# Processing of cloud condensation nuclei by collision-coalescence in a mesoscale model

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[1] The Naval Research Laboratory's Coupled Ocean-Atmosphere Mesoscale Prediction System (COAMPS) is employed to explore the relative importance of source, sink, and transport processes in producing an accurate forecast of the aerosol-cloud-drizzle system. Cloud processing, defined to be the reduction of cloud condensation nuclei (CCN) via collision-coalescence, is not uniquely related to total particle concentration, a behavior which stems from the roughly inverse dependence on cloud droplet concentration between autoconversion and accretion depletion terms. Instead, the behavior of cloud processing in COAMPS suggests relationships (scalings) based on cloud base drizzle rate (R) and cloud droplet concentration  $(N_c)$ . Cloud processing is found to be correlated with drizzle, a relationship that can be represented as a power law for drizzle rates less than 0.6 mm d<sup>-1</sup>. A scaling for cloud processing based on the product of  $N_c$  and R is accurate over a wider range of drizzle rates. Results from large eddy simulation with sizeresolved microphysical processes demonstrate reasonable agreement with COAMPS and the two parameter scaling. Entrainment plays an important role in strongly modulating the mean marine boundary layer (MBL) concentration, both increasing and decreasing CCN, depending upon the entrainment velocity  $w_e$  and the difference between MBL and free tropospheric CCN concentrations. The importance of entrainment suggests that transport processes, especially in the vertical, play a fundamental role in the overall MBL CCN balance. In situ sources rates of CCN, taken to represent heterogeneous chemical processes and sea salt flux of submicron size particles from the ocean surface, must be unrealistically large in order to be of the same magnitude as cloud processing. Because of the prevailing importance of cloud processing and entrainment over timescales of a typical mesoscale forecast, we argue that incorporating accurate vertical aerosol profiles into the model update cycles, either from remote sensing or from global chemistry models, is more important than highly constrained local CCN source rates.

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### 1. Introduction

[2] Atmospheric aerosol that serve as cloud condensation nuclei (CCN) play a significant role in determining the radiative and microphysical properties of marine boundary layer (MBL) clouds [*Twomey*, 1977; *Albrecht*, 1989]. Both the first and second indirect effects are in essence the response of cloud properties to the character of the ambient aerosol. The microphysical responses of the cloud to increasing submicron CCN concentrations are an increased number of smaller droplets for a given liquid water content [LWC] (the "Twomey" effect [*Twomey*, 1977]), and the suppression of precipitation processes associated with reduced coalescence rates (the precipitation suppression or "Albrecht" effect [*Albrecht*, 1989]). Lower CCN concen-

trations are more conducive to drizzle formation, precipitation, and the resulting effects upon the boundary layer thermodynamic stratification and energetics. One study using large eddy simulation (LES) demonstrated that drizzle processes can sometimes lead to the breakup of a solid cloud deck by stably stratifying the boundary layer into an environment that favors isolated, shallow cumulus updrafts [*Stevens et al.*, 1998]. More recently, *Ackerman et al.* [2004] found a complicated relationship between precipitation, liquid water path (LWP), and entrainment in simulations of marine stratocumulus. The complex nature of aerosolcloud-drizzle interactions has important implications for understanding cloud-climate feedbacks in global circulation models.

[3] *Mechem and Kogan* [2003, hereinafter MK2003] demonstrated that a mesoscale model can represent some aspects of these complicated aerosol-cloud-precipitation interactions. Using a two-moment bulk microphysical parameterization [*Khairoutdinov and Kogan*, 2000], the Naval Research Laboratory's Coupled Ocean–Atmosphere Meso-

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scale Prediction System (NRL COAMPS [*Hodur*, 1997]) responded to different ambient CCN concentrations in a physically consistent manner. For conditions characteristic of a clean maritime air mass, the model developed drizzle and a significant degree of mesoscale organization in the form of banded cloud structures. The transition from unbroken stratocumulus to banded cloud structures in the model is analogous to drizzle-induced cloud breakup produced in LES studies. As described above, the aerosol-cloud-precipitation feedbacks are thought to be important on global climate scales, but MK2003 demonstrated that this interaction can have significant impact even on short-term (6–24 hour) mesoscale model forecasts.

[4] These previous studies predominantly focused on how CCN characteristics affect cloud microphysical properties, including precipitation formation and how the resulting precipitation modulates cloud geometry. However, they largely neglected how clouds in turn modify CCN properties. Clouds affect aerosol size distributions via the physical processes of droplet nucleation, collision-coalescence, and impaction scavenging [Flossmann et al., 1985]. Collisioncoalescence is typically the most important of the three processes. Coalescence reduces droplet concentration and, upon evaporation of the larger droplet, results in fewer CCN relative to the number initially available for nucleating droplets. The nucleus of the evaporated droplet is larger than the original CCN radius. In other words, collisioncoalescence depletes the number concentration of CCN, but those that remain are larger [Hudson, 1993; Garrett and Hobbs, 1995]. A fewer number of larger CCN will be more conducive to efficient precipitation formation in subsequent cloud cycles for two reasons. First, although the larger particle sizes may not be "activated" in the Köhler sense, they may nevertheless be able to grow large enough to serve as drizzle nuclei. Second, the available liquid water will be distributed among fewer nucleation sites, increasing droplet radius and collision efficiency [Feingold et al., 1996]. In the absence of a CCN source, collision-coalescence can lead to what Feingold and Kreidenweis [2002] term a "runaway" precipitation process.

[5] In the absence of collision-coalescence, scavenging, and heterogeneous chemistry, nucleation does not modify the aerosol distribution per se, since evaporating the nucleated droplets will recover the original aerosol properties. The magnitude of cloud processing via impaction scavenging, which represents liquid drops "capturing" aerosol through various mechanisms, is generally much less than that from collision-coalescence and is neglected as in the work by *Feingold et al.* [1996]. In addition to these physical mechanisms, aqueous chemical reactions can increase dissolved solute mass in droplets [*Hegg and Hobbs*, 1982; *Feingold et al.*, 1996]. Feingold et al. found that, under some circumstances, the increases in regenerated CCN mass from collision-coalescence and aqueous phase chemistry can be of similar magnitude.

[6] The atmospheric aerosol state in the marine boundary layer is a balance between sources, sinks, and transport. Sources from aqueous phase chemistry and sinks attributable to collision-coalescence are discussed above. In addition, sea spray and di-methyl sulfide (DMS) generation [*Pandis et al.*, 1994; *O'Dowd et al.*, 1997] are a source of CCN or CCN precursors at the surface interface, while free tropospheric aerosols serve as a source to an entraining MBL [*Hudson*, 1993; *Raes*, 1995]. Entrainment should be considered a (turbulent) transport term, which can be negative when the free tropospheric CCN concentration is less than that in the MBL. *Clarke et al.* [1996] found that entrainment dilution was a key factor in a 35% reduction of column mean aerosol over a 34 hour period in the Atlantic Stratocumulus Transition Experiment (ASTEX). *Hoell et al.* [2000] argued that a reduction in MBL accumulation mode aerosol from 670 to 430 cm<sup>-3</sup> arose primarily from entrainment dilution. This dilution effect has also been noted by *Van Dingenen et al.* [1999] and *Johnson et al.* [2000].

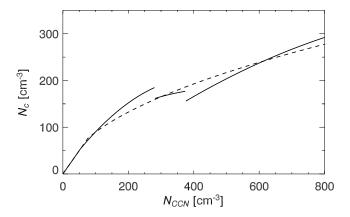
[7] This study employs COAMPS to explore the balance between these source, sink, and transport processes in the context of determining the sensitivities of a mesoscale forecast of the aerosol-cloud-precipitation system. MBL aerosol budgets are calculated for simulations with different initial aerosol concentrations and various source mechanisms and magnitudes. Our results demonstrate robust relationships (scalings) between cloud processing and drizzle, the importance of elevated sources of pollution, entrainment dilution, and generally the inability of in situ MBL and surface sources to overcome depletion via cloud processing. For the purposes of forecasting, we argue that incorporating estimates of the vertical aerosol profile into model update cycles, either from remote sensing or global chemistry models, may be more important than highly constrained local CCN source rates.

### 2. Mesoscale Model Configuration

[8] Simulations to investigate cloud processing of aerosol are based on the version of COAMPS used in MK2003. COAMPS is a fully three-dimensional, nonhydrostatic, compressible mesoscale model that integrates the acoustically active terms using the mode-splitting technique. A 1.5order turbulence closure scheme, which includes a prognostic equation for turbulent kinetic energy, parameterizes subgridscale motions (Mellor and Yamada [1982], "Level 2.5"). At the grid spacing used here, most of the turbulent transport is unresolved, so the turbulence closure is a crucial element in correctly representing the entrainment of free tropospheric air into the MBL. MK2003 demonstrated that the COAMPS subgrid-scale (SGS) scheme responds qualitatively correctly to drizzle-induced thermodynamic stratification in the MBL. Longwave radiation is treated according to Harshvardhan et al. [1987].

### 2.1. Microphysical Parameterization

[9] COAMPS employs the bulk microphysical parameterization of *Khairoutdinov and Kogan* [2000, hereinafter referred to as KK]. KK is a partial moment scheme that sequesters liquid water into nonprecipitating (cloud) and precipitating (drizzle) components. The microphysical scheme comprises prognostic equations for cloud and drizzle water content ( $q_c$  and  $q_r$ ), cloud and drizzle number concentration ( $N_c$  and  $N_r$ ), and CCN concentration ( $N_{CCN}$ ). *Wood* [2005b] found good agreement between microphysical process rates (autoconversion and accretion) from the KK parameterization and those derived from the stochastic collection equation applied to aircraft particle probe data. Our prognostic equations also include fallspeed relations for



**Figure 1.** Nucleation parameterization, which comprises an empirically based relationship between CCN and cloud droplet concentration. Dashed line represents a power law fit to the piecewise discontinuous curves.

 $q_r$  and  $N_r$ . Although recent LES results suggest that cloud droplet sedimentation may play a role in correctly representing in-cloud turbulence [*Ackerman et al.*, 2004], this term has been neglected in the present study.

[10] As in MK2003, nucleation of cloud droplets from CCN is based on the empirical relations of *Martin et al.* [1994] and *O'Dowd et al.* [1996] that relate bulk CCN to cloud droplet number concentrations. We slightly modify the range of the Martin et al. formulation to ensure that  $N_c \leq N_{CCN}$ :

$$\begin{split} N_c &= -1.15 \times 10^{-3} N_{CCN}^2 + 0.963 N_{CCN} + 5.30 & 54 \le N_{CCN} \le 280 \\ N_c &= 197.0 \Big( 1 - e^{-6.13 \times 10^{-3} N_{CCN}} \Big) & 280 < N_{CCN} < 375 \\ N_c &= -2.10 \times 10^{-4} N_{CCN}^2 + 0.568 N_{CCN} - 27.9 & 375 \le N_{CCN} \le 1500 \\ \end{split}$$

For  $N_{CCN} < 54 \text{ cm}^{-3}$ ,  $N_c = N_{CCN}$ . Although this piecewise nucleation parameterization (Figure 1) is discontinuous at 280 and 375 cm<sup>-3</sup>, our simulation results show little difference when using the simple power law approximation of  $N_c = MIN(N_{CCN}, 10.8N_{CCN}^{0.494} - 15.5)$  (overlaid in Figure 1). Because of the tight coupling between cloud droplets and CCN, we confine most of our analysis of cloud processing to total concentration  $N_t = N_{CCN} + N_c$ . For the purposes of this study, the terms "CCN" and "aerosol" are used interchangeably, since activation according to equation (1) assumes the aerosol is chemically homogeneous and microphysically active.

[11] Simple diagnostic relations between CCN and droplet number have been commonly used to represent droplet nucleation, particularly in global climate model studies [*Jones et al.*, 1994; *Lieput and Lohmann*, 2001]. This method of nucleation is limited in that it does not respond directly to model dynamics, and as a result the cloud droplet and CCN concentration fields are constrained more rigidly than in nature. However, for the purpose of the current investigation that focuses on the dependence of cloud processing rates on cloud microstructure and drizzle, representing in detail the nucleation mechanisms is not important so long as the nucleation scheme results in a full range of cloud droplet concentration and drizzle rate parameters. Future efforts will incorporate a more complete method of nucleation that responds to model dynamics, in addition to CCN properties.

[12] The cloud processing of aerosol (or just cloud processing for short) in MK2003 represents droplet nucleation and collision-coalescence as follows. Aerosols are activated according to the simple empirical relations, nucleating a specific cloud droplet number concentration  $N_c$ . The process of collision-coalescence is represented in the bulk model by the mechanisms of autoconversion and accretion, which reduce the concentration  $N_c$ . CCN are regenerated upon droplet evaporation, which as a result of collision-coalescence will be fewer than the original number. CCN associated with drizzle drops that fall to the ground without evaporating are no longer available for nucleating droplets. Subsequent cloud cycles occurring in an environment of depleted CCN concentrations are more conducive to precipitation formation.

[13] All aerosol properties are represented in COAMPS by a simple number concentration, so naturally many aspects of aerosol properties (such as the shift of the spectral shape toward larger sizes) are currently ignored. In this work, we concentrate on the sink of CCN concentration due to collision-coalescence. While aerosol spectral shape and mean radius may influence nucleation characteristics, their direct bearing on cloud processing from collisioncoalescence is limited.

### 2.2. Experimental Configuration

[14] The experimental configuration is similar to those used in recent idealized studies of mesoscale convective cells (MCCs). Fiedler and Khairoutdinov [1994] investigated MCCs using a dimensionless, three-dimensional, horizontally periodic model that was effectively  $(16 \text{ km})^2$ square with 125 m grid spacing in the horizontal. Müller and Brümmer [1999] employed a three-dimensional model with a square domain with sides of 12.8 km and horizontal grid spacing of 200 m. Shao and Randall [1996] used a two-dimensional model with a width of 32 km and horizontal grid spacing 250 m. The present study follows the method used in the idealized simulations by Fiedler and Kong [2003], who investigate MCCs over 32 and 64 km domains with 2 km horizontal grid spacing. The experimental configuration of Fiedler and Kong [2003] and the present study are very similar to those used in LES experiments [e.g., Moeng et al., 1996; Stevens et al., 2005], where thermodynamic profiles, wind, and large-scale forcings are specified, along with some small level of background turbulence to initialize the simulation.

[15] Initial conditions based on a cloud-topped boundary layer (CTBL) from the Atlantic Stratocumulus Transition Experiment (ASTEX) (A209 case sounding [*Duynkerke et al.*, 1995]) are specified using the conservative thermodynamic variables liquid water virtual potential temperature  $(\theta_{vl})$  and total water  $(q_t)$  (Table 1). Initial profiles of the COAMPS thermodynamic variables potential temperature, water vapor mixing ratio, and cloud water mixing ratio, are calculated from these specified profiles of  $\theta_{vl}$  and  $q_t$ . Like LES experiments, the specified initial conditions contain cloud; here the MBL is initially well mixed (constant  $\theta_{vl}$  and  $q_t$ ) and topped by a cloud with a peak adiabatic LWC of

 Table 1. Initial Thermodynamic Profile for All COAMPS

 Experiments

Height, m	$\theta_{vl}, K$	$q_t$ , g kg <sup>-1</sup>
0.0	289.8	10.2
662.5	289.8	10.2
687.5	295.0	9.1
1500.0	299.9	6.83

0.6 g m<sup>-3</sup>. Initial conditions are horizontally homogeneous, except for random temperature and turbulent kinetic energy perturbations with amplitude 0.05 K and 1.0 m<sup>2</sup>s<sup>-2</sup>, respectively, imposed for all heights less than 100 m. The initial mean wind is zero. Surface sensible and latent heat fluxes are 10 and 25 W m<sup>-2</sup>, respectively. Large-scale subsidence divergence of  $5 \times 10^{-6}$  s<sup>-1</sup> is imposed throughout the domain. For the purposes of the radiative transfer calculations, nocturnal conditions are assumed with a constant SST of 286 K.

[16] COAMPS simulations are performed on a three dimensional Cartesian grid of  $50 \times 50 \times 61$  with horizontal grid spacing of 2 km and a vertical spacing of 25 m. Because some of the lateral edge points are used for the boundary condition, the effective physical domain volume is  $90 \times 90 \times 1.5$  km<sup>3</sup>. Three dimensional simulations are necessary to capture the drizzle-induced mesoscale variability reported in MK2003. Lateral boundary conditions are periodic, and the upper boundary is a rigid lid, with a region of damping imposed over the upper portion of the domain. All the simulations are for a 12 hour period.

[17] The initial spatial distributions of CCN concentrations are specified for the MBL and the free troposphere, determined by the inversion height  $z_i$ . The height of the inversion is defined by cloud top height, as specified by a cloud water threshold of 0.01 g kg<sup>-1</sup>. Initially,  $z_i$  is 662.5 m but rises as the simulations progress and the boundary layer entrains. In the first set of experiments, the CCN concentration in the MBL is initially set to a value ranging from 100 to 800 cm<sup>-3</sup>, with the free tropospheric concentration set to zero (simulations C100, C200, C400, C800, CND). These experiments are intended to represent an MBL with no CCN sources. In a second suite of experiments, the initial MBL concentration is 200 cm<sup>-3</sup> and the free tropospheric concentration is varied between zero and  $800 \text{ cm}^{-3}$  (simulations E0, E200, E400, and E800. Note that the configuration of E0 is equivalent to C200). These simulations illustrate the effect of entraining "polluted" free tropospheric air into the boundary layer. This polluted air acts as a reservoir of CCN [*Hudson*, 1993] which, depending on the entrainment rate and free tropospheric concentration, can offset the depletion from cloud processing. A third set of experiments examines the effect of a boundary-layer-wide (in situ) source of CCN (simulations S0, S50, S100, S200, and S400). These simulations are initially identical to C200, but during each time step a fixed CCN source term is added over depth of the MBL. These experiments are designed to determine the source magnitude needed to offset depletion of CCN over the 12-hour run time. Table 2 summarizes all simulations.

### Cloud Processing in Absence of CCN Sources Effect of Ambient Aerosol Concentration on Cloud Parameters

[18] A sample cross section of the cloud structure at 12 hour in the C200 simulation (Figure 2) shows the development of substantial mesoscale variability in the form of spatially varying cloud thickness and cloud water mixing ratio ( $q_c$ ). Thicker cloud and higher values of  $q_c$  in Figure 2a tend to be associated with stronger drizzle (Figure 2b). These cloud and drizzle structures are similar to those in Figures 9–12 of MK2003.

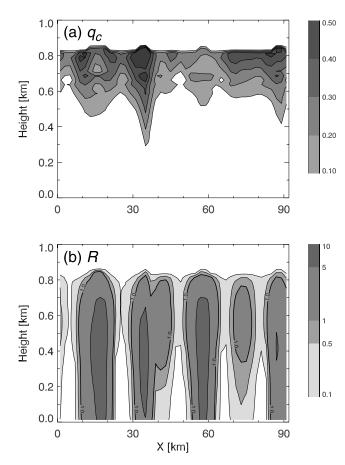
[19] Domain-mean cloud boundaries, LWP, and cloud base drizzle rate all respond in a qualitatively reasonable fashion to changes in ambient aerosol concentration (Figure 3). Cloud boundaries are identified column-by-column where cloud droplet concentration  $N_c$  is greater than 1 cm<sup>-3</sup>. These column-by-column values are then averaged to obtain the domain-mean quantities. For the COAMPS simulations, this  $N_c$  threshold typically coincides with a  $q_c$  threshold of 0.01 g kg<sup>-1</sup>. Thus either quantity can serve to accurately diagnose cloud boundaries and inversion height.

[20] Lower CCN concentrations are associated with larger drizzle rates, reduced entrainment, higher and more variable mean cloud bases, and a reduction in mean LWP. In the

Simulation Name	Initial $z < z_i N_{CCN}$ , cm <sup>-3</sup>	Initial $z > z_i N_{CCN}$ , cm <sup>-3</sup>	Source Rate, $cm^{-3} d^{-1}$
C100	100		
C200	200		
C400	400		
C800	800		
CND	_		
E0	200	0	
E200	200	200	
E400	200	400	
E800	200	800	
SO	200		0
S50	200		50
S100	200		100
S200	200		200
S400	200		400

Table 2. Summary of CCN Configurations for the Idealized COAMPS Simulations<sup>a</sup>

<sup>a</sup>C200, E0, and S0 simulations are equivalent. CND corresponds to a simulation using simple saturation adjustment.



**Figure 2.** Vertical cross section taken through the C200 domain at 12 hours. (a) Cloud water (g kg<sup>-1</sup>) and (b) drizzle rate (mm d<sup>-1</sup>).

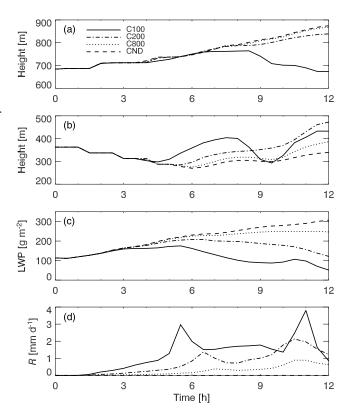
cleanest case (C100), entrainment is reduced to the extent that cloud top descends under the effect of large-scale subsidence. The cloud fields in the strongly drizzling cases tend to be highly variable in space and contain regions of much higher LWP (thicker cloud and/or larger  $q_c$ ), interspersed between regions of very thin (or broken) cloud (e.g., Figure 2a). This variability is not reflected in the mean LWP time series. However, the effect of variability is evident in the drizzle rate time series (Figure 3d). These drizzle rate pulses result from the emergence of mesoscale organization and resolved updrafts and downdrafts brought on by the thermodynamic stratification caused by evaporating drizzle. How COAMPS represents this organized mesoscale aspect of the circulation was discussed in detail in MK2003.

[21] The baseline experiments exhibit dramatic reductions of MBL-mean total particle concentration  $N_t$  ( $N_t = N_c + N_{CCN}$ ) with time, as illustrated in Figure 4 for simulations C200 and C800. In both cases the boundary layer deepens (Figures 4a and 4b) and the cloud thickens with time. Even under the presence of warming and drying via entrainment, the longwave radiative forcing at cloud top is sufficient to cool the boundary layer, reducing the saturation mixing ratio and resulting in a thickening of the cloud. The maximum  $q_t$  is smaller in the C200 case, which is likely related to drizzle removing water from the cloud layer from 6 hours onward (drizzle rate R in Figure 4c). Drizzle

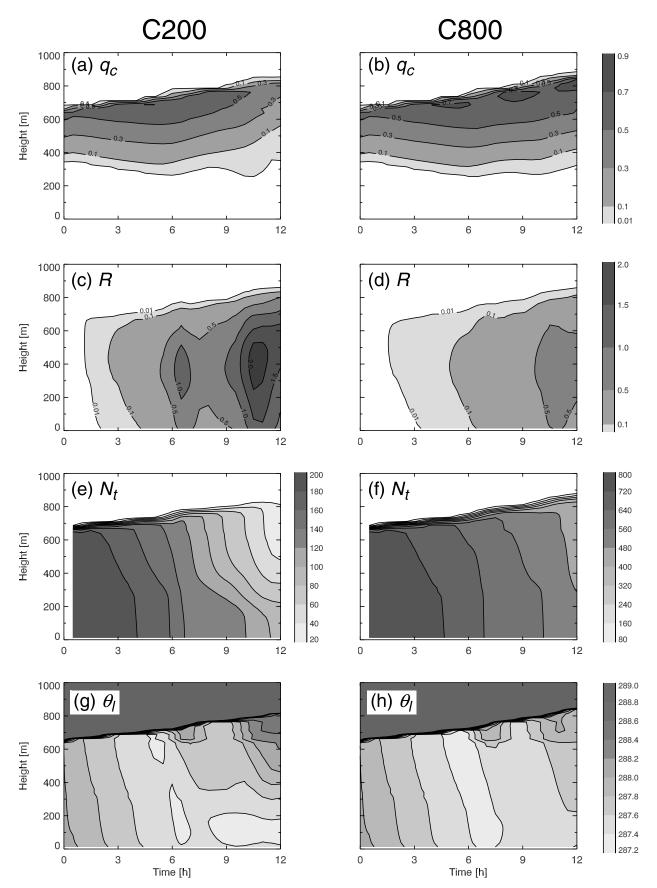
processes are evidently suppressing boundary layer energetics to a degree that entrainment is slightly reduced (see the slight difference in cloud tops in Figures 4a and 4b). This is occurring through both stably stratifying the boundary layer, and by reducing cloud LWC and the commensurate radiative cooling that drives the boundary layer energetics and entrainment.

[22] In the case of lower initial CCN (C200),  $N_t$  is initially 200 cm<sup>-3</sup> but decreases to less than 40 cm<sup>-3</sup> in the upper part of the MBL (Figure 4e).  $N_t$  in experiment C800 (Figure 4f) over the upper part of the MBL decreases from 800 cm<sup>-3</sup> to less than 480 cm<sup>-3</sup>. The absolute depletion of MBL  $N_t$  is greater in C800, although the fractional depletion is greater in C200. By 12 hours, the C200 simulation develops a vertical gradient in  $N_t$ , while remaining nearly well mixed in C800.

[23] Because of the low aerosol load, drizzle production is greater in C200, and drizzle drops falling through the subcloud layer (Figure 4c) evaporate and stably stratify the MBL, as evident in the  $\theta_l$  field from 6 to 12 hours in Figure 4g. Evaporating drizzle cools the subcloud layer as the simulation progresses. The upper part of the PBL experiences warming episodes from 6 to 8 hours and over the last 3 hours of the simulation, further enhancing the MBL stratification. MK2003 found that the warming at upper levels in the mesoscale model resulted from mechanical entrainment of free tropospheric air from weak mesoscale downdrafts rather than the potential buoyancy argument of *Stevens et al.* [1998], in which drizzle removes



**Figure 3.** Time series for idealized COAMPS simulations. (a) Cloud top height, (b) cloud base height, (c) LWP, and (d) cloud base drizzle rate.



**Figure 4.** Time-height plots of horizontally averaged quantities for simulations C200 and C800. (a and b)  $q_c$  (g kg<sup>-1</sup>), (c and d) R (mm d<sup>-1</sup>), (e and f)  $N_t$  (cm<sup>-3</sup>), and (g and h)  $\theta_l$  (K).

significant water substance from the cloud such that the descending branches of the MBL circulation become dry adiabatic at levels above the mean cloud base, thus warming the cloud layer. This thermodynamic stratification is typically accompanied in LES studies by a decoupling of the MBL-deep eddies into separate subcloud and cloud layer circulations. At the 2 km grid spacing used here, much of the energy associated with the turbulent eddies is subgridscale, although COAMPS does produce nonnegligible gridscale velocities. MK2003 argued that these resolved updrafts and downdrafts represent the mesoscale structure of MBL clouds, rather than the MBL eddies themselves. The thermodynamic stratification and decoupling of the circulation set the stage for shallow cumulus convection by creating a potentially unstable layer near the surface, which Stevens et al. [1998] documented using LES. Although we do not show cross sections depicting the evolution of the detailed cloud structures, the evolution of the COAMPS cloud structures in Figure 4 is consistent with the findings of MK2003. We refer the reader to MK2003 for a thorough analysis of the phenomenology.

## **3.2.** Evaluation of Cloud Processing Rates From Budget Analysis

[24] The total depletion of particles shown in Figures 4e and 4f is a sum of cloud processing (collision-coalescence) and dilution due to the entrainment of clean air from above. We quantify the evolution of CCN by contributions from cloud processing, entrainment/mixing, and other sources and sinks by calculating a budget of MBL total particle concentration  $N_t$ . Assuming periodic lateral boundary conditions, the mean  $N_t$  budget is represented by

$$\frac{d\langle N_t \rangle}{dt} = \frac{d\langle N_t \rangle}{dt} \bigg|_{cloud\ proc.} + \frac{d\langle N_t \rangle}{dt} \bigg|_{turb} + \frac{d\langle N_t \rangle}{dt} \bigg|_{source/sink}, \quad (2)$$

where the terms are the rates of change in MBL concentration and the rates due to cloud processing, turbulent transport/mixing, and any other sources or sinks. The term on the left hand side is known, as are any specified sources or sinks. The turbulent transport term is determined from mixing theory, based on the inversion height and the imposed large-scale divergence. The decrease in MBLmean  $N_t$  concentration from cloud processing is then evaluated as a residual. Each term in equation (2) (except the cloud processing residual) is evaluated using a local, column-by-column identification of cloud top based on a cloud droplet concentration threshold of 1 cm<sup>-3</sup>, which effectively identifies the inversion base. This method ensures that the MBL mean budget calculation samples all of the MBL and does not inadvertently capture any of the free troposphere, as might occur if a domain-mean cloud top were used. Since we are primarily concerned with cloud and precipitation effects on CCN, dry deposition effects are ignored in equation (2). This is consistent with the relatively small contribution of this term to the MBL aerosol budget given by Hoell et al. [2000]. All terms are calculated over a 12 hour period using analysis intervals of 30 min.

[25] From simple notions of mixing boundary layer air with an incremental volume of free tropospheric air (see *Raes* [1995], *Van Dingenen et al.* [1999], and *Hoell et al.* 

[2000] for similar developments), the turbulent transport term in equation (2) can be represented as

$$\left. \frac{d\langle N_t \rangle}{dt} \right|_{turb} = \frac{w_e}{z_i} \left( N_{FT} - \langle N_t \rangle \right),\tag{3}$$

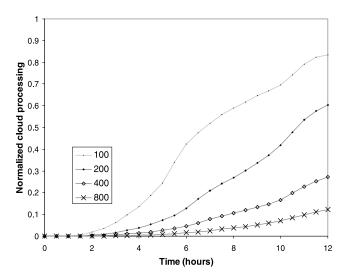
where  $w_e$  is entrainment velocity,  $z_i$  is the inversion height, and  $N_{FT}$  is the free tropospheric CCN concentration. The entrainment velocity  $w_e$  can be calculated from the time rate of change of the inversion height and the subsidence velocity, so equation (3) becomes

$$\left. \frac{d\langle N_t \rangle}{dt} \right|_{turb} = \frac{\frac{dz_i}{dt} + Dz_i}{z_i} (N_{FT} - \langle N_t \rangle), \tag{4}$$

where D is the large-scale subsidence divergence, which is constant with height (5  $\times$  10<sup>-6</sup> s<sup>-1</sup>). Previous studies that have applied similar approaches to observational data sets where large uncertainty exists in estimating the large-scale divergence have either attempted to constrain the subsidence and entrainment velocities from aerosol observations (e.g., the multilayer approach of *Clarke et al.* [1996]), assumed a fixed entrainment velocity [e.g., Van Dingenen et al., 1999], or neglected the large-scale subsidence divergence altogether [Hoell et al., 2000]. The turbulent transport term is positive when the concentration of free tropospheric CCN is greater than the MBL concentration, i.e.,  $N_{FT} >$  $\langle N_t \rangle$ , in effect tapping the tropospheric CCN reservoir. When the term is negative, the MBL  $N_t$  concentration can be reduced or "diluted" by entrainment. Both the increase and dilution of boundary layer  $N_t$  have a basis in observation and are important physical processes.

[26] From COAMPS output and the turbulent transport term evaluated in equation (4), we can calculate and compare all the terms in the CCN budget. However, a small (1% in 12 hours) model numerical source of CCN, estimated from a sensitivity experiment in which collision-coalescence processes were turned off, is present. We attribute this artificial source to the relatively crude advection scheme (second-order centered difference) used in the model. For purposes of the analysis, this source was removed by way of a time-dependent correction determined from a simulation in which collision-coalescence processes were switched off and  $N_t$  was in effect a passive tracer.

[27] Figure 5 shows normalized cloud processing, the fraction of the boundary layer mean reduction of  $\langle N_t \rangle$ attributable to cloud processing. Of the significant reduction of  $\langle N_t \rangle$  in simulation C800 (Figure 4f) at 12 hours, only  $\sim 10\%$  results from cloud processing, while entrainment dilution is responsible for the vast majority ( $\sim 90\%$ ). The contribution of cloud processing to depletion becomes progressively more important as the ambient CCN concentration decreases; in the C100 simulation, for example, cloud processing is responsible for over 80% of the depletion at 12 hours. For larger initial values of  $N_{CCN}$ , cloud processing is slower to increase and removes a smaller fraction of the particles. This behavior is associated with higher CCN concentrations suppressing the collisioncoalescence process and the formation of drizzle [Albrecht, 1989], as evident in the relative difference in drizzle rates between the simulations (Figure 3d). In addition, the steep-



**Figure 5.** Time series of normalized cloud processing (the fraction of  $\langle N_t \rangle$  reduction from cloud processing alone) for simulations C100, C200, C400, and C800.

ening of the processing curves in Figure 5 tends to be associated with the "pulses" in drizzle rates.

[28] Few past studies systematically evaluated the separate contributions from entrainment, cloud processing, advection, and source terms sufficiently to allow a robust comparison with our cloud processing rates. Using a 2D LES, Feingold et al. [1996] found a 25% reduction in MBLmean CCN concentration after 3 hours for initial conditions similar to those in our simulations and an initial CCN concentration of 50 cm<sup>-3</sup>. A COAMPS simulation with the same initial CCN configuration (not shown) produces a 3 hour depletion of 30%, in good agreement with the LES estimate of Feingold et al. Since the free tropospheric CCN concentration is  $50 \text{ cm}^{-3}$ , in both cases these reductions include a slight entrainment source, with the implication that the reduction in number concentration due to cloud processing is actually larger in magnitude than the 25-30%values. How much larger? Given the free tropospheric concentration and a mean entrainment rate of 0.8 cm s<sup>-1</sup>, a simple calculation using equations (2) and (4) shows that the magnitude of the entrainment source term is only  $\sim 10\%$ of the observed CCN reduction; therefore we estimate that the actual depletion arising from cloud processing will be  $\sim 28 - 33\%$ .

## **3.3.** Relative Contributions of Autoconversion and Accretion to Cloud Processing

[29] The efficiency of drizzle production clearly depends on cloud droplet concentration, and in the case of our closely coupled aerosol-droplet system, on  $N_t$ . Since larger values of  $N_t$  are associated with smaller fractional depletions (Figure 5), it is reasonable to expect that the cloud processing rate strongly depends on  $N_t$  as well. For all simulations, the MBL-depletion rates calculated according to equation (2) increase with time until near the end of the simulations (Figure 6), although the rates increase more rapidly with time in the cleaner cases. However, counterintuitively, the same depletion rate can be associated with different values of total particle concentration  $N_t$  (e.g., shaded line in Figure 6). For the KK parameterization, the time rate of change of  $N_c$  is given by the right hand side of equation (35) in the work by *Khairoutdinov and Kogan* [2000], which assumes all the collected droplets have mean droplet radius  $r_{vc}$ ,

$$\frac{\partial N_c}{\partial t} = \frac{-\frac{\partial q_r}{\partial t}\Big|_{auto} - \frac{\partial q_r}{\partial t}\Big|_{accretion}}{\left(\frac{4\pi\rho_w}{3\rho_a}r_{vc}^3\right)},\tag{5}$$

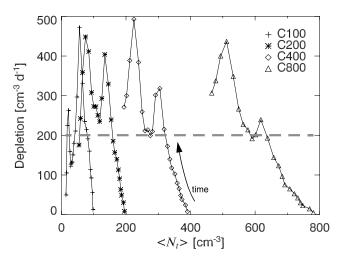
where  $\rho_w$  and  $\rho_a$  are the density of water and air, respectively. The expression for  $r_{vc}$  based on the two moments is

$$r_{vc} = \left(\frac{3\rho_a}{4\pi\rho_w}\right)^{1/3} q_c^{1/3} N_c^{-1/3} \tag{6}$$

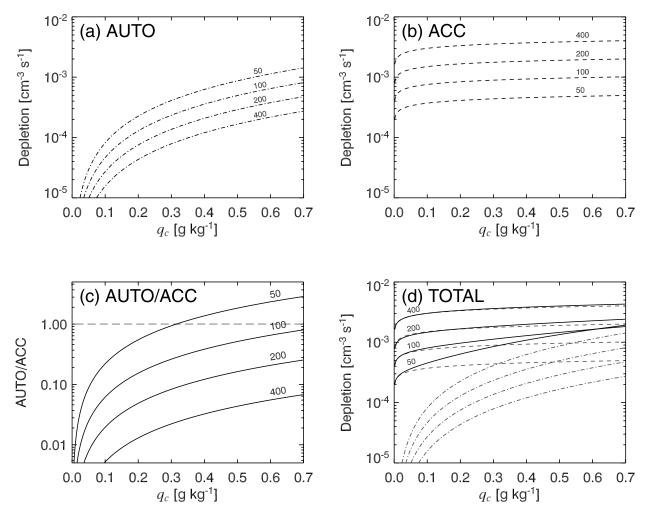
Substituting the expressions for autoconversion, accretion, and mean volume radius, into equation (5) gives

$$\frac{\partial N_c}{\partial t} = \frac{-aq_c^b N_c^c - e(q_c q_r)^f}{q_c / N_c} = -aq_c^{b-1} N_c^{c+1} - eN_c q_c^{f-1} q_r^f, \quad (7)$$

where the parameters *a*, *b*, *c*, *e*, and *f* are 1350, 2.47, -1.79, 67, and 1.15, respectively. *Wood* [2005b] compares the rate of loss of cloud droplets predicted by equation (7) with that from the stochastic collection equation, computed using spectra from twelve different research flights. The bulk parameterization is generally in good agreement (his Figure 7a), especially for larger values of depletion, though it slightly overestimates smaller values. Furthermore, the strong agreement implies that little error is introduced by assuming that the coalescence scavenging is distributed among droplets of constant radius  $r_{vc}$ . Cloud processing in COAMPS proceeds according to equation (7), although for Figure 5 we obtain it from the budget residual in equation (2). The two methods are within a few percent of each other.



**Figure 6.** Depletion rate from cloud processing as a function of  $\langle N_t \rangle$  for the four baseline simulations. Time runs from t = 1 hour at the bottom of the lines, upward, with symbols spaced at 30 min intervals. Shaded dashed line represents an equivalent value of depletion for each simulation.



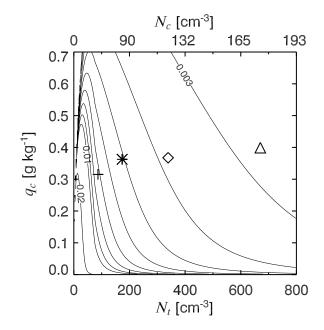
**Figure 7.** Depletion of cloud droplet concentration from collision-coalescence for specified cloud number concentrations. Drizzle water mixing ratio is assumed for the accretion calculation to be  $0.003 \text{ g kg}^{-1}$ . (a) Autoconversion, (b) accretion, (c) ratio of depletions from autoconversion and accretion, and (d) total depletion.

[30] As evident by equation (7) and Figure 7, both autoconversion and accretion contribute to depletion. In the calculations for Figure 7, drizzle water content  $(q_r)$ was assumed to be 0.003 g kg<sup>-1</sup>. In reality  $q_r$  is highly variable and will in fact depend on autoconversion. The particular value chosen is the modal drizzle water content at 6 hours for the C400 simulation, though any reasonable magnitude of  $q_r$  will satisfy to demonstrate the possibility that widely varying droplet concentrations can result in similar depletion rates. Accretion tends to be the dominant depletion mechanism over values of  $q_c$  and  $N_c$  typical of stratocumulus (Figures 7b and 7c). This result for depletion is analogous to the conclusion of Wood [2005b], who argues that accretion is the dominant process responsible for drizzle water production, and therefore cloudwater loss (which is the key to removal of CCN). For certain combinations of  $q_c$ ,  $q_r$ , and  $N_c$ , however, the contributions of autoconversion and accretion to depletion can become comparable. Autoconversion becomes more important as a depletion mechanism as  $q_c$  increases and  $N_c$  decreases (Figures 7a and 7c).

[31] The autoconversion and accretion terms vary as a function of  $q_c$  and  $N_c$  in such a way that the sum can

sometimes be invariant on  $N_c$  (Figure 7d). Mathematically, the possibility of the two terms being of similar magnitudes makes sense, since the loss in concentration from autoconversion is proportional to  $N_c^{-0.79}$ , while the loss from accretion is proportional to  $N_c$ . This inversely varying relationship makes possible the invariance on  $N_c$  suggested in Figure 7d and is one explanation for similar values of depletion being associated with different total particle concentrations in Figure 6.

[32] In order to understand more clearly the conditions under which the four "C" simulations might exhibit the same depletion rate, we explore the behavior of equation (7), constrained by a depletion rate of 200 cm<sup>-3</sup> d<sup>-1</sup> (represented by the shaded line in Figure 6). The parameter space is represented in Figure 8 by contours of  $q_r$  as a function of  $N_t$  and  $q_c$ . The predominantly vertical slope of the  $q_r$ contours over much of the parameter space implies that the existence of equivalent depletion rates under different ambient CCN concentrations (i.e., different values of  $N_t$ ) likely cannot be explained by a difference in  $q_c$  alone. Cloud system behavior in simulations C100, C200, C400, and C800, moreover, confirms this notion. Values of cloud-mean  $N_t$ 



**Figure 8.** Parameter space of  $N_t$ ,  $q_c$ , and  $q_r$ , given the depletion rate denoted by the shaded dashed line on Figure 6. Contours represent the  $q_r$  (g kg<sup>-1</sup>) required to satisfy equation (7) for a depletion rate of 200 cm<sup>-3</sup> d<sup>-1</sup> at the specified values of  $N_t$  and  $q_c$ .  $N_c$  values along the top axis are obtained from the nucleation parameterization. Contour interval is 0.001 g kg<sup>-1</sup>, except for the highest contour level, which has magnitude 0.02 g kg<sup>-1</sup>. Symbols are representative values from C100, C200, C400, and C800 (left to right) which correspond to a depletion rate of 200 cm<sup>-3</sup> d<sup>-1</sup>.

and  $q_c$  for selected times in each simulation when the cloud-mean depletion rate was 200 cm<sup>-3</sup> d<sup>-1</sup> are plotted on Figure 8. Here the cloud-mean values of  $q_c$ , which roughly represent  $q_c$  in the middle of the cloud, vary only between 0.3-0.4 g kg<sup>-1</sup> in all four cases. Therefore only significant differences in  $q_r$  can produce equivalent depletion rates in the four cases. These significant differences in  $q_r$  between simulations seem plausible, moreover, since drizzle amount is inversely related to  $N_t$ . Physically speaking, this result is an indication that depletion is strongly tied to drizzle production. Because the contours are not exactly vertical, for some regions of the parameter space a large difference in  $q_c$  between the simulations could conceivably bring about the same processing rate; however, the required difference in  $q_c$  would be implausibly large, much larger than typically produced in these simulations. This strong dependence on  $q_r$  weakens somewhat at large values of  $N_t$ and breaks down altogether near values of  $30 \text{ cm}^{-3}$ .

#### **3.4.** Scalings for Depletion and Drizzle

[33] The result that depletion is largely independent of  $N_i$ , at least for experiments C100–C800, enables the unique relationship between drizzle rate and depletion in Figure 9 that is not directly dependent on droplet concentration. In Figure 9, depletion is calculated from instantaneous values according to equation (7) as a mean over all cloudy points  $(N_c > 1 \text{ cm}^{-3})$  and then multiplied by  $(z_i - z_b)/z_i$  ( $z_i$  and  $z_b$  are mean cloud base and inversion height, respectively,

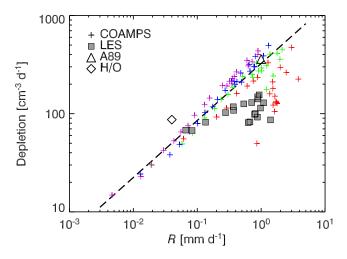
obtained from the averaging methodology described in section 3.1) to scale the rate over the MBL. As stated in section 3.3, independent calculations of MBL-mean depletion from equations (7) and (2) are within a few percent of each other. Mean cloud base drizzle rate was defined in section 3.1 and is taken as an average over the entire (horizontal) domain, not just conditionally sampled over cloudy columns. Both quantities are instantaneous and calculated using half-hour COAMPS data output. Figure 9 suggests two depletion regimes for the COAMPS simulation results. In the first regime, the depletion rate depends on drizzle intensity, not on ambient CCN concentration. For drizzle rates less than 0.6 mm d<sup>-1</sup>, the dependence on drizzle rate may be represented by a simple power law of

$$D = 325R^{0.581},\tag{8}$$

where D is  $cm^{-3} d^{-1}$  and R is drizzle rate in mm  $d^{-1}$ , and describes depletion as a function of cloud base drizzle rate generally within a factor of two ( $r^2 = 0.93$ ). This simple relationship is chiefly applicable for small resolved vertical motions and holds until near the end of the simulations when the small values of  $N_t$  in cloudy regions appear to limit depletion. This second depletion regime is represented in Figure 9 by the points with drizzle rates greater than about 0.6 mm  $d^{-1}$  that lie off the power law curve. The power law for all points is  $D = 248R^{0.464}$ , with  $r^2 = 0.71$ . Similar power laws exist for surface drizzle rate, with larger coefficients arising from the evaporation of drizzle falling through the subcloud layer. The possibility of drizzle evaporation in the subcloud layers of various depths and relative humidities increases the error in the surface drizzle relationship, to the point where it becomes meaningless for drizzle that completely evaporates before reaching the ground. Both relationships show little sensitivity to the particular value of initial  $N_t$ , except perhaps in the second, limiting regime when  $N_t$  becomes very small (less than about 60).

[34] A theoretical estimate of MBL-mean depletion from drizzle rate according to Albrecht [1989] for a cloud thickness of 400 m lies within the span of the COAMPS results in Figure 9. Hoell et al. [2000] calculated a rate of loss due to precipitation during the ACE-2 (North Atlantic Regional Aerosol Characterization Experiment) project and estimated an accumulation mode depletion rate of 144  $\text{cm}^{-3}$  d<sup>-1</sup> over a 2 hour drizzle event for an initial value of  $670 \text{ cm}^{-3}$ . ON the basis of in situ aircraft observations at cloud base for the same case, Osborne et al. [2000] estimated cloud base precipitation rate for this period of about 0.04 mm  $d^{-1}$ . The depletion, scaled over the boundary layer depth, from these two combined sources in Figure 9 is greater than COAMPS depletion for the given drizzle rates, although caution is in order when combining calculations from two largely independent studies.

[35] A large eddy simulation of case C200 was analyzed in order to compare cloud processing rates with those from COAMPS. The LES model is based on 3D Boussinesq dynamics and explicitly represents the turbulent boundary layer eddies, which are for the most part parameterized in the mesoscale model. Size-resolved cloud physics processes are formulated on the basis of prognostic equations for 19 CCN and 25 cloud/drizzle droplet bins. The LES is



**Figure 9.** MBL-mean depletion as a function of cloud base drizzle rate for the four baseline COAMPS simulations (crosses) and the LES simulation (solid rectangles). COAMPS results are stratified by color: C100 (red), C200 (green), C400 (blue), and C800 (magenta). The triangle represents a theoretical calculation as in the work by *Albrecht* [1989] for a cloud thickness of 400 m. The diamond denoted by H/O represents a synthesis of results by *Hoell et al.* [2000] and *Osborne et al.* [2000]. Dashed line is the power law fit represented by equation (8). See the text for more details.

described in detail by *Kogan* [1991], *Kogan et al.* [1995], and *Khairoutdinov and Kogan* [1999]. The model has been extensively verified against aircraft observations [*Khairoutdinov and Kogan*, 1999; *Liu et al.*, 2000], and indirect tests of a bulk drizzle parameterization derived from model drop size distributions (the KK parameterization) showed good agreement with in situ aircraft data [*Wood*, 2005b].

[36] The LES is initialized with ASTEX A209 conditions, the same as those used for the COAMPS simulations. The initial aerosol configuration is intended to be similar to C200 and assumes a lognormal distribution with modal radius 0.05  $\mu$ m, width parameter ( $\sigma$ ) of 1.5  $\mu$ m, and total MBL concentration of 200 cm<sup>-3</sup>. As in C200, the free tropospheric concentration is zero. We do not go into detail about the LES results but only concentrate on calculations of cloud processing for comparison with COAMPS. Cloud processing (depletion) in the LES is calculated directly on the basis of the coagulation process and is averaged over 30 min periods (2–3 eddy turnover cycles). For given drizzle rates (*R*), LES depletion rates in Figure 9 are generally lower (from 1/2–2/3 smaller) than the corresponding rates from the COAMPS simulations.

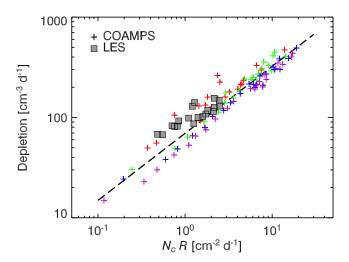
[37] The single parameter formula in equation (8) fits the COAMPS simulations for drizzle rates less than 0.6 mm d<sup>-1</sup> but degrades at larger values of *R*. From an analytical development beginning with the stochastic collection equation, *Wood* [2006] suggests a formulation of depletion based on the product of droplet concentration and drizzle rate ( $N_c R$ ). Our COAMPS and LES results plotted in Figure 10 against this new scaling demonstrate improved correlation

relative to the 1 parameter relation, especially for larger values of depletion. The exponent of the best fit to the COAMPS results differs somewhat from Wood's linear scaling:

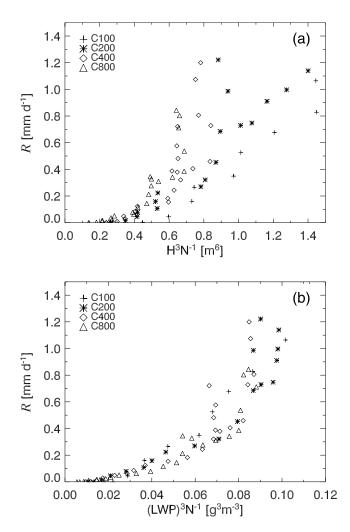
$$D = 69.4 (N_c R)^{0.668}.$$
 (9)

In equation (9),  $N_c$  and R are expressed as cm<sup>-3</sup> and cm d<sup>-1</sup>, respectively, to be consistent with the horizontal axis on Figure 10.

[38] Given the 2 km horizontal grid spacing in the mesoscale model, the turbulent eddies which in nature drive the precipitation process are only partially resolved, leaving the SGS to represent the bulk of the MBL dynamics. How reasonable, then, are the resulting precipitation amount and behavior? Recently, much research has centered on exploring scalings for drizzle based on fundamental cloud properties. These observationally based relationships are potentially very important for parameterizing drizzle rate and cloud droplet depletion in large-scale models, and it is natural to investigate how they compare to the bulk properties of cloud and drizzle in COAMPS. Pawloska and Brenguier [2003] found that drizzle rate scaled as  $H^4 N^{-1}$ , where H and N are cloud depth and mean droplet concentration, respectively. Drizzle rate scaled as  $(LWP/N)^{1.75}$  in an observational study of subtropical eastern Pacific marine stratocumulus [Comstock et al., 2004]. VanZanten et al. [2005] showed that cloud base drizzle rate from seven research flights during the Dynamics and Chemistry of Marine Stratocumulus (DYCOMS-II) project generally scaled with  $H^3N^{-1}$ . Wood [2005a] contains a summary comparison of these drizzle rate scalings. Half-hourly COAMPS results from the four "C" simulations fit the DYCOMS-II  $H^3 N^{-1}$  scaling fairly (Figure 11a) and behave similarly for the  $(LWP/N)^{1.75}$  scaling (not shown). COAMPS behavior seems to be described best by a



**Figure 10.** Alternate scaling for MBL-mean depletion suggested by *Wood* [2006] for the four baseline COAMPS simulations (crosses) and the LES simulation (solid rectangles). Crosses are colored to indicate C100 (red), C200 (green), C400 (blue), and C800 (magenta) simulations.



**Figure 11.** Two scalings for cloud base drizzle rate. (a)  $H^3 N^{-1}$  and (b)  $(LWP)^3 N^{-1}$ .

physically similar scaling of  $(LWP)^3 N^{-1}$  (Figure 11b). Both drizzle rate scalings show indications of the two depletion regimes visible in Figure 9, stratified according to a drizzle rate of about 0.6 mm d<sup>-1</sup>.

### 4. Sensitivity of Cloud Processing to CCN Sources

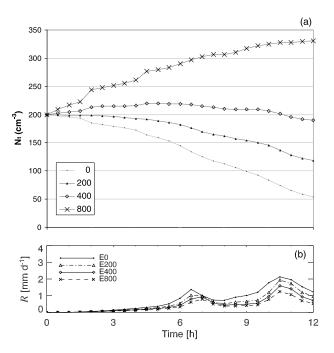
[39] The previous discussion of cloud processing neglected fundamental CCN sources that aid in maintaining adequate nucleation sites for subsequent boundary layer cloud cycles. We perform sensitivity experiments to test the importance of various CCN source configurations and rates relative to cloud processing. The experimental configurations are based on knowledge or current hypotheses of boundary layer CCN source mechanisms, specifically what we term the entrainment source and local (in situ or surface) sources. For these experiments, the initial value of  $N_{CCN}$  in the boundary layer was set to 200 cm<sup>-3</sup>.

### 4.1. Entrainment Source

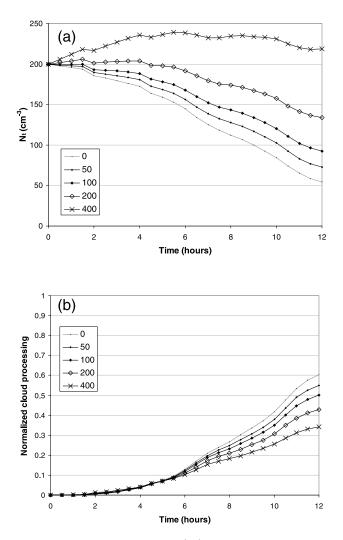
[40] The free troposphere supplies a common source of CCN as the boundary later entrains. Numerous studies, such as *Hoell et al.* [2000] and *Osborne et al.* [2000], have examined the behavior of CCN and cite dilution/entrain-

ment as the dominant mechanism for change. Dilution is a special case of entrainment when the free tropospheric concentration is less than that of the boundary layer. At times the entrained air is much more polluted than the boundary layer air (e.g., simulations by Jiang et al. [2002], based on an ASTEX case different from ours) and supplies a significant source of boundary layer CCN. Several mechanisms have been postulated for the source of this elevated polluted layer. Raes [1995] argued that it derives fundamentally from the downward branches of Hadley circulation over the subtropics. Other studies [e.g., Garrett and Hobbs, 1995] have implied that horizontal transport of polluted, continental air masses is responsible, although the generally barotropic nature of the subtropical high would preclude this mechanism as a CCN source for (clean) oceanic boundary layers.

[41] Simulations E0-E800 demonstrate the importance of the entrainment source in influencing the mean boundary layer CCN concentration. Free tropospheric conditions in these simulations range from zero to 800 cm<sup>-3</sup>, all of which are less than the value of  $1200 \text{ cm}^{-3}$  used by Jiang et al. [2002]. For a free tropospheric concentration greater than about  $400 \text{ cm}^{-3}$ , the entrainment source more than offsets depletion due to all causes, as indicated in Figure 12a. When entrained into the MBL, free tropospheric CCN counteract depletion from cloud processing (Figure 12a) and suppress drizzle (Figure 12b). Of course, from equation (3), the entrainment source is dependent not only upon the difference between the MBL and free tropospheric concentration but also on the entrainment rate. A reduction in entrainment rate, for example from weaker cloud top cooling accompanying a decrease in LWC, will reduce the entrainment source. The entrainment sensitivity experiments exhibit power law relationships between drizzle rate



**Figure 12.** Time series for the entrainment source experiments E0, E200, E400, and E800. (a)  $\langle N_t \rangle$  and (b) cloud base drizzle rate. Simulation E0 is identical to C200.



**Figure 13.** (a) Evolution of  $\langle N_t \rangle$  for the in situ source experiments S0, S50, S100, S200, and S400. Values correspond to concentration of CCN added per day. Simulation S0 is identical to C200. (b) Normalized cloud processing, as in Figure 5, but for the S-series simulations.

and cloud processing (not shown) similar to the control simulations.

### 4.2. In Situ MBL and Surface Sources

[42] Certain CCN source mechanisms are best represented by boundary-layer-wide sources. For example, enlargement of CCN via heterogeneous chemical reactions to a size large enough to be activated is known to occur within clouds [O'Dowd et al., 1997; Hoell et al., 2000] and is best represented in a MBL-mean sense. For numerical models that parameterize vertical transport, injection of sea salt by rough seas and subsequent mixing in the vertical may be best represented this way, especially if the time step is larger than the characteristic eddy turnover time (as unlikely as this may be in a mesoscale model setting). The sea salt source may be particularly important, considering the high activity of large salt particles relative to smaller sulfate particles [O'Dowd et al., 1997], and is a strong function of wind speed. For a typical MBL of depth 800 m, the sea salt source becomes significant at speeds greater than about  $10 \text{ m s}^{-1}$  [Hoell et al., 2000].

[43] The "S" suite of experiments is similar to C200 but with various CCN source rates within the boundary layer. The source rates are specified in terms of concentration added per day, and are added every timestep of the simulations. An in situ source of  $\sim$ 350 cm<sup>-3</sup> d<sup>-1</sup> would be required to offset the loss from cloud processing and to maintain the mean MBL CCN concentration at 200 cm<sup>-3</sup> (Figure 13a). As expected, adding CCN at a greater rate suppresses cloud processing (Figure 13b).

[44] Are any presently identifiable in situ or surface sources of this large magnitude comparable to the cloud processing rates in our study? For an MBL-mean source to be able to offset a cloud depletion of  $\sim$ 350 cm<sup>-3</sup> d<sup>-1</sup> seems unlikely. Raes [1995] argued that CCN (0.3%) production via heterogeneous chemistry occurs over timescales greater than three days, considerably longer than typical MBL timescales. Other modeling studies, however, have demonstrated that under certain conditions heterogeneous chemistry can influence MBL cloud behavior [Feingold et al., 1996; Feingold and Kreidenweis, 2002]. They found that the conversion of SO<sub>2</sub> to sulfate to be of similar magnitude to cloud processing under conditions of low liquid water content, while cloud processing dominates at higher liquid water content and when spectra broaden upon multiple cloud cycling events. The impact of aqueous chemistry, on the other hand, decreases as the atmospheric reagents are consumed. It is important to note that these chemical processes do not actually increase total particle number concentration; rather, they increase particle size and hence make them more easily activated. For this reason, prior studies have not framed the chemical processes in terms of bulk CCN source rates. It seems reasonable, however, to treat this chemistry as a CCN source, as particles traverse an arbitrary size/supersaturation threshold, although the complexities of parameterizing this process in a bulk model are challenging.

[45] Although the MBL concentrations of micron and larger sea salt particles are small relative to sulfate concentrations, flux from the ocean can enhance the concentration of smaller submicron aerosol as well [*O'Dowd et al.*, 1997]. *Hoell et al.* [2000] estimated MBL submicron sea salt source rates of 99 cm<sup>-3</sup> d<sup>-1</sup> and 10 cm<sup>-3</sup> d<sup>-1</sup> in a highly polluted and a clean environment, respectively. Although these rates are less than typical cloud processing rates, they nevertheless can contribute appreciably to the MBL budget. However, a single bulk CCN concentration is not able to represent the enhanced hygroscopy of the micron size particles.

### 5. Discussion and Conclusions

[46] Quality mesoscale forecasts require accurate representations of source/sink process rates, in addition to specification of initial and boundary conditions. Sea salt sources are parameterizable as a function of surface wind speed, while at least currently (in our opinion) accounting for heterogeneous chemical processes is beyond the ability of simple bulk models. Quantifying the entrainment source from the free troposphere requires knowledge of the vertical CCN distribution and the ability to accurately diagnose entrainment.

[47] Unfortunately, routine CCN measurements are not a standard component of meteorological data collection. Satellite remote sensing is one method for obtaining these measurements [e.g., *Mishchenko et al.*, 1997], although such techniques frequently have limitations such as being restricted to daytime or only giving a vertically integrated measurement. Other methods utilize combinations of surface measurements and remote sensing [e.g., *Feingold et al.*, 1998; *Ghan and Collins*, 2004], though these are fundamentally local in nature and require suites of expensive instruments. A more realistic manner of supplying initial and boundary conditions for CCN concentration is required. Because of the requirement for three-dimensional initialization fields, global chemistry models [e.g., *Chin et al.*, 2000] may be the best candidate.

[48] We have run a mesoscale model in an idealized configuration to evaluate the relative importance of cloud processing (collision-coalescence) and various physically based sources to an MBL CCN budget in order to evaluate the parameters required for an accurate forecast. The model uses a 2-moment microphysical parameterization and contains a prognostic equation for bulk CCN concentration. Cloud processing obtained from a residual of the MBL CCN budget is consistent with that calculated directly from the KK parameterization. Our results demonstrate that COAMPS cloud processing rates are in good agreement with LES and observational estimates. The MBL cloud properties behave predictably under different initial concentrations of CCN, with smaller values associated with stronger drizzle, smaller cloud LWC, and suppressed entrainment. All of the control cases, in which CCN is initialized only in the MBL, exhibit a decrease of CCN concentration over the 12 hour simulation period. The reduction is accomplished predominantly by entrainment dilution in the polluted case and by cloud processing in the clean case.

[49] Counterintuitively, cloud processing rate is not directly dependent upon total particle concentration; specifically, cloud processing rates are not uniquely associated with values of total concentration  $\langle N_t \rangle$ . We evaluated relative contributions to the processing rates from autoconversion and accretion in the microphysics scheme to explore this behavior. The droplet loss from autoconversion is proportional to  $N_c^{-0.79}$ , while loss from accretion is proportional to  $N_c$ . This inverse relationship is the most important factor in explaining the invariance on  $N_c$  (and thus on  $\langle N_t \rangle$ ). Depletion from accretion tends to dominate for higher droplet concentrations, while at lower concentrations, or for smaller values of drizzle water content, depletion from autoconversion can be of the same magnitude.

[50] Instead of dependence on  $\langle N_t \rangle$ , we find a robust relationship between cloud processing and combinations of drizzle rate and droplet concentration. For low to moderate drizzle rates ( $R < 0.6 \text{ mm d}^{-1}$ ), a power law describes the dependence of COAMPS cloud processing on drizzle intensity. The power law is most applicable for weak resolved updrafts and breaks down at large drizzle rates, when rapidly decreasing values of  $N_t$  in regions of resolved vertical motion appear to limit depletion. Similar behavior exists for surface drizzle rate, though the relationship is

more complex because of evaporation in the subcloud layer. A scaling for cloud processing based on drizzle rate and droplet concentration similar to that derived analytically by *Wood* [2006] vastly improves the fit over a broader range of drizzle rates. Our two parameter depletion scaling better fits results from LES with size-resolving microphysics.

[51] The one parameter power law relationship in equation (8) might form the basis of prescribing cloud processing for drizzle rates in a numerical model (cloud, mesoscale, or GCM) that does not keep track of droplet concentration independently as part of its microphysical scheme. This approach would apply to large-scale models that employ single moment (water content only) microphysics schemes but that still attempt to include aerosol. Including information about droplet concentration (equation (9)) would result in more accurately prescribed cloud processing for larger drizzle rates where depletion rates become much more significant. As more models employ multiplemoment microphysical schemes, it will become natural to develop expressions for cloud processing rates similar to equation (7). We also speculate that equations (8) and (9) could be used to diagnose cloud processing rates from cloud base drizzle rates estimated from radar data using Z-R relationships [e.g., Vali et al., 1998; Comstock et al., 2004], along with estimates of droplet concentration (required for equation (9)).

[52] Sensitivity experiments demonstrate the relative importance of in situ, surface, and entrainment sources. The entrainment source is of greatest importance relative to cloud processing and encompasses both dilution and enhancement of CCN by tapping into the free tropospheric reservoir. Accurately representing this source necessitates an accurate measure of the free tropospheric CCN and a realistic entrainment rate. Although beyond the scope of this study, improving the representation of cloud-top entrainment rates in models is a common topic of investigation, and we expect continual improvement along those lines. In our experience, COAMPS entrainment rates seem reasonable for this case and others.

[53] The in situ source experiments represent the effects of heterogeneous chemical processes and flux of sea salt nuclei from ocean spray. Although some past studies have demonstrated that heterogeneous chemistry can influence MBL cloud structure, the magnitude of the source rate required to balance cloud processing is implausibly large, especially over subsequent cloud cycles as the collisioncoalescence process becomes more efficient and reagents for the chemical processes become scarce. Furthermore, parameterizing this process in a bulk microphysical setting is a challenging problem. Depending upon the wind conditions, surface sources of submicron sea salt are significant but nevertheless still less than the loss of particles from highly depleting cloud systems. These submicron size salt particles are only moderately more hygroscopic than sulfate nuclei of similar size and compose a measurable source to the MBL budget. The larger, micron size particles that can serve as drizzle nuclei are much rarer and are not represented by our bulk CCN parameter. Parameterizations exist that specify sea salt flux as a function of wind speed, although they are a function of size, which poses a problem when representing CCN by a single bulk quantity.

[54] Our results show that cloud processing and entrainment effects (dilution or tapping the reservoir) dominate the MBL budget, which leads to the following possibility. If from remote sensing techniques or global chemistry models it is possible to obtain a representative free tropospheric value of CCN, or better yet the vertical profile of CCN, and assuming reasonable model entrainment rates, the CCN entrainment source term will be represented in the model. In a mesoscale simulation that is typically 6-48 hours long, a remotely sensed CCN profile, or a profile calculated in a large-scale chemistry model, would presumably become part of the reanalysis/update cycle. Incorporating these observations into the update cycle would reduce the importance of having highly accurate local representations of the secondary source rates (e.g., chemistry). For the purposes of forecasting, incorporating accurate estimates of free tropospheric aerosol concentration into model analysis cycles would be more important than highly constrained local CCN source rates.

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