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A new historical SST analysis: COBE2-SST

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Outline

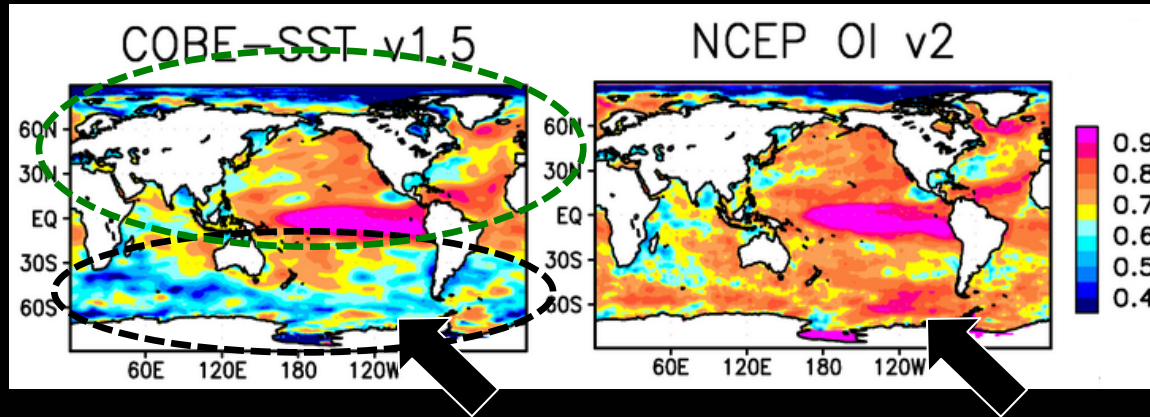
1. Basic Spec. of COBE2-SST
2. Data and Analysis Methods
3. Performance
4. Comparison with other datasets
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Motivation

1-Month Autocorrelation (1982-2006)



Regression coefficients on an ENSO-related index

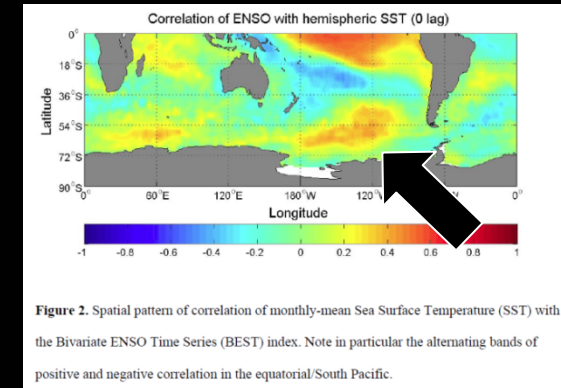


Figure 2. Spatial pattern of correlation of monthly-mean Sea Surface Temperature (SST) with the Bivariate ENSO Time Series (BEST) index. Note in particular the alternating bands of positive and negative correlation in the equatorial/South Pacific.

Meredith et al. (2008)

- El Niño drives long-lasting (~2yr) positive SST anomaly at the south-eastern part of the South Pacific through the "Atmospheric Bridge".
- Also, ice edge retreat associated with this warm SST has been observed (Kwok and Comiso 2002)
- COBE1-SST has much less persistence when compared with satellite-based SST datasets (here, NCEP OI v2).



➤ Need to introduce **satellite observations/EOF reconstruction** technique to improve reproducibility of SST persistence and variation in the Southern hemisphere

Basic Spec. of COBE2-SST

Version	Observation	Analysis Method	Others
COBE1 (Ishii et al. 2005)	<input type="checkbox"/> In-situ SST <ul style="list-style-type: none"> ▪ ICOADS 2.0*₁ ▪ Kobe Collection*₂ <input type="checkbox"/> Satellite Sea Ice <ul style="list-style-type: none"> ▪ SSMR (NASA team Algorithm*₃) ▪ SSM/I (NASA team Algorithm) 	<input type="checkbox"/> Optimal Interpolation (OI)	<input type="checkbox"/> Buckets Bias Correction (Folland and Parker 1995)
COBE2 (Dev. Ver.)	<input type="checkbox"/> In-situ SST <i>Updated!</i> <ul style="list-style-type: none"> ▪ ICOADS 2.5*₄ <input type="checkbox"/> Satellite SST <i>New!</i> <ul style="list-style-type: none"> ▪ AVHRR pathfinder*₅ <input type="checkbox"/> Satellite Sea Ice <ul style="list-style-type: none"> ▪ SSMR (NASA team algorithm) ▪ SSM/I (Bootstrap Algorithm*₆ <i>New!</i>) 	<input type="checkbox"/> Multiple timescale estimates (MTE) with OI and EOF reconstruction <i>New!</i>	<input type="checkbox"/> AMIP2-type reference climatology* ₇ <i>New!</i> <input type="checkbox"/> Salinity-dependent ICE-SST transformation <i>New!</i> <input type="checkbox"/> Buckets Bias Correction for the period after the WW-II <i>To Be Done!</i>

1. Worley et al. (2005) 2. Manabe et al. (1999) 3. Cavalieri et al. (1984) 4. Woodruff et al. (2011)
 5. NODC 6. Comiso (1986) 7. Taylor (2000)

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Observational Data Sources To be Used

SST

ICOADS 2.5 (Buckets, ERI, Buoy, ...)

1981 1998
GTS

AVHRR

Sea Ice

1870

Clim.

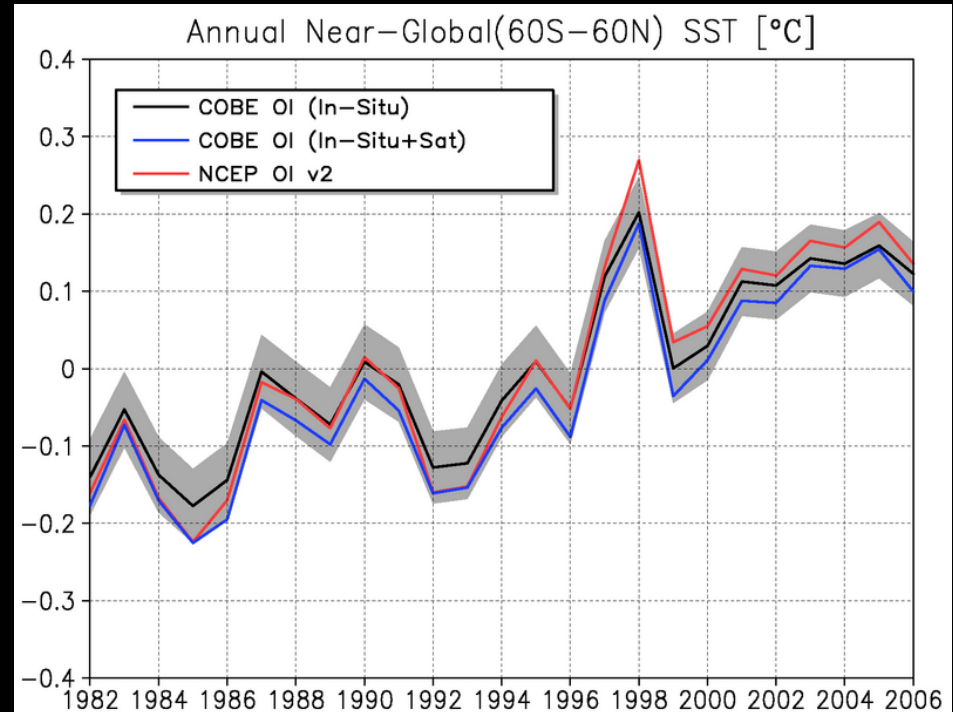
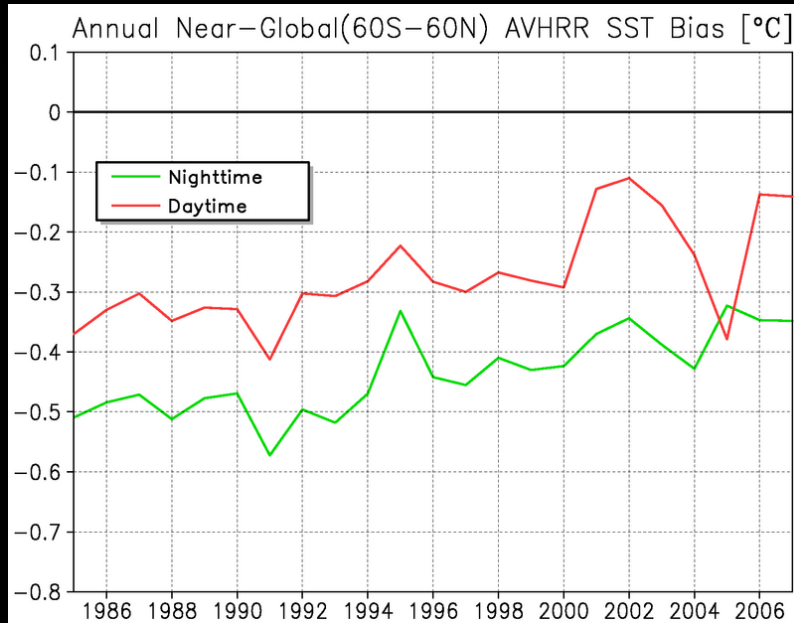
1979
Walsh and Chapman
(2001)

1987
SMMR

SSM/I

- Various types of observation are all mixed up together
- Bias corrections for various measurement methods are inevitable for creating a historically consistent product

AVHRR Bias Adjustment



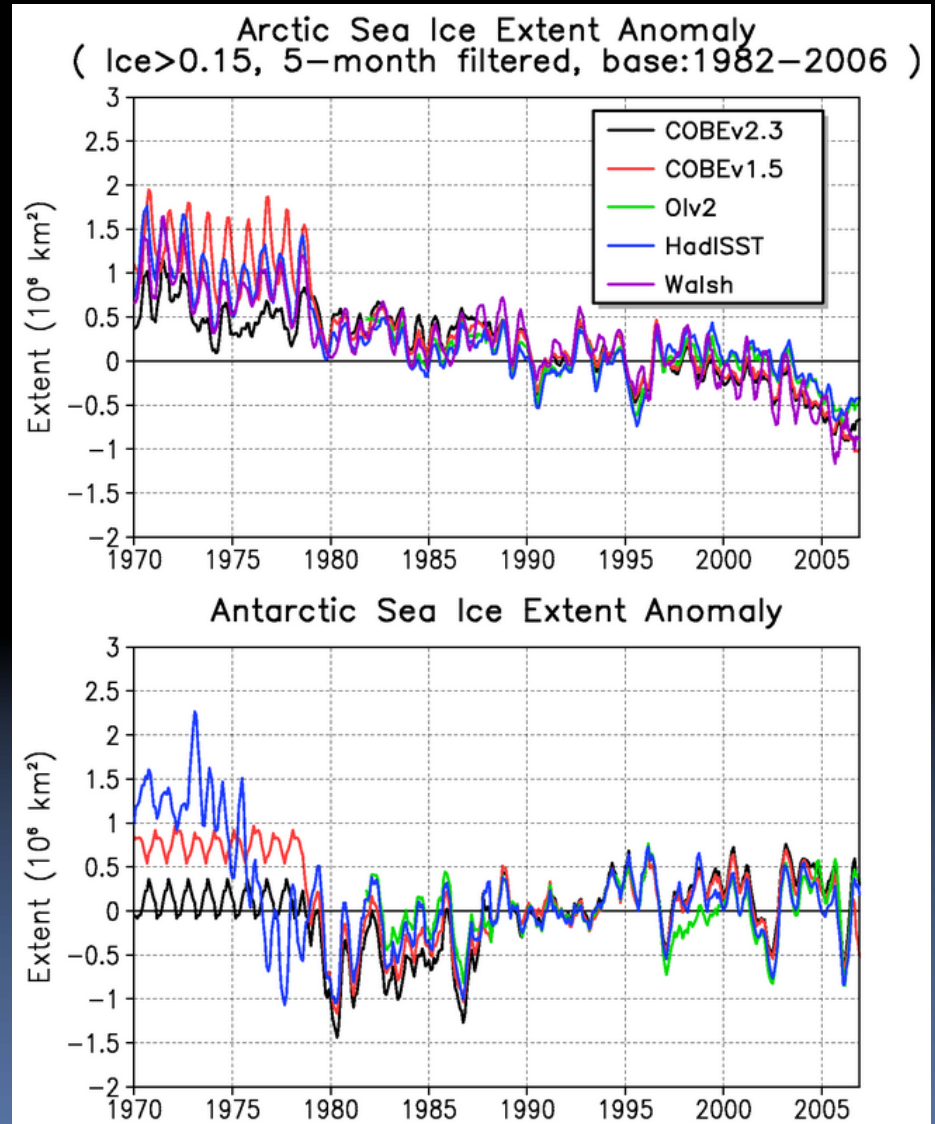
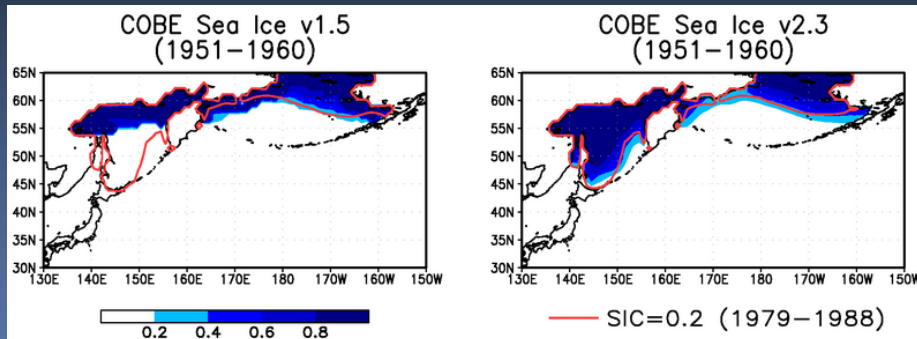
- To adjust AVHRR satellite bias, matchup data against in-situ observations (ships and buoys) are generated separately for ascending(daytime) data and descending(nighttime) data.
- Matchup data are analyzed with OI to make a gridded bias field



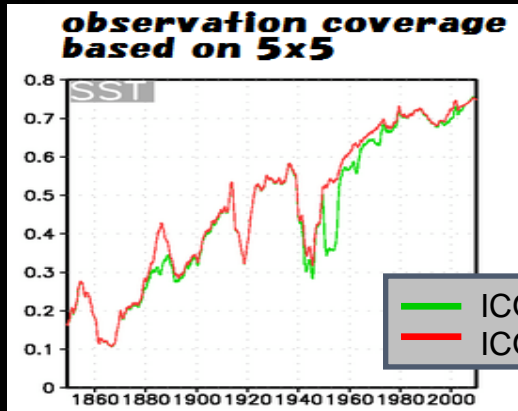
- AVHRR biases are estimated to be 0.1~0.4 for daytime data, and 0.3~0.6 for nighttime data
- Introduction of satellite observation affects **global mean SST little**, as long as its biases are properly removed.

Connecting satellite-derived Sea Ice to WC01

- SMMR(1979-1987) is adjusted to the level of SSM/I (1988-)
- Walsh and Chapman(2001) is a SIC dataset for the Arctic, which blends land/sea observations or handwritten charts
- A sudden decrease of sea ice in 1979 is corrected by adding a mean difference between before/after 1979.

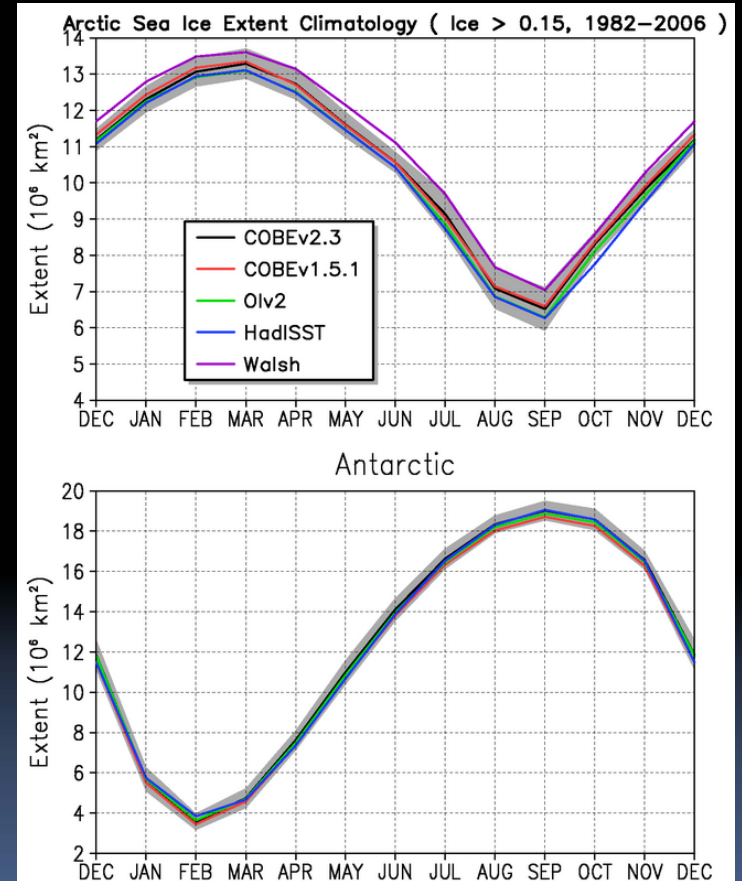


Other modifications



Improved observation coverage

Introduction of Bootstrap Algorithm to SSM/I sea ice concentration



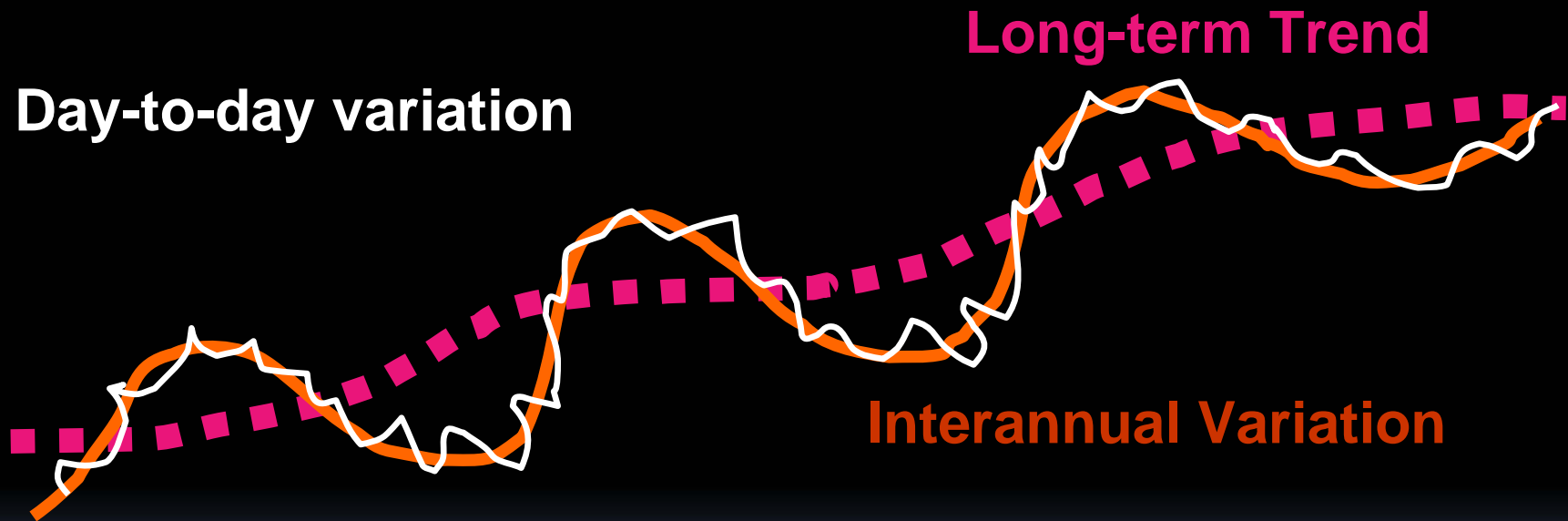
Boosted seasonal cycle for a reference SST climatology (Taylor et al. 2001)

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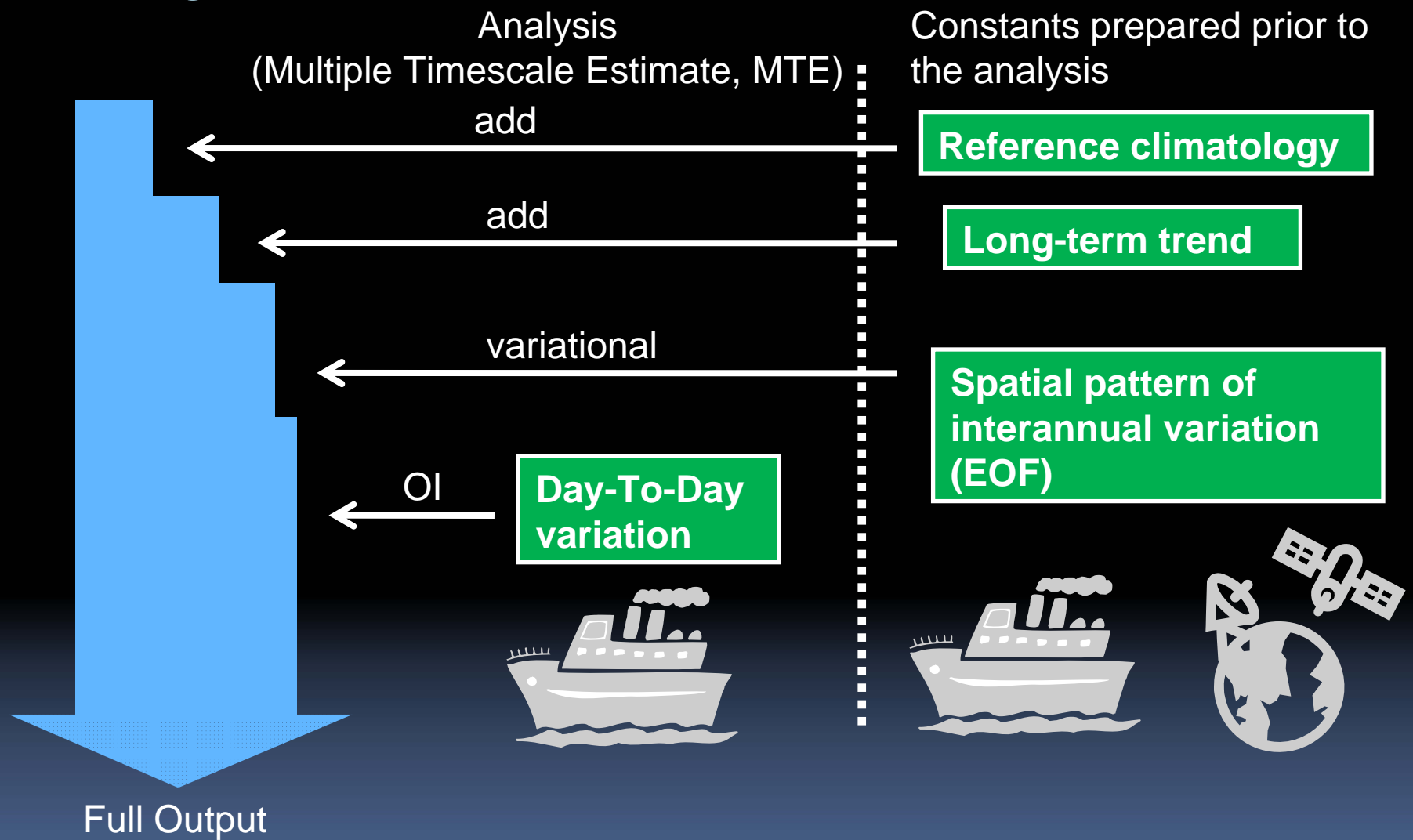
Multiple Time Scale Estimates with OI and EOF Reconstruction

$$T_a(n) = T_c(n) + \delta T_c(n) + \delta T_a^{rec}(n) + \delta T_a^{day}(n)$$



- Long-Term Trend : 1st EOF mode on 5x5 SST anomaly fields (δT_c)
- Interannual Variation : 1x1 EOFs calculated with both in-situ and satellite observations, 1961-2005, explains 90% of residual variance (δT_a^{rec})
- Day-To-Day Variation : Defined as an increment from previous day, analyzed by the Optimal Interpolation Method, 10% of residual variance (δT_a^{day})
- With an Analysis Error Estimation

Analysis Procedure



➤ Satellite SST observation is not used for historical analysis but it's used only for creating temporally constant variables

EOF Reconstruction and Analysis Errors

Background error covariance:

$$\mathbf{P}^f = \mathbf{F}\mathbf{L}\mathbf{F}^T$$

Minimize the following cost:

$$J = \mathbf{x}^T (\mathbf{P}^f)^{-1} \mathbf{x} + (\mathbf{y} - \mathbf{H}\mathbf{x})^T \mathbf{R}^{-1} (\mathbf{y} - \mathbf{H}\mathbf{x})$$

Analysis error :

$$\mathbf{P}^a = (\mathbf{I} - \mathbf{K}\mathbf{H})\mathbf{P}^f$$

$$\mathbf{K} = \left\{ (\mathbf{P}^f)^{-1} + \mathbf{H}^T \mathbf{R}^{-1} \mathbf{H} \right\}^{-1} \mathbf{H}^T \mathbf{R}^{-1}$$

Rewritten as :

$$\mathbf{P}^a = \mathbf{F}(\mathbf{L}^{-1} + \mathbf{B})\mathbf{F}^T$$

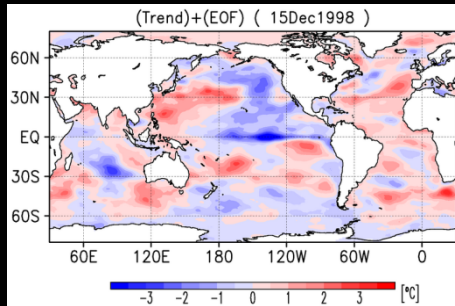
where

$$\mathbf{B} = \mathbf{F}^T \mathbf{H}^T \mathbf{R}^{-1} \mathbf{H} \mathbf{F}$$

\mathbf{P}^a	Analysis Error Covariance Matrix
\mathbf{P}^f	Background Error Covariance Matrix
\mathbf{R}	Observation Error Covariance Matrix
\mathbf{I}	Unit Matrix
\mathbf{K}	Optimal Weight matrix
\mathbf{H}	Observation Operator matrix
\mathbf{L}	Eigenvalue matrix
\mathbf{F}	Eigenvector matrix
\mathbf{x}	Optimal solution vector

A snapshot of a Daily Output

(Dec. 15, 1998)

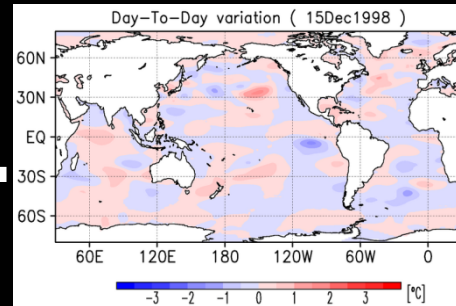


(Long-Term Trend)

+

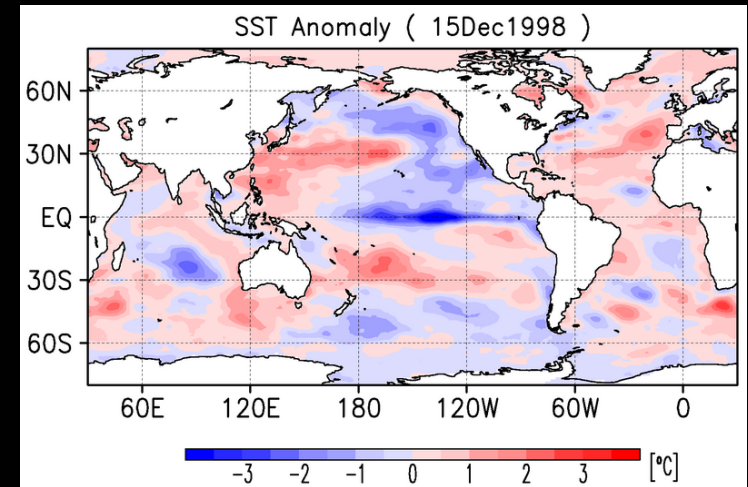
(Reconstructed 31-day
mean field centered at
the analysis date)

+

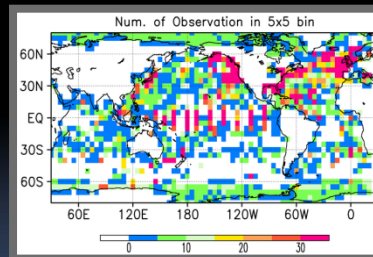


(Day-To-Day Variation)

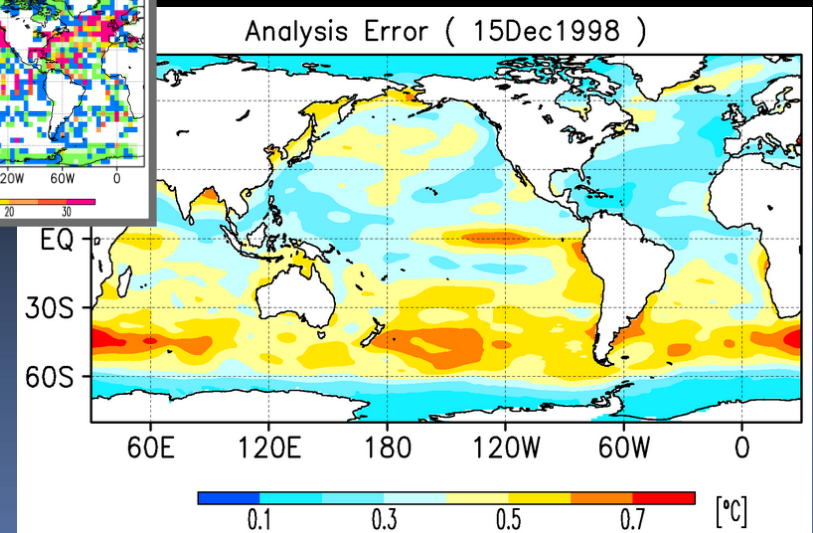
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(Full Daily Output)



(Observation)



(Analysis Error)

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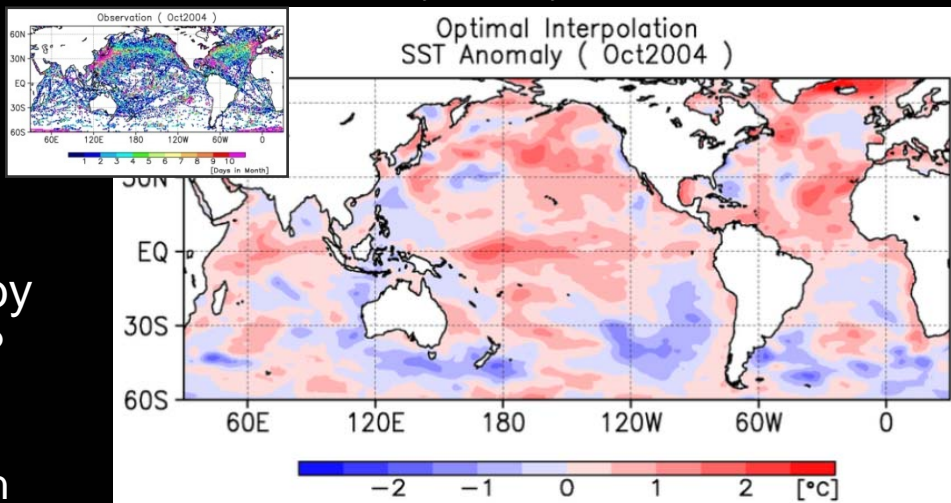
Strategy for Evaluating the new analysis scheme

EOF reconstruction yields substantial variances even in data-sparse areas, but almost zero anomalies in OI.

How much is our product affected by changes in observation distribution?

To emulate the observational network in 1890, we extract samples at the nearest position in time and space from 2004

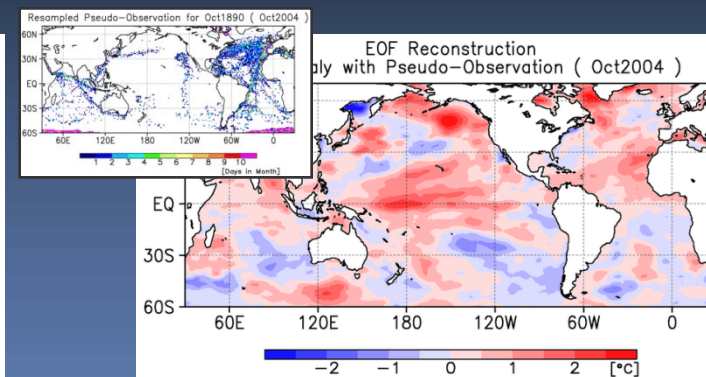
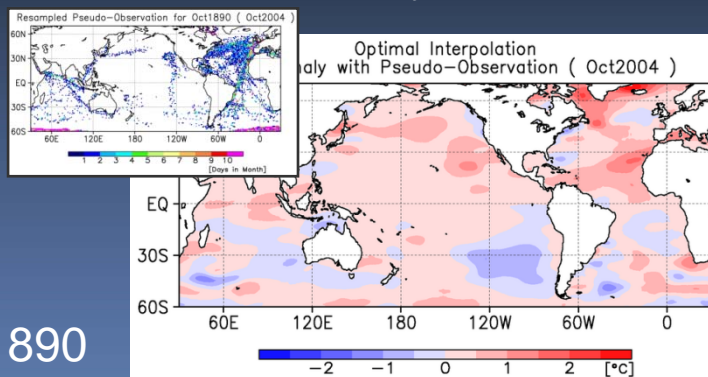
“True” SST anomaly analyzed with OI (Oct. 2004)



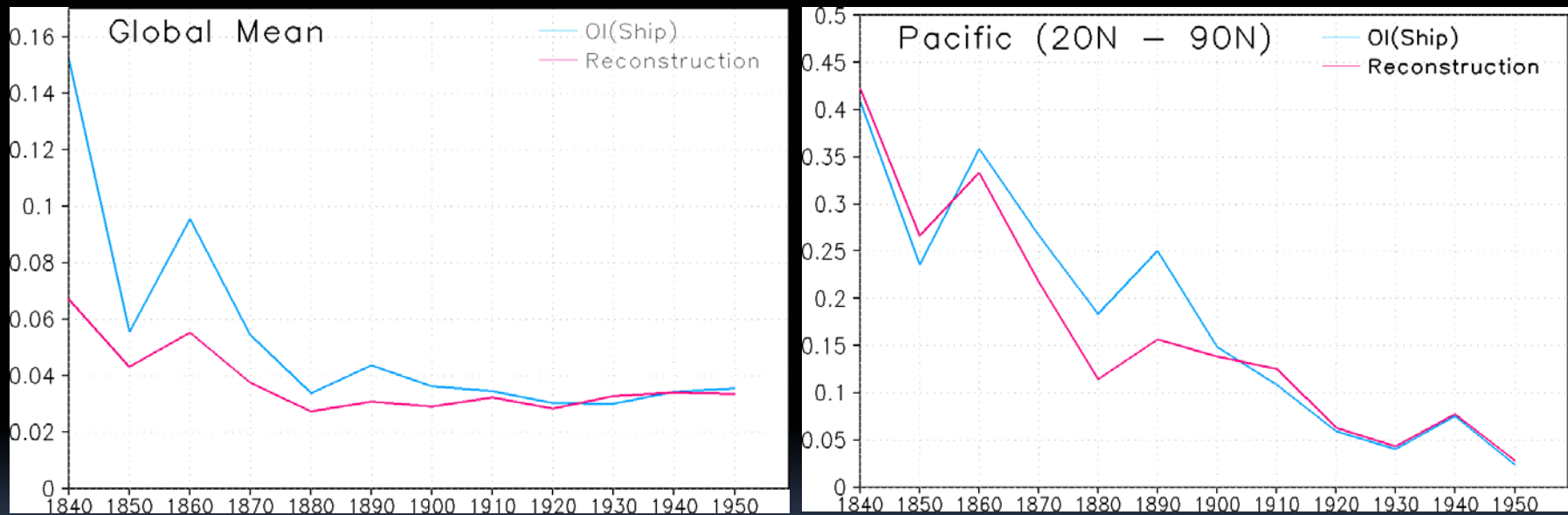
Previous analysis method (OI)

New Method (MTE)

Oct.1890



Cross Varidated Performance for the newly introduced analysis method

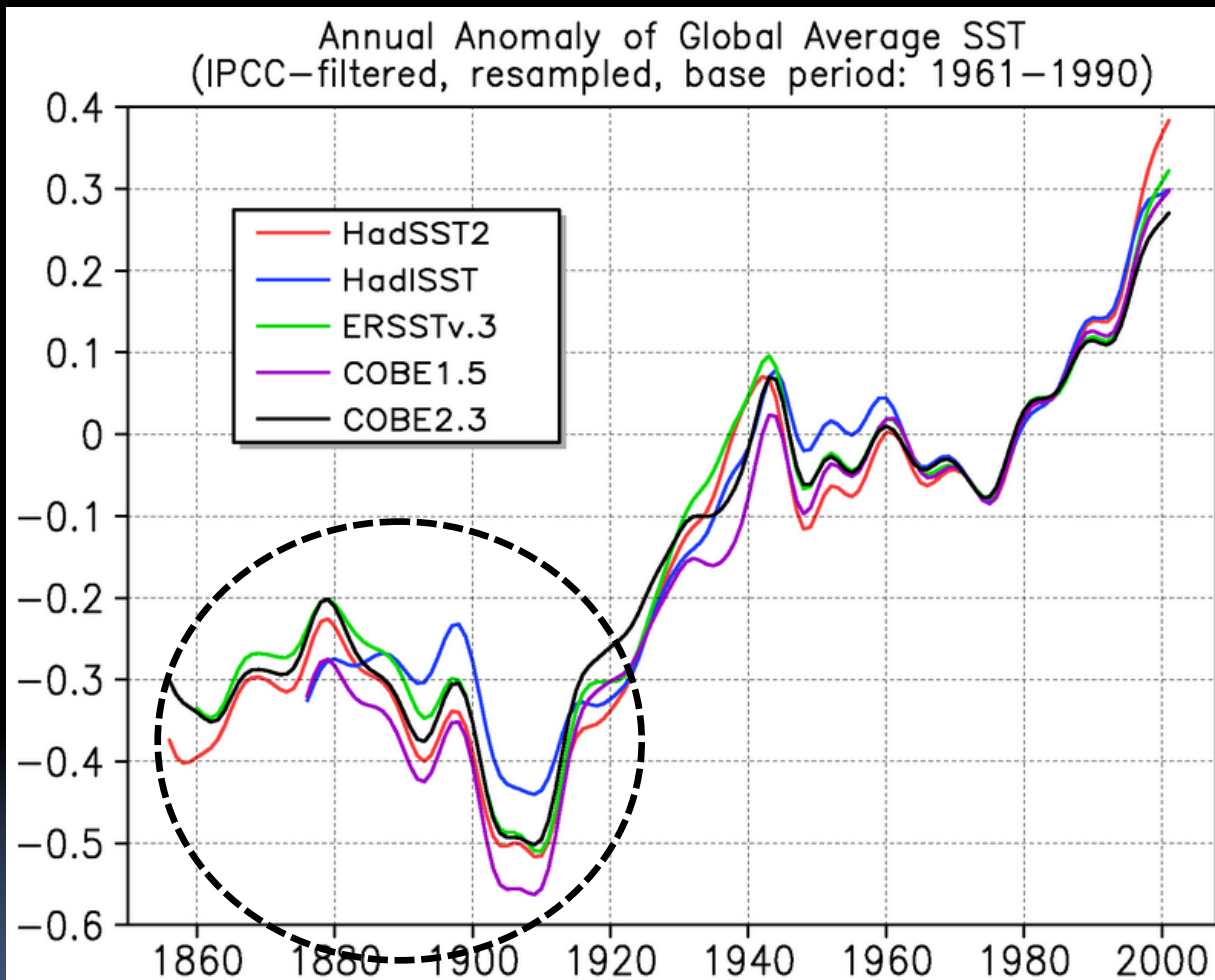


- Global means are shown to be better in **MTE** than in **OI**
- Also, MTE raises reliability of regional average over the North Pacific, where observation is relatively rich in number

Outline

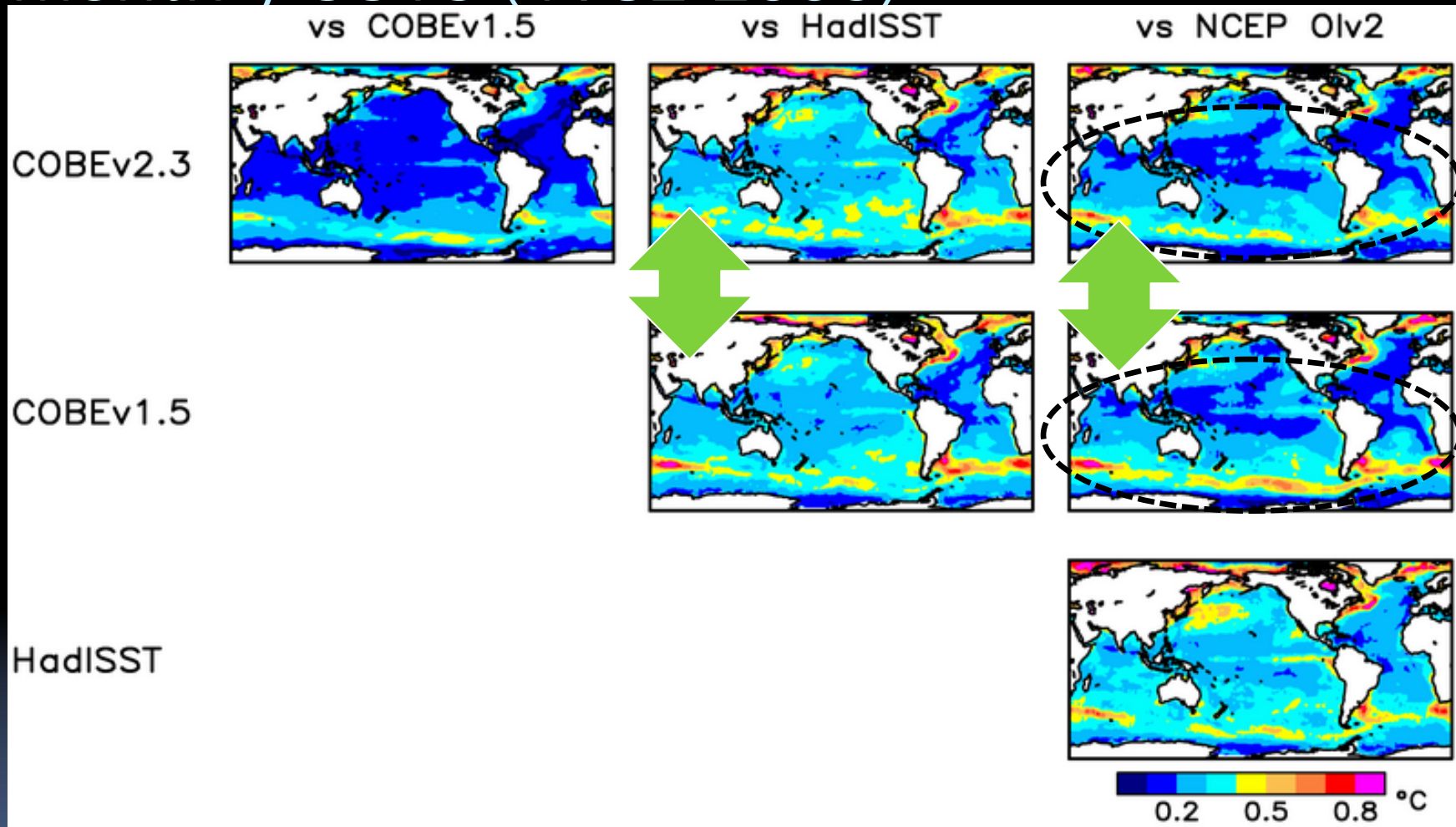
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Global Average SST



- Better agreement with HadISST and ERSSTv3
 - A slight decrease in analysis uncertainty

Root Mean Square Differences between the monthly SSTs (1982-2006)

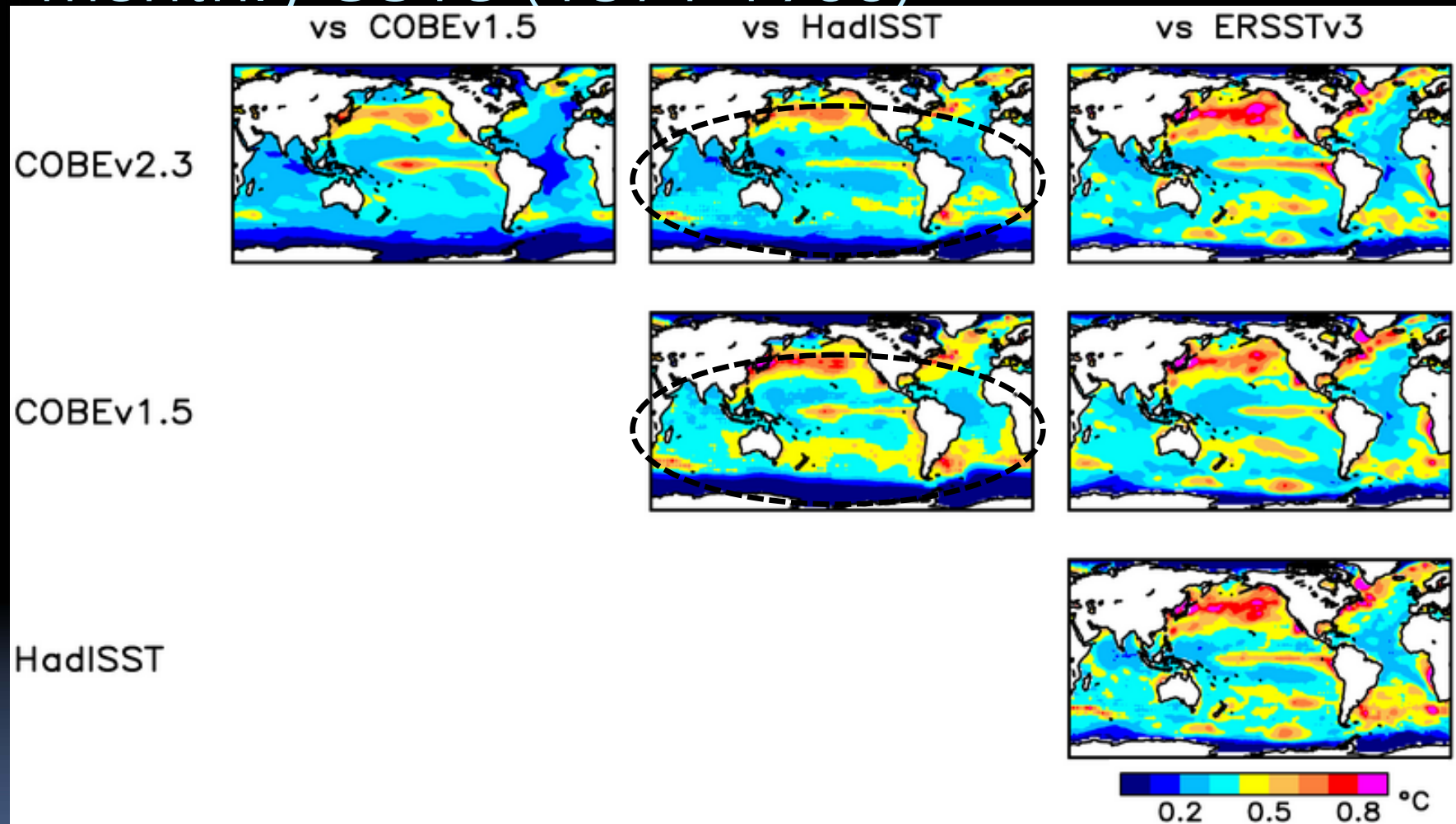


Root mean square differences of monthly SST anomaly between the every pair of SST datasets



➤ Better agreement of the interannual variation with the other datasets, particularly with NCEP OIv2.

Root Mean Square Differences between the monthly SSTs (1871-1900)

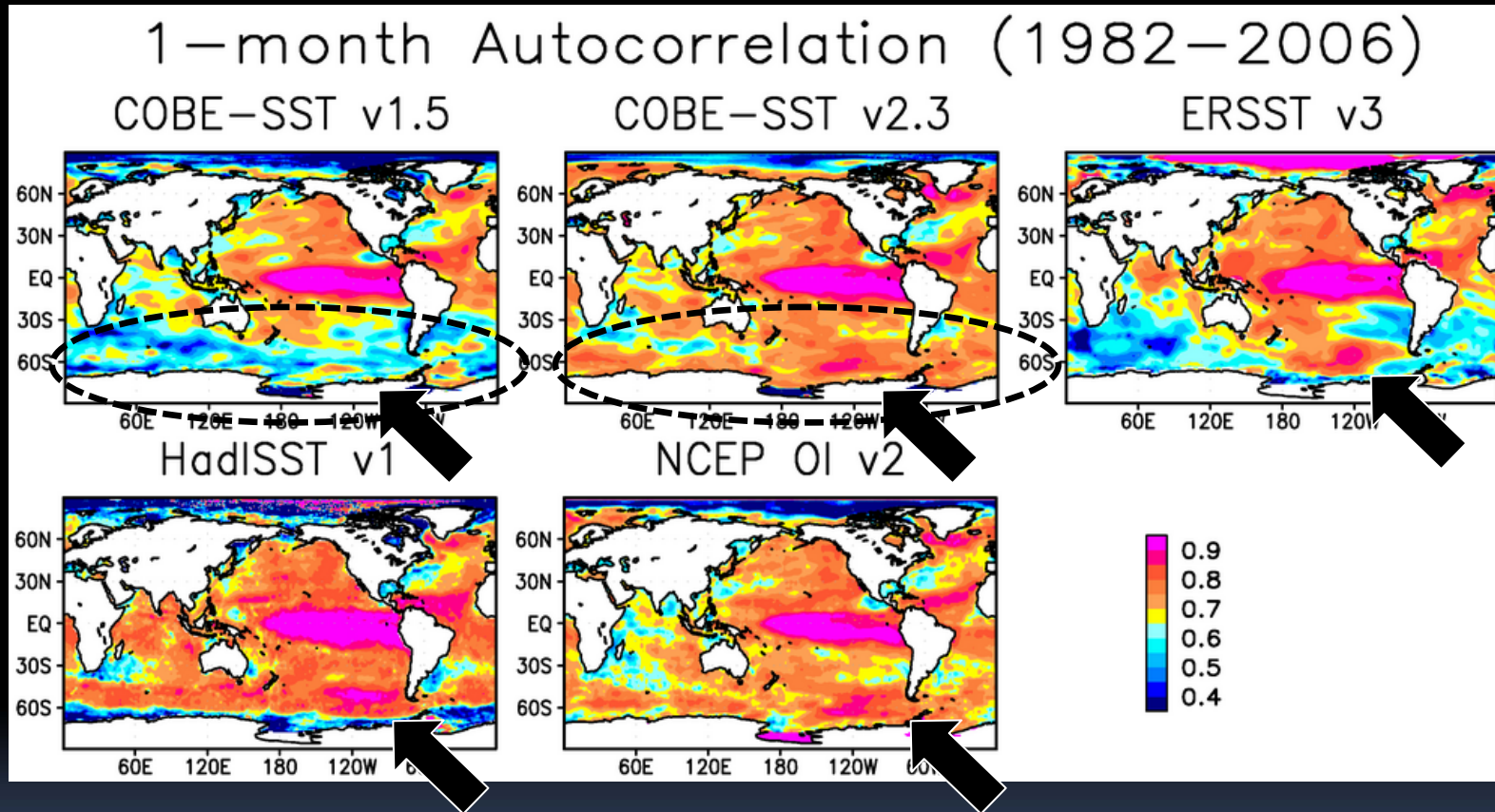


Root mean square differences of monthly SST anomaly between the every pair of SST datasets



➤ Better agreement of the interannual variation with the other datasets, particularly with HadISST

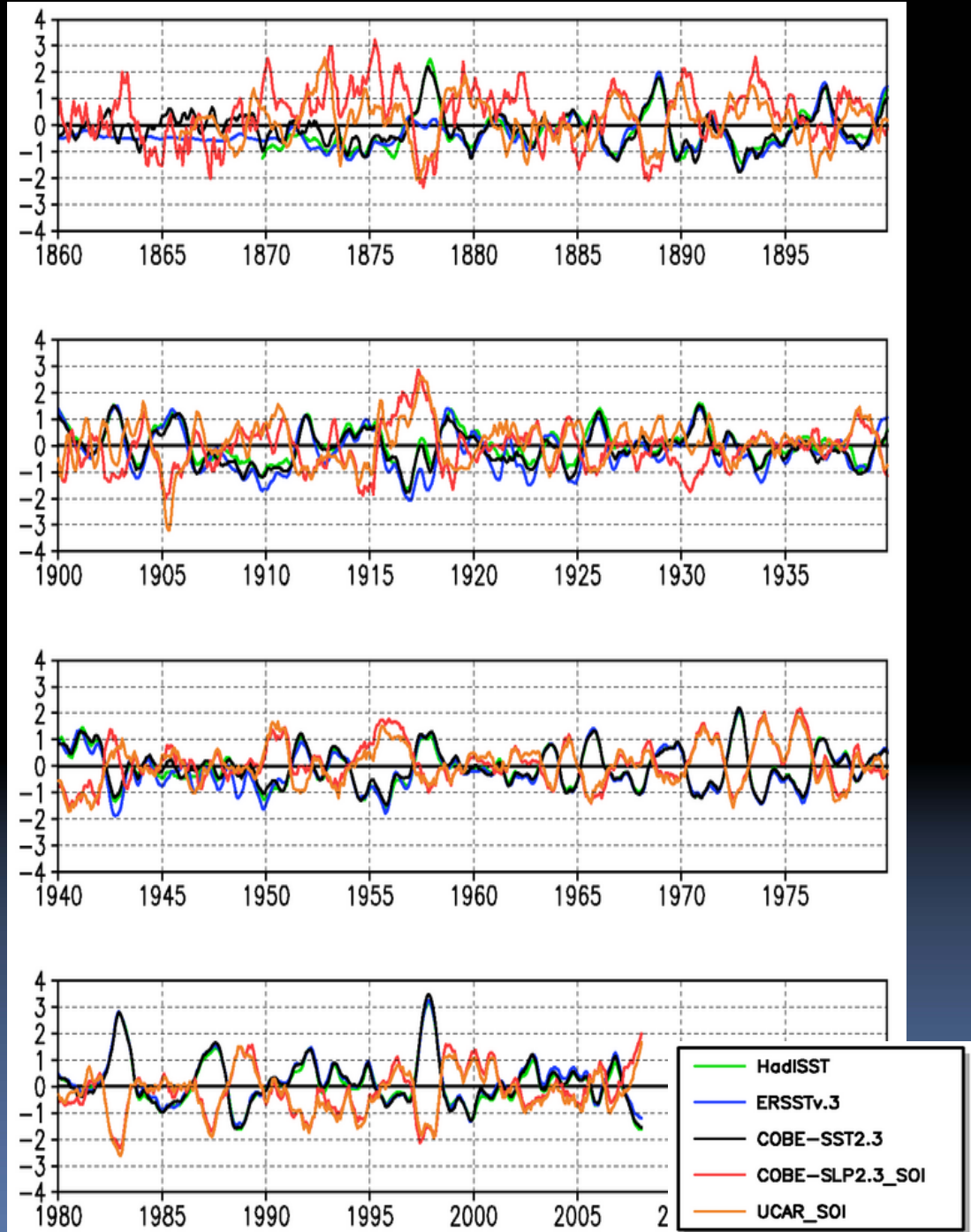
SST Anomaly Persistence



- Thanks to satellite observations, the new analysis scheme produces South Pacific SSTs with large persistence.
- One-month autocorrelation coefficients of the new analysis are in good agreement with those of the other SSTs

COBE2-SLP

- There are practically little differences among three NINO.3 SST time series
- COBE2-SLP is the historical SLP analysis processed in the same fashion as COBE2-SST
- SOIs based on ship observations are similar to those of land observations.
- Signals of seesaw-like covariation between NINO.3 SST and SOI would be detectable from 1870s



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Summary

COBE-SST has updated :

- Observational data sources
- Analysis method

And these updates have :

- Raised reliability of global mean SST
- Decreased differences against the other datasets

Future Plan

- Introduction of SST Analysis Ensemble (fluctuating raw observations, analysis parameters etc.)
- Bias adjustment for recent drifters (Kennedy et al. 2008@ CLIMAR-III)
- Metadata Inference for better bias adjustment

Thank You very much for
your kind attention !



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 - Worley, S.J., S.D. Woodruff, R.W. Reynolds, S.J. Lubker, and N. Lott, 2005: ICOADS Release 2.1 data and products. *Int. J. Climatol.*, 25, 823-842
- ICOADS 2.5
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- Buckets Bias Correction
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- NASA Team Algorithm
 - Cavalieri, D.J, P. Gloersen, & W. J. Campbell, 1984: Determination of sea ice parameters with the NIMBUS 7 SMMR. *Journal of Geophysical Research* 89(D4), 5355-5369.
- Bootstrap Algorithm
 - Comiso, J.C., 1986: Characteristics of arctic winter sea ice from satellite multispectral microwave observations. *Journal of Geophysical Research* 91(C1), 975-994.
- Walsh and Chapman Northern Hemisphere Sea Ice
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- AVHRR Pathfinder dataset v.5
 - Reference not found ...
 - available at <http://www.nodc.noaa.gov/SatelliteData/pathfinder4km/>
- Salinity from WOA05
 - Antonov, J. I., R. A. Locarnini, T. P. Boyer, A. V. Mishonov, and H. E. Garcia, 2006: *World Ocean Atlas 2005, Volume 2: Salinity*. S. Levitus, Ed. NOAA Atlas NESDIS 62, U.S. Government Printing Office, Washington, D.C., 182 pp.

➤ HadSST2

- Rayner, N.A., P.Brohan, D.E.Parker, C.K.Folland, J.J.Kennedy, M.Vanicek, T.Ansell and S.F.B.Tett, 2006: Improved analyses of changes and uncertainties in sea surface temperature measured in situ since the mid-nineteenth century: the HadSST2 data set. *Journal of Climate*. 19(3), 446-469.

➤ HadISST

- Rayner, N. A., Parker, D. E., Horton, E. B., Folland, C. K., Alexander, L. V., Rowell, D. P., Kent, E. C. and Kaplan, A., 2003: Global analyses of sea surface temperature, sea ice, and night marine air temperature since the late nineteenth century, *J. Geophys. Res.*, 108, No. D14, 4407 10.1029/2002JD002670

➤ ERSST v3

- Smith, T.M., R.W. Reynolds, Thomas C. Peterson, and Jay Lawrimore, 2008: Improvements to NOAA's Historical Merged Land-Ocean Surface Temperature Analysis (1880-2006). *Journal of Climate*, 21, 2283-2296.

➤ NCEP OI v.2

- Reynolds, R.W., N.A. Rayner, T.M. Smith, D.C. Stokes, and W. Wang, 2002: An improved in situ and satellite SST analysis for climate. *J. Climate*, 15, 1609-1625.

➤ COBE1-SST

- Ishii, M., A. Shouji, S. Sugimoto, and T. Matsumoto, 2005: Objective analyses of SST and marine meteorological variables for the 20th century using ICOADS and the Kobe collection. *Int. J. Climatol.*, 25, 865-879.
- Manabe, T., 1999: The digitized Kobe Collection, Phase I: Historical surface marine meteorological observations in the archive of the Japan Meteorological Agency. *Bull. Amer. Meteor. Soc.*, 80, 2703–2715.

➤ Meredith et al. 2008

- Meredith, Michael P.; Murphy, Eugene J.; Hawker, Elizabeth J.; King, John C.; Wallace, Margaret I.. 2008 On the interannual variability of ocean temperatures around South Georgia, Southern Ocean: forcing by El Niño/Southern Oscillation and the Southern Annular Mode. *Deep Sea Research II*, 55 (18-19). 2007-2022. 10.1016/j.dsr2.2008.05.020

➤ NAT Bias Correction

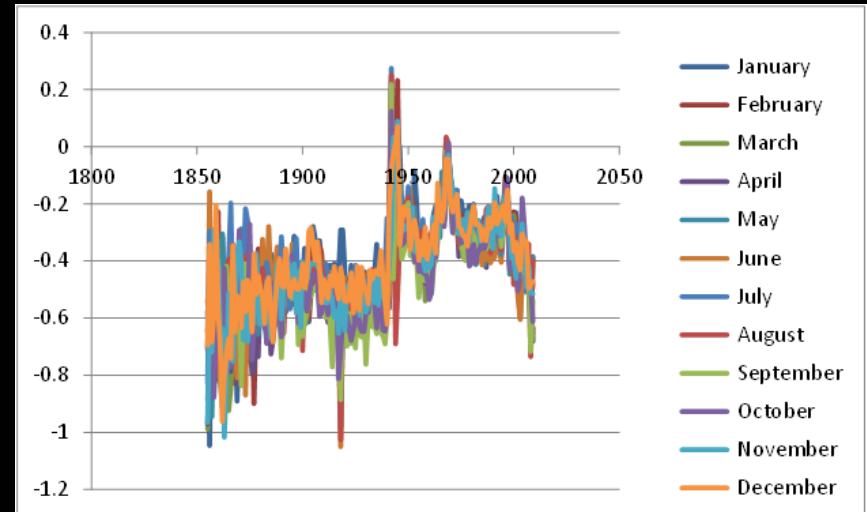
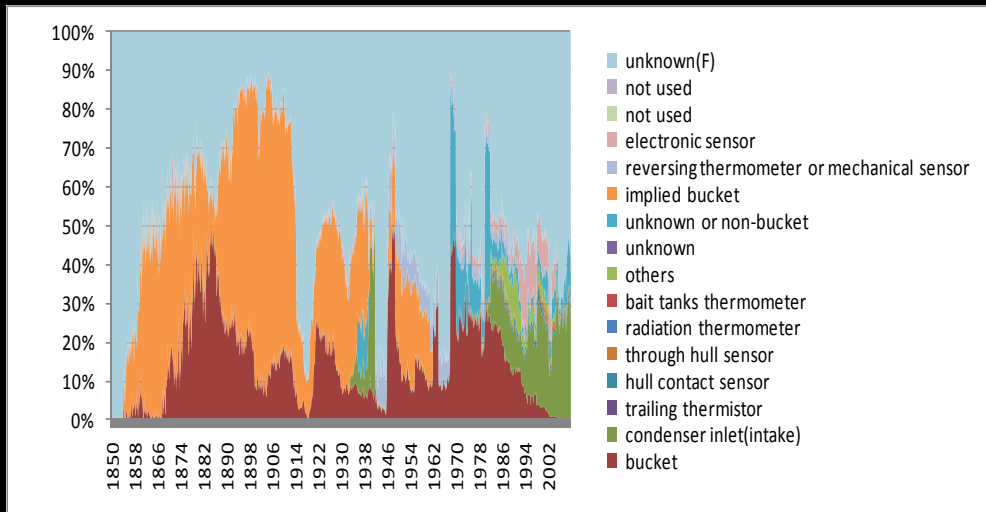
- Bottomley, M., et al., 1990: Global Ocean Surface Temperature Atlas "GOSTA". HMSO, London, 20 pp.+iv, 313 plates.

➤ Boosted SST climatology

- Taylor, K.E., D. Williamson, and F. Zwiers, 2000: The sea surface temperature and sea-ice concentration boundary conditions for AMIP II simulations, PCMDI Report No. 60, Program for Climate Model Diagnosis and Intercomparison, Lawrence Livermore National Laboratory, Livermore, California, 25 pp



Bias Adjustment for In-situ Observations



Historical transition of SST observation methods

Global average "Engine room intake" SST bias against nighttime marine air temperature

- There are several choices (ex. Smith and Reynolds 2002) to adjust biases on
 - Drifters in recent decades
 - Buckets observations before/after WW-II



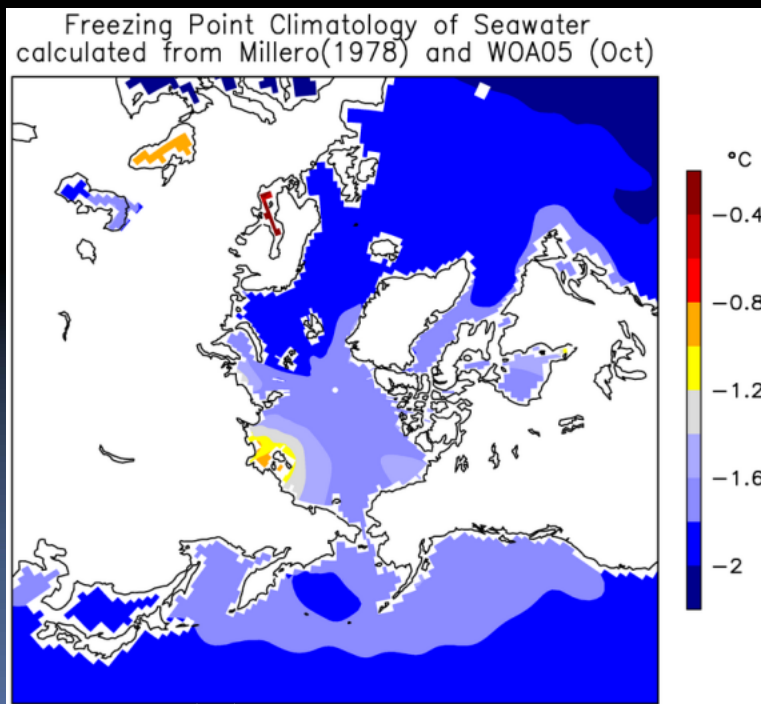
- Issues we need to tackle here are:
 - Sudden changes of major observation method in history
 - A large amount of "Method-Unknown" observations

Salinity-Dep. ICE-SST Equations

Empirical Relationship between SST and Sea Ice Concentration :

$$T_{Pseudo} = aI^2 + bI + c \quad \text{where}$$

Coefficients a and b are estimated by the method of least squares under a constraint, and they vary in space and seasonally, corresponding to monthly salinity climatology of WOA05



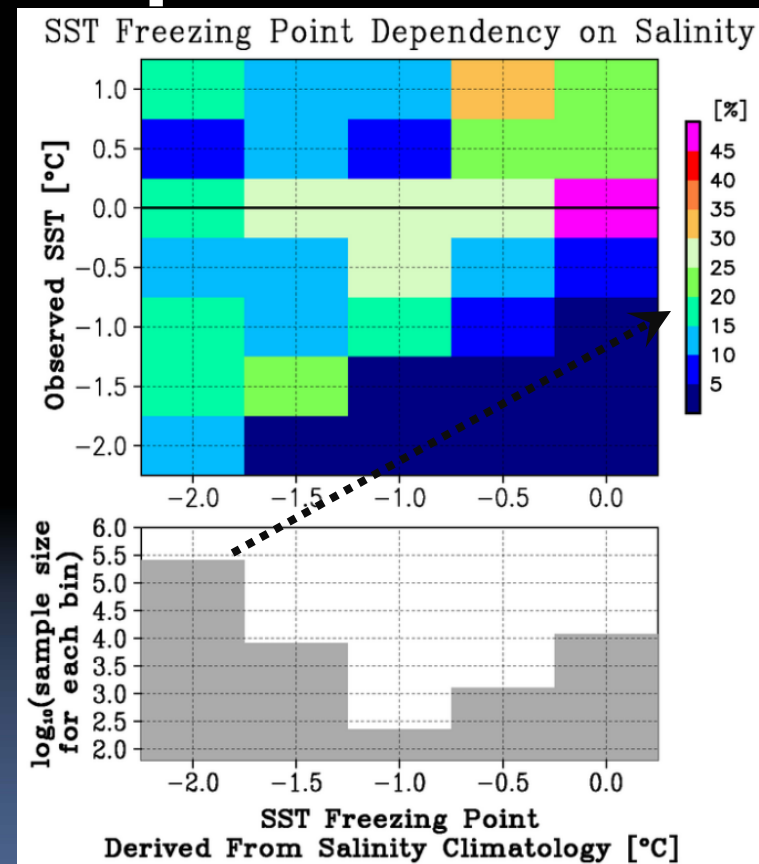
$$T_{freezing}(S) = aI_{MAX}^2 + bI_{MAX} + c$$

T_{Pseudo}

- Pseudo SST Observation
- Derived From Sea Ice data

I

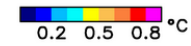
- Sea Ice Concentration [0~1]



Frequency distribution of In-situ SST versus climatological SST derived from salinity. Samples are taken at grids where SIC is greater than 0.9

Anomaly Correlation

RMSD (1871–1900)

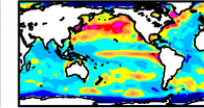
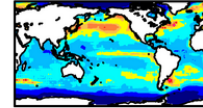
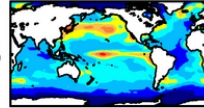


vs COBEv1.5

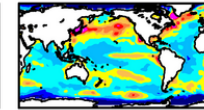
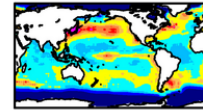
vs HadISST

vs ERSSTv3

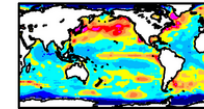
COBEv2.3



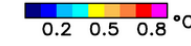
COBEv1.5



HadISST



RMSD (1901–1930)

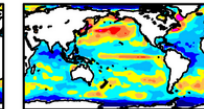
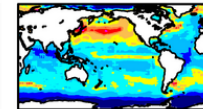
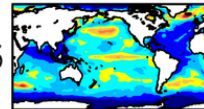


vs COBEv1.5

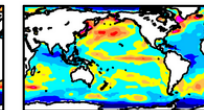
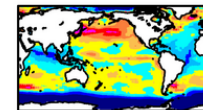
vs HadISST

vs ERSSTv3

COBEv2.3



COBEv1.5



RMSD (HadISST)

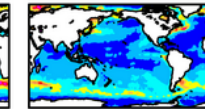
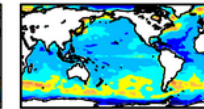
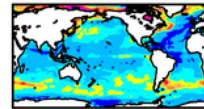
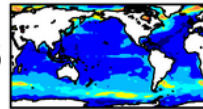
vs COBEv1.5

vs HadISST

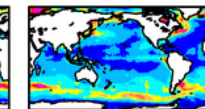
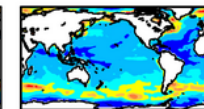
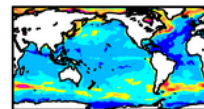
vs ERSSTv3

vs NCEP OIv2

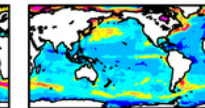
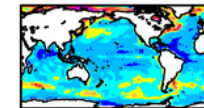
COBEv2.3



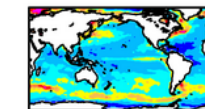
COBEv1.5



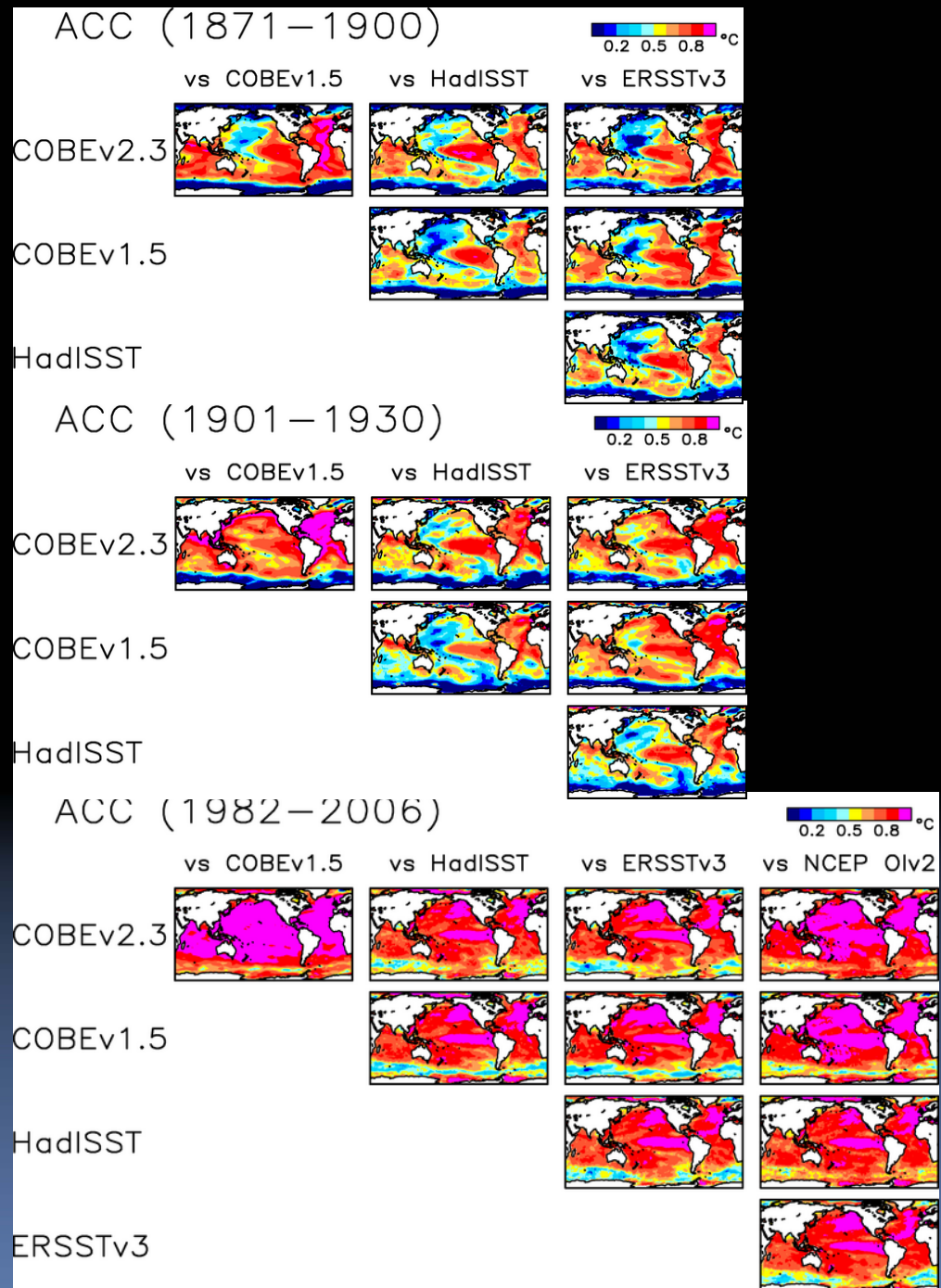
HadISST



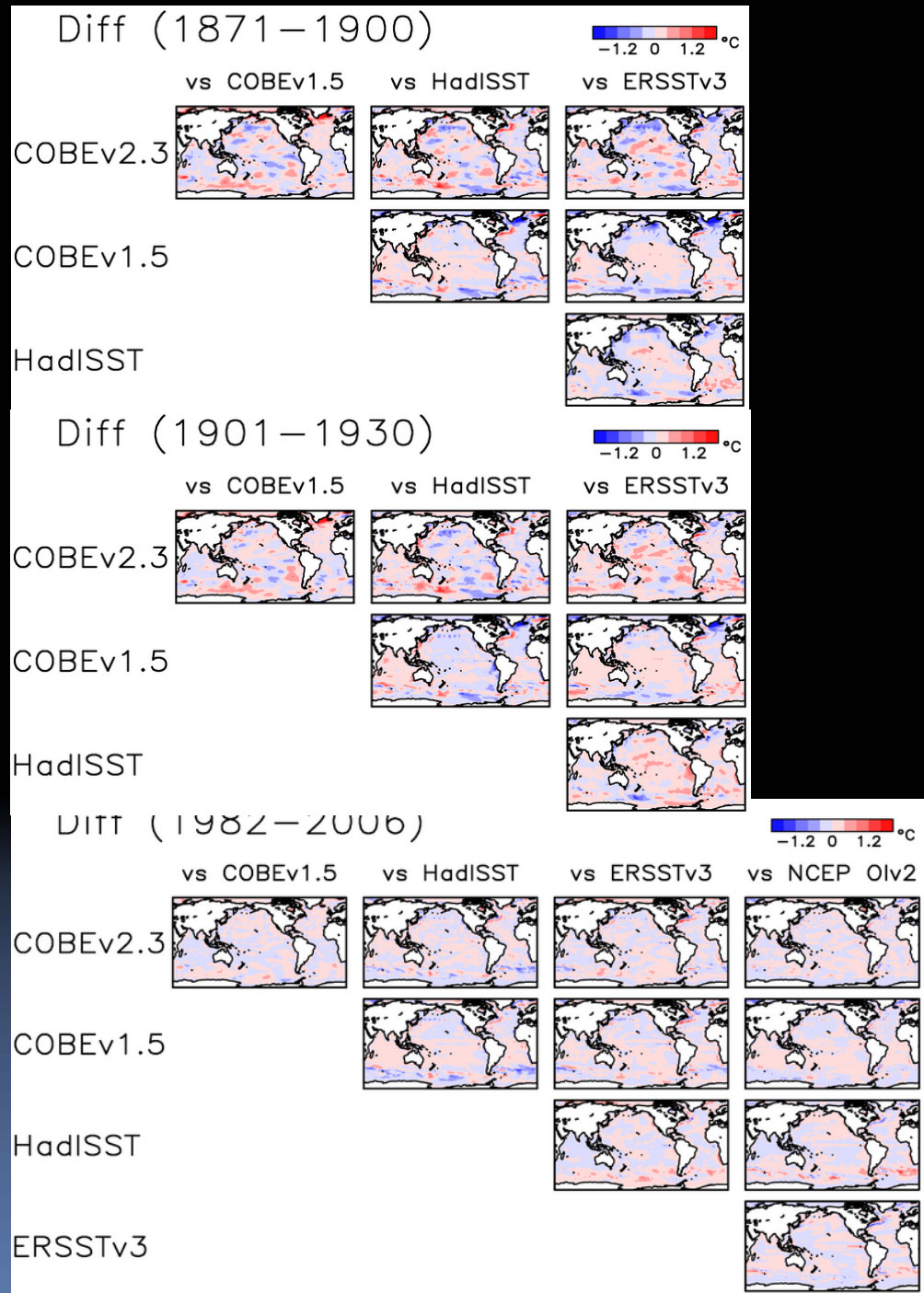
ERSSTv3



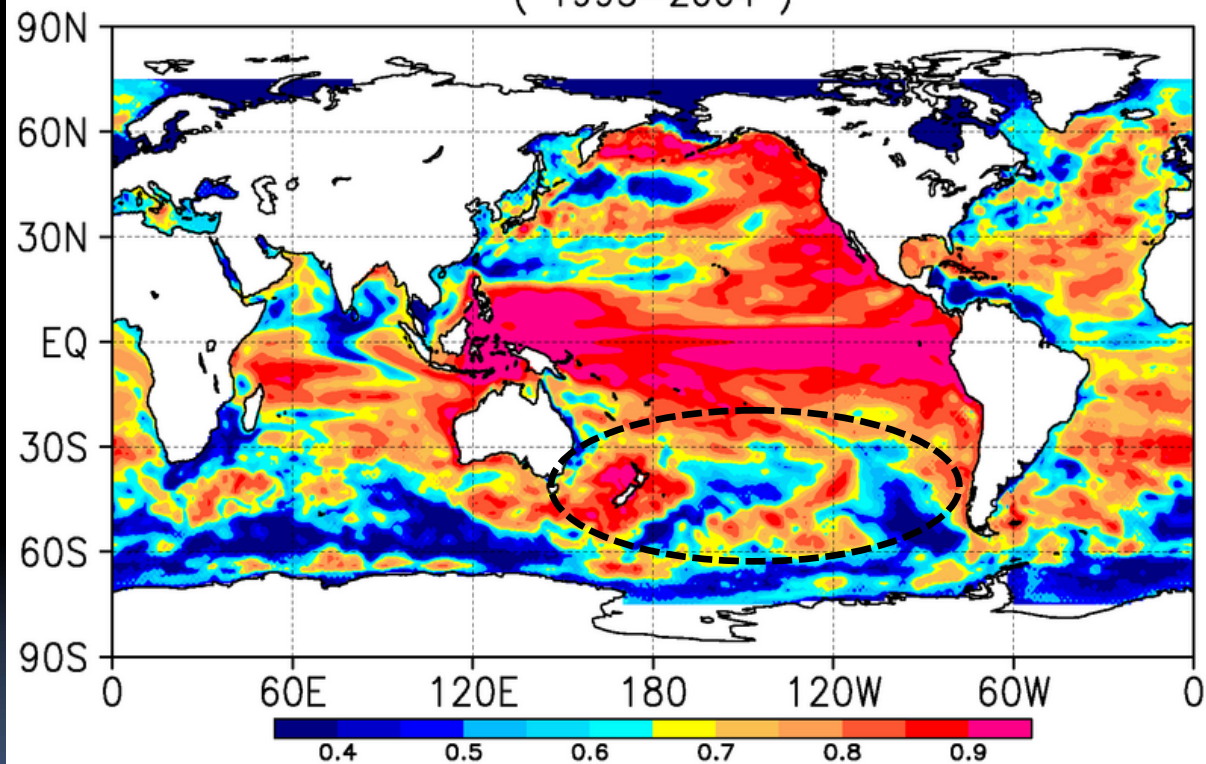
Anomaly Correlation



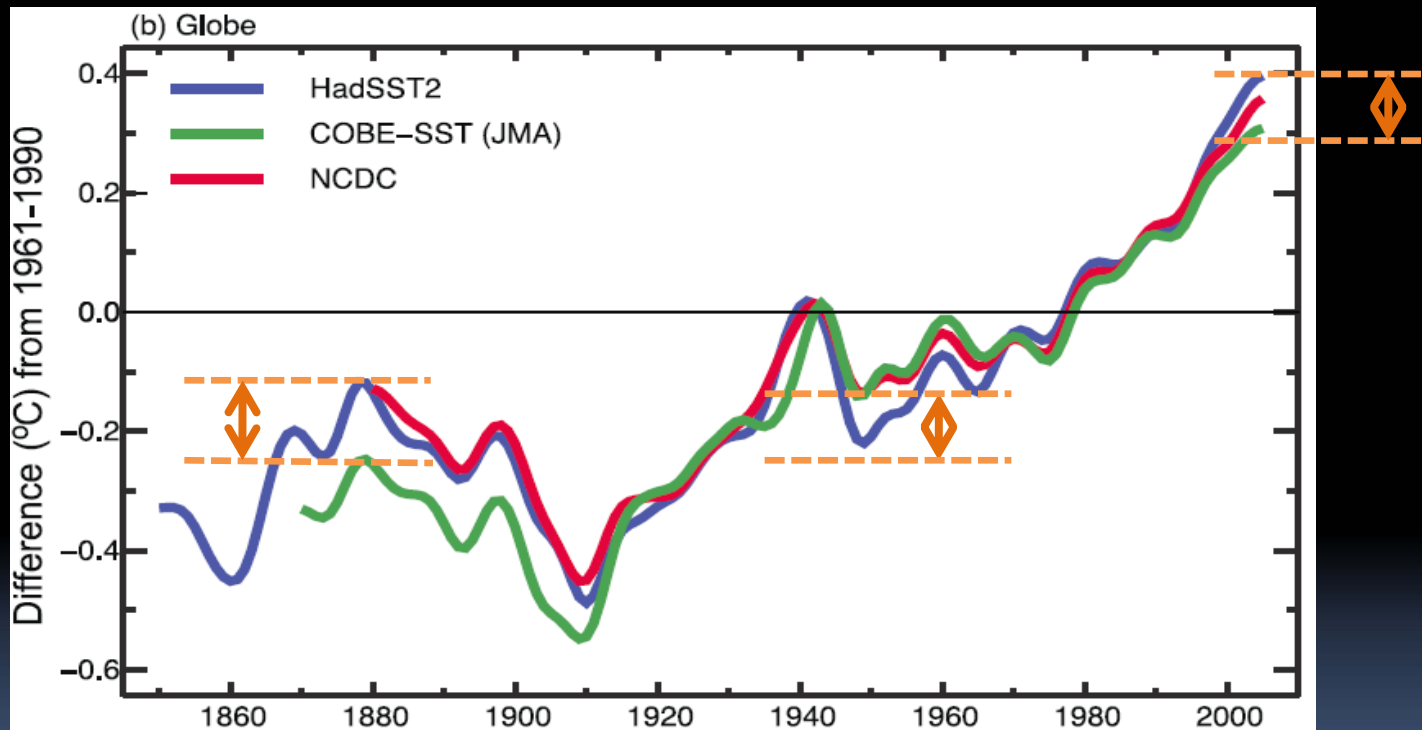
Mean Difference



1-Month Autocorrelation of Assimilated Sea Surface Heights
(1993–2004)

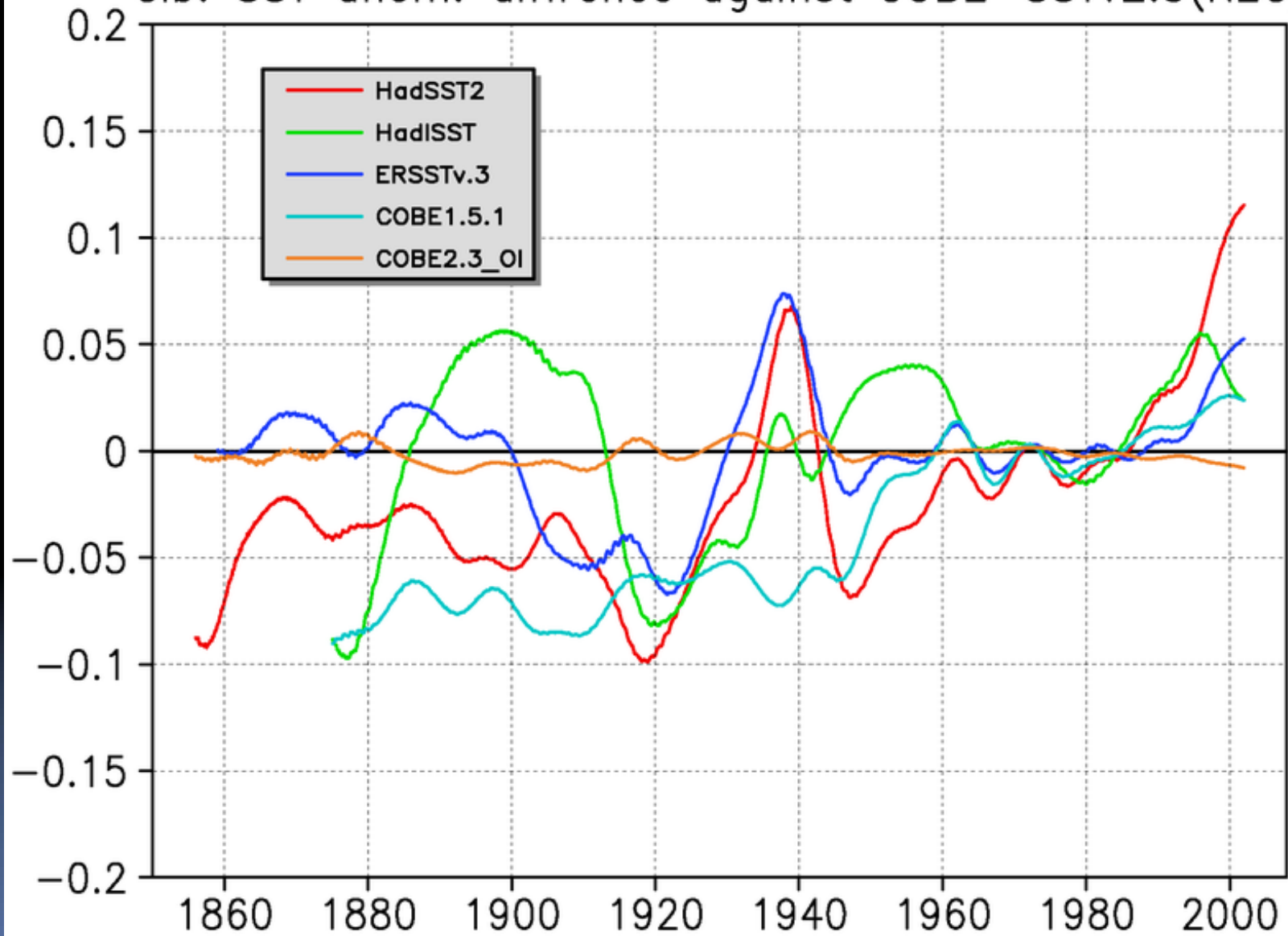


IPCC AR4



IPCC AR4 WG-1 (2007) Fig.3.4

Glb. SST anom. difference against COBE-SSTv2.3(REC)



Analysis Flowchart

Step 1:

Pseudo SST
derived from Sea Ice

In-Situ SST

Bias Adjusted Satellite SST

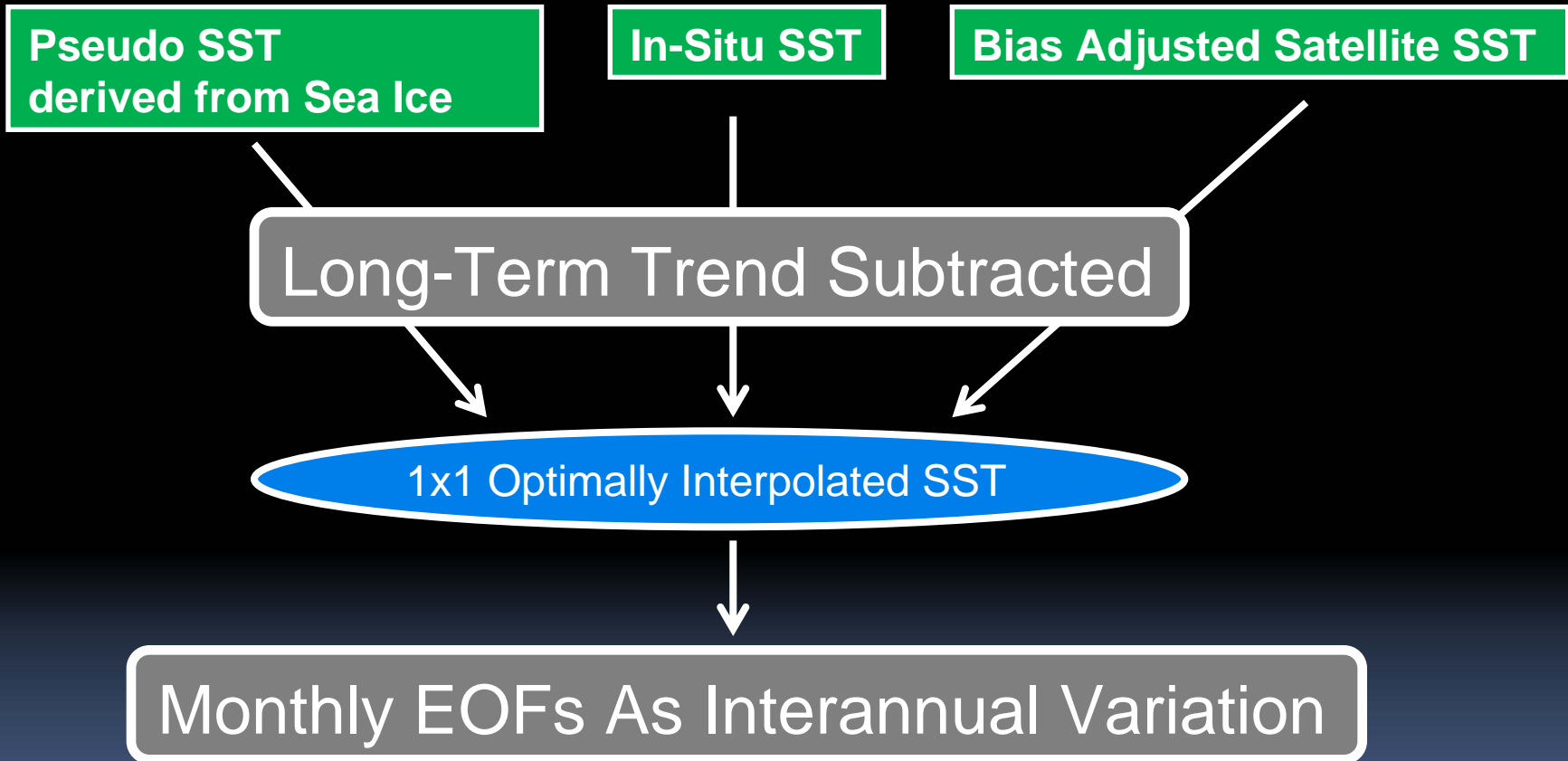
5x5 Monthly Box-Averaged SST

EOF1 As a Long-Term Trend Component

From 1850 onwards

Analysis Flowchart

Step 2:



At Recent decades

Only spatial patterns are utilized for following procedures

Analysis Flowchart Final Step:

Pseudo SST
derived from Sea Ice

In-Situ SST

Bias Adjusted Satellite SST

Long-Term Trend : Subtracted

EOFs Fitted and Subtracted

Optimally Interpolated Day-To-Day variation

Final Product

From 1850 onwards