Isotopic composition of convective rainfall in the inland tropics of Brazil

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Abstract. Strong convective systems characterize the tropical central-southern region of Brazil. These systems provide abundant water supply for agro-industrial activities and pose flood risks to large cities. Here, we present high-frequency (2-10 min; inter and intra-event) rainfall isotopic compositions (n=90 samples) to reveal regional and local atmospheric processes controlling the isotopic variability of convective systems between 2019-2021. Inter-events rainfall weighted-average (δ_{wgd}) values were low ($\delta^{18}O_{wgd} \leq -10.0$ ‰) due to the influence of evapotranspiration from the Amazon forest during the summer and associated with higher rainfall along Hysplit trajectories. In contrast, during autumn and spring seasons Hysplit trajectories from the Atlantic Ocean and South Brazil exhibited lower rainfall amounts, resulting in high $\delta^{18}O_{wgd} \geq -4.2$ ‰. This strong regional δ_{wgd} pattern often masks intra-event isotopic variability. Therefore, we analyzed the vertical structure of local rainfall using reflectivity (Z) from micro radar data. Variations in Z indicate that microphysical processes within falling raindrops led to changes in $\delta^{18}O$ and *d*-excess. Our findings establish a novel framework for evaluating the meteorological controls on the isotopic variability of convective precipitation in tropical South America, fill the gap of high-frequency studies in this region, and generate an isotopic dataset for convective model evaluations.

1 Introduction

The tropical central-southern region of Brazil (CSB) is the primary contributor to the country's economy, with agriculture and agroindustry as the main sectors (Zilli et al., 2017). These economic activities are highly dependent on seasonal rainfall for irrigation and hydropower supply (Luiz Silva et al., 2019). Projected changes in the frequency of heavy and extreme rainfall events (Marengo et al., 2020; Donat et al., 2013; IPCC, 2021; Marengo et al., 2021) pose a significant threat to regional economic growth and energy generation. Similarly, according to Marengo et al. (2021), simulations with pre-CMIP6 models suggest that the intensification of heavy rainfall events could exacerbate the prevalence of floods and landslides in susceptible regions. Such occurrences have resulted in a total cost of US$41.7 billion over the past half-century (Marengo et al., 2020; World Meteorological Organization, 2021).

Extreme precipitation events are linked to convective systems (CS). These systems significantly contribute to the annual rainfall budget and account for a large number of extreme rainfall events (Roca and Fiolleau, 2020). Across the tropics, diurnal surface heating amplifies convection, generating short-lived events that can occur in consecutive days. Rapid upward movement of air results in large condensation and precipitation rates (Breugem et al., 2020; Kastman et al., 2017; Lima et al., 2010; Machado et al., 1998). This is identified by vigorous vertical development in the form of *cumulus-nimbus* and *cumulus congestus* (convective clouds) and low-level divergence (stratiform clouds) (Siqueira et al., 2005; Machado and Rossow, 1993; Zilli et al., 2017; Houze, 1989, 2004). Precipitation associated with these systems are commonly referred as convective and stratiform rainfall, and account for 45% and 46% of the total rainfall in South America, respectively (Romatschke and Houze, 2013).

Whether rainfall is convective or stratiform has been suggested to determine variations in stable isotope composition of precipitation across the tropics (Zwart et al., 2018; Sánchez-Murillo et al., 2019; Sun et al., 2019; Han et al., 2021; Aggarwal et al., 2016; Munksgaard et al., 2019). Processes driving the variations in the isotopic composition in CS are more complex and less understood compared to other precipitation producing systems. Studies using the isotopic composition of rain and water vapor have quantified and modelled physical processes related to convection (Bony et al., 2008; Kurita, 2013). Previous studies have suggested that the isotopic composition of CS is connected to the integrated history of convective activity (Risi et al., 2008; Moerman et al., 2013), depth of organized convection and aggregation (Lawrence et al., 2004; Lekshmy et al., 2014; Lacour et al., 2018; Galewsky et al., 2023), microphysical processes within clouds (Aggarwal et al., 2016; Lawrence et al., 2004; Zwart et al., 2018), and cold pool dynamics (Torri, 2021). These interpretations simplified and lumped the effects of multiple rainfall timescales (e.g. monthly, daily and sub-hourly), providing different perspectives on convective processes, such as the regional (synoptic forcings) and local factors (e. g. microphysical processes occurring both within and below the cloud) (Kurita et al., 2009; Muller et al., 2015; Graf et al., 2019; Lee and Fung, 2008)..

High-frequency rainfall sampling and analyses of stable isotope ratios has been used to better understand the evolution of large weather systems such as tropical cyclones and typhoons (Sun et al., 2022; Sánchez-Murillo et al., 2019; Han et al., 2021), squall lines (Taupin et al., 1997; Risi et al., 2010; Tremoy et al., 2014; de Vries et al., 2022), mid-latitude cyclones, and cold fronts (Barras and Simmonds, 2009; Celle-Jeanton et al., 2004; Aemisegger et al., 2015; Thurnherr and Aemisegger, 2022; Muller et al., 2015; Landais et al., 2023). High-resolution isotope information can provide a better insight into the isotopic variability during the life cycle of rainfall events (Coplen et al., 2008; Muller et al., 2015; Celle-Jeanton et al., 2004).

In this study, we used high-frequency rainfall sampling to disentangle regional (moisture origin/transport, regional atmospheric circulation) from local (below-cloud processes, vertical structure of rainfall, cloud top temperature) processes controlling the isotopic composition of convective rainfall. High-frequency rainfall was integrated with ground-based observational data (Micro Rain Radar and automatic weather station), satellite imagery (GOES-16), ERA-5 reanalysis products, and HYSPLIT trajectories to better characterize convective rainfall over the inland tropics of Brazil.

2 Data and Methods

2.1 Sampling site and weather systems

The rainfall sampling site was located in Rio Claro city, São Paulo State (Fig. 1a). The station (-22.39°S, -47.54°W, 670 m a.s.l.) is part of the Global Network of Isotopes in Precipitation network (GNIP) and is influenced by weather systems responsible for rainfall variations and seasonality linked to the regional atmospheric circulations across the CSB region. The rainfall seasonality over CSB is associated with: (i) frontal systems (FS), represented mainly by cold fronts from southern South America acting throughout the year, and (ii) the activity of the South Atlantic Convergence Zone (SACZ) during austral summer (December to March) (Kodama, 1992; Garreaud, 2000) (Fig. 1b). These features are mostly responsible for CS development (Romatschke and Houze, 2013; Siqueira et al., 2005; Machado and Rossow, 1993) (Fig. 1c), and were captured during their passage over the Rio Claro station.

2.2 Rainfall sampling and isotope analyses

High-frequency rainfall sampling was conducted using a passive collector (2 to10 minutes intervals) from September 2019 to February 2021, except for April, July, and August (during winter 2020), when no rainfall was observed in the study area. The pandemic Covid-19 disrupted access to the university campus, thereby reducing the number of rainfall events sampled during the spring of 2020, particularly at night (e.g., lockdowns). In this study, the rainfall samples collected do not consist of consecutive day-night pairs during the same day. In total, 90 samples representing eight convective events (3 night-time and 5 day-time events) were collected. Samples were transferred to the laboratory and stored in 20 mL HDPE bottles at 4ºC. In parallel to high-frequency sampling, monthly cumulative rainfall samples were also collected using the methodology recommended by the International Atomic Energy Agency (IAEA, 2014).

Rainfall samples were analyzed for stable isotope composition using Off-Axis Integrated Cavity Output Spectroscopy (Los Gatos Research Inc.) at the Hydrogeology and Hydrochemistry laboratory of UNESP's Department of Applied Geology and at the Chemistry School of the National University (UNA, Heredia, Costa Rica). All results are expressed in per mil relative to Vienna Standard Mean Ocean Water (V-SMOW). The certified calibration standards used in UNESP were USGS-45 (δ^2H = −10.3 ‰, δ^{18}O = −2.24 ‰), USGS-46 (δ^2H = −236.0 ‰, δ^{18}O = −29.80 ‰), including one internal standard (Cachoeira de Emas - CE – δ^2H = −36.1 ‰, δ^{18}O = −5.36 ‰). USGS standards were used to calibrate the results on the V-SMOW2-SLAP2 scale, whereas CE was used for memory and drift corrections. At UNA, the certified standards MTW (δ^2H = −130.3 ‰, δ^{18}O = −16.7 ‰), USGS45 (δ^2H = −10.3 ‰, δ^{18}O = −2.2 ‰), and CAS (δ^2H = −64.3 ‰, δ^{18}O = −8.3 ‰) were used to correct the measurement results for memory and drift effects and to calibrate them on the V-SMOW2-SLAP2 scale (García-Santos et al., 2022). The analytical uncertainty (1σ) was 1.2 ‰ for δ^2H and 0.2 ‰ for δ^{18}O for UNESP analysis and 0.38 ‰ for δ^2H and 0.07 ‰ for δ^{18}O for UNA analysis. Deuterium excess (*d*-excess) was calculated as: *d*-excess = δ^2H - 8*δ^{18}O (Dansgaard, 1964), with uncertainties (1σ) of 1.33 and 0.43 ‰, respectively. This secondary isotope parameter was used to interpret the influence of moisture origin/transport (Sánchez-Murillo et al., 2017; Froehlich et al., 2002) and local processes (Aemisegger et al., 2015; Muller et al., 2015; Celle-Jeanton et al., 2004).

2.3 Meteorological data

An Automatic Weather Station (AWS) Decagon Em50 (METER) was installed next to the Micro Rain Radar (MRR) (METEK) at 670 m.a.s.l, within immediate vicinity of the rainfall collection site. Meteorological data were recorded at 1 min intervals for rain rate (RR, mm min^{-1}), air temperature (T, °C) and relative humidity (RH, %). The MRR data for reflectivity (Z, in dBZ), and fall velocity (w, m s^{-1}) were also recorded at 1 min intervals. MRR parameters correspond to the mean values measured at the elevation between 150 and 350 meters above surface. MRR operated at a frequency of 24.230 GHz, modulation of 0.5 – 15 MHz according to the height resolution mode. For this work, different height resolutions (31 range bin) were tested, 150 m, 200 m, 300 m and 350 m, resulting in vertical profiles of 4650 m, 6200 m, 930 0m and 10.850 m, respectively (Endries et al., 2018). The MRR data used in the following discussion are the near-surface data (first measurement from 150 m to 350 m). Lifting Condensation Level (LCL, meters) was computed from AWS RH and T, using expression proposed by Soderberg et al. (2013). The rainfall amount (R, mm) was also calculated during the sampling interval. GOES-16 imagery was used to identify the convective nuclei of the cloud-top (10.35-μm, Band-13) and brightness temperature (BT, °C), at 10 min intervals during the sampling period (Ribeiro et al., 2019; Schmit et al., 2017). The 10.35-μm BT is often used to estimate the convective cloud depth, since the lower BT is linked to deeper cloud tops (Adler and Fenn, 1979; Roberts and Rutledge, 2003; Adler and Mack, 1986; Ribeiro et al., 2019; Machado et al., 1998). The weather systems (fronts, instabilities, and low pressure) were defined according to the synoptic chart and meteorological technical bulletin of the Center for Weather Forecast and Climatic Studies of the National Institute of Space Research (CPTEC/INPE) that used information of numerical models, automatic weather stations, satellite and radar images, reanalysis data and regional atmospheric models, such as the Brazilian Global Atmospheric Model and ETA model.

2.4 Hysplit modeling and Reanalysis data

The origin of air masses and moisture transport to the Rio Claro site were evaluated using the HYSPLIT (Hybrid-Single Particle Langragian Integrated Trajectory) modeling framework (Stein et al., 2015; Soderberg et al., 2013). The trajectories of the air masses were estimated for 240 hours prior to rainfall onset, considering the estimated time of residence of the water vapor (Gimeno et al., 2010, 2020; van der Ent and Tuinenburg, 2017). Start time of trajectories was the same as the start time of rainfall events. The trajectories were computed using NOAA′s meteorological data (global data assimilation system, GDAS: 1 degree, global, 2006-present), with ending elevations of the trajectories at 1500 m above the surface, taking into account the climatological height of the Low Level Jet, within 1000–2000 m (Marengo et al., 2004). Ten-day trajectories representing convective events were calculated as trajectory ensembles, each consisting of twenty-seven ensemble members released at start hour of convective rainfall sample collection. Ensembles were produced by varying the initial trajectory wind speeds and pressures, according to the HYSPLIT ensemble algorithm, in order to account for the uncertainties involved in the simulation of individual backward trajectories (Jeelani et al., 2018). A sum of the rainfall intensity (mm hr^{-1}) along the trajectories was used to analyse rainout of the moist air masses according to the Jeelani et al. (2018).

Reanalysis data were used to better understand the influence of atmospheric circulation on isotopic composition of rainfall at the study area. ERA-5 information was used to evaluate hourly vertical integrals of eastward water vapor flux (kg m^{-1} s^{-1}) during convective events sampled. The Global Modeling and Assimilation Office (GMAO) data (MERRA-2, 1 hour, 0.5 x 0.625 degree, V5.12.4 were used for calculations of latent heat flux (LHF). Aqua/AIRS L3 Daily Standard Physical Retrieval (AIRS-only) data (1-degree x 1-degree V7.0, Greenbelt, MD, USA, Goddard Earth Sciences Data and Information Services Center) (known as GES DISC) were used for average outgoing longwave radiation (OLR). OLR values below 240 W m^{-2} indicate organized deep convection (Gadgil, 2003).

2.5 Identification of convective rainfall events and vertical variations of reflectivity

In general, the identification of CS was based on the vertical structure of the given precipitation system (lack of the melting layer and bright band - BB) in the radar profiles featuring high reflectivity values (Z > 38 dBZ) (Houze, 1993, 1997; Steiner and Smith, 1998; Rao et al., 2008; Mehta et al., 2020; Endries et al., 2018) and satellite imagery (Vila et al., 2008; Ribeiro et al., 2019; Siqueira et al., 2005; Machado et al., 1998). Consequently, convective rainfall was defined in this study by (i) convective cloud nuclei observed in GOES-16 imagery, (ii) no BB detected, (iii) Z > 38 dBZ near to the surface and (iv) rainfall intensity (AWS) of at least 10 mm h^{-1} (Klaassen, 1988) (Fig. 1c,d). The convective nuclei were identified using GOES-16 imagery, determined as a contiguous area of at least 40 pixels with BT lower than 235K (≤ -38 °C) over Rio Claro station, according to previous studies (Ribeiro et al., 2019).

The Z is defined as the mean number of raindrops within a specific diameter interval per unit volume of air. Therefore, Z represents the concentration of a particular raindrop property (in this case, the 6^{th} power of their diameter, proportional to the square of their volume) (Houze, 1993; Mehta et al., 2020; Uijlenhoet, 2001). A high Z value indicates a high concentration of raindrops. A modification in the formation mechanism for precipitation particles results in a change in Z of the vertical profile (Houze, 1997). Descriptive statistics were conducted on the Z values at different heights to comprehend and quantify the dynamics of rain particle formation during intra-events. The resulting parameters from considering the entire vertical profile of the MRR are: Z_{max}: is the maximum reflectivity value in the vertical profile indicating the maximum concentration of raindrops; Z_{median}: refers to the median reflectivity in the vertical profile and was used to synthetize the change in vertical Z values; and $Z_{amplitude}$ (Z_{ampl}) is defined as the difference between the maximum and minimum reflectivity values in the vertical profile. In other words, a larger Z_{ampl} indicates that raindrops undergo more microphysical transformations as they fall to the surface.

2.6 Statistical tests

The Shapiro-Wilk test was applied to verify that the data distribution was normal (parametric) or non-normal (non-parametric) (Shapiro, S. S.; Wilk, 1965). A significant difference (p-value < 0.05) indicates a non-parametric distribution. A Spearman rank correlation test was used for nonparametric distribution data, whereas Pearson's linear correlation test was applied for parametric data. Correlation tests were conducted between isotopes ($\delta^{18}O$ and *d*-excess) and meteorological data (AWS and MRR variables) during the same time interval and from individual events. Correlation tests were not applied to GOES-16 BT and reanalysis data due to their temporal resolution, which reduced the number of samples. All tests were performed with significance levels defined by a p-value < 0.05, using the R statistical package (R Core Team, 2023).

Rainfall weighted averages were calculated for each event to evaluate large-scale processes using the equation:

$$\delta_{wgd} = \frac{\sum_{i=1}^{n} Ri\delta i}{\sum_{i=1}^{n} Ri} \quad (1)$$

where δ_{wgd} is the rainfall weighted average of the isotopic composition, R_i is the rainfall of the event (mm), δ_i is the isotopic composition of an individual sample (‰), and n is the number of samples from each event. Rainfall weighted averages refers to the $\delta^{18}O_{wgd}$, $\delta^{2}H_{wgd}$ and d_{wgd}, and median of the $\delta^{18}O_{med}$, $\delta^{2}H_{med}$ and d_{med}.

3 Results

3.1 Inter-event variability of meteorological and isotopic parameters

3.3.1. Seasonal-mean climatic and isotopic conditions

The isotopic composition of monthly rainfall exhibits clear seasonal variations between September 2019 and February 2021 (Fig. 2a). Seasonal variability was characterized by wet (low $\delta^{18}O$) and dry (high $\delta^{18}O$) seasons (austral summer and autumn-spring, respectively). Summer months were characterized by the influence of convective activity, reflected in high latent heat flux and lower OLR (Fig. 2 b-d). During autumn and spring, significant lower latent heat flux and higher OLR were associated with less convective development (Houze, 1997, 1989). The formation of convective rainfall may not be primarily controlled by diurnal thermal convection, as rainfall is more likely to be associated with frontal systems (Siqueira and Machado, 2004), as observed in the rainfall episodes during autumn and spring.

A significant influence of the cold fronts was observed before, during, and after their passage over the study area (Fig. 2a). During autumn and spring, the convective events of 2019/11/05, 2020/11/18, and 2020/05/23 were associated with cold fronts in the study area. On 2020/06/09, changes in the regional atmosphere over the state of São Paulo caused convective rainfall due to an instability (frontal) system resulting from a cold front settling over the southern region of Brazil. During the summer season, convective rainfall also occurred on 2020/02/01 and 2021/02/24 due to cold fronts and instability (frontal), respectively. In addition, the thermal convection over land, lead to convective rainfall event on 2020/01/30. As a result of the interaction between thermal convection and the incursion of the frontal system, a low-pressure system (frontal) was responsible for the convective rainfall event on 2020/02/10.

3.3.2. Isotopic and local meteorological variations

Table 1 presents an overview of the sampling, isotope compositions (δ_{med} and δ_{wgd}) and median values of meteorological variables from individual events. The duration of sampled events ranged from 141 min to 18 min. The T and T_{wd} exhibited small differences among the events. In contrast, RR, RH, LCL, Z, w, and BT varied considerably between events. The maximum recorded values for these parameters were 97%, 489 m, 46 dBZ, 8 m s^{-1} and -63 °C, respectively. Isotope values varied among convective events, with a range of -11.0 ‰, -91.2 ‰ and +15.7 ‰ for $\delta^{18}O_{med}$, $\delta^{2}H_{med}$ and d_{med}, respectively (Table 1).

3.1.3. Moisture origin

The sourcing of moisture for rainfall over Rio Claro varies seasonally and spatially, suggesting complex interactions in moisture transport and mixing that strongly influence the δ_{wgd} isotopic composition of rainfall throughout the year (Table 1). Hysplit air mass back-trajectories revealed three main domains as moisture origin during the presence of convective rainfall: Amazon forest, Atlantic Ocean, and southern Brazil (Fig. 3).

Summer rainfall events were characterized by the trajectory and length of moist air masses arriving from the Amazon forest (2020/02/10, 2020/02/01, and 2020/01/30) (Fig. 3a). As a result, there was a large amount of rainfall along Hysplit trajectories.

Rainfall amounts were 177 mm, 126 mm and 78 mm, respectively. Remarkably, these events exhibited similar isotope characteristics (δ^2H_{wgd}, $\delta^{18}O_{wgd}$) (Table 1). In contrast, the event on 2021/02/24 presented higher δ_{wgd} values, reflecting the oceanic moisture influence (Fig. 3a), with a lowest amount of rainfall (53 mm) along Hysplit trajectory.

Based on ERA-5, the vertically integrated eastward vapor flux corroborates the influence of a distinct mechanism for moisture transport and δ_{wgd} values. Negative values for vertical vapor fluxes over the Amazon forest during sampled convective events in summer (Fig. 4a, b, d) clearly illustrate a westward moisture flux from the Atlantic Ocean to the Amazon forest. Positive values in the central-southern region of Brazil indicate moisture being transported eastward from the Amazon forest. However, these moisture fluxes were not observed on 2021/02/24 when the eastward vapor flux was positive with high values over the Atlantic Ocean (250 ~ 750 kg m^{-1} s^{-1}).

The autumn convective events on 2020/05/23 and 2020/06/09 revealed a significant continental origin of moist air masses (from south-western Brazil). In addition, during the second event, the Amazon-type trajectory started in the southern Atlantic and did not reach the boundary of the rainforest (Fig. 3b). Both autumn events reported the lowest rainfall amounts (4 mm) along Hysplit trajectories. On 2020/05/23 negative vertical flux values (-500 ~ -250 kg $m^{-1}s^{-1}$) were observed in south-western Brazil, indicating moisture transport from the Atlantic Ocean to the continent. This favored a vapor flux (500 ~ 750 kg $m^{-1}s^{-1}$) from western Brazil to the study area (Figure 4f). On 2020/06/09, there were slightly negative values (-250 ~ 0 kg $m^{-1}s^{-1}$) of eastward vapor flux in the Amazon forest, indicating less influence from rainforest moisture. Conversely, positive vapor flux values (250 ~ 500 kg $m^{-1}s^{-1}$) were observed in the western part of continental Brazil.

Two events in the spring season (Fig. 3c) also showed contrasting origin of moisture and d_{wgd} values, despite only slight differences in $\delta^{18}O_{wgd}$ (Table 1). The mean trajectory on 2020/11/18 clearly belongs to the Amazon category, although it only passed over the south-eastern boundary of the Amazon rainforest and had a much shorter length and lower rainfall along Hysplit trajectory (23 mm) compared to the Amazon trajectories observed during the summer season. Thus, positive values of the eastward vapor flux (250 ~ 750 kg m^{-1} s^{-1}) were not distributed along the Amazon forest to the Atlantic Ocean as typically observed (Fig. 4h). The mean trajectory on 2019/11/05 the eastward vapor flux (> 500 kg m^{-1} s^{-1}, Fig. 4g) were circling around Rio Claro, indicating the continental moisture origin (from southern Brazil), and low amount of rainfall along Hysplit trajectory of 8 mm.

3.2 Intra-event variability of the isotope and meteorological parameters

The temporal evolution of isotope characteristics and selected meteorological parameters of convective rainfall are shown in Fig. 5-6 (summer), Fig. 7 (autumn) and Fig. 8 (spring). The vertical Z variation of the MRR in all events shows a pattern of values ranging from 0 to 10 dBZ at the top, a wide band of lowest values and noise attenuating the reflectivity producing white horizontal and vertical bands, and an increase in Z values closer to the surface where Zmax occurs (highest values ranging from 44 to 51 dBZ). During intra-events, Z, isotopic parameters, and GOES-16 BT display distinct temporal patterns across events and seasons. There are large variations in Z values and inverse patterns between $\delta^{18}O$ and *d*-excess (more variable), and between T and RH. Different decreasing, increasing or stable trends were observed in BT values. The following sections described the main seasonal results for the intra-event analysis.

3.2.1. During summer

Low variability patterns were observed on 2020/02/01 and 2020/01/30 (Fig.5) for $\delta^{18}O$, T, RH, and BT. Both events were shorter in duration (≤ 25 minutes) and had a higher R (≤ 5.4 mm) value at the beginning, which decreased over the course of the event (0.2 mm). Similar MRR vertical profiles were observed between the events, illustrated by similar Z values, with low variability of Zmedian (7 ~ 17 dBZ and 8 ~ 15 dBZ), Zmax (23 ~ 48 dBZ and 19 ~ 46 dBZ) and Z amplitude decreasing along the event (17 ~ 45 dBZ and 19 ~ 42 dBZ), respectively. Strong and significant ($p < 0.0001$) correlations were observed between isotopic composition and MRR parameters for 2020/02/01: $\delta^{18}O$-Z (r = -0.9), $\delta^{18}O$-w (r = -0.9), $\delta^{18}O$-Zmáx (r = -0.9), $\delta^{18}O$-Zampl (r = -0.8), *d*-excess-Z (r = 0.9), *d*-excess-w (r = 0.9), *d*-excess-Zmax (r = -.9) and *d*-excess-Zampl (r = 0.9). No significant correlations between isotopic composition and meteorological parameters for 2020/01/30, except for a moderate correlation between $\delta^{2}H$ and Zmedian (r = -0.5).

Large isotopic and meteorological variations were observed for 2021/02/24 ($\delta^{18}O$: -7.9 ~ -4.4 ‰, *d*-excess: +1.2 to +18.4 ‰) and 2020/02/10 ($\delta^{18}O$: -15.2 ~ -7.9 ‰, *d*-excess: +4.8 ~ +21.4 ‰.) (Fig. 6). On 2021/02/24 a strong and significant ($p < 0.05$) correlation was observed between $\delta^{18}O$ and R (r = -0.8), Z (r = -0.6), Zmax (r = -0.6), Zampl (r = -0. 6), Zmedian (r = 0.7), and between *d*-excess and R (r = -0.6), Z (r = -0.5), Zmax (r = 0.5), Zampl (r = 0.5) and Zmedian (r = -0.7). For 2020/02/10, significant correlations were reported between $\delta^{18}O$-RH (r = -0.5), *d*-excess-RH (r = 0.5) and *d*-excess and Zmedian (r = 0.5). In addition, *d*-excess values lower than +10‰ were observed at the end of the events (2020/02/01, 2020/02/10 and 2021/02/24), corresponding to low values of the R and Z parameters and high RH (black dotted cycle in Figs. 5 and 6).

3.2.2 During autumn and spring

Autumn events show distinct isotopic patterns. The 2020/05/23 event exhibited a small isotopic ($\delta^{18}O$: -2.6 ~ -2.7 ‰, *d*-excess: +16.7 ~ +19.0 ‰) and meteorological (declining T, R and Z parameters along the event) variation (Fig. 7). On 2020/06/09 (Fig. 7) two isotopic distribution patterns were recorded, with minimal ($\delta^{18}O$: -3.6 ~ -3.4 ‰, *d*-excess: +26.4 ~ +17.7 ‰) and large ($\delta^{18}O$: -1.5 ~ -2.9 ‰; *d*-excess: +15.3 ~ +6.3 ‰) variations, corresponding to high RH, R, Zamplt and Zmax (grey bands in Fig. 8). Strong and significant ($p < 0.05$) correlations were observed between $\delta^{18}O$-RH (r = 0.5), $\delta^{18}O$-T (r = -0.6), *d*-excess-RH (r = -0.6), *d*-excess-T (r = 0.7) and *d*-excess- Zamplt (r = -0.5) on 2020/06/09. However, no significant correlations were found during the event on 2020/05/23.

Distinctive isotopic patterns were also found during spring events. On 2019/11/05, a change in the vertical profile and Z parameters was observed (grey bands in Fig. 8), with a shift in $\delta^{18}O$ from maximum depletion (-4.1 ‰) to enrichment at the end of the event (-3.2 ~ -1.7 ‰). On 2020/11/18, there was a gradual decrease observed in $\delta^{18}O$ (-2.7 ~ -5.4 ‰) and an increase in *d*-excess (+10.2 ~ +23.1 ‰). The latter was accompanied by a progressive increase in RH, decrease in T, and constant Zmedian values (Fig. 8). On 2019/11/05 a strong and significant ($p < 0.005$) correlations were observed between $\delta^{18}O$ and Z (r = -0.7), w (r = -0.7), Zmax (r = -0.7) and Zampl (r = -0. 6), and between *d*-excess and RH (r = -0.7), T (r = 0.8), w (r = 0.6), Zampl (r = 0.5) and Zmedian (r = -0.5). For 2020/11/18, significant correlations were obtained between $\delta^{18}O$-RH (r = -0.5), $\delta^{18}O$-T (r = 0.7), *d*-excess-Zampl (r = 0.7).

4. Discussion

Detailed evaluations of the isotopic variability in convective rainfall were provided at both inter- and intra-event scales. The key regional and local controls on the isotopic composition of convective rainfall can be divided in two groups: (i) rainfall produced by different moisture source region(s) represented by inter-event isotopic values, and (ii) local effects associated with vertical rainfall structure and surface meteorological conditions. In the summer, thermal conditions dominate convective processes. During autumn and spring, convective rainfall was associated with frontal systems (Fig. 2). In this regard. δ_{wgd} values better constrained the large-scale processes (such as vapor origin, convective activity and weather systems) with stronger rainfall amount dependencies. The individual isotopic patterns influenced by local effects revealed microphysical processes such as coalescence (i.e., higher concentration of raindrops with high Z values) hat are often masked by weighted averages and long-term averages during the evolution of individual precipitation systems.

4.1 Regional atmospheric controls

Regional aspects of atmospheric moisture transport to Rio Claro were illustrated in HYSPLIT backward trajectories (Fig. 3) and maps of vertically integrated moisture flux across the region (Fig. 4). Most of moist air masses arriving at Rio Claro during summer exhibited a common origin in the equatorial Atlantic Ocean and were subjected to a long rainfall rainout, extending over several thousand kilometers. Along this pathway, air masses interacted with the Amazon forest. Intensive moisture recycling resulted in a small continental isotope gradient across the Amazon forest (Salati et al., 1979; Rozanski et al., 1993) and elevated *d*-excess (Gat, J. R., & Matsui, 1991). At Rio Claro, the arriving air masses are depleted in heavy isotopes ($\delta_{wgd} \leq -10.0$ ‰) due to rainout along the trajectories (≥ 78 mm), with consistent $d_{wgd} > +14.0$ ‰, inherited through the interaction of maritime moisture with the Amazon forest. In contrast, the summer event on 2021/02/24 was influenced by oceanic moisture and had a short trajectory compared to other typical summer events. The convective events during spring and autumn season exhibited substantially shorter trajectories suggesting that the atmospheric “pump” transporting moisture from the equatorial Atlantic Ocean to the Amazon forest was much weaker or non-existent during this time of the year. Those short trajectories suggest enhanced evapotranspiration of source moisture for rainfall (Salati et al., 1979; Risi et al., 2013; Gat, J. R., & Matsui, 1991; Worden et al., 2007; Brown et al., 2008; Levin et al., 2009; Worden et al., 2021). As a result, those trajectories were characterized by a reduction in the amount of rainfall along the trajectories and enriched $\delta^{18}O_{wgd} = \geq -4.2$ ‰ and higher $d_{wgd} = \geq +16.5$ ‰. In addition, the highest d_{wgd} (+23.3 ‰) observed on 2019/11/05 was characterized by a continental moisture trajectory circling around Rio Claro (Fig. 3c) over a greater RH gradient (e.g., sugar cane crop regions) (da Silva et al., 2021). Evaporation from soil increases kinetic fractionation, favoring the evaporation of HDO due to high diffusivity, resulting in a strong *d*-excess changes (Risi et al., 2013).

4.2 Local atmospheric controls

In deep convection, precipitation particles primarily grow through the collection of water (known as coalescence) by larger droplets and/or ice particles (known as riming). These larger particles sweep water from the cloud on their falling paths in the presence of strong rising air currents. As a parcel of rising air ascends, the growing particles within it move until they become large enough to fall relative to the air. As the air parcel ascends, particles fall out at each successive height. The remaining lighter particles disperse laterally over a larger area due to the diverging airflow. Convective air movements create concentrated reflectivity peaks in the radar pattern because most of the precipitation mass falls within a few kilometres of the updraft centres (Houghton, 1968; Houze, 1997). The irregular blank bands visible in the vertical MRR profiles (Fig. 5) could be attributed to the lateral dispersion of remaining particles. The concentrated high reflectivity values (Fig. 5) illustrate this pattern, which typically occurs close to the surface and indicates the occurrence of Zmax.

Variations in the isotopic composition of the rainfall reflect changes in this mechanism of raindrop formation (Sun et al., 2022; Aggarwal et al., 2016). This is shown by the vertical variation in the Z values of the events on 2020/02/10, 2021/02/24, 2020/06/09 and 2019/11/05 (grey band in Fig. 6, 7, 8). A possible reason for this change is that the process of coalescence during the falling raindrops towards the surface may have been altered. This can be seen in the higher Zampl values (40 ~ 50 dBZ), which suggest that water particles were being incorporated into the raindrop during the fall at the surface, resulting in a larger water particle and consequently a higher concentration in the raindrops and the occurrence of Zmax close to the surface. The $\delta^{18}O$ values generally increased while the *d*-excess decreased, resulting in a change in the isotopic variation pattern, reflecting the diffusive exchange process between the surrounding vapor and the raindrops (Gedzelman and Lawrence, 1990; Celle-Jeanton et al., 2004). In contrast, the isotopic pattern of the events on 2020/02/01 (Fig. 5), 2020/01/30 (Fig. 5), and 2020/05/23 (Fig. 7) exhibited small variation due to the low variability in Z values. Therefore, the main local control on the isotopic variability of intra-events corresponded to the vertical structure of the rainfall event.

The *d*-excess values decreased and the $\delta^{18}O$ values increased at the end of the events on 2020/02/01, 2021/02/24 and 2020/02/10 (black dotted cycle in Figs. 5a, 6a and 6b, respectively). This was due to the formation of residual rainfall at low altitudes and a decrease in rainfall intensity during the dissipation phase of the convective cell. On 2020/11/18 (Fig. 8b), the

$\delta^{18}O$ values constantly decreased, illustrating a typical depletion of heavy isotopes based on Rayleigh distillation processes due to the progressive condensation of convective systems. Previous studies have widely observed these mechanisms during intra-events, and both interpretations are supported (Adar et al., 1991; Coplen et al., 2008, 2015; Barras and Simmonds, 2009; Celle-Jeanton et al., 2004; Muller et al., 2015).

5 Concluding remarks

This study used high-frequency isotopic composition of rainfall as well as meteorological data to investigate the regional and local mechanisms controlling the isotopic characteristics of convective precipitation. Based on the inter-event analysis, the regional isotopic characteristics are different between summer and autumn-spring seasons. The δ_{wgd} is determined by moisture transport mechanisms and convection features. The main factors are the gradual reduction of heavy isotopes along moisture trajectories. The rainfall produced along these tracks was pronounced during summer events, associated with the longer moisture transport pathway from the Amazon Forest, producing depleted isotope values. In contrast, reduced autumn and spring rainfall along trajectories is associated with a shorter moisture transport pathway from the Atlantic Ocean and southern Brazil. This produces enriched isotope characteristics and high d_{wgd} values associated with transpiration and soil evaporation along the moisture transport pathway.

Within convective events, the regional δ_{wgd}-signature was altered by local effects, as shown by the intra-event isotopic evolution. The vertical structure of rainfall, described by the Z parameters in the vertical MRR profile, is the main local control. During falling raindrops, a microphysical change can cause a vertical change in Z values, resulting in abrupt variations in isotopic patterns. These findings were supported by significant and strong correlations between the MRR and isotopic parameters in each event. Therefore, the isotopic composition of convective rainfall is controlled by an interplay of regional and local factors. The complex and dynamic conditions of convective rainfall formation across the tropics can be understood using high-frequency analysis. Although high-frequency rainfall sampling is logistically difficult, we encourage future studies of this type in different geographical regions across the tropics, to better understand the factors controlling the isotopic composition of convective rainfall during rainy period. Extensive monitoring of local meteorological parameters and modeling of regional moisture transport to the rainfall collection site, along with the application of more robust below-cloud models, should accompany such studies.

Data availability

A complete database (isotope characteristics of rainfall as well as selected meteorological parameters characterizing these events) are available at: https://doi.org/10.17632/kk3gs8zn4s.1 (dos Santos et al., 2023). Monthly GNIP data: https://www.iaea.org/services/networks/gnip. GOES-16 imageries are available at: https://home.chpc.utah.edu/~u0553130/Brian_Blaylock/cgi-bin/goes16_download.cgi. The weather systems are available at:

https://www.marinha.mil.br/chm/dados-do-smm-cartas-sinoticas/cartas-sinoticas and http://tempo.cptec.inpe.br/boletimtecnico/pt. Reanalysis data are available at: (https://cds.climate.copernicus.eu/cdsapp#!/search?type=dataset. The Global Modeling and Assimilation Office (GMAO) data are available at: https://goldsmr4.gesdisc.eosdis.nasa.gov/data/MERRA2/M2T1NXFLX.5.12.4/). Goddard Earth Sciences Data and Information Services Center (GES DISC) data are available at: https://disc.gsfc.nasa.gov/datasets/AIRS3STD_7.0/summary.

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Table 1. Summarizing overall convective rainfall events, isotope and meteorological parameters

Season		**Spring**		**Autumn**		**Summer**			
Data		**05/11/2019**	**18/11/2020**	**09/06/2020**	**23/05/2020**	**30/01/2020**	**10/02/2020**	**01/02/2020**	**24/02/2021**
Number of samples		21	8	12	4	6	18	5	16
Duration		82	141	96	131	23	86	18	55
$\delta^{18}O$	Median	-3.1	-4.2	-3.4	-2.9	-10.0	-13.9	-10.4	-6.8
	Weighted average	-3.0	-4.2	-2.7	-2.9	-10.0	-13.4	-11.1	-7.2
$\delta^{2}H$	Median	0.8	-13.7	-5.6	-6.9	-64.4	-92.0	-73.5	-44.8
	Weighted average	-1.2	-14.9	-4.9	-6.8	-63.9	-90.4	-75.0	-47.2
***d*-excess**	Median	22.9	19.7	17.3	16.3	15.7	17.5	13.4	7.2
	Weighted average	23.3	19.1	17.3	16.5	16.5	16.7	14.2	11.1
Automatic Weather Station	Rain rate	0.4	0.2	0.3	0.0	0.4	0.5	0.6	0.5
	RH	96	86	95	87	93	97	93	86
	T	21	20	19	19	23	22	23	21
	Tdw	20	17	18	17	21	21	21	18
	LCL	146	489	168	449	247	93	253	468
Micro Rain Radar	Z	46	38	42	33	38	41	39	35
	w	8	7.1	7.7	6.6	6.6	6.7	7.1	7.1
GOES-16	BT	-63	-63	-50	-56	-53	-39	-60	-51

Duration (minutes); Isotopes parameters (‰); Median values of meteorological variables: Rain rate ($mm.min^{-1}$), Relative Humidity – (RH %), Temperature (T °C), Dew Temperature (Tdw °C), Lifting Condensation Level (LCL meters), Reflectivity (Z dBZ), Vertical Velocity ($m.s^{-1}$) and Brightness temperature (BT °C).

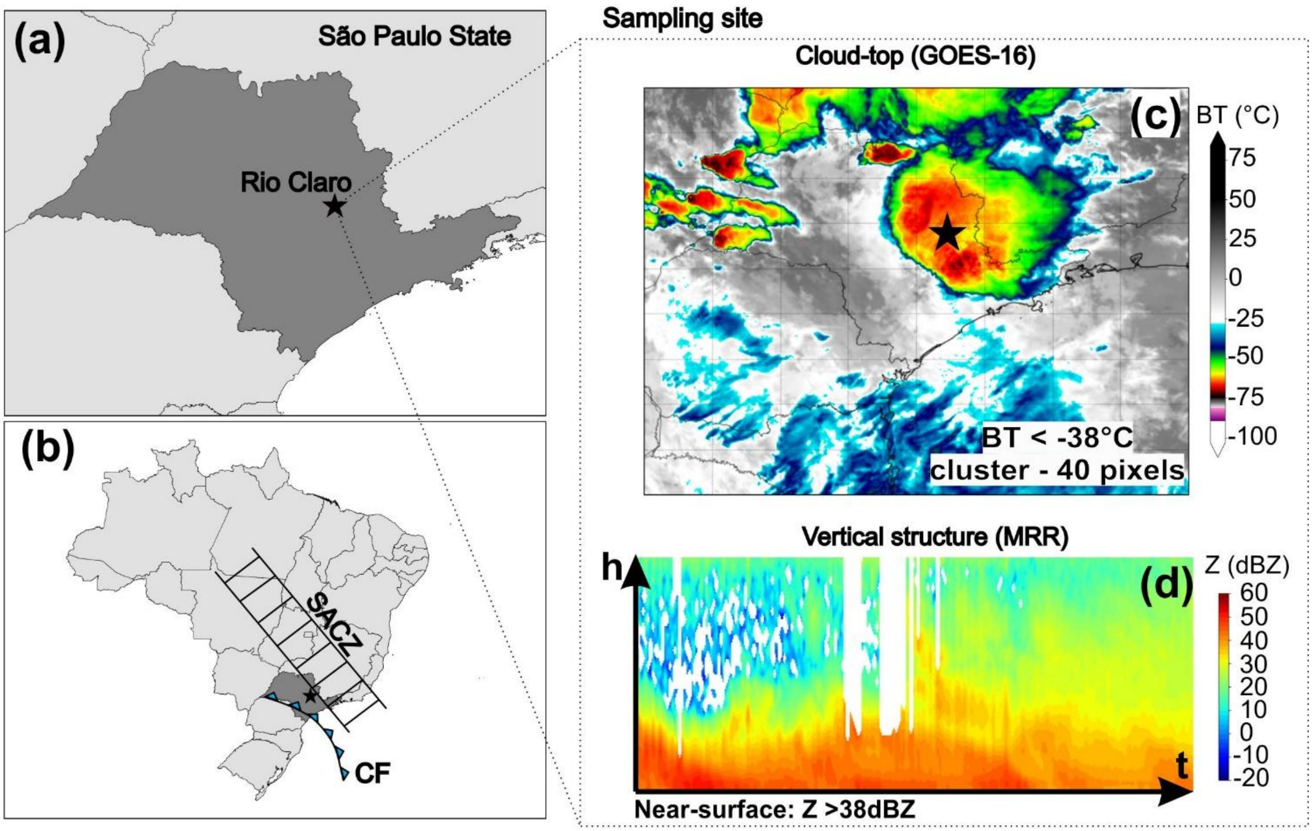

Figure 1. Regional and local context of study area. (a) Localization of sampling site in Rio Claro (black star) (b) regional synoptic context across Brazil and main weather systems (CF – cold front and SACZ – Southern Atlantic Convergence Zone). (c) GOES-16 satellite imagery of convective rainfall (d) Micro Rain Radar (MRR) image of convective rainfall.

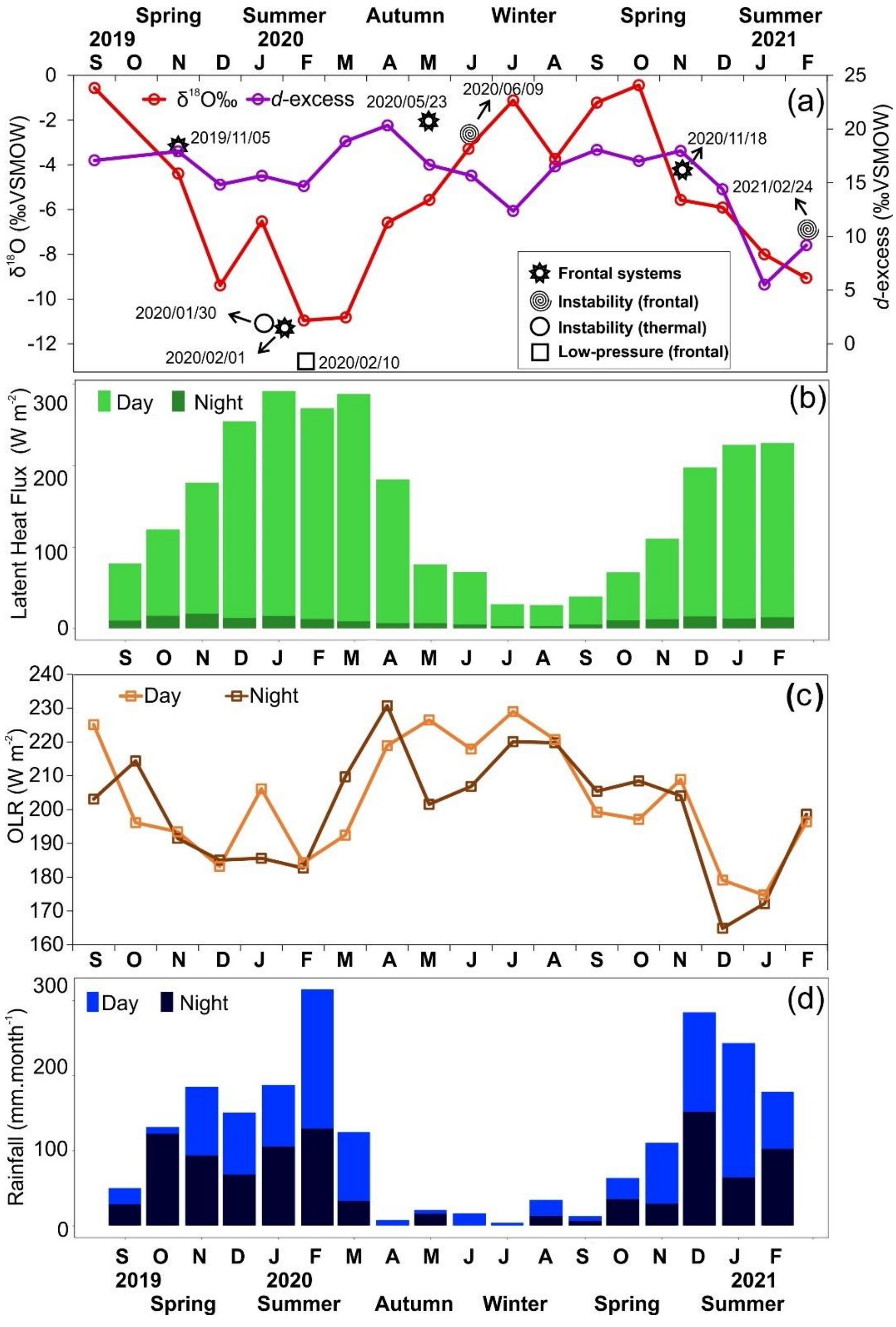

Figure 2. Seasonal variation of isotope and convective parameters. (a) Temporal distribution of monthly $\delta^{18}O$ and *d*-excess values during study period, with aggregated median of $\delta^{18}O$ values for high-frequency convective rainfall events (b) AQUA/AIRS latent heat flux. (c) MERRA-2 outgoing longwave radiation (monthly averaged daytime and night-time data) (d) monthly rainfall amounts at Rio Claro separated into day and night fraction (no rainfall types distinguished). The black symbol indicates weather systems described in section 3.1. The monthly isotopic composition used in this figure was collected by the first authors of the article and determined by the UNESP laboratory, following the same procedures mentioned in section 2.2.

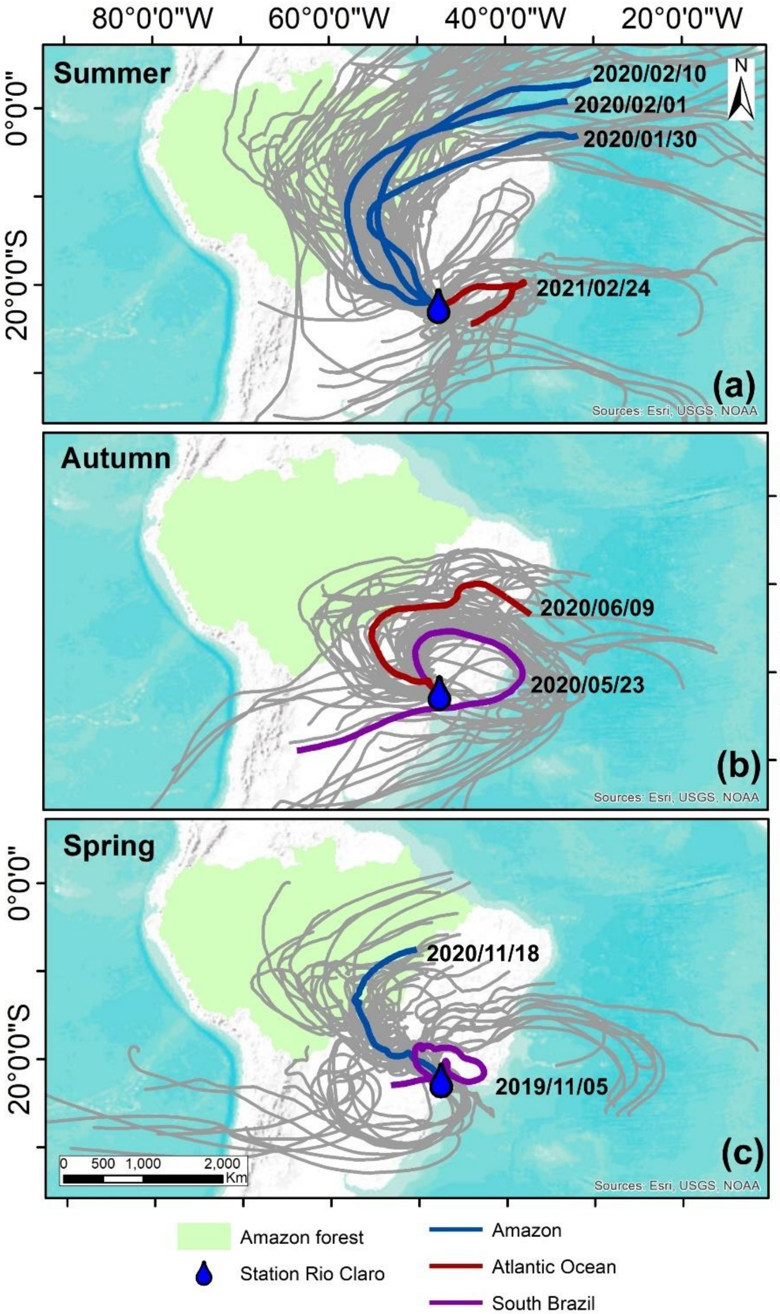

Figure 3. Ten-day backward trajectories arriving at Rio Claro station of eight convective events. (a) Summer, (b) Autumn and (c) Spring. Twenty-seven ensembles are grey lines, and the mean trajectory is the colors lines. The colours of the mean trajectories indicate the origin of air masses. The authors used trivial information, the borders of the countries and the ocean provided by the ESRI base map.

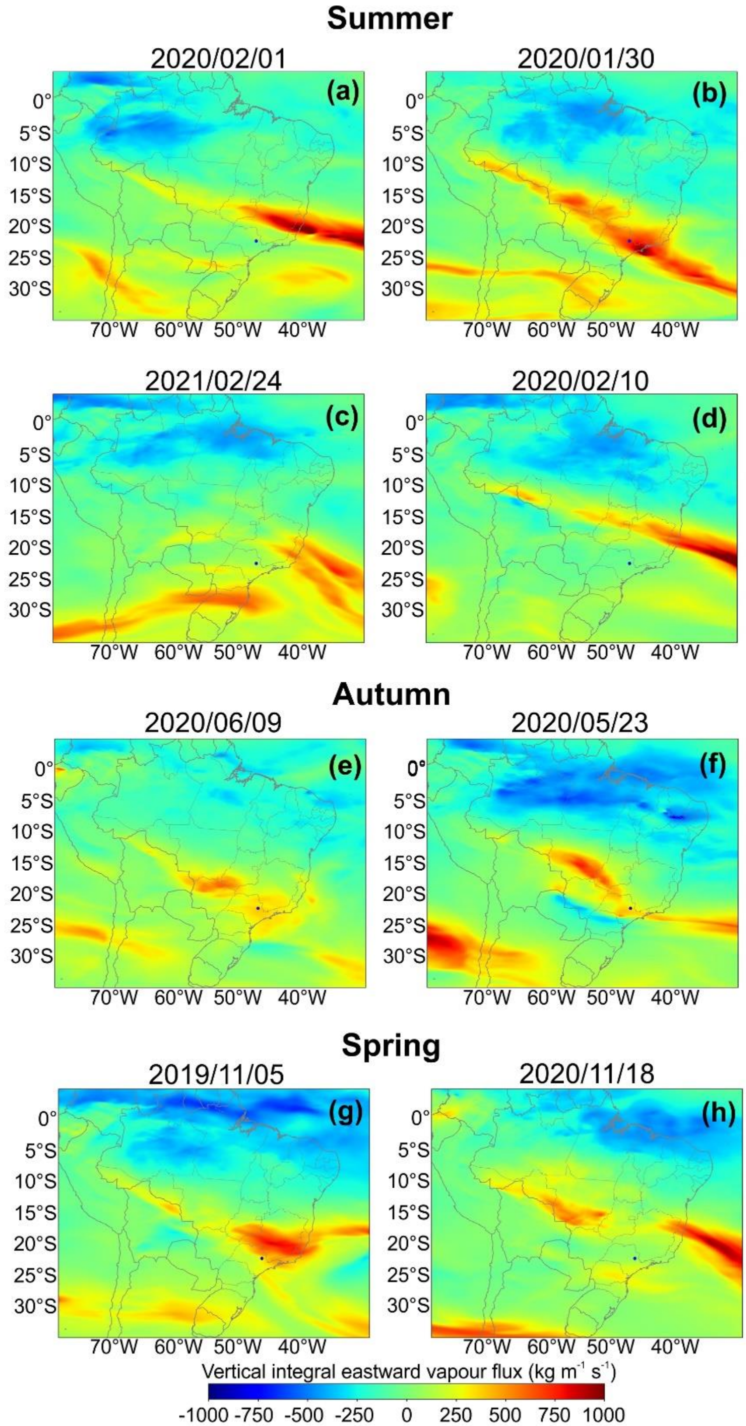

Figure 4. ERA-5 vertical integral of eastward water vapor flux. (a, b, c, d) summer convective events (e, f) autumn and (g, h) spring aggregated. The maps corresponded to the days when convective rainfall events occurred. Positive values indicate the direction of moisture vapor flux from left to right, and negative values from right to left.

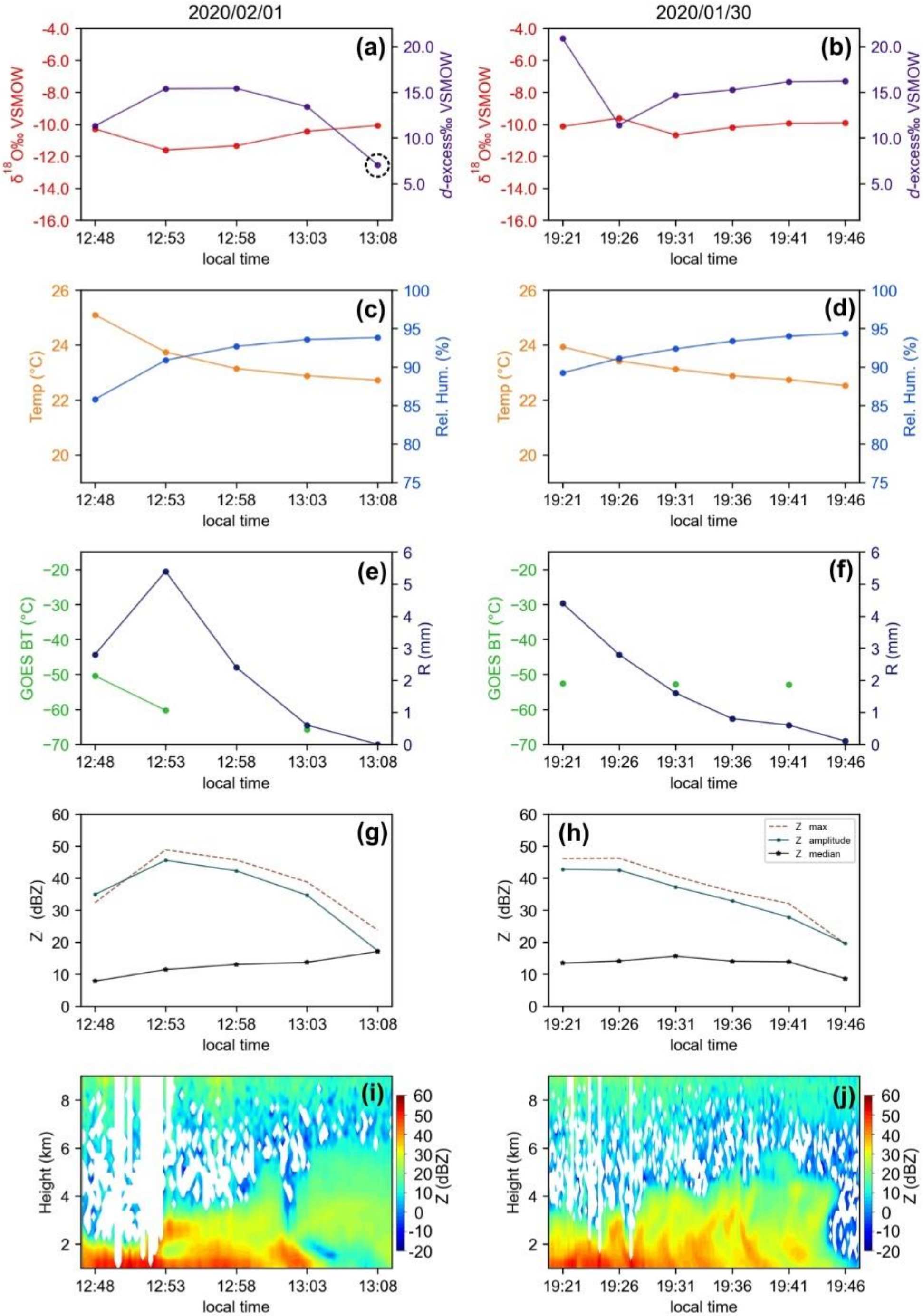

Figure 5. Summer intra-events. (a, b) $\delta^{18}O$ (red lines) and *d*-excess (purple lines) (c, d) Temperature (orange lines) and Relative Humidity (blue lines) (e, f) brightness temperature (BT – green bars) and rainfall amount (blue lines) (g, h) Reflectivity parameters, Z maximum (red lines), Z amplitude (green lines) and Z median (black lines) (i, j) radar reflectivity of Micro Rain Radar. The black dotted cycle refers to the low *d*-excess value.

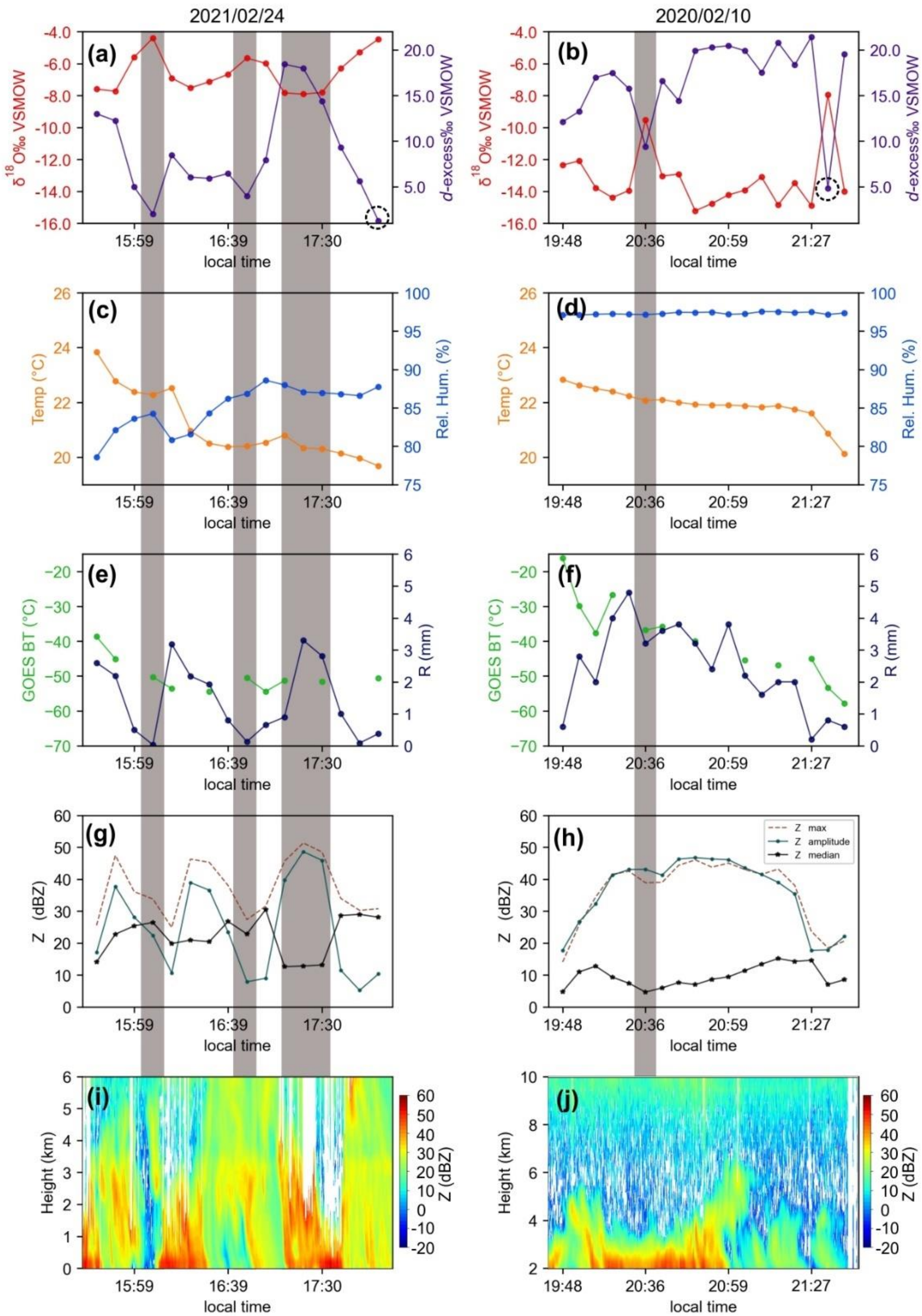

Figure 6. Summer intra-events. Refer to Fig. 5 for legend description.

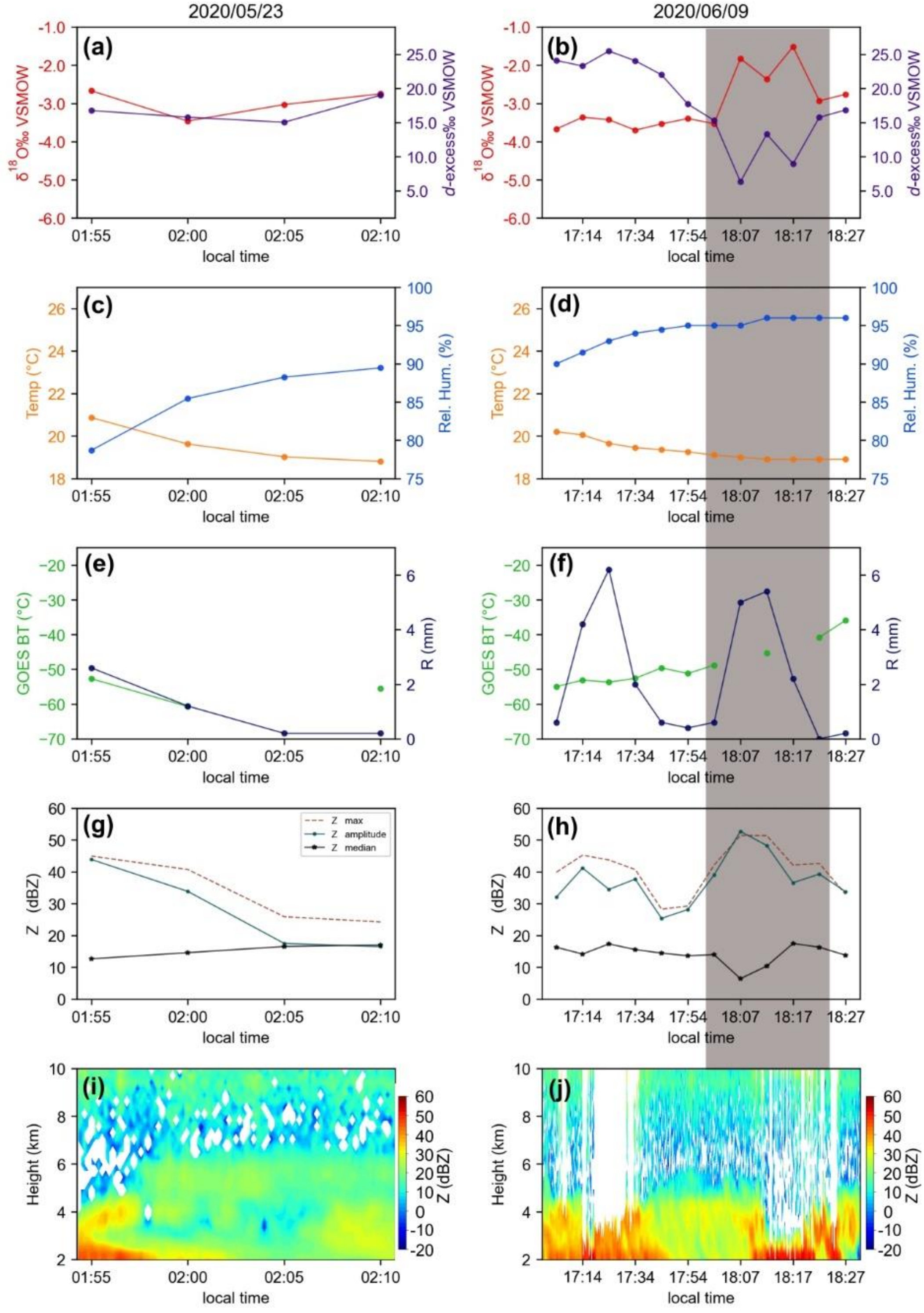

Figure 7. Autumn intra-events. Refer to Fig. 5 for legend description.

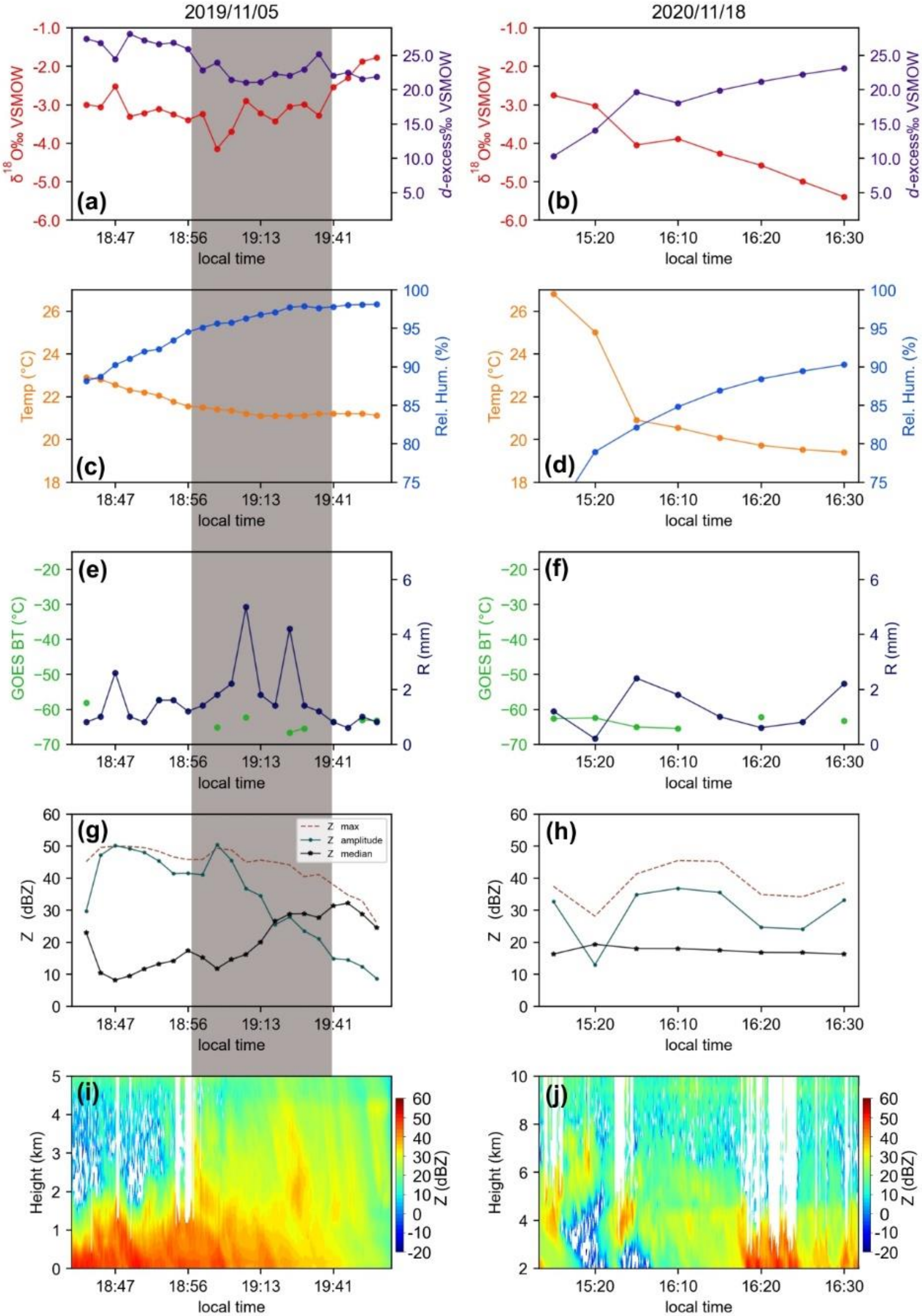

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Figure 8. Spring intra-events. Refer to Fig. 5 for legend description.