



# Article Effects of Aerosol Number Concentration and Updraft Velocity on Relative Dispersion during the Collision–Coalescence Growth Stage of Warm Clouds

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**Abstract:** Relative dispersion ( $\varepsilon$ ) is a key expression used to parameterize various cloud processes in global circulation models (GCMs) and meteorological mesoscale models. Aerosols, updraft velocity (*w*), and different growth stages of warm clouds are known to affect relative dispersion. A two-dimensional detailed bin microphysical cloud model is used to investigate the combined impacts of aerosol number concentration  $(N_q)$  and updraft velocity on relative dispersion in the collision–coalescence stage. In addition, the causes potentially controlling the changes in  $\varepsilon$  with updraft velocity are explored. There are three main influence regimes: the updraft velocity main influence regime, the aerosol main influence regime, and the joint influence regime. The cause of the variations in  $\varepsilon$  with updraft velocity is found to be different in the three main influence regimes. In the updraft velocity main influence regime, vigorous collision–coalescence due to stronger w results in a shift in the cloud droplet number concentration spectrum toward larger droplets, and the average cloud droplet radius increases, but the spectral width is less variable, so  $\varepsilon$  decreases. In the joint influence regime, stronger cloud droplet evaporation due to the stronger dragging effect of large cloud droplets widens the spectrum, mainly by reducing the cloud droplet number concentration ( $N_c$ ) of 4–30 µm, and  $\varepsilon$  increases with the reduction in w. In the aerosol main influence regime, the strongest dragging effect reduces  $N_c$  at all radii with decreasing w, and the cloud droplet number concentration spectrum (CDNCS) narrows, which becomes the formation mechanism of the positive correlation between  $\varepsilon$  and w. Evaporation mainly causes a negative correlation between  $\varepsilon$  and  $N_c$ , but weak evaporation causes the correlation to become positive under the background of high aerosol concentration. At low aerosol concentrations, a strong collision-coalescence effect leads to a negative correlation between  $N_{c}$  and  $\varepsilon$ , but at high aerosol concentrations, the correlation is the opposite due to a weak collision-coalescence effect.

Keywords: relative dispersion; aerosol; updraft velocity; collision-coalescence

# 1. Introduction

Aerosols affect cloud albedo and lifetime, which are referred to as the first and second aerosol indirect effects [1]. The cloud number concentration effect [2] and dispersion effect [3] are included in the first aerosol indirect effect. Atmospheric observations suggest that the first aerosol–cloud indirect effect can be enhanced or suppressed by the dispersion effect [4–12].

Relative dispersion, defined as the ratio of the standard deviation ( $\sigma$ ) to the mean radius ( $r_c$ ) of cloud droplets, is an important parameter for studying the dispersion effect [3].



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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Some previous studies assumed that  $\varepsilon$  was a constant and focused mainly on the effects of the liquid water content (*LWC*) and  $N_c$ . Consequently, the effects of  $\varepsilon$  were largely ignored when quantifying the first indirect effects of aerosols [1,13]. However, recent studies have shown that  $\varepsilon$  has a major impact on the assessment of the first indirect effects of aerosols [6,9,14–17]. Changes in  $N_a$  can affect  $\varepsilon$  and are referred to as aerosol dispersion effects or spectral effects [11]. Wang [15] found that  $\varepsilon$  first increases and then decreases with an increase in  $N_a$ , which provides observational evidence for numerical simulations in the recent literature. Ghan et al. [16] suggested that nearly half of the aerosol indirect radiative forces were caused by changes in the cloud droplet size distribution. Peng and Lohmann [9] found that an increase in  $N_a$  can potentially lead to changes in  $\varepsilon$ . Liu and Daum [6] analyzed measurements of marine clouds under clean and polluted conditions and pointed out that the increase in  $N_c$  and  $\varepsilon$  due to an increase in  $N_a$  can offset the Twomey effect by 10–80%. Therefore, it is necessary to provide detailed descriptions of the dispersion effects to obtain cloud albedo accurately and evaluate the indirect climatic effects more precisely.

Many studies have indicated that additional factors affect  $\varepsilon$ , including aerosols [18,19], vertical velocities and entrainment effects [8,17,19–23], and various microphysical processes [24,25]. Liu et al. [22] found that  $\varepsilon$  was negatively correlated with w. It was observed that  $\varepsilon$  became larger in weak updraft or downdraft zones (*w* less than or equal to 2 m/s) due to strong evaporation effects and became smaller in strong rising air regimes, where condensation effects are dominant [23]. Lu and Seinfeld [24] stated that  $N_c$  decreased but  $\varepsilon$ increased during collision-coalescence processes and that collision-coalescence processes were enhanced when aerosol concentrations were low. Chen et al. [19] explored the effects of w and  $N_a$  on  $\varepsilon$  during warm cloud nucleation and condensation processes and found that  $\varepsilon$  showed different characteristics in different configurations of aerosol and updraft velocity. Chandrakar et al. [20] identified  $\varepsilon$  independent of  $N_c$  for a non-precipitating cloud in a controlled laboratory environment by creating a turbulent cloud. Kumar et al. [17] investigated the effect of entrainment and turbulent mixing on cloud microphysics using direct numerical simulations of turbulent mixing followed by droplet evaporation at the cloud–clear air interface in a meter-sized volume using an ensemble of up to almost half a billion individual cloud droplets. The shape of the droplet size distribution varied significantly with the spatial scale. Enhancement of  $\varepsilon$  during the transient mixing process is strongly dependent on the scale of the mixing. Using the digital in-line holography technique, Desai et al. [25] obtained variations in  $N_c$  and droplet diameter in marine boundary layer clouds. They considered stochastic condensation to be one of the mechanisms causing the broadening of the CDNCS and breaking in the bottleneck of droplet growth that are attributable to diffusion and collision-coalescence. Stochastic condensation can result in increasing  $\varepsilon$  and droplet diameters with decreasing  $N_c$ .

Based on the current state of research, the effects of the joint dependence of aerosol and updraft velocity on  $\varepsilon$  have not been explored in warm clouds using a bin model including detailed microphysics processes. Therefore, we accurately performed such research by changing *Na* based on a bin cloud model considering condensation and evaporation and collision–coalescence microphysical processes to obtain the characteristics and formation mechanism of  $\varepsilon$  and provide background support for the assessment of aerosol indirect climate effects.

### 2. Description of the Model and Simulation Setup

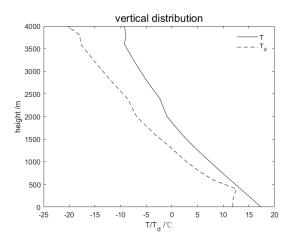
#### 2.1. The Model Description

A two-dimensional axis symmetrical nonhydrostatic cloud model developed by Tel Aviv University in Israel was used in this study [26]. The model used a vorticity equation and fluid function to solve the radial and vertical wind calculations, and the mass and number concentrations (e.g., for water droplets, ice, snow, and graupel), potential temperature levels, and *CCN* concentrations were successfully predicted. The microphysical processes of warm clouds include activation, condensation, evaporation, collision–coalescence, breakup, and sedimentation mechanisms. Each hydrometeor was divided into 34 bins, with the

second bin having twice the mass of the first, and so on. The aerosol number concentration size distributions were divided into 57 bins, and the minimum was set to  $0.0041 \mu m$ .

# 2.2. Model Initialization

The domain was 10 km in the radial direction and 4 km in the vertical direction. The grid size was 200 m. The dynamic time step was 5 s, and the total duration was set to 60 min. The outputs are from the 10th minute, and the interval was two minutes. The sounding profile was obtained from the previous literature (Figure 1) [27]. The temperature perturbation was set at 2 °C.



**Figure 1.** Temperature (T) and dew point temperature (T<sub>d</sub>) as the simulation input.

# 2.3. Experimental Schemes Design

The average aerosol number concentration size distribution obtained in 2011 (Figure 2) [28] was used in the control experiment. The total number concentration was 2790 cm<sup>-3</sup> (exp3). Then, with the shape of the spectrum unchanged,  $N_a$  in each bin of the other schemes was obtained by multiplying  $N_a$  of each bin in exp3 by a certain number of times (0.1 to 3.5). Eighteen experimental schemes were presented to explore the dependence of  $\varepsilon$  or  $N_c$  on w and  $N_a$ , and the distribution of w with height and time derived from the results of the eighteen simulations. Exp1, exp2, exp3, and exp4 were used to analyze the characteristics of the cloud droplet number concentration size distribution with changes in  $N_a$ . These were designed as follows:

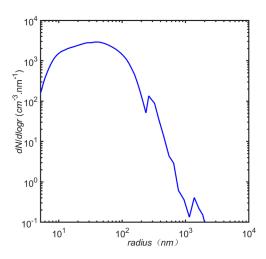


Figure 2. Initial aerosol number concentration size distribution (relative humidity < 60%).

Exp1:  $N_a$  in each bin is one-tenth of exp3;

Exp2:  $N_a$  in each bin is one-half of exp3;

Exp3: control experiment based on observations;

Exp4:  $N_a$  in each bin is two times that in exp3.

Exp1 and exp2 represent low  $N_a$  backgrounds, and exp3 and exp4 represent high  $N_a$  backgrounds. The simulations for the 18 schemes were analyzed in detail.

# 3. Results and Discussion

# 3.1. Selection of the Domain and the Time Division of Growth Stages

To avoid entrainment and mixing influences, the region of strong updraft in the center of the clouds must be taken as the research domain. In this study, the spatial distributions of the wind fields correspond to the aforementioned aerosol schemes, as illustrated in Figure 3. The wind fields are represented by wind vectors (the black arrows). For example, in the same aerosol scheme, the maximum values of *w* first increases and then decreases with time. It is more than 3 m/s at the 18th minute, more than 7 m/s at the 30th minute, and more than 1 m/s at the 38th minute. The heights corresponding to the maximum values of *w* increase with time. For example, the height is below 2 km in the 18th minute but above 2 km in the 30th minute. The domain field is within the radial distance of 0.2 km, where the strong center of *w* is located.

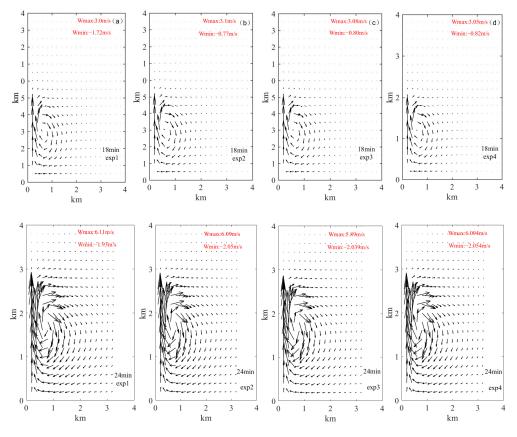


Figure 3. Cont.

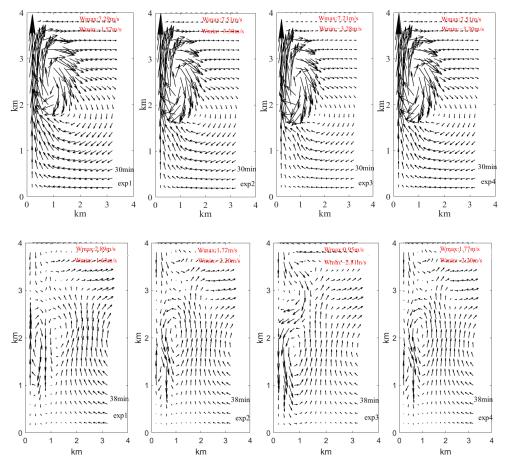
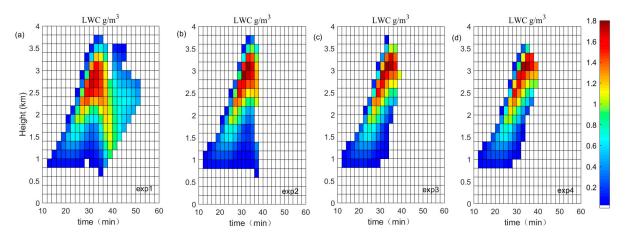


Figure 3. The wind fields for the different schemes for (a) exp1, (b) exp2, (c) exp3, and (d) exp4.

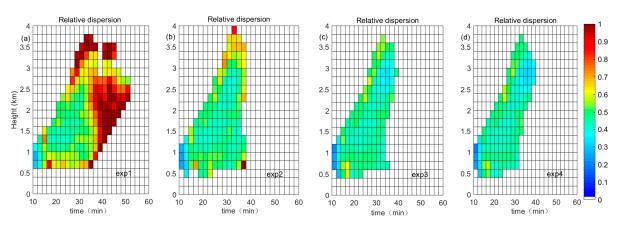
Tas et al. [10] suggested that  $dlnLWC/dt \ge 0$  at a certain height indicates the condensation growth stage, whereas dlnLWC/dt < 0 indicates the collision–coalescence stage. Based on this method, the condensation growth stage and collision–coalescence growth stage were obtained using the distributions of *LWC* with height and time in the stronger *w* regions (Figure 4).



**Figure 4.** The distribution of LWC with height and time in the domain field: (**a**) exp1, (**b**) exp2, (**c**) exp3, and (**d**) exp4.

# 3.2. Temporal Changes in Cloud Microphysics

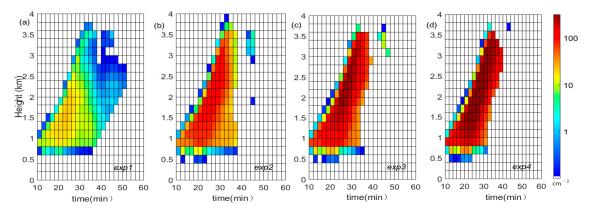
This study also investigated changes in  $\varepsilon$  with height and time. The results are presented in Figure 5. When the time is constant,  $\varepsilon$  first decreases and then increases with



height. The maxima of  $\varepsilon$  are at the top and bottom of the cloud, whereas the values in the central regions are smaller. Moreover,  $\varepsilon$  obviously decreases with an increase in *Na*. For example, the average value of  $\varepsilon$  in exp1 is 0.69 but is 0.43 in exp4.

**Figure 5.** Temporal and height distributions of  $\varepsilon$  in the domain field for (**a**) exp1, (**b**) exp2, (**c**) exp3, and (**d**) exp4.

Figure 6 illustrates the variations in  $N_c$  with time and height. When w is large,  $N_c$  is more abundant. At the same height,  $N_c$  tends to decrease with an increase in time due to collision–coalescence growth. High aerosol concentrations result in increases in  $N_c$ , decreases in  $\varepsilon$ , and reductions in  $r_c$ , which makes the *CDNCS* narrow.



**Figure 6.** Distributions of  $N_c$  in the domain field for (a) exp1, (b) exp2, (c) exp3, and (d) exp4.

#### 3.3. Joint Effects of Updraft Velocity and Aerosol Loadings on Relative Dispersion

Figure 7 shows the dependence of  $\varepsilon$  on w and  $N_a$  during the collision–coalescence stage. When  $N_a$  is fixed,  $\varepsilon$  increases slowly and then decreases rapidly with increasing w. In addition, in the regime where w is smaller than 1.5 m/s,  $\varepsilon$  mainly decreases with increasing  $N_a$ , but it changes slowly or remains unchanged with changing w. Therefore, this regime is the aerosol main influence regime. Furthermore, where w is greater than 3 m/s,  $\varepsilon$  decreases slowly with  $N_a$  but decreases strongly with increasing w, so this regime is the w main influence regime. When w is between 1.5 m/s and 3 m/s,  $\varepsilon$  also decreases with w, but first increases and then decreases with  $N_a$ , so this regime is the joint influence regime.

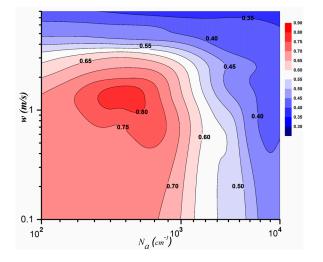
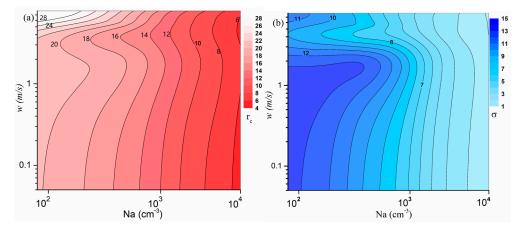


Figure 7. Joint dependence of aerosol number concentration and updraft velocity on relative dispersion.

In the aerosol main influence regime (w < 1.5 m/s), the characteristics of  $\varepsilon$  with w vary with  $N_a$ . For example, when  $N_a < 2000/\text{cm}^3$ ,  $\varepsilon$  increases slowly, but  $\sigma$  and  $r_c$  increase obviously, with increasing w (Figure 8a,b). Therefore, under this condition, the  $r_c$  of cloud droplets is the main factor affecting the change in  $\varepsilon$  with increasing w. However, in the case of 2000/cm<sup>3</sup> <  $N_a < 4000/\text{cm}^3$ ,  $\varepsilon$  does not change with w because of equivalent contributions from  $r_c$  and  $\sigma$  (Figure 8). In addition, when  $N_a > 4000/\text{cm}^3$ ,  $\varepsilon$  decreases only slightly with w, and the main reason is the increasing  $r_c$  with increasing w (Figure 8a,b).



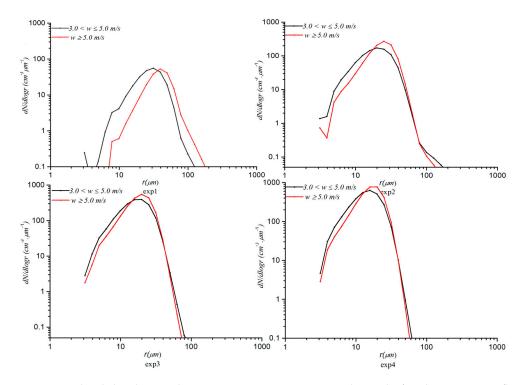
**Figure 8.** Joint dependence of aerosol number concentration and updraft velocity on the (**a**) average cloud droplet radius ( $\mu$ m, shading) and (**b**) standard deviation ( $\mu$ m, shading).

In the aerosol main influence regime and the joint influence regime, when w is constant,  $\varepsilon$  first increases significantly and then decreases with an increase in aerosol loadings. In the next section, we further explain these phenomena in combination with the characteristics of the *CDNCS* with  $N_a$ .

## 3.4. Variation in Relative Dispersion with Updraft Velocity and Aerosol Number Concentration

To investigate the reasons for the characteristics of  $\varepsilon$  with w and  $N_a$  in more detail, *CDNCSs* under the different aerosol schemes and the influence regimes are examined (Figures 9–11). In the main influence regime of w ( $w \ge 3$  m/s), w is in the early stage and at a lower height (Figure 12), and there is an inverse correlation between  $\varepsilon$  and w (Figure 7). In this regime, the larger cloud droplets are formed for vigorous collision–coalescence because  $r_c$  increases with the increase in w, which to some extent indicates that w has a promoting effect on collision–coalescence growth [29,30]. For each aerosol scheme, there is an obvious broadening in the *CDNCS* toward larger droplets with increasing w (Figure 9).

This finding is consistent with conclusions reported in the literature [30]. By comparison, we find that  $r_c$  is obviously larger at higher w than at lower w, but there are discernible differences in  $\sigma$  (Figure 8a,b). The slower increase in  $r_c$  with  $N_a$  is the reason for the less obvious characteristics of the decrease in  $\varepsilon$  with increasing w when the aerosol loadings are higher (Figure 9).



**Figure 9.** Cloud droplet number concentration spectrum in the updraft velocity main influence regime.

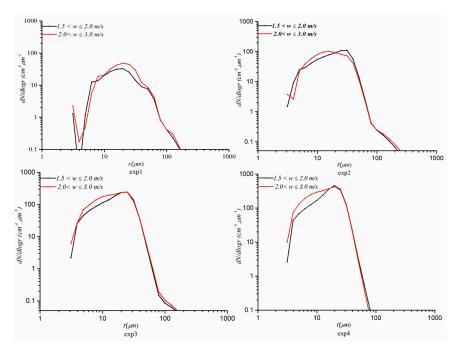


Figure 10. Cloud droplet number concentration spectrum in the joint influence regime.

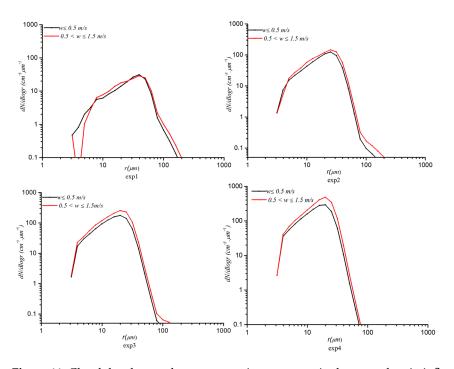


Figure 11. Cloud droplet number concentration spectrum in the aerosol main influence regime.

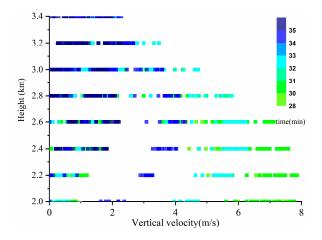


Figure 12. Distribution of updraft velocity with height and time.

In the joint influence regime  $(1.5 \le w < 3 \text{ m/s})$ , as shown in Figure 10, 4–30 µm droplets increase, but the large cloud droplet concentration changes little with the increase in w, so the *CDNCS* becomes narrower (i.e.,  $\sigma$  becomes smaller) with increasing w due to the explosion of smaller droplets. As shown in Figure 12, w values between 1.5 m/s and 3 m/s occur after the 34th minute and above the height of 2.8 km during the later period of the collision–coalescence stage. At this time, the drag effect on w steadily increases [31], and some scholars have also found this feature, that is, above the maximum of w, w decreases [32,33]. Hence, the drag effect is enhanced with the decreasing w [31], and the evaporation of falling cloud droplets [31] significantly reduces the 4–30 µm cloud droplets (Figure 10), which widens the *CDNCS* (i.e., higher  $\sigma$ ) and increases  $r_c$  (Figure 8a,b).

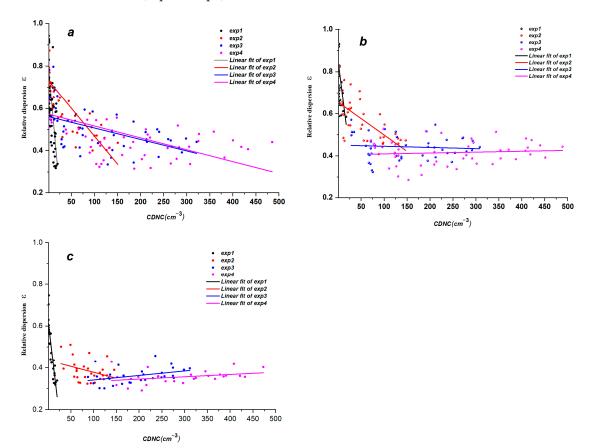
In the aerosol main influence regime, the mechanism for the increase in  $\varepsilon$  with the increase in w is similar to that in the joint influence regime, as is also the case for the drag effect and the evaporation effect [32,33]. However, the drag effect is more intense in the regime as a result of the smaller w [31] because the regime occurs at the end of the collision–coalescence stage (Figure 12). At this time, the evaporation effect is also more significant because the evaporative cooling can reduce w and even change into a downdraft [34]. As can be seen in Figure 11, under the four aerosol schemes, when the evaporation effect is

stronger, the *CDNCS* is narrower (i.e., smaller  $\sigma$ ),  $r_c$  becomes smaller (i.e., less than the change in  $\sigma$ ) by the reduction in  $N_c$  of all sizes. A positive relationship exists between  $\varepsilon$  and w (Figure 7).

This discussion leads to an interesting question: Why does  $\varepsilon$  first increase and then decrease with an increase in  $N_a$  in the aerosol main influence regime and the joint influence regime? To answer this question, the main aerosol influence regime can be taken as an example. As illustrated in Figures 8 and 11, the differences in  $\sigma$  are smaller between exp1 and exp2, but  $r_c$  significantly decreases with  $N_a$  (from exp1 to exp2), so  $r_c$  plays a major role in the increase in  $\varepsilon$  with an increase in  $N_a$ . As shown, from exp3 or exp4,  $r_c$  and  $\sigma$  significantly decrease because the collision–coalescence effect is noticeably weakened with increasing  $N_a$  [35]. Thus, it can be concluded that the characteristics of  $\sigma$  resulted in a decreasing  $\varepsilon$  with the increase in  $N_a$  (Figure 8a,b).

#### 3.5. Joint Dependence of the Relationship between $N_c$ and $\varepsilon$ on $N_a$ and w

This study also analyzed the correlations between  $\varepsilon$  and  $N_c$  within the different main regimes. Under low w conditions ( $w \le 1.5 \text{ m/s}$ ), negative correlations are observed between  $\varepsilon$  and  $N_c$ , and the relationship becomes weaker with the increase in  $N_a$  (Figure 13a). However, when w > 1.5 m/s, the negative correlations gradually weaken or even become positive correlations with  $N_a$  (Figure 13b,c). The positive correlations are found at higher  $N_a$  (exp3 or exp4).



**Figure 13.** Scatter correlations between  $\varepsilon$  and  $N_c$  during the collision–coalescence growth stage in the different regimes for (**a**)  $w \le 1.5$  m/s, (**b**)  $1.5 < w \le 3$  m/s, and (**c**) w > 3 m/s.

In each scheme,  $N_c$  is arranged from small to large, and the corresponding average values of  $\varepsilon$ ,  $r_c$ , and  $\sigma$  under higher  $N_c$  and lower  $N_c$ , respectively, are calculated. The physical quantity values are determined using the difference between the values at higher  $N_c$  and the values at lower  $N_c$ , which are defined as the variations (e.g.,  $\Delta N_c$ ,  $\Delta \varepsilon$ ,  $\Delta r_c$ , and  $\Delta \sigma$ ). The variation in each quantity to the quantity under a lower  $N_c$  multiplied by 100% is

defined as the change rate (CR<sub>x</sub> = $\Delta x/x$ , *x* under lower *N*<sub>c</sub>), where x represents the cloud microphysical quantities (*N*<sub>c</sub>,  $\varepsilon$ , *r*<sub>c</sub>, or  $\sigma$ ). This method can determine the main causes for the correlation between *N*<sub>c</sub> and  $\varepsilon$  in the different main influence regimes.

As shown in Table 1,  $CR_{\sigma}$  and  $CR_{r}$  are both negative. The absolute values of  $CR_{\sigma}s$  are higher than those of  $CR_{r}s$  at lower w ( $w \le 1.5 \text{ m/s}$ , the main influence regime of aerosol), and become smaller with the increase in  $N_a$ . Variations in  $\sigma$  are the main reason for the negative correlation between  $\varepsilon$  and  $N_c$  (Table 1). The absolute values of  $CR_{\sigma}$  reduction with  $N_a$  result in a weakening of the negative relationship between  $\varepsilon$  and  $N_c$  (Figure 11). The mechanism for this negative correlation can be understood by also considering the analysis in Figure 11. That is, stronger evaporation [34] (i.e., corresponding to a weaker w) causes  $N_c$  to decrease,  $\sigma$  to become obviously larger (Figure 8b), and  $\varepsilon$  to increase. The increase in  $N_a$  leads to weakening in the evaporation effect and  $\sigma$  effect [36], and thus the negative correlation.

**Table 1.** Change rates in cloud microphysical quantities under different  $N_a$  and w during the collision–coalescence growth stage (units: %).

	$w \leq$ 1.5 m/s				$1.5 \leq w \leq$ 3 m/s				w > 3  m/s			
	CR <sub>Nc</sub>	CRε	CR <sub>r</sub>	CR <sub>σ</sub>	CR <sub>Nc</sub>	CRε	CR <sub>r</sub>	CR <sub>σ</sub>	CR <sub>Nc</sub>	CRε	CR <sub>r</sub>	CR <sub>σ</sub>
exp1	163	-22	-26	-42	264	-4	-29	-32	303	-35	-33	-57
exp2	247	-18	-23	-37	353	-21	-19	-36	81	-5	-9	-14
exp3	409	-18	-16	-31	247	$^{-2}$	-16	-17	85	8	-10	$^{-2}$
exp4	171	-5	-11	-12	203	4	-15	-10	99	4	-5	-1

In the joint regime, there are negative correlations between  $N_c$  and  $\varepsilon$  in exp1, exp2, and exp3 (Figure 13b). The evaporation of cloud droplets reduces  $N_c$  of 4–30 µm, increases  $r_c$  and  $\sigma$  (the increase in  $\sigma$  is more significant), and then increases  $\varepsilon$  (Table 1). Finally, the negative correlation between  $N_c$  and  $\varepsilon$  appears. When  $N_a$  is very high (exp4), the relationship between  $N_c$  and  $\varepsilon$  becomes positive (Figure 13b). The reason for this change is that the evaporation of cloud droplets reduces  $N_c$  and decreases  $\varepsilon$  (i.e., the increase in  $r_c$  is stronger than the increase in  $\sigma$ ) (Table 1).

In the main influence regime of w, the collision–coalescence strength is proportional to w (Figure 9). Collision–coalescence growth is the main mechanism affecting the *CD*-*NCS*. When the collision–coalescence growth is stronger,  $N_c$  is lower, the *CDNCS* widens toward large diameters,  $\sigma$  increases, and  $r_c$  becomes larger (Table 1). The effect of collision– coalescence is stronger in lower  $N_a$  backgrounds (exp1, exp2) than in the higher  $N_a$  backgrounds (exp3, exp4). The broadening of the *CDNCS* toward larger cloud droplets is more significant in lower  $N_a$ , so the degree of  $\sigma$  change is stronger than that of  $r_c$ . However, when  $N_a$  is higher, collision–coalescence growth is relatively weaker, and the increase in  $r_c$  is stronger than the increase in  $\sigma$ . In conclusion, in the lower  $N_a$  background, stronger collision–coalescence causes a negative correlation between  $N_c$  and  $\varepsilon$ , but the relatively weak collision–coalescence in the higher aerosol background results in a positive correlation between the two (Figure 13c).

## 4. Conclusions

The joint dependence of aerosol number concentration and updraft velocity on relative dispersion during the collision–coalescence growth process under similar dynamic and thermal atmospheric environmental conditions was investigated by performing cloud model simulations with wide ranges of aerosol concentrations virtually covering ambient aerosol concentrations, thus improving our understanding of the regime dependence in the aerosol–cloud interaction. The main conclusions are stated below.

In the aerosol main influence regime,  $\varepsilon$  first increases and then decreases with an increase in  $N_a$ , but it changes slowly or even remains unchanged with w. In the updraft velocity main influence regime,  $\varepsilon$  decreases slowly with an increase in  $N_a$  but decreases

most substantially with increasing w. In the joint influence regime,  $\varepsilon$  also decreases with increasing w, and the changes with  $N_a$  are similar to those in the aerosol main influence regime.

The cause of the variation in the relative dispersion with updraft velocity is different in the different main influence regimes. In the updraft velocity main influence regime, vigorous collision–coalescence causes the cloud droplet number concentration spectrum to move toward large droplets and an increase in  $r_c$ , but the spectral width is less variable. In the joint influence regime, the dragging effect of large cloud droplets leads to a smaller updraft velocity, and their evaporation widens the spectrum by mainly reducing cloud droplets of 4–30 µm. Finally, a decrease in  $\varepsilon$  with an increase in w appeared. In the aerosol main influence regime, the strong drag effect of cloud droplets causes the cloud droplet number concentration of all sizes to decrease and the cloud droplet number concentration spectrum to narrow. This becomes the mechanism for the positive correlation between the relative dispersion and updraft velocity.

In the middle and late stages of collision–coalescence growth, there are both a positive correlation and a negative correlation between  $N_c$  and  $\varepsilon$ . Cloud droplet evaporation produces a negative correlation between the two. When the aerosol number concentration is very high, weaker evaporation results in a positive correlation between  $N_c$  and  $\varepsilon$ . In the early stage of collision–coalescence growth, the collision–coalescence effect results in a negative correlation under the background of a lower aerosol number concentration. At this time, the collision–coalescence effect is weak at higher aerosol number concentrations, and  $N_c$  and  $\varepsilon$  present a positive correlation relationship.

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