

# Impact of systematic errors in hydrographic data on estimates of ocean warming

***Viktor Gouretski***

**Alfred-Wegener-Institut**

New Technologies Division  
Marine Observing Systems  
Bremerhaven, Germany



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# Main Questions:

- How large are systematic temperature errors?
- What is their origin?
- Can we correct the data properly?
- What effect could these errors have on the calculations of the global temperature/heat content anomaly?

# Studies of systematic errors in Hydrographic data

- *Wyrтки (1971)*
  - nutrient data
- *Gordon & Molinelli (1982)*
  - salinity, oxygen, nut's
- *A.Mantyla (1980,1987,1994)*
  - salinity
- *Aoyama et al. (1998)*
  - offsets in IAPSO standard water
- *Johnson, Robbins&Hufford (2001)*
  - salinity, oxygen, nuts's (WOCE Pacific dataset)
- *Gouretski&Jancke (2001)*
  - salinity,oxygen,nut's (global WOCE & historical data)

# Cruise property biases (from Gouretski&Koltermann, 2004)

V.V. Gouretski, K. Jancke / Progress in Oceanography 48 (2001) 337-402

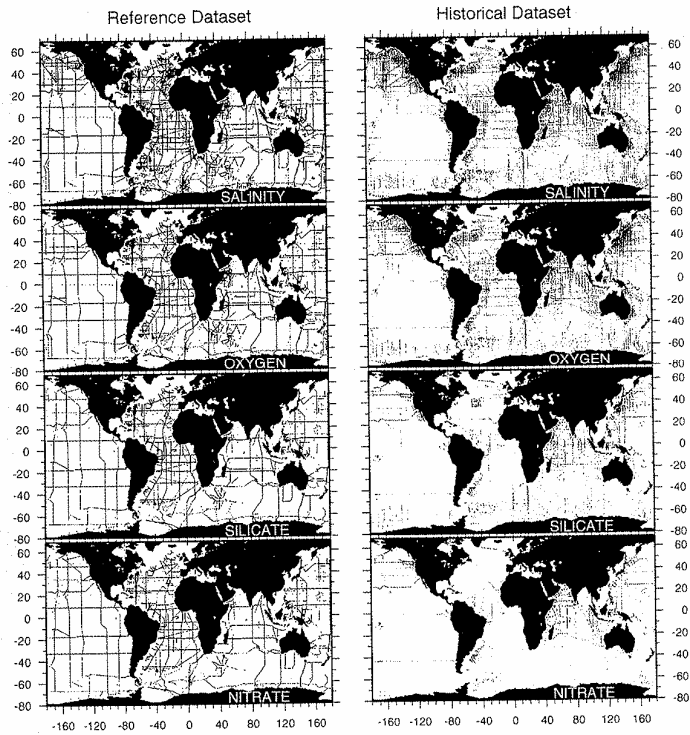


Fig. 2. Station distribution for the reference and historical datasets. WOCE cruises are shown in red.

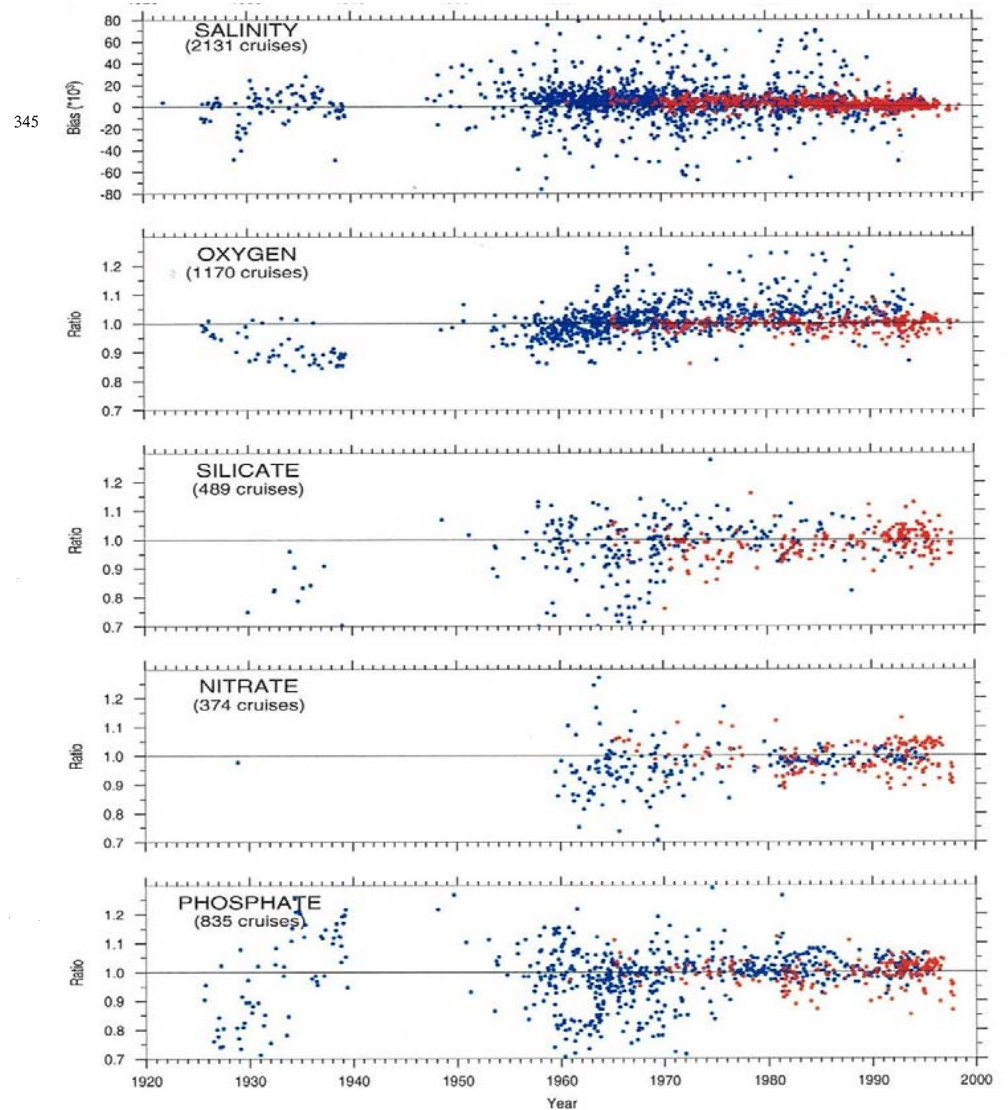
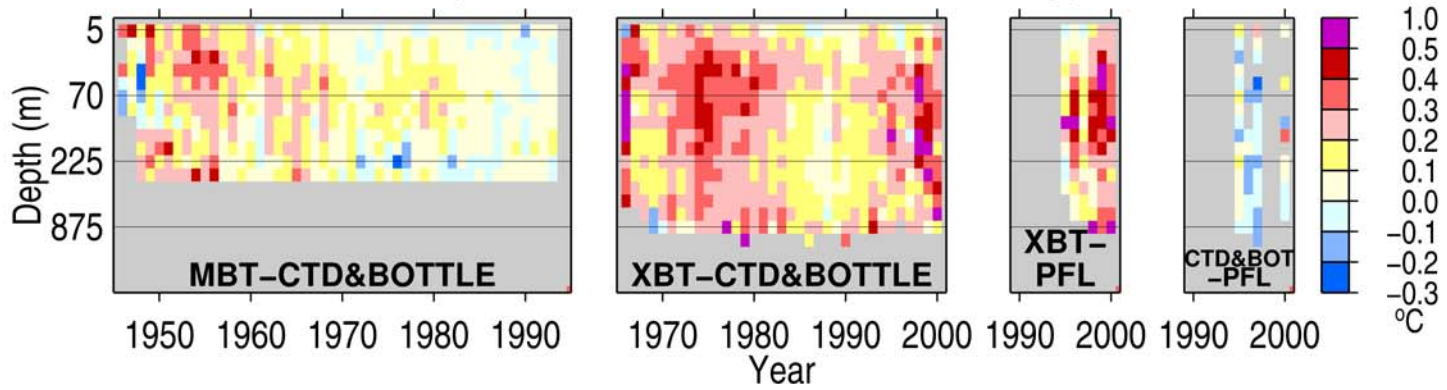


Fig. 11 Cruise biases versus time (red – reference cruises, blue – historical cruises).

### Temperature Offsets between Data Types



(Gouretski & Koltermann, 2007)

# Oceanographic instruments to measure temperature

**Nansen Bottles with reversing thermometers**



**Mechanical Bathithermograph**



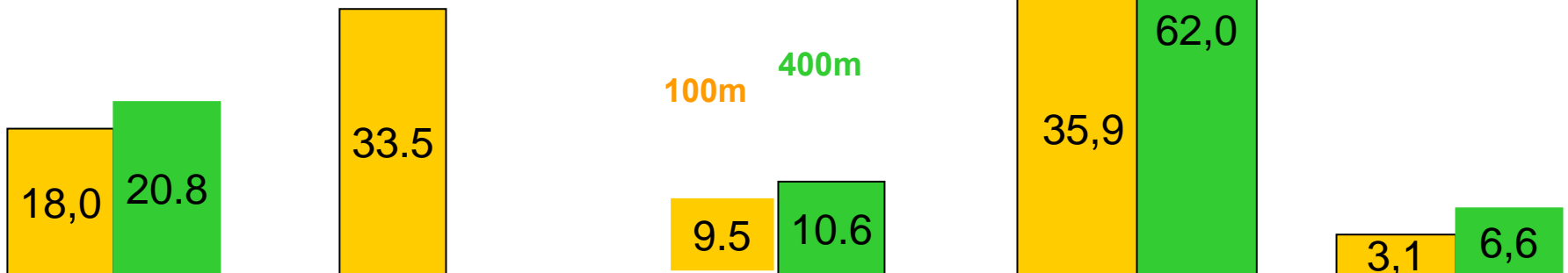
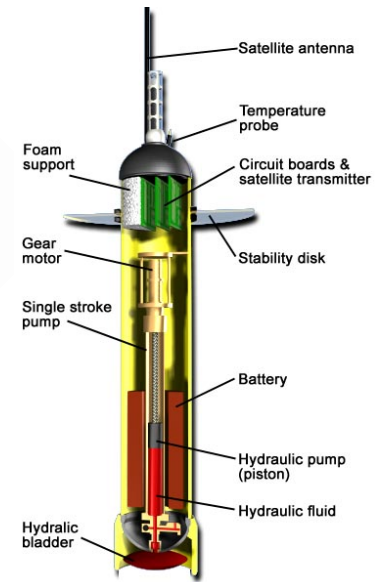
**CTD**



**XBT**

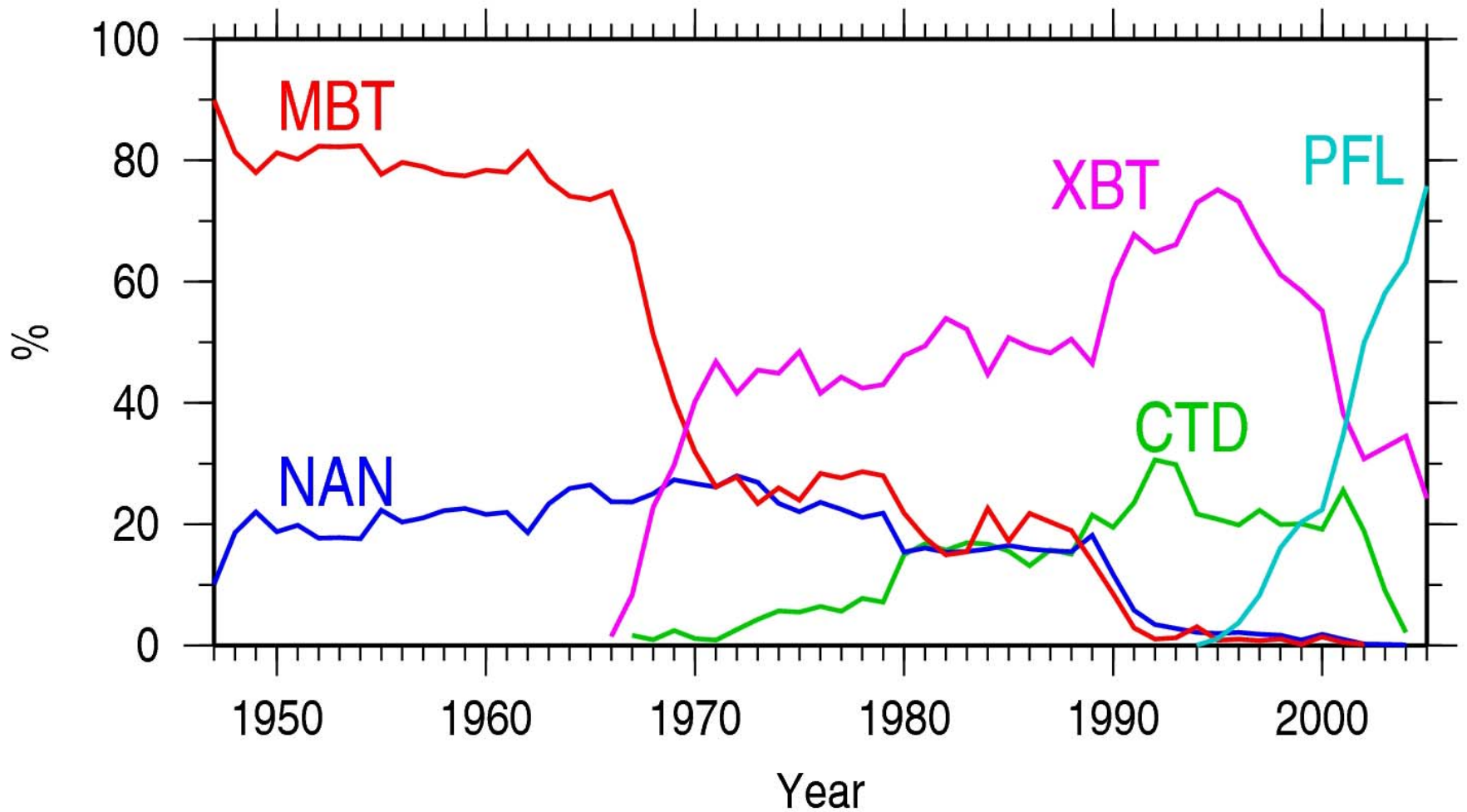


**Profiling float**

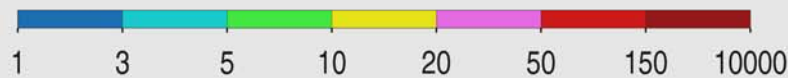
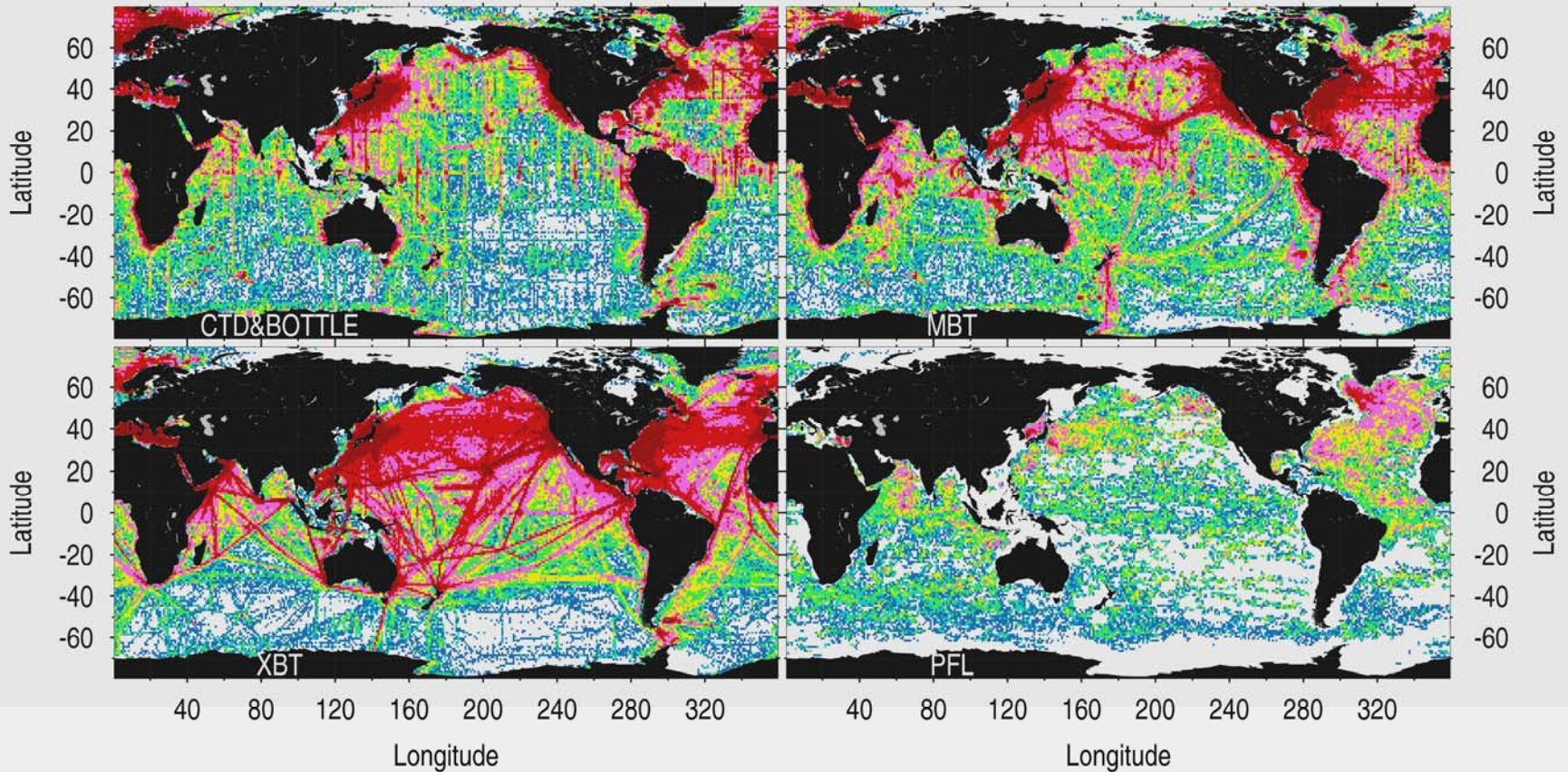


Time period: 1947 - 2006

# Datatype percentage at 100 meter depth



# Total Number of T-Profiles in 1x1-degree squares for different datatypes



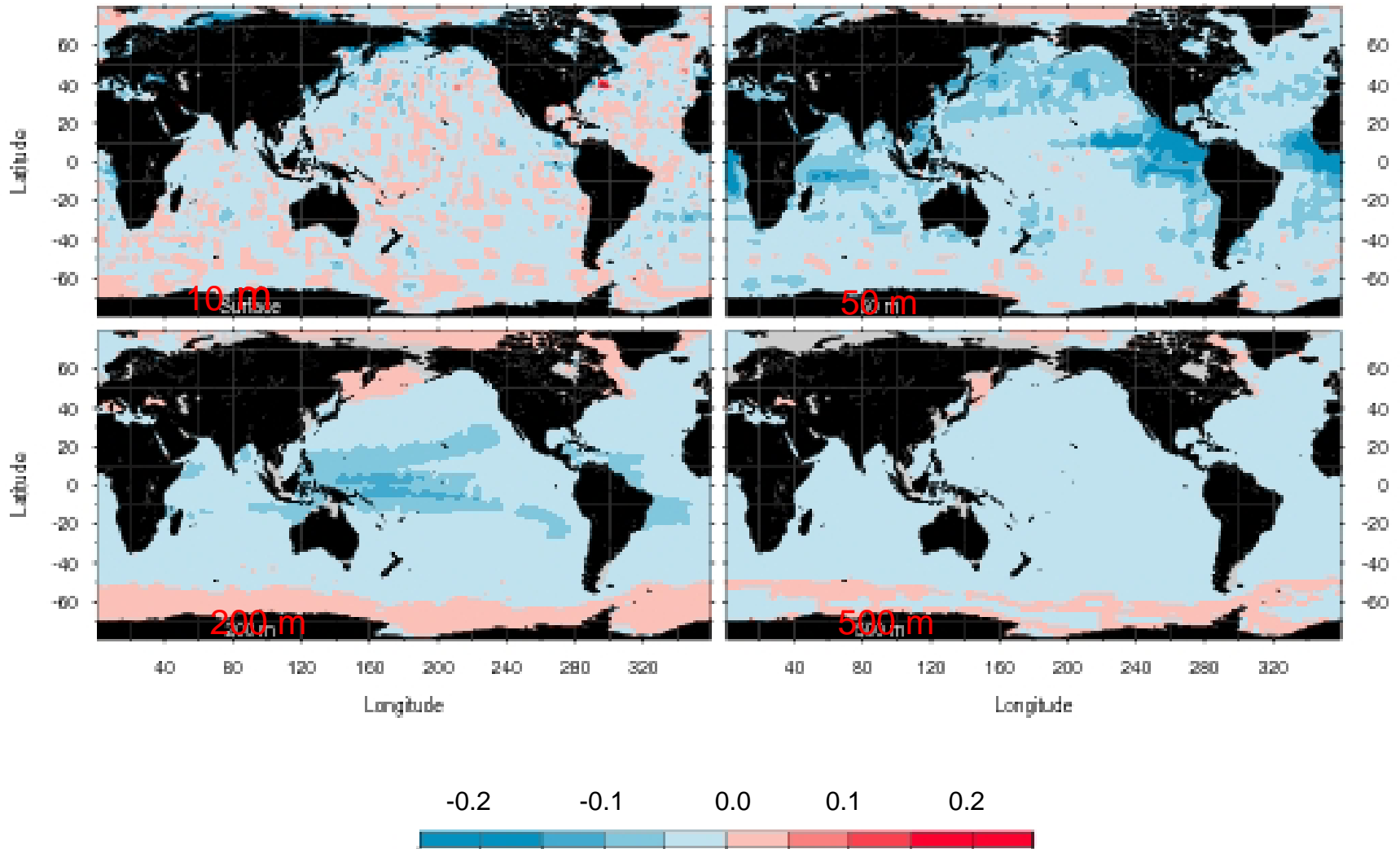


# Origin of Systematic Temperature Errors:

- Pure temperature error
- Sample depth error: translates into T-error if  $|dT/Dz| > 0$

(In case of XBT casts: difficult to identify the two error types as pressure/depth is not measured)

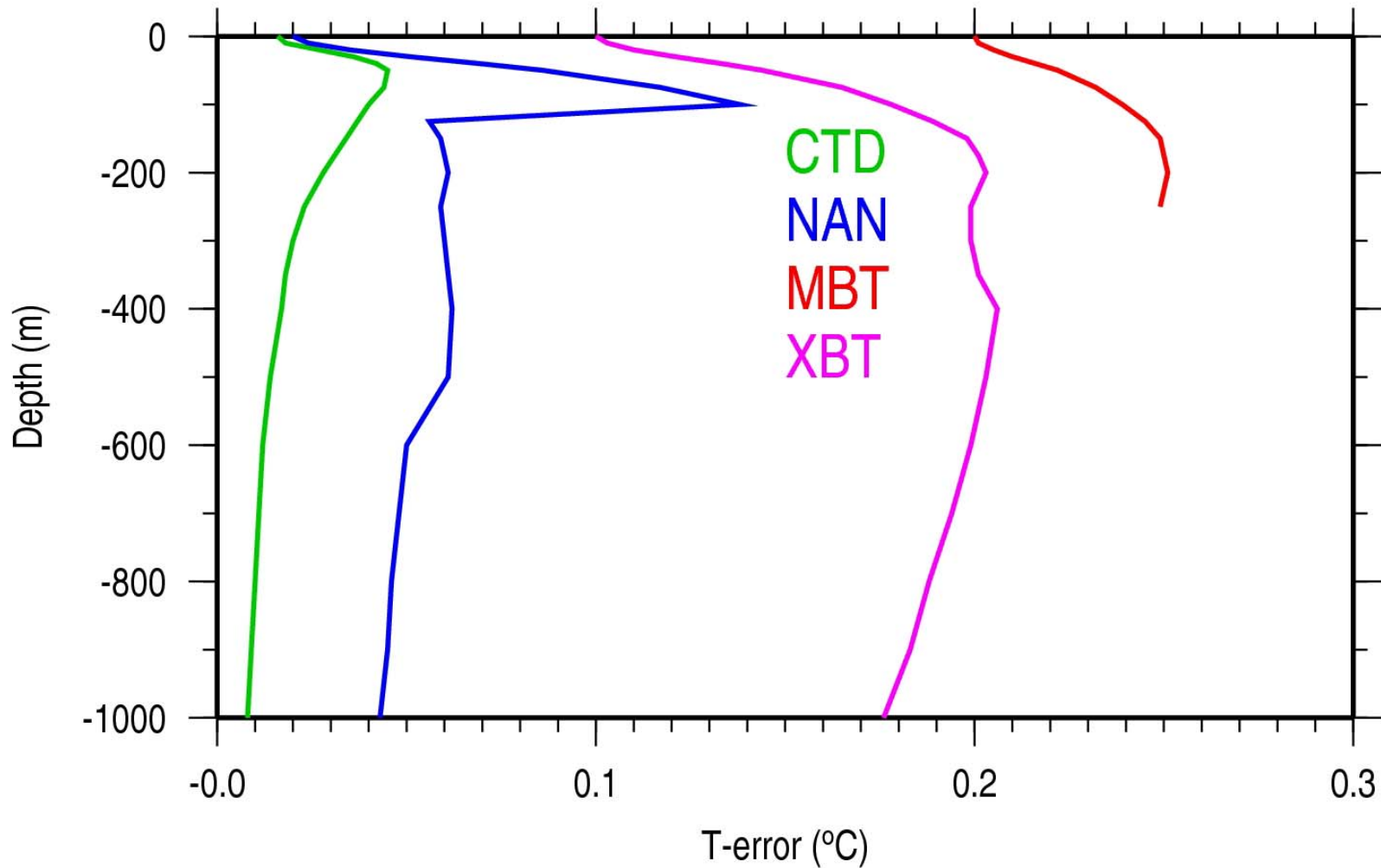
# Vertical Temperature Gradient [ $^{\circ}\text{C} \cdot \text{m}^{-1}$ ] at depths (annual WGHC Climatology)



## Depth ranges and measurement precisions of main oceanographic instruments

|                              | CTD       | Nansen<br>Bottles                                       | MBT   | XBT            | PFL   |
|------------------------------|-----------|---|-------|----------------|-------|
| Precision of Temperature, °C | 0.005     | 0.02  | 0.2   | 0.1            | 0.005 |
| Precision of depth, meters   | 0.015% FS | $\leq 3\% Z$<br>(Z<200m)<br>$\leq 1,0\% Z$<br>(Z>1000m) | 1% FS | $0.02 \cdot Z$ | <2.4  |

# Estimates of the total temperature error based on instrument precision specifications and the mean vertical temperature gradient



# Calculation of T-biases:

## 1) Building super-observations:

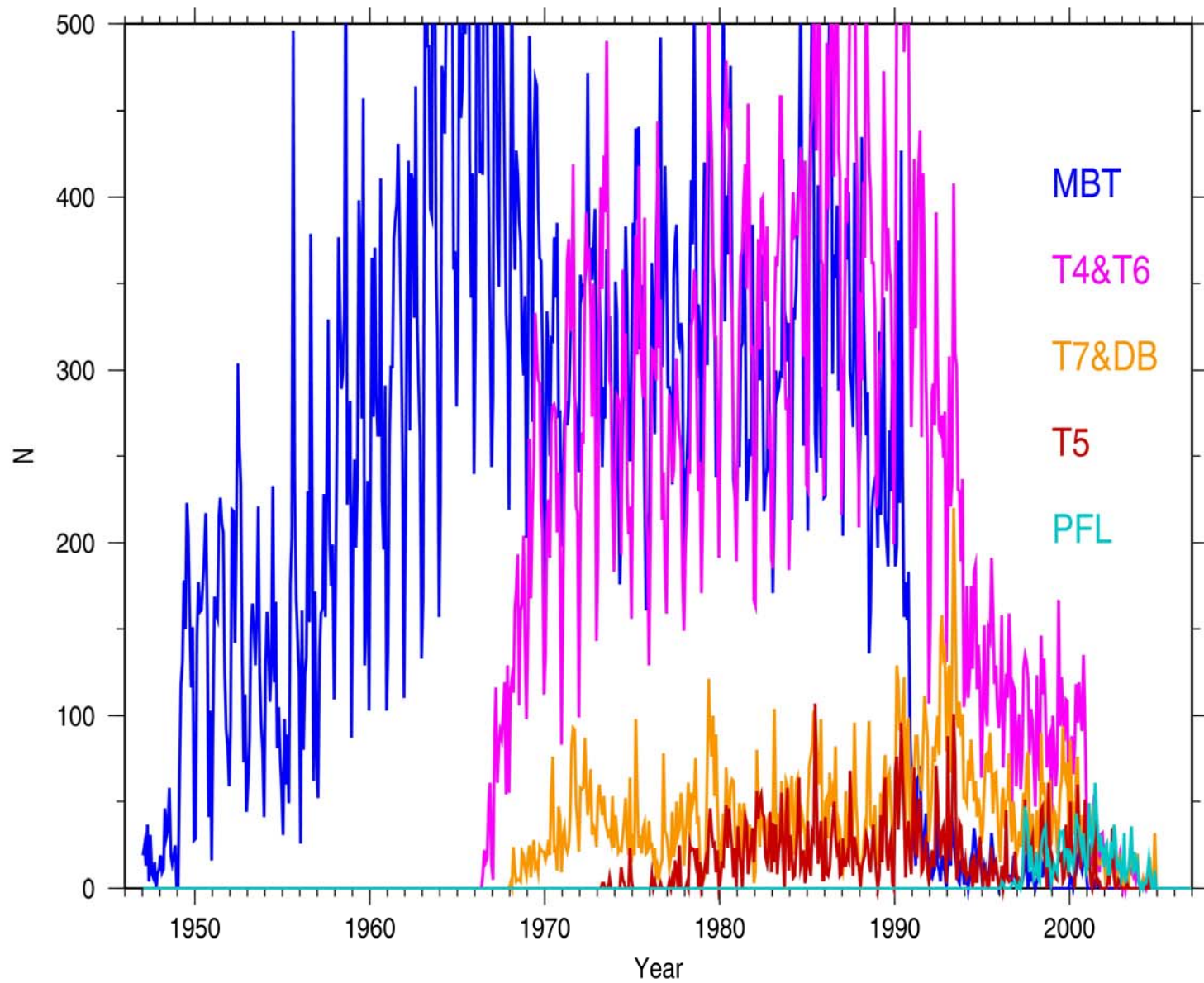
- Time binning: monthly
- Spatial binning: 111x111km
- Binned temperature for each instrument type separately between 1947 and 2006

## 2) Comparing data-type mean temperatures with CTD/Bottle temperatures in collocated boxes:

Box-averaged bias:  $B = \langle T_{\text{DataType}} \rangle - \langle T_{\text{BOT/CTD}} \rangle$

- Area-averaged box-values are used to produce bias time-series at each level

Number of overlapping boxes (Datatype/CTD&BOTTLE)



## XBTs: main T-data source since 1967

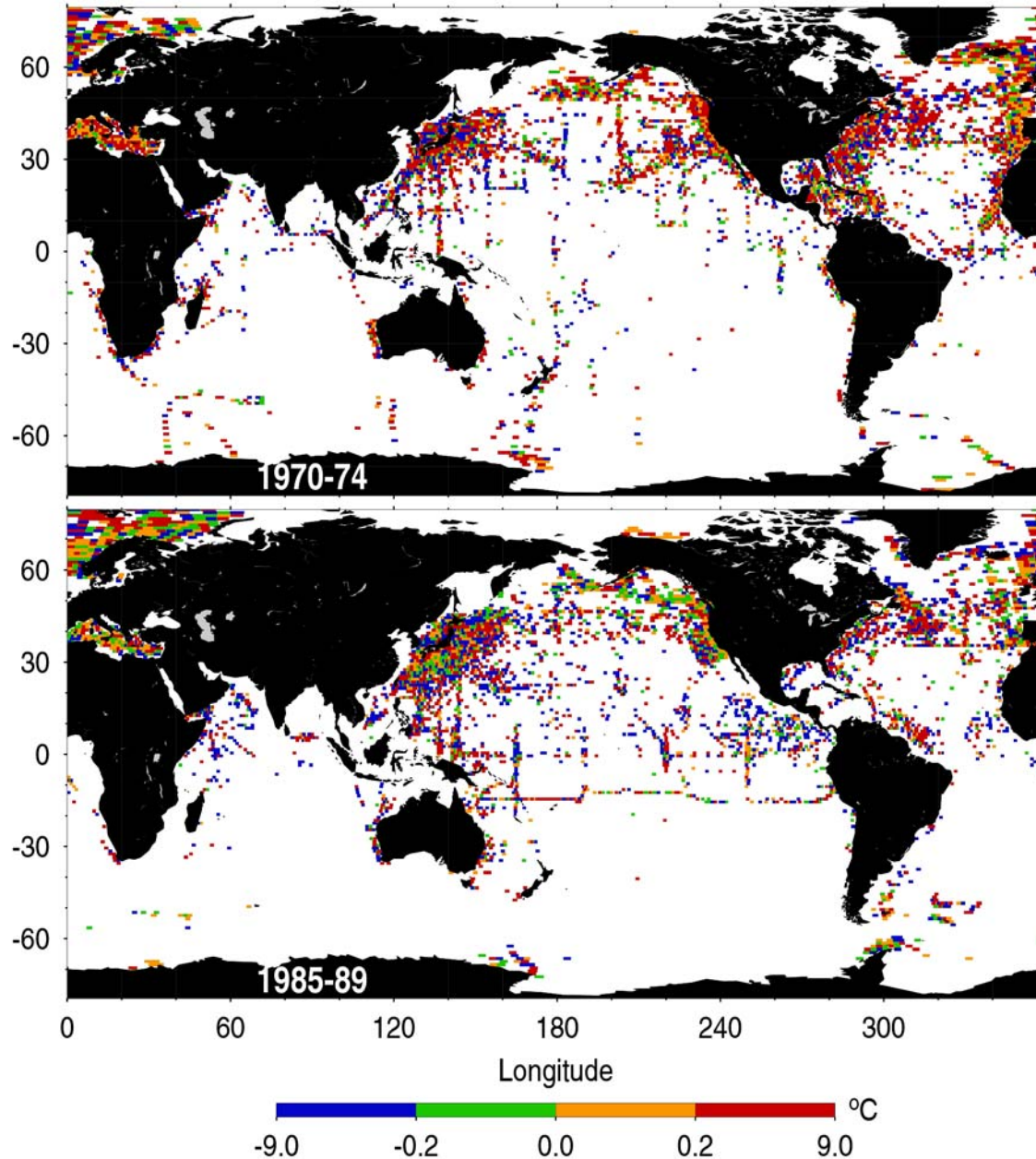
| Type      | Max Depth | Rated ship speed | Application            |
|-----------|-----------|------------------|------------------------|
| T-4       | 460       | 30               | Standard NAVY          |
| T-6       | 460       | 15               | Standard oceanographic |
| T-7       | 760       | 15               | NAVY & Oceanographic   |
| Deep Blue | 760       | 20               | NAVY & Oceanographic   |
| T-5       | 1830      | 6                | NAVY & Oceanographic   |

**T4&T6: 71.6%**

**T7&DB 19.6%**

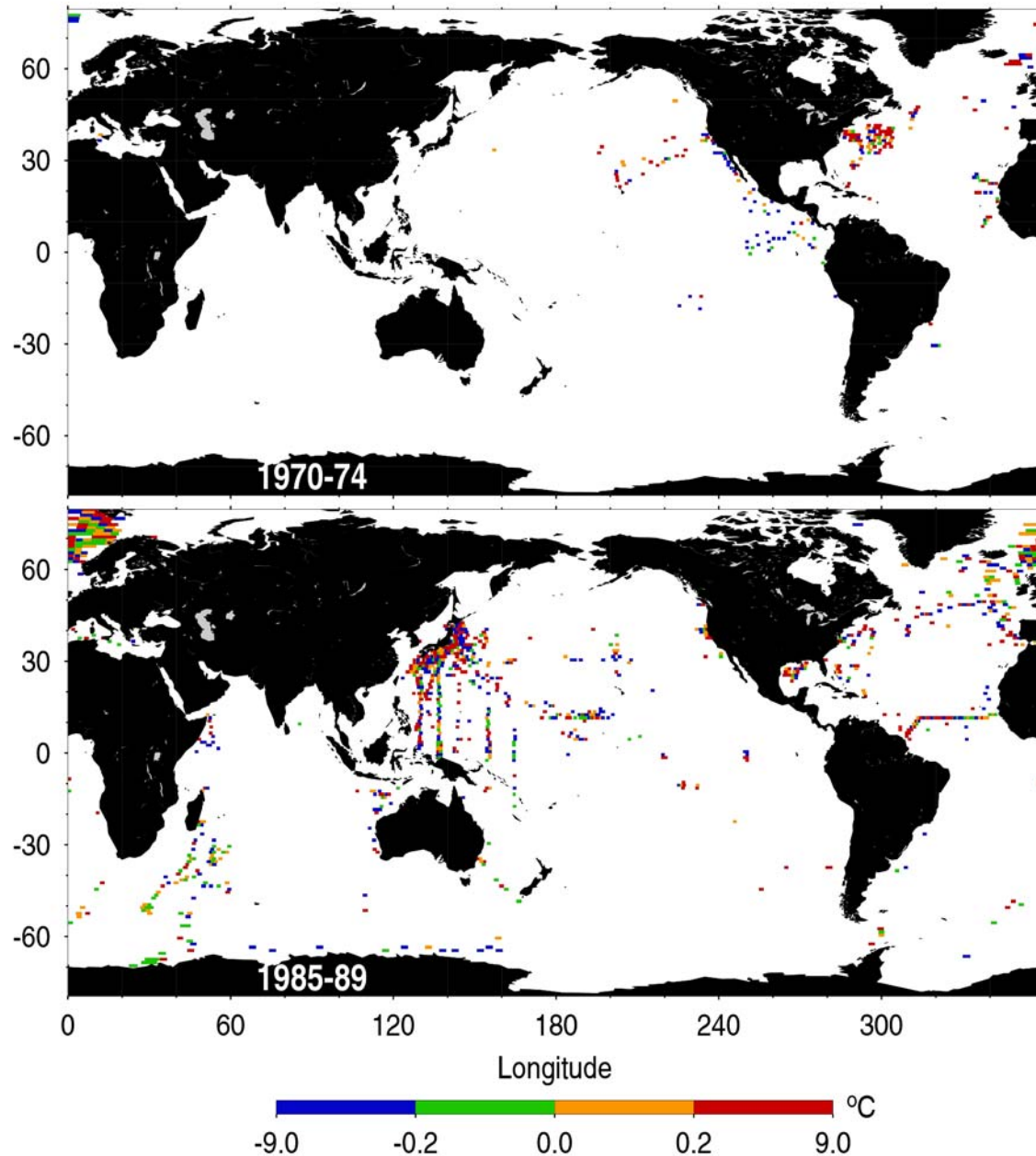
**T5: 8.8%**

# Temperature offset for T-4 & T-6 (100 m level)

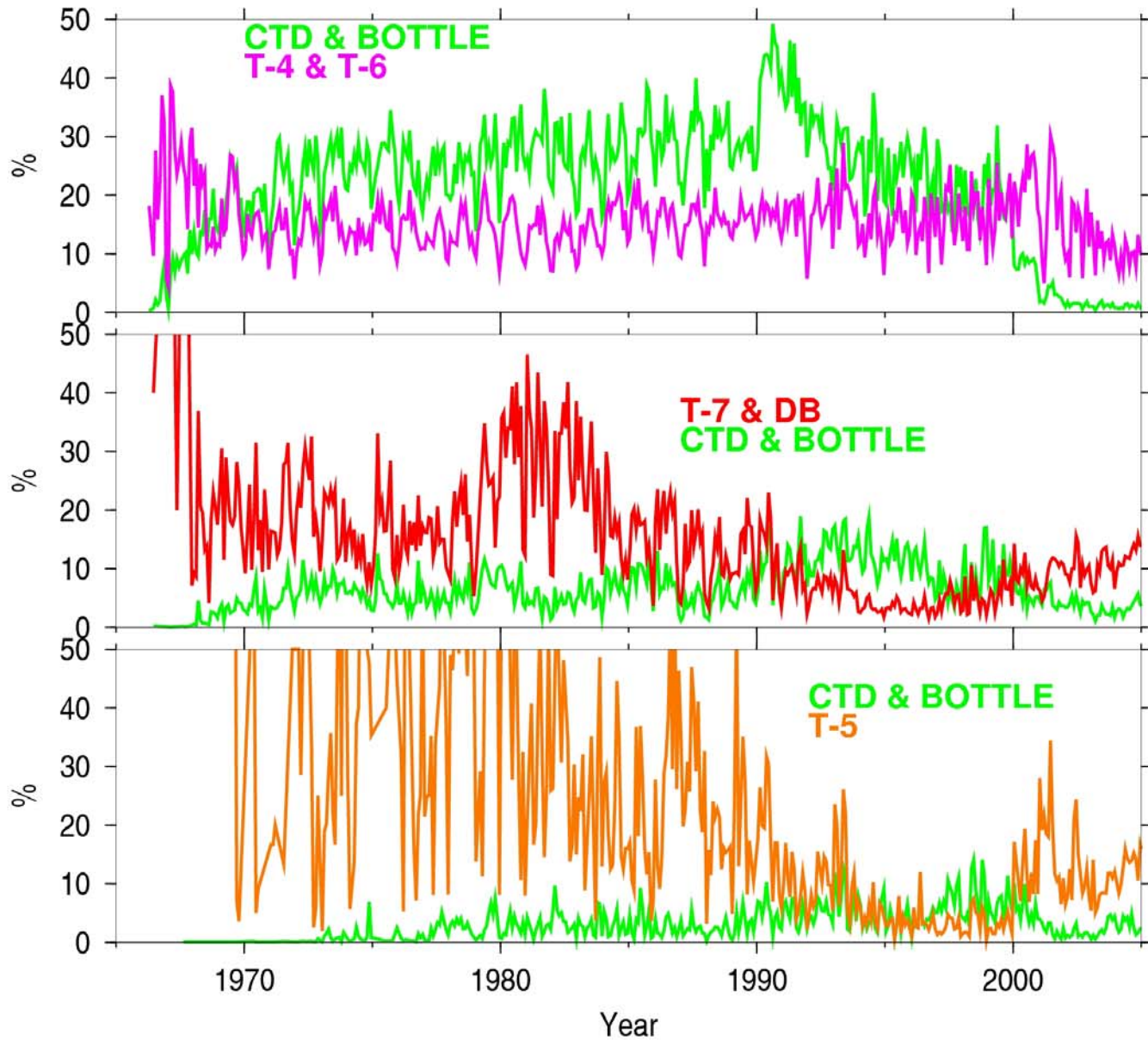




# Temperature offset for T5 (100 m level)



### Percentage of overlapping 111x111km boxes (at 100 m level)



# XBT Fall-rate Equation

$$Z_{\text{xbt}} = at - bt^2$$

(  $t$  is time (in sec) elapsed from the probe entry into the water)

For XBT-types T-4/T-6/T-7

$a=6.472$

$b=0.00216$

Sippican Ocean Systems (manufacturer)

$a=6.691$

$b=0.00225$

New recommended coefficients  
(Hanawa et al., 1994, 1995)

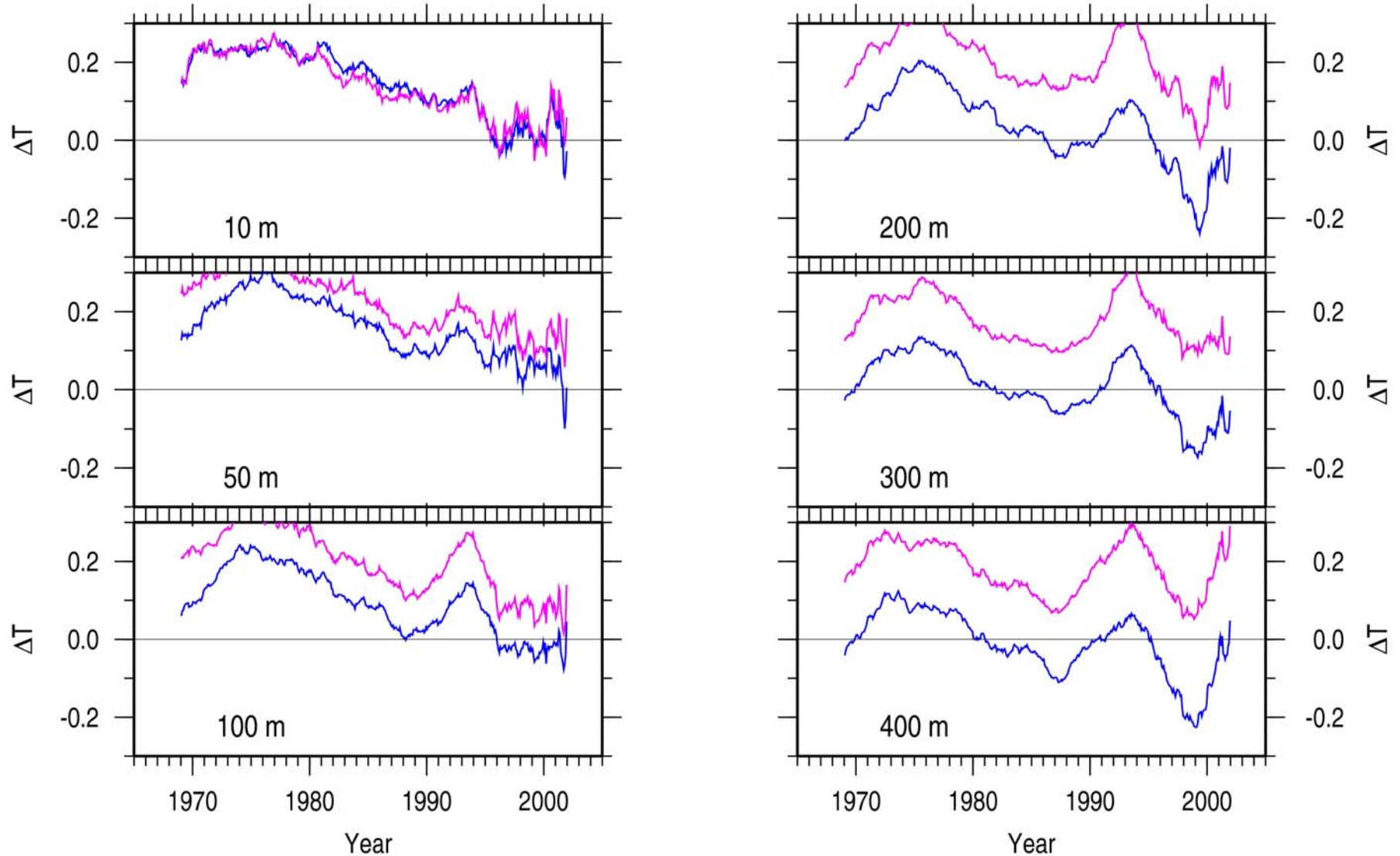
XBT's fall rate is **underestimated** by the manufacturer!

Hanawa et al. (1994) linear depth correction factor :

$$Z_{\text{true}} = 1.0336 * Z_{\text{XBT}}$$

# T-biases for T4 & T6

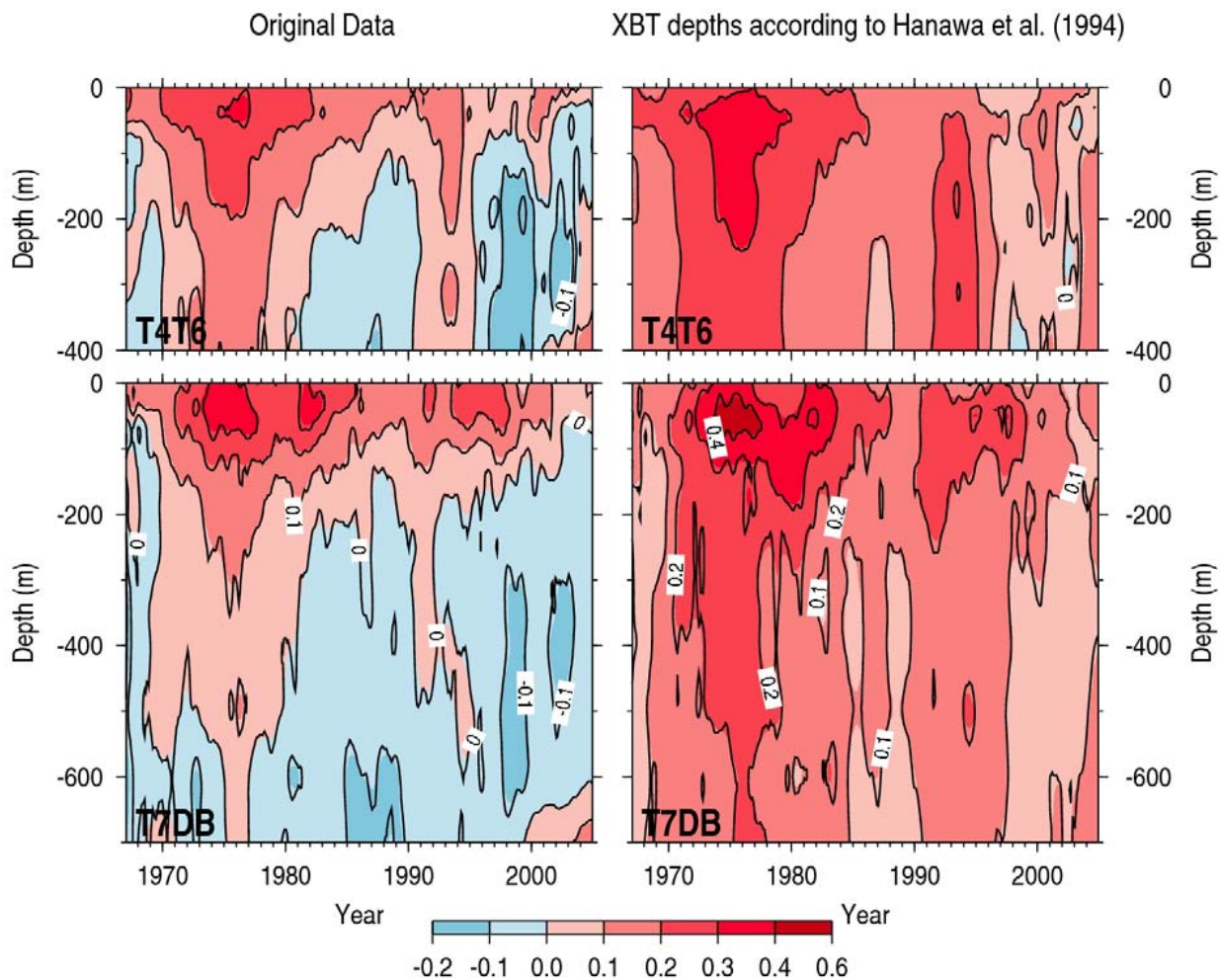
BLUE - original data    MAGENTA - corrected data (Hanawa et al. (1994) fall-rate corrections)



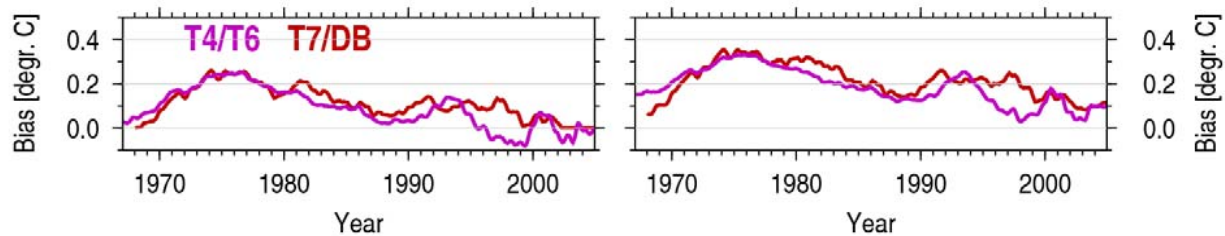
**Table 1. XBT temperature biases from XBT/CTD inter-comparison experiments (from Gouretski&Koltermann, 2007)**

| <b>Author</b>             | <b>Time of data acquisition</b> | <b>Temperature Offset, °C</b>                                   |
|---------------------------|---------------------------------|---|
| Wood, 1976                | ?                               | Positive offset   |
| Heinmiller et al., 1983   | 1973-79                         | <b>0.13-0.19</b>  |
| Bailey et. al., 1989      | Historical archive              | Positive T-drift with depth                                     |
| Wright and Szabados, 1989 | ?                               | <b>0.11-0.24</b>  |
| Boyd and Linzell, 1991    | 1991                            | <b>0.07</b>   |
| Hallock and Teague, 1992  | 1990                            | <b>0.1</b>  |
| Schmeiser, 2000           | 2000                            | <b>0.15</b>   |
| Roth, 2001                | 2001                            | <b>0.08</b>   |
| Boedeker, 2001            | 2001                            | <b>0.09</b>   |
| Fang, 2002                | 2002                            | <b>0.025-0.107</b>  |
| Kizu and Hanawa, 2002     | 1985-2001                       | <b>up to 1</b>  |
| Dixon, 2003               | 2003                            | <b>0.13</b>   |
| Laird, 2006               | 2006                            | <b>0.04</b>   |
| Reseghetti et al., 2006   | 2004                            | <b>O(0.05)</b> below 400 m<br><b>0.2-2.8</b> in the thermocline |

# Temperature biases for T4/T7 and T7/DB XBT types



## Depth-averaged T-bias



Hanawa et al. (1994) depth corrections do not eliminate the total **warm** temperature bias:

The corrected XBT data are „getting warmer“

What is wrong?

## Bias decomposition (for box-averaged values) :

$$\langle \mathbf{b}(\mathbf{z}) \rangle = \langle \Delta \rangle + \langle \gamma(\mathbf{z}) \rangle \cdot \zeta(\mathbf{z}) + \varepsilon ,$$

where

$$\langle \Delta \rangle$$

(pure) temperature bias,  
depth independent

$$\zeta(\mathbf{z}) = Z_{\text{XBT}} - Z_{\text{TRUE}}$$

sample depth bias,  
depth dependent

$$\gamma(\mathbf{z})$$

vertical temperature gradient

Spatial averaging {...} over N boxes gives

$$\{\langle \mathbf{b} \rangle\} \approx \{\langle \Delta \rangle\} + \{\langle \gamma(\mathbf{z}) \rangle\} \cdot \zeta(\mathbf{z})$$



Since the depth-error at the surface is zero ( $\zeta = 0$  for  $z=0$ ),

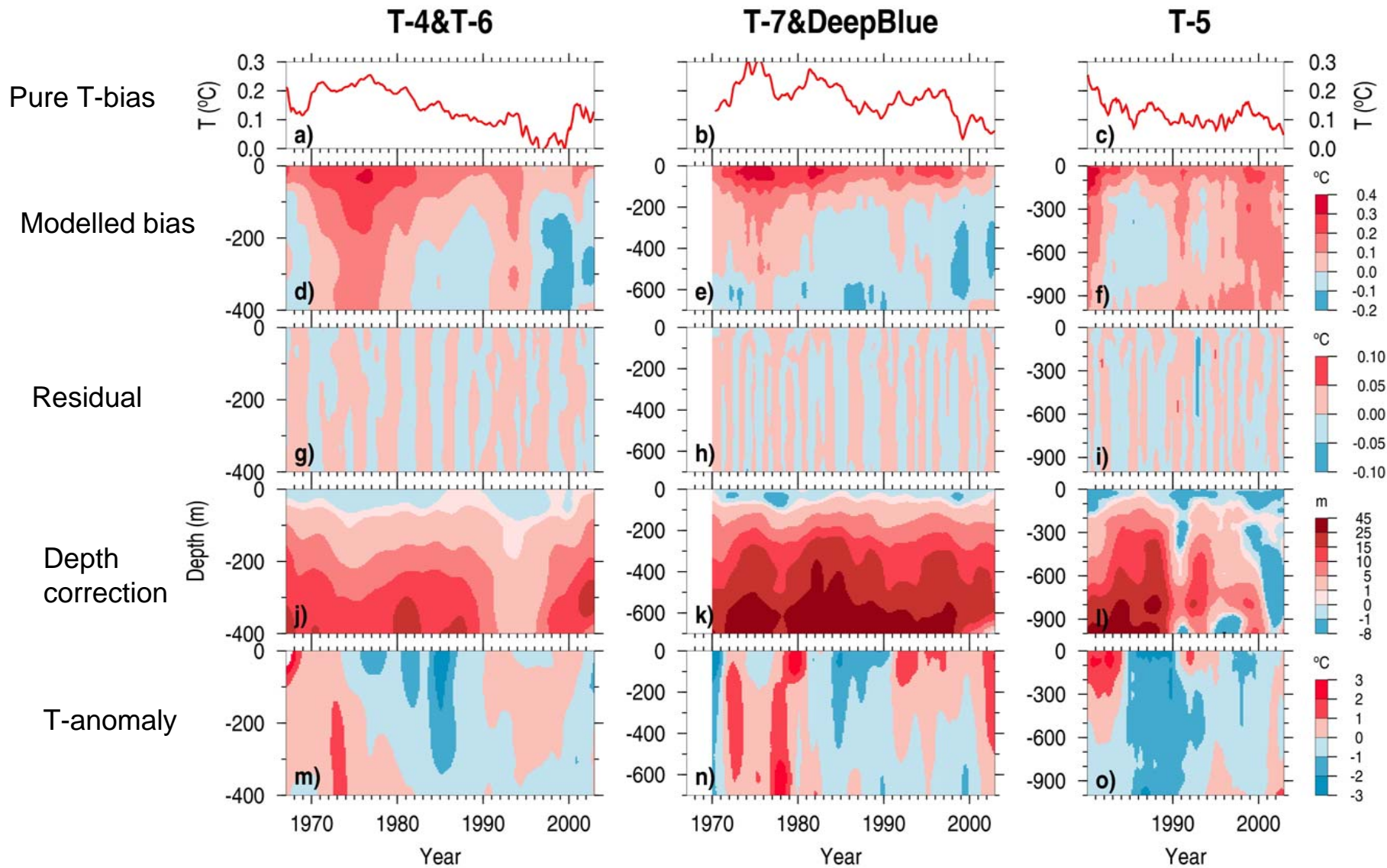
the depth-independent T-bias is:  $\{\langle \Delta \rangle\} = \{\langle b(0) \rangle\}$

**Depth correction** at an arbitrary level Z is given by

$$\zeta(z) \approx \frac{\{\langle b(z) \rangle\} - \{\langle b(0) \rangle\}}{\{\langle \gamma(z) \rangle\}}$$

Corrections  $\zeta$  can be compared with *independent* in-situ XBT vs CTD inter-comparisons

# Application of the bias model to different XBT types

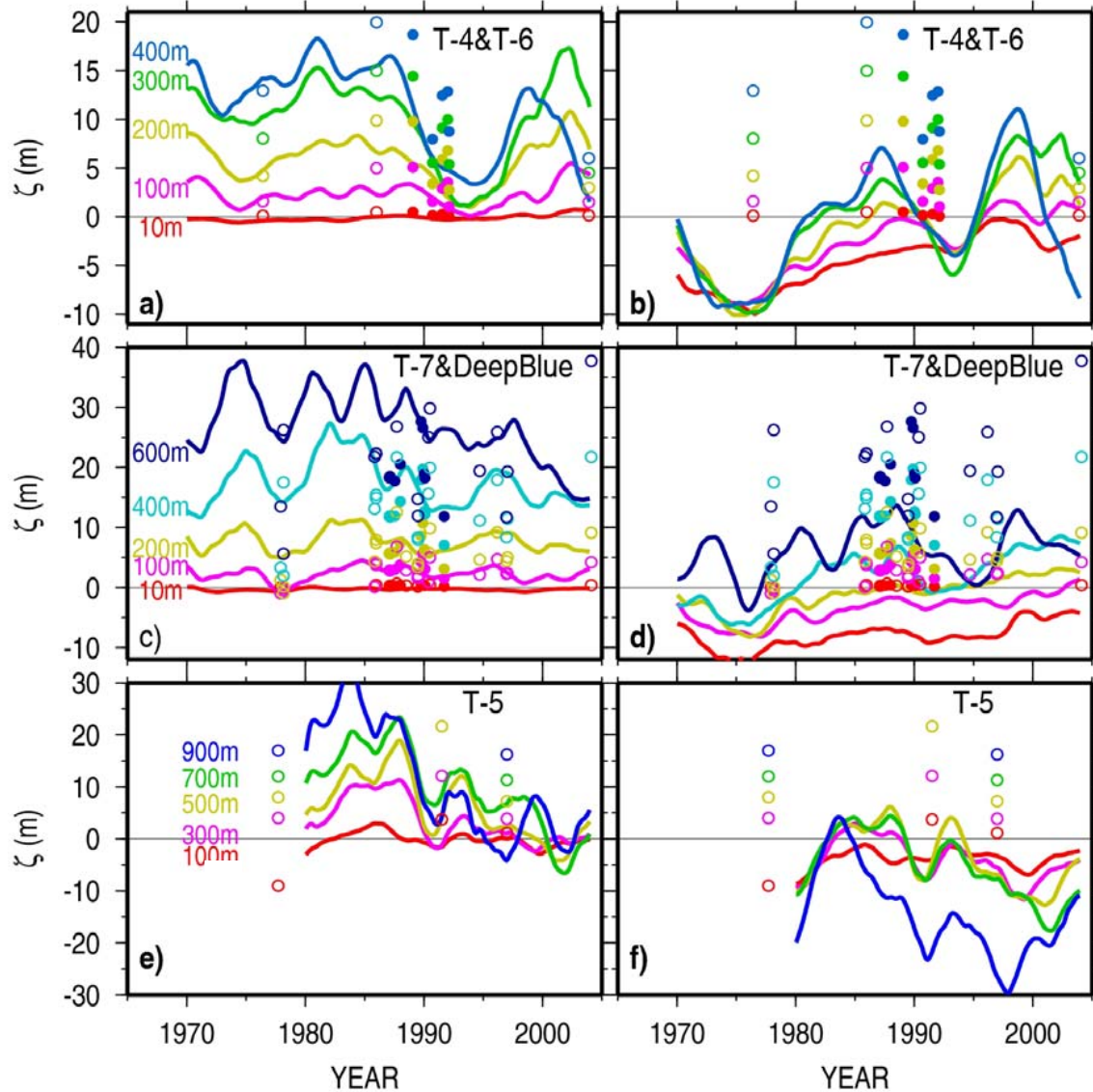


# Comparison of XBT depth corrections ( $\zeta$ ) with independent experiments (circles)

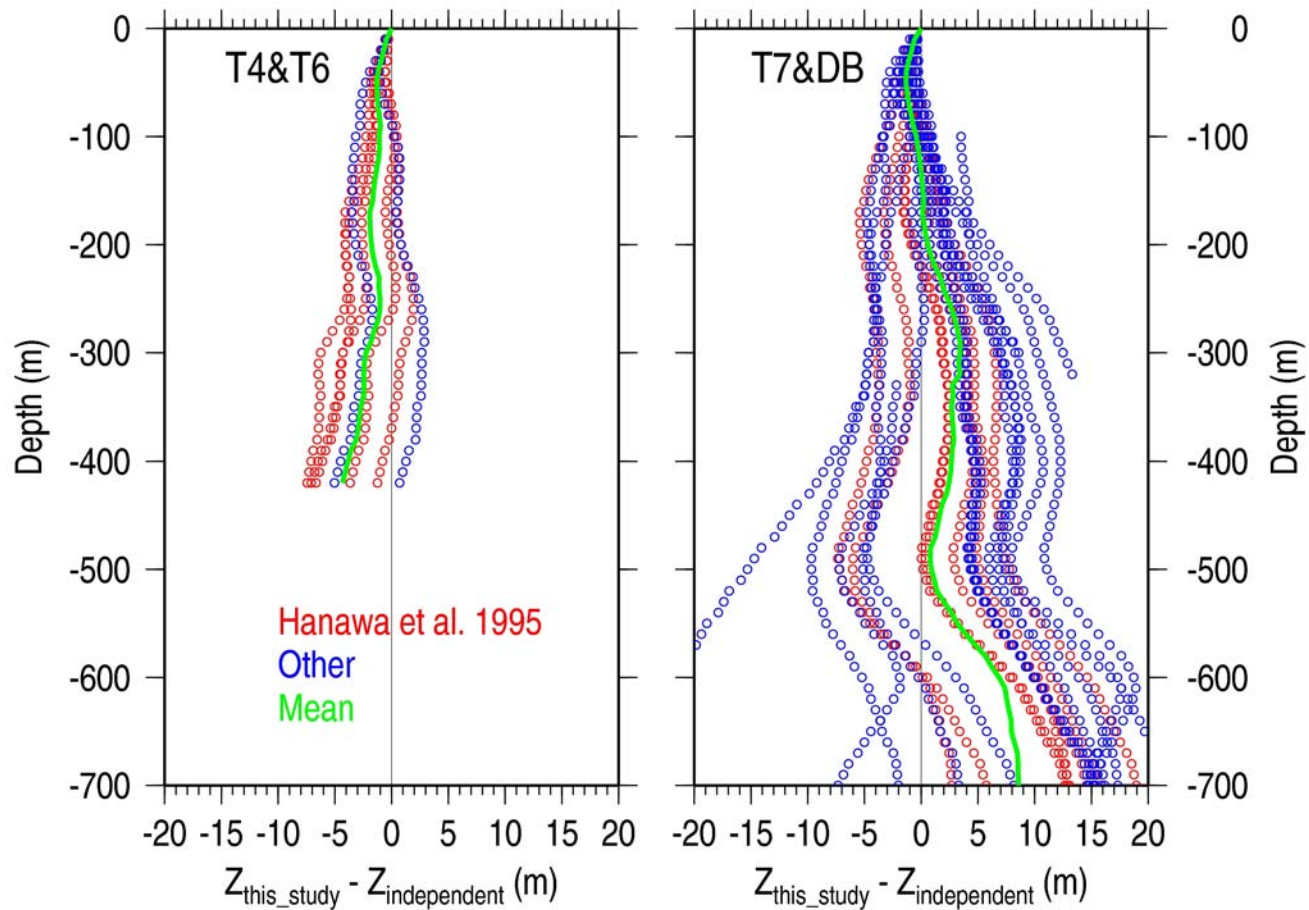
**Bias Model =>**

$$b(z) = \Delta + \gamma(z) \cdot \zeta(z)$$

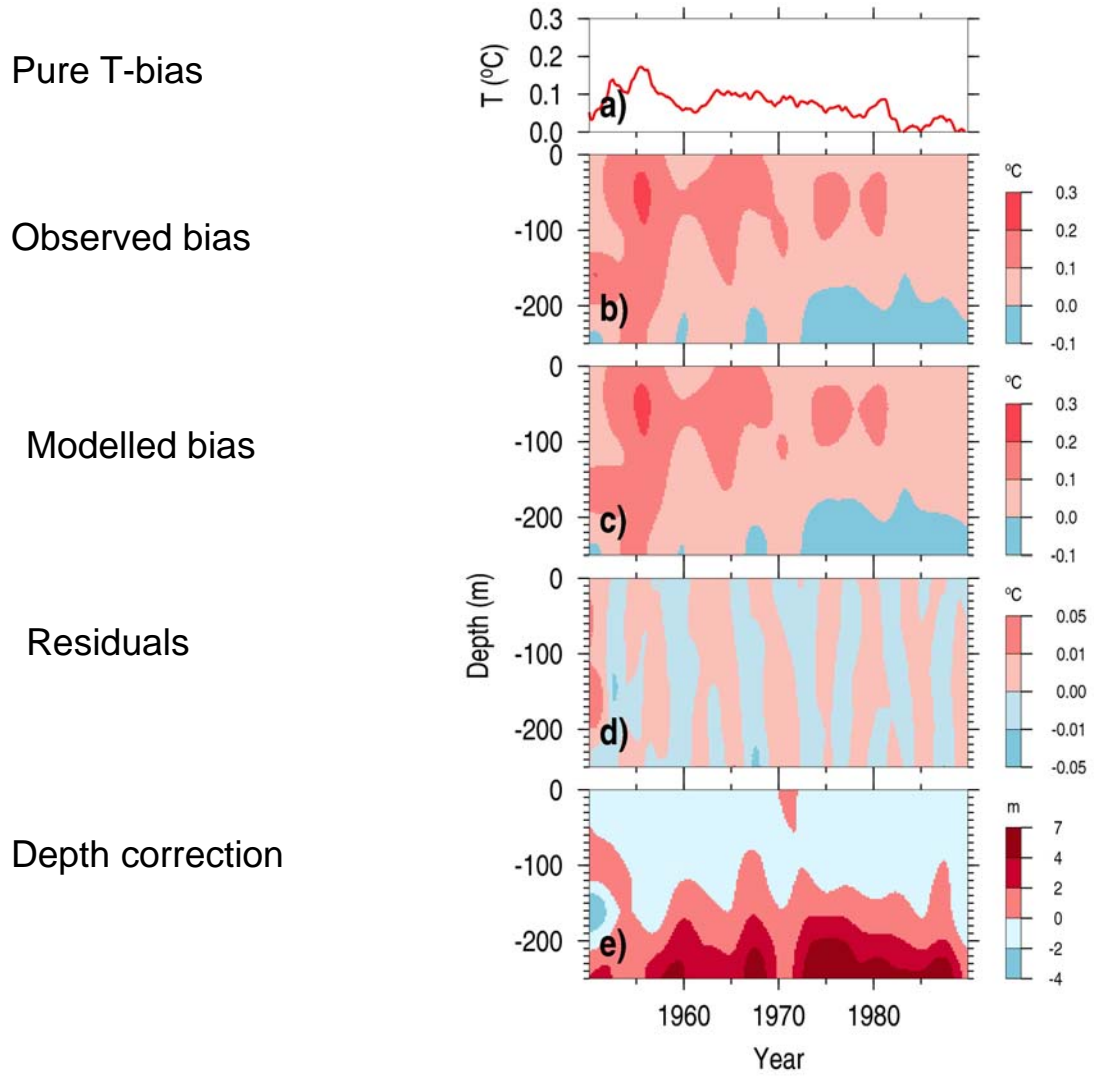
$$b(z) = \gamma(z) \cdot \zeta(z)$$



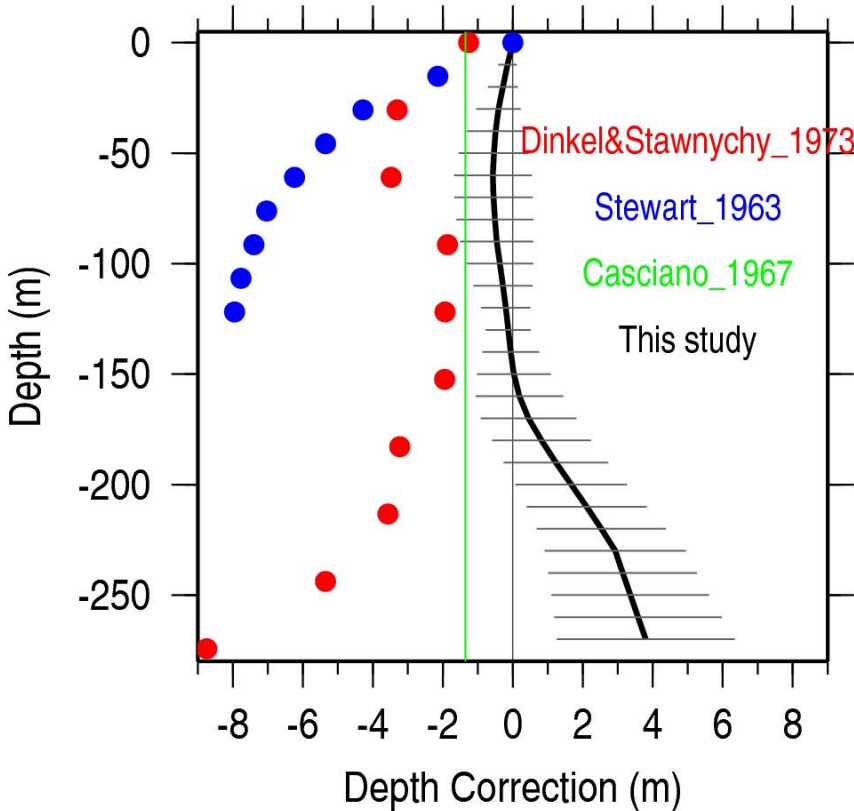
# Comparison of modelled depth corrections with independent results



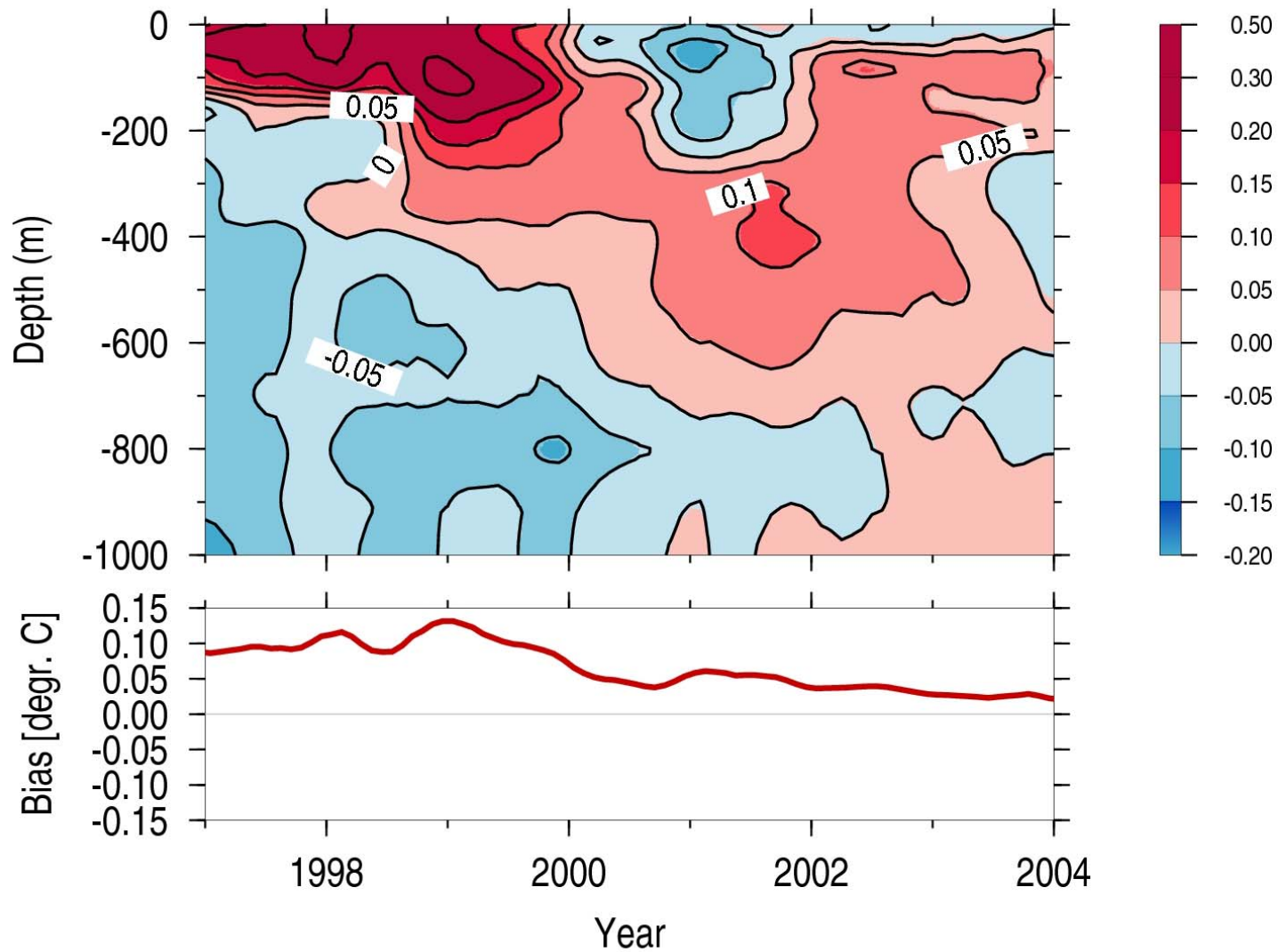
# Modelling MBT biases



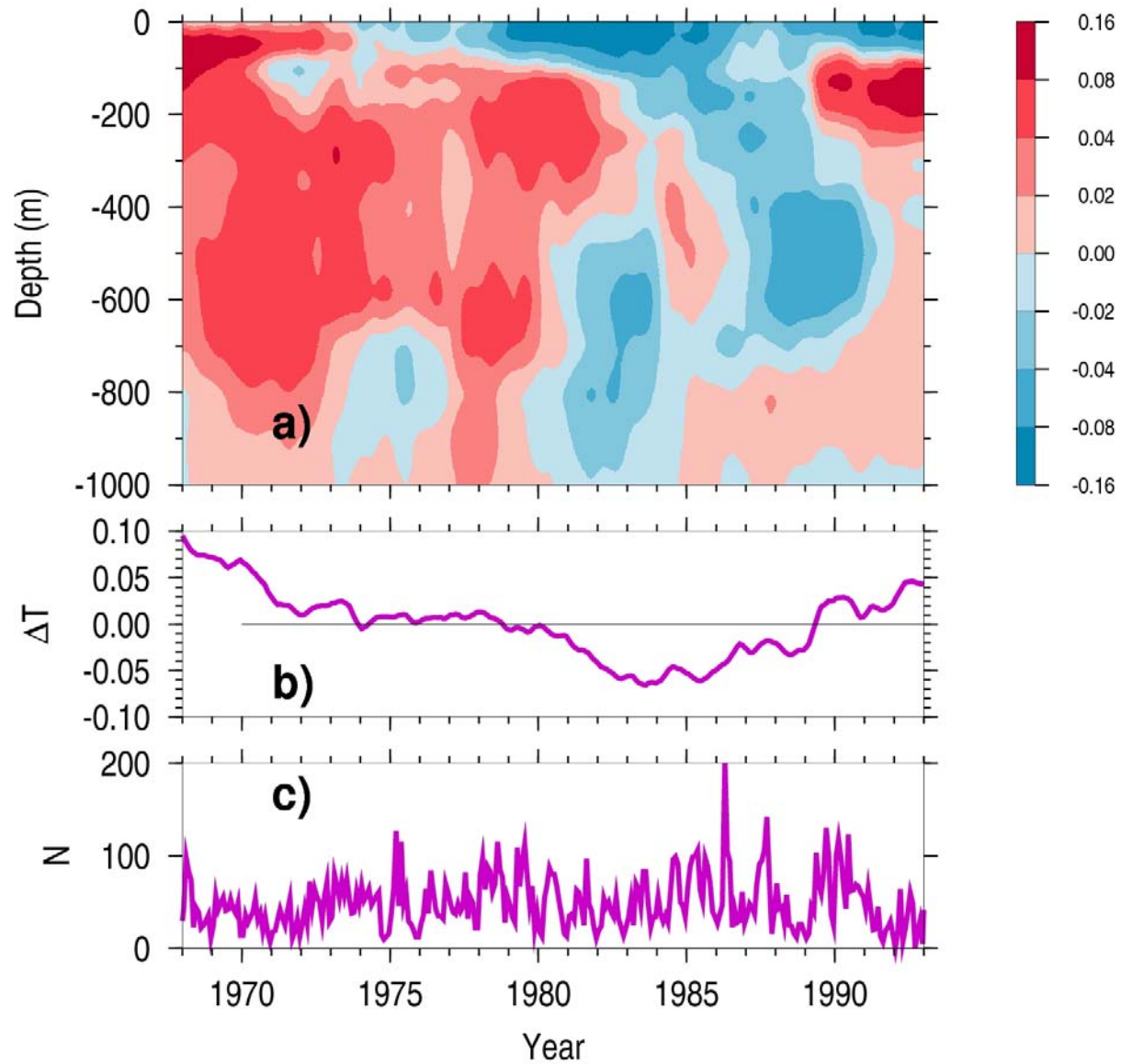
# Estimated MBT biases vs calibration results



# Profiling floats vs CTD



# BOTTLE vs CTD





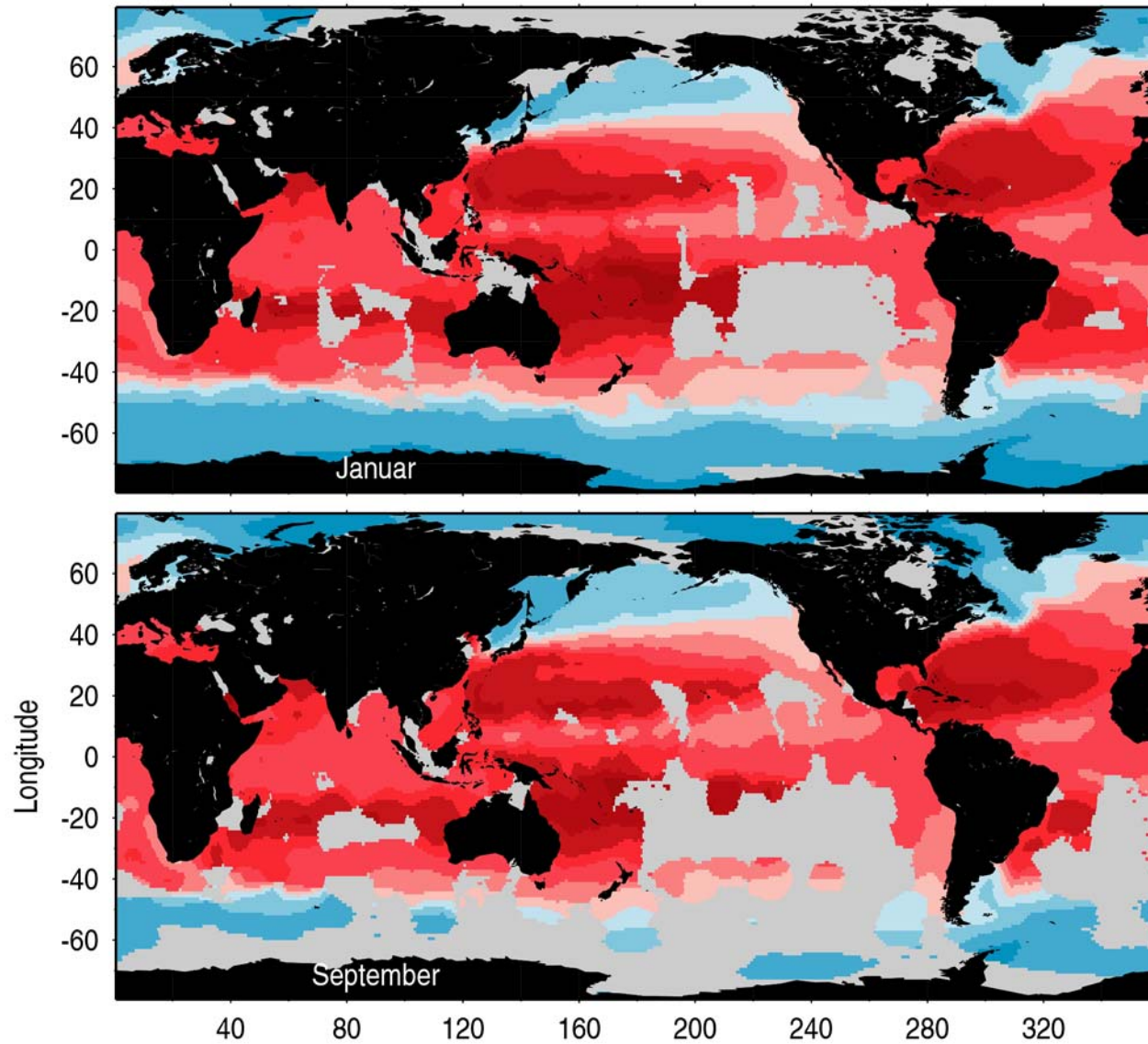
What effect observed temperature biases could have on the estimates of the global temperature/heat content anomalies?

# T-Anomaly calculation

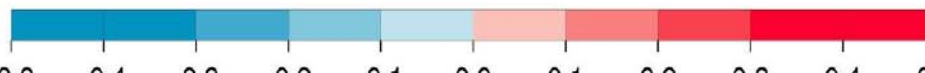
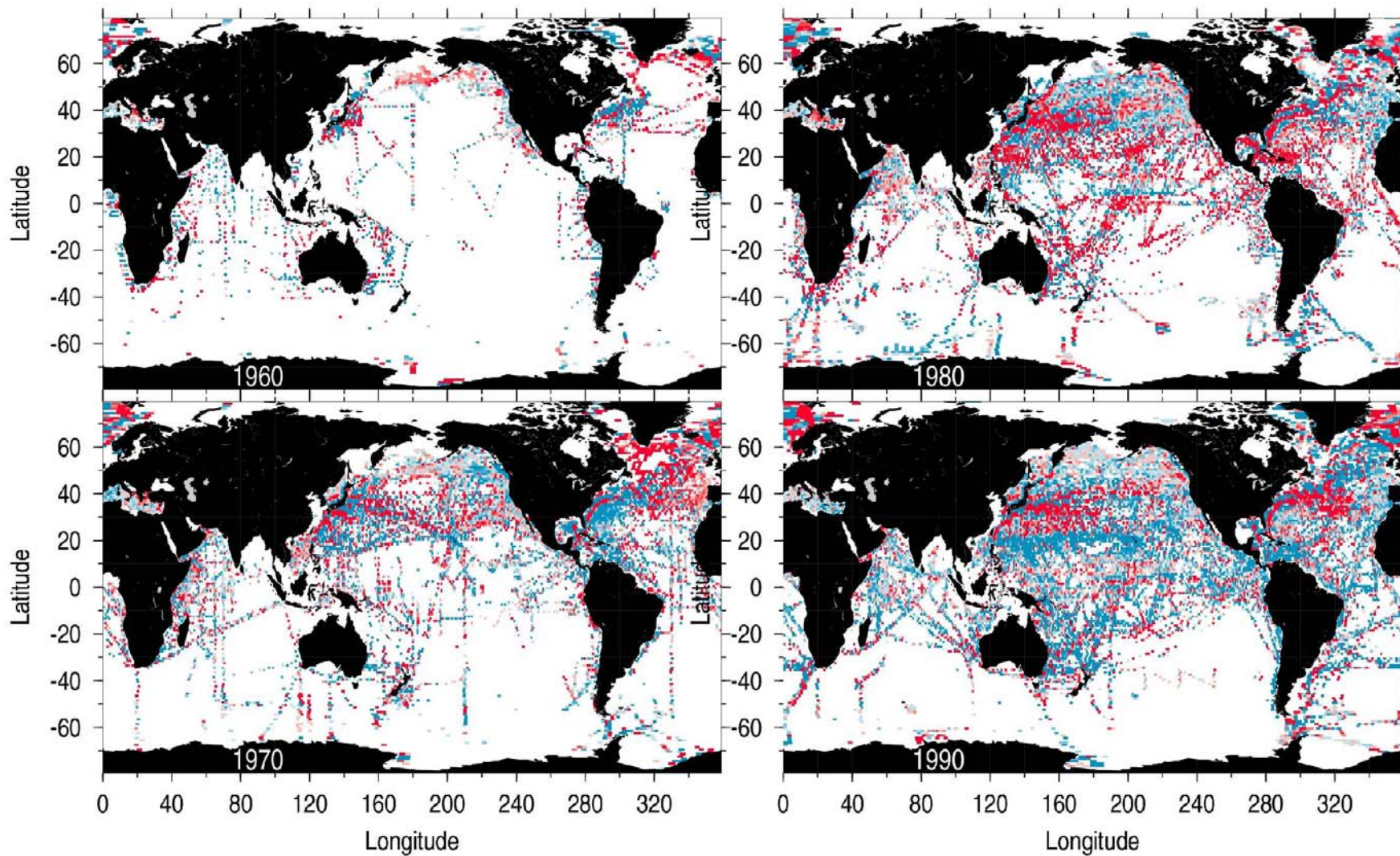
## Reference climatology:

- Base period: **1971-1995**
- Datatypes: CTD & Bottle Data
- Grid: 111x111km
- Above 400m: monthly
- Below 400m: annual

# Reference Climatology (100 m level)

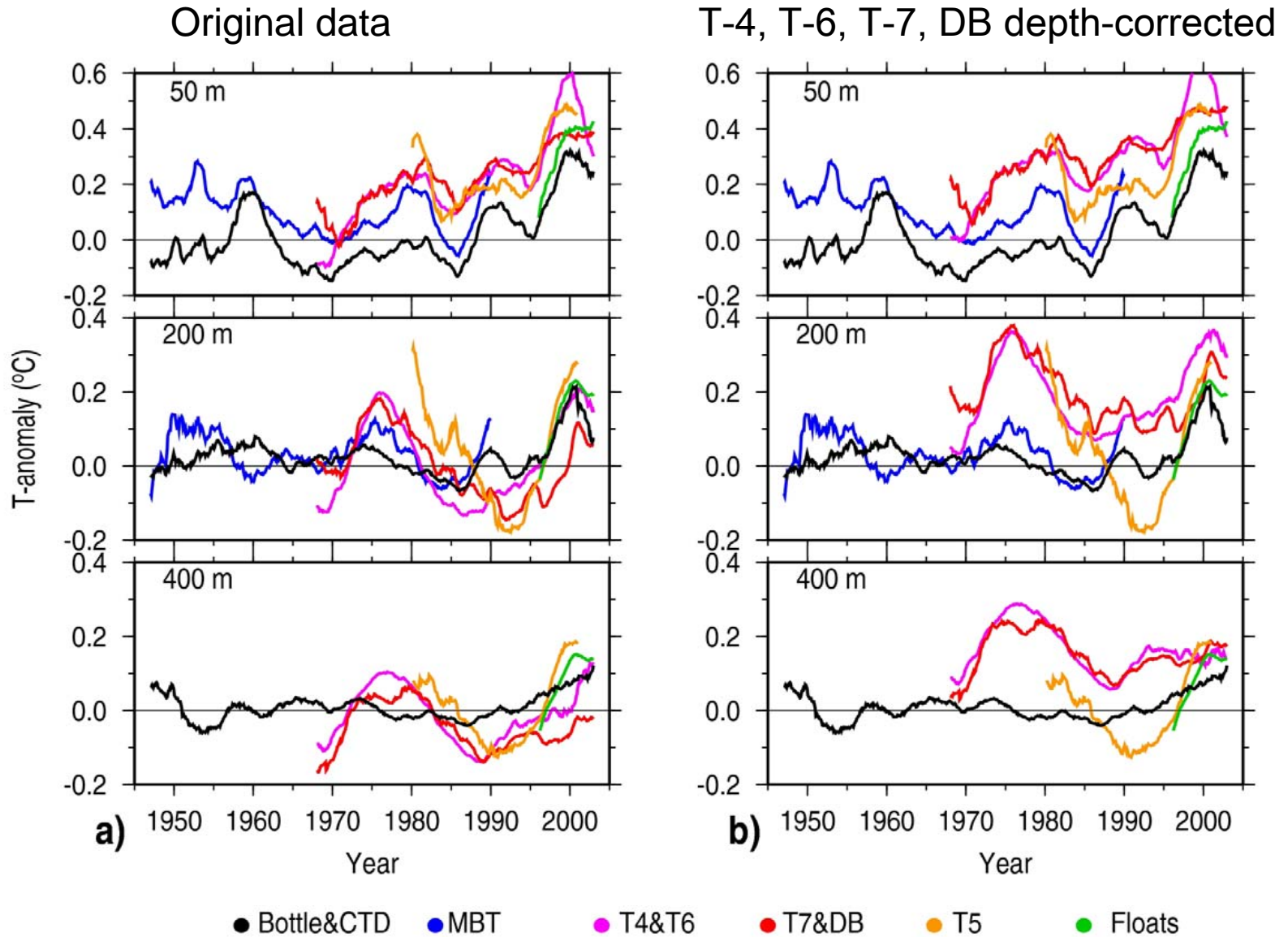


# Box-averaged T-anomalies for selected years at 400 m



# Global T-anomalies at selected levels :

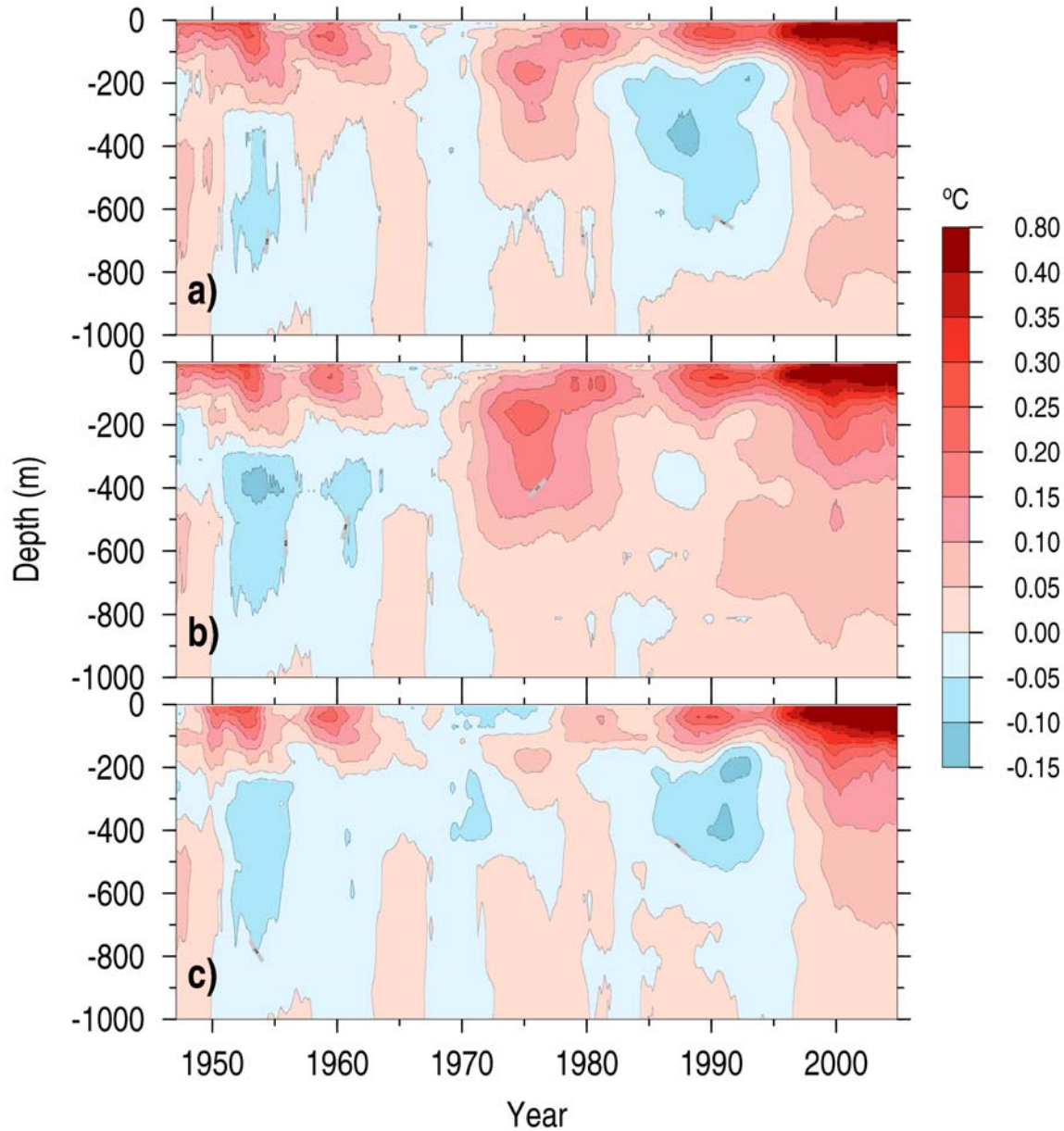
## Data-type dependence (Systematic errors + different sampling)



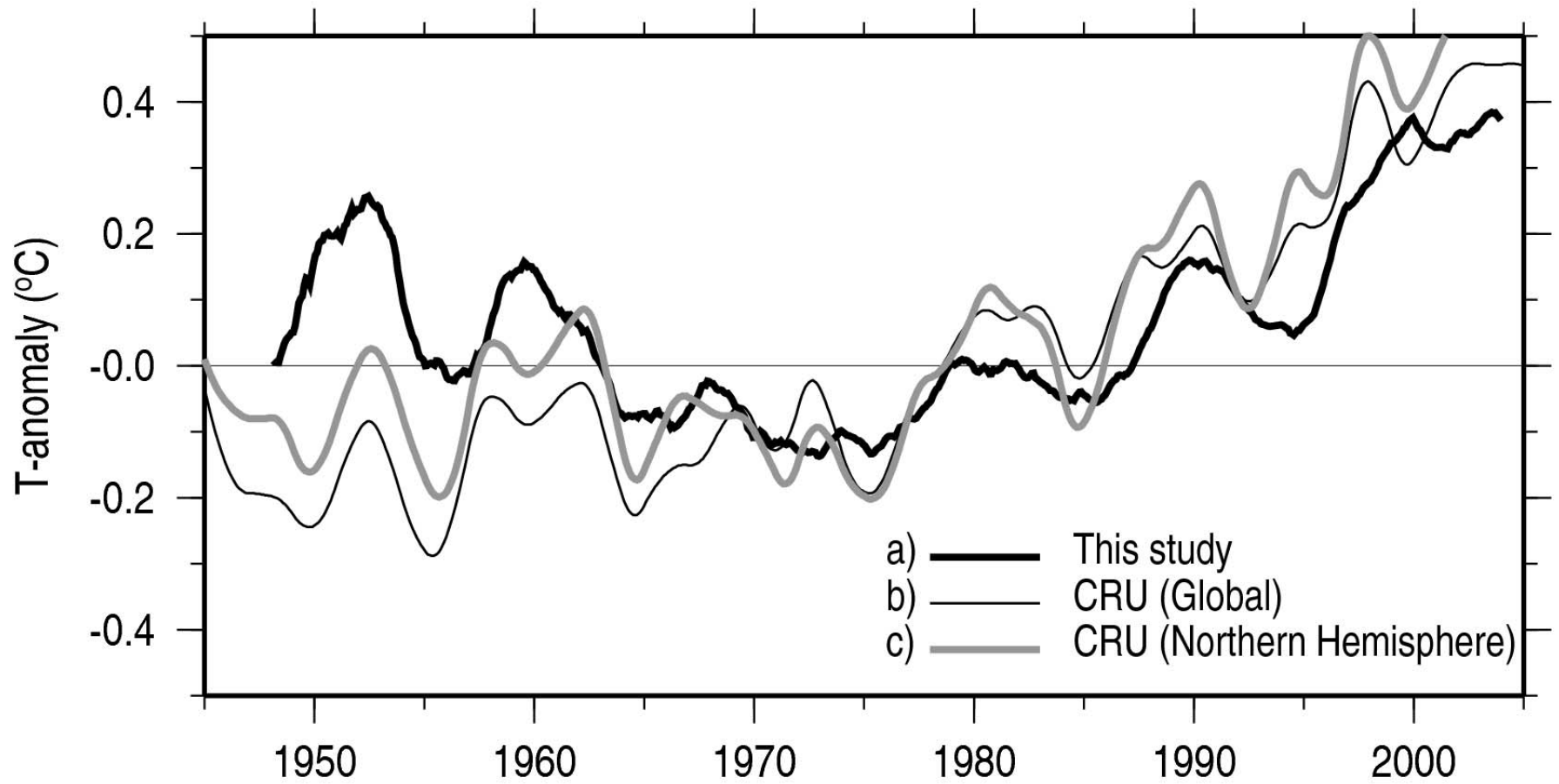
- For the **composite** dataset global anomalies were calculated based on:
  - 1) Original data for all types
  - 2) XBT data corrected using Hanawa et al. (1994) fall-rate corrections, original data for all other data types
  - 3) XBT & MBT data corrected for both T- and Z-bias, original data for all other data types

# Global Temperature Anomaly:

a) original data; b) Hanawa et al. (1994) depth corrected; c) depth and T-corrected data

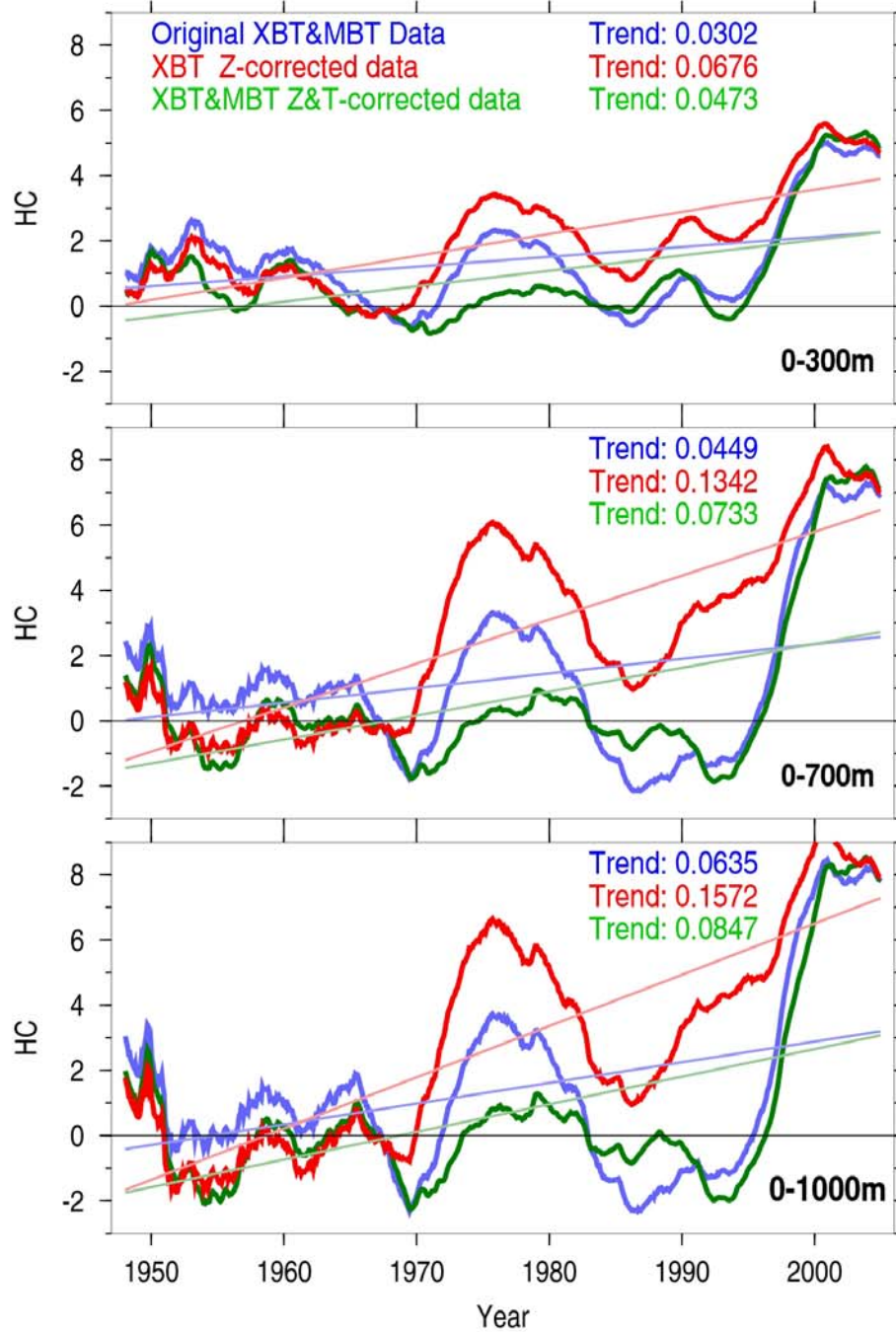


# Global surface temperature anomaly





# Global Heat Content Anomaly 1948-2004

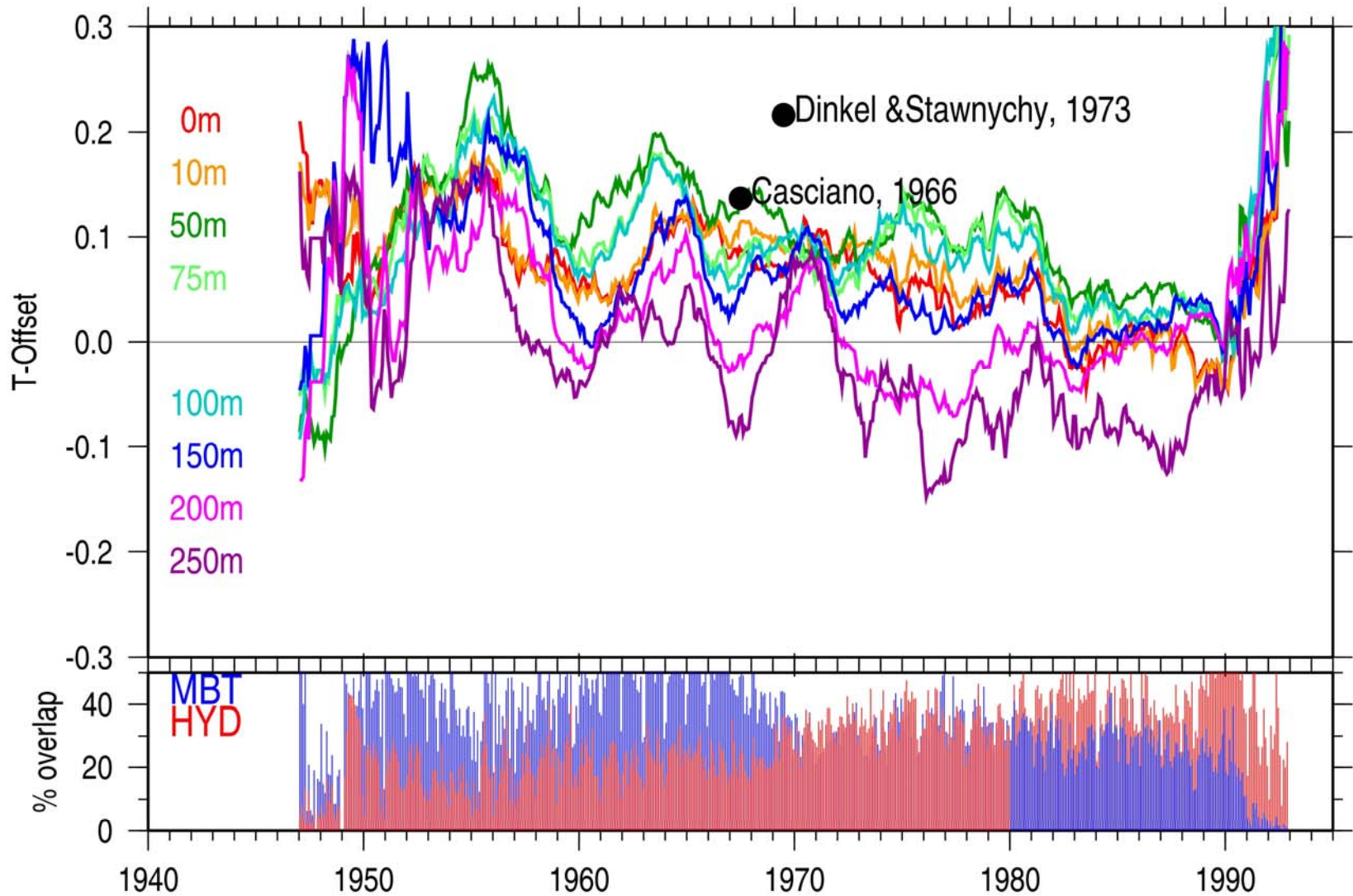


# Conclusions

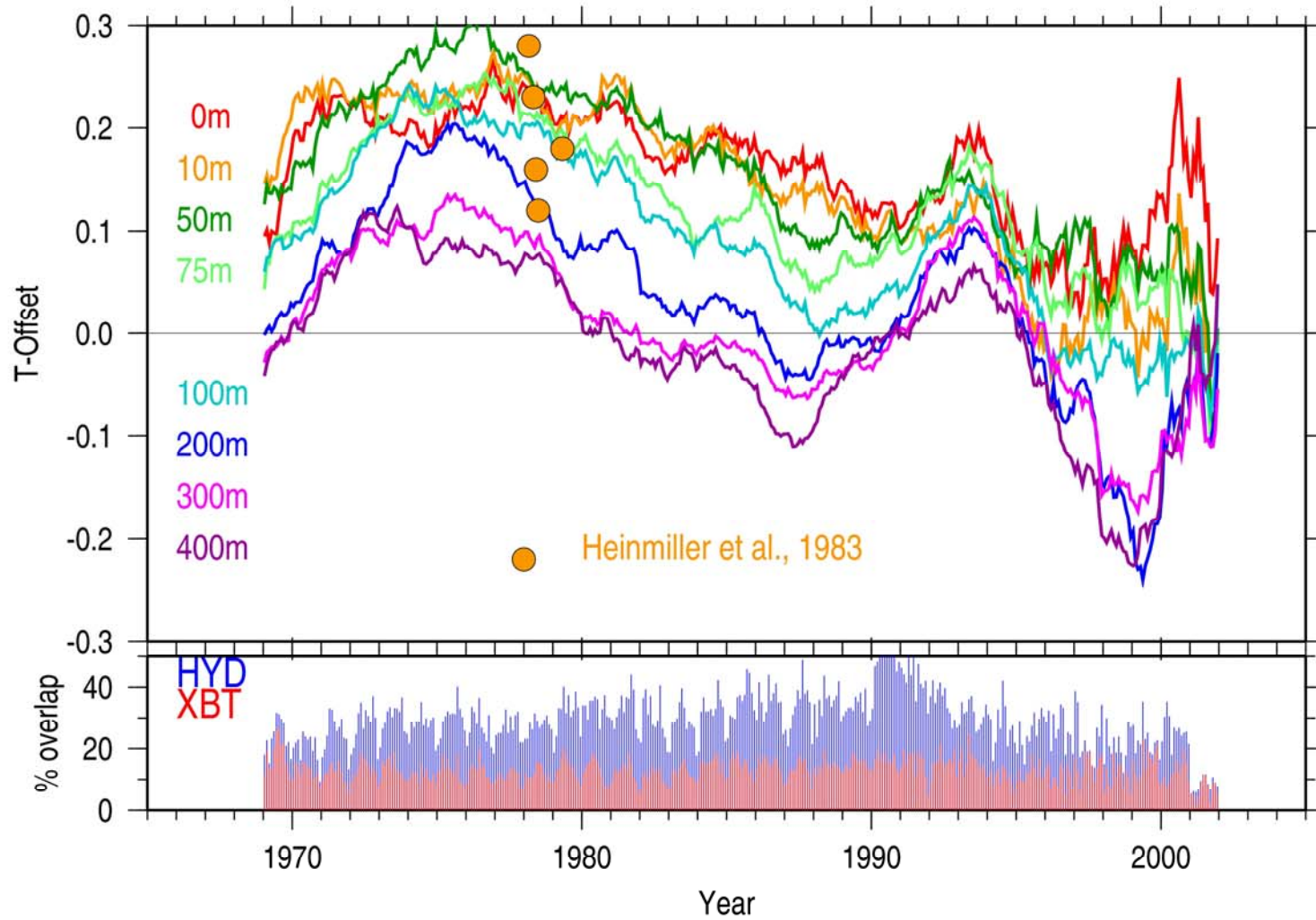
- Temperature subsurface measurements are subject to significant systematic errors
- Comparison with co-located CTD/Bottle data allows estimates of systematic errors in XBT and MBT data
- XBT data are both temperature- and depth-biased
- The validity of depth-corrections determined by Hanawa et al. (1994) is confirmed. However, account for temperature biases is necessary, as application of the depth-corrections only introduces an additional positive temperature bias
- The magnitude of instrument-dependent temperature biases is not negligible for climatic studies
- Corrections for depth and temperature biases reduce estimates of the Global Ocean warming between 1950s-1990s



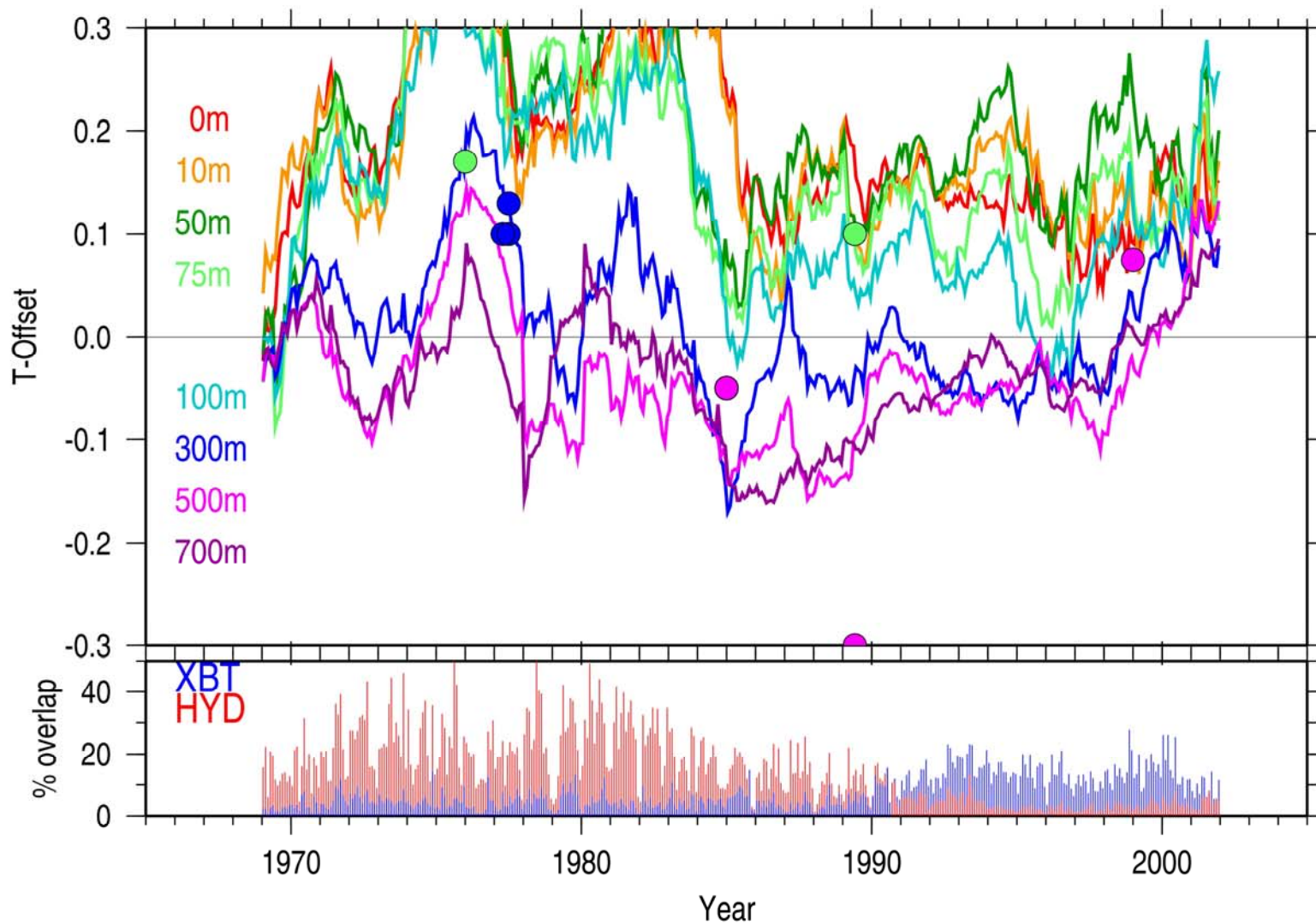
# Offset MBT-CTD/BOT at Different Levels



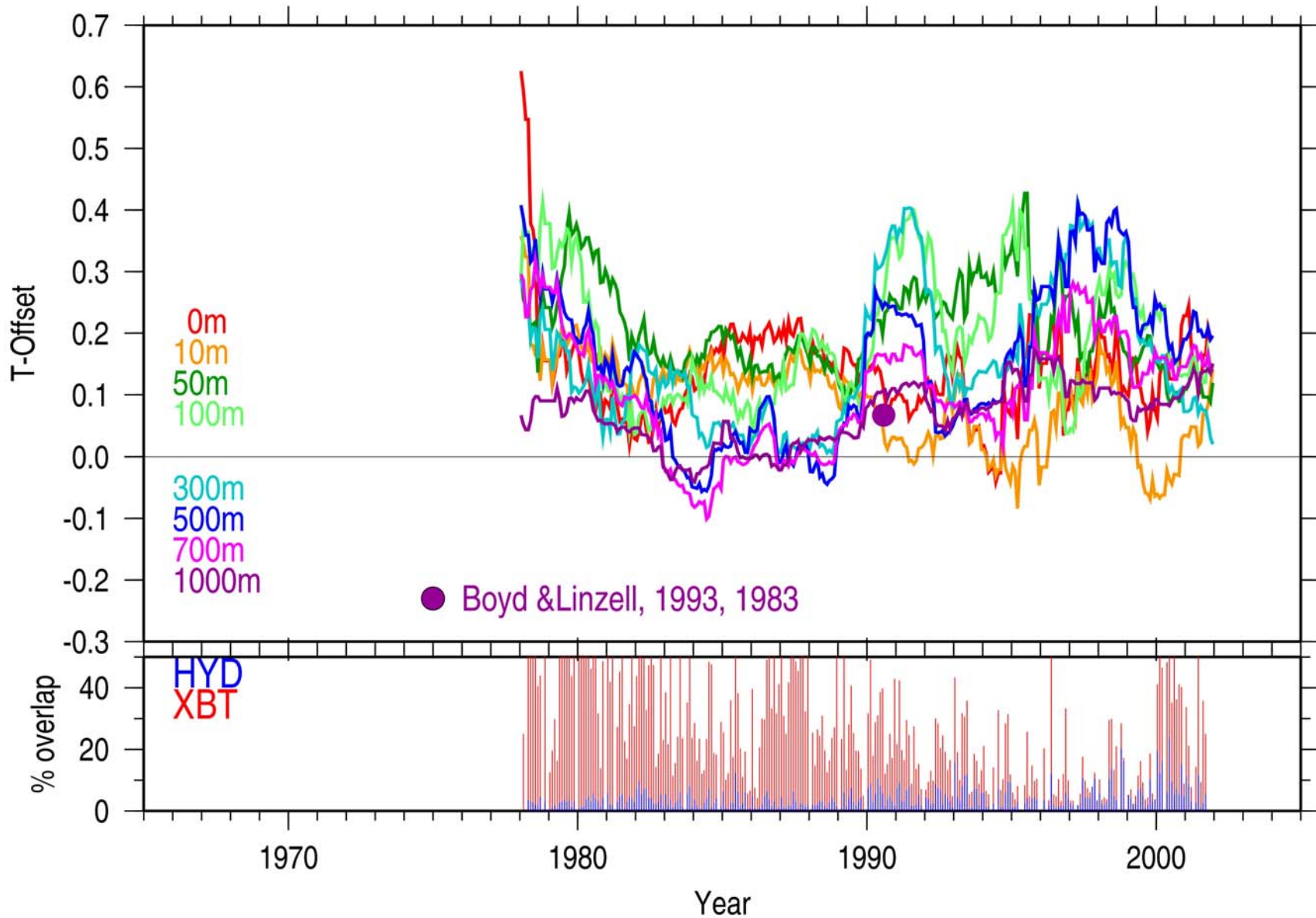
# OFFSET XBT(T4&T6) -CTD/BOT at different levels



# OFFSET XBT/T7DB at different levels



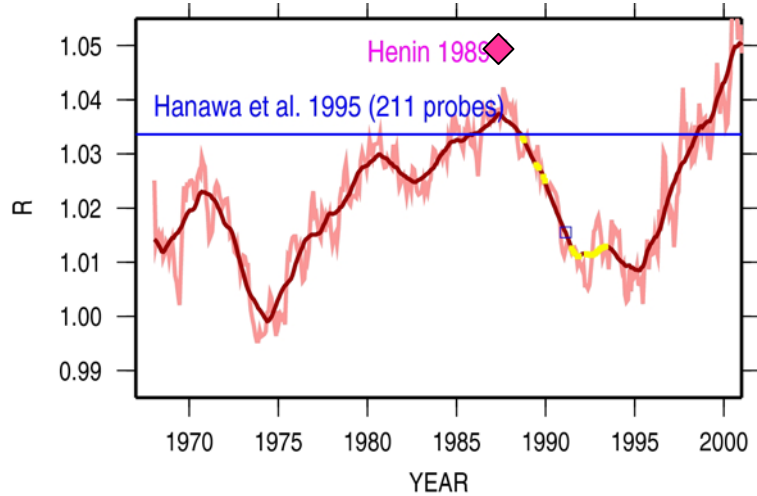
# OFFSET XBT(T5) - CTD/BOT at different levels



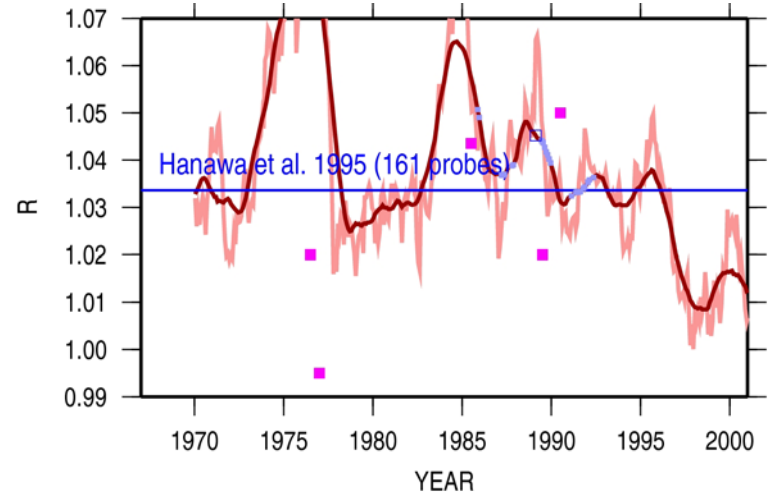
# Depth-averaged linear correction factor for original XBT data:

$$Z_{\text{TRUE}} = R * Z_{\text{XBT}}$$

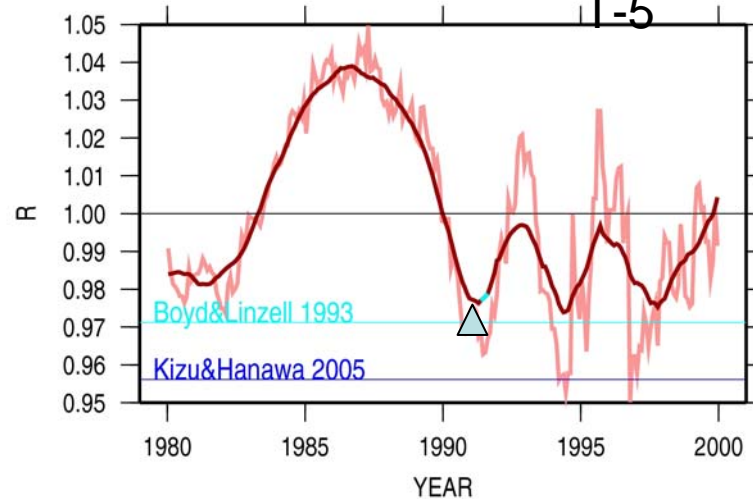
## T-4 & T-6



## T-7 & DB



## T-5





# Nansen Bottles

**Temperature** is measured with thermometers

**Depth** derived from:

1) the T-difference between protected and unprotected thermometers

**or**

2) length of the wire out and wire angle at the deck height

Thermometers calibrated regularly

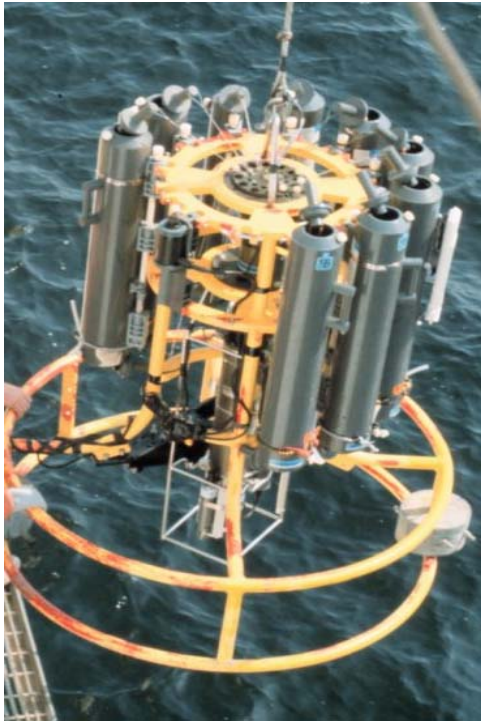


# MBT



- T is scribed on a coated slide.
- **The thermal element** contains a tube, filled with xylene that expands and contracts with T.
- **The depth element** consists of a spring loaded piston enclosed in a flexible envelope made of metal bellows.
- Calibrated regularly (?)
- There were about 5000 MBTs in the USA in use in 1967

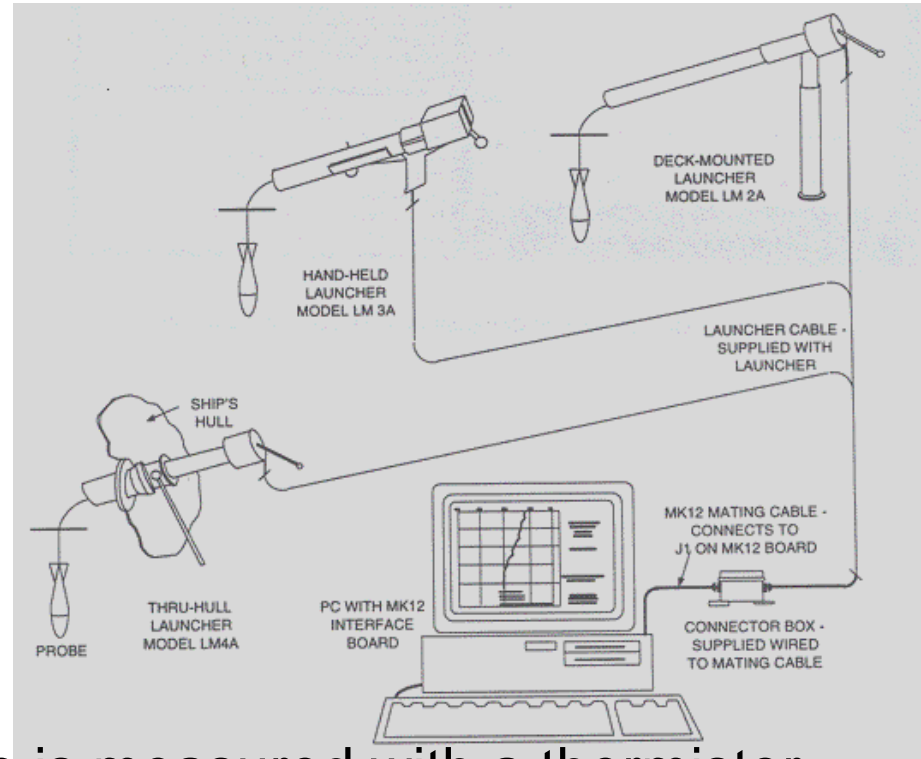
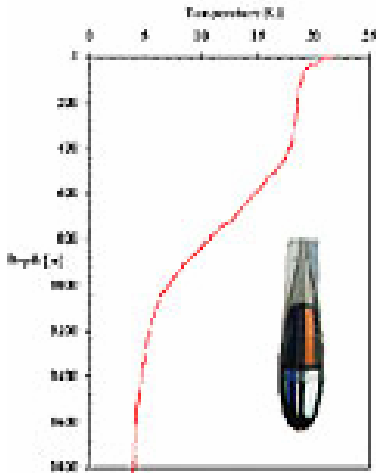
# CTD



Instrument is electrically connected with recording device in the lab

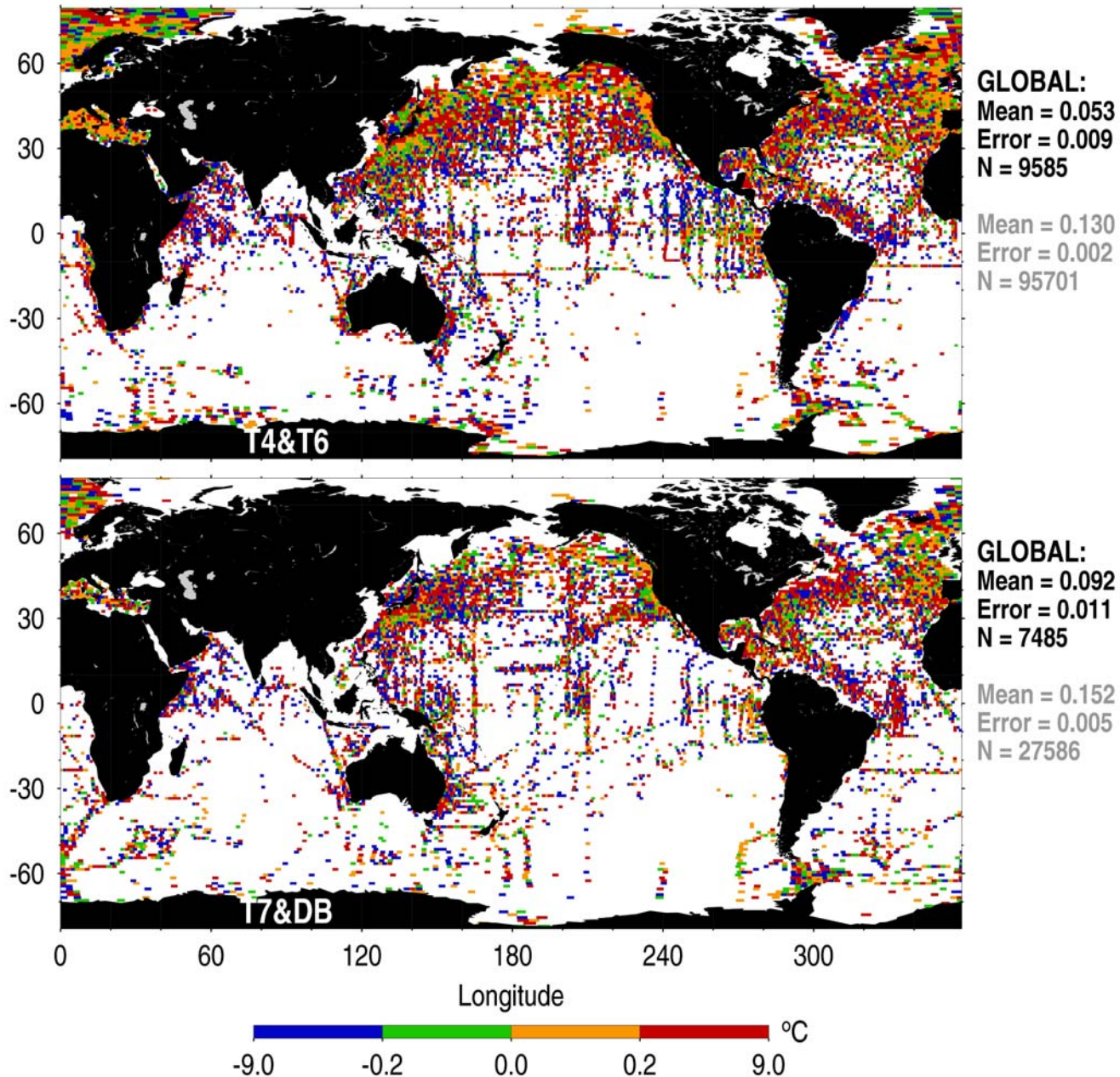
- **Both Temperature** and Pressure are measured with high-precision sensors
- **Depth** is calculated from pressure, T and S
- Sensors regularly calibrated

# Expendable Bathythermograph (XBT)

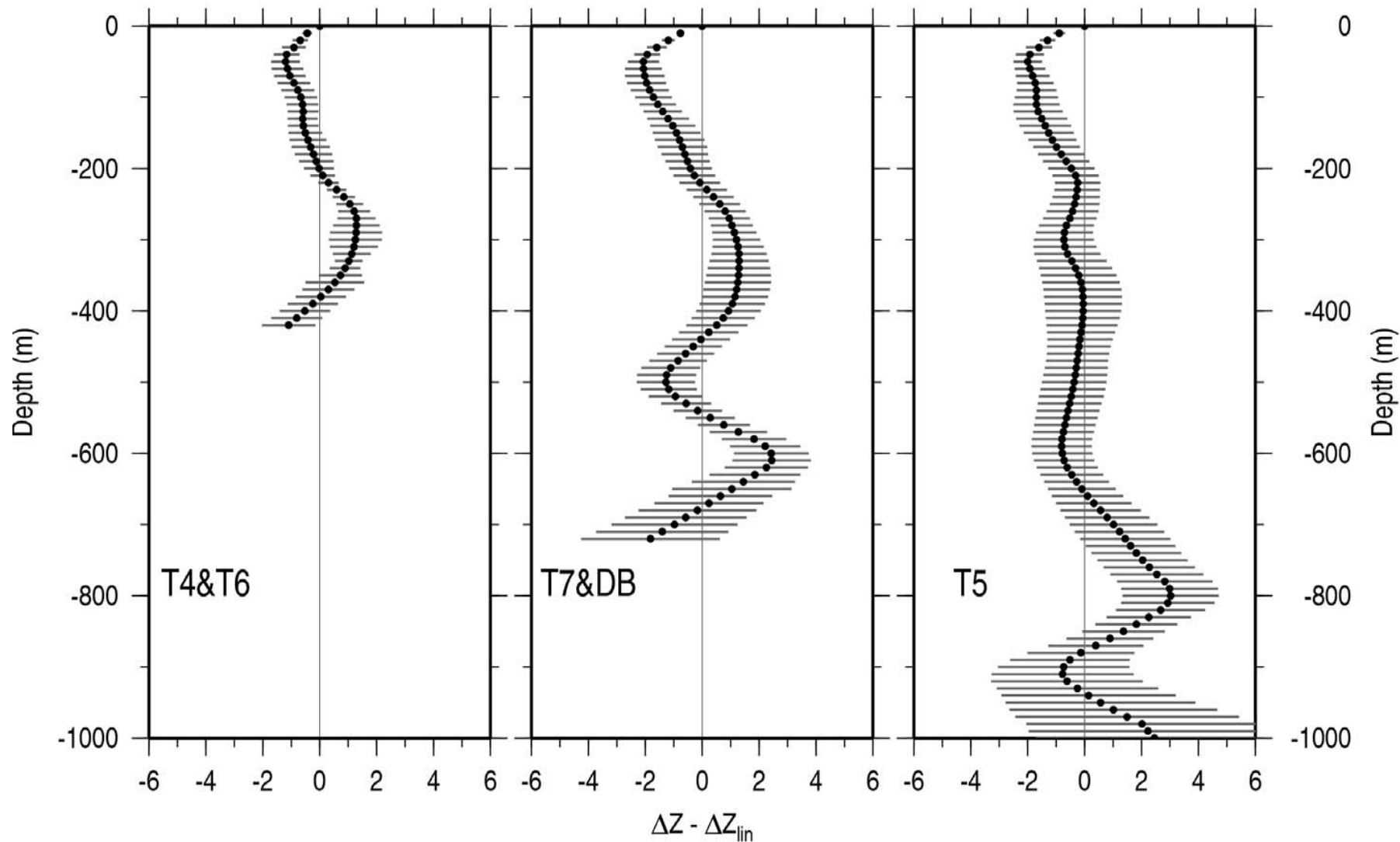


Temperature is measured with a thermistor  
Depth is calculated from the assumed probe fall rate  
Post-calibration not possible: **the probe is lost!**

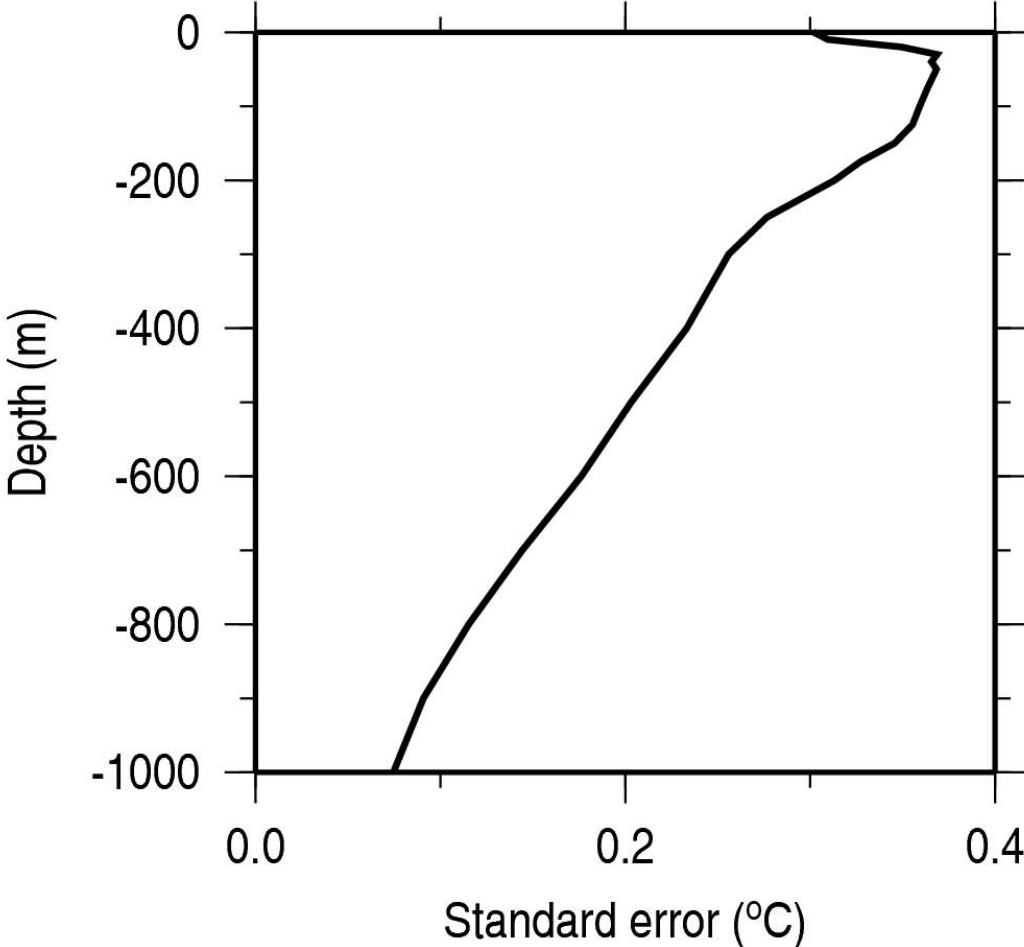
# Time-mean box-average temperature biases at 100 m level



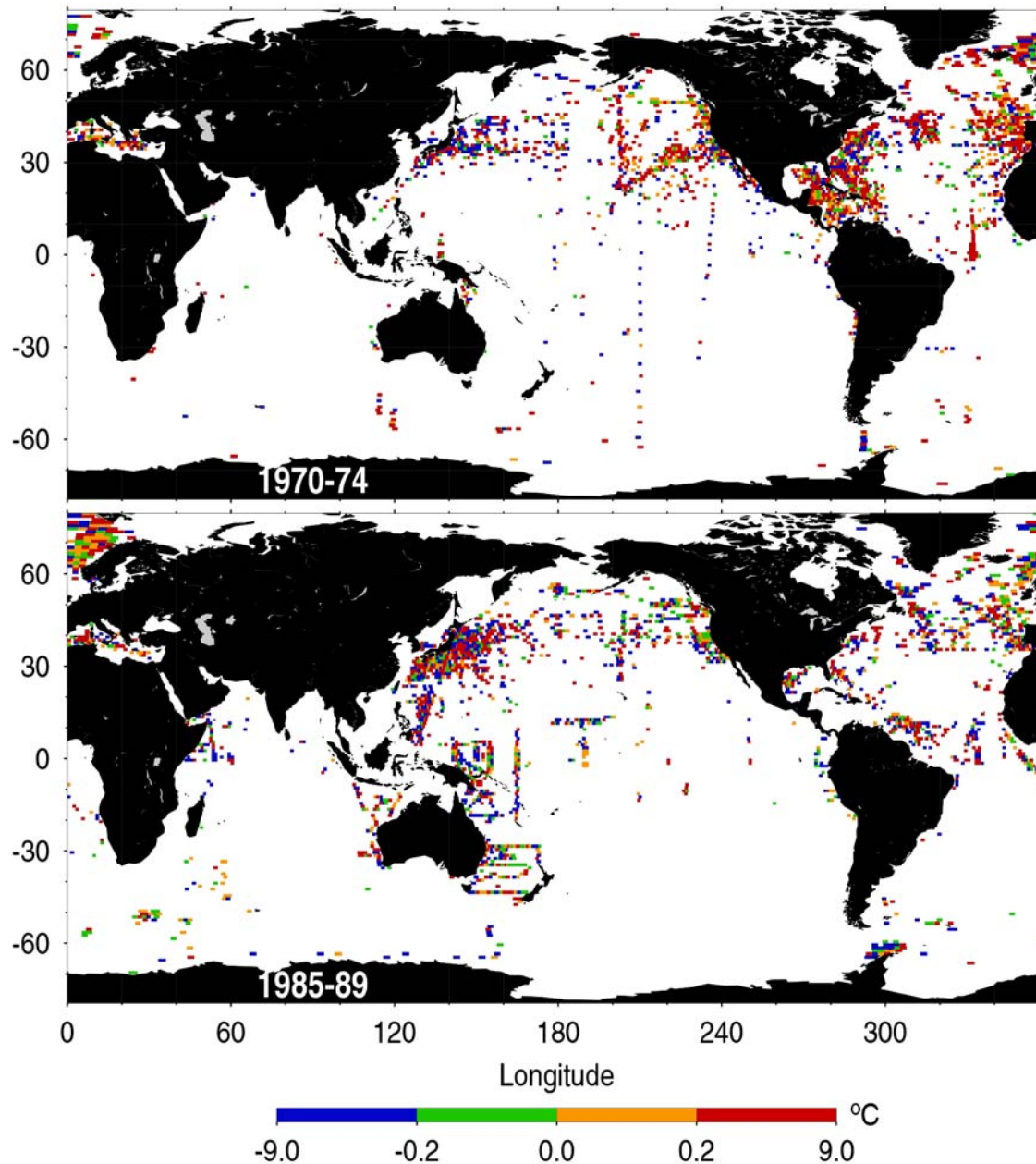
# XBT depth-correction Differences: $DZ_{\text{estimated}} - DZ_{\text{linear}}$



# Mean within-box temperature standard error



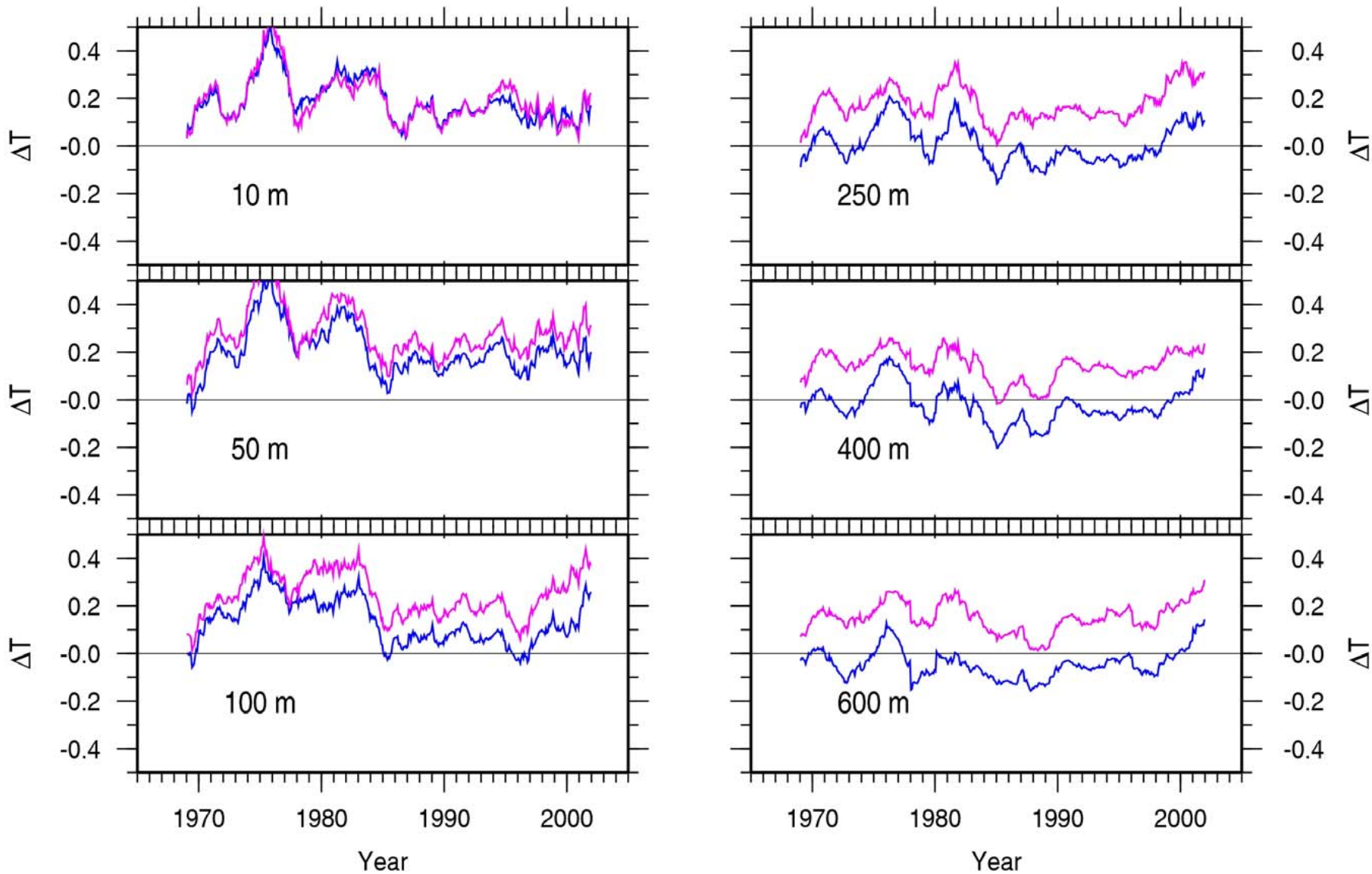
# Temperature offset for T-7 & Deep Blue (100 m level)





# T-biases for T7 & DB

BLUE - original data    MAGENTA - corrected data (Hanawa et al.(1994) fall-rate corrections)



# XBT bias model

A true box-averaged  $\langle \dots \rangle$  temperature bias is:

$$\langle \mathbf{B} \rangle \equiv \langle T_{\text{XBT}} \rangle - \langle T_{\text{TRUE}} \rangle$$

(True T-values collocated and simultaneous)

An observed bias is:

$$\langle \mathbf{b} \rangle = \langle T_{\text{XBT}} \rangle - \langle T_{\text{CTD}} \rangle = \langle \mathbf{B} \rangle + \varepsilon$$

( $\varepsilon$  – error due to CTD profiles being not strictly collocated,  
magnitude determined by the synoptic variability)