



1	Predicting Secondary Organic Aerosol Phase State and Viscosity and its Effect
2	on Multiphase Chemistry in a Regional Scale Air Quality Model
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25 Abstract

26 Atmospheric aerosols are a significant public health hazard and have substantial impacts on 27 the climate. Secondary organic aerosols (SOA) have been shown to phase separate into a highly 28 viscous organic outer layer surrounding an aqueous core. This phase separation can decrease the 29 partitioning of semi-volatile and low-volatile species to the organic phase and alter the extent of 30 acid-catalyzed reactions in the aqueous core. A new algorithm that can determine SOA phase 31 separation based on their: glass transition temperature (T_g) , Oxygen to Carbon (O:C) ratio, 32 concentrations relative to sulfate concentrations; and meteorological conditions were implemented 33 into the Community Multiscale Air Quality Modeling (CMAQ) System version 5.2.1 and was used 34 to simulate the conditions in the continental United States for the summer of 2013. SOA formed at the ground/surface level was predicted to be phase separated with core-shell morphology i.e. 35 36 aqueous inorganic core surrounded by organic coating, 68.5% of the time for continental United 37 States. The phase states of organic coatings switched between semi-solid and liquid states, 38 depending on the environmental conditions. The semi-solid shell occurring with lower aerosol 39 liquid water content (western United States and at higher altitudes) has a viscosity that was predicted to be 10^2 - 10^{12} Pa•s which resulted in organic mass being decreased due to diffusion 40 limitation. The organic phase was primarily liquid where aerosol liquid water was dominant 41 (eastern United States and at surface), with a viscosity $< 10^2$ Pa•s. Phase separation while in a 42 43 liquid phase state, i.e. Liquid-Liquid Phase Separation (LLPS), also reduces reactive uptake rates 44 relative to homogenous internally mixed liquid morphology, but was lower than aerosols with 45 thick viscous organic shell. The implementation of phase separation parameters in CMAQ led to 46 a reduction of fine particulate matter (PM_{2.5}) organic mass, with a marginal change in bias and 47 error ($< 0.1 \,\mu$ g/m³) compared to field data collected during the 2013 Southern Oxidant and Aerosol





Study. Sensitivity simulations assuming higher dissolution rate of isoprene epoxydiol (IEPOX) into the particle phase and the treatment of aerosol water content mitigated this worsening in model performance, pointing out the need to better constrain the parameters that govern phase state and morphology of SOA.

52 1 Introduction

53 Particulate matter (PM) is one of six criteria pollutants regulated by the United States 54 Environmental Protection Agency's (EPA) National Ambient Air Quality Standards (NAAQS), 55 established by the 1970 Clean Air Act. There are two categories of PM regulated by NAAQS: Fine 56 PM (PM_{2.5}), with particle diameter less than 2.5 µm, and coarse PM (PM₁₀), with particle diameter 57 up to 10 µm. PM has adverse effects on the global climate (Carslaw et al., 2013; Grandey et al., 58 2018; Lee et al., 2016; Regayre et al., 2015). PM_{2.5} also represents a substantial public health risk 59 due to its association with increased overall mortality, due to cardiorespiratory diseases (Hwang et al., 2017; Jaques and Kim, 2000; Zanobetti and Schwartz, 2009). It has been estimated that 20-60 61 60% of PM_{2.5} are comprised of organic aerosols (OA) (Docherty et al., 2008). These pollutant species are either directly-emitted primary organic aerosols (POA), or secondary organic aerosols 62 63 (SOA), which form when volatile organic compounds (VOCs) undergo chemical reactions that 64 reduce their volatility to the point that they either partition into the aerosol phase (Zhang et al., 65 2007) or react heterogeneously with the existing particles (Riva et al., 2019). Studies have found 66 that SOA tends to form the bulk of observed OA around the world (Nozière et al., 2015). The VOCs that form SOA may be either from biogenic or anthropogenic sources and can vary both 67 spatially and temporally to areas as confined as the community level (Yu et al., 2014). 68

69 Recent studies have shown that SOA may phase-separate under certain atmospherically 70 relevant conditions into different morphologies. These observations have included a "partially-





71 engulfed" organic-inorganic morphology; an "island" morphology, where discrete pockets of SOA 72 dot a larger inorganic particle; and a "core-shell" morphology, characterized by an organic rich 73 outer "shell" and aqueous inorganic "core" (Freedman, 2017; O'Brien et al., 2015; Price et al., 74 2015; Renbaum-Wolff et al., 2016; Song et al., 2015, 2016; You et al., 2012; Zhang et al., 2015, 75 2018a). Pye et al. (2018) applied the Aerosol Inorganic-Organic Mixtures Functional groups 76 Activity Coefficients (AIOMFAC) model (Zuend et al., 2008) to predict the thermodynamic 77 favorability of phase separation in SOA using a box model and found that aerosols over the 78 southeastern United States may be phase separated as frequently as 70% of the time. In other work, 79 Pye et al. (2017) used the ratio of organic matter to organic carbon (OM:OC) and the ambient relative humidity (RH) to predict phase separation frequencies exhibiting a complex behavior, 80 81 being more common in urban areas with low OM:OC at low RH, but higher phase separation 82 frequencies in rural areas attributed to increasing OM:OC at low RH.

83

84 When aerosols form a core-shell morphology, experimentally observed viscosities of the outer 85 organic-rich shell and inner electrolyte-rich core have been shown to differ by up to three orders 86 of magnitude resulting in possible diffusion limitations on reactive uptake (Ullmann et al., 2019). 87 It has also been shown that the viscosity and subsequently diffusivity of the organic phase (D_{org}) 88 may vary as a function of SOA composition (Grayson et al., 2017). Laboratory experiments have 89 been conducted to measure the viscosity of SOA using poke-flow and bead mobility techniques 90 (Reid et al., 2018; Renbaum-Wolff et al., 2013; Song et al., 2015, 2016). These studies have found 91 that SOA formed from anthropogenic precursors, such as benzene, toluene, and xylene, have similar D_{org} values in the realm of 10^{-14} - 10^{-16} m²/s (Grayson et al., 2016; Song et al., 2015, 2016, 92 93 2018). Similar studies on biogenic SOA comprised of α -pinene oxidation products, however found





that its measured viscosities and calculated diffusion coefficients are lower than those of
anthropogenic SOA by as much as 2 orders of magnitude at comparable conditions (Song et al.,
2016, 2018; Zhang et al., 2015).

97

98 The most abundantly emitted biogenic VOC is isoprene (2-methyl-1,3-butadiene) with average annual global emissions totaling to approximately 500-750 Tg-C yr⁻¹ (Guenther et al., 99 100 2006; Liao et al., 2015). Isoprene is known to react with hydroxyl (OH) radicals under low- NO_x 101 (=NO+NO₂) conditions to form isoprene hydroxyhydroperoxides (ISOPOOH) (Jacobs et al., 2014; 102 Krechmer et al., 2015). If the reaction pathway continues with OH, ISOPOOH will react again to 103 form isoprene epoxydiol (IEPOX) (Bates et al., 2014; Paulot et al., 2009; Surratt et al., 2010). It is 104 possible for IEPOX to form products with sufficiently low volatility to form SOA via a reactive 105 uptake pathway onto acidified sulfate seed particles (Bondy et al., 2018; Surratt et al., 2006, 2007, 106 2010). IEPOX-derived SOA have been observed to account for up to 36% of biogenic SOA in the 107 southeastern United States during the summer (Budisulistiorini et al., 2016). Given the importance 108 of this pathway there has been increased focus on the phase state of particles and its impact on 109 reactive uptake (Budisulistiorini et al., 2017).

110

Prior measurements of isoprene-derived SOA suggested that it would not be viscous enough to exhibit diffusion limitations; however, there is much uncertainty with these measurements as those particles mainly formed through nucleation of semi-volatile species (Song et al., 2015). IEPOX-derived SOA that specifically account for up to one-third or more of total organic aerosol mass in southeastern United States has shown to exhibit higher volatility than the remaining bulk, but IEPOX-derived SOA does have a low volatility (Lopez-Hilfiker et al., 2016). However, IEPOX





117 heterogeneous reaction pathways that typically happen in the ambient conditions lead to formation 118 of organosulfates that have potentially higher viscosities (Riva et al., 2019). Furthermore, RH 119 (Huang et al., 2018; Pajunoja et al., 2014; Song et al., 2015, 2016; Zhang et al., 2015, 2018a), 120 temperature (Maclean et al., 2017), degree of oligomerization, and mass loading (Gravson et al., 121 2016) also impact particle viscosity. Higher RHs may result in more water to partition into the 122 particle and act as a plasticizer which decreases its viscosity (Song et al., 2015, 2016, 2018; Zhang 123 et al., 2011). Higher temperatures also increase the diffusion coefficient (Chenyakin, 2015). Degree of oligomerization increases the viscosity of SOA and therefore reduce its Dorg. as well 124 125 (Grayson et al., 2017). The competing sinks between heterogeneous reactions and losses of semi-126 volatile gas species also amplify the effects of phase state on aerosol formation (Zhang et al., 127 2018a). The experimental data provided from previous studies highlight the urgency of incorporating those results into regional and global models to predict the effects of phase states in 128 129 aerosol formation in the ambient environment accurately. A recent study by Schmedding et al. 130 (2019) used a dimensionless (0D) box model for phase-separated SOA formation at the Look Rock 131 Site during the 2013 Southern Oxidant and Aerosol Study (SOAS). Our prior work found that the 132 inclusion of a phase-separation parameter could either inhibit SOA due to diffusion limitations in 133 the separated organic phase or increase it by concentrating the electrolytes into the aqueous core 134 leading to faster acid-catalyzed reactions. This resulted in decreasing normalized mean error 135 (NME) of the model from 83.4% to 77.9% and the normalized mean bias (NMB) from -66.2% to 136 -36.3% compared to a previous work simulating the same dataset that assumed homogenous 137 aerosol (Budisulistiorini et al., 2016). Our previous model study (Schmedding et al., 2019) 138 highlighted the significant impact of an organic coating layer on IEPOX-derived SOA formation,





- 139 but lacked any quantification of conditions that result in phase separation creating such organic
- 140 coating and its phase state.
- 141

142 The inclusion of an explicit reaction pathway for the reactive uptake of acid-catalyzed IEPOX-143 derived SOA in both regional and global scale chemical transport models (CTMs), such as the 144 Community Multi-Scale Air Quality Model (CMAQv5.2.1) and the Goddard Earth Observing 145 System (GEOS-Chemv11-02-rc), have substantially improved the performance of predicted SOA 146 yields (Marais et al., 2016; Pye et al., 2013; Pye et al., 2017). These models do not include 147 parameters in their aerosol algorithms that account for aerosol phase separation and its impact on 148 SOA formation (Marais et al., 2016; Pye et al., 2017, 2018), which can lead to potential deviations 149 of aerosol quantification. This work systematically examines when coatings comprised of OA 150 derived from a mixture of biogenic and anthropogenic compounds are formed (i.e. predicting phase 151 separation frequencies and how coatings impacts SOA formation from acid-catalyzed multiphase 152 reactions of IEPOX) by implementing parameterizations to determine the viscosity and phase-state 153 of particles (liquid or glassy) in CMAQ and simulating for the continental United States. 154

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- 155

156 2 Methods

157 **2.1** Phase state and its impact on reactive uptake: overview

Organic constituents of an aerosol exhibit a solid-like glassy phase when the ambient temperature is below the glass transition temperature (T_g) , which is a function of RH and the aerosol composition (DeRieux et al., 2018). A liquid phase occurs when the T_g is lower than ambient temperature. The difference in viscosity (η_{org}) of organic-rich phase of aerosol, below





and above the T_g , may be as high as 8 orders of magnitude (Marsh et al., 2018). The T_g can 162 determine when aerosols are in a highly viscous glassy state ($\eta_{org} \ge 10^{12} Pa \cdot s$), a semisolid 163 state ($100 \le \eta_{org} < 10^{12} Pa \cdot s$), or in a liquid state ($\eta_{org} < 100 Pa \cdot s$) (Marcolli et al., 2004; 164 165 Martin, 2000). Aerosols in a highly viscous or a semisolid state are assumed to be phase separated 166 as a model simplification (refer to Section 2.3). This simplification is based on recent observations 167 showing higher than anticipated rebound fractions (i.e., almost full resistance to reactive uptake) attributed to organic aerosol constituents with viscosities > $10^2 Pa \cdot s$. These aerosols were phase 168 169 separated having an amorphous solid coating, which, unlike liquid particles, can only dissipate energy by rebounding (Bateman et al., 2015a, 2015b, 2017; Reid et al., 2018; Virtanen et al., 2010). 170 171 Aerosols that are in a liquid state may either be an internal homogenous mixture, or they can also 172 be phase separated known as liquid-liquid phase separation (LLPS). The occurrence of LLPS 173 depends on the average O:C ratio, organic mass to sulfate ratio, ambient temperature and ambient 174 RH (Song et al., 2018; Zuend and Seinfeld, 2012). In addition, a sensitivity case was completed 175 where it was not assumed that a semisolid state is always phase-separated, and instead the LLPS 176 criteria was applied for conditions that produce a low aerosol water content (refer to Section 2.6). 177

Phase state of an organic shell impacts reactive uptake by affecting the diffusivity of a species through this outer organic phase (D_{org}). D_{org} can be related to the viscosity of the organic phase (η_{org}) using the Stokes-Einstein Equation, as shown in Eq. (1) (Ullmann et al., 2019):

181
$$D_{org} = \frac{k_b T}{6\pi \eta_{org} r_{diffusive}}$$
(1)





- 182 Where k_b is the Boltzmann constant, T is the ambient temperature, η_{org} is the organic phase
- 183 viscosity, and $r_{diffusive}$ is the hydrodynamic radius of the molecule diffusing through the
- 184 viscous organic phase.

185

2.2 Determining the Glass Transition Temperature (*T*org)

The combined T_{org} for anthropogenic and biogenic species and aerosol water associated with them was found using a modified version of the Gordon-Taylor Mixing Rule, as represented in Eq. (2) (DeRieux et al., 2018; Gordon and Taylor, 1952):

190
$$T_{org} = \frac{\left(w_s T_{g,w} + \frac{1}{k_{GT}} \left(w_a T_{g,a} + w_b T_{g,b}\right)\right)}{w_s (RH) + \frac{1}{k_{GT}} \left(w_a + w_b\right)}$$
(2)

where $T_{g,w}$ is the glass transition temperature of water (137 K) (Koop et al., 2011). $T_{g,a}$ and $T_{g,b}$ are the respective glass transition temperatures (K) for the anthropogenic (also includes all combustion-generated POA in addition to VOC-derived SOA, see Table 1) and biogenic (only includes VOC-derived SOA, see Table 1) fractions of OA. K_{GT} is the Gordon-Taylor constant, which is assumed to be 2.5 based off of Koop et al., (2011). w_a and w_b are the mass fractions of anthropogenic and biogenic OA species, respectively. $w_s(RH)$ or simply w_s is the mass fraction of organic aerosol water.

198

For this work, it was assumed that 10% of the aerosol water was present in the organic phase, within the range of organic water reported by Pye et al. (2017). In CMAQv5.2.1, the total aerosol water, 10% of which is directed to the organic phase, is predicted by ISORROPIA and only associated with inorganic electrolytes such as, ammonium bisulfate (Pye et al., 2017). As





203 represented in Eq. (3), the w_s along with the w_a and w_b make up the organic-water component of

205
$$w_s = 1 - (w_a - w_b)$$
 (3)

206

207 Shiraiwa et al. (2017) used 179 organic species to fit a relationship between T_g , the molar 208 mass (M), and O:C ratio (Shiraiwa et al., 2017). Following the same relationship as in Eq. (4), the 209 respective glass transition temperatures for the anthropogenic and biogenic fractions ($T_{g,a}$ and $T_{g,b}$, 210 also referred as, T_{biog} and T_{anth}) were calculated using the weighted average molar mass (M_x) and 211 O:C ratio $((O:C)_x)$ for all individual anthropogenic and biogenic species addressed in CMAQ (see 212 Table 1). Where, x refers to a - anthropogenic OA (anth) or b- biogenic OA (biog); i refers to 213 individual species: $T_{g,x} \text{ or } T_x = -21.57 + 1.51 M_x - 0.0017 M_x^2 + 131.4(0; C)_x - 0.25 M_x(0; C)_x$ 214 (4)

215 Where, $M_x = \sum (w_{i,x} * M_{i,x})$; $0: C_x = \sum (w_{i,x} * 0: C_{i,x})$; $w_{i,x} = \frac{Mass \ Concentration_{i,x}}{Total \ Mass \ Concentration_x}$

216

217 When the ambient temperature is below the T_{org} , the viscosity of the coating (η_{org}) is 218 assumed to remain constant at $10^{12} Pa \cdot s$. When the ambient temperature is greater than or equal 219 to the calculated T_{org} , the viscosity of the organic phase is calculated using a modified Vogel-220 Tamman-Fulcher Equation (DeRieux et al., 2018; Fulcher, 1925; Tamman and Hesse, 1926; 221 Vogel, 1921) as shown in Eq. (5) with experimentally fitted parameters as shown in Eqs. (6) and 222 (7):

223
$$log_{10}(\eta_{org}) = -5 + 0.434 \frac{T_0 D}{T - T_0}$$
 (5)

224
$$T_0 = \frac{39.17T_{org}}{D+39.17} \tag{6}$$





225	$D = 14.4 - 2.3(0:C)_{avg} \tag{7}$
226	
227	T is the ambient temperature (K), T_0 is an experimentally fitted parameter of Eq. (5) that
228	varies as a function of T_{org} and the fragility parameter D , which is a function of the O:C ratio
229	(DeRieux et al., 2018; Zhang et al., In Prep). $O: C_{avg}$ refers to the overall OA (including both POA-
230	all anthropogenic and SOA- anthropogenic and biogenic, see Table 1) O:C ratio given by CMAQ.
231	
232	The effective diffusion coefficient for IEPOX through the organic coating (D_{org}) was then
233	calculated using the Stokes-Einstein Equation (refer to Eq. (1)), assuming that $r_{diffusive} = 1 \text{ nm}$
234	(Evoy et al., 2019; Ullmann et al., 2019).
235	
236	2.3 Phase Separation
237	SOA phase state was determined by multiple criteria. As a model simplification, any SOA
238	was considered to be semisolid –phase separated (SSPS) when $\eta_{org} > 100 \text{ Pa} \cdot \text{s}$ ($T_{org}: T \ge 0.8$) based
239	on Shiraiwa et al., (2017) as shown in Figs. 1 and 4A. LLPS occurs for aerosols with $\eta_{org} \leq 100$
240	Pa•s (T_{org} : $T < 0.8$) when RH \leq separation relative humidity (SRH_{LLPS}). Song et al. (2018) suggests
241	that LLPS always happens when $(0: C_{avg}) \leq 0.56$, which we implemented to predict phase
242	separation along with conditions specified for $(0: C_{avg}) > 0.56$ in Eqs. (8) and (9). The SRH _{LLPS}
243	is dependent on OA composition as shown in Eqs. (8) and (9) based on Bertram et al. (2011),
244	Zuend and Seinfeld (2012) and Song et al. (2018):
245	$SRH_{LLPS} = 35.5 + 339.9(0:C_{avg}) - 471.8(0:C_{avg})^2 $ (8)
246	when $0.56 < (0: C_{avg}) \le 0.73$ and
247	$0.1 < (OM : Inorganic Sulfate) \le 15$





248				
249	$SRH_{LLPS} = 0$	i.e.no LLPS		(9)
250	when $(0: C_{avg}) > 0$	1.73 and		
251	0.1 < (<i>OM</i> : <i>Inorga</i>	enic Sulfate) ≤ 15		
252				
253	2.4 Model description	on and implementation		
254	All simulations	were completed in CMAQv5.2	2.1 for the SOAS campaign from	n June 1 -
255	July 15, 2013, with ten	days of spin-up time starting on	May 21, 2013. Model inputs are	described
256	in Xu et al. (2018). Th	e horizontal resolution of the sin	nulation was 12km x 12km. Moo	lel vertical
257	extent between the sur	face and 50 hPa (representing p	ossible stratospheric influences)	consisted
258	of 35 layers of variabl	e thickness. Weather Research	and Forecasting model (WRF)	Advanced
259	Research WRF (ARV	V) version 3.8 with lightning	assimilation was used to get	nerate the
260	meteorological inputs	for the simulations (Appel et al	., 2017; Heath et al., 2016). Th	e National
261	Emission Inventory (N	VEI) 2011 v2 produced by the	EPA was used to generate anth	ropogenic
262	emissions. Biogenic er	nissions were determined using	the Biogenic Emission Invento	ry System
263	(BEIS) v3.6.1 (Bash et	al., 2016). BEIS predicts lowe	r emissions amounts for isoprer	e than the
264	Model of Emissions of	f Gases and Aerosols from Nati	ure (MEGAN) (Carlton and Bal	ker, 2011).
265	Therefore, emissions o	f isoprene were increased in this	work to 1.5x their original level	s based on
266	Pye et al. (2017) who f	ound that this increase led to be	tter agreement with field measur	rements of
267	isoprene and OH at the	e Centreville site during the 201	3 SOAS. Carbon Bond v6.3 (C	B6r3) was
268	used for the gas-phase	chemistry in the model (Emery o	et al., 2015; Hildebrant Ruiz and	Yarwood,
269	2013; Yarwood et al., 2	2010).		
270				





271 **2.5 Reactive Uptake**

- IEPOX-derived SOA is modeled with a first-order heterogeneous uptake reaction that includes a new term that accounts for diffusion limitations due to an organic coating when the aerosol phase state demands it, as described below in Eqs. (10)-(13) (Anttila et al., 2006; Gaston et al., 2014; Ryder et al., 2014; Budisulistiorini et al., 2017). The impact of organic coating was
- 276 not considered in the original IEPOX reactive uptake algorithm in CMAQ (Pye et al., 2013):

$$277 \quad IEPOX_{(g)} \rightarrow IEPOXSOA_{(aerosol)} \tag{10}$$

278 This first-order heterogeneous-reaction rate constant (k_{het}) is defined as:

$$279 k_{het} = \frac{SA}{\frac{r_{\rm p}}{D_g} + \frac{4}{\nu_{\gamma}}} (11)$$

280 Where SA is the aerosol surface area $(\mu m^2/m^3)$, v is the mean molecular speed (m/s) of gas phase

281 IEPOX estimated by Eq. (12):

$$282 \qquad v = \sqrt{\frac{8*R*T}{\pi * MW_{IEPOX}}} \tag{12}$$

 r_p is the effective molecular particle radius including both the inorganic core and organic shell

284 (m),
$$D_g$$
 is IEPOX diffusivity in the gas phase $(1.9 * (MW_{IEPOX})^{-\frac{2}{3}} \frac{m^2}{s})$, $MW_{IEPOX} = 118$ g mol⁻¹ is

285 the molecular weight of IEPOX and γ is the reactive uptake coefficient:

$$286 \qquad \frac{1}{\gamma} = \frac{1}{\alpha} + \frac{v * r_p^2}{4H_{inorg} * R * T * D_a * r_{core}} \frac{1}{q * coth(q) - \frac{1}{q}} + \frac{v * l_{org} * r_p}{4 * H_{org} * R * T * D_{org,eff} * r_{core}}$$
(13)

287

288 α is the accommodation coefficient (0.02). H_{inorg} is the Henry's Law coefficient into the 289 inorganic phase $(3 * 10^7 \frac{M}{atm})$. *R* is the gas constant (0.08026 $\frac{L*atm}{K*mol}$), *T* is the ambient temperature 290 (*K*).





291 D_a is the IEPOX diffusivity in the aerosol core $(10^{-9} \frac{m^2}{s})$ and q is the diffuso-reactive 292 parameter as defined in Eq. (13):

293
$$q = r_{p} \sqrt{\frac{k_{particle}}{D_{a}}}$$
(14)

294

295 $k_{particle}$ is the pseudo-first order rate constant (s^{-1}) defined in Eq. (14) (Pye et al., 2013), 296 with parameters defined in Table 2:

297
$$k_{particle} = \sum_{i=1}^{N} \sum_{j=1}^{M} k_{i,j} [nuc_i] [acid_j]$$
(15)

298

299 $D_{org,eff}\left(\frac{m^2}{s}\right)$ is the effective diffusivity of IEPOX through an organic coating compromised of 300 the species given in Table 1 and 10% of the total aerosol liquid water.

301

302 The contribution of organic species to the volume of the core is assumed negligible and water 303 moves freely between the inorganic core and the organic shell, leading to approximately 90% 304 aerosol water in inorganic core and 10% in the organic shell for this work as described by Pye et 305 al. (2017). An extension of this assumption is that the inorganic ion species are concentrated entirely within the aqueous core when calculating $k_{particle}$. H_{org} (2 * 10⁵ M/atm) is the effective 306 Henry's Law constant for the organic coating and lorg is the organic phase thickness given by Eq. 307 308 (16) calculated at each time step based off of Riemer et al. (2009). r_p is the surface-area weighted median particle radius based on surface area distribution of different species and β is the ratio of 309 310 inorganic particle volume (90% of the particle water and inorganic species) to the total particle 311 volume (all organic species, water, and inorganic species):

312
$$l_{org} = r_p (1 - \beta^{\frac{1}{3}})$$
 (16)





313 314 r_p is the effective aerosol radius (m) same as in Eqs. (11), (13) and (14), and r_{core} is the aerosol 315 inorganic core radius (m). r_{core} is defined based off of Riemer et al. (2009) below: $r_{core} = r_p \beta^{\frac{1}{3}}$ 316 (17)317 318 Particles that did not have LLPS or SSPS morphology were assumed to form a homogenous mixture of organics and inorganics (i.e. $l_{org} = 0$), reducing Eq. (13) to the standard CMAQ 319 320 treatment. 321 322 2.6 Sensitivity simulations 323 A sensitivity simulation (Emission Reduction) was conducted using the EPA's emission 324 reductions estimates of 34% and 48% for NOx and SO₂, respectively, from 2013 to 2025 (Marais

325 et al., 2016; Eyth et al., 2014). A second sensitivity (HighHorg) was conducted that used the same upper bound of H_{org} as reported by Schmedding et al. (2019) increasing the value from $2*10^5$ 326 327 M/atm to $3*10^8 M/atm$. To better understand the effects of viscosity on particle morphology and 328 phase separation, a third sensitivity simulation (PhaseSep2) was conducted where the phase 329 separation of particles was determined solely by Eqs. (8) and (9). This simulation excluded the 330 erstwhile criteria that particles with $\eta_{org} > 100$ Pa•s were automatically phase separated with a 331 semi-solid outer core, also referred as SSPS morphology. Table 3 gives a brief description of the 332 NonPhaseSep simulation (base CMAQ without phase state and organic coating impacts), the new 333 PhaseSep proposed in this work, and the three sensitivity simulations: Emissions Reductions, 334 HighHorg, and PhaseSep2.





336 **2.7 Measurement Comparisons**

337 Field data were collected using a high-resolution time-of-flight chemical ion mass-spectrometer 338 (HTOF-CIMS) coupled with a filter inlet for gases and aerosols (FIGAERO) and a two-339 dimensional gas chromatogram time-of-flight mass spectrometer (GC×GC-TOFMS) at the 340 Centreville, AL site during the 2013 SOAS campaign (Zhang et al., 2018b). The combined 341 measurements provide comprehensive and quantitative molecular compositions of over 800 OA 342 species with a time resolution of 4 hours. Chemical formulas were assigned to all the species based 343 on high-resolution peak fitting and hence their O:C ratios and molecular weights are known, which 344 were then used to empirically calculate the average T_{org} of the OA at the site for the duration of 345 the entire SOAS campaign (June 1- July 15, 2013). The speciated OA were estimated to account 346 for 74% of total fine OA mass during SOAS. The uncharacterized fraction of fine OA (e.g., 347 organosulfur compounds) will likely have some influence on the estimated T_{org} . Also note that 348 both techniques use thermal desorption approach to analyze OA composition which was recently 349 shown to cause thermal decomposition for certain species (Lopez-Hilfiker et al., 2016; Cui et al., 350 2018). Thus, some interferences in T_{org} estimation could be expected by thermal decomposition; 351 however, at this time it remains unclear how substantial these interferences could be due to lack 352 of understanding of the degree of decomposition that occurs in these analytical methods. 353 Nevertheless, to our knowledge, this is the most comprehensive molecular-level OA speciation 354 data set, and thus, is appropriate to use for comparison with modeled Torg in this work.

355

Model simulation results (*PhaseSep, HighHorg* and *PhaseSep2*) were compared to recorded values for PM_{2.5} organic carbon mass concentration at monitoring stations that are a part of the





- 358 South Eastern Aerosol Research Characterization study (SEARCH) (Hansen et al., 2003) to better
- 359 constrain the parameters used in the calculation γ_{IEPOX} .
- 360
- 361
- 362 **3 Results**

363 **3.1 Predicted Aerosol Phase State**

364 The ratio of T_{org} to the ambient T is the strongest indicator of the phase state of the aerosol. The mean value for Torg for all grid cells on the surface level and for all time steps was 207 K with a 365 366 maximum value of 284 K, a minimum value of 137 K, and a median of 223 K. The values of T_{biog} 367 and Tanth ranged from 160-301 K and 230-311 K, respectively. This indicates that anthropogenic 368 species have a higher range of glass transition temperatures than biogenic species; however, the 369 maximum values of T_{biog} and T_{anth} are relatively closer than their minimum values. This is 370 attributed to the abundant biogenic acid-catalyzed IEPOX-derived SOA species, such as organosulfates and 2-methyltetrols, having a high T_g of 301 K and a viscosity of 10^{12} as shown in 371 372 Table 1. An Analysis of variance (ANOVA) test was completed to determine if Torg, Tbiog, and Tanth were significantly different ($p < 2*10^{-16}$). It was found that the aforementioned three categories of 373 374 glass transition temperatures were statistically different from each other.

375

For the simulation period, the diurnal variability (i.e., between day and night) in the ambient Tat any site was ~10 K, while T_{org} varied by as much as 75 K within a 24-hour period. This indicates that changes in the T_{org} :T ratio (i.e. Phase state) were driven by T_{org} (i.e., composition of the

379 organics-water system) rather than *T*.





381 Figure 1 gives the predicted probability density distribution of the Torg: T ratio at the surface level 382 of CMAQ for all grid cells and time steps. At the surface the range of Torg. T ratios was from 0.455 383 to 0.987 with a median value of 0.763 and a mean value of 0.703. In the surface layer over 63.5%384 of the T_{org} : T ratios were less than 0.8, a value which is given as the transition point from a semi-385 solid viscosity to a liquid-like viscosity (Shiraiwa et al., 2017), while the other 36.5% of the 386 condition that the T_{org} : T were more than 0.8, indicating the aerosols were in semi-solid phase state. Also shown in Figure 1 are the T_{org} : T ratio at the 18th layer (~ 1.8 km above ground level), 28th 387 layer (~ 8 km above ground level) and the 35th layer (~ 17 km above ground level). For 18th layer 388 (i.e., lower troposphere), Torg: T ratios ranged from 0.464 to 1.022 with a median value of 0.807 389 and mean value of 0.772. For 28th layer (i.e., upper troposphere), Torg: T ratios ranged from 0.523 390 to 1.201, with a median value of 0.890 and mean value of 0.892. For 35th layer (i.e., stratosphere), 391 392 Torg: T ratios ranged from 0.901 to 1.37, with a median value of 1.114 and mean value of 1.131. 393 The frequency of liquid-like viscosity based on the T_{org} : T < 0.8 cut-off reduced to 47.31% for 18th and 0% for 35th layer eventually. Similarly, frequency of semi-solid or glassy particles based on 394 the $T_{org}: T \ge 0.8$ cut-off increased to 52.69% for 18th, 84.38% for 28th and 100% for 35th layers 395 396 eventually.

397

Figure 2A shows a map of the average surface layer T_{org} : *T* ratio across the Continental United States for the duration of the simulation. The T_{org} : *T* ratios exhibited a bimodal distribution both at the surface (Fig. 1 and Fig. 2A) and in the lower troposphere (Fig. 2B), where particles over the oceans had substantially higher w_s , driving down their T_{org} : *T* ratio. Semi-solid particles with a higher range of T_g values (Fig 2A) were concentrated over areas associated with higher anthropogenic SOA (including anthropogenic POA listed in Table 1) and a low RH, aerosol liquid





404 water content, and biogenic SOA (i.e., the American southwest and Rocky Mountains). These higher T_g values pulled the net T_{org} value up closer to the ambient temperature, and thus, brought 405 406 the T_{org} : T ratio closer to 1. The particles with the lowest T_{org} : T ratios were located over the Atlantic 407 and Pacific oceans, due to the substantially higher aerosol water content and low levels, or even 408 lack of anthropogenic and biogenic organics in these environments. 409 410 Figures 2B, 2C and 2D show the spatial profiles of the mean T_{org} : T ratio for each grid cell at the 411 18th layer of CMAQ (lower troposphere), 28th layer of CMAQ (upper troposphere) and the 35th 412 layer of CMAQ (stratosphere). The value of T drops with the decreasing pressure. The O:C ratio 413 of the particles are predicted to increase when compared to the surface due to atmospheric 414 oxidation. The mean O:C ratio at the surface was 0.73, while across the troposphere (at layers 18 415 and 28) it was 0.75, and at layer 35 it was 0.77. The mean value of Torg also increased from 207 K 416 at the surface to 219 K at layer 18, 223.5 K at layer 28 and 239 K at layer 35. This change in T_{org} 417 was primarily driven by decreases in organic water in the aerosol. The mean concentration of water associated with organics (w_s) at the surface was 29%. At layer 18, this concentration was 17%, at 418 419 layer 28 it was 11.5% and at layer 35 it was 1.4%. The removal of water from the organic phase led to the disappearance of the bimodal T_{org} : T ratio beyond the 28th layer (upper troposphere). The 420 mean T_{org} : T ratio was less than 1 for all grid cells at the 18th layer (lower troposphere), and 59.7% 421 422 of particles were likely to be liquid based on the T_{org} : T ratio < 0.8. The remaining 40.3% of particles were semi-solid because their Torg: T values were between 0.8 and 1. Semi-solid particles 423 were still concentrated over the American southwest and Rocky Mountains. At the 18th laver 424 425 (upper troposphere), 69.35% of the particles were semi-solid with T_{org} : T ratio between 0.8 and 1, 426 with 15.61% and 15.03% of particles likely to be liquid (T_{org} : T ratio < 0.8) and solid (T_{org} : T ratio





> 1). At the 35th layer of CMAQ, all particles had a T_{org} : T ratio > 1, indicating that the organic 427 428 phases of all of the particles had glassy viscosities. By layer 35 (stratosphere), the particles mostly 429 exhibit a solid-like behavior across the Continental United States. Particles with the highest Torg: T 430 ratio at this altitude were located over the southern half of the simulation area, with T_{org} : T ratios 431 approaching 1 in the northern half of the simulation. Particles in the Northern half of the Continental United States domain had higher concentrations of biogenic and anthropogenic SOA 432 433 in comparison to those in the southern half of the domain and therefore had higher Torg values than 434 their southern counterparts had.

435

436 Figure 3 is an illustrative example through model data extracted for June 1 - June 15, 2013, at 437 two SEARCH monitoring sites. Figure 3 shows the diurnal profile and relative contributions of 438 the model predicted anthropogenic, biogenic and water fractions to T_{org} for a rural site in 439 Centreville, Alabama (Fig. 3A) and at an urban site at the Jefferson Street, Atlanta, Georgia (Fig. 3B). Both Centreville and Atlanta sites (Fig. 3) had Torg values that ranged from 175-250 K (Fig. 440 S1). The Centreville site, however, is rural and the T_{org} is more dominated by biogenic emissions 441 442 (Fig. 3A). Whereas, the Jefferson Street site has a significant contribution by both anthropogenic 443 and biogenic emissions, but anthropogenic dominating slightly (Fig. 3B). Fig. S1 gives the diurnal 444 pattern of relative contribution of aerosol liquid water to T_{org} . The peaks in T_{org} coincided with the 445 daytime period of high emissions of VOCs and lower contribution of aerosol liquid water (Figs. 3 446 and S1). At night, due to higher contribution of aerosol liquid water, T_{org} is lower than daytime for 447 both the sites (Fig. S1). Figure 3B shows that T_{org} at the Jefferson Street, Atlanta, Georgia has 448 similar peaks, but a higher minimum value during the night, due to the higher budgets of anthropogenic VOCs or combustion-generated anthropogenic POA as compared to biogenic. Both 449





- 450 sites have a relatively high contribution of aerosol water (generally true for eastern United States,
- 451 see Fig. 2A) to the organic phase, especially at night for 18:00-8:00 local day hours (Fig. S1).
- 452

453 **3.1.1 Predicted Viscosity**

454 The abundance of water relative to organics (Fig. 4F) drives the model predicted variability in 455 viscosity and phase separation. Whether a particle is semi-solid, or liquid, and whether it is in a 456 LLPS state is influenced by the proportion of SOA constituents, including uptake of water by them 457 and has implications for the organic-phase viscosity. Figures 4D-F show that, ws (i.e., water related to organic phase) had the strongest correlation with η_{org} (r = 0.919) followed by w_b (r = 0.736) 458 and w_a (r = 0.620) (i.e., biogenic and anthropogenic constituents in the organic phase, respectively). 459 460 Figure 4A gives the probability density distribution of η_{org} at the surface level for all grid cells and time steps. The predicted viscosity for *PhaseSep* simulation ranged from 5.94*10⁻³ Pa•s to 461 5.31*10¹¹ Pa•s with a mean value of 8.45*10⁵ Pa•s (median of 343 Pa•s). As shown in Figure 4A, 462 463 the overall phase separation frequency was 68.5%, where 54.8% of predicted viscosities were greater than 100 Pa•s, indicating that they exhibited SSPS morphology. The mean of η_{org} of SSPS 464 465 particles was $1.54*10^6$ Pa•s, and the median was $7.79*10^3$ Pa•s. The remaining 13.7% of the phase-466 separated particles exhibited a LLPS morphology. The median viscosity of LLPS particles was 467 1.14 Pa•s with a mean of 14.2 Pa•s with a range of 7.86*10⁻³ to 99.99 Pa•s. Ambient RH was also more strongly correlated with η_{org} (r = 0.677) than O:C ratio (r = 0.62) (Fig. 4B-C). $D_{org,eff}$, which 468 is inversely related to η_{org} as derived from Eq. (1), had a range 1.20 *10⁻²⁴ m²/s to 3.58*10⁻¹¹ m²/s 469 and a mean and median of 3.40*10⁻¹² m²/s and 3.94*10⁻¹¹ m²/s, respectively. The mean O:C ratio 470 471 was 0.678, with a range of 0.101 to 0.730. The mean fraction of the organic phase composed of 472 water (w_s) was 42.4% with a range of 1.04 *10⁻⁴ to 99.9%. The mean values of w_b and w_a in LLPS





- were 19.8% and 37.7%, respectively, with ranges of 1.76*10⁻⁵ to 82.1% and 2.15*10⁻⁵ to 96.9%.
 This suggests that anthropogenic aerosol components are likely more water soluble than biogenic
- 475 components.
- 476
- 477 **3.1.2 Comparison to Observed data**

478 Figure 5 shows the T_{org} : T ratio calculated from speciated organic aerosol composition field 479 data at the Centreville, Alabama field site (Zhang et al., 2018b) during the 2013 SOAS period. 480 Torg: Tratio derived from data collected by Zhang et al. (2018b) ranged from 0.630 to 0.881. Also 481 shown in Fig. 5 are the predicted T_{org} : T ratios using the phase separation (PhaseSep) 482 parameterization. CMAQ modeled Torg: Tratio using PhaseSep simulation ranged from 0.531 to 483 0.902, slightly exceeding the range predicted from observations. It should be noted that the Zhang 484 et al. (2018b) observations were recorded every four hours for $\sim 60\%$ of the 2013 SOAS time 485 period. Modeled Torg: T mostly captures the peaks and drops, which the observation derived Torg: T 486 shows (Fig. 5). Some mismatch can be attributed to the lack of an explicit mechanism to compute 487 organic aerosol water uptake and some unaccounted SOA formation mechanisms. Further, Zhang 488 et al. (2018b) only accounted for $\sim 70\%$ of SOA species listed in Table 1. During this time period 489 the model had a normalized mean bias (NMB) of 2.37% when compared to observationally 490 calculated values. Median and mean Torg: T ratios predicted from the 2013 SOAS field observations 491 of 0.799 and 0.773, respectively, were quite close to the corresponding values of 0.784 and 0.769 492 predicted by PhaseSep simulation in CMAQ. The difference in observed and model estimated 493 T_{org} : T range was statistically significant with a P-Value = 0.001, and a correlation coefficient of ~ 494 0.66 between them. There is also a discernable consistent diurnal trend across the 2013 SOAS





- 495 period for T_{org} : T, such as stronger contribution of aerosol liquid water for 18:00-08:00 hours and
- 496 a lowering of the T_{org} : T during those hours (Fig. 3A and S1).
- 497

498 Figure 6 shows the predicted viscosity of our phase separation implementation for all days, 499 grid cells and layers sorted into 10% RH bins. The trends in range of modeled η_{org} are the same as 500 in Fig. 4B, with narrower ranges at lower RH and wider ranges with increasing RH. Wider η_{org} 501 ranges at higher RH can be explained by increased diffusivity with higher aerosol liquid water in 502 SOA causing quick mixing times often accompanied with drastic differences in composition. Also, 503 shown in Fig. 6 are viscosities of aerosols made in the laboratory. The red dots represent the 504 viscosities of α -pinene SOA measured by Zhang et al. (2018a), and the blue box plots represent 505 the range of viscosities of toluene SOA measured by Song et al. (2016). Both laboratory-based 506 experimental studies show good agreement at atmospherically-relevant RH ranges with the 507 viscosities predicted by our implementation. At lower RH ranges ($\sim 30\%$), the experimentally 508 measured viscosities are slightly higher than those predicted by our study. This can be attributed to shattering of highly viscous SOA ($\eta_{org} \ge 10^6$ Pa•s) for RH $\le 30\%$ that inhibits their flow in 509 510 laboratory measurements of η_{org} (Renbaum-Wolff et al., 2013; Zhang et al., 2015; Zhang et al., 511 2018a).

512

513 3.2 Impact on Model predictions

514

3.2.1 Reactive uptake coefficient of IEPOX (*y*_{IEPOX})

515 Previous experimental studies show that phase separation forming semi-solid organic 516 aerosol coatings is expected to decrease IEPOX reactive uptake (γ_{IEPOX}), and thus, the resulting 517 SOA (Zhang et al., 2018a). Figure 7A shows reductions in γ_{IEPOX} with *Emission Reduction*





sensitivity case subsequently reducing SOA (Fig. 10A), in agreement with recent modeling 518 519 predictions that show emission reductions expected by 2025 lead to reductions in IEPOX SOA 520 (Marais et al., 2016). This study implemented the phase separation and the phase separation 521 parameters into CMAQ (PhaseSep), showing agreement with the previous experimental work (Zhang et al., 2018a), with the mean value of γ_{IEPOX} decreasing to 1.141*10⁻³ or a 18.3% decrease 522 at the surface level, compared to 1.397*10⁻³ in original CMAQ with no phase separation considered 523 524 (*NonPhaseSep*) (Fig. 7A). Similarly, the median value of γ_{IEPOX} for the *PhaseSep* case reduced to 525 4.454*10⁻⁵ from 1.479*10⁻⁴ for NonPhaseSep simulation. For southeastern United States, it is clear that an overall shift of higher γ_{IEPOX} values > 10⁻³ to lower values ranging between 10⁻⁴ to 10⁻⁶ 526 527 occurs with introduction of phase separation and phase state parameters in CMAQ (Fig. S2). For 528 continental United States, there is a similar trend with the shift in highest peak of the probability 529 distribution of *y_{IEPOX}* with *PhaseSep* case relative to *NonPhaseSep* case (Fig. 7A).

530

531 Figures 7B and 7C show the mean value of γ_{IEPOX} for each grid cell across the continental 532 United States during the *PhaseSep* and *NonPhaseSep* simulations, respectively, for the 2013 SOAS 533 period. The plot shows an overall reduction in γ_{IEPOX} when phase separation was introduced. There 534 was high variability in the value of γ_{IEPOX} between regions; specifically, between the eastern and 535 western United States. To understand the drivers that influence changes in γ_{IEPOX} with the new 536 PhaseSep simulation, grid cells that exhibited the maximum increase and decrease relative to the 537 NonPhaseSep were analyzed. When phase separation was included, particles in grid cell and timestep with maximum reduction in γ_{IEPOX} were the result of a low $D_{org, eff}$ of $5.83*10^{-19}$ m²/s and an 538 lorg as high as 100 nm resulting in a relatively thick organic coating with diffusion limitations. 539 540 Particles in the grid cell and time-step with the highest increases in *yIEPOX* had a *Dorg.eff* value of





 $7.34*10^{-16}$ m²/s and l_{org} of 0.668 nm, and were located over oceans with an abundant amount of 541 542 aerosol liquid water that were in close proximity to biogenic isoprene emission sources (Fig. S3). 543 These large increases in y_{IEPOX} were primarily caused by increases in $k_{particle}$ due to added 544 nucleophiles (i.e. abundant aerosol liquid water) and a lack of diffusive limitations through the 545 organic shell. Mean γ_{IEPOX} for the 2013 SOAS period across the continental United States shows a 546 higher reduction in the PhaseSep (Fig. 7B) relative to NonPhaseSep (Fig. 7C), in regions such as 547 the southwest US and southern Canada, with higher lorg (Fig. S3). To summarize, phase (which influences $D_{org,eff}$ and thickness (l_{org}) of the organic coating are the main drivers of change in 548 549 γ_{IEPOX} . A recent study by Riva et al. (2019) demonstrated that the formation of organosulfates 550 during the IEPOX reactive uptake process leads to an organic coating, and thus, a reduced γ_{IEPOX} . 551 This manifests as a self-limiting effect during the IEPOX-derived SOA formation. Atmospheric 552 models, including this work, do not consider this recently observed self-limiting process yet, but 553 accounting for it may lead to a further reduction of the γ_{IEPOX} .

554

555 3.2.2 Predicted SOA mass

556 Variability in the values of γ_{IEPOX} , as calculated in the *PhaseSep* simulation (Fig. 7B) relative 557 to the NonPhaseSep simulation (Fig. 7C), were also reflected in the large geospatial variations in 558 the concentrations of IEPOX-derived SOA (i.e., organosulfates and tetrols (Fig. 8A)). Higher 559 reduction in the IEPOX-derived SOA for *PhaseSep* relative to *NonPhaseSep* were also in regions 560 such as the southwest United States and southern Canada (more pronounced near the Great Lakes), 561 with higher reductions to *yIEPOX* owing to thick organic coatings (Fig. S3). Figure 8B shows the 562 average relative change in predicted biogenic SOA mass. Although, the southwest United States 563 shows high reduction in IEPOX-derived SOA (Fig. 8A), it is not reflected for changes in biogenic





564 SOA (Fig. 8B). While the high reduction in IEPOX-derived SOA (Fig. 8A) in southern Canada is reflected in reductions in biogenic SOA in that region (Fig. 8B). This spatial variability can be 565 566 explained by the lower fraction of IEPOX-derived SOA in total biogenic SOA on average in 567 southwest United States compared to their higher fraction in southern Canada near Great Lakes 568 (Fig. S4A), which are further reduced to be negligible in the southwest US in the *PhaseSep* case 569 (Fig. S4B). Hence, magnitude of changes in biogenic SOA (Fig. 8B) and eventually PM_{2.5} organic 570 carbon mass (Fig. S5) are dampened as compared to changes in IEPOX-derived SOA mass with 571 introduction of phase separation parameters (Fig. 8A). On average, the largest reduction in 572 biogenic SOA mass at any one grid cell was 40.9% and occurred over forested region in Ontario, 573 Canada near Lake Superior (Fig. 8B) which also exhibits high IEPOX-derived SOA contribution 574 to total biogenic SOA (Fig. S4). For southeastern United States, modeled average reductions for 575 2013 SOAS period in IEPOX-derived SOA ranged between 25-30%, which translated to 10-15% 576 reduction in total biogenic SOA (Fig. 8). Whereas, the highest average reduction in IEPOX-577 derived SOA was 74.06% that occurred over Colorado (Fig. 8A), which eventually matters less in terms of overall biogenic SOA reduction (Fig. 8B) owing to negligible contribution of IEPOX-578 579 derived SOA to total biogenic SOA in the American southwest (Fig. S4). In the southern Canadian 580 region near the Great Lakes where the maximum biogenic SOA reduction in *PhaseSep* occurred, 581 the average reductions in IEPOX-derived SOA ranged from 63% to 66%. The southern Canadian 582 region with maximum biogenic SOA reduction had average particle viscosities in the range of 583 $1.3*10^3$ to $8.36*10^5$ Pa•s. The phase separation frequency of particles for southern Canada region 584 was 86.3% of all time steps and was SSPS 62.04% of the time and LLPS 24.26% of the time. The 585 combination of these factors led to a 52.64% average reduction in γ_{IEPOX} .

586 **3.2.2.1 Comparison to Observed Data**





587 Figure 9 shows that consideration of phase state and separation in CMAQ slightly worsened 588 the NMB based on comparison with hourly PM2.5 organic carbon mass SEARCH observations at 589 both the Centreville rural site and Jefferson street, Atlanta urban site by \sim -4%. However, this 590 change was marginal in terms of mean bias change in *PhaseSep* relative to *NonPhaseSep* case 591 being $< 0.1 \ \mu g/m^3$. The sensitivity cases that assumed a higher H_{org} (HighHorg) and considered 592 LLPS in predicting SSPS (PhaseSep2) resulted in correcting the worsening of model performance 593 observed with PhaseSep case (Figs. 9 and S6). This highlights the importance of poorly 594 constrained parameters in models like Horg assumed as a constant and factors that might govern 595 phase separation under low RH or low aerosol water at different O:C ratios.

596

597 3.3 Sensitivities

598 The reduction in emission sources of NO_x and SO_2 impacted aerosol composition, and thus, 599 the T_{org} . The average T_{org} for the emissions reduction simulation predicted a statistically significant $(p-value = 2*10^{-16})$ increase of 1.5 K from the *PhaseSep* simulation, indicating the future emission 600 601 reductions could result in an increase in viscosity and frequency of phase separation. The overall 602 phase separation frequency for this sensitivity was 70.5% (57.0% SSPS, 13.5% LLPS) with predicted viscosities ranging from 6.13*10⁻³ to 1.73*10¹¹ Pa•s, which was narrower as compared 603 604 to η_{org} range from *PhaseSep* simulation (refer to section 3.1.1). With the implementation of the 605 future NO_x and SO_2 emissions reductions, overall there was a mean 7.85% reduction in biogenic 606 SOA at the surface level from the *PhaseSep* simulation for Continental United States. As shown 607 in Figure 10A the areas with the largest reductions in SOA mass occurred in American southeast, 608 while a marginal increase in SOA mass that occurred over the Atlantic Ocean and in some sparse 609 areas in Northern Canada and Western United States. The American southeast was highly sensitive





- 610 to the Emissions Reductions sensitivity due to the high concentrations of SO₂ from coal-fired 611 power plants and the high concentrations of IEPOX-derived SOA, whose chemistry is driven by 612 particulate sulfate. Fig. S7 shows that highest reductions in particulate sulfate occurs in the 613 American southeast, which would be accompanied by the reduction in aerosol liquid water, driving 614 the reductions in IEPOX-derived SOA as shown in recent literature (Pye et al., 2017), and hence 615 the large reductions in biogenic SOA mass. Also, NOx reductions in the NOx-limited southeastern 616 United States region essentially results in stronger decrease in biogenic SOA as shown by Fig. 10A, which is consistent with findings from SENEX aircraft (Edwards et al., 2017) and SOAS 617 618 ground measurements (Xu et al., 2015) in the southeastern United States.
- 619

620 When increases in Horg were simulated in scenario HighHorg it had impacts in opposite 621 directions compared to changes in the emission reduction scenario. This increase in biogenic SOA 622 can simply be attributed to the increased dissolution of IEPOX into the particle phase through the 623 organic coating with a three order of magnitude higher Horg relative to that in PhaseSep simulation. The average T_{org} in the HighHorg simulation had a statistically significant increase of 1.4 K, with 624 625 particles being phase separated 68.3% of the time (55.8% SSPS, 12.5% LLPS). Predicted viscosities in this simulation ranged from 5.94*10⁻³ Pa•s to 6.10¹¹ Pa•s. Overall, biogenic SOA 626 627 mass increased by an average of 14.19% at the surface level for this simulation relative to 628 PhaseSep for the Continental United States. As shown in Figure 10B, the regions with the largest 629 increases in biogenic SOA mass were located over boreal forests in Ontario and Quebec, Canada 630 that correspond to the regions with highest reactive uptake (Figs. 7B and 7C) forming more 631 homogenous SOA with increased H_{org} .





633 The removal of the assumption that all particles with a semisolid viscosity were phase 634 separated (*PhaseSep2*) decreased the overall phase separation frequency to 29.0% from 68.5% in 635 the PhaseSep simulation. The entirety of this reduction was from reductions in SSPS. Figure 10C 636 gives the changes in biogenic SOA mass yields in the PhaseSep2 case relative to the PhaseSep 637 case, with largest increases in Canadian regions where SSPS regime is moving to either LLPS or 638 homogenous liquid mixture. This causes SOA yield increases explained by high reactive uptake 639 in these regions (Figs. 7B and 7C). The phase separation frequency at the Centreville, Alabama site decreased to 65.4% from 79.3%. The average Torg increased by 2.3 K with a range of 137 K to 640 289 K and predicted viscosities ranged from 5.93*10⁻³ Pa•s- 9.99*10¹¹ Pa•s. Overall biogenic 641 642 SOA mass yields increased by an average of 25.86% from the PhaseSep simulation for Continental 643 United States. The initial assumption regarding phase separation at high viscosity seems to be 644 similarly as important as the assumption regarding H_{org} in constraining the impact of phase state 645 and morphology on reactive uptake of IEPOX.

646

647 4 Discussion and Atmospheric Implications

648 Current chemical transport models have not accurately accounted for the effects of aerosol 649 composition on phase separation or viscosity. This work has updated the CMAQ model to include parameters to calculate the Torg based on the Gordon-Taylor equation for SOA. This 650 651 implementation used molar mass and O:C ratio of the species, but other parameters could be used. 652 For example, DeRieux et al., (2018) developed a calculation for $T_{g,i}$ based on the number of 653 carbon-hydrogen and carbon-oxygen bonds in a molecule. DeRieux et al., (2018) showed their 654 implementation to be in good agreement with implementation provided in this work (Eq. (4)) for 655 species with molar masses in the range of those used by CMAQv5.2.1. This implementation also





656 included parameters to determine whether SOA was phase-separated based on its viscosity, O:C 657 ratio, sulfate concentrations, and the ambient RH. Our model predicted that 68.5% of the time 658 particles would exhibit phase separation at the surface layer, which is in proximity with the 70% 659 predicted by Pye et al. (2017). This implementation predicts that most of the SOA in the middle 660 and upper troposphere over the United States is phase separated with organics increasingly in a 661 semi-solid or even glassy state with increasing altitude. This is in agreement with previous 662 fieldwork and modeling studies which has found that SOA in the upper troposphere tends to be in a glassy state (Lienhard et al., 2015; Shiraiwa et al., 2017). This work also shows LLPS to be more 663 664 dominant in the eastern US, while semi-solid phase state being more prevalent in western US. This 665 is in agreement with the predominant role of aerosol liquid water driving the liquid phase state and 666 LLPS across the eastern United States, as observed in previous studies (Pye et al., 2017, 2018).

667

668 The model predicted that SOA dominated by anthropogenic constituents typically featured thick semi-solid organic phases surrounding aqueous cores, which caused the reactive uptake of 669 IEPOX to become diffusion limited. Regions that were predicted to have larger fractions of 670 671 biogenic SOA mass typically featured LLPS morphology that did not produce much of diffusion 672 limitations. These aerosols also resulted in a smaller inorganic core volume increasing the 673 concentrations of nucleophiles and acids, thus enhancing the rate of reaction in presence of 674 abundant aerosol water over oceans, but exhibited reduction in SOA over land though not as much 675 as solid-like particles exhibited. The phase separation parameters had the largest impact over the 676 Ohio River valley, southern Canada (more pronounced near Great Lakes) and American southeast. 677 These areas were also the most sensitive to future emission reductions of NO_x and SO_2 .





679 Further experimental and modeling work is required to understand the effects of aerosol phase state on the viscosity of the inorganic core that cause variability in the value of D_a and can 680 681 subsequently alter the reactive uptake of IEPOX. The conditions under which highly viscous SOA 682 will separate from inorganics in a particle or if the particle will remain homogenously mixed 683 should be further explored as well. Particle morphology in case of phase-separated organic and 684 inorganic species as 'core-shell' or 'partially engulfed' or 'emulsified' (smaller islands of organics 685 in the aqueous inorganic core) is driven by the differences in the interfacial surface tensions 686 (Gorkowski et al., 2017). Recent studies have also shown that at very high RH ranges (95-100%), 687 some particles will return to a core-shell morphology (Ham et al., 2019; Renbaum-Wolff et al., 688 2016). There is also little information on the criteria that drives this kind of phase separation as 689 well. Such variability in particle morphologies may modify the value of $k_{particle}$ by changing the 690 core volume. It is imperative that these parameters be better constrained in models. Furthermore, 691 there is much uncertainty in the organic phase Henry's Law coefficient (H_{org}), where higher H_{org} 692 increases the dissolution of IEPOX into the aerosol phase. Some of the newly proposed reaction 693 mechanisms leading to the formation of extremely-low volatile organic compounds (ELVOCs) 694 and organosulfates may also increase the viscosity of the particle phase, but have not been 695 incorporated in this study.

696

This work paves the way for implementing a more accurate representation of multiphase chemistry of different complex systems on the lines of explicit representation of IEPOX SOA. Multiphase chemistry of other dominant SOA apart from IEPOX SOA, such as monoterpenederived SOA, are not incorporated in CMAQv5.2.1 (Pye et al., 2018; Slade et al., 2019), and should be a focus of future work. This work showed that organic water fraction is the biggest driver of





viscosity, though the water abundance was set at 10% of the inorganic water content. Organic water uptake, even if increased, will still follow the diurnal trend of RH since it is diverted from the aqueous core that is derived from ISORRORPIA-based aerosol water in CMAQ v5.2.1. It does not, however, consider the hydrophobicity or abundance of various organic constituents. Constraining abundance of organic water uptake in terms of its association with different organic species and evaluating its reduction with future emission reductions of SO_x (SO₂ and sulfate) will be pertinent for future work.

709 Performing sensitivity simulations over the PhaseSep parametrization as part of this work also 710 show that any assumptions made on determining phase separation or morphology (*PhaseSep2*) is 711 as important as constraining the H_{org} (High H_{org}) factor in the regions with abundant IEPOX SOA 712 such as, American and Canadian southeast. Incorporating explicit kinetics coupled with 713 thermodynamic calculation of energies governing the mixing state of organic-inorganic aerosol 714 mixtures under different aerosol phase states, as observed from recent and ongoing experimental 715 findings, into atmospheric models such as CMAQ, would lead to more scientifically sound 716 representations of the impact particle phase state and morphology have on SOA mass predictions. 717

718 Code availability

US EPA makes the source code of CMAQ version 5.2.1 model publicly available for download at: <u>https://github.com/USEPA/CMAQ/tree/5.2.1</u> (last access: 6 November 2019). Corresponding author can make the modifications made to the CMAQ source code as part of this work available on request.

723

724 Data availability





725	The emissions and meteorological inputs along with other miscellaneous inputs to run CMAQ
726	model for the SOAS 2013 episode (1 June 2013 to 15 July 2015) across continental United States
727	can be downloaded from: <u>https://drive.google.com/open?id=1XR6Xp3bZzrZIzNBx-</u>
728	AgjcNCtC_HLlCkZ, made available by US EPA and University of North Carolina-Institute of
729	Environment (last access: 6 November 2019).
730	

Author contributions 731

732 RS and QZR lead the writing with WV. RS designed the new PhaseSep methodology along with

733 sensitivity cases to run in consistent consultation with YZ, HOTP, YC, JDS, QZR and WV. QZR

734 implemented the model code and performed the simulations in the regional scale model with

735 reviews from HOTP. RS analyzed results of simulations with QZR, WV and HZ. BHL, CM, FDL-

736 H, JAT, AHG and HZ analyzed the SOAS field data. RS and QZR prepared the paper with

737 extensive reviews and edits from WV, YZ, YC, HOTP, HZ, and JDS.

738

Competing interests 739

740 The authors declare that they have no conflict of interest.

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755 **References**

- 756 Eyth, A., Zubrow, A., and Mason, R: Technical Support Document (TSD): Preparation of
- Emissions Inventories for the Version 6.1, 2011 Emissions Modeling Platform, [online]Available from:
- 759 http://www.epa.gov/ttn/chief/emch/2011v6/2011v6.1 2018 2025 base EmisMod TSD nov201
- 760 4 v6.pdf (Accessed 20 November 2018), 2014.
- 761 Anttila, T., Kiendler-Scharr, A., Tillmann, R. and Mentel, T. F.: On the Reactive Uptake of
- 762 Gaseous Compounds by Organic-Coated Aqueous Aerosols: Theoretical Analysis and
- Application to the Heterogeneous Hydrolysis of N2O5, J. Phys. Chem. A, 110(35), 10435–
- 764 10443, doi:10.1021/jp062403c, 2006.
- Appel, K. W., Napelenok, S. L., Foley, K. M., Pye, H. O. T., Hogrefe, C., Luecken, D. J., Bash,
 J. O., Roselle, S. J., Pleim, J. E., Foroutan, H., Hutzell, W. T., Pouliot, G. A., Sarwar, G., Fahey,
 K. M., Gantt, B., Gilliam, R. C., Heath, N. K., Kang, D., Mathur, R., Schwede, D. B., Spero, T.
 L., Wong, D. C. and Young, J. O.: Description and evaluation of the Community Multiscale Air
 Quality (CMAQ) modeling system version 5.1, Geosci Model Dev, 10(4), 1703–1732,
 doi:10.5194/gmd-10-1703-2017, 2017.
- 771 Bash, J. O., Baker, K. R. and Beaver, M. R.: Evaluation of improved land use and canopy
- representation in BEIS v3.61 with biogenic VOC measurements in California, Geoscientific
- 773 Model Development, 9(6), 2191–2207, doi:https://doi.org/10.5194/gmd-9-2191-2016, 2016.
- 774 Bates, K. H., Crounse, J. D., St. Clair, J. M., Bennett, N. B., Nguyen, T. B., Seinfeld, J. H.,
- 775 Stoltz, B. M. and Wennberg, P. O.: Gas Phase Production and Loss of Isoprene Epoxydiols, J.
- 776 Phys. Chem. A, 118(7), 1237–1246, doi:10.1021/jp4107958, 2014.





- 777 Bateman, A. P., Bertram, A. K., and Martin, S. T.: Hygroscopic Influence on the Semisolid-to-
- Liquid Transition of Secondary Organic Materials, The Journal of Physical Chemistry A, 119,
 4386-4395, 10.1021/jp508521c, 2015a.
- 7/9 4386-4395, 10.1021/jp508521c, 2015a.
- 780 Bateman, A. P., Gong, Z., Liu, P., Sato, B., Cirino, G., Zhang, Y., Artaxo, P., Bertram, A. K.,
- 781 Manzi, A. O., Rizzo, L. V., Souza, R. A. F., Zaveri, R. A., and Martin, S. T.: Sub-micrometre
- particulate matter is primarily in liquid form over Amazon rainforest, Nature Geoscience, 9, 34,
 10.1038/ngeo2599
- 784 https://www.nature.com/articles/ngeo2599#supplementary-information, 2015b.
- 785 Bateman, A. P., Gong, Z., Harder, T. H., de Sá, S. S., Wang, B., Castillo, P., China, S., Liu, Y.,
- 786 O'Brien, R. E., Palm, B. B., Shiu, H. W., Cirino, G. G., Thalman, R., Adachi, K., Alexander, M.
- 787 L., Artaxo, P., Bertram, A. K., Buseck, P. R., Gilles, M. K., Jimenez, J. L., Laskin, A., Manzi, A.
- 788 O., Sedlacek, A., Souza, R. A. F., Wang, J., Zaveri, R., and Martin, S. T.: Anthropogenic
- influences on the physical state of submicron particulate matter over a tropical forest, Atmos.
- 790 Chem. Phys., 17, 1759-1773, 10.5194/acp-17-1759-2017, 2017.
- 791 Bertram, A. K., Martin, S. T., Hanna, S. J., Smith, M. L., Bodsworth, A., Chen, Q., Kuwata, M.,
- Liu, A., You, Y., and Zorn, S. R.: Predicting the relative humidities of liquid-liquid phase
- separation, efflorescence, and deliquescence of mixed particles of ammonium sulfate, organic
- material, and water using the organic-to-sulfate mass ratio of the particle and the oxygen-to-
- carbon elemental ratio of the organic component, Atmos. Chem. Phys., 11, 10995-11006,
- 796 10.5194/acp-11-10995-2011, 2011.
- 797 Bondy, A. L., Craig, R. L., Zhang, Z., Gold, A., Surratt, J. D. and Ault, A. P.: Isoprene-Derived
- 798 Organosulfates: Vibrational Mode Analysis by Raman Spectroscopy, Acidity-Dependent
- 799 Spectral Modes, and Observation in Individual Atmospheric Particles, J Phys Chem A, 122(1),
- 800 303–315, doi:10.1021/acs.jpca.7b10587, 2018.
- 801 Budisulistiorini, S. H., Baumann, K., Edgerton, E. S., Bairai, S. T., Mueller, S., Shaw, S. L.,
- 802 Knipping, E. M., Gold, A. and Surratt, J. D.: Seasonal characterization of submicron aerosol
- 803 chemical composition and organic aerosol sources in the southeastern United States: Atlanta,
- 804 Georgia, and Look Rock, Tennessee, Atmospheric Chemistry and Physics, 16(8), 5171–5189,
- 805 doi:https://doi.org/10.5194/acp-16-5171-2016, 2016.
- 806 Budisulistiorini, S. H., Nenes, A., Carlton, A. G., Surratt, J. D., McNeill, V. F. and Pye, H. O. T.:
- 807 Simulating Aqueous-Phase Isoprene-Epoxydiol (IEPOX) Secondary Organic Aerosol Production
- 808 During the 2013 Southern Oxidant and Aerosol Study (SOAS), Environ. Sci. Technol., 51(9),
- 809 5026–5034, doi:10.1021/acs.est.6b05750, 2017.
- 810 Carlton, A. G. and Baker, K. R.: Photochemical Modeling of the Ozark Isoprene Volcano:
- 811 MEGAN, BEIS, and Their Impacts on Air Quality Predictions, Environ. Sci. Technol., 45(10), 4428, 4445, doi:10.1021/or200050y. 2011
- 812 4438–4445, doi:10.1021/es200050x, 2011.
- 813 Carslaw, K. S., Lee, L. A., Reddington, C. L., Pringle, K. J., Rap, A., Forster, P. M., Mann, G.
- 814 W., Spracklen, D. V., Woodhouse, M. T., Regayre, L. A. and Pierce, J. R.: Large contribution of
- 815 natural aerosols to uncertainty in indirect forcing, Nature, 503(7474), 67–71,
- 816 doi:10.1038/nature12674, 2013.





- 817 Chenyakin, Y.: Are diffusion coefficients calculated using the Stokes-Einstein equation
- 818 combined with viscosities consistent with measured diffusion coefficients of tracer organics
- 819 within organics-water mediums?, University of British Columbia., 2015.
- 820 Cui, T., Zeng, Z., dos Santos, E. O., Zhang, Z., Chen, Y., Zhang, Y., Rose, C. A.,
- 821 Budisulistiorini, S. H., Collins, L. B., Bodnar, W. M., de Souza, R. A. F., Martin, S. T.,
- Machado, C. M. D., Turpin, B. J., Gold, A., Ault, A. P., and Surratt, J. D.: Development of a
- 823 hydrophilic interaction liquid chromatography (HILIC) method for the chemical characterization
- 824 of water-soluble isoprene epoxydiol (IEPOX)-derived secondary organic aerosol, Environmental
- 825 Science: Processes & Impacts, 20, 1524-1536, 10.1039/C8EM00308D, 2018.
- 826 DeRieux, W.-S. W., Li, Y., Lin, P., Laskin, J., Laskin, A., Bertram, A. K., Nizkorodov, S. A. and
- 827 Shiraiwa, M.: Predicting the glass transition temperature and viscosity of secondary organic
- material using molecular composition, Atmospheric Chemistry and Physics, 18(9), 6331–6351,
- 829 doi:https://doi.org/10.5194/acp-18-6331-2018, 2018.
- 830 Docherty, K. S., Stone, E. A., Ulbrich, I. M., DeCarlo, P. F., Snyder, D. C., Schauer, J. J., Peltier,
- 831 R. E., Weber, R. J., Murphy, S. M., Seinfeld, J. H., Grover, B. D., Eatough, D. J. and Jimenez, J.
- 832 L.: Apportionment of primary and secondary organic aerosols in southern California during the
- 2005 study of organic aerosols in riverside (SOAR-1), Environ. Sci. Technol., 42(20), 7655–
- 834 7662, 2008.
- 835 Eddingsaas, N. C., VanderVelde, D. G., and Wennberg, P. O.: Kinetics and products of the acid-
- 836 catalyzed ring-opening of atmospherically relevant butyl epoxy alcohols, The Journal of Physical
- 837 Chemistry A, 114, 8106-8113, DOI: 10.1021/jp103907c, 2010.
- 838 Edwards, P. M., Aikin, K. C., Dube, W. P., Fry, J. L., Gilman, J. B., de Gouw, J. A., Graus, M.
- 839 G., Hanisco, T. F., Holloway, J., Hübler, G., Kaiser, J., Keutsch, F. N., Lerner, B. M., Neuman,
- 840 J. A., Parrish, D. D., Peischl, J., Pollack, I. B., Ravishankara, A. R., Roberts, J. M., Ryerson, T.
- 841 B., Trainer, M., Veres, P. R., Wolfe, G. M., Warneke, C., and Brown, S. S.: Transition from
- 842 high- to low-NOx control of night-time oxidation in the southeastern US, Nature Geoscience, 10,
- 843 490, 10.1038/ngeo2976, https://www.nature.com/articles/ngeo2976#supplementary-information,
- 844 2017.
- Emery, C., Jung, J., Koo, B. and Yarwood, G.: Improvements to CAMx Snow Cover Treatments
 and Carbon Bond Chemical Mechanism for Winter Ozone. Final report for Utah DAQ, Utah
- 847 Department of Air Quality., 2015.
- 848 Evoy, E., Maclean, A. M., Rovelli, G., Li, Y., Tsimpidi, A. P., Karydis, V. A., Kamal, S.,
- 849 Lelieveld, J., Shiraiwa, M., Reid, J. P., and Bertram, A. K.: Predictions of diffusion rates of large
- organic molecules in secondary organic aerosols using the Stokes–Einstein and fractional
- 851 Stokes–Einstein relations, Atmos. Chem. Phys., 19, 10073-10085, 10.5194/acp-19-10073-2019,
- 852 2019.
- Freedman, M. A.: Phase separation in organic aerosol, Chem. Soc. Rev., 46(24), 7694–7705,
- 854 doi:10.1039/C6CS00783J, 2017.





- 855 Fulcher, G. S.: Analysis of recent measurements of viscosity of glasses, J. Amer. Ceram. Soc, 8, 856 339-355, 1925.
- 857 Gaston, C. J., Riedel, T. P., Zhang, Z., Gold, A., Surratt, J. D. and Thornton, J. A.: Reactive
- 858 Uptake of an Isoprene-Derived Epoxydiol to Submicron Aerosol Particles, Environmental
- 859 Science & Technology, 48(19), 11178–11186, doi:10.1021/es5034266, 2014.
- 860 Gordon, M. and Taylor, J.: Ideal Copolymers and the Second-Order Transitions of Synthetic
- 861 Rubbers. I. Non-Crystalline Copolymers, Journal of Applied Chemistry, 2(9), 493–500,
- 862 doi:10.1002/jctb.5010020901, 1952.
- 863 Gorkowski, K., Donahue, N. M. and Sullivan, R. C.: Emulsified and liquid-liquid phase-
- 864 separated states of α -pinene secondary organic aerosol determined using aerosol optical
- 865 tweezers, Environmental Science & technology, 51(21), 12154-12163,
- 866 doi:10.1021/acs.est.7b03250, 2017.
- 867 Grandey, B. S., Rothenberg, D., Avramov, A., Jin, Q., Lee, H.-H., Liu, X., Lu, Z., Albani, S. and
- 868 Wang, C.: Effective radiative forcing in the aerosol-climate model CAM5.3-MARC-ARG, 869 Atmospheric Chemistry and Physics, 18(21), 15783–15810, doi:10.5194/acp-18-15783-2018,
- 870 2018.
- 871 Grayson, J. W., Zhang, Y., Mutzel, A., Renbaum-Wolff, L., Böge, O., Kamal, S., Herrmann, H.,
- 872 Martin, S. T. and Bertram, A. K.: Effect of varying experimental conditions on the viscosity of
- 873 <i>α</i>-pinene derived secondary organic material, Atmospheric Chemistry and
- 874 Physics, 16(10), 6027–6040, doi:10.5194/acp-16-6027-2016, 2016.
- 875 Grayson, J. W., Evoy, E., Song, M., Chu, Y., Maclean, A., Nguyen, A., Upshur, M. A.,
- 876 Ebrahimi, M., Chan, C. K., Geiger, F. M., Thomson, R. J. and Bertram, A. K.: The effect of
- hydroxyl functional groups and molar mass on the viscosity of non-crystalline organic and 877
- 878 organic-water particles, Atmospheric Chemistry and Physics, 17(13), 8509-8524,
- 879 doi:10.5194/acp-17-8509-2017, 2017.
- 880 Guenther, A., Karl, T., Harley, P., Wiedinmyer, C., Palmer, P. I. and Geron, C.: Estimates of
- 881 global terrestrial isoprene emissions using MEGAN (Model of Emissions of Gases and Aerosols
- 882 from Nature), Atmospheric Chemistry and Physics, 6(11), 3181-3210,
- 883 doi:https://doi.org/10.5194/acp-6-3181-2006, 2006.
- 884 Ham, S., Babar, Z. B., Lee, J., Lim, H. and Song, M.: Liquid-liquid phase separation in
- 885 secondary organic aerosol particles produced from α -pinene ozonolysis and α -pinene photooxidation with/without ammonia, Atmos. Chem. Phys. Discuss., 1–27, doi:10.5194/acp-2019-19, 886 887 2019.
- 888 Hansen, D. A., Edgerton, E. S., Hartsell, B. E., Jansen, J. J., Kandasamy, N., Hidy, G. M. and
- 889 Blanchard, C. L.: The Southeastern Aerosol Research and Characterization Study: Part 1-
- 890 Overview, Journal of the Air & Waste Management Association, 53(12), 1460–1471,
- 891 doi:10.1080/10473289.2003.10466318, 2003.





- Heath, N. K., Pleim, J. E., Gilliam, R. C. and Kang, D.: A simple lightning assimilation
- technique for improving retrospective WRF simulations, Journal of Advances in Modeling Earth
 Systems, 8(4), 1806–1824, doi:10.1002/2016MS000735, 2016.
- 895 Hildebrant Ruiz, L. and Yarwood, G.: Interactions between Organic Aerosol and NOy: Influence
- 896 on Oxidant Production., University of Texas at Austin. [online] Available from:
- http://aqrp.ceer.utexas.edu/projectinfoFY12 13/12-012/12-012%20Final%20Report.pdf, 2013.
- Huang, W., Saathoff, H., Pajunoja, A., Shen, X., Naumann, K.-H., Wagner, R., Virtanen, A.,
- 899 Leisner, T. and Mohr, C.: α-Pinene secondary organic aerosol at low temperature: chemical
- 900 composition and implications for particle viscosity, Atmospheric Chemistry and Physics, 18(4),
- 901 2883–2898, doi:https://doi.org/10.5194/acp-18-2883-2018, 2018.
- 902 Hwang, S.-H., Lee, J. Y., Yi, S.-M. and Kim, H.: Associations of particulate matter and its
- 903 components with emergency room visits for cardiovascular and respiratory diseases, PLOS
- 904 ONE, 12(8), e0183224, doi:10.1371/journal.pone.0183224, 2017.
- Jacobs, M. I., Burke, W. J. and Elrod, M. J.: Kinetics of the reactions of isoprene-derived
- 906 hydroxynitrates: gas phase epoxide formation and solution phase hydrolysis, Atmospheric
- 907 Chemistry and Physics, 14(17), 8933–8946, doi:https://doi.org/10.5194/acp-14-8933-2014, 2014.
- Jaques, P. A. and Kim, C. S.: Measurement of total lung deposition of inhaled ultrafine particles
 in healthy men and women, Inhal Toxicol, 12(8), 715–731, doi:10.1080/08958370050085156,
 2000.
- 911 Koop, T., Bookhold, J., Shiraiwa, M. and Pöschl, U.: Glass transition and phase state of organic
- 912 compounds: dependency on molecular properties and implications for secondary organic
- aerosols in the atmosphere, Phys. Chem. Chem. Phys., 13(43), 19238–19255,
- 914 doi:10.1039/C1CP22617G, 2011.
- 915 Krechmer, J. E., Coggon, M. M., Massoli, P., Nguyen, T. B., Crounse, J. D., Hu, W., Day, D. A.,
- 916 Tyndall, G. S., Henze, D. K., Rivera-Rios, J. C., Nowak, J. B., Kimmel, J. R., Mauldin, R. L.,
- 917 Stark, H., Jayne, J. T., Sipilä, M., Junninen, H., Clair, J. M. S., Zhang, X., Feiner, P. A., Zhang,
- L., Miller, D. O., Brune, W. H., Keutsch, F. N., Wennberg, P. O., Seinfeld, J. H., Worsnop, D.
- 919 R., Jimenez, J. L. and Canagaratna, M. R.: Formation of Low Volatility Organic Compounds and
- 920 Secondary Organic Aerosol from Isoprene Hydroxyhydroperoxide Low-NO Oxidation, Environ.
- 921 Sci. Technol., 49(17), 10330–10339, doi:10.1021/acs.est.5b02031, 2015.
- 22 Lee, L. A., Reddington, C. L. and Carslaw, K. S.: On the relationship between aerosol model
- 923 uncertainty and radiative forcing uncertainty, PNAS, 113(21), 5820–5827,
- 924 doi:10.1073/pnas.1507050113, 2016.
- Liao, J., Froyd, K. D., Murphy, D. M., Keutsch, F. N., Yu, G., Wennberg, P. O., St Clair, J. M.,
- 926 Crounse, J. D., Wisthaler, A., Mikoviny, T., Jimenez, J. L., Campuzano-Jost, P., Day, D. A., Hu,
- 927 W., Ryerson, T. B., Pollack, I. B., Peischl, J., Anderson, B. E., Ziemba, L. D., Blake, D. R.,
- 928 Meinardi, S. and Diskin, G.: Airborne measurements of organosulfates over the continental U.S,
- 929 J Geophys Res Atmos, 120(7), 2990–3005, doi:10.1002/2014JD022378, 2015.





- 930 Lienhard, D. M., Huisman, A. J., Krieger, U. K., Rudich, Y., Marcolli, C., Luo, B. P., Bones, D.
- 931 L., Reid, J. P., Lambe, A. T., Canagaratna, M. R., Davidovits, P., Onasch, T. B., Worsnop, D. R.,
- 932 Steimer, S. S., Koop, T. and Peter, T.: Viscous organic aerosol particles in the upper troposphere:
- 933 diffusivity-controlled water uptake and ice nucleation?, Atmospheric Chemistry and Physics,
- 934 15(23), 13599–13613, doi:https://doi.org/10.5194/acp-15-13599-2015, 2015.
- 935 Lopez-Hilfiker, F. D., Mohr, C., D'Ambro, E. L., Lutz, A., Riedel, T. P., Gaston, C. J., Iyer, S.,
- 936 Zhang, Z., Gold, A., Surratt, J. D., Lee, B. H., Kurten, T., Hu, W. W., Jimenez, J., Hallquist, M.,
- 937 and Thornton, J. A.: Molecular Composition and Volatility of Organic Aerosol in the
- 938 Southeastern U.S.: Implications for IEPOX Derived SOA, Environmental Science &
- 939 Technology, 50, 2200-2209, 10.1021/acs.est.5b04769, 2016.
- 940 Maclean, A. M., Butenhoff, C. L., Grayson, J. W., Barsanti, K., Jimenez, J. L. and Bertram, A.
- 941 K.: Mixing times of organic molecules within secondary organic aerosol particles: a global
- 942 planetary boundary layer perspective, Atmospheric Chemistry and Physics, 17(21), 13037-
- 943 13048, doi:10.5194/acp-17-13037-2017, 2017.
- 944 Marais, E. A., Jacob, D. J., Jimenez, J. L., Campuzano-Jost, P., Day, D. A., Hu, W., Krechmer,
- 945 J., Zhu, L., Kim, P. S., Miller, C. C., Fisher, J. A., Travis, K., Yu, K., Hanisco, T. F., Wolfe, G.
- M., Arkinson, H. L., Pye, H. O. T., Froyd, K. D., Liao, J. and McNeill, V. F.: Aqueous-phase 946
- 947 mechanism for secondary organic aerosol formation from isoprene: application to the southeast
- 948 United States and co-benefit of SO₂ emission controls, Atmospheric Chemistry and Physics,
- 949 16(3), 1603–1618, doi:https://doi.org/10.5194/acp-16-1603-2016, 2016.
- Marcolli, C., Luo, B. and Peter, T.: Mixing of the Organic Aerosol Fractions: Liquids as the 950
- 951 Thermodynamically Stable Phases, J. Phys. Chem. A, 108(12), 2216–2224,
- 952 doi:10.1021/jp0360801, 2004.
- 953 Marsh, A., Petters, S. S., Rothfuss, N. E., Rovelli, G., Song, Y. C., Reid, J. P. and Petters, M. D.:
- 954 Amorphous phase state diagrams and viscosity of ternary aqueous organic/organic and
- 955 inorganic/organic mixtures, Physical Chemistry Chemical Physics, 20, 15086–15097,
- 956 doi:10.1039/c8cp00760h, 2018.
- 957 Martin, S. T.: Phase Transitions of Aqueous Atmospheric Particles, Chem. Rev., 100(9), 3403-958 3454, doi:10.1021/cr990034t, 2000.
- 959 Murphy, B. N., Woody, M. C., Jimenez, J. L., Carlton, A. M. G., Hayes, P. L., Liu, S., Ng, N. L.,
- 960 Russell, L. M., Setyan, A., Xu, L., Young, J., Zaveri, R. A., Zhang, Q., and Pye, H. O. T.:
- 961 Semivolatile POA and parameterized total combustion SOA in CMAQv5.2: impacts on source
- 962 strength and partitioning, Atmos. Chem. Phys., 17, 11107-11133, 10.5194/acp-17-11107-2017, 2017.
- 963
- 964 Nozière, B., Kalberer, M., Claeys, M., Allan, J., D'Anna, B., Decesari, S., Finessi, E., Glasius,
- M., Grgić, I., Hamilton, J. F., Hoffmann, T., Iinuma, Y., Jaoui, M., Kahnt, A., Kampf, C. J., 965
- 966 Kourtchev, I., Maenhaut, W., Marsden, N., Saarikoski, S., Schnelle-Kreis, J., Surratt, J. D.,
- 967 Szidat, S., Szmigielski, R. and Wisthaler, A.: The molecular identification of organic compounds
- 968 in the atmosphere: state of the art and challenges, Chem. Rev., 115(10), 3919–3983,
- 969 doi:10.1021/cr5003485, 2015.





- 970 O'Brien, R. E., Wang, B., Kelly, S. T., Lundt, N., You, Y., Bertram, A. K., Leone, S. R., Laskin,
- A. and Gilles, M. K.: Liquid-liquid phase separation in aerosol particles: imaging at the
- 972 nanometer scale, Environ. Sci. Technol., 49(8), 4995–5002, doi:10.1021/acs.est.5b00062, 2015.
- Pajunoja, A., Malila, J., Hao, L., Joutsensaari, J., Lehtinen, K. E. J. and Virtanen, A.: Estimating
- the Viscosity Range of SOA Particles Based on Their Coalescence Time, Aerosol Science and
- 975 Technology, 48(2), i-iv, doi:10.1080/02786826.2013.870325, 2014.
- Paulot, F., Crounse, J. D., Kjaergaard, H. G., Kürten, A., St Clair, J. M., Seinfeld, J. H. and
- 977 Wennberg, P. O.: Unexpected epoxide formation in the gas-phase photooxidation of isoprene,
- 978 Science, 325(5941), 730–733, doi:10.1126/science.1172910, 2009.
- 979 Price, H. C., Mattsson, J., Zhang, Y., Bertram, A. K., Davies, J. F., Grayson, J. W., Martin, S. T.,
- 980 O'Sullivan, D., Reid, J. P., Rickards, A. M. J. and Murray, B. J.: Water diffusion in
- 981 atmospherically relevant α-pinene secondary organic material †Electronic supplementary
- 982 information (ESI) available. See DOI: 10.1039/c5sc00685f Click here for additional data file.,
- 983 Chem Sci, 6(8), 4876–4883, doi:10.1039/c5sc00685f, 2015.
- 984 Pye, H. O. T., Pinder, R. W., Piletic, I. R., Xie, Y., Capps, S. L., Lin, Y. H., Surratt, J. D., Zhang,
- 2., Gold, A., Luecken, D. J., Hutzell, W. T., Jaoui, M., Offenberg, J. H., Kleindienst, T. E.,
- 986 Lewandowski, M. and Edney, E. O.: Epoxide pathways improve model predictions of isoprene
- 987 markers and reveal key role of acidity in aerosol formation, E and T Contents, 47(19), 11056– 11064 doi:10.1021/ac402106b.2013
- 988 11064, doi:10.1021/es402106h, 2013.
- 989 Pye, H. O. T., Murphy, B. N., Xu, L., Ng, N. L., Carlton, A. G., Guo, H., Weber, R., Vasilakos,
- 990 P., Appel, K. W., Budisulistiorini, S. H., Surratt, J. D., Nenes, A., Hu, W., Jimenez, J. L.,
- 991 Isaacman-VanWertz, G., Misztal, P. K. and Goldstein, A. H.: On the implications of aerosol
- 992 liquid water and phase separation for organic aerosol mass, Atmospheric Chemistry and Physics,
- 993 17(1), 343–369, doi:10.5194/acp-17-343-2017, 2017.
- 994 Pye, H. O. T., Zuend, A., Fry, J. L., Isaacman-VanWertz, G., Capps, S. L., Appel, K. W.,
- 995 Foroutan, H., Xu, L., Ng, N. L. and Goldstein, A. H.: Coupling of organic and inorganic aerosol
- systems and the effect on gas-particle partitioning in the southeastern US, Atmos Chem Phys,
- 997 18(1), 357–370, doi:10.5194/acp-18-357-2018, 2018.
- 998 Regayre, L. A., Pringle, K. J., Lee, L. A., Rap, A., Browse, J., Mann, G. W., Reddington, C. L.,
- 999 Carslaw, K. S., Booth, B. B. B. and Woodhouse, M. T.: The Climatic Importance of
- 1000 Uncertainties in Regional Aerosol–Cloud Radiative Forcings over Recent Decades, J. Climate,
- 1001 28(17), 6589–6607, doi:10.1175/JCLI-D-15-0127.1, 2015.
- 1002 Reid, J. P., Bertram, A. K., Topping, D. O., Laskin, A., Martin, S. T., Petters, M. D., Pope, F. D.,
- and Rovelli, G.: The viscosity of atmospherically relevant organic particles, Nature
 Communications, 9, 956, 10.1038/s41467-018-03027-z, 2018.
- 1005 Renbaum-Wolff, L., Grayson, J. W., Bateman, A. P., Kuwata, M., Sellier, M., Murray, B. J.,
- 1006 Shilling, J. E., Martin, S. T., and Bertram, A. K.: Viscosity of α-pinene secondary organic
- 1007 material and implications for particle growth and reactivity, Proceedings of the National
- 1008 Academy of Sciences, 110, 8014-8019, 10.1073/pnas.1219548110, 2013.





- 1009 Renbaum-Wolff, L., Song, M., Marcolli, C., Zhang, Y., Liu, P. F., Grayson, J. W., Geiger, F. M.,
- 1010 Martin, S. T. and Bertram, A. K.: Observations and implications of liquid-liquid phase separation
- 1011 at high relative humidities in secondary organic material produced by α -pinene ozonolysis 1012 without inorganic salts, Atmospheric Chemistry and Physics, 16(12), 7969–7979,
- 1013 doi:10.5194/acp-16-7969-2016, 2016.
- 1014 Riedel, T., Lin, Y.-H., Zhang, Z., Chu, K., Thornton, J., Vizuete, W., Gold, A., Surratt, J. D.:
- 1015 Constraining condensed-phase formation kinetics of secondary organic aerosol components from
- 1016 isoprene epoxydiols, Atmospheric Chemistry and Physics, 16, 1245-1254, 2016.
- 1017 Riemer, N., Vogel, H., Vogel, B., Anttila, T., Kiendler-Scharr, A., and Mentel, T. F.: Relative
- 1018 importance of organic coatings for the heterogeneous hydrolysis of N2O5 during summer in
- 1019 Europe, J. Geophys. Res.-Atmos., 114, D17307, https://doi.org/10.1029/2008JD011369, 2009.
- 1020 Riva, M., Chen, Y., Zhang, Y., Lei, Z., Olson, N. E., Boyer, H. C., Narayan, S., Yee, L. D.,
- 1021 Green, H. S., Cui, T., Zhang, Z., Baumann, K., Fort, M., Edgerton, E., Budisulistiorini, S. H.,
- 1022 Rose, C. A., Ribeiro, I. O., e Oliveira, R. L., dos Santos, E. O., Machado, C. M. D., Szopa, S.,
- 1023 Zhao, Y., Alves, E. G., de Sá, S. S., Hu, W., Knipping, E. M., Shaw, S. L., Duvoisin Junior, S.,
- 1024 de Souza, R. A. F., Palm, B. B., Jimenez, J.-L., Glasius, M., Goldstein, A. H., Pye, H. O. T.,
- 1025 Gold, A., Turpin, B. J., Vizuete, W., Martin, S. T., Thornton, J. A., Dutcher, C. S., Ault, A. P.,
- 1026 and Surratt, J. D.: Increasing Isoprene Epoxydiol-to-Inorganic Sulfate Aerosol Ratio Results in 1027
- Extensive Conversion of Inorganic Sulfate to Organosulfur Forms: Implications for Aerosol
- 1028 Physicochemical Properties, Environmental Science & Technology, 53, 8682-8694,
- 1029 10.1021/acs.est.9b01019, 2019.
- 1030 Rvder, O. S., Ault, A. P., Cahill, J. F., Guasco, T. L., Riedel, T. P., Cuadra-Rodriguez, L. A.,
- 1031 Gaston, C. J., Fitzgerald, E., Lee, C., Prather, K. A. and Bertram, T. H.: On the role of particle
- 1032 inorganic mixing state in the reactive uptake of N2O5 to ambient aerosol particles, Environ. Sci.
- 1033 Technol., 48(3), 1618–1627, doi:10.1021/es4042622, 2014.
- Schmedding, R., Ma, M., Zhang, Y., Farrell, S., Pye, H. O. T., Chen, Y., Wang, C.-T., Rasool, 1034
- 1035 Q. Z., Budisulistiorini, S., Ault, A. P., Surratt, J. and Vizuete, W.: α-Pinene-Derived organic
- 1036 coatings on acidic sulfate aerosol impacts secondary organic aerosol formation from isoprene in
- 1037 a box model, Atmos. Environ., 213, 456-462, https://doi.org/10.1016/j.atmosenv.2019.06.005, 1038 2019.
- Shiraiwa, M., Li, Y., Tsimpidi, A. P., Karydis, V. A., Berkemeier, T., Pandis, S. N., Lelieveld, J., 1039
- 1040 Koop, T. and Pöschl, U.: Global distribution of particle phase state in atmospheric secondary
- 1041 organic aerosols, Nature Communications; London, 8, 15002,
- 1042 doi:http://dx.doi.org.libproxy.lib.unc.edu/10.1038/ncomms15002, 2017.
- 1043 Slade, J. H., Ault, A. P., Bui, A., Ditto, J., Lei, Z., Bondy, A. L., Olson, N. E., Cook, R. D.,
- 1044 Desrochers, S. J., Harvey, R.M., Erickson, M. H., Wallace, H. W., Alvarez, S. L., Flynn, J. H.,
- 1045 Boor, B. E., Petrucci, G. A., Gentner, D. R., Griffin, R. J. and Shepson, P. B.: Bouncier particles
- 1046 at night: biogenic secondary organic aerosol chemistry and sulfate drive diel variations in the
- 1047 aerosol phase in a mixed forest, Environ. Sci. Technol., 53(9), 4977-4987, DOI:
- 1048 10.1021/acs.est.8b07319, 2019.





- 1049 Song, M., Liu, P. F., Hanna, S. J., Li, Y. J., Martin, S. T. and Bertram, A. K.: Relative humidity-
- 1050 dependent viscosities of isoprene-derived secondary organic material and atmospheric
- 1051 implications for isoprene-dominant forests, Atmospheric Chemistry and Physics, 15(9), 5145-
- 1052 5159, doi:10.5194/acp-15-5145-2015, 2015.
- 1053 Song, M., Liu, P. F., Hanna, S. J., Zaveri, R. A., Potter, K., You, Y., Martin, S. T. and Bertram,
- 1054 A. K.: Relative humidity-dependent viscosity of secondary organic material from toluene photo-
- 1055 oxidation and possible implications for organic particulate matter over megacities, Atmospheric
- 1056 Chemistry and Physics, 16(14), 8817–8830, doi:10.5194/acp-16-8817-2016, 2016.
- 1057 Song, M., Ham, S., Andrews, R. J., You, Y. and Bertram, A. K.: Liquid–liquid phase separation
- 1058 in organic particles containing one and two organic species: importance of the average
- 1059 O : C, Atmospheric Chemistry and Physics, 18(16), 12075–12084,
- 1060 doi:10.5194/acp-18-12075-2018, 2018.
- 1061 Surratt, J. D., Murphy, S. M., Kroll, J. H., Ng, N. L., Hildebrandt, L., Sorooshian, A.,
- 1062 Szmigielski, R., Vermeylen, R., Maenhaut, W., Claeys, M., Flagan, R. C. and Seinfeld, J. H.:
- 1063 Chemical composition of secondary organic aerosol formed from the photooxidation of isoprene,
- 1064 J Phys Chem A, 110(31), 9665–9690, doi:10.1021/jp061734m, 2006.
- 1065 Surratt, J. D., Lewandowski, M., Offenberg, J. H., Jaoui, M., Kleindienst, T. E., Edney, E. O. and
- 1066 Seinfeld, J. H.: Effect of Acidity on Secondary Organic Aerosol Formation from Isoprene,
- 1067 Environmental Science & Technology, 41(15), 5363–5369, doi:10.1021/es0704176, 2007.
- 1068 Surratt, J. D., Chan, A. W. H., Eddingsaas, N. C., Chan, M., Loza, C. L., Kwan, A. J., Hersey, S.
- 1069 P., Flagan, R. C., Wennberg, P. O. and Seinfeld, J. H.: Reactive intermediates revealed in
- secondary organic aerosol formation from isoprene, Proceedings of the National Academy of
- 1071 Sciences, 107(15), 6640–6645, doi:10.1073/pnas.0911114107, 2010.
- 1072 Tamman, G. and Hesse, W.: The dependence of viscosity upon the temperature of supercooled1073 liquids., Z. Anorg. Allg. Chem, 156, 245–257, 1926.
- 1074 Ullmann, D. A., Hinks, M. L., Maclean, A. M., Butenhoff, C. L., Grayson, J. W., Barsanti, K.,
- 1075 Jimenez, J. L., Nizkorodov, S. A., Kamal, S., and Bertram, A. K.: Viscosities, diffusion
- 1076 coefficients, and mixing times of intrinsic fluorescent organic molecules in brown limonene
- 1077 secondary organic aerosol and tests of the Stokes–Einstein equation, Atmos. Chem. Phys., 19, 1401–1502, 10,5104/arr, 10,1401,2010, 2010
- 1078 1491-1503, 10.5194/acp-19-1491-2019, 2019.
- 1079 Virtanen, A., Joutsensaari, J., Koop, T., Kannosto, J., Yli-Pirilä, P., Leskinen, J., Mäkelä, J. M.,
- 1080 Holopainen, J. K., Pöschl, U., Kulmala, M., Worsnop, D. R., and Laaksonen, A.: An amorphous
- 1081 solid state of biogenic secondary organic aerosol particles, Nature, 467, 824-827,
- 1082 10.1038/nature09455, 2010.
- 1083 Vogel, H.: The law of relation between the viscosity of liquids and the temperature., Phys. Z., 22,1084 645–646, 1921.
- 1085 Xu, L., Suresh, S., Guo, H., Weber, R. J., and Ng, N. L.: Aerosol characterization over the
- 1086 southeastern United States using high-resolution aerosol mass spectrometry: spatial and seasonal





- variation of aerosol composition and sources with a focus on organic nitrates, Atmos. Chem.
 Phys., 15, 7307-7336, 10.5194/acp-15-7307-2015, 2015.
- 1089 Xu, L., Pye, H. O. T., He, J., Chen, Y., Murphy, B. N. and Ng, N. L.: Experimental and model 1090 estimates of the contributions from biogenic monoterpenes and sesquiterpenes to secondary
- 1091 organic aerosol in the southeastern United States, Atmospheric Chemistry and Physics, 18(17),
- 1092 12613–12637, doi:https://doi.org/10.5194/acp-18-12613-2018, 2018.
- Yarwood, G., Whitten, G. Z., Jung, J., Heo, G. and Allen, D. T.: Development, evaluation and
 testing of version 6 of the Carbon Bond chemical mechanism (CB6), The University of Texas at
 Austin., 2010.
- 1096 You, Y., Renbaum-Wolff, L., Carreras-Sospedra, M., Hanna, S. J., Hiranuma, N., Kamal, S.,
- Smith, M. L., Zhang, X., Weber, R. J., Shilling, J. E., Dabdub, D., Martin, S. T. and Bertram, A.
 K.: Images reveal that atmospheric particles can undergo liquid-liquid phase separations, Proc.

1098 K.: Images reveal that atmospheric particles can undergo indud-indud phase separations, PT 1099 Natl. Acad. Sci. U.S.A., 109(33), 13188–13193, doi:10.1073/pnas.1206414109, 2012.

- Yu, C. H., Zhu, X. and Fan, Z.: Spatial/Temporal Variations and Source Apportionment of
 VOCs Monitored at Community Scale in an Urban Area, edited by Y. Zhang, PLoS ONE, 9(4),
- 1102 e95734, doi:10.1371/journal.pone.0095734, 2014.
- 1103 Zanobetti, A. and Schwartz, J.: The Effect of Fine and Coarse Particulate Air Pollution on
- Mortality: A National Analysis, Environmental Health Perspectives, 117(6), 898–903,
 doi:10.1289/ehp.0800108, 2009.
- Zhang, H., Surratt, J. D., Lin, Y. H., Bapat, J. and Kamens, R. M.: Effect of relative humidity on
 SOA formation from isoprene/NO photooxidation: enhancement of 2-methylglyceric acid and its
- 1108 corresponding oligoesters under dry conditions, Atmospheric Chemistry and Physics, 11(13),
- 1109 6411–6424, doi:https://doi.org/10.5194/acp-11-6411-2011, 2011.
- 1110 Zhang, Q., Jimenez, J. L., Canagaratna, M. R., Allan, J. D., Coe, H., Ulbrich, I., Alfarra, M. R.,
- 1111 Takami, A., Middlebrook, A. M., Sun, Y. L., Dzepina, K., Dunlea, E., Docherty, K., DeCarlo, P.
- 1112 F., Salcedo, D., Onasch, T., Jayne, J. T., Miyoshi, T., Shimono, A., Hatakeyama, S., Takegawa,
- 1113 N., Kondo, Y., Schneider, J., Drewnick, F., Borrmann, S., Weimer, S., Demerjian, K., Williams,
- 1114 P., Bower, K., Bahreini, R., Cottrell, L., Griffin, R. J., Rautiainen, J., Sun, J. Y., Zhang, Y. M.
- and Worsnop, D. R.: Ubiquity and dominance of oxygenated species in organic aerosols in
- anthropogenically-influenced Northern Hemisphere midlatitudes: UBIQUITY AND
- 1117 DOMINANCE OF OXYGENATED OA, Geophysical Research Letters, 34(13), n/a-n/a,
- 1118 doi:10.1029/2007GL029979, 2007.
- 1119 Zhang, Y., Chen, Y., Lei, Z., Olson, N. E., Zhang, Z., Gold, A., Jayne, J. T., Worsnop, D. R.,
- 1120 Onasch, T. B., Ault, A. P. and Surratt, J. D.: Predicting the Viscosity and pH on Inorganic-
- 1121 Irganic Mixed Isoprene-Derived Epoxydiols (IEPOX) aerosols, In Prep.
- 1122 Zhang, Y., S. Sanchez, M., Douet, C., Wang, Y., Bateman, A., Gong, Z., Kuwata, M., Renbaum-
- 1123 Wolff, L., B. Sato, B., Liu, P., K. Bertram, A., Geiger, F. and T. Martin, S.: Changing shapes and
- 1124 implied viscosities of suspended submicron particles, Atmospheric Chemistry and Physics
- 1125 Discussions, 15, 6821–6850, doi:10.5194/acpd-15-6821-2015, 2015.





- 1126 Zhang, Y., Chen, Y., Lambe, A. T., Olson, N. E., Lei, Z., Craig, R. L., Zhang, Z., Gold, A.,
- 1127 Onasch, T. B., Jayne, J. T., Worsnop, D. R., Gaston, C. J., Thornton, J. A., Vizuete, W., Ault, A.
- 1128 P. and Surratt, J. D.: Effect of the Aerosol-Phase State on Secondary Organic Aerosol Formation
- 1129 from the Reactive Uptake of Isoprene-Derived Epoxydiols (IEPOX), Environ. Sci. Technol.
- 1130 Lett., 5(3), 167–174, doi:10.1021/acs.estlett.8b00044, 2018a.
- 1131 Zhang, H., Yee, L. D., Lee, B. H., Curtis, M. P., Worton, D. R., Isaacman-VanWertz, G.,
- 1132 Offenberg, J. H., Lewandowski, M., Kleindienst, T. E., and Beaver, M. R.: Monoterpenes are the
- 1133 largest source of summertime organic aerosol in the southeastern United States, Proceedings of
- 1134 the National Academy of Sciences, 115, 2038-2043, 2018b.
- 1135 Zuend, A. and Seinfeld, J. H.: Modeling the gas-particle partitioning of secondary organic
- aerosol: the importance of liquid-liquid phase separation, Atmospheric Chemistry and Physics,
- 1137 12(9), 3857–3882, doi:https://doi.org/10.5194/acp-12-3857-2012, 2012.
- 1138 Zuend, A., Marcolli, C., Luo, B. P. and Peter, T.: A thermodynamic model of mixed organic-
- 1139 inorganic aerosols to predict activity coefficients, Atmospheric Chemistry and Physics, 8(16),
- 1140 4559–4593, doi:https://doi.org/10.5194/acp-8-4559-2008, 2008.





1142 **Tables**

- 1143 **Table 1 CMAQ** defined aerosol phase species (Pye et al., 2017; Murphy et al., 2017) used in the
- 1144 calculation of the predicted organic phase parameter (overall SOA viscosity- η_{org}) and their
- 1145 respective organic-mass-to-organic-carbon ratio (OM:OC) (Pye et al., 2017), atomic oxygen-to-
- 1146 carbon ratio (O:C), molar weight (Pye et al., 2017), and predicted individual glass transition
- 1147 temperature (T_g) and viscosity at standard temperature.

Species	Description	Source	OM :	O :C	Molar	Predicted	Predicted
Name			OC	ratio	weight	Tg	η_{org} at
			ratio		(g/mole)	(K)	T= 298K
							And
							ALW = 0
							(Pa•s)
AALK1	SV alkane	ANTH	1.56	0.3146	225	256	7.54*10 ⁹
	VOC SOA						
AALK2	SV alkane	ANTH	1.42	0.2026	205.1	233	5.34*10 ⁷
	VOC SOA						
ABNZ1	SV High NOx	ANTH	2.68	1.2106	161	289	1.67*10 ¹⁴
	SOA product						
	from benzene						
ABNZ2	SV High NOx	ANTH	2.23	0.8506	134	234	2.66*10 ⁷
	SOA product						
	from benzene						
ABNZ3	LV low NOx	ANTH	3.00	1.4666	180	322	1.00*10 ¹²
	SOA product						
	from Benzene						
AGLY	Glyoxal /	BIOG	2.13	0.7706	66.4	160	1.71*10 ³
	methylglyoxal						
	SOA						
AISO1	SV SOA	BIOG	2.20	0.8266	132.0	230	1.20*10 ⁷
	product from						
	isoprene						
AISO2	HV SOA	BIOG	2.23	0.8506	133.0	233	2.26*10 ⁷
	product from						
	isoprene						





AISO3	Acid-catalyzed	BIOG	2.80	1.3066	168.2	301	1.00*10 ¹²
	isoprene SOA						
	compounds (2-						
	methyltetrols +						
	IEPOX						
	organosulfate)						
ALVOO1	LV Oxidized	ANTH	2.27	0.8826	136	238	6.59*10 ⁷
	combustion						
	organic						
	compounds						
ALVOO2	LV Oxidized	ANTH	2.06	0.7146	136	222	3.97*10 ⁶
	combustion						
	organic						
	compounds						
AOLGA	Oligomer	ANTH	2.50	1.0666	206	303	1.00*10 ¹²
	products of						
	anthropogenic						
	SOA						
	compounds						
AOLGB	Oligomer	BIOG	2.10	0.7466	248	300	1.00*1012
	products of						
	biogenic SOA						
	compounds						
AORGC	Glyoxal and	BIOG	2.00	0.6666	177	251	1.33*10 ⁹
	Methylglyoxal						
	SOA						
APAH1	SV High-NOx	ANTH	1.63	0.3706	195.6	239	1.58*10 ⁸
	SOA product						
	from PAHs						
APAH2	SV High-NOx	ANTH	1.49	0.2586	178.7	216	2.80*10 ⁶
	SOA product						
	from PAHs						
APAH3	LV low-NOx	ANTH	1.77	0.4826	212.2	260	1.97*10 ¹⁰
	SOA product						
	from PAHs						
APCSO	Potential	ANTH	2.00	0.6666	170	245	3.91*10 ⁸
	combustion						
	SOA						
ASQT	SV SOA from	BIOG	1.52	0.2826	135	179	1.87*10 ⁴
	sesquiterpenes						





ASVO01	SV Oxidized	ANTH	1.88	0.5706	135	207	4.69*10 ⁵
	combustion						
	organic						
	products						
ASVOO2	SV Oxidized	ANTH	1.73	0.4506	135	195	1.10*10 ⁵
	combustion						
	organic						
	products						
ASVOO3	SV Oxidized	ANTH	1.60	0.3466	134	184	3.19*10 ⁴
	Combustion						
	organic						
	compounds						
AIVPO1	Intermediate	ANTH	1.17	0.0026	266	260	3.22*10 ¹⁰
	Volatility						
	Primary						
	organic						
	compounds						
ALVPO1	LV Primary	ANTH	1.39	0.1786	218	241	2.58*10 ⁸
	organic						
	compounds						
ASVPO1	SV Primary	ANTH	1.32	0.1226	230	245	7.00*10 ⁸
	organic						
	compounds						
ASVPO2	SV primary	ANTH	1.26	0.0746	241	249	1.86*10 ⁹
	organic						
	compounds						
ASVPO3	SV primary	ANTH	1.21	0.0346	253	254	6.63*10 ⁹
	organic						
	compounds						
ATOL1	SV high NOx	ANTH	2.26	0.8746	163	259	8.17*10 ⁹
	Toluene SOA						
ATOL2	SV High NOx	ANTH	1.82	0.5226	175	23	7.25*10 ⁷
	Toluene SOA						
ATOL3	LV low NOx	ANTH	2.70	1.2266	194	309	1.00*1012
	Toluene SOA						
ATRP1	SV SOA	BIOG	1.84	0.5386	177	239	1.30*10 ⁸
	product from						
	monoterpenes						





ATRP2	HV SOA	BIOG	1.83	0.5306	198	254	3.93*10 ⁹
	product from						
	monoterpenes						
AXYL1	SV High NOx	ANTH	2.42	1.0026	174	278	3.16*10 ¹²
	SOA product						
	from xylene						
AXYL2	SV High NOx	ANTH	1.93	0.6106	185	252	1.85*10 ⁹
	SOA product						
	from xylene						
AXYL3	LV low-NOx	ANTH	2.30	0.9066	218	297	1.43*10 ¹⁶
	SOA product						
	from xylene						

Table 2 - Rate constants used to calculate the effective first order rate constant for aqueous phase

1151 IEPOX SOA formation catalyzed by H^+ , HSO_4^- with water and SO_4^{2-} as nucleophiles

Rate Constant	Value	Reference
	$(M^{-2} s^{-1})$	
$k_{H^+,water}$	9.00x10 ⁻⁴	Eddingsaas et al., 2010;
,		Pye et al., 2013
$k_{HSO_{4}^{-},water}$	1.31x10 ⁻⁵	Eddingsaas et al., 2010
$k_{H^+,SO^{2-}}$	1.27x10 ⁻³	Riedel et al. 2016;
11 ,004		Budisulistiorini et al.,
		2017





Simulations	Details
NonPhaseSep	Base CMAQ v5.2.1 parameterization assuming homogeneous, internally mixed organic-inorganic fine aerosol, no phase separation (Pye et al., 2017)
PhaseSep	CMAQ parametrization with additional term in reactive uptake calculation to capture the impact of phase separation and organic coating described in sections 2.1-2.3 and 2.5
Emissions reduction	PhaseSep with EPA recommended emissions reductions of 34% and 48% for NO _x and SO ₂ from 2013 to 2025 (See Section 2.6)
HighHorg	PhaseSep with higher organic phase Henry's law Coefficient (3 orders of magnitude higher than in PhaseSep) (See Section 2.6)
PhaseSep2	PhaseSep with the assumption that for solid or semi-solid phase Zuend and Seinfeld (2012) phase sepration criteria is followed (See Section 2.6)

Table 3 – Brief summary of different simulations conducted in this work in CMAQ v 5.2.1









1169Figure 1-Probability density distribution of glass transition temperature to ambient temperature1170ratio (T_{org} : T) for all grid cells and time steps at the surface layer (red), 1.8 km above Surface layer1171(green, layer 18-lower troposphere), 8 km above Surface layer (blue, layer 28-upper troposphere)1172and 17 km above Surface layer (purple, layer 35-stratosphere).













- 1174 Figure 2- For all time steps and over the continental United States, the average glass transition
- 1175 temperature to ambient temperature $(T_{org}; T)$ ratio at the (A) surface level, (B) 1.8 km above Surface
- 1176 layer (lower troposphere), (C) 8 km (upper troposphere) and (D)17 km above Surface layer
- 1177 (stratosphere).
- 1178
- 1179



- 1181 Figure 3 From June 1 to June 15, 2013 the contributions of biogenic SOA (green), anthropogenic
- 1182 SOA (red), and aerosol water (blue) to glass transition temperature (T_{org}) at the (A) Centreville,
- 1183 AL site and the (**B**) Jefferson Street, Atlanta site.
- 1184
- 1185







1188 Figure 4- For all grid cells and time steps at the surface layer the (A) Probability distribution of

1189 the organic phase viscosity, and correlations of particle viscosity (η_{org}) with (**B**) relative humidity,

1190 (C) atomic oxygen-to-carbon (O:C) ratio, (D) anthropogenic SOA weight fraction, (E) biogenic

1191 SOA weight fraction and, (F) organic-phase water content (ws).









Figure 5 – Predicted glass transition temperature to ambient temperature ratio $(T_{org}:T)$ at the 1203 Centreville, Alabama during the 2013 SOAS campaign based on OA composition reported by 1204 1205 Zhang et al. (2018b) (black). Predicted T_{org} : T from this work is shown in yellow.

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- 1229 Figure 7 For all grid cells and time steps the predicted (A) probability distribution of γ_{IEPOX} at
- 1230 the surface level for the NonPhaseSep (red), PhaseSep (green), and Emission reductions (blue)
- simulations. For each grid cell the mean value of γ_{EPOX} for the (**B**) *PhaseSep* simulation and (**C**)
- 1232 NonPhaseSep simulation.
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Figure 8 – Spatial map of the mean percent relative change of (A) IEPOX-derived SOA and (B)
biogenic SOA mass (primarily driven by IEPOX SOA) in *PhaseSep* case relative to the *NonPhaseSep* Simulation.

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- 1246 Jefferson Street, Atlanta, Georgia site. Bars/shading indicate 25th to 75th percentiles. Lines indicate
- 1247 means. n= number of observation points.

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Figure 10 –Relative change (%) in biogenic SOA mass at the surface level from the PhaseSep parameterization for the (A) NO_x and SO_2 *emissions reduction* sensitivity simulation, (B) *HighHorg* sensitivity simulation, and (C) the *PhaseSep2* simulation that did not assume semi-solid particles were automatically phase separated.

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