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Submitted on 26 Feb 2008

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Influence of particle size and chemistry on the cloud nucleating properties of aerosols

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Received: 28 September 2007 – Published in Atmos. Chem. Phys. Discuss.: 5 October 2007
Revised: 10 January 2008 – Accepted: 20 January 2008 – Published: 26 February 2008

Abstract. The ability of an aerosol particle to act as a cloud condensation nuclei (CCN) is a function of the size of the particle, its composition and mixing state, and the supersaturation of the cloud. In-situ data from field studies provide a means to assess the relative importance of these parameters. During the 2006 Texas Air Quality – Gulf of Mexico Atmospheric Composition and Climate Study (TexAQS-GoMACCS), the NOAA RV Ronald H. Brown encountered a wide variety of aerosol types ranging from marine near the Florida panhandle to urban and industrial in the Houston-Galveston area. These varied sources provided an opportunity to investigate the role of aerosol sources and chemistry in the potential activation of particles to form cloud droplets. Measurements were made of CCN concentrations, aerosol chemical composition in the size range relevant for particle activation in warm clouds, and aerosol size distributions. Variability in aerosol composition was parameterized by the mass fraction of Hydrocarbon-like Organic Aerosol (HOA) for particle diameters less than 200 nm (vacuum aerodynamic). The HOA mass fraction in this size range was lowest for marine aerosol and highest for aerosol sampled close to anthropogenic sources. Combining all data from the experiment reveals that composition (defined by HOA mass fraction) explains 40% of the variance in the critical diameter for particle activation at the instrumental supersaturation (S) of 0.44%. Correlations between HOA mass fraction and aerosol mean diameter show that these two parameters are essentially independent of one another for this data set. We conclude that, based on the variability of the HOA mass fraction observed during TexAQS-GoMACCS, variability in particle composition played a significant role in determining the fraction of particles that could activate to form cloud droplets. Using a simple model based on Köhler theory and the assumption that HOA is insoluble, we estimate the degree to which calculated CCN concentrations are under- or overestimated if the variability in the HOA mass fraction that was observed during TexAQS-GoMACCS is neglected. The percent under- or overestimation in the CCN concentration is related to the source of the aerosol. Relative to the mean HOA mass fraction of 0.4±0.2 (average ±1σ standard deviation) for the entire experiment, CCN concentrations are underestimated by up to 50% (at 0.22% S) for aerosol sampled far from anthropogenic source regions as it had a lower HOA mass fraction and overestimated by up to 50% for organic-rich aerosol sampled near the source as it had a higher HOA mass fraction.

1 Introduction

In both the IPCC Third and Fourth Assessment Reports (IPCC, 2001, 2007), aerosol indirect forcing is assigned the largest source of uncertainty among all climate forcing mechanisms. In the Fourth Assessment Report, the radiative forcing due to the first indirect or cloud albedo effect is given a low level of scientific understanding for liquid water clouds. The cloud albedo effect occurs as the portion of aerosol that forms cloud condensation nuclei (CCN) increases in concentration and modifies the microphysical properties of clouds. For a fixed liquid water content, an increase in CCN will lead to enhanced cloud droplet number concentration, decreased droplet size, and enhanced cloud albedo (e.g., Twomey, 1977). The ability of any particle within a population of aerosol particles to act as a CCN and nucleate cloud droplets is a function of its size and chemical composition as well as the supersaturation of the air parcel. For a distribution of particles the spectrum of CCN with respect to supersaturation depends on the median diameter, standard deviation, number concentration and the internal mixing state. Composition affects CCN activity by determining molecular weight...
Cruise track in the GoMACCS study region colored by 
Feingold (2003) found that the aerosol number concentration 
activation will be most pronounced for particles with diam-
eters between about 40 and 200 nm (e.g., McFiggans et al., 
2005). Regardless of composition, smaller diameter particles 
will not activate under these conditions while larger diame-
ter particles will. Hence, it is this intermediate size range 
that is of interest when determining composition effects on 
CCN activation. It is significant, then, that this size range 
200 nm) often contains a large mass fraction of particu-
lar organic matter (POM). Furthermore, the POM in this 
size range tends to be composed of relatively low solubility 
changes in droplet concentration due to the presence of or-
ganics in aerosols varied from −86% to +110% (Ervens et 
al., 2005). This wide range is a result of variability in the 
treatment of composition parameters in the models includ-
solubility, molecular weight, and surface tension suppres-
sion. Most of these previous studies focused on the impact 
of organic acids and water soluble organic carbon. Petzold et 
al. (2005) investigated carbonaceous particles produced by 
combustion and found that only a small fraction activated to 
CCN. Furthermore, a high fraction of non-volatile organic 
matter in the particles caused a considerable increase in the 
activation diameter. 

Measurements from recent field campaigns have been used 
to assess the importance of particle size versus variability in 
chemical composition in determining CCN concentrations. 
Based on measurements of a limited range of aerosol compo-
sition encountered at a non-urban site in Germany, Dusek et 
al. (2006) reported that variation in the size distribution was 
able to explain 84 to 96% of the variance in measured CCN 
concentrations. Measurements of a broader range of aerosol 
composition during several aircraft campaigns indicated that 
a knowledge of both size and composition are required to ac-
curately deduce CCN concentrations in the absence of CCN 
measurements (Hudson, 2007). Here we investigate the roles 
of aerosol size and composition in determining CCN concen-
trations based on measurements made during the 2006 Texas 
Air Quality – Gulf of Mexico Atmospheric Composition and 
Climate Study (TexAQS-GoMACCS; hereafter GoMACCS) 
onboard the NOAA RV Ronald H. Brown. 

GoMACCS took place in 2006 from the end of July to the 
middle of September. Photochemical pollution and regional 
haze are common during this time of year in Texas. Between 
27 July and 11 September 2006, the NOAA RV Ronald H. 
Brown encountered a wide variety of aerosol types ranging 
from marine over the Atlantic Ocean near the Florida pan-
handle to urban and industrial in the Houston-Galveston area 
(Fig. 1). This wide variability in aerosol sources and chem-
ical composition provided an opportunity to investigate the 
role of chemistry in the activation of particles to form cloud 
droplets. For this purpose, measurements were made of the 
CCN number concentration at five different supersaturations, 
aerosol chemical composition, and the particle size distribu-
tion.

For realistic updraft velocities and corresponding supersat-
urations of warm clouds, composition effects on cloud drop 
activation will be most pronounced for particles with diam-
eters between about 40 and 200 nm (e.g., McFiggans et al., 
2006). Regardless of composition, smaller diameter particles 
will not activate under these conditions while larger diame-
ter particles will. Hence, it is this intermediate size range 
that is of interest when determining composition effects on 
CCN activation. It is significant, then, that this size range 
(<200 nm) often contains a large mass fraction of particu-
late organic matter (POM). Furthermore, the POM in this 
size range tends to be composed of relatively low solubility 

of the solute within a cloud droplet, density, solubility, de-
gree of dissociation, and surface tension. Understanding how 
these parameters influence particle activation to form CCN 
is essential to improving estimates of cloud droplet forma-
tion by global climate models (e.g., Abdul-Razzak and Ghan, 
2002; Fountakis and Nenes, 2005). 

The relative importance of aerosol parameters (size distri-
bution and composition) and dynamical parameters (updraft 
velocity and liquid water content) in controlling cloud albedo 
has been the subject of many recent studies. Modeling stud-
ies have investigated links between aerosol parameters and 
cloud microphysical properties. Using a cloud parcel model, 
Feingold (2003) found that the aerosol number concentration 
was consistently important for determining cloud drop effec-
tive radius while the importance of other parameters varied 
for different conditions. Modeling studies have also investi-
gated the influence of selected organic compounds and inor-
ganic/organic mixtures on cloud drop number concentration 
(e.g., Shantz et al., 2003; Nenes et al., 2002; Mircea et al., 
2002). A comparison of these studies revealed that predicted 

Fig. 1. Cruise track in the GoMACCS study region colored by (a) 
Rn and (b) HOA mass fraction. GoMACCS took place from late 
July to mid-September 2006. The portion of the cruise track from 
Charleston, SC to the GoMACCS study region is not shown.
hydrocarbon-like organic aerosol (HOA) while POM measured at larger diameters is composed of oxygenated organic aerosol (OOA) (e.g., Zhang et al., 2005a, b; Alfarra et al., 2004; Allan et al., 2003). HOA in the smaller size range may lead to fewer particles activating to form CCN compared to the case where the POM is composed only of OOA (McFiggans et al., 2006).

In this study, we relate the HOA mass fraction (HOAMF) for vacuum aerodynamic diameters (D_aero)<200 nm measured during GoMACCS to the critical diameter for activation (D_c). (A D_aero of 200 nm corresponds to a geometric diameter of 133 nm for a spherical particle with a density of 1.5.) The goal of this analysis is to examine the influence of particle composition on CCN activation for the variability in the aerosol observed during this experiment. In addition, the degree of under- or overestimation of the CCN concentration due to neglecting the variability in HOA mass fraction observed during GoMACCS is calculated using a simple model based on Köhler theory.

2 Methods

2.1 Aerosol sampling inlet

Sample air for all aerosol measurements was drawn through a 6-m mast. The entrance to the mast was 18 m above sea level and forward of the ship’s stack. The mast was automatically rotated into the relative wind to maintain nominally isokinetic flow and minimize the loss of supermicrometer particles. Air entered the inlet through a 5 cm diameter hole, passed through a 7° expansion cone, and then into the 20 cm inner diameter sampling mast. The flow through the mast was 1 m³ min⁻¹. The transmission efficiency of the inlet for particles with aerodynamic diameters less than 6.5 μm (the largest size tested) is greater than 95% (Bates et al., 2002).

The bottom 1.5 m of the mast were heated to establish a stable reference relative humidity (RH) for the sample air of 60±5%. On average, the aerosol was heated 2.5°C above the ambient temperature. Stainless steel tubes extending into the heated portion of the mast were connected to downstream aerosol instrumentation with either conductive silicon tubing or stainless steel tubing for analysis of organic aerosol.

The data reported here are based on air that was sampled only when the particle number concentration, the relative wind speed, and the relative wind direction all indicated that there was no possibility of contamination from the ship’s stack.

2.2 CCN concentration

A Droplet Measurement Technologies (DMT) CCN counter was used to determine CCN concentrations at supersaturations, S, of 0.22, 0.44, 0.65, 0.84, and 1.0%. Details concerning the characteristics of the DMT CCN counter can be found in Roberts and Nenes (2005) and Lance et al. (2006).

A multijet cascade impactor (Berner et al., 1979) with a 50% aerodynamic cutoff diameter of 1 μm was upstream of the CCN counter. The instrument was operated in two different modes. When the ship was located close to urban, industrial, or marine vessel sources such that aerosol concentrations fluctuated rapidly, a single supersaturation setting of 0.44% was often used. Away from sources when aerosol conditions were more stable, the five different supersaturations were cycled through over a 30 min period. For the multiple supersaturation mode, the first 2 min of each 6 min period were discarded so that only periods with stable supersaturations are included in the analyzed data set.

The CCN counter was calibrated before and during the experiment as outlined by Lance et al. (2006). An (NH₄)₂SO₄ aqueous solution was atomized with dry air, passed through a diffusional drier, diluted and then introduced to a Scanning Mobility Particle Sizer (SMPS, TSI). The resulting monodisperse aerosol stream was sampled simultaneously by the CCN counter and a water-based Condensation Particle Counter (WCPC, TSI) in order to determine the average activated fraction (CCN/ CN). This procedure was repeated for a range of particle sizes and instrumental supersaturations. Using this procedure, the instrument supersaturation is equal to the critical supersaturation of the particle obtained from the activation curve for an activated fraction of 50%. The critical supersaturation for a given particle size was calculated from Köhler theory (e.g., Fitzgerald and Hoppel, 1984). The supersaturations reported in the text are based on the calibrations and not the instrumental readout which disregards thermal efficiency. The difference between the calibrated values and those reported by the instrument were similar to the difference found by Lance et al. (2006). The uncertainty associated with the CCN number concentrations is estimated to be less than ±10% (Roberts and Nenes, 2005). Uncertainty in the instrumental supersaturation is less than ±1% for the operating conditions of this experiment (Roberts and Nenes, 2005).

2.3 Particle number size distributions

Size distributions from 20 to 200 nm and from 200 to 800 nm in geometric diameter were measured with two parallel differential mobility particle sizers (DMPS, University of Vienna (Winklmeyer, 1991) short and medium length columns, respectively) coupled to condensation particle counters (CPC model 3760A, TSI). The relative humidity of the sheath air for both instruments was controlled such that the measurement RH was approximately 60%. Mobility distributions were collected every 5 min. Details of the mobility distribution measurements and inversion methods are given by Bates et al. (2004) and Stratmann and Wiedensohler (1997).

Size distributions from 0.9 to 10 μm in aerodynamic diameter were measured with an aerodynamic particle sizer (APS model 3321, TSI). Modifications were made to the APS to reduce internal heating of the sample air so that the
measurement RH was close to 60%. Size distributions were collected every 5 min to match the DMPS scan time. APS size distributions were converted from aerodynamic to geometric diameters using densities based on the measured, time-dependent chemical composition (Quinn et al., 2002). The uncertainty associated with the number concentration derived from the size distribution measurements is estimated to be ±18% (Quinn et al., 2004).

Geometric number mean diameters ($D_{gn}$) were calculated from a lognormal fit to each measured size distribution. If the size distribution contained both an Aitken and accumulation mode, the fit was performed on the smaller Aitken mode. If only an accumulation mode was present in the submicrometer size range, it was used to determine $D_{gn}$.

2.4 Particle chemical composition

Concentrations of submicrometer non-refractory NH$_4^+$, SO$_4^{2-}$, NO$_3^-$, and POM were measured with a Quadrupole Aerosol Mass Spectrometer (Q-AMS, Aerodyne Research Inc., Billerica, MA). The AMS was downstream of a multijet cascade impactor with a 50% cutoff diameter of 1 µm (Berner et al., 1979). Sample air reaching the AMS was at an RH of 52±3.2%. The species measured by the AMS are referred to as non-refractory (NR) and are defined here as all the chemical components that vaporize at 550°C. These species include most organic components, inorganics such as ammonium nitrate and ammonium sulfate salts but not mineral dust, elemental carbon, or sea salt. The POM aerosol was divided into two fractions, a hydrocarbon-like organic aerosol (HOA) and an oxygenated organic aerosol (OOA) using a multiple linear regression of m/z 57 and m/z 44, respectively (Zhang et al., 2005a). The ionization efficiency of the AMS was calibrated every few days with dry monodisperse NH$_4$NO$_3$ particles using the procedure described by Jimenez et al. (2003). The instrument operated on a 5 min cycle with the standard AMS aerodynamic lens (Canagaratna et al., 2007).

The collection efficiency of the AMS is the product of the transmission of particles through the aerodynamic lens ($E_L$), the efficiency with which particles are focused by the lens and directed to the impactor-vaporizer ($E_S$), and the degree to which particles are vaporized and analyzed versus bounced off the impactor-vaporizer ($E_B$) (Huffman et al., 2005). Particle losses due to transmission through the lens were corrected by using the DMPS and APS-measured size distributions. This correction added, on average, 14±8% to the AMS total mass. Based on beam width probe data, there was no indication of particle loss due to $E_S$. $E_B$ is a function of particle water content and chemical composition (Allan et al., 2003). Comparison of the size corrected ($E_L$) AMS NR sulfate with sulfate simultaneously measured with a particle-into-liquid-sampler coupled to an ion chromatograph (PILS-IC) indicates that $E_B$ varied from 1 for acidic sulfate (ammonium to sulfate molar ratio of <0.5) to 0.54 for ammonium sulfate. Therefore, $E_B$ was assigned to each 5 min sample based on the AMS ammonium to sulfate molar ratio with $E_B$ as an exponential function of the ammonium to sulfate molar ratio varying from 0.54 to 1 for ammonium to sulfate molar ratios of 2 to 0.5. There was no indication from the AMS mass size distributions that the ammonium to sulfate molar ratio varied as a function of size over the accumulation mode size range. A linear regression of 5 min transmission and bounce corrected AMS sulfate concentrations versus PILS-IC sulfate concentrations yielded a slope of 0.95 and an $r^2$ of 0.81. The uncertainty in the AMS concentration measurements during GoMACCS was estimated at ±20%.

2.5 Radon

Radon was detected with a dual-flow loop, two-filter detector (Whittlestone and Zahorowski, 1998). The radon detector was standardized using radon emitted from a permeation tube. Background counts were measured with the air flow set to zero.

3 Results

To relate aerosol sources and transport to CCN formation, the data set was segregated in two ways. The first was based on geographical location and includes both offshore and inland sampling sites (Fig. 1). The offshore locations include a portion of the cruise track in the Atlantic Ocean as the ship transited from Charleston, SC to the GoMACCS study area. Additional offshore locations include the Gulf of Mexico during the initial transit to the Houston-Galveston area and subsequent visits over the course of the experiment. Inland locations include Galveston Bay which is the thoroughfare for ships transiting from the Gulf of Mexico to Houston, the Houston Ship Channel which is heavily impacted by marine vessel traffic and petrochemical and other industrial activities, Barbours Cut which is located at the entrance to the east-west portion of the ship channel and is the site of a major container and cruise terminal, Jacinto Port which is located on the north side of the Houston Ship Channel, and Freeport which is the site of a large chemical plant.

The second data sorting procedure was based on surface wind direction and radon concentrations. Radon was used in the data analysis to differentiate between sampled air from northerly flow that had been over the continent during the past day and “background” southerly flow from the Gulf of Mexico toward the continent. The radon threshold between continental and “background” air was 1000 mBq m$^{-3}$ (Fig. 1). This sorting led to three categories 1) Gulf-Southerly Flow which includes samples taken in the Gulf of Mexico during southerly flow and low radon concentrations and, hence, represents background air entering Texas, 2) Inland Texas-Southerly Flow which also includes samples taken during southerly flow and low radon concentrations.
but from inland locations and, thus, represents background air entering Texas plus local sources near the sampling site, and 3) Northerly Flow which includes samples taken during northerly flow and high radon concentrations and, therefore, represents continentally-influenced air masses impacted by both distant and local sources.

3.1 Aerosol composition and size during GoMACCS

3.1.1 Aerosol composition

Previously reported AMS measurements indicate several general features concerning the regional distribution of POM in terms of particle size and composition (Canagaratna et al., 2007). In general, in both rural and urban environments, the POM that occurs in the accumulation mode size range (200 to 500 nm $D_{\text{v,aero}}$) has a mass spectra that is characteristic of oxygenated organic molecules (e.g., Zhang et al., 2005a, b; Alfarra et al., 2004; Allan et al., 2003; Boudries et al., 2004). This OOA is typically internally mixed with inorganic species such as ammonium sulfate salts (e.g., Cubison et al., 2005). However, in urban environments there often is a second mode of POM with a smaller average mass mean diameter ($D_{\text{v,aero}} \sim 100$ nm) that has a mass spectrum characteristic of hydrocarbons (Allan et al., 2003; Drewnick et al., 2004; Zhang et al., 2005b) and that is very similar to what has been measured in fresh vehicle exhaust (Canagaratna et al., 2004; Schneider et al., 2005).

Results from GoMACCS are consistent with these previously reported measurements. The mass fraction of HOA for $D_{\text{v,aero}}<200$ nm often exceeded 0.5 for the inland portions of the cruise track (Galveston Bay, Barbours Cut, Beaumont, and Port Arthur) where urban and marine vessel emissions were most pronounced (Fig. 1). Size distributions of the POM components, sulfate, and POM mass fraction are shown in more detail in Fig. 2a for a period when the ship was docked for thirty hours at Barbours Cut on 4 and 5 August. The POM mass fraction is calculated as the mass concentration of POM divided by the total mass measured by the AMS. AMS size distributions averaged over this period show the occurrence of POM in the accumulation mode at about one third the mass concentration of sulfate. The majority of this POM was OOA. In contrast, POM dominated the Aitken mode (mass mean $D_{\text{v,aero}}$ of 160 nm) and was composed primarily of HOA. The POM mass fraction was 0.45 at $D_{\text{v,aero}}=200$ nm and increased steadily to near one at $D_{\text{v,aero}}=50$ nm.

Figure 2b shows the same information for a 13 h period on 11 September when the ship was offshore in the Gulf of Mexico. During this period, local winds were from the south at less than 5 m s$^{-1}$ and radon concentrations were low indicating that the sampled air mass had not had recent contact...
with land. In this case, sulfate dominated the submicrometer mass at all sizes such that the POM mass fraction was 0.25 or less for all particle diameters. The majority of the sulfate was most likely due to emissions from the large number of marine vessels in the upwind region (Bates et al., in preparation, 2008).

To compare the degree to which HOA contributed to the sub-200 nm mass versus the entire submicrometer size range, HOA, OOA, and sulfate mass fractions were calculated for these two size ranges. Mass fractions were calculated as the mass of the component divided by the total mass measured by the AMS. Average mass fractions for the periods spent in Barbours Cut, Galveston Bay, the Houston Ship Channel, and the Gulf of Mexico are shown in Fig. 2c. On average, for the inland sampling locations, sulfate dominated the submicrometer mass with OOA having the second largest mass fraction. Average submicrometer mass fractions of HOA were less than 0.14 for each of the inland locations (Barbours Cut: 0.13±0.11, Galveston Bay: 0.07±0.08, Houston Ship Channel: 0.11±0.08). The sub-200 nm mass fractions look very different, however, with average HOA of 0.53±0.20 at Barbours Cut, 0.47±0.21 in Galveston Bay, and 0.45±0.16 in the Houston Ship Channel. Relative to the inland sampling locations, both submicrometer and sub-200 nm HOA were lower for the offshore trips into the Gulf of Mexico. Averaged over all the times the ship spent in the Gulf of Mexico, the submicrometer HOA was 0.02±0.03 compared to a sub-200 nm value of 0.26±0.19. Figure 2a shows that not only the mass fractions but also the size distributions of HOA, OOA, sulfate are different within the sub-200 nm size range. Sulfate and OOA tail into this size range meaning that their largest concentrations occur at large diameters while HOA peaks in this size range and, therefore, has more broadly distributed concentrations throughout the size range.

Average submicrometer and sub-200 nm mass fractions are shown for the different wind-radon regimes in Fig. 2d. For all three regimes, the submicrometer mass is dominated by sulfate with OOA having the second largest average mass fraction. However, for the Inland Texas – Southerly Flow regime, HOAMF and OOA are nearly the same reflecting the close proximity of the ship to anthropogenic sources. The OOA is about three times greater than the HOA for the Northerly Flow regime reflecting the mix of distant and local sources in this category. Submicrometer average mass fractions for the Gulf-Southerly Flow regime are similar to the “Gulf of Mexico” category in Fig. 2b. For the two wind-radon regimes impacted by continental emissions, HOA dominated the sub-200 nm size range. The HOA for this size range averaged 0.51±0.21 for the Inland Texas-Southerly Flow regime and 0.42±0.23 for the Northerly Flow regime.

In summary, the particle size range most sensitive to composition effects in CCN activation was, for much of the experiment, dominated by HOA, an organic component whose mass spectrum is similar to those of diesel exhaust, lubricating oil, and freshly emitted traffic aerosols (Zhang et al., 2005a). In contrast, the organics within particles with $D_{aero}>200$ nm were dominated by a component with a mass spectrum indicative of aged, oxygenated organic aerosols. In the following analysis, the mass fraction of HOA for $D_{aero}<200$ nm was used to represent the variability of aerosol composition during the GoMACCS experiment because of its prevalence in this size range and its limited solubility which is expected to impact the CCN activation process.

### 3.1.2 Aerosol number size distribution

The geometric mean number diameter based on a lognormal fit of each measured size distribution was used to indicate the variability of particle size during GoMACCS. Only number modes contained in the submicrometer size range were considered. The geometric standard deviation, $\sigma_{\text{g}}$, or width of the mode also has been shown in modeling studies to affect cloud drop number concentrations (Feingold, 2003). At high particle concentrations, for a given $D_{\text{gn}}$ and total number concentration, increases in $\sigma_{\text{g}}$ lead to a decrease in the drop concentration because as the mode becomes broader, relatively more large particles are present and activated which leads to a suppression of the supersaturation. The decrease in supersaturation may lead to fewer particles being activated to CCN especially in polluted air masses dominated by larger particles. Near-source sampling locations (Barbours Cut and Houston Ship Channel) had high frequencies of lower values of $D_{\text{gn}}$ (<70 nm) (Fig. 3a). Larger frequencies of $D_{\text{gn}}>70$ nm occurred for Galveston Bay and Gulf of Mexico which are more distant from anthropogenic continental sources. Correspondingly, the local sources picked up under Inland-Texas-Southerly Flow conditions led to a high frequency of smaller $D_{\text{gn}}$ values while Gulf-Southerly Flow conditions had a high frequency of $D_{\text{gn}}>70$ nm. The Northerly Flow regime which included both local and more distant continental sources had more broadly distributed values of $D_{\text{gn}}$.

Both the sub-200 nm HOA mass fraction and the mean diameter displayed general trends in the context of sampling location and wind direction-radon regimes as discussed above. There was no significant correlation between these two parameters, however, for either the individual sample categories or for the overall data set. The coefficient of determination, $r^2$, for HOAMF versus $D_{\text{gn}}$ for the whole experiment was 0.10 indicating that the HOAMF could only explain about 10% of the variance in $D_{\text{gn}}$. 
3.2 Impact of composition on CCN formation

3.2.1 Calculation of critical diameter

The correlation between critical diameter for CCN activation \(D_c\) and aerosol composition was used to quantify the impact of composition on particle activation. \(D_c\) is defined in this analysis as the diameter at which

\[
\text{CCN}_{\text{measured}} = \text{CNC}_{\text{integrated}}
\]

where \(\text{CNC}_{\text{integrated}}\) is the integrated condensation nuclei concentration, was found by integrating the number-size distributions from the largest diameter measured down to the diameter where the above equation was satisfied. Uncertainty in Eq. (1) and, therefore in \(D_c\), is estimated at ±20% based on a quadrature of the errors in the number concentrations derived from the CCN counter (±10%) and the measured size distributions (±18%). The actual uncertainty in \(D_c\) will deviate from this estimate depending on the slope of the size distribution around \(D_c\), i.e., whether \(D_c\) is greater than or less than \(D_{gn}\).

Normalized frequency distributions of \(D_c\) are shown at \(S=0.44\%\) in Fig. 3b. Values of \(D_c\) calculated for the entire experiment extended up to near 170 nm. The highest frequency of small values of \(D_c\) (<80 nm) corresponded to measurements of marine aerosol made as the ship transited from South Carolina to the study region (denoted here as Atlantic Marine). Locations with a high frequency of \(D_c\) between 70 and 90 nm included the Gulf of Mexico and Galveston Bay. These locations are impacted by anthropogenic emissions but are not immediately downwind. Values of \(D_c\) greater than 90 nm were most frequent for inland sampling locations next to urban and industrial sources (Barbours Cut and the Houston Ship Channel). A comparison of values of \(D_c\) calculated for the different wind-radon regimes reveals distinct differences similar to those for the geographical sampling locations (Fig. 3b). The Gulf-Southerly Flow regime had the highest frequency of values at or less than 80 nm while the Inland Texas-Southerly Flow regime was just the opposite with the highest frequency of values at or greater than 90 nm. The highest frequency of values for the Northerly Flow regime occurred between 70 and 90 nm which spans those of the other two regimes.

3.2.2 Relationship between HOA mass fraction and critical diameter

The HOA mass fraction for the sub-200 nm size range is plotted versus \(D_c\) in Fig. 4 for the entire experiment and the geographical locations identified above and in Fig. 5.
for the three wind-radon regimes. These plots include all measurements taken at $S=0.44\%$. Over the course of the experiment, HOA$_{MF}$ spanned the maximum possible range from near zero to near one. $D_c$ ranged from around 50 nm, which corresponds to $D_c$ of ammonium sulfate at $S=0.44\%$, to near 170 nm. For each geographical location, an increase in HOA$_{MF}$ corresponded to an increase in $D_c$ (Fig. 4). A regression of these two parameters for all measurements made at $S=0.44\%$ yields a coefficient of determination, $r^2$, of 0.4 indicating that the HOA$_{MF}$ explained 40% of the variance in $D_c$. The slope corresponds to a change in $D_c$ of around 40 nm (75 to 115 nm) for the full range of HOA$_{MF}$ observed.

Positive correlations also were found for each of the three wind-radon regimes although the degree of correlation varied (Fig. 5). The correlation was strongest ($r^2=0.41$) for the Northerly Flow regime where HOA$_{MF}$ varied between near zero and near one and mass concentrations were high so that the AMS signal-to-noise ratio was high. The correlation was weaker for the Inland Texas-Southerly Flow regime as concentrations were lower and signal-to-noise ratio was higher. This noise issue and the occurrence of a narrower range of HOA$_{MF}$ most likely contributed to a poor correlation ($r^2=0.1$) for the Gulf-Southerly Flow regime.

The HOA$_{MF}$–$D_c$ relationship is a strong function of supersaturation. Segregating the data set by measurement supersaturation reveals a positive slope at each supersaturation but the magnitude of the slope and the $r^2$ values decreases with increasing supersaturation (Table 1). As the supersaturation increases, more smaller particles will activate. Hence, the change in slope may be due to a less variable particle composition (number of soluble molecules or ions per unit mass) in the lower end of Aitken size range. This response to increasing supersaturation may also be due to non-linearities in the Köhler equation. For comparison, a similar regression analysis (i.e., with the data segregated by measurement supersaturation) was performed on the sub-200 nm POM mass fraction and $D_c$. As for HOA$_{MF}$ versus $D_c$, a positive slope was found at each value of $S$ with the magnitude of the slope decreasing with increasing $S$ (Table 1). However, the slope and $r^2$ values at each supersaturation were less than those for the HOA$_{MF}$–$D_c$ relationship. All $r^2$ values were less than or equal to 0.2 indicating only a weak correlation between POM mass fraction and $D_c$. Hence, the chemical properties of HOA that affect CCN activation are distinct from those of the bulk POM aerosol.

A multivariate factor analysis was performed to further assess the correlation between critical diameter and composition. Factor analysis often is used to separate chemical species and other relevant parameters into different groups based on their degree of covariance (e.g., Sweet and Vermette, 1992; Millet et al., 2005; Quinn et al., 2006). Parameters with a high degree of covariance are grouped together into factors. The analysis results in a loading matrix that reveals the strength of the association between parameters within and between factors. The analysis performed here was done using a principal component method with varimax rotation (SYSTAT 11, SYSTAT Software, Inc.). The goal was to test for the degree of covariance between aerosol component mass fractions ($\text{SO}_4^{2-}$, $\text{NH}_4^+$, OOA, and HOA) in the submicron and sub-200 nm size ranges and $D_c$ and, in particular, to determine with which variables $D_c$ was most strongly correlated.

Five factors explained 91% of the total variance. Factor one, which contained a high loading for $D_c$ ($-0.84$), explained 27% of the total variance in the parameters included in the factor analysis. Also highly loaded on this factor were the sub-200 nm HOA ($-0.90$) and $\text{SO}_4^{2-}$ mass fractions.

<table>
<thead>
<tr>
<th>% Supersaturation</th>
<th>Slope</th>
<th>y-intercept</th>
<th>$r^2$</th>
</tr>
</thead>
<tbody>
<tr>
<td>HOA Mass Fraction versus Critical Diameter</td>
<td>0.22</td>
<td>57</td>
<td>96</td>
</tr>
<tr>
<td></td>
<td>0.44</td>
<td>43</td>
<td>75</td>
</tr>
<tr>
<td></td>
<td>0.65</td>
<td>32</td>
<td>64</td>
</tr>
<tr>
<td></td>
<td>0.84</td>
<td>28</td>
<td>62</td>
</tr>
<tr>
<td></td>
<td>1.0</td>
<td>19</td>
<td>61</td>
</tr>
<tr>
<td>POM Mass Fraction versus Critical Diameter</td>
<td>0.22</td>
<td>38</td>
<td>94</td>
</tr>
<tr>
<td></td>
<td>0.44</td>
<td>32</td>
<td>70</td>
</tr>
<tr>
<td></td>
<td>0.65</td>
<td>18</td>
<td>66</td>
</tr>
<tr>
<td></td>
<td>0.84</td>
<td>17</td>
<td>63</td>
</tr>
<tr>
<td></td>
<td>1.0</td>
<td>12</td>
<td>61</td>
</tr>
</tbody>
</table>

Table 1. Coefficients of linear regression for HOA and POM mass fractions ($D_{vaero}<200\text{ nm}$) vs. critical diameter at 5 supersaturations.
(+0.64), indicating a strong covariance between them and \( D_c \). A high HOA mass fraction forced a larger \( D_c \) value for a given supersaturation because the particle, as a whole, had fewer water soluble molecules or ions. The positive loading for the sub-200 nm SO\(_4^2\) mass fraction indicates an increase in soluble mass led to a decrease in \( D_c \). Hence, the multivariate analysis confirms the strong relationship between composition and critical diameter within this data set. Factor four, which explained 15% of the total variance had a high loading for only \( D_{\text{pet}} \) (+0.92) indicating it was independent from all other parameters included in the factor analysis.

3.3 Modeled sensitivity of CCN concentration to observed variability in composition and particle size

A model study based on Köhler theory was performed to determine to what degree calculated CCN concentrations would be under- or overestimated if the variability in the HOA mass fraction observed during GoMACCS was neglected. The equilibrium vapor pressure over the surface of a solution droplet is described by the Köhler Equation (e.g., Fitzgerald and Hoppel, 1984)

\[
S = \left( \frac{e'}{e_s} - 1 \right) \approx \frac{2A}{d} - \frac{B d_3}{d^3} \tag{2}
\]

where \( e' \) is the equilibrium vapor pressure over the curved surface of a solution droplet, \( e_s \) is the equilibrium vapor pressure over a flat surface of pure water,

\[
A = \frac{2\sigma M_w}{\rho_w R_v T} \tag{3}
\]

and

\[
B = \frac{i \rho_s M_w}{\rho_u M_r} \tag{4}
\]

Here, \( d \) and \( d_o \) are the droplet and dry particle diameters, \( \sigma \) is the surface tension, \( M_w \) and \( M_r \) are the molecular weights of water and solute, \( \rho_w \) and \( \rho_s \) are the densities of water and solute, \( R_v \) is the gas constant for water vapor, \( T \) is the temperature, \( i \) is the van’t Hoff factor, and \( \varepsilon \) is the water soluble fraction of the dry particle. By taking the first derivative of Eq. (1) with respect to diameter and finding the maximum, the following equation relating critical supersaturation (\( S_c \)) to \( D_c \) can be derived (e.g., Rogers and Yau, 1989; Corrigan and Novakov, 1999; Hudson, 2007)

\[
S_c = \left[\frac{32A^3}{27B}\right]^{1/2} D_c^{-3/2} \tag{5}
\]

Using Eq. (5), \( D_c \) was calculated for \( S_c \) values of 0.22, 0.44, and 1.0% which correspond to three of the measurement supersaturation values (5) used during the experiment. CCN concentrations for \( S_c =0.22, 0.44, \) and 1.0% were calculated by integrating a modeled unimodal, log-normal size distribution over all diameters greater than the \( D_c \) that was found to correspond to the value of \( S_c \) using Eq. (5). Modeled size distributions were constructed using a geometric mean diameter varying between 20 and 140 nm. For each size distribution regardless of \( D_{\text{pet}} \), the total number concentration was normalized to 3000 cm\(^{-3}\) and the geometric standard deviation was set to 1.5. Using this method, CCN concentrations were calculated for a matrix (201 \( \times \) 201) of insoluble mass fractions ranging from 0 to 1 and mean diameters ranging from 20 to 140 nm.

The percent under- and overestimation of the CCN concentration due to neglecting the variability in the HOA mass fraction observed during GoMACCS was calculated by taking the difference between a matrix where the insoluble fraction was made constant at 0.4 for all diameters and a matrix where the insoluble mass fraction varied from 0 to 1.0 at each diameter. Hence, the base case was an insoluble mass fraction of 0.4 which corresponded to the average sub-200 nm HOA\(_{\text{MF}}\) for GoMACCS. The end result for calculated CCN concentrations and percent under- and overestimation of CCN concentrations is shown in Fig. 6.

Several assumptions made in this analysis warrant further discussion. Assuming that the HOA\(_{\text{MF}}\) represents the insoluble mass fraction requires assuming not only that the measured HOA was insoluble but that all other chemical components present were fully or highly soluble. As stated above, the mass spectrum of HOA is characteristic of long chain hydrocarbons and is similar to spectra measured for fresh vehicle exhaust and lubricating oil. Based on this information, assuming that HOA is insoluble is reasonable. Furthermore, this assumption is supported by Petzold et al. (2005) who, based on measurements of combustion particles generated in a gas turbine engine, concluded that carbonaceous particles are very poor CCN. Furthermore, Saxena et al. (1995) reported that for urban aerosol, organic compounds decrease water adsorption by the inorganic fraction of the aerosol which, presumably, would lead to fewer particles being activated to CCN. Finally, based on simultaneous measurements of the hygroscopic growth factor and HOA mass concentration, Cubison et al. (2006) reported that fresh, urban aerosol emissions dominated by HOA are virtually insoluble.

The difference between the HOA\(_{\text{MF}}\) and \( D_c \) relationship and the POM mass fraction and \( D_c \) relationship shown in Table 1 indicates that the HOA measured during GoMACCS had chemical properties different from the bulk POM aerosol. The result of the factor analysis (\( D_c \) being proportional to the HOA\(_{\text{MF}}\) and inversely proportional to the sulfate and OOA mass fractions) indicates a similarity between the solubility of OOA and sulfate while HOA was distinctly different. Finally, measurements of marine aerosol when HOA\(_{\text{MF}}\) were near zero and \( D_c \) values were near that of (NH\(_4\))\(_2\)SO\(_4\) (Fig. 5 – Gulf-Southerly Flow) indicate that highly soluble aerosol was encountered during the experiment.

This analysis only includes composition effects on CCN activation that are associated with the fraction of insoluble
material in the aerosol. In principle, the model could be modified to include chemical effects such as surface tension changes. However, the lack of surface tension data for the complex composition and mixture of atmospheric aerosol encountered would make the resulting calculations highly uncertain and would not necessarily improve the result.

The combined effects of HOA mass fraction, mean diameter, and supersaturation on calculated CCN concentrations are shown in Fig. 6a–c. As expected, relatively few particles are activated to form CCN for small diameter aerosol with a large insoluble mass fraction. Conversely, most particles are activated to form CCN for large aerosol that is composed primarily of soluble species. Also as expected, as S increases, only the smallest particles with the smallest insoluble fraction remain unactivated.
Superimposed on Fig. 6d–e is a box (shown expanded in Fig. 6g–h) representing the range of composition and mean diameters observed during GoMACCS. Combining the measured variability with the model output allows the calculated CCN concentrations and percent under- and overestimation in calculated CCN concentrations due to neglecting the observed variability in HOA$^{\text{MF}}$ to be put into “real-world space”. The box representing GoMACCS observed variability is based on the standard deviation (1σ) of the mean of the HOA$^{\text{MF}}$ and $D_{\text{gn}}$ averaged over the entire experiment. Hence, it is a conservative estimate of the variability and does not include the full range of values observed. The modeled CCN concentrations and percent under- and overestimation in calculated CCN concentrations for each corner of the GoMACCS box relative to the base case of an HOA$^{\text{MF}}$ of 0.4 are reported in Table 2.

Calculated CCN concentrations corresponding to the range of observed variability in HOA$^{\text{MF}}$ (insoluble mass fraction) are a strong function of supersaturation and mean diameter (Fig. 6a–c and Table 1). Figure 6a shows that, for $S=0.22$%, an increase in the HOA$^{\text{MF}}$ from 0.2 to 0.6 results in a decrease in CCN concentration from 368 to 125 cm$^{-3}$ or a decrease of 66%. In contrast, Fig. 6c shows that for $S=1.0$%, the same increase in HOA$^{\text{MF}}$ results in a decrease in the CCN concentration of only 14%. At $S=0.22$ and 1.0% and $D_{\text{gn}}=100$ nm, the change in HOA$^{\text{MF}}$ from 0.2 to 0.6 results in a decrease in CCN concentration of 31 and <1%, respectively. Figure 6d–f shows the percent under- and overestimation in calculated CCN concentrations due to neglecting the variability in HOA$^{\text{MF}}$ (insoluble mass fraction) observed during GoMACCS. The GoMACCS box is superimposed on Fig. 6d–f and expanded and plotted full-scale in Fig. 6g–i. At $S=0.22$% and a mean $D_{\text{gn}}$ of 50 nm, an increase in the HOA$^{\text{MF}}$ from the base case of 0.4 to the +1σ standard deviation of 0.6 results in an overestimation of the CCN concentration by 49% (Table 1). A decrease to the −1σ standard deviation of 0.2 results in an underestimation of 52%. For the same supersaturation but a mean $D_{\text{gn}}$ of 100 nm, an increase in the HOA$^{\text{MF}}$ from 0.4 to 0.6 results in a 21% overestimation in the CCN concentration while a decrease from 0.4 to 0.2 results in a 14% underestimation. At $S=1.0$%, the same changes in HOA$^{\text{MF}}$ result in minimal under- or overestimates in the CCN concentration of <10%. Overall, for the variability in composition observed during GoMACCS, the impact on the calculated CCN concentration of neglecting the variability in the observed HOA$^{\text{MF}}$ is significant for $S=0.44$% and lower.

### Table 2. Calculated CCN concentrations at three supersaturations for mean diameters of 50 and 100 nm and HOA$^{\text{MF}}$ of 0.2 and 0.6. Also shown is the percent under- or overestimate of CCN concentrations for HOA$^{\text{MF}}$ of 0.2 and 0.6 relative to the base case of HOA$^{\text{MF}}=0.4$.

<table>
<thead>
<tr>
<th>$S$ (%)</th>
<th>$D_{\text{gn},1}$ (nm)</th>
<th>$D_{\text{gn},2}$ (nm)</th>
<th>HOA$^{\text{MF}}$</th>
<th>CCN (cm$^{-3}$) at $D_{\text{gn},1}$</th>
<th>CCN (cm$^{-3}$) at $D_{\text{gn},2}$</th>
<th>% difference from base case at $D_{\text{gn},1}$</th>
<th>% difference from base case at $D_{\text{gn},2}$</th>
</tr>
</thead>
<tbody>
<tr>
<td>0.22</td>
<td>50</td>
<td>100</td>
<td>0.2</td>
<td>368</td>
<td>2120</td>
<td>−52</td>
<td>−14</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>0.6</td>
<td>125</td>
<td>1470</td>
<td>+49</td>
<td>+21</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>0.2</td>
<td>1470</td>
<td>2860</td>
<td>−25</td>
<td>−3.0</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>0.6</td>
<td>830</td>
<td>2600</td>
<td>+30</td>
<td>+6.4</td>
</tr>
<tr>
<td>0.44</td>
<td>50</td>
<td>100</td>
<td>0.2</td>
<td>2720</td>
<td>3000</td>
<td>−5.3</td>
<td>−0.14</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>0.6</td>
<td>2330</td>
<td>2980</td>
<td>+10</td>
<td>+4.0</td>
</tr>
<tr>
<td>1.0</td>
<td>50</td>
<td>100</td>
<td>0.2</td>
<td></td>
<td></td>
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<td></td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>0.6</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

A more detailed presentation of data from GoMACCS is shown superimposed on the modeled percent under- and overestimation of CCN concentration plots in Fig. 7. Here, average mean $D_{\text{gn}}$ values are plotted versus HOA$^{\text{MF}}$ for the specific geographical sampling locations and for the three wind-radon regimes. The lowest HOA$^{\text{MF}}$ and largest sub-200 nm mean diameters correspond to the Atlantic Marine and Gulf of Mexico sampling locations as well as the Gulf-Southerly Flow wind-radon regime. Aerosol in each of these cases was sampled away from continental anthropogenic sources and had a sub-200 nm composition dominated by sulfate and/or OOA; the HOA$^{\text{MF}}$ was less than 0.2 at some diameters. At $S=0.22$%, the percent underestimation in calculated CCN concentrations relative to the base case of an HOA$^{\text{MF}}$ (insoluble mass fraction) of 0.4 ranged from greater than 60% for Atlantic Marine to between 20 and 40% for the Gulf of Mexico and Gulf-Southerly Flow regime.

By comparison, model CCN concentrations were overestimated for sampling locations next to continental anthropogenic sources (Barbours Cut, Galveston Bay, Houston Ship Channel). In addition, CCN concentrations were overestimated for the Inland-Southerly Flow regime, where the aerosol was a result of local industrial and urban sources and background Gulf of Mexico aerosol, and for the Northery Flow regime which was impacted by both near and distant anthropogenic sources. The highest HOA$^{\text{MF}}$ were observed at Barbours Cut and during the Inland-Southerly Flow regime for mean diameters less than 60 nm. As a result, CCN concentrations were overestimated by greater than 60% for

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larger mean diameters (between 70 and 120 nm), the HOA
was still sufficiently large relative to the base case value of
0.4 to result in an overprediction of CCN concentrations up
to 20%.

4 Conclusions

The mass fraction of HOA in the $D_{\text{aero}} < 200$ nm size range
was used to represent the observed variability in chemical
composition during GoMACCS and to assess the sensitivity
of CCN activation to composition. For sampling locations
impacted by urban, industrial, and marine vessel emissions,
HOA dominated the mass in the sub-200 nm size range. A re-
gression of the sub-200 nm HOA$_{\text{MF}}$ versus critical diameter
for all measurements made at 0.44% $S$ resulted in an $r^2$ value
of 0.4 indicating that HOA could explain 40% of the variance
in $D_c$. An increase in the HOA$_{\text{MF}}$ from 0 to 1 corresponded
to an increase in $D_c$ of 40 nm.

Model calculations, which assumed that HOA was com-
pletely insoluble, were performed to determine the percent
under- or overestimation in the calculated CCN concentra-
tion if the variability in the HOA$_{\text{MF}}$ observed during Go-
MACCS were neglected. The mean HOA$_{\text{MF}}$ over the entire
experiment was 0.4 with a 1σ standard deviation of ±0.2. At
a mean diameter of 50 nm and a supersaturation of 0.22%,
neglecting the 1σ standard deviation resulted in an under-
or overestimation of the CCN concentration of about 50%. Per-
cent overestimations of CCN concentrations were largest for
aerosol sampled from inland locations in close proximity to
anthropogenic sources due to higher HOA$_{\text{MF}}$ but still con-
siderable for aerosol sampled further offshore in the Gulf of
Mexico.
The calculations presented here did not include other chemical effects of the HOA on CCN activation (e.g., surface tension) due to a lack of information about the chemical properties of the HOA. They were able, however, to indicate the importance of considering the unique composition of the sub-200 nm size range which is the size range where chemical effects are most pronounced in CCN activation and where the majority of the observed HOA is found. In addition, the unique combination of measurements and model calculations presented here serve to relate errors in CCN calculations to observed variability in aerosol composition and size. Further measurements of the chemical composition in this size range and in different geographical regions are required to refine the calculations presented here.

Acknowledgements. This work was supported by the NOAA Climate Program Office, the NOAA Health of the Atmosphere Program, and the Texas Air Quality Study. We thank D. Hamilton, J. Johnson, K. Schulz, C. Hoyle and the officers and crew of the Ronald H. Brown for logistical, technical, and scientific support. This is PMEL contribution number 3136.

Edited by: J. Curtius

References


