

# Persistent Regime Modes Of Mid-Latitude Variability And Scale Interactions

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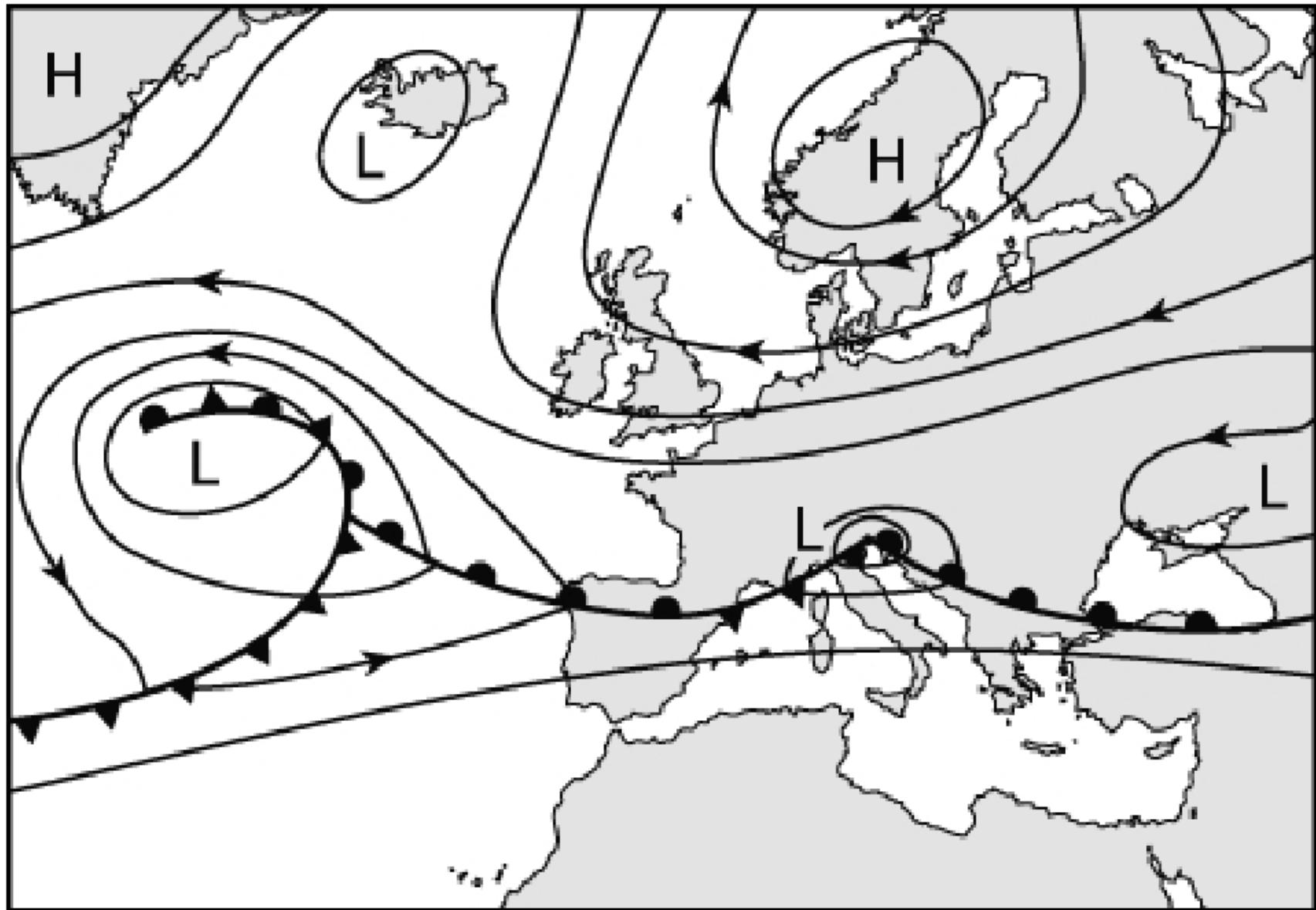
# Outline

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- Motivation
- Space-Time Clustering
- NH metastable regimes
- Dynamical processes
- SH attribution
- Summary

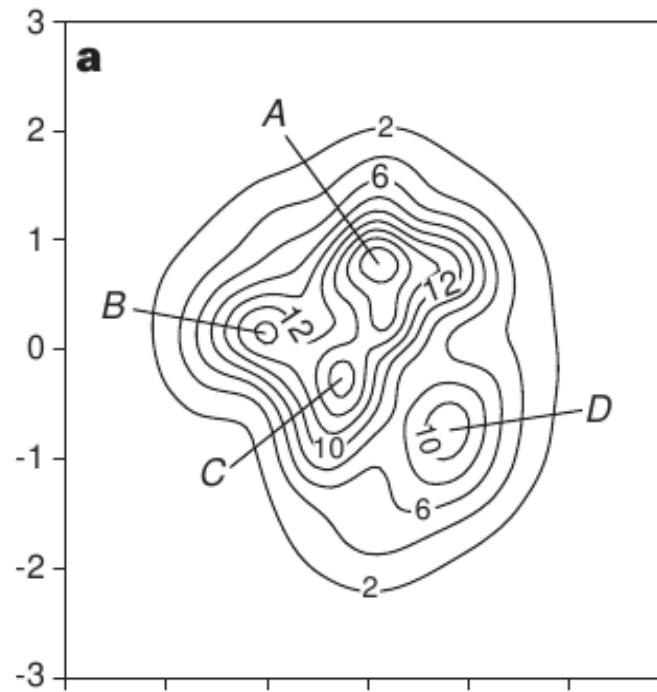
# Motivation

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# Motivation

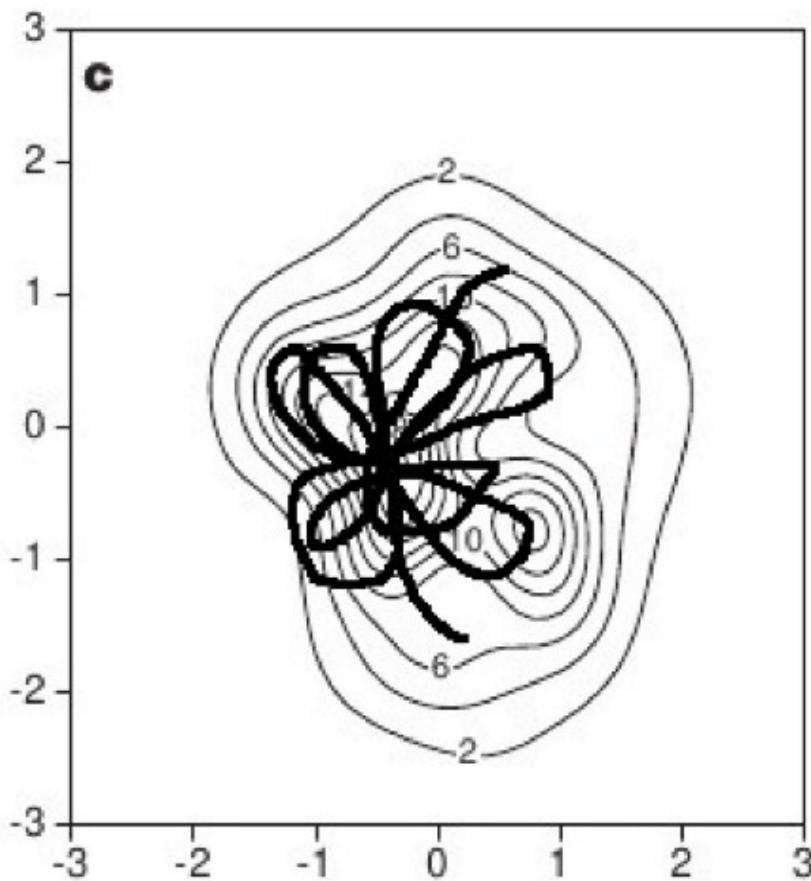
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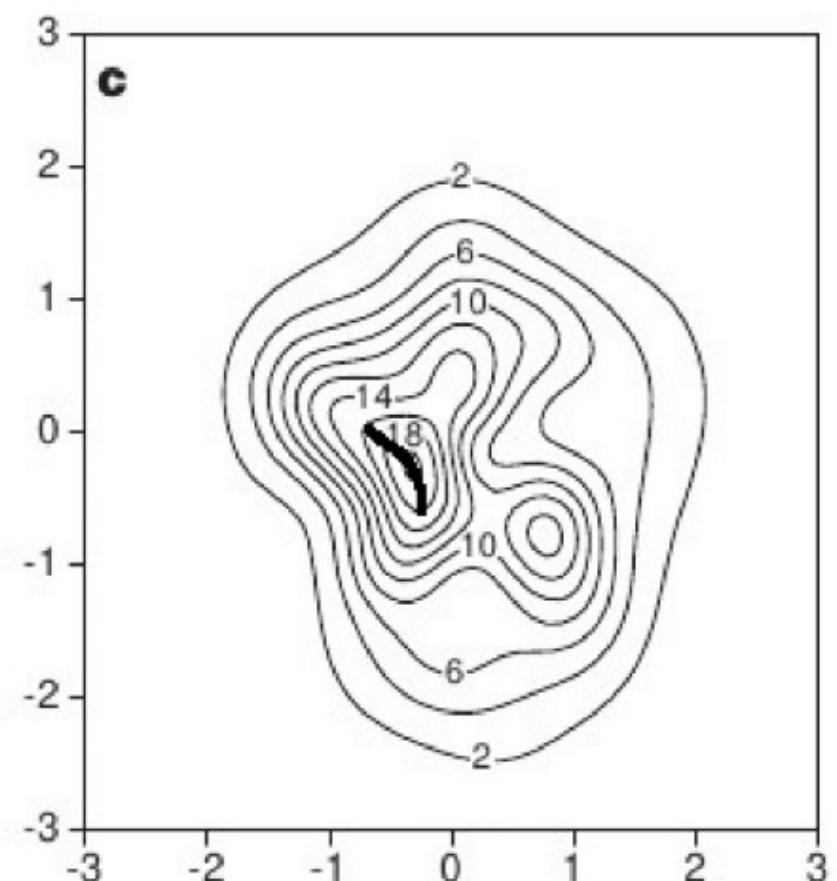
# Motivation

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Recurrent

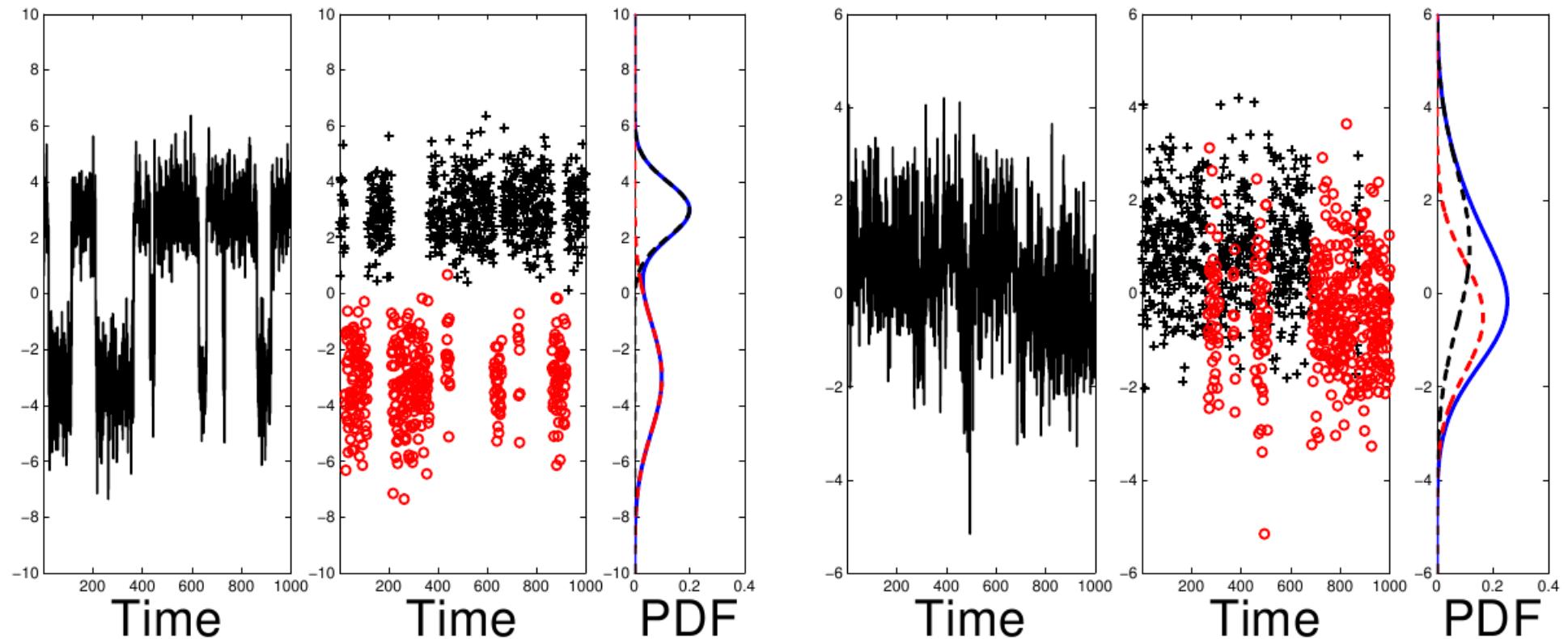


Persistent



# Space-Time Clustering

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# Space-Time Clustering

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Finite Element, Bounded Variation,  
Vector Autoregressive Factor  
**FEM-BV-VARX method:**

$$\mathbf{x}_t = \mu_t + \mathbf{A}_q(t)\phi_1(x_{t-\tau}, \dots, x_{t-m\tau}) + \mathbf{B}(t)\phi_2(u_t) + \mathbf{C}(t)\epsilon_t$$

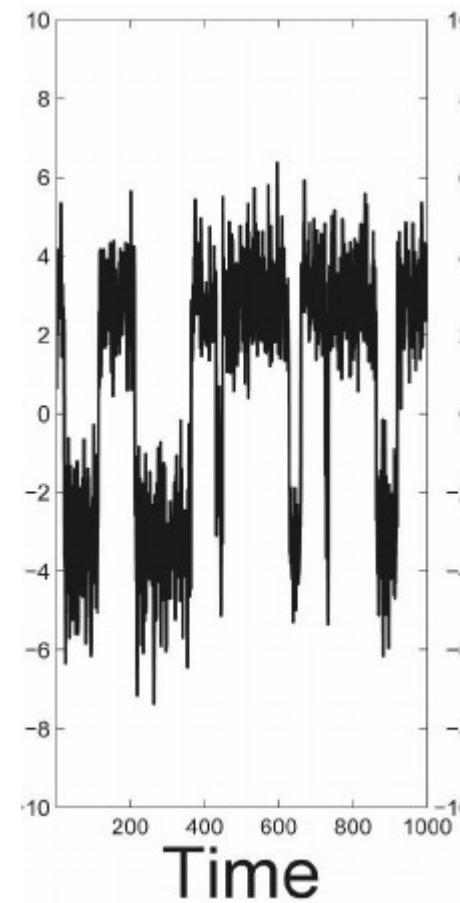
# Space-Time Clustering

Finite Element, Bounded Variation,  
Vector Autoregressive Factor  
**FEM-BV-VARX method:**

$$\mathbf{x}_t = \mu_t + \mathbf{A}_q(t)\phi_1(x_{t-\tau}, \dots, x_{t-m\tau}) + \mathbf{B}(t)\phi_2(u_t) + \mathbf{C}(t)\epsilon_t$$



Conditional Mean

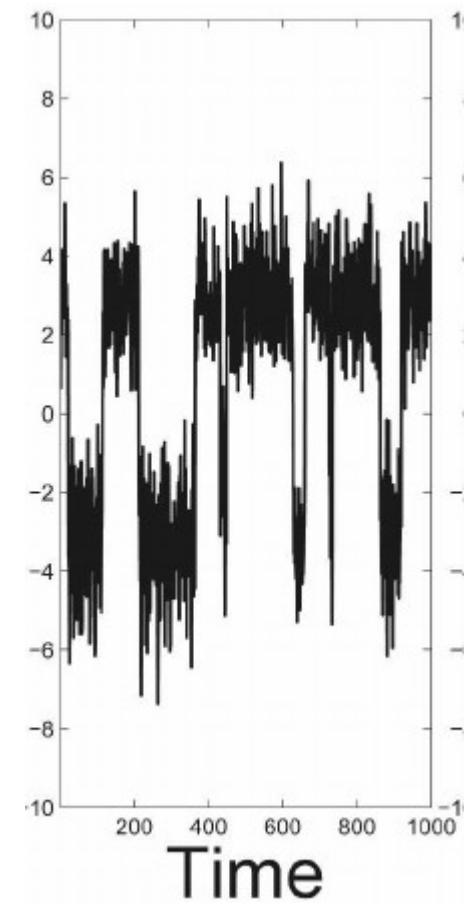


# Space-Time Clustering

Finite Element, Bounded Variation,  
Vector Autoregressive Factor  
**FEM-BV-VARX method:**

$$\mathbf{x}_t = \mu_t + \mathbf{A}_q(t)\phi_1(x_{t-\tau}, \dots, x_{t-m\tau}) + \mathbf{B}(t)\phi_2(u_t) + \mathbf{C}(t)\epsilon_t$$

Vector Autoregressive Components



# Space-Time Clustering

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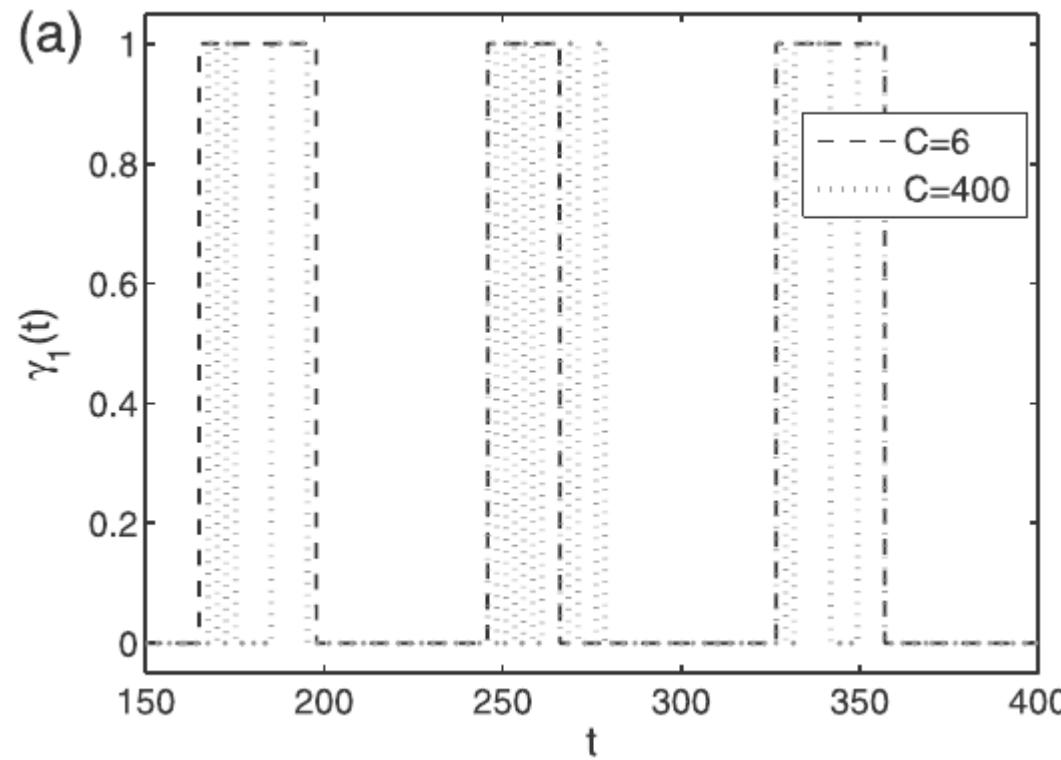
Finite Element, Bounded Variation,  
Vector Autoregressive Factor  
**FEM-BV-VARX method:**

$$\mathbf{x}_t = \mu_t + \mathbf{A}_q(t)\phi_1(x_{t-\tau}, \dots, x_{t-m\tau}) + \mathbf{B}(t)\phi_2(u_t) + \mathbf{C}(t)\epsilon_t$$



External Factor Component

# Space-Time Clustering

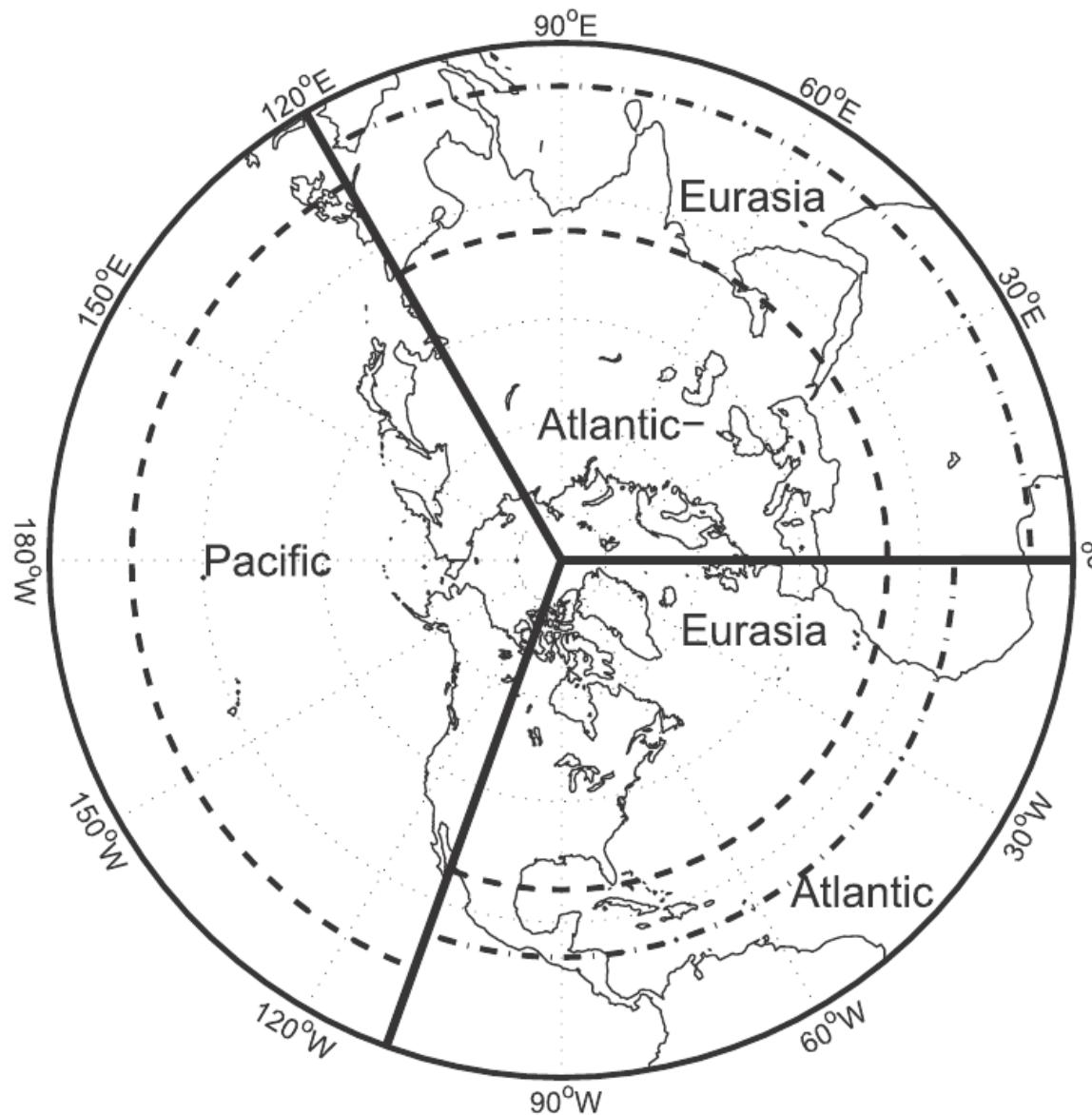


Imposing persistency  
by enforcing a maximum  
number of switches

$$|\gamma_i|_{BV(0,T)} = \sum_{t=0}^{T-1} |\gamma_i(t+1) - \gamma_i(t)| \leq C,$$

# NH Metastable Regimes

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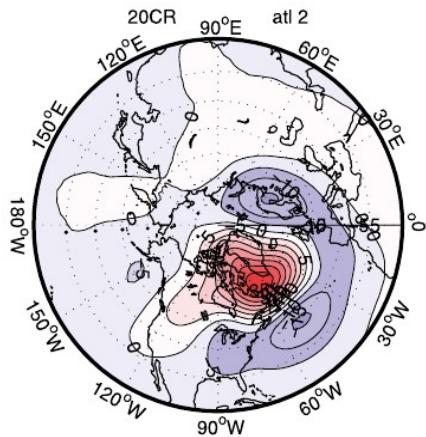
# NH Metastable Regimes

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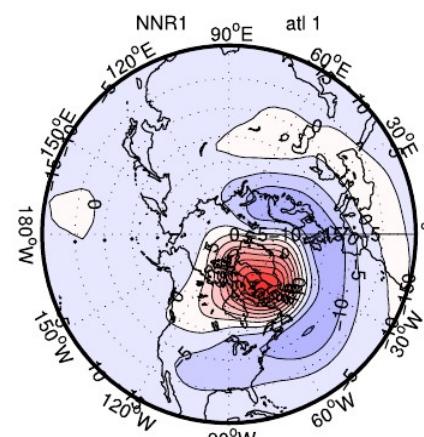
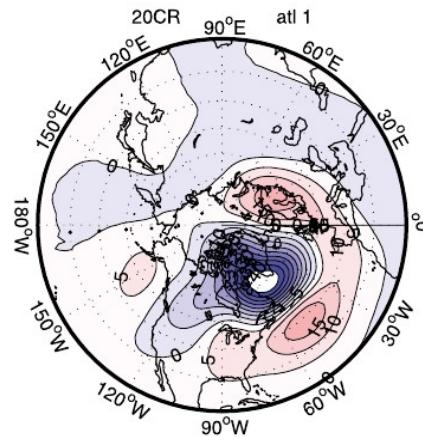
TABLE 1. Periods used for the FEM-BV-VARX analysis for the given reanalysis.

Expt	Reanalysis	Period
1	20CR	1871–2009
2	20CR	1948–2009
3	NNR1	1948–2009
4	NNR1	1979–2009
5	CFSR	1979–2009

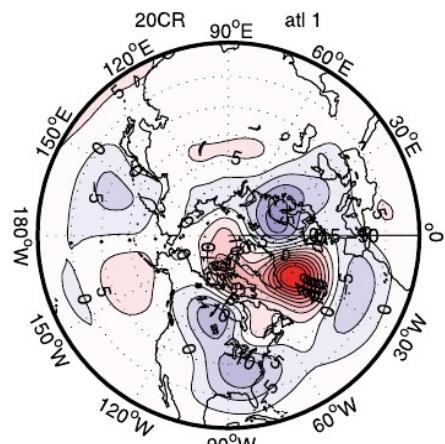
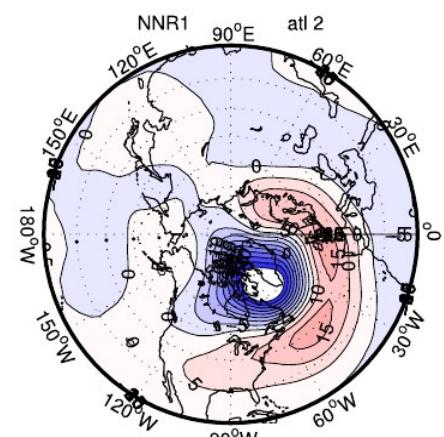
# North Atlantic Regimes



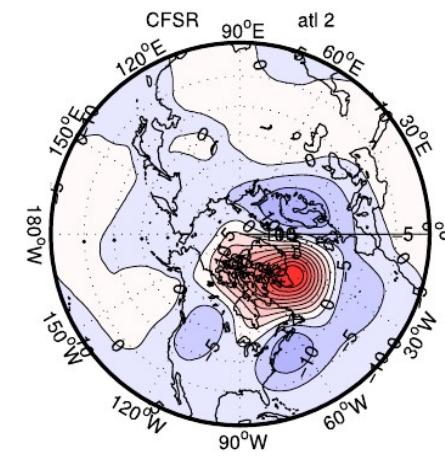
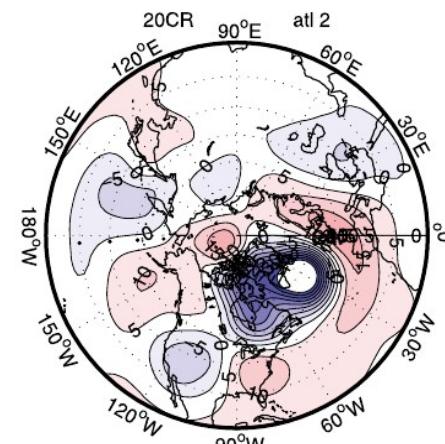
(a) 20CR 1871–2009



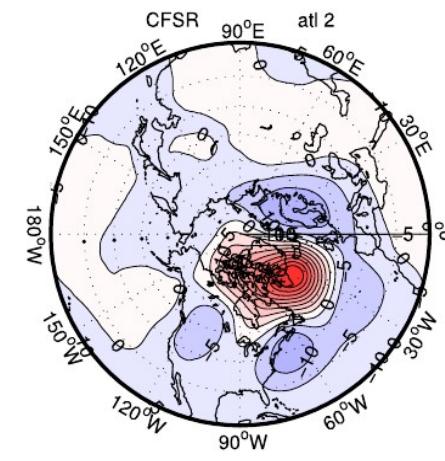
(c) NNR1 1948–2009



(b) 20CR 1948–2009

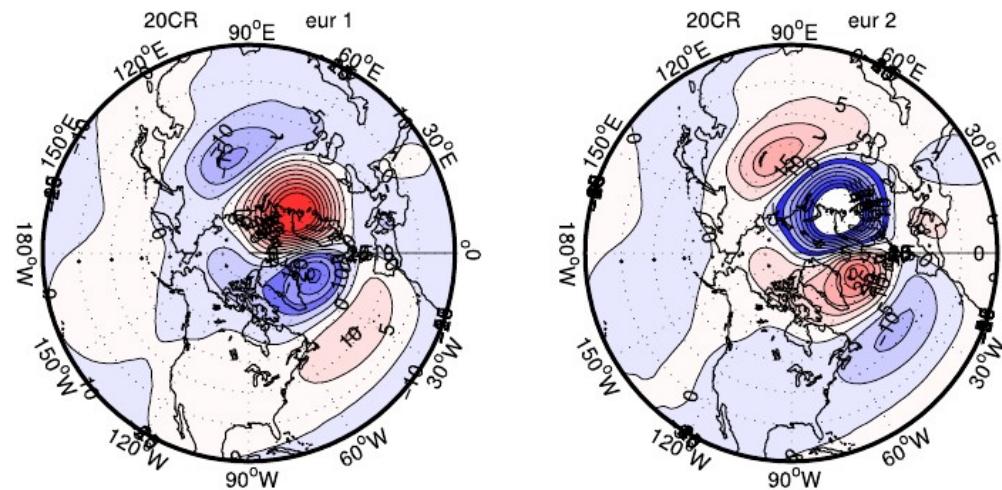


(d) CFSR 1979–2009

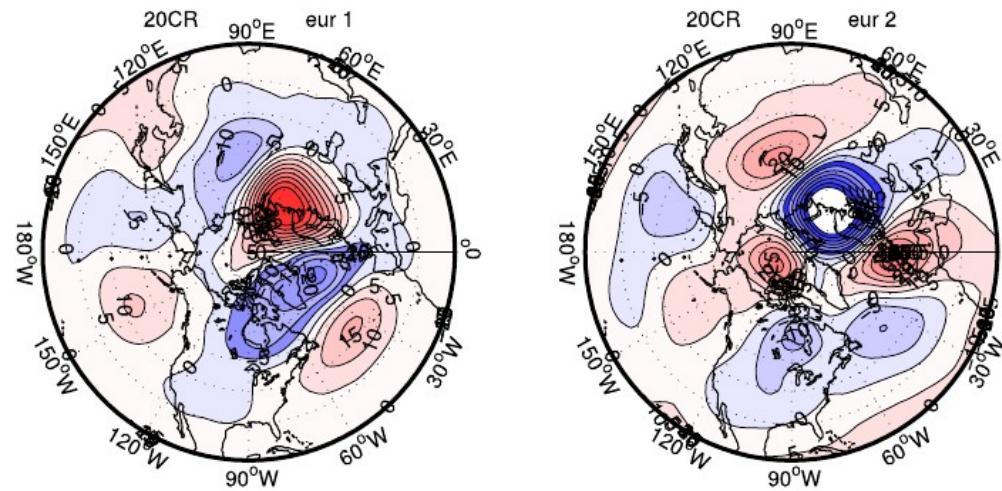


# Eurasian Regimes

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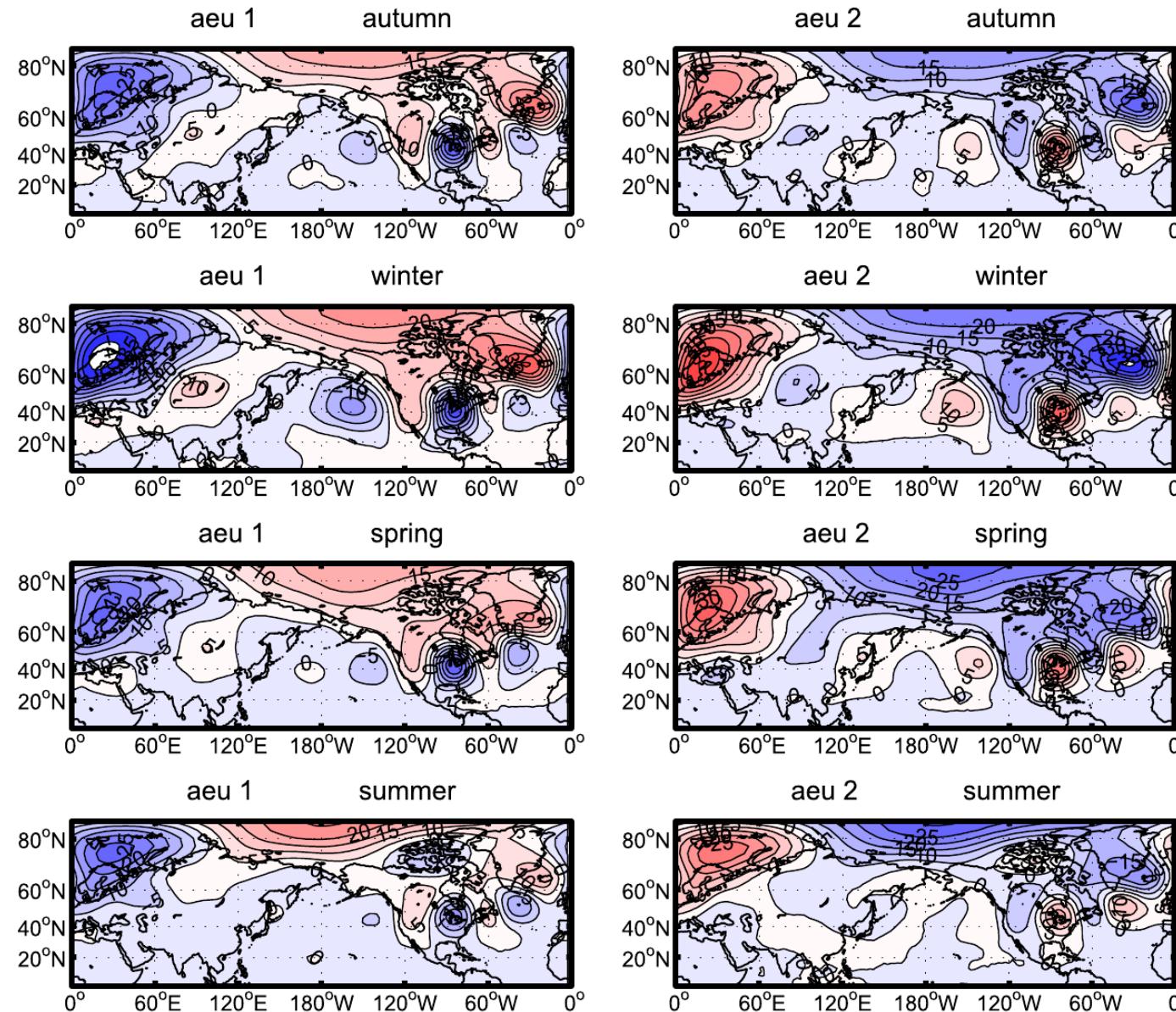


(a) 20CR 1871–2009



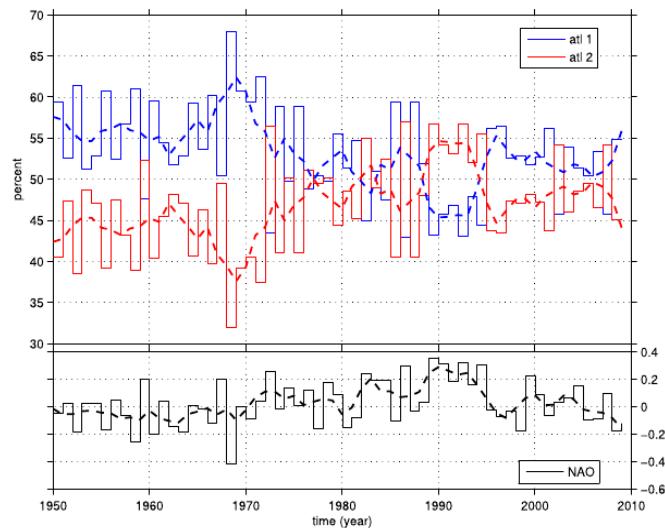
(b) 20CR 1948–2009

# Atlantic-Eurasian Regimes

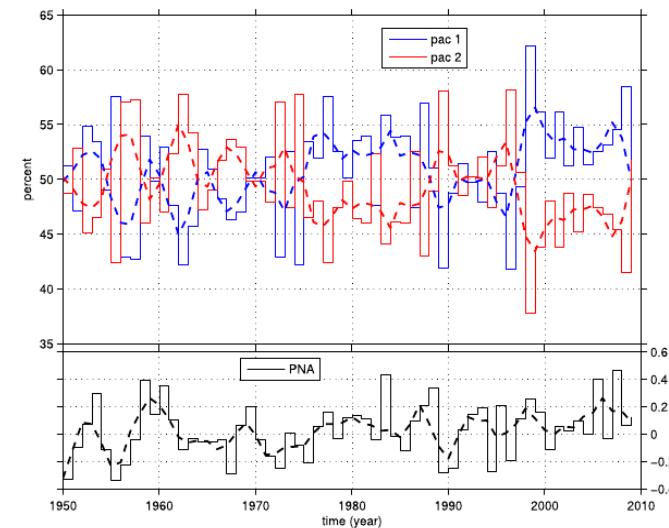


# Interannual Regime Variability

Corr=0.76

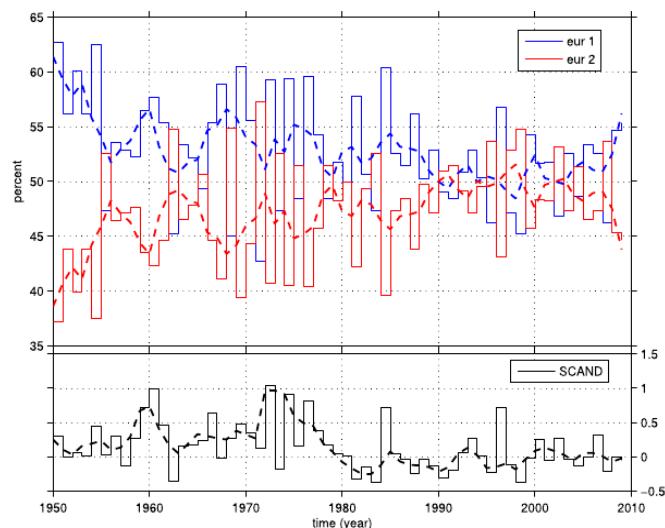


(a) Atlantic



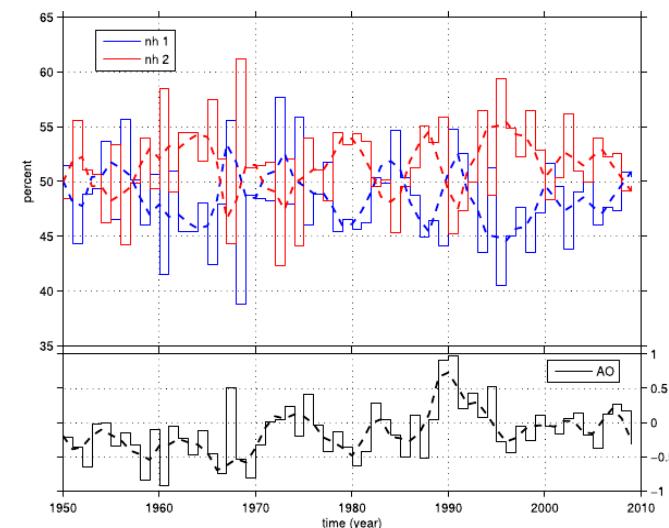
(b) Pacific

0.57



(c) Eurasia

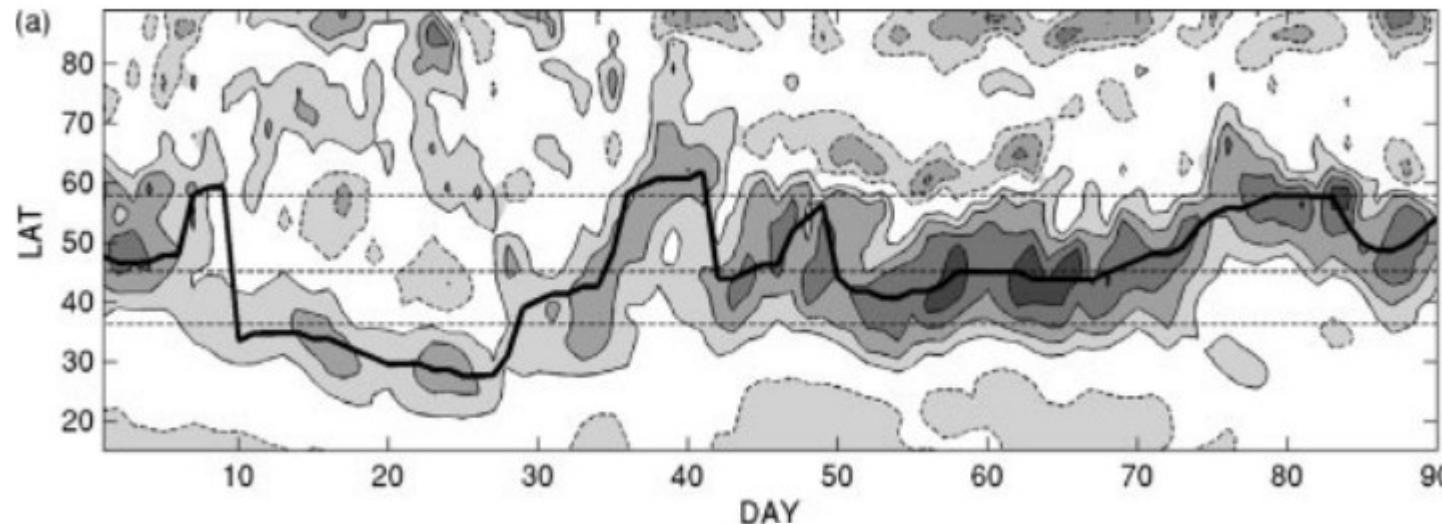
0.41



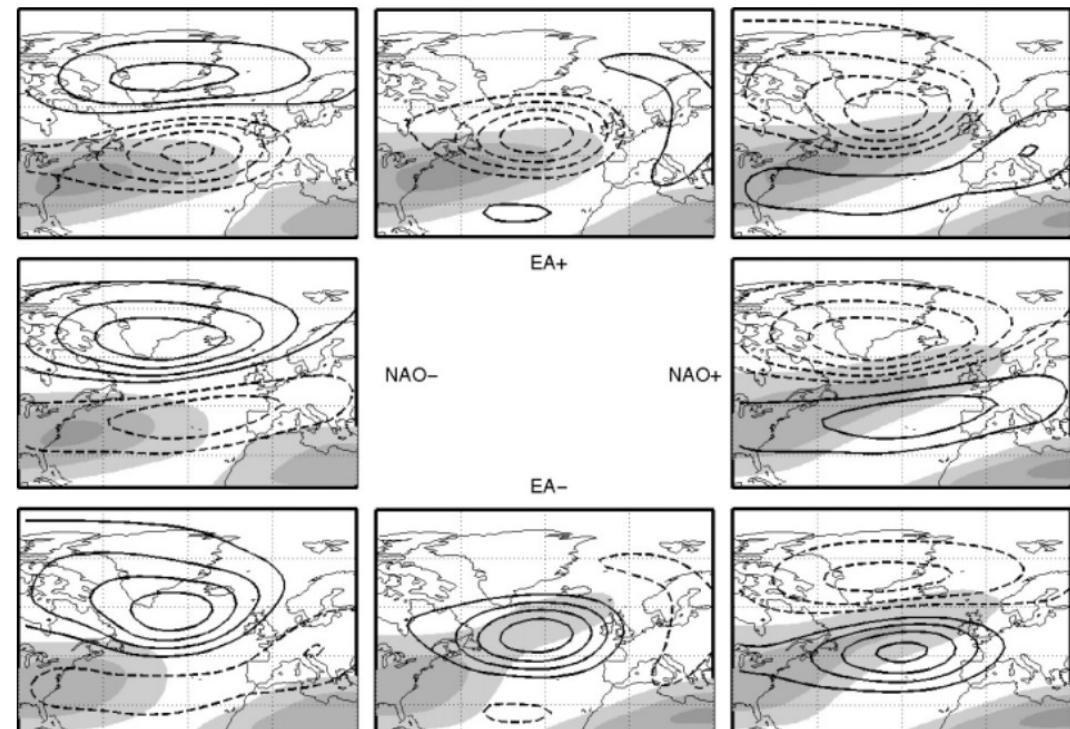
(d) Northern Hemisphere

0.35

# North Atlantic Jet Stream



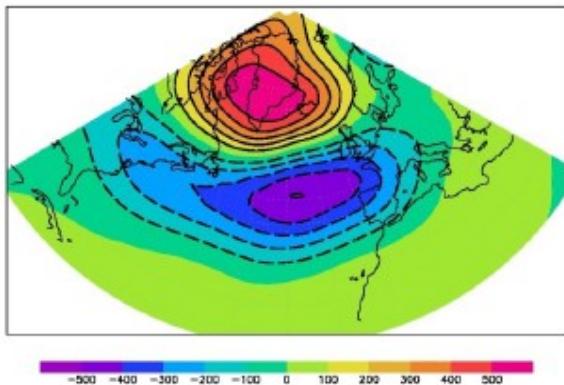
Jet Latitude  
Index



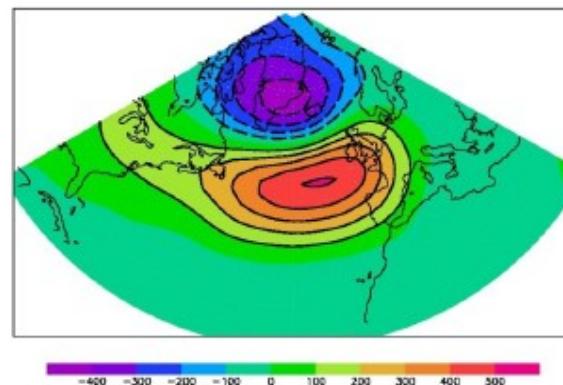
# North Atlantic Jet Stream

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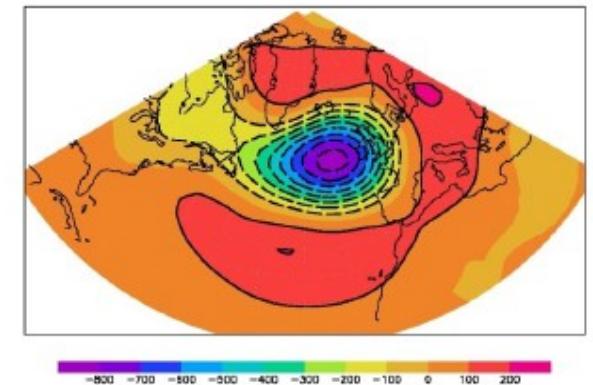
Southern Jet



Northern Jet



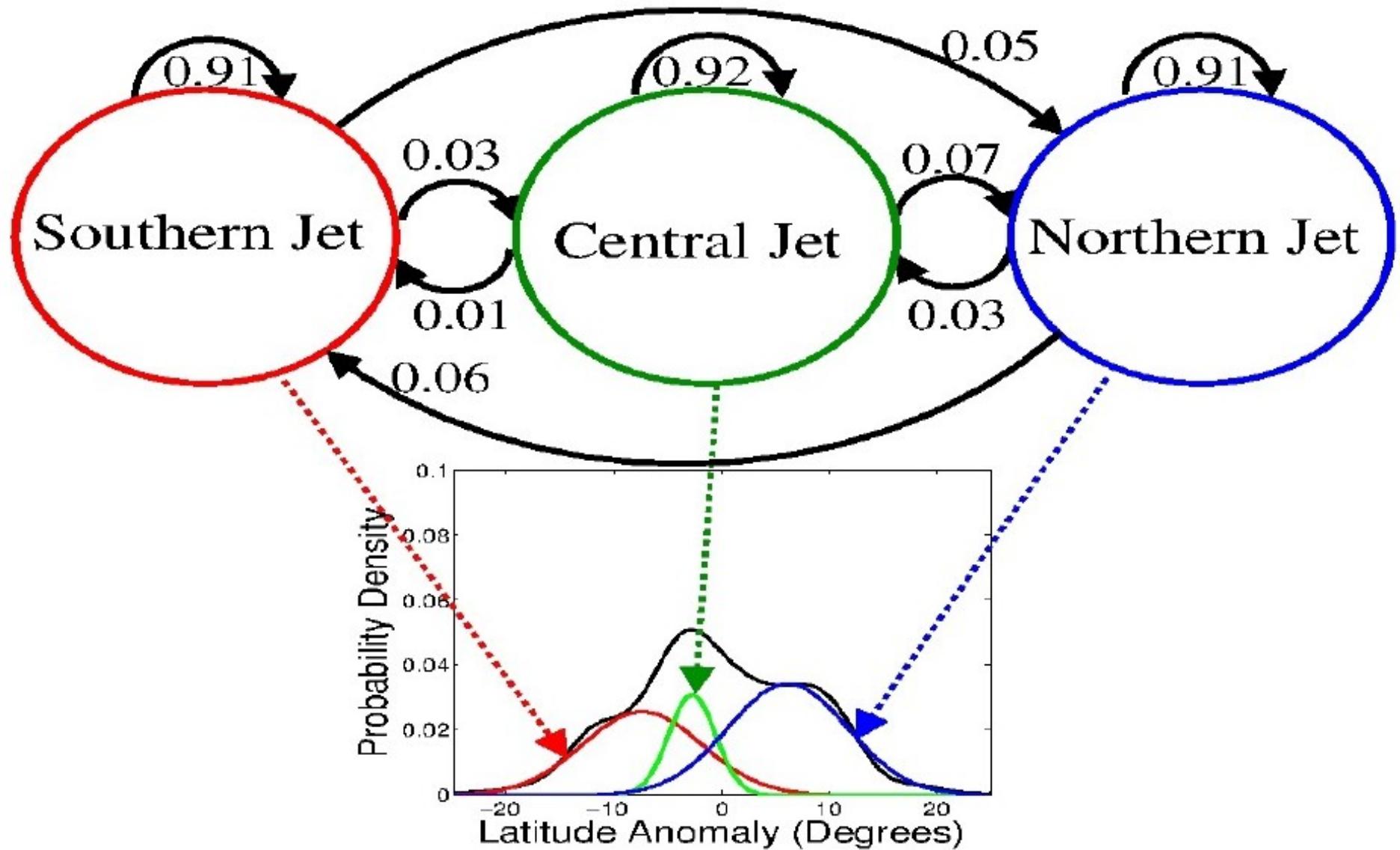
Central Jet



Anomalous 500 hPa Geopotential Height (Annual cycle subtracted)

Mixture of NAO and EA teleconnection Patterns (Woollings et al. 2010)

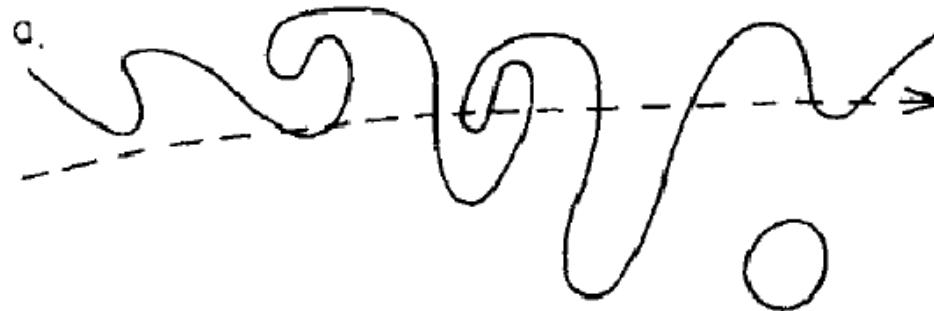
# North Atlantic Jet Stream



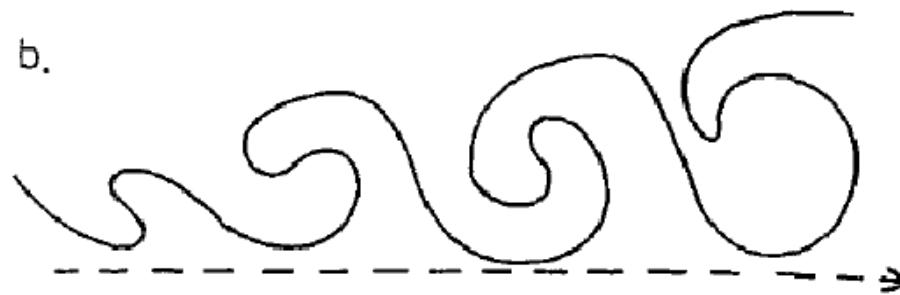
# North Atlantic Jet Stream

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LC1 (Anticyclonic)



LC2 (Cyclonic)



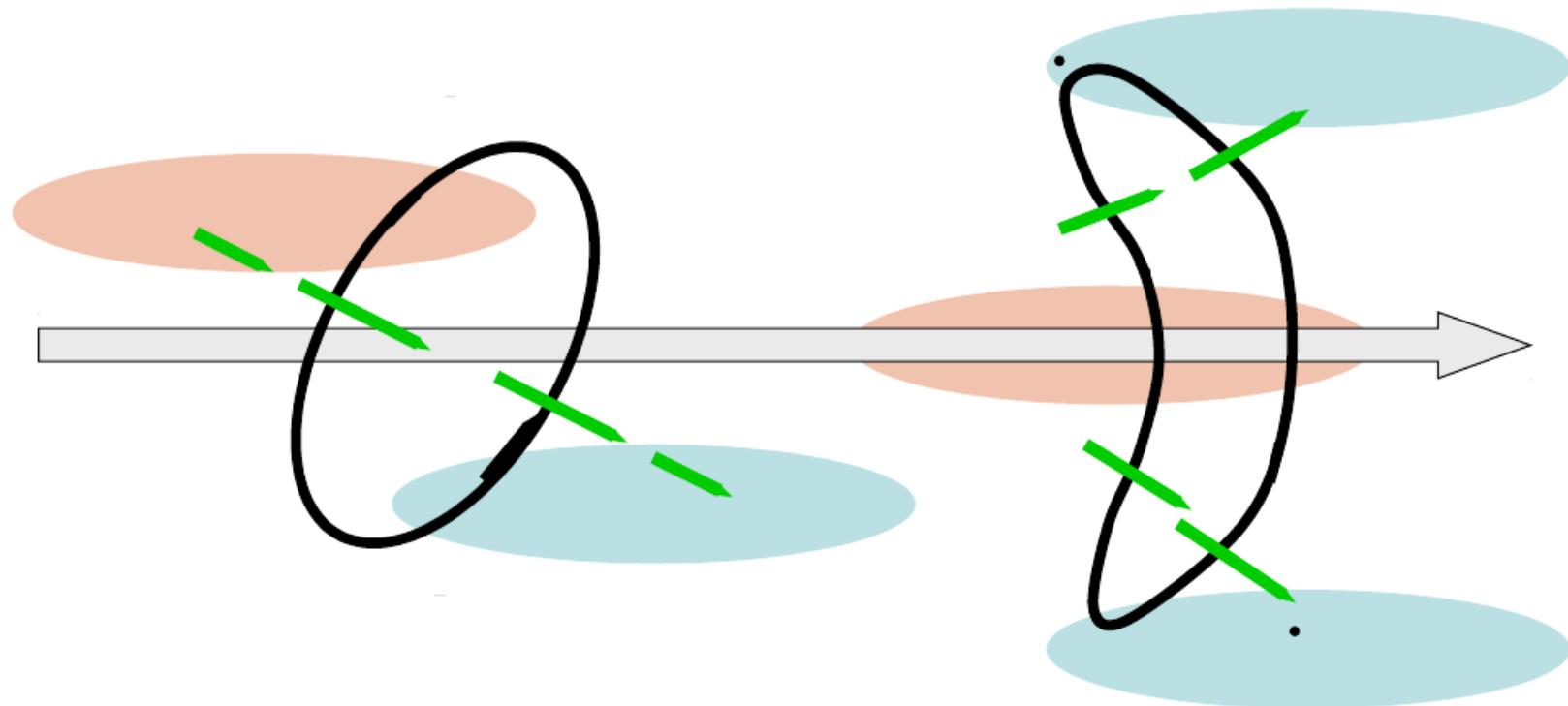
Side of jet determines shear, and so  
also the direction of wave-breaking

# North Atlantic Jet Stream

E Vectors ~ wave activity flux

Divergence : Accelerates westerlies

Convergence : Decelerates westerlies



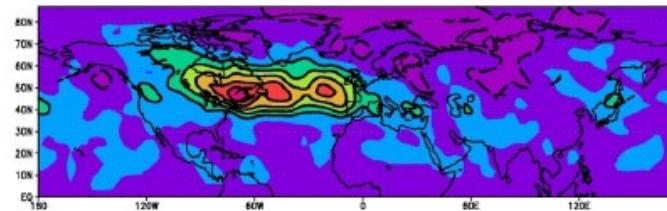
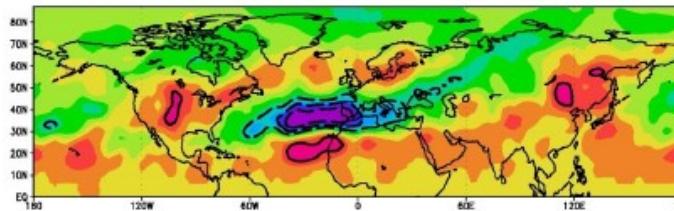
Hoskins et al 83

# North Atlantic Jet Stream

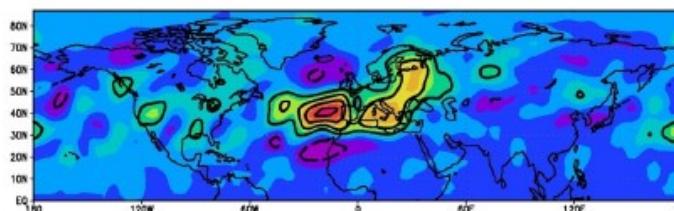
a) LC1 (Anticyclonic Wave Breaking)

b) LC2 (Cyclonic Wave breaking)

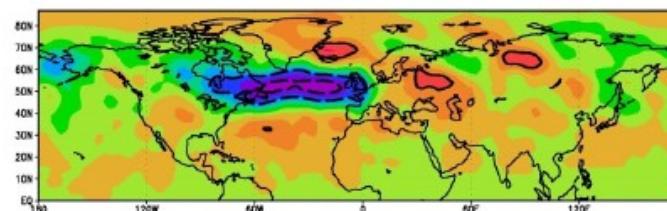
Southern Jet



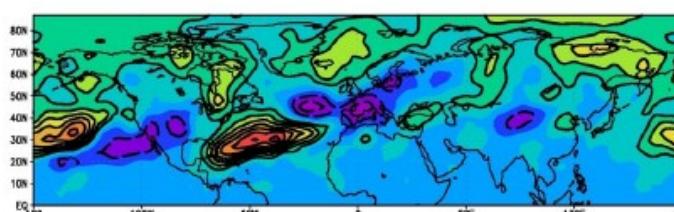
Northern Jet



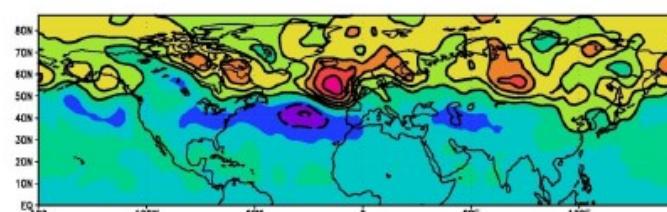
Northern Jet



Central Jet



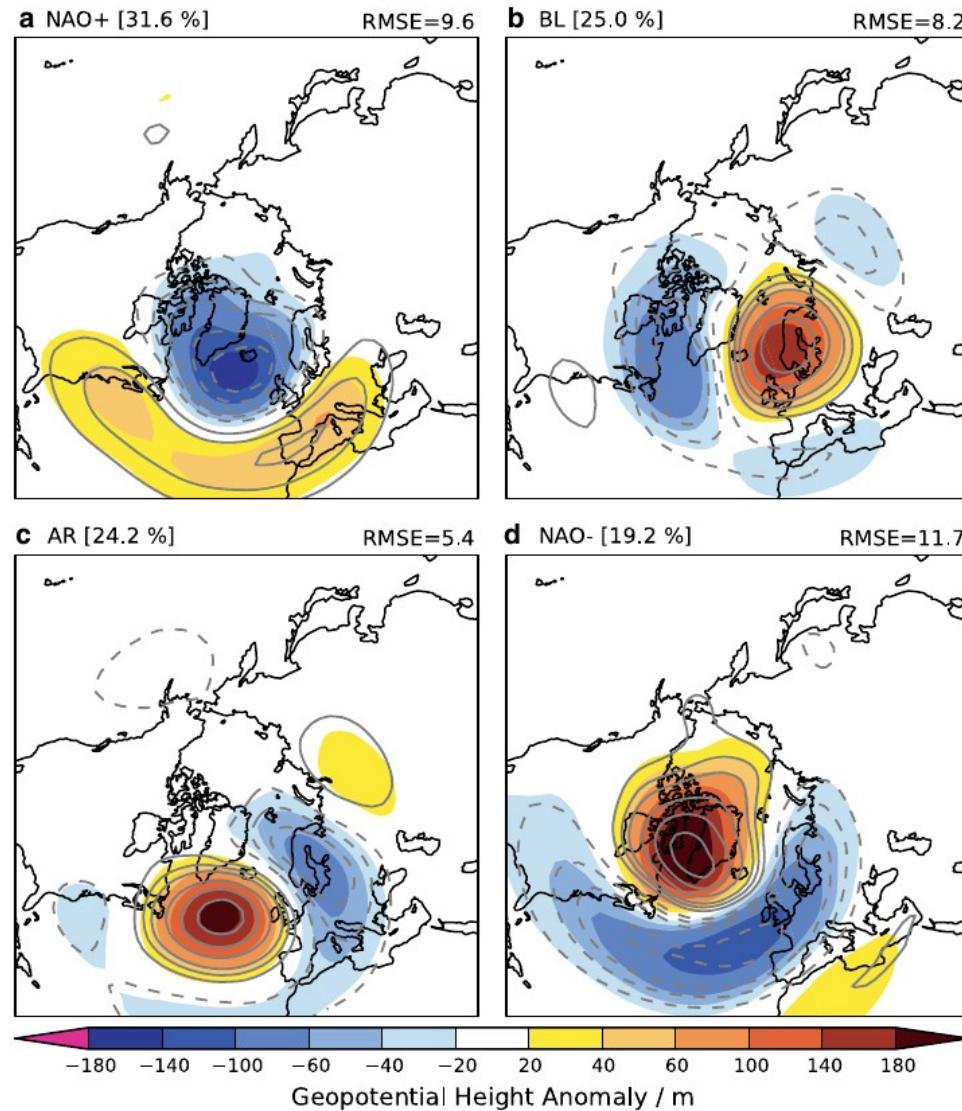
Central Jet



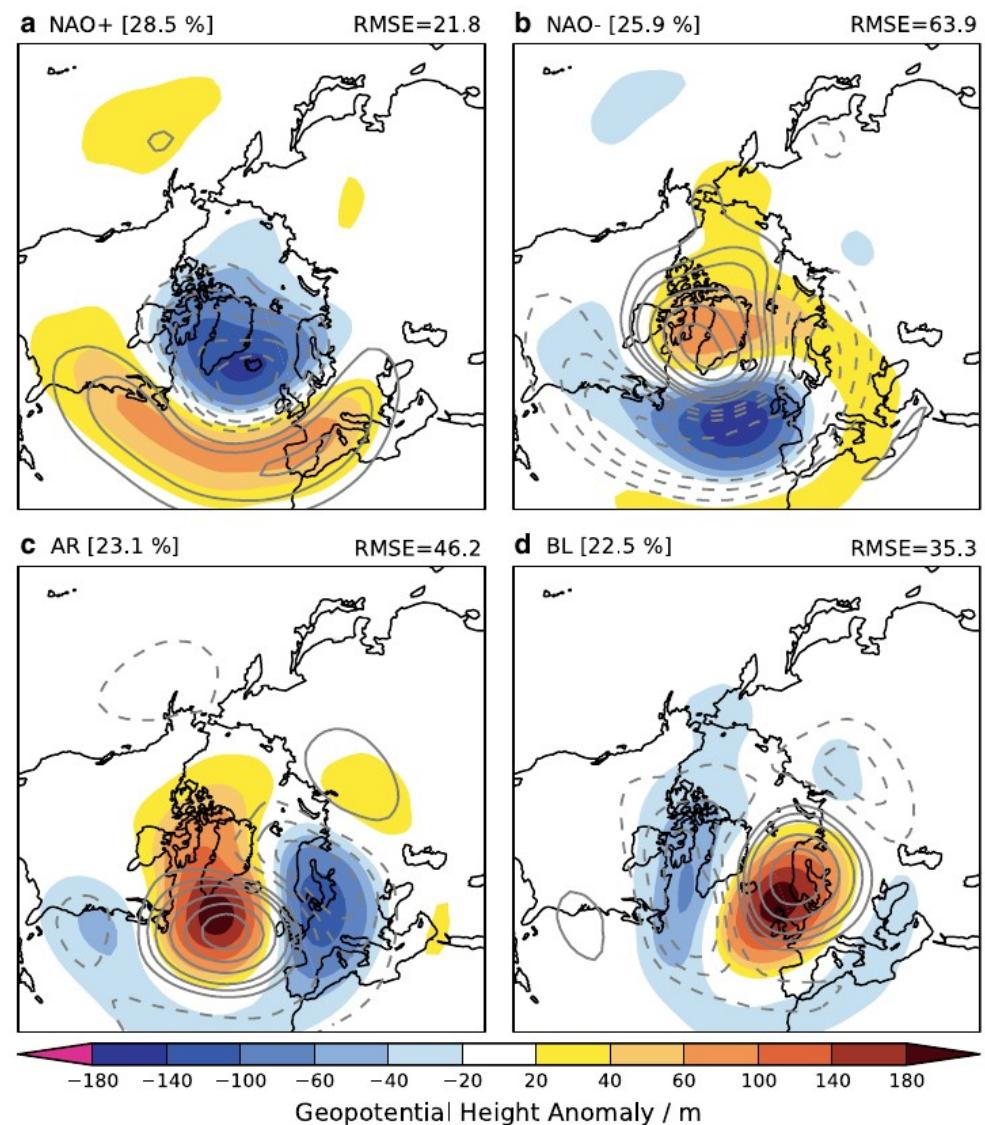
Rossby Wave Breaking; ECMWF reanalysis

# Regime Simulations

T1279

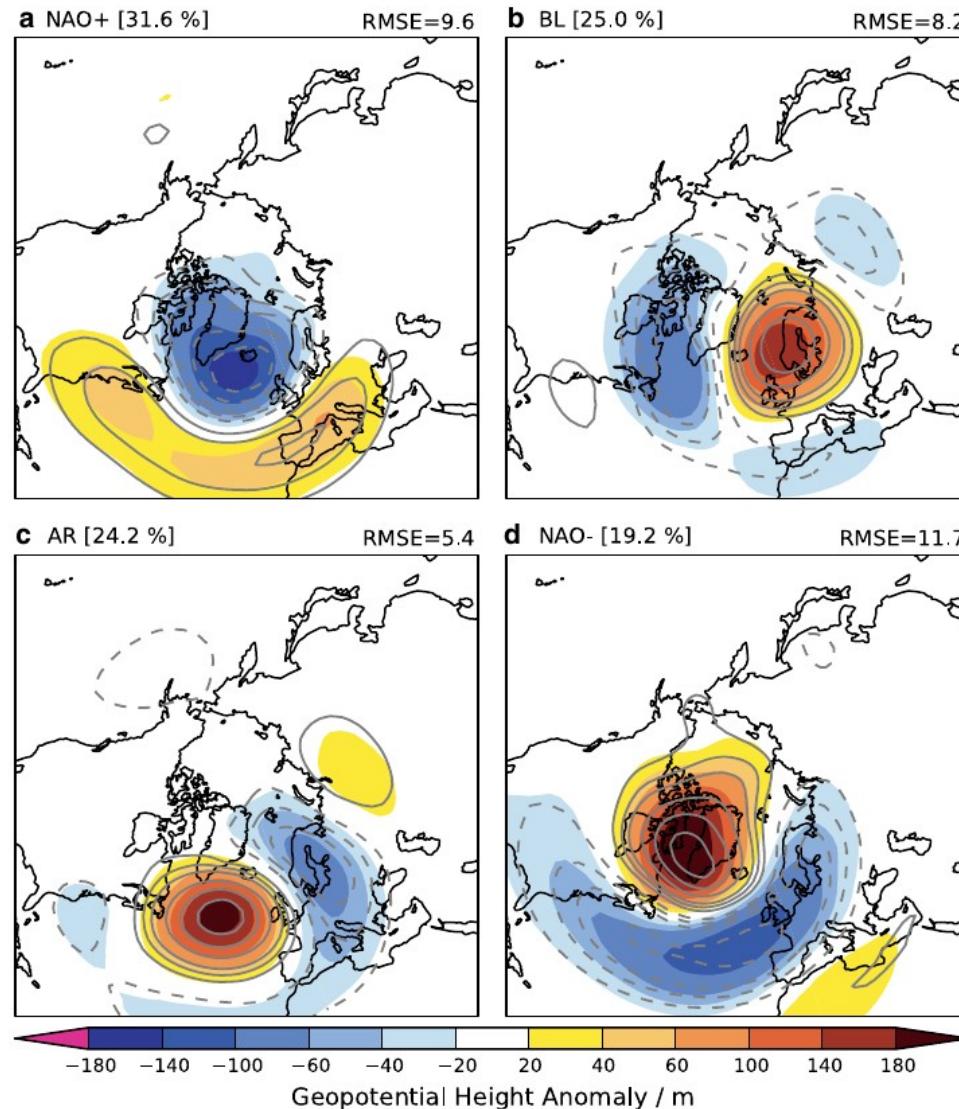


T159

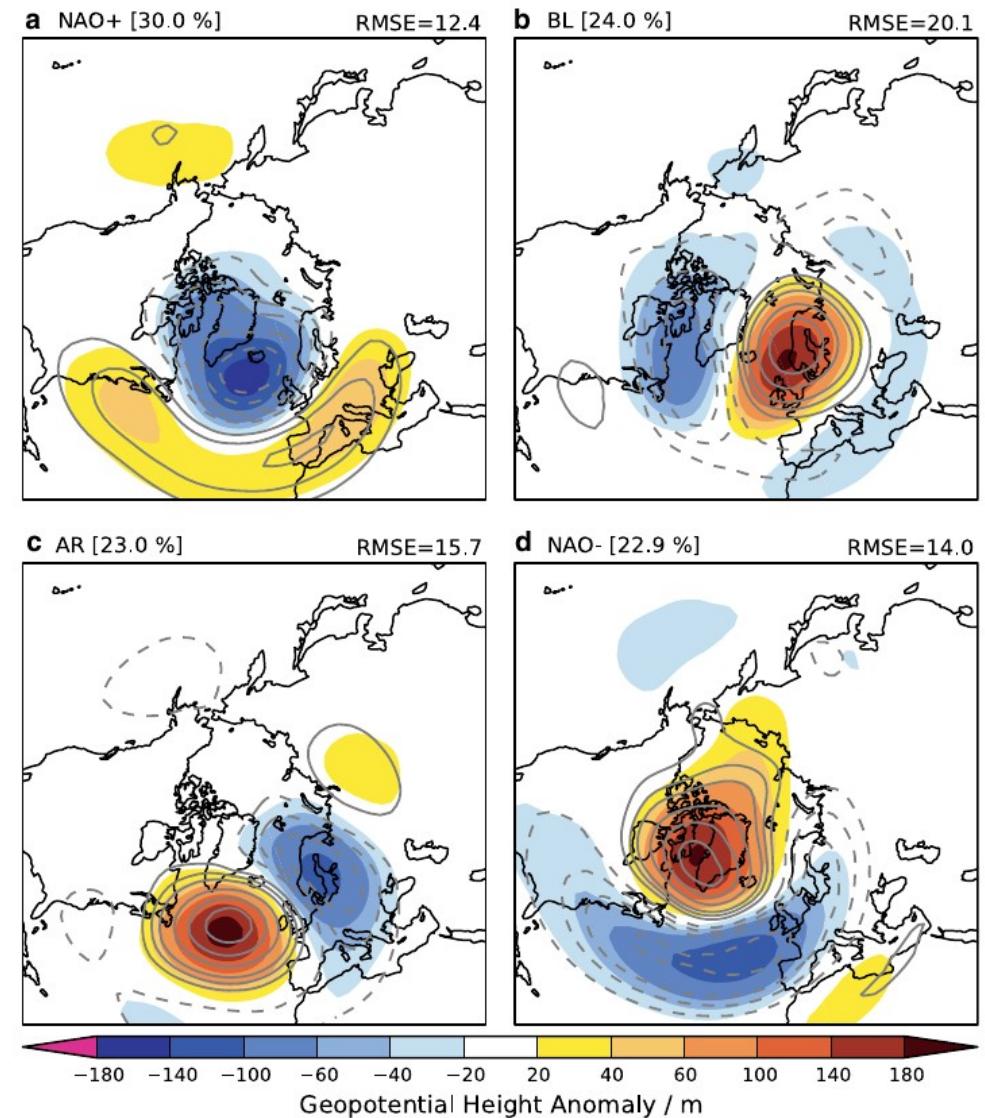


# Regime Simulations

T1279



T159, Stochastic Physics



# Attribution of Secular Changes

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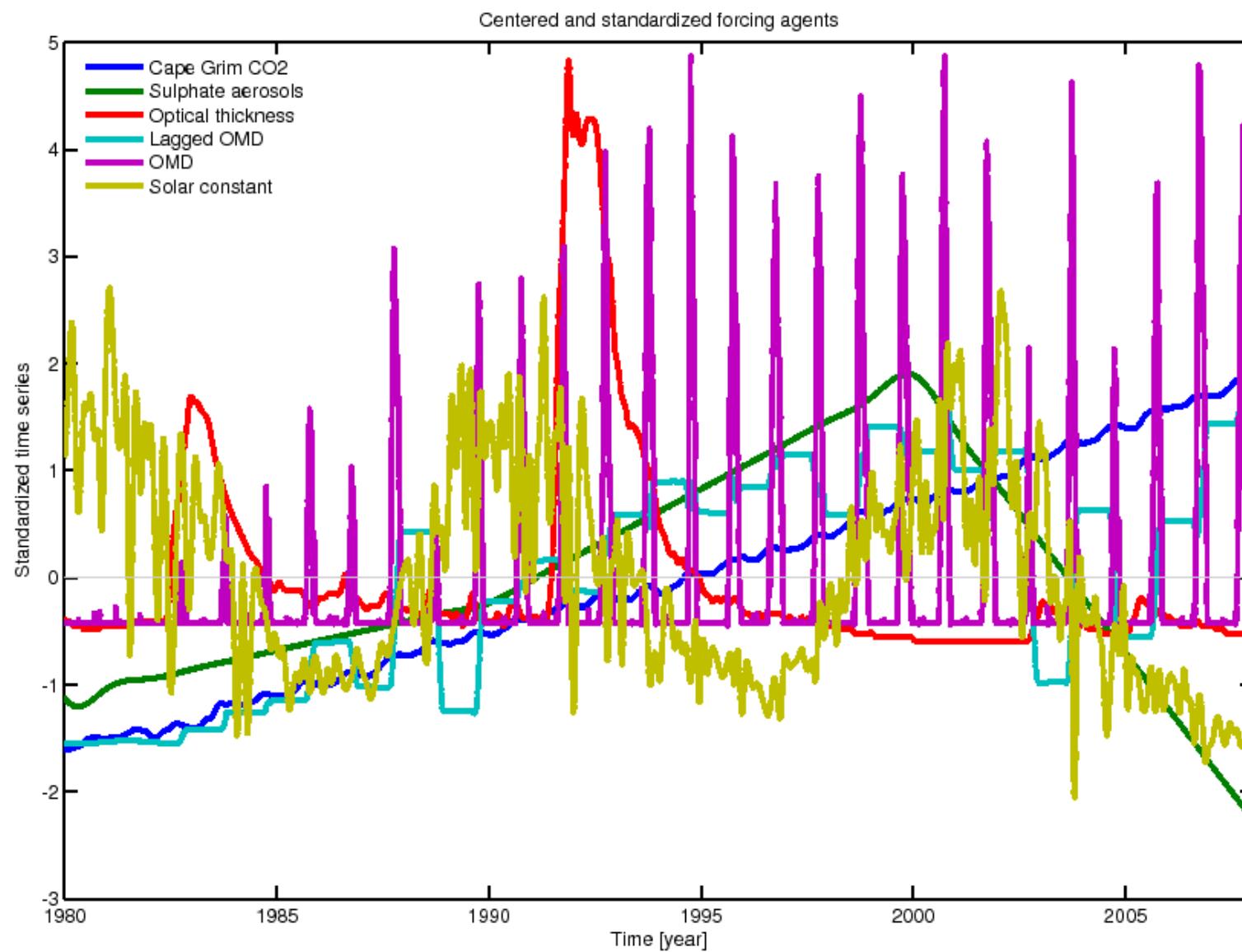
Finite Element, Bounded Variation,  
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External Factor Component

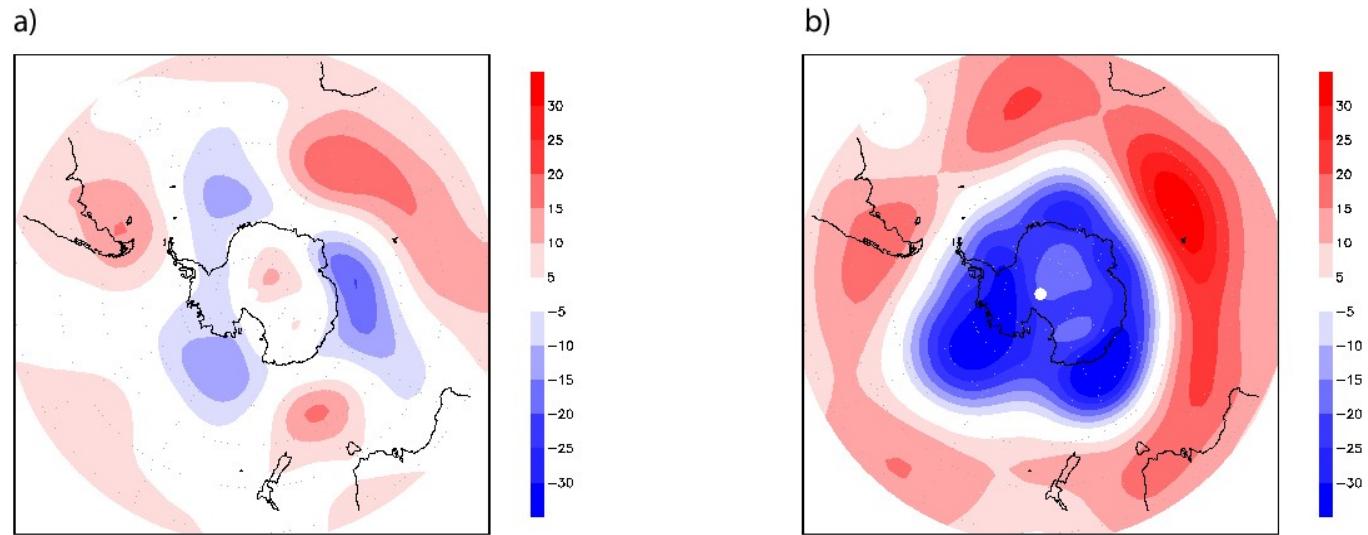
# SH Secular Circulation Trends



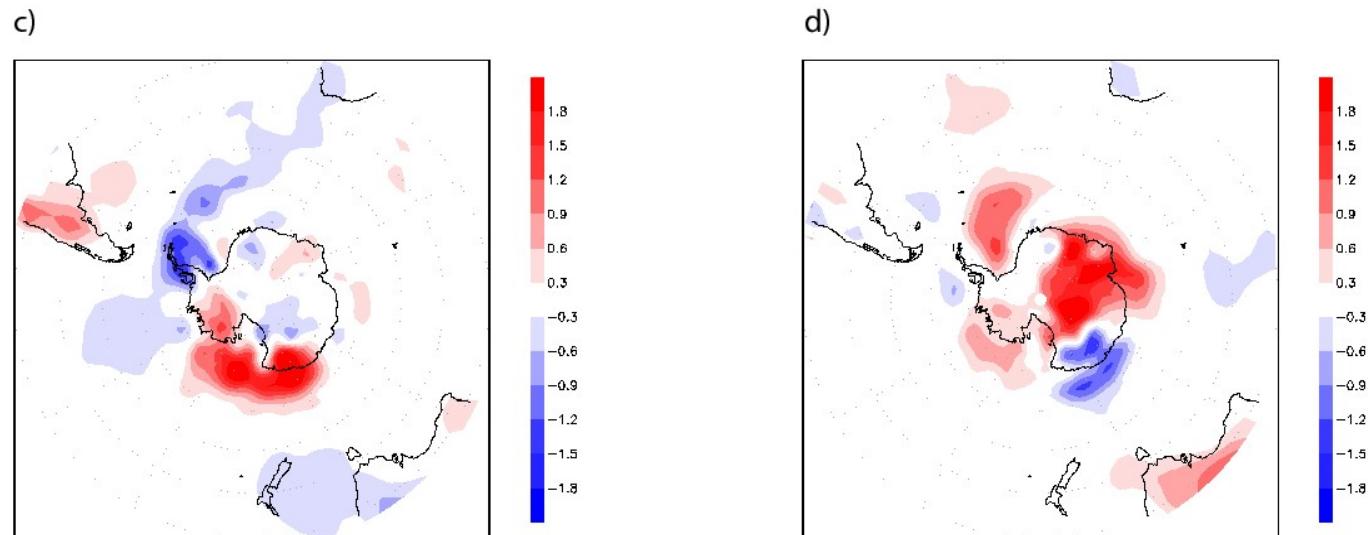
# SH Secular Circulation Trends

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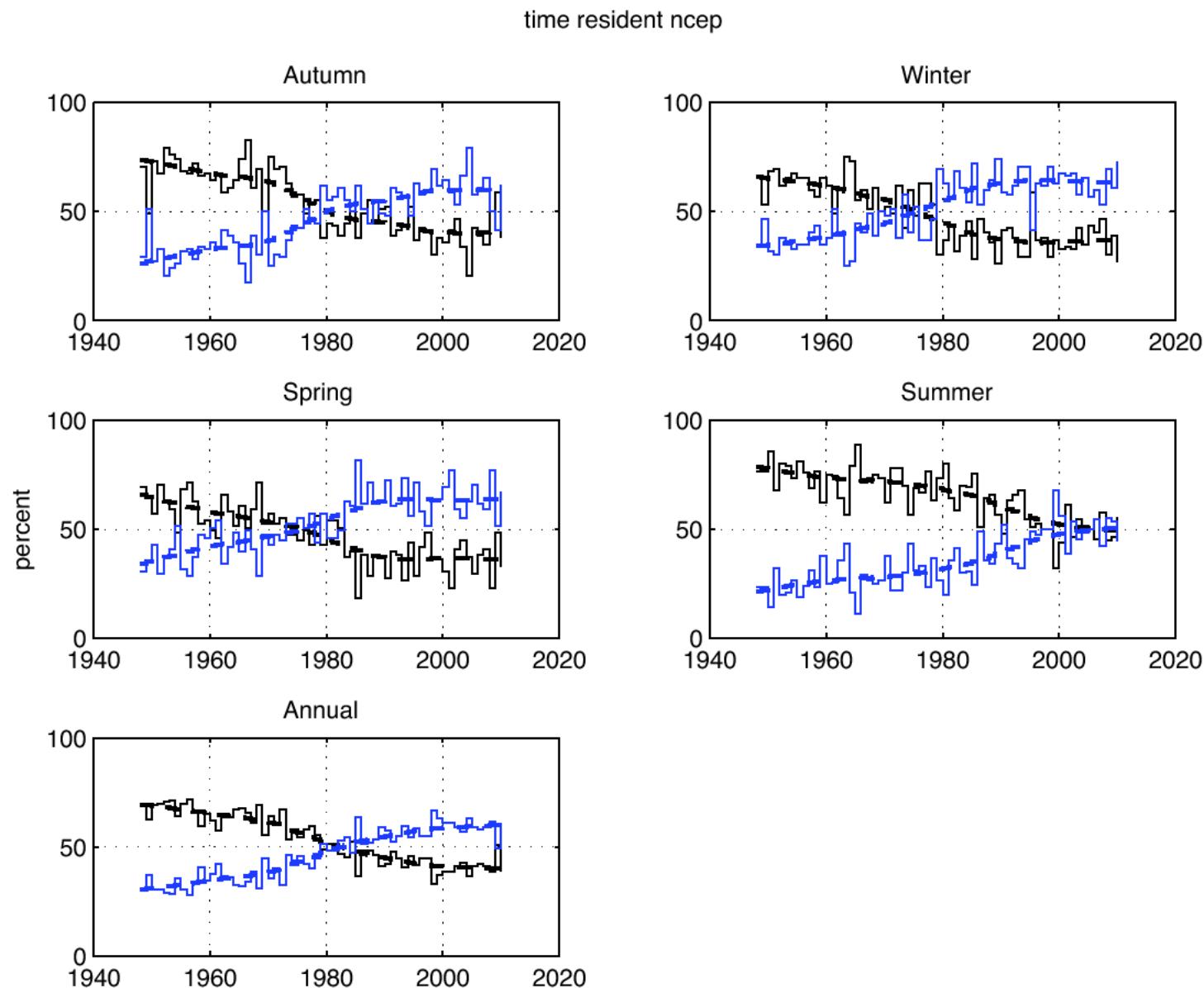
500 hPa  
Geopotential



Surface Air  
Temperature



# SH Secular Circulation Trends



# SH Secular Circulation Trends

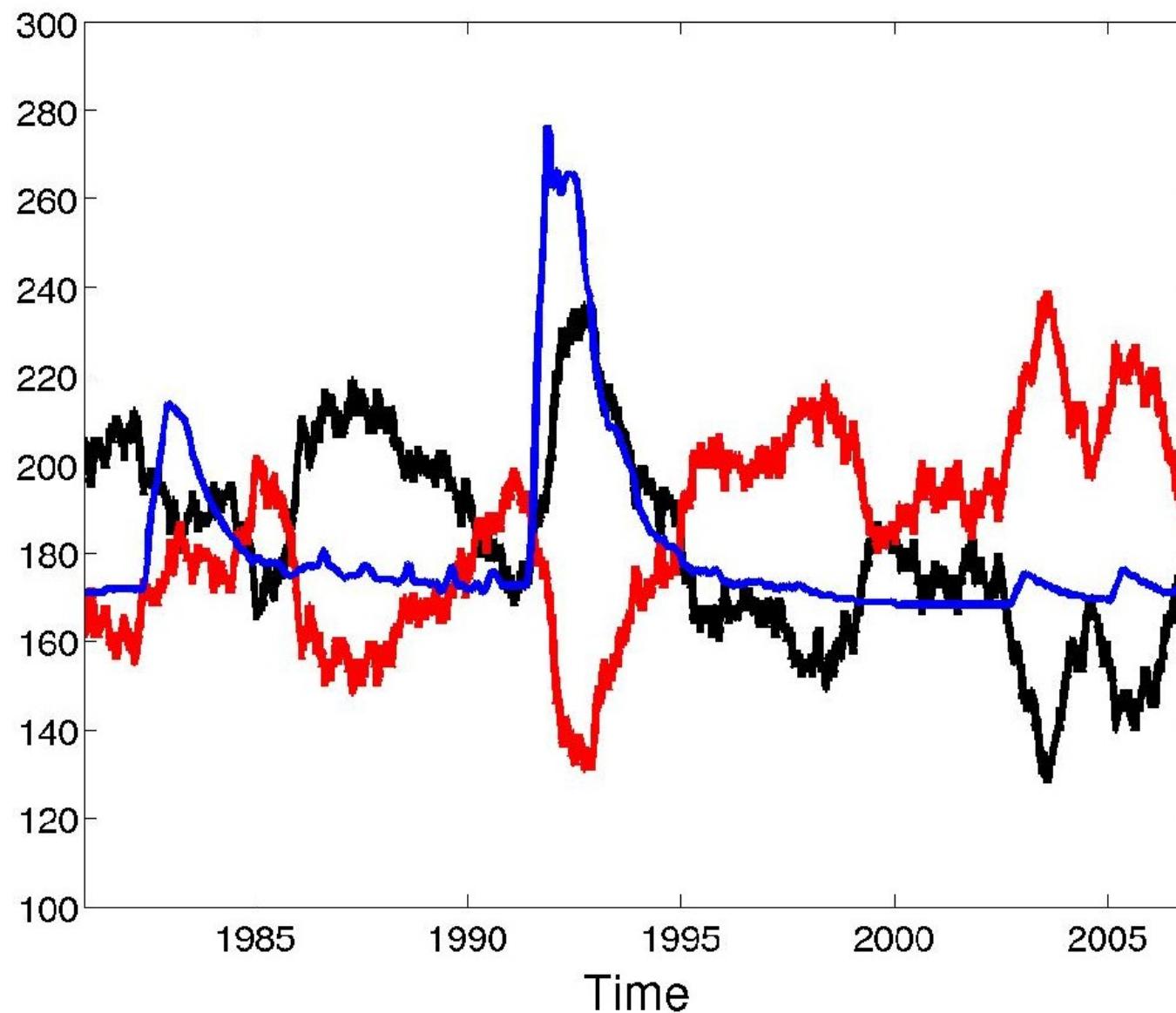
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Attribution Results:

- $\text{CO}_2 \text{ AIC}_{\min} = 63053$
- Akaike weight value reveals strong statistical support of  $\text{CO}_2$  compared to stratospheric Ozone:  
 $w_i = 3.1083e^{-18}$
- → Recovery of ozone has less relevance to changes in Southern Hemisphere extratropical circulation than projected in many modelling studies  
(e.g. Barnes et al., 2013; Shindell et al., 2004)

# SH Secular Circulation Trends

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# Summary

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- Space-Time Clustering
  - Non-Stationary clustering approach
  - In NH all important teleconnection have been found
- Attribution of secular changes
  - In SH CO<sub>2</sub> is more important than Ozone  
→ Recovery of Ozone hole might have less relevance than previously claimed

# References

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- Franzke, O'Kane, Monselesan, Risbey and Horenko, 2015: Systematic Attribution of Secular Southern Hemispheric Circulation Trends with Observational Forcing Data, *Nonlin. Proc. Geophys.*, in press.
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