

# Provinces of Air-Sea Interaction

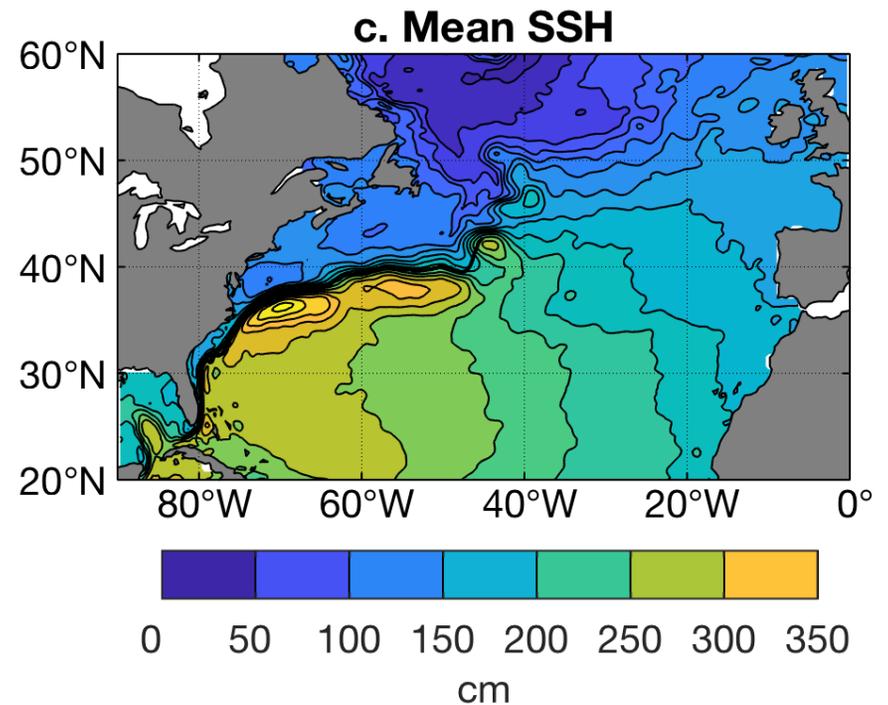
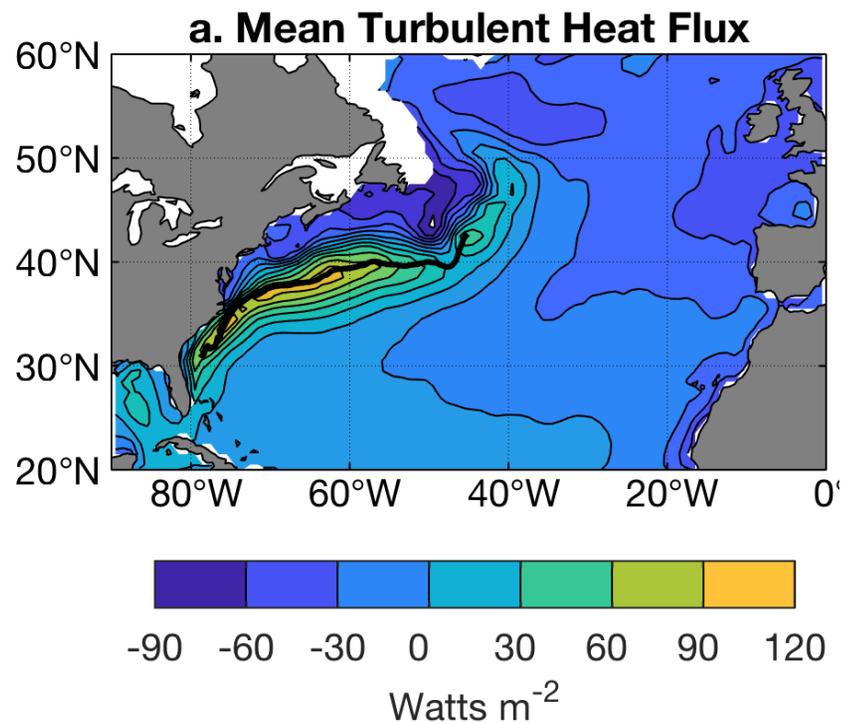
In the North Atlantic Ocean

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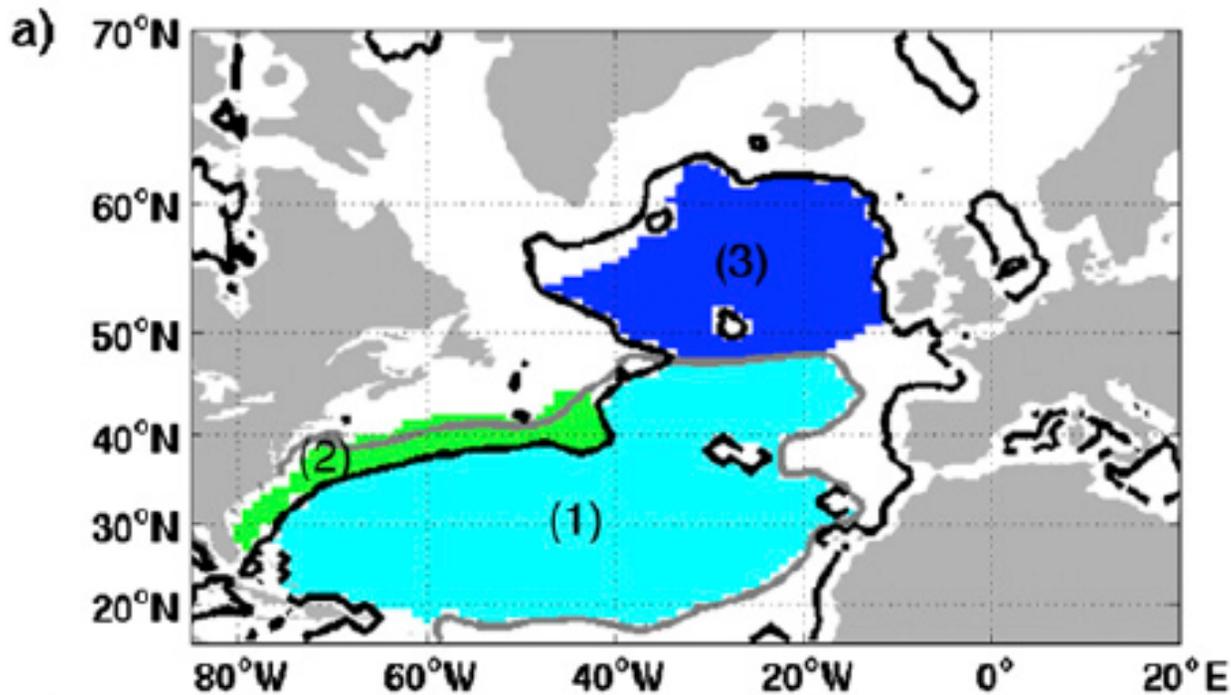
(1) University of Washington, (3) GFDL/Princeton  
NASA Ocean Surface Topography Science Team

In the mean: Turbulent flux of heat  
(latent+sensible.  $Q_{\text{turb}}$ ) driven by ocean  
heat transport convergence

Positive out of the ocean



Dominant contributions by region:  
Monthly timescale, heat budget of the  
upper ocean integrated to the  
maximum MLD in ECCO



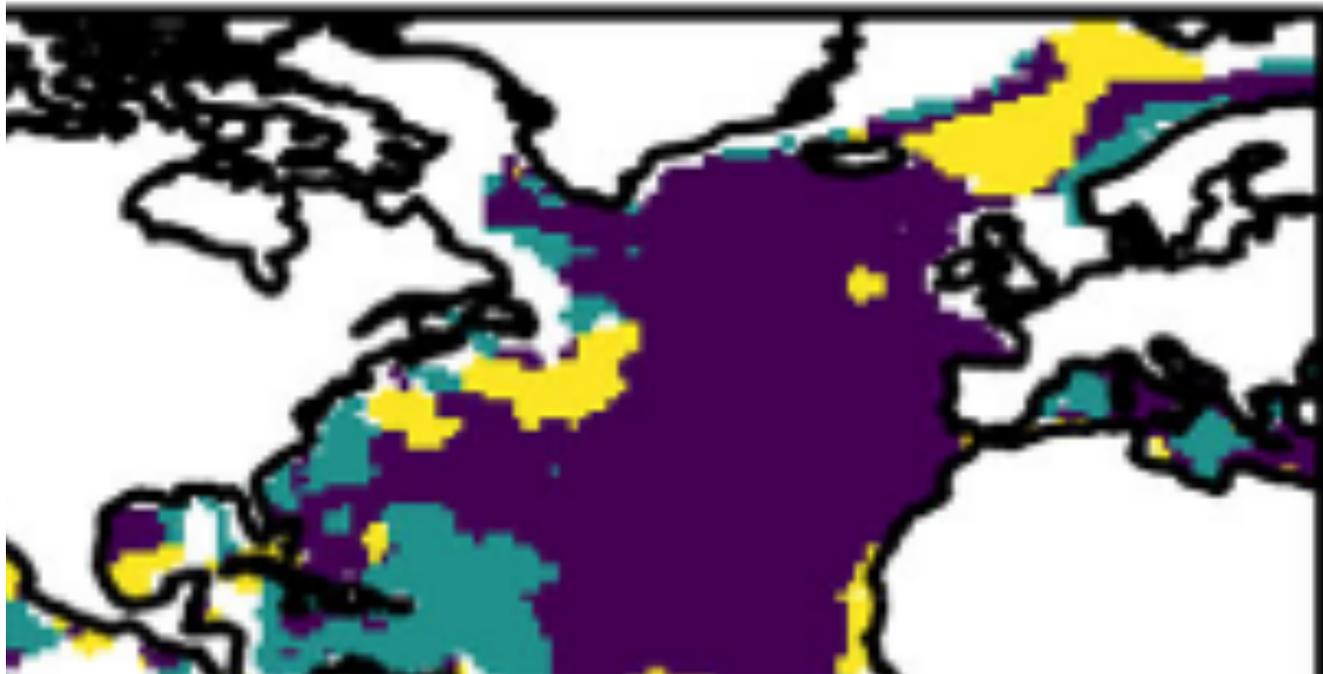
$Q_{\text{net}} + \text{Ekman}$

Geostrophic heat  
transport convergence  
anomalies and damping  
by air-sea fluxes

Air-sea fluxes balance  
bolus fluxes

Buckley et al, 2014

Similar results from observations based  
upper ocean heat budget on  
interannual time scales



Roberts et al, 2017

Analysis using surface observations alone to investigate provinces that define the dominant controls of the monthly upper ocean heat budget

Sea level anomaly (SLA) from CMEMS

Sea surface temperature SST from OISST

Turbulent flux of heat  $Q_{\text{turb}}$  from OAFLUX

Framed with a simple model of air-sea interaction

# Stochastic model of air-sea interaction: Frankignoul et al (1998)

Ocean heat content  
tendency

$Q_{\text{turb}}$

Radiative cooling


$$\rho C_p H \frac{dT_o}{dt} = -\lambda_q (T_o - T_a) - \lambda_r T_o$$

$\lambda_q$  Turbulent flux feedback

$\lambda_r$  Radiative flux feedback

$$\lambda_q \gg \lambda_r$$

Modification to include:

“ocean noise” =  $N_o$

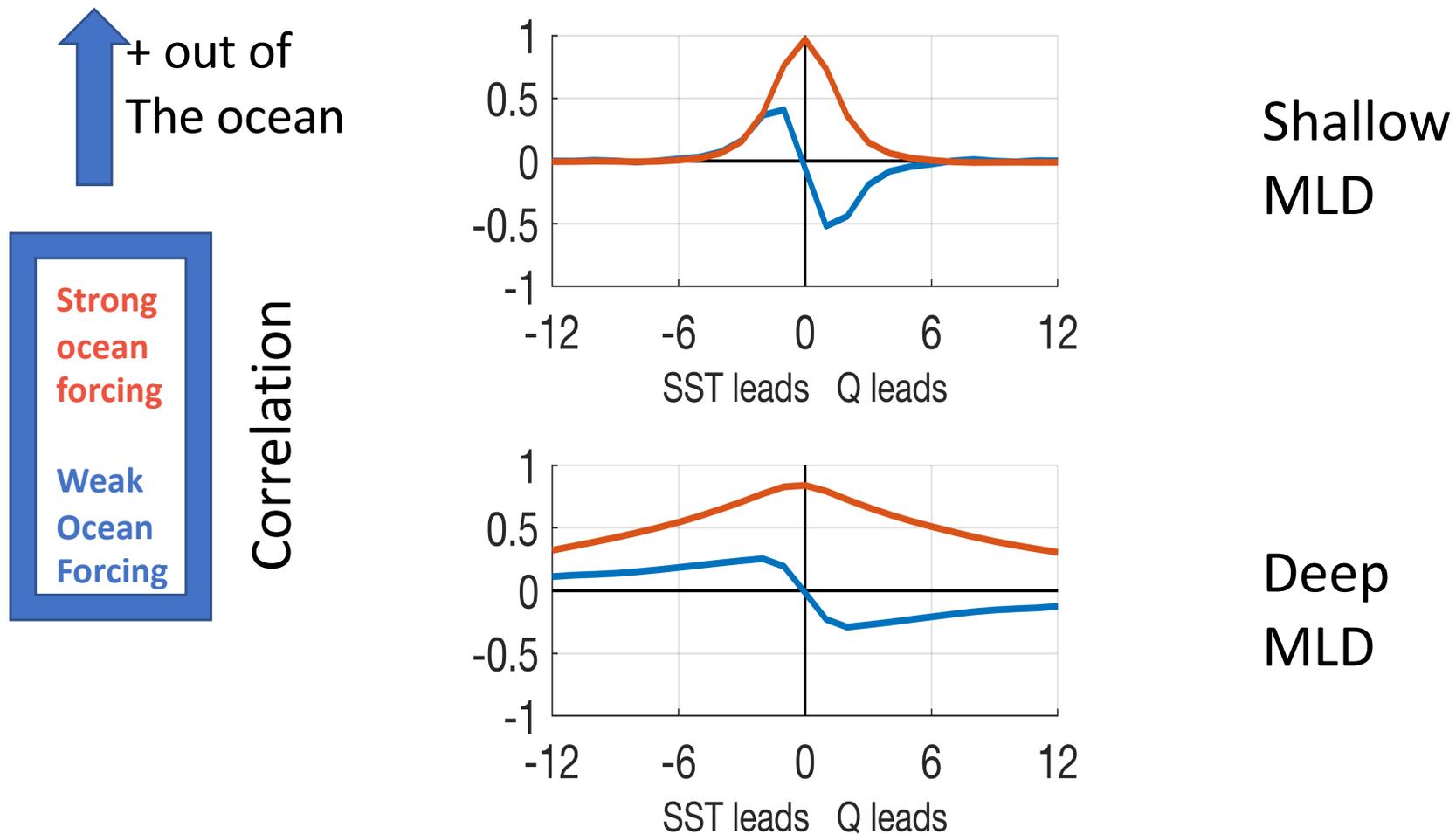
ocean heat transport convergence from all processes, vertical and horizontal

$$\rho C_p H \frac{dT_o}{dt} = -\lambda_q (T_o - T_a) - \lambda_r T_o + N_o$$

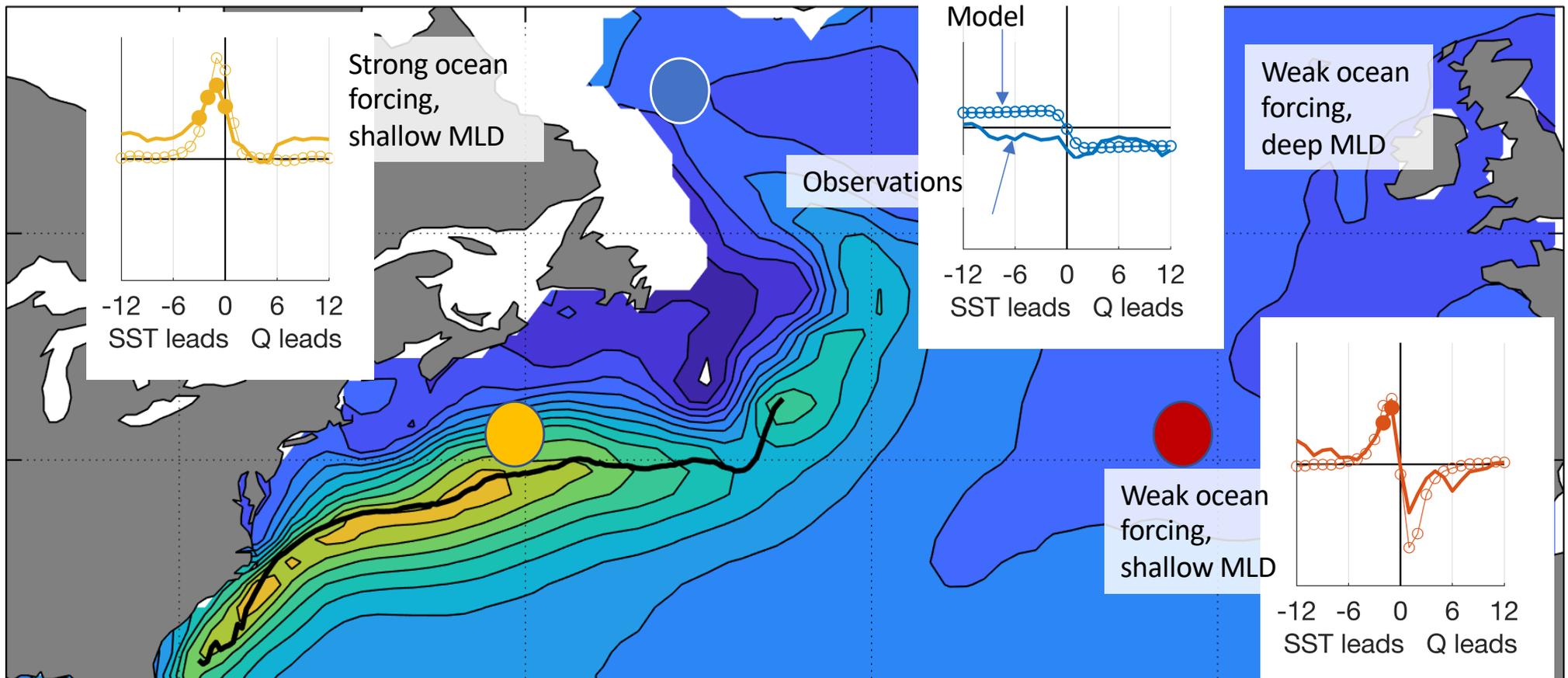
$T_a = N_a$  High Frequency Noise:  
atmospheric forcing

$N_o$  Low Frequency Noise coming  
from ocean heat transport  
convergence anomalies: ocean  
forcing

Lagged correlations between  $Q_{\text{turb}}$  and SST depend on depth of the upper ocean  
*and*  
the ratio of the atmospheric to oceanic forcing.



Air-sea interaction processes depends on location:  
lagged correlations of SST and  $Q_{\text{turb}}$  are consistent  
with solutions of the simple model



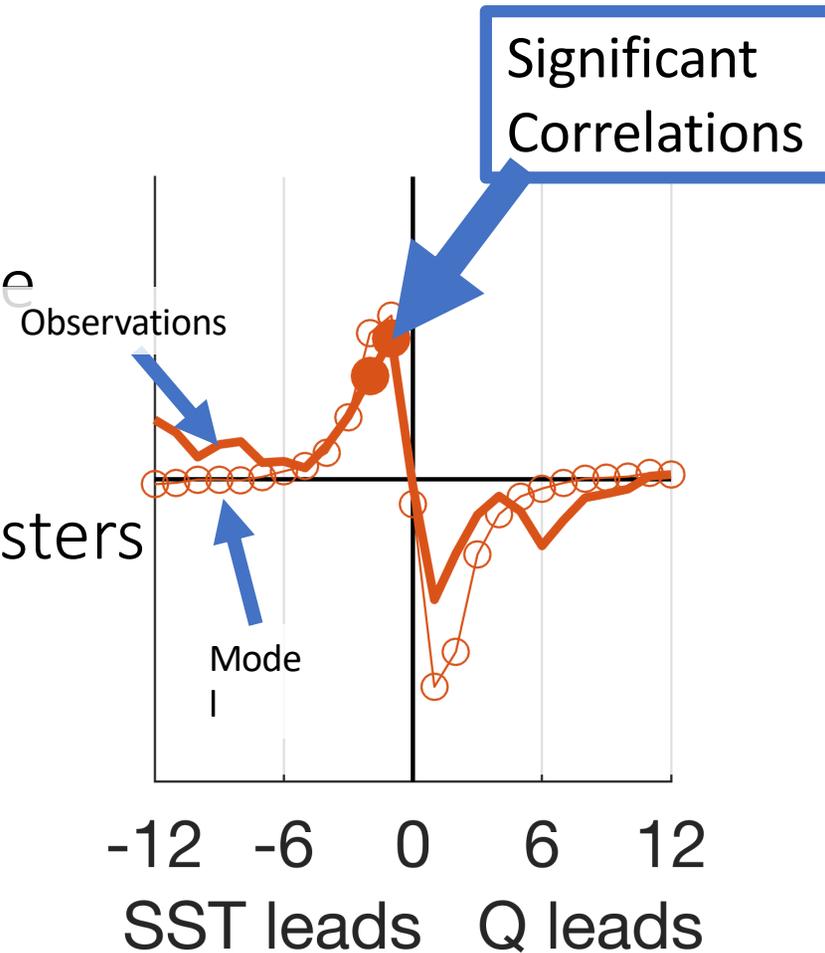
All fields smoothed to 100km full width at half max

# Characterization of provinces via clustering

Apply k-means clustering of lagged correlations patterns of SST and  $Q_{\text{turb}}$   
Minimizes the Euclidian Distance of the lagged-correlations within clusters

3 clusters: various test indicate 2-3 clusters

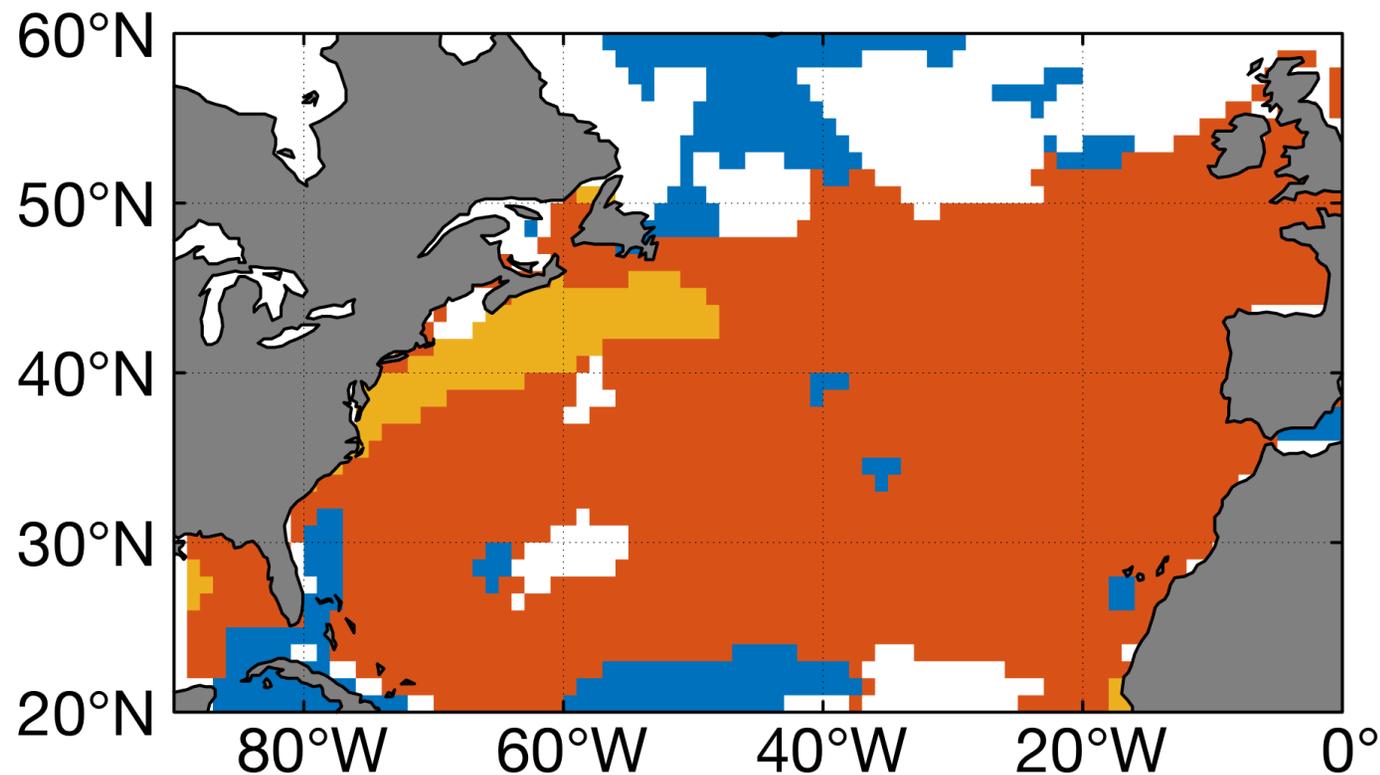
Only use locations with at least **one** significant lagged correlation



Clustering with k-means groups together similar lagged correlations patterns:

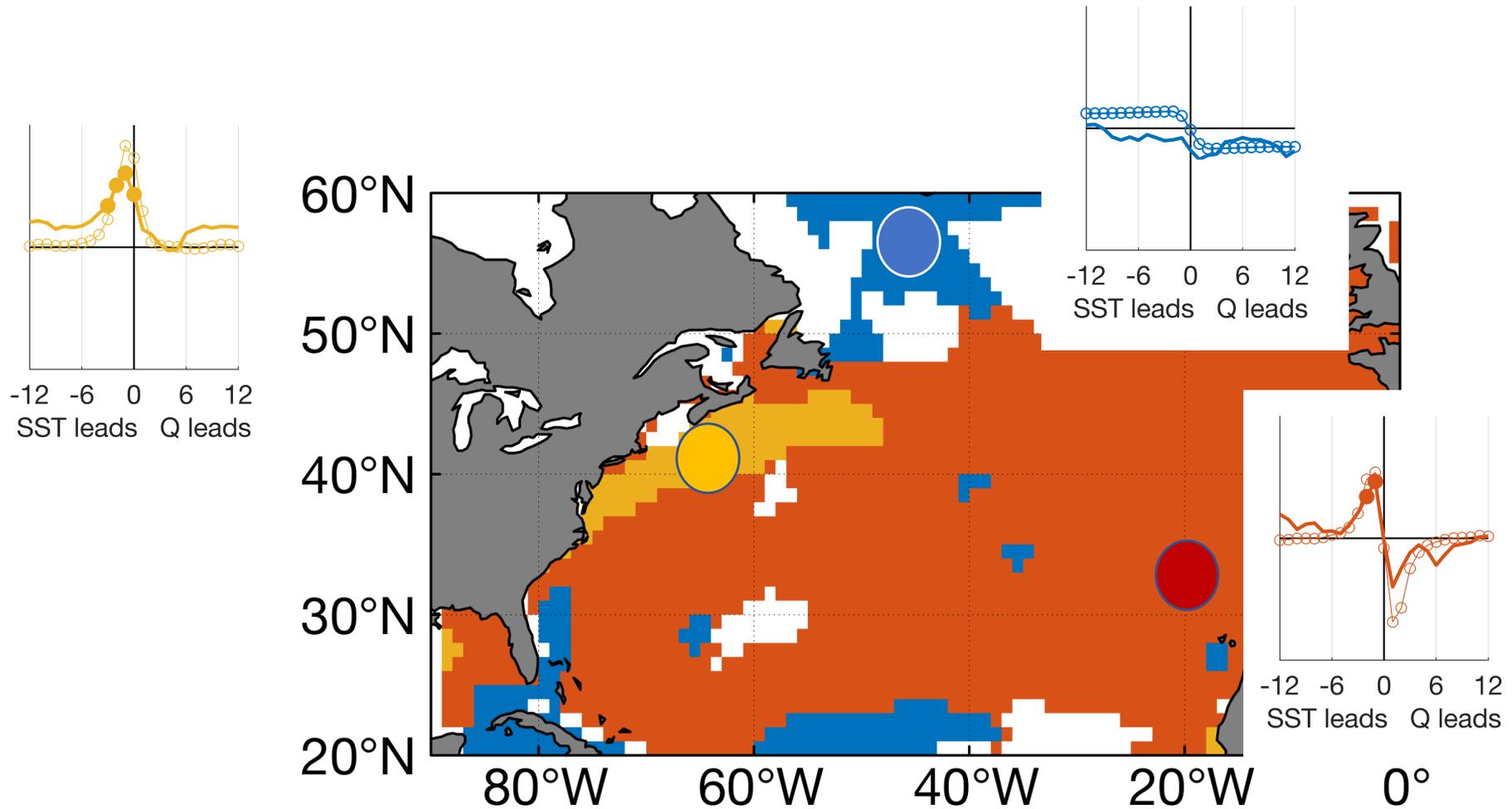
*Similar lagged correlations are linked spatially*

*No spatial information is provided in the analysis*



*Blank areas have NO significant lagged correlations*  
*Spatially coherent*

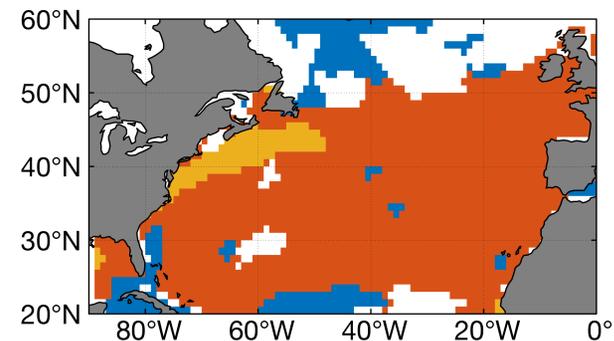
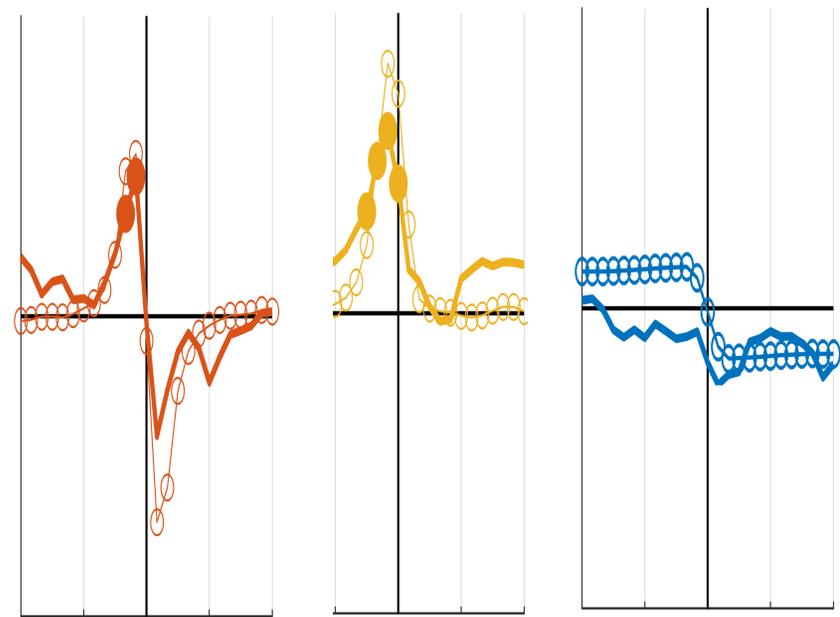
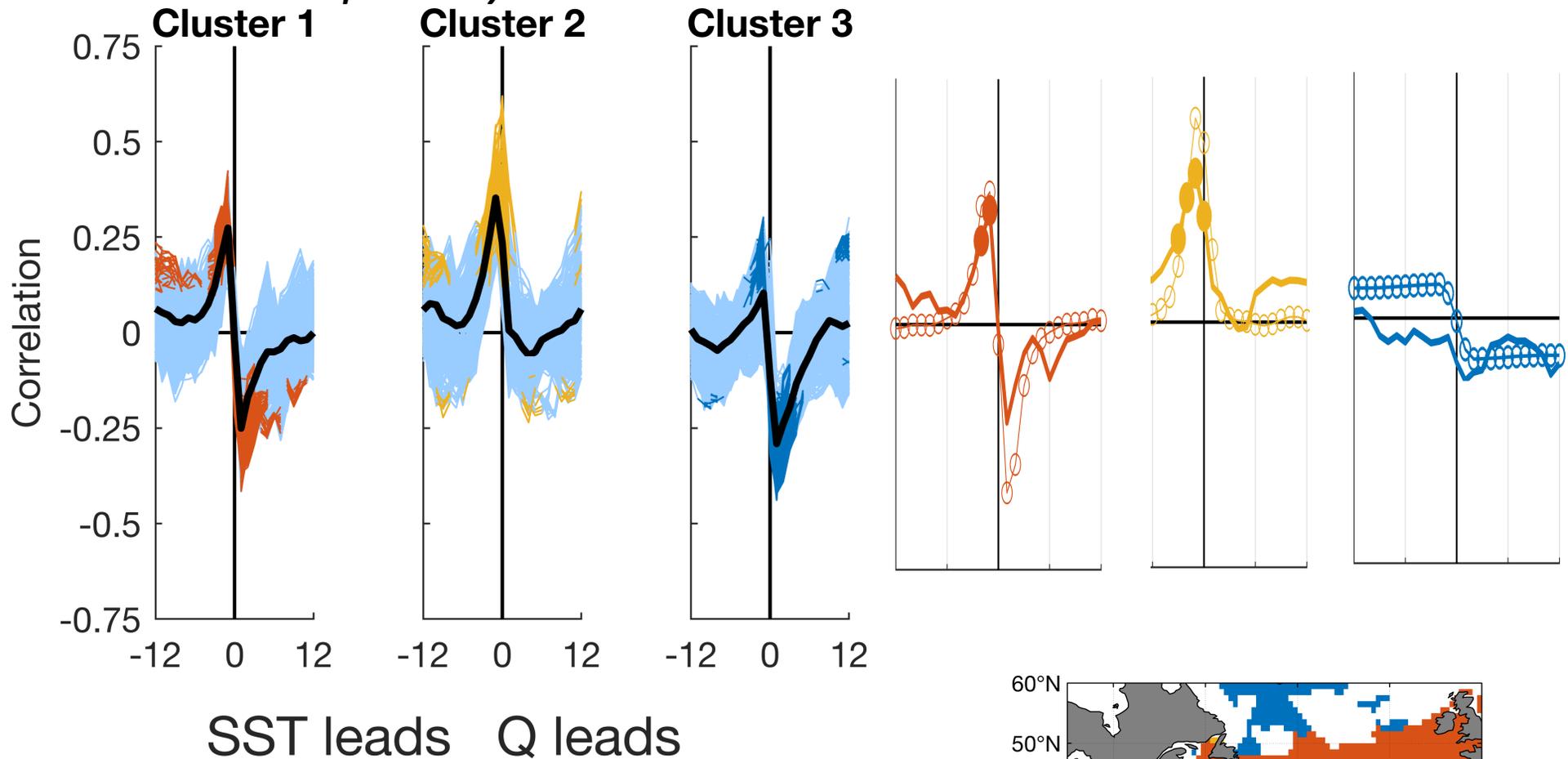
# Clustering with k-means groups spatially similar lagged correlations patterns



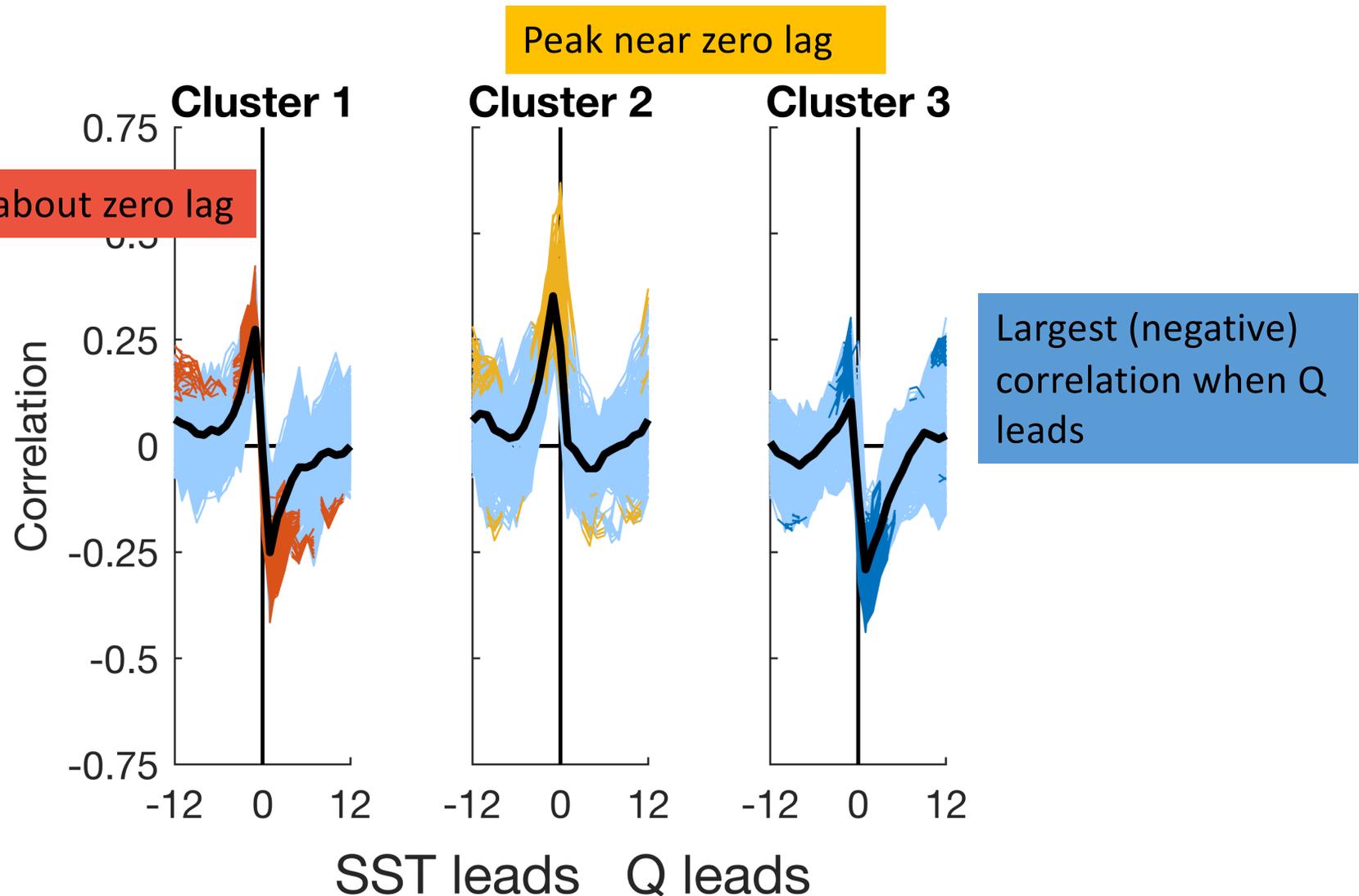
# Cluster analysis

*K-means sorts by the symmetry properties of the lagged correlations*

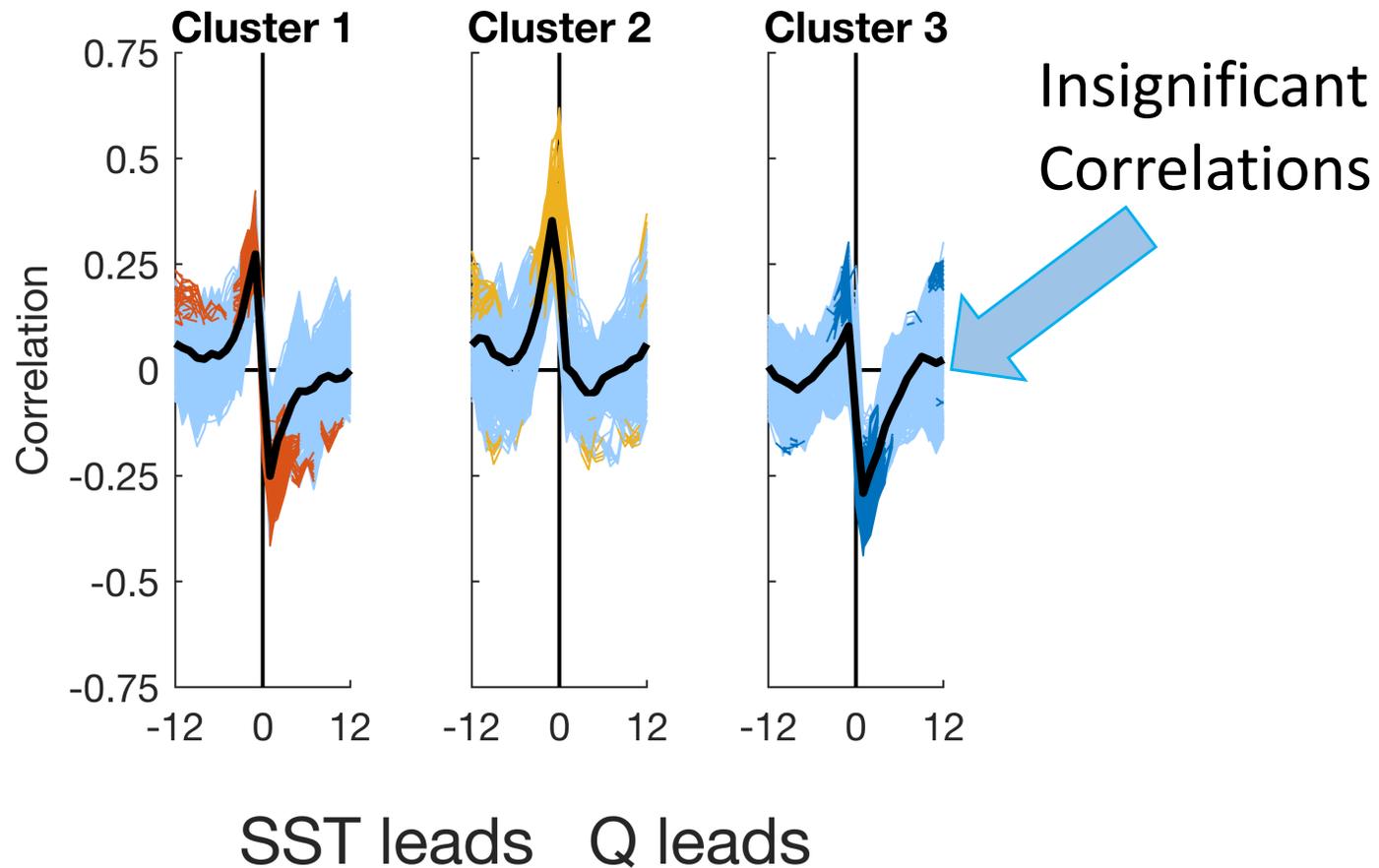
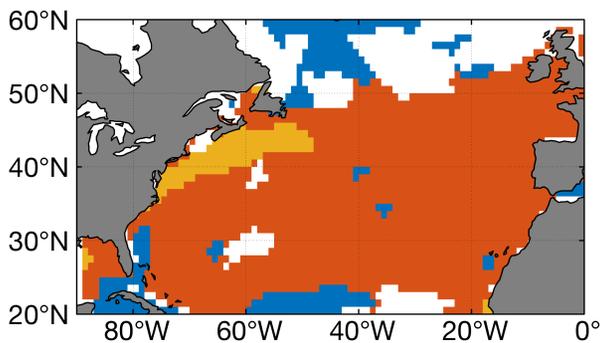
*Results are spatially coherent!*



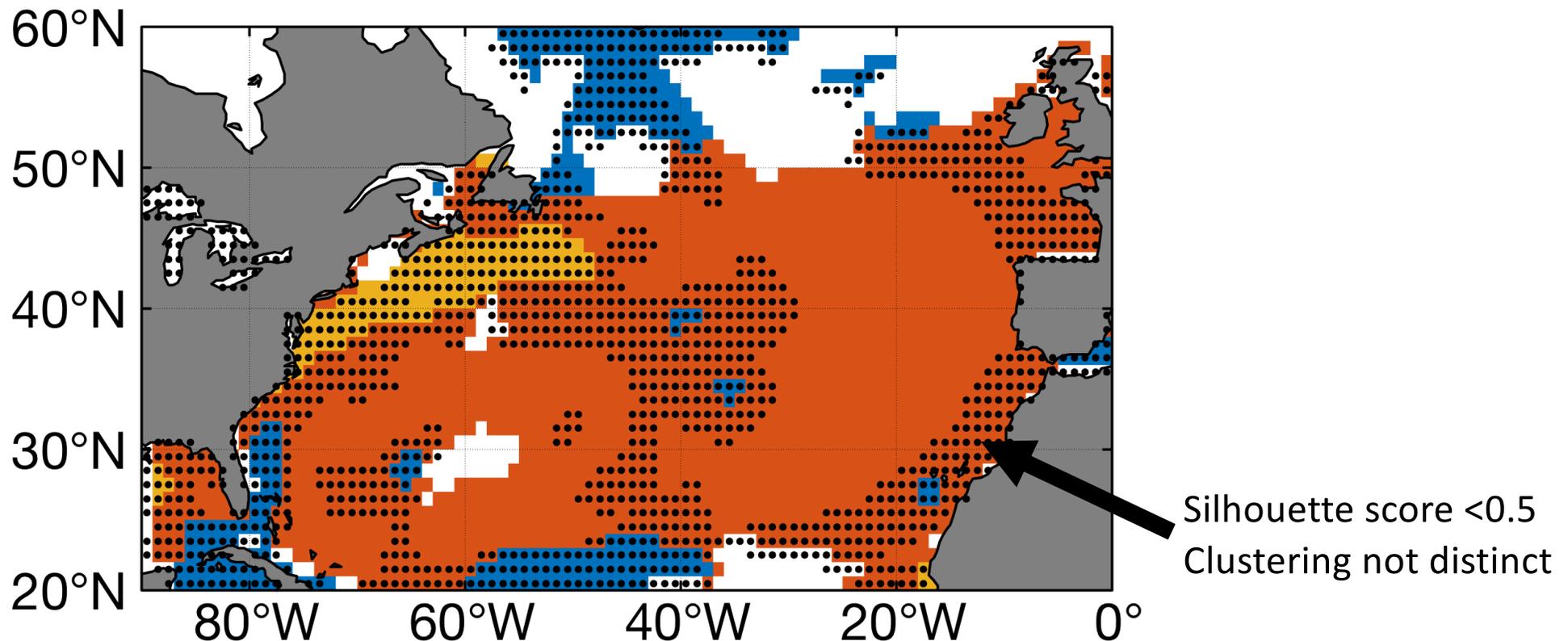
# Clusters distinguished by symmetry properties of the lagged correlations



However, lagged correlations in each cluster suggest some overlap between clusters

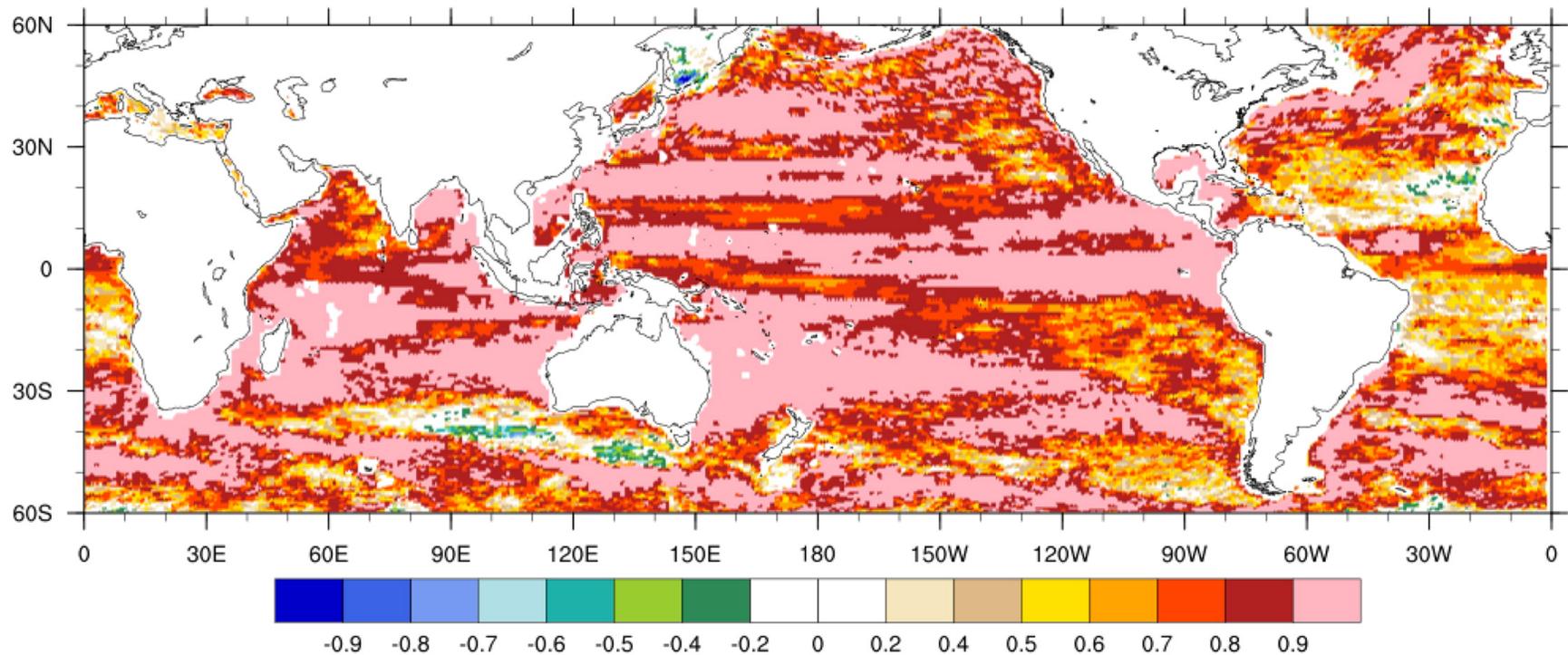


Silhouette score for each location indicates areas with robust distinction between clusters.



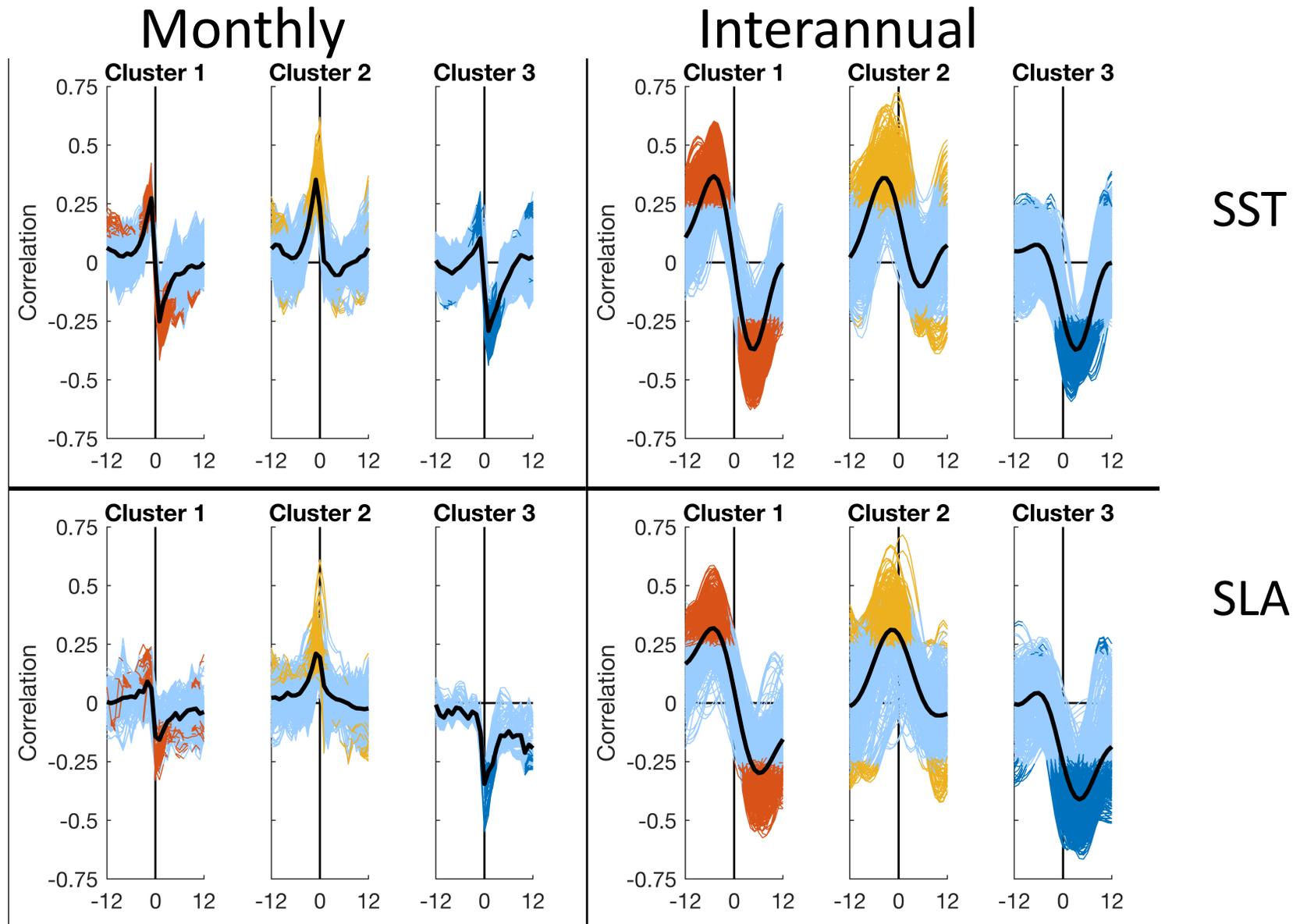
What can we learn by applying the analysis to SLA?

Use the same approach for the upper ocean using SLA as proxy for upper ocean heat content



Upper 400m heat content correlation with SLA in high resolution coupled model (Small et al, 2020): Highly correlated in the Gulf Stream/North Atlantic Current and the Gulf of Mexico

Similar results for SST/SLA, proxy for upper ocean heat content

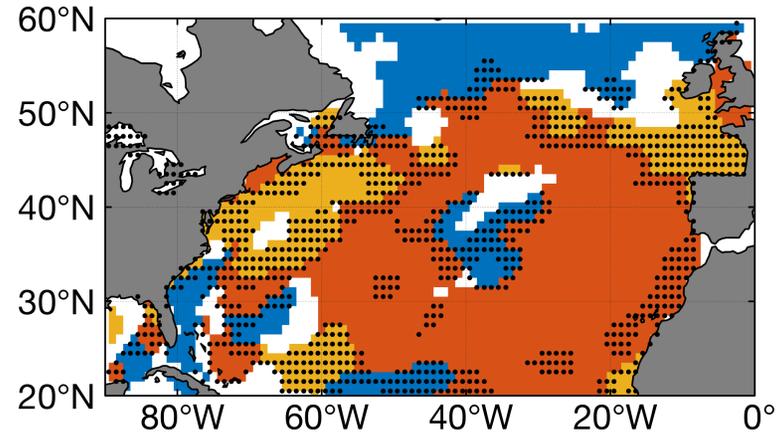
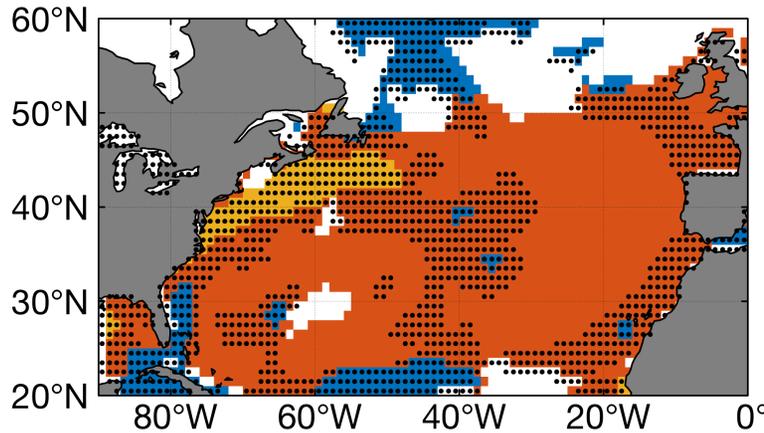


# Clusters of SLA provides a more detailed delineating of the provinces of air-sea interaction

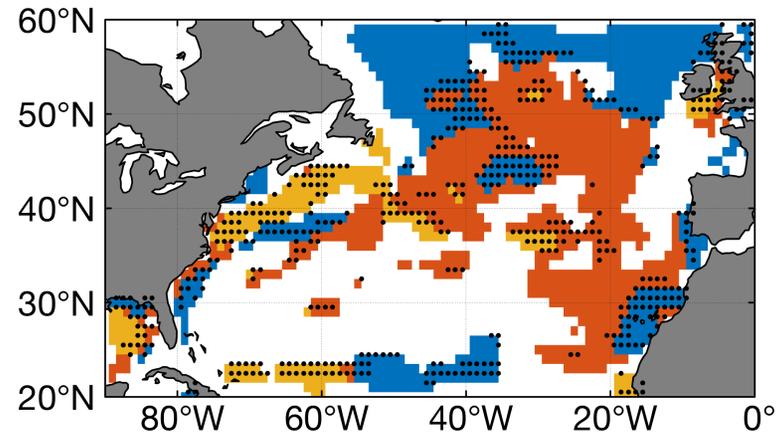
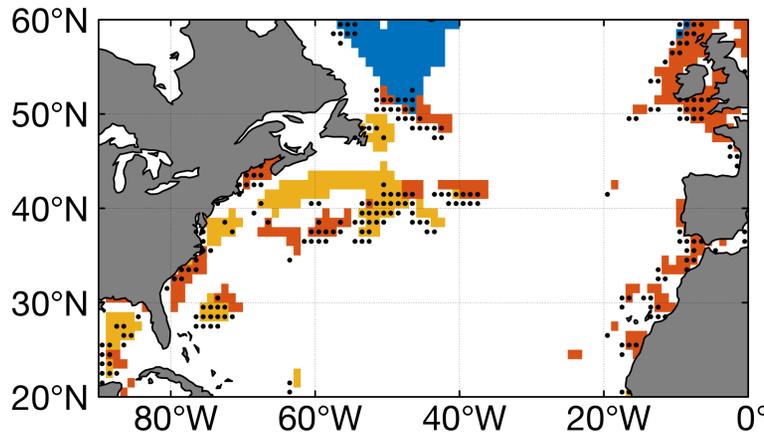
## Monthly

## Interannual

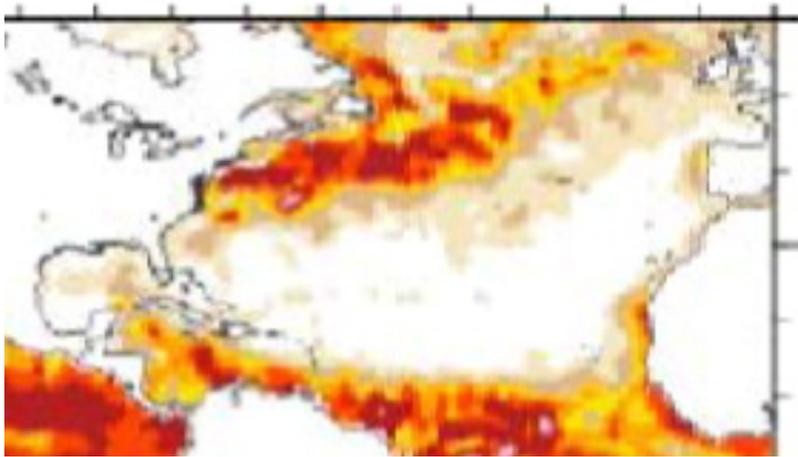
SST



SLA



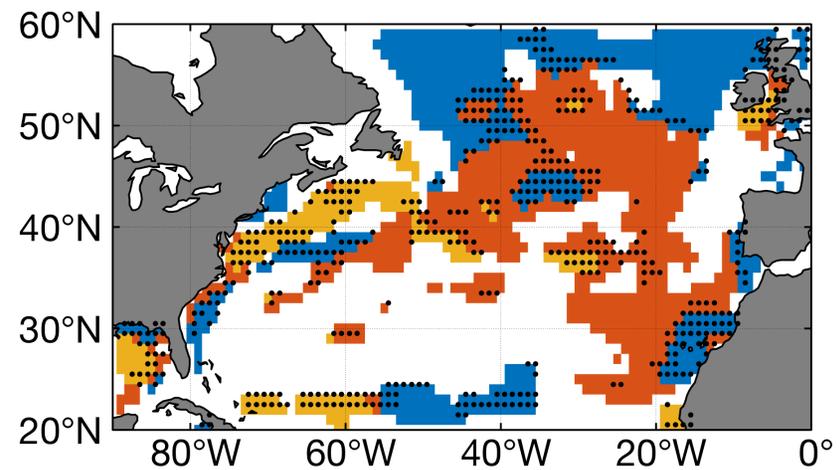
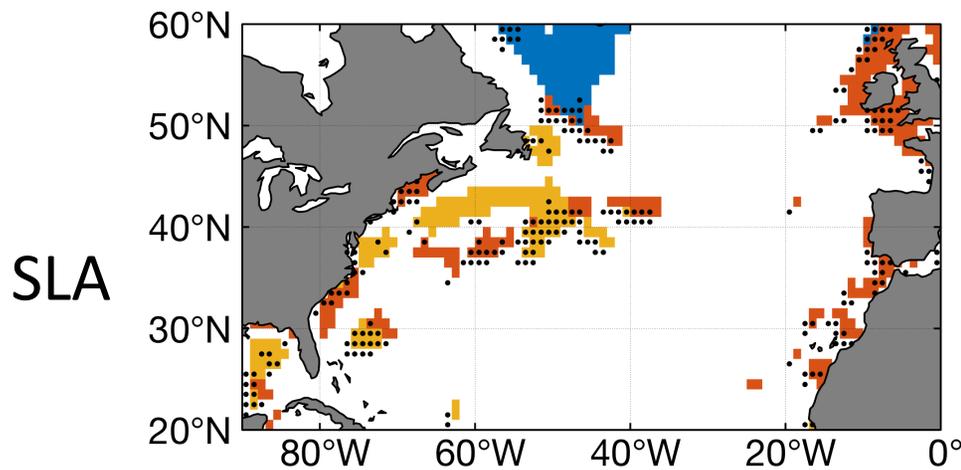
Clusters of lagged correlations between SLA and  $Q_{\text{turb}}$  consistent with regression in high resolution climate model of rate of change of heat content with  $Q$



Results from high-resolution coupled climate model Small et al, 2020

Monthly

Interannual



# Conclusions

- K-means clustering defines provinces of differing processes controlling upper ocean heat budget from surface observations alone:
- Three distinct regimes
  - Gulf Stream: Ocean heat transport convergence drives air-sea interaction, **shallow MLD, strong ocean forcing**
  - Interior subtropical gyre: Atmosphere forces then damps SST anomalies, **shallow MLD, weak ocean forcing**
  - Subpolar gyre: atmosphere forces a deep ocean, SST anomaly not damped locally, **deep MLD, weak ocean forcing**
- Results for SLA similar to what is found from heat budget analysis (ECCO, observations, Coupled high resolution model)
- *Heat content anomalies below seasonal thermocline reflected by SSH are not directly interacting with the atmosphere in the summer*

