



## Article

# An Observational Study of the Symmetric Boundary Layer Structure and Tropical Cyclone Intensity

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**Abstract:** This study analyses Global Positioning System dropsondes to document the axisymmetric tropical cyclone (TC) boundary-layer structure, based on storm intensity. A total of 2608 dropsondes from 42 named TCs in the Atlantic basin from 1998 to 2017 are used in the composite analyses. The results show that the axisymmetric inflow layer depth, the height of maximum tangential wind speed, and the thermodynamic mixed layer depth are all shallower in more intense TCs. The results also show that more intense TCs tend to have a deep layer of the near-saturated air inside the radius of maximum wind speed (RMW). The magnitude of the radial gradient of equivalent potential temperature ( $\theta_e$ ) near the RMW correlates positively with storm intensity. Above the inflow layer, composite structures of TCs with different intensities all possess a ring of anomalously cool temperatures surrounding the warm-core, with the magnitude of the warm-core anomaly proportional to TC intensity. The boundary layer composites presented here provide a climatology of how axisymmetric TC boundary layer structure changes with intensity.

**Keywords:** tropical cyclone; atmospheric boundary layer; axisymmetric structure; storm intensity; climatology

## 1. Introduction

Tropical cyclones (TCs) typically form over warm ocean regions and may strengthen when the environmental factors are favorable. Even in favorable conditions, TCs experience differing intensification rates due to internal processes. Accurate forecasts of TC track and intensity in numerical weather prediction models depend on multiple factors, but one important requirement is that the TC structure should be accurately represented. For instance, previous numerical studies have shown large sensitivities of TC intensity and structure to certain planetary boundary layer (PBL) parameterization schemes [1–5]. The PBL physics regulates the strength of the inflow which is tied to TC spin-up via angular momentum advection [6]. It also affects the location of maximum low-level convergence and

distribution of convection [7,8]. Thus, it is imperative to understand the TC boundary-layer structure for model physics evaluation and improvement purposes.

Since 1997, GPS-based dropsondes have been deployed in TCs during National Oceanic and Atmospheric Administration's (NOAA) and Air Force's research and reconnaissance missions [9]. Dropsondes measure quasi-vertical profiles of wind velocities, temperature, pressure and humidity between flight level and sea surface with a very high vertical resolution ( $<10$  m). Dropsonde observations have been widely used for operational and research applications. In an operational framework, characteristics of the averaged wind profiles have been investigated in both eyewall and outside regions of TCs using dropsonde data [10]. Reduction factors are developed for estimating surface maximum winds from the flight level ( $\sim 700$  hPa), which are used by forecasters for making real-time estimates of TC intensity.

Previous studies have utilized dropsonde data to investigate both kinematic and thermodynamic structures of TCs. For example, Zhang et al. [11] and Ming et al. [12] have analyzed dropsonde data from multiple TCs to examine characteristic height scales of the boundary layer. Zhang et al. [13] and Ren et al. [14] have studied how the boundary layer height varies relative to the environmental shear and motion direction, respectively. Other aspects of the low-level TC structure have been investigated in several case studies, such as in Hurricanes Bonnie (1998, [15]), Edouard (2014, [16–18]), and Earl (2010, [19,20]), as well as in studies using a composite approach [21,22].

This present study aims to investigate the relationship of the axisymmetric TC boundary-layer structure and storm intensity by compositing dropsonde data from multiple TCs. The objective is to create an observations-based climatology of the symmetric low-level (i.e., boundary layer) structure of a TC. Accurate forecasts of TC track and intensity require the TC vortex in numerical weather prediction models to be represented with enough accuracy in the model's initial condition. Satellite-based observations can provide a reasonable estimate of TC horizontal structure, but they are limited by relatively low vertical resolution, especially in the boundary layer. The development of the GPS dropsonde has made it possible to obtain observations in nearly all portions of the TC with accuracy. The dropsonde composites can also be utilized for model evaluation purpose besides model initialization. Improved understanding of TC structural variation in response to storm intensity will provide useful information for forecasters to narrow the range of uncertainty in the intensity forecast, especially before TC landfalls.

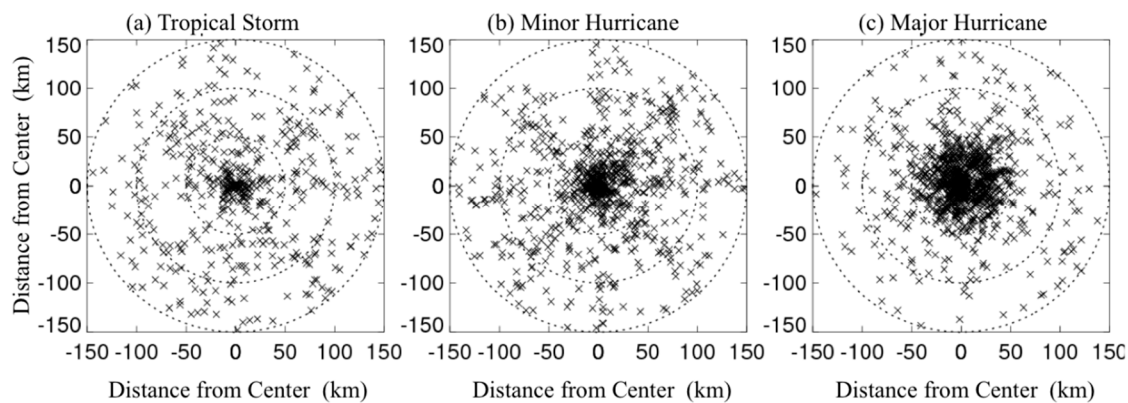
## 2. Data and Methodology

This study uses a comprehensive database of GPS dropsonde profiles collected between 1998 to 2017 to diagnose the boundary-layer structure of TCs with different intensity. All dropsondes used here were deployed from either research or reconnaissance aircraft at 700–850 hPa pressure levels. A dropsonde descends with a speed of  $\sim 10$  m s<sup>−1</sup>, collecting quasi-vertical atmospheric profiles of wind velocities, temperature, pressure, and humidity with a vertical resolution of less than 10 m. Details of instruments and their accuracies for a dropsonde can be referred to Hock and Franklin [9]. The raw dropsonde data are post-processed using the ASPEN program.

In order to stratify cases by storm intensity (defined as the maximum 1-min sustained surface wind speed at 10 m height), we use the intensity values provided by the National Hurricane Center's (NHC) Best Track data [23]. We group the data by three classes of TC intensity: (1) Tropical Storm ( $17.5$  m s<sup>−1</sup>  $\leq v_{\max} < 32.5$  m s<sup>−1</sup>), (2) Minor Hurricane ( $32.5$  m s<sup>−1</sup>  $\leq v_{\max} < 49$  m s<sup>−1</sup>), and (3) Major Hurricane ( $v_{\max} \geq 49$  m s<sup>−1</sup>). Table 1 lists the information of TCs and numbers of dropsonde profiles taken in each intensity class. A total of 42 TCs are included in the study. There are 641, 916, and 1051 dropsondes in the tropical-storm, minor-hurricane, and major-hurricane class, respectively. Figure 1 illustrates the horizontal distribution of dropsonde profiles for each intensity class. In all three TC intensity classes, the dropsondes are distributed evenly along azimuth and radius.

**Table 1.** List of TCs and number of dropsondes. Date is in year and month format. For TC strength, TS represents tropical storm; H1, H2, H3, H4, and H5 represents Category 1, 2, 3, 4, and 5 hurricanes, respectively.

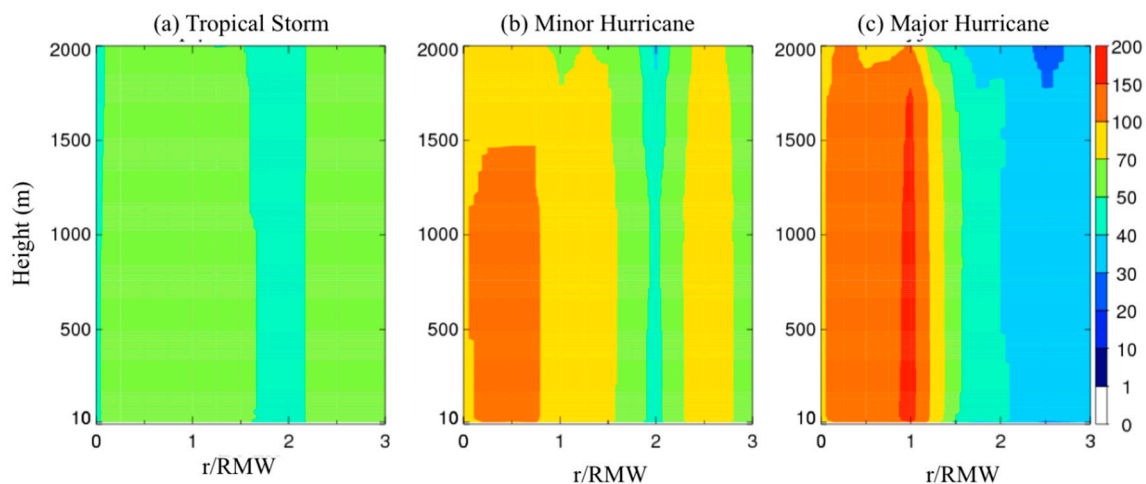
TC Date	TC Name	TC Strength	Dropsonde Counts
199808	BONNIE	TS, H3	12, 102
199808	DANIELLE	H1	52
199809	EARL	TS, H1, H2	3, 1, 2
199809	GEORGES	H1, H2, H4	16, 66, 28
199908	BRET	TS, H2, H4	3, 4, 7
199908	DENNIS	H1, H2	3, 17
199909	FLOYD	H2, H3, H4	13, 4, 7
200308	FABIAN	H3, H4	91, 63
200309	ISABEL	H2, H3, H4, H5	89, 7, 28, 156
200408	CHARLEY	TS, H1, H2, H3, H4	3, 12, 21, 15, 14
200408	FRANCES	H2, H3, H4	44, 11, 80
200409	IVAN	H3, H4, H5	14, 109, 41
200409	JEANNE	H2, H3	10, 1
200507	DENNIS	TS, H1, H3	4, 18, 2
200508	KATRINA	H3, H4, H5	44, 4, 20
200509	RITA	H4, H5	3, 10
200608	ERNESTO	TS	51
200609	HELENE	H1, H2	8, 42
201108	IRENE	H1, H2, H3	35, 44, 17
201110	RINA	TS, H1, H2, H3	1, 2, 1, 3
201208	ISAAC	TS, H1	158, 50
201208	LESLIE	TS	53
201210	SANDY	TS, H1	10, 97
201309	INGRID	TS, H1	21, 47
201310	KAREN	TS	39
201406	ARTHUR	TS, H1	30, 48
201407	BERTHA	TS, H1	37, 22
201408	CRISTOBAL	TS, H1	58, 28
201409	EDOUARD	H1, H2, H3	22, 51, 5
201410	GONZALO	H3, H4	23, 17
201508	DANNY	TS, H1, H3	24, 7, 10
201508	ERIKA	TS	82
201608	EARL	TS, H1	11, 5
201608	HERMINE	TS, H1	26, 3
201609	KARL	TS	51
201609	MATTHEW	H1, H2, H3, H4	8, 5, 14, 8
201708	FRANKLIN	TS	24
201708	HARVEY	TS, H1, H2, H3	50, 13, 18, 18
201708	IRMA	H3, H4, H5	15, 38, 67
201709	JOSE	TS, H1, H4	18, 12, 8
201709	MARIA	H1, H2, H3, H4, H5	64, 17, 15, 4, 14
201710	NATE	TS, H1	52, 53



**Figure 1.** Plan view of the dropsonde distribution in the azimuth-radial plane relative to the storm center for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes, respectively.

To compute the distance between each dropsonde and the TC center, Hurricane Research Division's (HRD) 2-min-track dataset are used [24]. To put each dropsonde into normalized radial coordinates, we normalize the physical radius by the radius of maximum winds (RMW). Hourly estimates of the RMW are provided by the Tropical Cyclone Observations-Based Structure (TC-OBS) Database developed by the Tropical Cyclone Data Project at NCAR [25]. This new database was built using objective analysis methods, such as criteria-informed weighted averaging, to assess various storm parameters from high-resolution aircraft flight-level observations and vortex data messages.

The final step in the axisymmetric composite analysis places the dropsondes into normalized radial coordinates (i.e.,  $r^* = r/\text{RMW}$ ). Figure 2 shows  $r^*$ - $z$  plot of dropsonde counts for each intensity class. The same composite method as in Zhang et al. [11] is used in this study. For the inner-core region ( $r^* < 2$ ), we use a radial bin width of  $0.25 r^*$  for the averaging. For the outer region, we use a bin width of  $0.5 r^*$ . Note that the normalization by the RMW was conducted for individual dropsondes before the composite analysis.

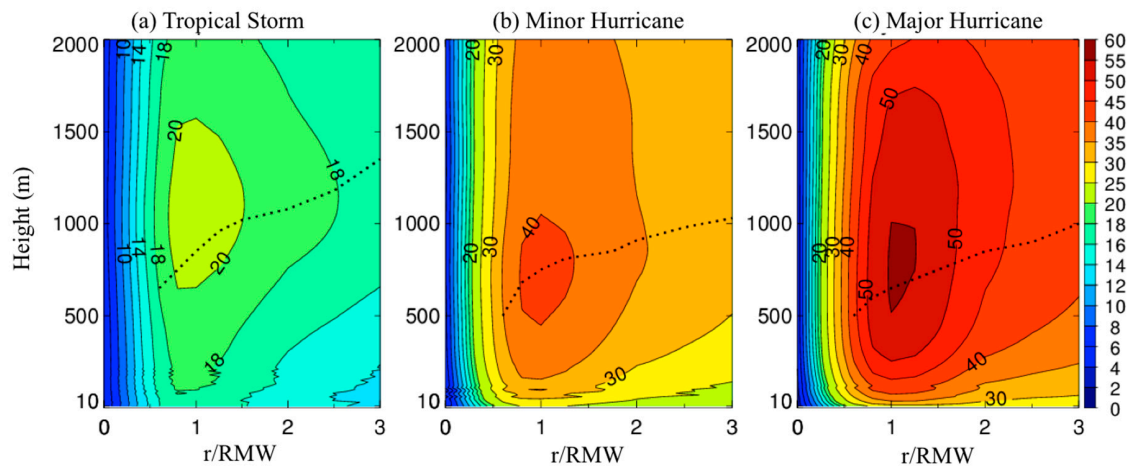


**Figure 2.** Distribution of data counts in the normalized-radial and vertical plane for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes.

### 3. Results

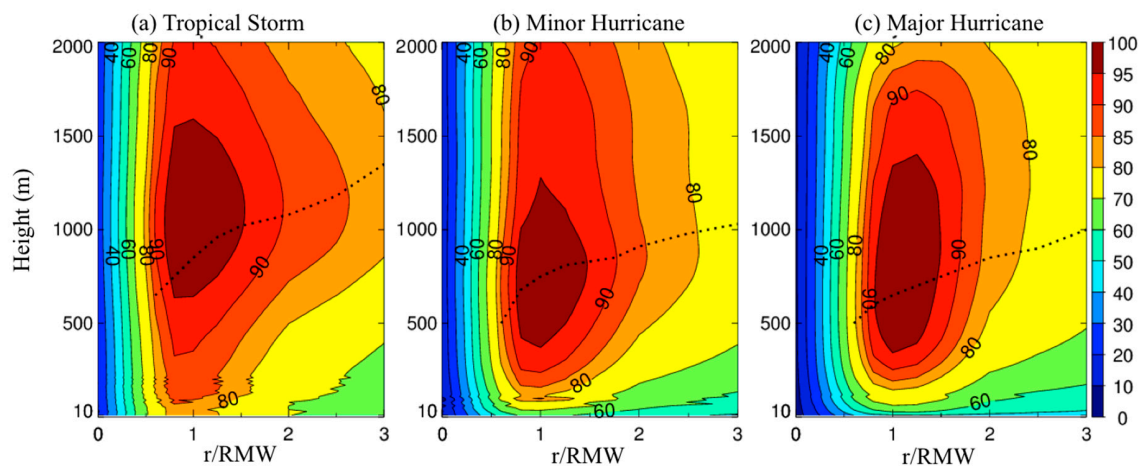
The normalized radius-height representation of tangential velocities for the tropical-storm, minor-hurricane, and major-hurricane composites are displayed in Figure 3. In the major-hurricane composite, the maximum tangential wind speed is  $58.1 \text{ m s}^{-1}$  and is located at  $\sim 600 \text{ m}$  altitude. For the minor-hurricane composite, the maximum tangential wind speed ( $V_t$ ) is  $44.7 \text{ m s}^{-1}$  at  $\sim 800 \text{ m}$  altitude. For the tropical-storm composite, the maximum  $V_t$  is  $23.2 \text{ m s}^{-1}$  at  $\sim 1000 \text{ m}$  altitude. In each intensity

class, the height of maximum  $V_t$  ( $h_{vtmax}$ ) increases with radius. Additionally, at a given radius,  $h_{vtmax}$  decreases with the TC intensity. The tropical-storm composite shows that  $h_{vtmax}$  increases to  $\sim 1300$  m at  $3 r^*$ , while it only increases to  $\sim 1000$  m in minor-hurricane and to  $\sim 800$  m in major-hurricane composites. This structure of  $V_t$  in hurricane-strength TCs is consistent with that in previous studies (e.g., [2,4,6,11,12]).



**Figure 3.** Composite analysis of the tangential velocities ( $\text{m s}^{-1}$ ) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The dashed line in each panel depicts the height of the maximum wind velocity as it varies with radius. The contour intervals in (a), (b), and (c) are 2, 5, and 5  $\text{m s}^{-1}$ , respectively.

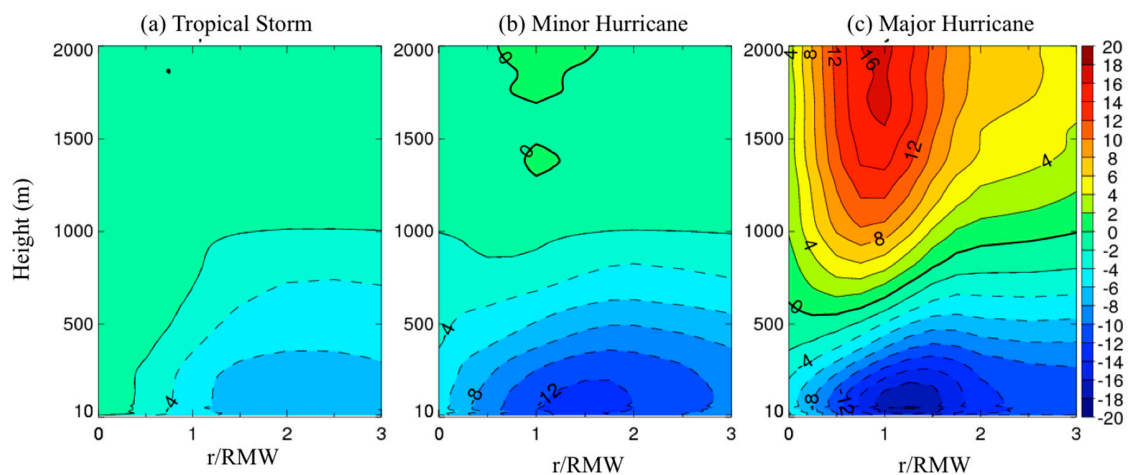
To further elucidate the characteristics of  $V_t$ , each composite is normalized by its composite-maximum value of  $V_t$  (Figure 4). While the decreasing trend in  $h_{vtmax}$  with increased TC intensity is evident, other interesting patterns are also revealed. Both the vertical and horizontal gradients of  $V_t$  increase with TC intensity. For example, at  $3 r^*$ , the tangential wind at 1000 m altitude is  $\sim 85\%$  the peak value in tropical storms, while it is only  $\sim 70\%$  the peak value in major hurricanes. The more rapid drop-off in  $V_t$  from their normalized values implies that the inertial stability is larger outside the eyewall region in more intense TCs. This corroborates the finding by Martinez et al. [26] that “the eye and inner-core region of major hurricanes are much more inertially resistant compared to minor hurricanes.”



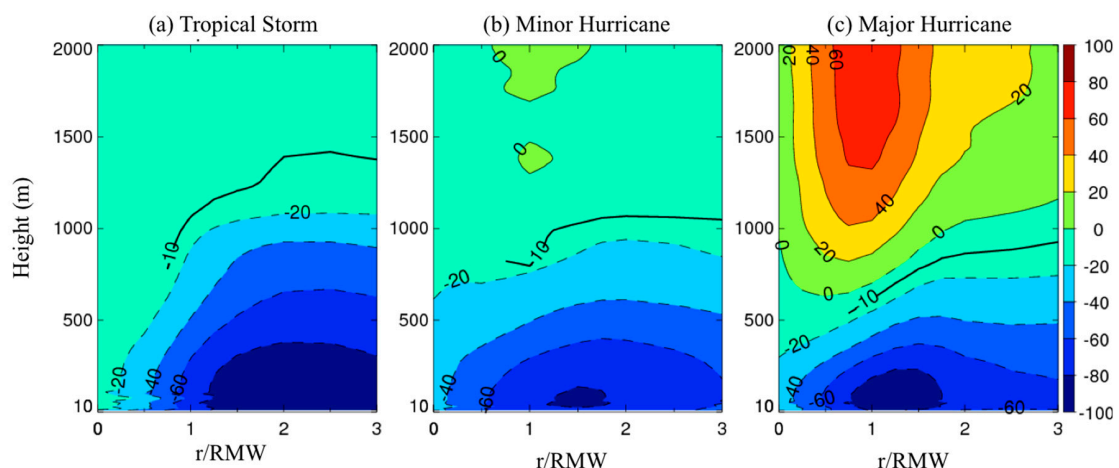
**Figure 4.** Composite analysis of the tangential velocity, as a function of altitude and the normalized radius, normalized by the composite-peak values for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes.



To explore the variation of the inflow layer depth ( $h_{\text{inflow}}$ ) with storm intensity, Figure 5 shows the composite of the axisymmetric radial wind speed ( $V_r$ ) for each intensity class, while Figure 6 shows the normalized  $V_r$  by the maximum inflow value. Here,  $h_{\text{inflow}}$  is defined as the height of 10% of the maximum value of negative  $V_r$  [11]. The maximum values of radial inflow are 7.5, 15.6, and 20.7  $\text{m s}^{-1}$  for tropical-storm, minor-hurricane, and major-hurricane composite, respectively. In all three composites, the radial inflow is strongest at  $\sim 150$  m altitude and is located between  $r^* = 1$  and  $r^* = 2$ . However, the shape of the radial wind field varies largely between the different intensity classes. The major-hurricane composite is the only one with a pronounced outflow above the boundary layer. In the major-hurricane composite,  $h_{\text{inflow}}$  is  $\sim 800$  m near  $r^* = 3$ , decreases towards the storm center to  $\sim 500$  m at  $r^* = 1$ . In the tropical-storm composite, the 10% contour is above 1000 m outside  $r^* = 1$ , which is larger than that in either the major- or minor-hurricane composite. In the minor-hurricane composite,  $h_{\text{inflow}}$  is nearly 1000 m at  $r^* = 3$  and decreases to  $\sim 750$  m at  $r^* = 1$ .



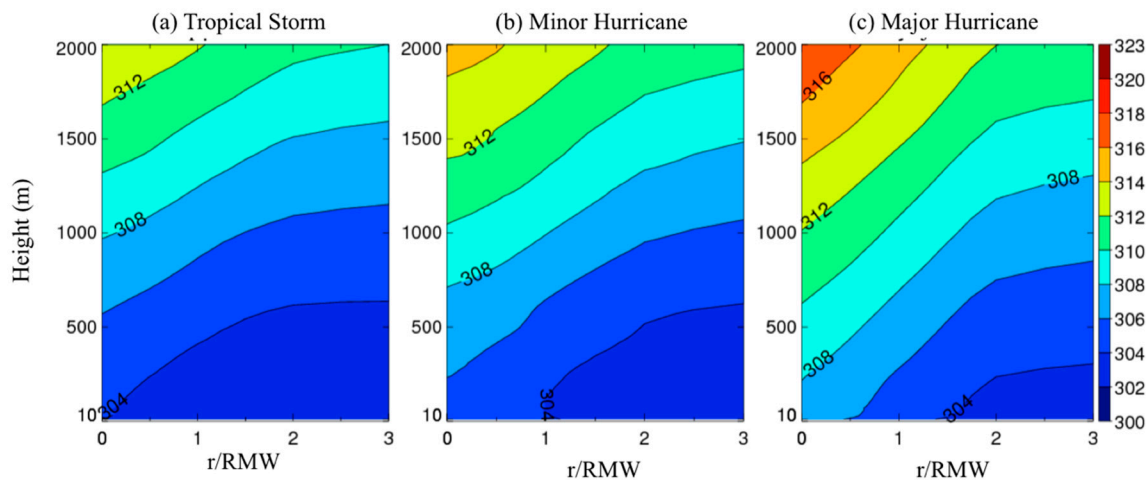
**Figure 5.** Composite analysis results of the radial wind velocity ( $\text{m s}^{-1}$ ) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. Contour interval is 2  $\text{m s}^{-1}$  in all panels.



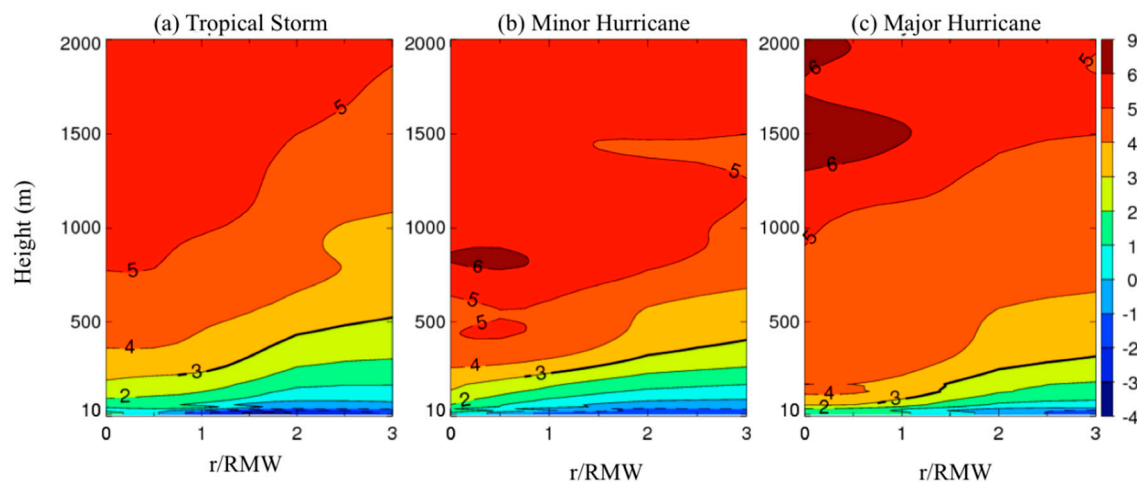
**Figure 6.** Composite analysis of the radial wind velocity normalized by the peak values in percentage (%) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes.

The thermodynamic mixed layer depth ( $z_i$ ) is estimated based on the profiles of virtual potential temperature,  $\theta_v$ , taken as the height where the lapse rate of  $\theta_v$  is 3  $\text{K km}^{-1}$  [11]. The  $\theta_v$  composite implies that the boundary layer is warmer and/or moister in more intense storms (Figure 7). As one might expect, the magnitude of  $\theta_v$  is larger at almost all vertical levels at a given radius in stronger

TCs than in weaker ones. A well-mixed layer is below 600 m altitude between  $r^* = 1$  and  $r^* = 3$  in the tropical-storm composite (Figure 8a), which is below 550 m between  $r^* = 1$  and  $r^* = 3$  in the minor-hurricane composite (Figure 8b), and is below 500 m beyond  $r^* = 3$  in the major-hurricane composite (Figure 8c). Additionally,  $z_i$  decreases with decreasing radius for all three intensity classes. At a given radius,  $z_i$  is larger for TCs with weaker intensity. However, in all the composites,  $z_i$  is much less than  $h_{vmax}$  or  $h_{inflow}$ . The largest  $z_i$  is  $\sim 500$  m at  $r^* = 3$  in the tropical-storm class. Close to the eyewall (i.e.,  $RMW = 1$ ),  $z_i$  is below  $\sim 250$  m in all three intensity classes. Furthermore, the lapse rate of virtual potential temperature (Figure 8) shows that the near-surface layer is much more unstable (i.e., larger values of negative gradient) in weaker TCs.



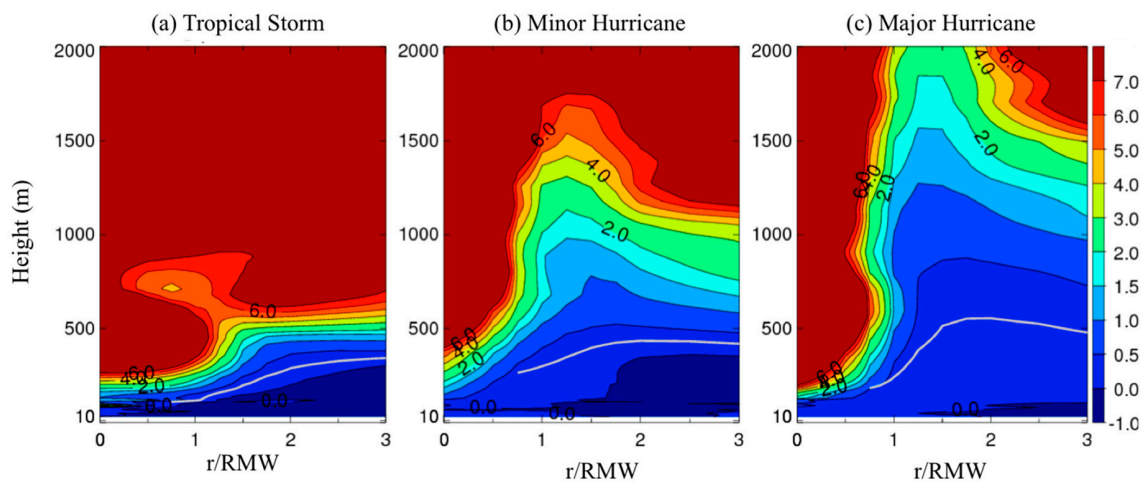
**Figure 7.** Composite analysis of the virtual potential temperature (in K) as a function of altitude and normalized radius to the storm center for (a) tropical Storms, (b) minor hurricanes, and (c) major hurricanes. The contour interval is 2 K in all panels.



**Figure 8.** Composite analysis of the lapse rate of virtual potential temperature (in  $K km^{-1}$ ) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The thick black line represents the contour of  $d\theta_v/dz = 3 K km^{-1}$ . The contour interval is 1  $K km^{-1}$  in all panels.

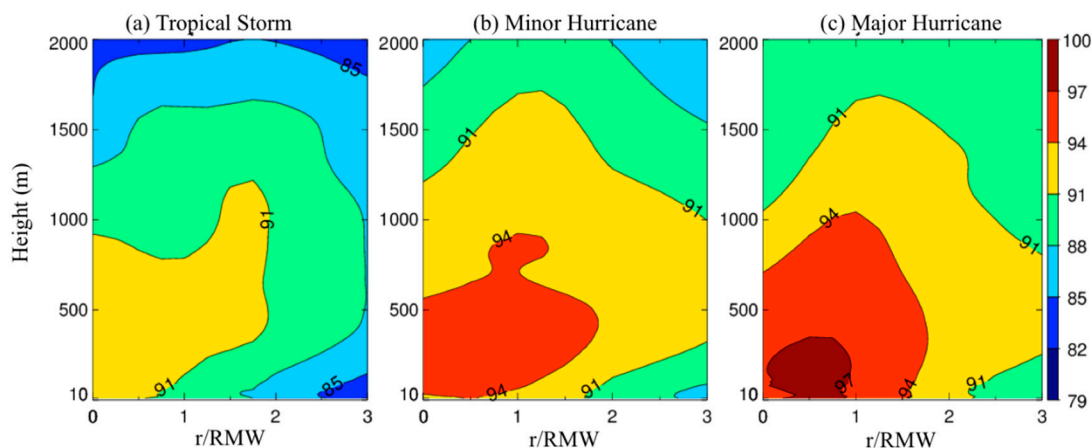
The last boundary layer height definition is based on the height at which the bulk Richardson number is equal to a critical value of 0.25 ( $h_{Ric}$ ). This method has been widely applied in the PBL schemes of numerical models [27–29]. Interestingly,  $h_{Ric}$  is generally larger in more intense TCs at a given radius (Figure 9).  $h_{Ric}$  generally has a decreasing trend with decreasing radius in all three intensity classes, although there is a relatively large drop toward the storm center just outside  $r^* = 1$  in

the major-hurricane class. Note that the difference in the magnitude of Richardson number among the intensity classes is mainly due to the difference in wind shear, as the difference in the static stability is small among the intensity classes as shown in Figure 8.



**Figure 9.** Composite analysis of the Richardson numbers as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The gray line in each panel shows the 0.25 contour.

Next, we evaluate the differences in the thermal structures between the three intensity classes. Generally, the relative humidity decreases with height in all three composites (Figure 10). The relative humidity is the largest inside the RMW for all three intensity classes and is larger at almost all vertical levels at a given radius for more intense TCs. The major-hurricane composite shows nearly saturated (i.e., relative humidity  $>95\%$ ) air below 400 m and inside the RMW, while at the same region in the tropical-storm composite the relative humidity only approaches  $\sim 91\%$ . Overall, more intense TCs tend to have a deeper layer of near-saturated air. These differences are consistent throughout the inflow layer and extend radially out to  $r^* = 3$ .

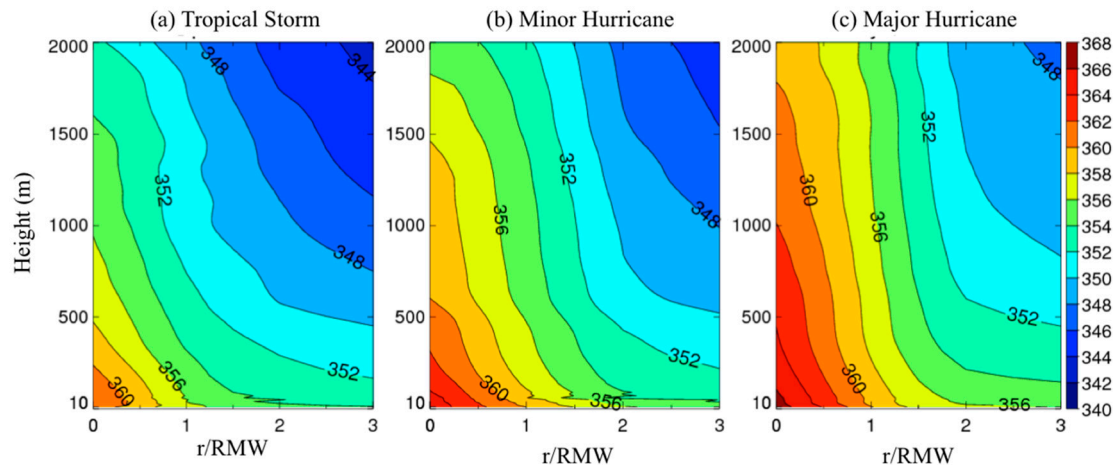


**Figure 10.** Composite analysis of relative humidity (%) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The contour interval is 3% in all panels.

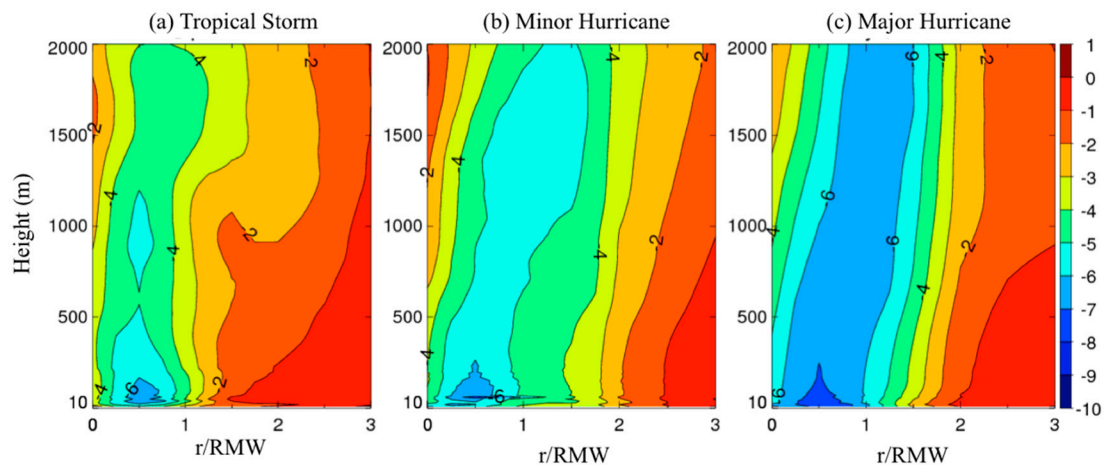
The distribution of equivalent potential temperature ( $\theta_e$ ) in each composite is qualitatively consistent with that of the relative humidity distribution below 1000 m (Figure 11). It appears that  $\theta_e$  increases as both height and radius decrease, and in general, the magnitude of near-surface  $\theta_e$  increases as TC intensity increases. In the major-hurricane composite, the isolines of  $\theta_e$  are nearly vertical near



the RMW, while in less intense storm composites, the  $\theta_e$  isolines tend to bend inward with height. Furthermore, the radial gradient of  $\theta_e$  differs between the three TC classes (Figure 12). Outside the RMW, the radial gradient is much larger for more intense TCs. This result agrees with the maximum potential intensity theory given by Emanuel [30] and numerical simulation result given by Bryan and Rotunno [31].



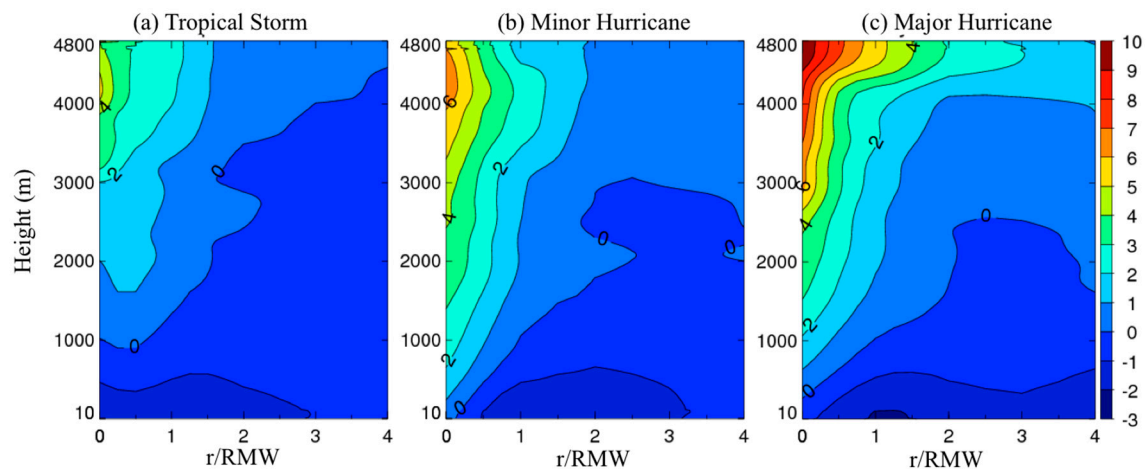
**Figure 11.** Composite analysis of equivalent potential temperature (in K) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The contour interval is 2 K in all panels.



**Figure 12.** Composite analysis of the radial derivative of equivalent potential temperature as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The contour interval is 1 K km<sup>−1</sup> in all panels.

To examine the low-level warm-core structure, we present composites of the temperature anomaly. Here, the temperature anomaly is computed as the difference between the TC temperature and environmental temperature. The environmental reference temperature is taken as the average temperature within  $r^* = 8$  and  $r^* = 14$  radii [32,33]. Here, the environmental dropsonde data are from the G-IV aircraft. There are a total of 78, 43, and 37 environmental dropsondes for tropical-storm, minor-hurricane, and major-hurricane class, respectively. Note that we extend the temperature anomaly composite to 4800 m in the vertical and 4  $r^*$  in the radii (Figure 13). A cold temperature anomaly exists in the low levels of all three composites, which is mainly a result of adiabatic expansion due to the low pressure at the storm center. The coldest anomaly exists in the major hurricane group. According to balanced dynamics, this low-level cold anomaly (along with the effect of friction) may help explain why

the maximum tangential wind is found near 500 m rather than at the ground [34]. Of note, one needs to consider unbalanced dynamics in the TC boundary layer as well, especially in intense storms [35–38].



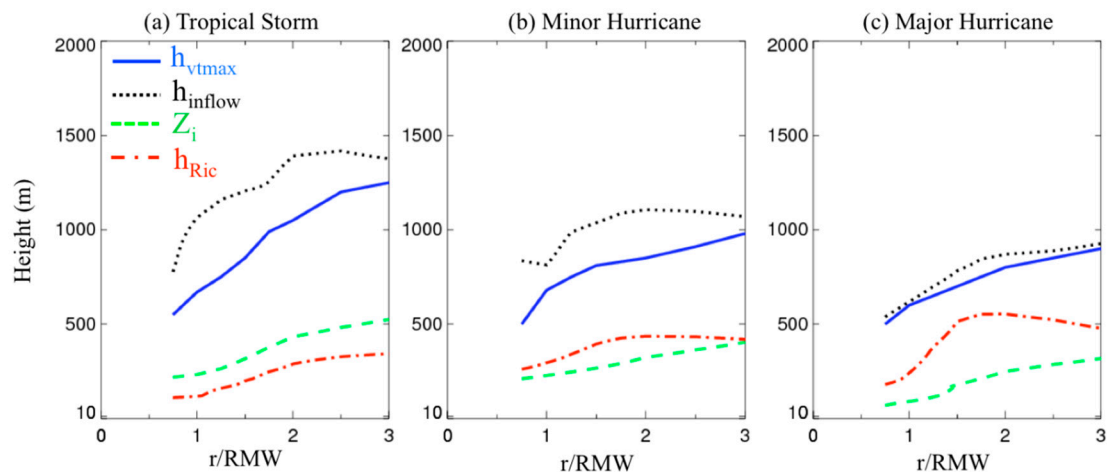
**Figure 13.** Composite analysis of the temperature anomaly (in K) as a function of altitude and normalized radius for (a) tropical storms, (b) minor hurricanes, and (c) major hurricanes. The contour interval is 1 K in all panels.

In all three composites, the warm core expands outwards with height above 1000 m altitude, where the cold perturbation gradually diminishes with radius. The magnitudes of temperature anomalies are weaker for less intense TCs in agreement with previous studies [29,32,39,40]. The warm-core anomaly maximum is ~10 K in major hurricanes, while it is only ~4 K in tropical storms. Even so, the maximum warm-core anomaly occurs at similar heights in all three composites.

#### 4. Discussion and Conclusions

This study constructed composites of dropsonde data to study the low-level structure of TCs of different intensity. After pairing these dropsondes with available TC parameters from the Best Track and the TC-OBS Database, 2608 dropsonde profiles from 42 North Atlantic TCs were analyzed over the period from 1998 to 2017. Composite analyses of inner-core structure of tangential wind, radial wind, virtual potential temperature, relative humidity, equivalent potential temperature, and temperature anomaly are conducted for three intensity classes: tropical-storm, minor- and major- hurricanes. The first part of this study is a follow-up to Zhang et al. [11]. Note that that study [11] analyzed a much smaller number of dropsondes than our study. The uniqueness of the current composite analysis is the inclusion of a tropical storm group, an intensity category that has not been previously sampled as frequently.

Figure 14 presents a schematic diagram synthesizing the results of boundary-layer heights ( $h_{\text{inflow}}$ ,  $h_{\text{vtmax}}$ ,  $z_i$ , and  $h_{\text{Ric}}$ ) for the three TC intensity classes. All these height scales show a general decreasing trend with decreasing radius outside the RMW. While  $h_{\text{inflow}}$  and  $h_{\text{vtmax}}$  are close to each other,  $z_i$  and  $h_{\text{Ric}}$  are much smaller than  $h_{\text{inflow}}$  in all intensity classes.



**Figure 14.** A schematic plot summarizing the height scales in the composites of (a) tropical storms, (b) minor hurricanes, and (c) and major hurricanes. Note that  $h_{vtmax}$  is the height of maximum tangential wind speed;  $h_{inflow}$  is the inflow layer depth,  $Z_i$  is the thermodynamic mixed layer depth, and  $h_{Ric}$  is the boundary layer height based on critical Richardson number method.

The result that more intense TCs tend to have a shallower boundary layer outside the RMW may be explained by the dynamical scaling (i.e., the square root of the ratio of the vertical eddy diffusivity and the inertial stability) [41]. It is expected that the inertial stability increases with the wind speed. In-situ aircraft data indicated that the vertical eddy diffusivity increases nearly linearly with the wind speed [42–44]. However, the inertial stability increases faster than the vertical eddy diffusivity as the wind speed increases, because the inertial stability is nearly a function of the square of the wind speed. This may explain why stronger TCs tend to have shallower boundary layers.

In addition to the boundary-layer height, this study also investigated differences in the thermal structure among TCs of different intensities. The composites of all TC intensity classes possess a cold temperature anomaly surrounding the warm core near the top of the inflow layer with larger warm-core anomaly in more intense TCs. The result also suggests that more intense TCs have a deep layer of the near-saturated air in the eyewall region. The moisture differences between the three intensity classes may be tied to different strengths of turbulent mixing in TCs with different intensity. As stronger TCs tend to have larger turbulent mixing in a deeper layer as indicated by  $h_{Ric}$ , the near-saturated air near the sea surface could be mixed to higher levels in the boundary layer in stronger TCs.

The equivalent potential temperature increases as both radial distance and height decrease, and this trend is qualitatively consistent with the relative humidity distribution in all groups. In the eyewall region, the vertical variation of  $\theta_e$  is much smaller in stronger TCs than in weaker TCs. On the other hand, the magnitude of the radial variation of  $\theta_e$  is much larger in stronger TCs than in weaker TCs, especially in the eyewall region.

The TC-intensity based dropsonde composites in this study have several applications for TC forecast and research. For example, these composites can be used to identify deficiencies in the existing algorithms to construct initial bogus vortices for TC forecast models. One could also use these composites to validate TC structure in numerical simulations or forecasts over a TC's life cycle, during its transition from a tropical-storm stage to minor-hurricane and/or major-hurricane stages. Such an examination may help identify potential deficiencies in model physics that can be reduced to improve TC track and intensity forecasts. The observed structural differences in TCs with different storm strengths may also assist forecasters to estimate potential TC intensity change in real time. The structural differences between weak and strong TCs can also be useful in the communication of intensity forecasts from the forecasters to public audiences.

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