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**Regime view of Teleconnection: Euro-Atlantic Winter Regimes in ECMWF Seasonal Forecasts**

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# Regime View of Teleconnection:

## Euro-Atlantic Winter Regimes in ECMWF Seasonal Forecasts

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# Intra-Seasonal Atmospheric Variability: Teleconnections vis-à-vis Circulation Regimes

**“Teleconnection ... refers to climate anomalies being related to each other at large distances (typically thousands of kilometers).”\***

- Physical explanation in terms of propagation mechanisms
- Often diagnosed through “linear” analysis of anomalies

**Circulation Regimes: Preferred organization of large-scale anomalies over a wide region.**

- Physical explanation: involves feedback between planetary and synoptic waves to produce “quasi-equilibrium” states
- Diagnosed through “non-linear” algorithms

\*from Wikipedia

## **Phenomenological Motivation for Circulation Regimes**

**Existence of extended periods of one type of (possible extreme) weather has been recognized for many years (papers going back to the 1950s at least) - Examples: droughts, stormy periods, cold periods**

**These periods occur intermittently, and must be related to persistence in the “large-scale” flow**

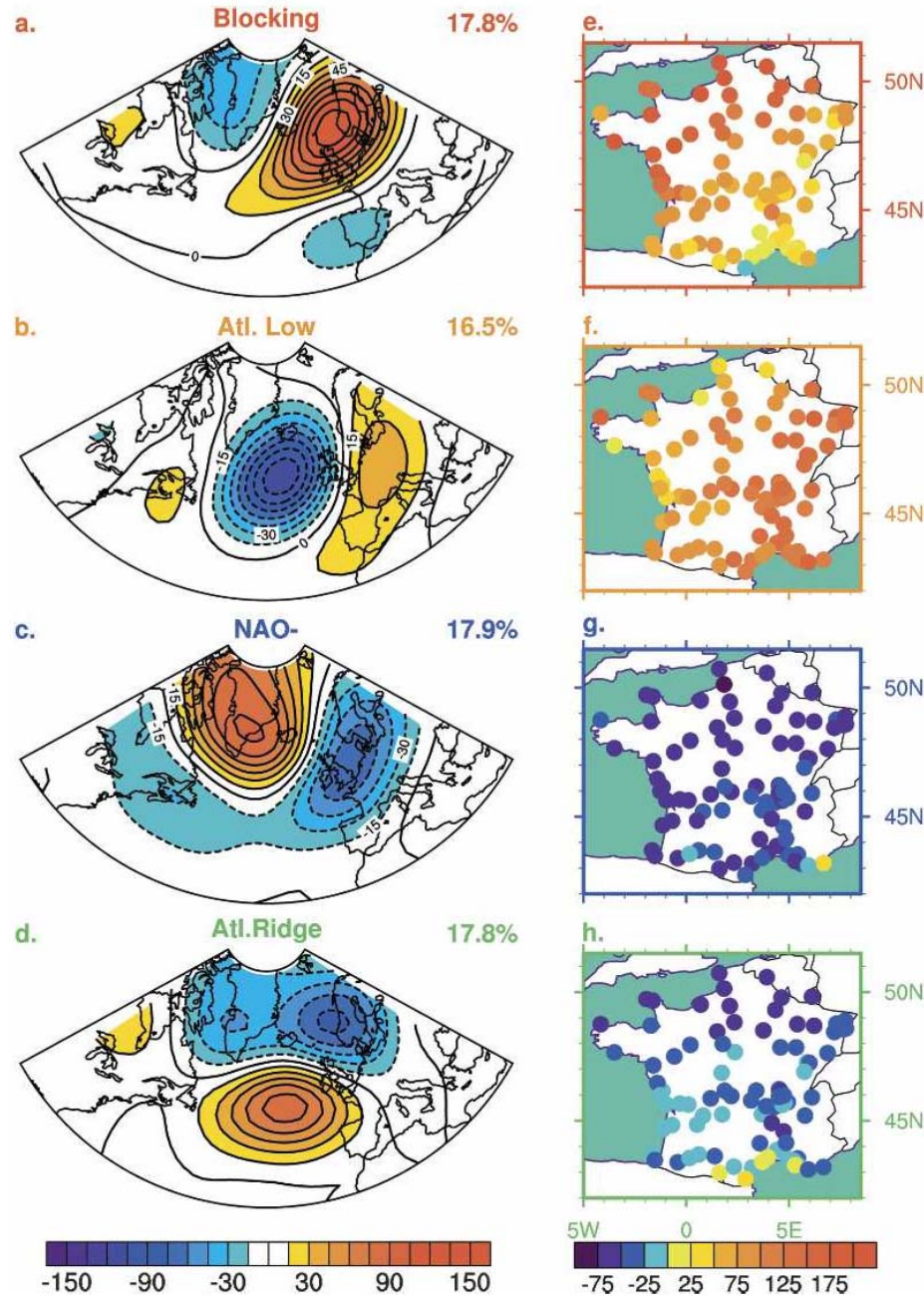
**Example: European Heat Waves of summer 2003 - were they related to regimes in the summertime Euro-Atlantic region?**

**Early Aug 2003 -  
Blocking** →

**June 2003 - Atl. Low** →

Clusters (regimes) of  
*daily 500 Z* from  
1950-2003 JJA  
(CI=15m)

**2003 European Heat Wave**  
**June and early August**  
**extreme T**



Relative changes (in percent) in the frequency of extreme warm days (95% percentile):

100% means twice as likely to have extreme warm day

## Regimes and Synoptic-Scale Feedback

**Notion that weather regimes involve mutual feed-back between the (quasi-stationary) large scales waves and the smaller-scale baroclinic, synoptic disturbances was developed theoretically by Reinhold and Pierrehumbert (1982) and Vautard and Legras (1988).**

**The feedback from the baroclinic waves to the planetary waves can be parameterized:**

**Purely dynamically (RP)**

**Semi-empirically (VL)**

**Completely statistically (multiplicative noise: Sura, Newman, Penland and Sardeshmukh, 2004: J. Atmos. Sci., 62, 1391-1409)**

## Some Methodologies

- 1) Partitioning of PC-based state space to maximize in-cluster variance
- 2) Mixture model method: modeling entire *pdf* with a sum of Gaussian *pdfs*
- 3) Neural-Network related methods

**-Each method has advantages and disadvantages**  
**-Synoptic scale feedback usually not accounted for**

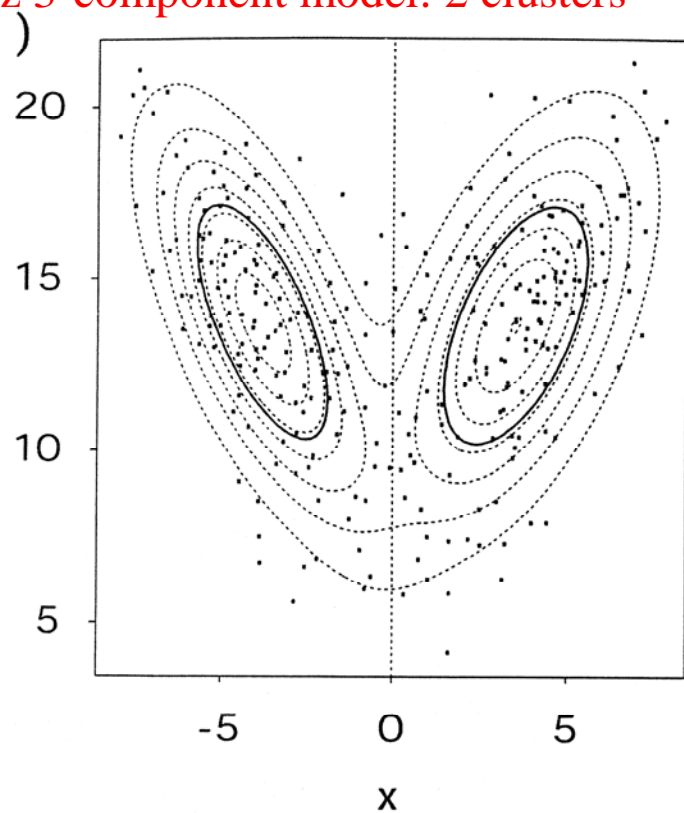
### Significance Testing

- a) Significance vis-à-vis a single Gaussian pdf
- b) robustness to sampling errors (reproducibility)
- c) Significance easier to establish in large simulated datasets than in short observational record

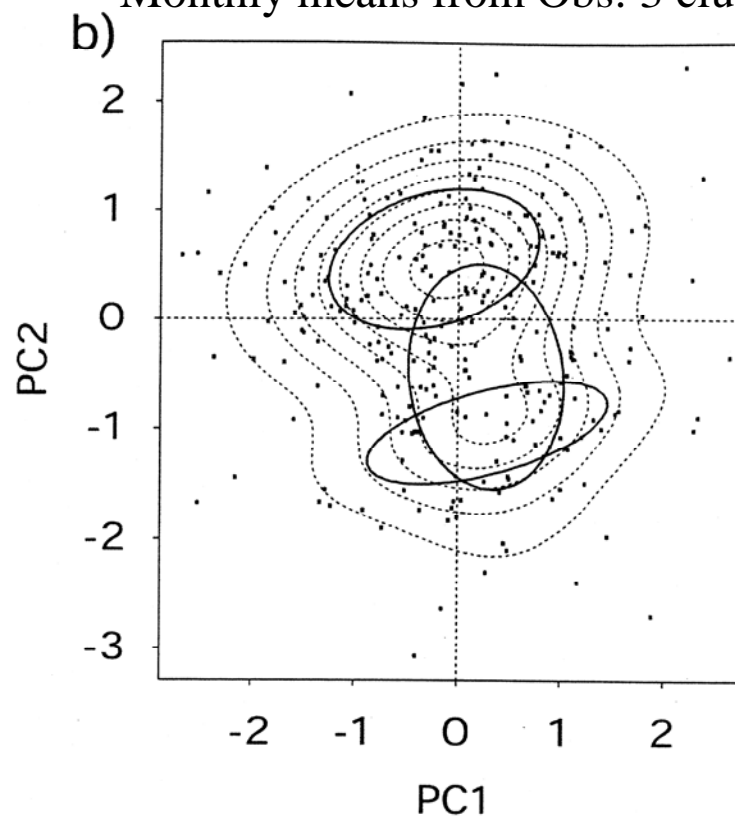
## Example of partitioning in PC state space: Maximize within-cluster variance

(Stephenson, Hannachi, and O'Neill, 2004: *QRMS*, **130**, 583-605)

Lorenz 3-component model: 2 clusters



Monthly means from Obs: 3 clusters????





# Euro-Atlantic Winter Regimes in ECMWF Seasonal Forecasts

**Explicit coupling between planetary and synoptic scale  
“envelope” is incorporated**

## **Data:**

- **Model - System 3: T159 AGCM coupled to HOPE 1-deg Ocean**
- **Historical Forecasts: Nov 1 starts for 25 years: 1981-2005**
- ***Daily* 200 hPa height analyzed: December-March**
- **11 ensemble members for each forecast start date**
- **Observational comparison: ERA40 + continuation for same winters**

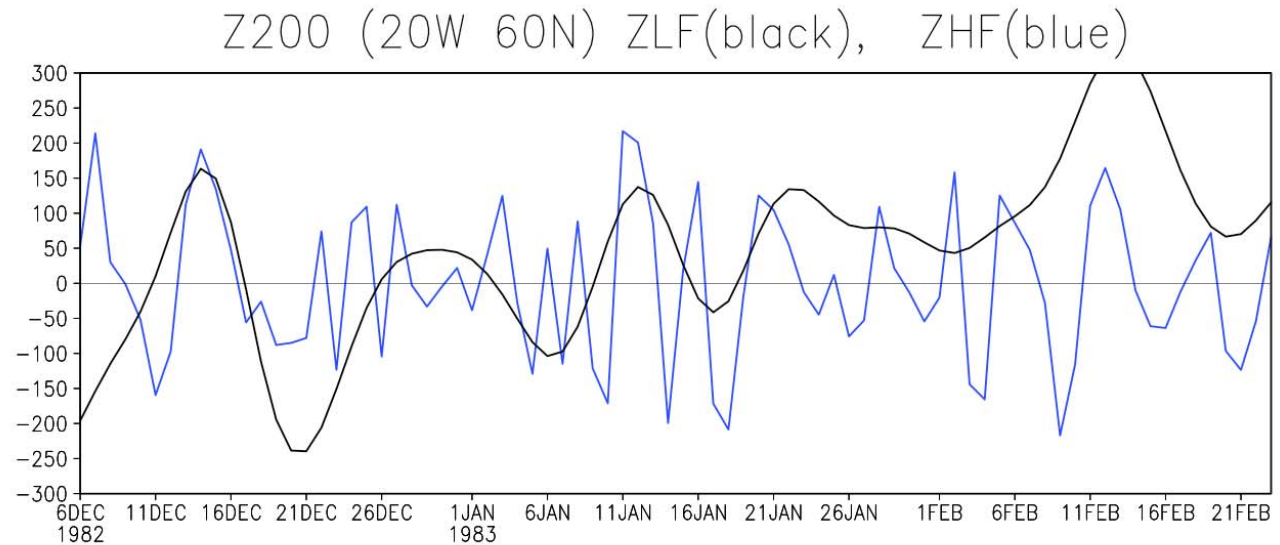
**Envelope Function: Tracks low-frequency variations of  
synoptic scale activity**

# Computation of **envelope** at 20W 50N for DJFM 1982/83

**Filtered Z200**

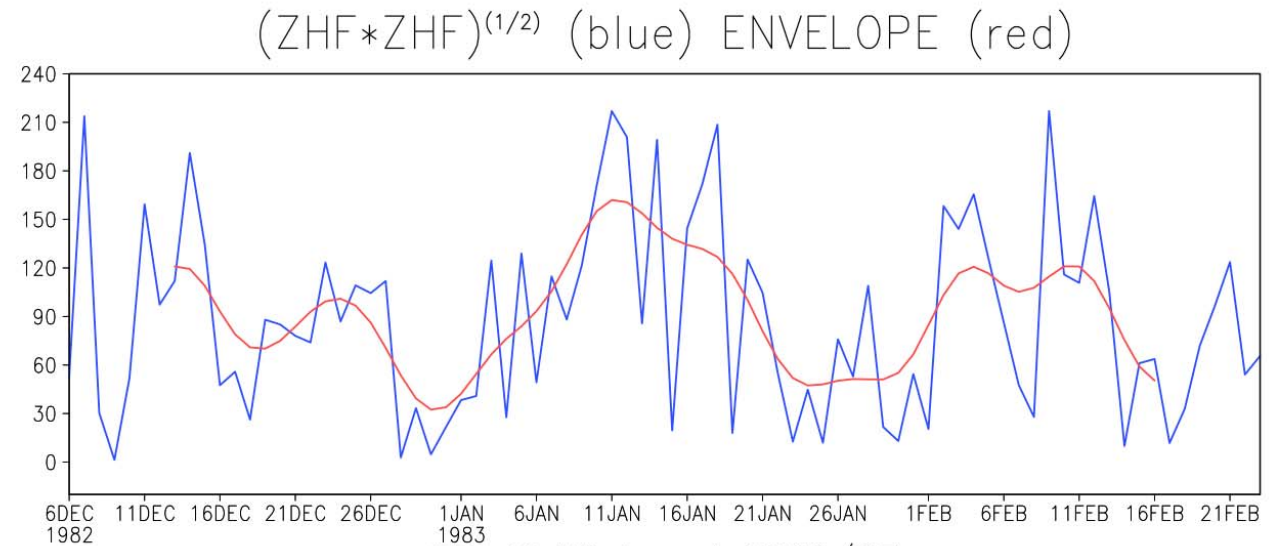
$Z_{LF}$ :  $\tau = 10-90$  day (black)

$Z_{HF}$ :  $\tau = 2-10$  day (blue)



$(Z_{HF} Z_{HF})^{(1/2)} = \text{blue}$

**envelope function =**  
 $\{(Z_{HF} Z_{HF})^{(1/2)}\}_{LF}$



ERA40 Winter of 1982/83

# Euro-Atlantic Winter Regimes in ECMWF Seasonal Forecasts

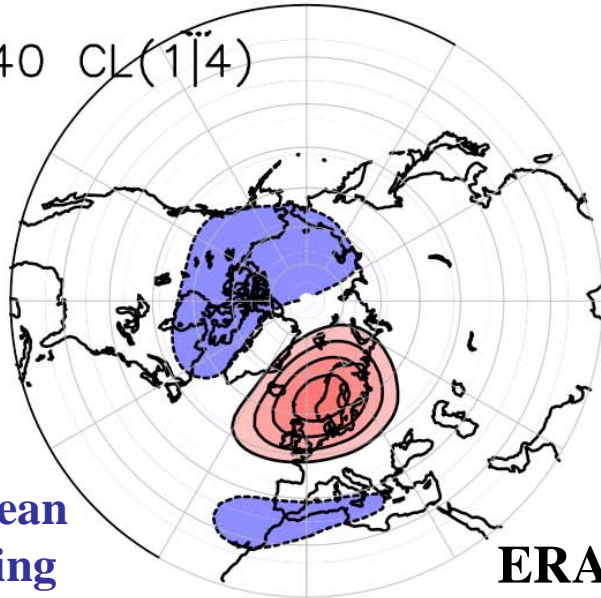
## Analysis:

- Traditional low-pass (10-90 day) filter on Z 200  $\Rightarrow$  ZLP
- Envelope function of band-pass (2-10 day) filtered data  $\Rightarrow$  ZENV
- Compute EOFs and PCs of ZLP
- Compute EOFs and PCs of ZENV
- Compute Singular Value Decomposition using leading N PCS of ZENV and ZLP
- SVD patterns very robust to changes in N from 6 to 20
- Leading 3 SVD modes capture ~ 87 - 90% of squared covariance (little dependence on N)
- Use SVD-defined coordinates - keep only 3 modes:
- Apply quasi-stationary filtering (following pioneering studies by Toth)
- Apply partitioning algorithm
- Technical note: Algorithm is insensitive to orthogonal rotation defined by SVD, but the SVD analysis leads to a unique truncation (N) in state space

## Presentation of cluster patterns

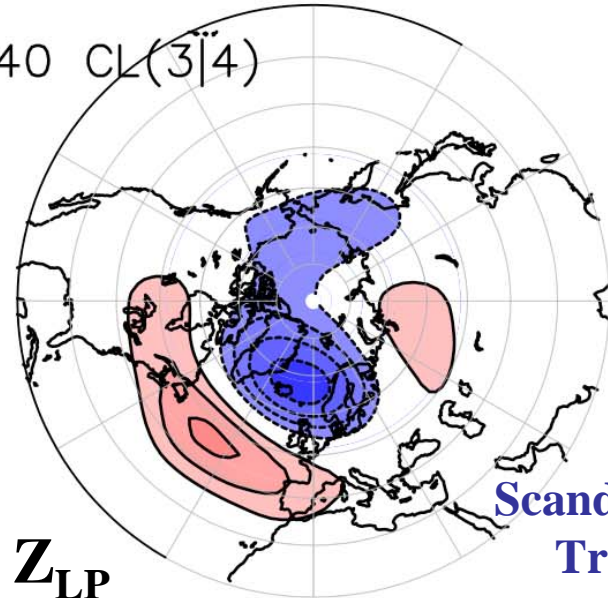
- **Classify all quasi-stationary states into one of 4 clusters,**
- **Full-field composite anomalies of ZLP based on cluster assignment**
- **Full-field composite anomalies of the envelope function  
based on cluster assignment**
- **Examination of envelope function anomalies shows storm track shifts  
in association with low-pass height shifts**

ERA40 CL(1|4)



**European Blocking**

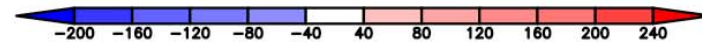
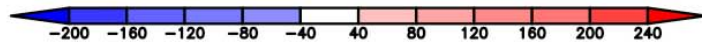
ERA40 CL(3|4)



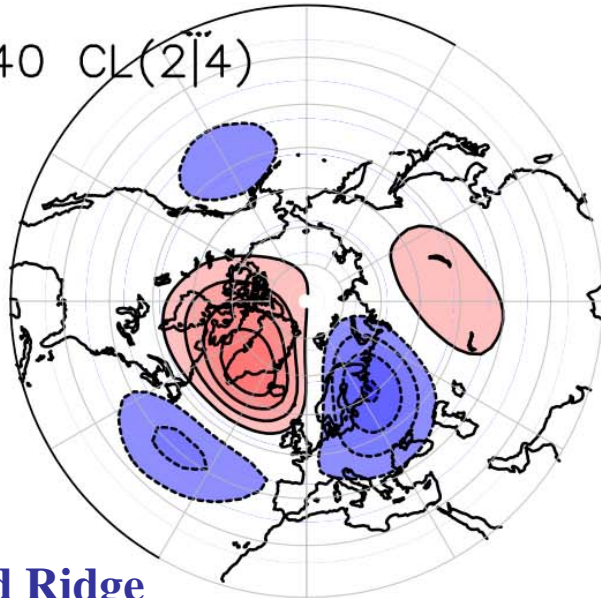
**Scandinavian Trough**

ZLP

ERA 40 Clusters:  $Z_{LP}$

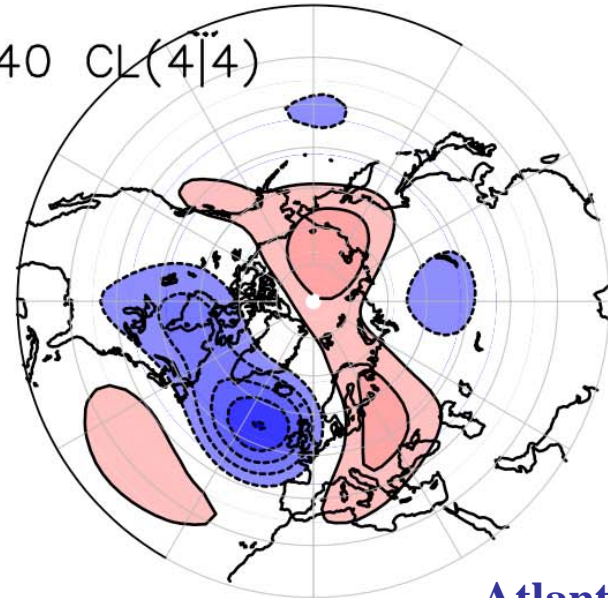


ERA40 CL(2|4)



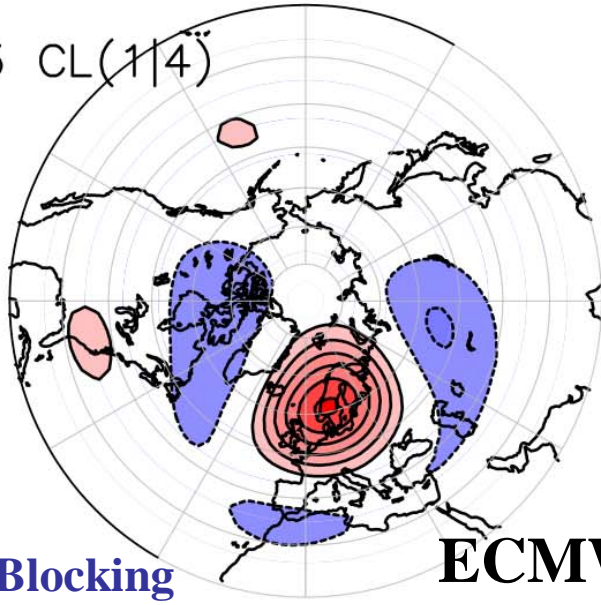
**Greenland Ridge**

ERA40 CL(4|4)



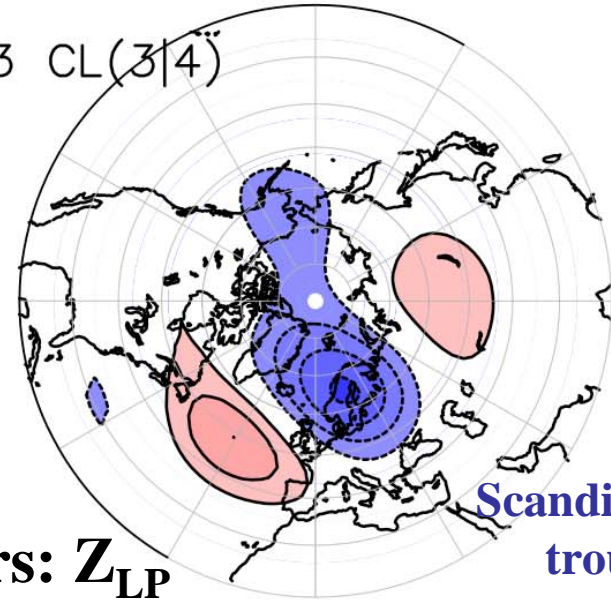
**Atlantic wave**

Sys3 CL(1|4)



**European Blocking**

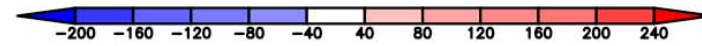
Sys3 CL(3|4)



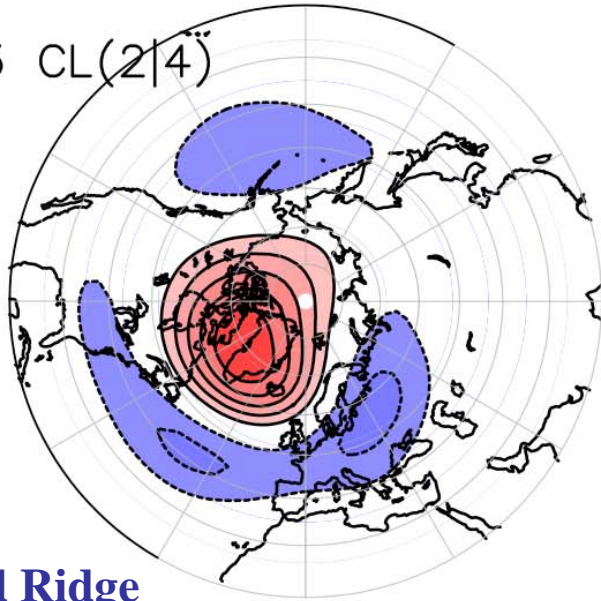
**Scandinavian trough**

ZLP

**ECMWF Clusters: Z<sub>LP</sub>**

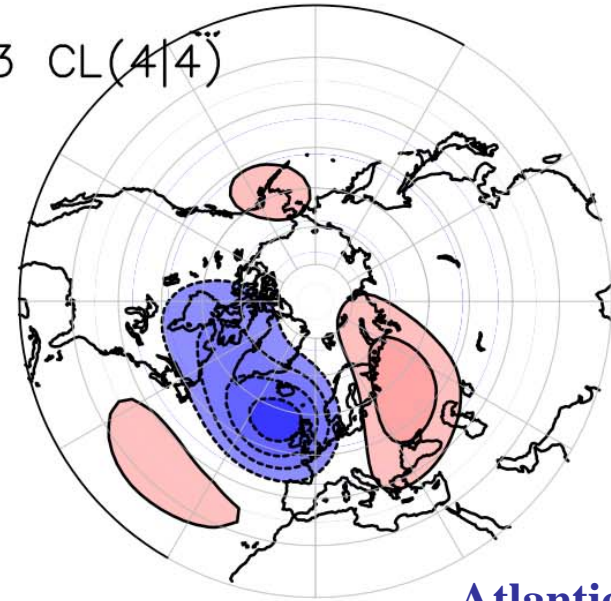


Sys3 CL(2|4)

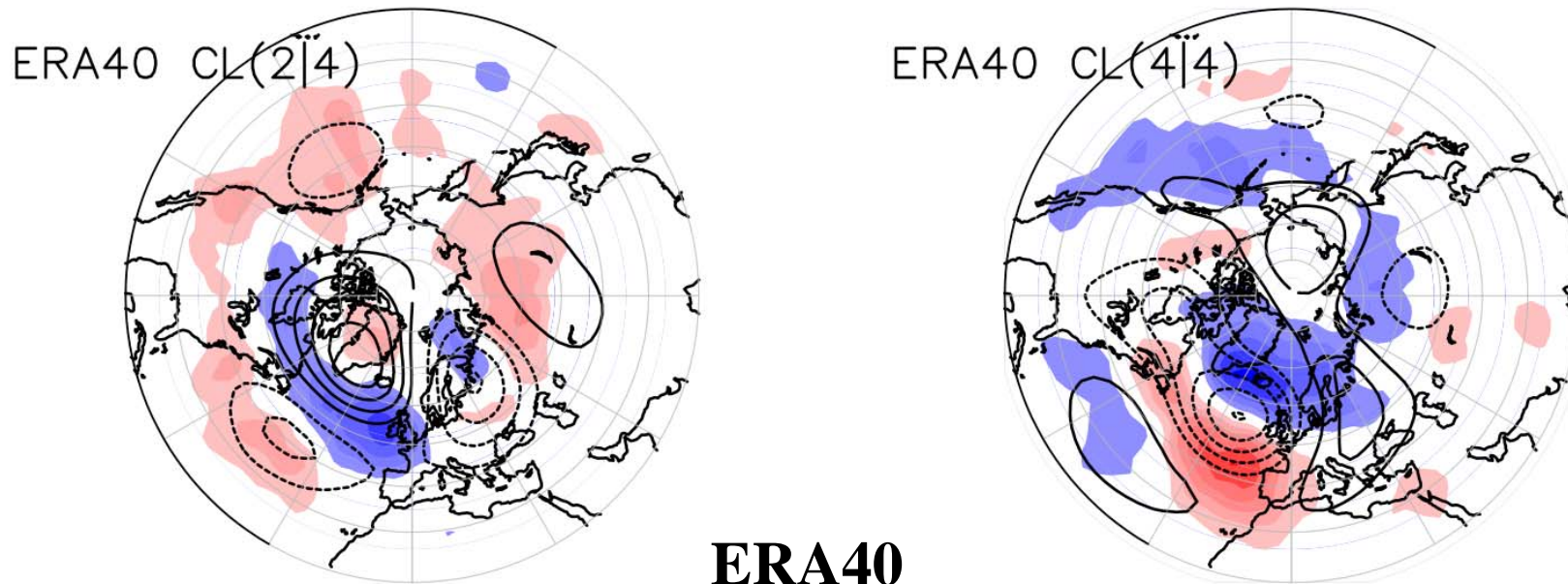
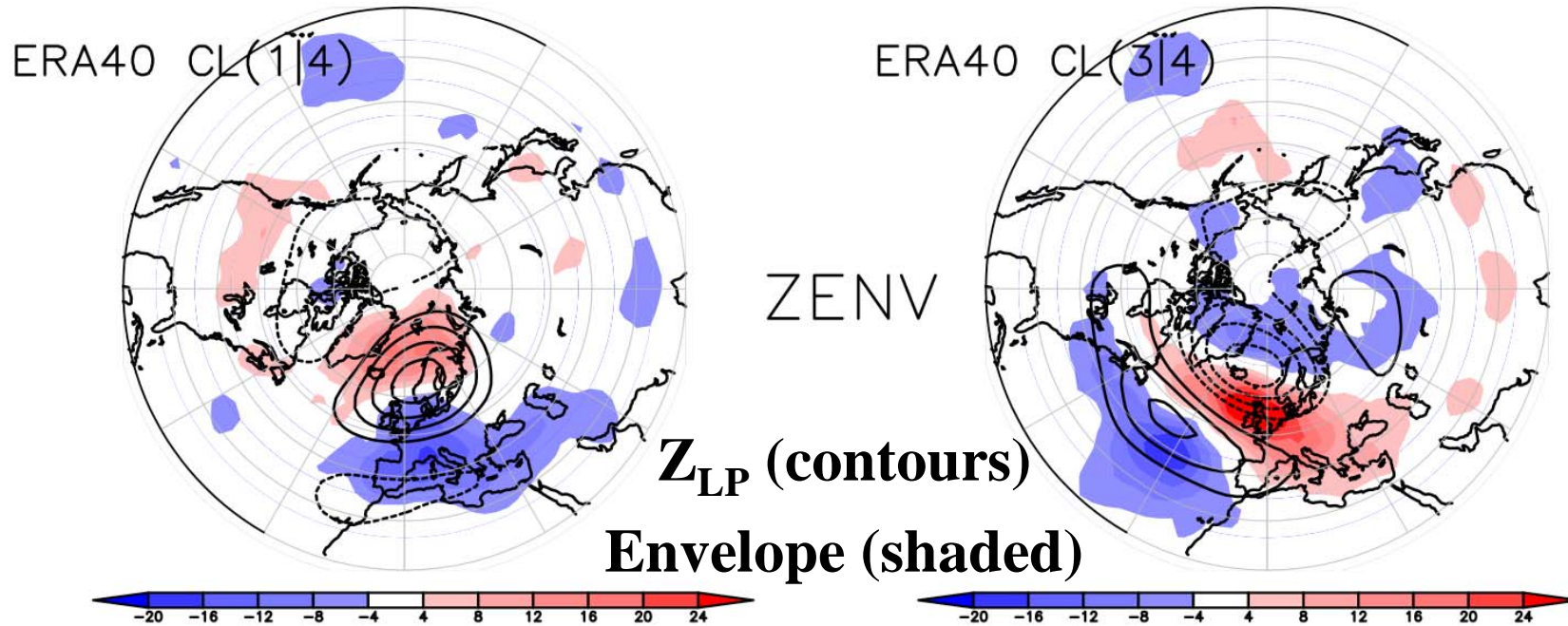


**Greenland Ridge**

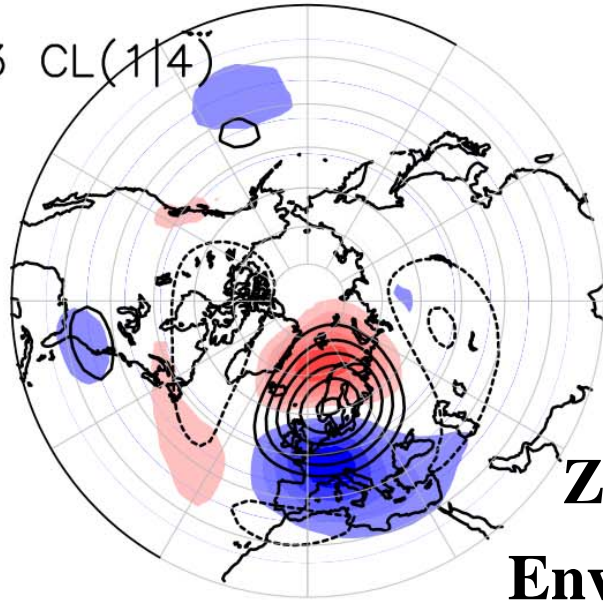
Sys3 CL(4|4)



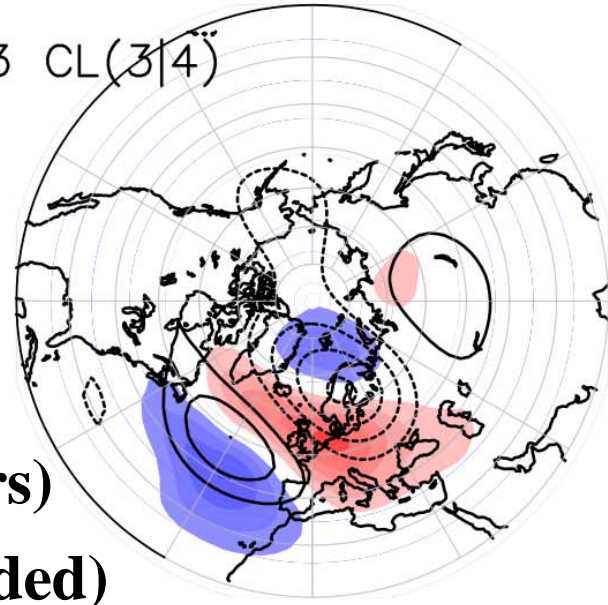
**Atlantic/wave**



Sys3 CL(1|4)



Sys3 CL(3|4)



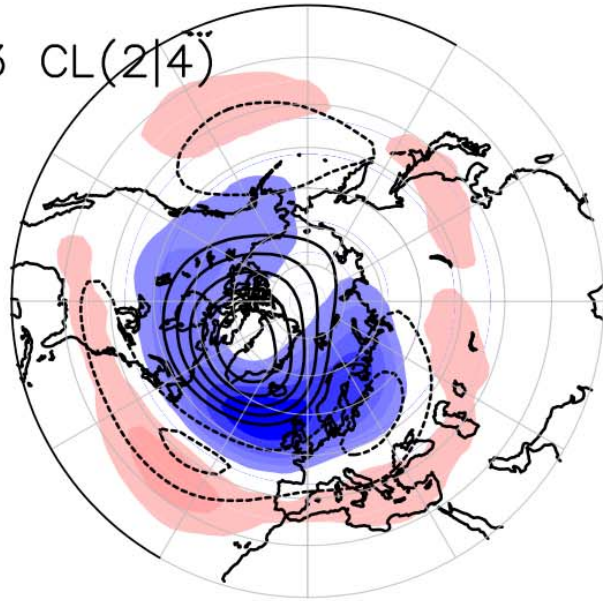
ZENV

Z<sub>LP</sub> (contours)

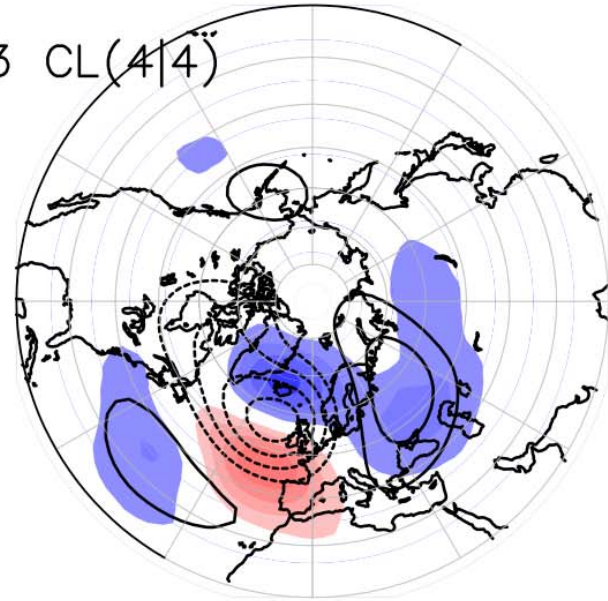
Envelope (shaded)



Sys3 CL(2|4)



Sys3 CL(4|4)



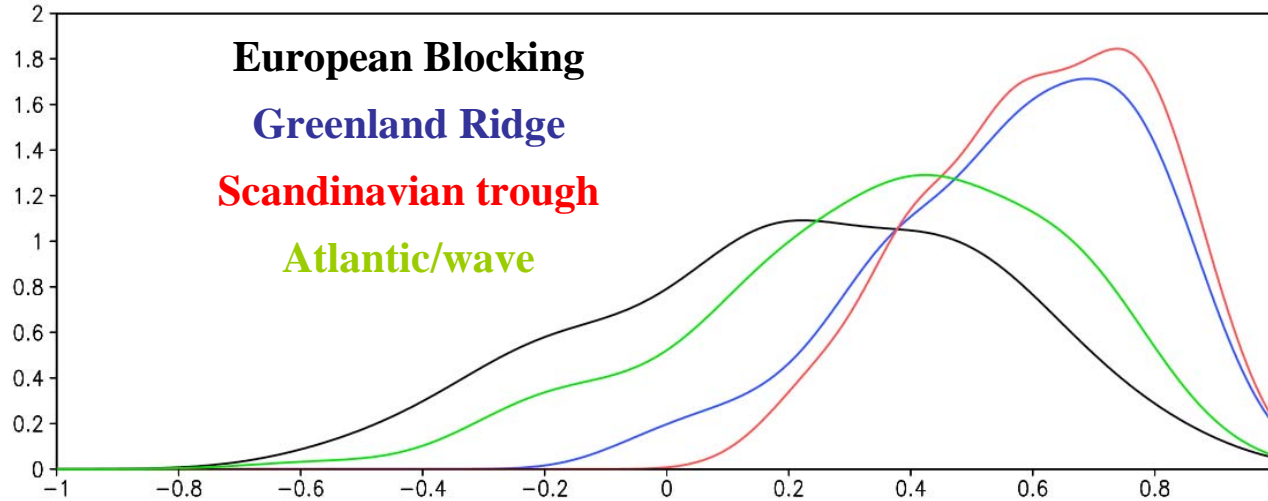
ECMWF



## Reproducibility of the clusters

- **Construct 121 winter *samples* from ensemble data set:**
- **Each *sample* consists of one forecast per winter for the 25 winters, and is strictly comparable to the ERA reanalysis**
- **For each sample:**
  - **From the full set of PCs of ZLP and the envelope function, choose the subset corresponding to the given sample**
  - **Compute the SVDs based on the subset of PCs**
  - **Apply the quasi-stationary filtering and partitioning to the SVDs**
  - **Match the corresponding clusters to the clusters of the full ensemble on the basis of error “energy” (squared amplitude); compute error energy and pattern correlation for each cluster**
  - **Archive the 121 sets of cluster error energy and pattern correlation measures**
- **From this archive compute pdfs**
- **Note: The SVD defining each sample defines a unique rotation and truncation of the original PC state space**

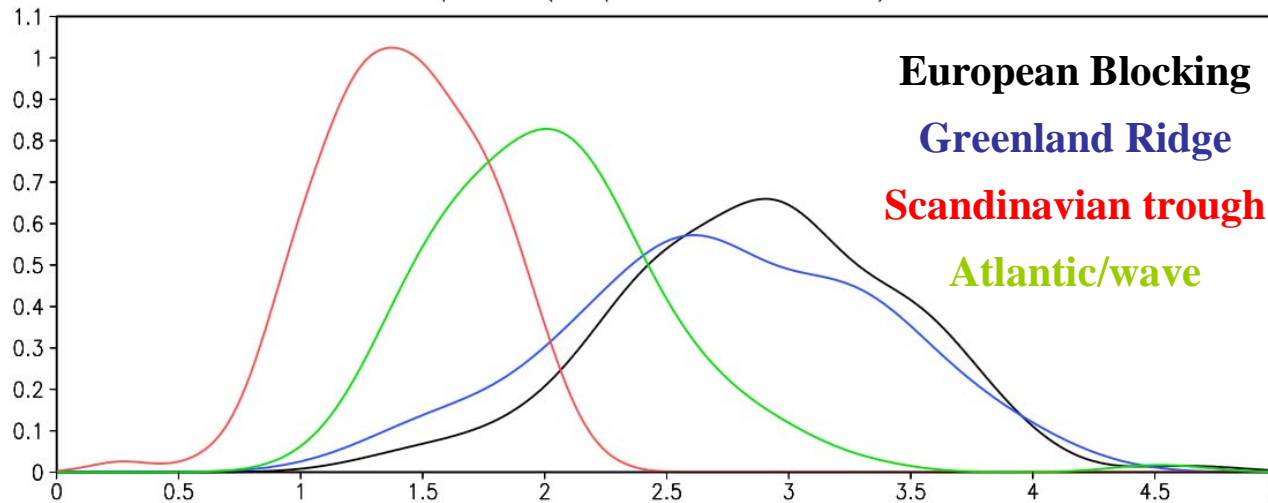
pdf (Pattern Correlation)



(pdfs normalized  
to unit area)

CL1(black), CL2(blue), CL3(red), CL4(green)

pdf (Squared Error)



CL1(black), CL2(blue), CL3(red), CL4(green)

## Reproducibility

- Scandinavian Trough most reproducible: generally highest pattern correlation and lowest error energy
- European Blocking least reproducible: lowest pattern correlation and highest error energy

## **Some Conclusions**

- **ECMWF seasonal forecast model simulates European-Atlantic clusters which are very similar in pattern to those in reanalyses**
- **The Scandinavian trough is the most reproducible across forecasts; European blocking is the least reproducible**
- **Using SVD between low-pass height field and the envelope storm track fluctuations yields a unique truncation level (3 modes) for cluster calculations - removing one source of arbitrariness**
- **Other ambiguities remain: Number of clusters?**

## Appendix: Some details about SVD calculations

Data source	N PCs	squared covariance	% sq cov explained in first 3 modes
EC forecasts	6	$1.1 \times 10^{11} \text{ m}^4$	37, 33, 20
EC forecasts	10	$1.2 \times 10^{11} \text{ m}^4$	35, 32, 20
EC forecasts	20	$1.2 \times 10^{11} \text{ m}^4$	35, 32, 20
ERA 40	6	$8.6 \times 10^{10} \text{ m}^4$	43, 30, 19