

Do ocean reanalysis products agree on the historical representation of the AMOC?

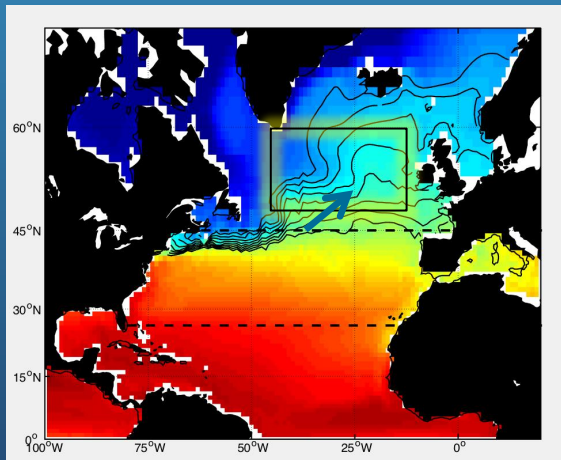
Alicia R. Karspeck

Detlef Stammer, Gokhan Danabasoglu

Thanks to Magdalena Balmaseda, Doug Smith , Tony Rosati, Shaoqing Zhang, Armin Köhl, Keith Haines, Maria Valdivieso, Yosuke Fujii , Ben Giese for making AMOC data available

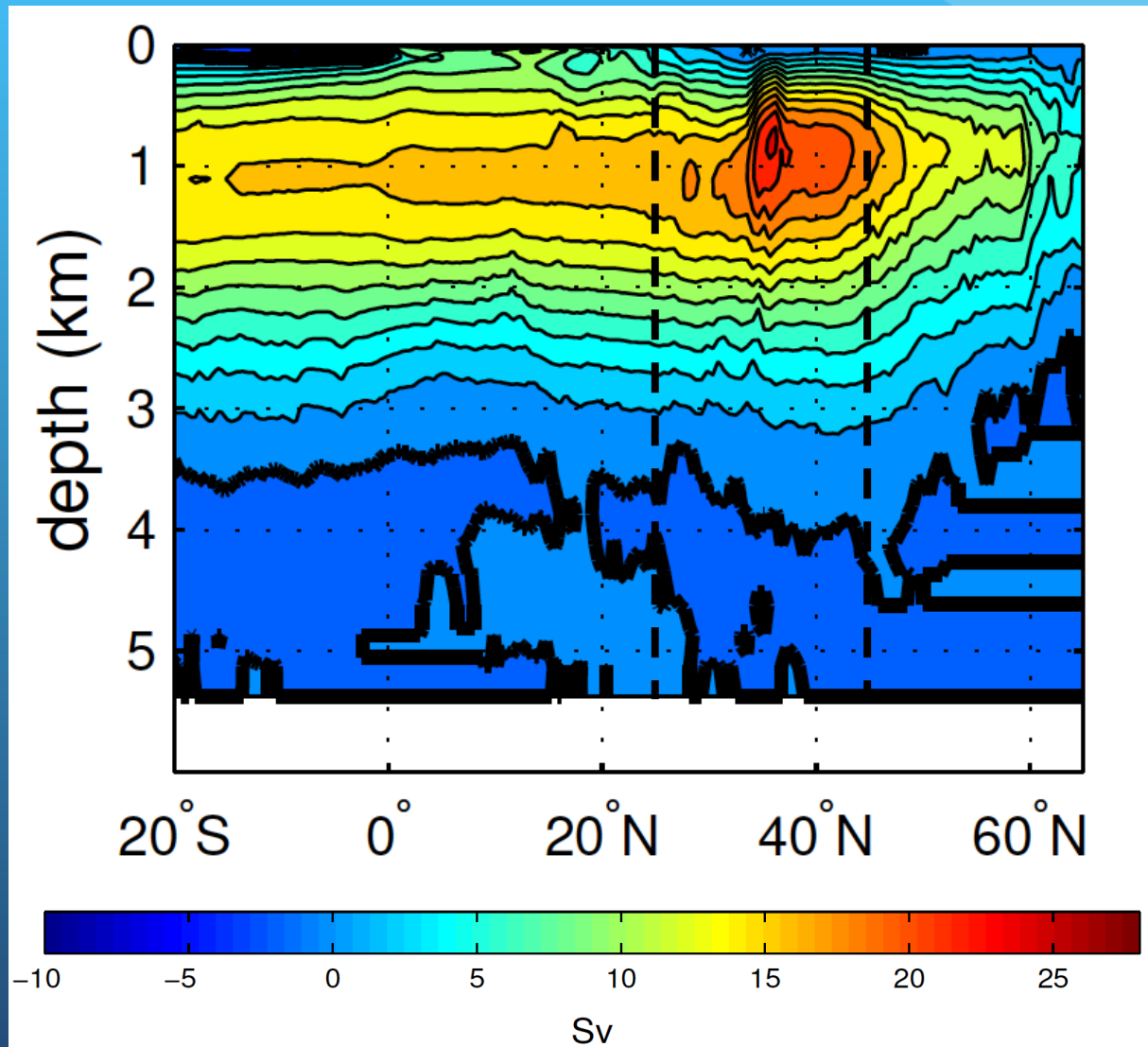
AMOC and the initialization of decadal prediction

- The AMOC state upon initialization has been cited an important influence on **decadal-scale climate prediction** in the North Atlantic (specifically the subpolar gyre). (Robson et al 2012; Yeager et al 2012, Matei et al 2012; Msadek et al 2014)
- In the context of decadal climate prediction --- An anomalous AMOC is invoked as a reasonable “proxy” for an anomalous net heat transport by the ocean into the subpolar gyre.



$$[\mathbf{vT}]' = \underline{\mathbf{v}}\mathbf{T}' + \mathbf{v}'\underline{\mathbf{T}} + \mathbf{v}'\mathbf{T}'$$

Atlantic Meridional Overturning Circulation



Groups that have contributed* AMOC reanalyses from 1960 - 2007 (or longer)

GROUP	METHOD	INSITU T/S	ALT	SST	NoAssim Control run?	Atm forcing	DP INIT?
GECCO2 (U. Hamburg)	4DVAR	YES	YES	YES	YES	[NCEP]*	YES
ORAS4 (ECMWF)	NEMOVAR 3DVar	YES	YES	YES	YES	ERA-40/ ERA-I	YES
MOVE-CORE (MRI)	3DVar	YES	NO	NO	YES	CORE II IAF	[NO]
SODA (U.MaryInd/ TAMU)	OI	YES	NO	YES	YES	20-CR	YES
DePreSys (UKMET)	Coupled nudging to OI product	YES	NO	YES	NO	N/A	YES
ECDA3.2 (GFDL)	coupled EaKF	YES	INDIRECTLY	YES	NO	[NCEP]*	YES

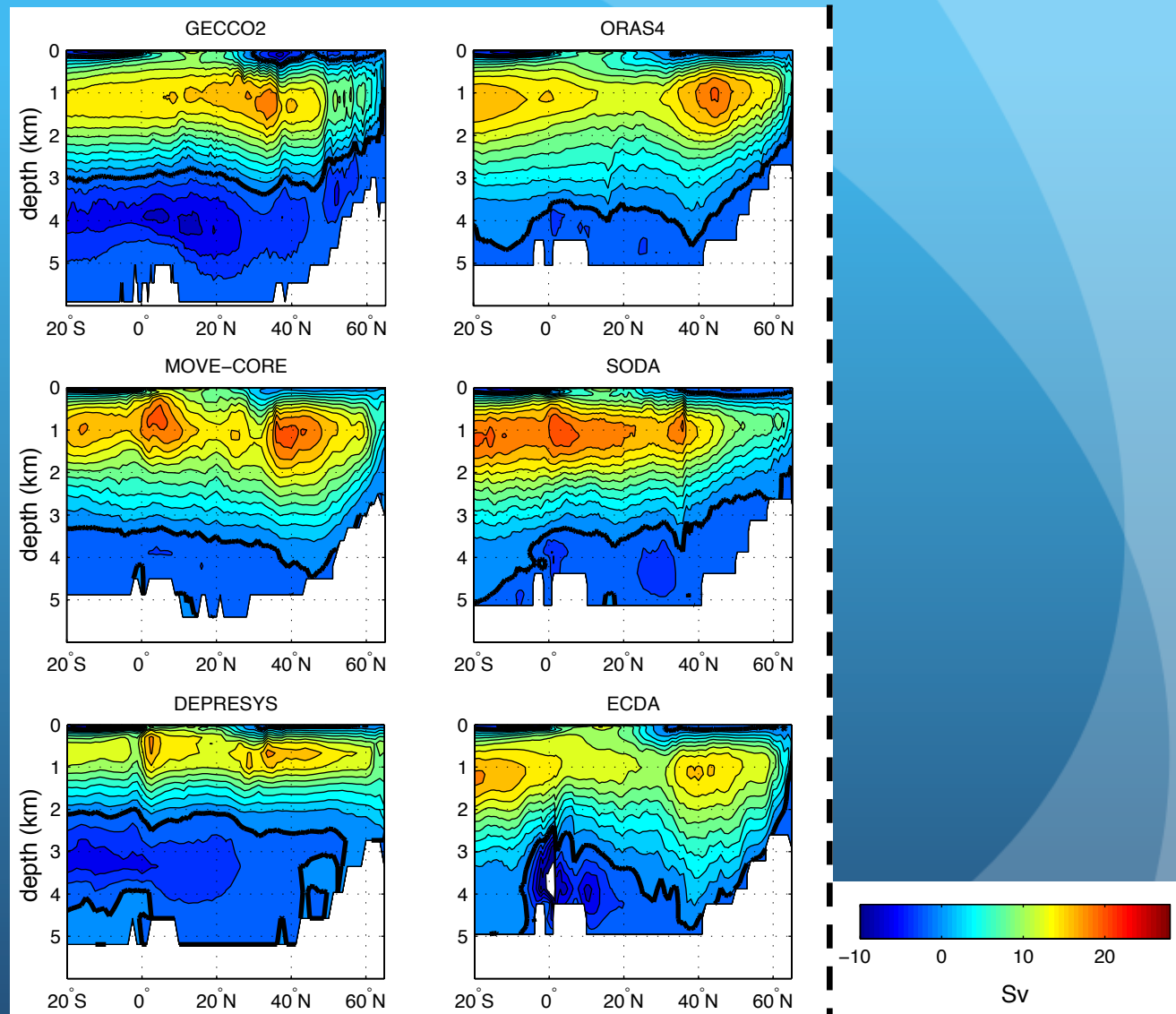
Groups that have contributed* AMOC reanalyses from 1960 - 2007 (or longer)

GROUP	METHOD	INSITU T/S	ALT	SST	NoAssim Control run?	Atm forcing	DP INIT?
GECCO2-REF (U. Hamburg)	4DVAR	YES	YES	YES	YES	NCEP	YES
ORAS4-CNTRL (ECMWF)	NEMOVAR 3DVar	YES	YES	YES	YES	ERA-40/ ERA-I	YES
MRI-CORE (MRI)	3DVar	YES	NO	NO	YES	CORE II IAF	NO
SODA-NOASSIM (U.MaryInd/ TAMU)	OI	YES	NO	YES	YES	20-CR	YES

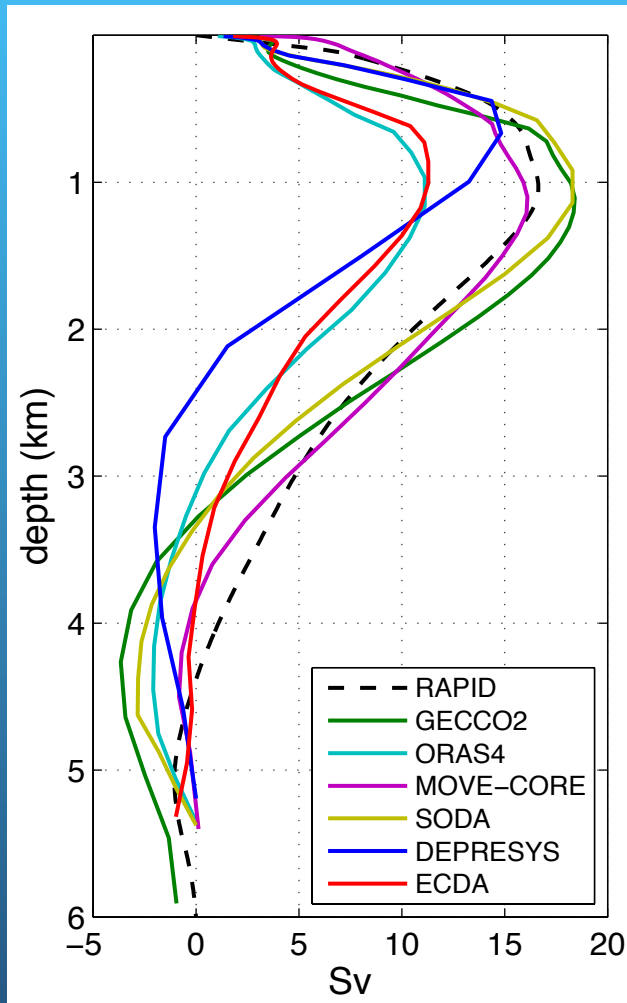
4 groups also contributed “No Assimilation”
simulations to help understand the role of data
constraint

*Karspeck et al. 2015 (submitted Climate Dynamics)

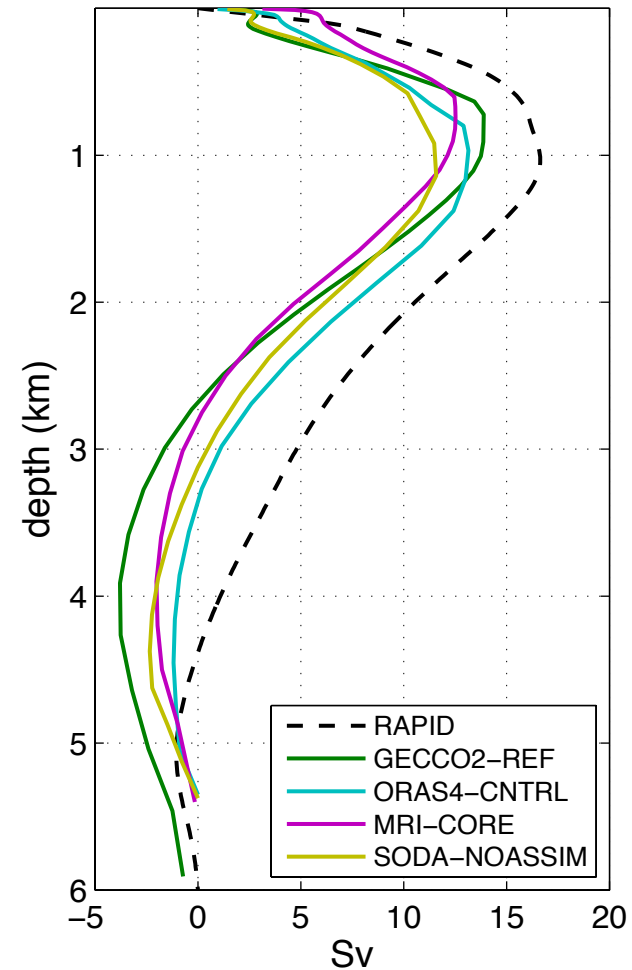
AMOC time mean (1961-2007)



Comparison to RAPID estimates @ 26.5N

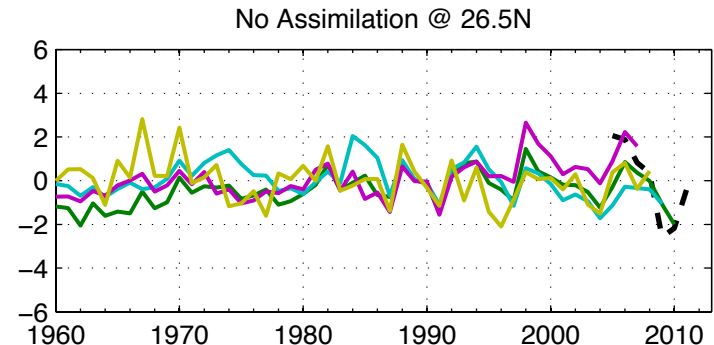
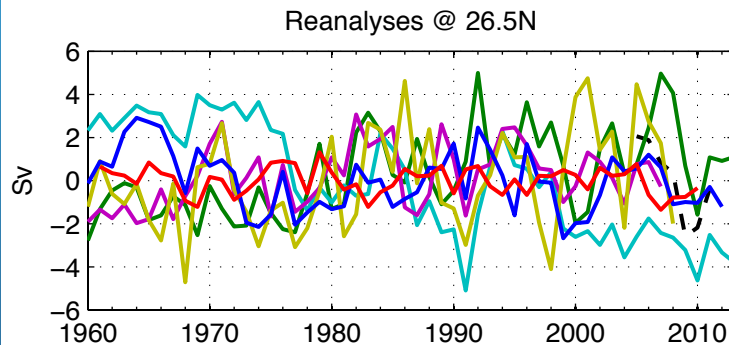
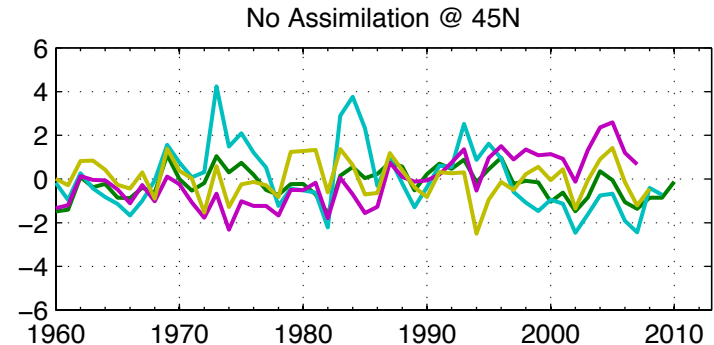
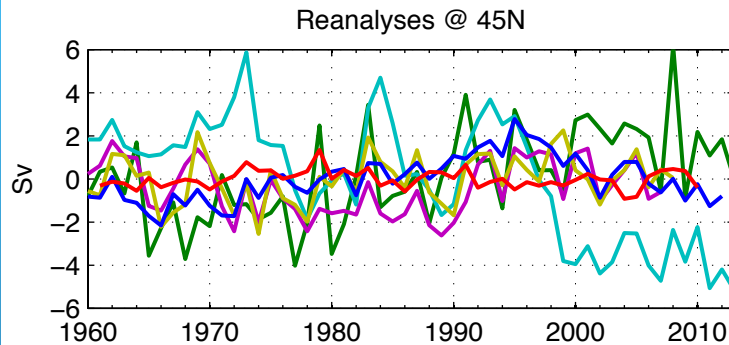


Reanalysis set



NoAssimilation set

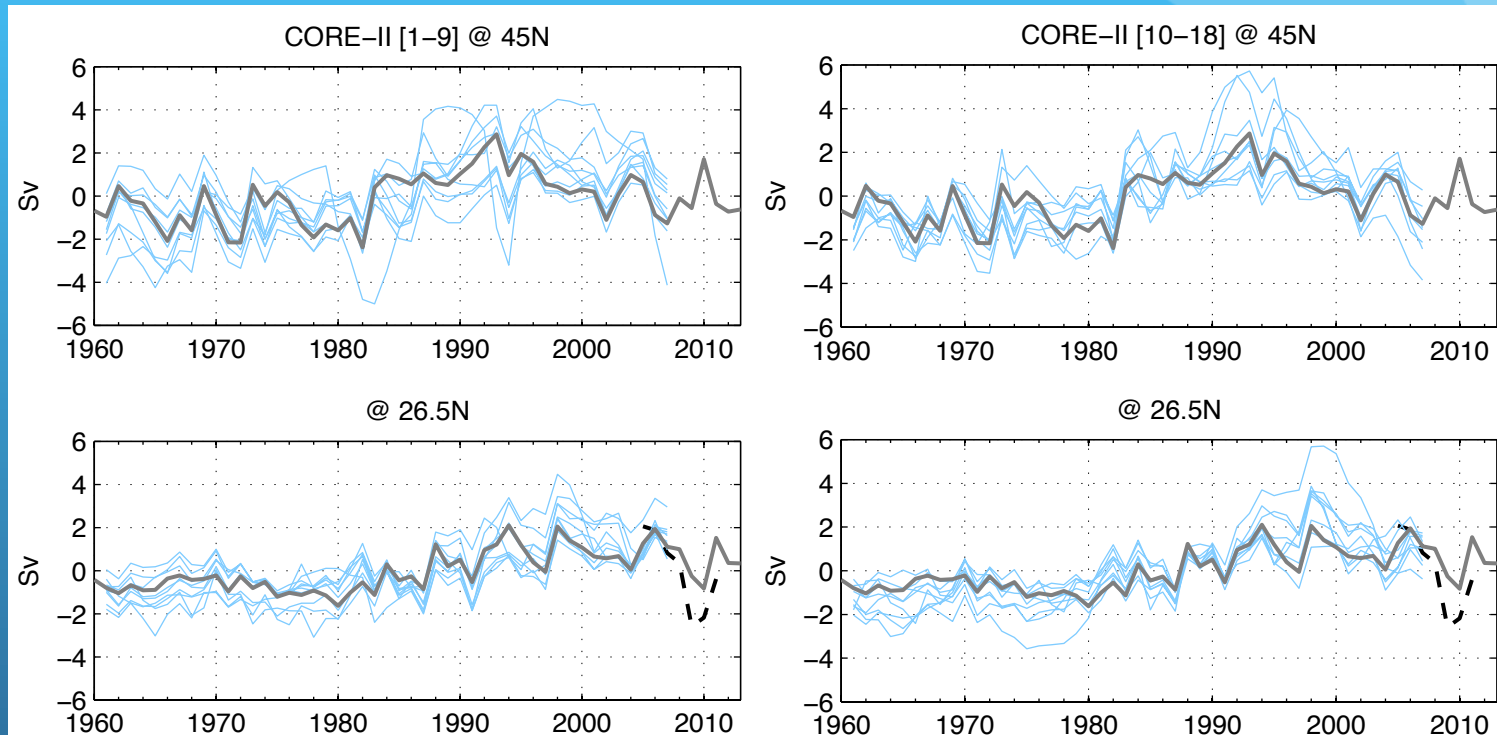
Annual-mean AMOC variability @ 1000m



- - - RAPID.....[n/a ,17.0]
 — GECCO2..... [14.4,16.6]
 — ORAS4..... [20.6,14.1]
 — MOVE-CORE [20.4,15.4]
 — SODA..... [13.6,16.5]
 — DEPRESYS... [14.2,13.5]
 — ECDA..... [15.6,11.8]

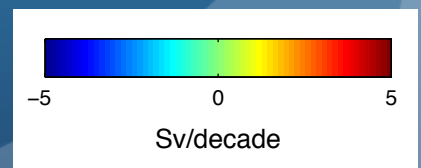
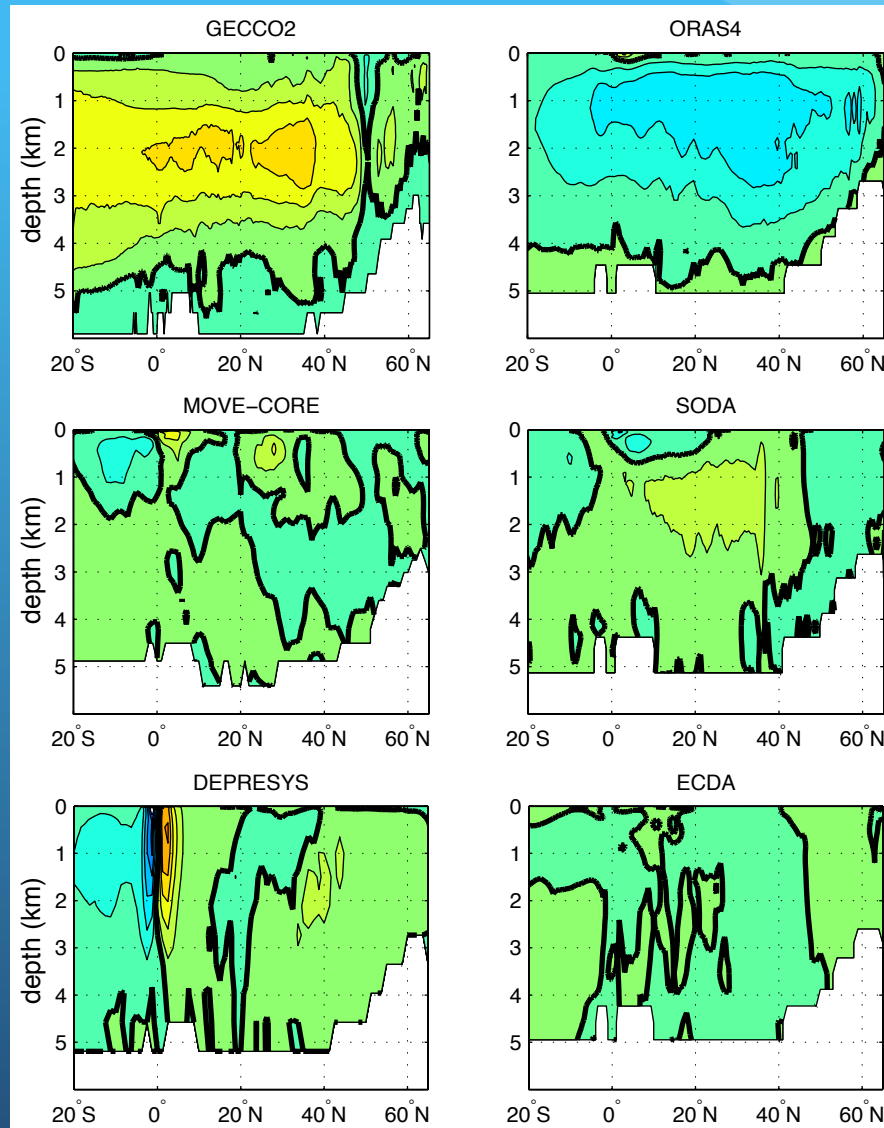
- - - RAPID
 — GECCO2-REF [12.4,14.1]
 — ORAS4-CNTRL ... [13.6,13.7]
 — MRI-CORE [12.7,10.5]
 — SODA-NOASSIM [11.9,11.1]

Annual-mean AMOC variability @ 1000m

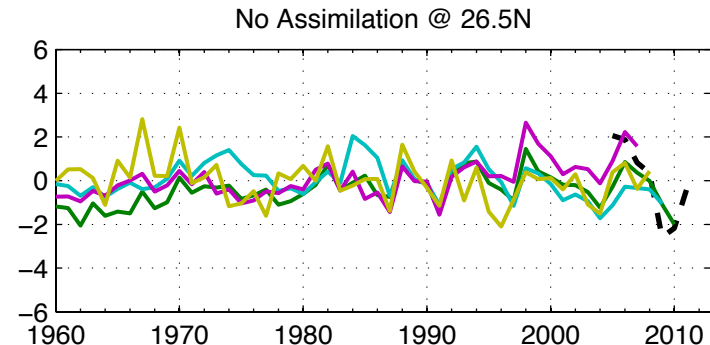
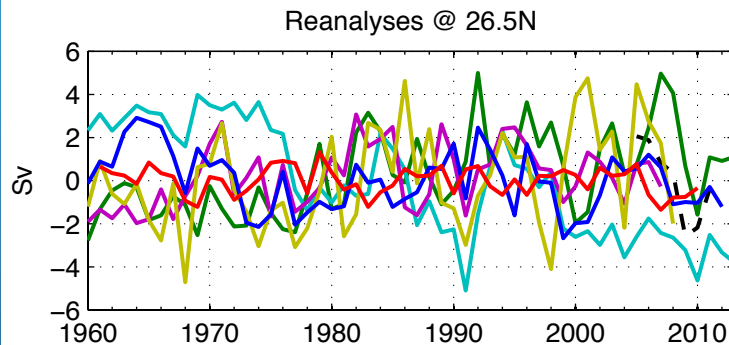
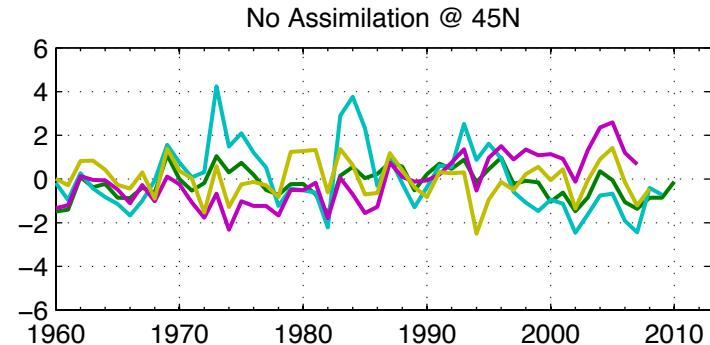
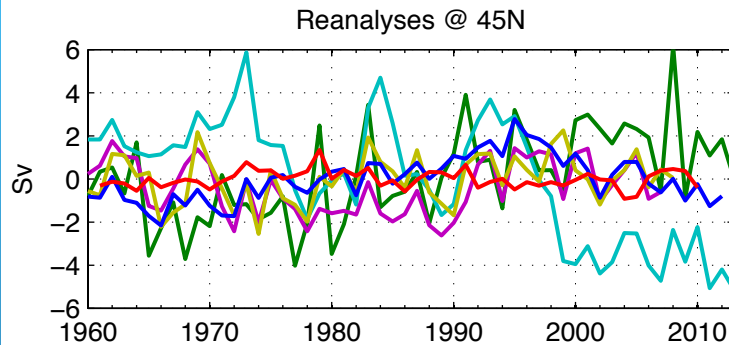


20 different models, identical CORE-IAF forcing, identical spinup procedures

Linear trend (1961-2007)



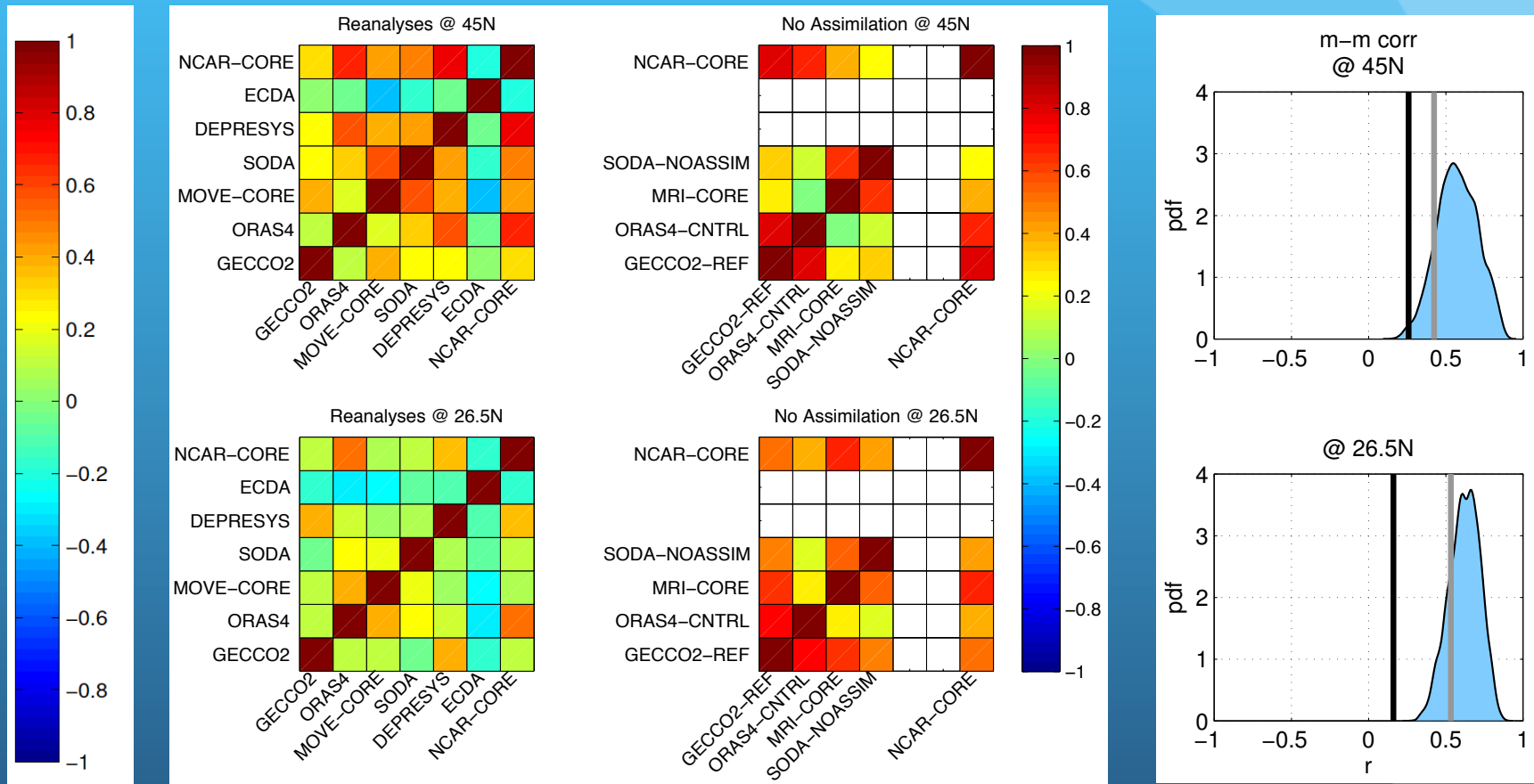
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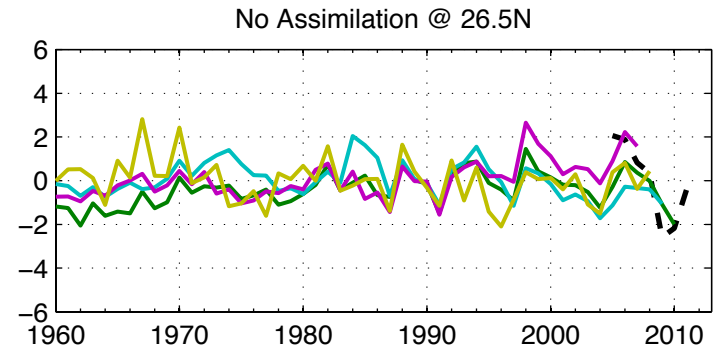
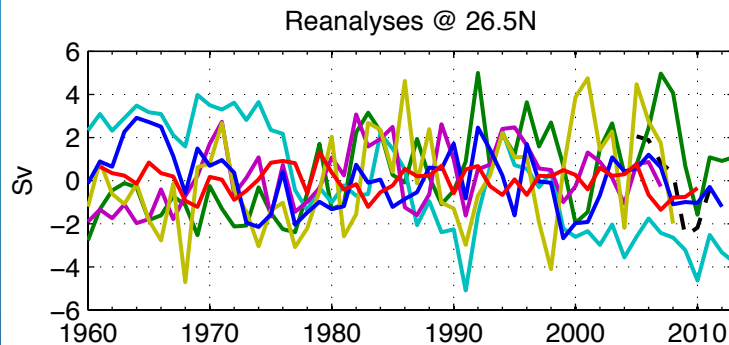
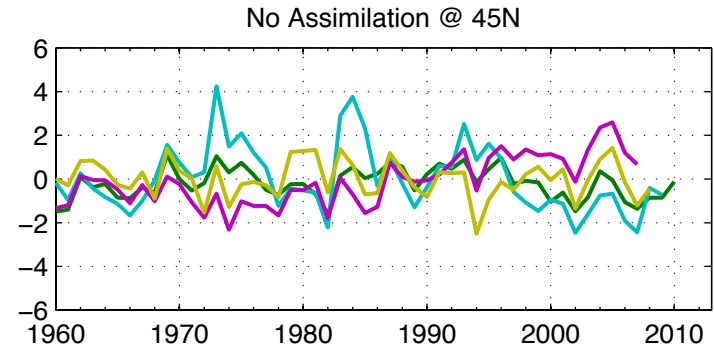
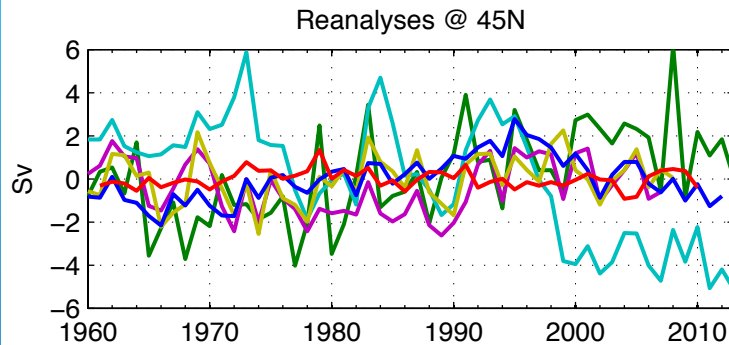
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 — SODA-NOASSIM [11.9,11.1]

Within-group similarity: “model-model correlation”



The assimilation process tends to reduce within group consistency

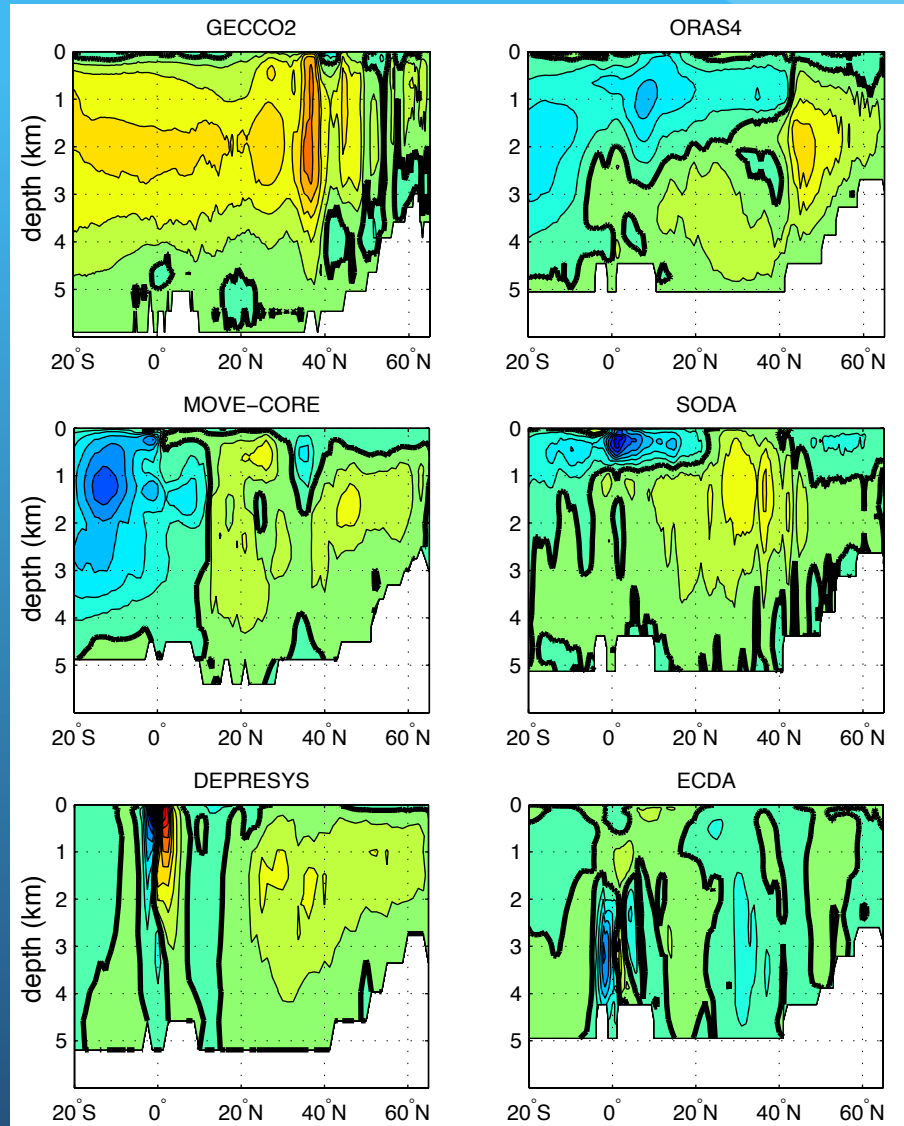
Annual-mean AMOC variability @ 1000m



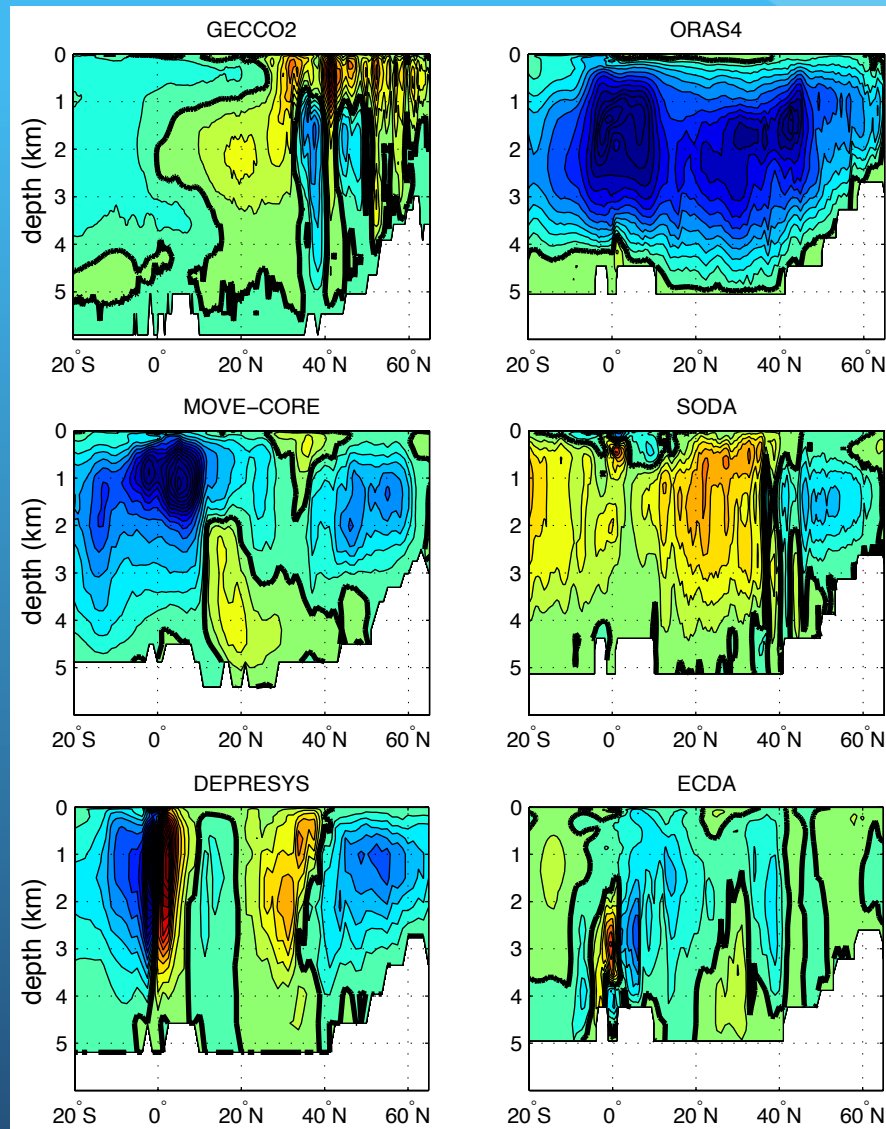
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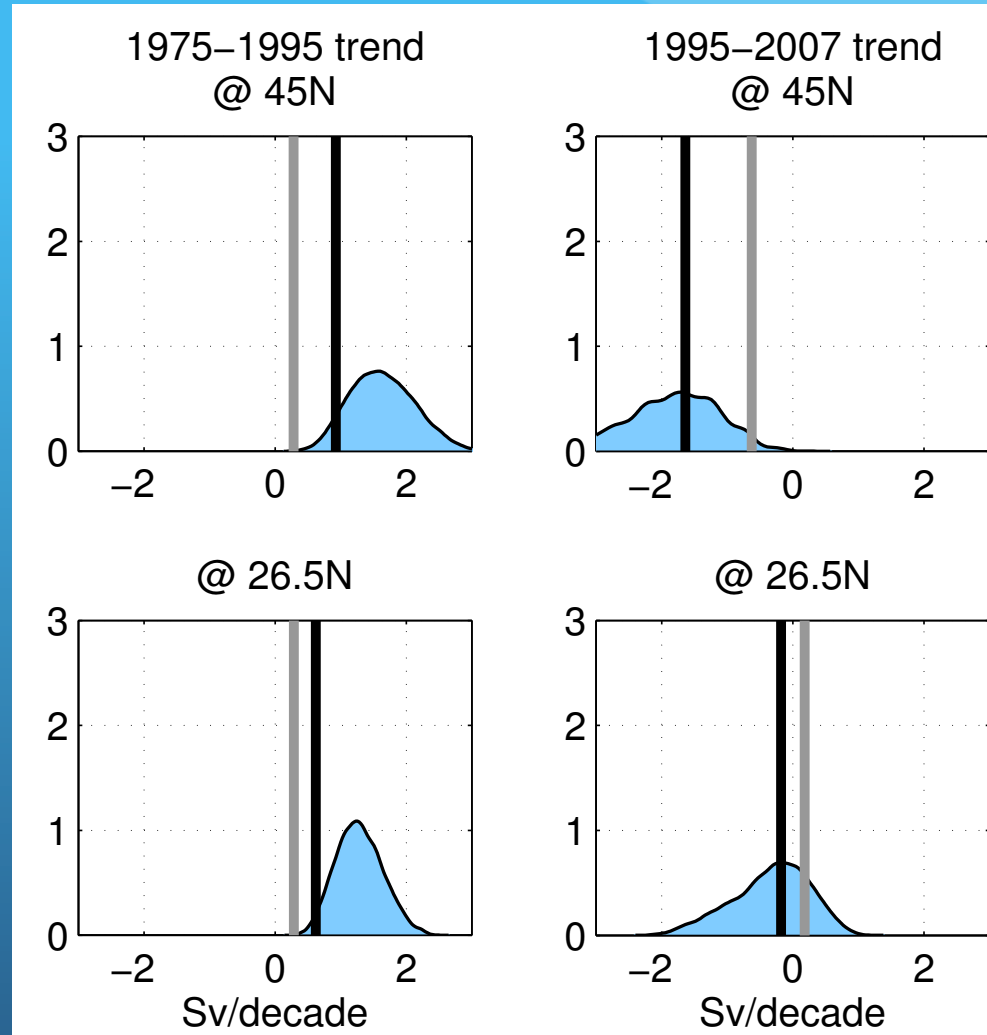
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 — SODA-NOASSIM [11.9,11.1]

Linear trend (1975-1995)

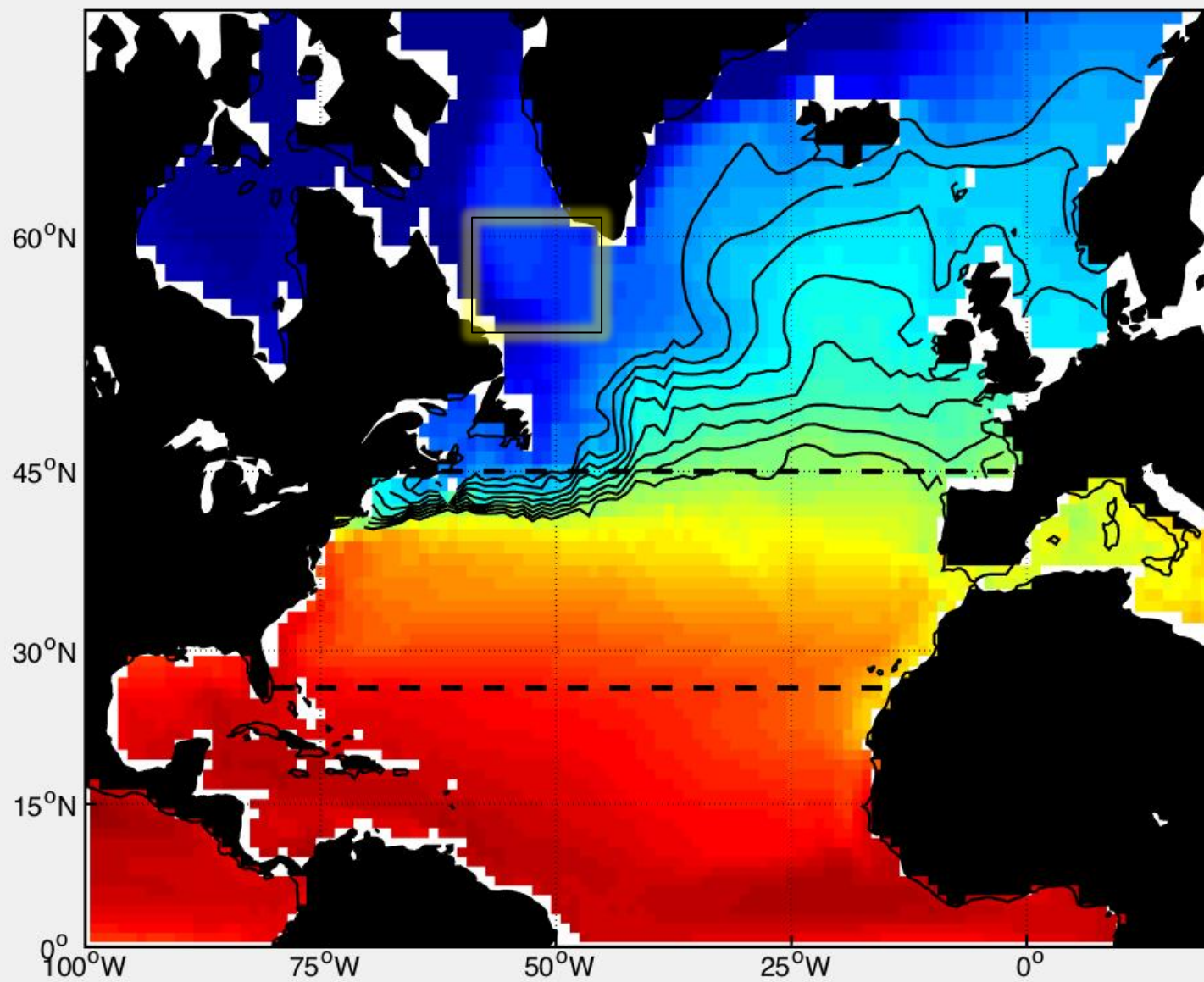


Linear trend (1995-2007)



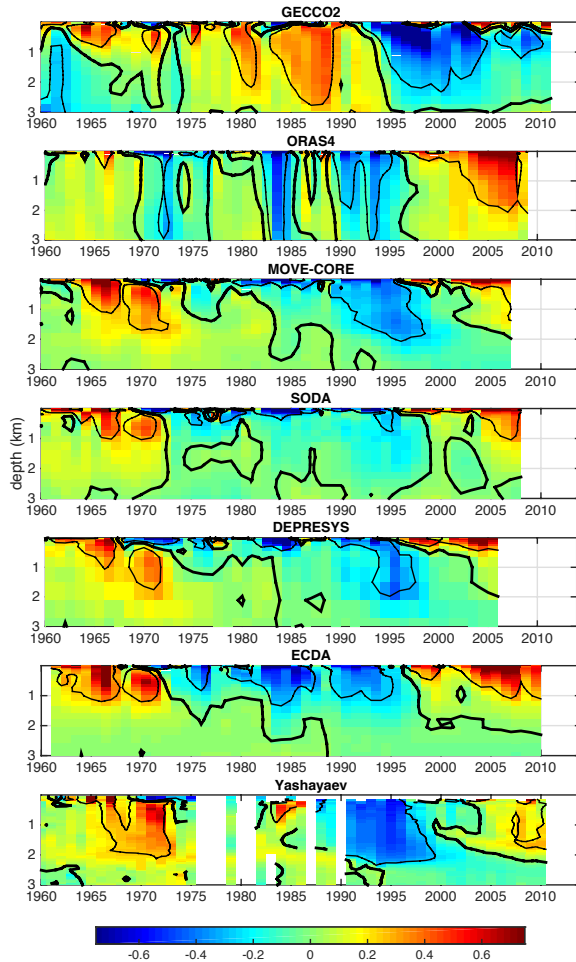


Some indications that DA contributes to the upward trend in AMOC from 1975 to 1995 and a downward trend at 45N in the 2000's*

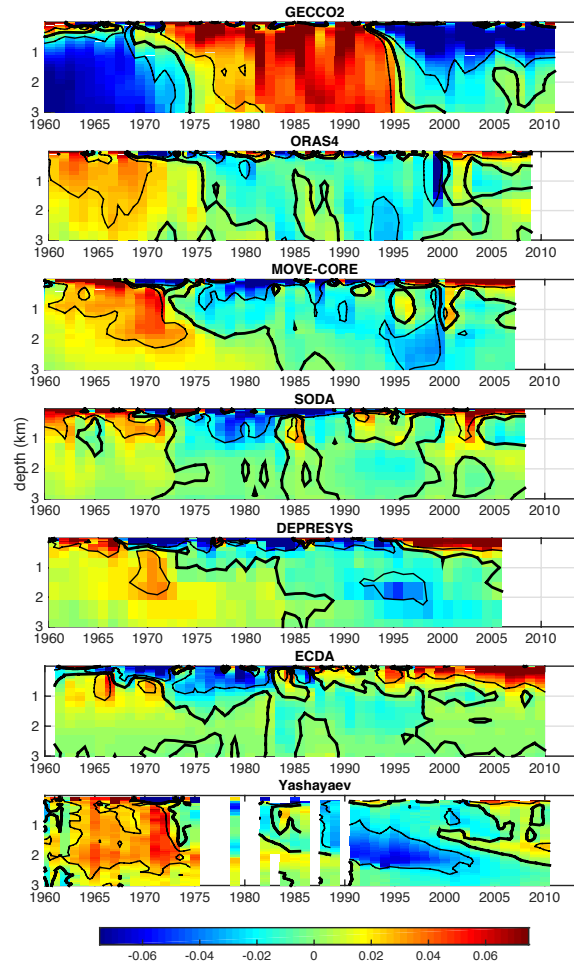


Hydrography in the Labrador Sea

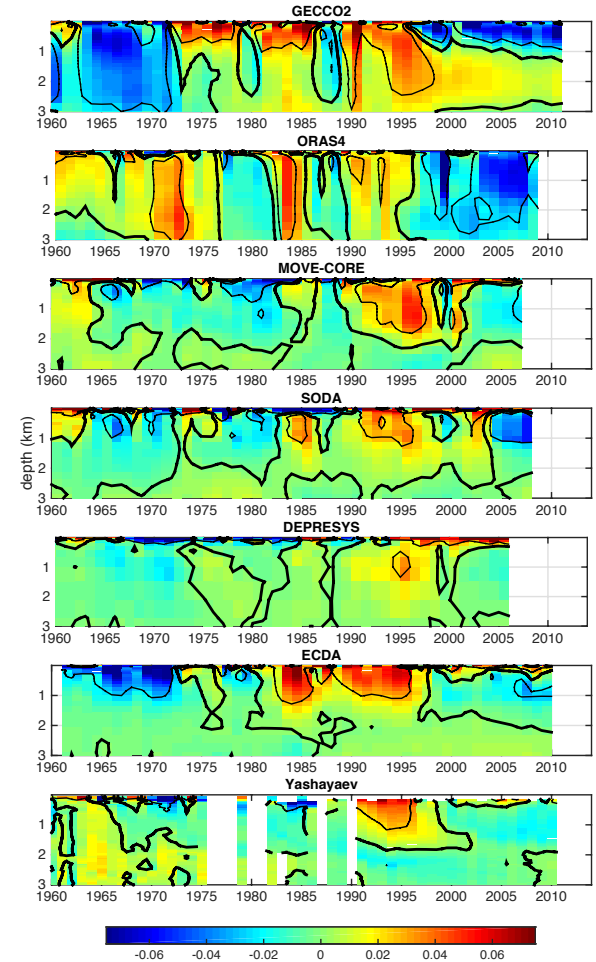
TEMPERATURE



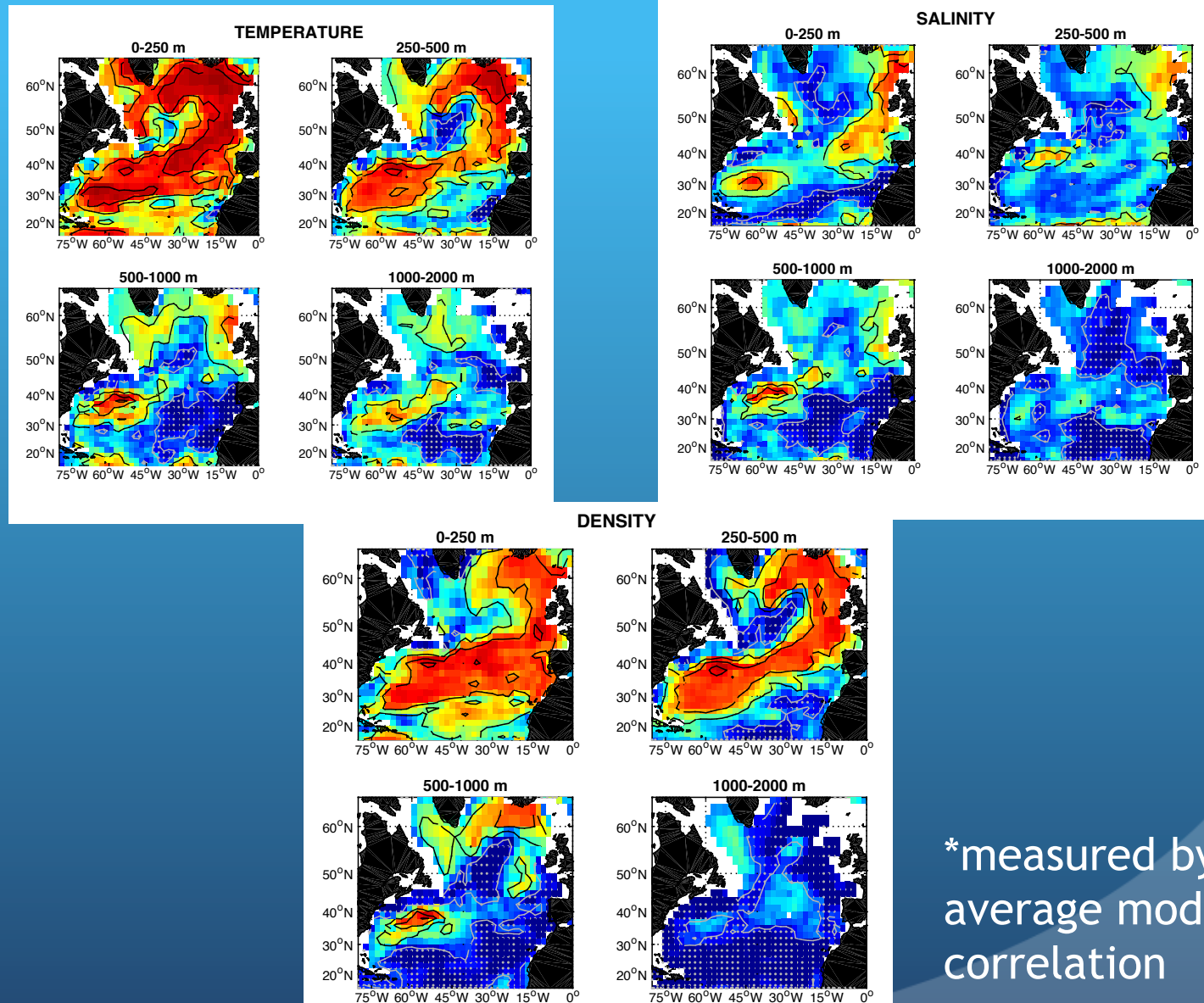
SALINITY



DENSITY



Hydrographic similarities*



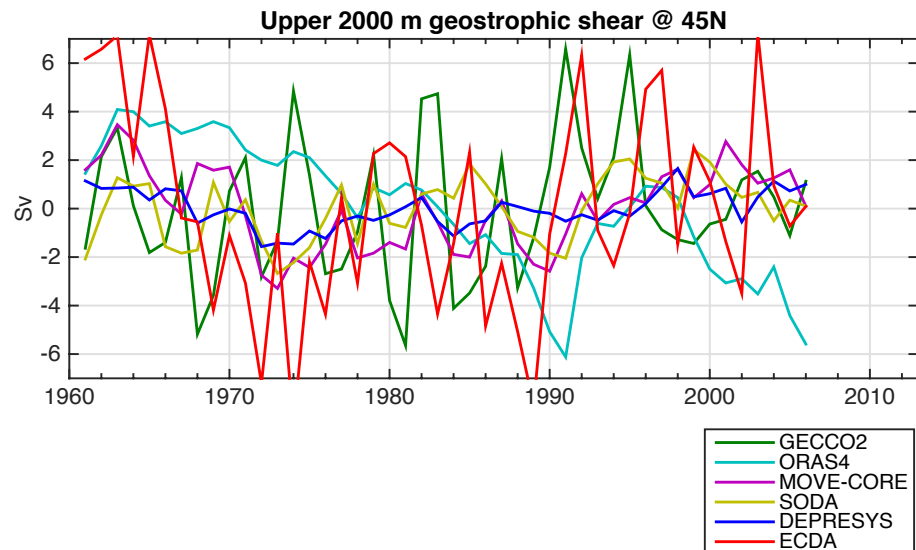
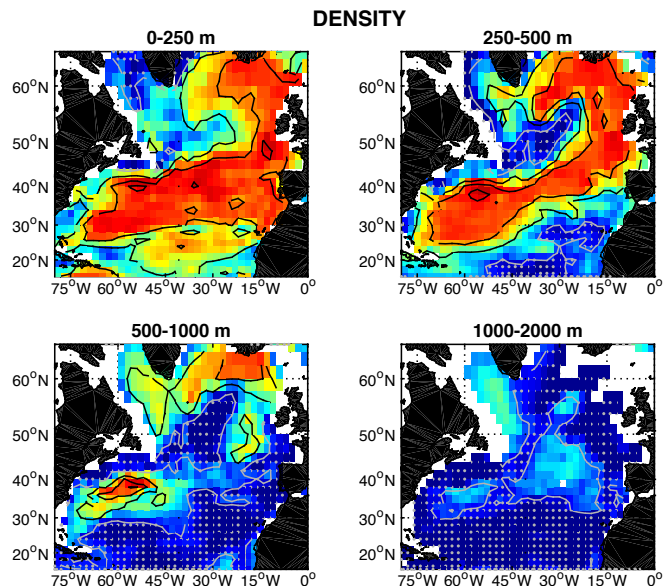
Transport variability computed from end-point density geostrophic shear

$$\Psi_{total} \approx \Psi_{Ekman} + \Psi_{geostrophic}$$

$$\Psi_{geostrophic} = \int_{-H}^0 \frac{g}{f \rho_o} \int_{-H}^z \rho_w(z') - \rho_e(z') dz' dz + H \bar{v}_{-H}^x$$

Geostrophic shear

Velocity at reference level
(includes bottom pressure effects)



Some summary points :

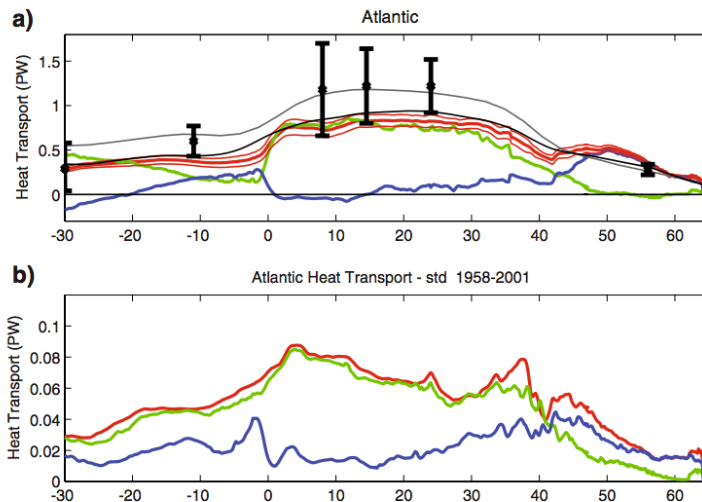
- Ocean data constraints tend to increase mean AMOC strength (closer to RAPID observations)
- Ocean data constraints tend to increase trends and variability strength but...
- Long-term AMOC variability/trends are *less* consistent within ocean reanalysis products than in forced-ocean runs but...
- ... show some agreement over the periods 1975-1995 and 1995 to present (likely associated with low-frequency density variations in the Lab sea)
- Disagreement in boundary density and density at depth in the subtropical gyre contribute to AMOC dissimilarity

Some questions:

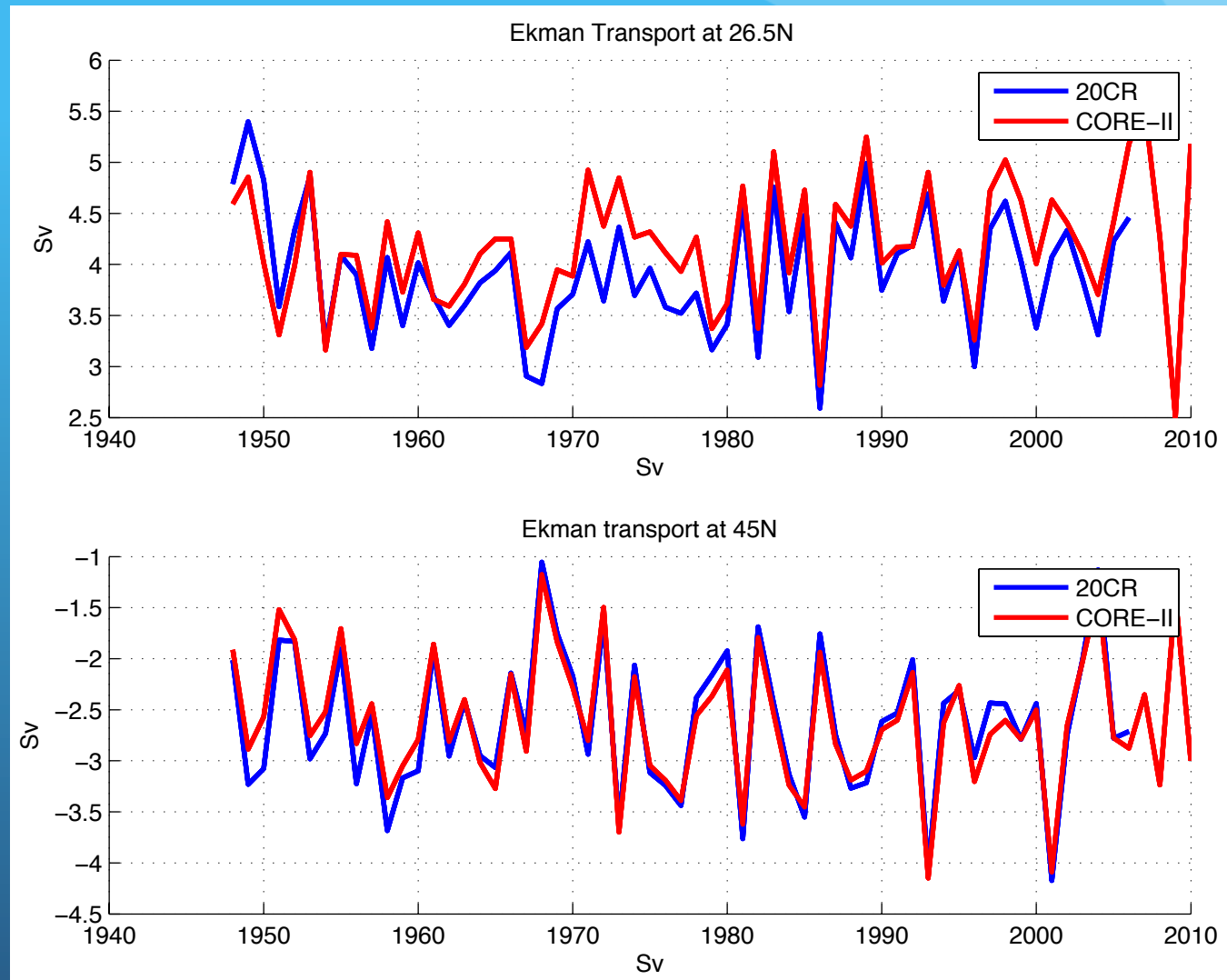
If the AMOC state is important for prediction, can these products be used indiscriminately for initialization and verification?

Is high latitude AMOC really the most important metric for prediction in the subpolar gyre given that ocean heat transport is dominated the gyre circulation?

Fig. 6 Atlantic Meridional Ocean Heat Transport (OHT) from the model hindcast 1958–2001 as a function of latitude: mean (**a**) and standard deviation (**b**). Red line is the total transport, green line is the MOC component and blue line is the gyre component. **a** Also includes estimates of mean Atlantic transport from Trenberth and Caron (2001) (grey line), Grist and Josey (2003) (black line) and hydrographic sections (black crosses, see Table 1 for details). Thin red lines are ± 1 standard deviation of the total heat transport



Extra slides...





Lab Sea Dens (0-1000m) leads AMOC (45-50)

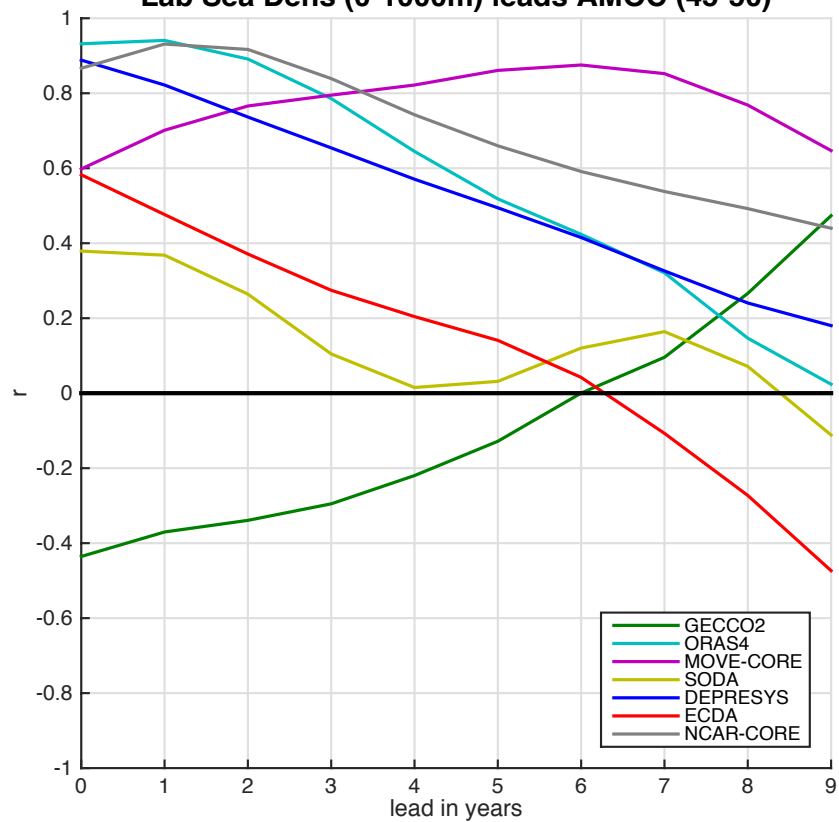
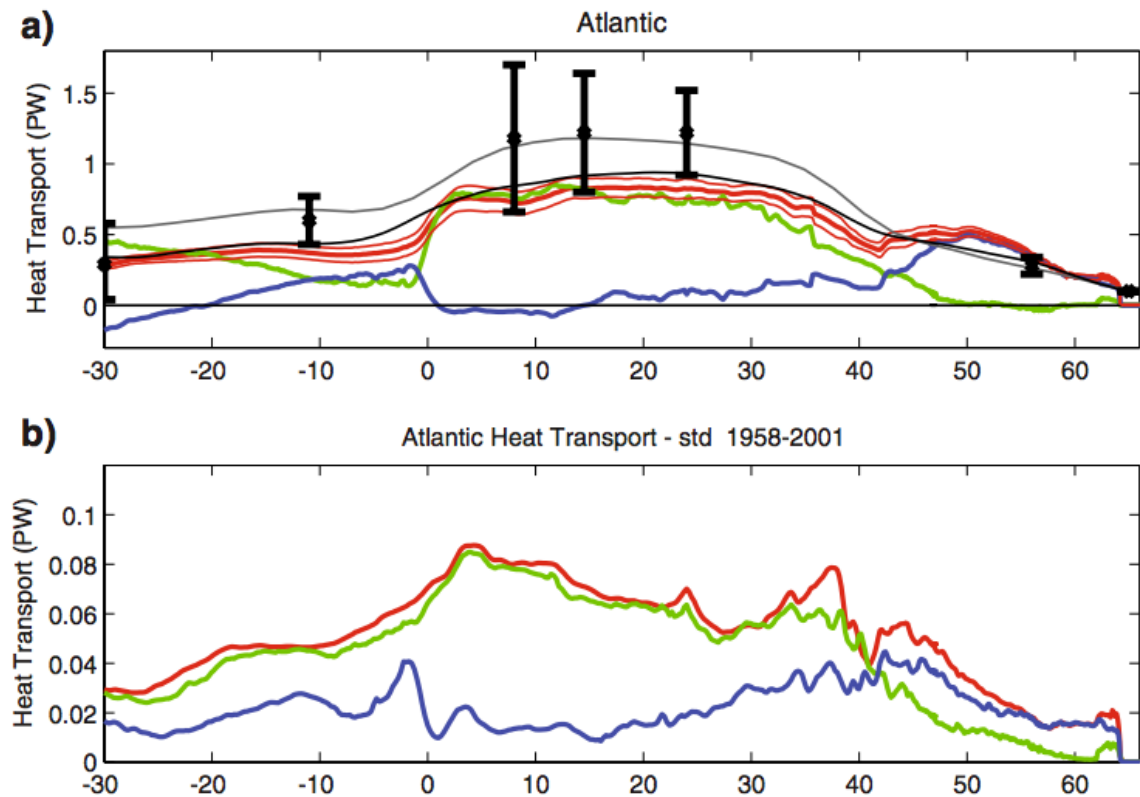
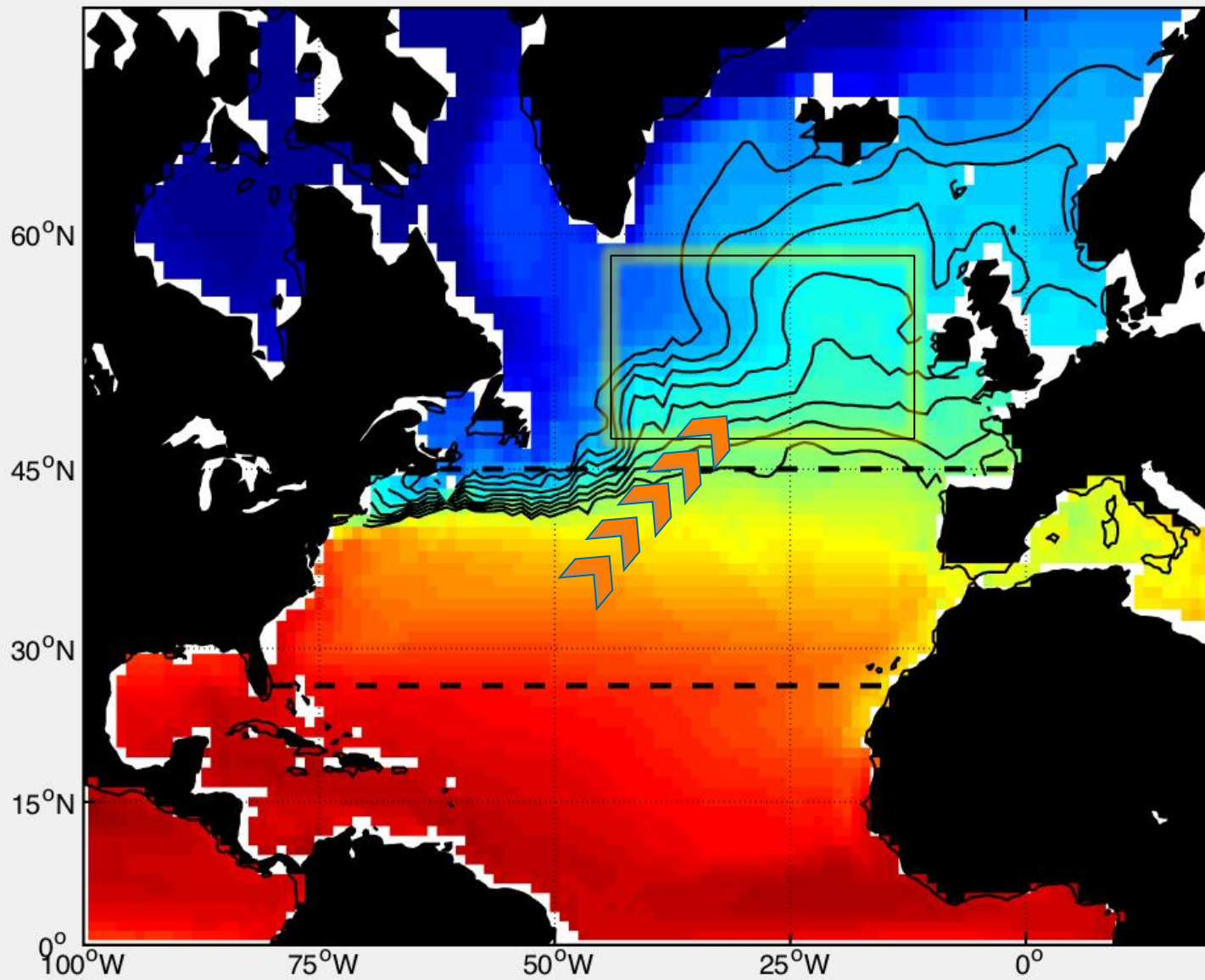


Fig. 6 Atlantic Meridional Ocean Heat Transport (OHT) from the model hindcast 1958–2001 as a function of latitude: mean (a) and standard deviation (b). *Red line* is the total transport, *green line* is the MOC component and *blue line* is the gyre component. **a** Also includes estimates of mean Atlantic transport from Trenberth and Caron (2001) (grey line), Grist and Josey (2003) (black line) and hydrographic sections (black crosses, see Table 1 for details). *Thin red lines* are ± 1 standard deviation of the total heat transport





$$[\mathbf{vT}]' = \underline{\mathbf{v}}T' + \mathbf{v}'\underline{\mathbf{T}} + \mathbf{v}'\mathbf{T}'$$

Fig. 7 **a** Time series of full-depth ocean heat content anomaly, OHC^* (J), in the North Atlantic subpolar gyre. **b** Anomalous annual change in heat content, ΔOHC^* (J, black bars), and the contribution to this change from anomalous surface heat flux (blue bars), anomalous ocean heat transport convergence (red bars) and residual terms (cyan bars). **c** Ocean heat convergence for the North Atlantic Subpolar Gyre region (solid red line) and corresponding heat transports at the southern (dashed) and northern (dot-dashed) boundaries of the domain (W). **d** Anomalies of the MOC (solid) and gyre (dot-dashed) components of heat transport (W) at the southern boundary

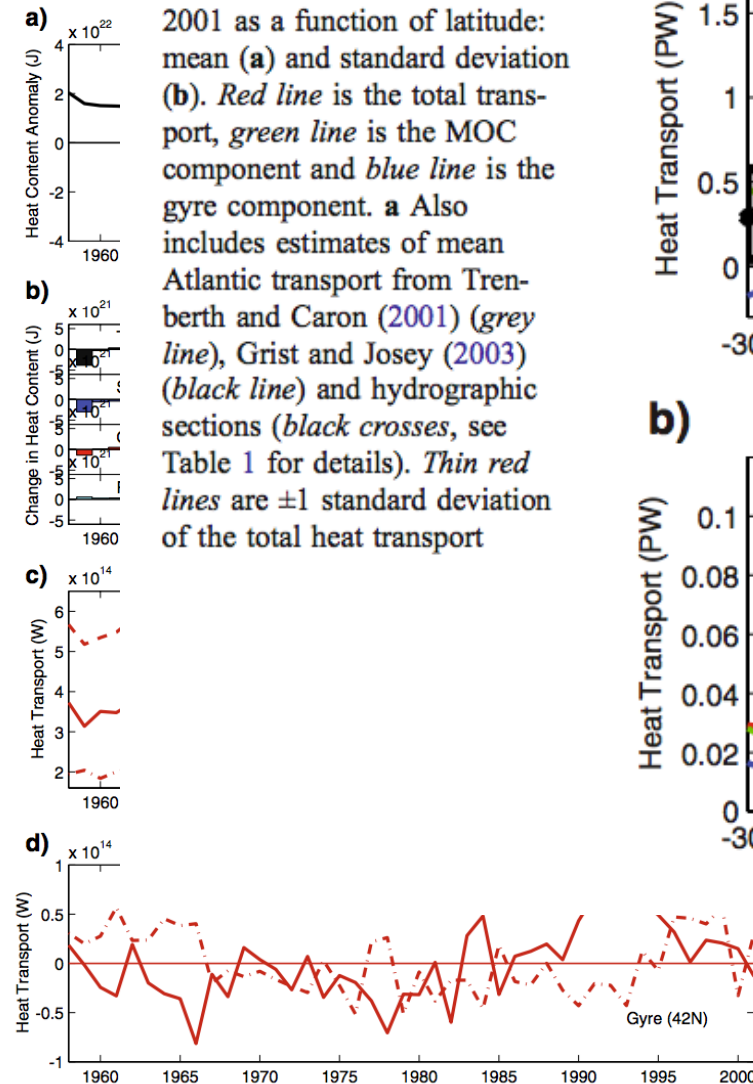
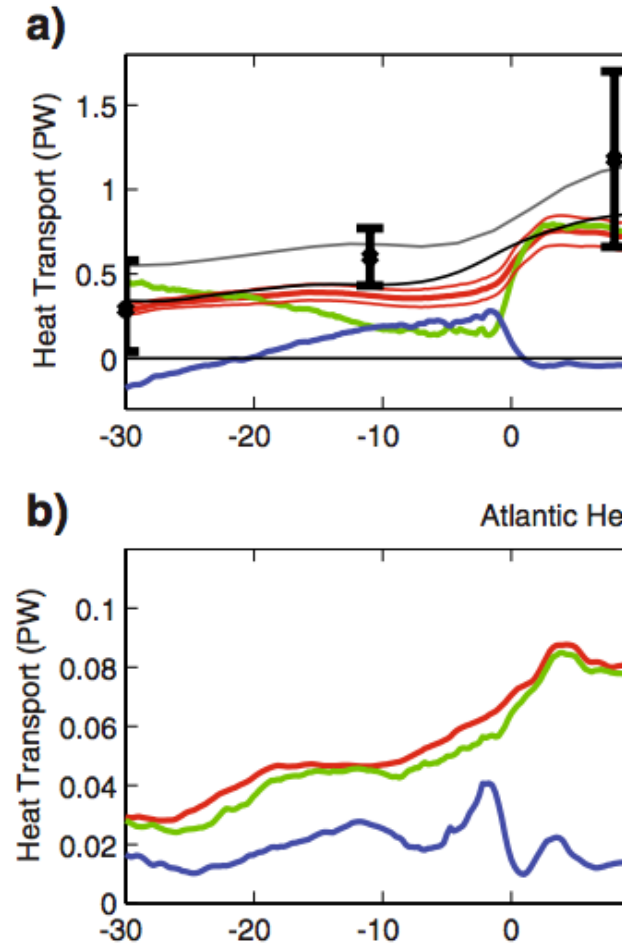
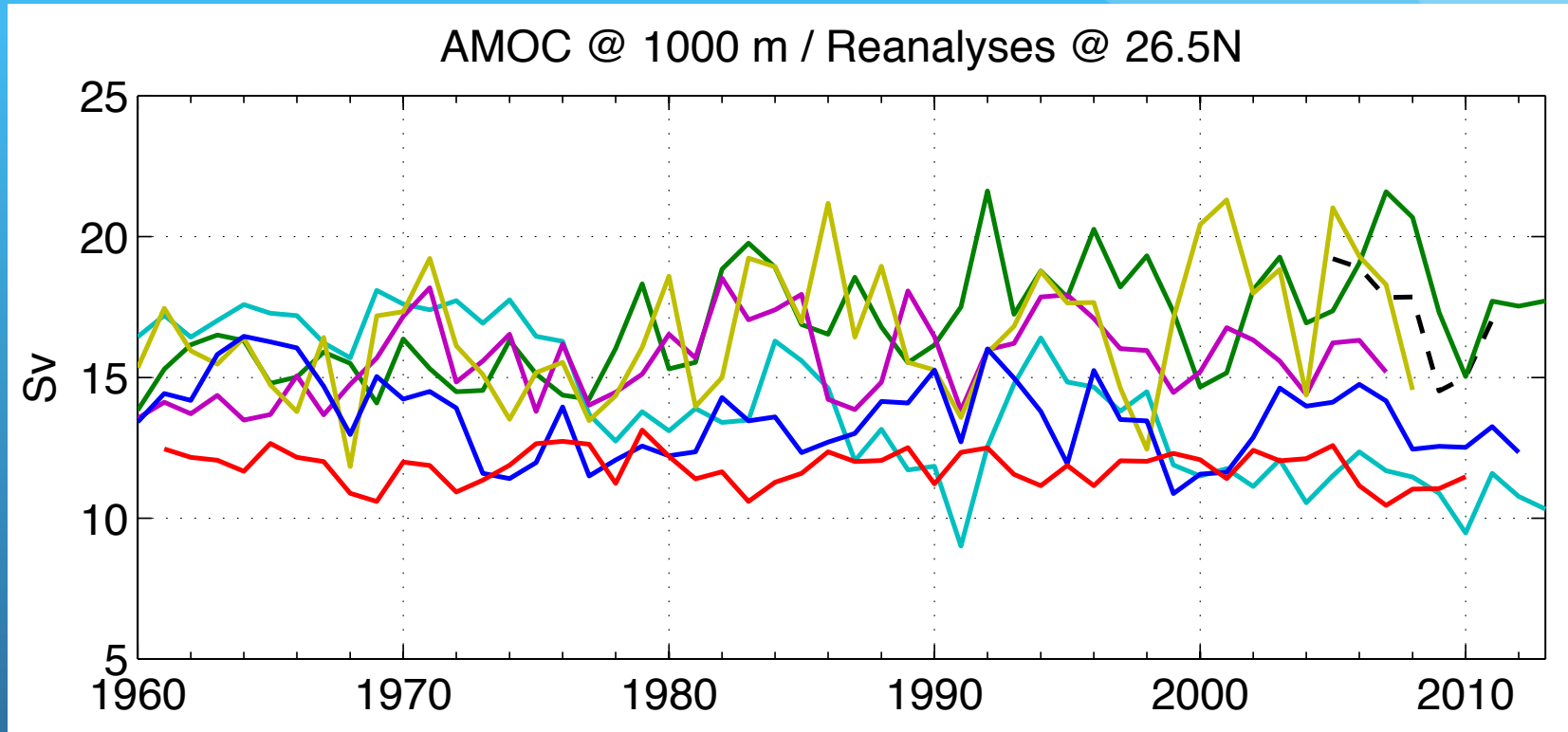


Fig. 6 Atlantic Meridional Ocean Heat Transport (OHT) from the model hindcast 1958–2001 as a function of latitude: mean (a) and standard deviation (b). Red line is the total transport, green line is the MOC component and blue line is the gyre component. **a** Also includes estimates of mean Atlantic transport from Trenberth and Caron (2001) (grey line), Grist and Josey (2003) (black line) and hydrographic sections (black crosses, see Table 1 for details). Thin red lines are ± 1 standard deviation of the total heat transport



Reanalyses set

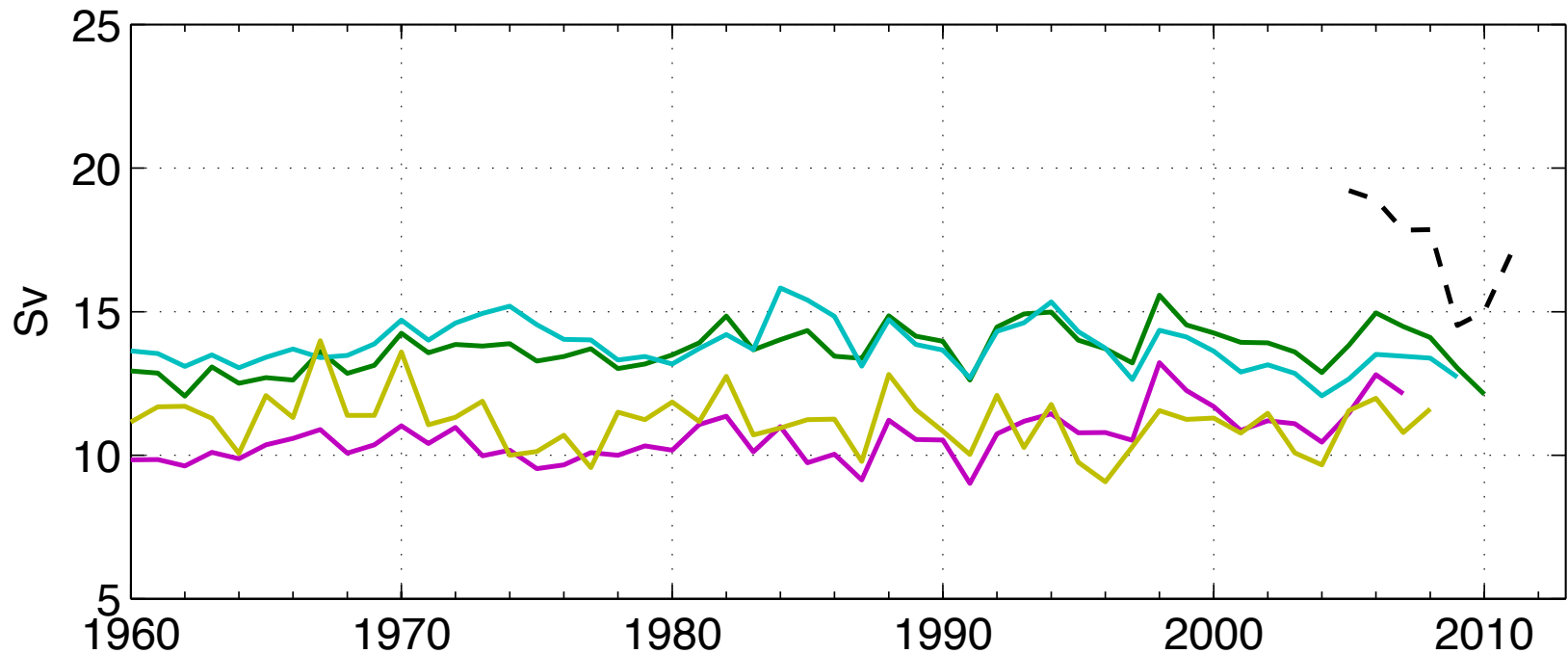


*6 different models, forcing
datasets, spinups
ALL constrained by ocean data*

- RAPID
- GECCO
- ORAS4
- MOVE-CORE
- SODA
- DEPRESYS
- GFDL

No Assimilation

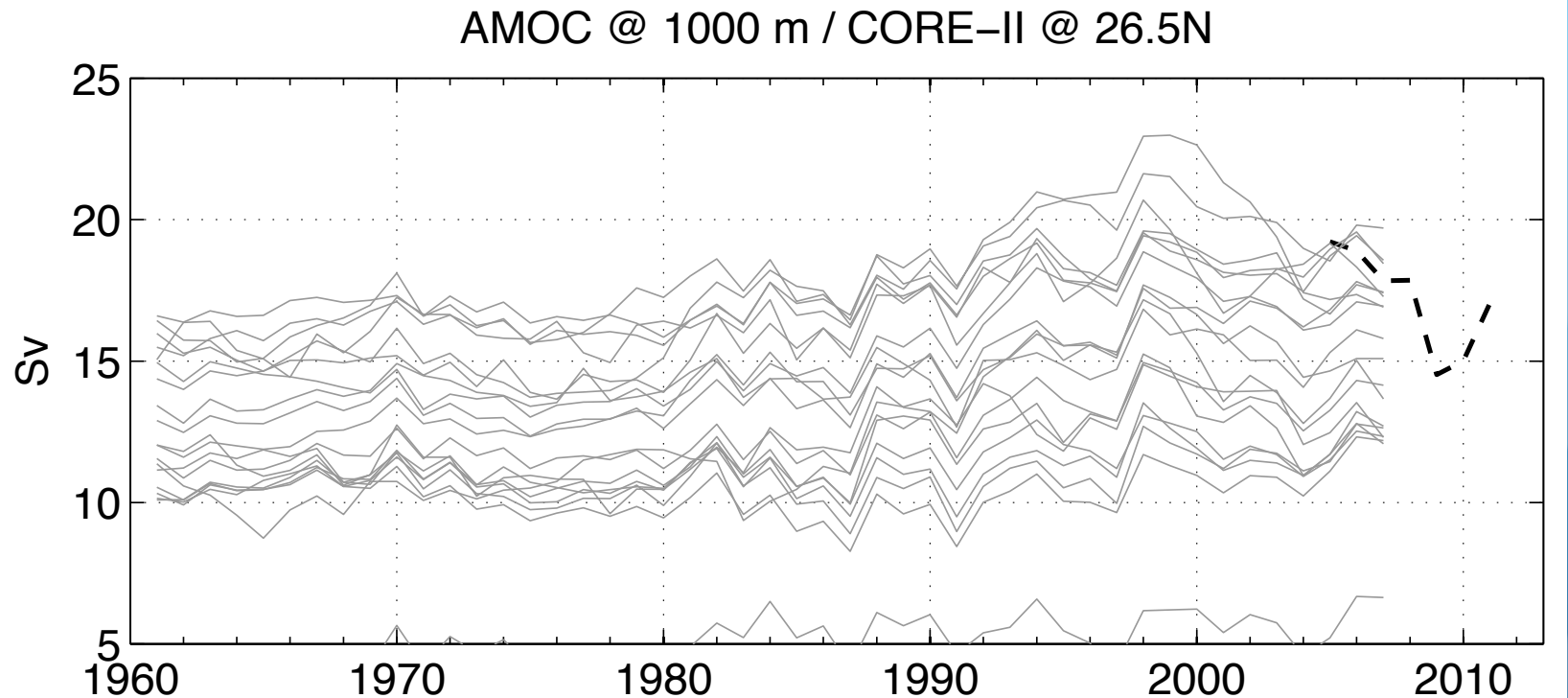
AMOC @ 1000 m / NoAssimilation @ 26.5N



*4 different models, forcing
datasets, spinups*

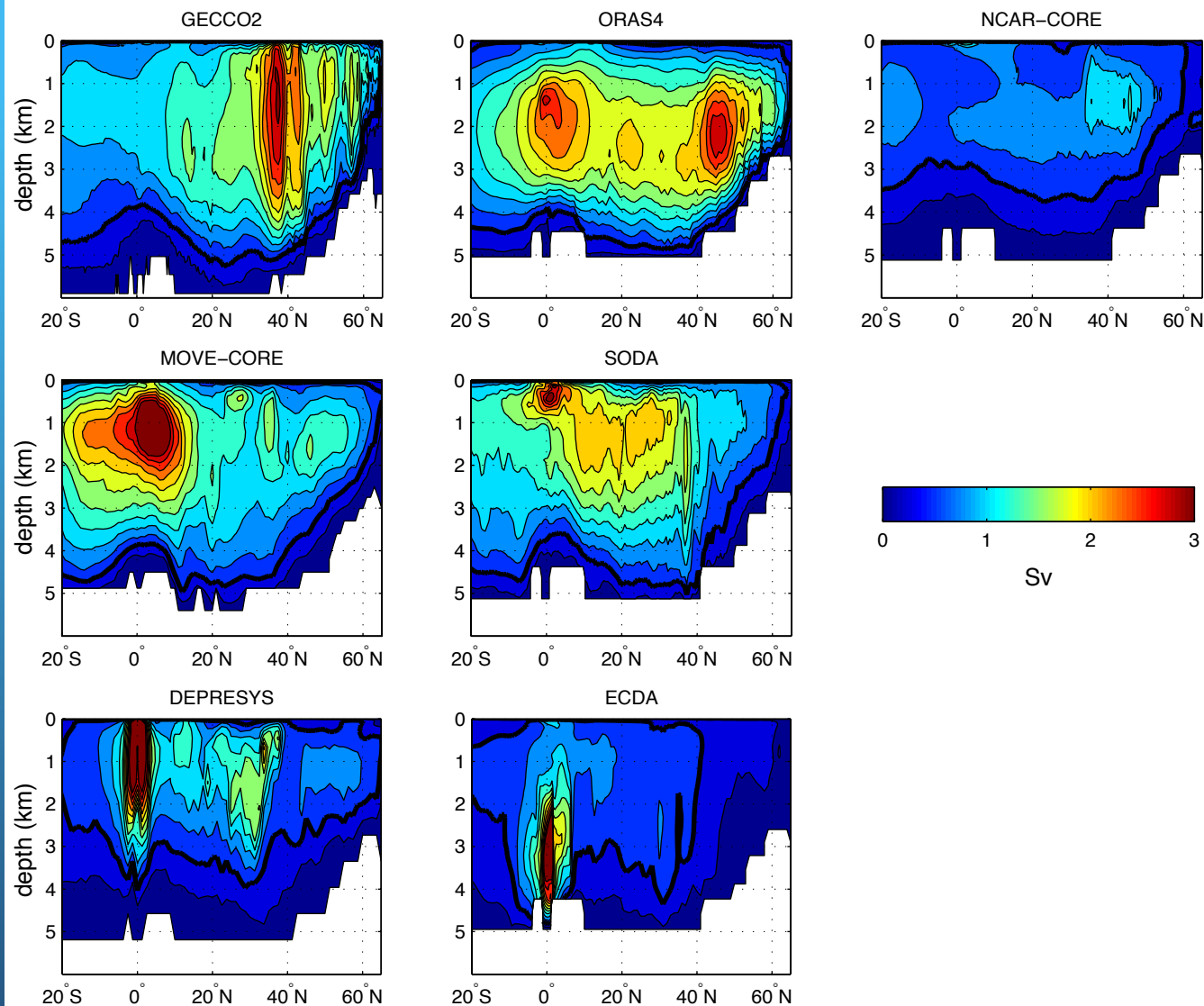
- - - RAPID
- GECCO
- ORAS4
- MOVE-CORE
- SODA

CORE-II



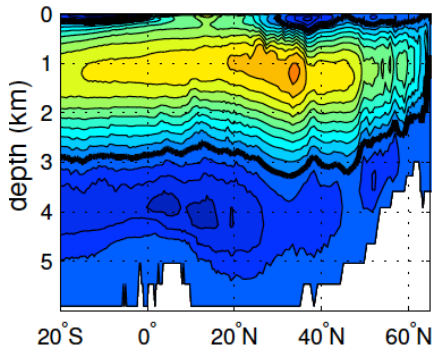
20 different models, identical CORE-IAF forcing, identical spinup procedures

AMOC Variability (all groups)

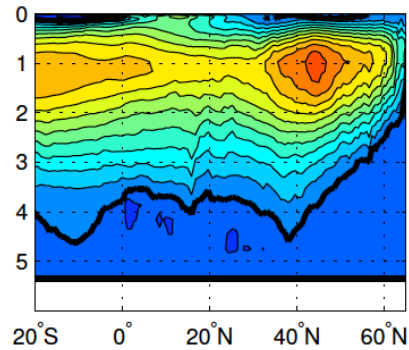


Time-Mean AMOC

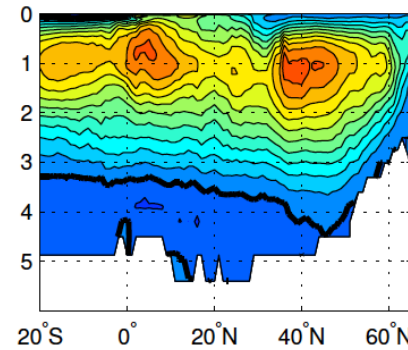
GECCO



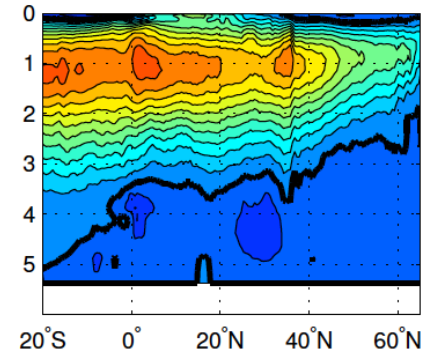
ORAS4



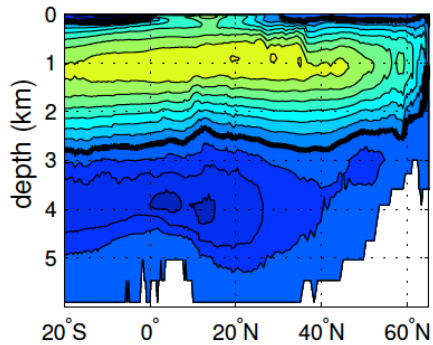
MOVE-CORE



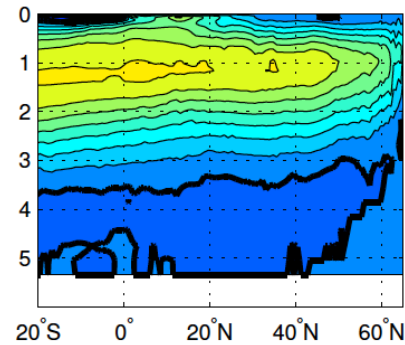
SODA



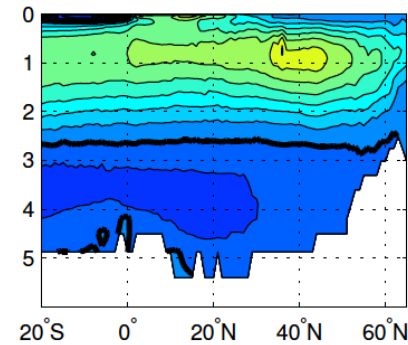
GECCO-REF



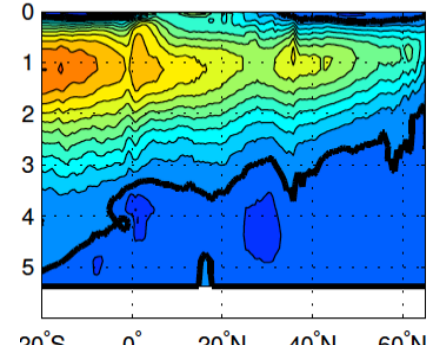
ORAS4-CNTRL



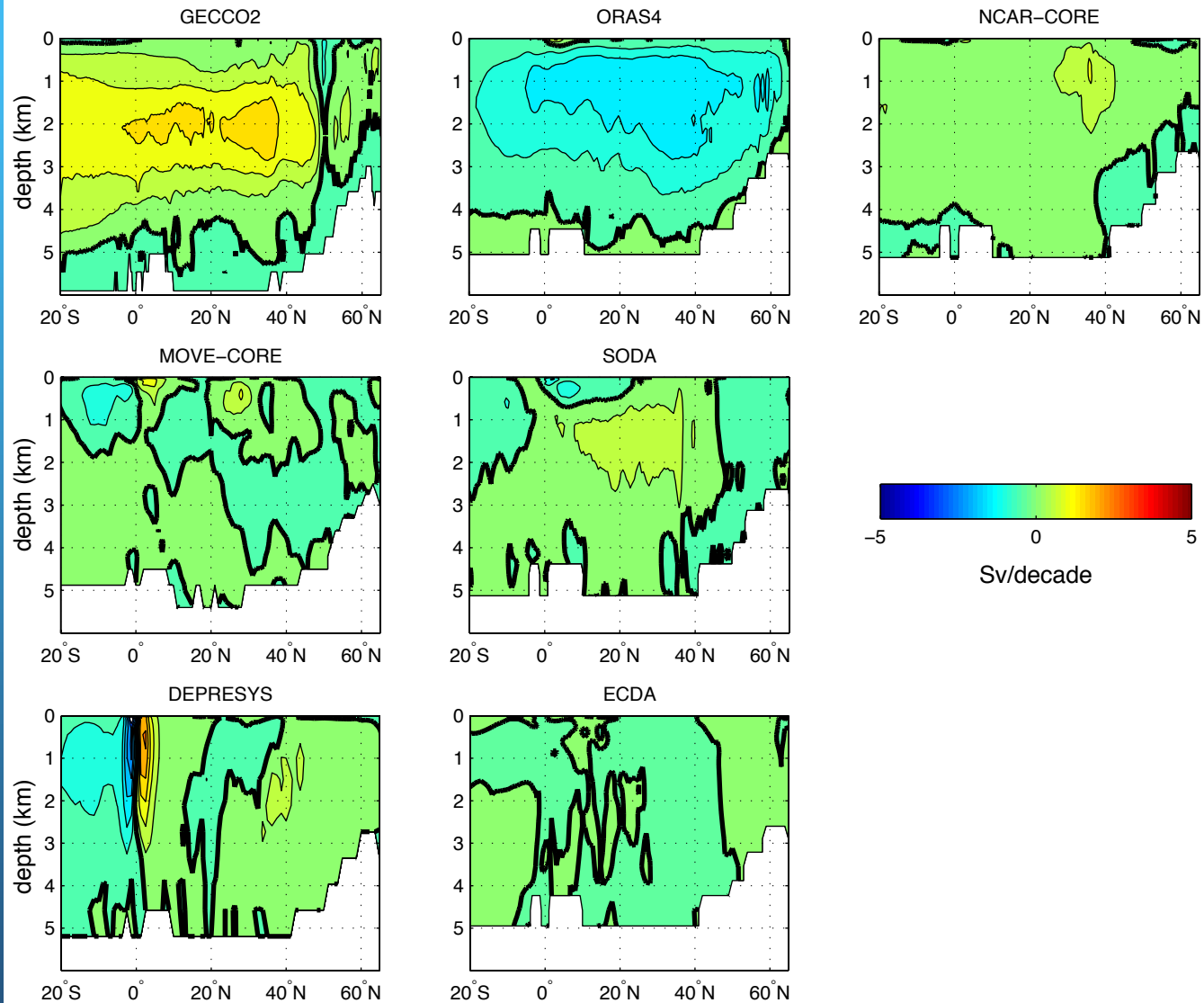
MRI-CORE



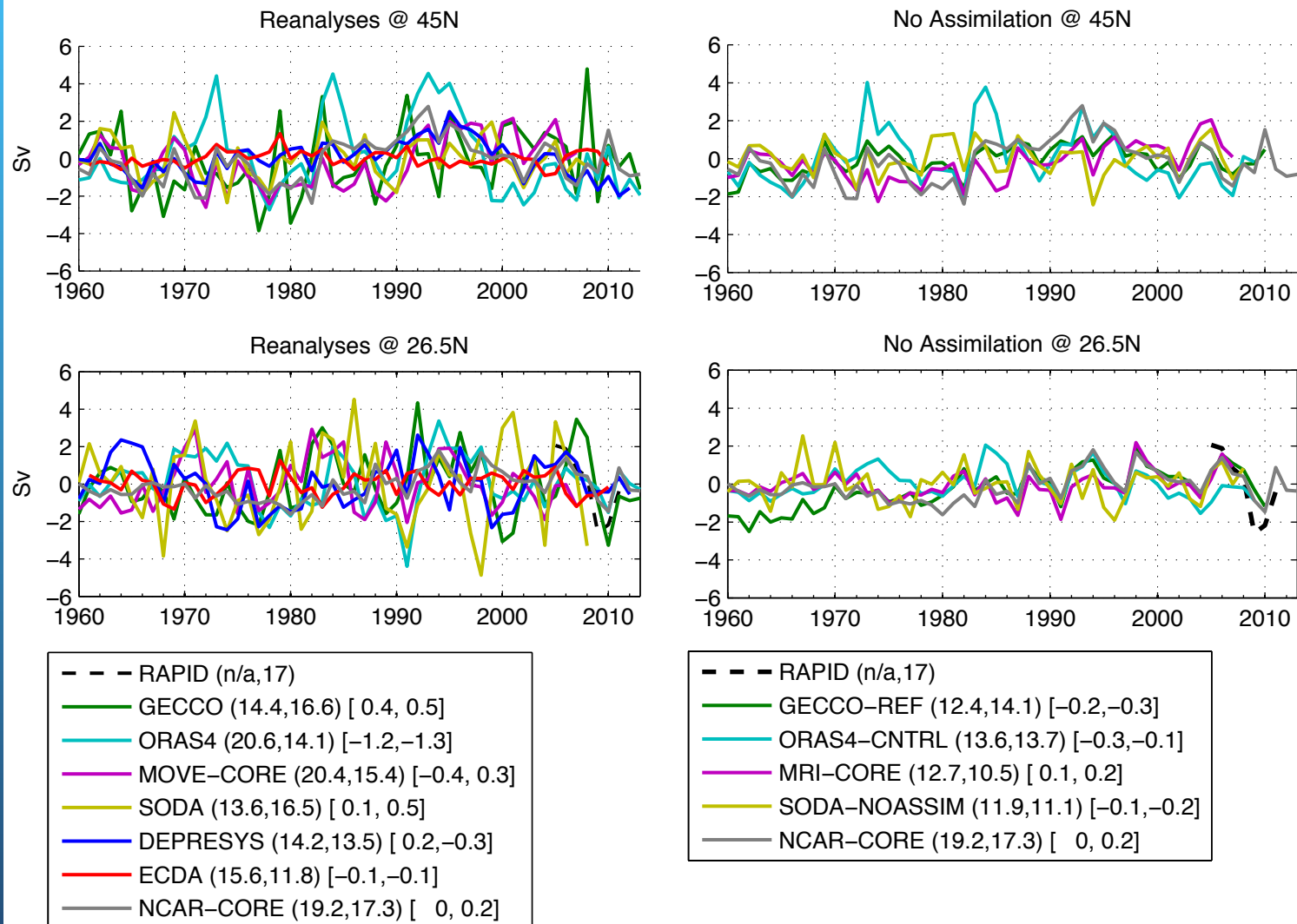
SODA-NOASSIM



AMOC Trend (1960-2007)

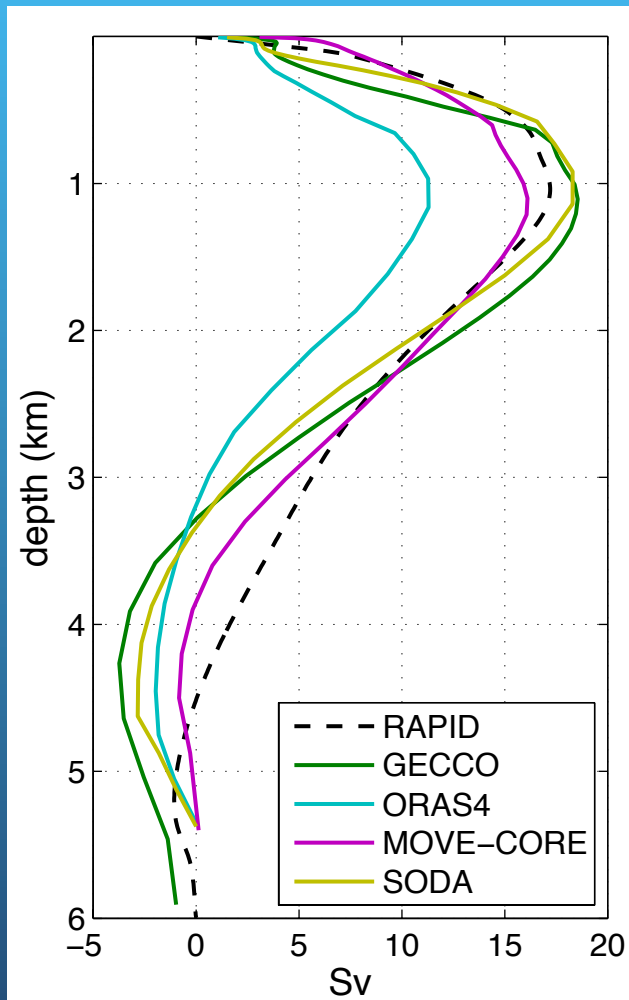


Agreement in year-to-year signal? (all groups)

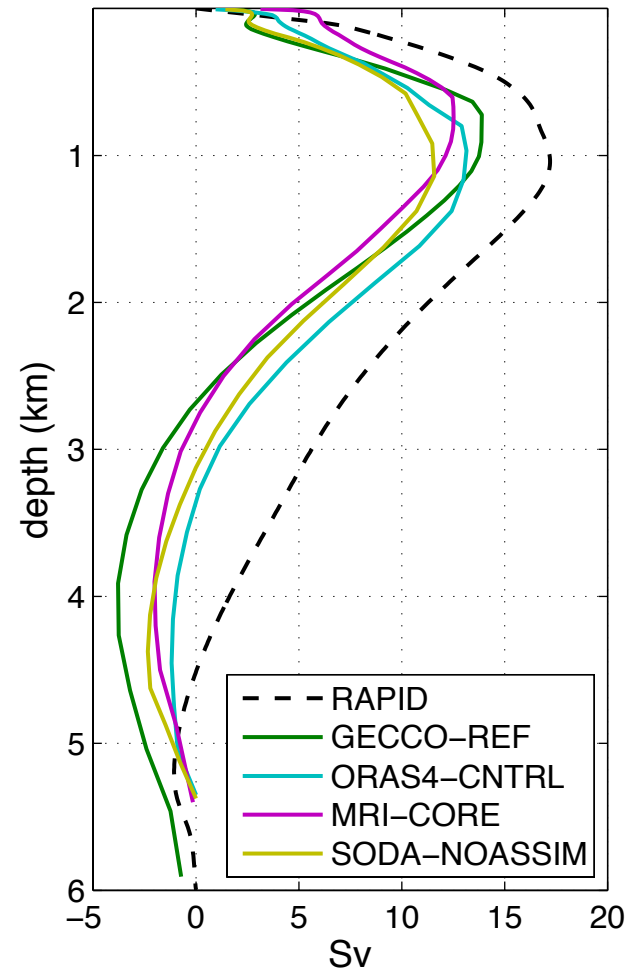


Comparison to RAPID estimates @ 26.5N

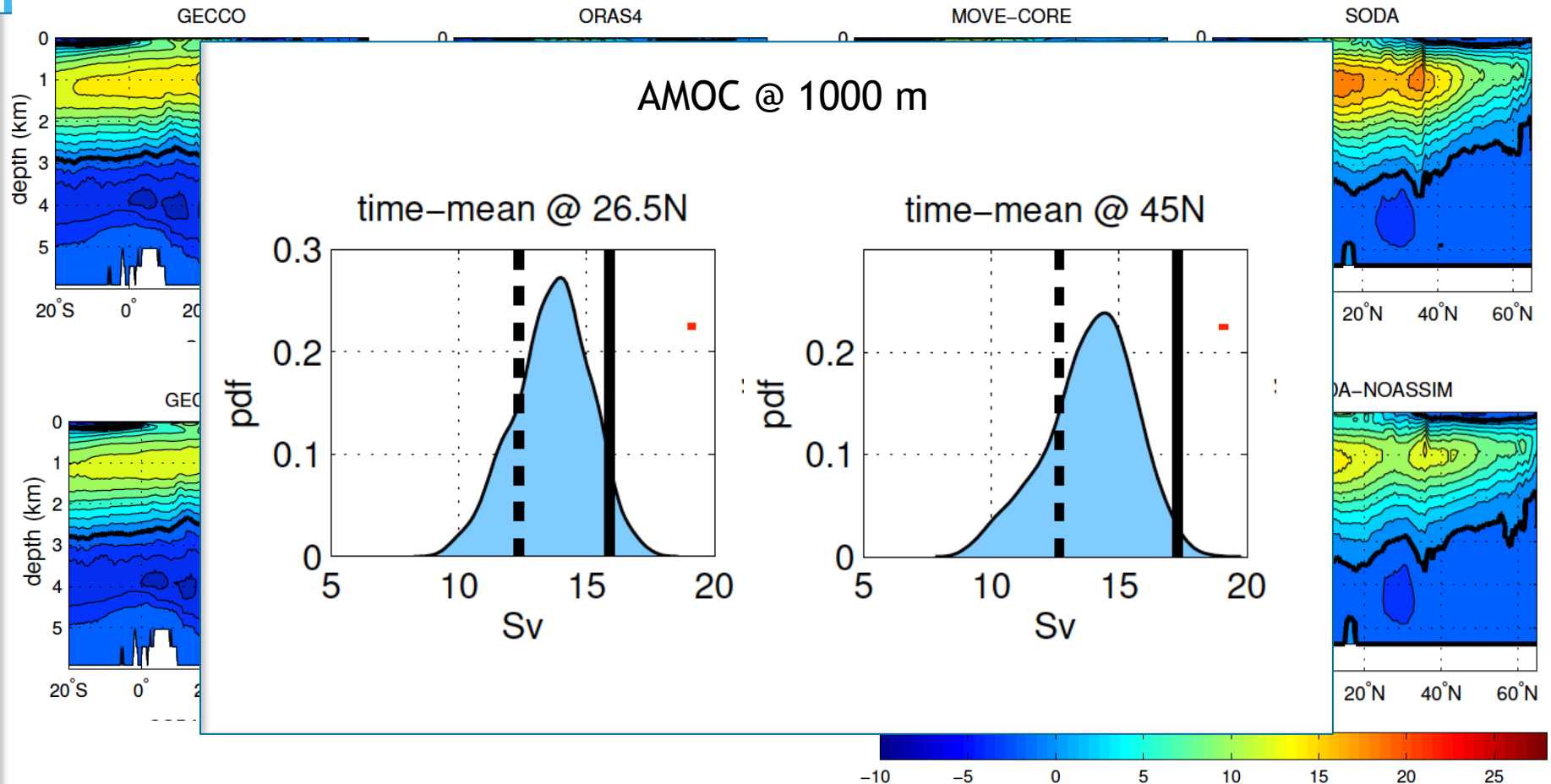
REANALYSES



FORCED OCEAN/ NO ASSIMILATION

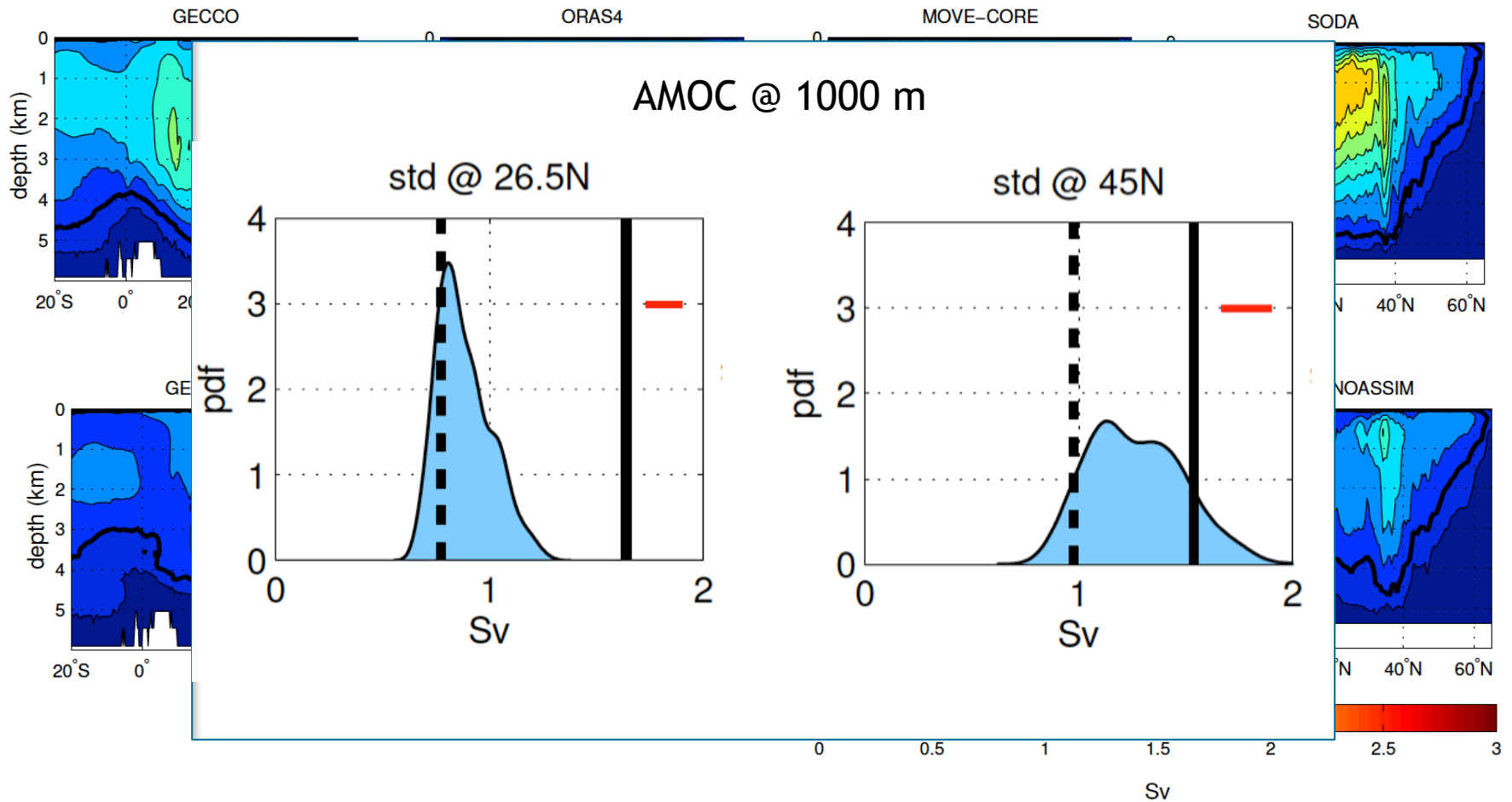


AMOC Time Mean



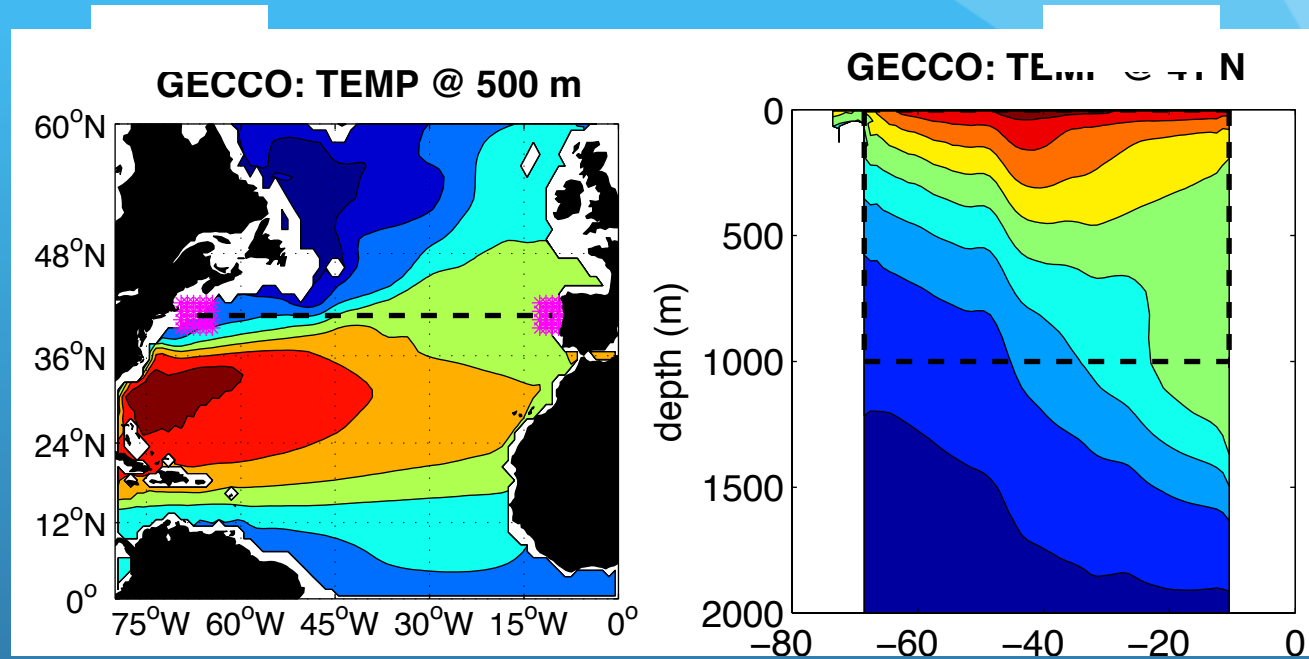
Data constraints lead to stronger mean AMOC, more consistent with RAPID

AMOC Variability



*Data constraints increase variability,
especially at lower-latitudes*

The geostrophic shear @ 41N



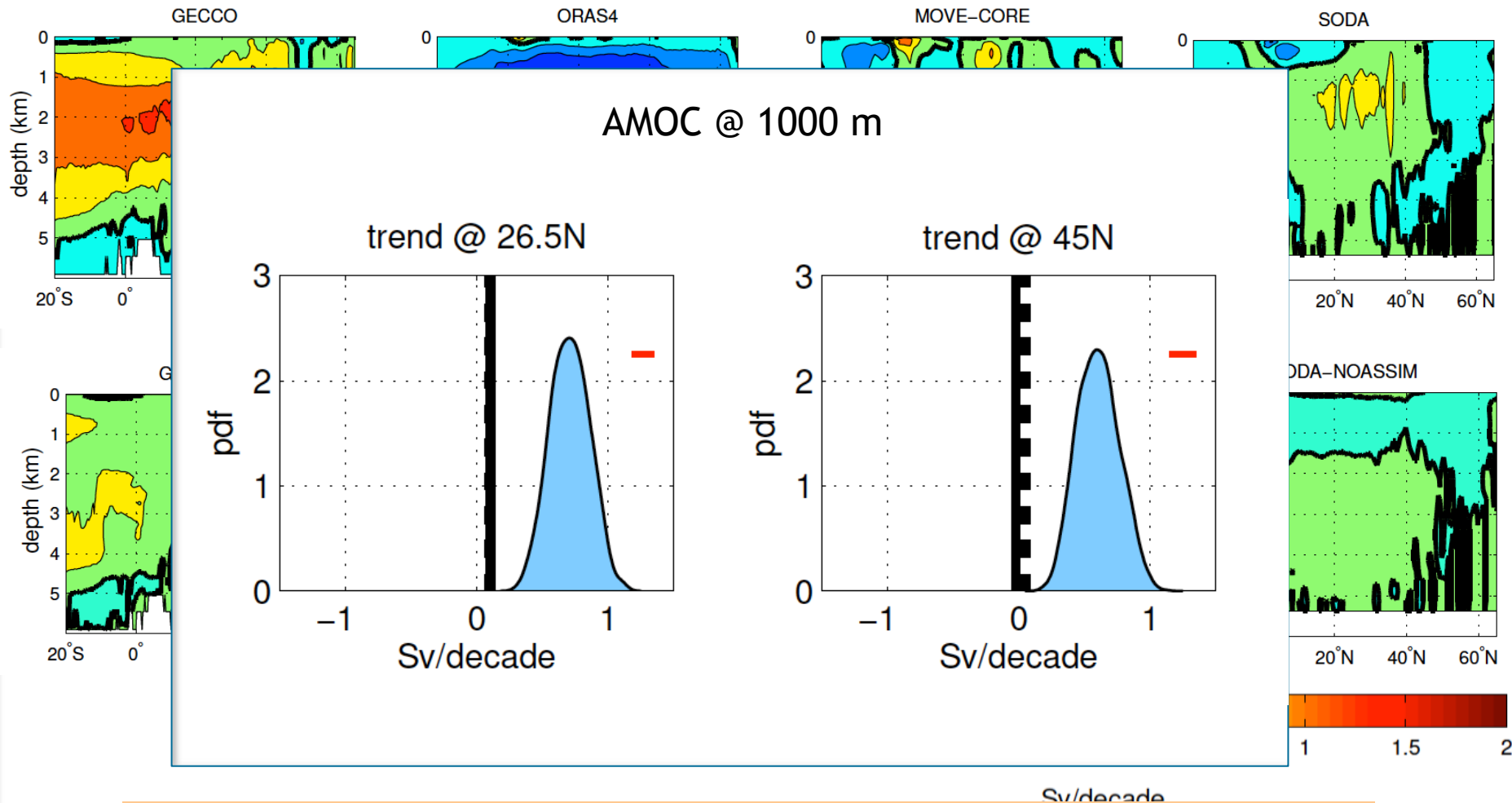
$$\Psi_{total} \approx \Psi_{geostrophic} = \int_{-H}^0 \bar{v}_g^x dz$$

$$= \int_{-H}^0 \frac{g}{f \rho_o} \int_{-H}^z \rho_w(z') - \rho_e(z') dz' dz + H \bar{v}_{-H}^x$$

$$\rho_w = f(T_w) = f(\bar{T}_w)$$

$$\rho_e = f(T_e) = f(\bar{T}_e)$$

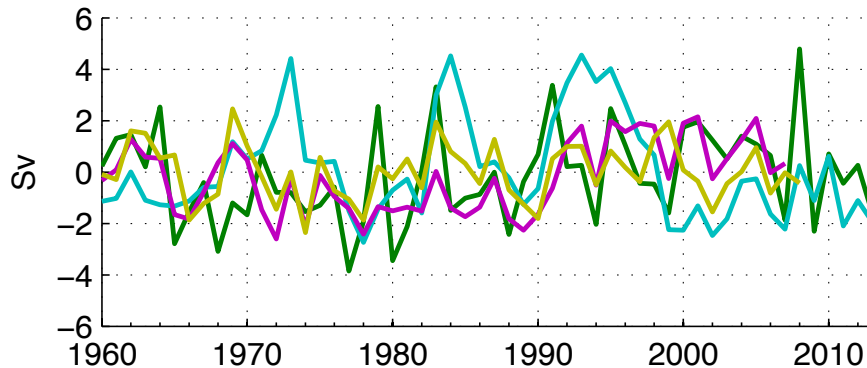
AMOC Trend (1960-2007)



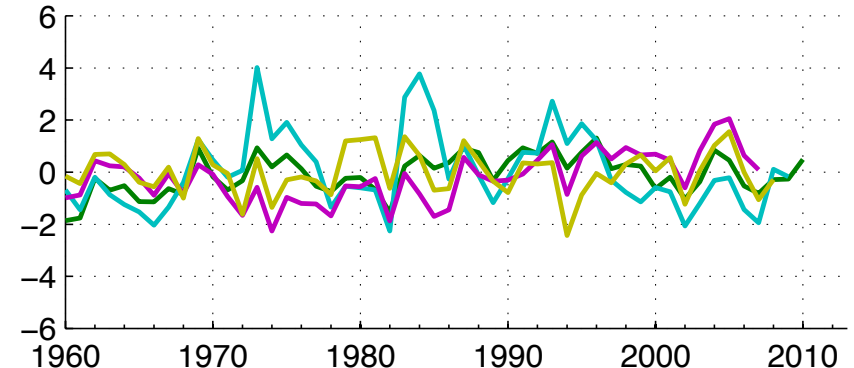
*Data constraints increase trends
- and not consistently*

Agreement in year-to-year signal?

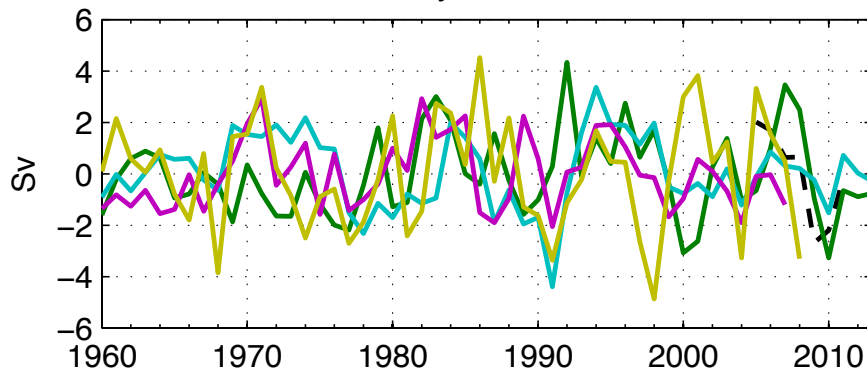
Reanalyses @ 45N



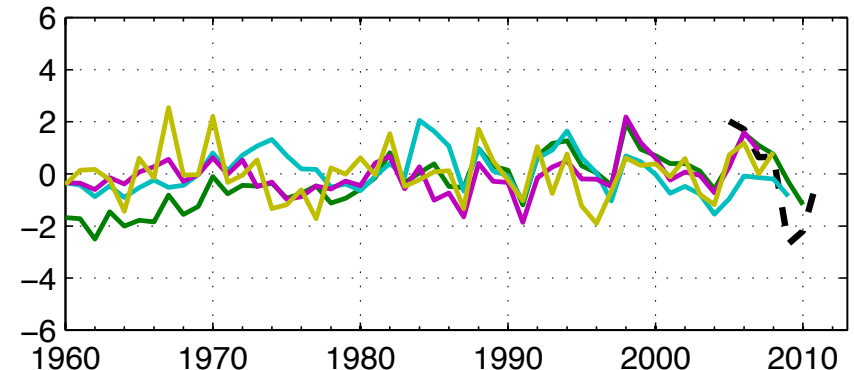
No Assimilation @ 45N



Reanalyses @ 26.5N



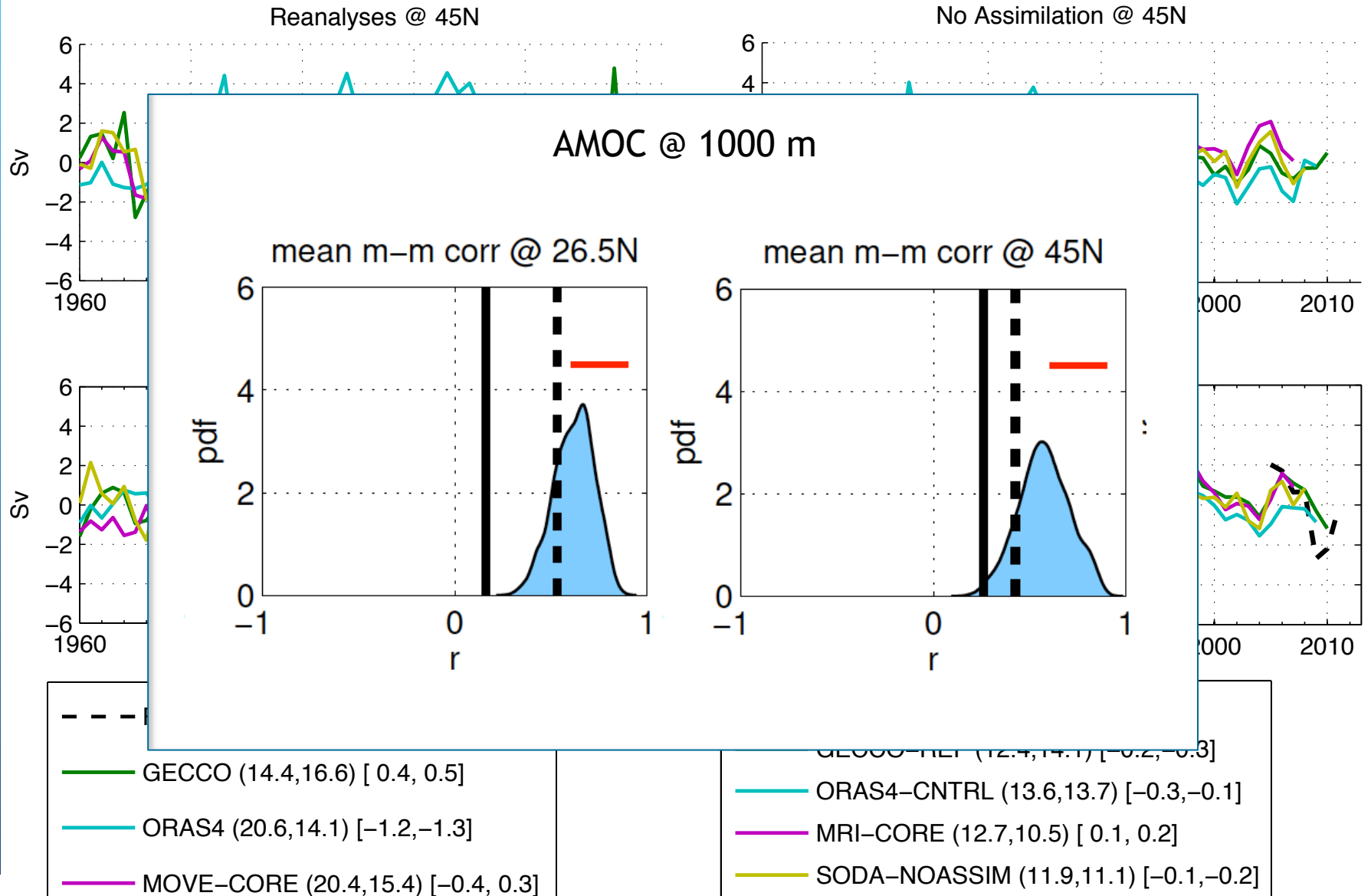
No Assimilation @ 26.5N



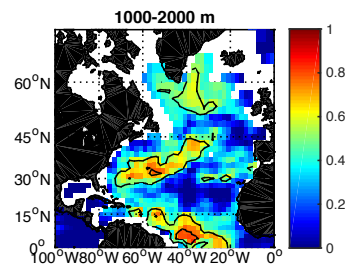
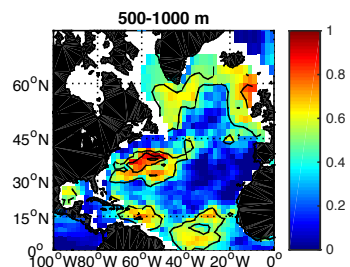
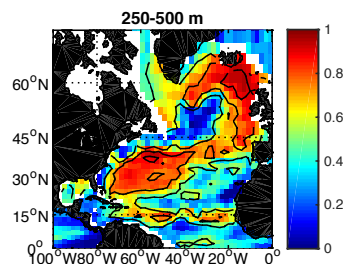
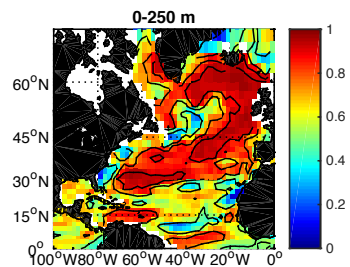
- - - RAPID (n/a,17.1)
 — GECCO (14.4,16.6) [0.4, 0.5]
 — ORAS4 (20.6,14.1) [-1.2,-1.3]
 — MRI-CORE (20.4,15.4) [0.4, 0.3]

- - - RAPID (n/a,17.1)
 — GECCO-REF (12.4,14.1) [-0.2,-0.3]
 — ORAS4-CNTRL (13.6,13.7) [-0.3,-0.1]
 — MRI-CORE (12.7,10.5) [0.1, 0.2]
 — SODA-NOASSIM (11.9,11.1) [-0.1,-0.2]

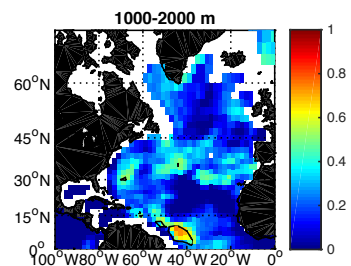
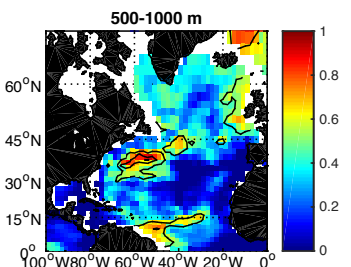
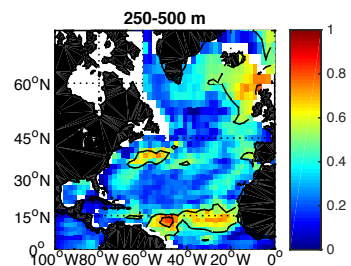
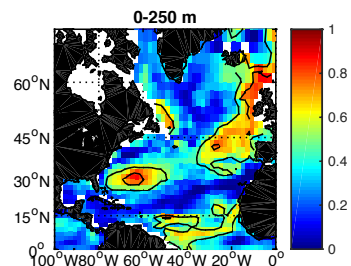
Agreement in year-to-year signal?



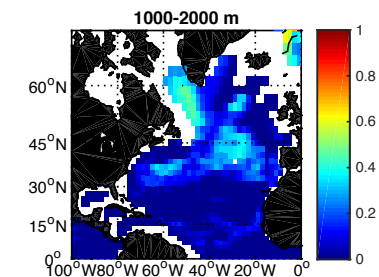
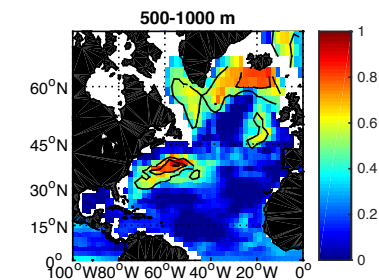
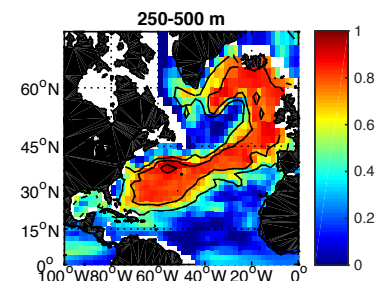
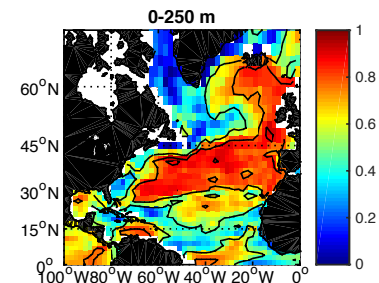
TEMP



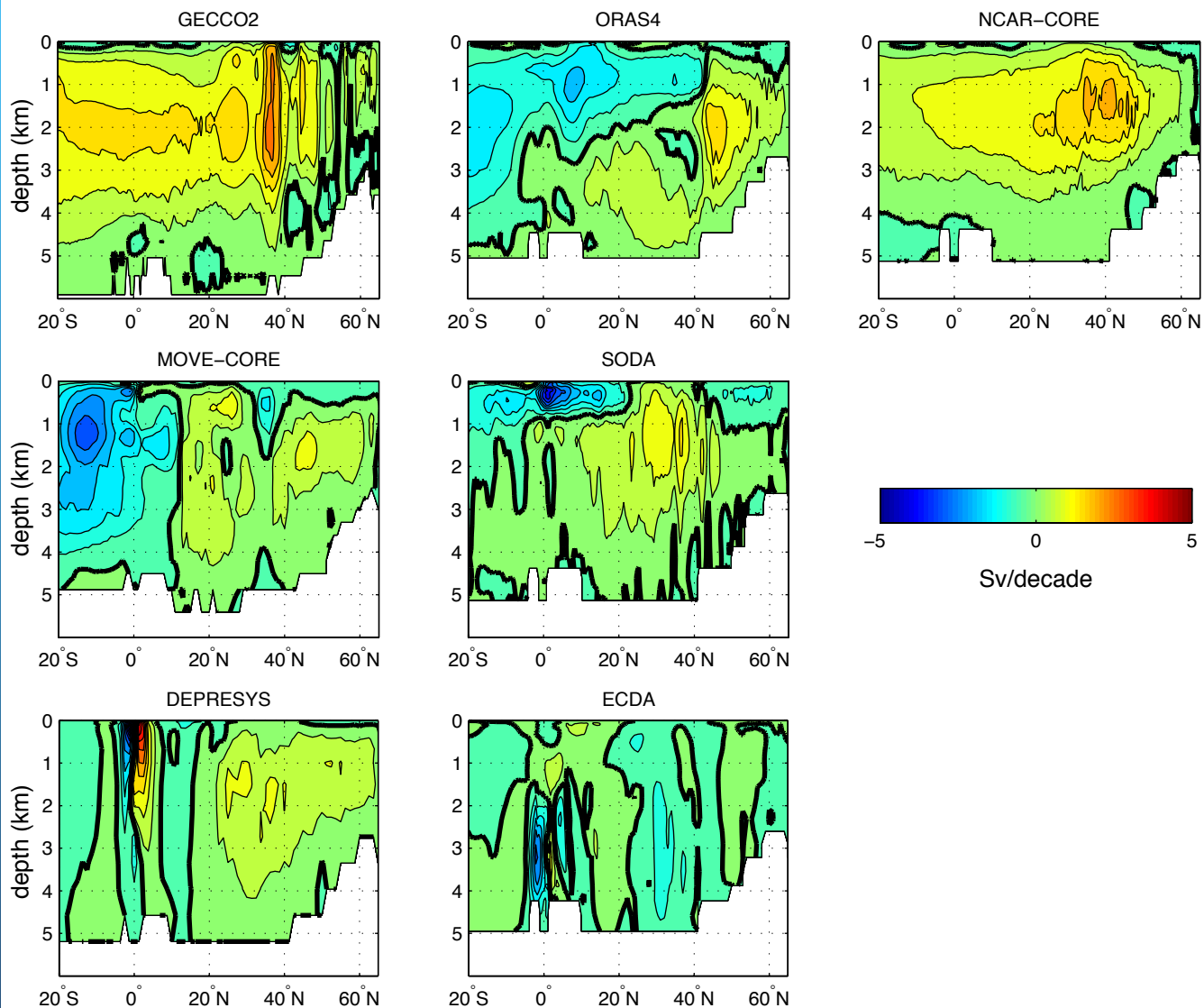
SALT



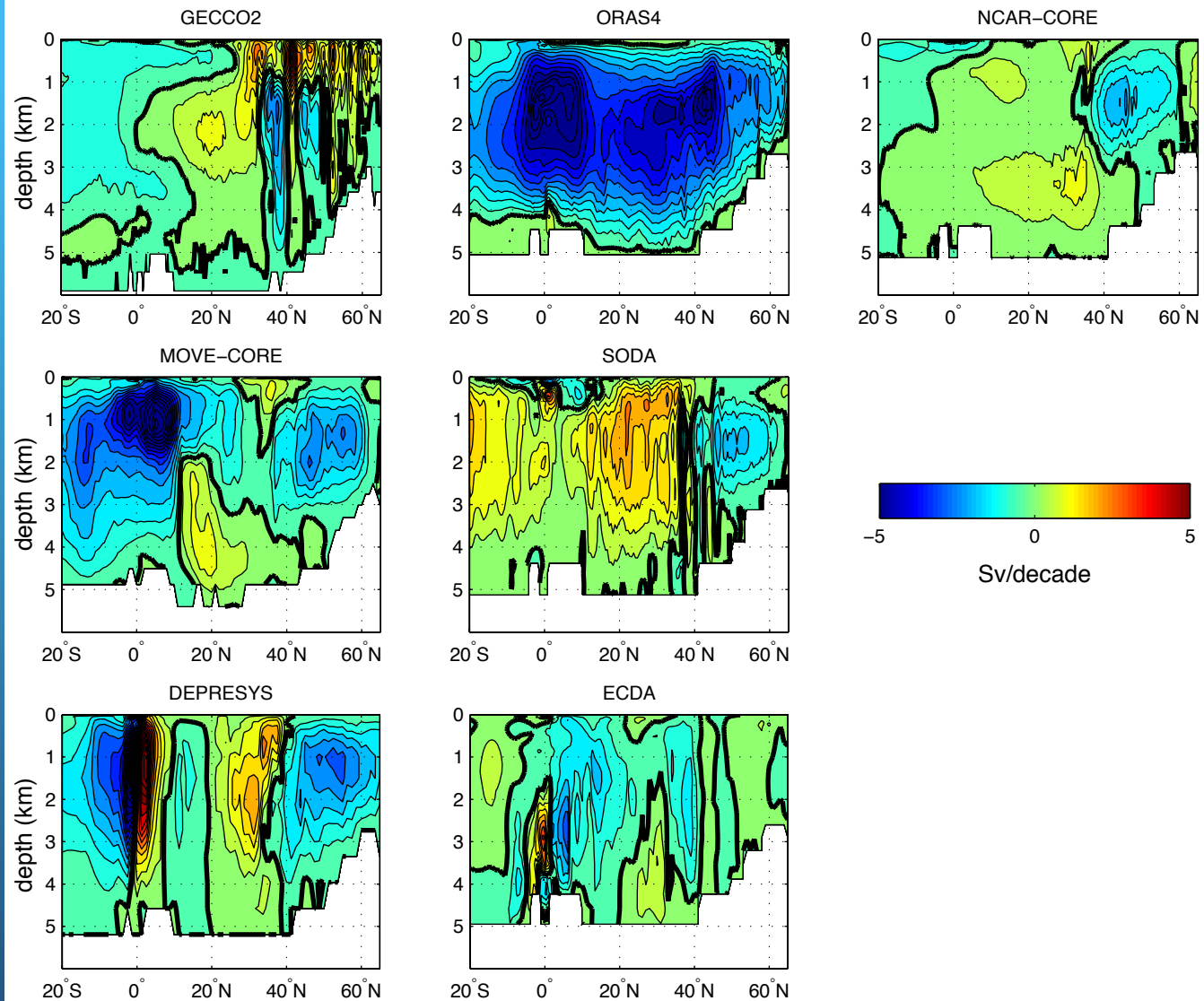
DENS



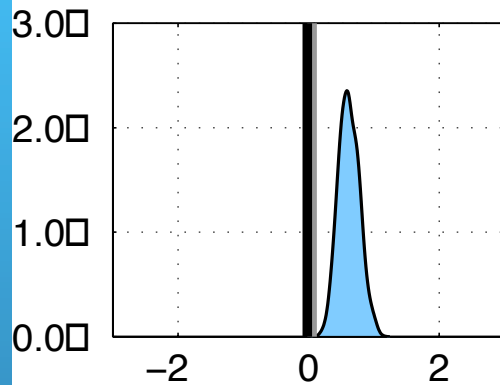
AMOC Trend (1975-1995)



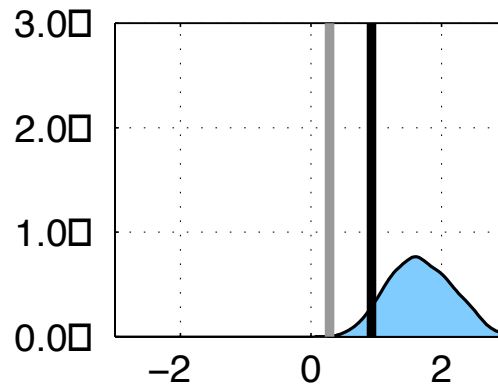
AMOC Trend (1995-2007)



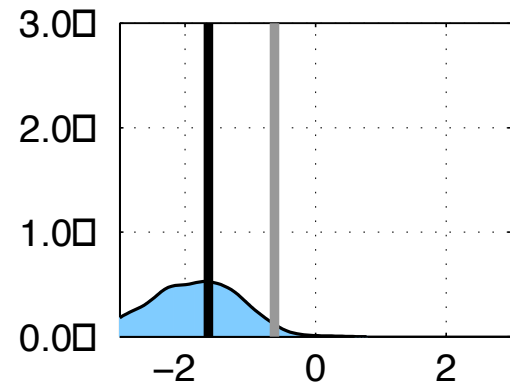
1960–2007 trend
@ 45N



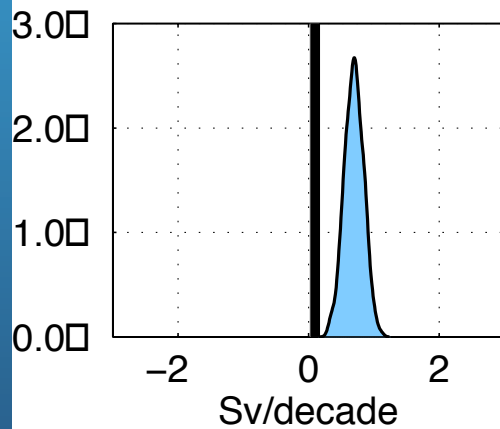
1975–1995 trend
@ 45N



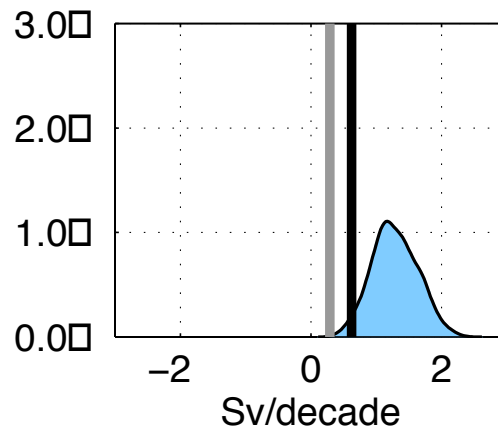
1995–2008 trend
@ 45N



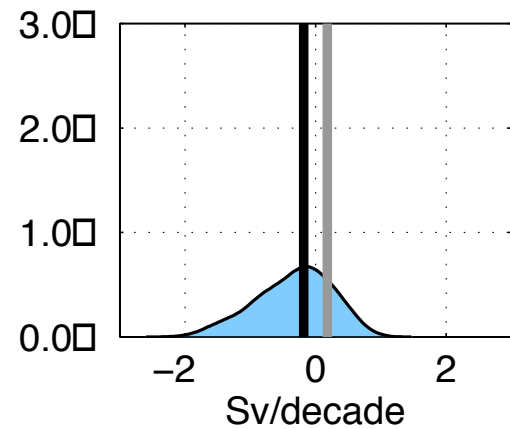
@ 26.5N

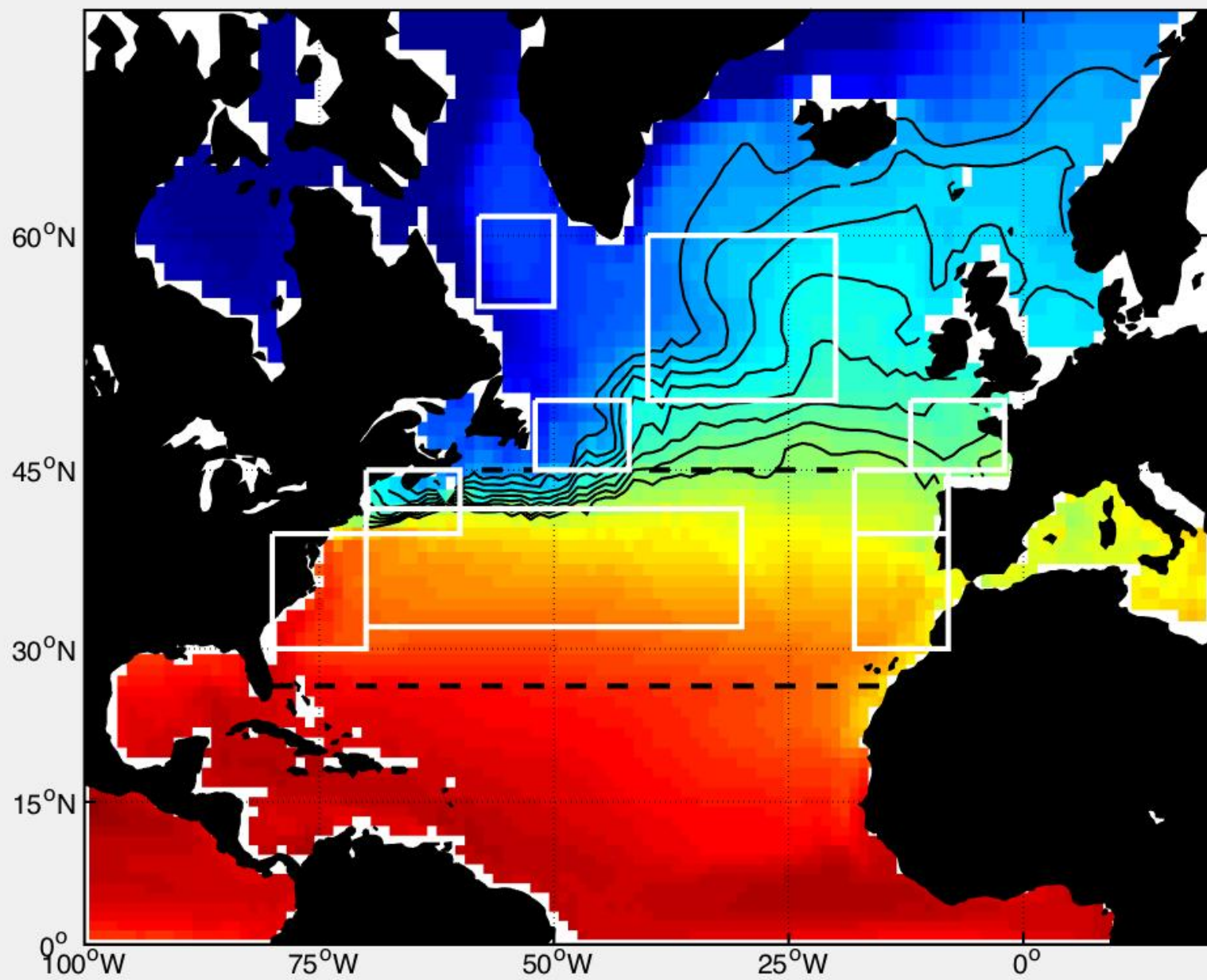


@ 26.5N

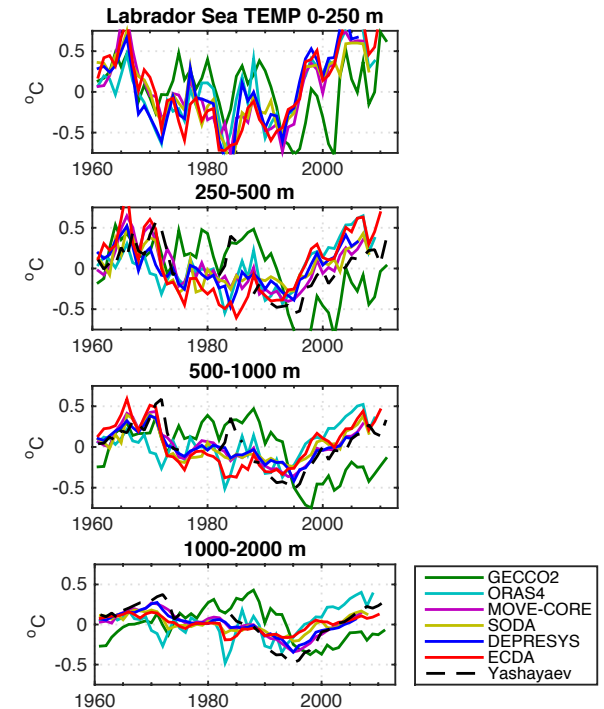
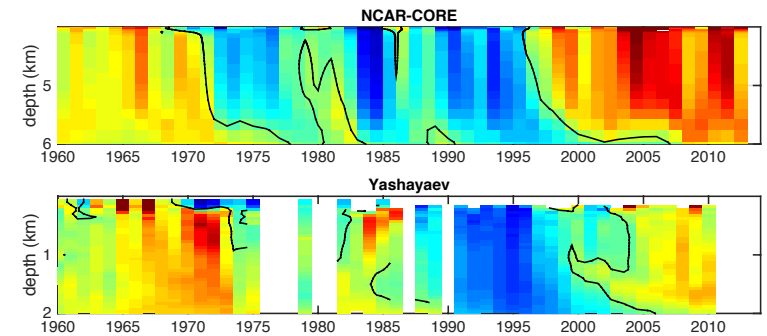
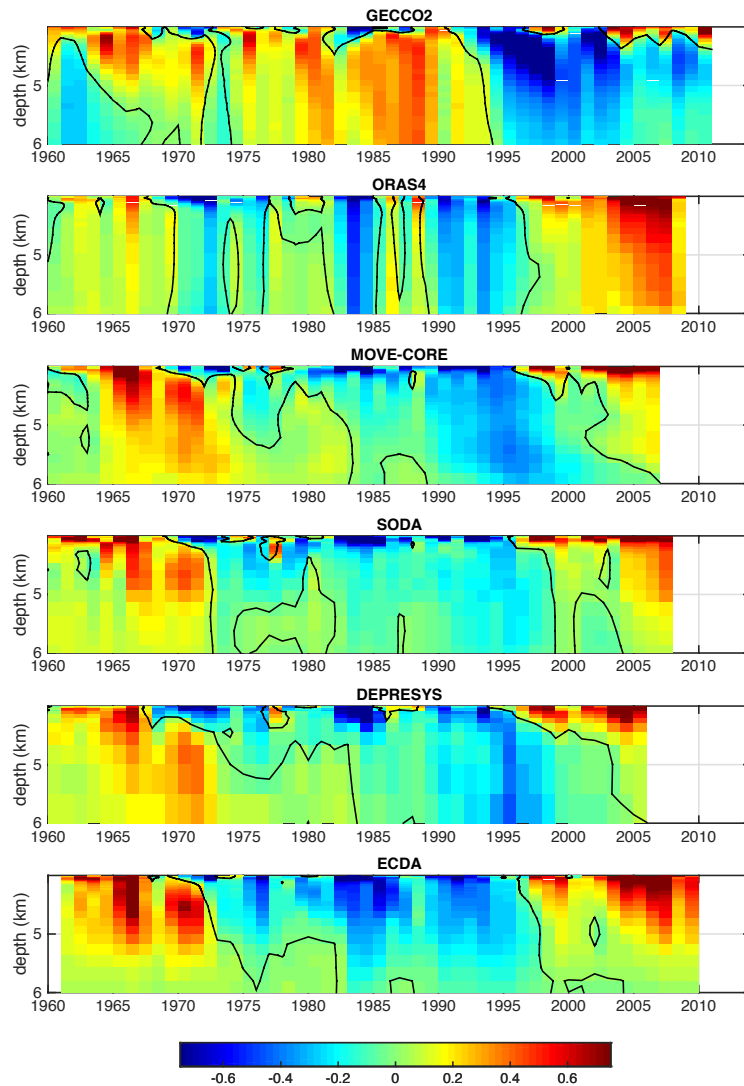


@ 26.5N

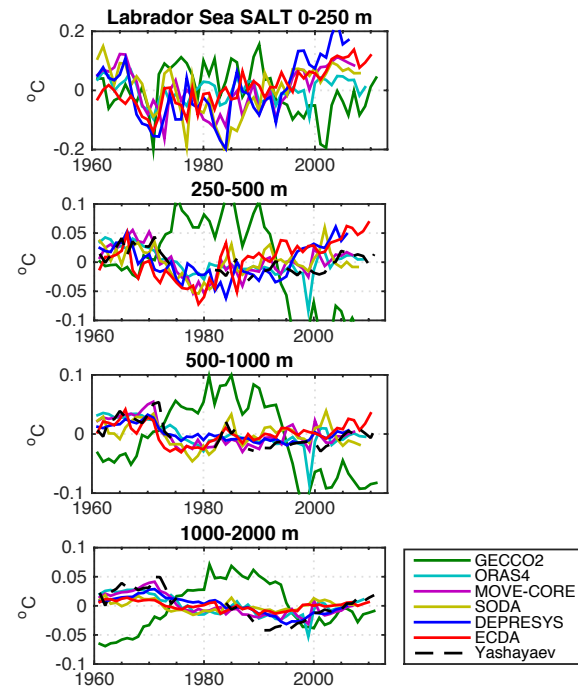
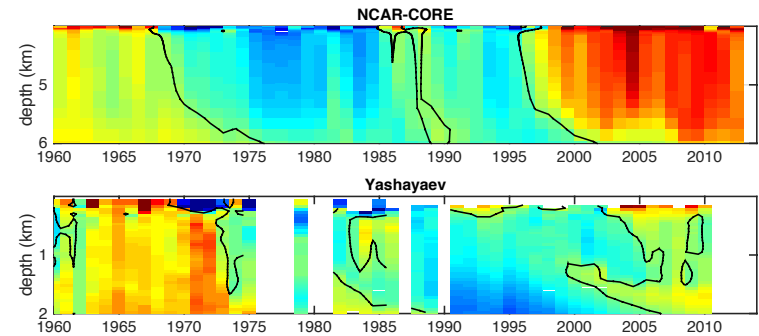
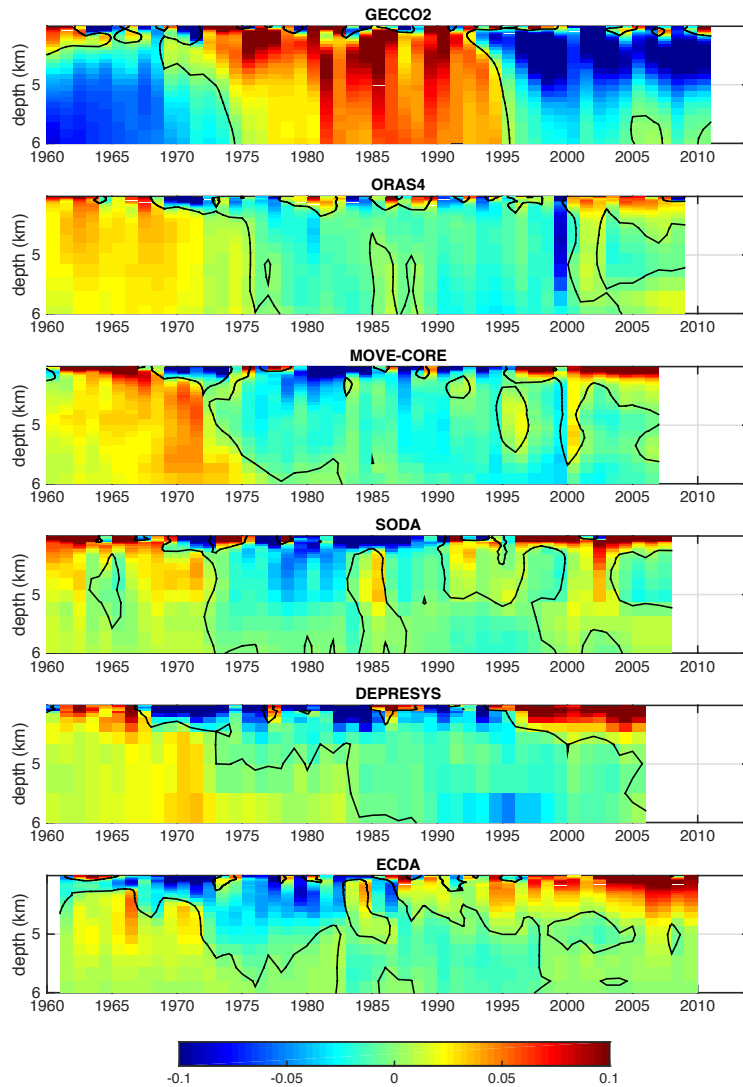




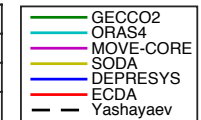
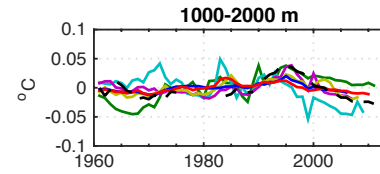
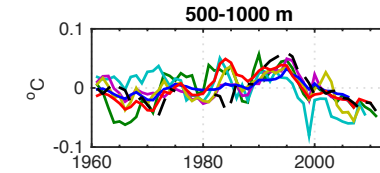
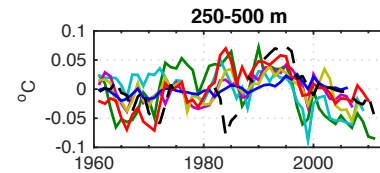
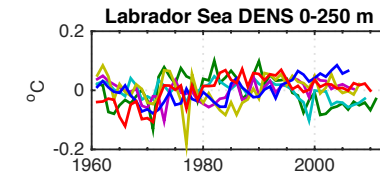
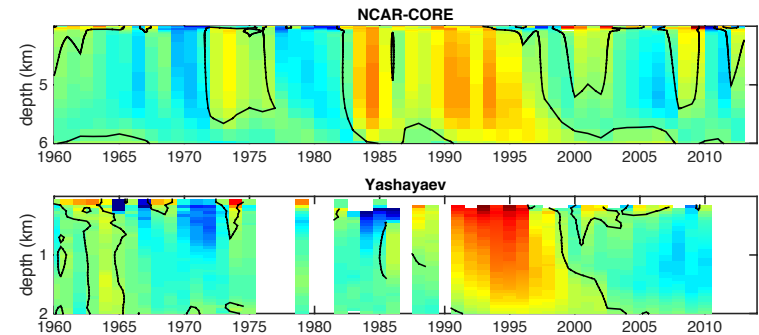
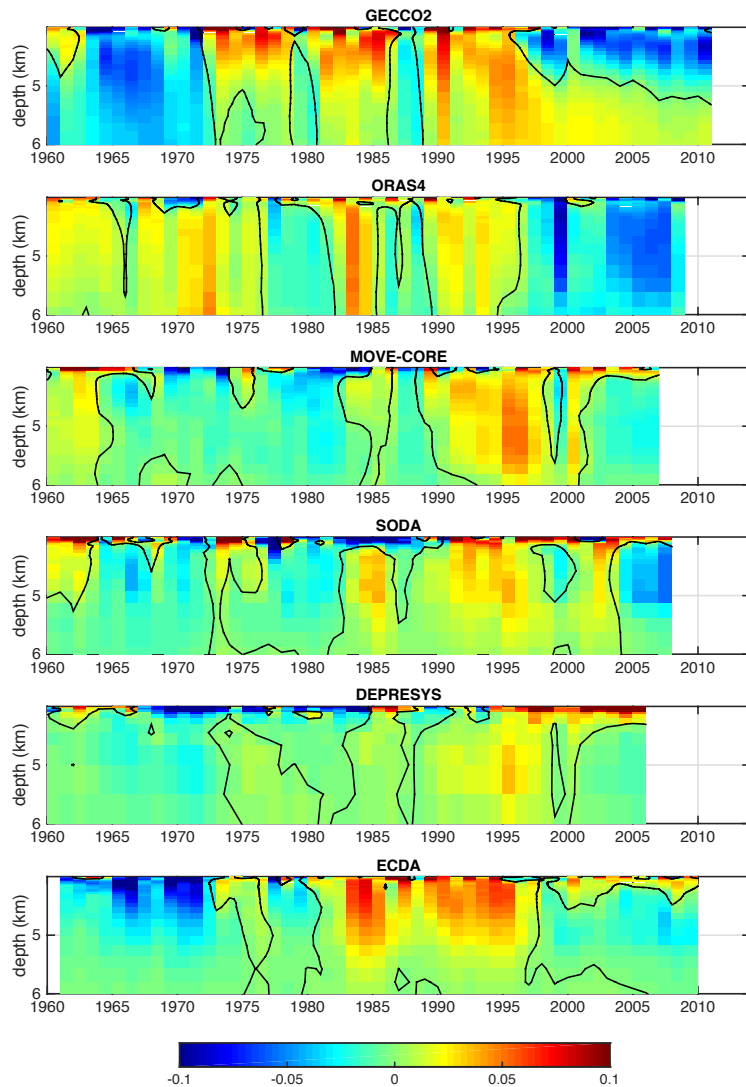
TEMP in Labrador Sea



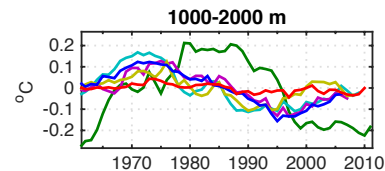
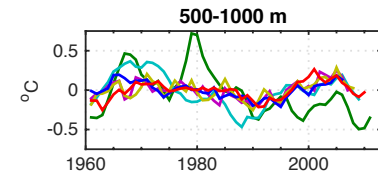
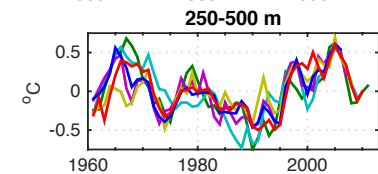
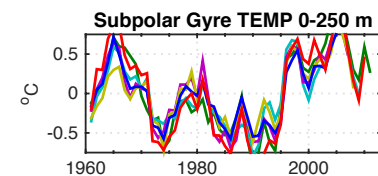
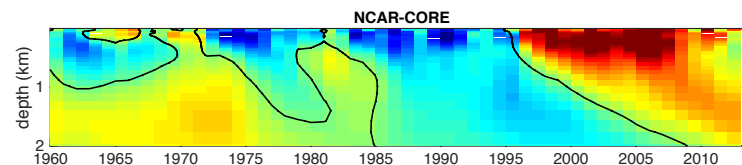
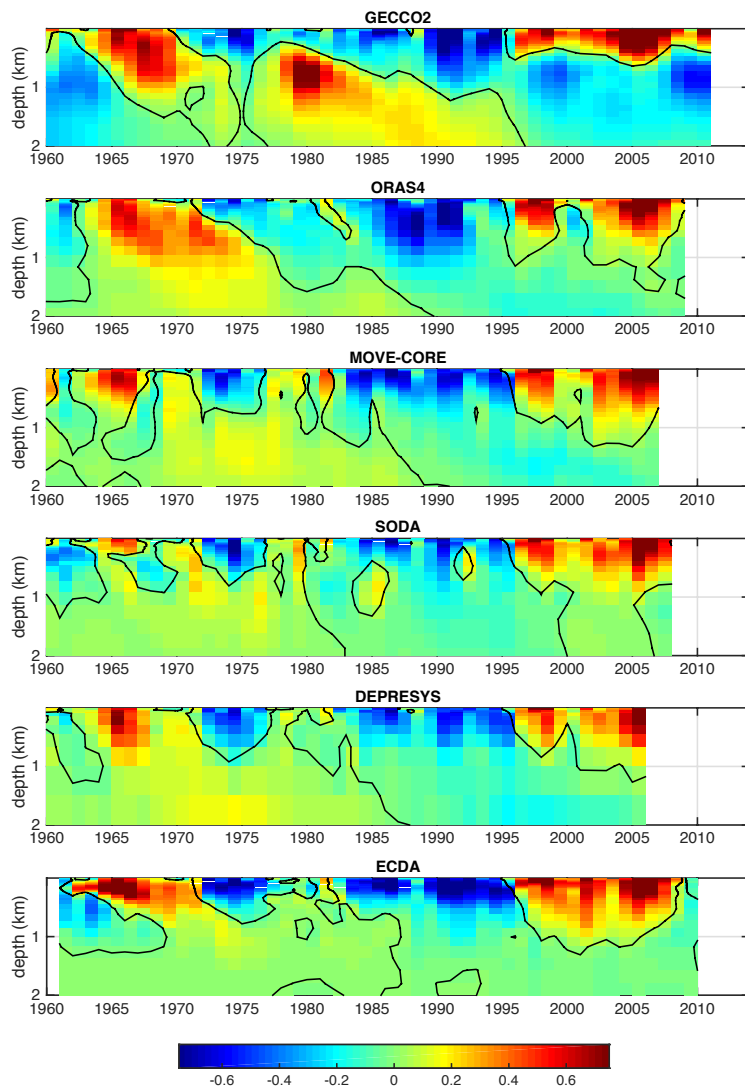
Salinity in Labrador Sea

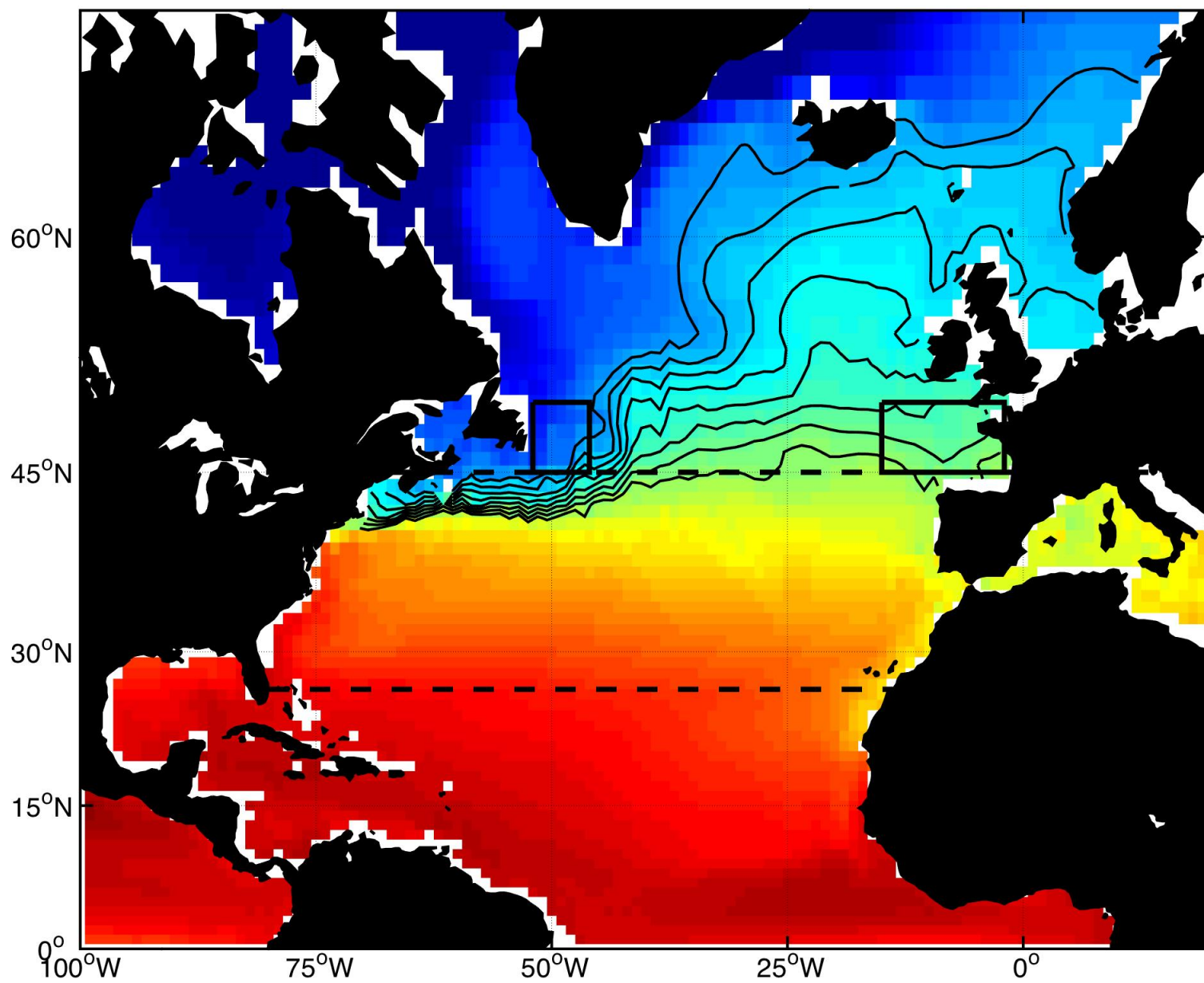


Density in Labrador Sea

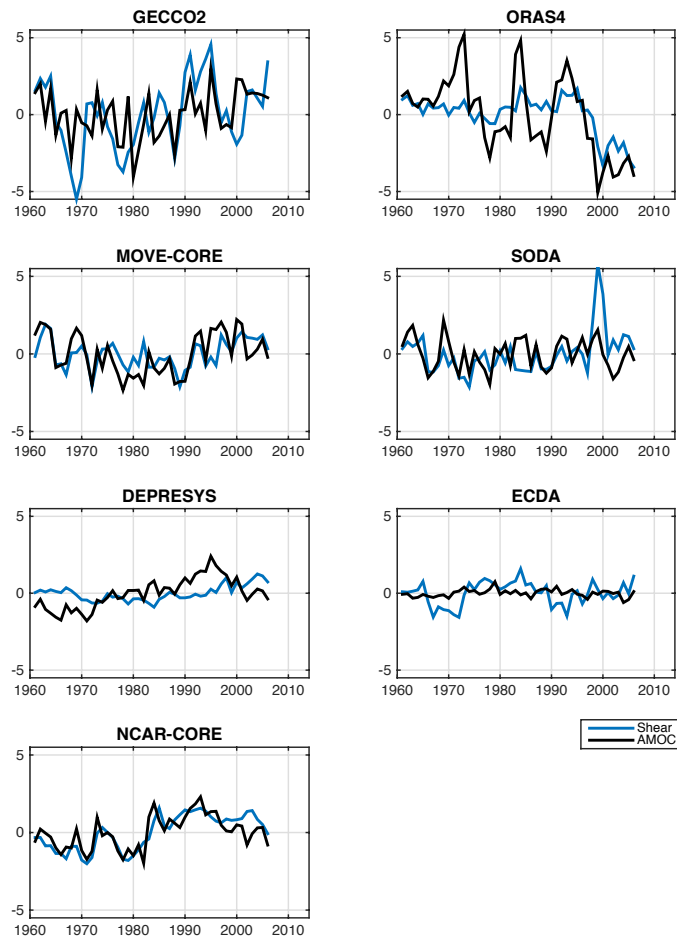


TEMP in subpolar gyre

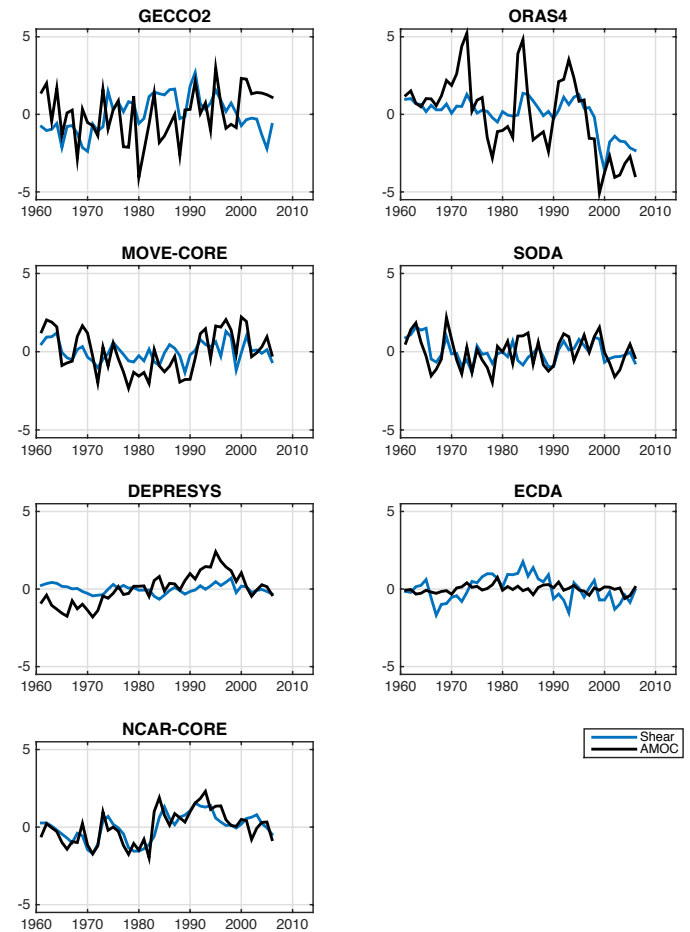




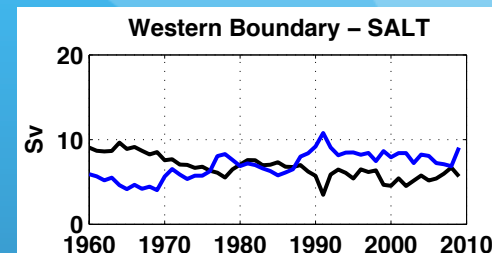
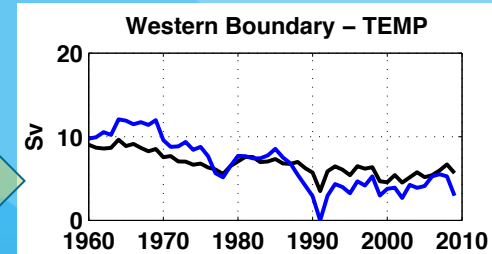
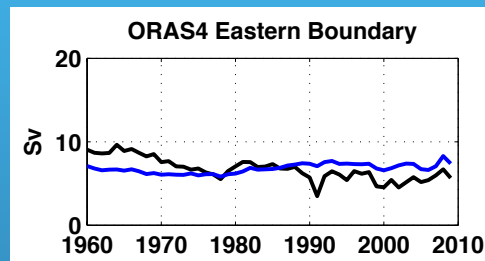
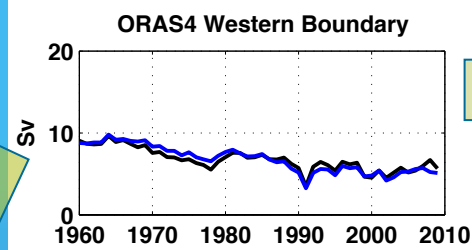
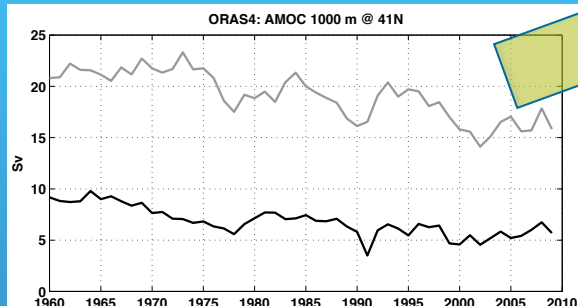
1000 m geostrophic shear at 45N - 50N



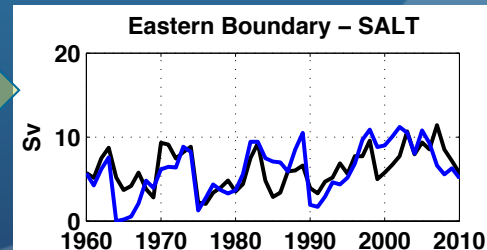
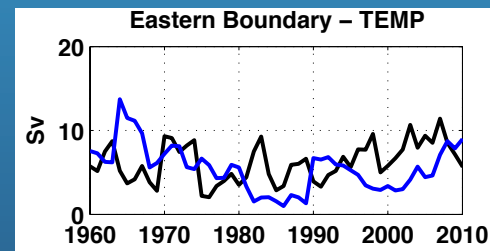
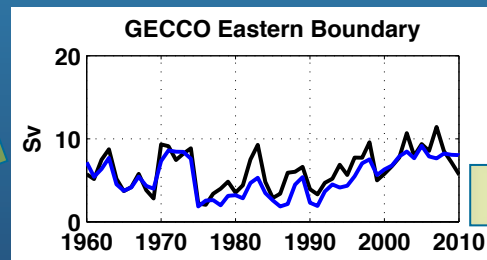
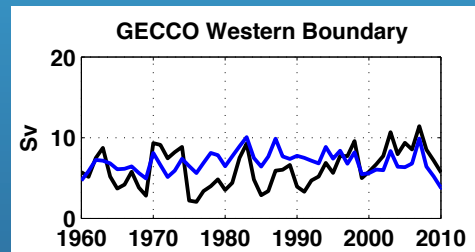
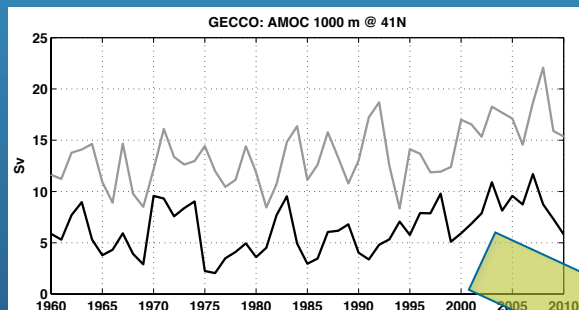
1000 m geostrophic shear(western boundary density) at 45N - 50N



ORAS4

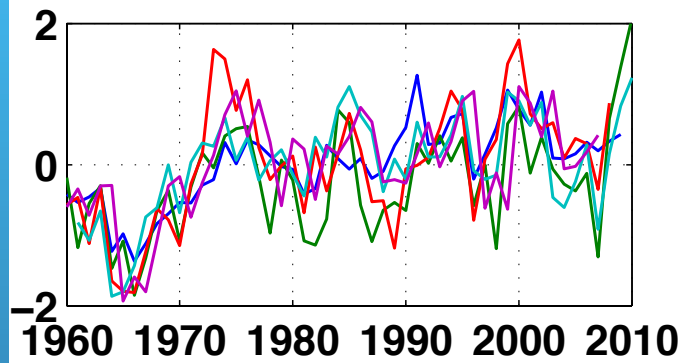


GECCO

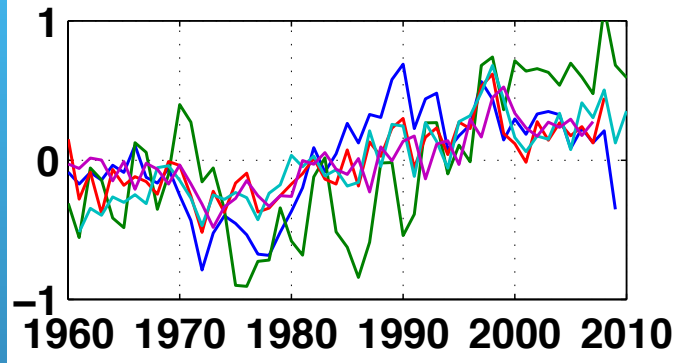


Is the temperature at the eastern/western boundary in agreement?

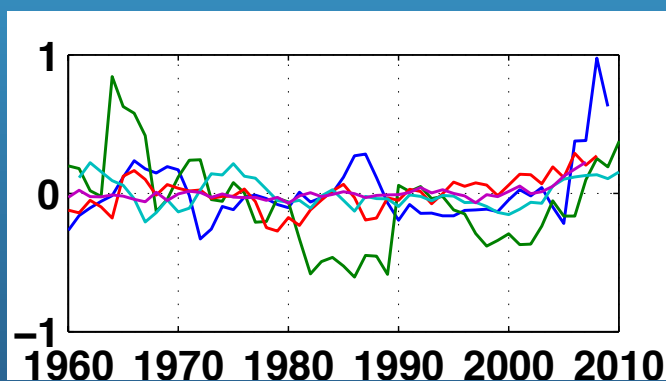
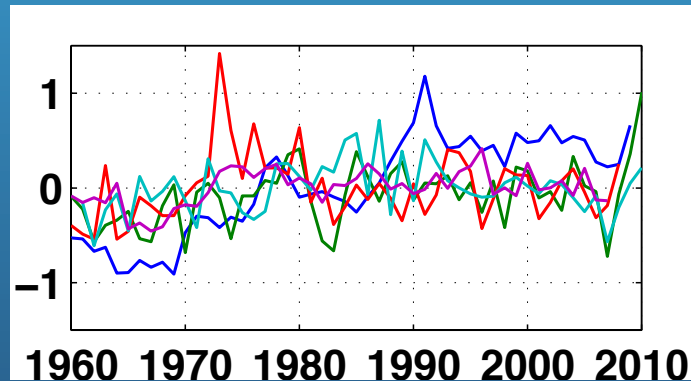
WESTERN BOUNDARY



EASTERN BOUNDARY



0-250 m

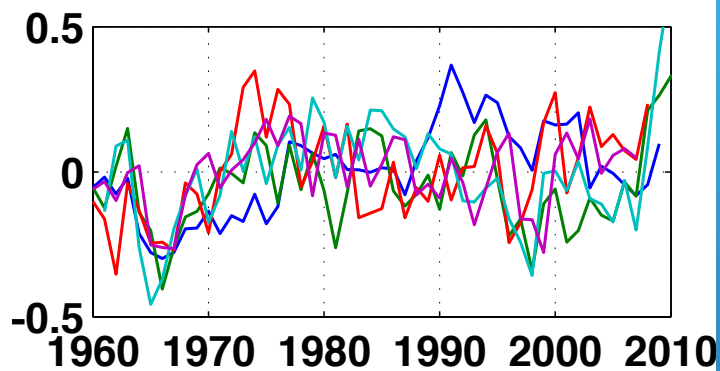


250-1000 m

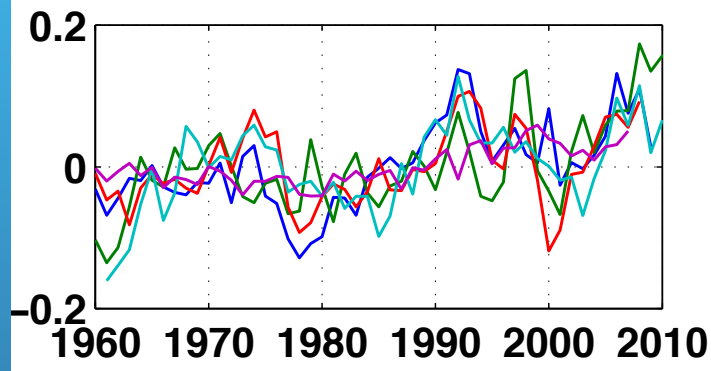


Is the salinity at the eastern/western boundary in agreement?

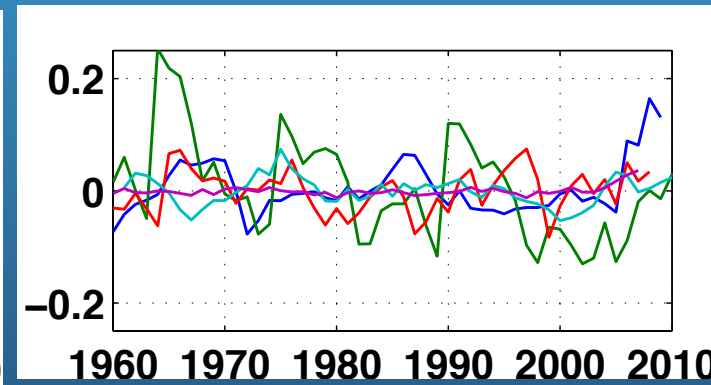
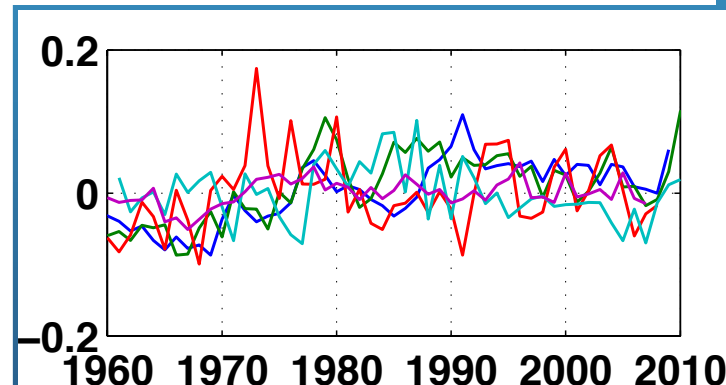
WESTERN BOUNDARY



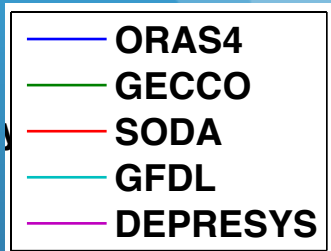
EASTERN BOUNDARY

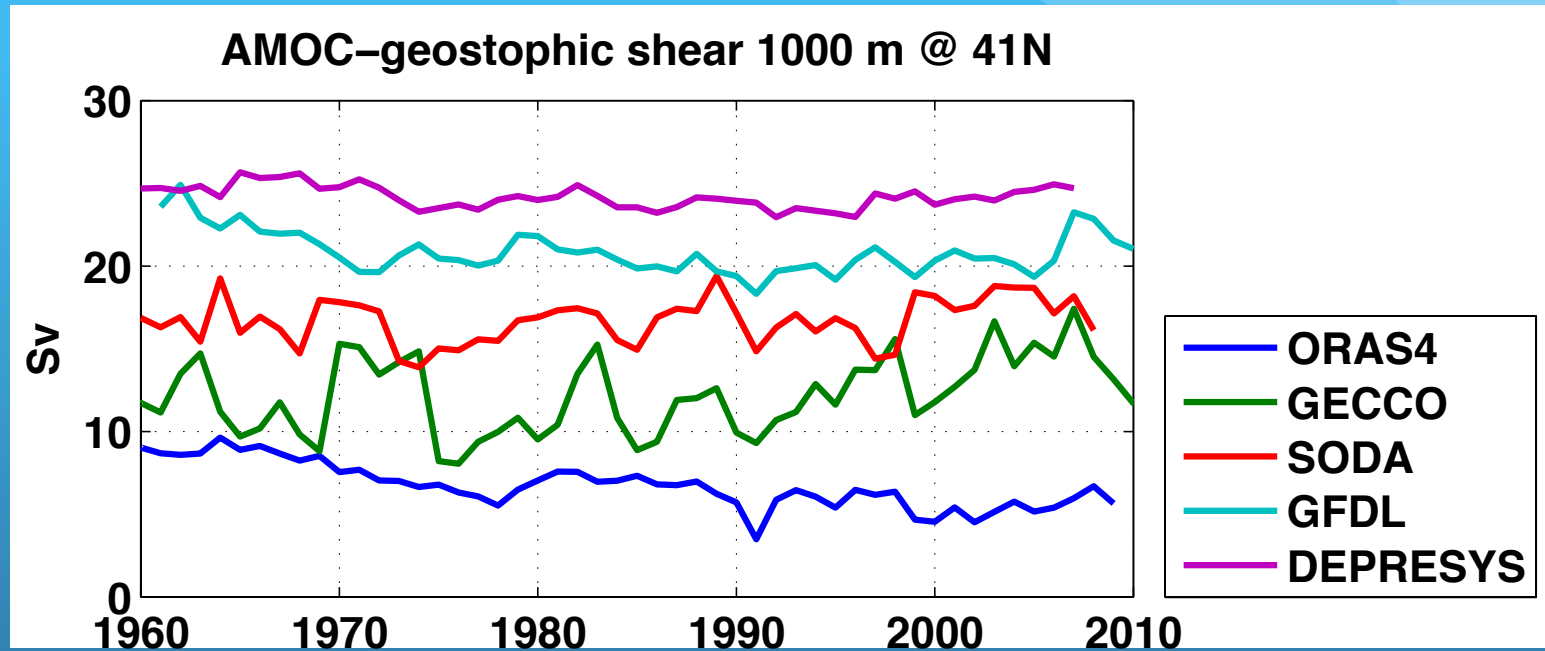


0-250 m



250-1000 m





Trends in the
geostrophic shear component of AMOC
in the upper ocean are inconsistent

What do we know so far about why?

In a preliminary analysis at 41N we found disagreement that

- 1) whether density variations on the east or west boundary were dominating the trends
- 2) whether density variations were primarily driven by temperature or salinity.
- 3) temp/salinity variability on the boundaries, especially below 250m

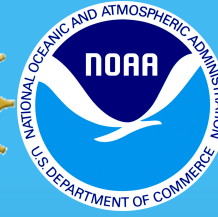
End





NCAR

NATIONAL CENTER FOR ATMOSPHERIC RESEARCH



An overview of experimental reanalysis efforts at NCAR

Alicia R. Karspeck, Abhishek Chatterjee

Data assimilation key personnel:

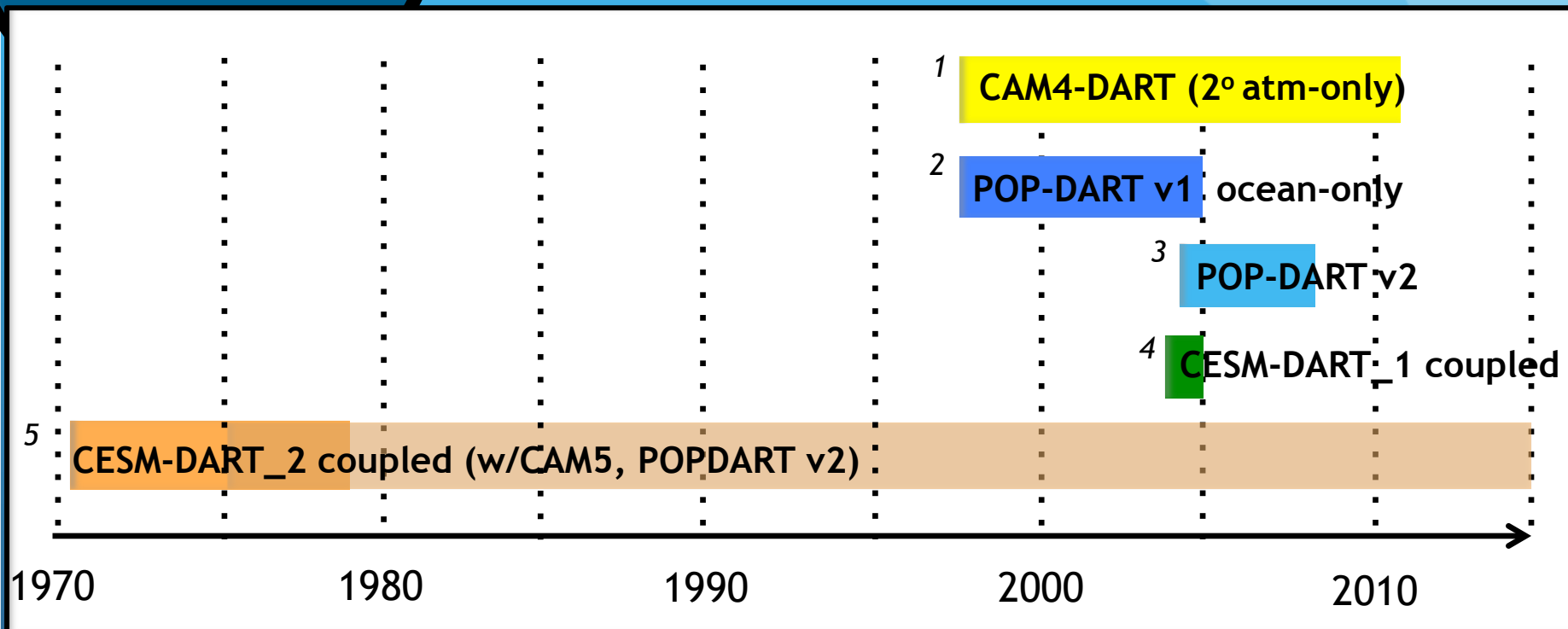
Jeff Anderson, Nancy Collins, Tim Hoar, Helen Kershaw, Kevin Raeder

Climate modeling key personnel:

Gokhan Danabasoglu, Joe Tribbia, Steve Yeager, Svetlana Karol

Formal
Data Assimilation
activities
led by CGD scientists

POP/CAM/CESM DART: experimental climate reanalyses



¹ Kevin Raeder (DAReS-CISL)

² Alicia Karspeck (Ocean-CGD)

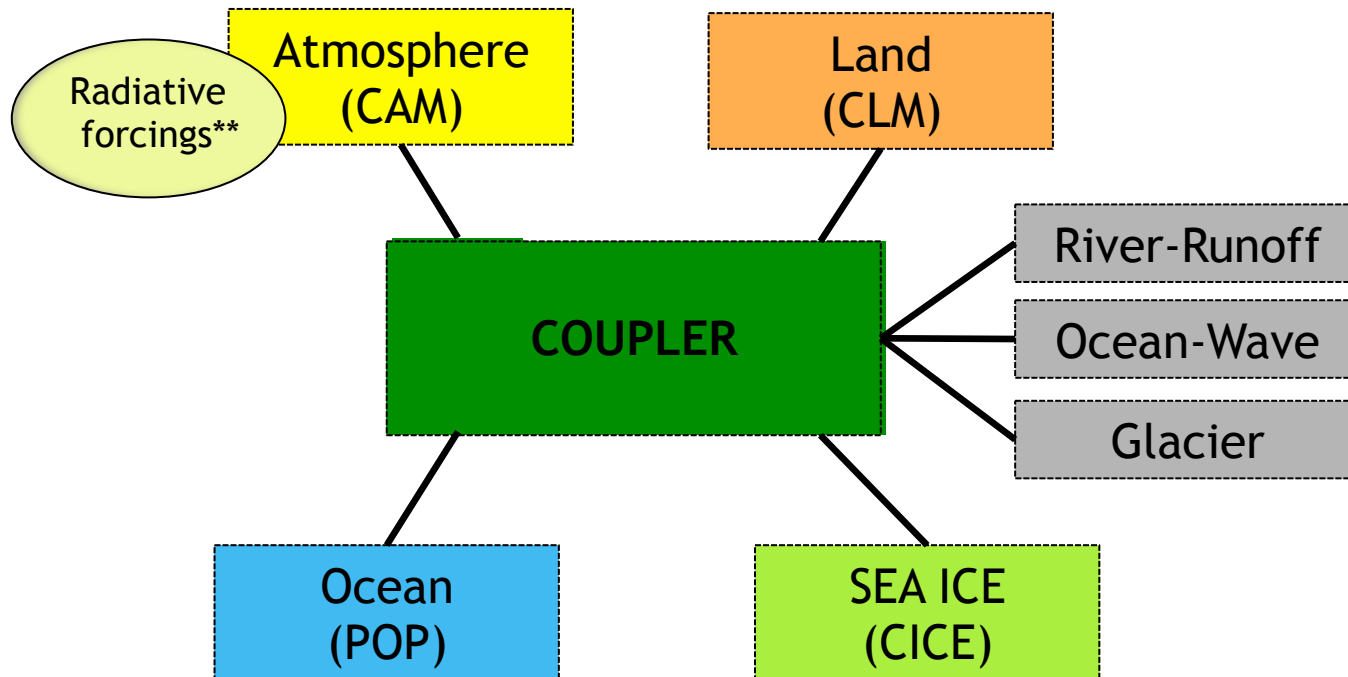
³ Alicia Karspeck (Ocean-CGD)

⁴ Abhishek Chatterjee (CGD/DAReS-CISL)

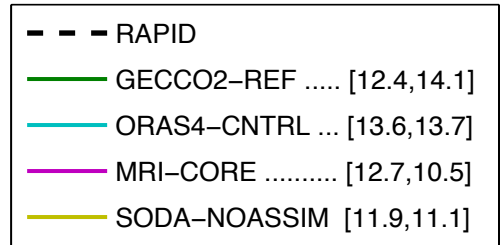
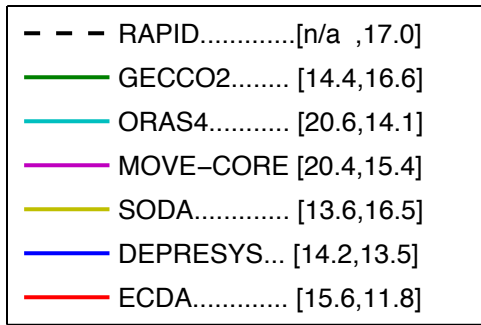
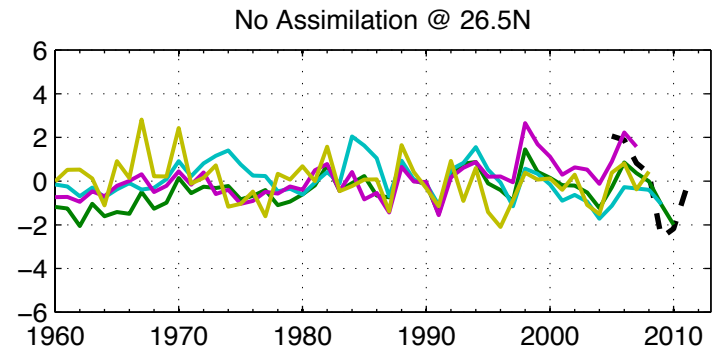
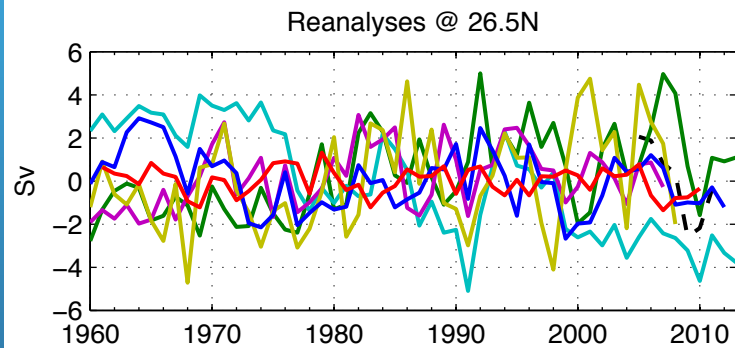
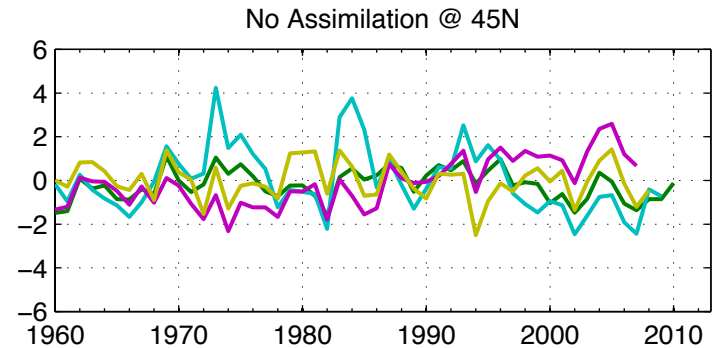
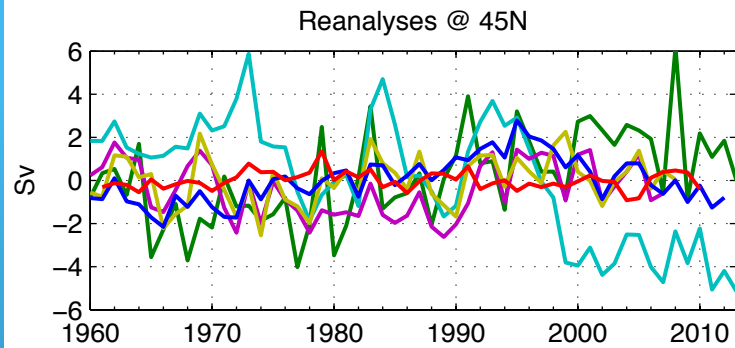
⁵ Alicia Karspeck (Ocean-CGD)

All methods use the DART
implementation of the
Ensemble Adjustment Kalman Filter

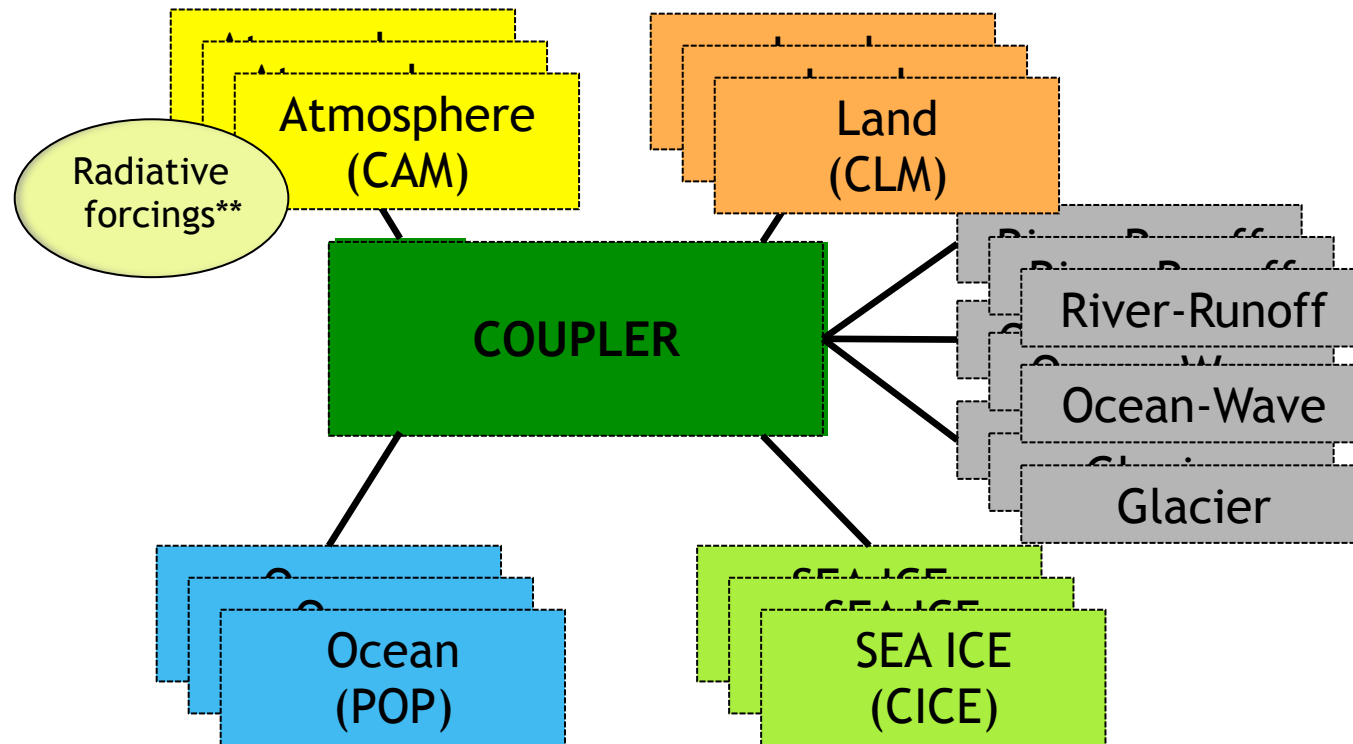
Community Earth System Model



** Greenhouse gases, manmade aerosols, volcanic eruptions, solar variability

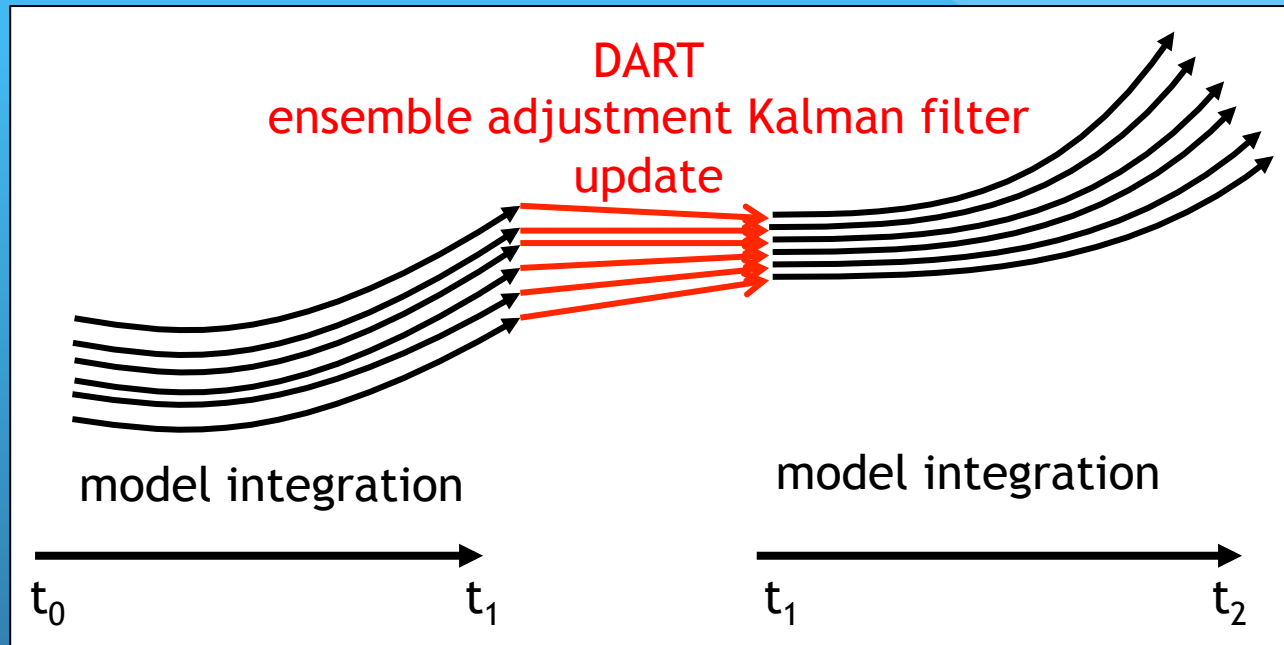


Community Earth System Model “multi-instance”



** Greenhouse gases, manmade aerosols, volcanic eruptions, solar variability

Data Assimilation Research Testbed



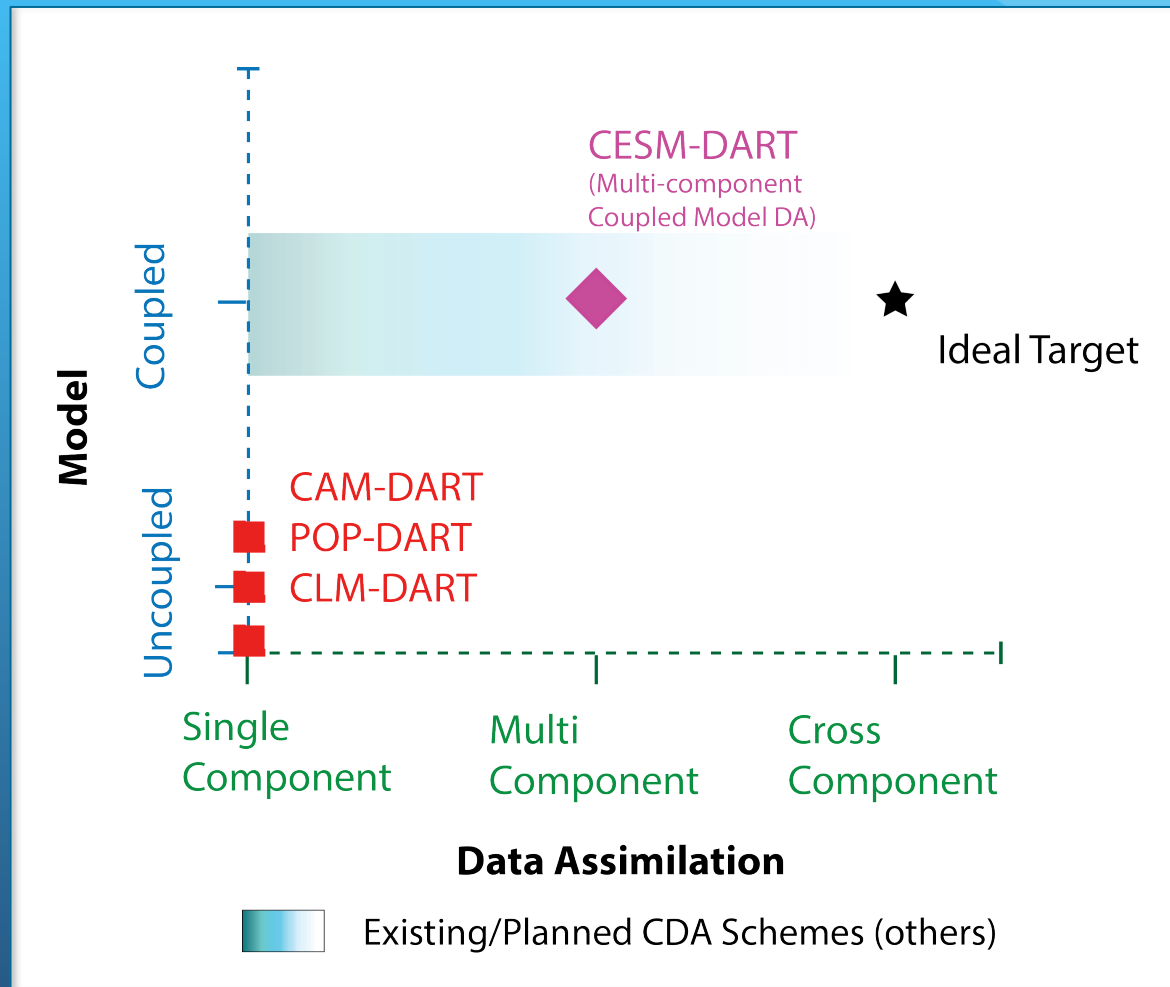
DART is a generic ensemble filter; necessary ingredients:

- **Model forecasts**
 - In a coupled framework -- model state can be defined independently for each component or jointly across components.
- **Forward operators** to map from the model state vector to the observation space
- **Observations**

(<http://www.image.ucar.edu/DAReS/DART>)

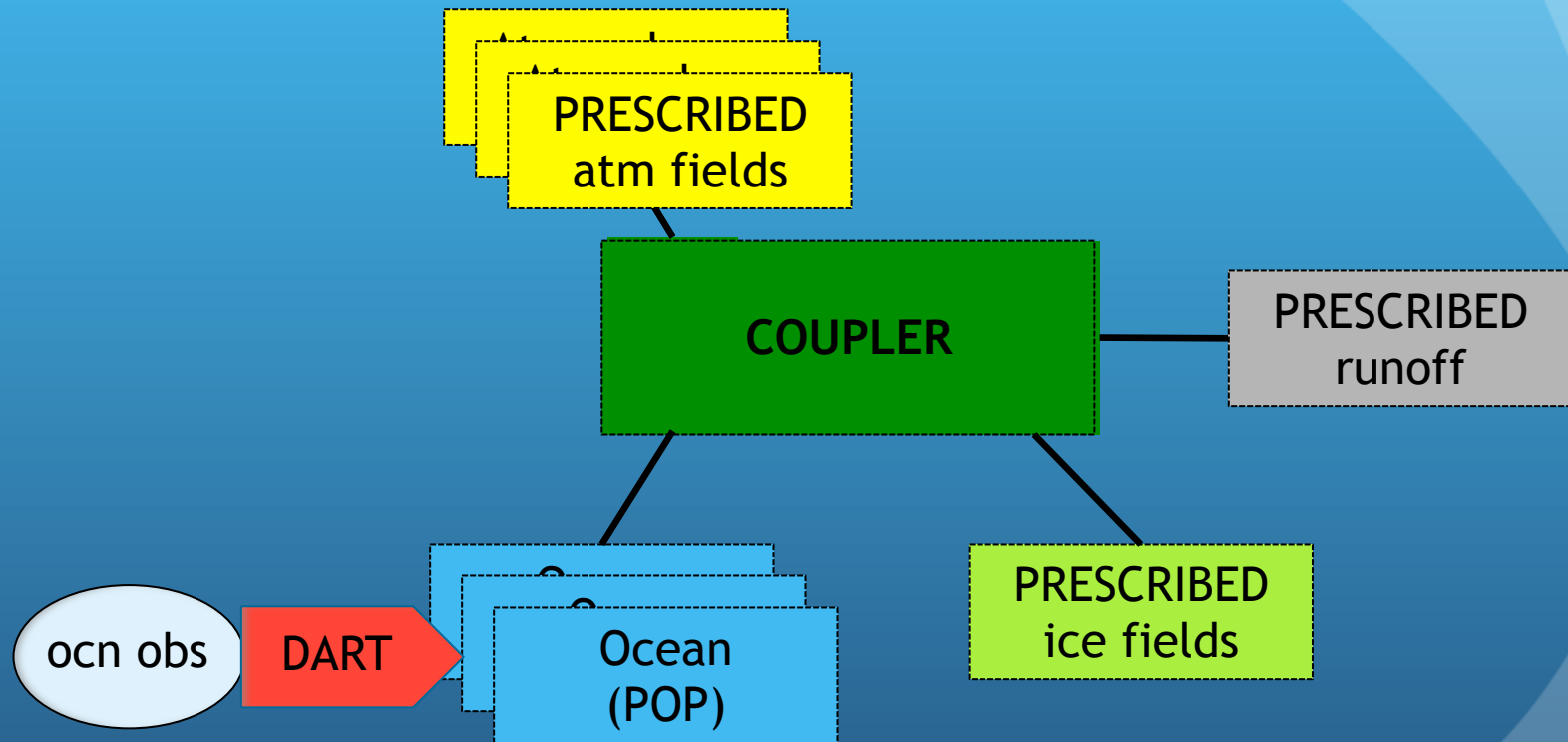


Frameworks for data assimilation

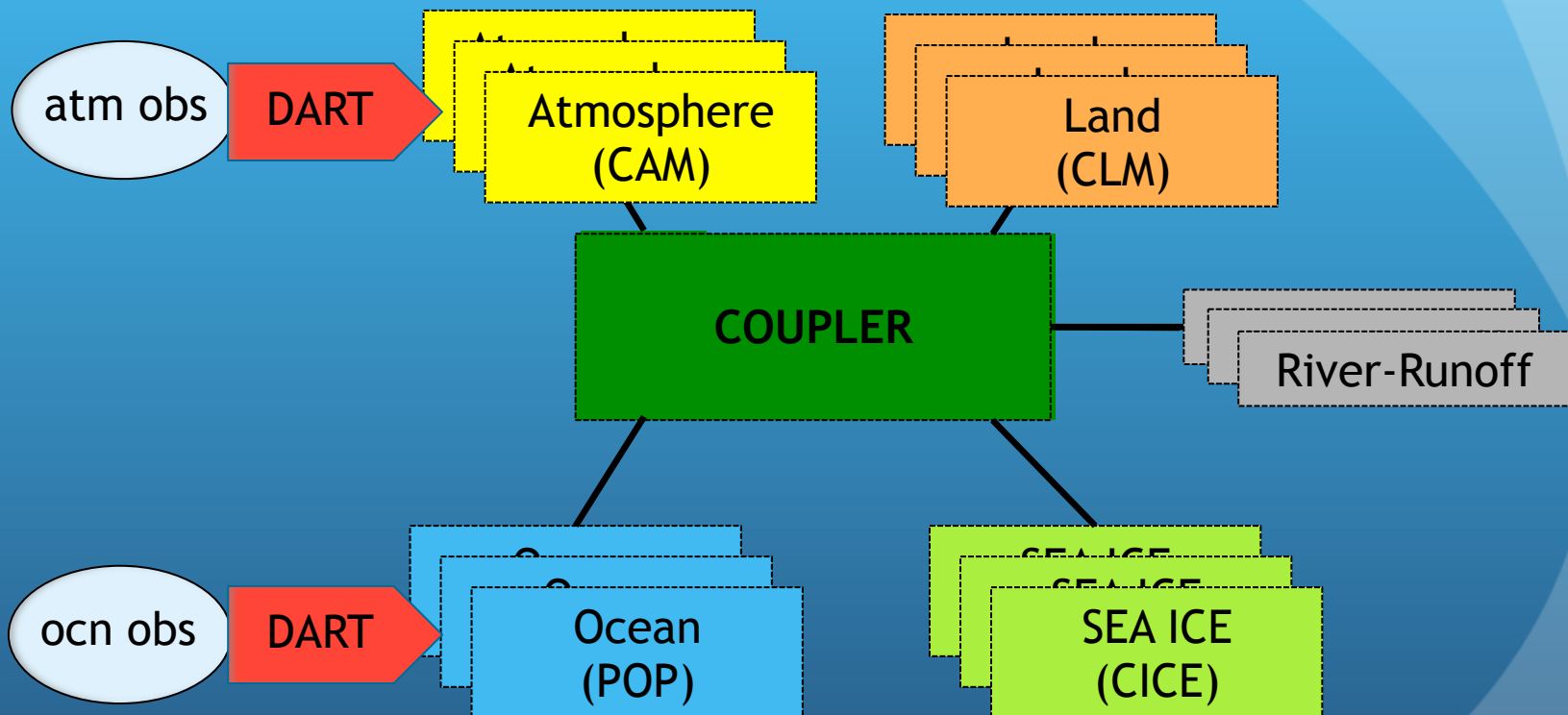


Schematic courtesy of A. Chatterjee

Community Earth System Model interfacing with DART in a “single-component” DA uncoupled framework



Community Earth System Model interfacing with DART in a “multi-component” DA coupled framework



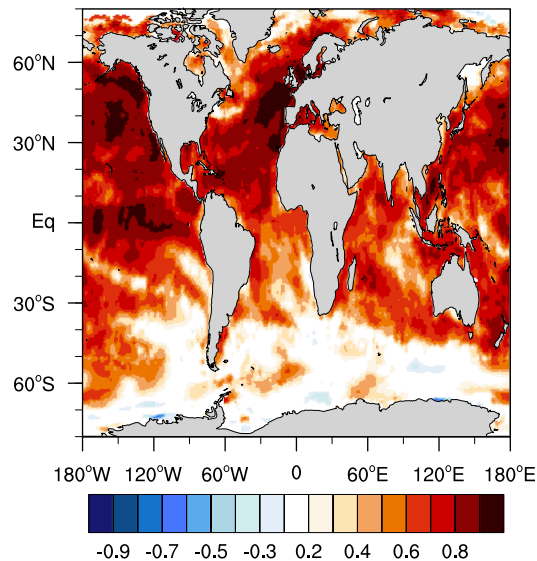
Summary info on the CESM-DART coupled assimilation system

Model:	CESM global coupled ocean/atm/ice/land <u>Horizontal resolution</u> : nominal 1° <u>Vertical resolution</u> : CAM5 30 levels (~2hPa) POP 60 levels (10 m upper to ~250m deep)
DA method:	30 member DART ensemble adjustment Kalman filter (EAKF)
Ocean obs:	In-situ temp and salinity (XBT, MBT, CTD, drifters, floats, moorings, ARGO floats, ocean station; no SST, no altimetry)
Atm obs:	temp and winds (radiosondes, aircraft, satellite drift winds, GPSRO-COSMIC, ACARS; currently no moisture, surface pressure, or radiometer retrievals)

Early results from the CESM-DART coupled assimilation

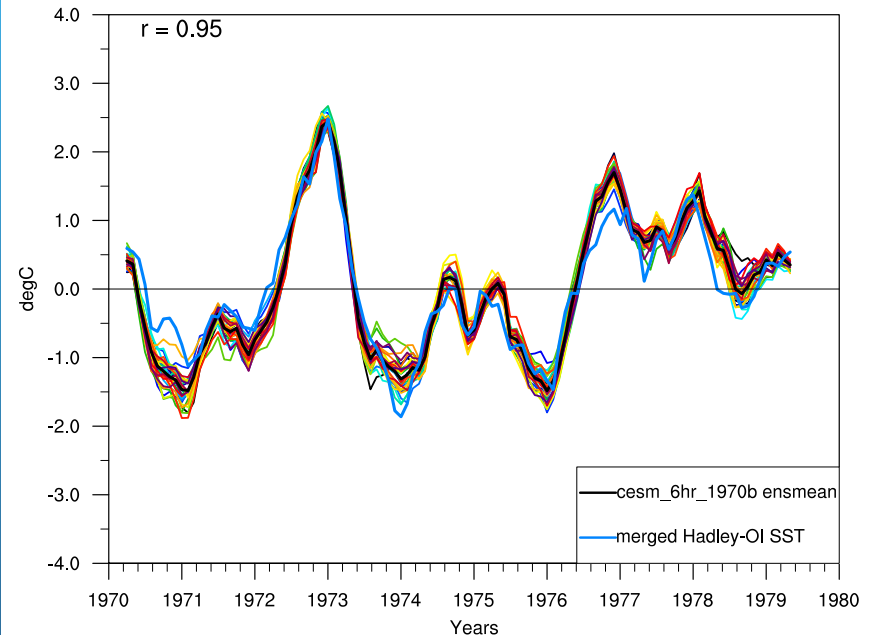
1970-1979 Monthly SST correlation

cesm_6hr_1970b, Hadley-OI SST



Generally high correlation
with HADISST

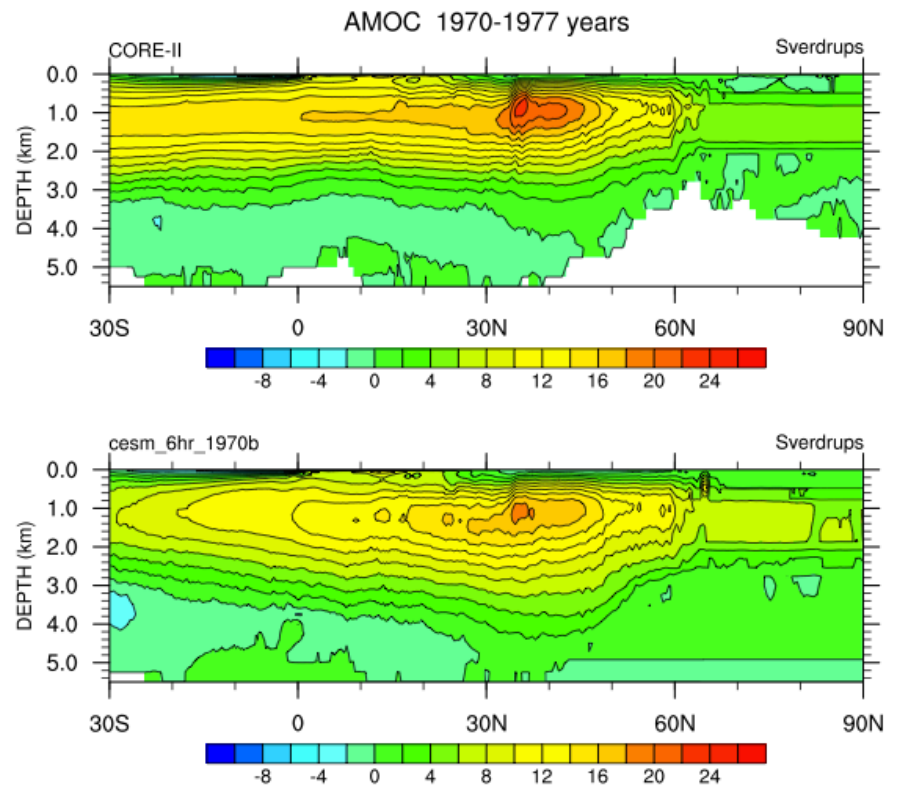
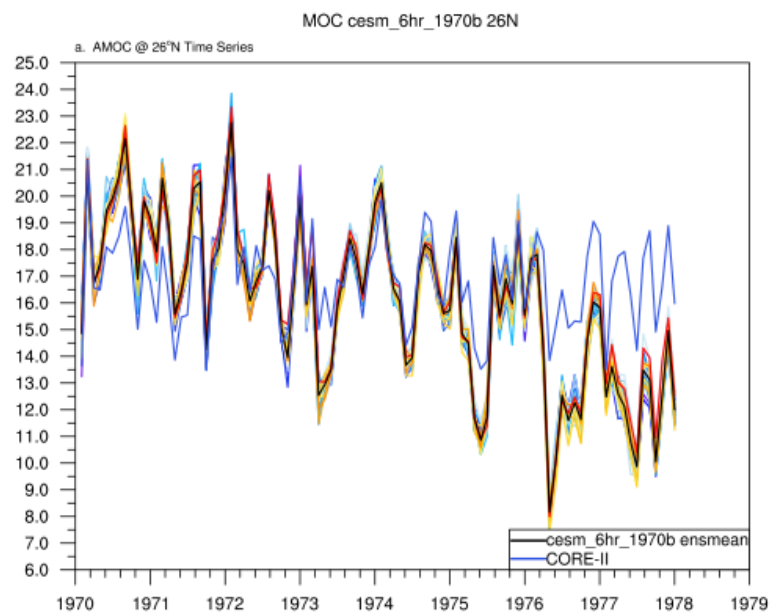
SST anomalies in the Nino 3.4 region (5N-5S, 120W-170W)



1972-73 El Nino event simulated

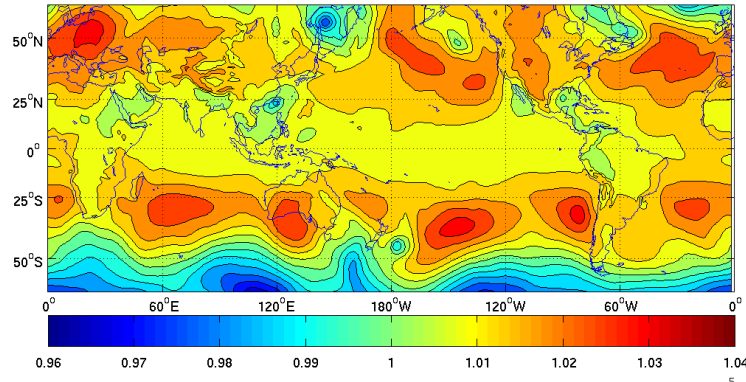
Plots courtesy of S. Karol

AMOC

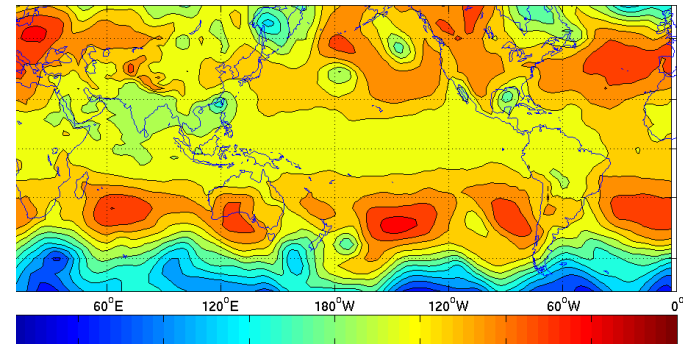


Ski-hourly snapshot of SLP from CAM5

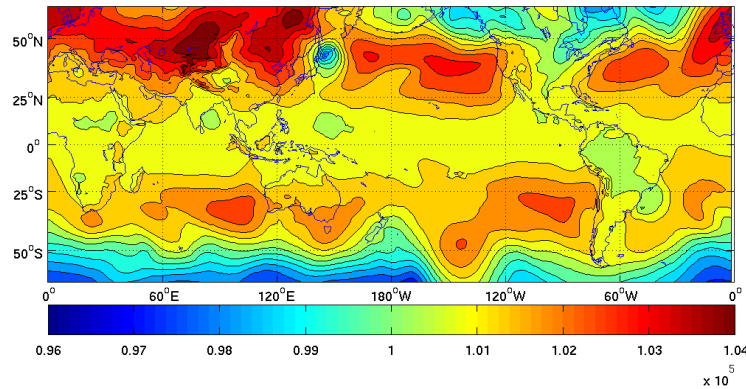
NCAR CESM-DART
SLP (dynes/cm²); ENS mean
1975-09-23-00000



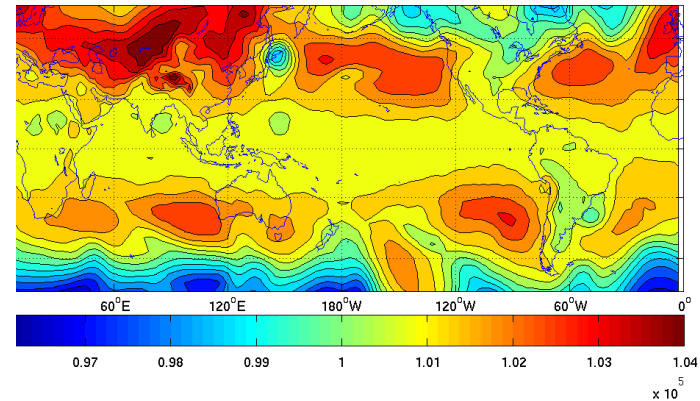
NCEP
SLP(dynes/cm²)
1975-09-23-00000



NCAR CESM-DART
SLP (dynes/cm²); ENS mean
1975-11-08-00000



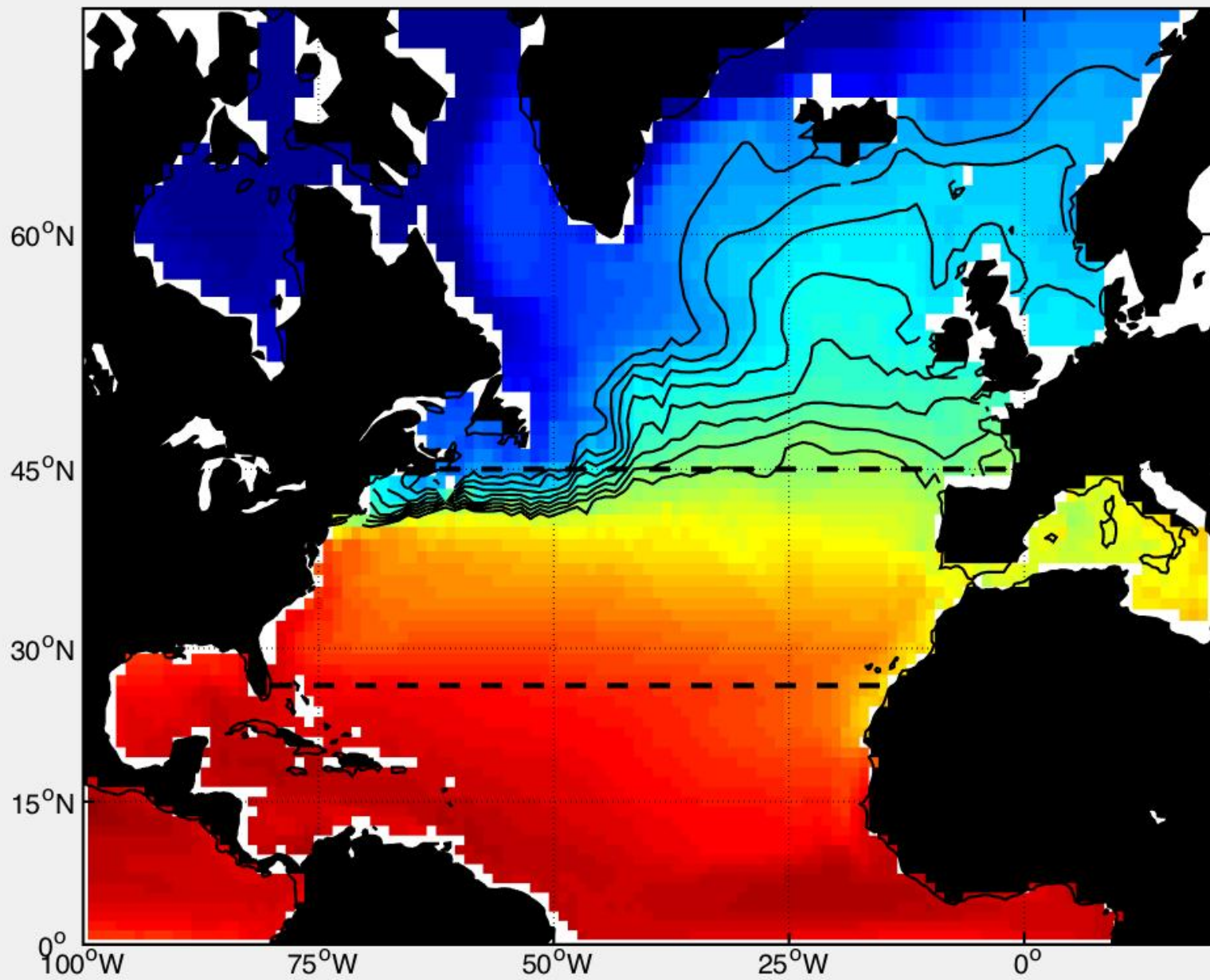
NCEP
SLP(dynes/cm²)
1975-11-08-00000



- Reasonable AMOC/variability (albeit with a drfit)
- Skill in 6 hourly forecast in atmosphere comparable to the stats published by NCEP
- Reasonable SST variability

Plans in the next 5 years:

- Complete coupled-model, multi-component assimilation
- Develop coupled-model cross-component assimilation (cross component covariances / increments)
- Software advances for speeding-up the assimilation
- Include altimetry in ocean assimilation
- Global ocean assimilation with eddy-resolving model
- **Investigate the ways that coupled assimilation may be advantageous for state estimation and prediction**



Ensemble/Group Average

