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Intercomparison of Planetary Boundary Layer Heights Using Remote Sensing Retrievals and ERA5 Reanalysis over Central Amazonia

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Abstract: The atmospheric boundary layer height (z_i) is a key parameter in the vertical transport of mass, energy, moisture, and chemical species between the surface and the free atmosphere. There is a lack of long-term and continuous observations of z_i , however, particularly for remote regions, such as the Amazon forest. Reanalysis products, such as ERA5, can fill this gap by providing temporally and spatially resolved information on z_i . In this work, we evaluate the ERA5 estimates of z_i (z_i -ERA5) for two locations in the Amazon and corrected them by means of ceilometer, radiosondes, and SODAR measurements (z_i -experimental). The experimental data were obtained at the remote Amazon Tall Tower Observatory (ATTO) with its pristine tropical forest cover and the T3 site downwind of the city of Manaus with a mixture of forest (63%), pasture (17%), and rivers (20%). We focus on the rather typical year 2014 and the El Niño year 2015. The comparison of the experimental vs. ERA5 z_i data yielded the following results: (i) z_i -ERA5 underestimates z_i -experimental daytime at the T3 site for both years 2014 (30%, underestimate) and 2015 (15%, underestimate); (ii) z_i -ERA5 overestimates z_i -experimental daytime at ATTO site (12%, overestimate); (iii) during nighttime, no significant correlation between the z_i -experimental and z_i -ERA5 was observed. Based on these findings, we propose a correction for the daytime z_i -ERA5, for both sites and for both years, which yields a better agreement between experimental and ERA5 data. These results and corrections are relevant for studies at ATTO and the T3 site and can likely also be applied at further locations in the Amazon.

Keywords: Amazon forest; El Niño; atmospheric boundary layer; ERA5 simulations; GoAmazon and ATTO projects

1. Introduction

The planetary boundary layer (PBL) is the lowest portion of the troposphere and is directly and dynamically influenced by the Earth's surface [1,2]. These surface-atmosphere

interactions occur on short timescales and play a crucial role in the development of the PBL height (z_i). The PBL is also influenced by atmospheric conditions, topographic characteristics, and the type of land cover. Thus, z_i is an important parameter for many meteorological applications, such as air quality monitoring, cloud formation and evolution, land and ocean surface fluxes, and the atmospheric hydrological cycle [3]. As the PBL height represents the depth of the vertical turbulent mixing and, therefore, defines the enrichment or dilution of pollutants close to the surface, it is an essential parameter in air quality monitoring and simulations [4]. The PBL height is, further, a key factor in numerical weather forecasts, since the base height of the clouds is usually located closely to z_i . Furthermore, the PBL evolution from its nocturnal state to convective mixing determines the cloud development and transition from shallow to deep convection [5].

The z_i values can be obtained from radiosonde launches [6] as well as from various remote sensing tools, such as ground-based LIDAR [7–9], SODAR [10], ceilometer [11,12], and aircraft sounding [13]. These methods typically provide high-resolution profiles of the lower troposphere, however, are typically restricted to local measurements and limited measurement periods. Logistical and budgetary constraints further strongly limit continuous measurements in remote areas, which entails that experimental z_i retrievals are sparse over oceans, mountains, deserts, and large forests. A framework for satellite-based z_i estimates is being developed [14,15], providing a good spatial coverage [14,16–18], however, with relatively low accuracy [19–21].

Reanalysis data are a promising alternative to obtain z_i for different and especially remote areas of the world. The reanalysis system combines observational and modeling data by assimilating a variety of measurements, ranging from in situ to space-borne data, into weather prediction models. A main strength of reanalysis products is their spatiotemporal continuity, which enables long-term studies. A good example is the fifth generation of the European Centre for Medium-Range Weather Forecasts (ECMWF) atmospheric reanalysis (ERA5) [22], which is an upgrade of the previous ERA-Interim [23]. This dataset provides a good representation of the atmosphere and is being used worldwide – especially for z_i values [24,25]—as it provides data where observational information is not available.

Intercomparisons between experimental data, such as radiosonde and LIDAR, on one hand, and ERA5 reanalysis data, on the other, were conducted in several previous studies. Zhang et al. [25] showed that the ERA5 z_i values over the US exceed corresponding aircraft observations by 18–41%. This overestimation might be caused by different kinetic or thermodynamic assumptions used in the ERA5 estimates. Recently, [26] compared z_i at a tropical site in western India using different estimates from satellite, radiosondes, and ERA5 outputs. They found that ERA5 underestimates the daytime ceilometer observations by 200–500 m. Unfortunately, they did not provide any information of corresponding comparison during nighttime. Madona et al. [27] compared the ERA5 outputs with radiosonde data for a long period (1978–2018) over Europe. They also analyzed the nighttime and daytime z_i values for both atmospheric stability classes (unstable/daytime and stable/nighttime). They found that ERA5 is able to represent the observations at the Lindenberg Observatory in Germany reasonably well. Ref. [24] analyzed the climatology of ERA5-derived z_i from 8 sites over the Korean peninsula and surrounding sea over a 10-year period. Their results show that ERA5 outputs agree reasonably well with radiosonde observations, although with significant diurnal and seasonal variability. They found an average correlation coefficient of around 0.7 for both timescales. The authors emphasize the importance of the soil moisture/surface sensible heat fluxes in modulating the PBL height. Remarkably, the authors also found an increasing trend in z_i over the period of their study and associated this with potential effects of climate change. Ref. [28] established a daytime z_i climatology based on different datasets (i.e., ERA5, MERRA-2, JRA-55, and NCEP-2). They analyzed around 300 stations (but none over Amazonia) during the period from 2012 up to 2019 and found that all reanalysis products underestimate the observations. In this study, the ERA5 provided the best results relative to radiosondes, however, with a negative bias (around –130 m). The study does not provide information on the nighttime period.

Over the Amazon region, several previous studies have investigated z_i , mainly using radiosonde data collected during field campaigns [29–34]. Ref. [30] were among the first to show that z_i values are greater above pasture than above forest regions. Ref. [33] recently evaluated the diurnal cycle of z_i in two contrasting years, 2014 (typical year) and 2015 (El Niño year). For this, they used a wide suite of instruments (radiosonde, SODAR, ceilometer, wind profiler, LIDAR, and microwave radiometer) installed during the GoAmazon 2014/2015 campaign [35]. They found that the ceilometer is the best instrument to describe the PBL height once compared with in situ radiosonde measurements. Additionally, the El Niño year substantially influenced the growth phase of the daytime PBL, with a 15% increase in its rate. In another approach, ref. [36] analyzed the PBL structure over two tropical forests in Central Amazonia, using observations and a numerical high-resolution model (large eddy simulation models—LES). The results, based on turbulent kinetic energy analysis, conclude that the boundary layer structure is strongly influenced by the presence of topography (hills and valleys) that can also trigger horizontal heterogeneity. Ref. [37] used observations and numerical model outputs for Amazonia to show that heat and moisture transports from the sub-cloud into the cloud layer are not well represented by regular reanalysis, such as ERA5.

This paper has the goal to better understand the PBL evolution by comparing multiple instruments and ERA5 simulations for two distinct years and for two distinct surface covers in Central Amazonia. The extensive observational data used here were collected during GoAmazon 2014/15 [35] and the ATTO project [38] as two major recent field experiments in Central Amazonia. The convective boundary layer (CBL) and the nocturnal boundary layer (NBL) were analyzed independently. We derived z_i from ERA5 and propose a correction for this data based on the observational results. This comparatively simple correction is meant to allow the scientific community to use the ERA5 z_i in a more reliable way and it represents a new parameterization for the z_i retrieval in ERA5. To our knowledge, this is the first study proposing a correction to the z_i values from ERA5 for the Amazon region.

2. Methods and Materials

2.1. Study Sites

The study was carried out using data from two experimental sites located in Central Amazonia, as shown in Figure 1. The first one is called T3 site (03°12'36" S–60°36'00" W, and 60 m of elevation above sea level) and was part of the Green Ocean Amazon Project (GoAmazon, <http://campaign.arm.gov/Goamazon2014/>, accessed on 25 July 2022) [35]. It is located in a pasture area north of the municipality of Manacapuru in the state of Amazonas. The second site is called Amazon Tall Tower Observatory (ATTO) and is installed in a region of pristine tropical forest (02°08'44.69" S–59°00'17.44" W, and 130 m of elevation above sea level) about 150 km northeast of the city of Manaus, in the Uatumã Sustainable Development Reserve [38]. The T3 site is quite flat [35], a common feature for Amazonian regions located close to large rivers. On the other hand, the ATTO site has a slightly more accentuated orography, common to terra firme forests in the Amazon region [36,39].

The climate in Amazonia is strongly associated with the rainfall distribution, with a wet (from February up to May) and a dry (from August to October) season. The temperature cycle is almost absent and its seasonal variation is around 2 °C. The energy partitioning between sensible and latent heat fluxes at the surface is strongly dependent on this rainfall distribution/soil moisture content [40].

For the current study, data from the GoAmazon project were used for the rainy quarters (named wet season) from February up to April, and for the the dry quarters (named dry season) from August up to October for two different years: 2014 can be considered a typical year in terms of rainfall distribution, whereas 2015 was largely affected by the strong El Niños at that time [33]. For ATTO, data from 31 October to 30 November 2015 were used, as both ceilometer and radiosonde data were available in this timeframe. For the GoAmazon analysis, the wet season (2014 and 2015) consisted of 89 days, which represents 2136 h

of measurement, while the dry season (2014 and 2015) consisted of 92 days, representing 2208 h. For ATTO analysis, it was only 30 days (representing 720 h).

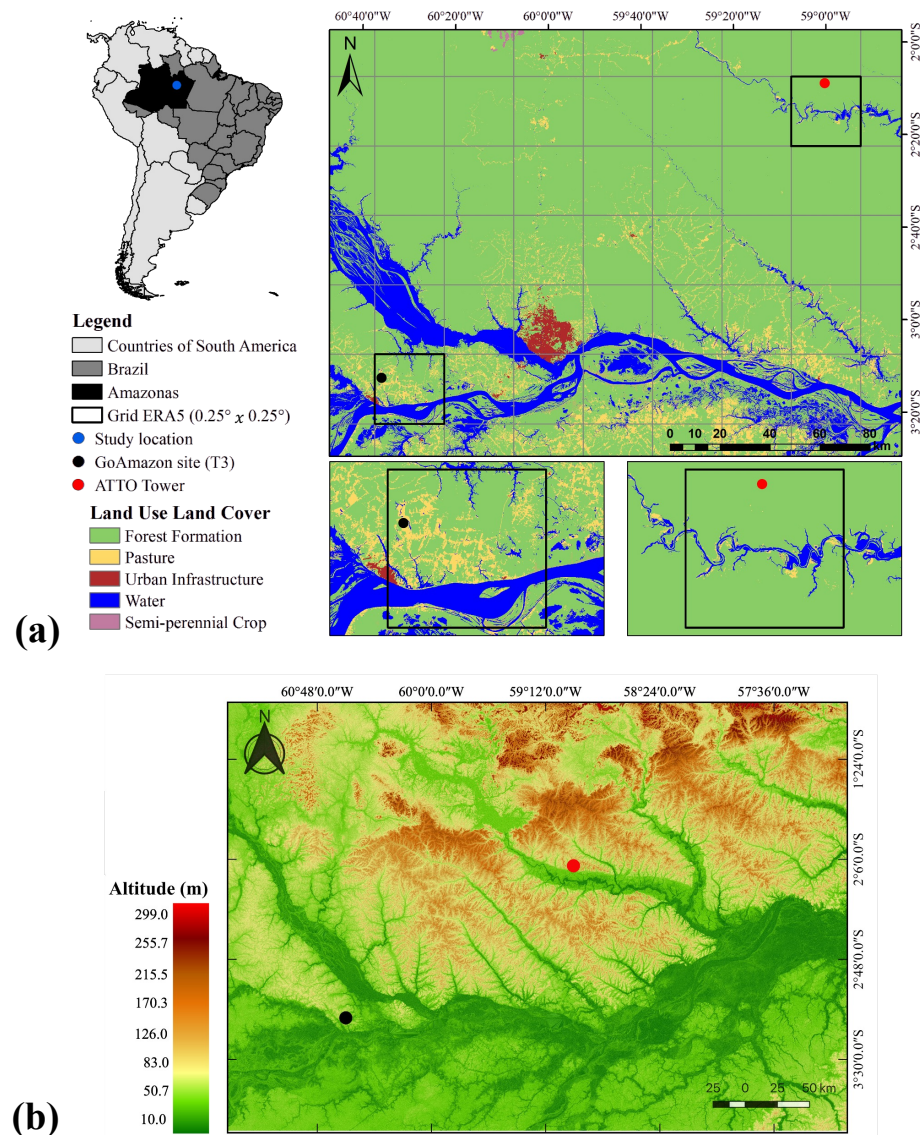


Figure 1. (a) Geographic locations of the experimental sites T3 and ATTO in the Amazon basin. (b) Topography of the study region.

2.2. Radiosonde

At the T3 site, the z_i values were derived from radiosondes (RS) using Vaisala sondes (RS92SVP) launched at standard synoptic times (GMT-4 h), at 02:00, 08:00, 11:00, 14:00, and 20:00 local time (LT). For the ATTO site, the radiosondes were made with the German system Graw DFM-09, launched at 02:00, 06:00, 08:00, 11:00, 14:00, 18:00, and 20:00 LT.

From the vertical profiles of the RS launches, the potential temperature (θ) and specific humidity (q) were calculated, which then allowed to calculate the PBL height as follows: in its daytime phase (CBL), the heights were identified by the profile method [41,42], in which z_i is the vertical level with an increase in θ and a reduction in q , for three or more layers (vertical bins). In the night phase (NBL), heights were determined where the θ vertical gradient was null or less than a defined number (0.01 K km^{-1}) from the surface [42,43].

2.3. Ceilometer

The z_i values were also monitored in both experimental areas using two ceilometers. At the T3 site, a ceilometer model CL31 from Vaisala Inc. (Helsinki, Finland) was used, while at the ATTO site, a ceilometer model CHM15k (Jenoptik AG, Jena, Germany, now sold by Lufft (<https://www.lufft.com/de-de/produkte/wolken-schneehoehensensoren-306/ceilometer-chm-15k-nimbus-2093/>; accessed on 25 July 2022)) was installed. Both instruments are LIDAR-type remote sensing techniques that record the intensity of the optical backscatter in the near-infrared wavelength (between 900 and 1100 nm) by emitting an autonomous vertical pulse. The LIDAR measurements rely on the aerosol concentration in the atmosphere. In the ABL, the aerosol concentration is high compared to the free atmosphere above, and this contrast is the basis for PBL height detection from LIDAR measurements [44]. These measurements are used to produce derived products that are recorded: the height of the cloud base, the retrieval of the particle backscatter coefficient, and PBL height [33,45,46].

The amount of backscattered light is detected in high temporal resolution for a maximum height of approximately 10 km and maximal sensitivity ~ 100 m [46,47]. Thus, previous studies have shown that the ceilometer is a powerful tool to measure z_i during its daily cycle (day and night phases) at a high level of detail [46–48]. The standard procedure for the PBL heights determination from Vaisala ceilometers is the software package BL-View developed by the manufacturer (for more details, see [49]).

The PBL heights variability, estimated from ceilometers, can vary from 100 m for wet conditions, for example, in the Amazonia [33], up to 200 m for dry conditions, for example, in deserts [50]. It should be noted that the T3 site is more polluted than ATTO, which entails that the measurements of the PBL top there are more robust. At very clean locations, such as the pristine forest at ATTO, the PBL height can sometimes be difficult to identify [11].

2.4. SODAR

For the T3 area, data from a SODAR (sound detection and ranging) (model SODAR MFAS and RASS A032002, Scintec, Rottenburg, Germany) were also used to measure the NBL height. This instrument provided wind speed and wind direction measurements every 30 min of the vertical profiles from the surface up to 400 m. The height of the NBL was determined using the maximum wind height (jet) methodology [33,43].

2.5. ERA5 Reanalysis Dataset

ERA5 is the fifth generation of atmospheric reanalysis of the global climate, produced by the assimilation of several observational datasets from satellites and radiosondes. It covers the entire global atmosphere and provides spatial and temporal data products [22]. The ERA5 data have 37 pressure levels with hourly time steps, and horizontal grid resolution of $0.25^\circ \times 0.25^\circ$, which represents a spatial size of around 30 km near the Equator. Therefore, we chose the grid where the experimental site is located (Figure 1). As the lower forcing for the model is dependent of the type of vegetation, a synthesis of its land use/land cover is shown in Table 1.

Table 1. Land use and land cover (LULC) within the ERA5 grid for the two experimental sites. Extracted from MapBiomas Collection 5 (<https://mapbiomas.org/en/colecoes-mapbiomas-1>, accessed on 6 April 2022).

LULC	T3 (%)	ATTO (%)
Forest formation	63.1	93.2
Pasture	16.8	2.0
Urban infrastructure	0.5	0.0
Water	19.7	4.9

2.6. The PBL Heights

As there are different instruments and physical concepts based on estimates of the PBL heights, it is suitable to give a brief description on how they are computed and the physical principles associated. For the daytime PBL (convective boundary layer), radiosondes used the potential gradient threshold value, and the ceilometer used the light backscattered. Both situations are associated with thermodynamic aspects. For the nighttime PBL (stable boundary layer), the SODAR uses the level of maximum windspeed which is associated with mechanical aspects. Previous studies [30,33] described the methods used by those instruments to estimate the PBL height. The ERA5 uses the Richardson number approach, that is, the potential temperature vertical gradient normalized by the windshear.

3. Results and Discussion

3.1. PBL Heights at the T3 Site from In Situ Measurements and ERA5 Data

The z_i values at the T3 site obtained by different instruments and by ERA5 estimates during the wet (Figures 2a and 3a) and dry (Figures 2b and 3b) seasons of 2014 (Figure 2) and 2015 (Figure 3) are shown. We can see a clear seasonal change in z_i values for both years that is well captured by both ERA5 and the observations. This seasonality is due to the rainfall regime in Central Amazonia [30,33]. From the experimental data for 2014, the z_i values during the wet season ranged between 900 and 1350 m, and during the dry season they ranged between 1350 and 2000 m. For 2015, the wet season z_i values increased mainly in February with values close to 1350 m. For the dry season in 2015, the PBL heights were around 1800 and 2000 m. It is worthwhile to note the interannual scale mainly during the dry season. The performance of ERA5 relative to the observations seems to be better during the dry season of 2015, which was an El Niño year. In 2014, there is a clear underestimation for both wet and dry periods; this is also the case for the wet season of 2015. In Section 3.3, we present a physical explanation for this behavior.

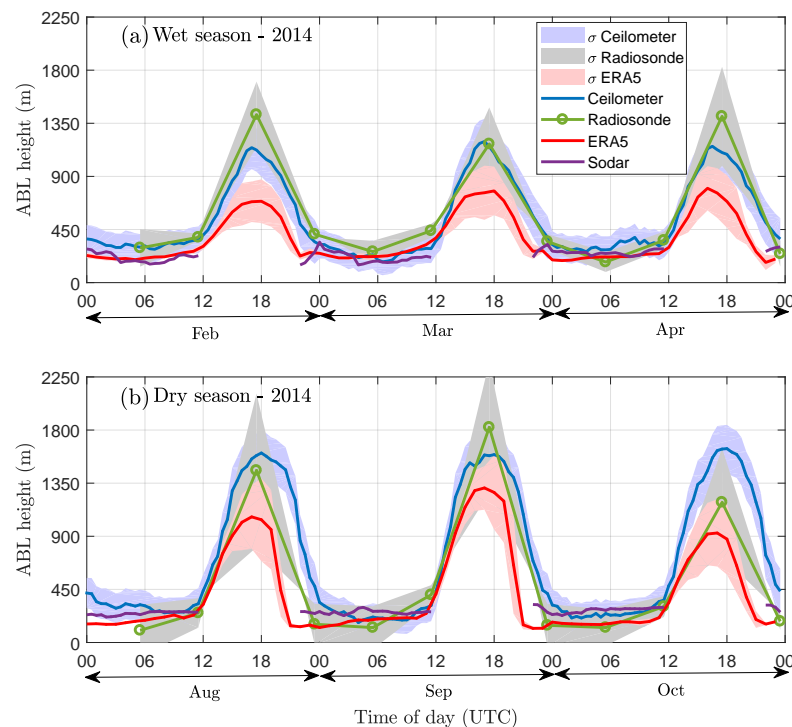


Figure 2. Average daily cycle (data from entire month) of the PBL height at the T3 site near Manaus during the wet (a) and dry seasons (b) in 2014, derived from ceilometer (blue), SODAR (lilac), and radiosonde (green), as well as ERA5 retrieval (red). 2014 was a non-El Niño year. The shaded area represents the standard deviation.

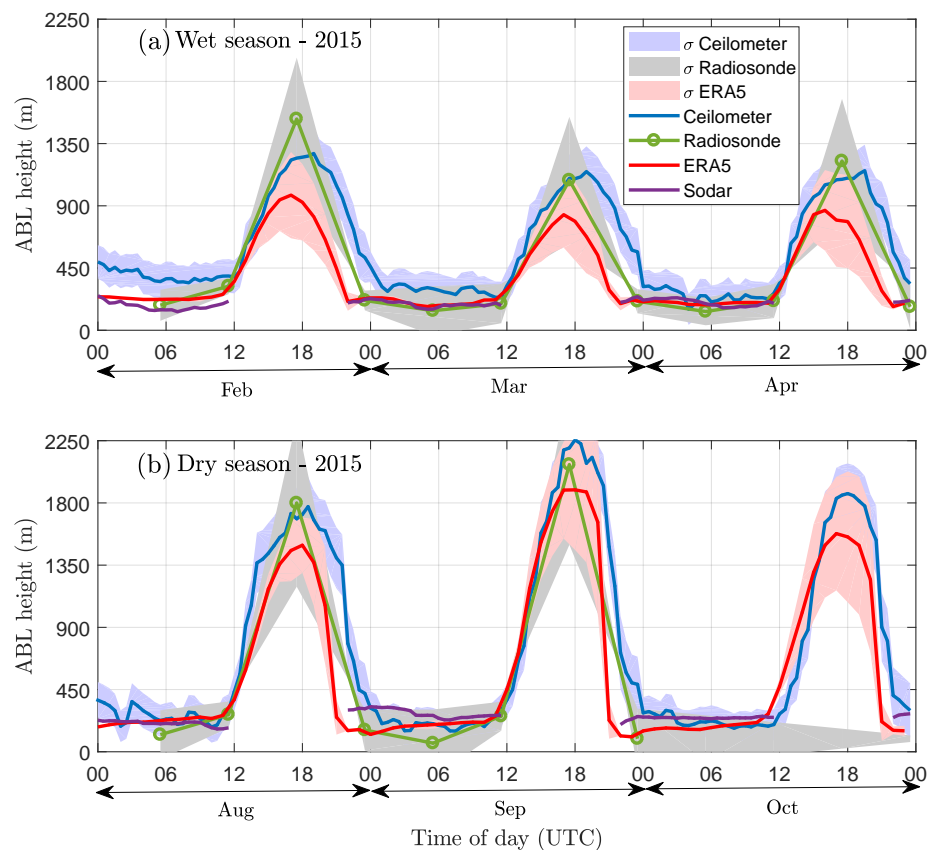


Figure 3. The same as Figure 2 for the El Niño-affected year 2015, during the wet (a) and dry seasons (b).

With respect to the diurnal change (Figures 2 and 3), we can still see that z_i is higher during the dry season, for both years. This behavior is well captured by ERA5, and is very close to the observed sounding values. The slope of the PBL growth is very similar between the ERA5 and the observed one. During the decreasing stage at afternoon times, ERA5 tends to anticipate its collapse in relation to the observations, especially during the dry season.

3.2. PBL Heights at the ATTO Site from In Situ Measurements and ERA5 Data

Figure 4 shows all z_i values (derived from ERA5 and measured by a ceilometer and radiosonde) for November 2015. This is the only month with ceilometer and radiosonde data available at the ATTO site for this study. The in situ observations agreed well between them, with maximum values ranging from 1550 m (measured by ceilometer) and 1400 m (derived from radiosondes). These values were lower than the same values for the T3 site (approximately 1800 m; Figure 3b). However, this result is expected as the latter has a higher fraction of pasture, which is almost absent at and around ATTO (Table 1). This same result was demonstrated by [30] for forested and deforested areas in Rondonia State (southwest Amazonia). They showed that the sensible heat flux is higher at a pasture than at a forest site and, consequently, z_i is also higher over deforested areas.

In contrast to the T3 results (Section 3.1), we found that z_i -ERA5 overestimates the measured z_i at ATTO, with maximum PBL heights of about 1800 m. However, the ATTO site also presented a collapsed CBL in late afternoon, which is discussed in Section 3.3.

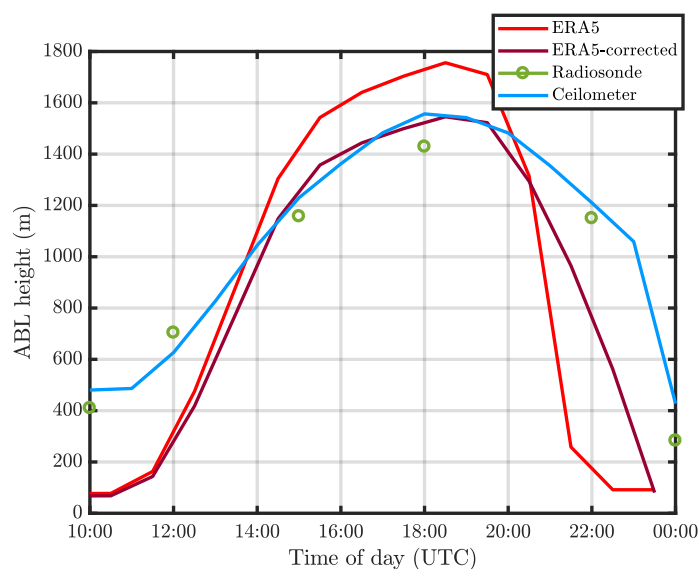


Figure 4. Average diurnal cycle of the PBL height at ATTO in Nov 2015, obtained from ceilometer (blue) and radiosonde (green, circles, corresponding to the average of the period from 1–6 November) measurements, as well as ERA5 retrievals (red). The corrected ERA5 data (dark red) are shown for comparison, as discussed in detail in Section 3.3.

3.3. Physical Explanations for Underestimated or Overestimated ERA5 Values

In this section, we provide the potential physical reasons for the observed overestimation of the z_i -ERA5 values for ATTO and underestimation for T3. We believe that the main reasons are associated with the parameterization used by the model related to the sensible heat flux (H) and the atmospheric stability (given by the Richardson number, Ri). These parameters are shown for both sites in Figures 5–8. The H experimental values at both sites (T3 and ATTO) were determined by the eddy covariance (EC) technique, measured by a 3D sonic anemometer. Note that the H values simulated by ERA5 were higher than the ones obtained experimentally for both the T3 and ATTO sites (Figures 5 and 8, respectively). This means that the ERA5 is computing higher sensible heat fluxes for the Central Amazonian. The height of the convective boundary layer is strongly dependent on the surface heat fluxes.

Figure 6 shows the temperature vertical profiles for both ERA5 and experimental data. The profiles correspond to an average of all profiles at 18 UTC (14 LT). This time was chosen to represent the maximum depth of the convective PBL. It is possible to note that the temperature values of the ERA5 profile were higher than the values obtained experimentally. This is associated with the high surface sensible heat flux of the ERA5 (Figure 5). However, it is interesting to note that even with higher H values, the z_i -ERA5 was lower than the z_i from experimental data. The apparent controversy (higher H at surface and lower z_i depth) for ERA5 is due to the fact that the model was not able to vertically distribute all this heat released from the surface.

Previous studies have already shown that the differences between z_i -ERA5 and z_i from experimental data can be caused by several factors. Among them, the surface heterogeneity plays an important role in this difference [28,51], since ERA5 has difficulties in representing the surface heterogeneity, due to its relatively sparse grid. It is worth noticing that the T3 site has considerable horizontal heterogeneity (Table 1). Additionally, in work by [28], it was shown that the greatest differences between z_i -ERA5 and z_i from experimental data occurred in regions of low and medium latitudes, such as the sites shown in this study. In these regions, the thermal convection is strong, that is, static stability is supposed to exert an important influence on the comparison results. Ref. [28] analyzed this influence on the differences between z_i from experimental data and z_i -ERA5. They found that the z_i -ERA5 values were underestimated due to an inadequate parameterization of the intensity of

atmospheric instability in the lower troposphere, which does not ideally portray turbulent transport in that region. Additionally, according to [28], the afternoon z_i values are the ones that suffer the highest errors due to inadequate mixing of air between PBL and the free atmosphere in the models, similar to that observed in this work (Figures 2 and 3).

With this information in mind, Figure 7 shows the Ri values calculated for some days of the wet season and the dry season above the T3 site. During both wet seasons (2014 and 2015), the Ri values are always positive, indicating a stable layer, that is, the temperature at the highest level is higher than the temperature near the surface, which does not help the thermal convection mixture in this layer. For the dry season, Ri values show differences between 2014 and 2015. For the dry season of 2014, it is around -0.8 from 15:30 up to 19:00 UTC (which is from 11:30 up to 15:00 LT) and it reverses its signal (to be positive values) afterwards. Thus, the CBL is generated only for a fraction of the day (until midday). For the year 2015, which was drier, the H is higher in relation to 2014 (Figure 5) and the same behavior happens, although the Ri is stronger (around -1.0) and weakly longer (from 15:00 until 19:30 UTC).

For the ATTO site, the difference between the H values from ERA5 and experimental data was considerably greater than for the T3 site (Figure 8a). Furthermore, for the ATTO site, Ri (Figure 8b) is negative (around -1.5) from 12:30 until 19:00 UTC, provoking an overestimation of PBL heights. After 15:00 UTC, there is a signal reversal and Ri becomes positive, so there is this sharp drop in z_i -ERA5 values (Figure 4). It is believed that the higher sensible heat flux and the stronger thermal instability caused ERA5 to overestimate the z_i values for the ATTO site, and this may be associated with the land use/cover shown in Table 1. It is possible that the presence of a reasonable fraction of water/rivers in the ERA5 grid for the T3 site produces considerable thermal stability within the simulated PBL. As for the ATTO site, the absence of water in the ERA5 grid produces the opposite effect.

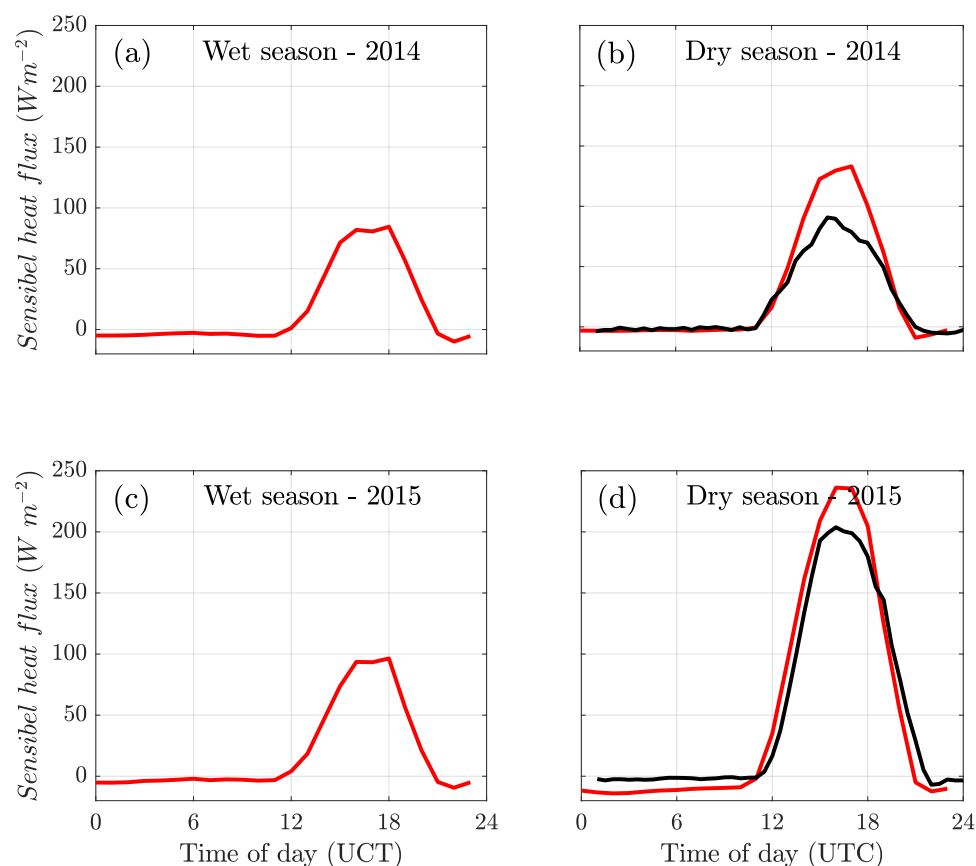


Figure 5. Sensible heat flux values through experimental data (black line) and ERA5 (red line) at the T3 site. The data correspond to the wet seasons of (a,c) 2014 and 2015, and the dry seasons of (b,d) 2014 and 2015.

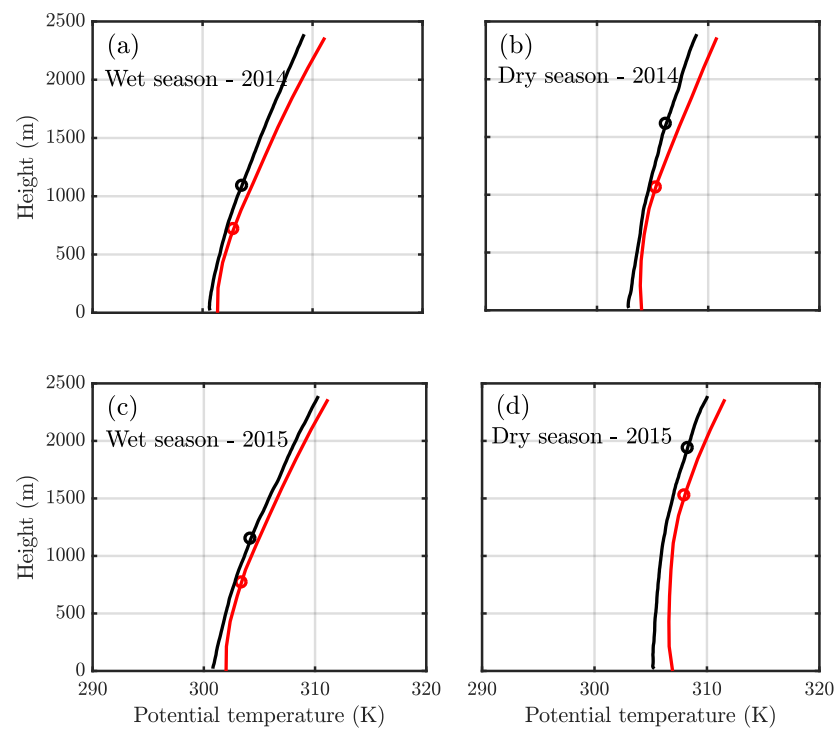


Figure 6. Potential temperature profile from experimental data (black line) and ERA5 (red line) at the T3 site. The data correspond to the wet seasons of (a,c) 2014 and 2015 and the dry seasons of (b,d) 2014 and 2015. The vertical profiles for both ERA5 and experimental data represent an average of all profiles made at 18:00 UTC (14:00 LT). The black and red circles correspond to the average height of the boundary layer estimated through experimental data and ERA5, respectively.

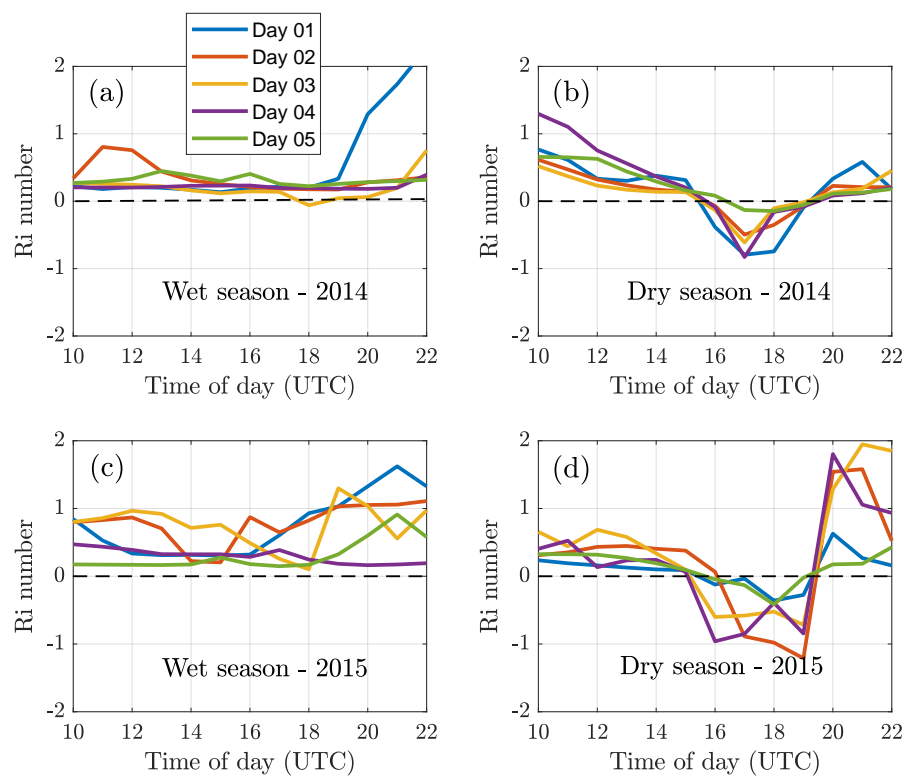


Figure 7. R_i values obtained through the potential temperature and wind profiles from ERA5 for the T3 site. The data correspond to the wet seasons of (a,c) 2014 and 2015 and the dry seasons of (b,d) 2014 and 2015.

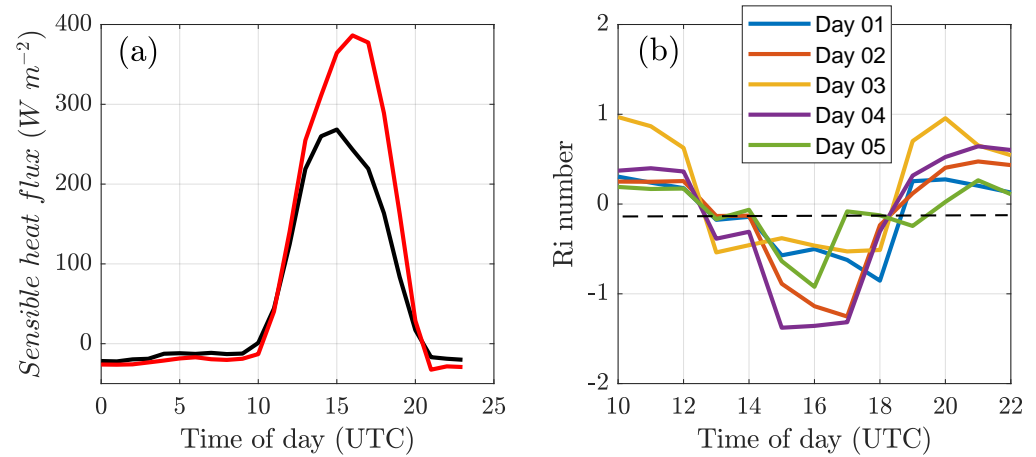


Figure 8. (a) Sensible heat flux values through experimental data (red line) and ERA5 (black line), and (b) R_i values obtained through the temperature and wind profiles from ERA5 for the ATTO site. The data correspond to November 2015.

3.4. ERA5 Correction for Daytime Period at the T3 and ATTO Sites

In order to determine the best correction to be applied to the z_i -ERA5 values, a linear regression was applied using the ERA5 and the ceilometer data. The ceilometer was chosen as the best estimator of z_i , according to [33]. This linear regression was made for the years 2014 and 2015, splitting the data available for wet (Figures 9a and 10a) and dry (Figures 9c and 10c) periods. The z_i values derived from ERA5 are lower than from the observations so the slope of the best line adjusted is lower than the 1:1 line. One point that should be observed is the early reduction of the z_i -ERA5 values in the late afternoon (similar to those observed in Figures 2 and 3), associated with an early extinction of the turbulence within the daytime PBL. This may be caused by the method used in ERA5 to compute z_i (potential temperature gradient) that is almost null at this time but the turbulence/convection is still active.

For the z_i values from ERA5 ($z_{i,ERA5}$), two procedures were adopted: (i) a coefficient (α) associated with an under/overestimation relative to the observations ($z_{i,ceil}$) was found (Equation (1)); (ii) Equation (2) was used to correct the PBL heights derived from ERA5 ($z_{i,corrected}$). A sinusoidal function was chosen to correct the early reduction of the PBL heights derived from ERA5 in the late afternoon.

$$\alpha = 1 - \frac{\overline{z_{i,ERA5}}}{\overline{z_{i,ceil}}} \quad (1)$$

$$z_{i,corrected} = \begin{cases} (1 + \alpha)z_{i,ERA5}, & \text{if } 12 \leq t \leq 17, \text{ UTC} \\ (1 + \alpha)z_{iM,ERA5}(\sin[\pi(t - 12)/\tau]), & \text{if } 18 \leq t \leq 23, \text{ UTC} \end{cases} \quad (2)$$

where τ corresponds to the time window of the diurnal cycle (half sinusoidal wave = 12 h). z_{iM} is the maximum value of z_i on that day. The alpha values were $\alpha = 0.30$ for the year 2014 $\alpha = 0.15$ for 2015.

After the corrections were applied (Equations (1) and (2)), not only did the correlation coefficient and the slope improve, but so did the collapse of the PBL height in the late afternoon for both seasons and years.

Figures 11 and 12 present all values (observations, ERA5, and ERA5-corrected) for z_i daytime. It was possible to observe that the corrections improved the diurnal cycle, especially for the wet season. For the dry season of 2014, the observations are slightly overestimated but the agreement was better than the original z_i -ERA5.

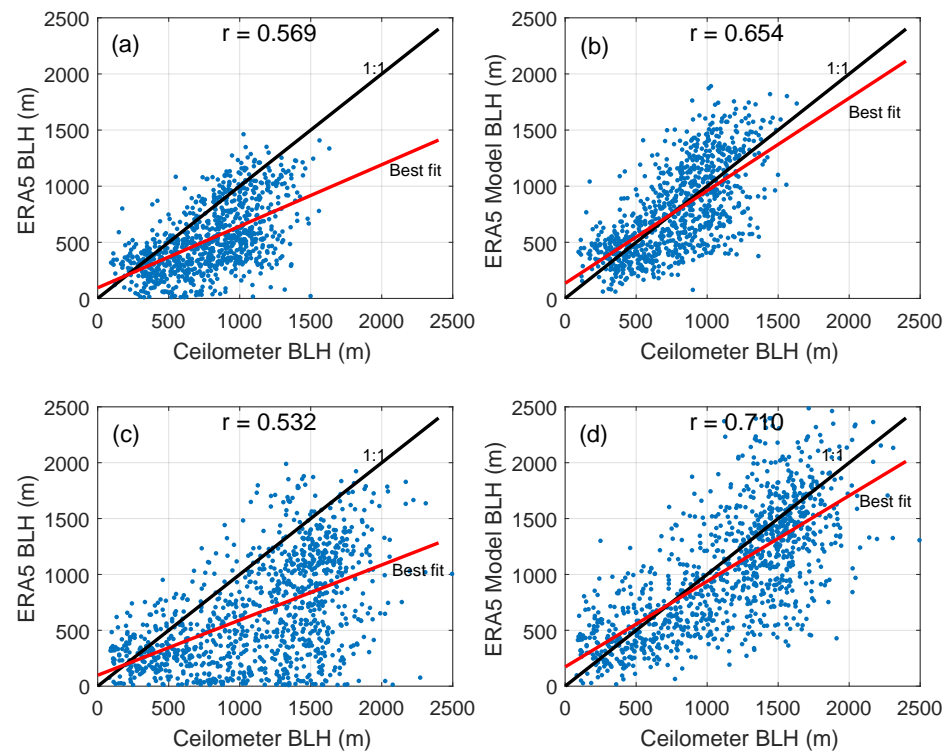


Figure 9. Scatterplots of daytime PBL heights derived from observational data (ceilometer) and model (ERA5) for before (a,c) and after correction (b,d) for wet (a,b) and dry (c,d) seasons for the year 2014 at the T3 site.

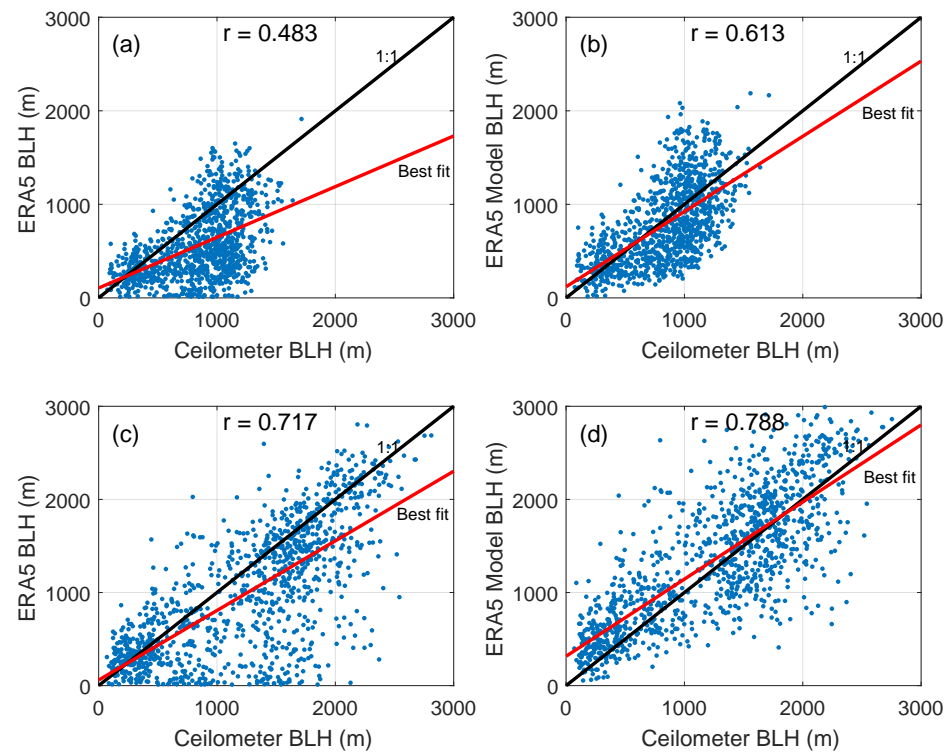


Figure 10. Similar to Figure 9 for the year 2015: PBL heights derived from observational data (ceilometer) and model (ERA5) for before (a,c) and after correction (b,d) for wet (a,b) and dry (c,d) seasons.

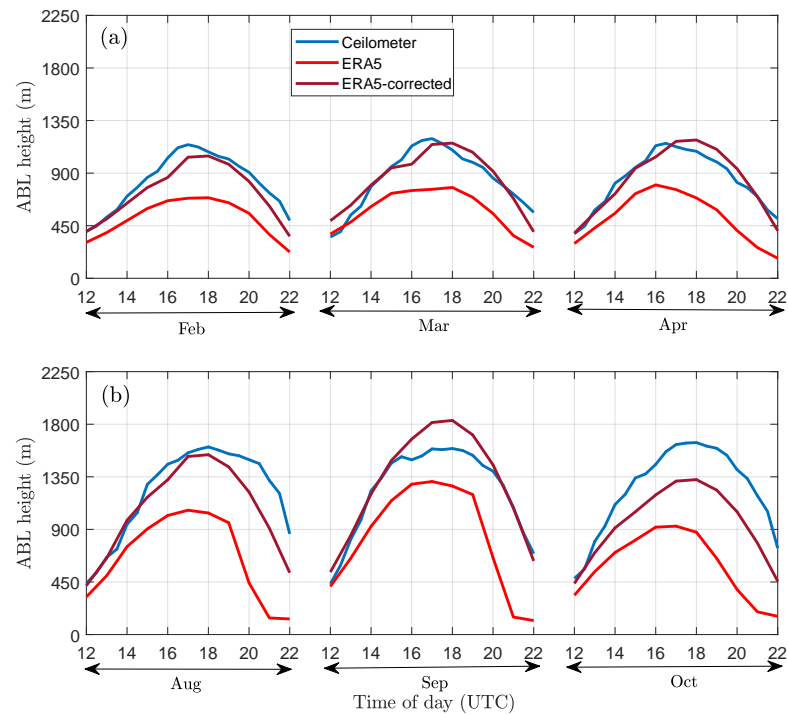


Figure 11. Average diurnal cycle (data from entire month) for the convective PBL estimated for different instruments: ceilometer (blue line), ERA5 (red line), and ERA5-corrected (Equation (2)) for the wet (a) and dry (b) seasons for 2014 (non-El Niño year).

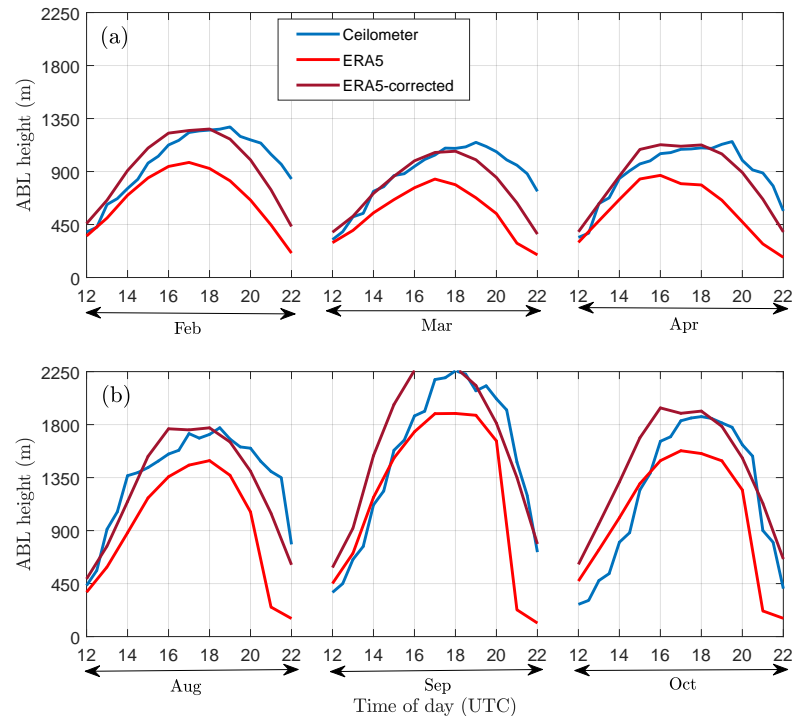


Figure 12. Average diurnal cycle (data from entire month) for the convective PBL estimated for different instruments: ceilometer (blue line), ERA5 (red line), and ERA5-corrected (Equation (2)) for the wet (a) and dry (b) seasons for 2015 (El Niño year).

The same type of corrections for the daytime zi-ERA5 at T3 were also carried out for ATTO (Equations (1) and (2)), but α was estimated to be -0.12 (Equation (1)). After the correction, there was a better agreement between the ERA5-corrected and the observations

related to the radiosondes and ceilometer estimates (Figure 4; dark red line). The earlier collapse of the CBL was quite toned down with the corrections.

3.5. ERA5 ABL Heights for Nocturnal Periods at the T3 Site

For the nocturnal period of PBL (NBL), a similar procedure to the one applied to the diurnal phase was performed, applying a linear regression during the dry and wet seasons of 2014 (Figure 13), between the z_i -ERA5 versus z_i -ceilometer (Figure 13b,d) and z_i -SODAR (Figure 13a,c) values, since the SODAR also presents accurate NBL measurements [33]. Note that there is no significant relationship between z_i -ERA5 and z_i values obtained with experimental data and, consequently, a possible correction of z_i -ERA5, as performed for the daytime period, becomes unlikely. The same behavior was observed for the night period of the year 2015 (not shown here). All estimates (ERA5, ceilometer, and SODAR) showed values around 250 m, with very small temporal variability during the night (Figure 14). Sometimes, the ceilometer showed values around 400–500 m (Figure 14e,f) which are not the depth of NBL, but instead are the residual layer, following [42]. This happens as the turbulence intensity is reduced at night, making the ceilometer measurements very difficult [52].

Figure 15 shows a normal (Gaussian) distribution of the differences between ERA5 and SODAR (Figure 15a,c) and ERA5 and ceilometer (Figure 15b,d). It can be noticed that the errors are well distributed along the zero values, and this is a signal that ERA5 gives a good estimate of the NBL heights. The differences were about 80–90 m for the ceilometer and ranged from 10–90 m for the SODAR. In other words, the z_i from ERA5 underestimates (around than 90 m) the observations. The same plots from Figures 14 and 15 were made for 2015 (not presented) and the results were the same.

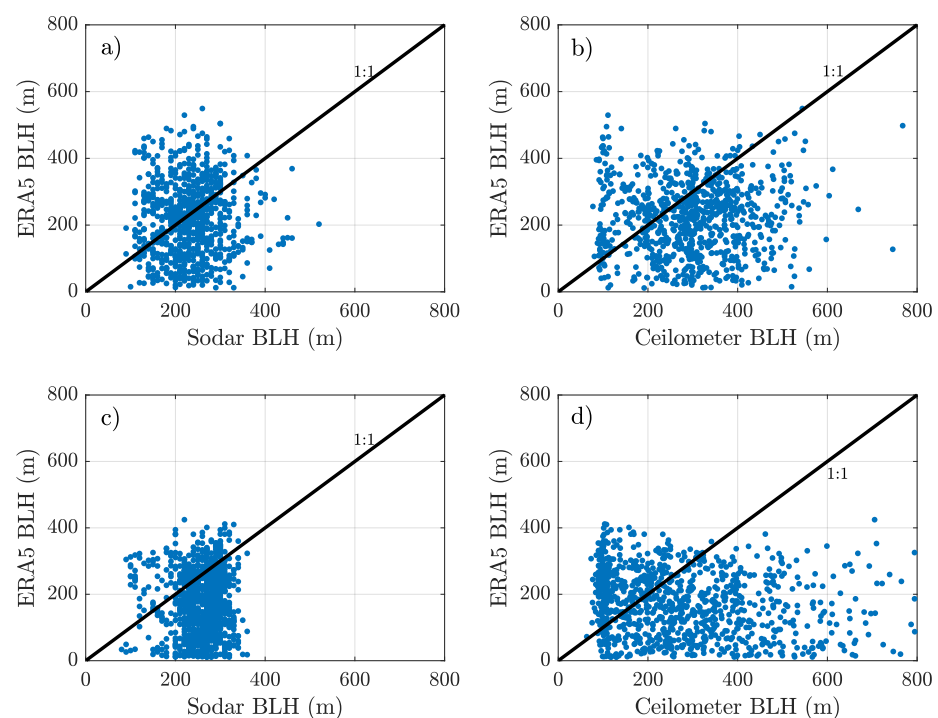


Figure 13. Linear regression between the z_i -ERA5 against (a) z_i -SODAR and (b) z_i -ceilometer for the wet season and z_i -ERA5 against (c) z_i -SODAR and (d) z_i -ceilometer for the dry season, during the nocturnal period of 2014.

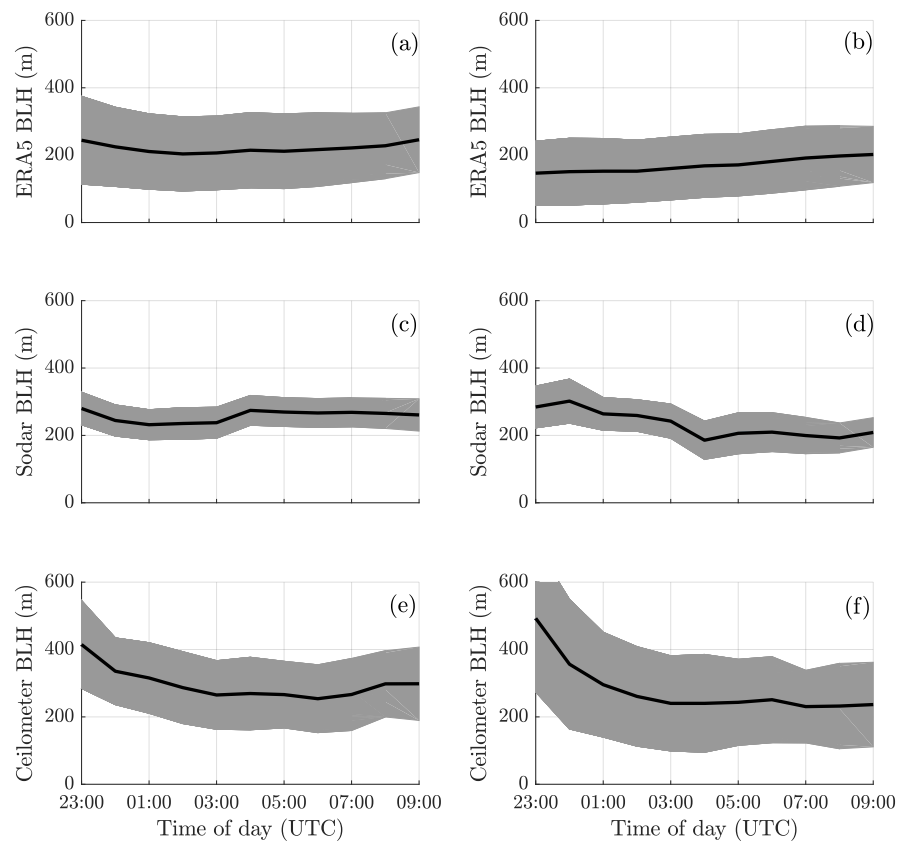


Figure 14. Time series of the nocturnal boundary layer of z_i -ERA5 (a,b), z_i -SODAR (c,d), and z_i -ceilometer (e,f) for the wet and dry seasons of 2014, respectively. The solid line is the mean value and the grey shaded area represents one standard deviation.

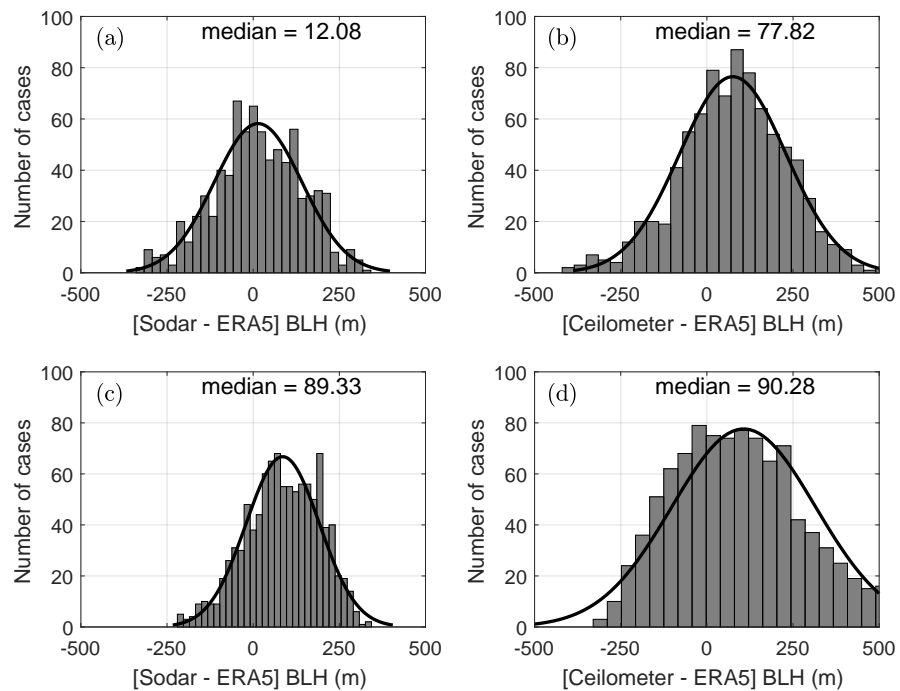


Figure 15. Normal distribution of the differences between z_i -ERA5 and z_i -SODAR for (a) wet season and (c) dry season of 2014. Normal distribution of the differences between z_i -ERA5 and z_i -ceilometer for (b) wet season and (d) dry season of 2014.

4. Conclusions

This paper presents the first attempt to validate and correct the height of the PBL from ERA5 in Central Amazonian. A new methodology to correct the hourly PBL heights from ERA5 was proposed. The major correction identified is the early reduction of its height in the late afternoon that is not physically reasonable. Probably this is due to not considering the entrainment fluxes contribution to maintain the turbulence at this period. Additionally, due to the heterogeneity of the surface, the values derived from ERA5 are higher than the observations during daytime periods above the forest area (ATTO site), and are always smaller above the forest–pasture–river area (T3 site). Additionally, after the correction of the hourly values of the height of the PBL from ERA5, we obtained a better correlation between the experimental data and ERA5, for both forest and forest–pasture–river areas and for both years: typical and El Niño year.

The ERA5 values did not develop a real thermal stratification when compared with observations. This may be due to the parametrization of H and Ri for the PBL, especially during daytime. Additionally, there is the influence of the heterogeneity of the surface, as the model considered tropical forest, and in fact there is a mixture of different biomass (forest, pasture, and water).

The NBL heights derived from ERA5 were similarly (without any shift or trend) related to the observations (SODAR and Ceilometer). Thus, the outputs of the NBL from ERA5 can be used as typical values, for both seasons (wet and dry), for a non and El Niño year. However, as they present a higher variability they cannot be used at hourly time periods. Based on the analysis performed and expertise gained for nighttime PBL, it should be desirable to conduct new fieldwork in order to validate and calibrate models. The ATTO's tower (325 m height) is a suitable platform to understand the behavior of the NBL and its erosion as there is a profile of climatic elements (such as temperature, humidity, winds) and turbulent fluxes (such as H). The analysis of all these data with 3D simulations using a very-high-resolution model (such as LES) will permit a better understanding of the NBL.

For the first time, comparisons of the PBL height estimates obtained experimentally with those from the ERA5 reanalysis for the Amazon region are presented. Although the correction/validation proposed in this work was performed using empirical analysis, it can be used in other areas of the Amazonia with similar climate/land use characteristics of the GoAmazon and ATTO sites, if there are no experimental data available. Additionally, it is useful for ongoing and future research that would like to use PBL heights derived from ERA5 for the GoAmazon and ATTO region, and may benefit the scientific community that is working with the coupling between the Amazonia vegetation and atmosphere.

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Data Availability Statement: The datasets used in this work are available at the ARM Climate Research Facility database for the GoAmazon2014/5 experiment (<https://www.arm.gov/research/campaigns/amf2014goamazon>, accessed on 1 September 2020) and in the ATTO data portal (<https://www.attodata.org/>, accessed on 1 September 2020).

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