

# Southern Ocean variability over the last centuries in coupled data assimilation experiments with particle filtering

Hugues Goosse, Violette Zunz

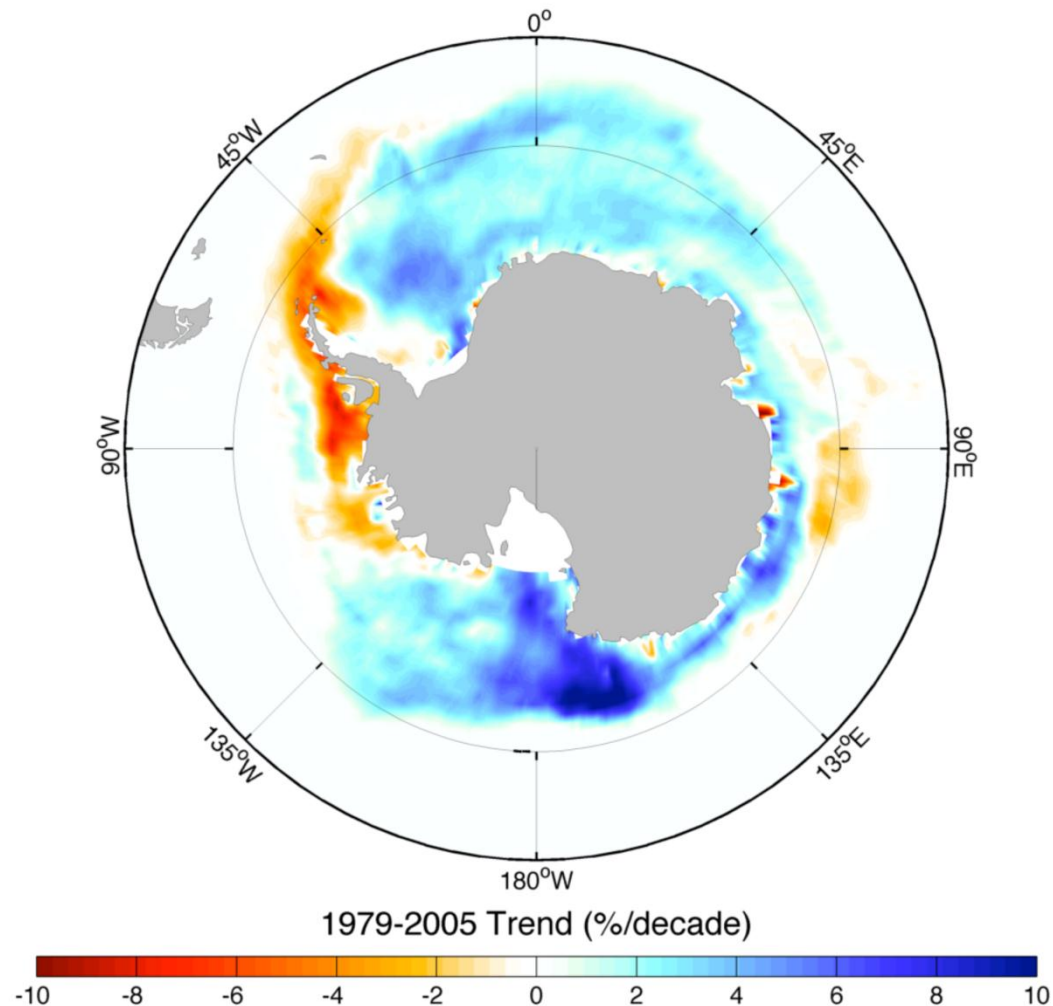
**Université catholique de Louvain, Belgium**

Toulouse, October 20, 2016

International workshop on coupled data assimilation

# Sea ice changes over the last decades

Observed trend in sea ice concentration over the period 1978-2010 (data from NSIDC)

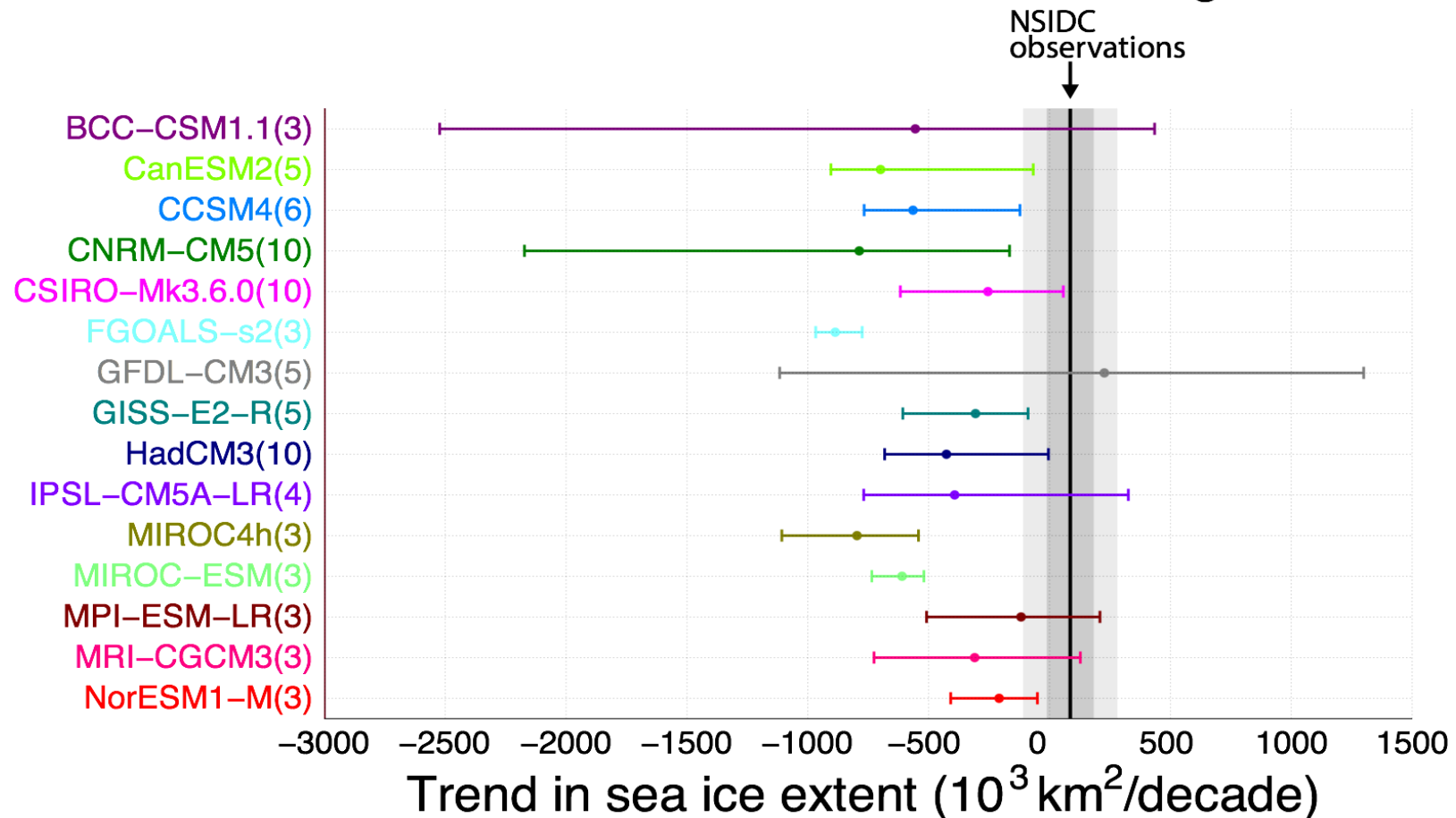


Satellite observations indicate a **significant positive sea ice extent trend** of  $1.7 \cdot 10^5 \pm 2 \cdot 10^4 \text{ km}^2$  per decade in the Southern Ocean for the period November 1978–December 2010, (Cavalieri and Parkinson, 2012).

# Simulated trends over the last decades

Among the members of the CMIP5 ensemble, only a few display a positive trend in sea ice extent.

## 1979–2005 JAS sea ice extent trend range

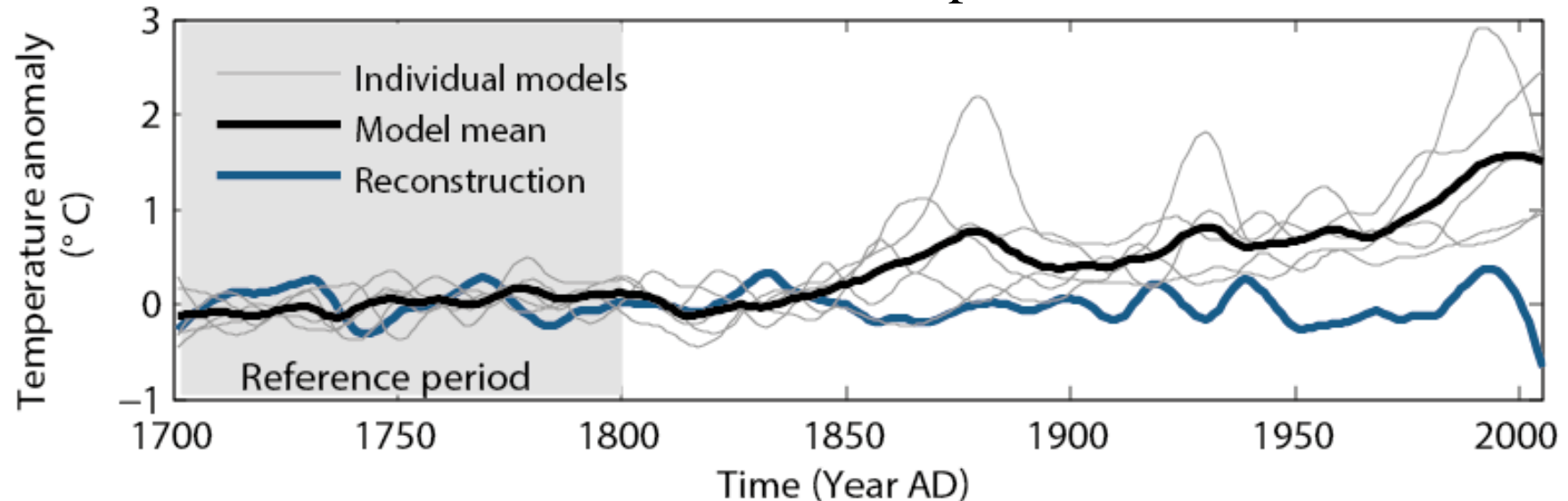


# Temperature changes over the last centuries



Models suggest a large temperature increase in Antarctica over the 20<sup>th</sup> century while the warming is much weaker in reconstructions

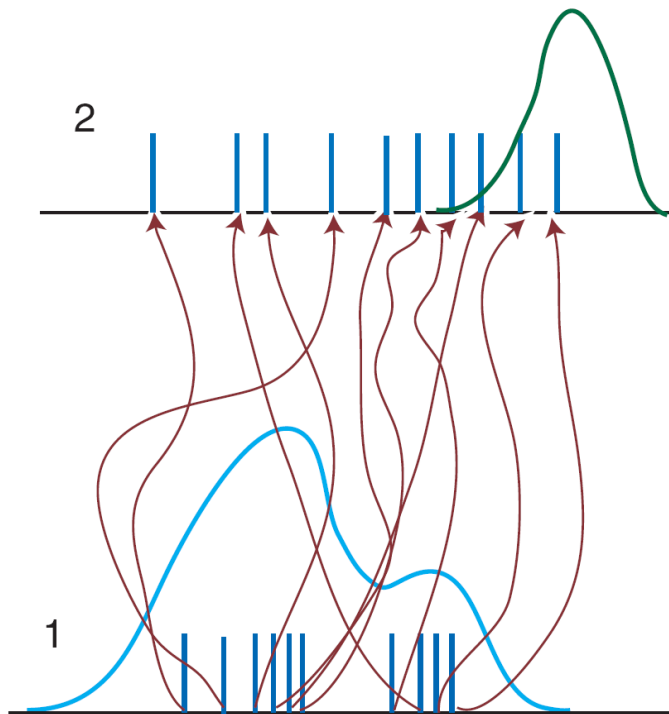
## Antarctic surface temperature



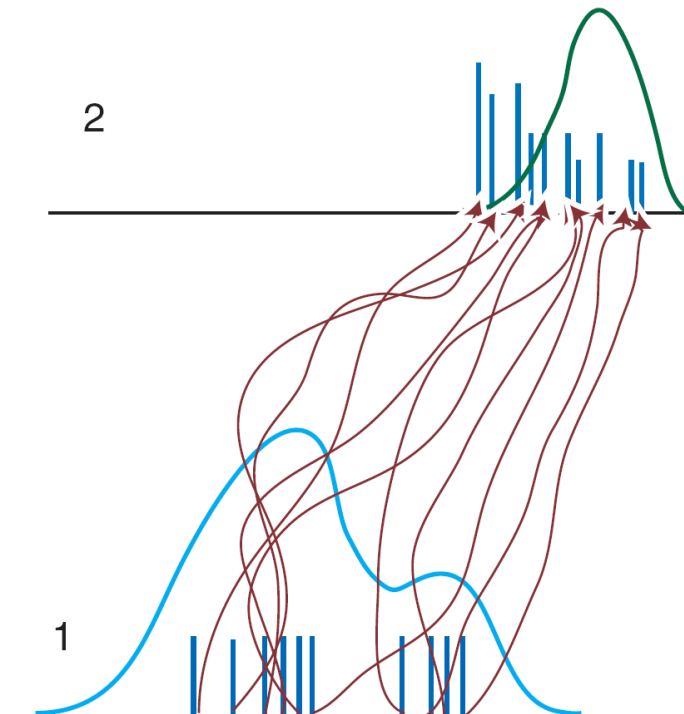
Annual mean surface temperature averaged over Antarctica simulated by five climate models following the PMIP3-CMIP5 protocol over the past 300 years and PAGES2k reconstruction for the same period (PAGES2k-PMIP3 working group, 2015).

## Methods

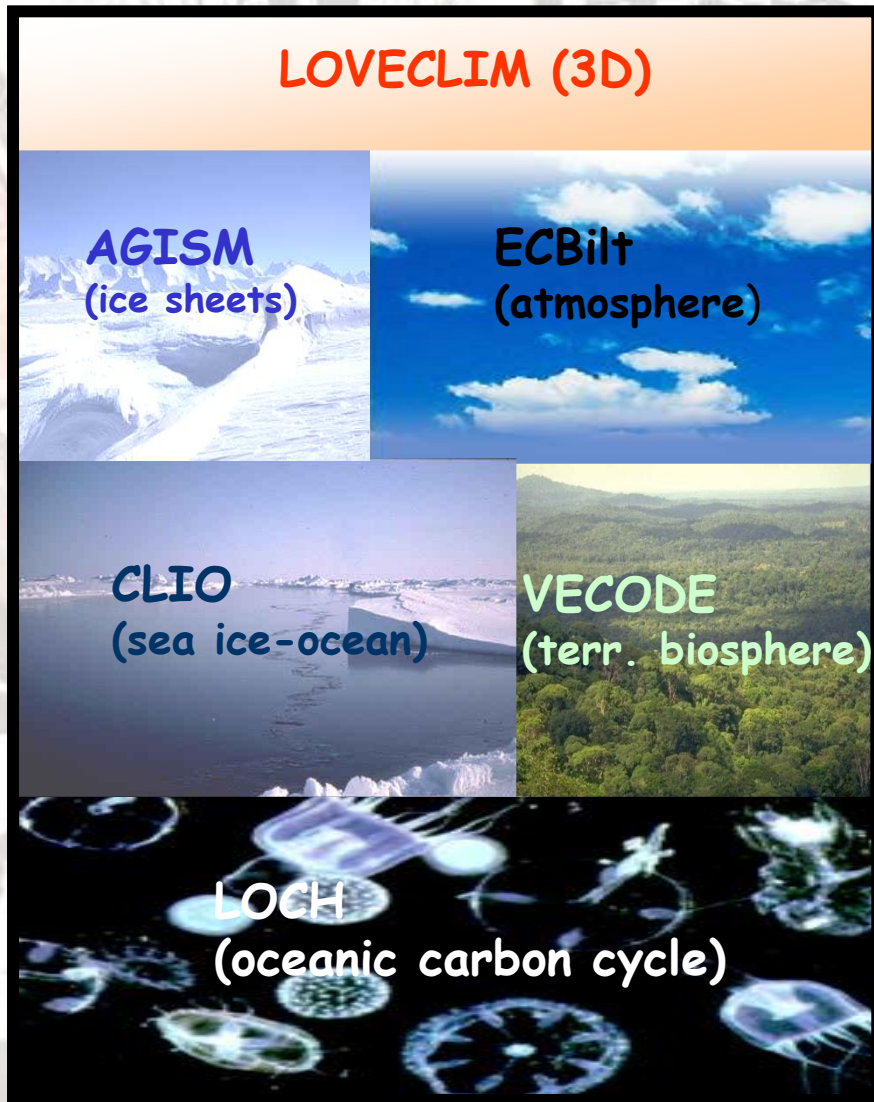
### Particle filter with sequential importance resampling (SIR)



### Nudging proposal particle filter (NPPF)



# Description of LOVECLIM



**ECBilt** (Opsteegh et al., 1998)

Quasi-geostrophic atmospheric model (prescribed cloudiness; T21, L3).

**CLIO** (Goosse and Fichefet, 1999)

Ocean general circulation model coupled to a thermodynamic-dynamic sea ice model (3 x 3, L20).

**VECODE** (Brovkin et al., 2002)

Reduced-form model of the vegetation dynamics and of the terrestrial carbon cycle (same resolution as ECBilt).

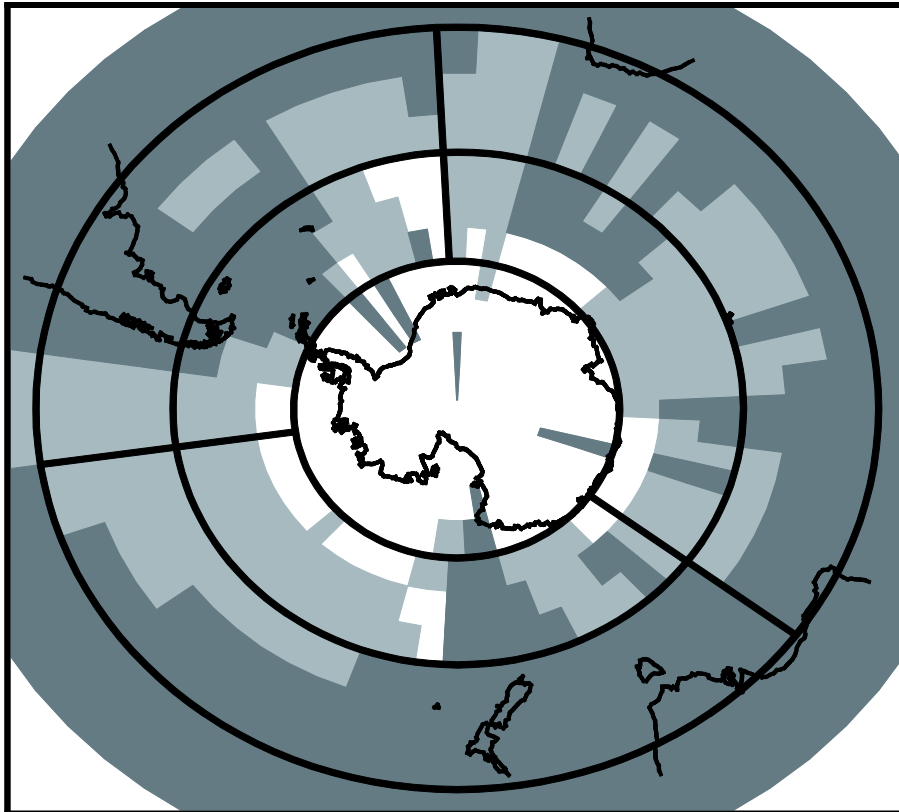
**200 years of simulation on a single core in one day**

# Simulation over the last 150 years constrained by HadCRUT3 dataset

Data constrain: surface temperature (HadCRUT3)

Assimilation step: 3 months (Time averaged observations)

Method : nudging Particle Filter (96 simulations )

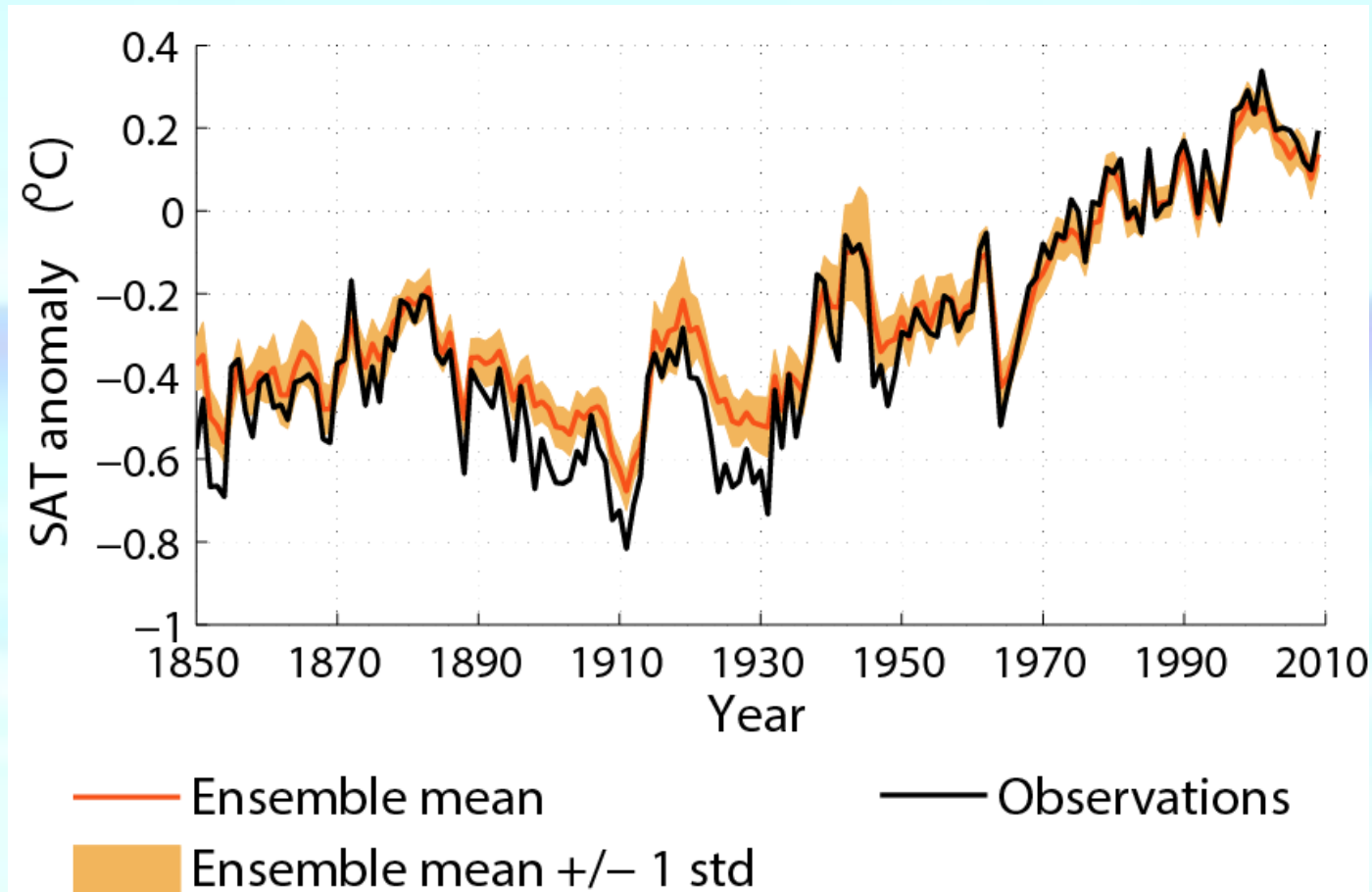


Data coverage:

- The dark grey area represents the model grid boxes for which observations are available since 1960
- The light grey area represents the model grid boxes for which observations are available since 1980.
- No data is available in the white grid boxes.

# Simulation over the last 150 years constrained by HadCRUT3 dataset

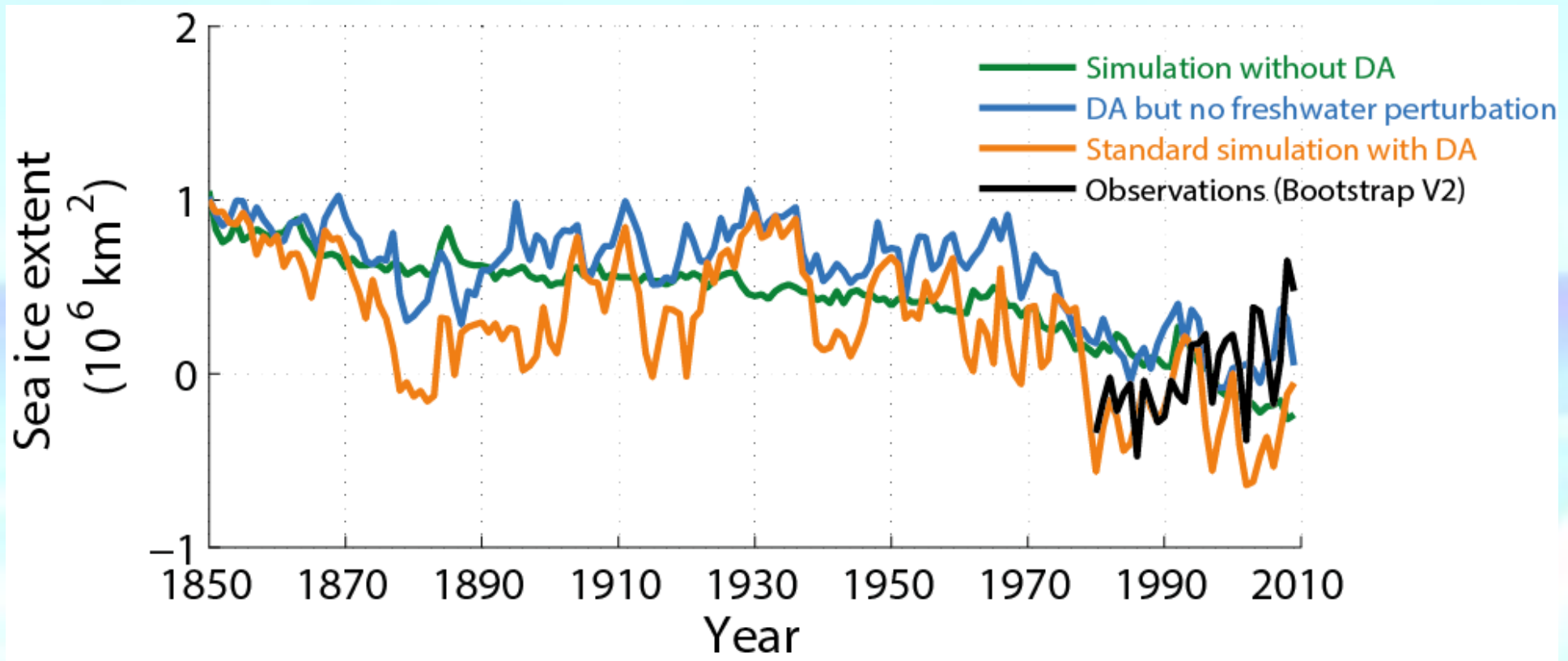
**Yearly mean surface air temperature anomalies with regard to 1961–1990, averaged over the area south of 30°S.**





# Simulation over the last 150 years constrained by HadCRUT3 dataset

## Ensemble mean of yearly mean sea ice extent anomalies with regard to 1980–2009 ( $10^6 \text{ km}^2$ ) in the Southern Ocean



In response to the forcing, the decreasing trend is relatively constant.  
The simulation with data assimilation shows a large shift between the 1960's and the 1980's.

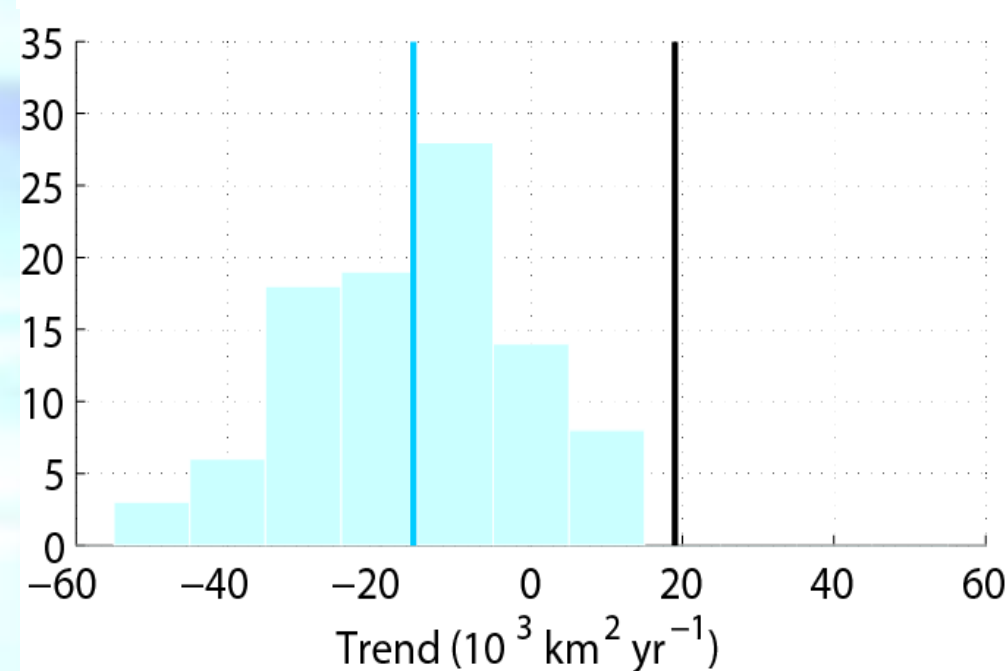
# “Predicting” trends over the last 30 years

Simulations initialized in 1980 from an ensemble of 96 simulations with the EMIC LOVECLIM using a nudging Particle Filter

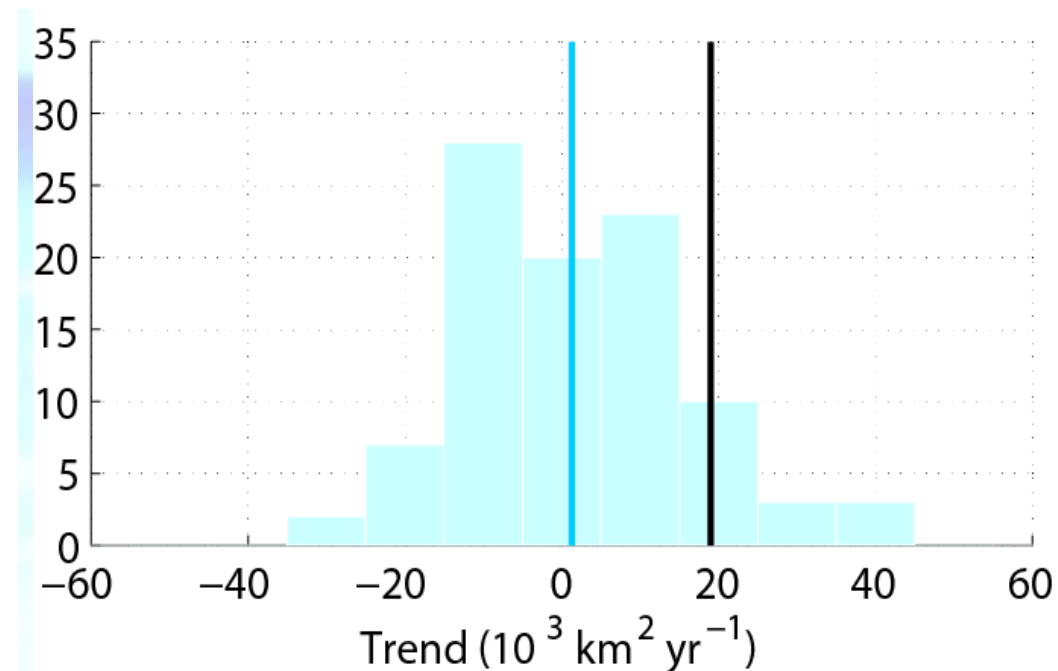
No data constraint is applied after 1979.

1980–2009 trend in annual mean sea ice extent

Non-initialized hindcast



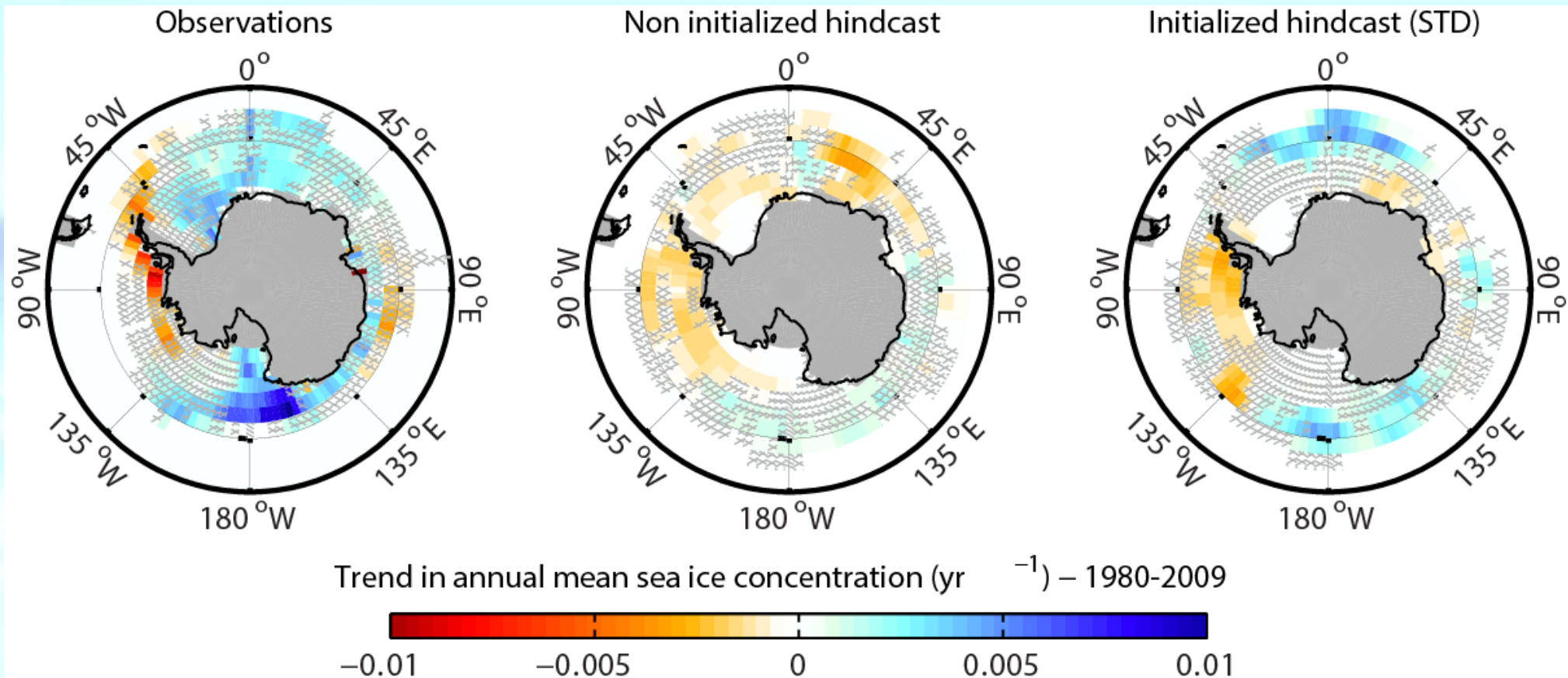
Initialized hindcast (STD)



# 'Predicting' trends over the last 30 years

Simulations initialized from an ensemble of 96 simulations with the EMIC LOVECLIM using a nudging Particle Filter

Trend in annual mean sea ice concentration 1980-2009

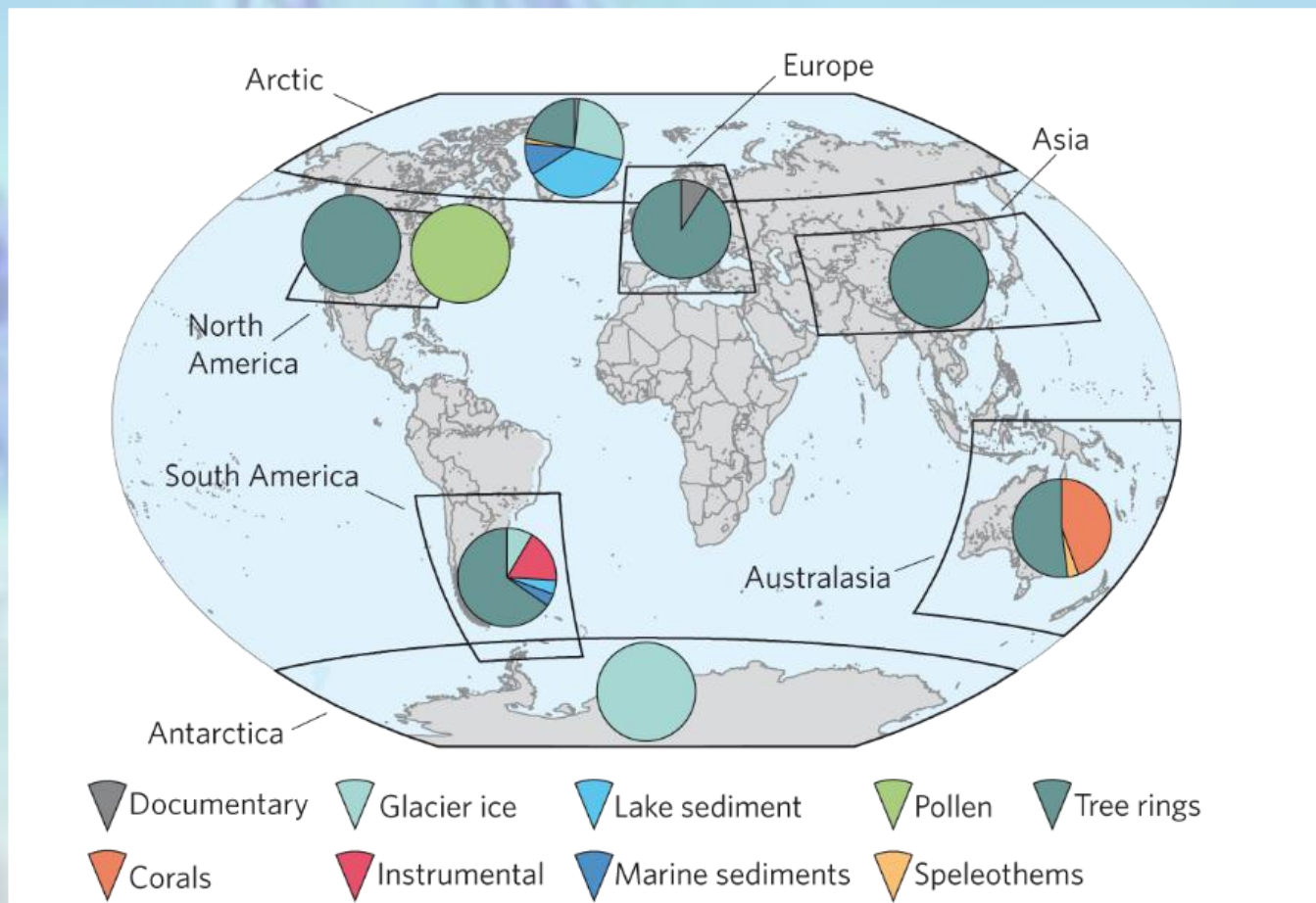


# Simulations over the last centuries constrained by PAGES2k continental-scale reconstructions

Data constrain: surface temperature in 7 continental regions

Assimilation step: 1 year

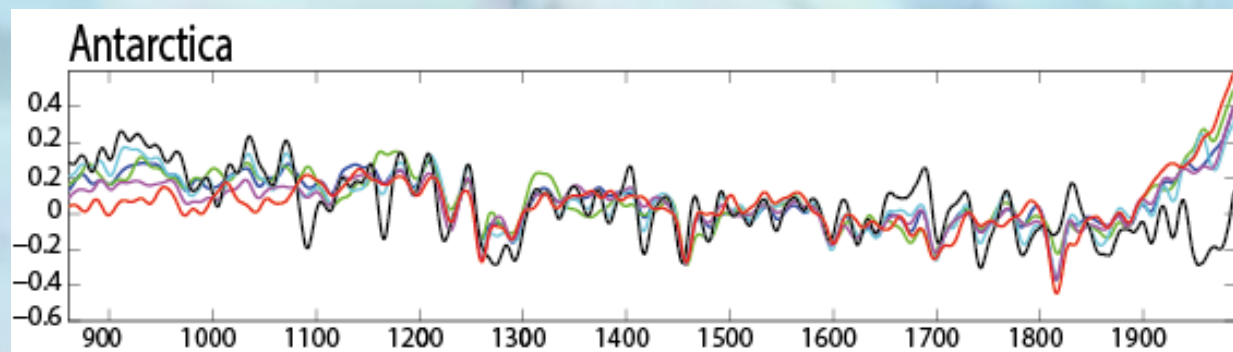
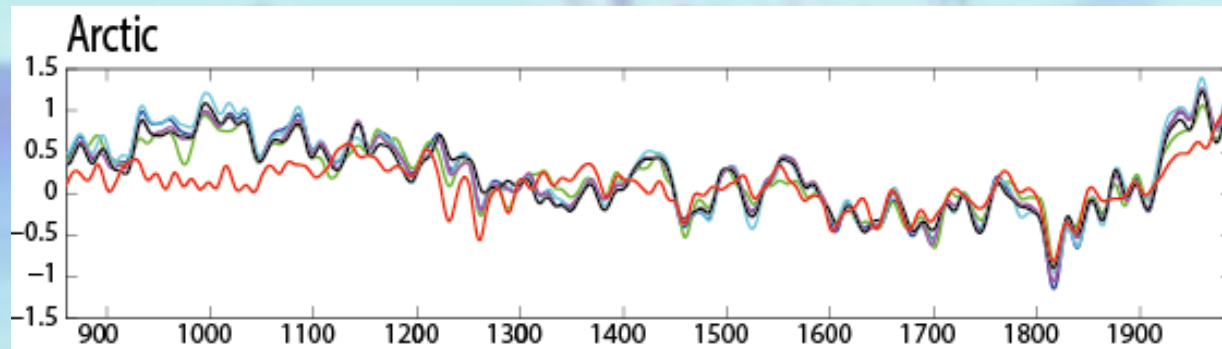
Method : Particle Filter Importance Resampling (96 simulations )



# Simulations over the last centuries constrained by PAGES2k continental-scale reconstructions

Simulations initialized from an ensemble of 96 simulations with the EMIC LOVECLIM using a Particle Filter

Smoothed time series of simulated temperatures and Pages2k reconstructions for two continent-scale regions

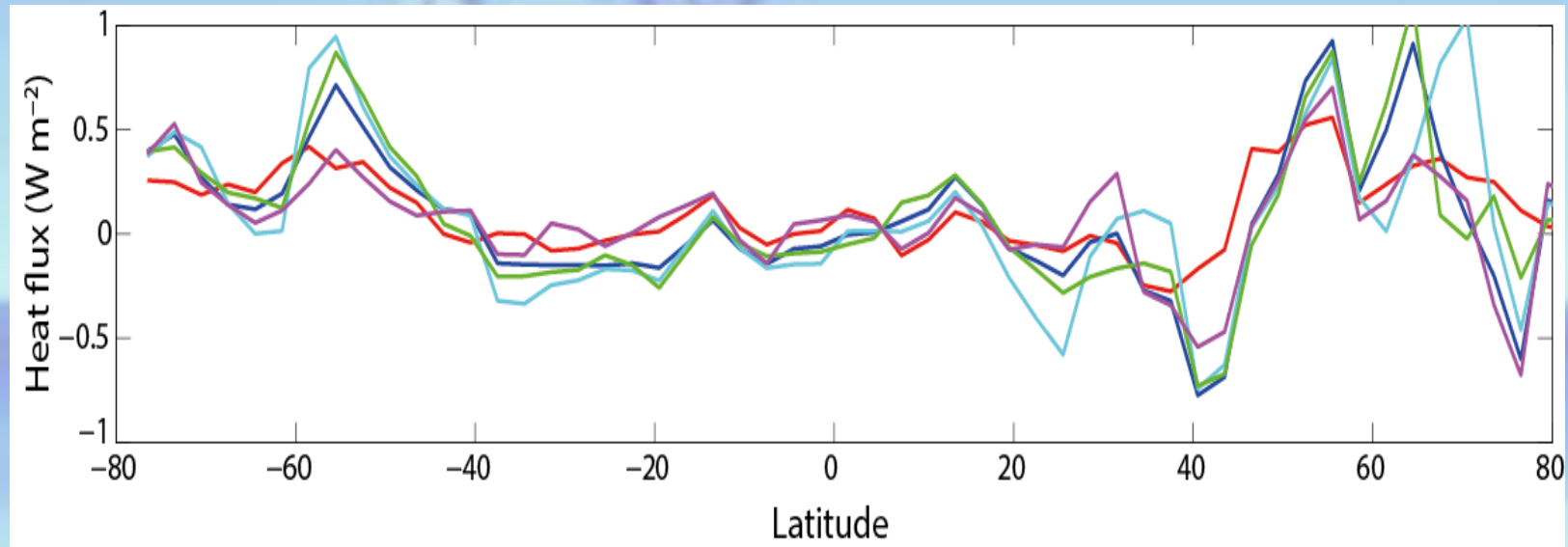


- Reconstruction
- Simulations without data assimilation (ensemble mean)
- Simulations with data assimilation

# Influence of ocean dynamics



Atmosphere-ocean heat flux anomaly (in  $\text{W m}^{-2}$ ) averaged over the period 850-1050



— Simulations without data assimilation (ensemble mean)

— Simulations with data assimilation

# Conclusions



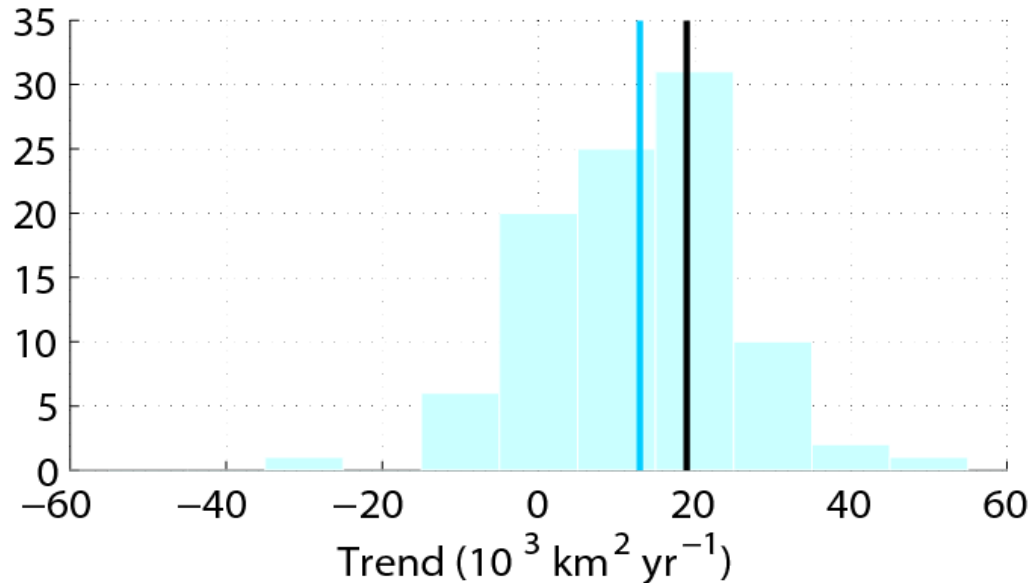
- ◆ Particle filtering is an interesting tool for coupled data assimilation on long time scales.
- ◆ The ocean has potentially played a large role in the increase in sea ice extent over the last decades.
- ◆ A strong incompatibility exists between simulated warming in Antarctica over the 20<sup>th</sup> century and reconstructions.

# 'Predicting' trends over the last 30 years

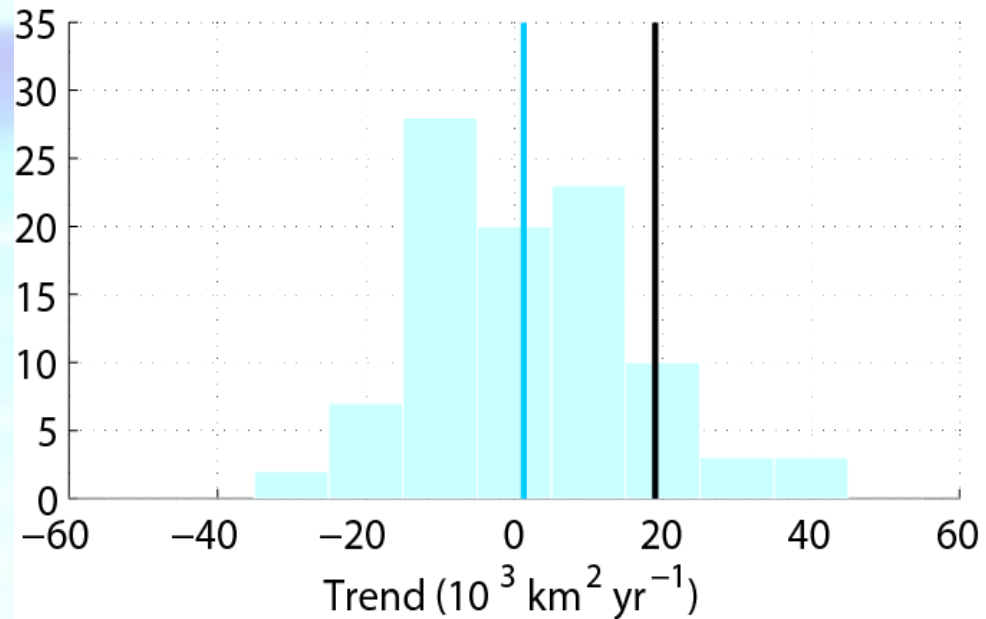
Simulations initialized from an ensemble of 96 simulations with the EMIC LOVECLIM using a nudging Particle Filter

1980–2009 trend in annual mean sea ice extent

with additional freshwater flux during the hindcast



without additional freshwater flux during the hindcast (STD)

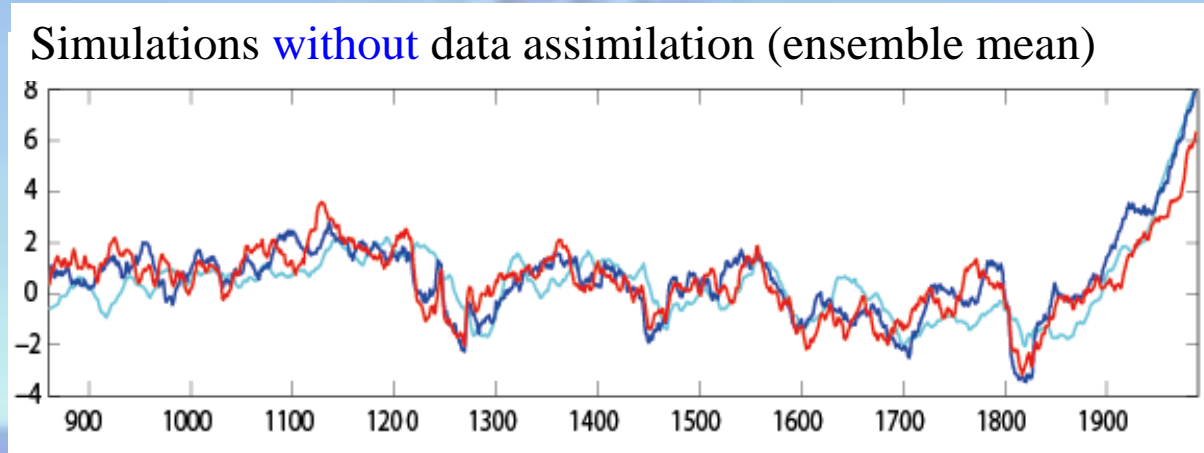




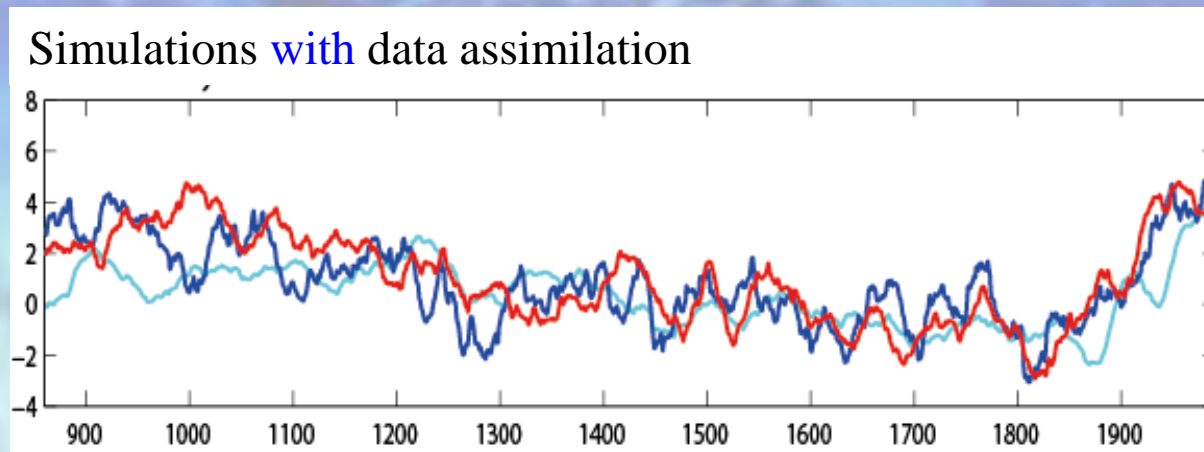
# Link between regions

## Comparison of temperature changes in various latitude bands

Normalized Temperature



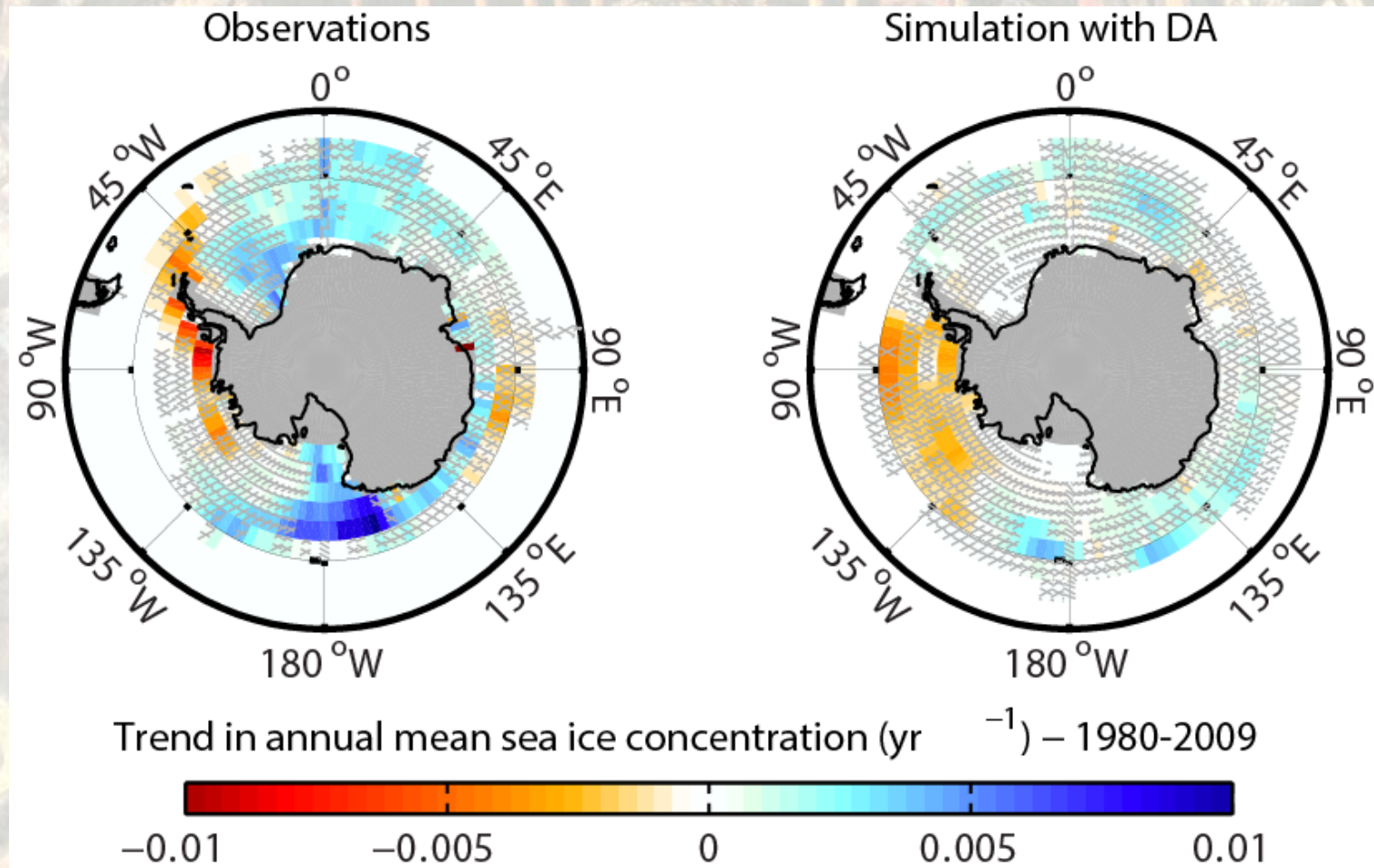
— 80°S  
— 45°S  
— 80°N



Time

# Annual mean sea ice concentration

## Trends of sea ice concentration over the period 1979-2009

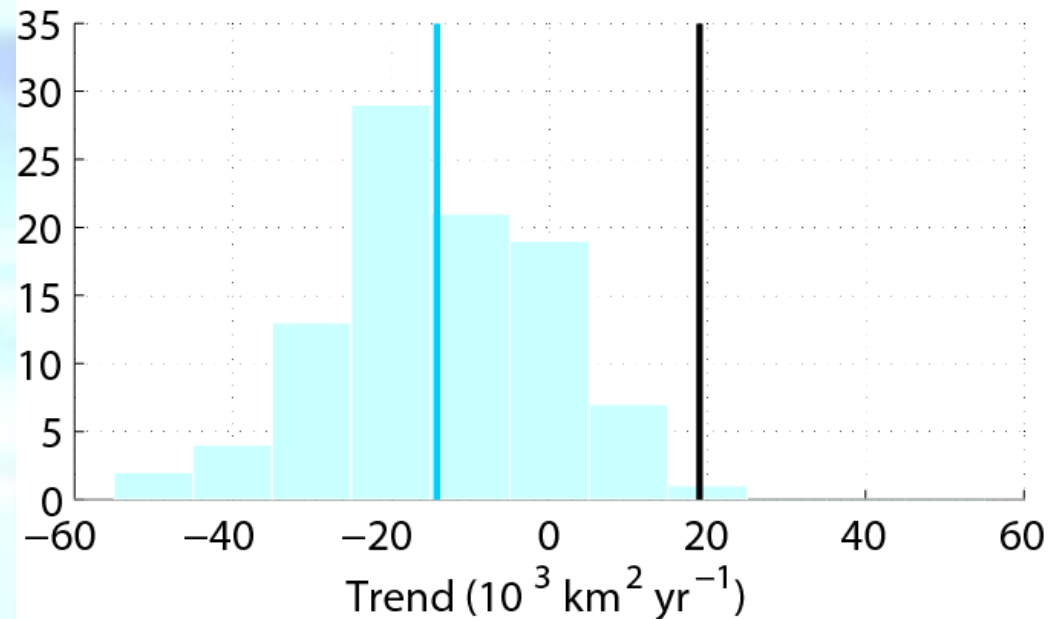


# Predicting trends over the last 30 years

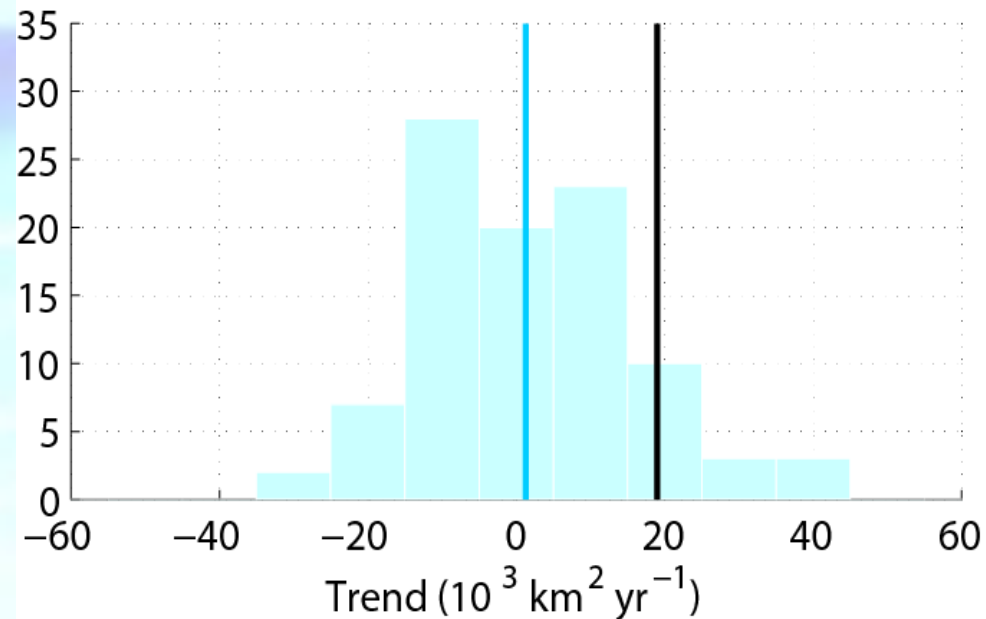
Simulations initialized from an ensemble of 96 simulations with LOVECLIM using a nudging Particle Filter

1980–2009 trend in annual mean sea ice extent in hindcasts initialized from a simulation with data assimilation

without perturbation of the freshwater flux before 1980

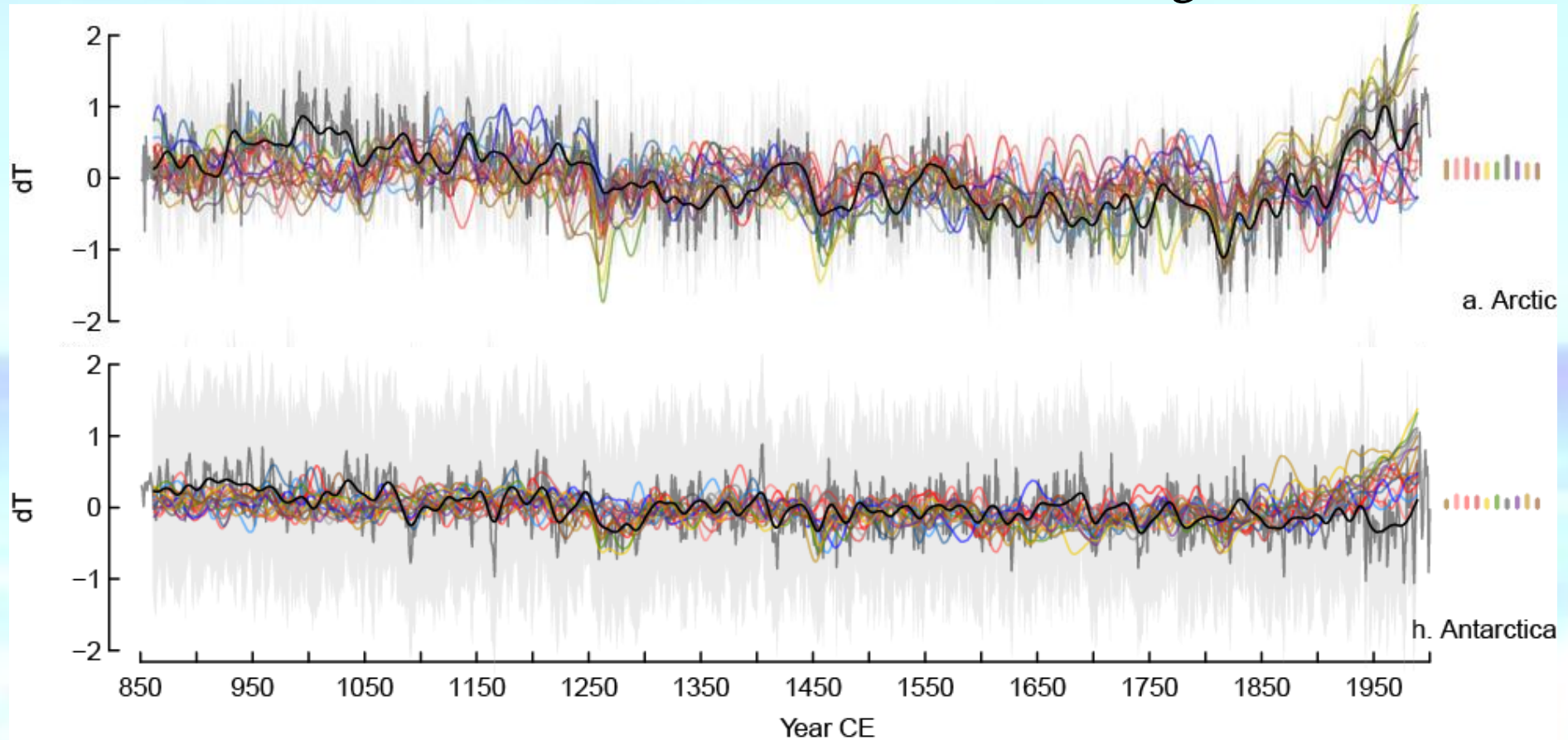


with a perturbation of the freshwater flux before 1980 (STD)



# Model-data comparison at the regional scale

Smoothed time series of simulated temperatures and Pages2k reconstructions for two continent-scale regions

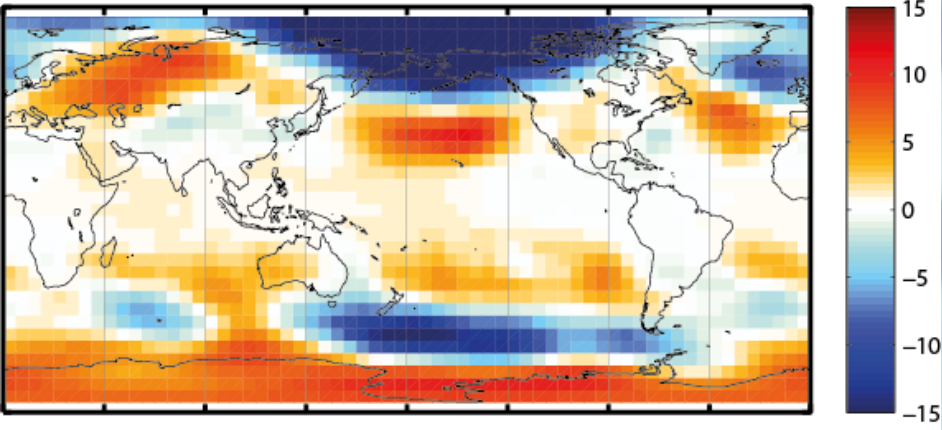


- |                              |                    |                           |                              |
|------------------------------|--------------------|---------------------------|------------------------------|
| ■ CSIRO-Mk3L-1-2 / piControl | ■ COSMOS1-5        | ■ CCSM4 / piControl       | ■ GISS-E2-R-7                |
| ■ COSMOS1-1 / CTL segment 1  | ■ COSMOS2-1        | ■ CESM / piControl        | ■ HadCM3 / piControl         |
| ■ COSMOS1-2 / CTL segment 2  | ■ COSMOS2-2        | ■ GISS-E2-R-1 / piControl | ■ IPSL-CM5A-LR / piControl   |
| ■ COSMOS1-3 / CTL segment 3  | ■ COSMOS2-3        | ■ GISS-E2-R-4             | ■ MPI-ESM-P / piControl      |
| ■ COSMOS1-4                  | ■ PAGES2K (annual) | ■ PAGES2K (low frequency) | ■ Reconstruction uncertainty |

# Role of atmospheric dynamics

Spatial distribution of the geopotential height anomaly at 800 hPa  
(in  $\text{m}^2\text{s}^{-2}$ ) in a simulation with data assimilation

850-950



1700-1800

