



# Filling the resolution gap between global models and applications: dynamical and/or stochastic downscaling

Miguel Nogueira

Instituto Dom Luiz, Faculdade de Ciências, Universidade de Lisboa

# Overview

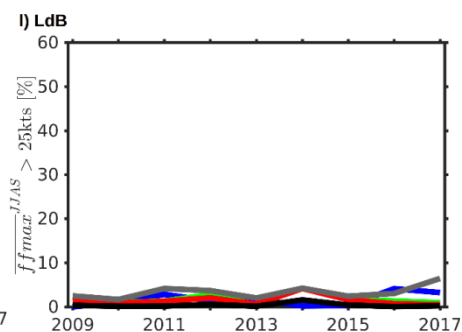
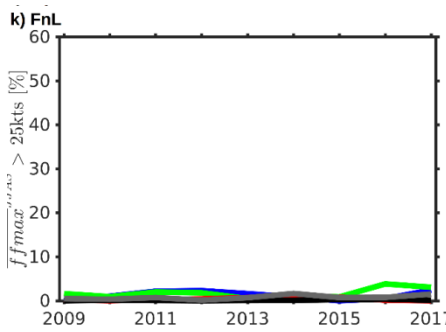
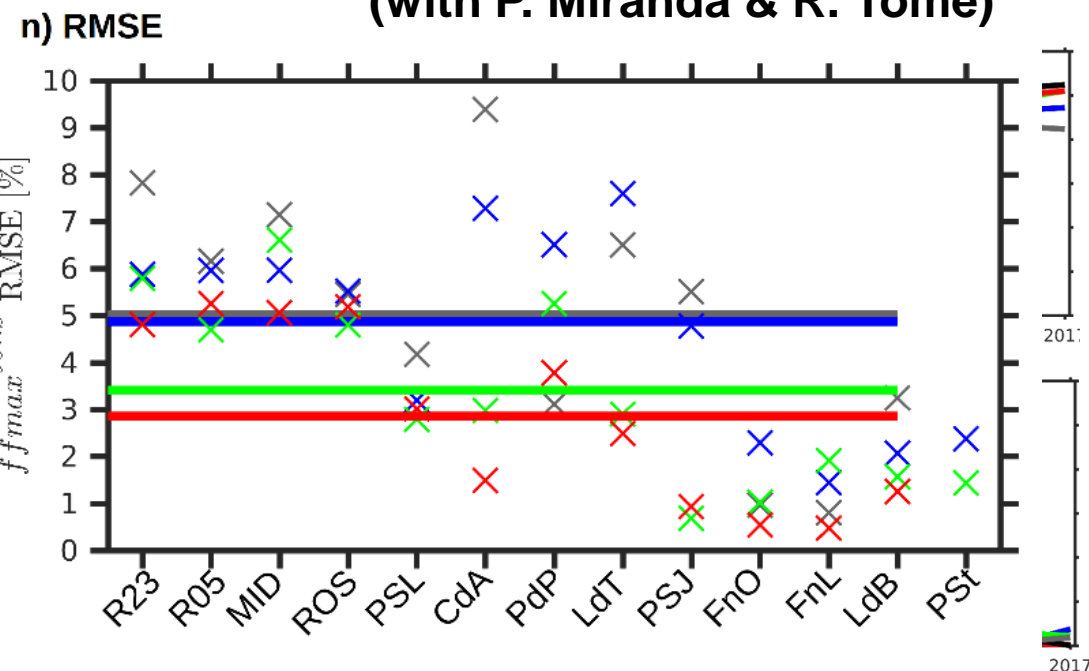
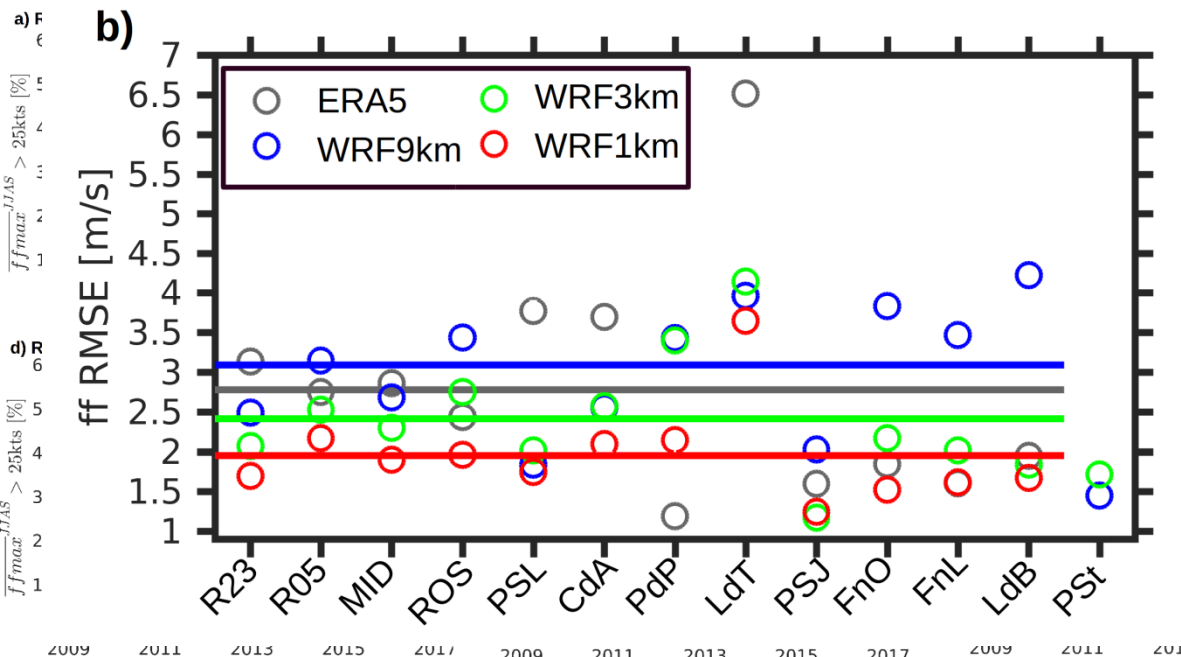
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- Atmospheric fields display complex variability over vast range of scales (space & time)
- Global models have insufficient resolution for many weather & climate applications
- Does increasing model resolution solve all problems (panacea) or adds spurious information (illusion)?
- How accurate are high-resolution simulation in simulating small-scale variability?
- How much does dynamical downscaling depends on large-scale forcing?
- How can we optimize predictions with stochastic methods?

# Dynamical Downscaling in Madeira Island

## MADEIRA ISLAND WIND (2009-2017): ERA-5 (GLOBAL, 0.25°) → WRF (REGIONAL) (with P. Miranda & R. Tomé)

PROBABILITY GUST > 25kt in JJAS

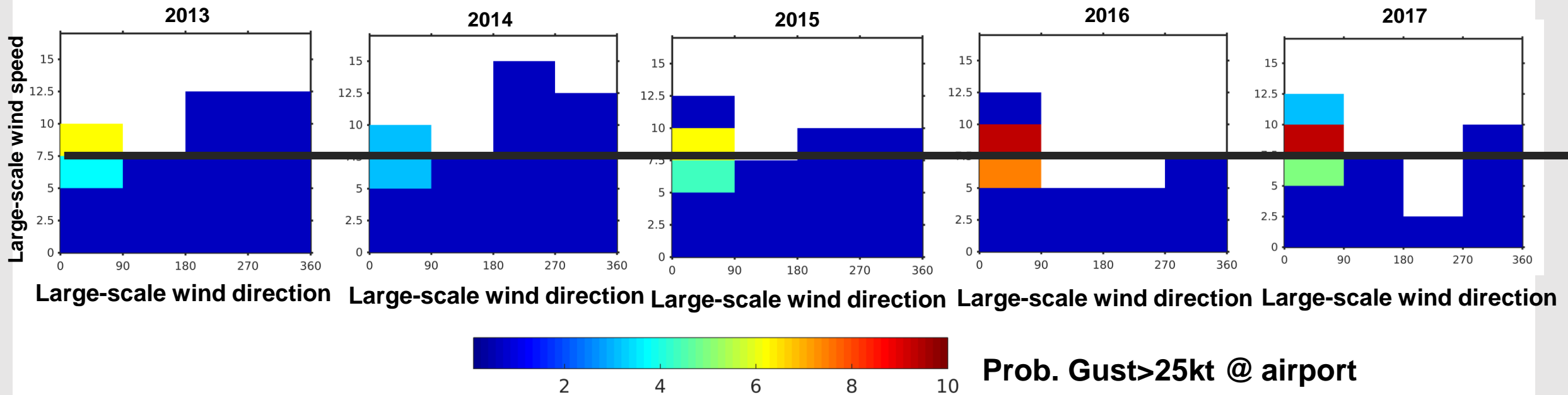


- Obs
- ERA-5
- WRF9km
- WRF3km
- WRF1km

**ERA-5 has relevant information  
9km is insufficient  
3km & 1km have significant added value  
...and can explain the observed behavior**

# Local-to-large-scale links

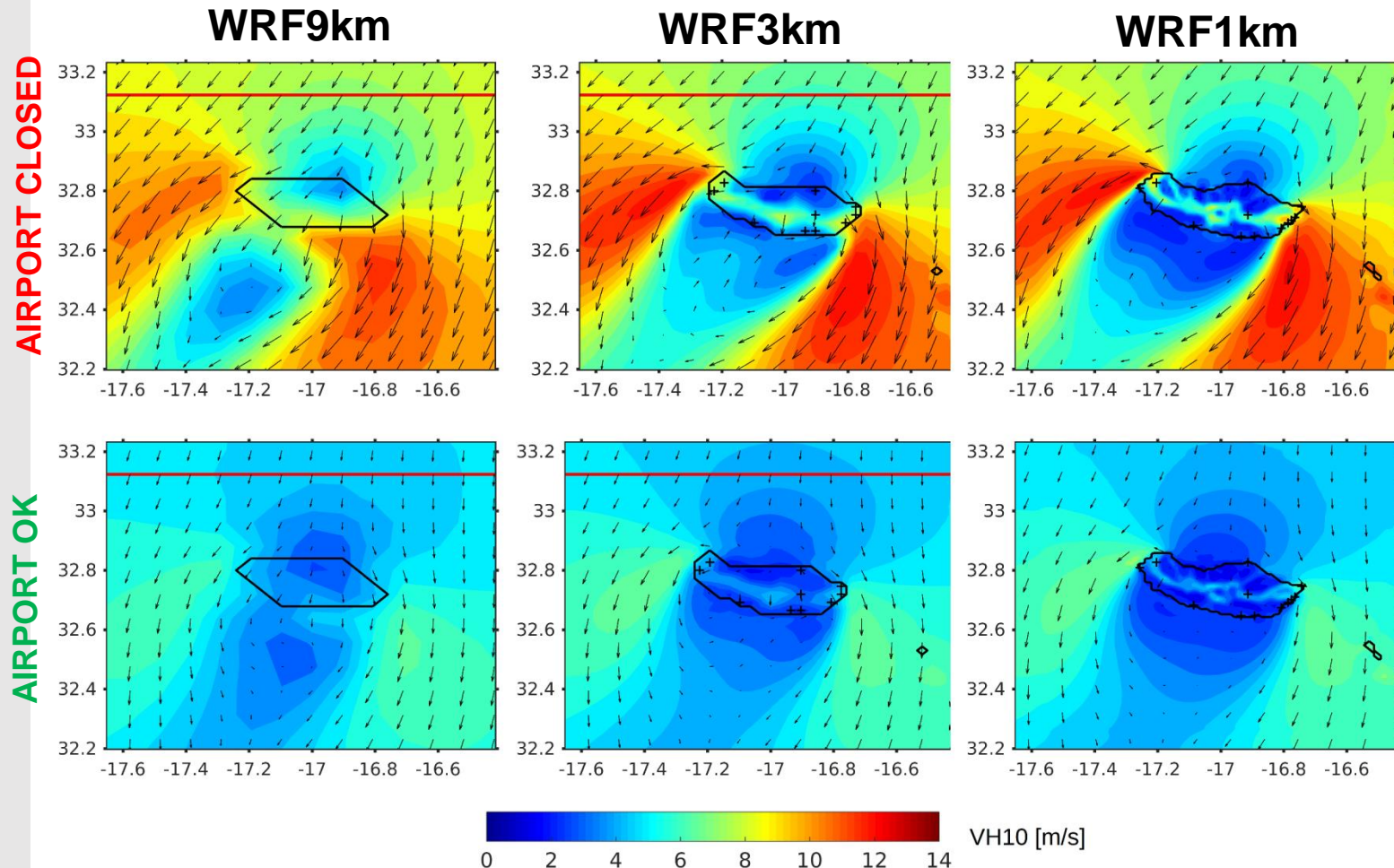
## PROBABILITY OF JJAS GUST>25kt CONDITIONAL ON LARGE-SCALE FLOW



- Local changes to gust frequency are tightly linked to changes in large-scale flow;
- Increased freq. of strong northeasterly wind => increased freq. of airport closed;
- Information is on large-scale (ERA-5)
- But internal variability or trend? Study requires long high-resolution simulation...
- ... accurate projections requires high-resolution ensemble...

# Dynamical Downscaling in Madeira Island

## LARGE-TO-SMALL SCALE TRANSFER FUNCTION:



**ECMWF (Det.+Ens) large-scale**

**Large-to-small scale transfer:**

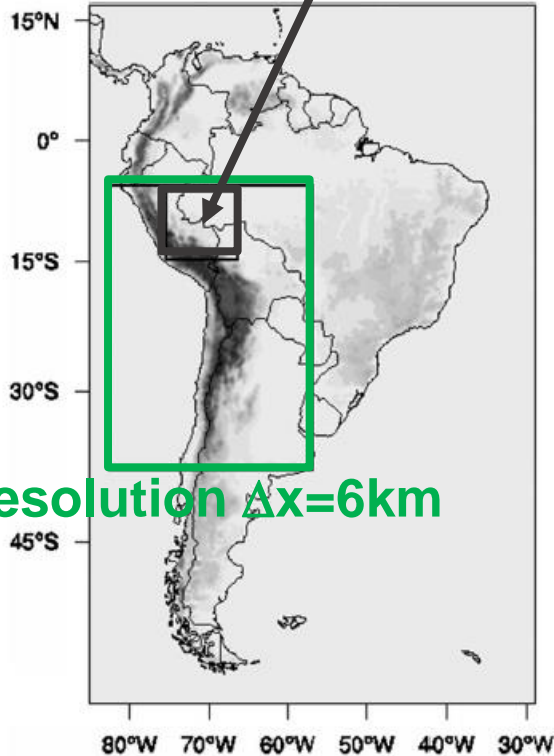
- Dynamical downscaling
- Stochastic downscaling
- Combine to get EPS

**SST interaction (J. Alves)**

**Vertical structure of turbulence  
(OBSERVATIONS!!!!!!)**

# The Grid vs Effective Resolution Increases

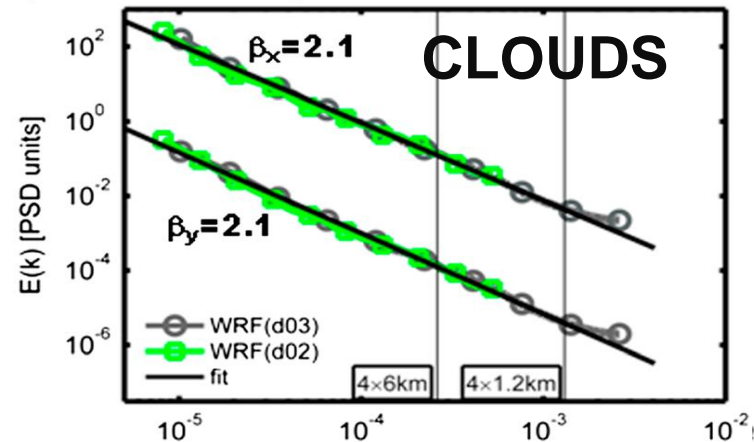
Resolution  $\Delta x = 1.2\text{km}$



Resolution  $\Delta x = 6\text{km}$

Nogueira & Barros (2014, JGR Atmos.)

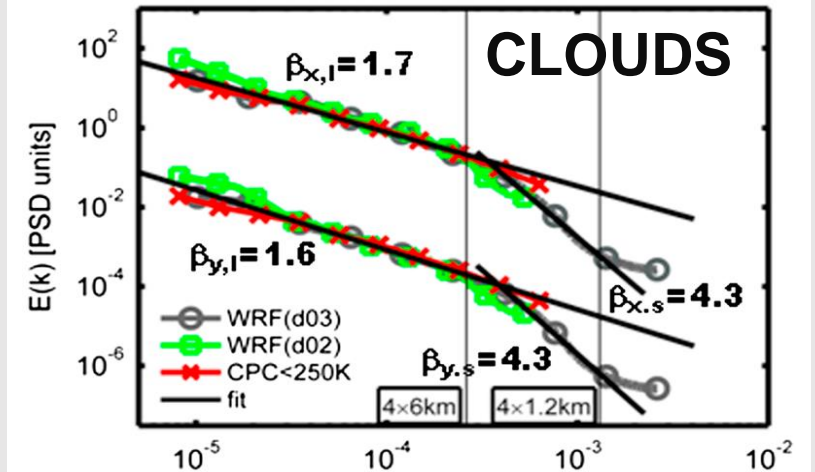
## STRATIFORM CASE



Effective Res.  $< 2\Delta x$

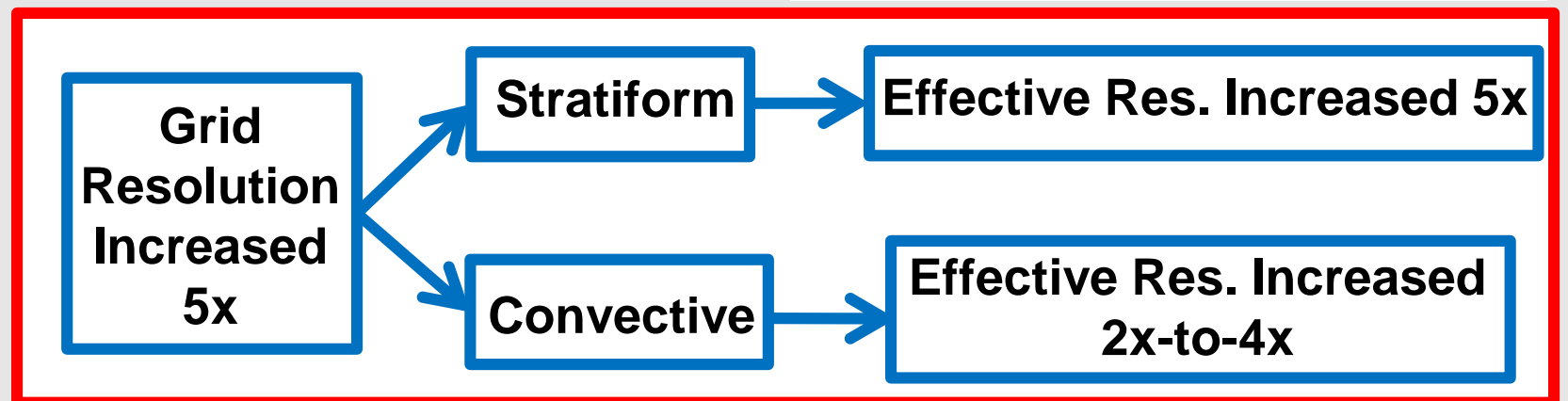
Effective Res.  $\approx 2\Delta x$

## CONVECTIVE CASES



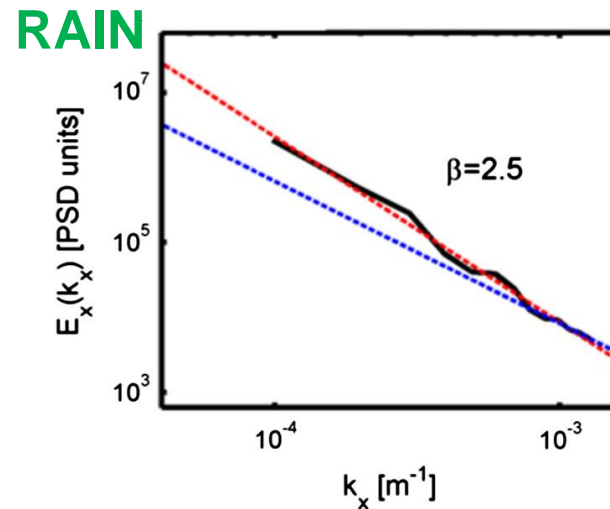
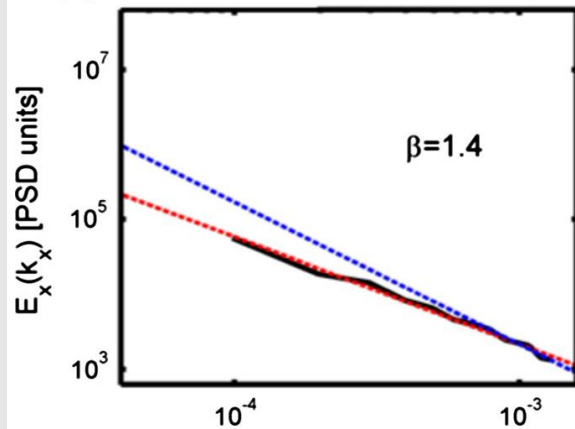
Effective Res.  $\approx 4-5\Delta x$

Effective Res.  $\approx 6-12\Delta x$



# Stochastic Fractal Symmetries Across Scales

## SCALE-INVARIANT SYMMETRIES ARE UBIQUITOUS IN THE ATMOSPHERE

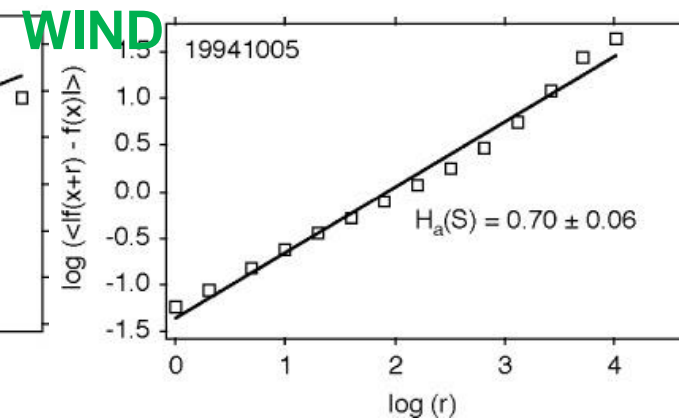
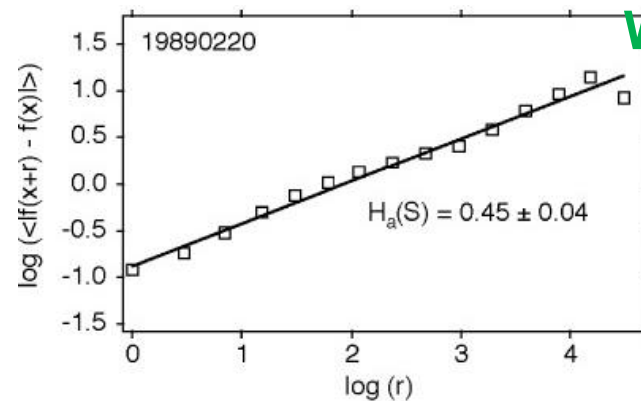
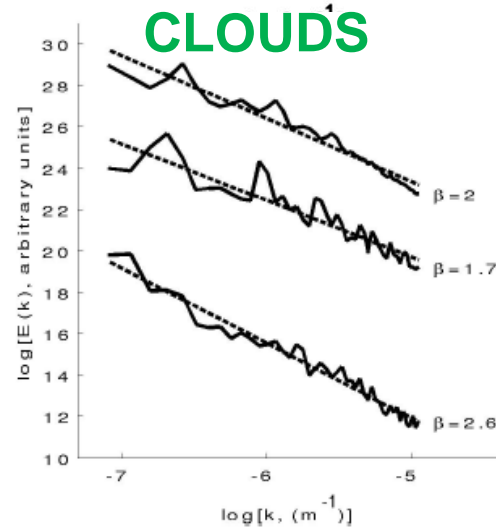


Scale-invariance in wind, rain, clouds, etc.

$$\Delta f(l) = \varphi_1^n l^H.$$

The scaling coefficients are transient...  
Namely convective/stratiform transition

Nogueira & Barros (2015, J. Hydrology)  
Nogueira (2017a, JGR Atmos)  
Nogueira (2017b, PIOS One)



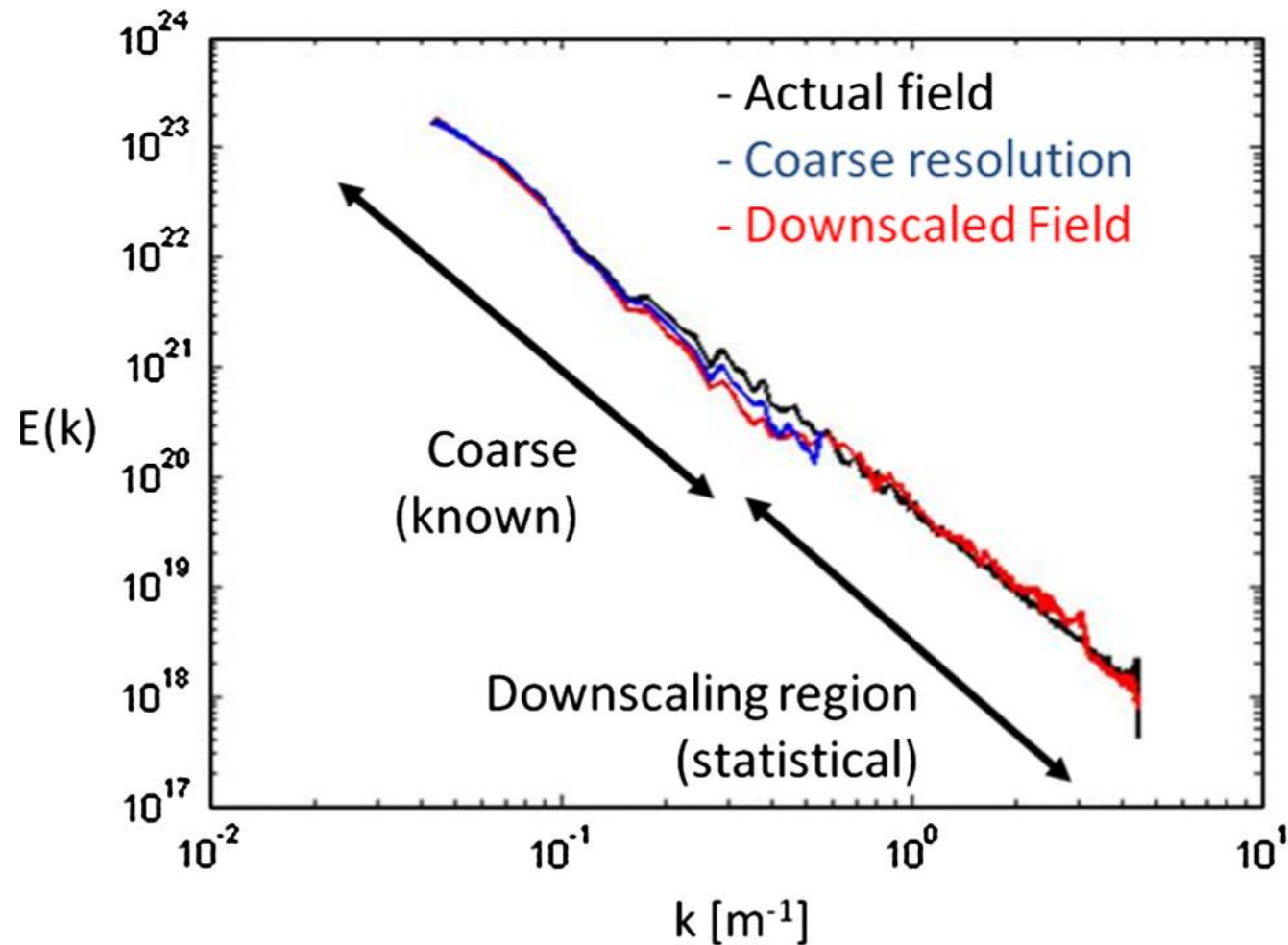
Related to information introduced at different scales (Nogueira, 2017b):

$$H(X) = -\sum_{x_i \in \Theta} p(x_i) \log p(x_i)$$

# Stochastic Fractal Downscaling

## fDws methodology

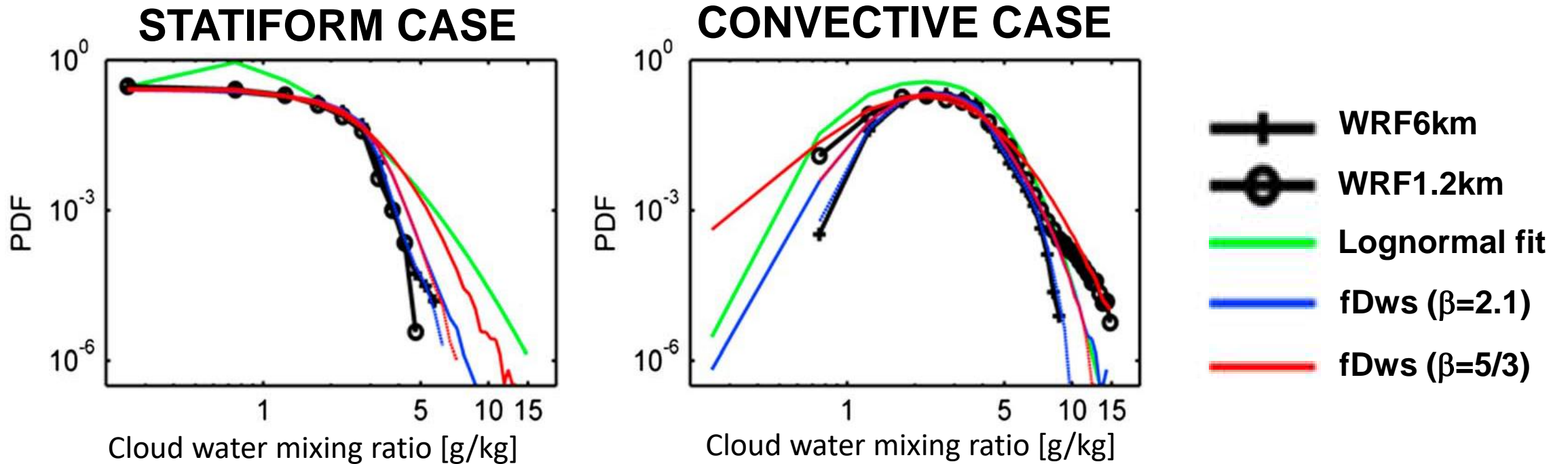
Nogueira & Barros (2014, JGR Atmos.)  
Nogueira (2018, Earth System Dynamics)





# Spatial Stochastic Fractal Downscaling of Clouds

PDFs STOCHASTIC DOWNSCALING  $\leftrightarrow$  PDFs DYNAMICAL DOWNSCALING



# Temporal Fractal Downscaling of Rain: Predictors

## Employ Detrended Cross-Correlation Analysis to find key PREDICTORS

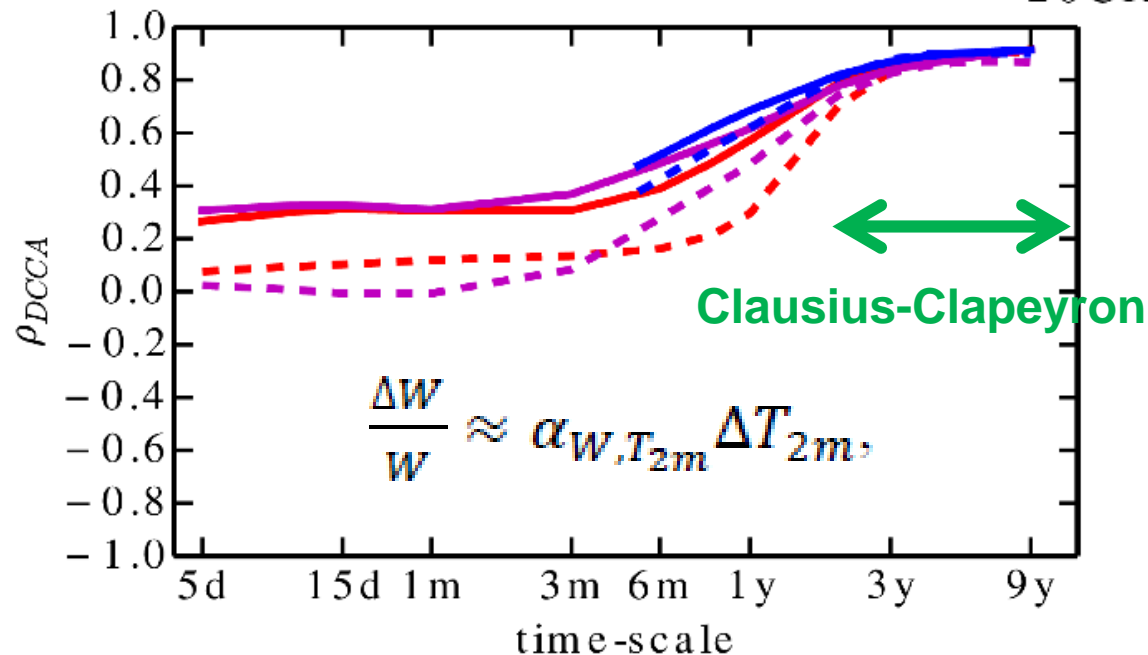
$$f_{R,R'}^2(n, i) = \frac{1}{n+1} \sum_{k=i}^{i+n} [(R_v - \widetilde{R}_v)(R_v' - \widetilde{R}_v')],$$

— ERA-20C

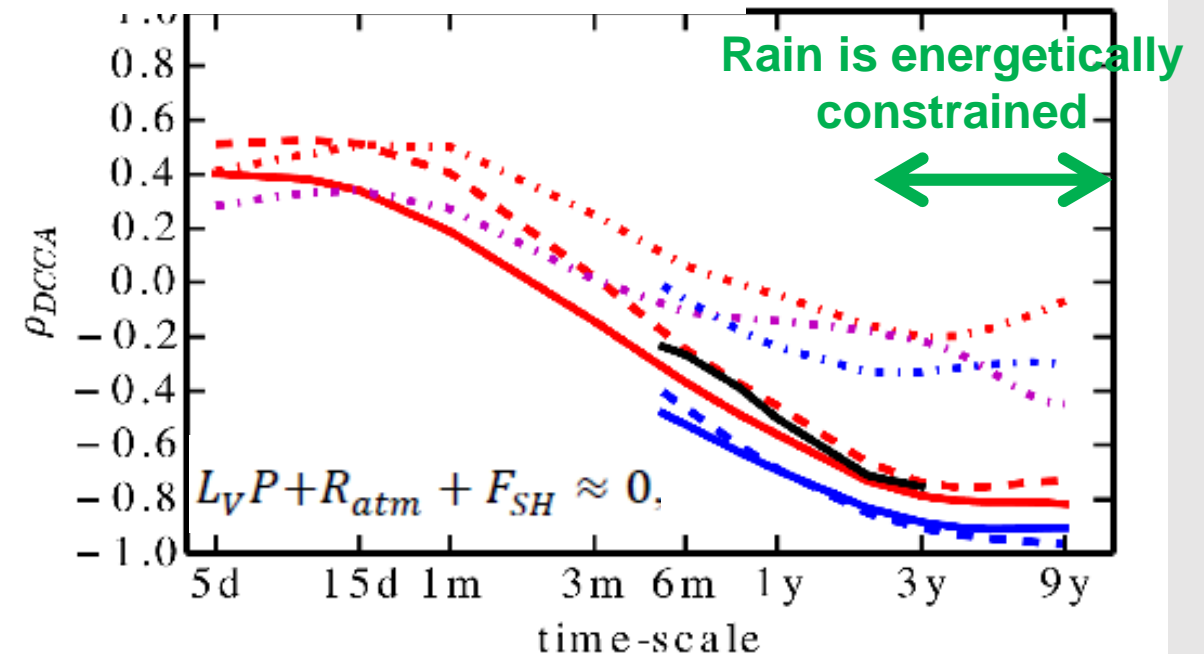
— 20CR

— ERA-20CM

— Observations



a) Precipitable water vapor vs  $T_{2m}$  (solid);  
Precipitable water vapor vs SST (dashed)

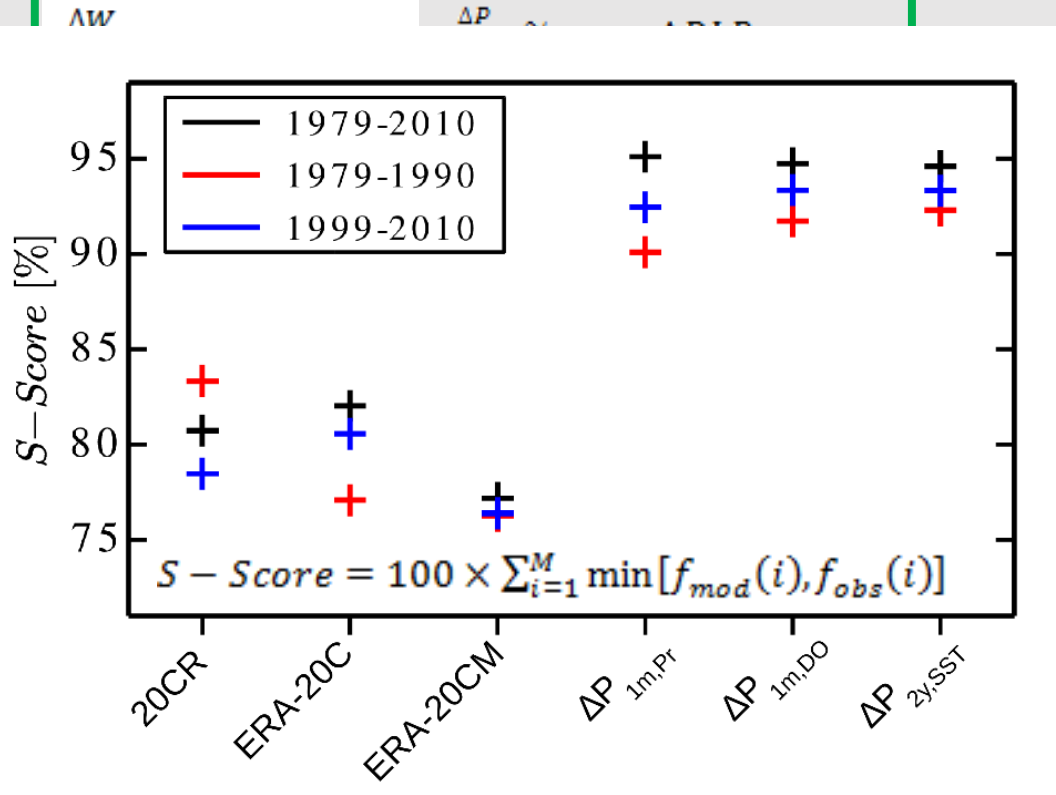


b) Rain vs  $R_{ATM}$  (solid); Rain vs DLR (dashed);  
Rain vs  $SH_{flux}$  (dot-dashed)

Nogueira (2018, Clim. Dyn) & Nogueira (2018, Earth. Syst. Dyn)

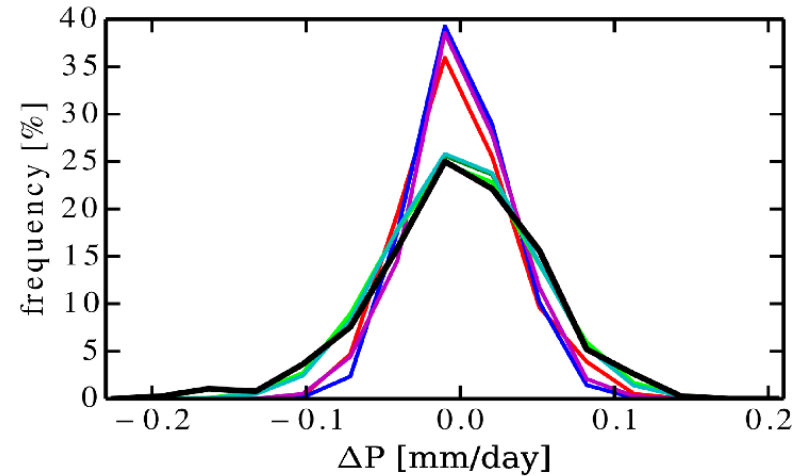
# Temporal Fractal Downscaling of Rain: Application

COMPUTE 3-YEAR VARIABILITY FROM ENERGETIC CONSTRAINTS AND CLAUSIUS-CLAPEYRON



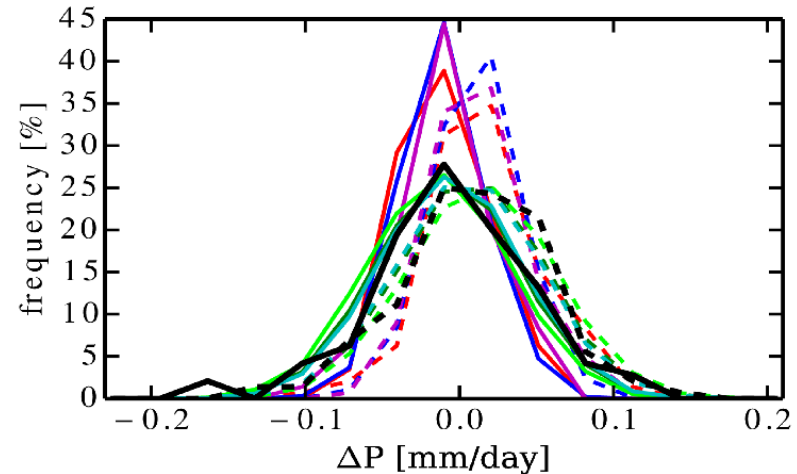
Nogueira (2018, Earth Syst. Dyn.)

a) PDF for 1979-2010 (solid)



- ERA-20C
- ERA-20CM
- 20CR
- Observations
- Fractal

b) PDF for 1979-1990 (solid) & 1999-2010 (dashed)



# SUMMARY & THE WAY AHEAD

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- **Dynamical downscaling is a key tool for weather and climate;**
- **But very high (~km) resolutions are often required;**
- **Stochastic methods can increase resolution at low computational cost;**
- **Stochastic methods can calibrate the comprehensive simulations (which have intrinsic model limitations and high-resolution);**
- **Fractal downscaling can do both; can be combined with other methods (e.g. copulas)**

## **Next:**

- **Combine stochastic downscaling with dynamical for Madeira, Azores & Extreme events over Portugal= hybrid dynamical/stochastic EPS;**
- **Extend the DCCA predictor analysis in these studies;**
- **Systematic (Offline) Coupling to CMIP6, CORDEX**
- **FOCUS 1: Quantify risk of extremes (Weather & Climate);**
- **FOCUS 2: Madeira & Azores Islands – high-resolution ensemble data**