Atmos. Chem. Phys. Discuss., 11, 27913–27936, 2011 www.atmos-chem-phys-discuss.net/11/27913/2011/ doi:10.5194/acpd-11-27913-2011 © Author(s) 2011. CC Attribution 3.0 License.



This discussion paper is/has been under review for the journal Atmospheric Chemistry and Physics (ACP). Please refer to the corresponding final paper in ACP if available.

Decreasing particle number concentrations in a warming atmosphere and implications

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Received: 22 August 2011 - Accepted: 29 September 2011 - Published: 14 October 2011

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Published by Copernicus Publications on behalf of the European Geosciences Union.

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Abstract

New particle formation contributes significantly to the number concentration of condensation nuclei (CN) as well as cloud CN (CCN), a key factor determining aerosol indirect radiative forcing of the climate system. Using a physics-based nucleation mechanism that is consistent with a range of field observations of aerosol formation, it is shown that 5 projected increases in global temperatures could significantly inhibit new particle, and CCN, formation rates worldwide. An analysis of CN concentrations observed at four NOAA ESBL/GMD baseline stations since the 1970s and two other sites since 1990s reveals long-term decreasing trends consistent with these predictions. The analysis also suggests, owing to larger observed CN reductions at remote sites than can be 10 explained by the basic nucleation mechanism, that dimethylsulphide (DMS) emissions may be decreasing worldwide with increasing global temperatures, implying a positive DMS-based cloud feedback forcing of the climate ("CLAW"). The combined effects of rising temperatures on aerosol nucleation rates, and possibly on DMS emissions, may imply substantial decreases in future tropospheric particle abundances associated 15

with global warming, delineating a potentially significant feedback mechanism that increases Earth's climate sensitivity to greenhouse gas emissions. Further research is needed to quantify the magnitude of such a feedback process.

1 Introduction

- Atmospheric particles affect the Earth's energy budget directly by scattering solar radiation, and indirectly by acting as cloud condensation nuclei (CCN), which affect cloud optical properties and influence precipitation (e.g., Twomey, 1977). The magnitude of aerosol indirect radiative forcing is poorly constrained in climate models, and represents one of the greatest remaining uncertainties in assessing climate change (IPCC, 2027). A magnitude of a thread of the greatest remaining uncertainties in assessing climate change (IPCC, 2027).
- ²⁵ 2007). A major source of atmospheric CCN is the secondary particle formation frequently observed in the atmosphere (Pierce and Adams, 2007; Makkonen et al., 2009;



Wang and Penner, 2009; Yu and Luo, 2009; Spracklen et al., 2010; Kazil et al., 2010).
 The non-linear dependence of aerosol nucleation rates on key atmospheric parameters, and the influence of aerosol formation on CCN populations, points to a potentially important climate feedback mechanism involving interactions between particle nucle ation, CCN production, cloud microphysics, and climatic responses.

Ambient atmospheric temperatures (*T*) and sulfuric acid vapor concentrations $([H_2SO_4])$ are the dominant factors controlling particle nucleation events in many regional settings (although other parameters, such as relative humidity and ionization rates, can also contribute in determining nucleation rates; e.g., Yu, 2010). In the past, it was suggested that future climatic warming might change oceanic emissions of dimethylsulphide (DMS), thus influencing $[H_2SO_4]$, sulfate aerosols, and the indirect radiative forcing of marine stratus clouds, defining a climate feedback process (i.e., the CLAW hypothesis; Charlson et al., 1987). After more than two decades of study, however, the strength and even the sign (i.e., negative or positive) of the CLAW

- feedback process remain ambiguous (e.g., Ayers and Cainey, 2007; Kloster et al., 2007; Woodhouse et al., 2010). In contrast to the large number of studies considering CLAW (~ 1500 publications since 1987, according to Ayers and Cainey, 2007), very few investigations have been carried out to quantify the direct effects of climate change (specifically, temperature variations) on new particle and CCN formation rates,
- while the associated climate feedback processes, which offer a more direct physical linkage, have never been investigated. Hence, in this study, we seek to quantify the magnitude of a positive climate system feedback involving the influence of temperature on particle nucleation rates. Long term trends in CN concentrations, derived for the first time from six observational stations with ~ 15–35 yr records of CN data, appear to
- ²⁵ support such a feedback mechanism. Moreover, a consistent interpretation of the CN data, as presented below, may also indicate that the sign of CLAW feedback process is likely to be positive that is, global warming might be enhanced through temperature sensitive changes in DMS emissions (although no direct evidence of the nature of the temperature-DMS relationship is presented here).



2 Effect of temperature increase on global particle formation rates and concentrations

Physically, temperature (*T*) is a key parameter determining particle nucleation rates (*J*). Figures 1 and 2 show the dependence of *J* on *T* based on several different nucleation theories. In Fig. 1, the sensitivity of *J* to *T* has been determined using a physicsbased ion-mediated nucleation (IMN) model that incorporates recently available thermodynamic data (Yu, 2010) and has been tested against detailed multiple-instrument measurements of freshly nucleated particles, including their electrical charge state (Yu and Turco, 2011). The IMN reduces to binary homogeneous nucleation (BHN) (Yu, 2007) when the ionization rate is zero. The percentage change in the nucleation rate (*J*) (i.e., PC_{*J*}) per degree increase in *T* is a non-linear function of temperature. IMN rates are very sensitive to temperature as *J* values increase from insignificant (<~ 0.01 cm⁻³ s⁻¹) to significant (>~ 1 cm⁻³ s⁻¹). At *J* = 0.5 cm⁻³ s⁻¹, under the conditions considered in Fig. 1, the values of PC _{*J*} based on the IMN model are in the range

¹⁵ of -80--20 % per °C. After $J_{\rm IMN}$ reaches a significant value (~ 1-20 cm⁻³ s⁻¹), further decreases in *T* (other parameters fixed) have small effects, because nucleation under such conditions is limited by the ionization rate. When *T* is very low, binary homogeneous nucleation (BHN) becomes dominant and PC_J for IMN approaches that for BHN. Compared to BHN alone, IMN yields larger PC_J at higher ambient temperatures, but smaller values at lower temperatures. If averaged over the entire ambient temperature range of interest, PC_J values for BHN are greater than those for the integrated IMN

mechanism. Figure 2 shows a similar or larger effect of temperature on nucleation rates based on a different BHN (Vehkamaki et al., 2002) and several ternary homogeneous nucleation

²⁵ (THN) models (Napari et al., 2002; Yu, 2006; Merikanto et al., 2007). The THN model of Napari et al. (2002), now known to overestimate the THN rates significantly (Yu, 2006; Merikanto et al., 2007), gives the largest values of PC_J . It should be noted that some unknown or yet to be established nucleation mechanisms may also contribute



to the production of new particles in the atmosphere. We expect that such nucleation mechanisms would also be quite sensitive to temperature, as this is a key parameter controlling the saturation vapor pressures of precursors, stability of pre-nucleation clusters, and thus nucleation rates.

- In order to confidently assess the significance of the temperature feedback mechanism associated with new particle formation and CCN evolution, a global aerosol model that can treat particle microphysical processes – especially nucleation and growth – is essential. Baseline aerosol simulations should also be carefully validated against observational data. Yu and Luo (2009) incorporated an advanced particle microphysics
- (APM) model into GEOS-Chem, a global 3-D model of atmospheric composition driven by assimilated meteorological data from the NASA Goddard Earth Observing System 5 (GEOS-5). The GEOS-Chem model has been developed and used by many research groups and contains a number of state-of-the-art modules treating various chemical and aerosol processes (e.g., Bey et al., 2001; Liu et al., 2001; Martin et al., 2003;
- Park et al., 2004; Evans and Jacob, 2005; Liao et al., 2007; Fountoukis and Nenes, 2007; Trivitayanurak et al., 2008; Henze et al., 2008; Yu and Luo, 2009) with up-to-date key emission inventories (e.g., Guenther et al., 2006; Bond et al., 2007; Zhang et al., 2009). The APM model in GEOS-Chem is optimized to accurately simulate the formation of secondary particles and their growth to CCN sizes, with high size resolution for
- ²⁰ particles in the size range of 1.2–120 nm (Yu and Luo, 2009). Our previous validation studies indicate that the predicted total particle number concentrations (with diameters larger than ~ 3 nm, and ~ 10 nm) agree quite well (generally within a factor of two) with a comprehensive set of land-, ship-, and aircraft- based measurements (Yu and Luo, 2009; Yu et al., 2010; Luo and Yu, 2011).
- The results presented below are based on a one-year simulation (October 2004– December 2005, with the first 3 months as spin-up) using GEOS-Chem v8-02-04 + APM, with nucleation rates predicted by the IMN mechanism (Yu, 2010) and the condensation of low volatile secondary organic gases from successive oxidation aging (Yu, 2011) taken into account. The horizontal resolution is 2° × 2.5° and there are



47 vertical layers in the model (surface to 0.01 hpa). To estimate temperature sensitivity, two runs were inter-compared; one using baseline temperatures, and a second with all temperatures incremented by 1 °C; differencing the results provides the sensitivity per °C around the baseline climate state. In the real atmosphere, global temperature change is inhomogeneous and has many other associated changes (meteorological fields, emissions, chemistry, etc.). The sensitivity study presented here is aimed to isolate and illustrate the impact of temperature change on nucleation and particle number concentrations.

Figure 3 illustrates the horizontal (i.e., averaged within a 0–2 km surface layer) and vertical (i.e., zonally averaged) spatial distributions of annual mean percentage change (PC) in the nucleation rate and CN10 (i.e., total number of particles larger than 10nm diameter) concentrations per °C. It is clear from Fig. 3 that, throughout most of the troposphere, annual mean nucleation rates decrease by ~ 3–30% for each °C of warming. The maximum decrease can reach values exceeding 30% °C⁻¹ in the tropical lower troposphere, where *T* is high and *J* is small, consistent with the dependence of PC_J on *T* shown in Fig. 1. Figure 3b indicates that the regions where large decreases

in *J* occur extend from the surface up to ~ 400 mb in the tropics $(30^{\circ} \text{ S}-30^{\circ} \text{ N})$. The relatively lower sensitivity of *J* to *T* over Antarctica and in the upper troposphere is a result of very cold temperatures, such that nucleation is more strongly limited by $[H_2SO_4]$ in these regions.

Figure 3c, d indicates that, as a result of the reduced nucleation rates, the annual mean CN10 concentrations decrease by $\sim 2-8\%$ per °C of warming in most of the troposphere. Similar to the sensitivity of J, the maximum decrease in CN10 occurs in the tropical regions, and can exceed 10%. The zonally-averaged decreases in CN10 per degree of warming (Fig. 3d) are largest in the tropical lower troposphere (to 5% or more). The effect of increasing *T* on CN10 concentrations is relatively small in the polar regions and in the tropical upper troposphere.

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Global surface temperatures have increased at a rate of $\sim 0.17\,^\circ\text{C}/\text{decade}$ on average since the 1970s, varying from -0.25 to $+0.75\,^\circ\text{C}/\text{decade}$ in different regions



(IPCC, 2007). According to the present results, such long-term trends should have led to noticeable changes in nucleation rates and CN10 abundances. As it happens, beginning in the middle/late 1970s, NOAA/ESRL's Global Monitoring Division (GMD) has collected long-term measurements of CN at four remote baseline stations at Bar-

- ⁵ row, Alaska (BRW), Mauna Loa Observatory, Hawaii (MLO), American Samoa (SMO), and South Pole Observatory (SPO) (Bodhaine, 1983). The GMD has another site at Bondville, Illinois (BND) which has recorded CN values since 1994. In addition, the German Antarctic station Neumayer (NEU) has measured CN since 1993 (Weller and Lampert, 2008). To our knowledge, BRW, MLO, SMO, SPO, BND, and NEU (at loca-
- tions marked respectively as A, B, C, D, E, and F in Fig. 3c) are the only 6 stations around the globe having more than 15 yr of CN data available in the public domain that allow one to look into the long-term trends of atmospheric particle number concentrations. It should be noted that the Australian "Atmospheric Baseline" program began CN measurements at Cape Grim (40.7° S, 144.7° E) in the latter 1970s (Gras, 1990)
 but the long-term Cape Grim CN data are not yet available.

Figure 4 illustrates the monthly mean CN values observed at these six sites, along with linear regression (LR) results. It should be noted that 30 plus years of CN data for BRW, MLO, and SMO during different periods were obtained using two or three different CN counters (with 50 % particle detection efficiency diameters varying from $\sim 8 \text{ nm}$ to

~ 12 nm and ~ 15 nm). The supporting analysis provided in the Supplement shows that the changeover of CN counters is likely to have had only a small (<~ 5%) effect on the variance of CN values at these three remote sites. Only the most recent 22 yr of measurements from SPO are included in this study, as explained in the Supplement, an unexplained increase in CN concentrations associated with a change in the CN counter in 1989 hinders the interpretation of the entire record there as a continuous</p>

time series.

Although there exist substantial inter-annual variations (likely as a result of El Nino, interannual and decadal dynamics, volcanic eruptions, biomass burning, and so on) and some periods of missing data, CN concentrations exhibit a long-term decreasing



trend at each of the six sites: -39.2%, -18.9%, -15.0%, -11.9%, -5.4%, and -17.4% per decade at BRW, BND, MLO, SMO, NEU and SPO, respectively. Both surface and tropospheric air temperatures trended upward during the last 3–4 decades in the regions around BRW, BND, MLO, and SMO, in the range of 0.15–0.55°C/decade

- ⁵ (IPCC, 2007). Temperatures increase in some regions, and decrease in others around NEU and SPO, ranging from -0.25 °C/decade to +0.25 °C/decade (IPCC, 2007). The opposing observed long-term trends in *T* and CN appear to be consistent with the physics of nucleation and particle evolution (Figs. 1–3). It should be noted that tropospheric particles have lifetimes of ~ 1 week, and thus CN are subject to the influence
- of variations in temperatures and nucleation rates in regions upwind of measurement sites. We would like to emphasize that the values of above derived CN trends are subject to uncertainty associated with CN counting efficiency, instrument operation condition, and missing data. Nevertheless, Fig. 4 represents the best set of long-term (> 15 yr) CN data presently available and our analysis indicates that, thanks to the rel atively long duration of the data, a few short periods of abnormal values do not change
 - the overall decreasing trends of CN concentrations.

The observed long-term trends in CN at the 6 sites shown in Fig. 4 are generally larger than would be expected from the effects of temperature changes alone (Fig. 3c), perhaps as a result of changes in the emissions of precursor gases (such as SO₂, DMC, primary particles, emerge others). For exemple, the changes in enthree space

- ²⁰ DMS, primary particles, among others). For example, the changes in anthropogenic SO₂ emissions in the Eurasia and US may have contributed to incremental decreases in CN at BRW. The reduction in anthropogenic SO₂ emissions may also have contributed to the decreasing trend in CN at BND. At more remote MLO, SMO, NEU, and SPO sites, oceanic DMS emissions are the major sulfur source, and anthropogenic
- influences on CN would be expected to be small. As mentioned earlier, the response of oceanic DMS emissions to global climate change, and hence the sign of the CLAW feedback process, remains undetermined. A number of recent studies indicate that global warming may actually stratify the ocean surface, limit nutrient supply, and thus reduce DMS emission, in which case the feedback loop becomes positive (so-called



"positive-CLAW") (e.g., Kloster et al., 2007; Ayers and Cainey, 2007). The fact that the long-term decreasing trends in CN concentrations at remote sites seem to exceed what can be explained by the direct effect of warming temperatures on nucleation rates alone (Fig. 3c) suggests that DMS emissions might indeed be decreasing with global warm-

- ⁵ ing (i.e., supporting the positive-CLAW hypothesis). Compared to CLAW, a positive feedback mechanism linking temperature increases to reductions in nucleation rates and CN concentrations can be built upon specific physical laws (Figs. 1–3). Taken together, the feedback effects of warming on nucleation rates and DMS emissions (via positive-CLAW) would imply an even more significant decrease in the number concented to the positive of the provide the positive of the provide the positive of the pos
- ¹⁰ trations of tropospheric particles associated with future climate change.

3 Effect of temperature increase on CCN concentrations

It is shown above that global warming could slow down new particle formation and reduce total particle number concentrations. However, to assess the climatic impact of this mechanism, the effect on CCN concentrations must be determined, which depends not only on nucleation rates, but also on the growth rates of nucleated particles and the 15 sources of primary particles that can act as cloud nuclei. In this regard, a global model that is capable of reproducing baseline ambient distributions of observed primary and secondary CCN is necessary. Toward this end, simulations with the modeling system described above are presented in Fig. 5. Figure 5a shows the simulated spatial distribution of the annual mean number concentrations of CCN (defined at a water su-20 persaturation of 0.4 % – CCN0.4) averaged within the lower boundary layer (0–0.4 km) ([CCN0.4], BI). Figure 5b compares simulated [CCN0.4], BI values with those observed at 26 stations around the globe. The locations of the 26 stations are indicated by the letters in Fig. 5a. The CCN0.4 data include those compiled by Andreae (2009), with additional data points taken from recent publications (Dal Mason et al., 2008; Bougiati-25

oti et al., 2009; Hudson and Noble, 2009; Komppula et al., 2009; Kivekas et al., 2009), as well as archival observations (DOE's Atmospheric System Research). In some



locations, multiple CCN data are available for different seasons, and averaged values were used for the comparisons. In the model employed here, CCN concentrations are calculated at the prescribed supersaturation based on the simulated particle size distributions and compositions, using the scheme of Petters and Kreidenweis (2007). It

- ⁵ should be noted that the model results in Fig. 5a are annual mean values, while most of the CCN data are from various field campaigns that lasted a few weeks to months. Owing to large seasonal variations, model results corresponding to the months of the observations are used for comparisons with observations in Fig. 5b. The vertical bars in Fig. 5b define the simulated ranges of monthly mean CCN values.
- Figure 5b shows that the simulated CCN0.4 values agree reasonably well with surface-based observations obtained at different points on the globe (within a factor of ~ 2 for all sites), keeping in mind limitations in the CCN0.4 data with respect to regional representation and duration of observations. Overall, the simulations capture the absolute values as well as the horizontal variations of the observed [CCN0.4] at
- ¹⁵ the 26 sites worldwide, with an overall correlation coefficient (*r*) of 0.94 and a normalized mean bias (NMB) of 0.78%. [CCN0.4]_{LBL} ranges from several-tens cm⁻³ in remote oceanic areas to several-thousands cm⁻³ over polluted regions, with the highest annual mean value exceeding 4000 cm⁻³ in the lower boundary layer over East Asia. Due to large anthropogenic sources over major continents in the Northern Hemisphere,
- [CCN0.4]_{LBL} values are roughly a factor of two or more larger than corresponding levels in the Southern Hemisphere. As a result of continental outflows, the [CCN0.4] distribution has large horizontal gradients in coastal areas, and enhanced [CCN0.4] zones can be seen over some regions of the oceans. [CCN0.4]_{LBL} over the North Atlantic exceeds 100 cm⁻³, although it is generally below ~ 100 cm⁻³ elsewhere in the marine boundary layer. [CCN0.4]_{LBL} over the polar regions are generally below ~ 150 cm⁻³
 - and comparable to those over the remote oceans.

With the GEOS-Chem + APM model, which generally captures the absolute values as well as the spatial variations in the observed CCN distribution, the sensitivity to changes in nucleation rates associated with global warming can be investigated.



Figure 6 shows the changes in [CCN0.4] associated with increasing temperatures (% °C⁻¹) in the lower troposphere (0–2 km), and the scaled total CCN0.4 change projected to the end of the century (2080–2099) based on NCAR CCSM3 global warming predictions corresponding to the IPCC-DDC 4th Assessment Report Scenario SR-A1B.

- ⁵ Figure 6a indicates that, as the result of a decrease in nucleation rates, annual mean CCN0.4 concentrations decrease by ~ 1–3 % per degree of warming through most of the troposphere. In contrast to *J* and CN10, which show a maximum decrease in the tropics, PC_{CCN0.4} has large values in regions where particle growth rates are normally fast (associated with anthropogenic and biogenic precursor emissions). The maximum decrease in CCN0.4 exceeds 3 % °C⁻¹ over South America and India. The zonally av-
- decrease in CCN0.4 exceeds 3 % °C ⁺ over South America and India. The zonally averaged (not shown) decreases in CCN0.4 are largest in the tropical lower troposphere (reaching above 2 % °C⁻¹).

Global climate models project significant greenhouse warming by the end of this century, with large uncertainties and spatial variations (IPCC, 2007). Figure 6b offers
 ¹⁵ an example of how such warming might impact CCN abundances in different regions as a result of direct temperature effects on nucleation rates. Figure 6b suggests that the impact of global warming (according to NCAR CCSM3 Scenario SR-A1B forecasts, IPCC, 2007) based on the positive feedback mechanism quantified above (with no other specified changes in emissions, or other factors) could result in a decrease
 ²⁰ in CCN0.4 of up to 5–10% over many continental landmasses. The estimated de-

In CCN0.4 of up to 5–10% over many continental landmasses. The estimated decrease in CCN0.4 is greatest in the Arctic and over major continents because of large increases in temperatures, and/or high sensitivity of CCN0.4 to temperature change, predicted for these regions.

4 Summary and discussion

The present analysis points to the existence of a positive climate feedback mechanism that involves a decrease in cloud condensation nuclei (CCN) concentrations associated with regional climate warming caused by greenhouse gas emissions. The estimated



1-3% CCN decrease for each degree Centigrade of regional warming leads to a reduced aerosol indirect radiative cooling effect of clouds that form on the CCN, thus amplifying the initial warming. The feedback mechanism works because the formation of new aerosol particles, a fraction of which eventually evolve into CCN, is suppressed as ambient temperatures rise. It has long been known that CCN influence cloud mi-5 crophysical and optical properties in such a way that a decrease in CCN generally increases the mean size of cloud droplets, reduces cloud albedo, enhances precipitation, and decreases cloud cover (Twomey, 1977; IPCC, 2007). By reducing cloud albedo and area, more solar energy reaches the surface, intensifying the initiating warming - that is, a positive feedback occurs. It should be pointed out that changes in 10 CCN concentrations of only a few percent can have substantial climate forcing implications (Platnick and Twomey, 1994). A rough calculation (Luo and Yu, 2011) suggests that a 1% decrease in CCN may lead to a positive first-indirect radiative forcing of $\sim 0.1 \, \text{W m}^{-2}$. Accordingly, the positive feedback process discussed here might contribute an additional forcing of $+0.1-0.3 \text{ W m}^{-2}$ per degree of global warming, enough 15 to increase the sensitivity of Earth's climate system significantly.

This analysis only considers the direct effect of increasing temperatures on new particle formation, ignoring other related factors that might play a role; e.g., effects on emissions of aerosol precursor compounds, the hydrological cycle, photochemical re-

- action rates, oxidant concentrations, gas-particle partitioning, and so on. A global climate model, with relevant key processes reasonably validated, is needed to assess the importance of the positive feedback proposed in this study amid associated changes of these other factors. Nevertheless, the long-term decreasing trends in CN concentrations, which have been observed at four NOAA ESRL/GMD baseline stations since the
- 1970s and two other sites since middle 1990s, appear to not only be consistent with the specific positive feedback mechanism outlined in this study, but also indirectly support the idea that feedback processes associated with other related factors affecting CN are, overall, positive in nature. Taken together, the feedback effects of warming on nucleation rates and other factors (especially DMS emissions) would imply a significant



decrease in the concentrations of tropospheric particles associated with future climate change. These feedback processes will affect the climate sensitivity of greenhouse gas emissions and should be incorporated in ongoing model assessments of global warming.

⁵ Supplementary material related to this article is available online at: http://www.atmos-chem-phys-discuss.net/11/27913/2011/ acpd-11-27913-2011-supplement.pdf.

Acknowledgements. This study is supported by NSF under grant AGS-0942106 and NASA under grant NNX11AQ72G. We thank the following sources of information and data used in this
 work: the Observatory Staff and Aerosol Group of NOAA/ESRL's GMD for making CN measurements available; Rolf Weller of the Alfred Wegener Institute for Polar and Marine Research for the Neumayer CN data; Anne Jefferson (NOAA/ESRL/GMD and U. Colo/CIRES) for the CCN data observed through the Atmospheric Radiation Measurement (ARM) Program sponsored by the US Department of Energy; the NCAR CCSM3 team for projected temperature increases; and Hatakka Juha of the Finnish Meteorological Institute and the CREATE Aerosol Database for particle size distributions at Pallas used in the Supplement. The GEOS-Chem model is managed by the Atmospheric Chemistry Modeling Group at Harvard University with support from NASA's Atmospheric Chemistry Modeling and Analysis Program.

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Fig. 1. Dependence of ion-mediated nucleation (IMN) rates (solid lines) and binary homogeneous nucleation (BHN) rates (dashed lines) on temperature (*T*) (RH = 50%). The percentage change (PC) in the nucleation rate (*J*) per °C increase of *T* at $J = 0.5 \text{ cm}^{-3} \text{ s}^{-1}$ is also given for each case. Lines of same color have same sulfuric acid vapor concentration ([H₂SO₄], in cm⁻³) and the same local surface area density of pre-existing particles (*S*, in $\mu \text{m}^2 \text{ cm}^{-3}$). IMN rates also depend on ionization rate (*Q*, in ion-pairs cm⁻³ s⁻¹). BHN is an integral part of IMN, and J_{IMN} approaches to J_{BHN} at low temperatures when BHN is dominant.





Fig. 2. Effect of temperature (*T*) on $H_2SO_4-H_2O$ binary homogeneous nucleation (BHN) and $H_2SO_4-H_2O-NH_3$ ternary homogeneous nucleation (THN) under a range of atmospheric conditions based on different nucleation models: **(a)** classical BHN model of Vehkamaki et al. (2002); **(b)** classical THN model of Napari et al. (2002) with $[NH_3] = 10$ ppt; **(c)** revised classical THN model of Merikanto et al. (2007) with $[NH_3] = 100$ ppt; **(d)** Kinetic THN model of Yu (2006) with ammonia stabilizing factor (F_{NH_3}) constrained by experimental results. In the legend, read A1E8 as $[H_2SO_4] = 1.0 \times 10^8$ cm⁻³. The percentage change (PC) in the nucleation rate (*J*) per degree increase in *T* at J = 0.5 cm⁻³ s⁻¹ is also given for each case.





Fig. 3. Horizontal (i.e., averaged within the 0–2 km surface layer) and vertical (i.e., zonally averaged) spatial distributions of the annual mean percentage changes in nucleation rates (*J*) and concentrations of condensation nuclei larger than 10 nm (CN10), for a uniform 1 °C temperature increase. These temperature sensitivities were calculated as described in the text. In panel (c), the locations of four NOAA baseline stations (BRW, MLO, SMO, and SPO), one NOAA regional station (BND), and one German Antarctic station (NEU) are marked respectively as A, B, C, D, E, and F. The location of Pallas station discussed in Supplement is marked as G.













Fig. 5. (a) Simulated global distribution of CCN concentrations (annual mean number concentration for CCN that are active at a water supersaturation of 0.4 %) averaged within the lower boundary layer (0–0.4 km) (designated as $[CCN0.4]_{LBL}$). (b) Comparison of simulated $[CCN0.4]_{LBL}$ with observed values at 26 sites around the globe (locations are indicated in (a) by letters). In (b), model results correspond to the months of the observations, and vertical bars define the simulated ranges of monthly mean CCN0.4 values. In (b), the site identifier and bars indicating variance are color coded for clarity.





