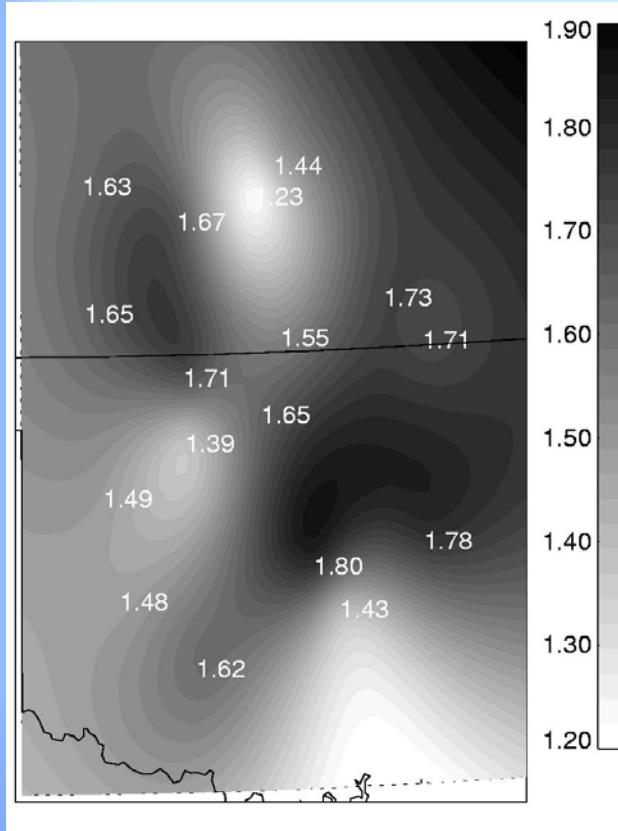
- strong trend in 1993-1994
- seasonal cycle with max in Spring or Winter

## Large-scale

- smaller inter-annual trend



# $\beta$ v.s. topography



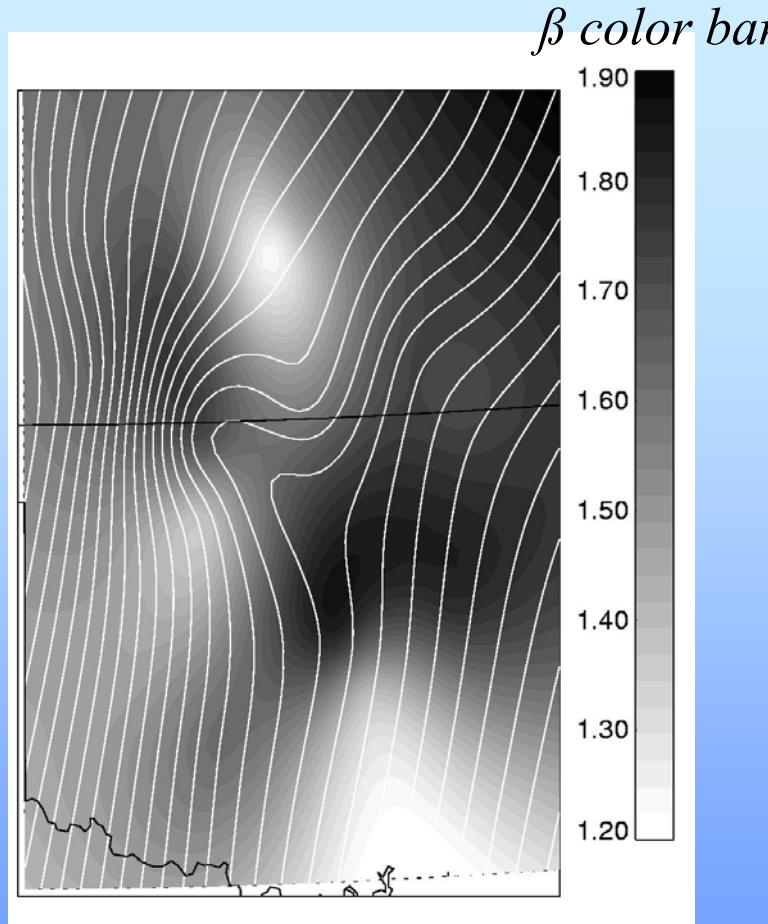
Temporal evolution of  $\beta$  in " $\beta > 1.6$ " and " $\beta < 1.6$ " groups during September 2000.

Mean values of  $\beta$  for SGP network sites in September 2000.

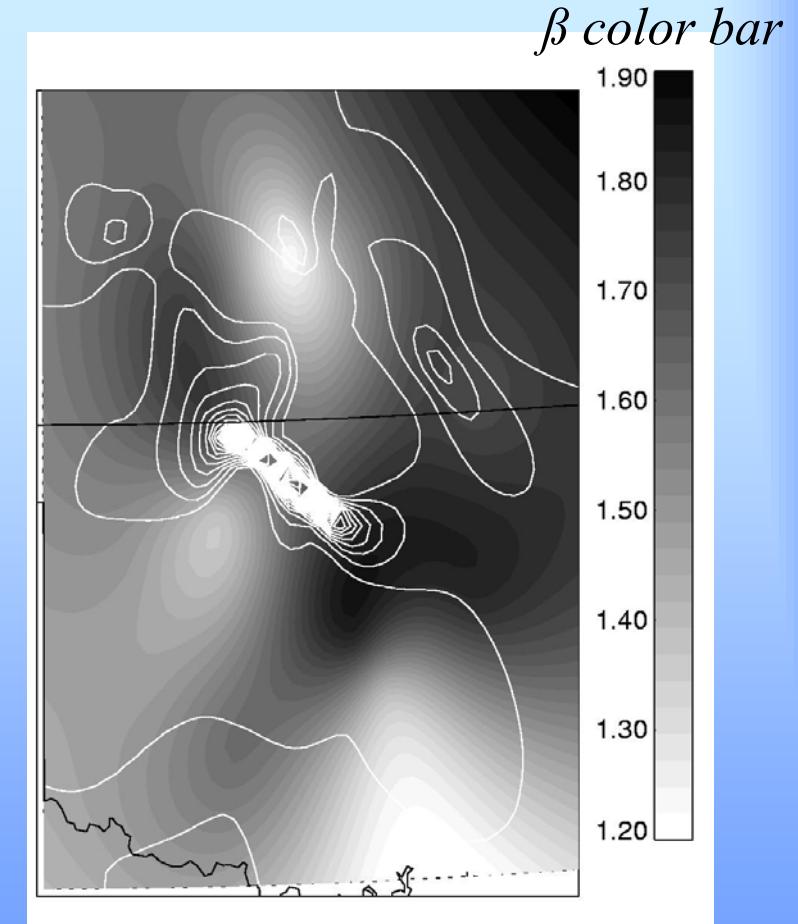
Same as left with altitude isolines over-plotted.



# $\beta$ v.s. topography



Altitude:  $h$

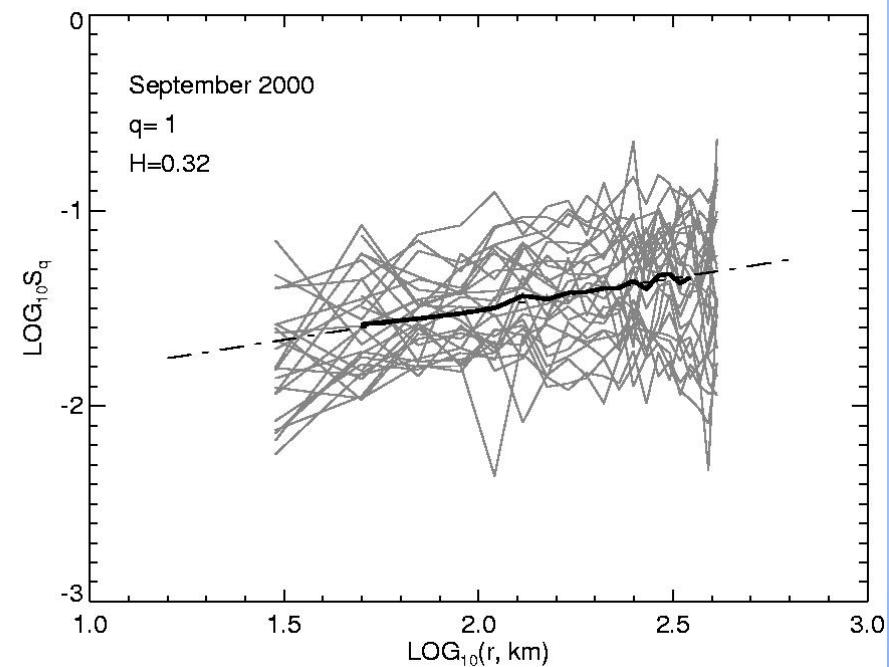
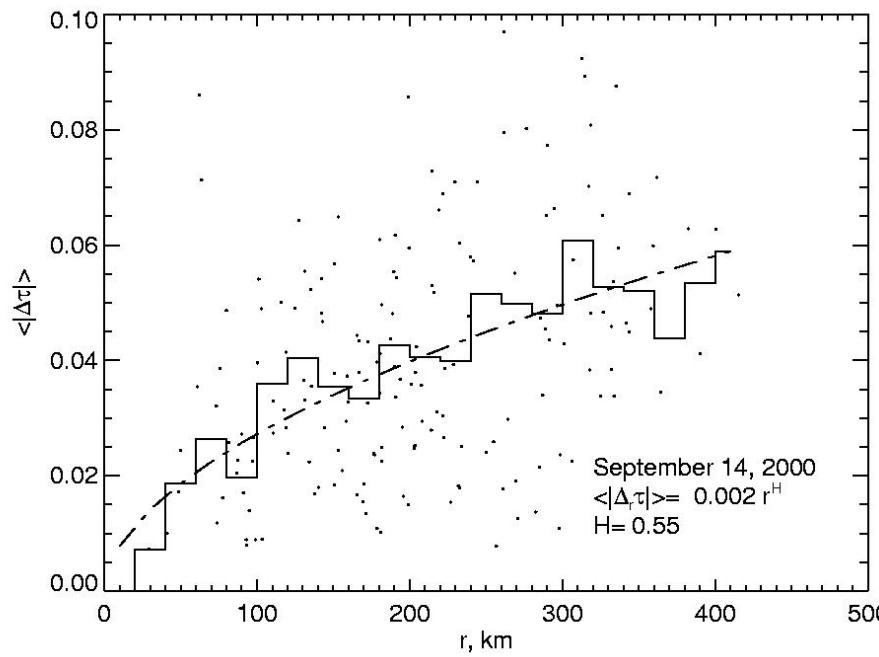


Curvature:  $K = \operatorname{div} \left( \frac{\nabla h}{\sqrt{1 + |\nabla h|^2}} \right)$



# Spatial structure functions

$$\Delta\tau = |\tau(r_1) - \tau(r_2)|, \quad r = \sqrt{(x_1 - x_2)^2 + (y_1 - y_2)^2}$$

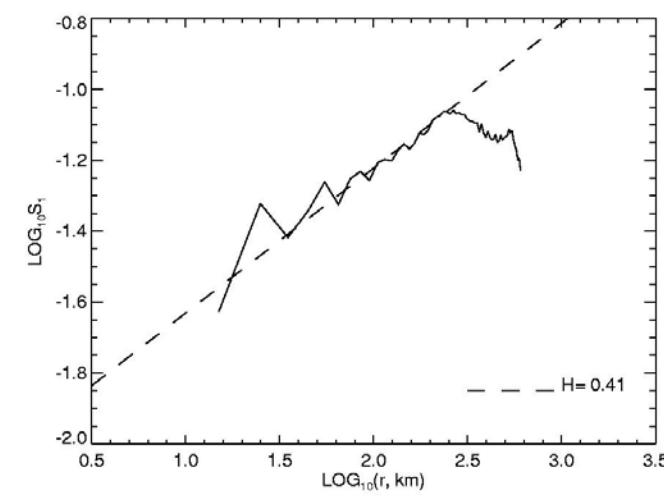
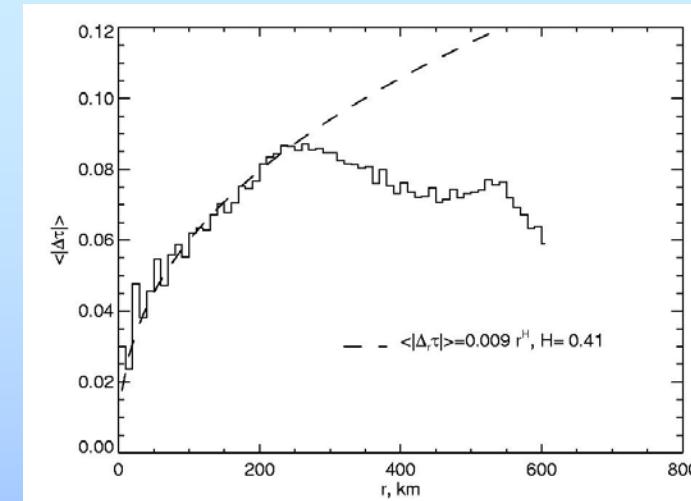
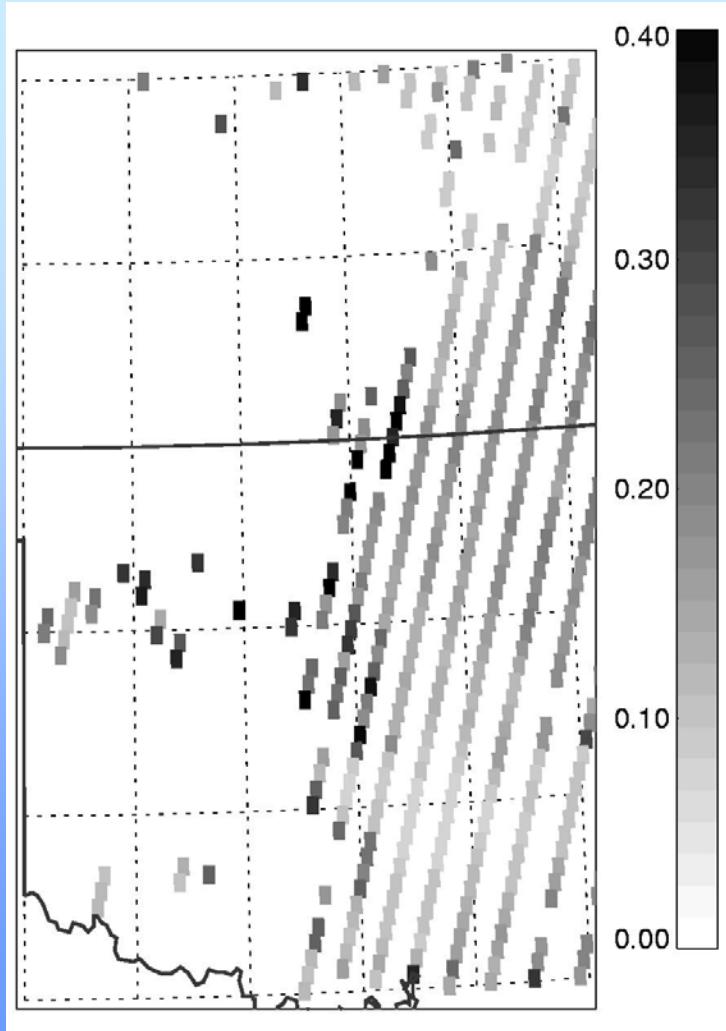


The first order spatial structure function for Sep. 14, (left: 19 sites, 171 pairs) and for all days in Sep. 2000 (right: 21 sites, 210 pairs, range: 30 – 415 km, spacing: 2.3 km mean, 18 km max).



# MODIS SF: SGP

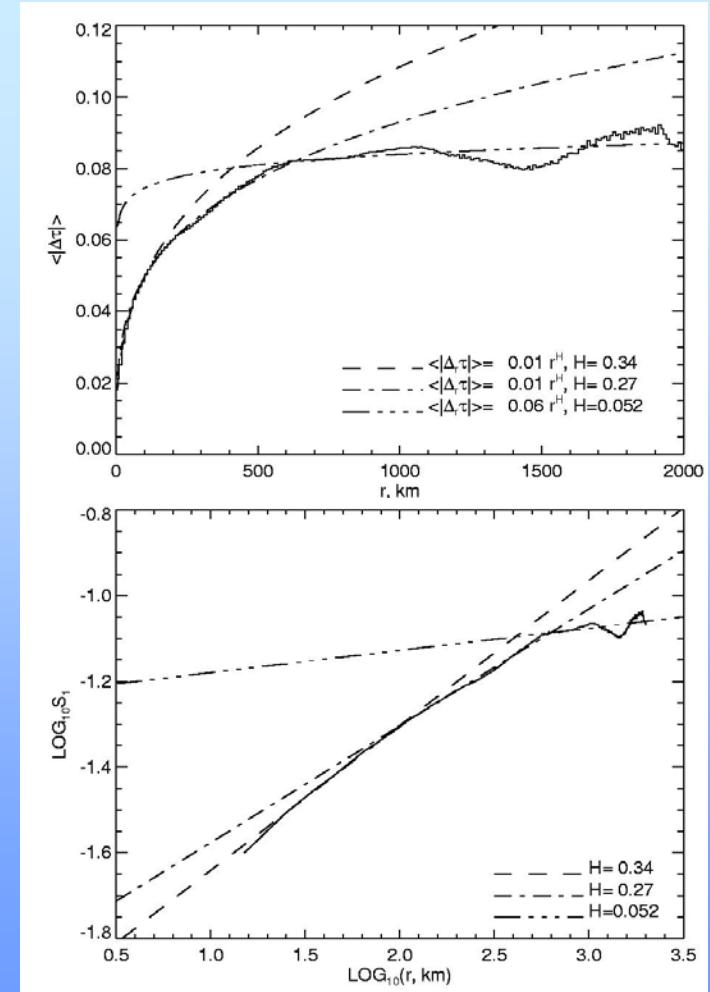
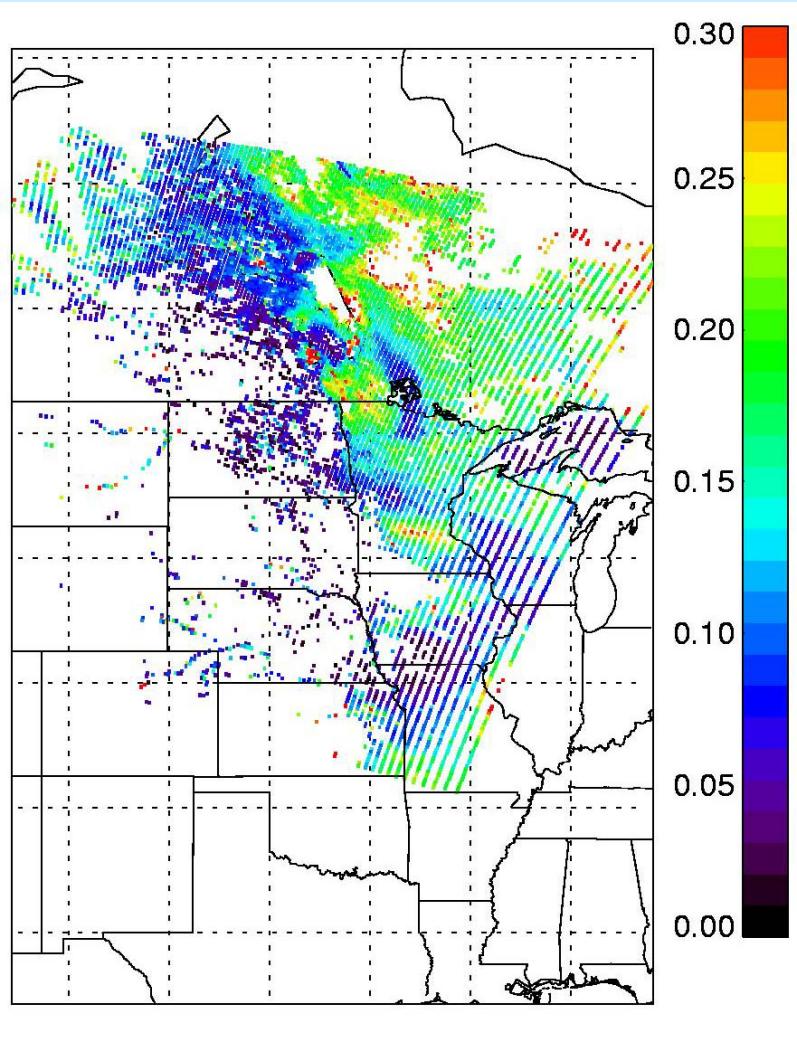
September 14, 2000, 508 pixels, 128,778 pairs





# MODIS SF: NE USA

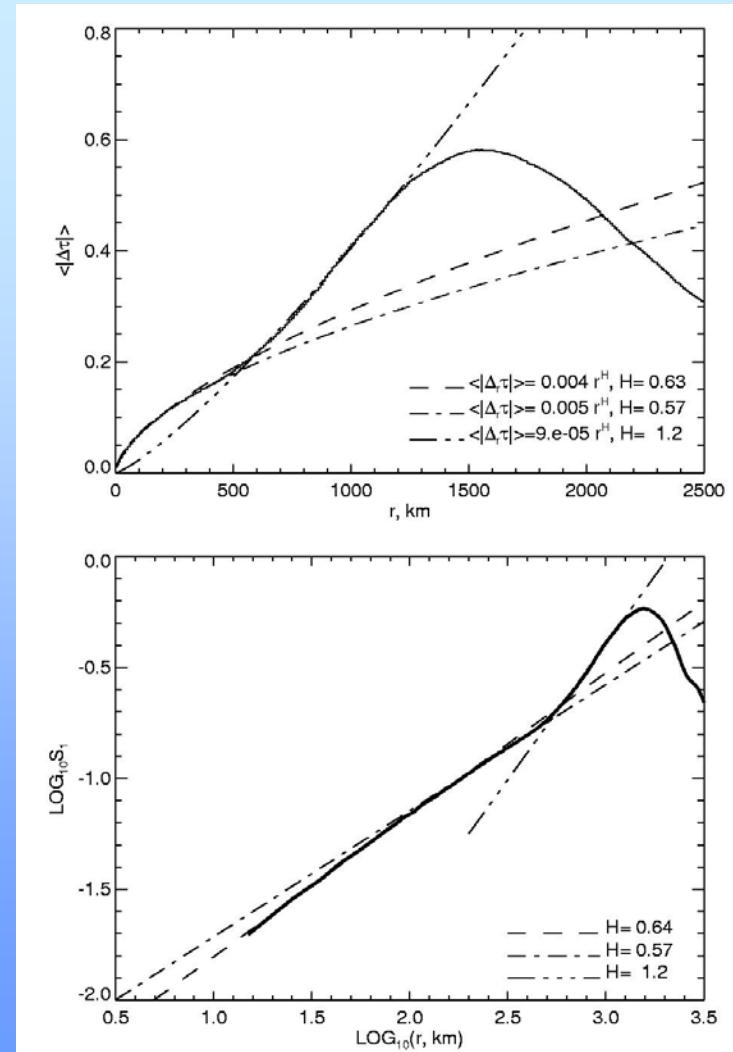
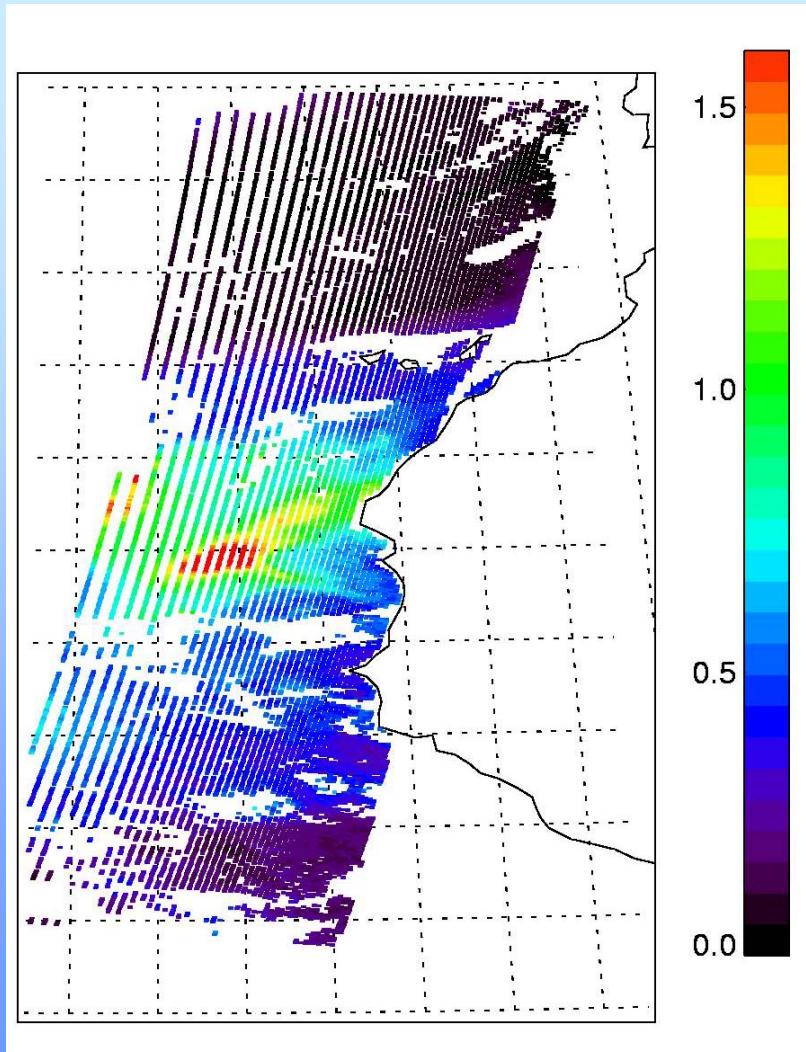
September 14, 2000; 9,292 pixels, 43,165,986 pairs





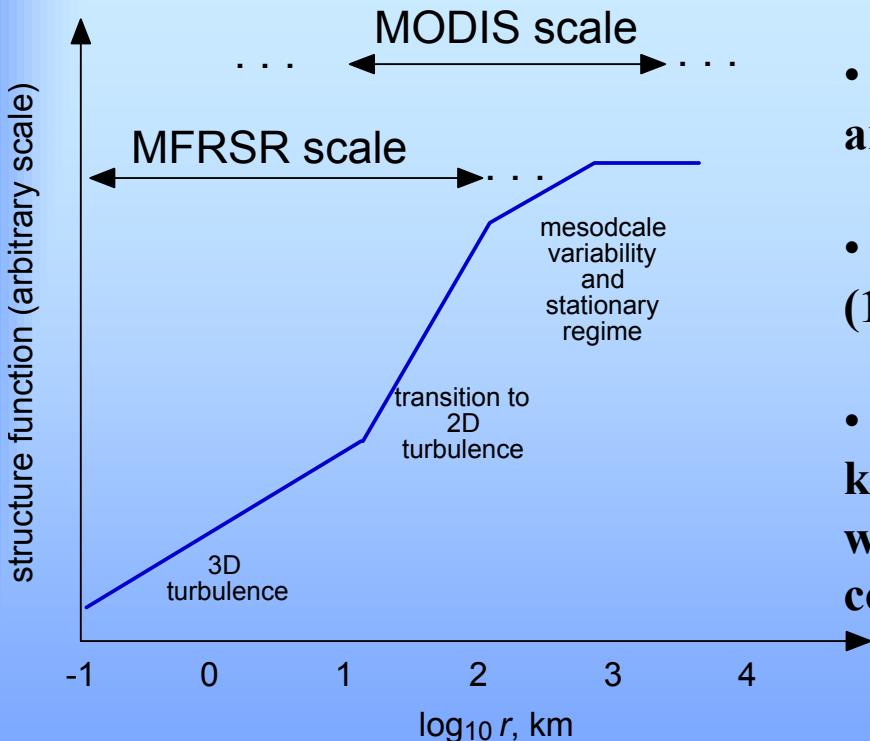
# MODIS SF: Sahara dust plume

June 4, 2001; 12,295 pixels, 75.5 million pairs





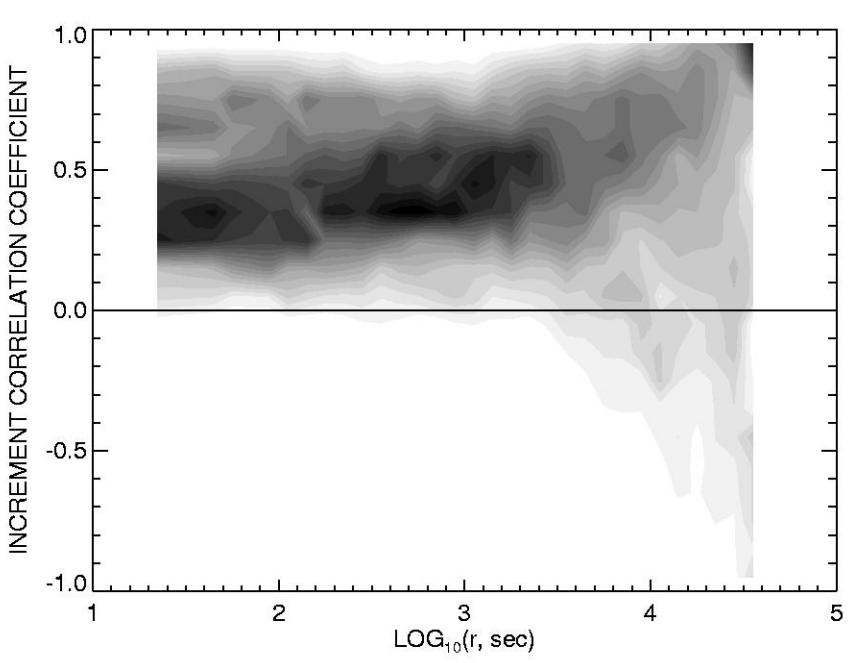
# AOT Scaling Regimes (preliminary results)



- microscale (0.5–15 km) where fluctuations are governed by 3D turbulence;
- transition towards large-scale 2D turbulence (15–100 km);
- mesoscale variability (scales up to 100–600 km and synoptic scales (after 600–1000 km) where AOT fields become stationary and loose correlation.



# AOT correlation with aerosol size (preliminary results)



Statistical distribution of the correlation coef.  $C_{uv}$  values obtained by analysis of 294 clear sky daily MFRSR records from Sept. 2000.

A multivariate structure function  $S_{uv}$  and a scale-dependent correlation coef.  $C_{uv}$  of two fields  $u(x)$  and  $v(x)$  ( $x$  is time, or space):

$$S_{uv}(r) = \overline{[u(x+r) - u(x)][v(x+r) - v(x)]}$$
$$C_{uv}(r) = \frac{S_{uv}(r)}{\sqrt{S_{uu}(r)S_{vv}(r)}}$$

**Scales up to 6 hours ( $\sim 100$  km):**  
positive correlation - AOT variation is dominated by **hygroscopic growth**.

**Larger scales:**  
correlation starts to change sign - AOT variation is influenced by fine mode **aerosol concentrations**.



# Conclusions

- ***Scale invariance is a fundamental property of atmospheric aerosol datasets.***
- ***Variability in a large scale range is characterized by 1 or 2 parameters complementary to Gaussian statistics.***
- ***AOT scaling reflects mixed layer meteorology and aerosol processes (transport, hygroscopic growth)***