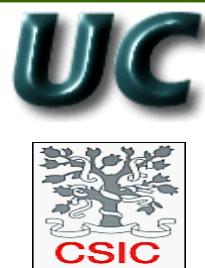


# Downscaling Seasonal Precipitation in Perú using clustering techniques *(self-organizing maps SOM)*



José M. Gutiérrez  
Antonio S. Cofiño  
Carmen Sordo  
**CSIC / Univ. de Cantabria, SPAIN**



Rafael Cano  
Cristina Primo  
**Ins. Nac. de Meteorología, SPAIN**

Thanks to (collaborators):

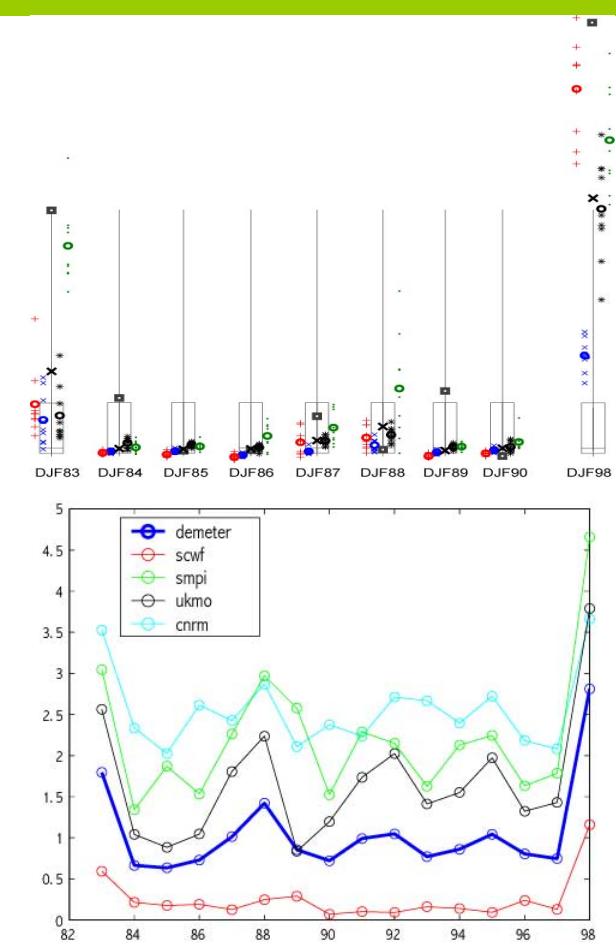


**PERÚ**

AI  
met  
group

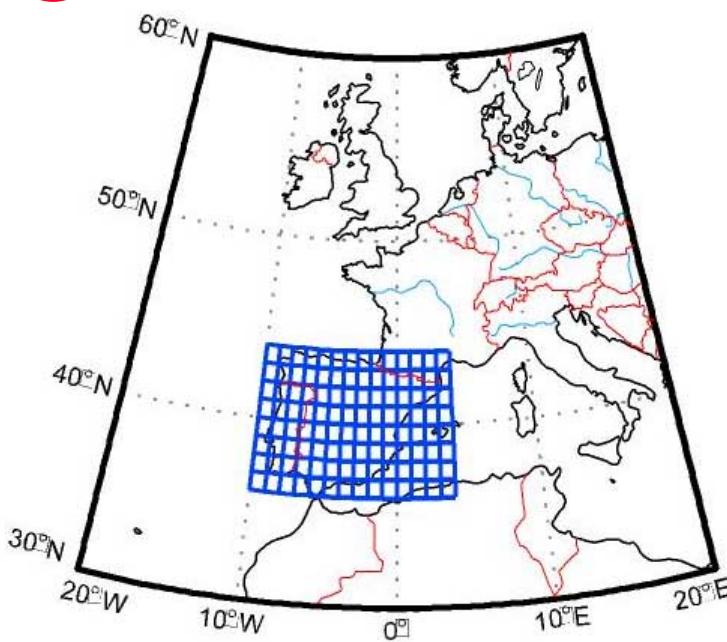
National Service of  
Meteorology and Hidrology

National Geophysical  
Institute



## REMINDER: The SOM Clustering Model

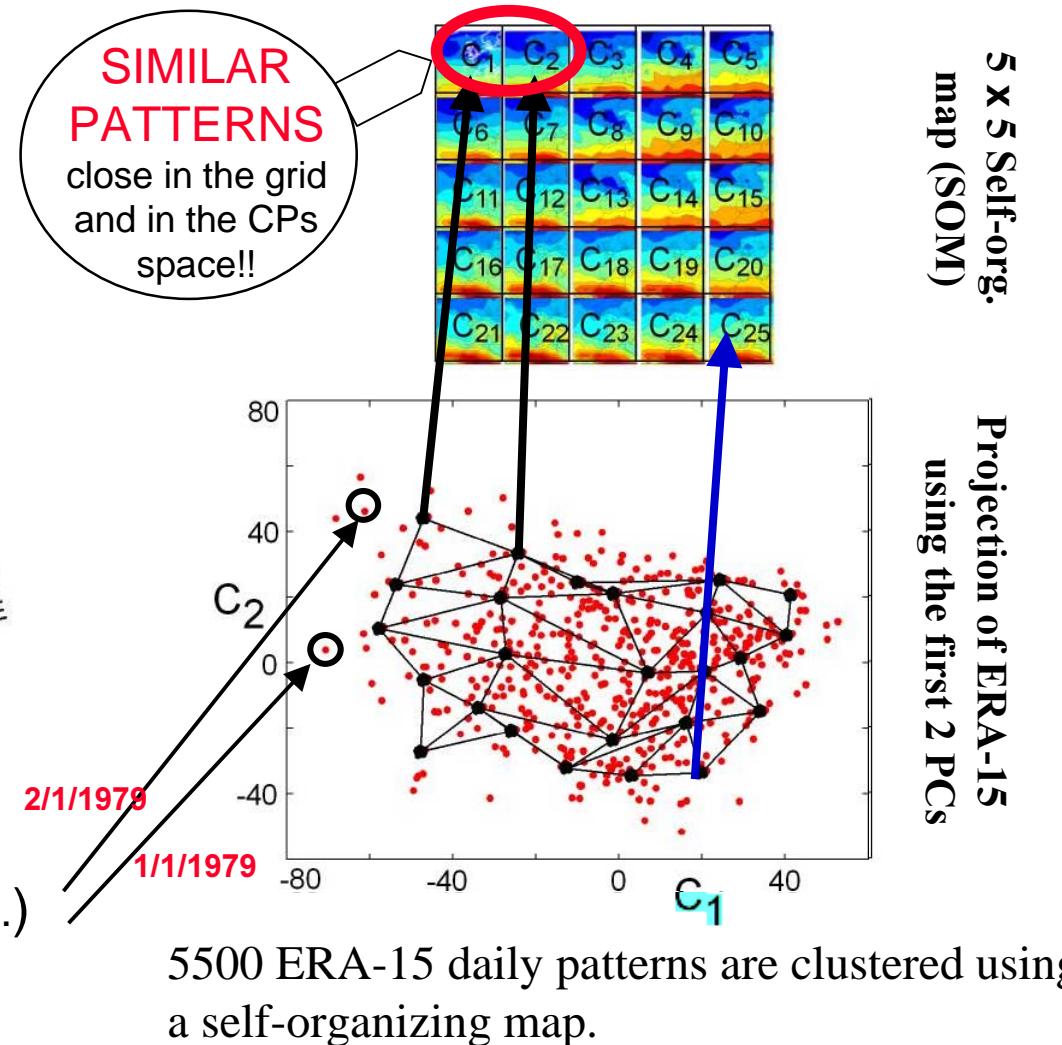
- Perú (Piura, Mantaro)
- Iberian Peninsula



Atmospheric daily circulation:

$$\vec{ac} = (T(1000 \text{ mb}), T(850 \text{ mb}), \dots, Z, H, \dots)$$

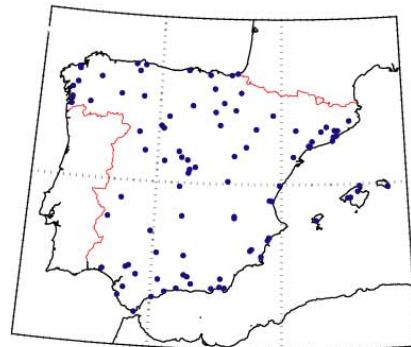
Dimension reduction: EOFs  
100 dimensions are kept.



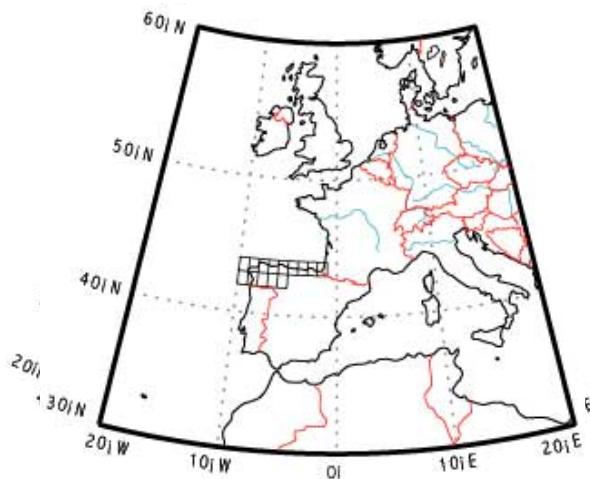
## Clustering Downscaling Model vs Standard Analog

### Short-range daily forecast :

- ✓ lead time  $D+1$
- ✓ 100 stations in Spain
- ✓ 730 days (1997-1998)

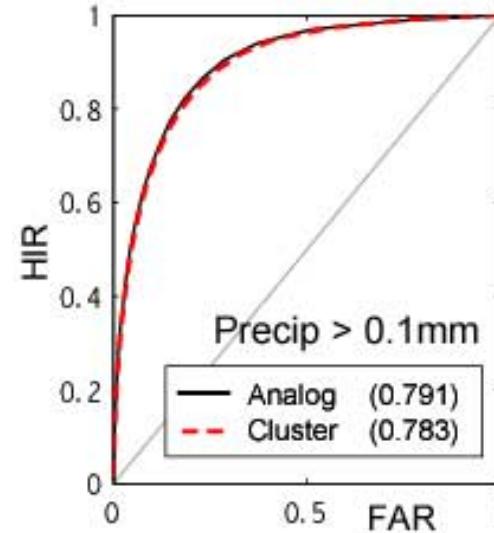


48DnSystop precipitter(07.1122), 24Z

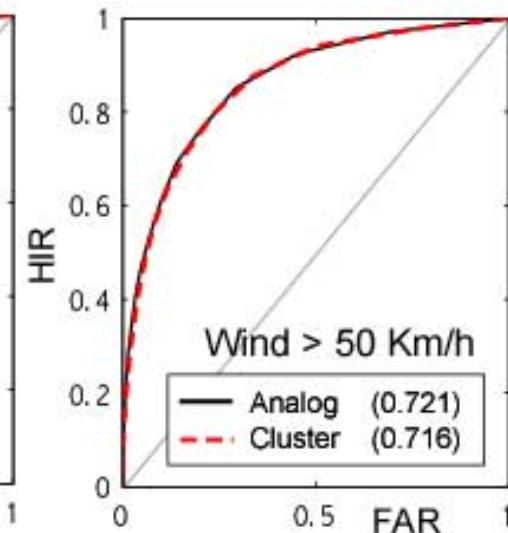


AI  
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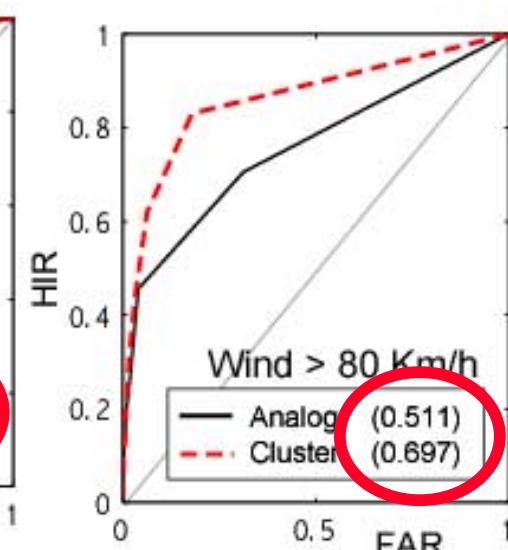
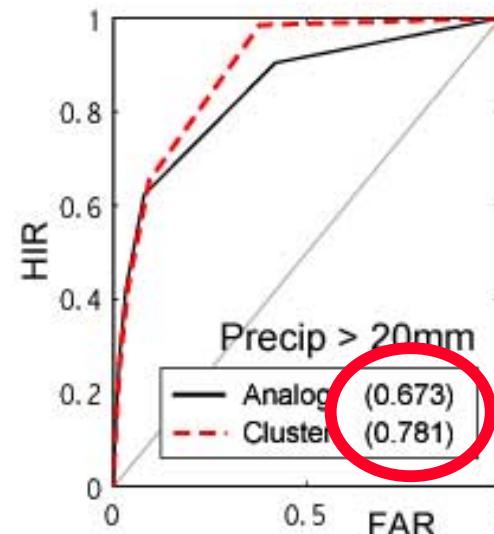
### Rainfall



### Max. wind



Normal event

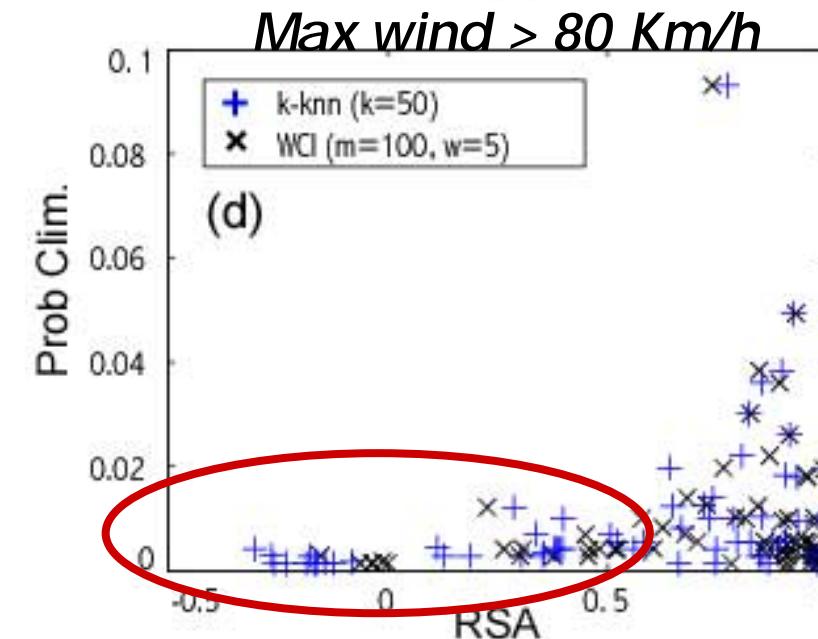
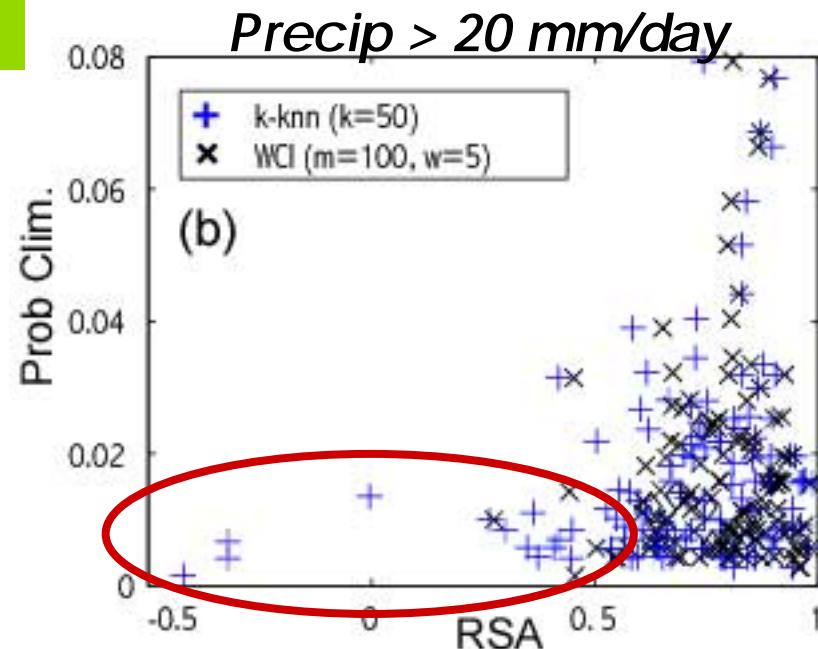


Tail event

## Individual Skill of Stations

*The clustering method clearly outperforms the standard analog method in those stations with lower climatic frequency for the event.*

J.M. Gutiérrez, A.S. Cofiño, R. Cano, and M.A. Rodríguez, "Clustering Methods for Statistical Downscaling in Short-Range Weather Forecast", **Monthly Weather Review**, to appear (2004).

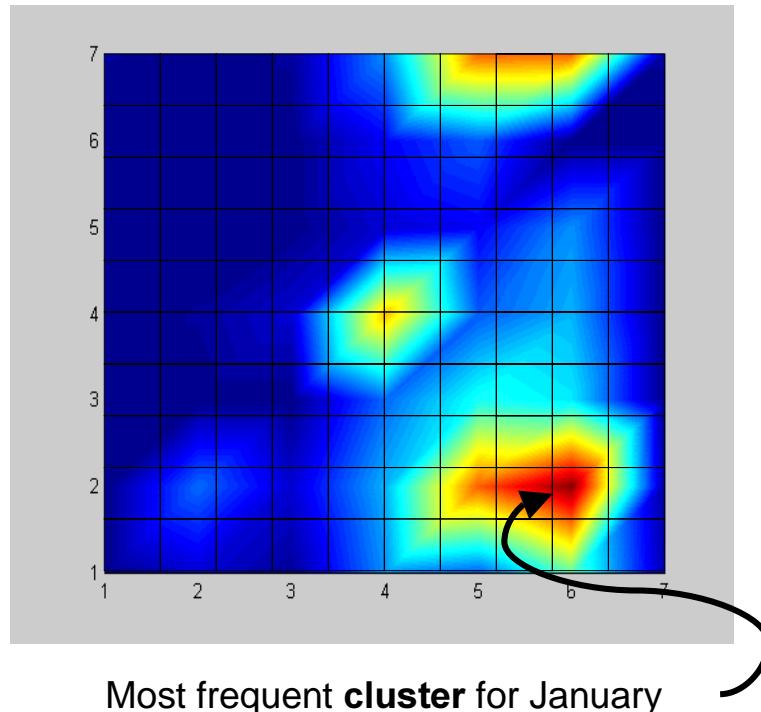


## Clustering Downscaling. Seasonal Forecast.

For a given month, the daily ERA-15 patterns define a "regular" density on the SOM grid (the frequency of points falling in each of the clusters).

For instance for January (1979-1993), we get a climatological SOM density:

12 / 1 / 1979  
12 / 2 / 1979  
...  
12 / 31 / 1993



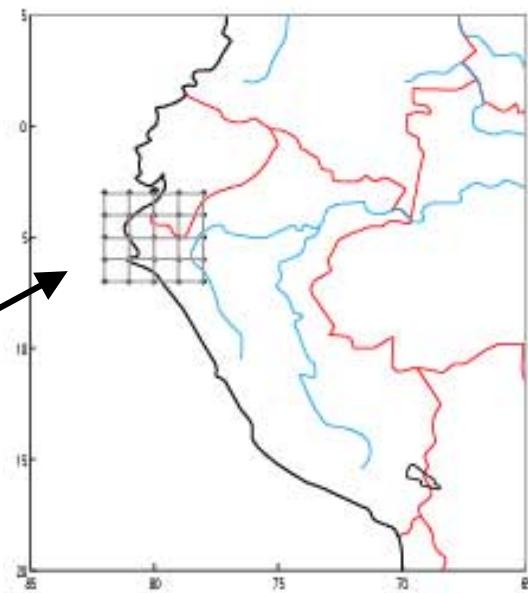
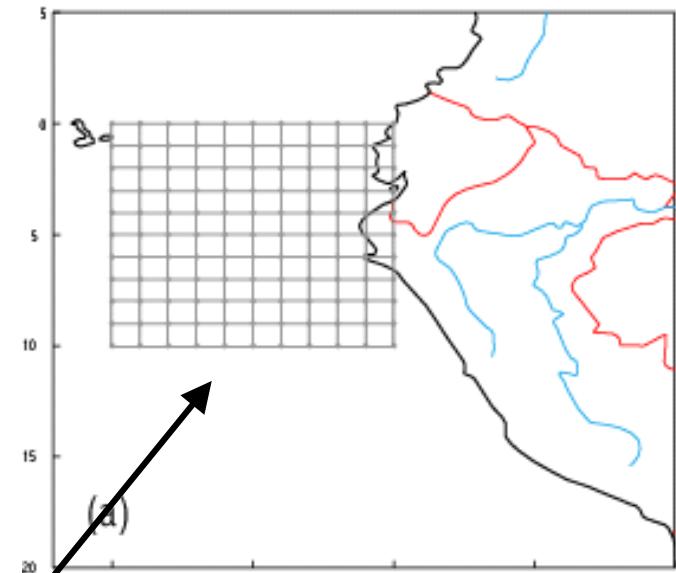
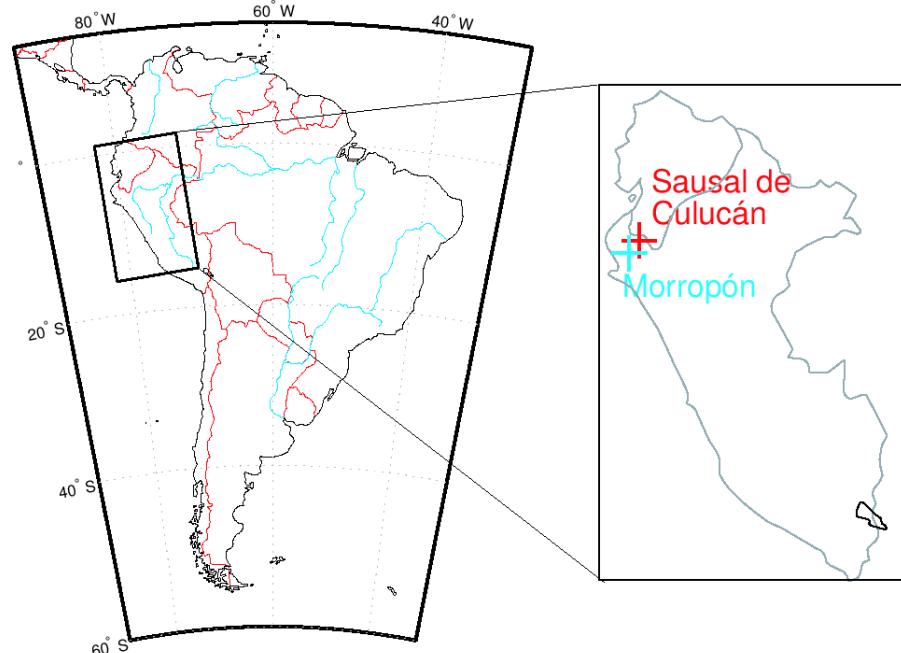
From each of the DEMETER models:

- ECMWF
- UKMO
- MPI
- CNRM

we obtain **90 daily forecasts (x 9 ensemble members)** for a given season (e.g., DJF).

These patterns also define a density on the SOM. Differences and similarities with the climatological one indicate anomalies.

## Seasonal Forecast. Downscaling Precipitation in Perú



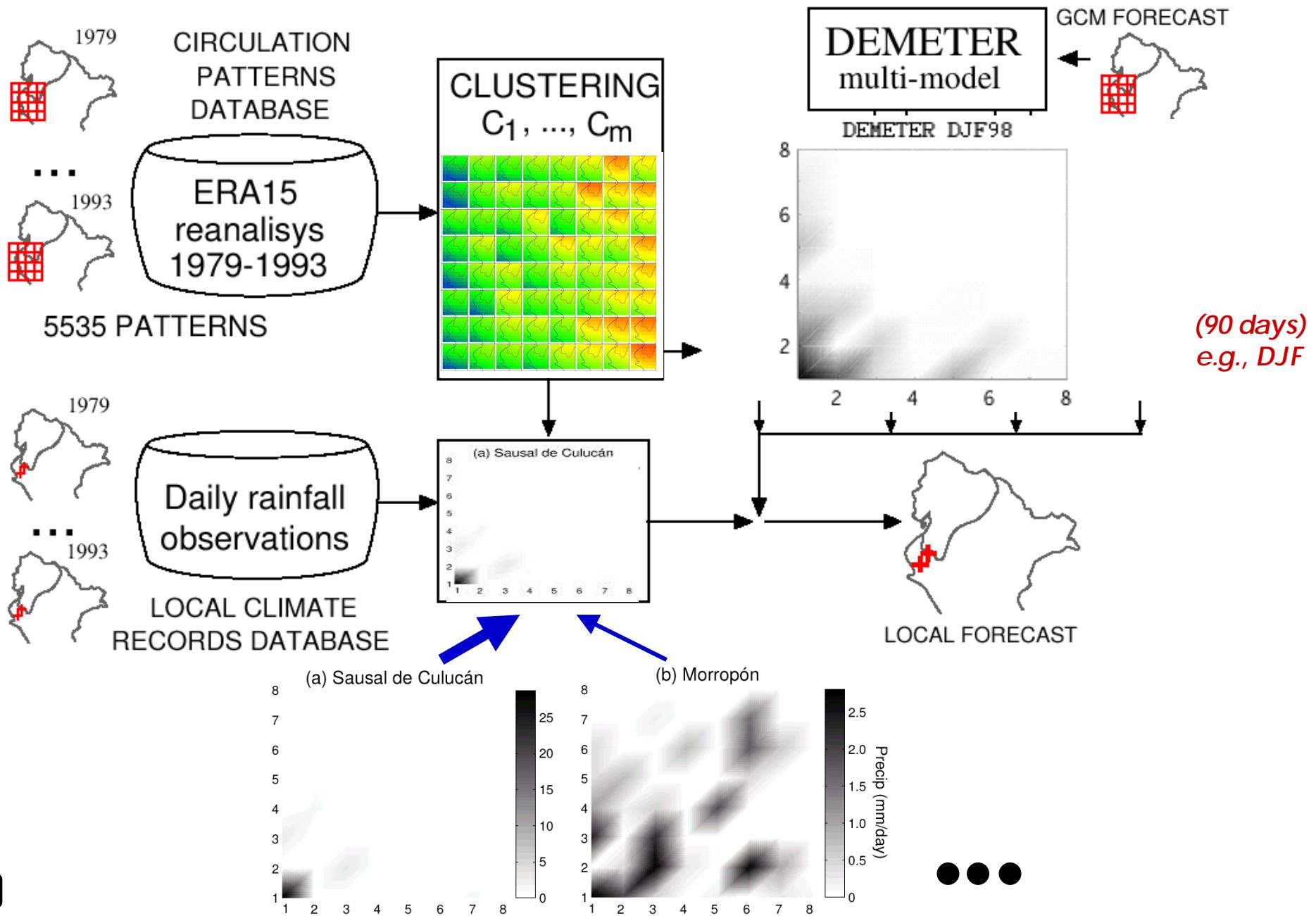
We considered:

a 2D "surface oceanic" pattern:

- ✓ area "El Niño 1-2".
- ✓ Variable: MSLP

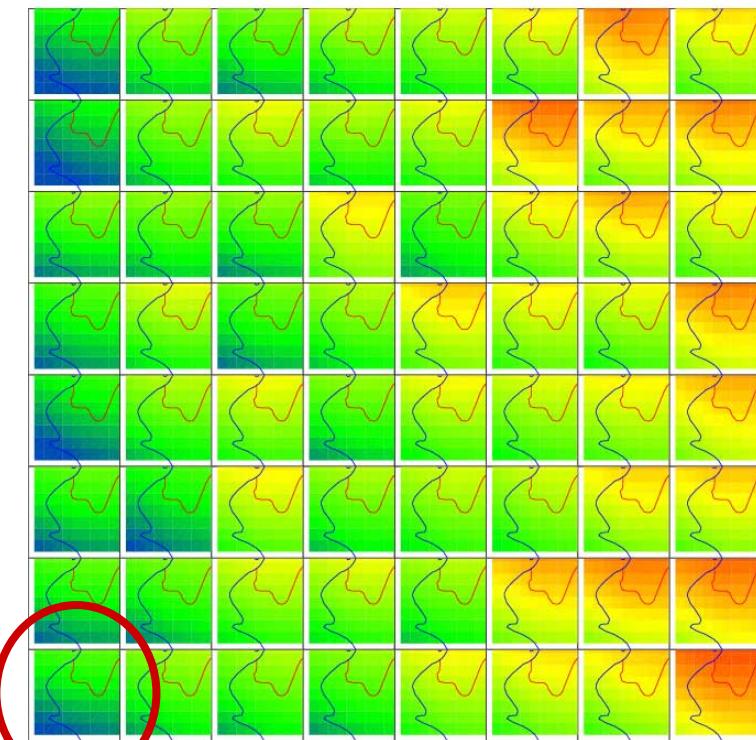
a 3D atmospheric pattern:

- ✓ regional scale.
- ✓ Z, H, and T at 500mb and 850mb

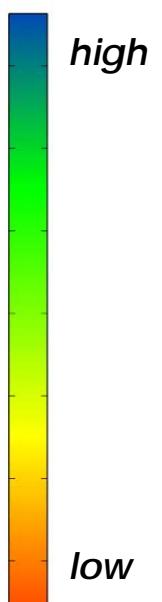
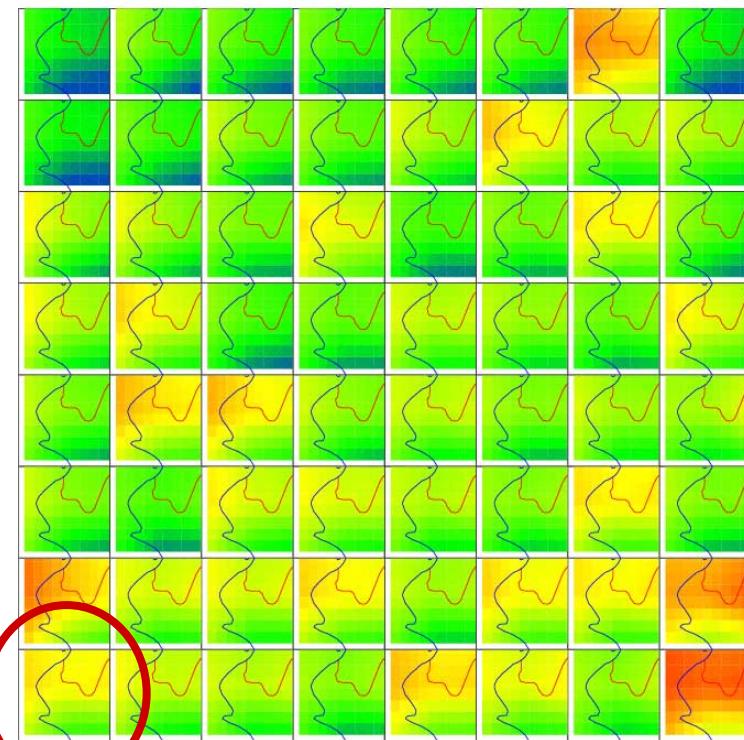


## SOM Atmospheric Patterns (prototypes)

Z500 time: 00Z



Z850 time: 00Z

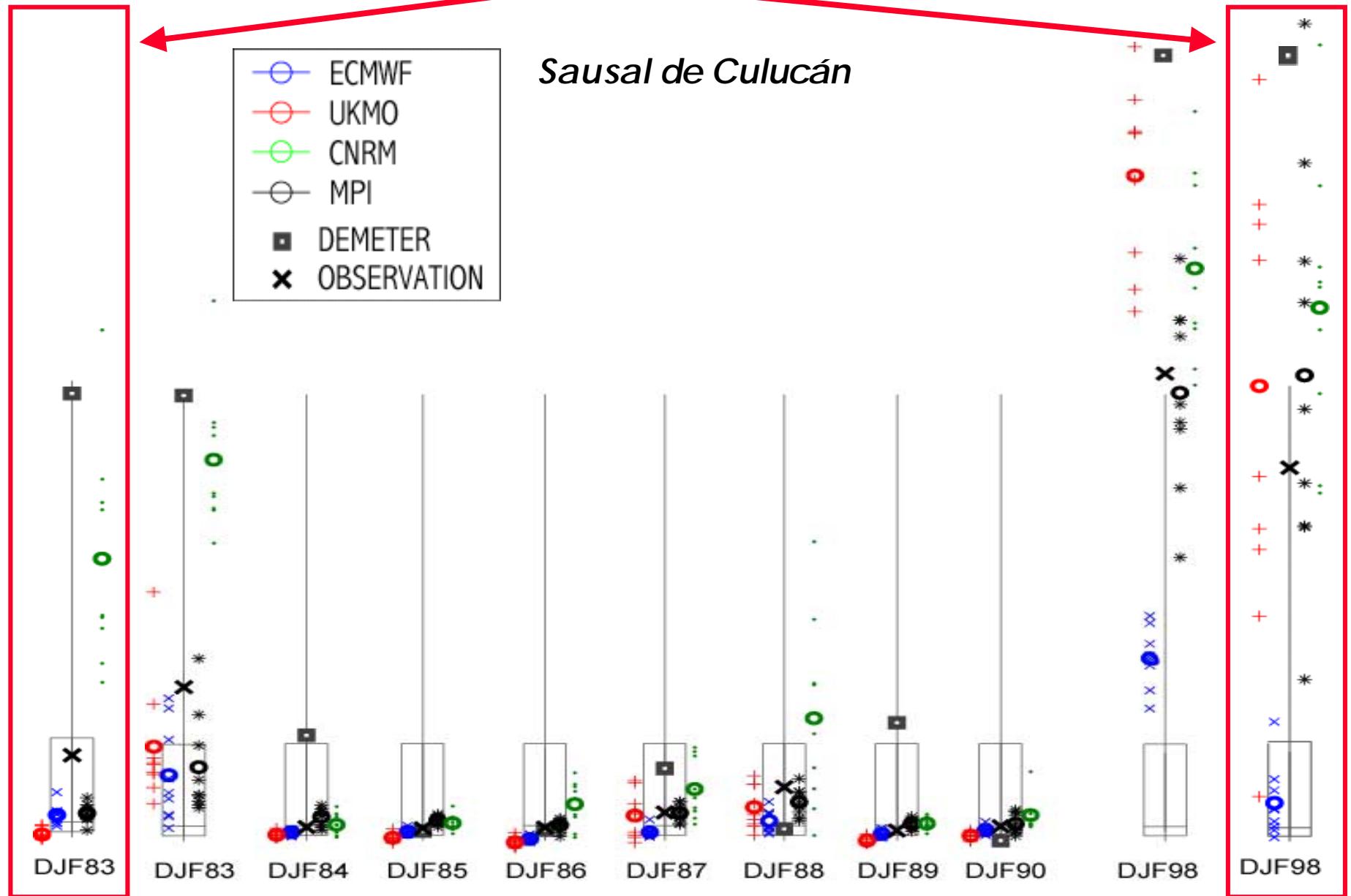


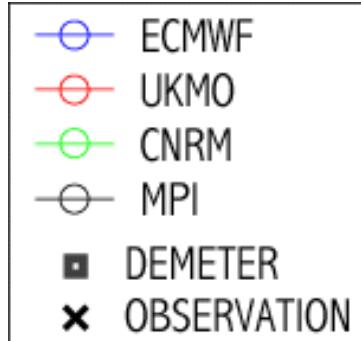
AI  
met  
group

*Pattern associated with "El Niño" rainfall in Sausal de Culucán*

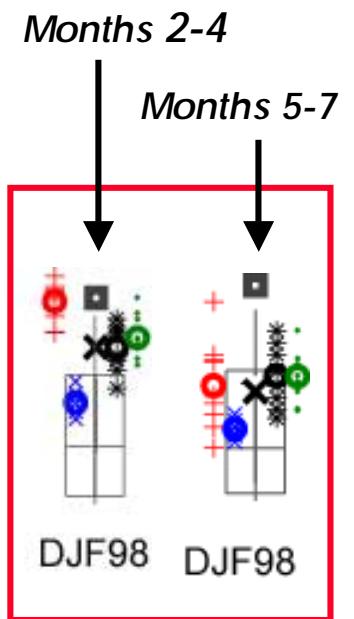
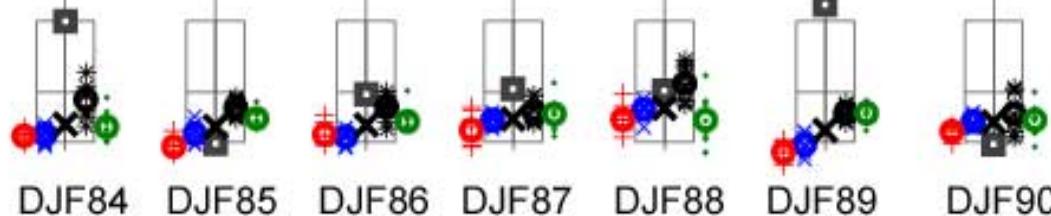
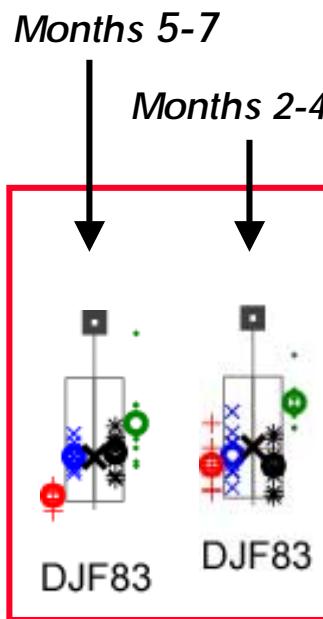
## Results for months 2-4 (5-7) DJF 1983-1998

AI  
met  
group





*Morropón*



How **reliable** and how **anomalous** is a multimodel ensemble forecast?

AI  
met  
group

**Reliability** has to do with dispersion of ensemble members.

**Anomaly** has to do with distance to climatology.

## SOM Density Plots (months 2-4 Winter DJF)

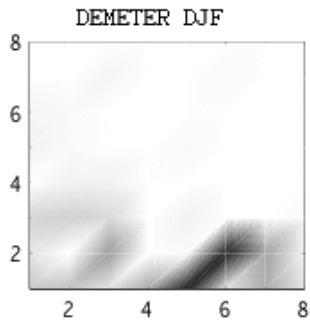
Climatology  
1979-1994

1990

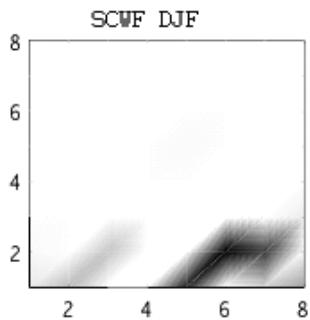
"El Niño" 1998

AI  
met  
group

*Multi Model*



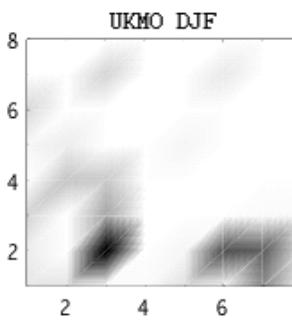
*ECMWF*



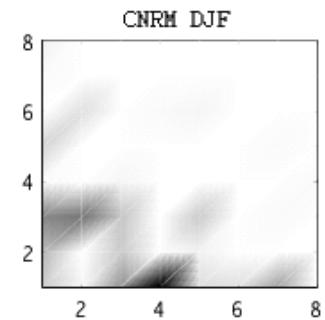
*MPI*



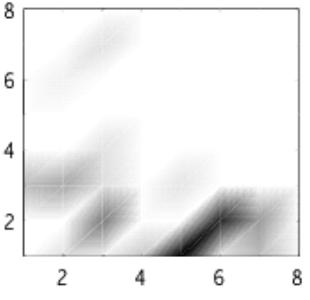
*UKMO*



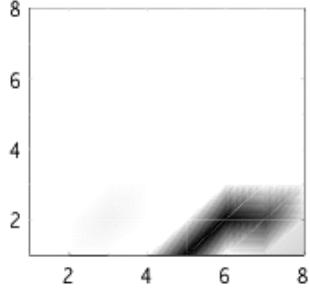
*CNRM*



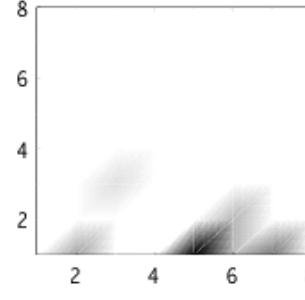
DEMETER DJF90



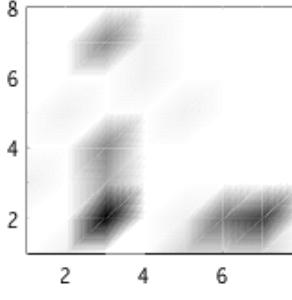
SCWF DJF90



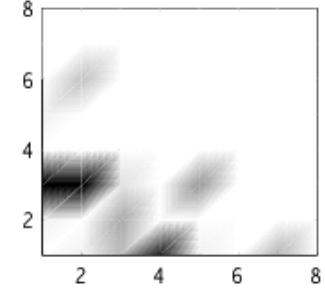
SMPI DJF90



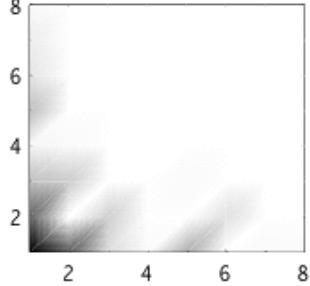
UKMO DJF90



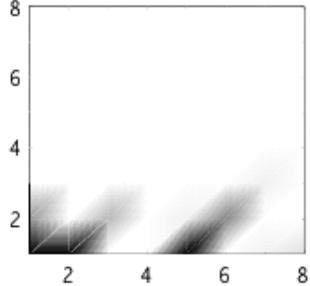
CNRM DJF90



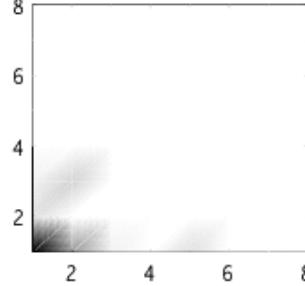
DEMETER DJF98



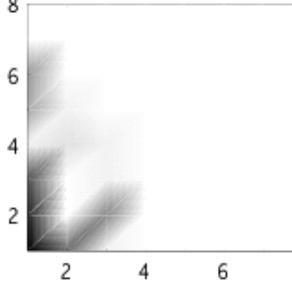
SCWF DJF98



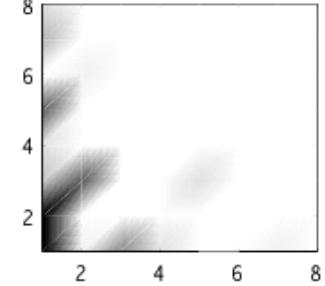
SMPI DJF98



UKMO DJF98



CNRM DJF98

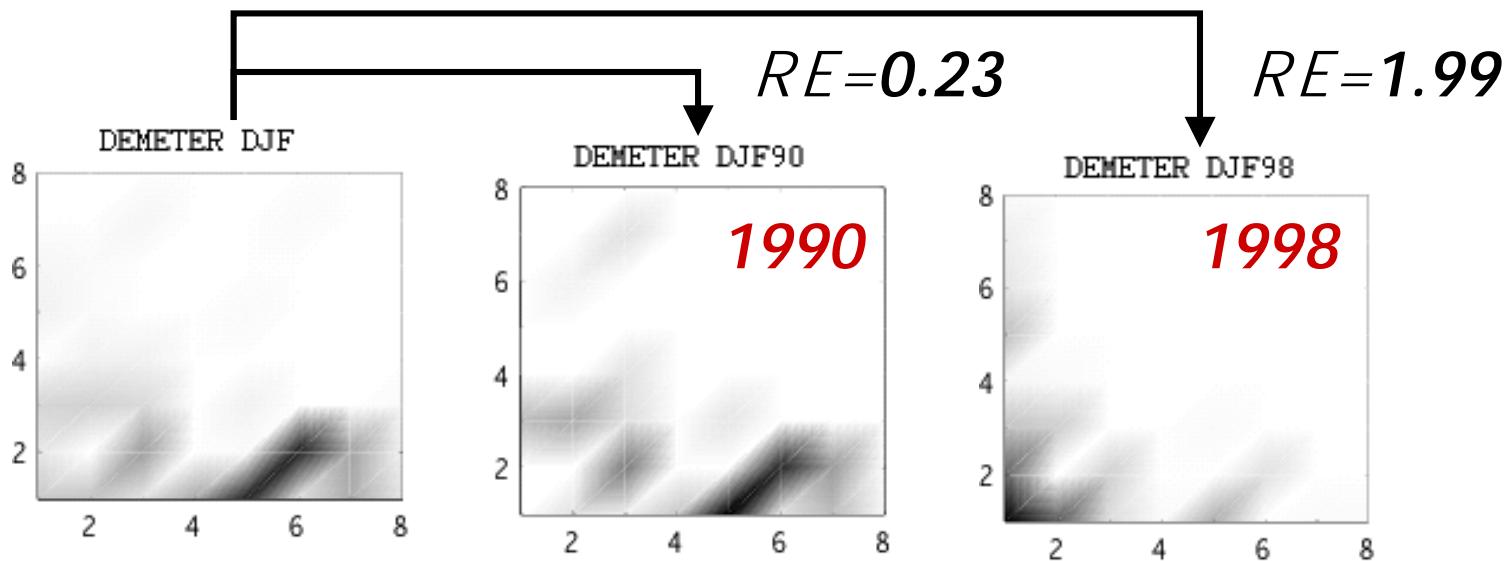


## Quantifying Anomalies & Predictability. Relative Entropy

The relative entropy characterizes the similarity between two distributions:

- ✓  $P_i$  (DEMETER climatology) and
- ✓  $Q_i$  (distribution for a particular forecast year, e.g., "El Niño" 1998)

$RE = -\sum Q_i \log Q_i / P_i \geq 0$  and grows as the distributions become "different" (in terms of entropy, or disorder).



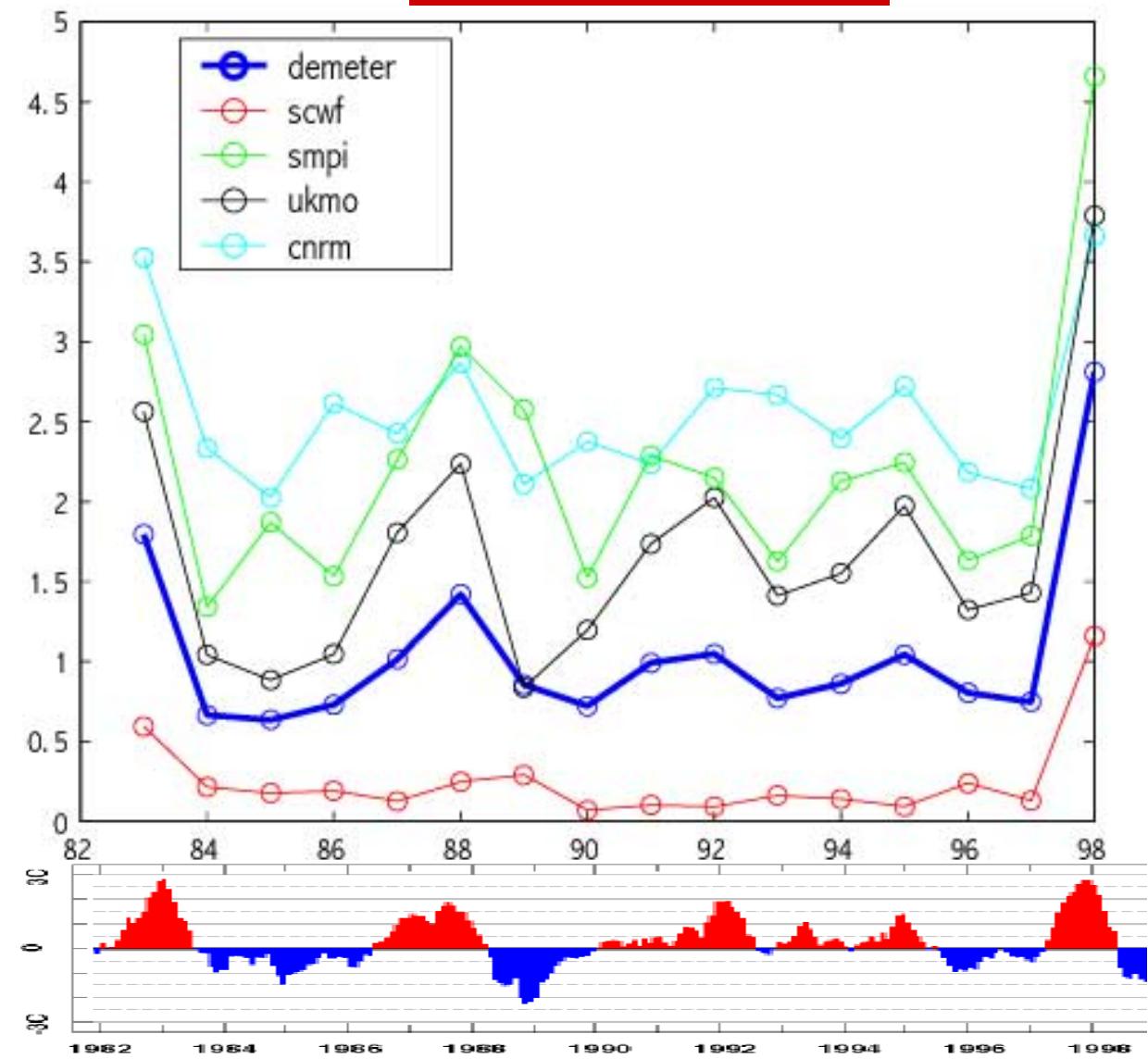
## Relative Entropies for 1982-1998

*High entropy values indicate an anomaly in the seasonal patterns.*

*The higher the entropy the larger the deviation from the climatology.*

*DEMETER output for "El Niño" years are associated maximum values of relative entropy.*

*Months 2-4 (DJF)*

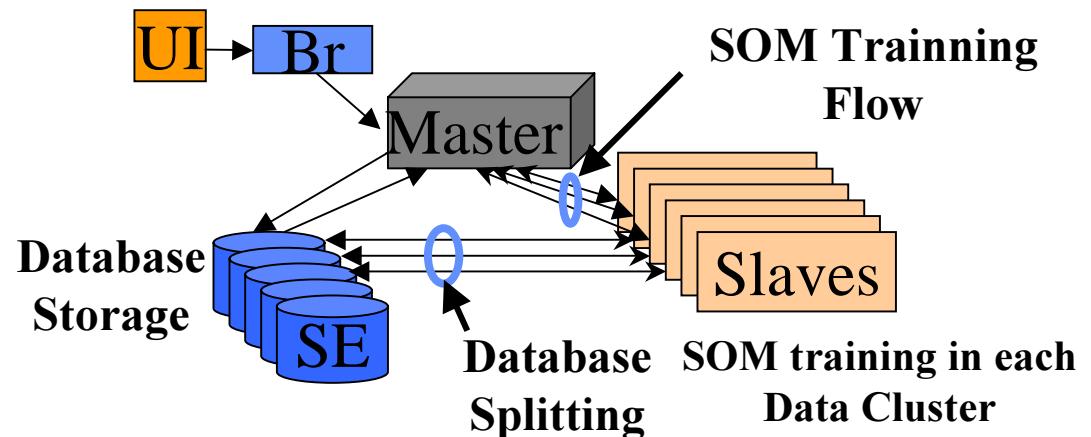


## Web Portal for data-mining applications

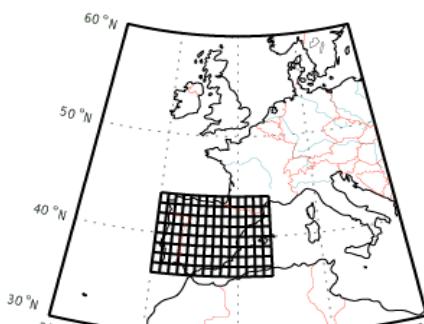
5th EU Framework



<http://www.eu-crossgrid.org>



***Developing clustering tools in an Interactive & user friendly framework:***



Interactive selection of parameters  
✓ grid area,  
✓ variables, etc.  
through a Web portal.

**Output.** XML-based interactive graphic format, binary files, etc.

