

# Mitigation of Large Scale Biases in the Aquarius Salinity Retrievals

T. Meissner and F. Wentz

Remote Sensing Systems

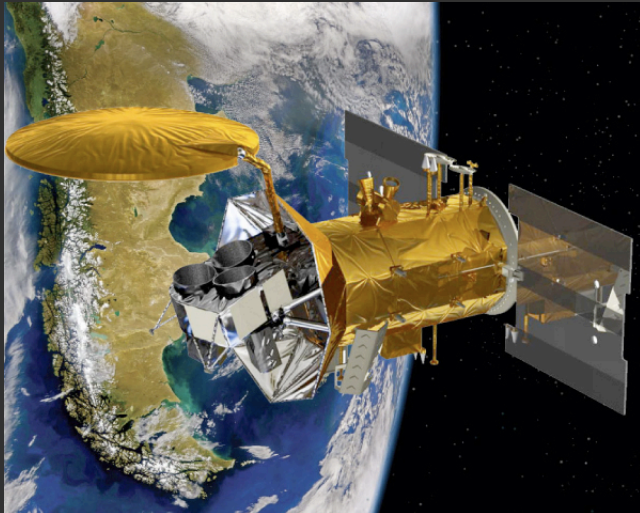
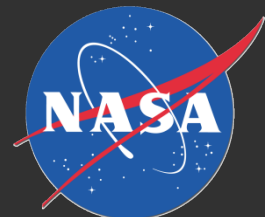
*meissner@remss.com*

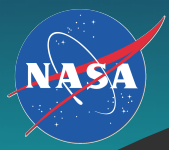
**2014 Aquarius / SAC-D Science Team Meeting**

November 11- 14, 2014

Seattle. Washington, USA

Remote Sensing Systems   
[www.remss.com](http://www.remss.com)





# Outline

- 1. Current Status:**
  - Observed Biases
  - Post-hoc SST correction
- 2. 2-Dimensional Analysis: SST and Wind Speed**
- 3. Low Wind Speed Limit**
  - Dielectric Model
  - O<sub>2</sub> Absorption Model
  - SST Auxiliary Field
- 4. Moderate –High Wind Speeds**
  - Wind Emissivity Model
- 5. Summary**
- 6. Going Forward**

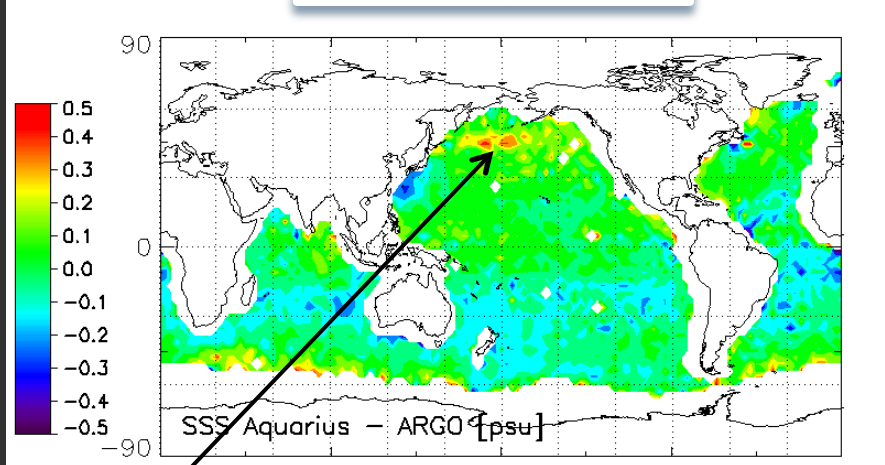
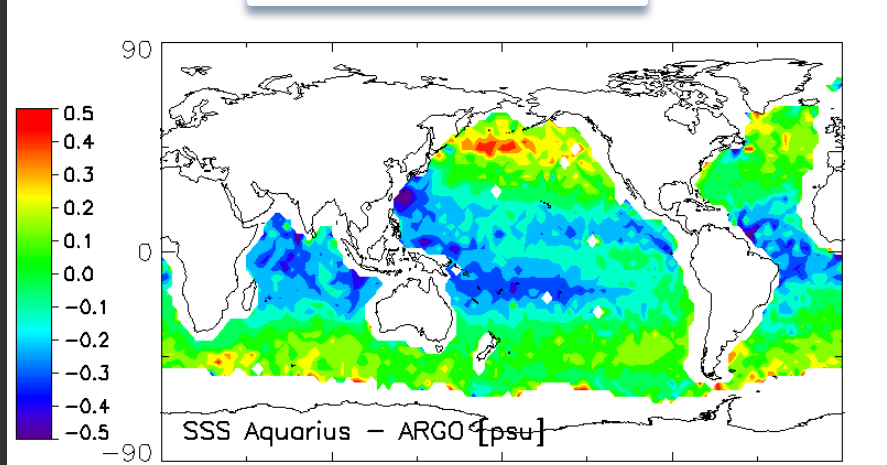
# SST Dependent Biases

## Post-hoc Correction (2)

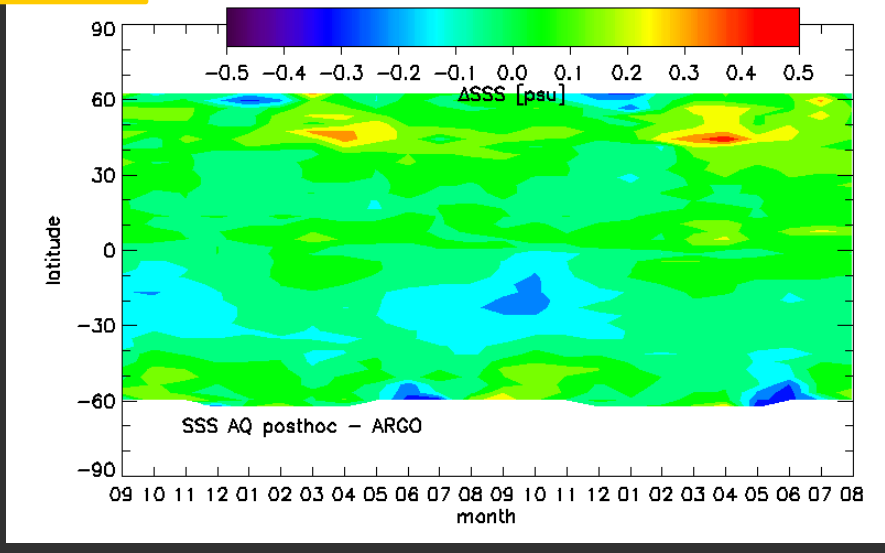
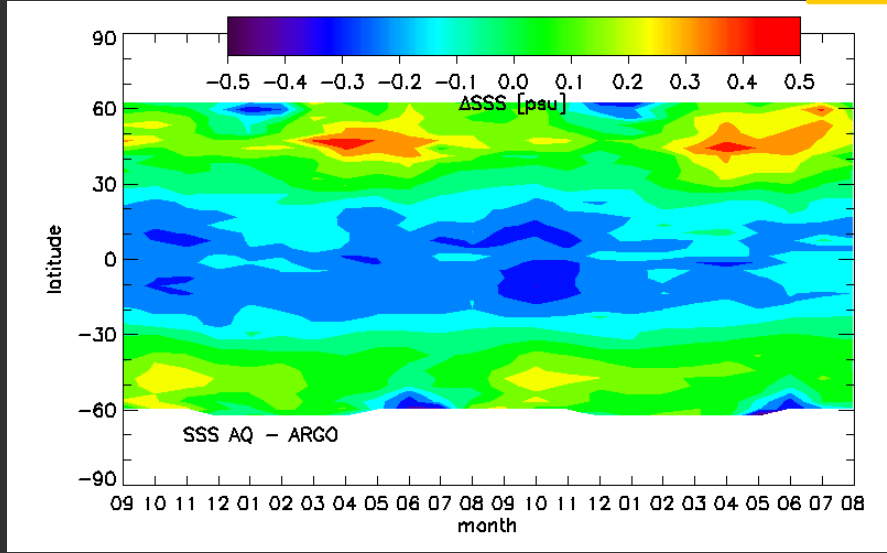
- The ADPS V3.0 standard SSS shows fresh biases in low latitudes and salty biases in high latitude compared to ARGO and HYCOM.
- These biases are a large part of the observed error
  - Global RMS of monthly 1 deg averages
  - Goal: 0.2 psu
- These biases are not caused by stratification/rain (see afternoon talk).
- These biases are caused by the geophysical model function and need to be removed.
- ADPS V3.0 contains a **bias adjusted** SSS product, which should be used for scientific studies.

V3.0  
no adjustment

V3.0  
bias adjusted



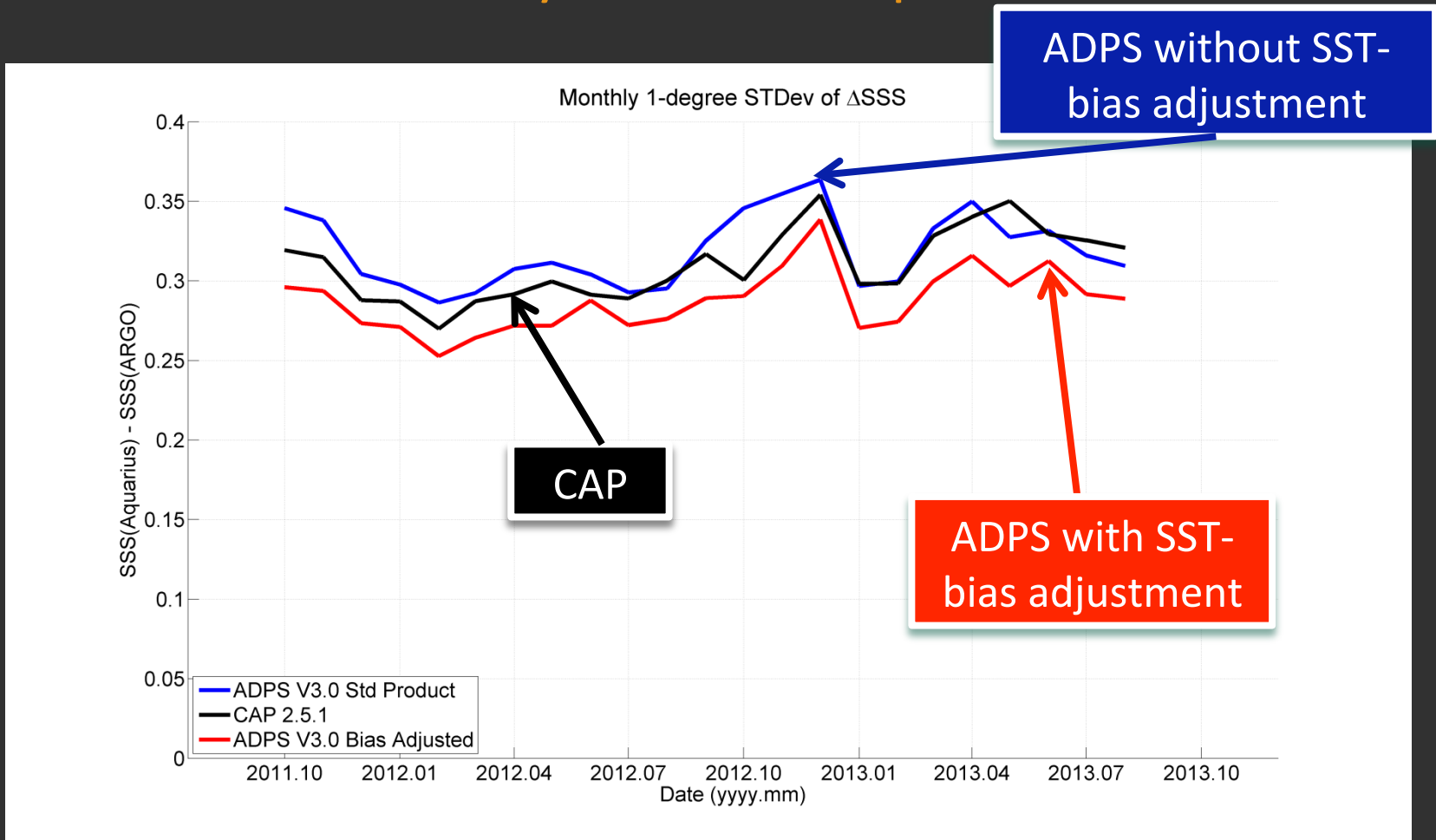
HYCOM ≠ ARGO





# Std. Dev. of Monthly Averages vs. ARGO

## Error dominated by local SST-dependent biases



**CAP V3.0 has implemented an SST bias adjustment. So does SMOS. Need to compare ADPS SST-bias adjusted SSS with CAP V3.0.**

# Task and Challenge for L2 Algorithm

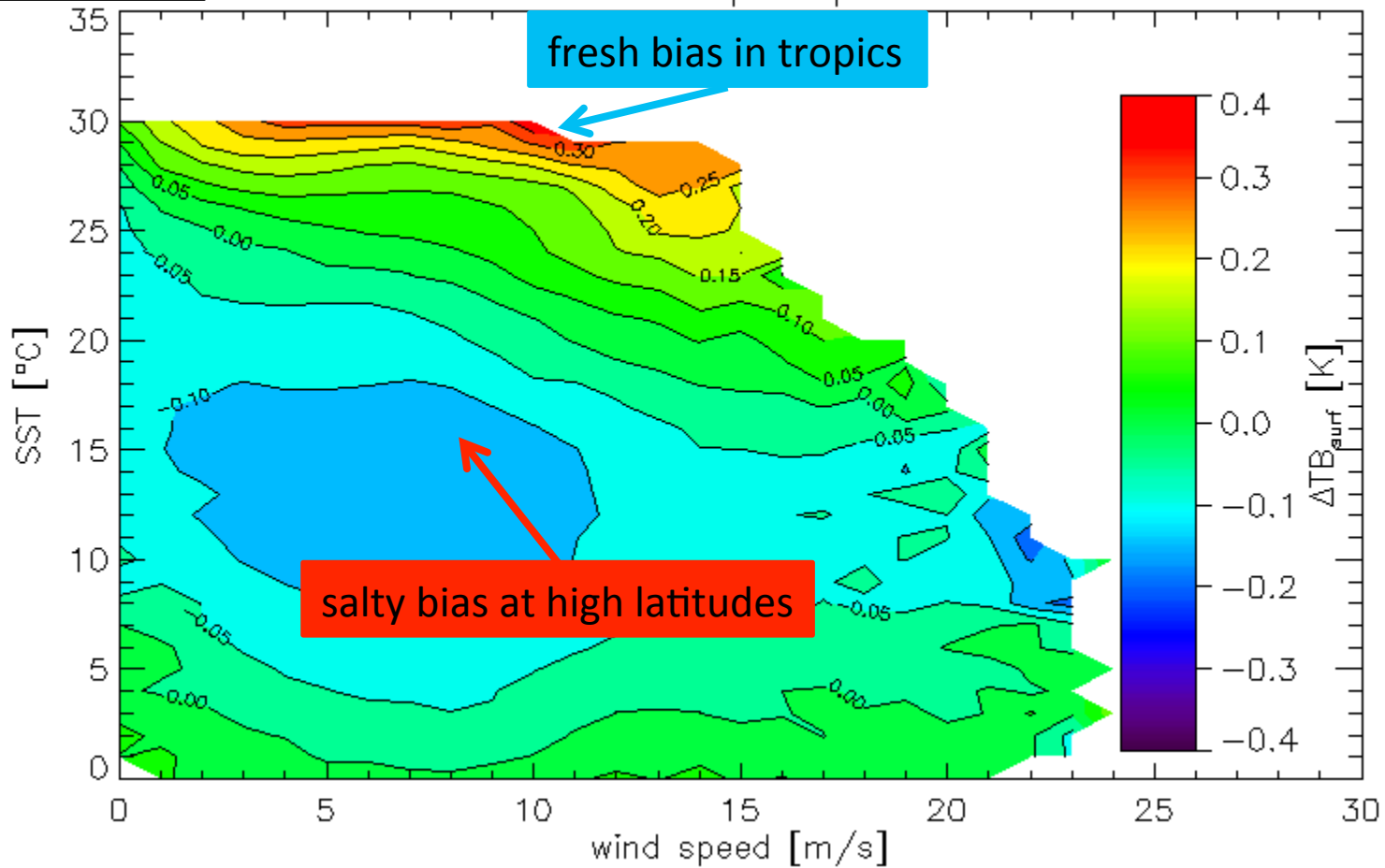
- The Aquarius salinity retrieval is a **physical algorithm**, which relates the measured TB to the emission of electromagnetic radiation from the ocean surface and its propagation through the atmosphere and ionosphere.
  - Geophysical Model (GM) based on Radiative Transfer Model (RTM)
- The goal is to try to identify the physical reason = component of the GM that cause the observed biases and correct for it.
- Should be done at the TB level and horn specific.
  - Integrated into calibration loop.

# Key: 2-Dimensional Stratification

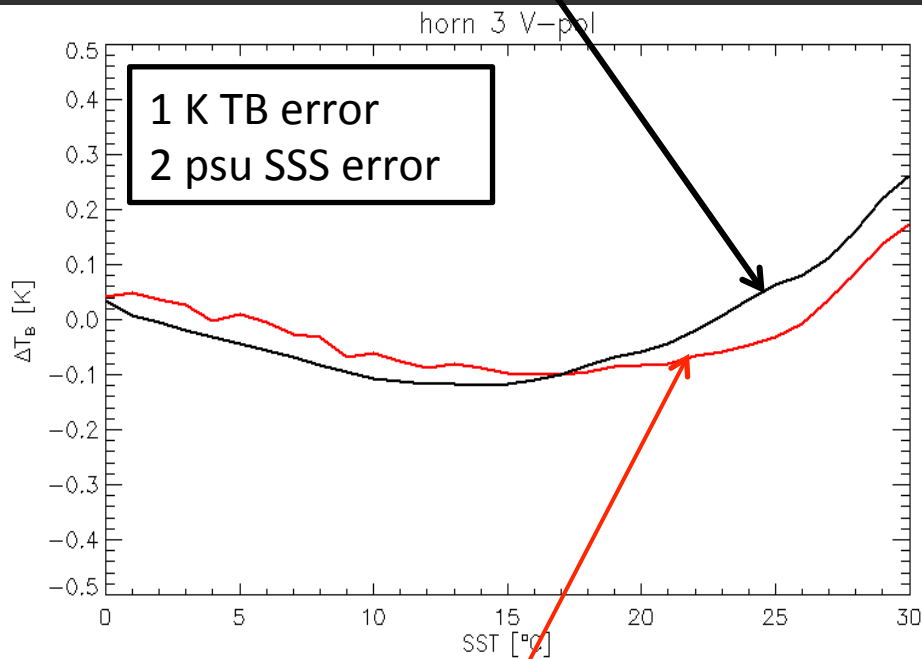
TB measured – RTM as function of SST and wind speed  
Rain filtered

+ 1 K TB error  
- 2 psu SSS error

TB meas – exp V-pol horn 3



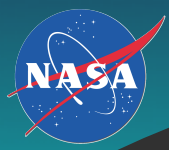
V3.0 post-hoc bias adjustment



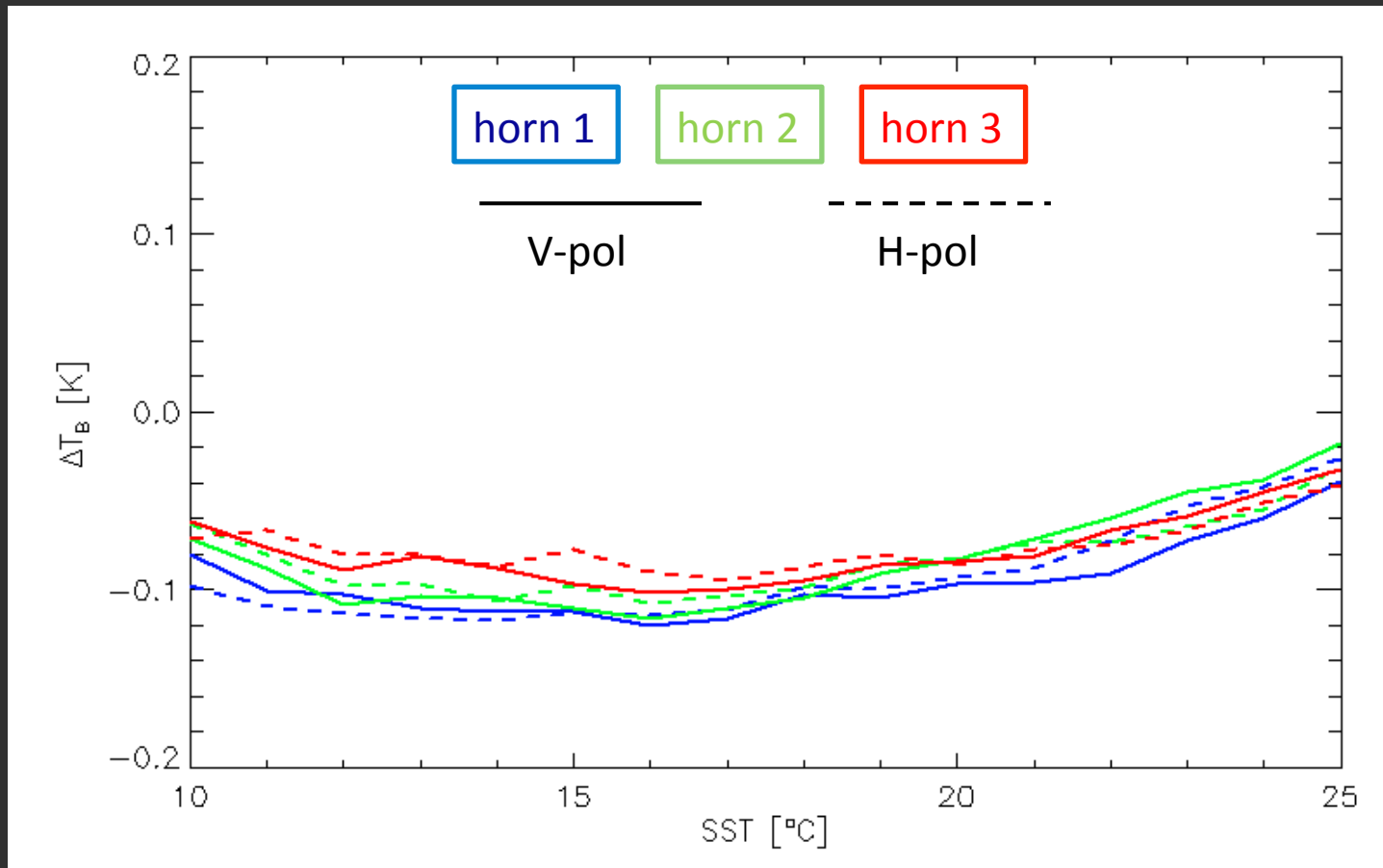
low wind speed limit of [TS, W]  
diagram

- Possible Causes:
  - Model for sea water permittivity (Meissner Wentz 2012)
  - Model for  $O_2$  absorption in the atmosphere
  - Error in auxiliary SST input
  - NOT: Rain/Stratification
- **Small: 0.1 K level**
- Current post-hoc bias adjustment overcorrects in warm water and undercorrects in cold water (0.2 psu).





# Low Wind Speed Limit Channel Signature

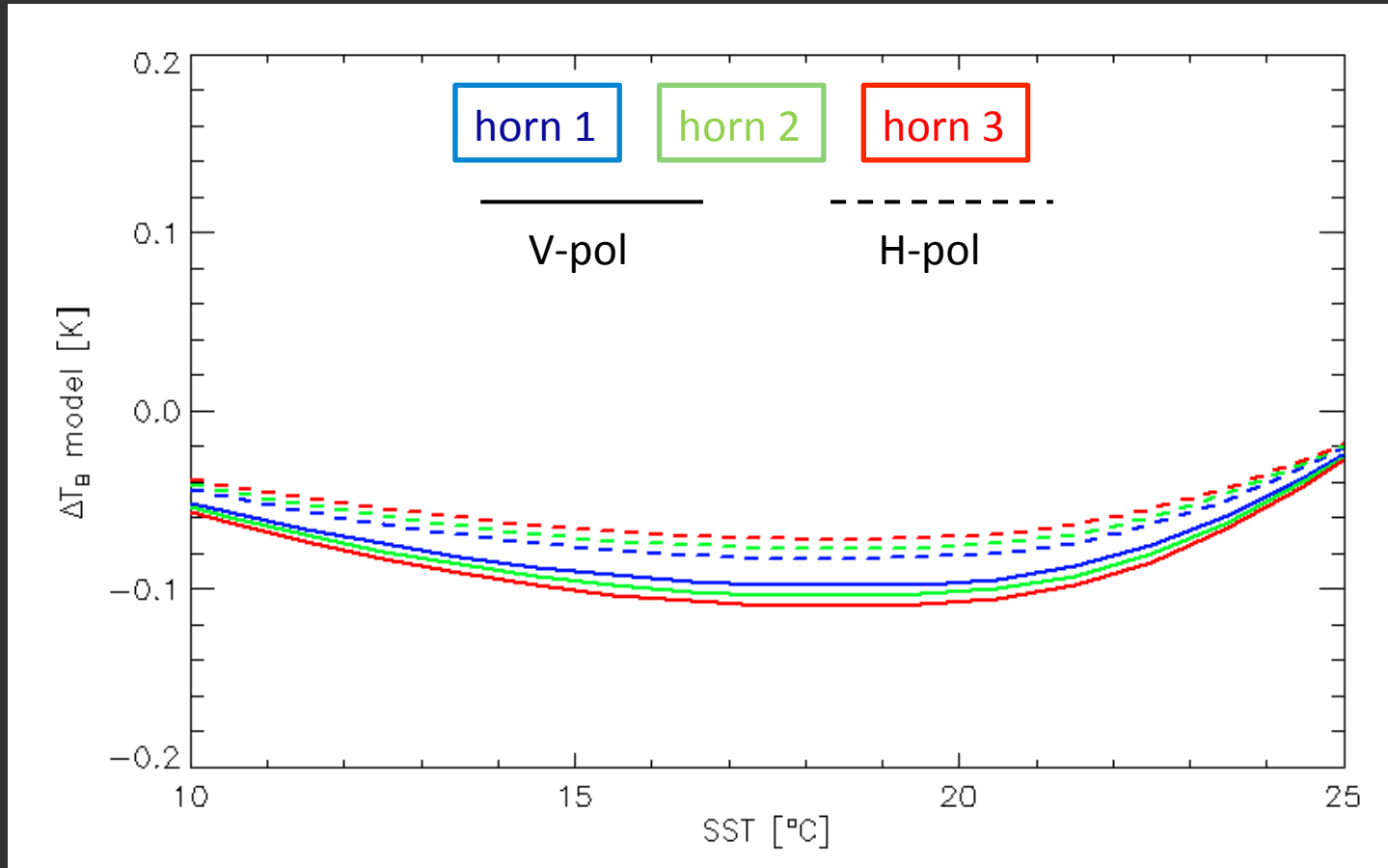


1 K TB error  
2 psu SSS error

Very Small Inter-channel Differences

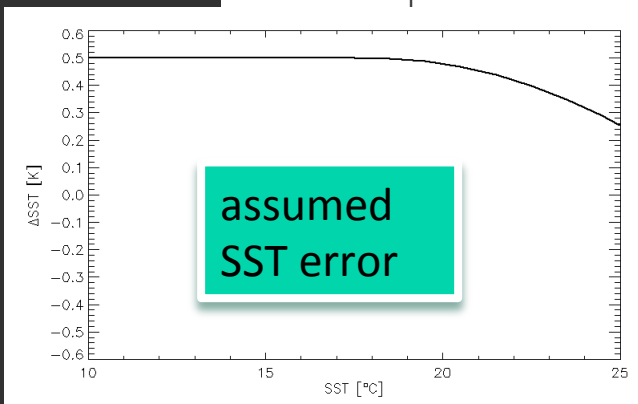
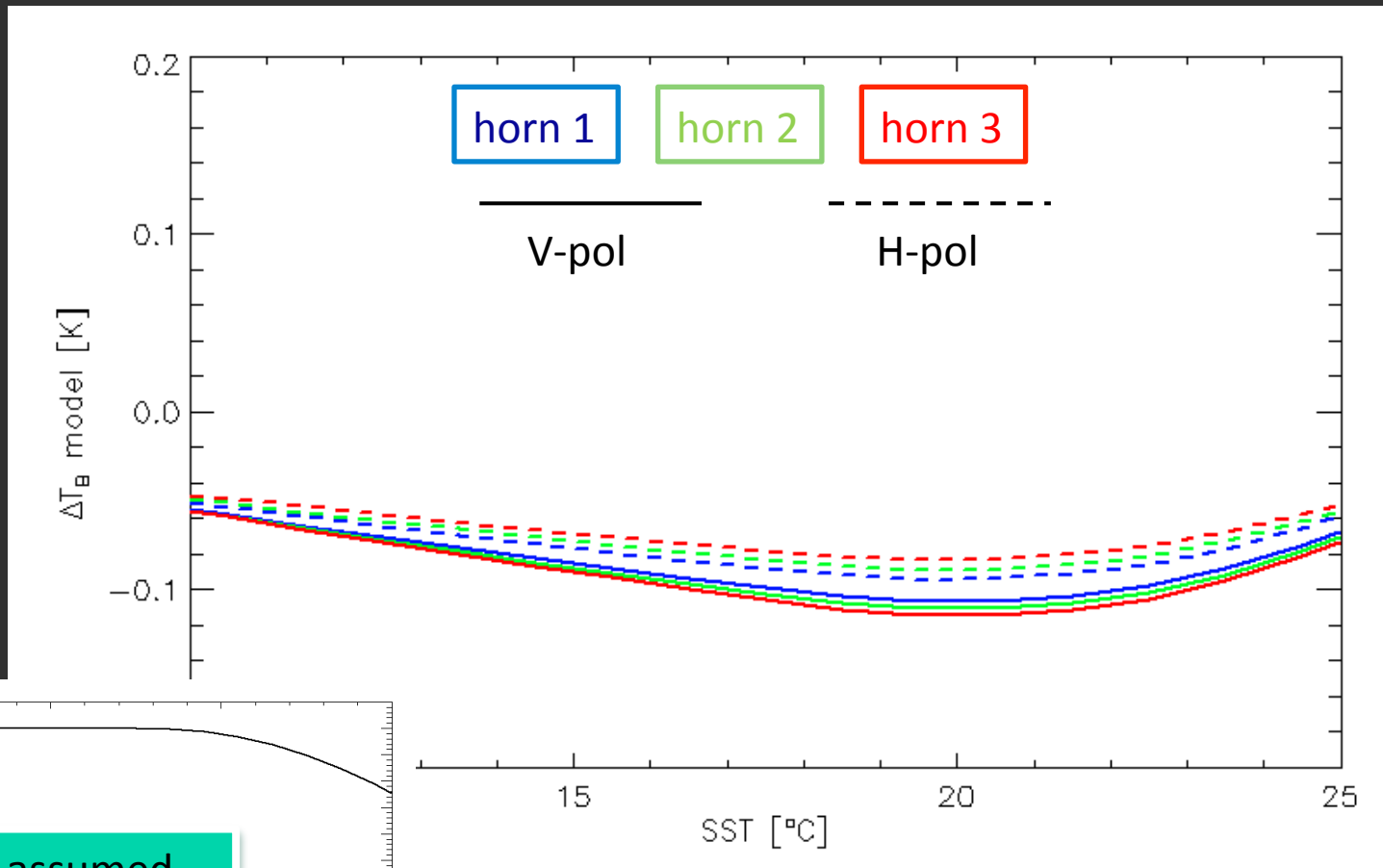
# Small Error in Sea Water Permittivity Model

$\text{Im}(\epsilon)$  changed by 0.3%



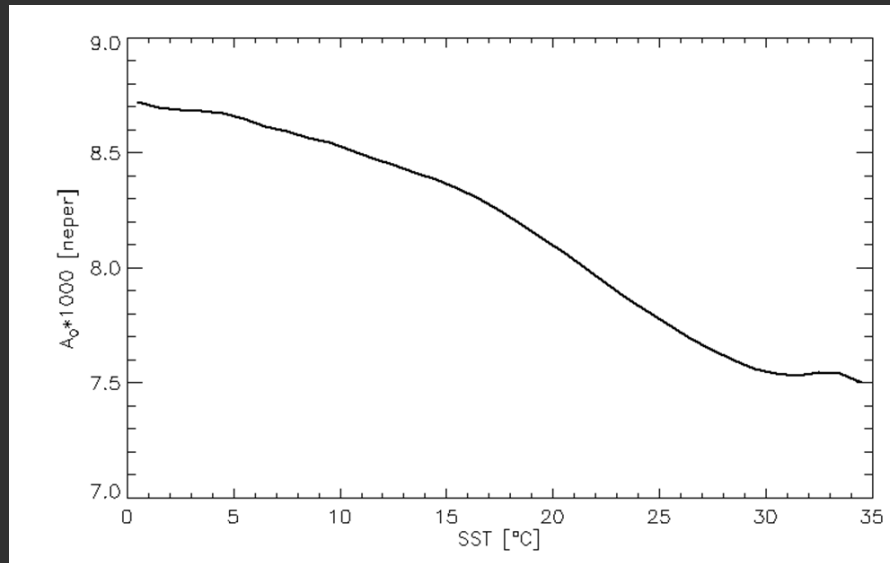
1 K TB error  
2 psu SSS error

# Small Error in Auxiliary SST Input (Reynolds OI SST without MW Data)



Similar signature as error in dielectric model

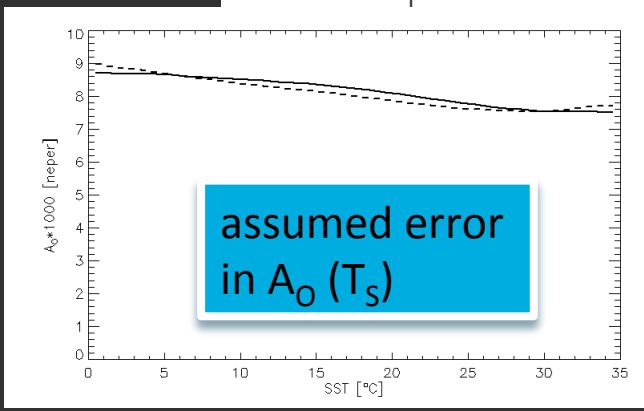
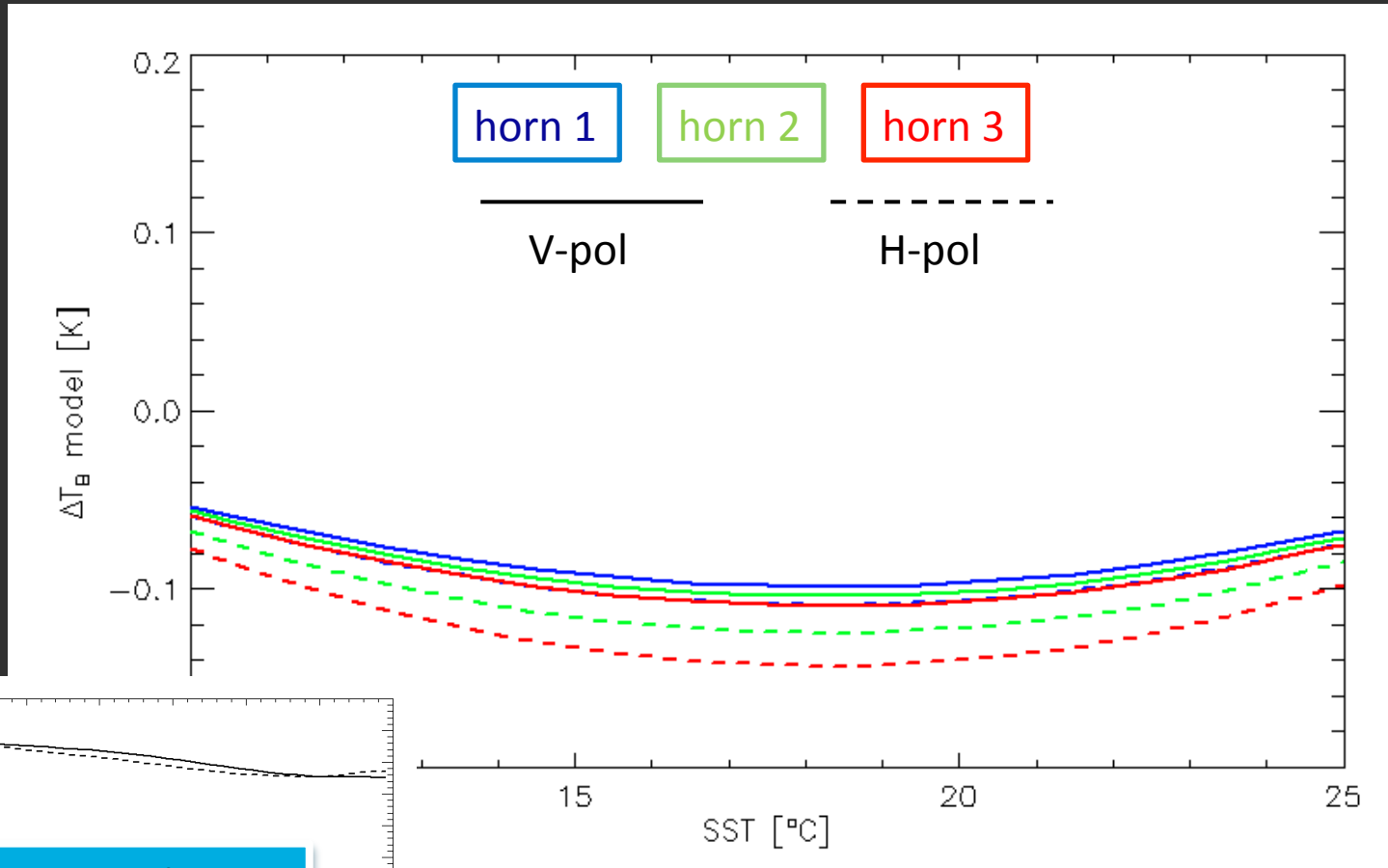
# Oxygen Absorption

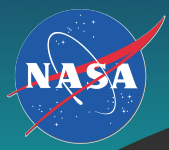


- $O_2$  absorption signal amounts to 3 – 5 K of TOA TB. It depends on atmospheric temperature, which correlates with SST.
- At L-band  $O_2$  absorption is not caused by the 60 GHz  $O_2$  band but due to non-resonant continuum, which is caused by transitions between degenerate (same energy) levels of the  $O_2$  molecule. This is very difficult to measure in laboratory experiments.
- The  $O_2$  absorption model used in V3.0 salinity retrievals is based on H. Liebe [1985], which itself quotes a paper by Mingelgrin [1974].
- We have made changes in the temperature dependence to match satellite TB with RTM TB in dry air at C-band and X-band.

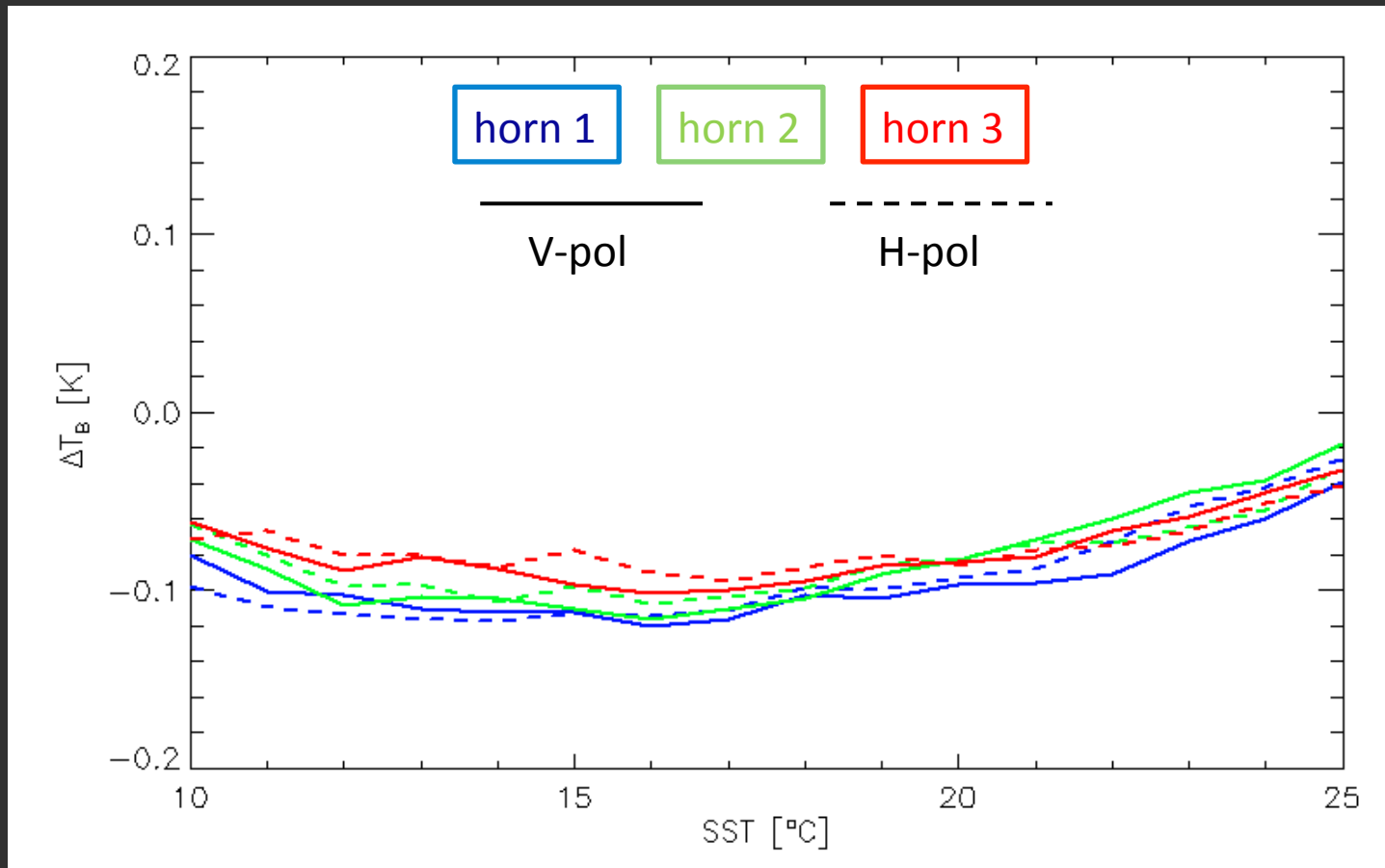
# Small Error in O<sub>2</sub> Absorption

## 2% Change of A<sub>0</sub> (T<sub>S</sub>)





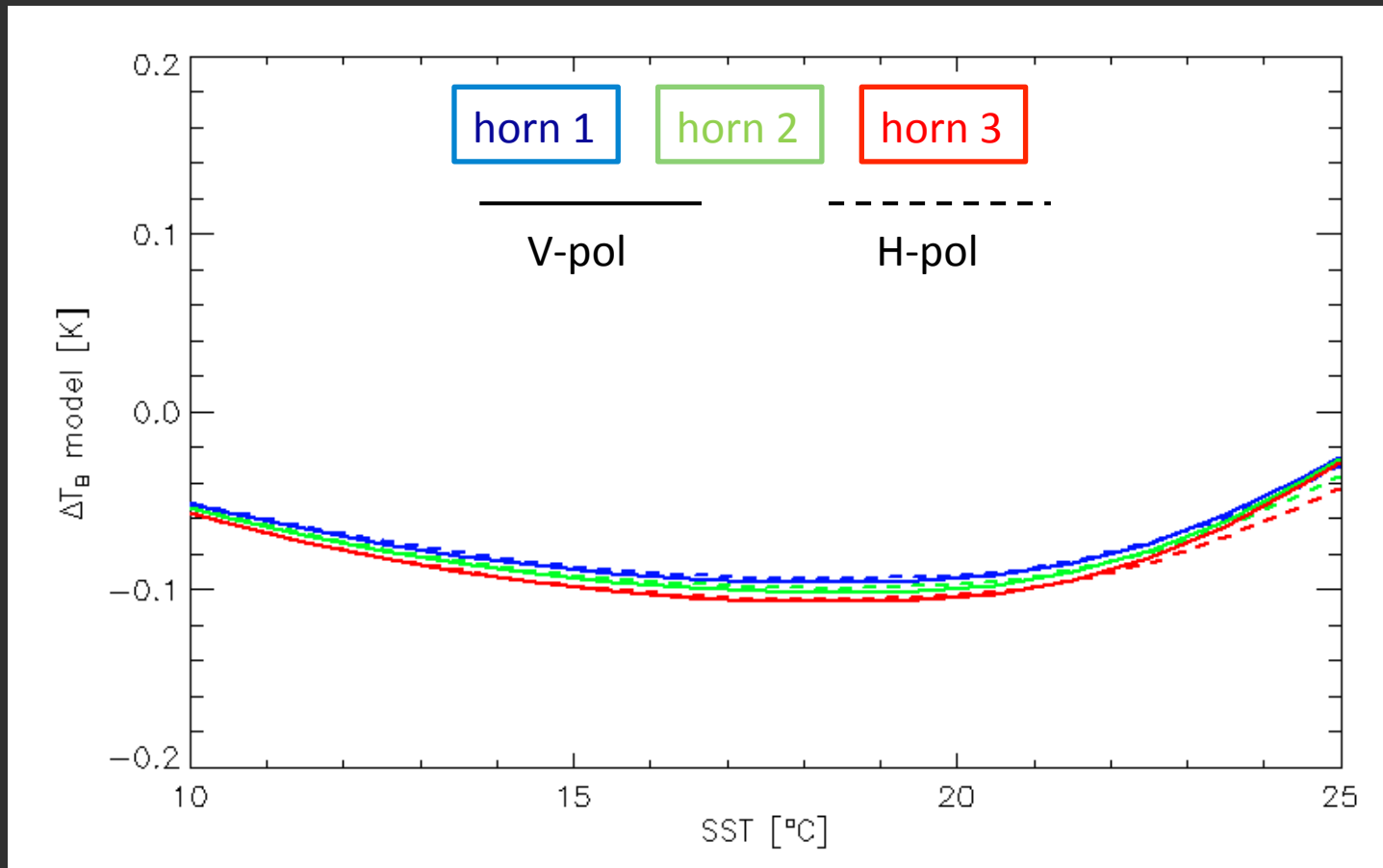
# Low Wind Speed Limit Channel Signature



Very Small Inter-channel Differences

# Combined Error

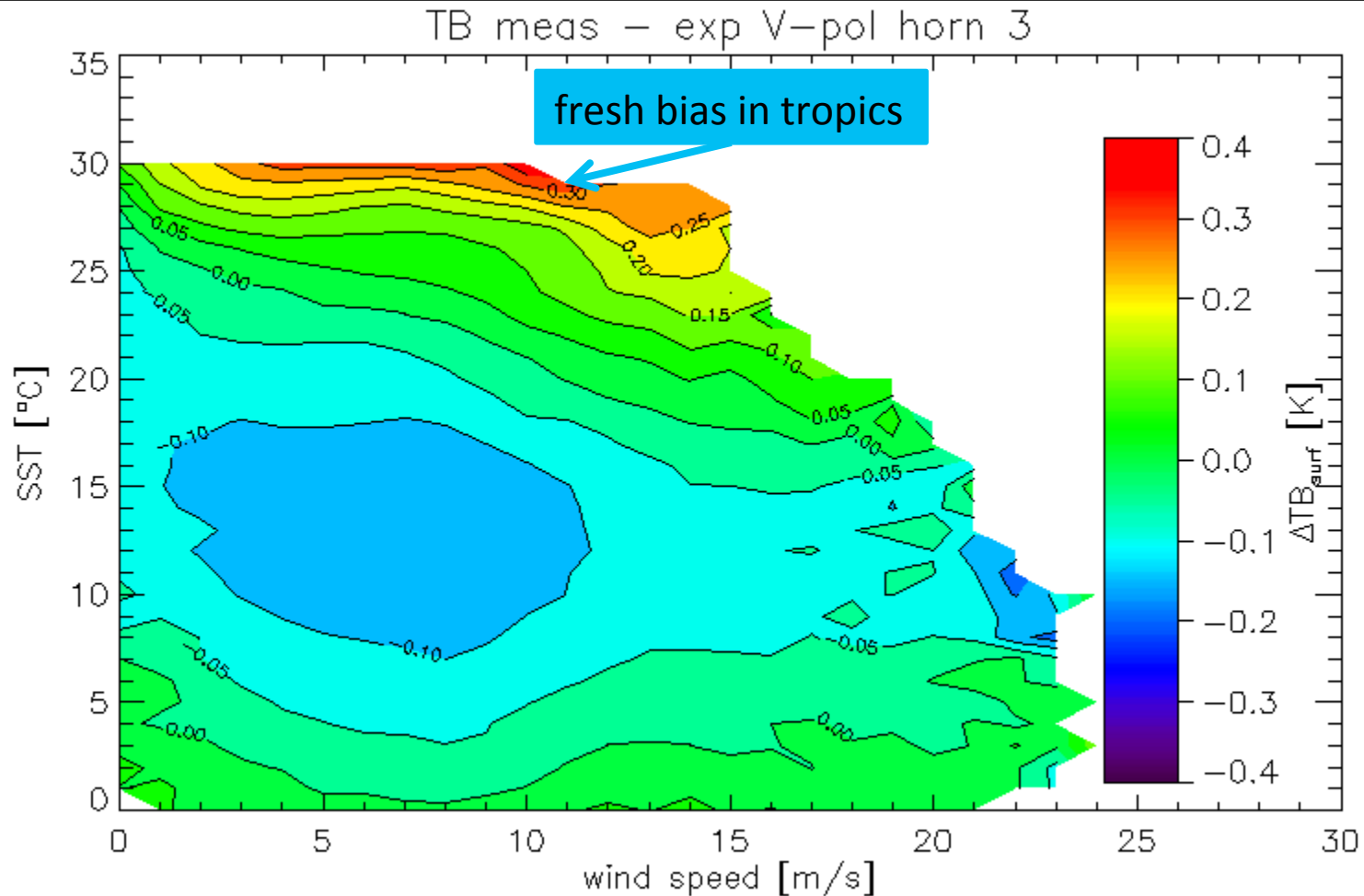
## Dielectric Model + O<sub>2</sub> Absorption



1 K TB error  
2 psu SSS error

# 2-Dimensional Stratification

## Fresh Biases in Tropics: Increase with Wind Speed



Fresh biases in tropics are neither caused by dielectric model nor  $O_2$  absorption, but by the modeled SST dependence in wind induced emissivity model.





# SST Dependence of Wind Induced Emissivity

Meissner, Wentz + Ricciardulli, JGR Special Issue

$$\Delta E_w (W, T_S) = \delta (T_S) \cdot \alpha (W) \quad \delta (T_S) = \frac{E_0 (T_S)}{E_0 (T_{ref})} \quad T_{ref} = 20^\circ C$$

In V2.0 the wind induced emissivity  $\Delta E_w$  had no SST dependence.

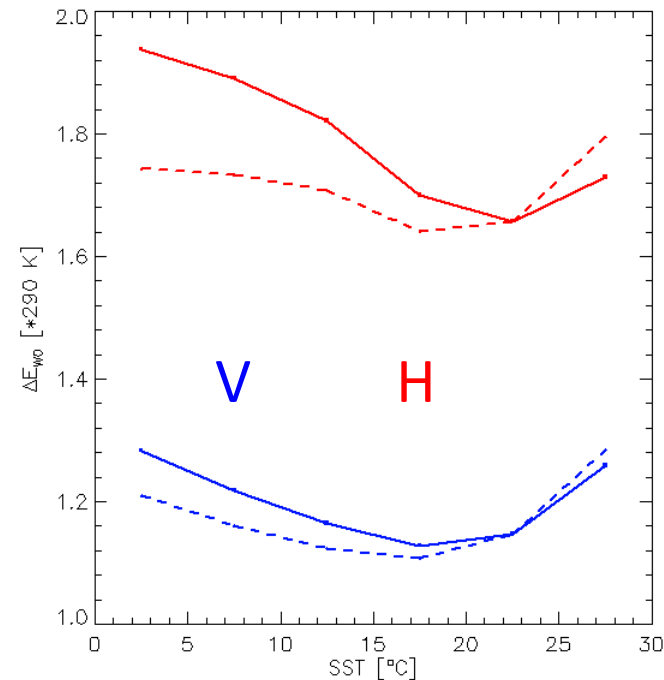
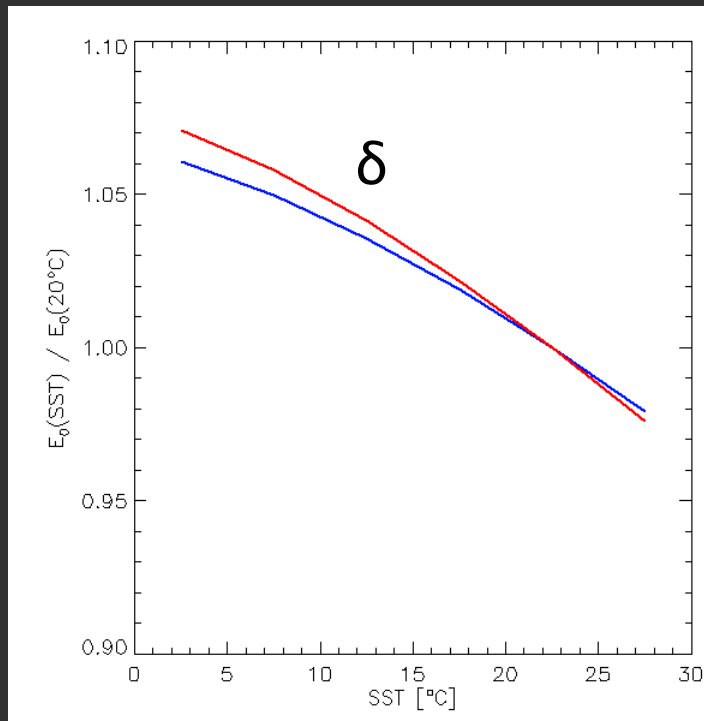
In V3.0 we have assumed that  $\Delta E_w$  has the same SST dependence as the specular emissivity  $E_0$ .

This is based on assuming geometric optics (tilted facets) and has been used in our RTM at higher frequencies.

It obviously breaks down at L-band in warm water. At L-band surface emission and scattering are different than at higher frequencies, as other physical mechanisms dominate.

# SST Dependence of Wind Induced Emissivity

$$\Delta E_W (W, T_S) = \delta (T_S) \cdot \alpha (W) \quad \delta (T_S) = \frac{E_0 (T_S)}{E_0 (T_{ref})} \quad T_{ref} = 20^\circ C$$



full:  $\Delta E(T_S)$  for average wind speed.  
 dashed: divide by  $\delta$ . ideally should be flat.

The assumed SST dependence **improves the model up to 20°C** but **makes it worse in very warm water**.

# Summary

- SST dependent biases need to be stratified in **2 dimensions as function of SST and wind speed.**
- Low wind speed limit:
  - Reveals biases in dielectric model, oxygen absorption, auxiliary input SST
  - The observed biases are small ( $\approx 0.1$  K)
  - The causes have similar signature and are thus hard to separate on that level
- Moderate - Higher wind speeds
  - Reveals biases in surface roughness model
  - Larger (up to 0.3K)
  - **Assumption that the  $T_s$  dependence of  $\Delta E_w$  can be modeled by the specular emissivity  $E_0$  breaks down at high  $T_s$**

# Going Forward

- Tweaking dielectric model  $\epsilon$  or oxygen absorption model  $A_o$ 
  - Likely futile.
  - Very small (0.1 K).
  - Ambiguous signature.
  - Physics of electromagnetic radiation has consequences at higher frequencies, which would need to be reanalyzed.
- Most important step in mitigating the large scale ST dependent biased is to adjust the SST dependence of  $\Delta E_w$

$$\Delta T_B(W, T_S) \approx \beta(T_S) + \delta'(T_S) \cdot \alpha(W) \cdot T_S$$

Small change in  $\epsilon$  or  $A_o$

adjust SST dependence of  $\Delta E_w$



# Backup Slides

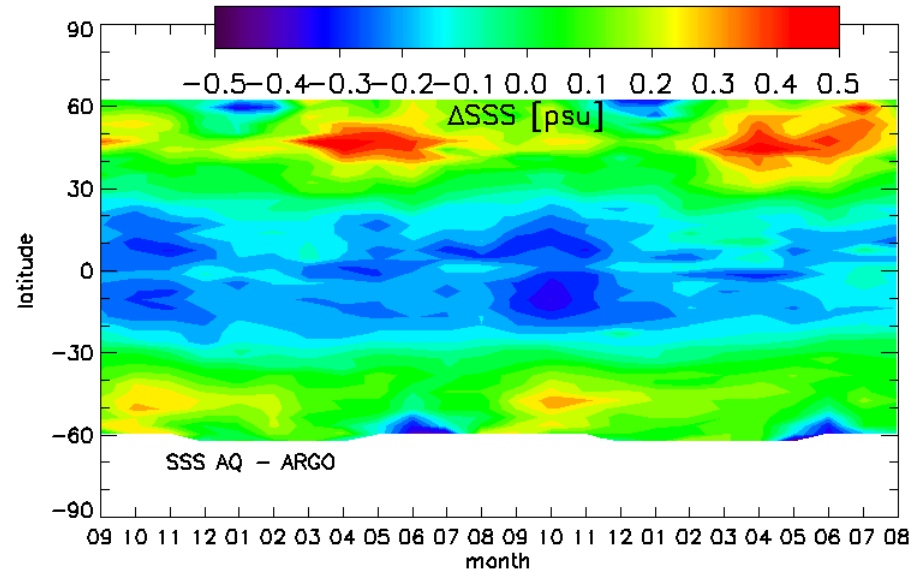
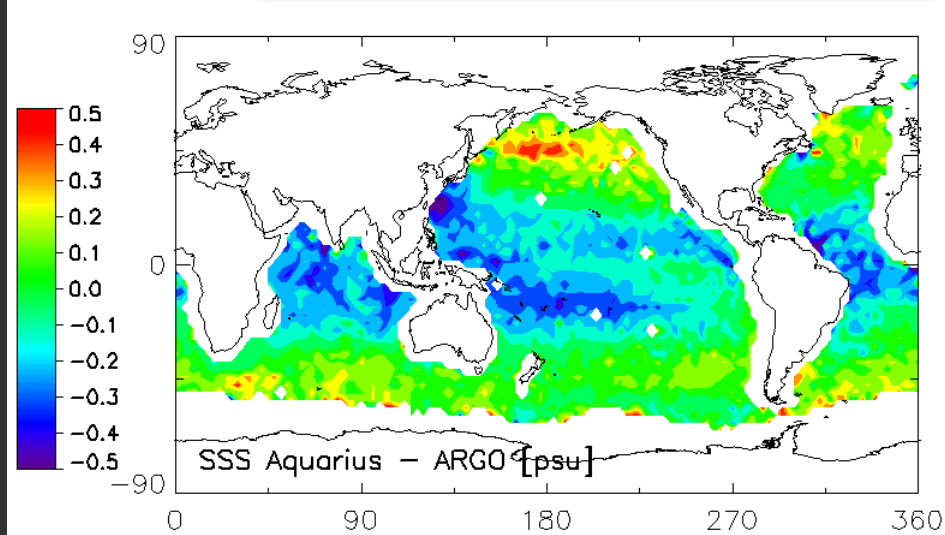
# Performance: Local Biases

## Aquarius - ARGO

2-year: 09/2011 – 08/2013

Latitude

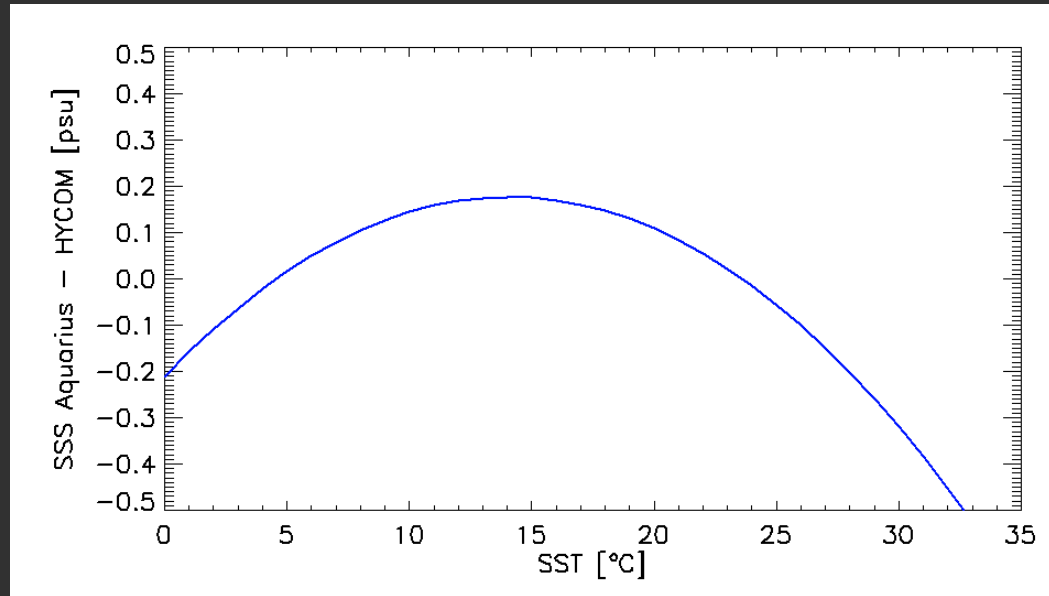
Month



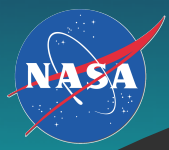
- Fresh biases in tropics and subtropics.
- Salty biases at mid-high latitudes.
  - Biggest in N Pacific.
- Seasonal pattern.

# SST Dependent Biases

## Post-hoc Correction (1)



- **Rain has been filtered out. Bias is not due to stratification.**
- **Sensor calibration: Aquarius is globally adjusted to HYCOM. Rain is not filtered when running calibration, which makes Aquarius too salty. But the effect is very small for global average: 0.04 psu.**
- **Not caused by residual RFI contamination: Aggressive filtering for possible RFI (see S. Brown) does not change it significantly.**



# Impact on Performance

## Triple Colocation Statistics

### Global. Rain Filtered

AQ – HYCOM – ADPRC ARGO Differences $\sigma$ [psu] 3° monthly averages			
	AQUARIUS – HYCOM	AQUARIUS – ARGO	HYCOM – ARGO
V3.0	0.29	0.31	0.25
SST Bias adjusted	0.24	0.27	0.25

Estimated Individual Errors $\sigma$ [psu] AQ – HYCOM – ADPRC ARGO $\sigma$ [psu] 3° monthly averages (1.5° monthly averages)			
	AQUARIUS	HYCOM	ARGO
V3.0	<b>0.24</b> (0.27)	0.16	0.19
SST bias adjusted	<b>0.18</b> (0.22)	0.16	0.19