

## HISTOGRAM MATCHING OF ASMR-E AND TMI BRIGHTNESS TEMPERATURES

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### 1. Introduction

A microwave-enhanced version of the Statistical Hurricane Intensity Prediction Scheme (SHIPS) is trained on a passive microwave sample consisting of Special Sensor Microwave Imager (SSM/I) and TRMM Microwave Imager (TMI) tropical cyclone overpasses utilizing 19.35, 37.0, and 85.5-GHz channels (Jones 2004, Jones et al. 2006). This new prediction scheme is referred to as SHIPS-MI. To increase sample size and real time data availability, Advanced Microwave Scanning Radiometer (ASMR-E) overpasses were applied to SHIPS-MI beginning in 2004. The ASMR-E instrument uses 18.4, 36.5, and 89.0-GHz channels in place of the 19.35, 37.0, and 85.5-GHz channels used by SSM/I and TMI. While the physical interpretation of these channels is the same across all sensors, brightness temperature ( $T_b$ ) differences on the order of 10 K exist between ASMR-E and TMI over low precipitation regions. For example, the ocean surface emits slightly less microwave radiation at 18.4 vs. 19.35-GHz. As a result, 18.4-GHz  $T_b$  are colder than 19.35-GHz  $T_b$  for the same observation region. Thus, ASMR-E 18.4-GHz  $T_b$  are generally slightly cooler than their TMI counterparts while ASMR-E 89.0-GHz  $T_b$  are slightly warmer than TMI 85-GHz  $T_b$ .

In order to use ASMR-E data in a model trained from 19, 37, and 85-GHz data, the ASMR-E 18, 36, and 89-GHz  $T_b$  must be adjusted to simulate 19, 37, and 85-GHz  $T_b$ . Both horizontal (H) and vertical (V) polarizations for each channel are adjusted. An adjustment utilizing the difference in radiative properties between ASMR-E and TMI sensors is quite complex; thus, a simpler statistical approach is desired. A histogram-matching technique is used to match ASMR-E brightness temperatures to a baseline histogram derived from TMI brightness temperatures. Data from the TMI (and not SSM/I) are used as the adjustment standard since TMI has a similar spatial resolution as ASMR-E.

### 2. Data

The comparison histograms are computed from 10 TMI and ASMR-E 2004 tropical cyclone overpasses that occur within 2 h of each other. Each overpass is centered on the best track location of the tropical cyclone interpolated to the overpass time. Data out to a distance 300 km from the tropical cyclone center are considered. It is assumed that the overall microwave signature of a tropical cyclone remains relatively constant over a period of 2 h. The nature of ASMR-E and TMI orbits makes concurrent overpasses quite rare. The adjustment is trained on tropical cyclone overpasses rather than entire swaths in order to maximize adjustment accuracy for tropical cyclone observations.

### 3. Methodology

Histogram matching consists of matching the  $T_b$  histogram from one satellite sample (ASMR-E) to that of a reference sample (TMI) to calculate adjusted  $T_b$  (Richards and Jia 1999). The application of this technique requires the calculation of Cumulative Distribution Functions (CDFs) from the TMI and ASMR-E data. ASMR-E/TMI  $T_b$  pairs are selected along each CDF where cumulative probabilities are equal. A best-fit model between the paired data is created. The best-fit coefficients are then used to simulate 19, 37, and 85-GHz  $T_b$  from the ASMR-E 18, 36, and 89-GHz  $T_b$ .

Below approximately 250 K, ASMR-E 89-GHz and TMI 85-GHz are essentially equal and do not require adjustment. Thus, the 89/85-GHz adjustment is only trained and applied to ASMR-E 89-GHz  $T_b > 245$  K. Similarly the 36-GHz channel does not require adjustment for  $T_b < 205$  K. Applying an adjustment beyond these limits would have the effect on increasing TMI/ASMR-E differences.

### 4. Results

The largest TMI/ASMR-E difference occurs for H19 and H18 channels between 140 and 180 K (Fig. 1a). TMI H19 is substantially warmer than H18 below 200 K. If H18 data were to be used in place of H19, forecast errors of several

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knots would occur for tropical cyclones with below normal precipitation signatures. Differences between H36 and H37 are limited to less than 5 K while differences between 5 and 10 K exist between H85 and H89 (Figs. 2a, 3a). Data outside the 36 and 89-GHz adjustment thresholds are not included in the CDFs. Similar characteristics were observed for the vertical polarizations of these channels, though the magnitude of the  $T_b$  difference was somewhat less (not shown).

To adjust AMSR-E  $T_b$  to the TMI standard,  $T_b$  pairs along the CDF curves in Figures 1-3a are selected along lines of equal probability. For example, a cumulative probability of 0.2 in Fig. 1a produces the  $T_b$  pair 160 K (AMSR-E 18-GHz) and 175 K (TMI 19-GHz). Multiple  $T_b$  pairs are selected and plotted against each other in Figs. 1b, 2b, and 3b with a 1:1 reference line shown for comparison. Adjustment coefficients are derived from the  $T_b$  pairs under the assumption that a  $T_b$  pair containing TMI and adjusted AMSR-E data should match the 1:1 reference as close as possible. For each channel, best-fit lines are calculated from the  $T_b$  pairs using a single predictor linear regression analysis with units in degrees Kelvin (Eqs. 1-3). Each explains well over 99% of the variance present in the paired data. These equations are then applied to the AMSR-E data forming adjusted channels whose CDFs are also plotted in Figures 1-3a.

$$H19_{ADJ} = 31.3231 + 0.8814 \times H18_{AMSRE} \quad (1)$$

$$H37_{ADJ} = 4.0615 + 0.9745 \times H36_{AMSRE} \quad (2)$$

$$H85_{ADJ} = 23.0939 + 0.9018 \times H89_{AMSRE} \quad (3)$$

Overall, the adjusted CDFs closely match the TMI standard and eliminate much of the  $T_b$  difference between the two instruments. Equal probability TMI and adjusted AMSR-E  $T_b$  pairs lie much closer to the 1:1 reference than previously (Figs 1-3b). The adjustment accuracy decreases slightly as a function of increasing frequency. For 19 and 37-GHz adjustments, accuracy is within  $\pm 2$  K of the TMI  $T_b$  (Figs. 1b and 2b) However, the relationship between AMSR-E H89 and TMI H85 appears to be non-linear between 250 and 260 K resulting in a somewhat larger error (Fig. 3b). This temperature range corresponds with the transition from scattering of 85-GHz radiation at lower  $T_b$  to emission at higher  $T_b$ . The non-linearity of differences between 85 and 89-GHz radiation can be dealt with by applying more complex fits to the  $T_b$  pairs in Figure 3b. Interestingly when H85 and V85 data are combined to form PCT85 data (Spencer et al. 1989), which is used in SHIPS-MI,

the non-linearity of the adjustment between 250 and 260 K decreases.

Generally speaking, the accuracy of the adjustment is deemed good enough for use in an operational form of SHIPS-MI and possible future training samples. It is also expected to incorporate data from the next generation of SSM/I (SSMIS) into SHIPS-MI using this technique.

## 5. Example

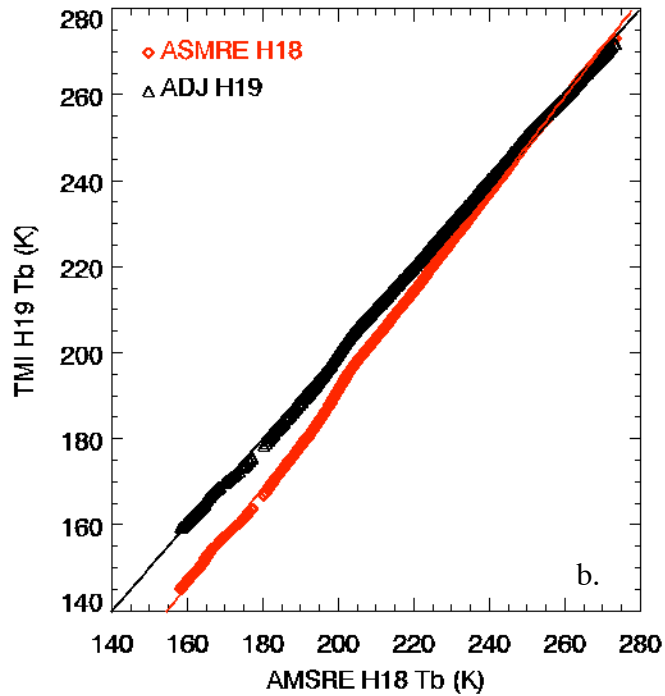
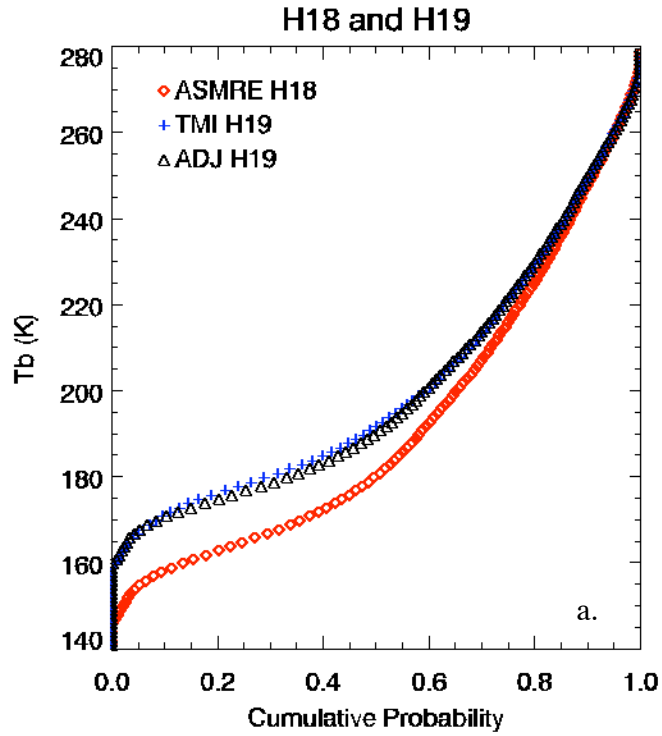
H18, H36, and H89 data from an AMSR-E overpass of Hurricane Ivan at 1543 UTC 4 September 2004 are adjusted to the TMI standard using Equations 1-3 (Figs. 4-6). Shown for comparison are H19, H37, and H85 data from a TMI overpass at 1537 UTC. The largest difference between raw and adjusted  $T_b$  occurs when AMSR-E H18 is adjusted to H19 (Fig. 4a-b). Observe the large area of  $\sim 150$  K H18  $T_b$  present outside the inner core of Ivan on the non-adjusted overpass. The adjustment to H19 increases these  $T_b$  by  $\sim 15$  K (Fig. 4b) resulting in a much better agreement with the concurrent TMI H19  $T_b$  (Fig. 4c). The adjusted H19 160 K contour is an excellent match to the corresponding contour on the TMI overpass. The adjustment has little effect in higher precipitation regions as evidenced by similar placement of 200 K contours on both adjusted and non-adjusted data. Little noticeable difference exists between AMSR-E H36 and adjusted H37  $T_b$  data (Fig. 5). Recall that no adjustment is made for  $H36 < 205$  K. The differences, often less than 5 K, are difficult to visualize in this image. Still, agreement between the adjusted H37 and TMI H37 data is excellent. The adjustment is somewhat more apparent with AMSR-E H89 (Fig. 6). The areal coverage of  $H89 > 270$  K decreases after adjustment to H85. The decrease more closely matches the areal coverage present in TMI H85 data. Given that the 89/85-GHz adjustment had the poorest fit, the adjustment still improves comparability between AMSR-E H89 and TMI H85 data by a significant margin.

## Acknowledgements

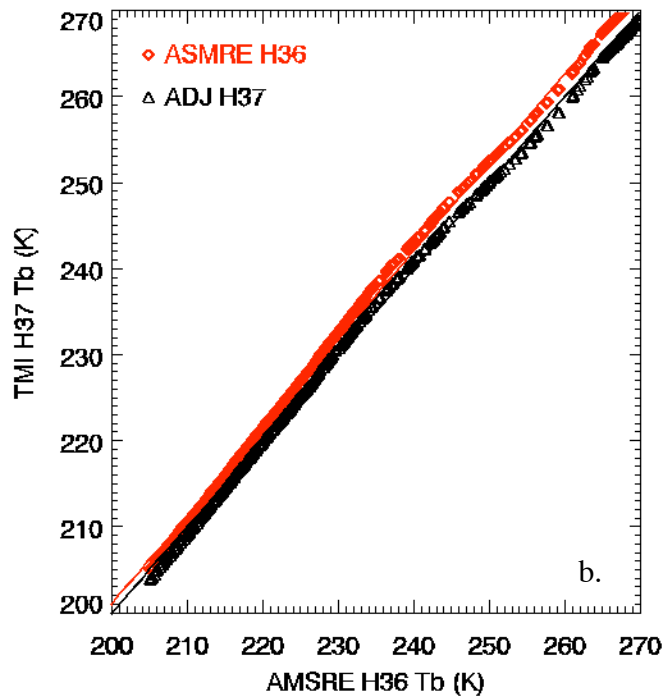
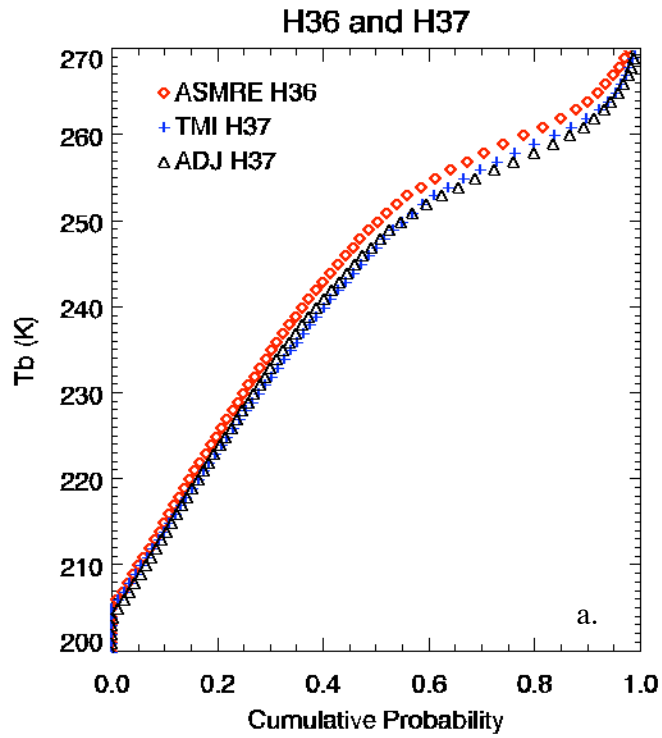
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## References

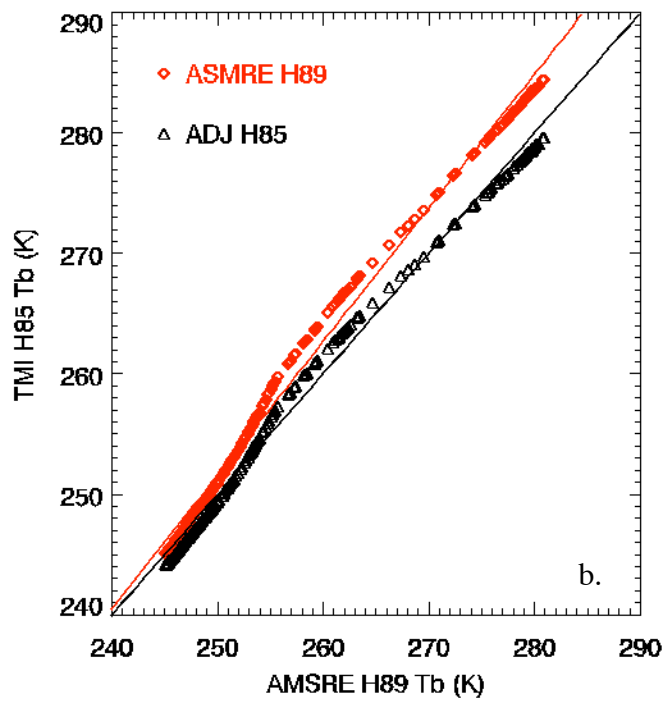
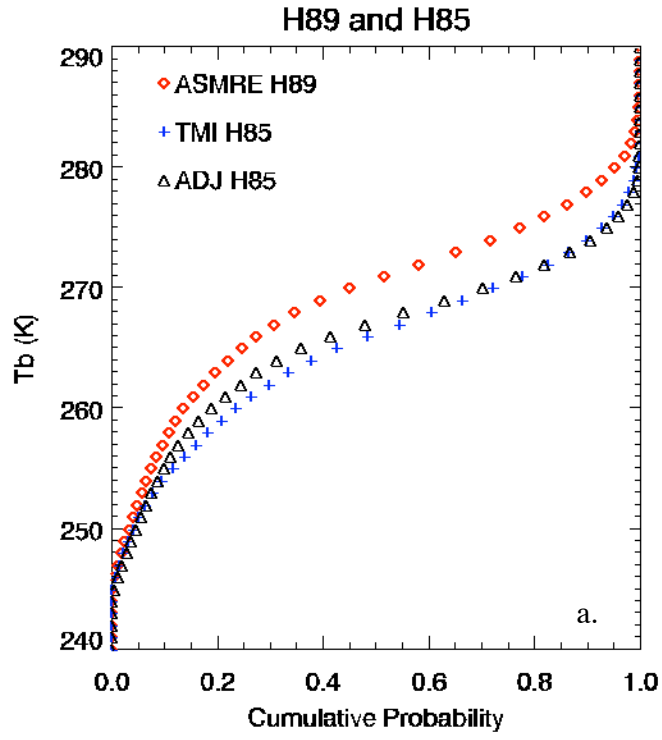
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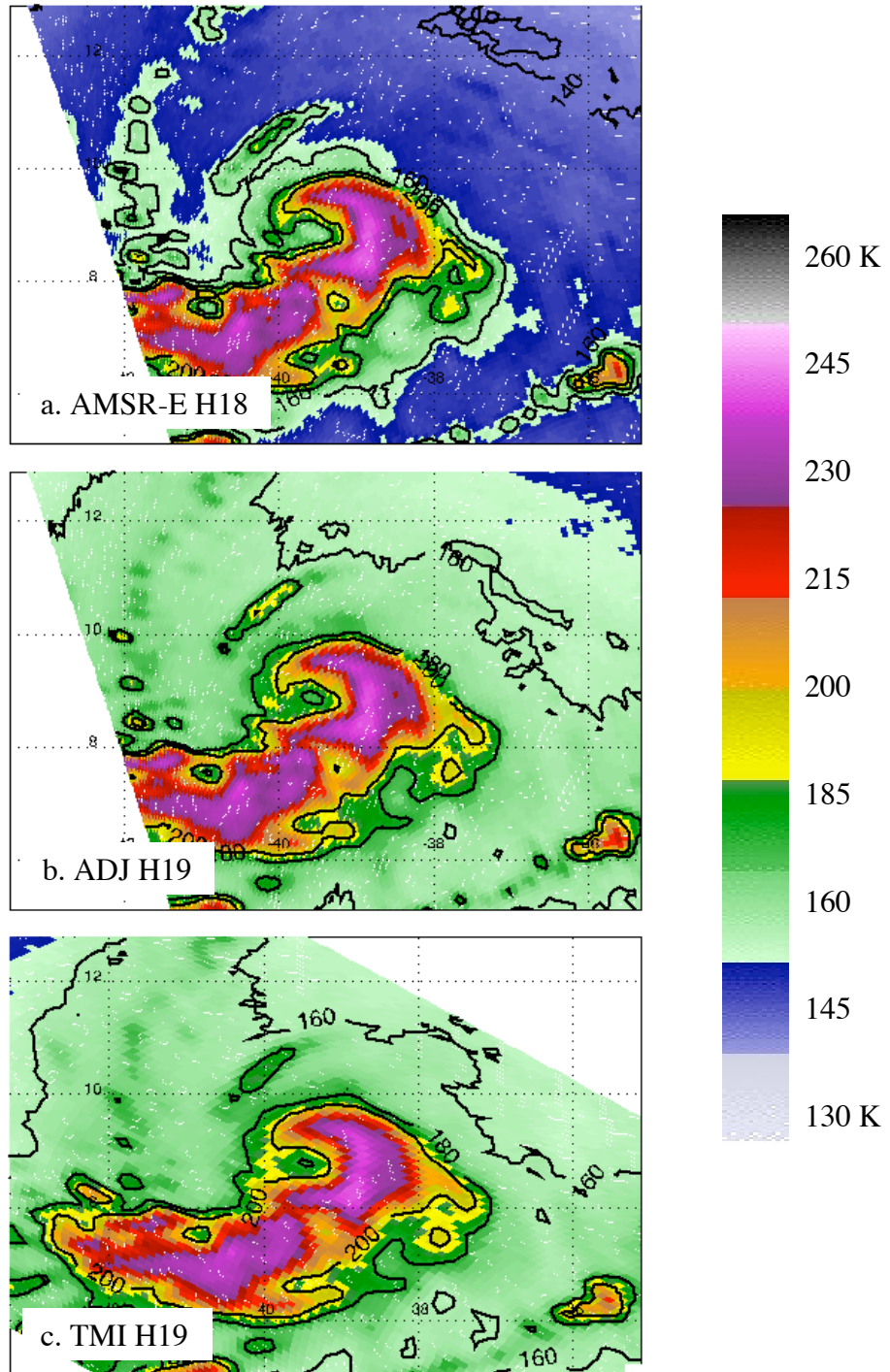
**Figure 1.** Cumulative distribution functions of AMSR-E H18 and TMI H19 brightness temperatures from the 10-overpass training sample (a). AMSR-E and TMI  $T_b$  pairs along lines of equal cumulative probability plotted as a function of each other (b, red points). Results for adjusted H19, using Eq. 1, data are shown for comparison in both plots (black triangles).



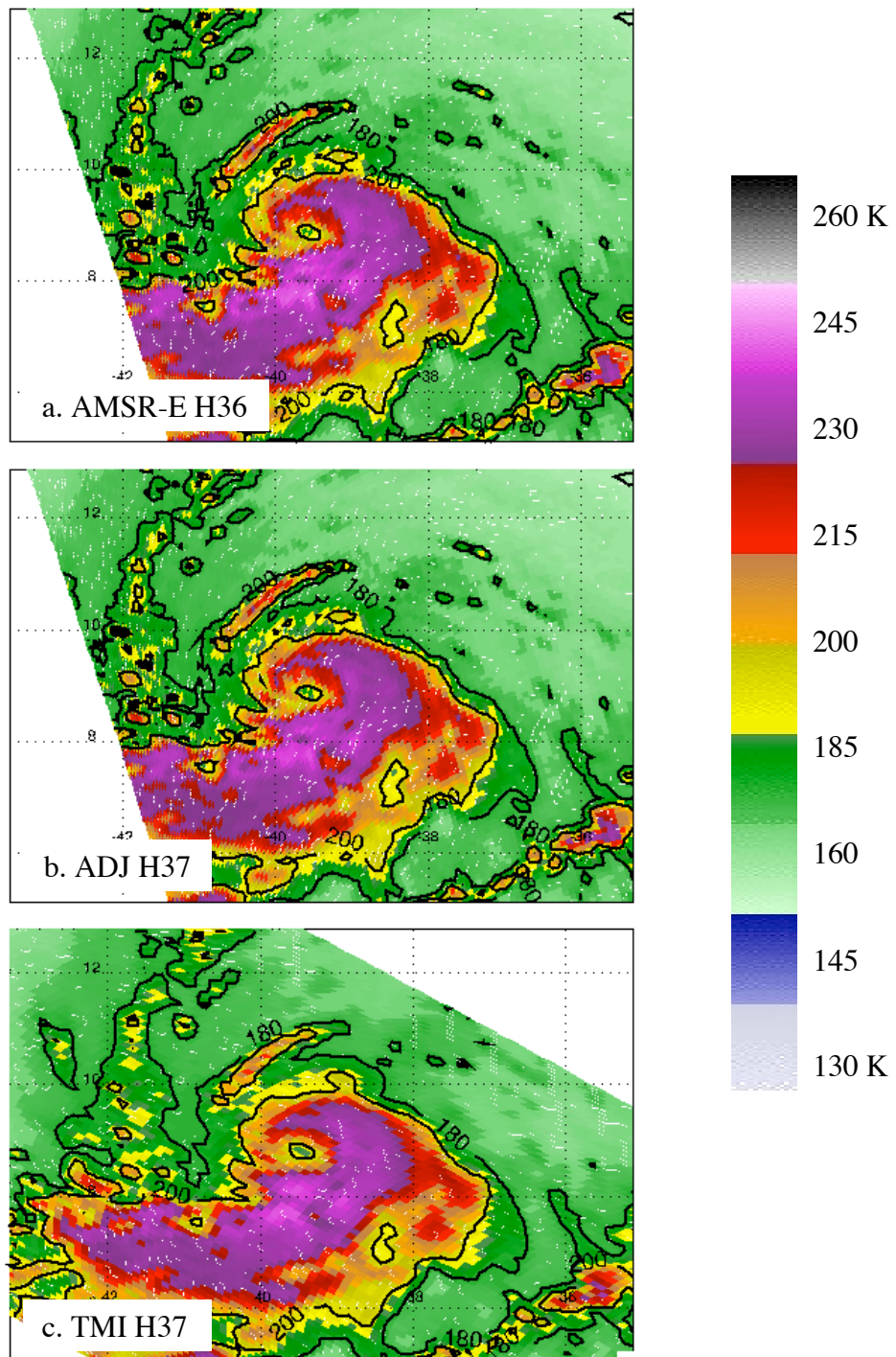
**Figure 2.** Same as Figure 1, but for AMSR-E H36, TMI H37 and adjusted H37  $T_b$  (Eq. 2). Data below 205 K are not shown.



**Figure 3.** Same as Figure 1, but for AMSR-E H89, TMI H85, and adjusted H85  $T_b$  (Eq. 3). Note the non-linearity in the difference between 250 and 260 K. This prevents the linear adjustment from performing as well as it does for H19 and H37 adjustments. Data below 245 K are not shown.

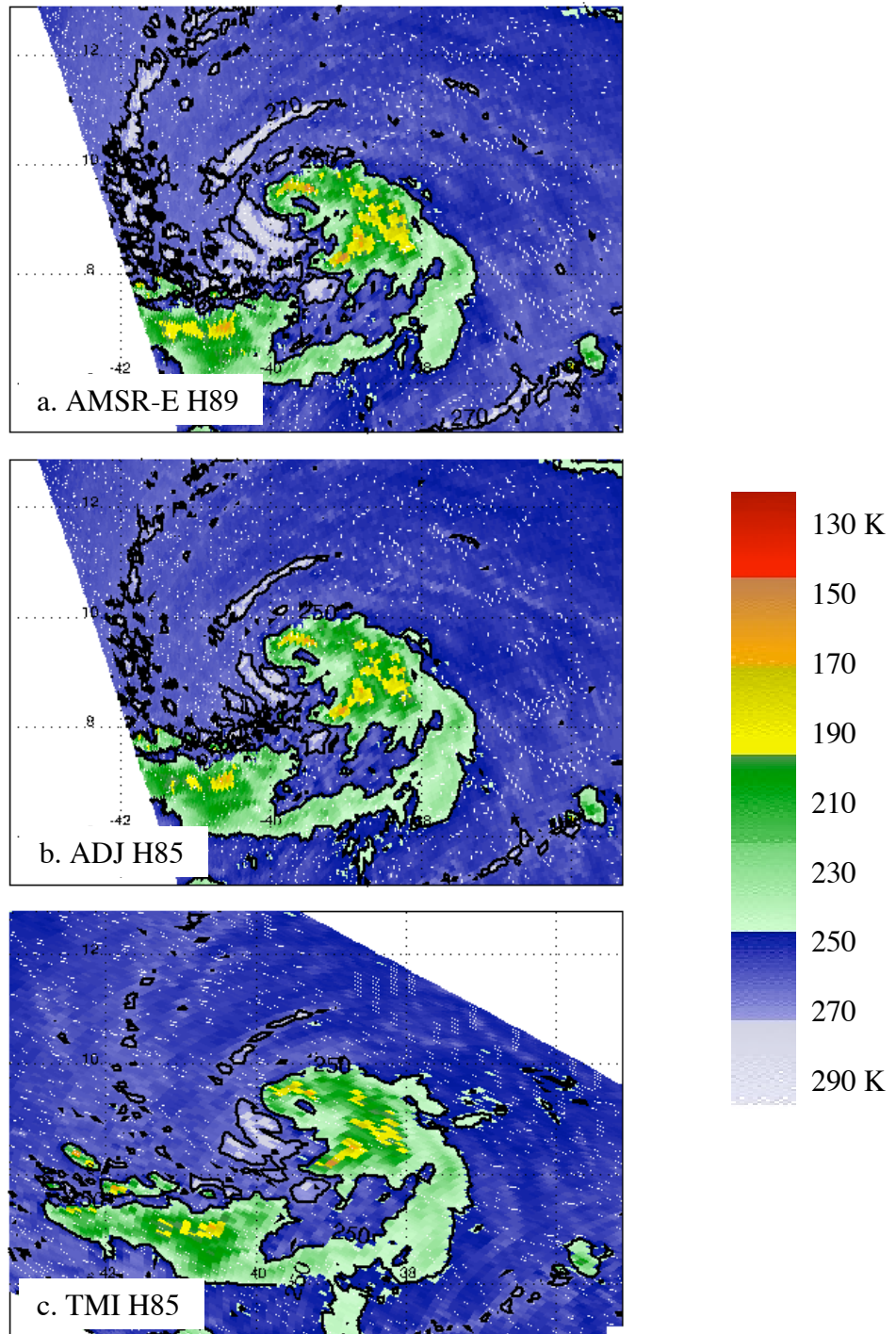


**Figure 4.** AMSR-E and TMI overpasses of Hurricane Ivan at 1543 and 1537 UTC 4 September 2004 centered on the interpolated best track location at these times. Raw AMSR-E H18 (a), adjusted AMSR-E H19 (b), and TMI H19 (c) are shown with contours at 140, 160, 180, and 200 K overplotted. Note the similarity in the 160 K contour between the adjusted AMSR-E H19 and TMI H19 and how both are ~15 K warmer than H18 in low precipitation regions.



**Figure 5.** Same as Figure 4, but for raw AMSR-E H36 (a), adjusted AMSR-E H37 (b), and TMI H37 (c) data. Little difference is apparent between raw and adjusted data for this frequency.





**Figure 6.** Same as Figure 4, but for raw AMSR-E H89 (a), adjusted AMSR-E H85 (b), and TMI H85 (c) data. 250 and 270 K contours are overplotted. Note the decrease in area of H89 > 270 K when adjusted to H85, which better matches the TMI reference. Regions of strong convection and ice scattering (H89 < 250 K) are not affected by the adjustment.