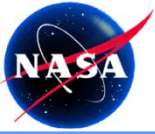


# Characterization and Correction of the Aquarius TB Drift using On-Earth References

Shannon Brown and Sidharth Misra  
Jet Propulsion Laboratory, California Institute of Technology  
SMOS/Aquarius Workshop  
April 16, 2013

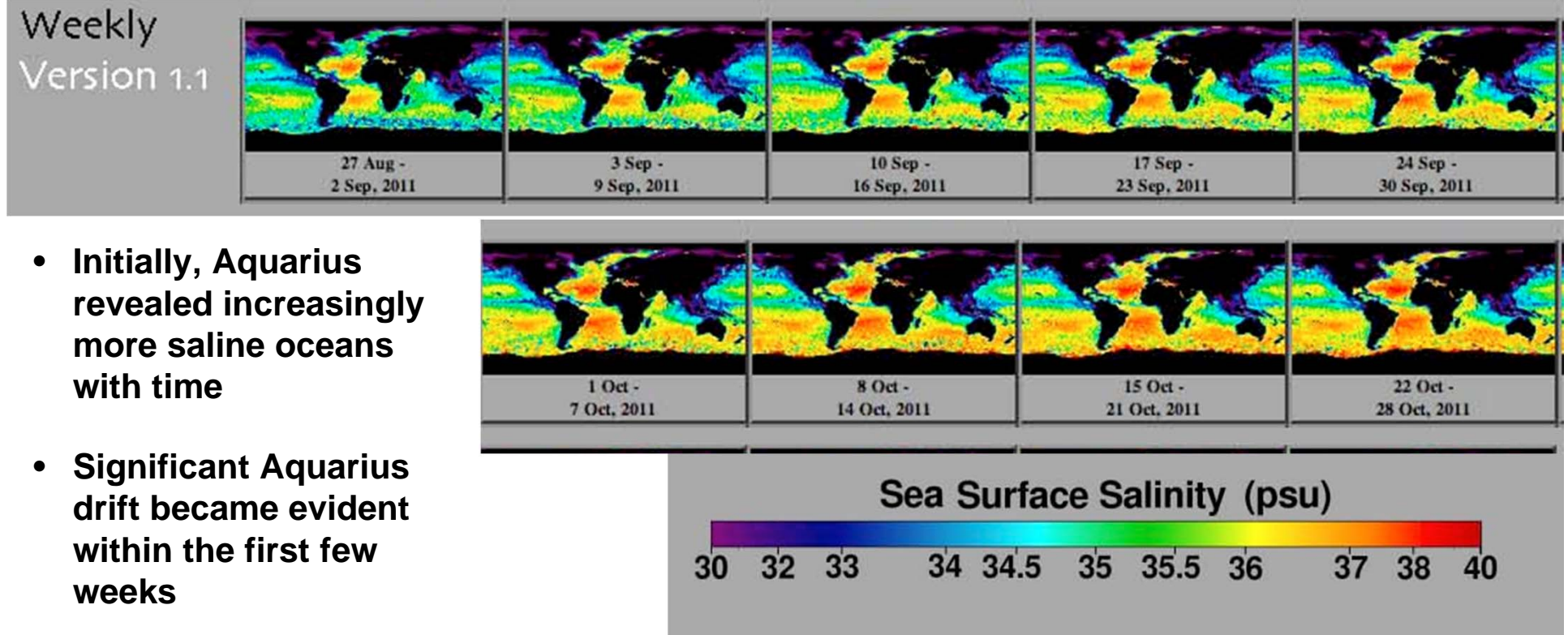




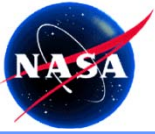
# Need for Stability



- A main mission objective is for Aquarius to provide monthly global salinity maps for climate studies
  - Critical that any spatial or temporal systematic biases be characterized and corrected to  $< 0.2$  psu
  - Requires TB stability of about  $0.1K$ , which is a challenging requirement for the radiometer

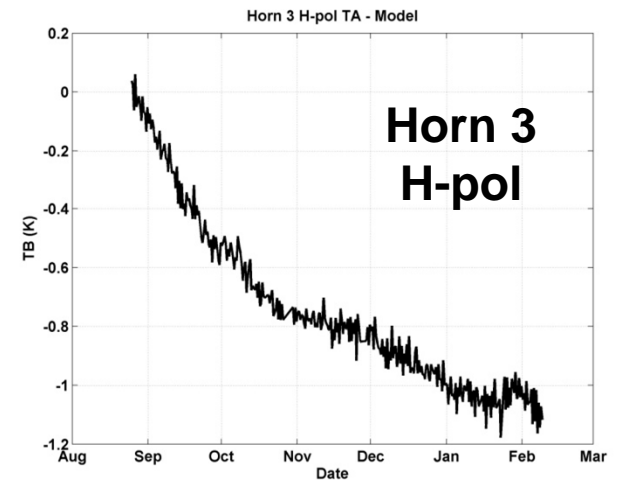
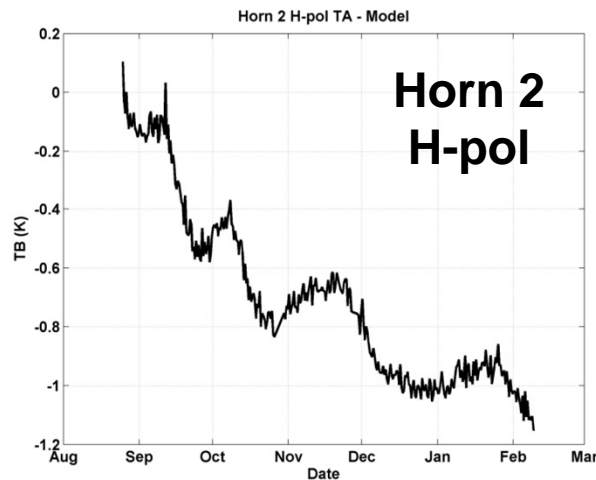
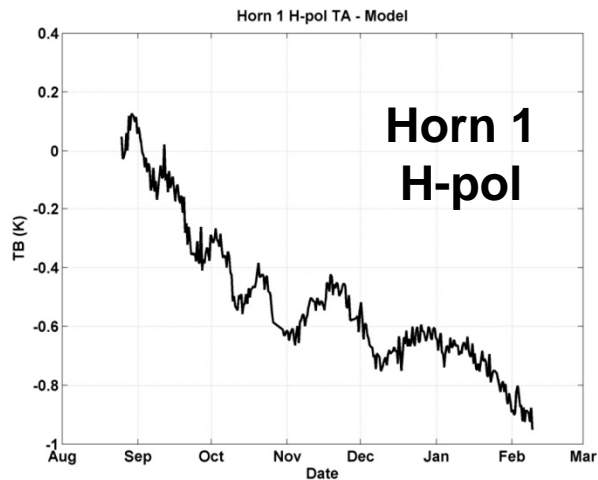
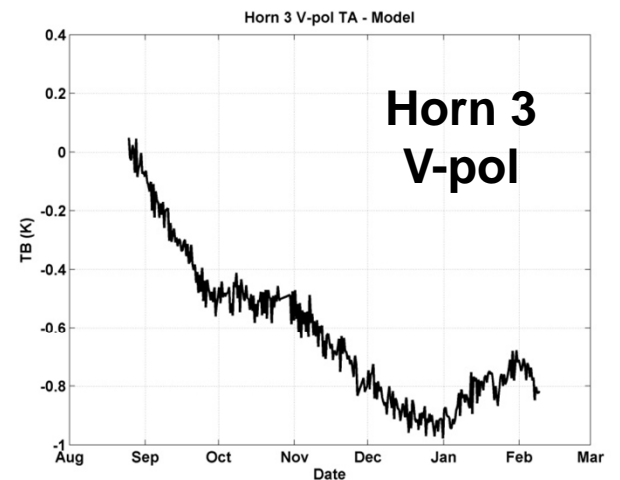
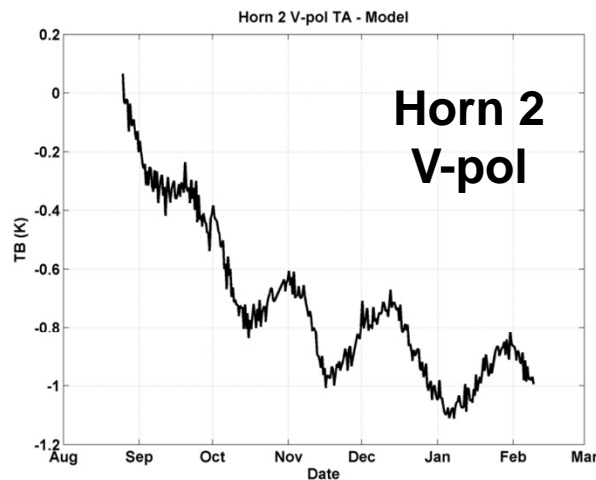
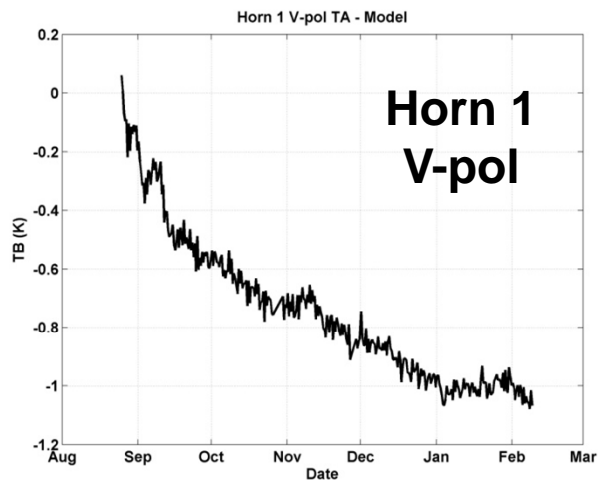


- Initially, Aquarius revealed increasingly more saline oceans with time
- Significant Aquarius drift became evident within the first few weeks

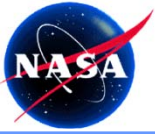


# Aquarius Drift Relative to Ocean Model

- Global average difference between observed and modeled TBs using HYCOM salinity reveals drift in all channels
  - Data filtered for low wind conditions, negligible galactic contribution and weak faraday rotation

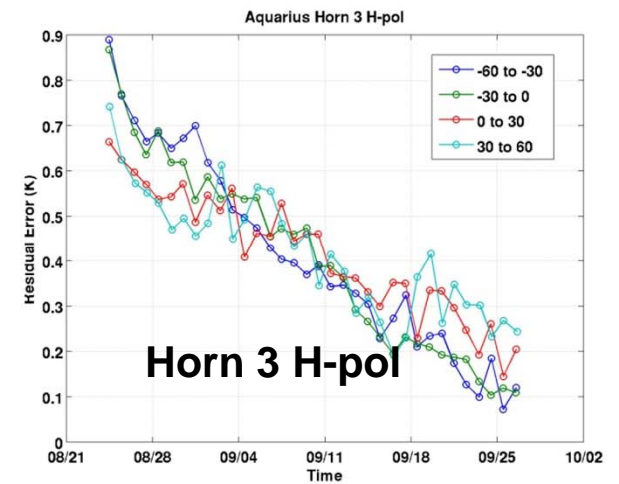
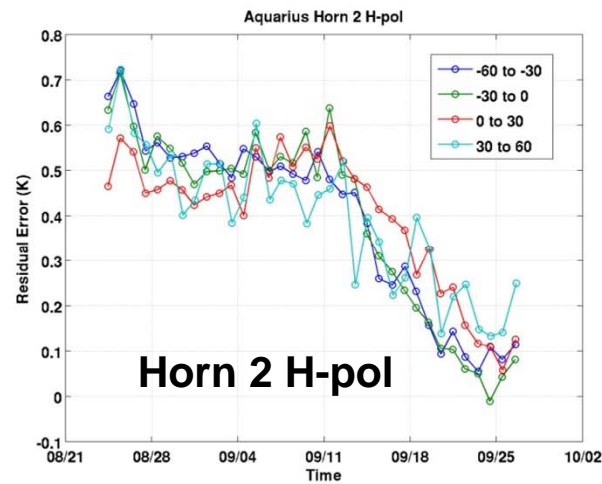
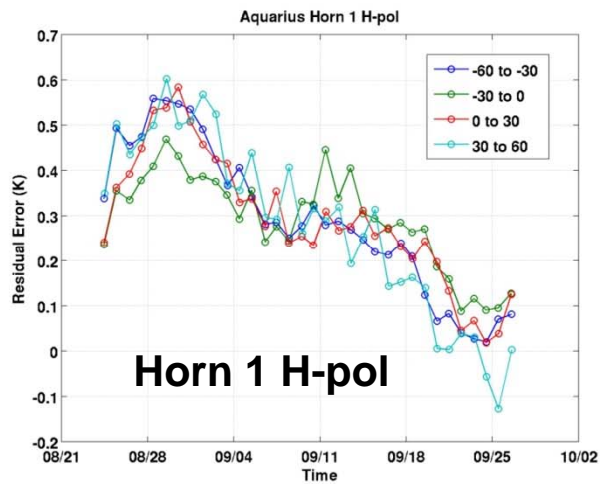
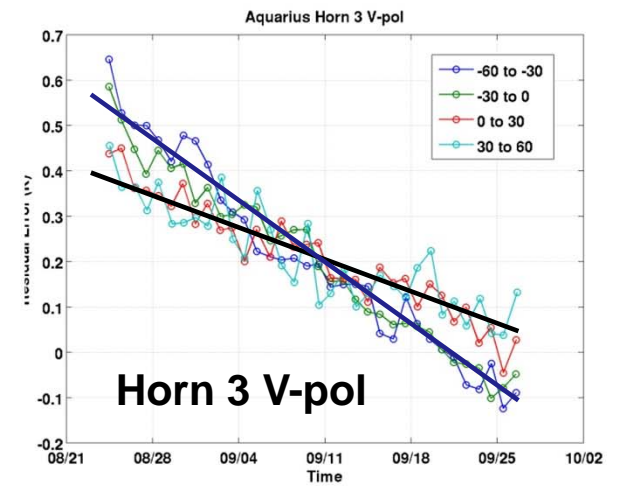
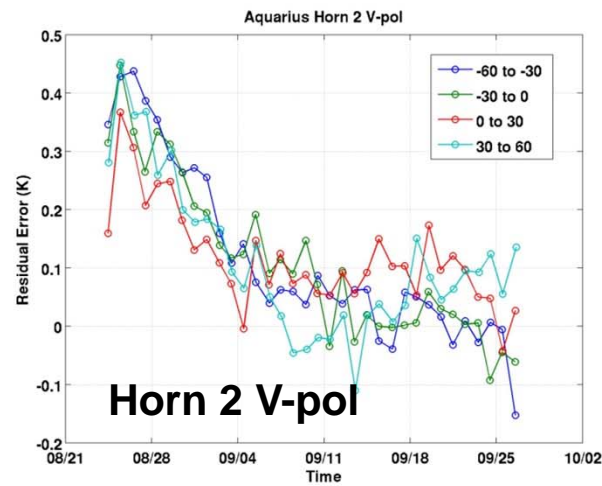
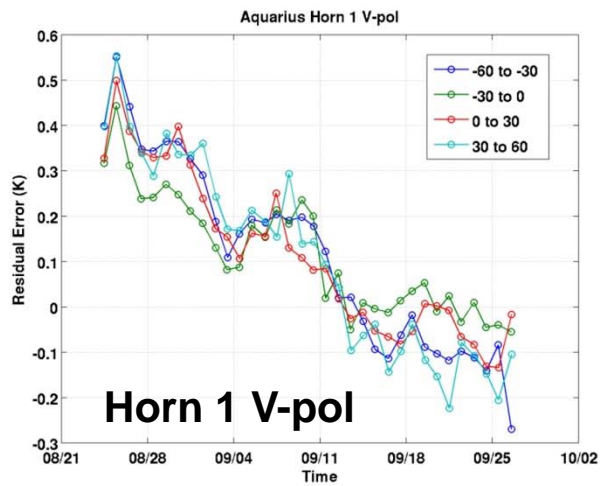




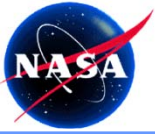


# But which is the true drift?

- Different trends observed when data are binned zonally
- Need to ensure that drift calibration doesn't remove real signal not captured in the ocean model



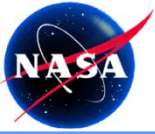




# Drift Characterization and Correction Approach



- **Extend a technique originally developed to stabilize the climate calibration of the water vapor radiometers on the NASA altimeter missions**
  - Use known reference targets at several brightness temperature levels to track both the gain and offset stability of the radiometer -> *important for soil moisture applications*
  - Look for consistency between references to isolate instrument contribution from systematic model errors
- **Develop model references suitable for L-band and characterize their uncertainty at various time scales**
  - Particular to Aquarius, this implies assessing the timescale for which the model uncertainty is less than 0.1K



# Natural On-Earth Calibration Targets for Stability Tracking



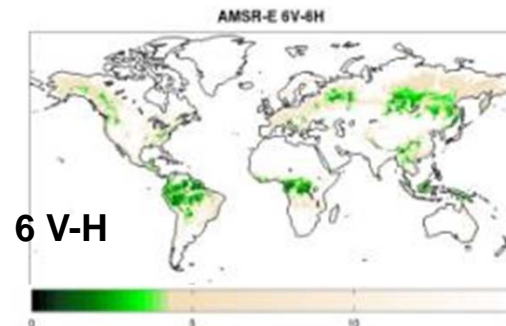
- Antarctica (**mid-range TB ~200K**)

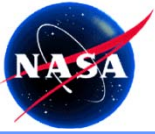
- Select areas with stable temperature (V-pol TB) and snow structure (H-pol TB)
- Radiative transfer model used to determine L-band TB over time using in-situ temperature and higher frequency microwave observations as input



- Rainforest (**warm end TB ~280K**)

- Select depolarized heavily vegetated areas within the Aquarius swath
- Use ancillary data to determine canopy temperature to track Aquarius calibration



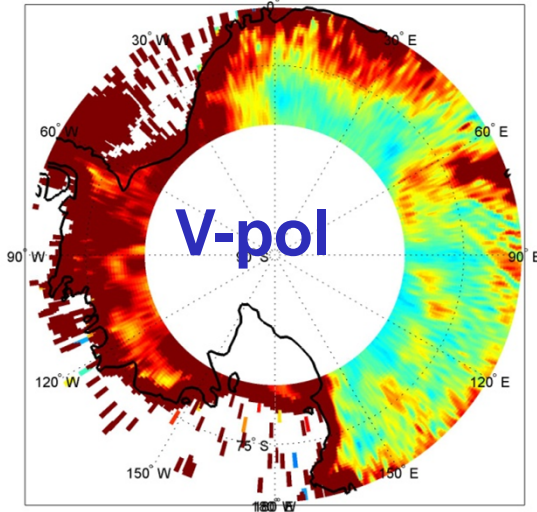


# Aquarius L-band Temporal Stability (Sep'11-July'12)



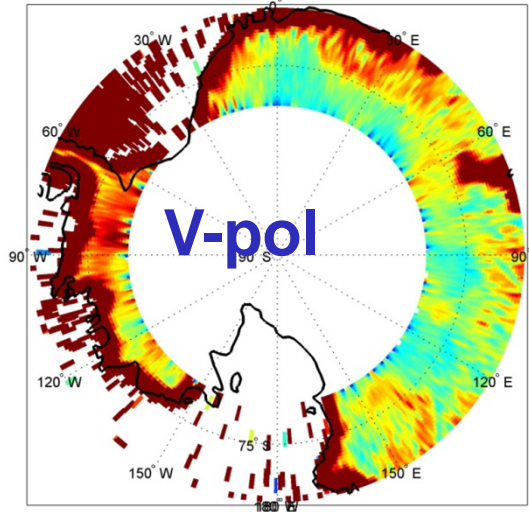
$\theta = 28.7^\circ$

Aquarius Horn 1 V-pol Stability (K)



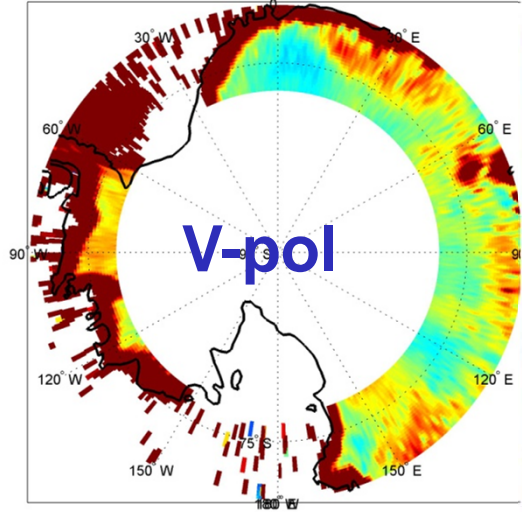
$\theta = 37.8^\circ$

Aquarius Horn 2 V-pol Stability (K)

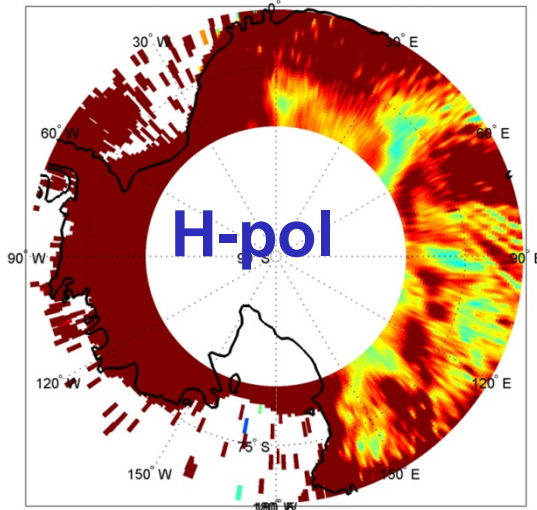


$\theta = 45.6^\circ$

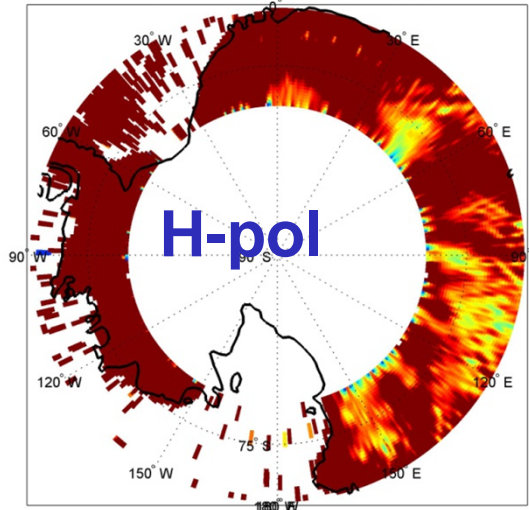
Aquarius Horn 3 V-pol Stability (K)



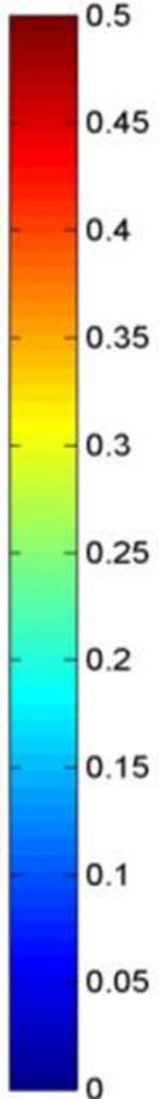
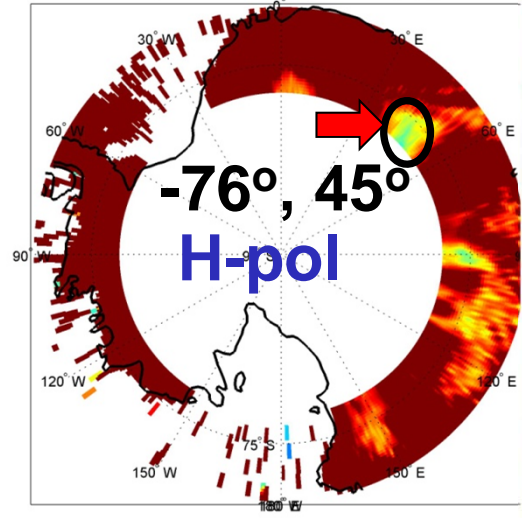
Aquarius Horn 1 H-pol Stability (K)



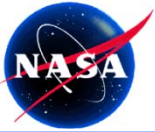
Aquarius Horn 2 H-pol Stability (K)



Aquarius Horn 3 H-pol Stability (K)

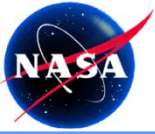






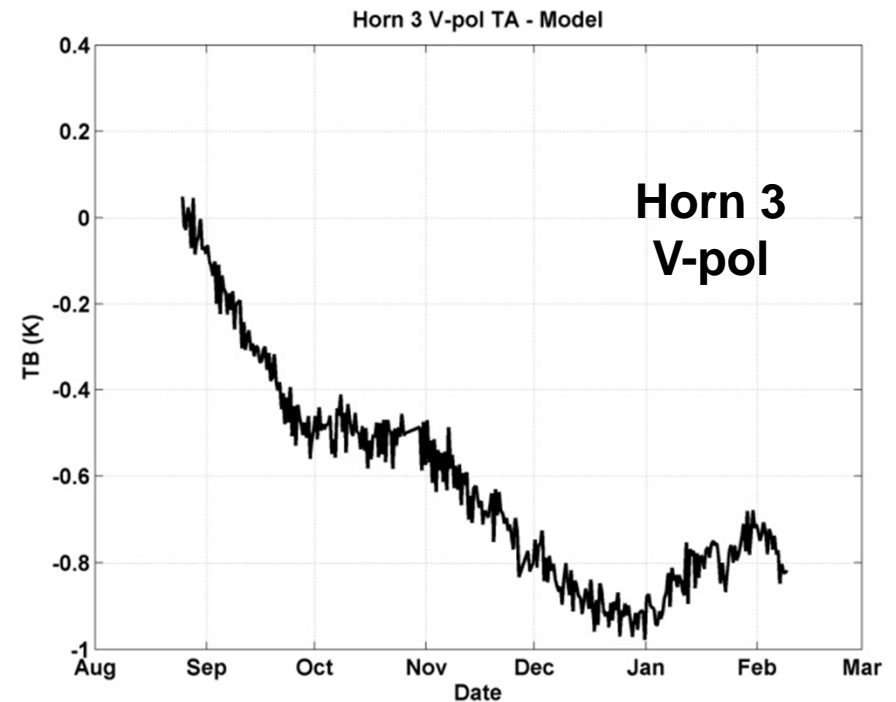
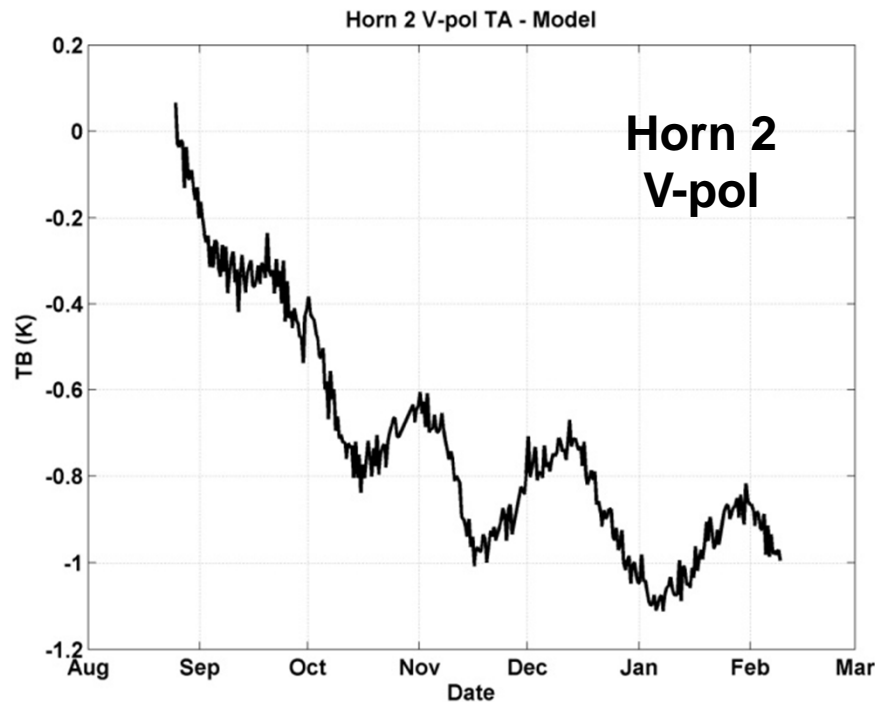
# Antarctica Ice Model

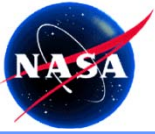
- **Coupled thermodynamic/radiative transfer model**
  - MEMLS model (Wiesmann and Matzler, 1999) used to compute upwelling TB
  - Heat transport equation solved for ice  $T(z,t)$  profile
- **Tuned using multi-frequency AMSR-E TBs and in situ surface temperature data**
  - Generated random snow layer structures to find a realization that gave best fit 6-37 GHz V&H-pol TBs
  - Ice dielectric model from Tiuri et al., (1984) gave best fit AMSR-E data
- **Dynamic and static versions of model**
  - Snow structure assumed constant in static model
    - Limits ability for H-pol, particularly at higher incidence angle
  - Dynamic model varies surface layer temperature and snow density to fit daily 6-37 GHz observations (e.g. WindSat, AMSR-2)



# Nature of the Drift

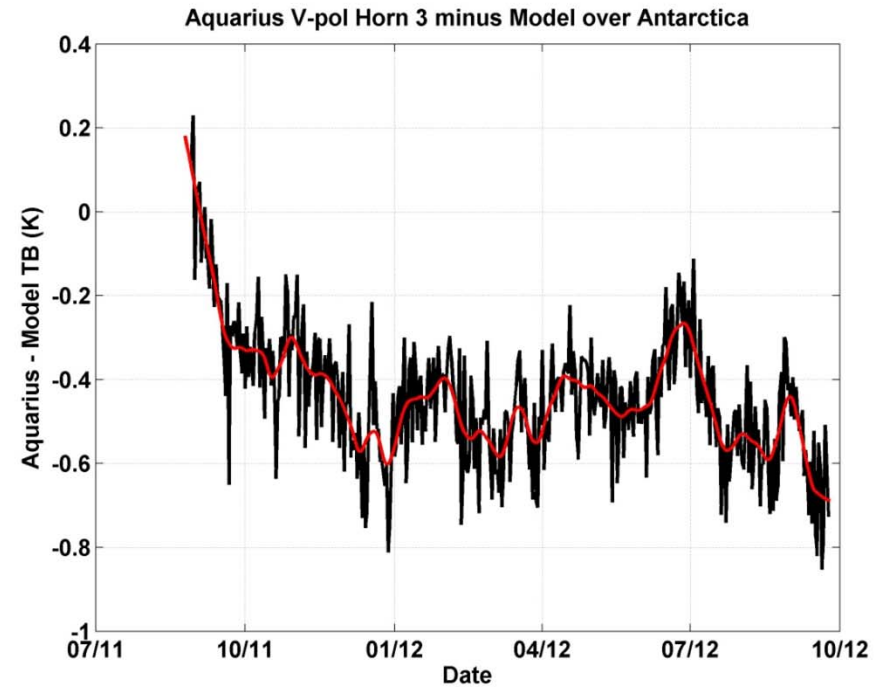
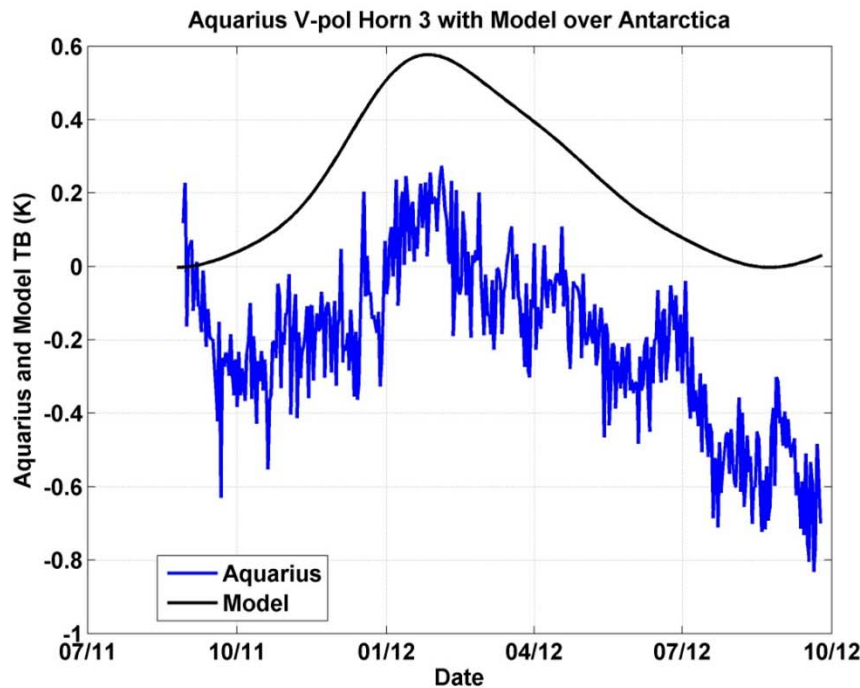
- Ocean comparisons show long period exponential trend ( $\sim 1\text{K}$  level) and shorter period oscillations ( $\sim 0.2\text{K}$  level)
  - Are these observed in the Antarctic and rainforest comparisons?
  - If so, do they have the same magnitude ( $\rightarrow$  offset) or are they scaled ( $\rightarrow$  gain)?
    - Gain drift will be  $\sim 0.5\text{x}$  over Antarctica ( $\sim 0.5\text{K}$ ) and  $\sim 0.05\text{x}$  ( $\sim 0.05\text{K}$ ) over rainforest since Aquarius calibration referenced to internal  $\sim 300\text{K}$  load



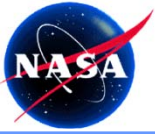


# Aquarius – Antarctica TB Model

- Difference between Aquarius and Antarctica TB model shows  $\sim 0.5\text{K}$  long term drift, but similar magnitude short term oscillations
  - Horn 3 V-pol shown here as an example since ice model performs best near Brewster angle (minimizes sensitivity to surface variability, wind crusts)
- Long term drift consistent with a gain drift
  - first implemented a long term exponential gain correction fit to ocean model

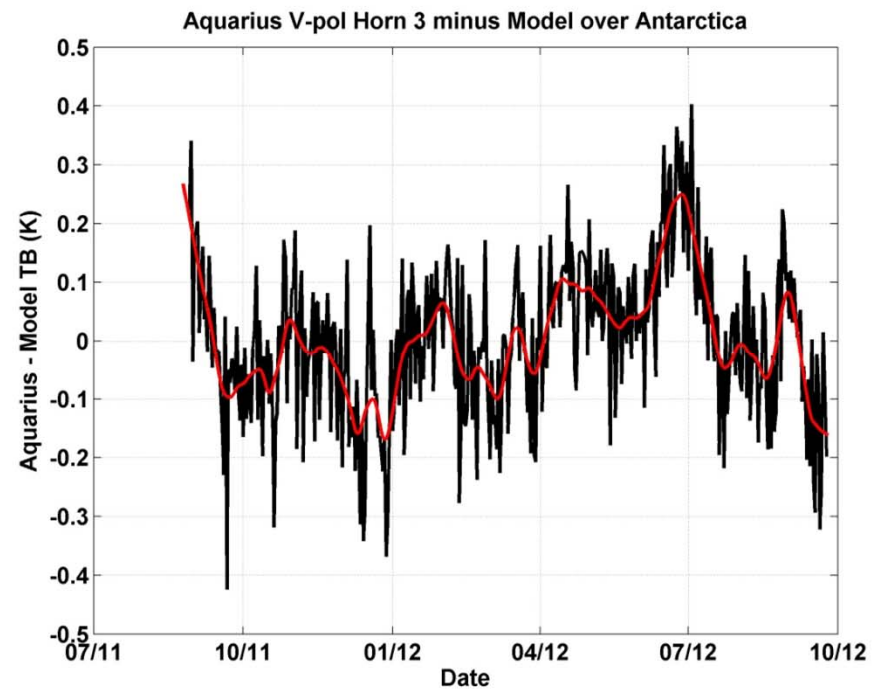
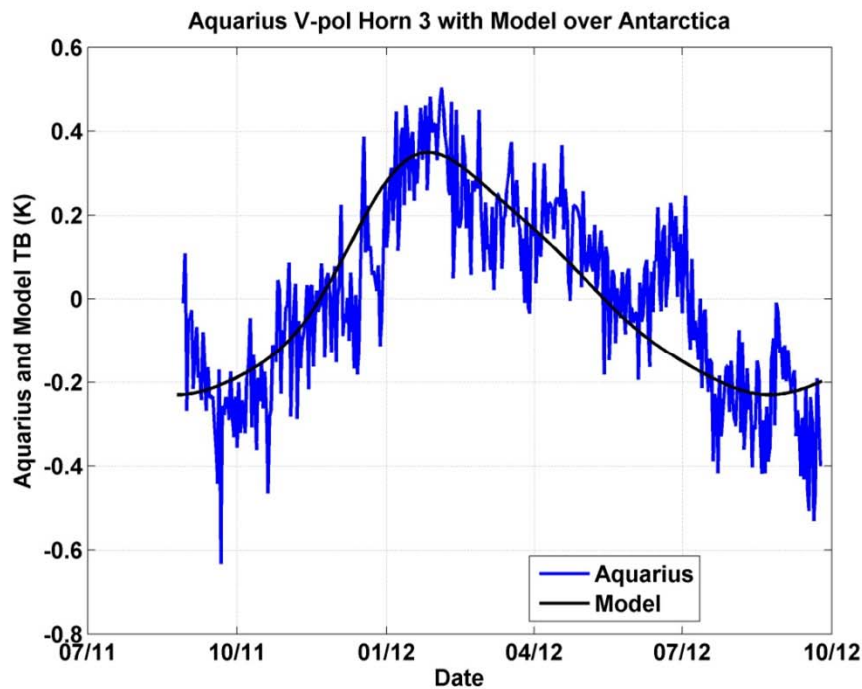




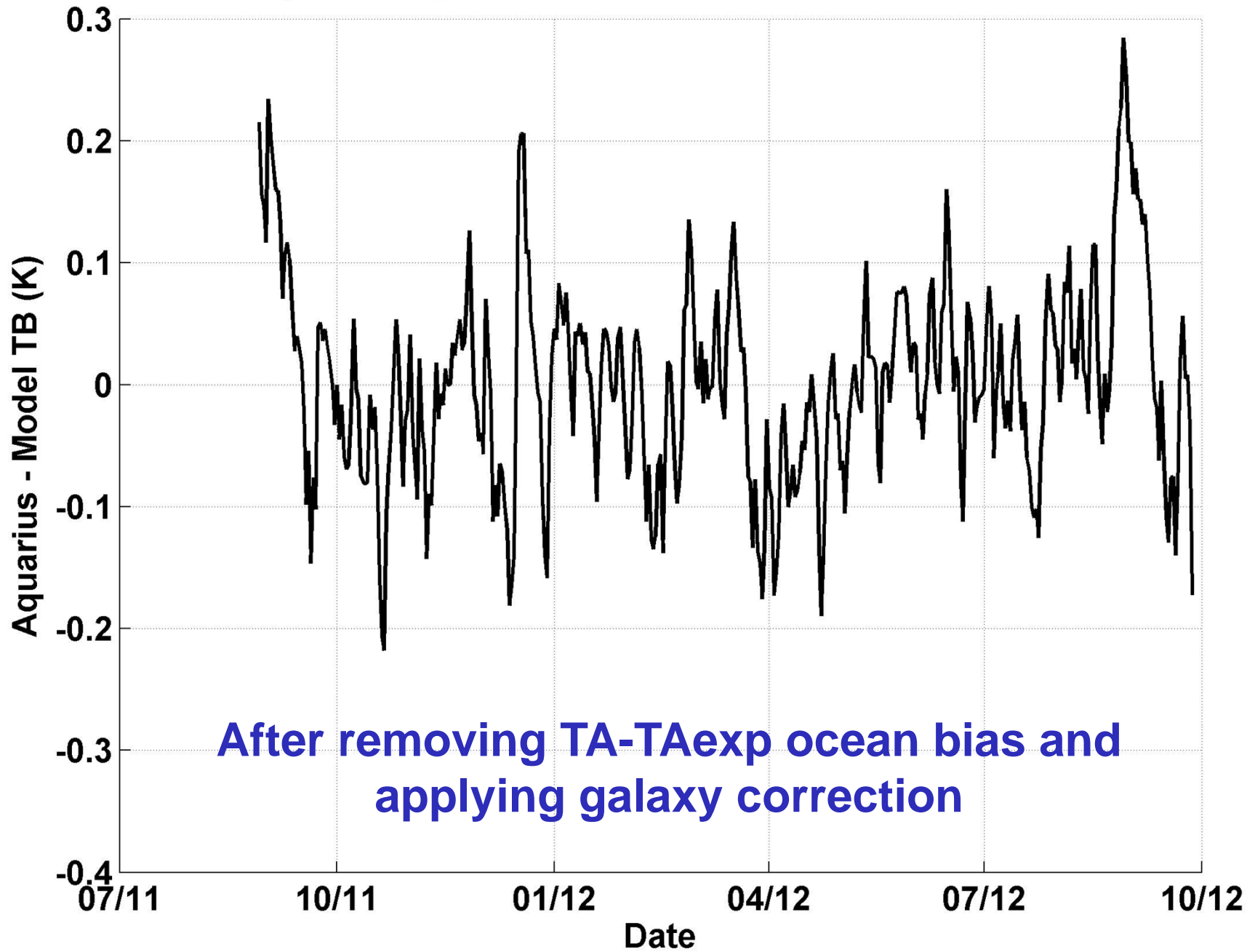


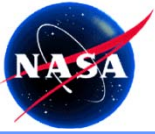
# With Exponential Gain Correction

- Exponential TND correction removes long term drift over Antarctica
  - Note, if offset correction was applied instead of a gain correction, a  $\sim +0.5\text{K}$  drift would have been introduced over Antarctica
- Short term oscillations remain
  - Instrument or ice model?



# Aquarius V-pol Horn 3 minus Model over Antarctica

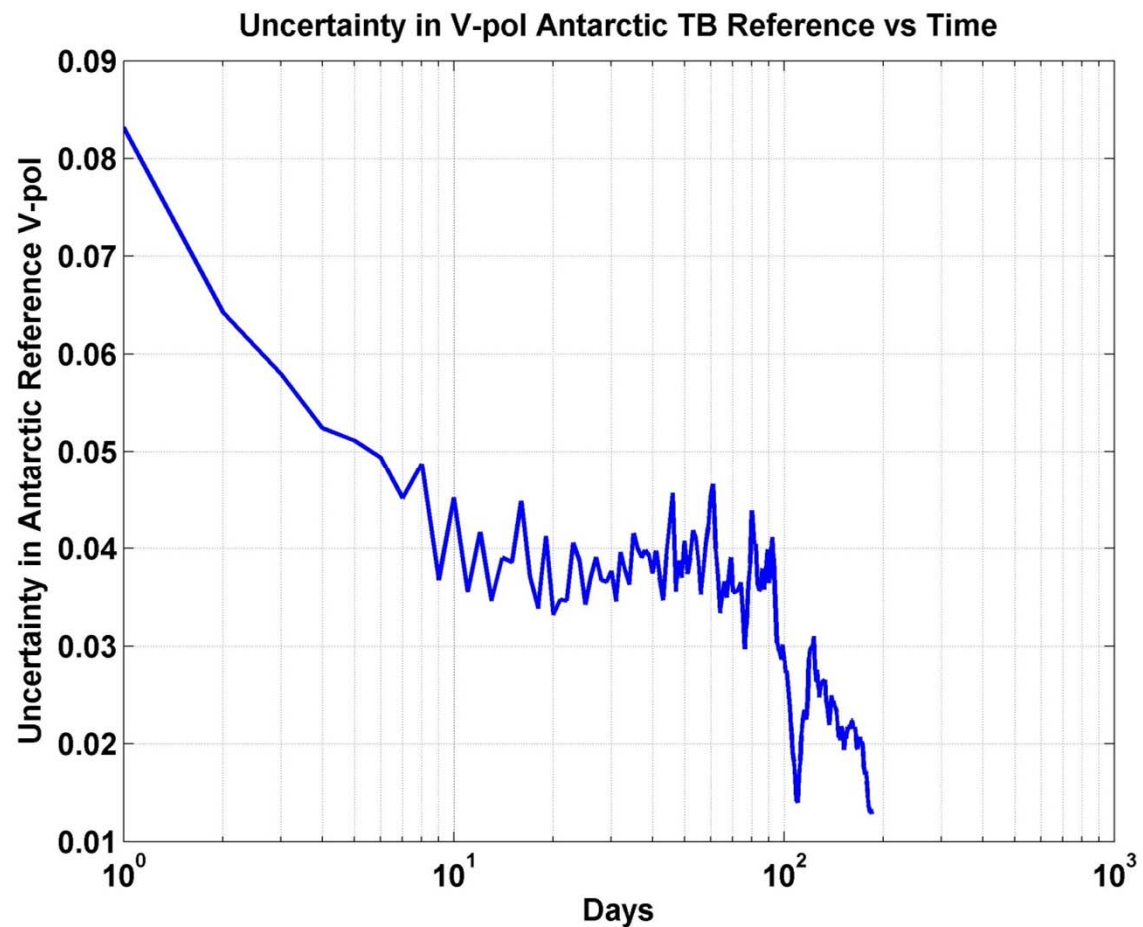




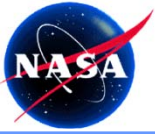
# Uncertainty in Antarctic Reference: V-pol



- Antarctic reference for V-pol sensitive to 0.1K variability on daily time scales and <0.05K variability on > 10 day times scales



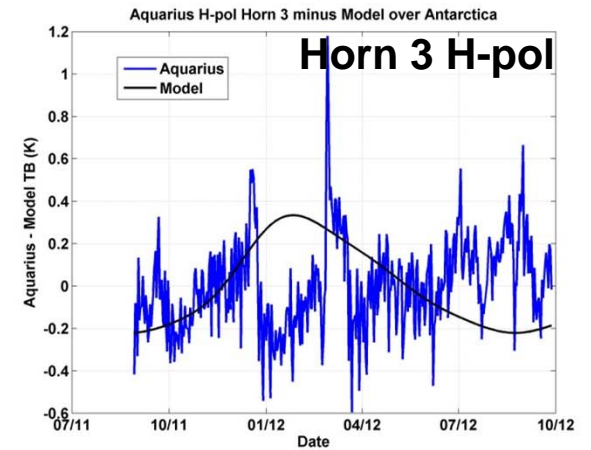
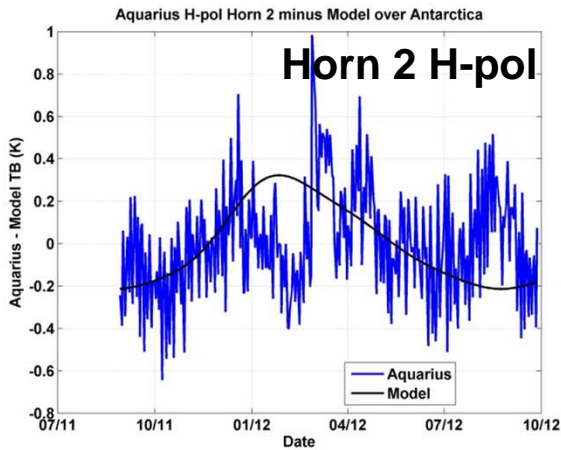
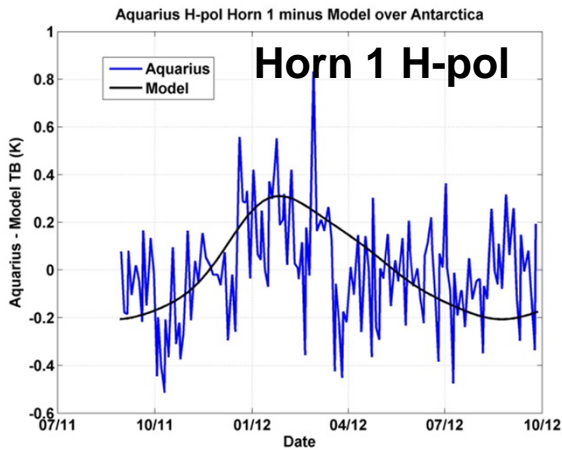




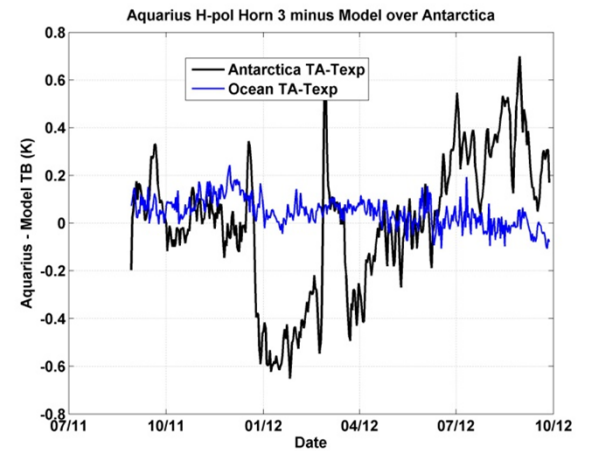
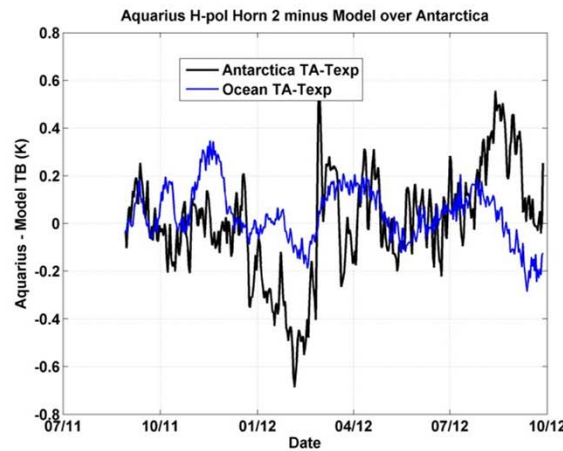
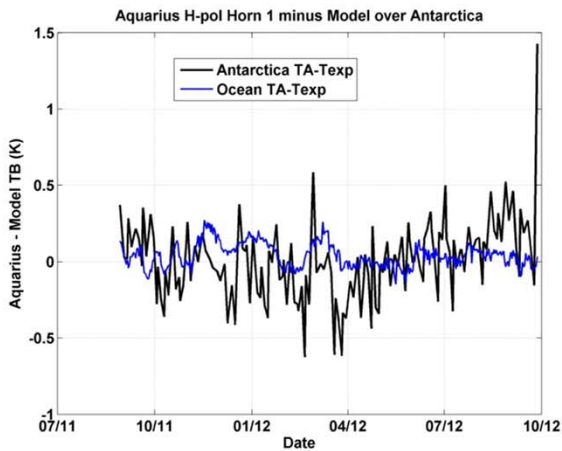
# H-pol Channels after Exponential Gain Correction

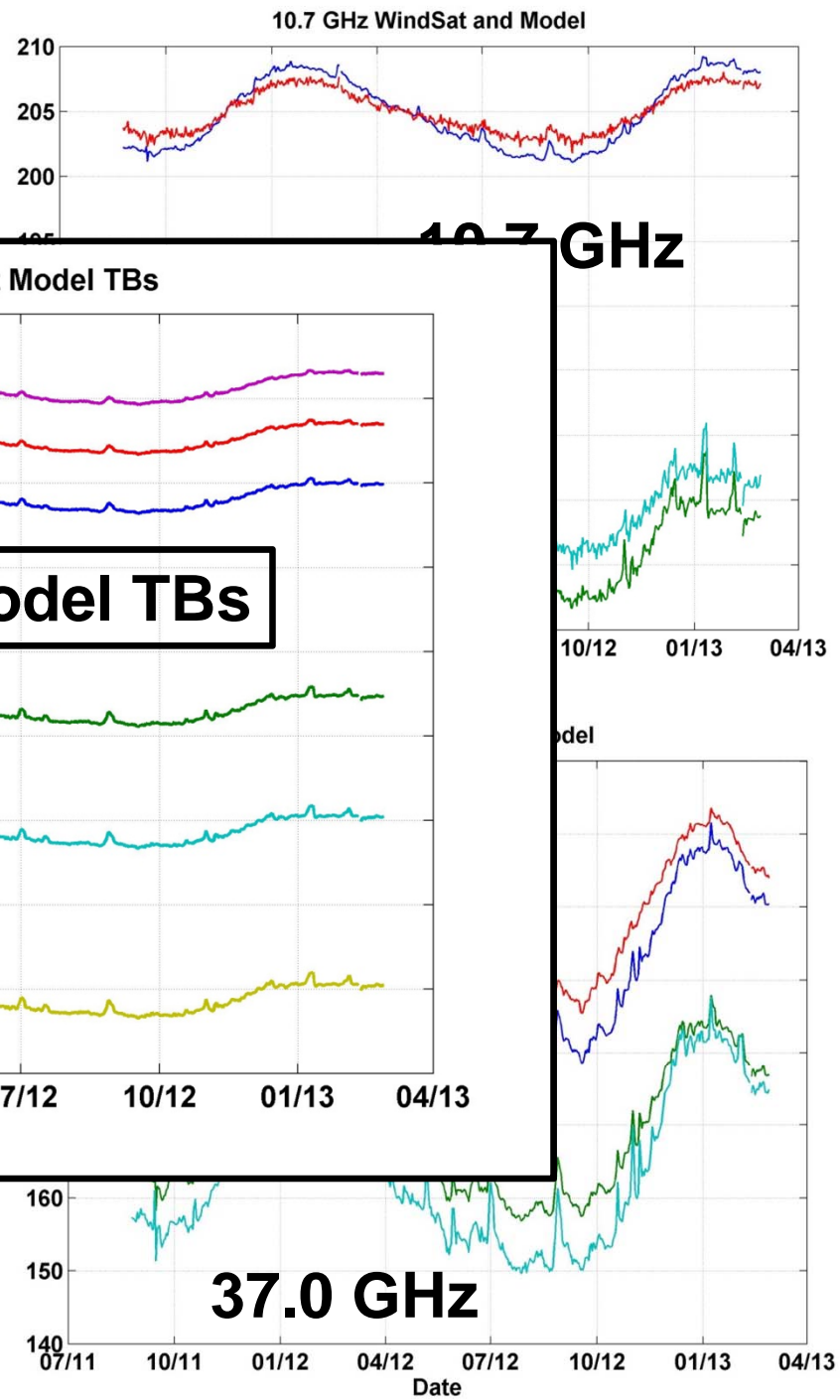
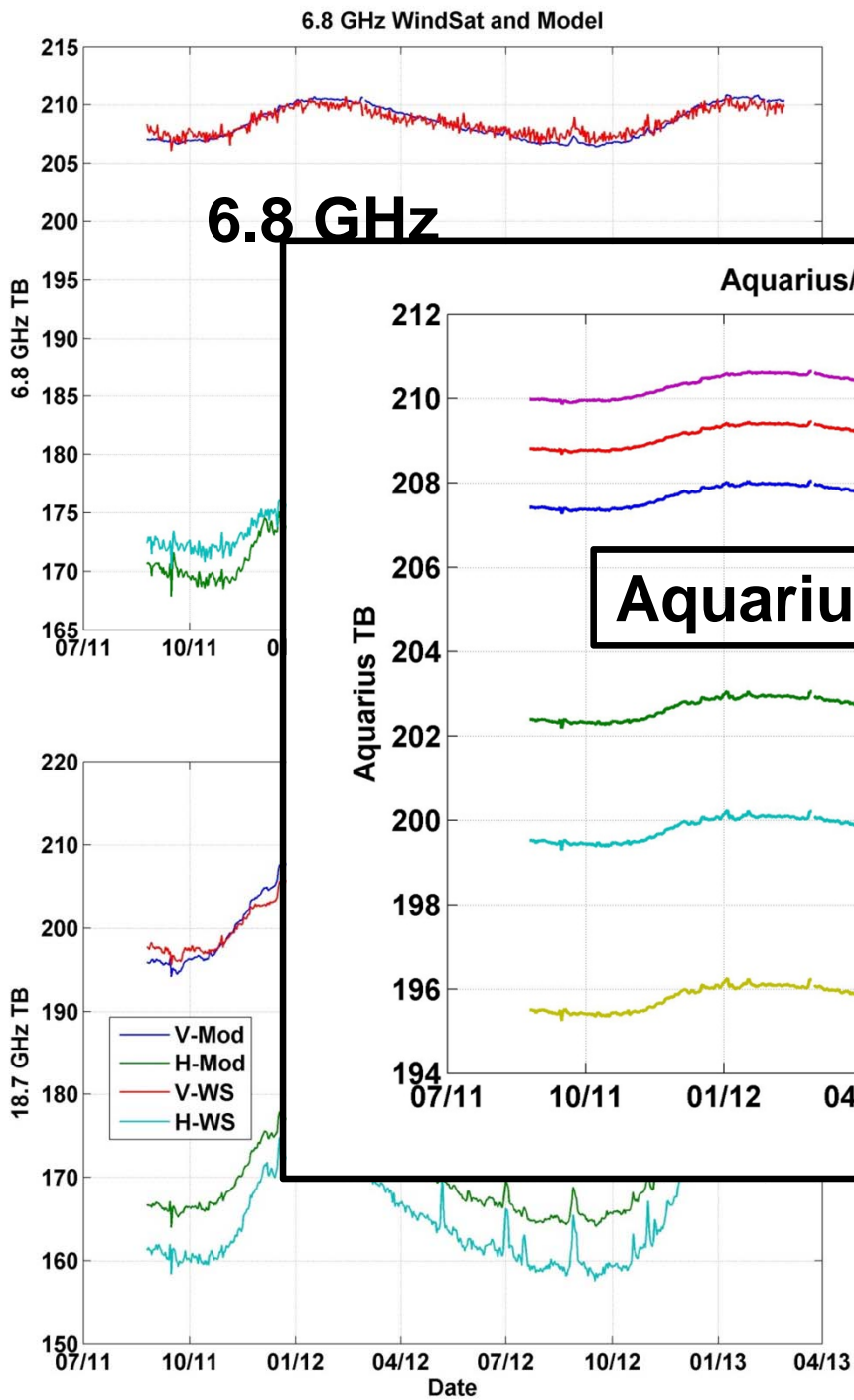


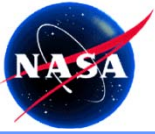
- H-pol comparisons nosier due to ice surface variations not accounted for in model
  - Uncertainty  $\sim 0.25\text{-}0.5$  K level
  - ...but no evidence of residual drift



## Aquarius- Model



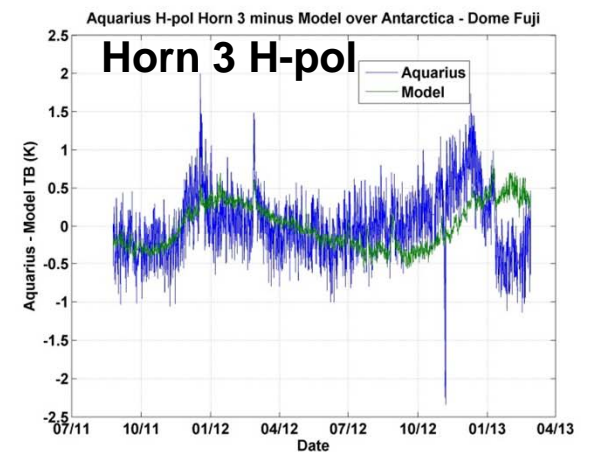
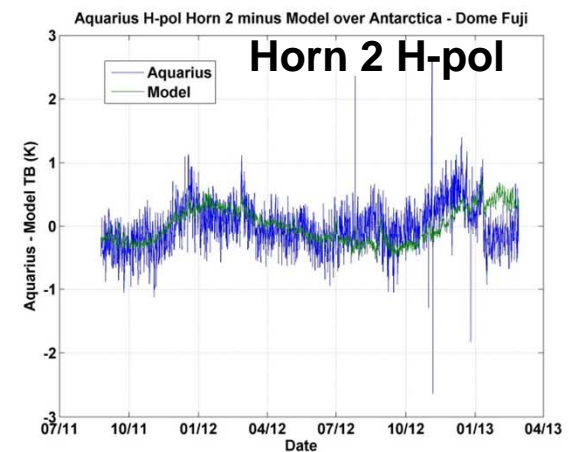
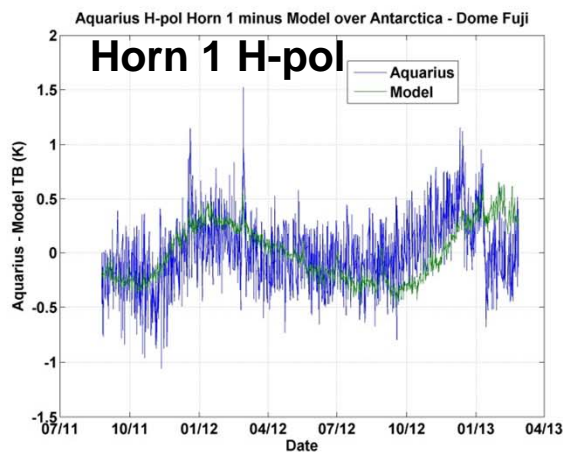
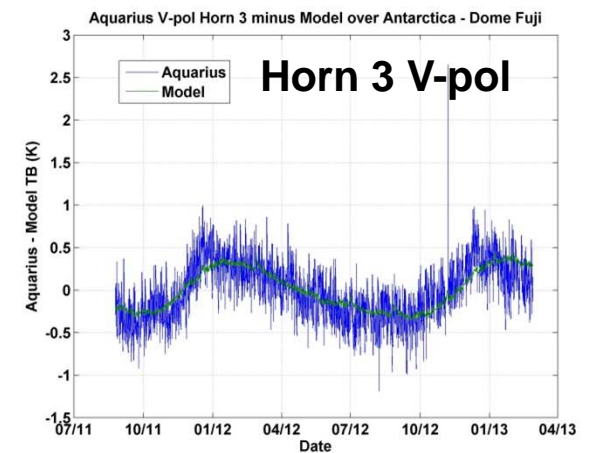
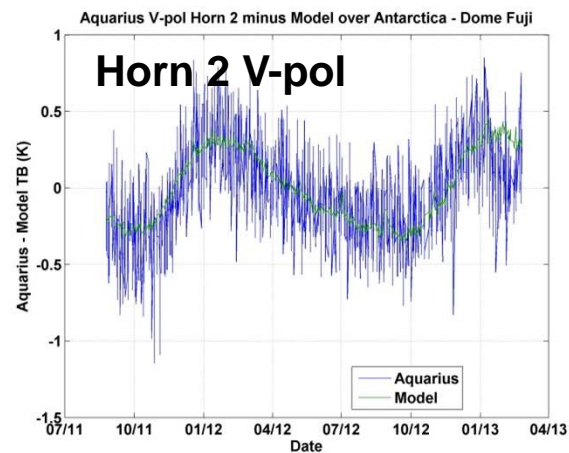
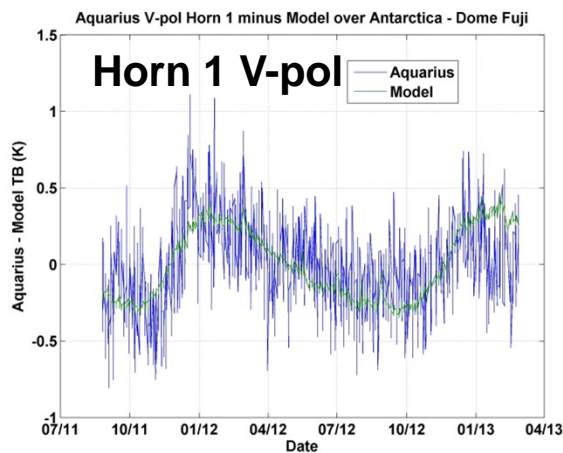




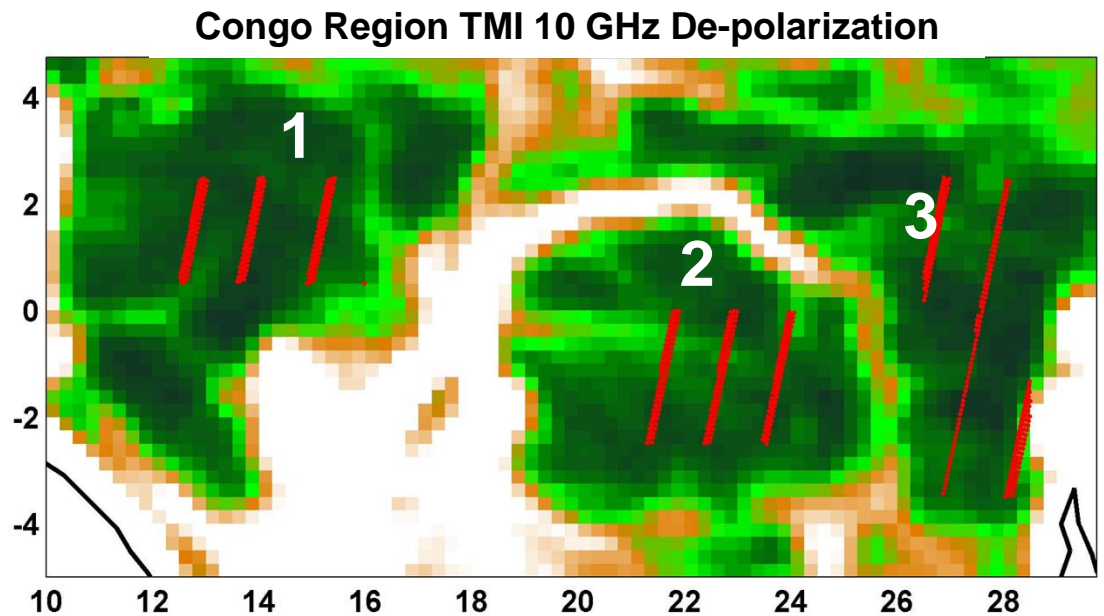
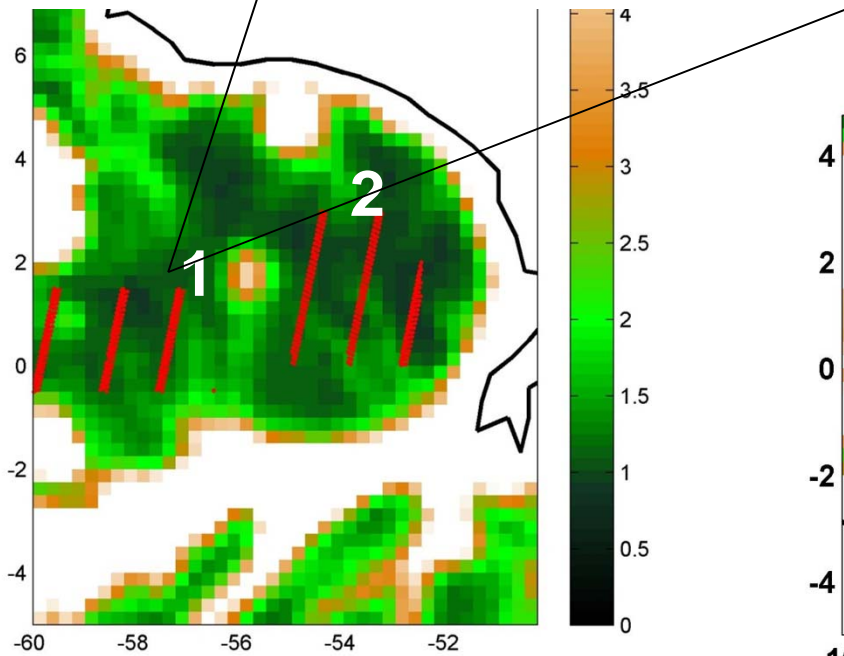
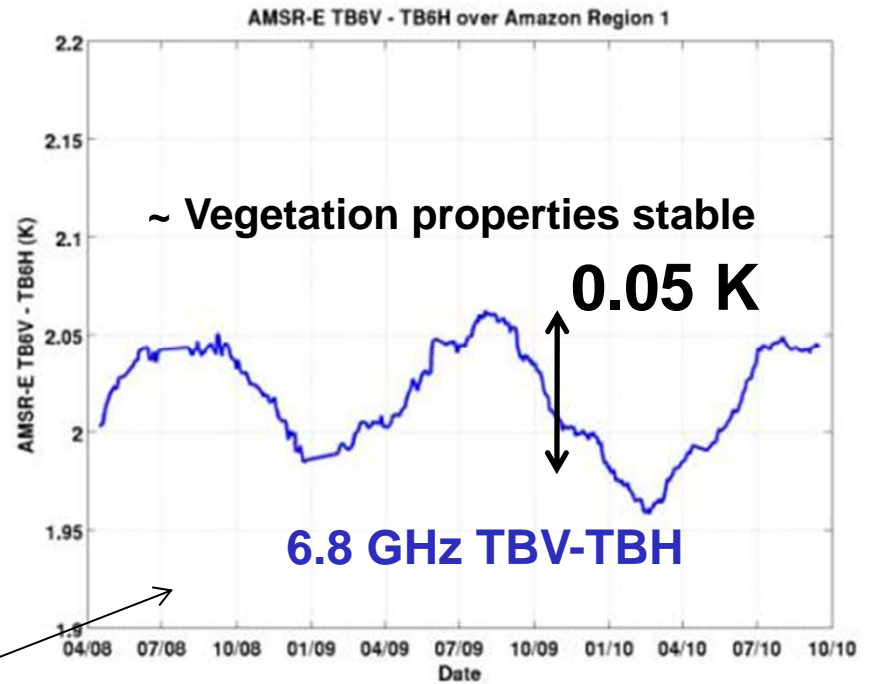
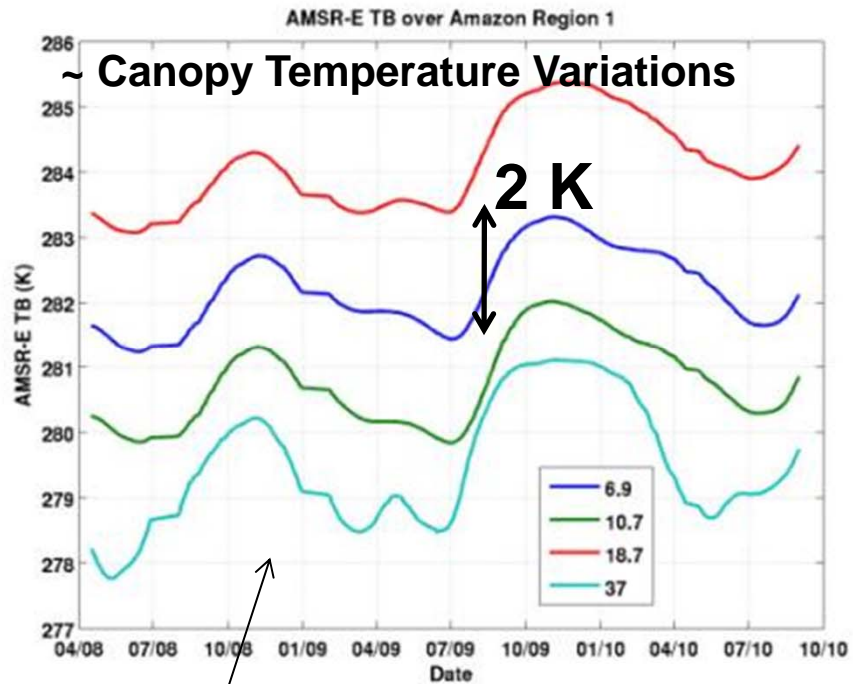
# Aquarius with Dynamic Antarctic Model



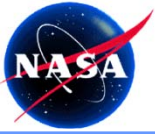
- Dynamic model offers some improvement for H-pol, but doesn't capture all variability
- Future work will attempt to improve dynamic model, but we still have the rainforest comparisons...







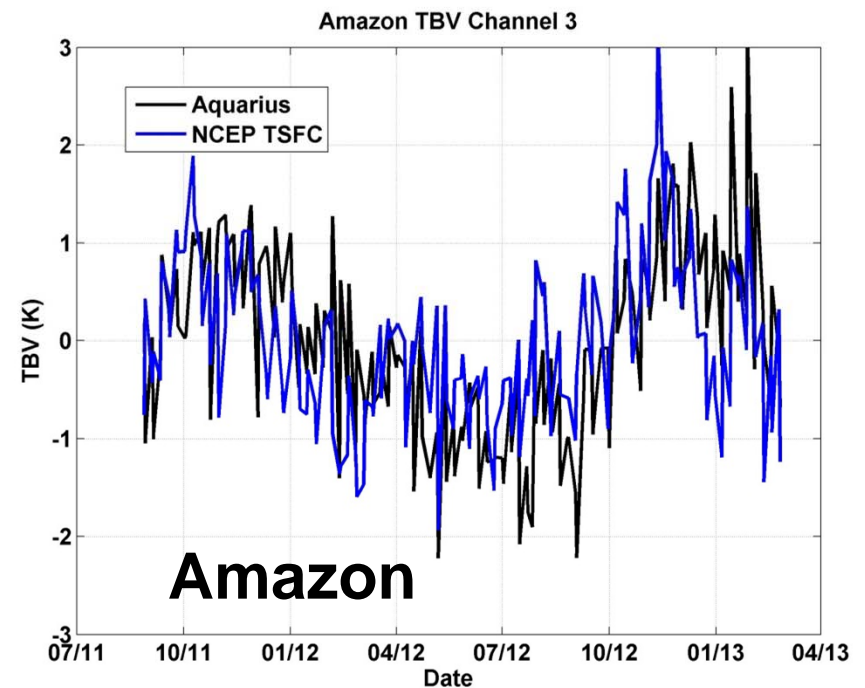
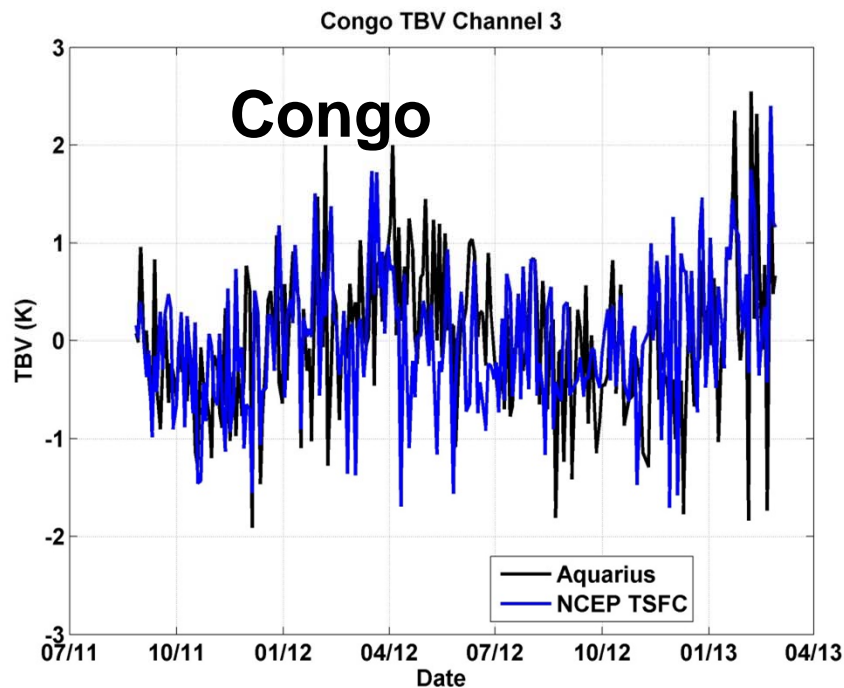


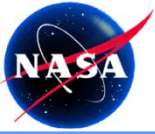


# Aquarius TB and NCEP Surface Temperature



- Slightly larger seasonal signal observed over Amazon
- NCEP surface temperature scaled by approximate surface emissivity of 0.94 for large woody volume forests (Vecchia et al. 2010)
- Good correlation observed on long time scales

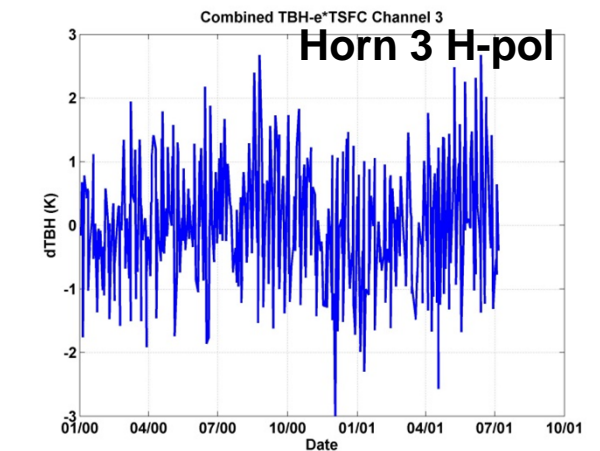
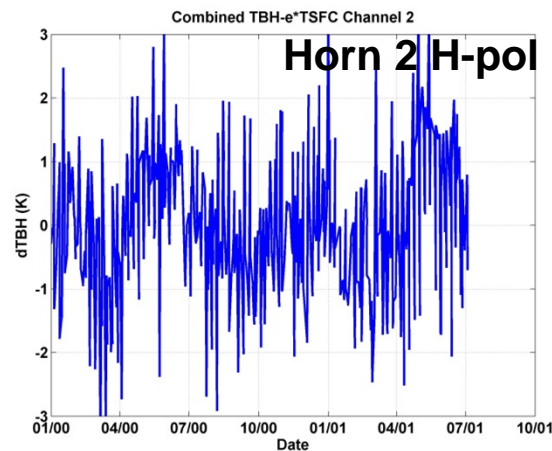
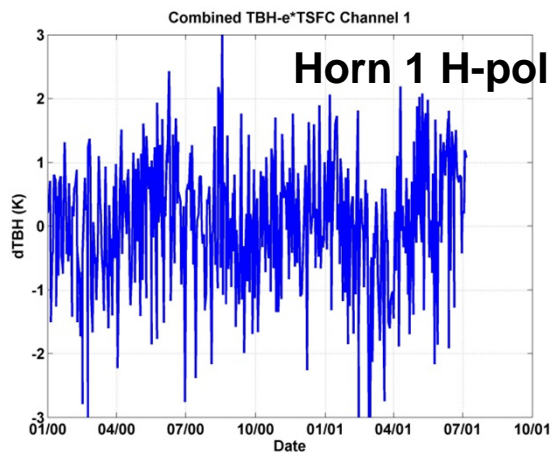
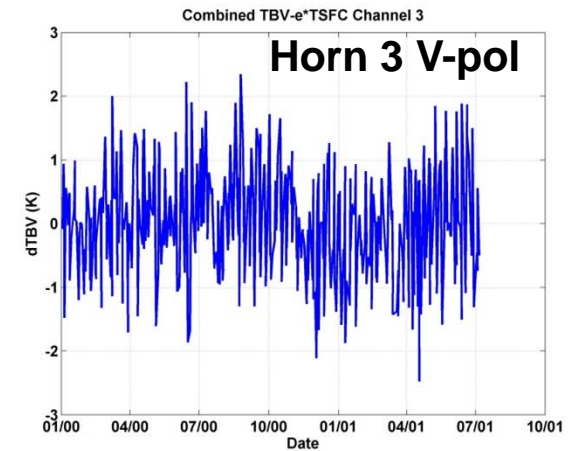
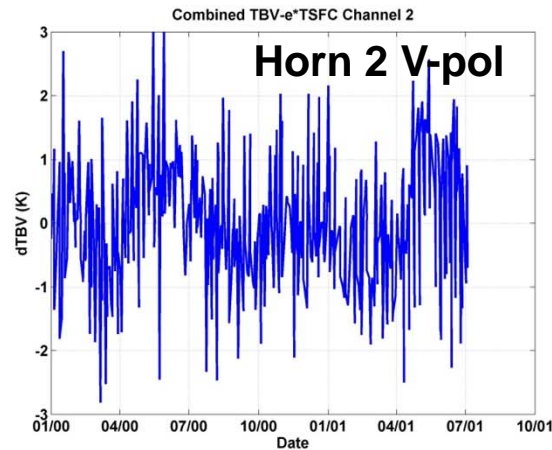
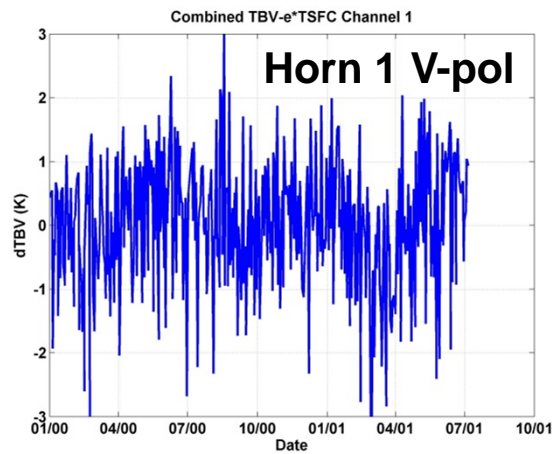


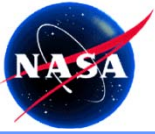


# Aquarius – Rainforest (Congo+Amazon)



- Individual channel comparisons too noisy to assess short period oscillations
- Though, can be used for tracking long term drift
  - Absence of long term drift exponential drift consistent with gain drift

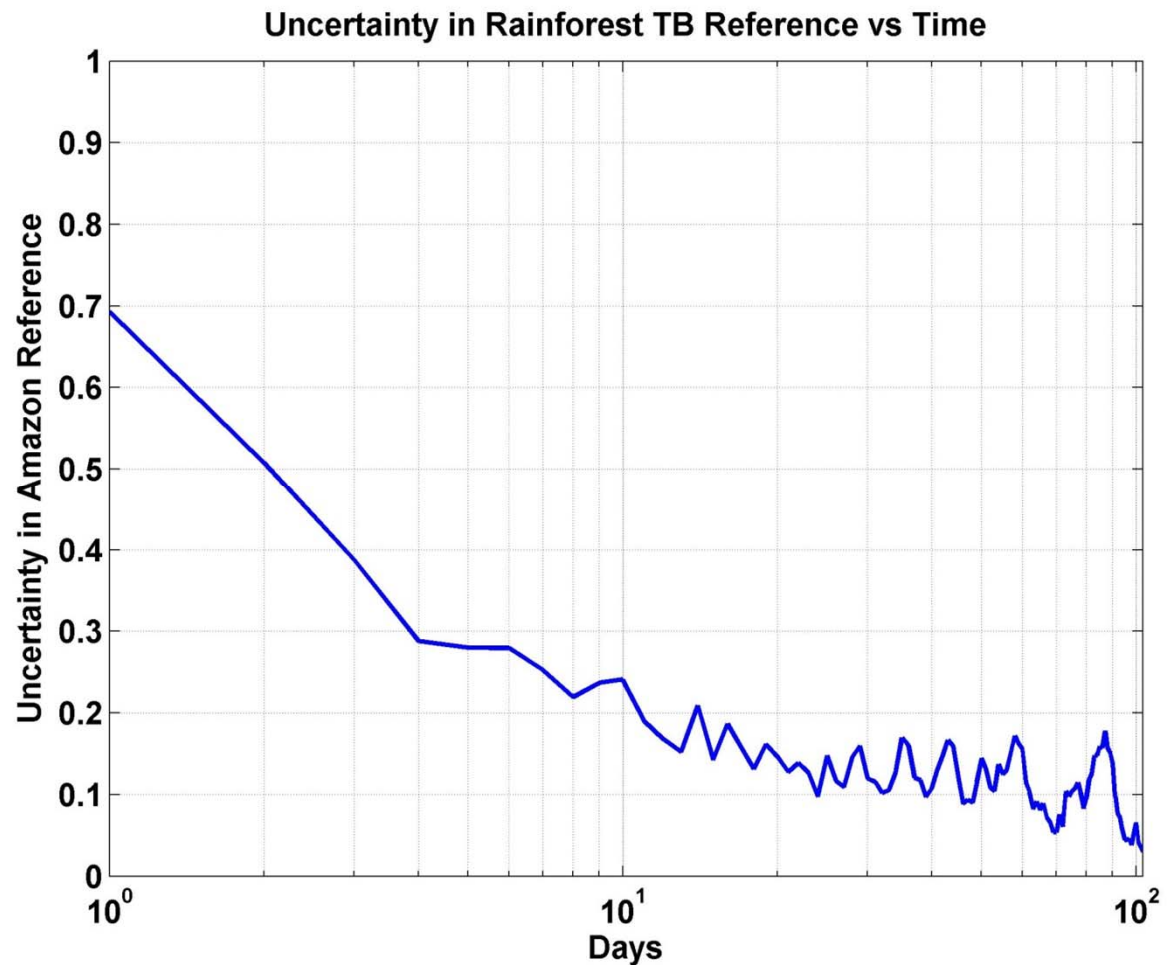


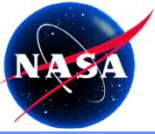


# Uncertainty in Rainforest Reference



- Rainforest reference only reaches 0.1K level uncertainty on > 60 day time scales
  - Not good enough for analyzing quasi-monthly variability



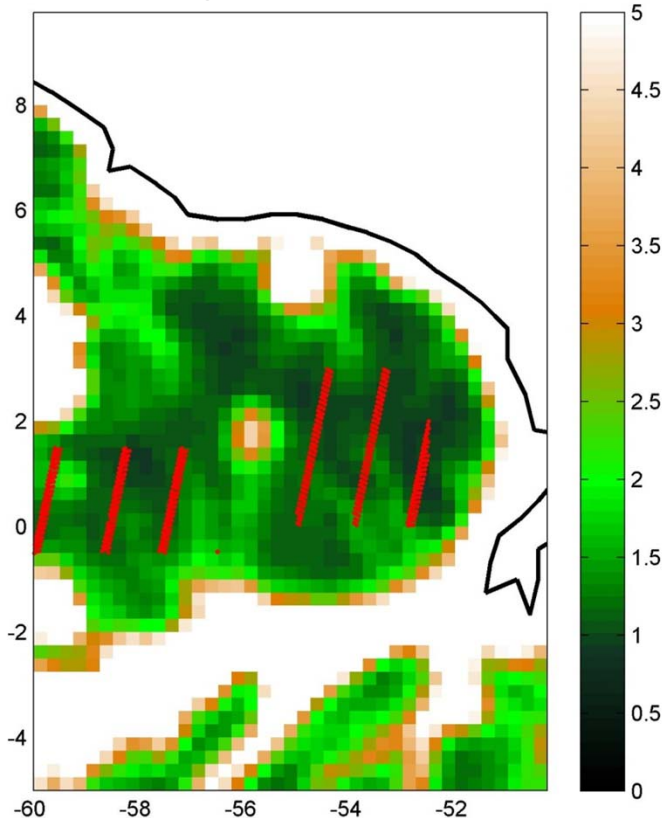


# Inter-channel Differences over Rainforest

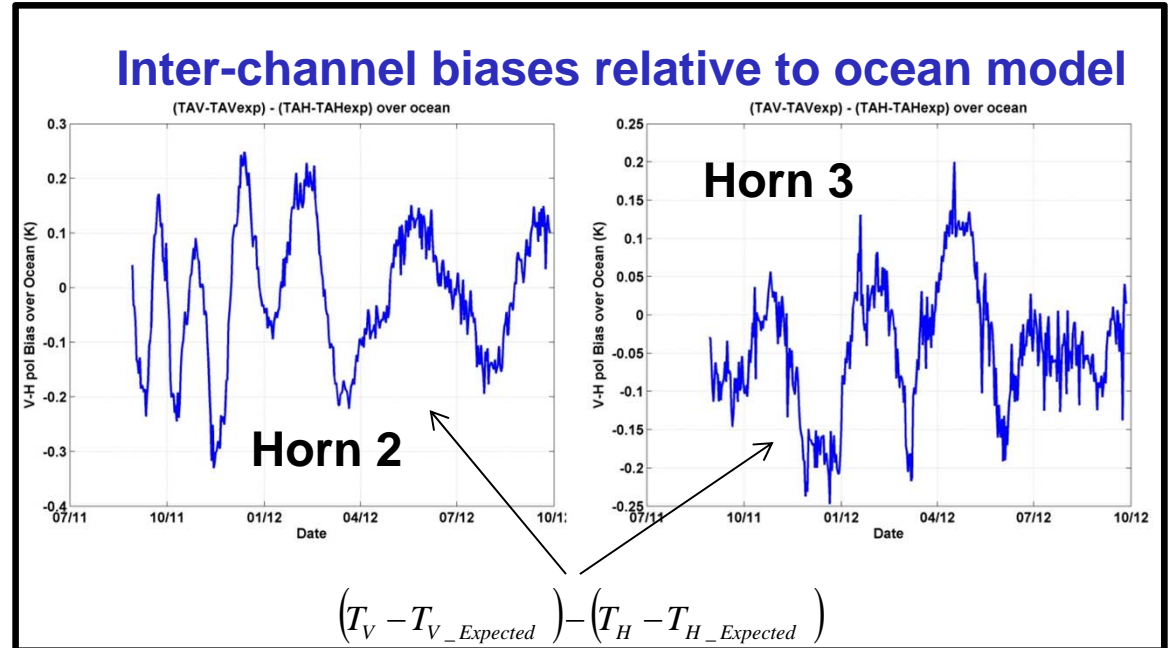


- Offset error should be apparent in rainforest comparisons
- Uncertainty in TA over rainforest regions at  $> 0.1K$  level on time scales  $< 30$  days mainly due to uncertainty in  $T_{canopy}$ , but...

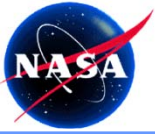
Amazon Region TMI 10 GHz De-polarization



these uncertainties largely cancel if looking at inter-channel differences



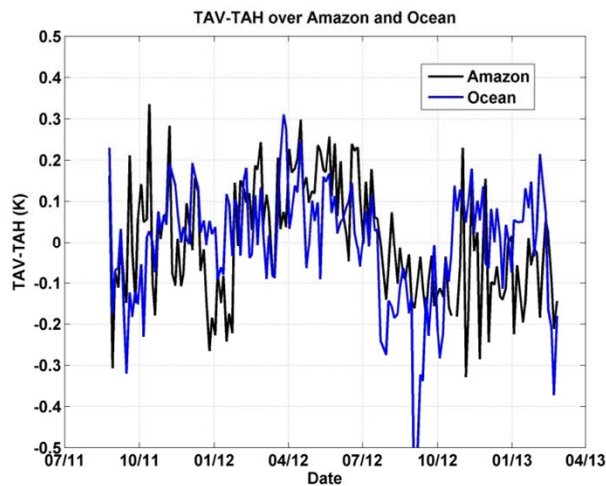




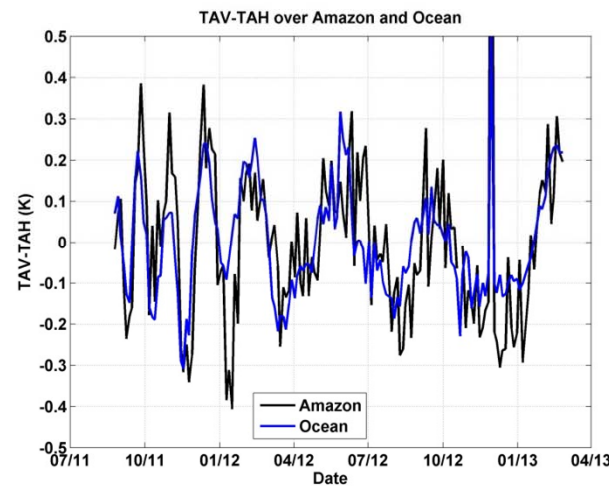
# Inter-Channel Differences over Rainforest



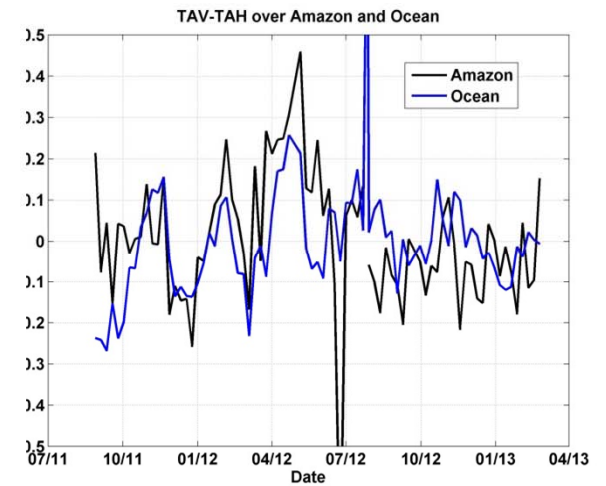
- **Uncertainty in  $T_{\text{canopy}}$  largely cancels in V-pol – H-pol difference over the rainforest regions**
- **Assuming that surface emissivity is stable (and depolarized), then these inter-channel differences allow us to assess relative offsets compared to ocean**
  - **Uncertainty at 0.1K level on times scales < 10 days**



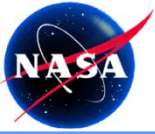
**Horn 1**



**Horn 2**



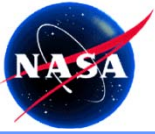
**Horn 3**



# Aquarius Version 2 Drift Correction Approach



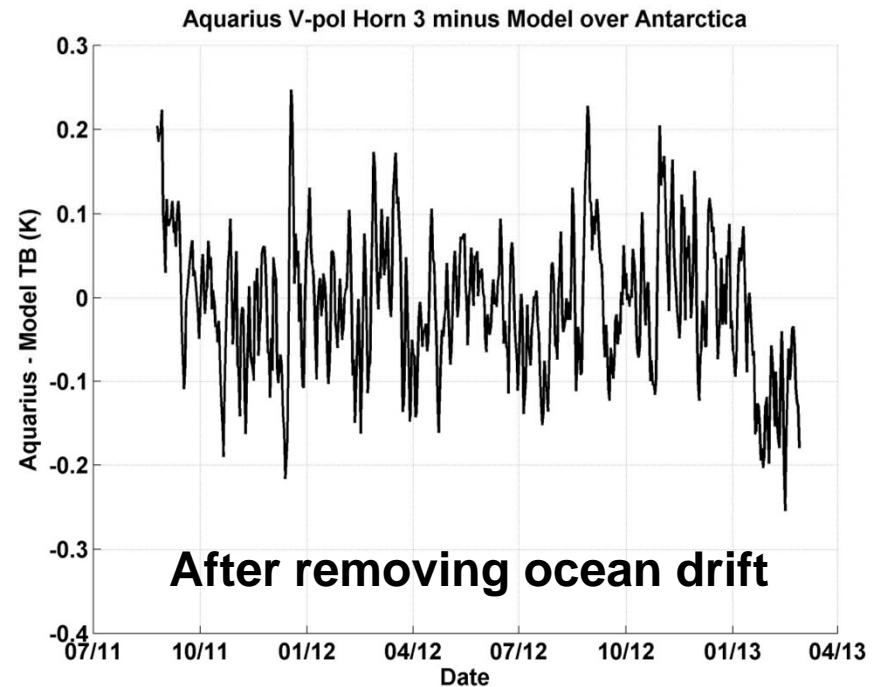
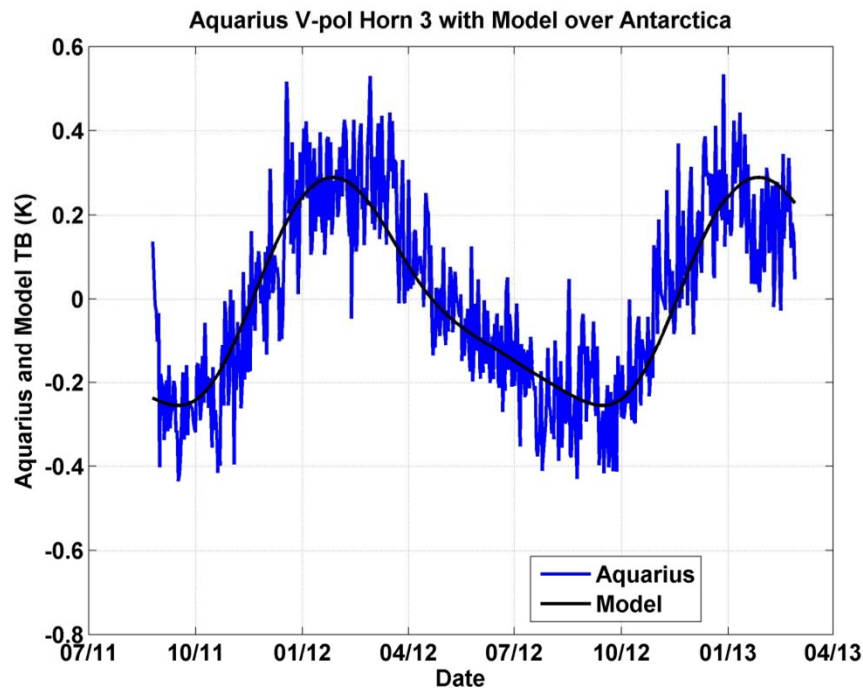
- Empirical exponential gain correction fit to > 1yr time series of ocean model differences
- Residual TA oscillations removed by extracting a common component from ocean model time series computed for different regions and subtracted as an offset
- Corrections only made to V & H pol channels, not 3<sup>rd</sup> stokes

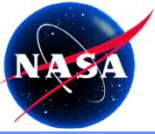


# Version 2 Aquarius – Antarctica TB : TBV horn3



- **Version 2 calibration removes most all drift, but residual instrument calibration variability at 0.05-0.1 K still apparent**

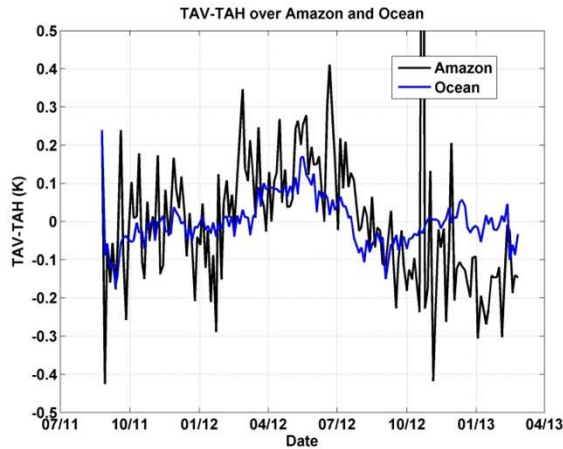




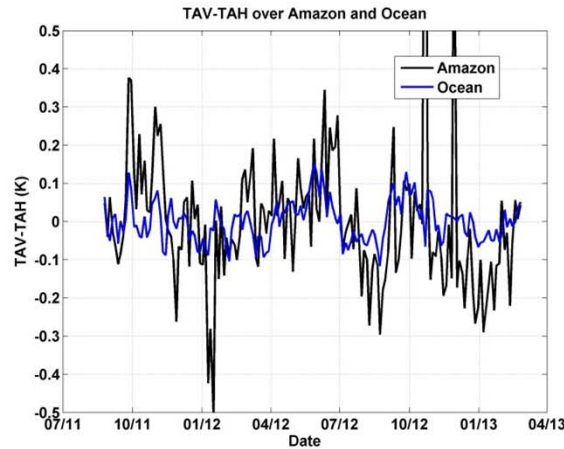
# Version 2 Aquarius TV-TH over Rainforest



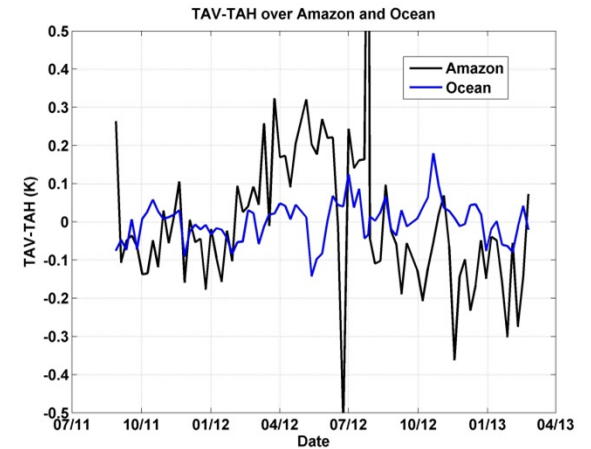
- Some residual error remains in inter-channel differences as well
  - Correlated between ocean and rainforest



**Horn 1**

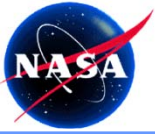


**Horn 2**



**Horn 3**

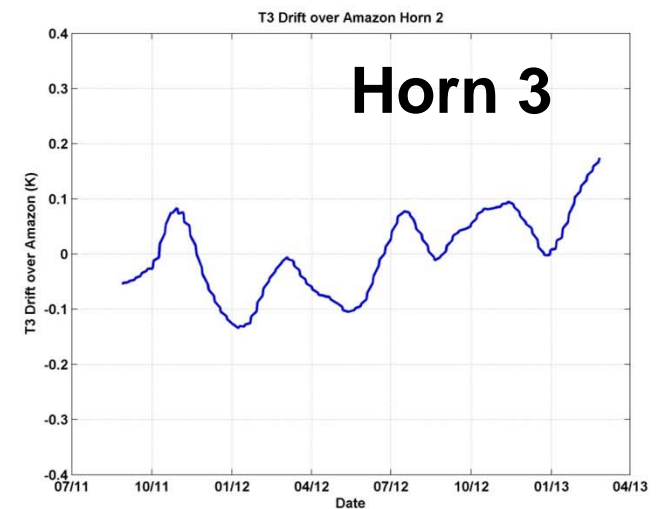
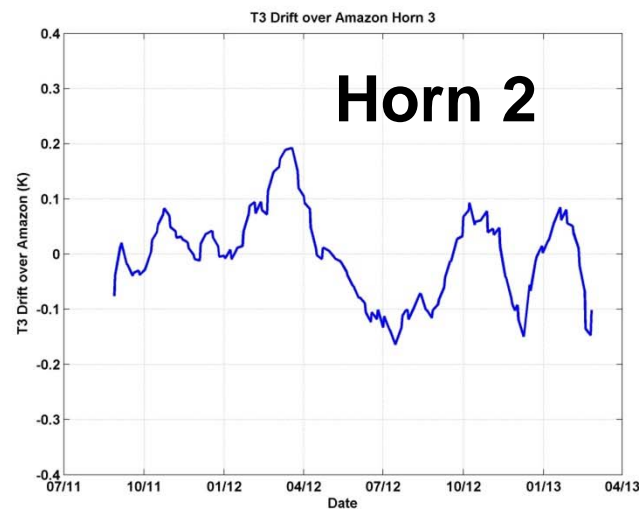
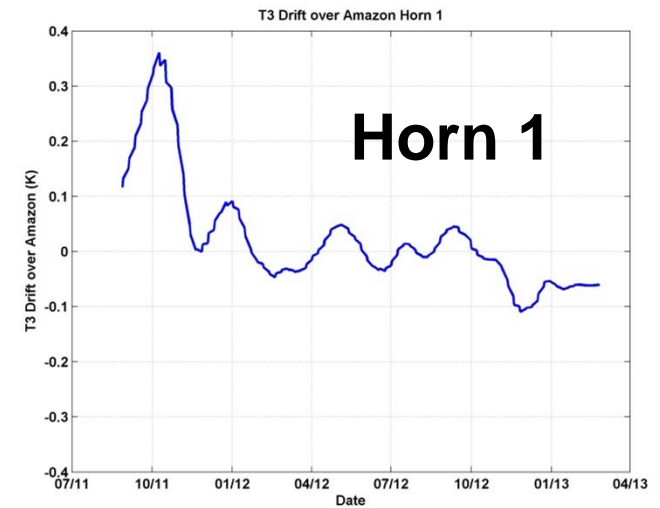


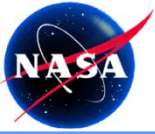


# Version 2 3<sup>rd</sup> Stokes Calibration Variability



- **3<sup>rd</sup> stokes should be near zero and stable over rainforest**
  - Consistent variability observed across 5 regions in Amazon and Congo
  - Variations between 0.1-0.4K observed
  - Introduces small time variability in Asc/Dsc regional differences and in global mean time series
- **Current correction implemented for V2 doesn't address drift/oscillations in 3<sup>rd</sup> stokes**

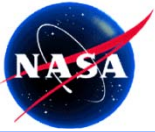




## Summary



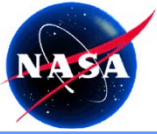
- **Antarctica and rainforest references used to characterize TB drift**
  - Separated gain and offset components of Aquarius TB drift
  - Isolated instrument contributions though inter-reference consistency
- **Reference model uncertainty:**
  - Antarctica reference uncertainty  $< 0.05$  K on  $>10$ -day time scales for V-pol, but not as reliable for H-pol ( $>1$ K uncertainty)
  - Rainforest reference uncertainty at  $0.1$ K on  $> 60$ -day times scale for single channel observations
  - Uncertainty in inter-channel differences over rainforest (e.g. V-Hpol)  $<0.1$ K on 10-day times scales
    - Including 3<sup>rd</sup> stokes



## Next Steps: Toward Aquarius Version 3

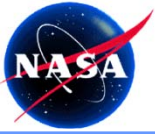


- **Current drift correction approach doesn't completely remove all instrument variability nor correct 3<sup>rd</sup> stokes variability**
- **Recently, probable root cause for the long term drift and short term oscillations identified**
- **Move toward hardware constrained or hardware only solution**
- **Assess and apply corrections for all channels (including 3<sup>rd</sup> stokes)**

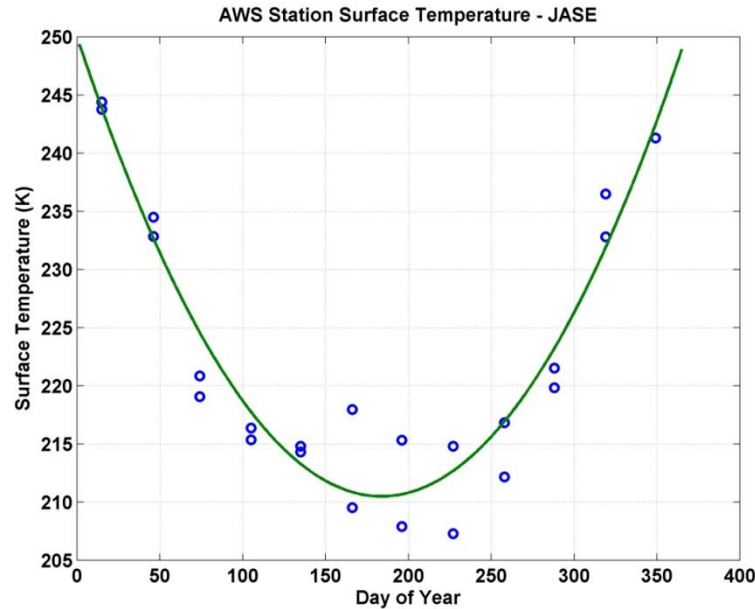


# Backup





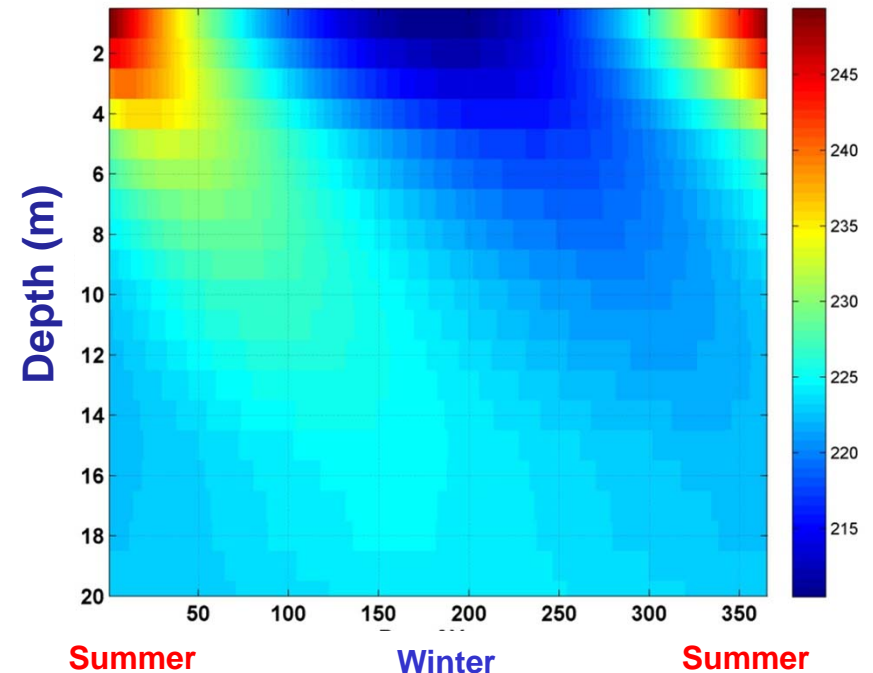
# Thermal Profile



→ 
$$\frac{\partial T}{\partial t} = \alpha_T(\rho) \frac{\partial^2 T}{\partial z^2}$$



Ice Temperature

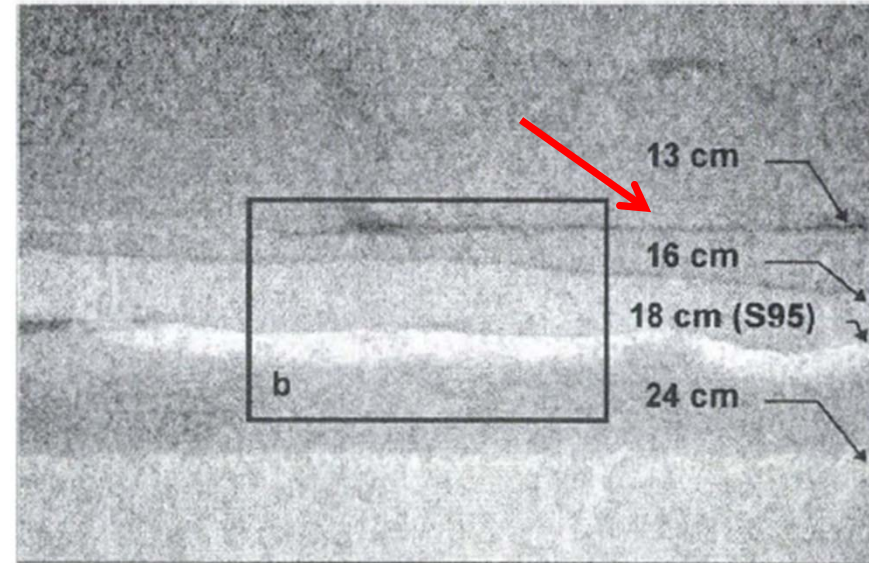
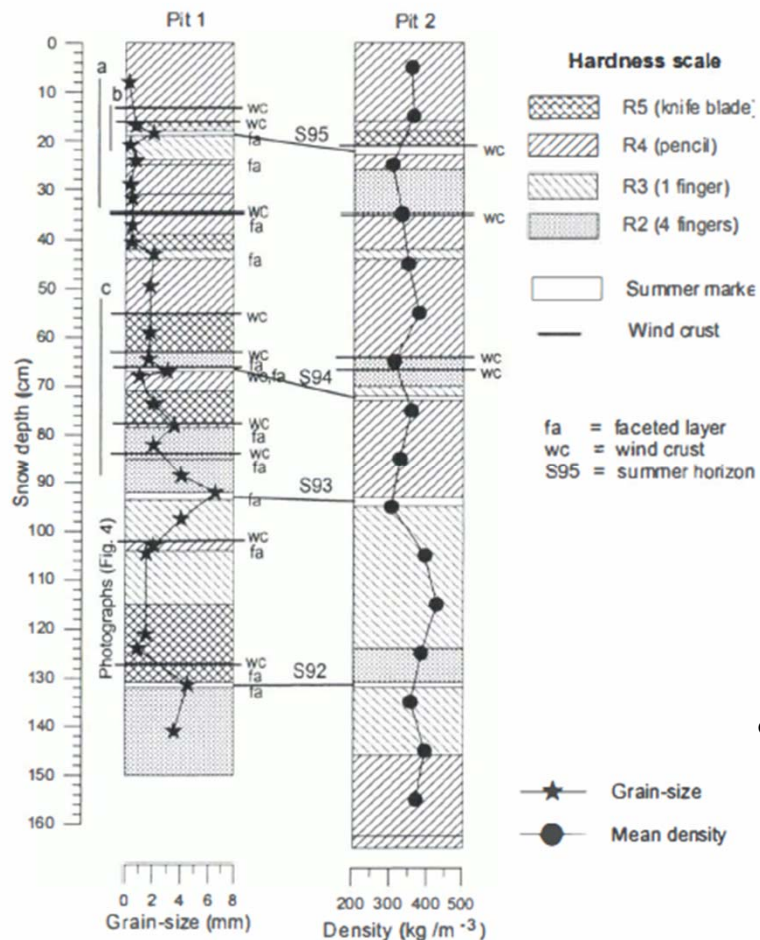


Surface temperature values obtained from near by AWS station (JASE) used as top boundary condition

Solved heat equation numerically to determine  $T(z,t)$  assuming only vertical heat transport

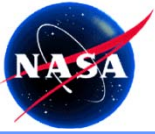
Thermal diffusivity increases as a function of density (Paterson, 2000)

# Snow Structure

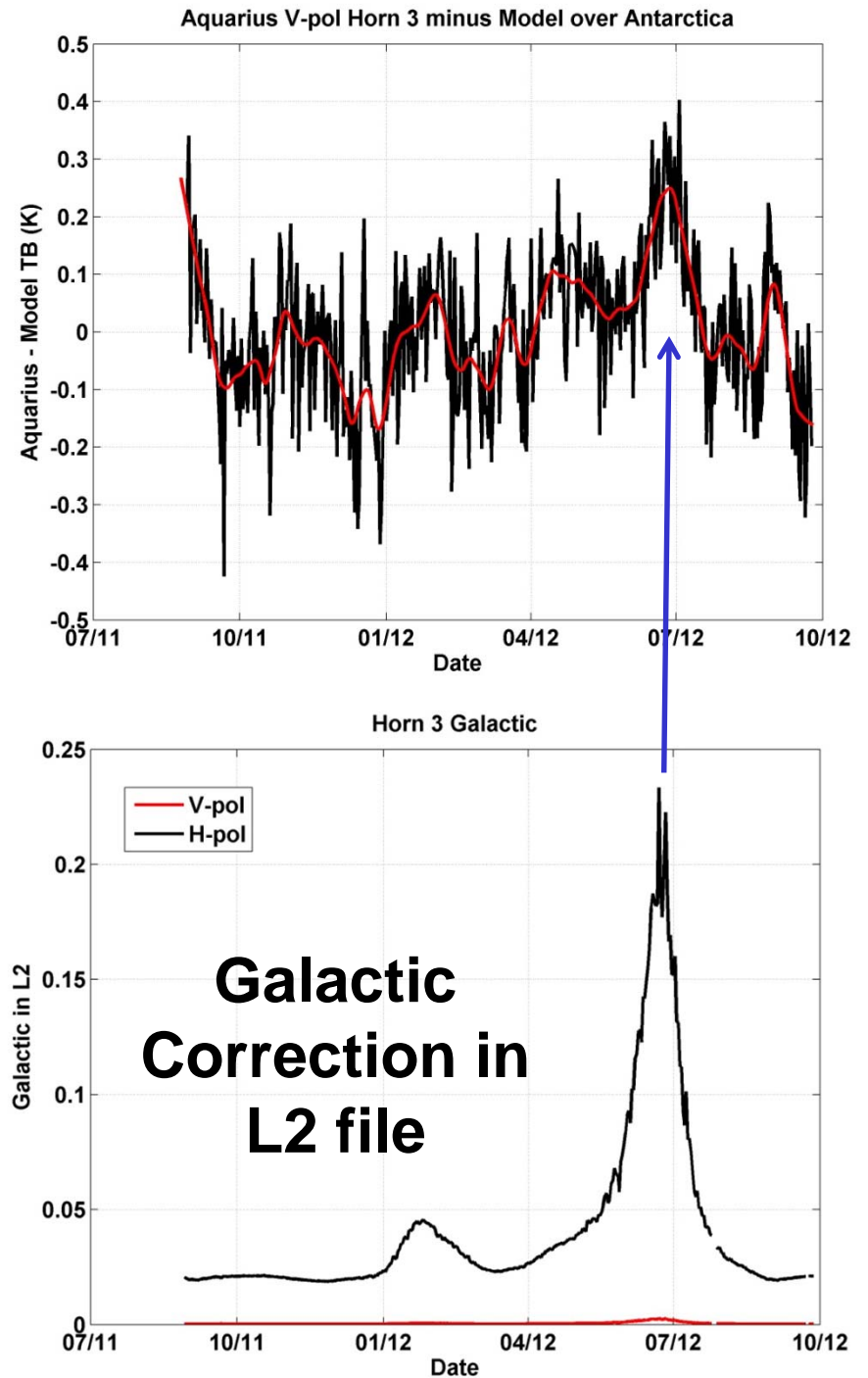


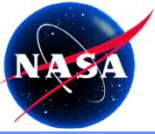
**Steffen et al., 1999**

- Snow structure near top surface contains layers with variable thickness, density and grain size (e.g. Steffen et al., 1999; Macelloni et al., 2006)
- Wind crusts (thin, high density) can be present



- Undercorrection of strong galactic reflection in July 2012 accounts for some of the oscillation

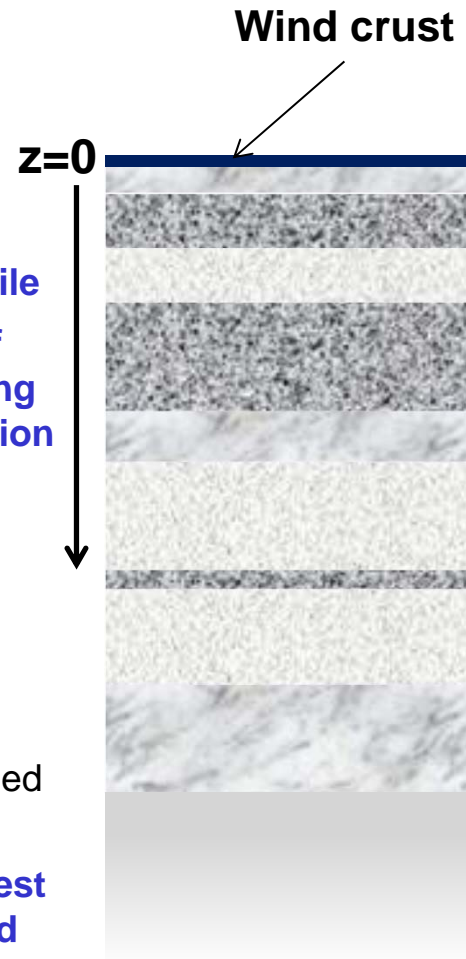




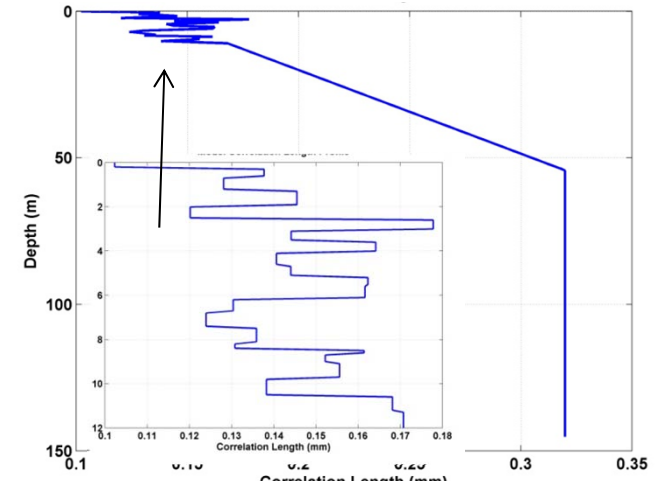
# TB Model



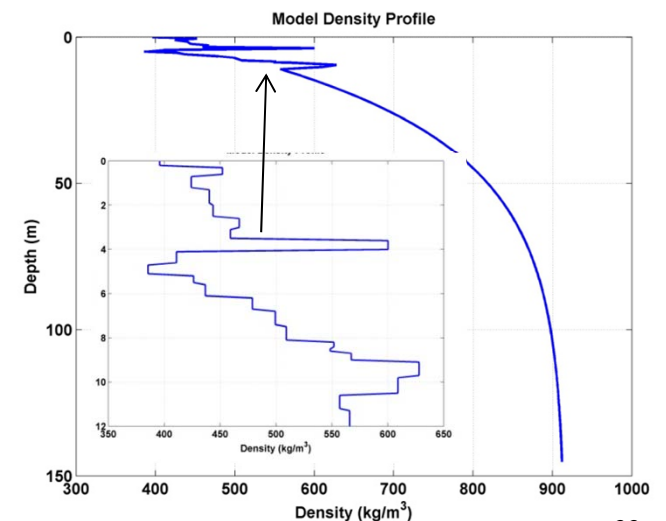
- MEMLS model (Wiesmann and Matzler, 1999) used to compute upwelling TB
  - Started with exponentially increasing density profile and increasing correlation length profile
  - Generated multiple realizations of snow structure by randomly adding layers of varying density, correlation length and thickness to first 20 m
    - Density variations based on measurements found in literature (e.g. Steffen et al., 1999; Paterson, 2000; Macelloni et al., 2007)
    - Correlation length profile based on Matzler (2002)
  - Chose realization that provided best fit to AMSR-E 6.9 – 36.5 GHz V-and H-pol TBs
  - Ice dielectric model from Tiuri et al., (1984) gave best fit AMSR-E data



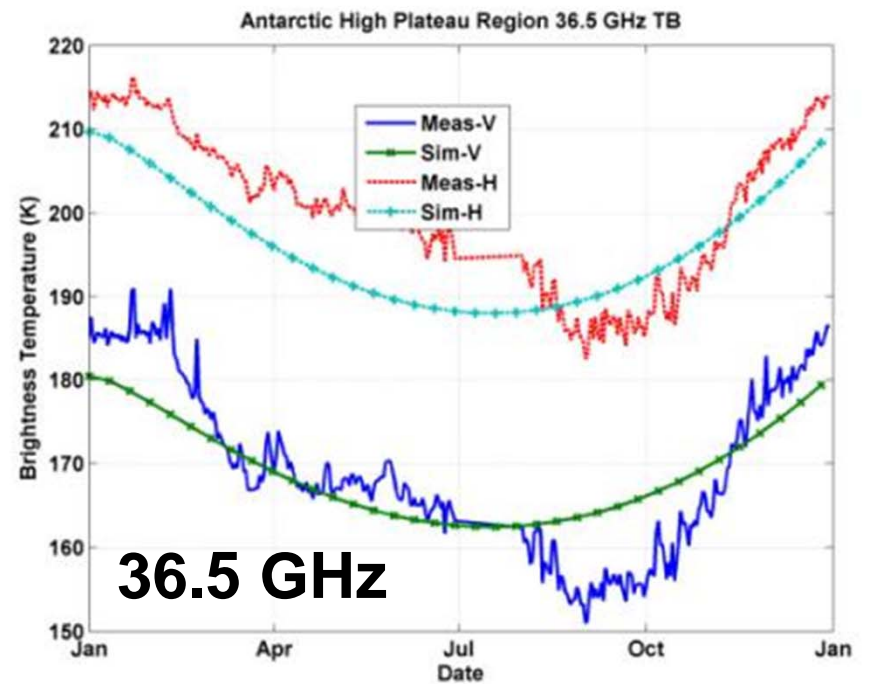
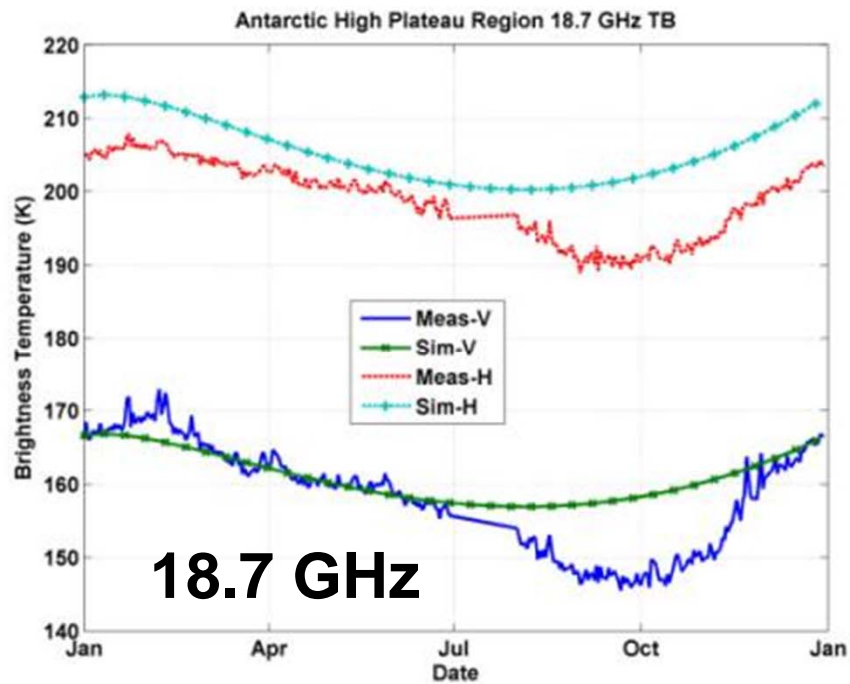
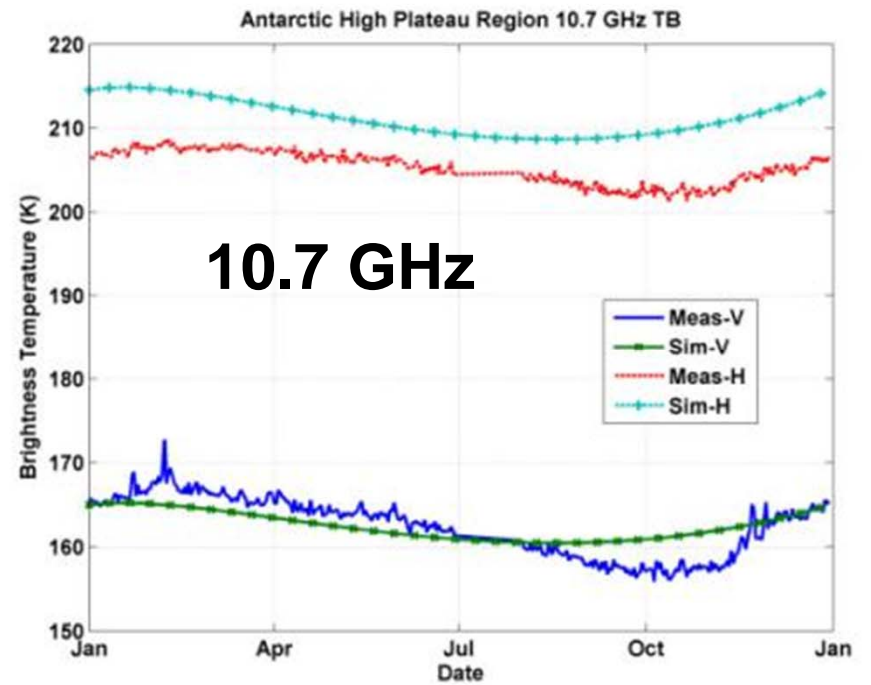
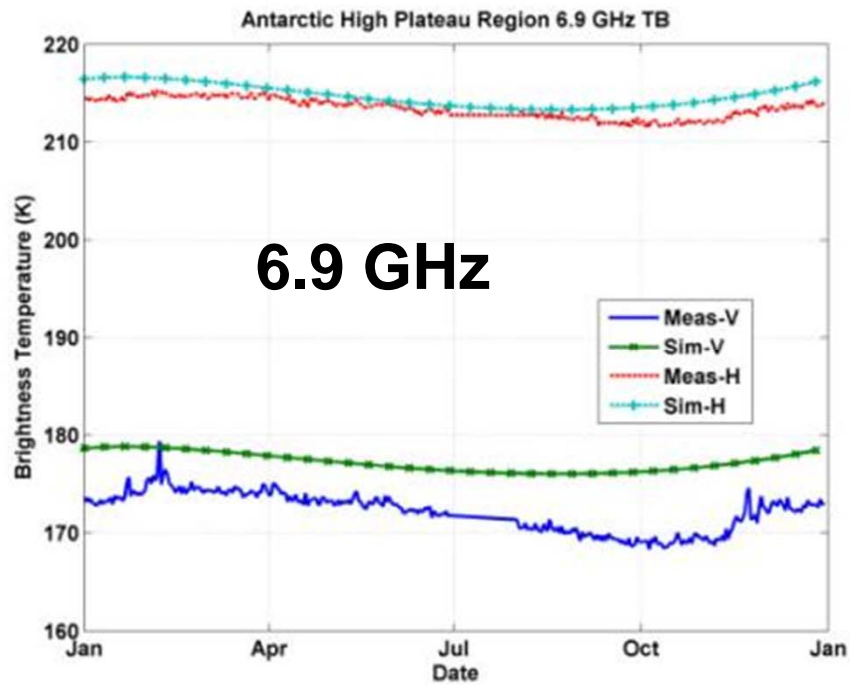
## Correlation Length Profile



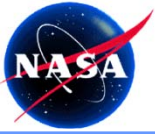
## Density Profile







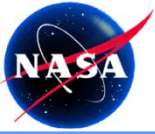




# Summary



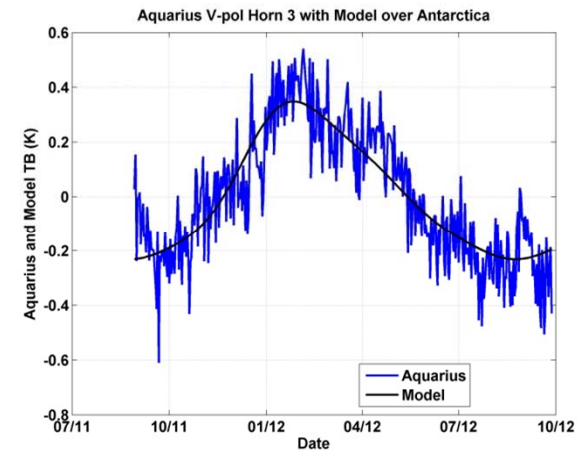
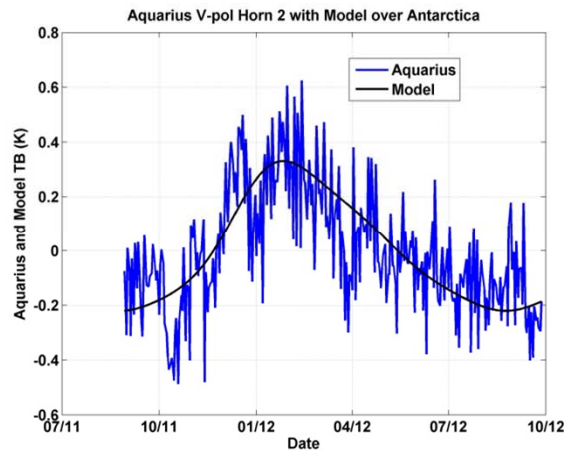
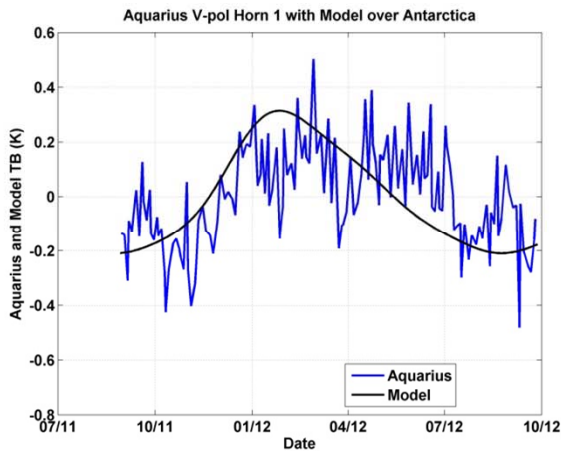
- **Exponential drift correction successfully removes observed long period drift over Antarctica**
  - **Confirms gain (e.g. noise diode) drift as source**
- **Calibration wiggles are observed in Antarctic model differences and have the same magnitude as those observed over the ocean**
  - **Suggests quasi-monthly variability observed in TA-TAexp over ocean is due to TA calibration drift**
  - **Suggests that correction should be implemented as an offset correction**
    - Could be related to instability in PIN diode switch or change in impedance balance between antenna and reference arm of switch



# V-pol Channels after Exponential Gain Correction



- All channels in good agreement with model after applying gain drift correction based on ocean TA drift estimates



## Aquarius- Model

