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# Secondary droplet activation during condensational growth in convective clouds and its detection from satellites

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#### ABSTRACT

By acting as cloud condensation nuclei (CCN), aerosol particles play a key role in the climate system. The CCN can be activated into cloud droplets at the cloud base (i.e., primary activation), or above it (i.e., secondary activation). This study shows the conditions required for secondary activation during the condensational growth phase in convective clouds. It also proposes a methodology for detecting this secondary activation from satellites. Using a spectral bin adiabatic parcel model, we simulate the vertical profile of cloud microphysical properties and demonstrate how different aerosol size distributions and updraft velocities greatly affect the secondary activation initiation and the cloud properties. The secondary activation slows down the cloud drop effective radius ( $r_e$ ) growth rate with increasing height, and decreasing temperature (T), due to the relatively larger population of smaller droplets in the cloud parcel. Therefore, the vertical profile of  $r_e$  growth with height is slower than the adiabatic rate when the secondary activation occurs.

The proposed physical principle was verified by satellite-retrieved T- $r_{\rm e}$  profiles and adiabatic cloud drop number concentrations ( $N_{\rm d}$ ) over the Amazon region. The results obtained from this study can be utilized to identify the secondary droplet activation during the condensational growth phase, which can lead to an overestimation of the retrieved  $N_{\rm d}$  as well as suppression of warm rain. This improves our knowledge and observational capabilities of the role of aerosol particles in the microphysics, dynamics, and precipitation behavior of convective clouds.

Plain text summary: Small particles serve as sites for cloud droplets' condensation at the cloud base (primary droplet activation) or above it (secondary activation). Once a droplet is activated at the cloud base, the surrounding water vapor condenses on it and the droplet grows - this is called condensational growth. The cloud droplet number concentrations ( $N_d$ ) can be obtained by the satellite-retrieved vertical growth rate of droplet size in the condensational growth phase. However, new small droplets formed during this phase (i.e., secondary activation), might cause an overestimate in the retrieved  $N_d$ . This study presents the physical principle of secondary activation during condensational growth. Using a model, we simulate the condensational growth of aerosol particles, which act as cloud condensation nuclei (CCN), for different particle size distributions and thermodynamic conditions (i.e., vertical velocities). Our simulations show that secondary activation slows the cloud droplet growth rate with height due to the larger competition for the available water vapor promoted by the new drops. Comparisons between satellite-retrieved  $N_d$  of convective clouds and in-situ measurements show

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that the satellite retrievals overestimate  $N_d$  when the secondary activation of droplets is neglected. Our findings improve the understanding of aerosols' role in the condensational growth of droplets in convective clouds.

#### 1. Introduction

#### 1.1. Background

The impacts of aerosols on clouds and climate are among the most significant uncertainties in assessing and modeling climate change (IPCC, 2013, 2021). Remote sensing techniques for studying aerosols and clouds allow worldwide monitoring and analysis of aerosol-cloud interactions (e.g., Rosenfeld and Lensky, 1998; Bréon et al., 2002; Rosenfeld et al., 2016; Grosvenor et al., 2018; Yang et al., 2021). Yet, analyzing aerosol and cloud characteristics with sufficient precision has remained a major challenge to quantify how cloud microstructure and the associated radiative properties respond to aerosol perturbations (e. g., Zhao et al., 2012; Efraim et al., 2020; Sayer et al., 2020).

The number concentration of cloud droplets ( $N_d$ ; a list of abbreviations and symbols is given in Table 1) at the cloud base mainly depends on the activation spectrum of the aerosol particles that serve as cloud condensation nuclei (CCN) as a function of supersaturation (S) (Köhler, 1936; Twomey, 1959). The S rises when an air parcel is steadily cooled below the dew point due to the existing cloud base updraft ( $w_b$ ). When S reaches a critical value ( $S_c$ ), which is specific to the characteristics of a particular CCN, it is activated and grows into a droplet. As S increases, further activation of droplets occurs, and the already activated CCN continue to grow. Consequently, water vapor is removed by condensation at a steadily increasing rate, resulting in a slowing of the increase of

Table 1
List of abbreviations and notations.

Abbreviation/ notation	Description	Units
ACRIDICON- CHUVA	Aerosol, Cloud, Precipitation, and Radiation Interaction and Dynamics of Convective Cloud Systems - Cloud Processes of the Main	-
	Precipitation Systems in Brazil: A Contribution to	
	Cloud Resolving Modeling and to the GPM (Global	
ACD	Precipitation Measurement)	$cm^{-3}$ .
ASD	Aerosol size distribution	cm °, nm
ATTO	Amazon Tall Tower Observatory	-
CCN	Cloud condensation nuclei	-
$H_{\mathrm{b}}$	Cloud base height	km
LWC	Liquid water content	g/kg
LWC <sub>a</sub>	Adiabatic liquid water content	g/kg
$M_{ m droplet}$	Mass of a single droplet	μg
$N_{\rm a}$	The total particle number concentration	$cm^{-3}$ , $mg^{-1}$
$N_{\rm CCN}$	Number concentration of CCN	cm <sup>-3</sup> , mg <sup>-1</sup>
$N_{ m d}$	Number concentration of droplets	cm <sup>-3</sup> ,
$N_{\mathrm{da}}$	The adiabatic $N_d$ (based on eq. 4 in Freud et al.,	$cm^{-3}$ ,
OLR	2011) Outgoing longwave radiation	$mg^{-1}$
RWF	Rainwater fraction	_
	The effective radius of the cloud droplet spectra	_
<i>r</i> <sub>e</sub>	The droplet mean-volume radius	μm
$r_{ m v} = S$	Supersaturation	μm %
SAZ	Secondary activation zone	70
SAZ <sub>coal</sub>	Secondary activation above the coalescence phase	_
SAZ <sub>cond</sub>	Secondary activation during the condensational	_
or in-cond	growth	
$S_c$	Critical supersaturation	%
$S_{\max}$	Maximum supersaturation near cloud base	%
SMPS	Scanning Mobility Particle Sizer device	_
T	Temperature	°C
w	Updraft	$ms^{-1}$
$w_{\rm b}$	Cloud base updraft	$ms^{-1}$

S until the effect of condensation balances the growth of S due to cooling. Under the assumption of a fixed  $w_{\rm b}$ , the maximum S at the cloud base ( $S_{\rm max}$ ) is reached within a small distance (a few to tens of meters) above the cloud base (Twomey, 1959; Rogers and Yau, 1996). Above the level of  $S_{\rm max}$ , the existing droplets continue to grow, S starts to decrease, and no further CCN are activated. The  $N_{\rm d}$  at the cloud base will then be determined by the number concentration of activated CCN ( $N_{\rm CCN}$ ) where  $S_{\rm c} \leq S_{\rm max}$  (Twomey, 1959).

A common method for remote retrieval of  $N_d$  and  $N_{CCN}$  in growing convective towers is based on the growth of cloud drop effective radius  $(r_e)$  with height or decreasing temperature (T). This approach relies on aircraft observations showing that the measured  $r_e$  in different cloud depths above the cloud base increases almost as if the clouds were adiabatic. However, the cloud liquid water content (LWC) is mostly smaller than the adiabatic state (Freud et al., 2011; Braga et al., 2017). This pattern is caused by the nearly inhomogeneous mixing behavior of convective clouds with ambient air (Hill and Choularton, 1985; Paluch, 1986; Bower and Choularton, 1988; Brenguier, 1993; Brenguier et al., 2000; Burnet and Brenguier, 2007; Freud et al., 2008; Freud et al., 2011; Beals et al., 2015; Rosenfeld et al., 2016; Braga et al., 2017). Freud et al. (2011) showed that the cloud base  $N_{\rm d}$  could be approximated by the ratio of adiabatic LWC (LWC<sub>a</sub>) to the mass of a single droplet ( $M_{droplet}$ ). The  $M_{\text{droplet}}$  is calculated based on the mean-volume radius  $(r_{\text{v}})$  where  $r_{\nu} = \frac{r_e}{1.08}$  in an adiabatic process (Freud et al., 2011). Hereafter  $r_e$  and  $N_d$ in the adiabatic part are referred to as the adiabatic  $r_e$  and adiabatic  $N_d$ , respectively (Freud et al., 2011; Rosenfeld et al., 2016). Rosenfeld et al. (2014a) have shown that the T- $r_e$  profiles can be retrieved by satellites and thus provide the capability of calculating the adiabatic  $N_d$  based on the assumption of adiabatic  $r_e$  and LWC<sub>a</sub>. Using the cloud base height  $(H_b)$ ,  $w_b$  can be approximated based on the empirical relation  $w_b =$  $0.9H_b$ , where  $H_b$  is in km and  $w_b$  is in ms<sup>-1</sup> (Zheng and Rosenfeld, 2015). Then, the estimated  $N_d$  and  $w_b$  are used to calculate  $S_{max}$  (Pinsky et al., 2012), where  $N_d$  is, by definition,  $N_{CCN}$  at  $S_{max}$ . Rosenfeld et al. (2016) combined all these considerations into a method to retrieve cloud base  $N_{\rm d}$  and  $S_{\rm max}$  by satellite, which is essentially the  $N_{\rm CCN}(S)$ , with an accuracy of  $\pm 30\%$ .

However, as pointed out earlier,  $N_{\rm d}$  and  $N_{\rm CCN}$  can only be retrieved from vertical T- $r_{\rm e}$  profiles as long as the  $r_e$  behaves adiabatically. The layers of the cloud where  $r_e$  is nearly adiabatic are where the condensation process dominates the cloud droplets' growth above the level of  $S_{\rm max}$  close to the cloud base and below the level where the coalescence process dominates (i.e., for  $r_e < 14~\mu{\rm m}$  (Rosenfeld et al., 2006)). Droplet coalescence increases the growth rate of  $r_e$  with decreasing T beyond the adiabatic condensational growth rate. The condensation phase of the cloud and its role in the calculation of  $N_{\rm d}$  will be further described in Section 1.3.

#### 1.2. Secondary activation zone

The process of activating cloud droplets well above the cloud base (above the height of  $S_{\rm max}$ ) is referred to herein as secondary activation, as opposed to the primary activation of droplets at the cloud base. Secondary activation might occur in two ways:

- (1) When entrained particles from the cloud's lateral and/or top boundaries get activated as their characteristic  $S_c$  is lower than the actual S they experience in the cloud, which is smaller than  $S_{\max}$ .
- (2) When S above the cloud base exceeds the S<sub>max</sub>. This can occur either when droplet coalescence reduces the integrated droplets' surface area available for condensation, which decreases the

condensation rate and increases S (Efraim et al., 2022), or when there is an increase in updraft (w), which increases S due to a higher cooling rate. As a result, particles, that were not activated at the cloud base because their  $S_{\rm c}$  was greater than  $S_{\rm max}$ , can now be activated into cloud droplets at the current elevated S.

Both mechanisms will reduce the observed  $r_e$  with decreasing T, due to the presence of a significant number of smaller droplets in an environment of fewer larger drops, where the newly activated droplets can dominate the  $r_{\rm e}$ , as shown by several in-cloud aircraft campaigns (Warner, 1969; Paluch and Knight, 1984; Paluch and Baumgardner, 1989; Prabha et al., 2011; Braga et al., 2017; Bera et al., 2022). The secondary activation process might have an important impact on climate. The released latent heat from the activation of the new cloud droplets above the cloud base increases the buoyancy and further invigorates the cloud towards the tropopause (Khain et al., 2012; Fan et al., 2018). This invigoration may lead to more extensive and colder anvils in the form of cirrus clouds (Fan et al., 2013; Pan et al., 2021). These clouds efficiently absorb outgoing longwave radiation (OLR) and marginally reflect the incoming sunlight (Stephens et al., 1990). Therefore, during the day they might not have a large albedo, but they do absorb most of the OLR during day and night, eventually resulting in a positive radiative forcing and warming effect (Slingo and Slingo, 1988; Cotton et al., 2011). Moreover, the evaporation of ice crystals from these anvils enriches the upper troposphere with water vapor, which is a strong greenhouse gas (Price, 2000). Therefore, it will likely strengthen the positive radiative forcing.

The vertical microphysical zone in the cloud where the secondary activation occurs is defined as the "secondary activation zone" (SAZ). Efraim et al. (2022) presented a method to identify the post-coalescence SAZ along with other microphysical zones from satellite observations. This method analyses the T-re profile and divides the cloud into different microphysical zones based on the growth rate of re with decreasing T (dre/dT) compared to the adiabatic growth rate of re:

- condensational growth r<sub>e</sub> growth rate is similar to an adiabatic r<sub>e</sub> curve originating at the cloud base;
- (2) coalescence the growth rate of  $r_{\rm e}$  exceeds the adiabatic growth rate:
- (3) rainout a moderation of the growth rate of  $r_e$  after coalescence;
- (4) secondary activation a negative growth rate of  $r_e$ ;
- (5) mixed-phase of ice and water a rapid regrowth of  $r_{\rm e}$  above the subzero temperatures; and.
- (6) glaciation where the indicated  $r_{\rm e}$  reaches a maximum threshold of 40  $\mu$ m and/or temperatures colder than -38 °C.

As mentioned above, secondary activation can occur either after coalescence or when w accelerates above the cloud base, which increases the cooling rate. This might increase S to the extent that it exceeds  $S_{\text{max}}$ near the cloud base, even before the coalescence process dominance when the condensational growth is still dominant. While the secondary activation of droplets after coalescence was presented and discussed in a previous paper (Efraim et al., 2022), this study serves as a complementary one and discusses the physical principle of secondary activation during the condensational growth phase. Both studies together present a whole method of detecting SAZ from satellite observations. The conditions during coalescence are typically aerosol-limited, whereas the conditions at the focus of this study are often updraft-limited - the added drop nucleation occurs due to updraft acceleration. The condensational growth zone contains small droplets, so the newly activated ones are much less likely to reverse the growth trend with height like in the postcoalescence SAZ, but rather slow it to below adiabatic.

Hereafter, the microphysical zone in the cloud where secondary activation during the condensational growth occurs is referred to as  $SAZ_{\rm cond}$ , and the secondary activation of droplets above the coalescence phase is referred to as  $SAZ_{\rm coal}$ .

## 1.3. Secondary activation during the condensational growth phase, $SAZ_{cond}$

Additional condensation of water vapor above the level of  $S_{max}$  leads to a growth of the existing cloud droplets, i.e., condensational growth. This process further increases the integrated droplet surface area, decreases S, and usually prevents the activation of additional cloud droplets above that level (Rosenfeld, 2018). The LWCa is divided over the single droplet mass of the existing cloud droplets ( $M_{droplet}$ ), causing the N<sub>d</sub> to remain relatively constant with height (Rogers and Yau, 1996; Freud et al., 2011; Rosenfeld et al., 2016). This is valid as long as the cloud is adiabatic and there is no droplet evaporation or activation of new CCN particles (Rosenfeld, 2018). Therefore, a linear relationship of LWC<sub>a</sub>-M<sub>droplet</sub> ratio would denote an adiabatic part of the cloud. The adiabatic condensational growth phase is then determined by the most consecutive linear points of the LWC<sub>a</sub>-M<sub>droplet</sub> ratio. This linear part should also be close to the cloud base and pass through the origin because when LWC<sub>a</sub> is zero, there are no droplets. Fig. 1 illustrates the  $LWC_a~[g/kg]$  as a function of  $M_{droplet}~[\mu g]$  for each temperature bin. The LWCa is calculated based on the retrieved cloud base pressure and temperature and increases up to the cloud top (Freud et al., 2011). Assuming the droplets are spherical, the  $M_{\rm droplet}$  is calculated by the product of the droplet volume and the water density. As long as the LWC<sub>a</sub>-M<sub>droplet</sub> ratio remains linear, the adiabaticity is preserved. This means that the LWC<sub>a</sub> is divided equally between the existing cloud base  $N_{\rm d}$  without losing or gaining droplets. If this ratio is no longer linear, it can either mean (1) droplet coalescence, where  $M_{droplet}$  increases

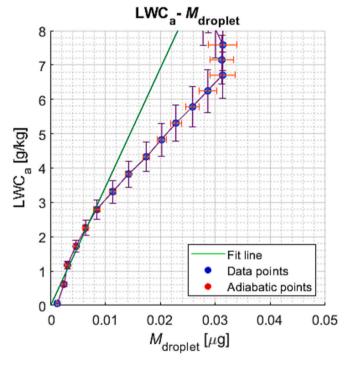


Fig. 1. Illustration of the adiabatic LWC (LWC<sub>a</sub> [g/kg]; uncertainty: 15%) over droplet mass ( $M_{\rm droplet}$  [µg] uncertainty: 8%). The data was derived from a sample satellite-retrieved case study over the Amazon ( $-2.56^{\circ}$ ,  $-59.46^{\circ}$ ) from February 26th, 2018. Each point represents the calculated LWC<sub>a</sub> and  $M_{\rm droplet}$  for each temperature bin. The LWC<sub>a</sub> is calculated based on the cloud base pressure and temperature, and the  $M_{\rm droplet}$  is based on the mean-volume radius ( $r_{\rm v}$ ), where  $r_{\rm v} = \frac{r_{\rm v}}{1.08}$  in the adiabatic part. The red points and the green fit line mark the part where the LWC<sub>a</sub>- $M_{\rm droplet}$  ratio is most linear and passes through (0,0). These are the adiabatic points by which the  $N_{\rm d}$  at the cloud base is calculated. Any deviation or noise in the defined adiabatic points may cause a bias in retrieving the cloud base  $N_{\rm d}$ . (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

beyond adiabaticity; (2) precipitation, where  $M_{\rm droplet}$  decreases due to the removal of raindrops and remaining tiny drops; or (3) activation of new cloud droplets (i.e.,  $SAZ_{\rm cond}$ ), which also decreases  $M_{\rm droplet}$ .

As mentioned above,  $N_{\rm d}$  is calculated based on the linear LWC<sub>a</sub>- $M_{\rm droplet}$  ratio. Any deviation from adiabaticity due to  $SAZ_{\rm cond}$  in the defined linear part may cause an overestimation in the retrieval of cloud base  $N_{\rm d}$ . This will be further discussed in Section 4. Another impact of  $SAZ_{\rm cond}$  is the suppression of warm rain and possible cloud invigoration. Several studies suggested, based on aircraft and satellite measurements, that warm rain formation requires a cloud with  $r_{\rm e}$  larger than 13–14 µm (Rosenfeld and Gutman, 1994; Gerber, 1996; Pinsky and Khain, 2002; VanZanten et al., 2005; Chen et al., 2008; Prabha et al., 2011; Konwar et al., 2012; Freud and Rosenfeld, 2012). The activation of tiny cloud droplets during the condensational growth inhibits the collision and coalescence processes and delays the droplets' growth into raindrops. This will be described by the model and with aircraft validations in Section 3.1 and Section 4, respectively.

This study describes and demonstrates the physical principle of secondary activation of droplets during the condensational growth of convective clouds. For this purpose, a spectral bin microphysics adiabatic parcel model was used to simulate the vertical profiles of several cloud properties for different aerosol size distribution (ASD) and w profiles. In addition, a method to detect  $SAZ_{\rm cond}$  from a satellite is presented, and the impact of  $SAZ_{\rm cond}$  on the satellite retrieval of  $N_{\rm d}$  is discussed. The simulated cloud properties are described in Section 3.1. Case studies with and without a detectable  $SAZ_{\rm cond}$  on satellite retrieved  $T-r_{\rm e}$  and a discussion on the effect on the retrieved  $N_{\rm d}$  are described in Section 3.2 and Section 4, respectively.

#### 2. Methods

The methodology in this study is similar to the methodology presented in Efraim et al. (2022), therefore we describe it here concisely with the relevant adjustments for the  $SAZ_{\rm cond}$  study.

#### 2.1. Model description

The model used here is the Pinsky and Khain (2002) spectral bin adiabatic parcel model with 2000 bins, which describes the cloud microphysical properties of convective clouds in the water phase only (temperatures warmer than  $-10\ ^{\circ}\text{C}$ ). The initial thermodynamic conditions for the simulations, including pressure, temperature, relative humidity, and height, were measured below cloud bases during flight AC07 of the ACRIDICON-CHUVA campaign (Wendisch et al., 2016). The simulations are based on modified ASD measured below cloud bases in subsaturated conditions (Braga et al., 2021; Pöhlker et al., 2021), and on aerosol supply through the cloud base. This means that entrainment is not included according to the inhomogeneous mixing assumption. However, the results in such cases are expected to be similar: a reduction of  $r_{\rm e}$  (e.g., Burnet and Brenguier, 2007; Andrejczuk et al., 2009; Devenish et al., 2012; Kumar et al., 2012; Pinsky et al., 2016). The simulated cloud properties are re, Nd, the total particle number concentration (Na), S, rainwater fraction (RWF), and prescribed updraft (w) as a function of decreasing T to match the retrieval from the satellite. The temperature (°C) is correlated with the height (m) above the cloud via the moist adiabatic lapse rate ( $\sim 6$  °C/km). In the original use of the model (Pinsky and Khain, 2002) the w profiles are calculated by the sum of the buoyancy and friction forces, according to an input sounding profile. In this study, the w profiles are prescribed to control the rate of increase of the production term of S. The w profiles represent typical values taken from measurements (Anderson et al., 2005; Giangrande et al., 2016; Braga et al., 2017; Marinescu et al., 2020).

The RWF is defined as the ratio between the rainwater content (drops with a diameter  $>50~\mu m$ ) and the total water content. It increases as coalescence starts and decreases as the raindrops precipitate from the cloud. If there is no new droplet activation, RWF increases with

decreasing T up to unity when the smallest drops grow beyond the threshold of 50  $\mu m$  in diameter. In the case of SAZ occurrence, the RWF decreases as the new small droplets delay the conversion into raindrops. Although we focus here on the condensational growth phase, the RWF is present as it is affected by the SAZ<sub>cond</sub>. Generally, clouds that completely rain out cannot develop beyond that point due to a lack of condensation and buoyancy. However, in this study, the model forces the cloud to grow beyond the point of total rainout to illustrate how secondary activation changes the T-re profile compared to the alternative that is rarely realized in nature. The T-re profile for each simulation (e.g., Fig. 2D and 3D) shows the adiabatic  $r_e$  curves under the assumption of condensational growth only for each cloud base  $N_d$  (grey lines). The adiabatic curves are calculated based on the LWCa and the corresponding development of  $r_e$  based on the cloud base temperature and pressure (Rosenfeld et al., 2016). The deviations between the actual and the adiabatic T-re profiles define the dominant microphysical zones (Efraim et al., 2022).

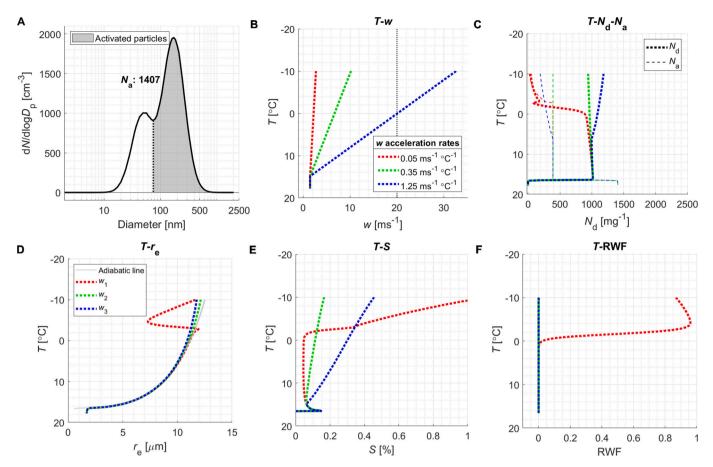
To emphasize the impact of different ASD and w profiles on the microstructure of the cloud and the SAZ, several sets of simulations were performed. The first two simulations (Fig. 2 and Fig. 3) present the impact of SAZ in general on the cloud properties, and the other ones (Fig. 4 and Fig. 5) focus on the temperature of  $SAZ_{cond}$  initiation. The first simulation (Fig. 2) uses a fixed ASD and three prescribed w profiles and the second one (Fig. 3) uses two ASD and a fixed w profile.

This thorough model describes the fundamental physical processes by simplifying environmental factors. However, it is well suited to illustrate the physical principle of  $SAZ_{\rm cond}$  and the expected behavior of such a process on the cloud properties.

#### 2.2. Satellite T-r<sub>e</sub> retrieval

The satellite retrieval case studies in Section 3.2 were obtained from the Visible Infrared Imaging Radiometer Suite (VIIRS) passive sensor onboard the Suomi National Polar-orbiting Partnership (S-NPP) satellite. This sensor has sufficient resolution to accurately resolve the vertical structure of convective clouds by retrieving its T-re profile. The wavelengths used to retrieve the T-re profile are 10.8  $\mu$ m and 3.7  $\mu$ m for T and  $r_{\rm e}$ , respectively (Rosenfeld et al., 2014b). The uncertainty values of the satellite-retrieved properties are  $T(0.2 \,^{\circ}\text{C})$ ,  $r_e(8\%)$ , and LWC<sub>a</sub> (15%) (Rosenfeld et al., 2016). The satellite retrieval method assumes ergodicity, meaning that a snapshot of the T-r<sub>e</sub> profile of a cloud cluster gives the same information as obtained by tracking a single convective system throughout its vertical evolution (Arakawa and Schubert, 1974; Lensky and Rosenfeld, 2006). In addition, assuming no precipitation is falling, the cloud top pixel is considered to have the same  $r_{\rm e}$  value as more developed clouds at the same height (Freud et al., 2008; Rosenfeld and Lensky, 1998).

Using a designated IDL software, cloud scenes of interest were manually sampled on the satellite image to minimize obstruction by multilayer or semi-transparent clouds. Then, a cloud mask algorithm (Zhu et al., 2014) filters out the partially filled cloudy pixels to reduce associated errors. The distortion caused by the satellite and the solar zenith angle is reduced by taking cloud scenes between  $30^{\circ}$  and  $-20^{\circ}$ , and below 65°, respectively. The 30th percentile for all  $r_{\rm e}$  values within each bin is calculated, resulting in a continuous T-re profile that captures the clouds in their growing phase, where the effect of aerosols is mostly reflected (Lensky and Rosenfeld, 2006; Rosenfeld et al., 2008; Rosenfeld et al., 2016). T-r<sub>e</sub> profiles obtained in different locations yield similar findings for similar environments (e.g., Lensky and Rosenfeld, 2006; Rosenfeld, 2007; Rosenfeld et al., 2008; Huang et al., 2022) implying robust, credible, and applicable worldwide method. An objective algorithm analyzes the retrieved T-re profiles and divides the cloud into different microphysical zones (Efraim et al., 2022), where the condensational growth microphysical zone is the focus of this study.



**Fig. 2.** Simulations of cloud properties for a fixed aerosol size distribution (ASD) and three prescribed updraft profiles (w). Panel A shows the bimodal ASD with a high concentration of accumulation mode particles and a lower concentration of Aitken mode particles. The total particle number concentration ( $N_a$ ) below the cloud base is 1407 cm<sup>-3</sup>. The shaded grey marks the calculated activated particles at the cloud base. Panel B shows the prescribed w profiles with a constant w speed of 1.5 ms<sup>-1</sup> up to the cloud base and then different acceleration rates, where  $w_1$  (red dashed line) has the lowest acceleration rate (0.05 ms<sup>-1</sup> °C<sup>-1</sup>) and is close to constant w with height;  $w_2$  (green dashed line) has a higher acceleration rate (0.35 ms<sup>-1</sup> °C<sup>-1</sup>); and  $w_3$  (blue dashed line) has the strongest acceleration rate (1.25 ms<sup>-1</sup> °C<sup>-1</sup>). Panels C—F show the different cloud properties, where the color of the lines is related to the same-colored w profile in each panel. Panel C shows the number concentration of cloud droplets ( $N_d$ ) and  $N_a$  profile in units of mg<sup>-1</sup> to avoid the consideration of the change of air density with height; Panel D shows the effective radius ( $r_c$ ) profile, where the grey line is the adiabatic curve, calculated based on the cloud base pressure and temperature; Panel E shows the vertical profile of supersaturation over water (S) and Panel F shows the vertical rainwater fraction (RWF) profile. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

#### 2.3. Aerosol observations at the Amazon Tall Tower Observatory

For each of the case studies described in Section 3.2, an ASD was measured at the Amazon Tall Tower Observatory (ATTO). This site is located in the Amazon Basin (2.145°S, 59.004°W at 130 m above sea level) and uses a Scanning Mobility Particle Sizer (SMPS) at 60 m height above the surface (Franco et al., 2022). In addition, this site monitors fundamental climatic and atmospheric parameters such as temperature, pressure, wind profiles, advection of air mass, relative humidity, and precipitation (Andreae et al., 2015). These parameters were used to determine the coupling state of the chosen cloud scene case studies, where the air sampled at ATTO fed the sampled clouds.

#### 3. Results

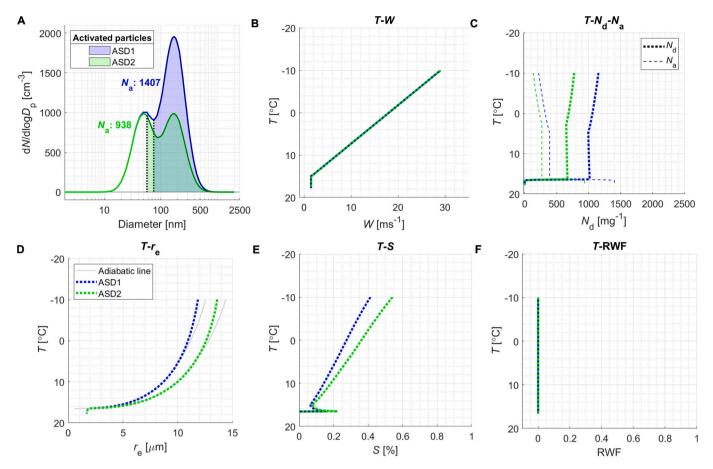
#### 3.1. Simulations of SAZ<sub>cond</sub>

This section presents the convective cloud simulations and the effect of different inputs of ASD and w profiles on the microphysical zones focusing on the existence and properties of  $SAZ_{cond}$ . The panels in each figure of the cloud properties simulations (Fig. 2 and Fig. 3) include the ASD in panel A; The w profiles in panel B; the  $N_d$  and  $N_a$  profiles in panel C; the  $r_e$  profile in panel D; the S profile in panel E; and the RWF profile

in panel F.

#### 3.1.1. Fixed ASD

The input of the first simulation includes (1) a representative bimodal ASD with a high concentration of accumulation mode particles that serve as CCN at a supersaturation of approximately 0.2% and a smaller Aitken mode particle population (e.g., Pöhlker et al., 2016, 2018; Franco et al., 2022). The total  $N_a$  is 1407 cm<sup>-3</sup> (Fig. 2A); (2) Three prescribed w profiles (Fig. 2B) with a typical initial speed of 1.5 ms<sup>-1</sup> at cloud base (Braga et al., 2017) and then different acceleration rates with height. The first w profile ( $w_1$ , red dashed line) has an acceleration rate of 0.05  $\text{ms}^{-1}\,^{\circ}\text{C}^{-1}.$  It has the lowest slope and the closest one to constant w.  $w_2$  (green dashed line) has a higher acceleration rate of 0.35 ms<sup>-1</sup> °C  $^{-1}$ , and  $w_3$  has the highest acceleration rate of 1.25 ms $^{-1}$  °C $^{-1}$  (blue dashed line). According to the T-N<sub>d</sub>-N<sub>a</sub> profile (Fig. 2C), the cloud's primary activation, consisting of the accumulation mode only (Fig. 2A), is the same for all three w profiles due to the same value at the cloud base. Under specific conditions, the remaining Aitken mode particles have the potential for later activation. After the primary activation,  $N_d$ stays nearly constant with decreasing T and only decreases slightly due to the minor coalescence process above the cloud base. This is consistent with the constant  $N_a$  concentration with decreasing T, meaning that no new activation of droplets occurs. The T-re profile (Fig. 2D) shows that,



**Fig. 3.** Simulations of cloud properties for fixed prescribed updraft (w) profile (panel B) and two different aerosol size distributions (ASD) (panel A). The w profile is the same as  $w_3$  in Fig. 2, with a constant w of 1.5 ms<sup>-1</sup> up to the cloud base and then an acceleration rate of 1.25 ms<sup>-1</sup> °C <sup>-1</sup>. The first ASD (ASD1, blue) is the same as illustrated in Fig. 2, with the same  $N_a$  of 1407 cm<sup>-3</sup>. The second ASD (ASD2, green) has the same Aitken mode as the blue one but has a lower accumulation mode. The  $N_a$  of ASD2 is 938 cm<sup>-3</sup>. Panels C—F show the different cloud properties as described in Fig. 2, except the color of the lines in this figure is related to the same-colored ASD in each panel. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

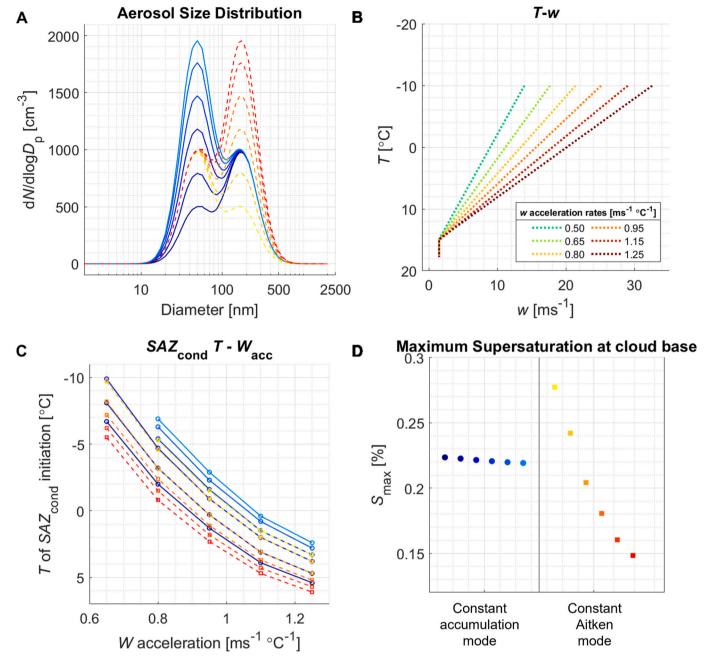
at first,  $r_e$  increases at the same rate as the adiabatic curve for the same cloud base  $N_{\rm d}$ . This means that during this phase, the dominant microphysical process is condensational growth. For the  $w_1$  case (red dashed line in Fig. 2D), the coalescence and collision processes start to dominate at  $\sim$ 0 °C and lead to rainout at that level, as shown in the *T*-RWF profile (Fig. 2F). The  $N_{\rm d}$  starts to decrease sharply at the level of rain initiation, as the coalescence merges many cloud droplets into fewer raindrops. The coalescence and rainout reduce the integrated droplet surface area available for condensation, leading to S exceeding  $S_{\max}$ . As a result, smaller particles with lower critical  $S(S_c)$  are activated as cloud droplets. This is the  $SAZ_{coal}$  as defined and shown in Efraim et al. (2022). The  $SAZ_{coal}$  is easily seen on the  $T-N_d-N_a$  profile as the increase of  $N_d$  and reduction of  $N_a$  at  $\sim -3$  °C. It is also noticeable in the T- $r_e$  profile, as the  $r_{\rm e}$  growth rate exceeds the adiabatic curve when the coalescence becomes dominant and turns negative with the activation of new droplets in the environment of coalesced ones. In nature, this could also happen due to the entrainment of particles with low  $S_c$  from the lateral boundaries of the cloud (Warner, 1973; Latham and Reed, 1977; Baker et al., 1980). For the  $w_2$  case,  $r_e$  remains adiabatic up to cloud top, and rain initiation is delayed altogether (green line in Fig. 2F). When w accelerates even faster ( $w_3$ ; blue line in Fig. 2C), the strong cooling rate causes a high enough S to exceed  $S_{\text{max}}$  and to activate new droplets even during the condensational growth, representing  $SAZ_{cond}$ . In this case,  $N_d$  starts to increase during the dominant condensational growth phase at  $\sim$ 6 °C. In the environment of the small droplets with little coalescence, the newly activated ones slow down the  $r_e$  growth rate and it becomes less than adiabatic (blue dashed line in Fig. 2D). The activation of new

droplets during the condensational growth delays the coalescence process and the initiation of the rain. As seen in the *T*-RWF profile, no rain is initiated until cloud top (blue dashed line in Fig. 2F).

Eventually, for the same ASD, the highest w acceleration causes  $SAZ_{cond}$  while the lower ones may keep the  $r_e$  adiabatic or cause  $SAZ_{coal}$ .

#### 3.1.2. Fixed w profile

The input of the second simulation includes: (1) two bimodal ASD, where ASD1 is identical to the ASD in the previous simulation (blue line in Fig. 3A), whereas ASD2 has the same concentration of Aitken particles, but a lower concentration of accumulation mode particles (green line in Fig. 3A). The  $N_a$  is 1407 cm<sup>-3</sup> for ASD1 and 938 cm<sup>-3</sup> for ASD2; (2) One prescribed w profile (Fig. 3B) identical to the  $w_3$  profile from the first simulation. The T-N<sub>d</sub>-N<sub>a</sub> profile (Fig. 3C) shows a higher concentration of activated  $N_d$  at the cloud base for the ASD1 case (blue dashed line), which has a higher concentration of accumulation mode particles. Therefore,  $S_{\text{max}}$  of the ASD1 case (blue dashed line in Fig. 3E) is smaller than the one of the ASD2 case (green dashed line). However, the cloud base  $N_{\rm d}$  is smaller than the  $N_{\rm a}$  for both cases, meaning that there are unactivated interstitial particles within the cloud parcel. After the primary activation,  $N_{\rm d}$  stays relatively constant with height, and the  $r_{\rm e}$ increases at the same rate as the idealized adiabatic curves for each cloud base  $N_{\rm d}$  (Fig. 3D), indicating that condensational growth is the dominant microphysical process. For the prescribed w profile in this simulation, SAZ<sub>cond</sub> appears for both cases, although, the temperature of SAZ<sub>cond</sub> initiation changes. With the constant increase of w and cooling rate, S exceeds the initially smaller  $S_{\max}$  for the ASD1 case at a warmer

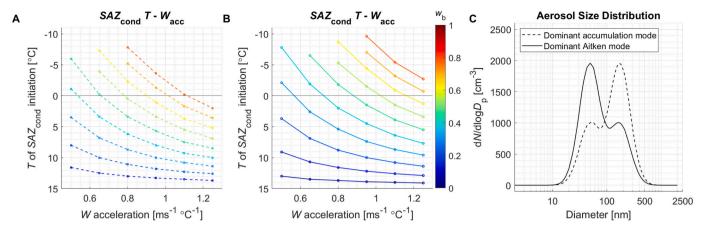


**Fig. 4.** The temperature of  $SAZ_{cond}$  initiation for various aerosol size distributions (ASD) and updraft (w) profiles. Panel A shows the different ASD, where the warm color scaled lines (red to yellow) are ASD with constant Aitken mode and various accumulation modes; and the cold color scaled lines (dark to light blue) are ASD with constant accumulation mode and various Aitken modes. Panel B shows the different w profiles, where they all have  $w_b$  of 1.5 ms<sup>-1</sup> and different acceleration rates. Panel C shows the temperature of  $SAZ_{cond}$  initiation as a function of the w acceleration rate and Panel D shows the maximum supersaturation at cloud base ( $S_{max}$ ), where in both panels each colored point or line is related to the same-colored ASD color in panel A. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

temperature, causing  $SAZ_{\rm cond}$  to occur at a lower altitude. The  $S_c$  increases as the interstitial particles' size and the air temperature decrease. Thus, a higher  $S_c$  must be reached to activate further interstitial particles in the ASD2 case. Therefore, the  $SAZ_{\rm cond}$  occurs slightly higher than the point where S exceeds  $S_{\rm max}$ . The  $r_{\rm e}$  growth rate in both cases becomes less than adiabatic, but for the lower-level  $SAZ_{\rm cond}$ , it occurs at warmer T (or lower altitude). The secondary activation of a higher concentration of particles in the ASD1 case (blue dashed line in Fig. 3D) results in the  $r_{\rm e}$  growth rate decrease to smaller values than for the ASD2 case (green dashed line). The activation of new droplets delays the coalescence process and the initiation of the rain in both cases up to the cloud top (Fig. 3F).

Eventually, for the same strong w, a case with a more prominent accumulation mode will experience  $SAZ_{\rm cond}$  in warmer temperatures and lead to smaller  $r_{\rm e}$  because of more available particles for activation with lower  $S_c$  in the rising parcel. The cloud microstructure profiles for the simulations of the  $w_1$  and  $w_2$  profiles with ASD2 are shown in the supplements (Fig. S1).

Fig. 4 summarizes the effect of various ASD and w profiles on the temperature of  $SAZ_{\rm cond}$  initiation. The input for this set of model runs includes (1) twelve ASD with various accumulation and Aitken mode sizes (Fig. 4A); and (2) six w profiles with a constant  $w_{\rm b}$  of 1.5 ms<sup>-1</sup> and different accelerations (Fig. 4B). As shown in the figure, generally, weaker w acceleration results in a colder temperature of  $SAZ_{\rm cond}$ 



**Fig. 5.** The temperature of  $SAZ_{cond}$  initiation for two different aerosol size distributions (ASD), updraft (w) profiles, and cloud base w ( $w_b$ ). Panel A shows the two ASD with dominant accumulation (dashed) or Aitken (solid) mode. Panels B and C show the temperature of  $SAZ_{cond}$  initiation as a function of the w acceleration and the  $w_b$  for each ASD. The w profiles are described in panel B of Fig. 4.

initiation, because S exceeds the cloud base S<sub>max</sub> higher in the cloud, due to lower cooling rate.

The dashed warm colored lines (yellow to red color scale) represent ASD where the Aitken mode is constant (peak at  $dN/dlogD_p = 1000$ cm<sup>-3</sup>) and the accumulation mode varies from peak at  $dN/dlogD_p = 500$ cm<sup>-3</sup> to  $dN/d\log D_p = 2000$  cm<sup>-3</sup>. In the extreme case of very high accumulation mode (darkest red),  $S_{\text{max}}$  is lowest (0.14%) (Fig. 4D) due to the activation of many of the largest particles. The needed w acceleration for  $S_{\text{max}}$  exceedance is lower compared to ASD with lower accumulation mode, where  $S_{\text{max}}$  is higher due to the activation of fewer particles (Fig. 4D). Therefore, the temperature of SAZ<sub>cond</sub> initiation is warmer. In addition, increasing the accumulation mode means more available particles with sufficient  $S_c$  for activation in the S values beyond  $S_{\text{max}}$ . On the other hand, the cold colored lines (dark to light blue color scale) represent ASD where the accumulation mode is constant (peak at  $dN/dlog D_p = 1000 \text{ cm}^{-3}$ ) and the Aitken mode varies from peak at  $dN/dlog D_p = 1000 \text{ cm}^{-3}$  $d\log D_{\rm p} = 500 \, {\rm cm}^{-3} \, {\rm to} \, {\rm d}N/{\rm d}\log D_{\rm p} = 2000 \, {\rm cm}^{-3}$ . In these cases,  $S_{\rm max}$  does not change as much compared to the constant Aitken mode cases (Fig. 4D). This is due to the activation of the whole accumulation mode at the cloud base. When the Aitken mode is higher (lighter blue), more particles are added to the accumulation mode and are activated at the cloud base, thus  $S_{\text{max}}$  slightly decreases. In cases with lower Aitken mode (darker blue), the temperature of  $SAZ_{cond}$  initiation is warmer for the same w acceleration, because there are more available particles with sufficient  $S_c$  for activation (fewer smaller ones). This occurs even though  $S_{max}$  is slightly higher in darker blue cases because there are fewer activated particles to lower the supersaturation.

In addition, there are ASD in intermediate states with either low accumulation and/or low Aitken modes, where the temperature of  $SAZ_{cond}$  initiation is a matter of how many particles are activated at the cloud base against how many activate due to the w acceleration rate.

Another factor that determines the temperature of  $SAZ_{\rm cond}$  initiation is the cloud base w ( $w_b$ ). Fig. 5 shows the temperature of  $SAZ_{\rm cond}$  initiation as a function of the w acceleration for different  $w_b$  (panels A and B). The model was run for two ASD with constant accumulation mode and high Aitken mode (solid line in Fig. 5C), and vice versa (dashed line in Fig. 5C). According to this figure, for both ASD, smaller  $w_b$  leads to warmer temperature of  $SAZ_{\rm cond}$  initiation. The  $w_b$  determines the  $N_d$  at the cloud base, thus smaller values activate lower  $N_d$ , resulting in more available particles for activation during the condensational growth phase due to the prescribed w acceleration.

#### 3.2. Detection of SAZ<sub>cond</sub> based on satellite-retrieved T-re profiles

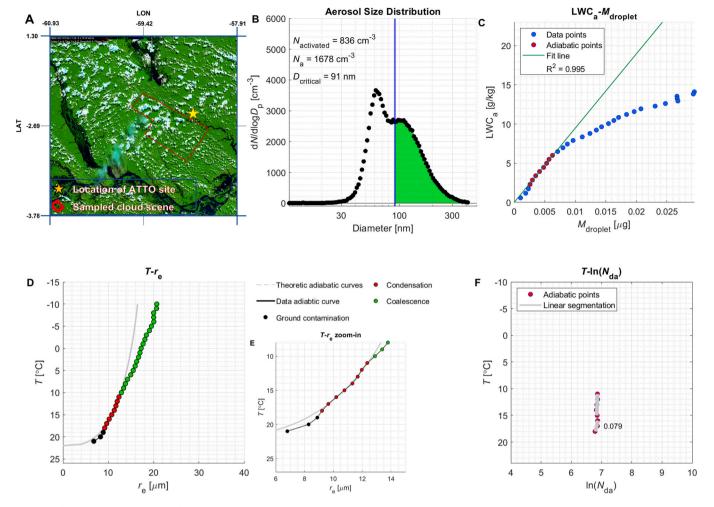
The different microphysical zones in convective clouds and the method for their detection by the T- $r_e$  profile analysis have been fully

described in Efraim et al. (2022) and also briefly in Section 1.2. However, the newly defined  $SAZ_{\rm cond}$  is less readily detected since it is a part of the defined condensational growth phase. Still, it can be identified by analyzing the small fluctuations within the condensational growth points. These small fluctuations can be either noise, due to retrieval uncertainty (Freud et al., 2011; Rosenfeld et al., 2016), in which case these points should still be defined as condensational growth; or  $SAZ_{\rm cond}$  signal, representing the appearance of smaller droplets within the condensational growth phase.

To analyze the fluctuations in the condensational growth points, we used the profile of the natural logarithm of the adiabatic  $N_{\rm d}$  with decreasing  $T(T-\ln(N_{\rm da}))$ . The value of  $\ln(N_{\rm da})$  is calculated by taking the natural logarithm of the LWC<sub>a</sub>- $M_{\rm droplet}$  ratio for each temperature bin, for the adiabatic points. Using the  $\ln(N_{\rm da})$ , instead of  $N_{\rm da}$ , emphasizes the relative change in  $N_{\rm da}$  rather than the absolute change. The  $\ln(N_{\rm da})$  was linearly segmented by the trend of the points. Ideally, the  $\ln(N_{\rm da})$  should be quite constant during the condensational growth and any increase can be either due to noise or a signal. The  $SAZ_{\rm cond}$  is identified where a significant increase of  $\ln(N_{\rm da})$  occurs.

This section presents two convective cloud scenes as case studies with and without a detected  $SAZ_{cond}$  and an application of a method to detect the  $SAZ_{cond}$  by remote sensing. Both cloud scenes were sampled over the ATTO region, where the ASD of the air feeding the clouds was measured. Even though both cases include coalescence or ice formation, we focus on the adiabatic non-precipitating part only. Each case study (Fig. 6 and Fig. 7) presents the satellite overpass image in panel A, the 1-h average ASD of the feeding air before the satellite overpass in panel B, the LWC<sub>a</sub>- $M_{droplet}$  ratio in panel C, the T- $T_e$  profile in panel D and E, and the T-ln( $N_{da}$ ) profile in panel F.

Cloud scene A is an example of a case without  $SAZ_{cond}$ . The cloud scene is marked by a red polygon on a Day Natural color scheme satellite image (Lensky and Rosenfeld, 2008). In this case, a cluster of cumulus congestus clouds was taken within  $\sim\!25$  km of the ATTO site. The satellite overpass was on the 6th of July 2017 at 17:40 UTC. The adiabatic points are marked in red on the LWC<sub>a</sub>-M<sub>droplet</sub> profile (Fig. 6C). These points have the best linear fit with the origin ( $R^2 = 0.995$ ), thus they define the condensational growth phase. The  $N_d$  at the cloud base is then determined by the linear ratio of LWC<sub>a</sub>- $M_{droplet}$ . The grey line on the T- $r_{\rm e}$ profile (Fig. 6D and E) is the adiabatic curve calculated by the cloud base temperature and pressure for the specific retrieved N<sub>d</sub>. The defined condensational growth points (red points) agree with the adiabatic curve until the coalescence begins and exceeds adiabaticity (Fig. 6D and E). The adiabatic T-ln( $N_{da}$ ) profile (Fig. 6F) shows a slight increase of 0.079 in the  $ln(N_{da})$  for the adiabatic points. To determine whether it is noise or signal we examine the ASD. The calculated  $N_d$  based on the linear LWC<sub>a</sub>- $M_{droplet}$  ratio is 836 cm<sup>-3</sup>. The 1-h average ASD (Fig. 6B)

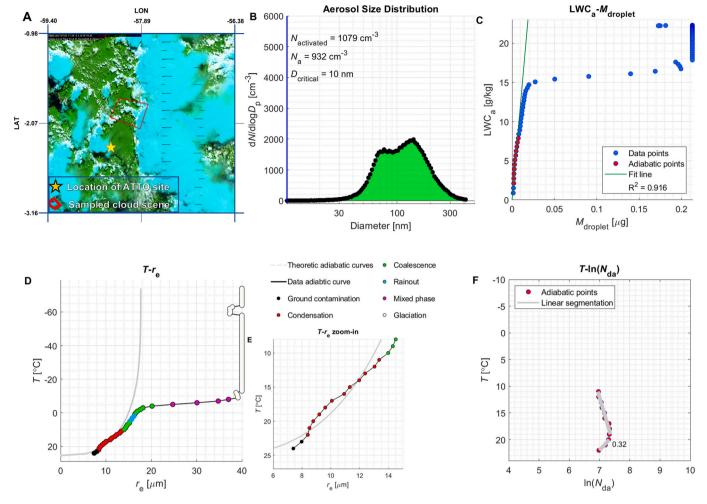


**Fig. 6.** Satellite-retrieved cloud microphysical profiles in the ATTO region without indications for secondary droplet activation during the condensational growth phase ( $SAZ_{cond}$ ). Panel A shows the Day Natural color scheme satellite image with the ATTO site marked as the star and the sampled cloud scene shown as a red polygon (Cloud scene A). Panel B shows the 1-h average ASD at ATTO before the satellite overpass, with the particle fraction activated as cloud droplets being shown as green shading under the curve. Panel C shows the LWC<sub>a</sub>- $M_{droplet}$  ratio where the red points are defined as the adiabatic ones, with the best fit with the origin ( $R^2 = 0.995$ ). The adiabatic points are marked as the condensational growth points on the T- $r_e$  profile (red points in Panel D). The grey line in the same panel is the calculated adiabatic curve for the specific retrieved  $N_d$ . Panel E shows an enhanced T- $r_e$  profile focused on the adiabatic part. The T- $\ln(N_{da})$  profile (Panel F) shows only the adiabatic points (red points in Panel D) and the trend lines with decreasing T. The value in Panel F (0.079) is the slope of the positive trend line. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

has a well-defined Hoppel minimum at 85 nm. The Hoppel minimum is a size separation gap between two size modes, which usually indicates the size of the smallest particles that can serve as CCN for the given thermodynamic conditions due to cloud processing (Hoppel and Frick, 1986; Hudson et al., 2015). Summing the  $N_{\rm d}$  largest particles on the ASD in Fig. 6B (green shading) yields the smallest diameter to be activated, i.e., the critical diameter, since the larger particles are activated first. In this case, the critical diameter is 91 nm. This suggests that the activated particles at the cloud base are accumulation mode particles down to that threshold. The good agreement of the retrieved  $N_{\rm d}$  with the concentration of the accumulation mode particles implies that the fluctuations in the condensational points are likely to be noise and the case is without  $SAZ_{\rm cond}$ . That is because no significant overestimation of  $N_{\rm d}$  was found, as opposed to the next presented Cloud scene B.

As opposed to the previous case study, Cloud scene B (red polygon in Fig. 7A) is an example of a case with a possible  $SAZ_{\rm cond}$ . The sampled cloud is a developed cumulonimbus  $\sim$ 70 km from ATTO. The satellite overpass was on the 1st of July 2017 at 17:30 UTC. The 1-h average ASD for Cloud scene B (Fig. 7B) has a well-defined Hoppel minimum at 91 nm and  $N_{\rm a}$  of 932 cm $^{-3}$ . The LWC<sub>a</sub>- $M_{\rm droplet}$  ratio profile (Fig. 7C) defined the adiabatic points (red points) with a linear fit of R $^2$  = 0.916. These points

are also in good agreement with the adiabatic curve on the T-r<sub>e</sub> profile (Fig. 7D and E). However, the adiabatic T-ln( $N_{da}$ ) (Fig. 7F) shows a larger increase in  $ln(N_{da})$  of 0.32, compared to Cloud scene A (0.079). This suggests larger fluctuations in the adiabatic points. The calculated  $N_{\rm d}$  based on the linear LWC<sub>a</sub>- $M_{\rm droplet}$  ratio is 1211 cm<sup>-3</sup>, actually exceeding the accumulation mode particles that usually relate to primary activation, let alone the total  $N_a$  measured at ATTO. Even with allowing for possible differences in aerosol concentrations between ATTO and the location of the cloud as well as a potential overestimation of the retrieved  $N_d$ , this would imply that more particles were activated than the supplied ones. Therefore, the fluctuations in the adiabatic points, in this case, are implied to be a signal of potential activation of extra cloud droplets during the condensational growth which leads to a bias in the calculated adiabatic N<sub>d</sub>. Presumably, if there was no SAZ<sub>cond</sub> steepening the adiabatic line, it would be less vertical, resulting in a lower  $N_{\rm d}$ . The tendency of the line towards a higher slope, due to the appearance of small droplets in the overall condensational growth phase, as well as the result biased  $N_d$ , indicates the likelihood of a potential SAZ<sub>cond</sub>. This is distinct from noise or retrieval bias, which would shift the entire profile while maintaining the same slope. This will be further discussed in the next section.



**Fig. 7.** Satellite-retrieved cloud microphysical profiles in the ATTO region with indications for secondary droplet activation during the condensational growth phase ( $SAZ_{cond}$ ). Panels A-F have similar descriptions as in Fig. 6. However, the adiabatic points in panel C have  $R^2$  of 0.916 and the value of the slope of the positive trend line in panel F is 0.32.

#### 4. Discussion

The SAZ during condensational growth ( $SAZ_{cond}$ ) may be detectable in the T- $r_e$  profile as a slowdown of the  $r_e$  growth rate to less than the adiabatic one during the condensational growth phase, as shown in Cloud scene B in the previous section. It was also described by the model, in Section 3.1, where the  $r_e$  growth rate was reduced below the adiabatic values in cases of droplet activation during condensational growth (blue line in Fig. 2D and blue and green lines in Fig. 3D). This can occur due to an increase in w or at the same w, for different ASD. In nature, the  $SAZ_{cond}$  can occur also due to the entrainment of particles with low  $S_c$ , which can be activated at the existing S during the dominant condensational growth. However, both mechanisms result in the reduction of  $r_e$ . As seen in Cloud scene B,  $SAZ_{cond}$  may cause an overestimation of the satellite-retrieved  $N_d$ .

As mentioned in Sections 1.1 and 1.3, the adiabatic cloud base  $N_{\rm d}$  can be approximated by the ratio of adiabatic LWC (LWC<sub>a</sub>) to the mass of a single droplet ( $M_{\rm droplet}$ ), where  $M_{\rm droplet}$  is calculated based on the meanvolume radius ( $r_{\rm v}$ ) where  $r_{\rm v} = \frac{r_{\rm v}}{1.08}$  in an adiabatic process (Freud et al., 2011). Additional droplet activation reduces the drop size for the same LWC<sub>a</sub>, thus drop growth rate becomes less than adiabatic. This results in a calculated  $N_{\rm d}$  above the adiabatic  $N_{\rm d}$  at the cloud base. Another way to look at it is by observing the slope of the LWC<sub>a</sub>- $M_{\rm droplet}$  ratio, which is essentially the adiabatic  $N_{\rm d}$ . Adding small droplets in the adiabatic part due to  $SAZ_{\rm cond}$  will lower the  $M_{\rm droplet}$  and increase the adiabatic  $N_{\rm d}$  to above the original value at the cloud base. The explicit formulas for the

calculation of  $r_e$  and  $r_v$  are:

$$r_e = \frac{\int N(r)r^3 dr}{\int N(r)r^2 dr} \tag{1}$$

$$r_{v} = \left(\frac{3 \bullet LWC}{4\pi\rho N}\right)^{\frac{1}{3}} \tag{2}$$

Where *N* and *r* are the droplet concentration and radii, respectively, and  $\rho_w$  is the density of water (Freud and Rosenfeld, 2012). Adding N droplets with a small r above the cloud base due to  $SAZ_{cond}$  would not reduce the  $r_e$  as much as it would reduce  $r_v$ , assuming unchanged LWC<sub>a</sub>. Therefore, the retrieved  $N_d$  under the assumption that all droplets were activated at the cloud base would give a larger  $N_d$  compared to the actual N<sub>d</sub> at the cloud base and might even exceed the total CCN as shown in Cloud scene B. Another reason that might cause an overestimation of the retrieved  $N_{\rm d}$  is the use of more adiabatic points with less certainty. Supposedly, taking only the first point on the adiabatic curve would suffice in the calculation of N<sub>d</sub>, since it already gives the ratio of LWC<sub>a</sub> to  $M_{\text{droplet}}$ . However, for the calculation of  $N_{\text{d}}$ , it is important to identify the whole adiabatic part of the T-re to avoid any biases due to surface contamination (Rosenfeld et al., 2016; Yue et al., 2019; Efraim et al., 2022). To reduce this uncertainty, the algorithm does not rely merely on the first point but rather includes more points above, as long as they are in good fit with the adiabatic curve. If these points include fluctuations due to  $SAZ_{\rm cond}$ , the LWC<sub>a</sub>- $M_{\rm droplet}$  ratio would be larger, hence a larger  $N_{\rm d}$ .

An additional impact of the  $SAZ_{\rm cond}$ , as shown by the model, is the suppression of warm rain. This was also observed by in-situ measurements of T- $r_{\rm e}$  profiles from cloud probes in several flights during the ACRIDICON–CHUVA campaign (Wendisch et al., 2016), which showed that the measured  $N_{\rm d}$  was larger above the cloud base than at the cloud base (Braga et al., 2017). During flights AC08, AC12, and AC20 strong w (up to 15 ms $^{-1}$ ) was measured above the cloud base. The strong w increased S and allowed for more CCN activation. The measured profiles of  $r_{\rm e}$  were smaller than the estimated adiabatic  $r_{\rm e}$  profile and its values were smaller than 13  $\mu$ m, indicating the suppression of raindrop formation. Measured droplet size distribution from the cloud probe on the aircraft validated that indeed no raindrops were observed during these flights. Instead, ice particles were formed above the 0 °C isotherm (Braga et al., 2017) where the cloud could reach due to the suppression of the warm rain.

As described in Section 3.2, the minor fluctuation of the condensational growth can result from either noise (e.g., Cloud scene A) or an actual signal of  $SAZ_{\rm cond}$  (e.g., Cloud scene B). However, it can be argued that the supposed  $SAZ_{\rm cond}$  is merely due to deviation from adiabaticity because of mixing that changes the 1.08 ratio or a matter of satellite retrieval uncertainties, such as the  $r_{\rm e}$ .

Regarding the deviation from the adiabaticity argument, we rely on the strong assumption of inhomogeneous mixing in convective clouds (references in Section 1.1), thus the cloud  $r_{\rm e}$  is considered to be adiabatic. Moreover, we rely on representative atmospheric measurements from ATTO that show no abnormality in the relative humidity, precipitation, or air temperature near the satellite overpass time. This suggests that there is no evidence of the mixing of a different kind of air parcel into the cloud

As for the uncertainty in the  $r_e$  retrieval, it can be attributed to three main factors: (1) 3D effects, (2) pixel inhomogeneity, (3) and distortion due to large backscatter angles. 3D effects, such as illuminating and shadowing, can lead to a significant  $r_e$  bias (Marshak and Davis, 2005; Davis and Marshak, 2010; Marshak et al., 2006; Zhang et al., 2012). However, the accuracy of retrieved  $r_{\rm e}$  from MODIS (Moderate Resolution Imaging Spectroradiometer) satellite sensor was found to be the best at the 3.7 µm channel in non-precipitating clouds (King et al., 2013; Rosenfeld et al., 2016), because the 3D effects tend to have the lowest impact in this wavelength. This is due to the largest absorption and shortest mean free path of the photons (Zhang et al., 2012). Therefore, the use of this channel leads to minimal effect by cloud inhomogeneities and 3D effects (Rosenfeld et al., 2004; Zhang and Platnick, 2011; Grosvenor and Wood, 2014). The VIIRS detector used in this study, which has a much finer resolution than MODIS (Rosenfeld et al., 2014a, 2014b; Yue et al., 2019), further reduces the uncertainty related to the first two reasons mentioned above.

The distortion due to the backscattering angle is solved by applying the retrieval restrictions mentioned in Section 2.2. However, by using observations in the cloud scale, this bias would only cause a shift in the whole  $r_{\rm e}$  profile. In this study, we focus mainly on the trend and not the absolute values of  $r_{\rm e}$ , so even with shifting of the  $r_{\rm e}$  profile the trend is preserved. Therefore, the importance of the  $r_{\rm e}$  uncertainty in that manner is reduced, considering the similar satellite-retrieved and modeled  $r_{\rm e}$  behavior at the scale of the same cloud.

Nevertheless, this uncertainty should not be neglected. Based on initial statistical analysis, a threshold value of approximately 0.2 for ln (Nda) was established to distinguish between noise and signal. However, this threshold should be strengthened by incorporating more observational data.

Here we simply outline the underlying physical principle and present a case study with a potential  $SAZ_{\rm cond}$ . Further statistical results along with validations of measured ASD below the clouds necessitate additional research.

#### 5. Conclusions

Aerosol particles can be activated into cloud droplets in convective clouds above the cloud base. The microphysical zone in the cloud where it occurs is referred to as the secondary activation zone (SAZ). The detection of SAZ based on T-re profiles allows the identification of a significant occurrence of new droplet activation above the cloud base, either after the dominant coalescence of droplets (SAZ<sub>coal</sub>) or during the dominant condensational growth of the cloud droplets ( $SAZ_{cond}$ ). While the properties of SAZ<sub>coal</sub> were discussed in Efraim et al. (2022), the physical principle and the causes for  $SAZ_{cond}$  are presented in this study. A spectral-bin adiabatic parcel model was used to describe the effect of updraft (w) and different aerosol size distributions (ASD) on the existence and properties of SAZ<sub>cond</sub>. The simulations showed that a stronger increase of w with decreasing T results in the change from unperturbed dominant condensational growth to the occurrence of SAZ<sub>cond</sub> when a high-accelerated w increases S to the extent that it exceeds the maximum supersaturation simulated at the cloud base ( $S_{max}$ ). This matches the results presented by Pinsky et al. (2012). The simulations also showed that, for the same w profile, a more polluted case with higher CCN concentrations and resulting lower  $S_{\text{max}}$  would lead to a  $SAZ_{\text{cond}}$  starting at lower cloud depths and with more significant activation of interstitial particles into cloud droplets. A method to detect SAZ<sub>cond</sub> from T-r<sub>e</sub> profiles measured by satellite was demonstrated using two case studies. One in which SAZcond was observed and another where it was not identified. We found that the existence of SAZcond may cause an overestimation of the satellite retrieved  $N_{\rm d}$  due to: (a) the smaller  $r_{\rm e}$  after SAZ<sub>cond</sub> for the same amount of LWC<sub>a</sub>, (b) the deviation from the assumption that all droplets were activated at cloud base, (c) the reduction of adiabaticity, and (d) the consideration of more adiabatic points with less certainty. In addition,  $SAZ_{cond}$  leads to a warm rain suppression and possible invigoration of the cloud by the released latent heat from ice nucleation above the 0  $^{\circ}$ C isotherm. The occurrence of SAZ has climatic importance by shaping the deep convective cloud microstructure with possible consequences for cloud radiative forcing. The ability to detect both SAZcond and SAZcoal signatures from satellites allows a detailed analysis of convective cloud microphysics in large areas and over long periods. Further investigations and validations of these signatures in convective clouds will improve our understanding of their role in aerosol-cloud interactions.

#### Disclaimer

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Avichay Efraim: Conceptualization, Formal analysis, Investigation,

Methodology, Resources, Software, Visualization, Writing – original draft, Writing – review & editing. Ramon C. Braga: Conceptualization, Methodology, Resources, Writing – review & editing. Daniel Rosenfeld: Conceptualization, Methodology, Supervision, Writing – original draft. Oliver Lauer: Conceptualization, Formal analysis, Investigation, Methodology, Resources, Software, Writing – review & editing. Marco A. Franco: Methodology, Resources, Writing – review & editing. Leslie A. Kremper: Methodology, Resources, Writing – review & editing. Christopher Pöhlker: Writing – review & editing. Meinrat O. Andreae: Writing – review & editing. Cléo Q. Dias-Junior: Writing – review & editing. Mira L. Pöhlker: Conceptualization, Resources, Supervision, Writing – review & editing.

#### **Declaration of Competing Interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

#### Data availability

The satellite data of the case studies presented in this study is available on the VIIRS dataset found at the NOAA's Comprehensive Large Array-data Stewardship System [https://www.avl.class.noaa.gov/]. The ATTO data used in this study are available via the ATTO data portal at https://www.attoproject.org/. The output data from the IDL program of the sampled cloud scenes have been deposited in supplementary data files for use in follow-up studies [doi: https://doi.org/10.5061/dryad. h44j0zpnr]. For data requests beyond the available data, please refer to the corresponding author.

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#### Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.atmosres.2023.107196.

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