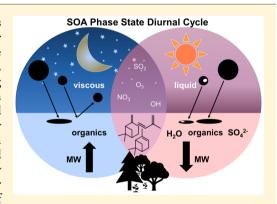


# Bouncier Particles at Night: Biogenic Secondary Organic Aerosol Chemistry and Sulfate Drive Diel Variations in the Aerosol Phase in a Mixed Forest

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Supporting Information

ABSTRACT: Aerosol phase state is critical for quantifying aerosol effects on climate and air quality. However, significant challenges remain in our ability to predict and quantify phase state during its evolution in the atmosphere. Herein, we demonstrate that aerosol phase (liquid, semisolid, solid) exhibits a diel cycle in a mixed forest environment, oscillating between a viscous, semisolid phase state at night and liquid phase state with phase separation during the day. The viscous nighttime particles existed despite higher relative humidity and were independently confirmed by bounce factor measurements and atomic force microscopy. High-resolution mass spectrometry shows the more viscous phase state at night is impacted by the formation of terpene-derived and higher molecular weight secondary organic aerosol (SOA) and smaller inorganic sulfate mass fractions. Larger daytime particulate sulfate mass fractions, as well as a predominance of



lower molecular weight isoprene-derived SOA, lead to the liquid state of the daytime particles and phase separation after greater uptake of liquid water, despite the lower daytime relative humidity. The observed diel cycle of aerosol phase should provoke rethinking of the SOA atmospheric lifecycle, as it suggests diurnal variability in gas-particle partitioning and mixing time scales, which influence aerosol multiphase chemistry, lifetime, and climate impacts.

# INTRODUCTION

Secondary organic aerosol (SOA), formed from both gas-phase oxidation and condensed-phase reactions involving anthropogenic and biogenic volatile organic compounds (BVOCs), constitutes a significant fraction of the global aerosol budget and the most abundant type of organic aerosol in the atmosphere. SOA impacts climate directly by scattering or absorbing radiation and indirectly by altering the radiative properties of clouds and serving as ice nuclei.<sup>2</sup> However, there are order-of-magnitude differences in the global SOA burden

according to atmospheric models, leading to significant uncertainties regarding SOA impacts on the radiative budget.<sup>3</sup>

The uncertainties associated with SOA impacts on climate result in part from limited knowledge of the chemical transformations and physical state of aerosol during its lifetime

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in the atmosphere.<sup>4,5</sup> While SOA has traditionally been assumed to be in a homogeneous liquid state, recent laboratory, field, and modeling studies have demonstrated that SOA formed from a variety of BVOC-oxidant systems and in different environments can exist as amorphous solids, semisolids, and phase-separated particles.<sup>6–16</sup> Shiraiwa et al.<sup>13</sup> used a model to predict that the phase state of particles varies spatially around the globe and with altitude depending on temperature, relative humidity, and particle composition (molar mass and characteristics such as the oxygen-to-carbon ratio of the organic matter, O/C) on an annual average. Such variations in particle phase state can significantly impact aerosol reactivity,  $^{17-20}$  the long-range transport of toxic substances,  $^{21,22}$  and the uptake and partitioning of semivolatile organic compounds and water vapor.  $^{8,23-28}$  These processes affect the lifetime of SOA and its optical  $^{29}$  and cloud condensation/ice nuclei activation properties.  $^{30-33}$ 

Field studies have aimed to characterize the phase state of atmospheric SOA particles based on the analysis of particle bounce factors (BF) in different forested environments, including the boreal forest region of northern Finland,<sup>6</sup> the Amazon rain forest of Brazil,<sup>34</sup> and a mixed deciduous/ coniferous forest in the southeastern US.<sup>12</sup> While these studies together suggest phase state varies by location, with solid-like particles in the colder, monoterpene-dominated boreal forests, and liquid-like particles in the humid, isoprene-dominated forests of the Amazon, it has remained unclear if phase state changes over the diel cycle, despite the obvious contrasts in temperature, relative humidity, boundary layer height and atmospheric transport, light availability, and BVOC emissions. 35,36 For example, monoterpenes and the nitrate radical can become the dominant BVOC-oxidant system in forests at night, generating SOA with very different molecular properties and viscosity than that formed from daytime isoprene photooxidation. <sup>13,16,23,28,37–39</sup> Furthermore, the viscosity of SOA can be very sensitive to modulations in aerosol liquid water (ALW) content, which depend on the ambient relative humidity, water-soluble organic carbon content, and inorganic mass fraction.9,10

Herein, we analyze the ambient particle phase state over multiple daily cycles in a mixed deciduous/coniferous forest during the Atmospheric Measurements of Oxidants in Summer (AMOS) study in 2016 at the University of Michigan Biological Station (UMBS) PROPHET research site. 40 This work expands on prior BF field measurements by integrating high-frequency (1 Hz) day and night BF measurements with an electrical low-pressure impactor (ELPI) and single particle and bulk chemical composition, phase, and morphology analyses employing a suite of microscopy and high-resolution mass spectrometry instrumentation. Together, these measurements provided detailed quantitative information on the daily cycles of water-soluble ions, total organic mass, and other composition measures important when assessing compositional drivers of particle phase state, including average molar mass (M) and O/C ratios and estimates of ALW.

#### MATERIALS AND METHODS

**Site Description and Field Study Timeline.** The PROPHET-AMOS study was a large-scale field campaign conducted at the University of Michigan Biological Station in northern Michigan from July 1 to July 31, 2016. The measurements presented herein were made at the PROPHET tower research site (45°33′N, 84°42′W) underneath the mixed

deciduous/coniferous forest canopy (canopy height  $\sim$ 22 m) from July 9 to July 24. The PROPHET research tower is  $\sim$ 5.5 km east of the town of Pellston, MI (population <800), and the nearest major metropolitan areas are Chicago, IL (472 km SW), Milwaukee, WI (375 km SW), and Detroit, MI (350 km SE). Other details of the site, including forest composition, BVOC emissions, and the impacts of different aerosol sources can be found in several previous studies.  $^{40-42}$ 

Meteorological and  $SO_2$  Measurements. Meteorological measurements were conducted  $\sim 6$  m above the ground and were collocated with the trace gas sample inlets for the University of Houston Mobile Air Quality Laboratory (UHMAQL). Temperature and relative humidity were measured with a R. M. Young 41382 sensor, and pressure was measured with a R. M. Young 61302 V pressure sensor.  $SO_2$  was measured using a pulsed fluorescence analyzer (Thermo Environmental, Inc.; model 43i-TL). Baseline determinations were made once per hour by flowing ambient air over a carbonate-treated filter to selectively remove  $SO_2$  from the sample. Instrument sensitivity was established by daily challenges with zero-air dilutions of a NIST-traceable gas standard (Scott-Marrin, Inc., Riverside, CA).

Electrical Low-Pressure Impactor Sampling. Two electrical low pressure impactors (ELPIs; Dekati ELPI+ and High Resolution-ELPI+<sup>43</sup>) housed in the University of Michigan Mobile Laboratory were employed to determine particle bounce factors (BFs).<sup>44</sup> One ELPI was operated with sintered substrates<sup>45</sup> and the other with smooth aluminum foil substrates. The two ELPIs sampled particles simultaneously at a rate of 10 L min<sup>-1</sup> through ~2 m long 1/2" ID insulated copper tubing connected to a 12'' L  $\times$  4'' ID cylindrical sampling manifold, which was adapted to a ~3 m long 1" ID stainless steel tube oriented vertically on top of the trailer roof. There were no differences in the relative humidity or temperature measured outside and at the base of the ELPI in the lab during sampling. The ELPIs sampled particles with an aerodynamic diameter between 0.006 to 10  $\mu$ m across 14 electrically detected stages at a rate of 1 Hz. The BF data presented in this work are 10 min averages of the 1 Hz BF data. It is important to note that BF is used in this study to infer changes to particle phase state on relatively shorter time scales than is allowable by offline analysis, and should be regarded as a mechanical property, dependent on both the chemical and physical properties of the particles as well as the surface characteristics and flow dynamics in the impactor. 46 Further details regarding the BF calculation can be found in

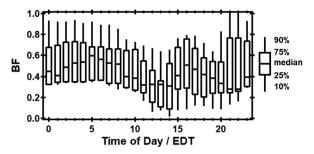
High-Resolution Time-of-Flight Aerosol Mass Spectrometry. A high-resolution time-of-flight aerosol mass spectrometer (HR-ToF-AMS, Aerodyne Research Inc.) was used to measure nonrefractory submicron aerosols.<sup>47</sup> In brief, particles were sampled through a 100  $\mu$ m critical orifice and were focused into a particle beam using an aerodynamic lens. After traversing a vacuum chamber, the particles in the beam were impacted onto a tungsten vaporizer heated to 600 °C. Vapors were subsequently ionized by electron impact ionization (70 eV). The HR-ToF-AMS was operated in a high mass sensitivity mode, referred to as V-mode. The sampling inlet for the HR-ToF-AMS measurement was collocated with the UHMAQL meteorological measurements. The inlet was fitted with a PM<sub>2.5</sub> cyclone. Further details of ionization efficiency calibrations, data analysis, and ALW determination by ISORROPIA can be accessed in the SI.

Particle Collection by MOUDI and Analysis by Atomic Force Microscopy. Particle samples for atomic force microscopy (AFM) were collected using a micro-orifice uniform deposition impactor (MOUDI, model 110, MSP Corp.) and collocated with the ELPI. Particles were sampled from 5.5 m above ground level through an insulated 1.1 cm inner diameter copper tubing inlet using a cylindrical sampling manifold. Particles were impacted on silicon wafers (Ted Pella Inc.) on stages 5, 7, 9, and the backup filter of the MOUDI, and samples from July 10, 2016 (day) and July 16, 2016 (night) on stage 9 of the MOUDI were analyzed at the University of Michigan. AFM analysis at ambient temperature and pressure was initially performed on a NanoIR2 system (Anasys Instruments) followed by analysis with a PicoPlus 5500 AFM (Agilent) after rehumidification to 80% RH where they equilibrated prior to analysis at 50% RH (similar RH values to ambient collection conditions). SEM-EDX analysis was used to confirm that the particles analyzed were primarily organic carbon or organic-sulfate mixtures. Particles <180 nm (stage 9) were primarily organic and sulfate, with EDX showing C, O, S, and N as the predominant elements, which prior work at UMBS has shown is organic material and sulfate. 42,48-50 Less than 3% of daytime particles and 1% of nighttime particles contained markers for salts (other than ammonium sulfate) and dust (Na, Mg, K, Ca, P, Al, and Cl), though these are observed in larger particles at the site. 49,51 Further details of the AFM and SEM-EDX analysis can be found in the SI.

High-Performance Liquid Chromatography Electrospray Ionization Time-of-Flight Tandem Mass Spectrometry. A custom-built sampler was positioned on the PROPHET tower 28 m above the ground, facing west. Samples were collected on PTFE membrane filters (47 mm diameter, 1.0 µm pores, Tisch Environmental) housed in passivated stainless-steel filter holders (Pall Corporation). No upstream inlet tubing was used to minimize potential aerosol loss to tubing walls. Samples were collected at 1 m<sup>3</sup> hr<sup>-1</sup> for maximum collection efficiency. An 84-mesh stainless steel screen (McMaster Carr) was installed over the inlet that prevented large particles and insects from contaminating the filters and limited particle size to approximately PM<sub>10</sub> at a flow rate of 1 m<sup>3</sup> hr<sup>-1</sup>. Samples were collected both during the day (9:00 am-5:00 pm) and at night (9:30 pm-5:30 am), avoiding sunrise and sunset, to capture products of daytime and nighttime oxidation chemistry without the influence of transitional chemistry during dawn and dusk. Field blanks were collected alongside all samples in identical holders. Filters were sonicated and extracted in methanol, and the extracts were frozen immediately and then thawed prior to analysis. The extracts were analyzed with an Agilent 1260 Infinity HPLC with an Agilent 6550 Q-TOF mass spectrometer, using an electrospray ionization (ESI) interface. We note that some fraction of the carboxylic acids and carbonyl compounds in the filter samples may have been converted to esters and (hemi)acetals, respectively, during extraction in methanol.<sup>52</sup> If conversion in the frozen methanol extracts occurred, this implied that the O/C ratios and viscosity we reported in this study could be slightly underestimated. Further details can be found in the SI.

# ■ RESULTS AND DISCUSSION

Diel Patterns and the Impact of Mixing State, Size, and Liquid Water on Particle Bounce. Figure 1 shows the



**Figure 1.** Diel trend in BF showing median and percentiles for each hour corresponding to all BF measurement periods in this study.

composite median diel trend in BF from the individual daily BF profiles presented in Figure S1. BF exhibits a maximum in the early morning (between 03:00 and 06:00 EDT), decreasing following sunrise to a minimum during the day (between 12:00 and 14:00 EDT) and then increasing into and through the late evening. For comparison, the median BF values are similar in range to those measured in a mixed forest in the southeastern U.S., indicating that the particles are characteristic of semisolids but transition to lower viscosity particles during the day. 9,12,44

Single particle analysis<sup>53</sup> confirmed that BF reflects particle phase state by contrasting BF with the morphology and phase of the particles using atomic force microscopy (AFM)<sup>54</sup> at ambient pressure and RH, with corroboration from scanning electron microscopy (SEM).<sup>28</sup> Figure 2 shows representative AFM height and phase images of particles impacted onto silicon wafers using a micro-orifice uniform deposit impactor (MOUDI) (0.10–0.18  $\mu$ m) during a low BF period (ranging between  $\sim 0.2$  and  $\sim 0.3$ ) during the day and a high BF period (ranging between  $\sim 0.6$  and  $\sim 0.8$ ) at night. Because particle size is an important parameter impacting phase transitions, St phase separation,<sup>56</sup> and bounce,<sup>7,11</sup> though highly uncertain,<sup>57</sup> we examined the impact of particle size on the phase state by determining how the spreading ratios (ratio of radius to height, where 1 is a hemisphere) of particles with volume equivalent diameters <100 nm and >100 nm differ between night and day. This analysis was conducted both as collected and after rehumidifying the samples to 80% RH followed by analysis at 50% RH, to reproduce ambient RH. The spreading ratios in Figure 2e indicate less spreading for the higher BF particles <100 nm at night, which is indicative of more viscous particles,<sup>54</sup> confirming the lower spreading at night was representative of ambient conditions. In contrast, greater spreading was observed for the daytime samples <100 nm, which is in line with low BF observed during the day. AFM phase images of the daytime samples with more spreading also showed separate aqueous ammonium sulfate and organic phases, as has been shown previously with AFM.<sup>58</sup> Greater sulfur in the daytime particles was confirmed using SEM with energy dispersive X-ray spectroscopy (EDX), which is primarily sulfate based on prior measurements at UMBS.50 We found that daytime and nighttime particles >100 nm have similar, high spreading ratios (12-13), indicative of aged, mixed inorganic, and organic accumulation mode particles with high water content. Thus, our results indicate that the observed diel cycle in BF is driven by the properties of relatively newly formed (<100 nm) particles, which prior measurements at UMBS suggest are of a local biogenic origin. 41,50

HR-ToF-AMS further reveals that the bouncier particles at night contained a greater fraction of organic matter  $(f_{Org})$  and

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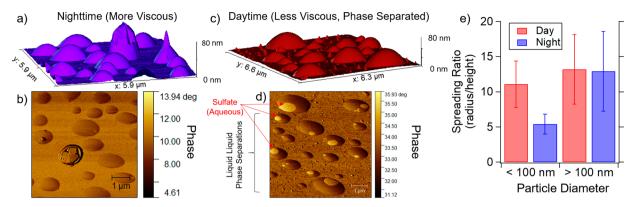


Figure 2. (a and c) AFM height images of taller (more viscous) nighttime particles  $(0.6 \le BF \le 0.8)$  and flatter daytime particles  $(0.2 \le BF \le 0.3)$ . (b and d) AFM phase images of the same samples, with liquid–liquid phase separations indicated in the daytime sample. (e) Quantified spreading ratios for nighttime and daytime samples for particles <100 nm and >100 nm, where particles <100 nm at night exhibit less spreading than larger particles or daytime particles.

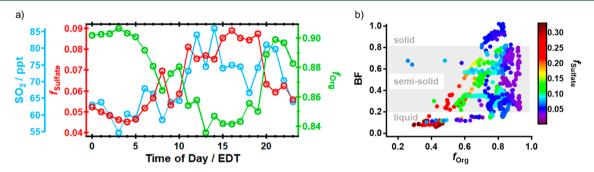


Figure 3. (a) Median diel SO<sub>2</sub> particulate sulfate mass fraction ( $f_{\rm Sulfate}$ ), and particulate organic matter mass fraction ( $f_{\rm Org}$ ). (b) BF as a function of  $f_{\rm Org}$  and  $f_{\rm Sulfate}$  (shown in color scale). The gray shaded region in part b shows approximate cutoffs for the different phase state regimes. Below BF  $\sim$  0.2, particles are likely in a liquid-like state, in a transition or semisolid regime between 0.2 and 0.8, and highly viscous semisolids/solids above BF  $\sim$  0.8.

smaller fraction of particulate sulfate ( $f_{\text{Sulfate}}$ ), compared to the daytime particles as shown in Figure 3a. There is an estimated minor contribution (<2%) from organosulfates based on the concentration of CS ion families in the mass spectra for both day and night aerosol, independently confirming the results from Figure 2, which is supported by a lack of Raman organosulfate modes<sup>59</sup> from previous measurements at UMBS.<sup>48</sup> According to Figure S2, the consistently higher  $f_{\text{Sulfate}}$  during the day is likely driven by a shift in wind direction to more polluted regions from the south (HYSPLIT back trajectories<sup>60</sup> for each day are shown in Figure S3). VanReken et al.<sup>42</sup> characterized air masses impacting the PROPHET site from the south as having relatively higher concentrations of SO<sub>2</sub>, sulfate, and water-soluble organic carbon (WSOC) with higher cloud condensation nuclei (CCN) activity than the mostly organic particles observed when flow is from cleaner regions to the north or west. In contrast, the shift to lighter and more westerly flow at night indicates that the nighttime aerosol was impacted more by local biogenic sources, 42 leading to the relatively higher  $f_{\text{Org}}$  at night. In addition, due to the shallower boundary layer, the more stagnant air at night can trap BVOC emissions (primarily terpenes due to lower isoprene emissions), their oxidation products, and aerosol particles near the surface, promoting condensational growth of organic matter on the particles and increase in  $f_{\rm Org}$  at night.

The increase in sulfate and  $SO_2$  during the day is expected to increase particle hygroscopicity, promoting water uptake and liquification of the particles. Figure 3b shows the dependence of BF on  $f_{Org}$  and  $f_{Sulfate}$  (color scale). In general, BF

decreased with decreasing  $f_{\rm Org}$  and increasing  $f_{\rm Sulfate}$ , and notably, when  $f_{\rm Org}\sim$  0.4, corresponding to  $f_{\rm Sulfate}\sim$  0.3, the BF < 0.2 indicates that the particles were primarily in a liquid-like state. Similar behavior in particle bounce has been noted for pure glucose particles exposed to H<sub>2</sub>SO<sub>4</sub> and laboratorygenerated biogenic SOA exposed to SO2, where even minor enhancements in  $f_{\text{Sulfate}}$  can lead to a significant loss of particle bounce. <sup>6,9,10</sup> Moreover, according to particle rebound fractions measured in Beijing, Liu et al.61 showed that submicron aerosol particles are in a liquid state during urban haze episodes, which the authors attribute to significant enhancements in the water-soluble inorganic fraction and subsequent increase in ALW. However, this contrasts a recent study by Bateman et al., 62 who observed an increase in BF more often at night associated with anthropogenic activity in the Amazon. Similarly, Vaden et al.<sup>63</sup> and Zelenyuk et al.<sup>64</sup> indicate that polycyclic aromatic hydrocarbon (PAH) emissions from combustion sources can increase viscosity and decrease SOA volatility. Figure S4 shows that potential PAH concentrations in our aerosol filter samples were indistinguishable between day and night, emphasizing the importance of sulfate and other biogenic components in controlling aerosol phase over the diel cycle. A subtle, but important, distinction to be made from Figure 3b is that although BF generally decreased with increasing  $f_{\text{Sulfate}}$ , the particles can remain in a liquid-like state (BF < 0.2) even at very low  $f_{\text{Sulfate}}$  < 0.1. This suggests  $f_{\text{Sulfate}}$  is not the only driver of BF but it is likely that other factors, e.g., the organic molecular composition of the aerosol, play an important role too.

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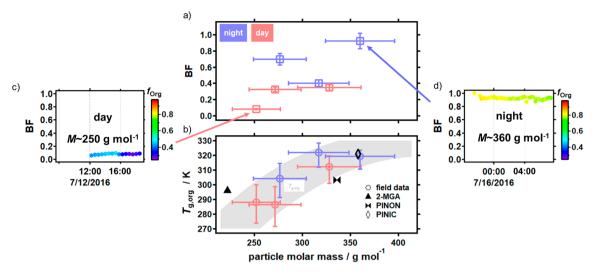


Figure 4. (a) BF (squares) and (b)  $T_{\rm g,org}$  (circles) as a function of M, where nighttime samples are in blue and daytime samples in red. The gray shaded region in part b shows the calculated range of  $T_{\rm g,org}$  bounded by O/C=0.25 and O/C=0.75. The black symbols represent the  $T_{\rm g,org}$  of common biogenic SOA dimers of pinic acid (PINIC, diamond), pinonaldehyde (PINON, bow tie), and 2-methylglyceric acid (2-MGA, triangle). The vertical error bars in BF (part a) represent 10% variability in the measured BF over the filter sampling period. M is weighted by LC peak abundances and shown with an uncertainty of 10% as discussed in detail in the Methods. The vertical error bars (part b) in dry  $T_{\rm g,org}$  account for the applied 10% uncertainty in M. (c and d) Example day and night BF time series, respectively, colored by AMS-derived organic mass fractions ( $f_{\rm Org}$ ).

Figure 5. Relevant nighttime (blue) and daytime (red) BVOC oxidation and multiphase chemistry. Acid-catalyzed aldol condensation of pinonaldehyde and formation of product  $C_{20}H_{32}O_4$  was adapted from Tolocka et al.<sup>68</sup> Formation of a secondary ozonide from β-pinene ozonolysis and formation of product  $C_{17}H_{26}O_4$  was adapted from Heaton et al.<sup>69</sup> Relevant isoprene daytime chemistry leading to formation of 2-methyl-tetrol ( $C_5H_{12}O_4$ ) was adapted from Surratt et al.<sup>67</sup>

Glass Transition Temperatures and the Role of Biogenic Emissions and Aerosol Liquid Water. Due to the large fraction of organic matter in the aerosol (81% by mass on a campaign average), we examine how the BF changes in response to the average molar mass (M) and O/C of particle-phase organic components. M and O/C express the degree of intermolecular bonding and are used here to determine particle glass transition temperatures  $(T_{\rm g})$  of the organic components, defined as the characteristic temperature for which a nonequilibrium phase transition occurs from a glassy solid state to a semisolid state as temperature increases.  $^{8,13,16}$  This provides a link between BF, a mechanical property, and molecular composition. Equations for calculating BF and  $T_{\rm g}^{13}$  can be found in the SI, eqs S1–S3. We

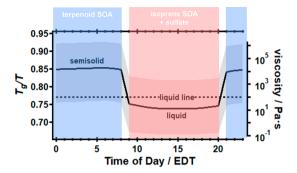
calculated the M and O/C of aerosol particles collected using a high-volume PM10 filter sampler based on weighted average peak spectral intensities and assigned chemical formulas from HPLC-ESI-ToF-MS spectra in negative ion mode, as done previously. <sup>65,66</sup> Differences between the phase states of night and day aerosol were determined from the analysis of filter samples acquired in parallel with BF measurements over three 8 h daytime (7/12, 7/22, and 7/23) and nighttime sampling periods (7/15–7/16, 7/16–7/17, and 7/22–7/23). Figure 4a shows the average BF and Figure 4b shows the corresponding  $T_{\rm g}$  of the dry organic components ( $T_{\rm g,org}$ ) as a function of M for the six independent collection periods. Example daytime and nighttime BF time series during filter collection are shown

in Figure 4c,d, respectively, and indicate little variability. Corresponding mass spectra are presented in Figure S5.

Figure 4 shows that the increase in the observed BF from  $\sim$ 0.1 to  $\sim$ 0.9 corresponds very well with the increase in M from  $\sim$ 250 to  $\sim$ 360 g mol<sup>-1</sup>, leading to the  $\sim$ 30 K increase in  $T_{\rm g, org}$ . This indicates that the molecular composition of the organic components in the particles potentially contributes to differences in both phase state and bounce characteristics in the impactor. However, note the lower M periods also correspond to lower  $f_{\text{Org.}}$  For reference, estimated  $T_{\text{g,org}}$  and corresponding M are in agreement with that of common biogenic SOA markers (2-MGA, lower M) and monoterpenederived SOA (PINON and PINIC, higher M). Notably,  $T_{\rm g,org}$ was relatively higher at night on average, consistent with the higher BF measured at night. Detailed molecular composition analysis in Figure S6 confirmed that larger M oligomers related to monoterpene oxidation (C<sub>17</sub> and C<sub>20</sub> compounds) comprised a greater proportion of the nighttime particle mass, while smaller M compounds associated with isoprene SOA, including 2-methyltetrols (C<sub>5</sub>H<sub>12</sub>O<sub>4</sub>) and an oligoester monomer (C<sub>5</sub>H<sub>8</sub>O<sub>5</sub>), <sup>39,67</sup> constituted a greater fraction of the daytime particle mass. Figure 5 shows potential oligomer formation pathways from pinic acid and pinonaldehyde, formed from the oxidation of  $\alpha$ - and  $\beta$ -pinene by O<sub>3</sub> and NO<sub>3</sub>, and daytime relevant production of 2-methyl-tetrols from isoprene photooxidation by OH.

Table S1 shows the relative VOC reactivities of isoprene to monoterpenes for day and night assuming OH and O3 are the dominant oxidants, and indicates that isoprene dominates daytime VOC reactivity, whereas monoterpenes dominate the VOC reactivity at night. This is important for understanding the contribution of BVOC oxidation chemistry to aerosol phase state, as several studies indicate that the aerosol composition and phase can be very different for isoprene and monoterpene SOA and depend on the specific BVOCoxidant system. The NO<sub>3</sub> oxidation of terpenes produces relatively larger M oligomerization products<sup>37</sup> and highly viscous (higher  $T_{g,org}$ ) aerosol<sup>23</sup> compared to isoprene photooxidation SOA, wherein monoterpene- and sesquiterpene-derived SOA, which are more relevant than isoprene SOA at night, remain highly viscous even under high, nighttime relevant, RH.<sup>8,13,16,38</sup> In contrast, daytime isoprene oxidation produces smaller M products, including isoprene epoxydiols (IEPOX) and 2-methyl-tetrols, which were in greater abundance in the daytime filter samples and are known to partition to and suppress the surface tension of aqueous SOA.<sup>70</sup> Such compounds could contribute to the relatively lower BF and  $T_g$  of the daytime particles. Moreover, aerosol phase OH oxidation<sup>12</sup> and photodegradation reactions during the day can create fragmented and volatile aerosol oxidation products, 71,72 thus reducing M, whereas NO<sub>3</sub> heterogeneous oxidation at night is not expected to increase aerosol volatility.<sup>73</sup> This suggests the oligomers formed at night are also susceptible to photodegradation during the day, triggering a positive feedback loop during the day whereby the decrease in particle viscosity promotes more uptake of pollutants, such as SO<sub>2</sub>, which react to form inorganic ions in the particles, further decreasing particle viscosity.

To estimate the impact of ALW on the aerosol phase diel cycle, Figure 6 shows the predicted night and day ratios of  $T_{\rm g}/T$  after correcting the average night and day  $T_{\rm g,org}$  for estimated ALW content, where  $T_{\rm g}/T$  relates to viscosity  $(\eta)$  following the parametrization outlined in Shiraiwa et al. <sup>13</sup> and DeRieux et

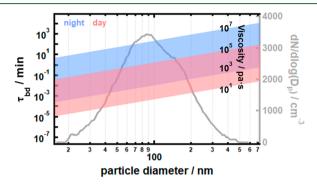


**Figure 6.** Diel trend in the estimated ratio of glass transition temperature to ambient T ( $T_{\rm g}/T$ ) and corresponding viscosity ( $\eta$ ) corrected for inorganic- and organic-derived ALW, where the gray shaded area represents the upper and lower bounds of  $\eta$  assuming a fragility parameter of 20 and 5, respectively. <sup>13</sup> In this analysis,  $\kappa_{\rm org}$  = 0.15 during the day (09:00–20:00) and  $\kappa_{\rm org}$  = 0.02 at night (21:00–08:00). The liquid line ( $\eta$  = 10<sup>2</sup> Pa·s) represents the semisolid–liquid phase transition. <sup>13,16</sup>

al. 16 Here, ALW was estimated from thermodynamic principles employing the ISORROPIA model for inorganic ions and Gordon-Taylor approximation for organics ascribing a hygroscopicity parameter  $(\kappa)$ , 74,75 as discussed in the Supporting Information and eq S3. Although  $\kappa$  of the organic components is uncertain, prior work at UMBS measured relatively larger  $\kappa$  during periods of anthropogenic influence, as observed here during the day, and relatively smaller  $\kappa$  during periods of biogenic influence, as observed here at night.<sup>4</sup> Further, laboratory studies have shown that  $\kappa$  of terpenederived SOA at equivalent nighttime RH (median diel cycles of RH and T are provided in Figure S7) is several times lower ( $\kappa$ ~ 0.02 at 80% RH) compared to isoprene-derived SOA under relevant daytime RH ( $\kappa \sim 0.15$  at 60% RH). Because we observed a distinct presence and greater abundance of monoterpene-derived SOA at night and isoprene-derived SOA during the day, we extend our analysis to  $\kappa_{\rm org} = 0.15$ during the day (09:00–20:00) and  $\kappa_{\rm org}$  = 0.02 at night (21:00– 08:00). These values are within the uncertainty in  $\kappa$  reported by VanReken et al. 42 for aerosol particles at UMBS assuming the inorganic fraction is primarily ammonium sulfate ( $\kappa_{\text{inorg}}$  = 0.63), 4 as confirmed for these measurements in Figure S8. Our analysis in Figure 6, while sensitive to the applied  $\kappa_{org}$  (see Figure S9), shows that  $\eta$  may be several orders of magnitude larger at night (up to ~106 Pa·s) compared to that during the day (~101 Pa·s), despite the higher RH at night, with the estimated daytime and nighttime  $\eta$  in the range of that measured previously for isoprene- and monoterpene-derived SOA, respectively. 16,76 Note that the abrupt night-day transition in Figure 6 is expected to be more gradual and is a consequence of fixing  $\kappa_{\text{org}}$  over two coarse 12 h daytime and nighttime sampling regimes, corresponding to the time frame of aerosol collection onto the filters. Notably, for all reasonable  $\kappa_{\rm org}$  values applied, our analysis indicates that the daytime particles at this site are predictably in a liquid state ( $\eta < 10^2 \, \text{Pa}$ · s), and nighttime  $\eta$  is in the range of semisolids and highly viscous liquids  $(10^2 < \eta \le 10^6 \text{ Pa·s})$ , consistent with the diel cycle in BF.

The results presented in this study suggest different partitioning behavior of particle-phase components<sup>24</sup> and heterogeneous reactivity<sup>19</sup> at night and during the day, i.e. partitioning more readily with the particle bulk during the day and more with the particle surface at night. To test this, we

calculate the effect estimated nighttime and daytime  $\eta$  has on the characteristic equilibrium time scale for bulk diffusion  $(\tau_{\rm bd})$  in a particle with diameter  $(d_{\rm p})$  according to  $\tau_{\rm bd} = \frac{d_{\rm p}^2}{4\pi^2D_{\rm b}}$  where  $D_{\rm b}$  is the molecular diffusion coefficient in the bulk derived from the Stokes–Einstein equation assuming a molecular radius of 1 nm. Since  $^{8,13}$  Given the uncertainty in  $\kappa_{\rm org}$  and the existence of multiple aerosol phases as shown in Figure 2, we show  $\tau_{\rm bd}$  over a range of predicted viscosities in Figure 7. Here,



**Figure 7.** Estimated range in bulk diffusion times  $(\tau_{bd})$  and viscosity of night (blue) and day (red) aerosol sampled during this study as a function of particle diameter. Upper bounds in the estimated night and day  $\tau_{bd}$  represent the  $\tau_{bd}$  of phase-separated particles and lower bounds represent well-mixed inorganic/organic particles, as discussed in the text. The median particle size distribution measured by the SMPS during this study is shown in gray.

we assume the particles are either well-mixed or phase-separated. In the well-mixed case, the ALW effect on  $T_{\rm g}$  includes combined ALW content from both the inorganic and organic matter (this yields the lower bound in  $\tau_{\rm bd}$ ). In the phase-separated case, the ALW effect on  $T_{\rm g}$  is considered isolated to either the organic or inorganic components (yielding the upper bound of  $\tau_{\rm bd}$ ). A sensitivity analysis in Figure S10 shows how  $\tau_{\rm bd}$  changes with different  $\kappa_{\rm org}$ . Also note that the Stokes–Einstein relation may underestimate bulk diffusivity in highly viscous matrices at temperatures near the glass transition. As a result, although nighttime  $T_{\rm g}/T$  was  $\sim$ 0.85, it is possible our estimated nighttime  $\tau_{\rm bd}$  may be shorter than shown in Figure 7.

From Figure 7, nighttime aerosol exhibits relatively longer bulk diffusion time scales, increasing with diameter and degree of phase separation and decreasing as the inorganic and organic components become well mixed, i.e., with more ALW interaction with the organic matter. Estimated bulk diffusion time scales for particles between 50 and 300 nm (i.e., bulk of the observed size distribution) are shown to range from up to half an hour to several hours at night, whereas time scales are limited to under 20 min during the day. However, as we did not observe a significant difference in the spreading ratios of particles >100 nm in diameter in Figure 2e, we expect that the particles most impacted by day and night differences in bulk diffusion times are those <100 nm, where the estimated time scales range from <2 min during the day and up to 2 h at night. This result implies slower aerosol partitioning of semivolatile organic compounds, and thus potentially diffusion-limited particle mass growth at night. <sup>23,24</sup> Indeed, recent work shows that isoprene epoxide (IEPOX) uptake by acidified ammonium sulfate can be twice as slow when the particle is coated with  $\alpha$ pinene SOA, 28 suggesting that such reactions could affect the

growth and chemical transformations of aerosol particles at night. Compounds in the particle phase may be relatively longer-lived overnight due to slower diffusion of reactants into the particle bulk and from the bulk to the surface, 17,19 contributing to the long-range transport of toxic pollutants embedded in the particles. <sup>21,22</sup> In addition, because of much greater surface uptake resistance for bouncier particles, the particles themselves are potentially longer lived at night with respect to dry depositional loss. 77 Given the clear differences in the phase states of monoterpene- and isoprene-derived SOA observed here and in other studies, our results also suggest that the current forest succession occurring at UMBS, 78 i.e., transition from predominately isoprene-emitting (deciduous) to predominately terpene-emitting forests (coniferous), could impact the physical nature of atmospheric SOA by altering the pool of reactive BVOCs and thus BVOC oxidation products, in general. It is important to note that the mixing state of different particle populations from differences in day-to-night transport dynamics can influence the phase state of the particles sampled in this study.<sup>50</sup> Particle mass loading<sup>79</sup> and air mass history may also influence particle phase state, as the time scale for water diffusion in viscous aerosol and the phase and morphology of particles depend on its atmospheric conditioning history (number of drying and humidification cycles, and drying rate). 80,81 Moreover, it is unclear how the diel behavior in aerosol phase and viscosity in this study compare to other forested and urban regions as it depends on the ambient temperature, relative humidity, composition of the reactive VOCs, and the extent of anthropogenic influence, e.g., mass of sulfate in the particles. In the boreal region, where conifers and monoterpene emissions dominate, or in regions such as the Amazon, where deciduous forests and isoprene emissions dominate, the diel cycle in aerosol phase may be unlike our observations, whereas the phase state of aerosol in mixed forest regions such as in the southeastern United States may exhibit a similar diel cycle. Therefore, it is critical that future research expand on these findings, through devoted field measurements in different environments and through atmospheric modeling, to help better constrain the impact of particle phase state diel variability on climate, air quality, and public health.

# ASSOCIATED CONTENT

#### S Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.est.8b07319.

HR-ToF-AMS ionization efficiency calibration and ALW determination by ISORROPIA; bounce factor calculation; filter extraction and analysis by HPLC-ESI-ToF-MS; glass transition temperature derivation; daytime and nighttime differences in isoprene- and monoterpenederived SOA precursors; VOC reactivity table; BF daily time profiles; figures for diel wind direction and wind speed, relative humidity, and temperature; HYSPLIT back trajectories, double bond equivalence, and aromaticity index; night and day mass spectra from HPLC-ESI-ToF-MS; mole ratio of ammonium to sulfate; hygroscopicity effect on viscosity with time of day; and bulk diffusion time scales. (PDF)

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J.H.S., A.P.A., and P.B.S. wrote the paper. J.H.S., P.B.S., R.M.H., G.A.P., and B.E.B. designed the particle bounce research. J.H.S. and S.J.D. performed the bounce measurements. J.H.S. analyzed the data related to the bounce measurements and glass transition temperatures. A.P.A. designed and A.P.A., Z.L., A.L.B., and N.E.O. performed and analyzed the AFM and SEM-EDX measurements of single particle composition and spreading ratios. J.H.S., A.P.A., and R.D.C. setup sampling and inlets for the ELPIs (bounce factors), SMPS, and MOUDI. J.H.S. and R.D.C. operated the SMPS and analyzed the SMPS particle size distributions. R.D.C. collected aerosol particles with the MOUDI. A.T.B., H.W.W., and R.J.G. designed, performed, and analyzed data from the HR-ToF-AMS measurements. A.T.B. performed ISORROPIA modeling. J.C.D. and D.R.G. collected filter samples and analyzed particle composition and molar mass utilizing HPLC-ESI-ToF-MS. J.H.F., S.L.A., M.H.E., R.J.G., and H.W.W. designed, performed, and analyzed data from the measurements of meteorological data and SO<sub>2</sub>. All authors contributed intellectually to the manuscript.

## Notes

The authors declare no competing financial interest.

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