# 1 The Influences of Mass Loading and Rapid Dilution of 2 Secondary Organic Aerosol on Particle Volatility

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#### 1 Abstract

2 The thermally-induced evaporation of secondary organic aerosol (SOA) has been characterized 3 for SOA formed from the dark ozonolysis of  $\alpha$ -pinene + O<sub>3</sub> at initial mass concentrations ranging from 1 to 800 µg m<sup>-3</sup>. Temperature-dependent particle size distributions were measured using a 4 5 thermodenuder and the resulting mass thermograms were compared between the SOA formed at the various SOA mass concentrations. Negligible differences were observed between the mass 6 thermograms for SOA concentrations  $< 300 \,\mu g \, m^{-3}$ . At higher SOA concentrations, the observed 7 8 mass thermograms indicated the SOA was actually slightly less volatile than the SOA at lower 9 concentrations; this is likely an artifact due to either saturation of the gas-phase or to 10 re-condensation during cooling. The thermograms observed when the SOA was formed at high concentrations (>380  $\mu$ g m<sup>-3</sup>) and then rapidly isothermally diluted to low concentrations (1-20  $\mu$ g 11 12 m<sup>-3</sup>) were identical to those for the SOA that was initially formed at low concentrations. The 13 experimental results were compared to a kinetic model that simulates particle evaporation upon 14 heating in a thermodenuder for a given input volatility distribution and particle composition. Three 15 cases were considered: 1) the SOA was composed of semi-volatile monomer species with a volatility distribution based on that derived previously from consideration of SOA growth 16 17 experiments; 2) the initial SOA was composed almost entirely of non-volatile dimers that 18 decompose upon heating into their semi-volatile monomer units, which can then evaporate; and 3) 19 where a volatility distribution was derived by fitting the model to the observed mass thermograms. 20 It was found that good agreement is obtained between model predictions and the observations when the particle composition is either dominated by compounds of low volatility or by dimers. 21 22 These same models were used to simulate isothermal evaporation of the SOA and were found to 23 be broadly consistent with literature observations that indicate that SOA evaporation occurs with 24 multiple timescales. The use of the semi-volatile monomer volatility distribution fails to reproduce the observed evaporation. The presence of dimers and larger oligomers in secondary organic 25 26 aerosol formed from products of the reaction of  $\alpha$ -pinene and O<sub>3</sub> has been well-established in 27 laboratory studies. However, the timescale and relative importance of the formation of oligomers 28 or low volatility compounds in the growth and evaporation of SOA has been debated. This study 29 provides further support that low volatility compounds and oligomers are formed in  $\alpha$ -pinene + O<sub>3</sub> 30 in high abundances and suggests that their formation occurs rapidly upon particle formation.

# 1 **1 Introduction**

2 Atmospheric aerosol particles have an important impact on human health (Chen et al., 2013) 3 and climate (IPCC, 2014). Organic aerosol (OA) is a significant portion of atmospheric particulate mass, often contributing 20-90% of the fine particle mass world-wide (Saxena and Hildemann, 4 5 1996; Andreae and Crutzen, 1997), a major portion of which is secondary organic aerosol (SOA) (Zhang et al., 2005). One pathway through which SOA is formed is when products from the gas-6 7 phase oxidation of volatile organic compounds (VOCs) condense onto pre-existing particles or 8 nucleate to form new particles. VOCs are broadly classified as being either biogenic (BVOCs) or 9 anthropogenic (AVOCs). The source of SOA varies with geographical location, with larger 10 contributions of anthropogenic SOA in and around urban areas (Weber et al., 2007) and larger 11 contributions of biogenic SOA in rural areas (Han et al., 2014).

12 An important source of biogenic SOA is the reaction of unsaturated gas-phase VOCs with  $O_3$ . 13 The most globally abundant BVOC compounds are isoprene ( $C_5H_8$ ) and monoterpenes ( $C_{10}H_{16}$ ) (Kesselmeier and Staudt, 1999). Around 90 Tg C yr<sup>-1</sup> of monoterpenes are emitted from vegetation 14 sources worldwide (Hallquist et al., 2009) of which  $\alpha$ -pinene constitutes nearly half (Guenther et 15 16 al., 1995; Seinfeld and Pankow, 2003). During the formation of SOA from the ozonolysis of  $\alpha$ -17 pinene the aerosol composition and corresponding physical properties have been shown to change 18 as a function of total organic aerosol mass loading ( $C_{OA}$ ). For example, Shilling et al. (2009) 19 observe that both the O/C ratio and the effective density of α-pinene SOA decrease as COA 20 increases, most steeply below  $\sim 30 \,\mu g \, m^{-3}$ . Other studies have shown that the mass yield of a variety 21 of SOA, including  $\alpha$ -pinene + O<sub>3</sub> SOA, increases as C<sub>OA</sub> increases (Henry et al., 2012;Odum et 22 al., 1996;Pathak et al., 2007). Changes to aerosol composition as a function of C<sub>OA</sub> can be 23 explained by gas/particle partitioning in which the distribution of material between the gas and particle phases is related to the saturation vapor concentration,  $C^*$ , and the total OA concentration 24 25 (Pankow, 1994;Odum et al., 1996) according to:

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27 
$$\frac{c_{i,p}}{c_{i,tot}} = \alpha_i \left(1 + \frac{c_i^*}{c_{OA}}\right)^{-1}$$
(1)

where  $C_{i,p}$  is the concentration of compound *i* in the particle phase (µg m<sup>-3</sup>),  $C_{i,tot}$  is the total 1 concentration of i in both the gas and particle phase ( $\mu g m^{-3}$ ),  $C_i^*$  is the saturation vapor 2 concentration (µg m<sup>-3</sup>) and  $\alpha_i$  is the mass yield of compound *i*. When C<sub>OA</sub> is equal to  $C_i^*$  50% of 3 4 compound *i* exists in the particle phase. Compounds are generally considered semi-volatile when 5 their  $C_{i}^{*}$  are within 1-2 orders of magnitude of the concurrent C<sub>OA</sub>. According to gas/particle partitioning, as C<sub>OA</sub> increases the fraction of higher volatility compounds, which usually have a 6 7 lower O/C ratio, present in the condensed phase will increase. SOA growth experiments have 8 historically been interpreted through the framework of absorptive gas/particle partitioning theory, 9 where volatility distributions, i.e. distributions of  $\alpha_i$  as a function of  $C_i^*$  for some number of 10 surrogate compounds, are derived by fitting the observed SOA formation (Odum et al., 11 1996;Donahue et al., 2006). Such analyses indicate that SOA is composed of a distribution of semi-volatile compounds with volatilities greater than ~  $10^{-1} \ \mu g \ m^{-3}$ . However, the volatility 12 distributions determined from fitting of growth experiments have been mostly unable to describe 13 14 the reverse process, namely evaporation of SOA...

15 For example, quantitative estimates of the volatility of both ambient and laboratory OA after 16 heating induced evaporation indicate that there are often components of OA with significantly 17 lower volatility than predicted by fitting of growth experiments (Cappa and Jimenez, 2010;Stanier 18 et al., 2007). In addition, several experiments have observed slower than expected room-19 temperature evaporation of both ambient (Vaden et al., 2011) and laboratory generated (Saleh et 20 al., 2013; Grieshop et al., 2007; Wilson et al., 2015; Vaden et al., 2011), SOA during isothermal 21 dilution. It has also been observed that the mass spectrum of  $\alpha$ -pinene + O<sub>3</sub> SOA over the range 22 40-200 amu exhibited negligible changes during the heating induced evaporation (Cappa and 23 Wilson, 2011), even though absorptive gas/particle partitioning suggests an SOA composed of components having volatilities spanning several decades of C<sup>\*</sup>. Some other experiments have 24 25 observed some changes to the observed particle composition (i.e. mass spectrum) upon heating 26 (Hall and Johnston, 2012b;Kostenidou et al., 2009), but overall the changes tend to be small and 27 inconsistent with the particles being composed of individual compounds with a wide range of 28 volatilities. Altogether these observations illustrate that there is a clear gap between the apparent 29 volatility of SOA as characterized during evaporation experiments and the effective volatility of 30 SOA derived from formation studies.

1 In this study, the volatility of  $\alpha$ -pinene + O<sub>3</sub> SOA was characterized by heating-induced 2 evaporation in a thermodenuder (TD) as a function of  $C_{OA}$  over the range 1 to 800 µg m<sup>-3</sup>. Based on previous SOA formation experiments, the SOA composition is expected to have changed as 3  $C_{\text{OA}}$  was increased from 1µg m<sup>-3</sup> to >140 µg m<sup>-3</sup> (Shilling et al., 2009). It follows that the SOA 4 volatility should vary as a function of  $C_{OA}$  as well, with an expectation that SOA at higher  $C_{OA}$ 5 6 should be more volatile than that at low  $C_{OA}$  and thus should exhibit different responses to heating. 7 Additionally, mass thermograms of SOA that was initially formed at  $C_{OA} > 380 \ \mu g \ m^{-3}$  and rapidly diluted to  $C_{\text{OA}} < 30 \ \mu\text{g m}^{-3}$  were measured. The experimental results are interpreted using the 8 kinetic model of aerosol evaporation in a TD by Cappa (2010) that has been extended from the 9 10 original formulation that assumed direct evaporation of semi- or low-volatility monomers to 11 include dimer formation and decomposition. Good agreement between the experimental 12 observations and the model predictions provide support for the large influence of oligomer 13 decomposition on SOA evaporation.

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#### 15 2 Materials and Methods

# 16 **2.1 Secondary Organic Aerosol Production**

17 SOA was formed in the absence of seed particles at various total  $C_{OA}$  from the formation and 18 subsequent growth of nano-condensation nuclei that were formed from products of the ozonolysis 19 of gas-phase  $\alpha$ -pinene, in excess (Fig. S1). Variable amounts of  $\alpha$ -pinene were introduced into a 20 stainless steel flowtube (L = 2 m; ID = 2.3 cm) by constantly injecting liquid  $\alpha$ -pinene (0.12-0.7 21  $\mu$ L h<sup>-1</sup>) into a stream of purified house air at 0.015 lpm. The O<sub>3</sub> was generated by passing air 22 through a cell containing a 22.9 cm long Hg pen-ray lamp (UVP, LLC.) and then 0.70-1.0 lpm of 23 this flow was sub-sampled into the flowtube. The relative humidity of the air stream was  $\sim 30\%$ 24 for all experiments. The concentrations of  $\alpha$ -pinene, O<sub>3</sub> and other experiment-specific conditions 25 are given in Table 1. The residence time in the flow tube was typically about 1 minute, although 26 slightly variable depending on the total volumetric flow rate (see Table 1). No OH scavenger was 27 used. The O<sub>3</sub> concentration was measured using an O<sub>3</sub> Monitor (Model 450, API Inc.). 28 Downstream of the flowtube residual hydrocarbons and  $O_3$  were removed by passing the airstream 29 through a Carulite 200 (Carus) catalyst and a charcoal denuder. The particles were assumed to have a density of 1.2  $\mu$ g m<sup>-3</sup>. The particle mass concentrations were varied from 1 to 800  $\mu$ g m<sup>-3</sup> 30

although were kept stable for the duration of each experiment. Larger concentrations tended to
 correspond to particle size distributions that peaked at larger sizes.

3 In addition to SOA that was generated at variable  $C_{OA}$ , seven experiments involved the dilution of SOA that was initially formed at high  $C_{OA}$  ( $\geq$ 380 µg m<sup>-3</sup>) and diluted to low  $C_{OA}$ . The dilution 4 occurred downstream of the flowtube, charcoal denuder and ozone denuder. To achieve the desired 5 6 dilution the aerosol-laden airstream was divided into two fractions; one was directed through a 7 HEPA capsule filter with Versapor® membrane (Pall Corp.) to remove particles from the air 8 stream and the other passed directly through 1/8-in copper tubing. The two air streams were 9 recombined after the filter and passed directly to the TD. The fraction of the airstream directed 10 through the HEPA filter, i.e. the level of dilution, was controlled by a needle valve attached to the 11 outlet of the filter.

#### 12 **2.2 Thermodenuder**

13 The TD used here is based on the design of Huffman et al. (2008) with the following key 14 modifications: 1) the heated laminar flow reactor is 0.71 m long (as compared to 0.41 m) and has 15 a center line fully-heated residence time ( $\tau_{res}$ ) of 26 seconds at a flow rate of 0.40 lpm; 2) the 16 distance between the actively heated volume and the charcoal denuder has been shortened and is 17 now 4.8 cm (as compared to  $\sim$ 14 cm); 3) there is only one heating region. The shorter distance 18 between the end of the actively heated volume and the charcoal denuder helps to limit re-19 condensation as the air cools prior to reaching the denuder section. The bypass (i.e. unheated) line 20 had the same volume as the TD, and thus the same total residence time. Further information on the 21 design and characterization of the TD is provided in the Supplemental Information. The room 22 temperature flowrate through the TD was a constant 0.40 lpm independent of the total flowrate in 23 the SOA formation flowtube. Measurements of the particle size distribution were made after the 24 particles passed through either the bypass line (room temperature) or the TD. The TD temperature ranged from room temperature (298 K) to 220°C (493 K). No differences in the mass thermograms 25 26 were found between experiments based on the order of temperature changes, e.g. whether temperature was increased or decreased. 27

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- 29

#### 1 2.3 Measurements

A scanning mobility particle sizer (SMPS; TSI, Inc.), composed of a charge neutralizer, a differential mobility analyzer (DMA; Model 3085) and a condensation particle counter (CPC; Model 3772), was used to measure particle size distributions. The extent of aerosol evaporation was characterized by comparing the particle size distribution for particles that passed through the bypass line to that for the particles after passing through the TD. The size distributions were characterized by their volume-weighted median diameter,  $d_{p,V}$ . The particle volume fraction remaining (VFR) after passing through the TD is then:

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10 
$$VFR = \frac{\frac{\pi}{6}d_{p,V,TD}^3}{\frac{\pi}{6}d_{p,V,bypass}^3},$$
 (2)

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where  $d_{p,V,TD}$  and  $d_{p,V,bypass}$  refer to the particles that passed through the TD or the bypass, respectively. Under an assumption of constant particle density, the VFR is equivalent to the particle mass fraction remaining (MFR), and plots of VFR versus temperature are commonly referred to as mass thermograms. The bypass distribution was measured at least every two temperature changes (~every 20 minutes) to account for any changes in the reference particle distribution; in general, the reference distributions were very stable.

18 To facilitate quantitative comparison between experiments at different  $C_{OA}$ , each mass 19 thermogram was fit to the sigmoidal type equation from Emanuelsson et al. (2013):

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21 
$$VFR(T) = VFR_{max} + \left(\frac{VFR_{min} - VFR_{max}}{1 + \left(\frac{T_{50}}{T}\right)^{S_{VFR}}}\right),$$
(3)

22

where  $VFR_{min}$  is the VFR at the low temperature limit,  $VFR_{max}$  is the VFR at the high temperature limit (typically zero),  $S_{VFR}$  is the slope factor that characterizes the steepness of the VFR curve and  $T_{50}$  is the temperature at which VFR = 0.50. If there is no evaporation in the TD at room temperature due to the removal of gas-phase compounds (vapor stripping) in the denuder section then the VFR at room temperature (298 K) should be, by definition, unity. Best-fit *VFR*<sub>min</sub> values greater than unity may, however, be obtained because Eqn. 3 is an empirical expression and thus is not expected to provide a perfect match with the observations, although can nonetheless facilitate comparison between different experiments. Here, to provide for more consistent fitting and since no evaporation was observed at room temperature, the fit curves were forced to go through unity at room temperature.

# 6 2.4 Kinetic Model of Evaporation

#### 7 2.4.1 Thermodenuder model

8 The kinetic model of evaporation used here is a modified version of the model developed by 9 Cappa (2010) to simulate evaporation in a thermodenuder. The original model simulated 10 gas/particle mass transfer (evaporation and condensation) for a monomodal multi-component 11 aerosol as particles pass through and are heated and cooled in the TD along with loss of vapors to 12 the charcoal denuder. Absorptive partitioning is implicitly assumed. Compounds evaporate 13 according to their respective saturation vapor concentrations, and it is assumed that the gas/particle system is at equilibrium before entering the TD. The temperature dependence of  $C^*$  is accounted 14 15 for using the Clausius-Clapeyron equation. Here, it is assumed that the enthalpy of vaporization,  $\Delta H_{vap}$ , is related to C<sup>\*</sup> according to the relationship of Epstein et al. (2010), where  $\Delta H_{vap}$ (kJ mol<sup>-1</sup>) 16 = 131 - 11×log  $C^*$ . The temperature profile through the TD is empirically specified (see SI). The 17 key input to the model is the distribution of mass (gas + particle) with respect to  $C^*$ , referred to as 18 19 a volatility distribution; different distributions will yield different mass thermograms (Cappa and 20 Jimenez, 2010). It is commonplace to assume a distribution where the  $C^*$  values differ by an order 21 of magnitude at a specified reference temperature, e.g.  $\log C^*(298 \text{ K}) = (-3, -2, -1, 0, 1, 2, 3)$ , and 22 this approach is adopted here. The calculated mass transfer rates can be adjusted to account for mass transfer limitations, as characterized by the evaporation coefficient,  $\gamma_e$ , which characterizes 23 24 deviations from the theoretical maximum evaporation rate;  $\gamma_e$  is an adjustable parameter as it is not known *a priori*. The default value used is  $\gamma_e = 1$ . The model output for a given set of  $\Delta H_{vap}$  and  $C^*$ 25 26 is dependent on  $\gamma_e$ . At smaller  $\gamma_e$  the slope of the mass thermogram is less steep, the  $T_{50}$  increases 27 and for SOA with semi-volatile components an increasing amount of mass remains after TD-28 processing at room temperature (Cappa and Wilson, 2011). The model can be run with pre-29 specified volatility distributions or can be used to determine empirical volatility distributions from 30 fitting to observations (Cappa and Jimenez, 2010).

1 The base TD model has been modified to include the influence of dimers and dimer 2 decomposition on the simulated evaporation, and shares some similarities with Trump and 3 Donahue (2014). The dimer model is implemented as follows. The initial equilibrium gas/particle 4 mass distribution is based on a semi-volatile monomer volatility distribution (i.e. that determined 5 from previous growth experiments). The balance between monomers and dimers at equilibrium is then determined from the monomer/dimer equilibrium constant,  $K_{eam}$  (cm<sup>3</sup> molecules<sup>-1</sup>), which is 6 equal to the ratio of the forward  $(k_f, \text{ cm}^3 \text{ molecules}^{-1} \text{ s}^{-1})$  and reverse  $(k_r, \text{ s}^{-1})$  rate coefficients 7 8 associated with formation from monomers and dimer decomposition, i.e.  $K_{eqm} = k_f/k_r$ . Note that 9 the volume units on  $K_{eqm}$  and  $k_f$  correspond to condensed-phase volume. If  $K_{eqm}$  is large then all 10 condensed-phase species would be in dimer form and, at equilibrium, all gas-phase material would 11 be drawn into the condensed phase, assuming that the monomers are miscible with the dimers. 12 Here, this situation is avoided through the following simplification to determine the initial particle 13 state at the TD inlet. First, the gas/particle (monomer only) equilibrium distribution is calculated 14 given the specified volatility distribution and  $C_{OA}$ . Then the monomer/dimer equilibrium in the 15 condensed phase only is calculated based on the current condensed-phase monomer 16 concentrations. The gas-phase concentrations are then set to zero to avoid large amounts of 17 condensing material at the next time step. Since a charcoal denuder is placed immediately after the 18 flowtube, this simplification is physically reasonable as we have previously found that vapor 19 stripping in charcoal denuders is efficient (Cappa and Wilson, 2011). The resulting monomer-20 dimer concentrations in the condensed phase are used as the initial state. The above simplification 21 for the initial particle state most likely does not provide a true representation of the actual particle 22 composition, just as the assumption regarding only homodimers (discussed below) is a 23 simplification. However, as we ultimately find that the simulation results are much more sensitive 24 to the initial distribution of particulate mass with respect to monomers and dimers than to the 25 specific distribution of monomers with respect to their volatility, these simplifications will 26 influence the details but not the general conclusions arrived at here.

It is assumed that the dimers are non-volatile over the entire temperature range considered, and thus do not directly evaporate. In addition, only homodimers, that is dimers formed from monomers in the same volatility bin, are assumed to form. This is a simplification compared to allowing for all possible cross-reactions and allows for more straight-forward keeping track of the dimer source monomers. As the temperature increases within the TD the dimers decompose into

1 their semi-volatile parent monomers, which can then evaporate according to their saturation vapor 2 concentration. It was assumed that there were no mass transport limitations within the 3 particle-phase for all evaporating species, i.e. that the surface composition was always equivalent 4 to the bulk composition. As the semi-volatile monomers evaporate the equilibrium state is 5 perturbed and the dimers decompose in response, according to the temperature dependent  $K_{eqm}$ , to re-establish dimer/monomer equilibrium. Depending on the timescale of dimer formation and 6 7 decomposition, the dimers and monomers may not be in equilibrium at every step of the model, 8 yet they are constantly forming and decomposing to move towards equilibrium. Experimental 9 observations by Hall and Johnston (2012b) have shown that dimers in SOA do decompose upon 10 heating. The rate at which dimers decompose is governed by changes to  $k_{\rm f}$  and  $k_{\rm f}$ , as a function of 11 temperature. Assuming they exhibit Arrhenius-type temperature dependence, the temperature 12 sensitivity of  $K_{eqm}$  can be characterized by the difference in the activation energies of the reverse 13 and forward reactions,  $\Delta E_a = E_{a,r} - E_{a,f}$ , and where the temperature dependence of  $k_r$  and  $k_f$  has the 14 form:

16 
$$k_r(T) = k_r(298K) \cdot e^{\left(-\frac{E_{a,r}}{RT} + \frac{E_{a,r}}{R \cdot 298K}\right)} = A_r \cdot e^{-\frac{E_{a,r}}{RT}}$$
 (4)

17

18 where R is the universal gas constant (8.314 J mol<sup>-1</sup> K), T is the temperature (K) and where 19

20 
$$A_r = k_r (298K) \cdot e^{-\frac{E_{a,r}}{R \cdot 298}}$$
 (5)

22 Note that the Arrhenius pre-factor,  $A_r$ , depends on  $E_{a,r}$ . Consequently,

23

24 
$$K_{eqm}(T) = \frac{k_r(298K)}{k_f(298K)} \cdot e^{-\frac{\Delta E_a}{R \cdot 298K}} \cdot e^{-\frac{\Delta E_a}{RT}} = \frac{A_r}{A_f} \cdot e^{\frac{\Delta E_a}{RT}}$$
(6)

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and  $\Delta E_a$  is as defined above. It should be noted that this formulation differs somewhat from that of Trump and Donahue (2014) in that they assumed that *A* and  $E_a$  were independent parameters and further did not account for the T-dependence of  $k_{\rm f}$ , which we account for here in the relationship between  $k_{\rm r}$ ,  $k_{\rm f}$  and  $\Delta E_{\rm a}$ . The key model inputs are then  $K_{\rm eqm}(298 \text{ K})$ ,  $k_{\rm r}(298 \text{ K})$  and  $\Delta E_{\rm a}$ . Although  $K_{\rm eqm}$  governs the equilibrium distribution,  $k_{\rm f}$  and  $k_{\rm r}$  will control the timescales associated with dimer formation and the approach to equilibrium in the particles.

# 5 2.4.2 Isothermal evaporation model

6 The kinetic thermodenuder model of evaporation was adapted to allow for simulation of 7 particle evaporation at room temperature following from isothermal dilution for any initial input 8 of particle composition including semi-volatile monomers, very low volatility compounds and a 9 mixture of semi-volatile monomers and non-volatile dimers. The extent of dilution is user-10 selectable as a dilution factor (DF), which simulates SOA and the associated vapors being passed 11 through a DMA and injected into a chamber. The organic vapors are assumed to be removed from 12 the system (i.e. lost to the chamber walls) with a rate characterized by a user-selectable first order loss rate,  $k_{loss}$  (s<sup>-1</sup>). Vapor loss serves to mimic the conditions in some isothermal evaporation 13 experiments where the diluted SOA particles are held in a chamber containing activated carbon 14 15 (Vaden et al., 2011). The timescales associated with isothermal evaporation are much longer than 16 for the TD experiments and simulations, and the isothermal evaporation model can be run for many 17 hours of model time. When the monomer/dimer equilibrium is used to establish the initial particle 18 composition, the relationships between  $K_{eqm}$ ,  $k_r$ ,  $k_f$  and  $\Delta E_a$  are the same as in the TD evaporation 19 model.

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# 21 3 Results and Discussion

#### 22 **3.1 Observations**

Evaporation and shrinking of the  $\alpha$ -pinene+O<sub>3</sub> SOA particles occurred upon heating in the TD. Example size distributions as a function of temperature for an initial  $C_{OA} = 9 \ \mu g \ m^{-3}$  are shown in Figure 1. The mass thermograms for each individual experiment are shown in Figure 2. The experimental results have been grouped according to the bypass  $C_{OA}$  for each experiment, with groupings of: (i) high,  $C_{OA}>300 \ \mu g \ m^{-3}$ ; (ii) medium,  $90 \le C_{OA}<300 \ \mu g \ m^{-3}$ ; and low,  $C_{OA}\le 30 \ \mu g \ m^{-3}$ . The demarcations were chosen based on the results from Shilling et al. (2009), who observed that particle composition varied with  $C_{OA}$ . Results from experiments where SOA was formed at a high  $C_{OA}$  (>300 µg m<sup>-3</sup>) and then rapidly isothermally diluted to a lower concentration (<30 µg m<sup>-3</sup>) are also reported in Figure 2. Each experiment was individually fit according to Eq. 3, and the best-fit parameters are given in Table S1. The average  $T_{50}$  and  $S_{VFR}$  for each  $C_{OA}$  grouping are given in Table 2.

5 Within each grouping the mass thermograms are all very similar, especially for the low and 6 medium cases. No evaporation is observed at room temperature from vapor stripping in the 7 denuder section for any case. The maximum variability is observed within the high  $C_{OA}$  grouping, 8 although even here the variability is not particularly large, with the average and sample standard 9 deviation  $S_{\rm VFR} = 16.4 \pm 1.5$  and in  $T_{50} = 359 \pm 7$ K. The  $S_{\rm VFR}$ 's for all groupings are statistically 10 indistinguishable, as are the  $T_{50}$  values for the low and medium groupings. However, the  $T_{50}$  for the high  $C_{OA}$  grouping is significantly larger at the p < 0.05 level (p = 0.006 and p= 0.025 as 11 12 compared to the low and medium  $C_{OA}$  groupings, respectively, for a two-tailed test). Visual inspection of Figure 2a indicates that one experiment, with  $C_{OA} = 600 \,\mu \text{g m}^{-3}$ , has a notably larger 13 14  $T_{50}$ . If this experiment is excluded the  $T_{50} = 357 \pm 5$  K, which is still statistically larger than the low  $C_{\text{OA}} T_{50}$  at the p<0.05 level (p = 0.008 for the two-tailed test) but is only now statistically 15 16 larger than the medium  $C_{OA}$   $T_{50}$  at the p<0.10 level (p = 0.079 for the two-tailed test). This 17 difference could be due to small amounts of re-condensation or to saturation of the gas-phase, both 18 of which become a greater concern at high  $C_{OA}$  (Cappa, 2010;Saleh et al., 2011;Cappa and 19 Jimenez, 2010; Fuentes and McFiggans, 2012; Riipinen et al., 2010), although there is no specific 20 dependence of  $T_{50}$  on  $C_{OA}$  within the high  $C_{OA}$  group. Regardless, it is apparent that the effective 21 volatility of the SOA at high  $C_{OA}$  is not higher than at low  $C_{OA}$  and that, despite the slight 22 differences, the response to heating of SOA particles formed from products of the ozonolysis of 23  $\alpha$ -pinene is, to a very large extent, independent of the C<sub>OA</sub> at the point of formation. This then 24 suggests that, from a volatility perspective, the distribution of compounds in the particle is 25 independent of  $C_{OA}$ , which stands in contrast to expectations based on the growth-derived volatility 26 distribution.

The mass thermogram of SOA originally formed at high  $C_{OA}$  and isothermally diluted to low C<sub>OA</sub> was also measured (Figure 2d). Since the evaporation of SOA induced by isothermal dilution occurs very slowly, on the order of many minutes to hours (Grieshop et al., 2007;Saleh et al., 2013), the composition of the diluted SOA is not expected to change substantially from the initial

1 state of formation at high  $C_{OA}$  before the particles enter the TD. The  $T_{50}$  of the SOA formed at high 2  $C_{OA}$  is larger than for the diluted SOA, and significantly different at the p < 0.05 level (p = 0.003) 3 for a two-tailed test), while the average  $S_{VFR}$  of the diluted and the high  $C_{OA}$  grouping mass 4 thermograms are statistically indistinguishable at the p<0.05 level (p = 0.443 for the two-tailed 5 test). This strongly suggests that the difference in  $T_{50}$  of the high  $C_{OA}$  grouping results from 6 re-condensation or saturation of the gas-phase, although the possibility that there is some real 7 difference in the effective volatility of particles after rapid isothermal dilution cannot be excluded. 8 The average diluted SOA mass thermogram is also almost identical to the average low  $C_{OA}$  mass 9 thermogram indicating that the volatility distributions of the compounds in the diluted and low 10 C<sub>OA</sub> cases are the same. Overall, it is evident that the rapid dilution of SOA does not induce changes 11 to molecular composition that significantly influence particle volatility.

#### 12 **3.2 Evaporation Modeling**

# 13 3.2.1 Semi-volatile SOA model

14 The observed similarity between the mass thermograms for the SOA formed at orders of magnitude different  $C_{OA}$  is surprising given that some observations suggest that particle 15 16 composition depends on  $C_{OA}$  (e.g. Shilling et al. (2009)). Since the application of absorptive 17 partitioning theory to the interpretation of SOA growth experiments suggests that the particles are 18 (i) composed of compounds with a large distribution of individual volatilities, typically with  $C^*$ values >  $10^{-1} \mu g m^{-3}$  and (ii) that the fraction of higher volatility compounds should increase with 19 20 increasing  $C_{OA}$ , the mass thermograms are expected to depend on  $C_{OA}$ . Using a volatility 21 distribution for  $\alpha$ -pinene + O<sub>3</sub> SOA derived from SOA formation experiments (Pathak et al., 22 2007), simulated mass thermograms have been calculated as a function of  $C_{OA}$  (for  $\gamma_e = 1$  or 0.001) 23 using the TD model, first assuming that the particles are composed only of monomers (Figure 3). 24 Results from this model will be referred to as semi-volatile monomer results. Specifically, we use the 7-bin volatility distribution with  $\log C^* = [-2, -1, 0, 1, 2, 3, 4]$  and mass yields of  $\alpha = [0.001, 0.012, 0.012]$ 25 0.037, 0.088, 0.099, 0.250, 0.800]. The theoretical mass thermograms, for  $\gamma_e = 1$ , indicate that a 26 27 significant dependence of the mass thermograms on  $C_{OA}$  should have been observed (Figure 3a). Further, they indicate that substantial evaporation of the SOA particles at high  $C_{OA}$  should have 28 been observed at room temperature due to vapor stripping in the charcoal denuder section of the 29 TD, which occurs to some extent for any species with  $C^* \ge -1 \ \mu g \ m^{-3}$  when  $\gamma_e = 1$ . Neither of these 30

phenomena were observed, demonstrating that there is a clear disconnect between typical volatility
 distributions derived from SOA growth experiments and SOA evaporation experiments, as has
 previously been noted (e.g. (Cappa and Jimenez, 2010)).

4 Some measurements of time-dependent evaporation profiles of SOA have been interpreted as 5 suggesting that  $\gamma_e$  is significantly less than unity for  $\alpha$ -pinene + O<sub>3</sub> SOA due to mass transfer 6 limitations in the condensed phase (Grieshop et al., 2007;Saleh et al., 2013;Karnezi et al., 2014). 7 Further, some TD-based SOA studies have used  $\gamma_e$  as a tunable parameter in data fitting for individual experiments and suggest that  $\gamma_e < 1$  (Lee et al., 2011;Lee et al., 2010). Therefore, model 8 9 predictions for  $C_{OA}$  dependent mass thermograms are also reported for  $\gamma_e = 0.001$  (Figure 3b). As 10 expected, the apparent volatility (i.e. extent of evaporation at a given temperature) is decreased 11 compared to the  $\gamma_e = 1$  case, and the simulated thermograms exhibit a greater similarity to the 12 observations. Also, the extent of evaporation at room temperature is substantially lowered and more consistent with the observations, as now only species with  $C^* \ge \sim 1000 \,\mu \text{g m}^{-3}$  will evaporate 13 14 to any substantial extent in the TD due to vapor stripping alone. However, the simulations also 15 indicate a very strong  $C_{OA}$  dependence — higher volatility with higher  $C_{OA}$  — is expected when 16  $\gamma_e = 0.001$ , which is inconsistent with the observations here. This demonstrates that conclusions 17 regarding the magnitude of parameters such as  $\gamma_e$  when derived from single experiments may not 18 provide a robust description of the process in question (here, evaporation) because they are not 19 unique solutions (i.e. are dependent on the other model inputs, namely the assumed  $\Delta H_{vap}$  and 20 volatility distribution). Regardless of assumptions about mass transfer limitations, the model 21 predictions for the mass thermograms of particles comprised entirely of monomers (i.e. based on 22 the Pathak et al. (2007) volatility distribution) unambiguously show a dependence on  $C_{OA}$ . Thus, 23 there is a clear disconnect between volatility distributions derived from SOA growth experiments 24 and observations from SOA evaporation experiments that cannot be entirely explained by kinetic 25 limitations to evaporation.

#### 26 **3.2.1 Dimer-Decomposition Model**

The above discrepancy strongly suggests that the molecular composition of the condensed phase is only indirectly related to the volatilities of the condensing species as determined from growth experiments. Here, the possibility that this discrepancy can be explained through the

formation and subsequent decomposition of dimers (and higher-order oligomers) through 1 2 condensed phase reactions is examined. Cappa and Wilson (2011) demonstrated that, although 3 simple applications of equilibrium absorption partitioning theory can explain SOA growth in laboratory chamber experiments, such models are not unique explanations. In particular, they 4 5 showed it was possible to reconcile SOA growth experiments with the occurrence of condensed-6 phase reactions—even to the extent that the entire particle is rapidly converted from monomers 7 (that retain the volatility of the condensing species) to non-volatile species. There is now a variety 8 of experimental evidence that many types of SOA particles are composed of a large fraction of 9 oligomers (Kourtchev et al., 2014;Putman et al., 2012;Kundu et al., 2012;Gao et al., 2004a;Muller 10 et al., 2009;Kalberer et al., 2004), which will generally have volatilities lower than the monomeric 11 precursors. For the system considered in this study,  $\alpha$ -pinene + O<sub>3</sub> SOA, the oligometric content is 12 suggested to be greater than 50% (Tolocka et al., 2004;Gao et al., 2004a;Gao et al., 2004b;Hall 13 and Johnston, 2012a) and both laboratory (Kristensen et al., 2014) and ambient (Kristensen et al., 2013; Yasmeen et al., 2010) measurements have identified several  $\alpha$ -pinene+O<sub>3</sub> SOA dimers. 14

Simulated mass thermograms have been calculated as a function of  $C_{OA}$  using the modified 15 16 TD model, in which some fraction of the condensed-phase material is assumed to exist as dimers. 17 The same 7 volatility bins were used with the same mass yields as the semi-volatile monomer case 18 to calculate the initial concentration of monomers in the particle. As described above, the 19 equilibrium coefficient,  $K_{eqm}$ , was used to determine the initial monomer/dimer equilibrium while 20 the decomposition rate coefficient,  $k_r$ , and activation energy,  $\Delta E_a$ , describe the rate and sensitivity 21 to temperature changes of dimer thermal decomposition. None of the parameters are known a 22 *priori*. Since there is a relationship between all three parameters ( $K_{eqm} = k_f/k_r$  and  $k_r(T)$  are dependent on  $\Delta E_a$ ) we have taken the approach of specifying different values of  $K_{eqm}$  and then 23 24 fitting the model to the observations by adjusting  $k_r$  and  $\Delta E_a$ . The level of model/measurement 25 agreement for the different  $K_{eqm}$  was then assessed.

The model aerosol used had  $d_p = 90$  nm and  $C_{OA} = 100 \ \mu g \ m^{-3}$  as starting conditions, and was fit to the average mass thermogram of the medium/low  $C_{OA}$  grouping (Figure 4a). Generally good fits were obtained for all  $K_{eqm}$  over the range  $10^{-18}$  to  $10^{-14} \ cm^3$  molecule<sup>-1</sup>, with the overall best agreement obtained for  $K_{eqm} = 10^{-17} \ cm^3$  molecule<sup>-1</sup>, although the differences are quite small (see the *SI* for the best-fit model parameters for each  $K_{eqm}$ ). At smaller  $K_{eqm}$ , extensive room

1 temperature evaporation occurred as a result of the increasing initial fraction of semi-volatile 2 monomers, a result that is inconsistent with the observations. However, even for the simulations 3 at larger  $K_{eqm}$ , some evaporation at room temperature was always predicted. The simulated room 4 temperature evaporation at larger  $K_{eqm}$  may result from the model assumption of liquid-like 5 particles in that if mixing within the particles were slow such that there were a build up at the 6 particle surface of non-volatile dimers then evaporation of monomers that are buried below the surface would be slowed (Roldin et al., 2014). The associated best fit  $k_r(298 \text{ K})$  and  $\Delta E_a$  varied 7 with  $K_{\text{eqm}}$ , from 1.6 x 10<sup>-3</sup> s<sup>-1</sup> to 2.8 x 10<sup>-2</sup> s<sup>-1</sup> and from 15 kJ/mol to 42 kJ/mol, respectively; smaller 8 9  $K_{\text{eqm}}$  values corresponded to larger  $k_{\text{r}}$  and smaller  $\Delta E_{\text{a}}$ .

10 These  $K_{eqm}$  values correspond to a case where the particles are almost entirely composed of dimers, as the dimer fraction is >97% for all  $K_{eqm} > 10^{-18}$  cm<sup>3</sup> molecule<sup>-1</sup>. The range of best-fit  $k_r$ 11 indicate a dimer lifetime of only 1-10 minutes with respect to decomposition at room temperature. 12 The range of  $k_{\rm f}$  values associated with the best fit  $K_{\rm eam}$  and  $k_{\rm r}$  is 1.6 x 10<sup>-21</sup> to 2.8 x 10<sup>-16</sup> cm<sup>3</sup> 13 molecules<sup>-1</sup> s<sup>-1</sup>. Given a typical molecular density of  $\sim 10^{21}$  molecules cm<sup>-3</sup>, the approximate dimer 14 15 formation timescale is only a fraction of a second, consistent with the short reaction time in these 16 experiments. Consequently, the dimer decomposition timescale is not the same as the observable 17 timescale associated with particle mass loss at room temperature upon e.g. isothermal dilution 18 (Grieshop et al. (2007)). However, there are several potential factors that slow down evaporation 19 at room temperature despite the short dimer lifetime with respect to decomposition, as discussed 20 below when isothermal dilution and evaporation is considered. The  $K_{eqm}$ ,  $k_r$ , and  $\Delta E_a$  determined above from fitting the medium/low  $C_{OA}$  data (i.e.  $C_{OA} = 100 \ \mu g \ m^{-3}$ ) have been used to predict 21 additional mass thermograms for  $C_{OA} = 1, 10, 70$  and 600 µg m<sup>-3</sup> (Figure 5a). The predicted mass 22 23 thermograms are mostly independent of  $C_{OA}$ , in contrast with the semi-volatile monomer model. 24 Thus, when the particle is nearly entirely initially dimers this "dimer-decomposition" model result 25 is generally consistent with the experimental observations, where limited differences were 26 observed between the mass thermograms measured at different  $C_{OA}$ , although it should be noted 27 the slight increase in T<sub>50</sub> observed at the highest mass loadings is not reproduced. Also, only the  $C_{\text{OA}} = 1 \,\mu\text{g m}^{-3}$  simulation predicts negligible evaporation at room temperature, as was observed 28 for all  $C_{OA}$ . The dimer-decomposition model also predicts that the observable particle composition 29 should remain relatively constant as evaporation is induced (Figure 6a), consistent with 30

1 observations. This prediction is consistent with previous measurements in which it was observed 2 that the particle composition, as measured using a vacuum ultraviolet aerosol mass spectrometer 3 (VUV-AMS) remained quite constant during the heating induced evaporation of  $\alpha$ -pinene+ O<sub>3</sub> SOA (Cappa and Wilson, 2011). There are several experiments where changes to composition 4 5 were observed. Hall and Johnston (2012b) used an electrospray ionization Fourrier transform ion 6 cyclotron resonance (ESI-FTICR) mass spectrometer to measure the fraction of oligomers in the 7 particle before and after heating (393 K) and found that the fraction of oligomers and the O:C ratio 8 increase after heating. Furthermore, when re-condensation does occur, the compounds that 9 recondensed appear to be monomer decomposition products. Kostenidou et al. (2009) used a quadropole AMS to quantify the mass fraction of m/z 44 fragments as a function of MFR and 10 11 found that the fraction of m/z 44 increased as MFR decreased, indicating more oxygenated 12 particles with heating-induced evaporation. Since the dimer model presented here tracks the 13 relative concentration of dimers and monomers due to decomposition, the most comparable study is Cappa and Wilson (2011) because the measurement technique is one that primarily detects the 14 15 monomer components due, most likely, to thermal degradation during analysis.

16 Trump and Donahue (2014) and Roldin et al. (2014) have previously suggested that accounting for the behavior of dimers within SOA can help to explain observations of SOA evaporation; our 17 18 observations and analysis support and expand upon this conclusion. The range of  $k_{\rm r}$  independently 19 determined here are somewhat larger than the room-temperature  $k_r$  suggested by Trump and Donahue (2014) (= $1.1 \times 10^{-4} \text{ s}^{-1}$ ) and Roldin et al. (2014) (= $2.8 \times 10^{-5} \text{ s}^{-1}$ ), which were based on 20 21 needing an evaporation timescale of ~1 hr for isothermal evaporation (Grieshop et al., 2007; Vaden 22 et al., 2011). Ultimately, reconciliation of the different timescales indicated for dimer 23 decomposition between the different studies likely will require more detailed consideration of the 24 exact nature of various dimer types with respect to their decomposition and formation timescales, 25 which may not all be identical as assumed here, and of the influence of particle phase on evaporation. It should be noted that the  $\Delta E_a$  determined here are substantially smaller than that 26 suggested by Trump and Donahue (2014), who give  $E_{a,r} \sim 80$  kJ mol<sup>-1</sup> (and where, it seems, that 27 their  $E_{a,r}$  is essentially equal to the  $\Delta E_a$  here as they assume that  $k_f$  is T-independent). However, 28 29 this difference can be understood by recognizing that they assumed a constant value for A = 3 x $10^{10}$  s<sup>-1</sup>) and  $k_r(300$  K) and determined  $E_{a,r}$  using the relationship  $k_r(T) = Aexp(-E_{a,r}/RT)$ . Thus, 30

1 underestimations of  $k_r$  may lead them to actually overestimate the true temperature sensitivity of 2 the system.

3 The best-fit  $K_{eqm}$  and  $k_r$  were determined from fitting to T-dependent evaporation experiments 4 that occur over relatively short timescales (~1 min) in the thermodenuder. To facilitate more direct 5 connections with previous experiments that have investigated room temperature evaporation upon dilution, the best-fit dimer-decomposition model for  $K_{eqm} = 10^{-17} \text{ cm}^3$  molecules<sup>-1</sup> has been used 6 7 to simulate the long-time, isothermal, room-temperature evaporation of SOA for the case where 8 the SOA is initially diluted and the evaporating vapors are constantly being stripped from the gas-9 phase (Figure 4b). This corresponds approximately to the conditions in a series of experiments 10 investigating SOA evaporation (Vaden et al., 2011; Wilson et al., 2015). A vapor loss rate constant of  $k_{\text{loss}} = 10^{-3} \text{ s}^{-1}$  has been used, which is a reasonable estimate given the size of the chambers used 11 in the previous experiments (Matsunaga and Ziemann, 2010;Zhang et al., 2014). The initial (pre-12 dilution)  $C_{OA} = 100 \,\mu \text{g m}^{-3}$ , which was diluted by a factor of DF = 30 to induce evaporation. 13

14 The literature experiments have generally shown evidence for evaporation of SOA on fast, 15 medium and slower timescales, where "fast" corresponds to timescales of around a minute, 16 "medium" corresponds to timescales of around 1 hour and "slow" to timescales of many hours. 17 The dimer model simulations for all the  $K_{eam}$  fits exhibit similar behavior, with "fast," "medium" 18 and "slow" periods of mass loss and timescales similar to previous observations. There is a nonmonotonic dependence on  $K_{eqm}$ , with the least mass loss predicted for  $K_{eqm} = 10^{-16} \text{ cm}^3 \text{ molecules}^{-1}$ 19 20 and greater total mass loss predicted for  $K_{eqm}$  both larger and smaller. The behavior results from a 21 balance between the  $k_r$ ,  $k_f$  and evaporation time scales for each  $K_{eqm}$  fit. After 15 h the simulated 22 MFR of SOA is 5-27% of the initial (post-dilution)  $C_{OA}$ . The general model behavior, which 23 indicates that evaporation occurs on multiple timescales, can be understood by recognizing that 24 decomposition of dimers composed of higher  $C^*$  monomers leads to rapid evaporation, such that 25 the observable evaporation rate is controlled by the dimer decomposition. In contrast, 26 decomposition of dimers composed of lower  $C^*$  monomers results in species that do evaporate, 27 but only slowly at room temperature. Given a distribution of monomers with respect to their  $C^*$ , 28 the result is a time-dependent evaporation profile multiple apparent timescales for evaporation. 29 Further, as evaporation proceeds, the finite rate of vapor loss means that over time the gas-phase 30 concentration may build up, which will also limit the rate of mass loss.

1 The simulated MFR values at the end of 15 h of SOA evaporation are somewhat lower than 2 was observed in the literature experiments for dry, fresh SOA from  $\alpha$ -pinene + O<sub>3</sub>, where MFR ~ 3 0.35-0.4 at 15 h (Vaden et al., 2011; Wilson et al., 2015). However, the extent of evaporation is 4 dependent on the model assumptions, specifically the  $k_{loss}$  and DF. Smaller  $k_{loss}$  or DF leads to 5 larger MFR at a given time due to more extensive inhibition of evaporation resulting from faster 6 saturation of the gas-phase (Figure 7a). Conversely, larger  $k_{loss}$  or DF lead to more extensive 7 evaporation. As neither the  $k_{loss}$  nor DF are explicitly known for the literature experiments, a more 8 quantitative comparison is not possible. However, it is nonetheless noteworthy that the model 9 suggests that both  $k_{loss}$  and DF can play a controlling role in observations of isothermal 10 evaporation. These previous isothermal evaporation measurements also indicate that SOA 11 evaporation is mostly size independent, in contrast to evaporation of single-component particles 12 (Vaden et al., 2011; Wilson et al., 2015). Simulations using the dimer-decomposition model with 13 different starting particle sizes show some dependence on particle size ( $d_p = 90$ , 180 and 360 nm), 14 with larger particles having smaller MFRs at a given time (Figure 7a). However, the overall 15 differences are relatively small and reasonably consistent with the observations given that the 16 observations have typically considered a narrower size range than examined here.

17 **3.2** 

#### 3.2.1 Low-volatility SOA Model

18 One alternative possibility to explain the observations of evaporation of SOA in the TD is that 19 the observed heating-induced evaporation results from direct evaporation of low-volatility species. 20 These low-volatility species could be either highly oxygenated monomers (Ehn et al., 2014) or 21 thermally-stable dimers or higher-order oligomers, although the thermal stability of dimers seems 22 unlikely (Hall and Johnston, 2012a). To test this idea, the TD model has been fit to the observations 23 assuming that the particles are only composed of semi- and low-volatility species, but where the volatility distribution is skewed to much lower  $C^*$  than suggested from SOA growth experiments 24 25 (i.e. from the Pathak et al. (2007) volatility distribution). Given that there is negligible evaporation observed at room temperature in the TD for all  $C_{OA}$ , including  $C_{OA} = 1 \,\mu g \, m^{-3}$ , the highest volatility 26 bin was set at  $C^* = 1 \ \mu g \ m^{-3}$ . The lowest value was set based on the requirement that there remains 27 some particle mass at ~343 K. If  $\Delta H_{vap}$  is too large then even very low-volatility compounds will 28 29 not persist to such high temperatures (Cappa and Jimenez, 2010; Cappa, 2010). As such, an upperlimit  $\Delta H_{vap}$  constraint of 185 kJ mol<sup>-1</sup> was placed on the  $C^*/\Delta H_{vap}$  parameterization, and a lower 30

bound  $C^*$  of 10<sup>-9</sup> µg m<sup>-3</sup> was used. Following Cappa and Jimenez (2010), a relationship between 1 the total organic mass and  $C^*$  was assumed, where  $C_{i,tot} = a_1 + a_2 \exp[a_3(\log(C^*) + a_4)]$ . Values of 2 3 the  $a_x$  parameters have been determined through data fitting; it is difficult to constrain the absolute 4  $C_{OA}$  while determining the  $a_x$  parameters through fitting, and thus  $C_{OA}$  was allowed to vary. The 5 model was fit to the average thermogram for the medium/low  $C_{OA}$  grouping, and a good fit was 6 found when the  $a_x = [1.53, 8.5, 0.3, 0.59]$ , with a corresponding  $C_{OA}$  of 71 µg m<sup>-3</sup> (Figure 4a). This 7 demonstrates that an alternative model can potentially be used to explain the TD results, namely 8 one in which the condensed-phase species are very low volatility but evaporate directly in response 9 to heating.

10 If the same  $a_x$  distribution is used, but with  $C_{i,tot}$  scaled up or down to give a different initial 11  $C_{\rm OA}$  (and slightly different distribution of compounds), the simulated volatility decreases slightly 12 as  $C_{OA}$  increases (Figure 5b). This is mostly due to gas-phase saturation at higher concentrations, 13 and subsequently greater re-condensation as the SOA cools in the denuder. Nonetheless, this is 14 opposite the  $C_{OA}$  dependence predicted by the semi-volatile monomer model and is in the same 15 direction of the observations, where the high  $C_{OA}$  grouping exhibited lower apparent volatility. 16 There is, however, some difference in the simulated mass thermograms for low and medium  $C_{OA}$ , which was not observed, although the gap between the low (1-10  $\mu$ g m<sup>-3</sup>) and medium (100  $\mu$ g 17 m<sup>-3</sup>)  $C_{OA}$  simulations is smaller than the gap between the medium and high (600 µg m<sup>-3</sup>)  $C_{OA}$ 18 simulations. If re-condensation of the evaporated species were, for some reason, not particularly 19 20 efficient (due perhaps to changes in the molecular composition upon heating) then the differences 21 between the different  $C_{OA}$  simulations would be lessened.

22 As with the dimer-decomposition model, simulation of isothermal evaporation by the low-23 volatility monomer model provides evidence for multiple evaporation timescales, with "fast," "medium" and "slow" components (Figure 4b). For the same  $k_{loss}$  (= 10<sup>-3</sup> s<sup>-1</sup>) and DF (= 30), the 24 25 extent of evaporation from the low-volatility aerosol simulation at 15 h is less than for the various 26 dimer-decomposition simulations. The low-volatility aerosol model exhibits a similar sensitivity 27 to the assumed  $k_{\text{loss}}$  and DF, and a slightly smaller sensitivity to changes in particle size (Figure 7b). It is apparent that the low-volatility aerosol model is compatible with the observations from 28 29 both our TD and the literature isothermal evaporation experiments (Vaden et al., 2011; Wilson et 30 al., 2015).

1 Although both the low-volatility aerosol and dimer-decomposition models perform equally 2 well in explaining the observed mass thermograms and literature observations of isothermal 3 evaporation, there is a distinct difference between two model results in terms of how the particle 4 composition is predicted to vary with temperature. Unlike the dimer-decomposition model, the 5 predicted relative particle composition undergoes substantial changes as the particles evaporate 6 upon heating for the low-volatility aerosol model (Figure 6b). This model result would suggest 7 that potentially large changes in composition should be observed upon heating or, more 8 generically, evaporation. This prediction is inconsistent with the various observations that suggest 9 negligible to very moderate changes in the observed particle composition (Cappa and Wilson, 10 2011;Kostenidou et al., 2009).

## 11 **3.2.1** Comparison between model results

12 Overall, the dimer-decomposition model of evaporation provides the most comprehensive 13 explanation in that it can explain not only the current results where the observed mass thermograms 14 are nearly independent of  $C_{OA}$ , but also the minor changes in composition that occur upon heating-15 induced evaporation of α-pinene+O<sub>3</sub> SOA observed by some (Cappa and Wilson, 2011), the 16 moderately long timescales required for achieving equilibrium upon isothermal dilution (Grieshop et al., 2007) and the bimodality of SOA evaporation upon rapid dilution and subsequent continuous 17 18 vapor stripping (Vaden et al., 2011). The low-volatility monomer evaporation model can reproduce 19 many of these observations, but suggests large compositional changes upon heating. The semi-20 volatile monomer model fails to reproduce nearly all of the observations. Additionally, the dimer-21 decomposition model is potentially consistent with suggestions that SOA particles formed under 22 dry conditions have very high viscosity (Kannosto et al., 2013; Virtanen et al., 2010; Abramson et 23 al., 2013). The viscosity of SOA should decrease rapidly as temperature increases and, to the extent 24 that SOA might actually be a glass, could go through a glass-liquid transition (Koop et al., 2011). 25 If the particles were primarily semi-volatile monomers for which evaporation were limited by 26 diffusion in the particle phase, then decreases in viscosity should lead to substantial increases in 27 the observed evaporation rate (Zaveri et al., 2014;Roldin et al., 2014). The continuous change in 28 VFR with temperature out to relatively high temperatures suggests that the condensed-phase 29 species must have low-volatility such that as the viscosity decreases there is no substantial impact 30 on the observed particle evaporation. This model/observation comparison suggests that for SOA-

1 at least that produced from the  $\alpha$ -pinene+O<sub>3</sub> reaction—the mass thermogram does not give direct 2 information on the distribution of volatilities of the original condensing compounds (i.e. the 3 monomers), but on the properties of the oligomers, specifically their thermal stability. One 4 limitation of the current kinetic model is the assumption that  $k_r$  and  $\Delta E_a$  are the same for all dimers, 5 whereas it is likely that the rate and temperature-sensitivity of oligomer decomposition is 6 compound specific (Hall and Johnston, 2012b). However, expansion of the model to include such 7 information would only add more tunable parameters, but would not materially influence the 8 conclusions here.

9 Despite the general success of the dimer-decomposition model in reproducing a variety of 10 observations, it does predict some particle evaporation at room temperature in the TD, which was 11 not observed. Further, it seems unlikely that all particle mass is converted to dimers on such rapid 12 timescales as implied by the dimer-decomposition model; although accurate quantification of the 13 relative fractions of dimers (and larger oligomers) versus monomers in SOA particles has proven 14 challenging, it seems likely that the oligomer fraction is not 100% (Hall and Johnston, 15 2012b;Kalberer et al., 2004;Kristensen et al., 2014), some experiments have observed apparent 16 variations in VFR, determined from either heating or vapor stripping, as the particles are "aged" 17 by sitting in the dark (Abramson et al., 2013) or by exposure to oxidants (Kalberer et al., 2004;Salo 18 et al., 2011; Emanuelsson et al., 2013), suggesting that compositional changes (including dimer or 19 oligomer formation) may occur on multiple timescales, ranging from seconds to minutes to hours. 20 It therefore seems likely that a more complete representation of  $\alpha$ -pinene+O<sub>3</sub> SOA volatility is 21 some hybrid of the dimer-decomposition and low-volatility species frameworks, where some 22 substantial fraction of the condensed phase mass exists as very low-volatility, effectively non-23 volatile, dimers or oligomers — or even thermally-unstable, low-volatility monomers — that 24 decompose to produce species with a distribution of volatilities that subsequently evaporate, while some fraction exists as low-volatility ( $C^* < 1 \ \mu g \ m^{-3}$ ) species that can directly evaporate but for 25 26 which the actual volatilities tend to be lower than those predicted from traditional analyses of 27 growth experiments. Regardless of the details, the effective volatility of  $\alpha$ -pinene+O<sub>3</sub> is much less 28 than predicted by growth experiments.

# 29 4 Conclusions

1 Experimental observations of T-dependent SOA evaporation have been presented that 2 demonstrate that the apparent volatility of  $\alpha$ -pinene + O<sub>3</sub> SOA, as characterized by heating in a 3 thermodenuder, is mostly independent of the SOA concentration over many orders of magnitude 4 variation. Comparison of these observations with various kinetic models of evaporation in the TD 5 suggest the observations are most consistent with SOA from the ozonolysis of  $\alpha$ -pinene being 6 composed of a large fraction of effectively non-volatile, but thermally-unstable species; these 7 species are likely dimers or higher order oligomers, but could also be exceptionally low-volatility 8 monomers. Any monomers that do exist must be of sufficiently low volatility ( $< -1 \mu g m^{-3}$ ) that 9 they do not readily evaporate at room temperature. A dimer-decomposition model provided a good fit to the experimental observations when the monomer/dimer equilibrium constant ranged from 10  $K_{\rm eam} \sim 10^{-18}$  to  $10^{-14}$  cm<sup>3</sup> molecule<sup>-1</sup>, with corresponding rate coefficients for the reverse 11 (decomposition) reaction ranging from  $k_r(298K) = 1.6 \times 10^{-3}$  to 2.8 x  $10^{-2}$  s<sup>-1</sup>, and a difference in 12 activation energies between the forward and reverse rate coefficients ranging from  $\Delta E_a = 15$  to 42 13 14 kJ mol<sup>-1</sup>. The best-fit dimer-decomposition model can also explain observations of slow rates of 15 evaporation after isothermal dilution (Vaden et al., 2011; Wilson et al., 2015) and nearly constant 16 composition as a function of rapid heating (Cappa and Wilson, 2011). These parameters would, 17 by themselves, suggest that the SOA particles are nearly entirely composed of dimers, which seems 18 unlikely. A model where the particle was assumed to be composed of low-volatility compounds 19 — either highly oxygenated monomers or oligomers — could explain the bulk evaporation 20 observations nearly as well, although suggested that large changes to particle composition upon 21 heating should be observed. Thus, it seems that a hybrid model where the particles are composed 22 of a substantial fraction of dimers (or oligomers) and some smaller fraction of low-volatility 23 compounds may ultimately provide a more complete description.

24 Many laboratory (Cappa and Wilson, 2011; Emanuelsson et al., 2013; Loza et al., 25 2013; Grieshop et al., 2007; Saleh et al., 2013) and field studies (Cappa and Jimenez, 2010) have 26 aimed to characterize the volatility of SOA. In general, the observations have concluded that the 27 effective volatility of SOA is much lower than the volatility determined from interpretation of 28 formation studies within a gas/particle partitioning framework. The analysis presented here 29 suggests that this apparent discrepancy can be reconciled to a large extent through a combined 30 framework in which the volatility distributions derived from growth experiments (i.e. (Pathak et 31 al., 2007)) provides a reasonable description of the properties of the condensing monomers, but

1 where rapid formation of thermally-unstable dimers (and higher order oligomers) occurs, which 2 consequently suppresses the apparent volatility of the SOA. Since the residence time in our 3 flowtube was  $\sim 1$  minute, these accretion reactions must occur on a similar timescale (or faster). 4 This dimer formation timescale is much faster than what is typically used within air quality models 5 (Carlton et al., 2010), which assume timescales on the order of a day, and suggests that air quality 6 models may therefore have SOA that is too volatile and thus overly sensitive to dilution. However, 7 care must be taken in the implementation of any model that allows for such rapid formation of 8 dimers, as the ultimate consequence would be to transfer all semi-volatile material to the 9 condensed phase. One possible reconciliation is that SOA particles may actually have a very high viscosity (which is, perhaps, a consequence of oligomer formation), which can limit the transport 10 11 of gas-phase material into the particle bulk and the timescale and extent of transfer of gas-phase 12 material into the particles (Zaveri et al., 2014). Although the oligomeric content of ambient 13 biogenic SOA may be less than in laboratory biogenic SOA (Kourtchev et al., 2014) the presence of oligomers has been observed in both and needs to be accounted for in models of SOA volatility. 14

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# 16 Author Contribution

K.R. Kolesar and C.D. Cappa designed the experiments and D. Johnson carried them out. C.
Chen characterized the temperature profile in the thermodenuder. C.D. Cappa and K.R. Kolesar
modified the kinetic model of evaporation from Cappa (2010) and performed the simulations. K.R.
Kolesar and C.D. Cappa prepared the manuscript.

21

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<b>D</b> •	T-1 (	T 1 1 0	C C	•		1
Experiment	Flowrate	Initial COA	$C_{OA}$ after	$\alpha$ -pinene	Uzone	<i>d</i> <sub>p,V,bypass</sub>
Date	(lpm)	$(\mu g m^{-3})$	dilution	$(\mu L hr^{-1})$	(ppm)	(nm)
			$(\mu g m^{-3})$			
90512	0.79	1	n/a	0.12	4.9	37
82912	0.8	9	n/a	0.12	7.8	39
101912	0.8	30	n/a	0.6	8.8	52
41114	0.82	90	n/a	0.15	38.7	48
90712	0.81	150	n/a	0.3	6.8	61
91312	0.8	180	n/a	0.2	^	57
40914	0.82	200	n/a	$0.23^{*}$	63	57
91212	0.8	400	n/a	0.5	^	73
101612	0.8	450	n/a	0.6	8.8	83
101712	0.8	500	n/a	0.6	8.8	88
091112	0.8	600	n/a	0.38	23.4	76
101812	0.83	800	n/a	0.6	8.8	97
101212	0.83	380	5	0.6	8.8	73
100912	1.02	380	6	0.7	9.8	71
101112	0.79	430	7	0.5	9.7	73
101012	0.8	450	10	0.5	8.8	77
83112	0.8	600	14	0.5	29.3	76
92412	0.76	650	23	0.5	9.7	90
100412	1.04	450	23	0.5	8.8	68
	•					

**Table 1.** Experimental conditions for  $\alpha$ -pinene + O<sub>3</sub> SOA generation for the various experiments. 

\* The flowrate of  $N_2$  over the  $\alpha$ -pinene syringe was 0.015 lpm for all experiments except this one, for which it was 0.074 lpm. ^ Unknown

Mass Loading Range $(u_2, m^{-3})$	$S_{VFR} \pm \sigma_e^{\#}$	$T_{50} \pm \sigma_e$	# of
(µg m <sup>+</sup> )		(K)	Samples
Diluted (<23)	$-15.9 \pm 1.6$	$346 \pm 7$	7
Low (≤30)	$-16.6 \pm 1.9$	$345 \pm 5$	3
Medium (90 < $C_{OA}$ < 200)	-15.7 ± 1.6	$347 \pm 6$	4
High (>300)	$-16.4 \pm 1.5$	$359 \pm 7$	5

**Table 2.** The average fit parameters for each  $C_{OA}$  grouping of mass thermograms.

 $\sigma_{e}$  is the greater of the propagation of error from the individual fits and the sample standard deviation.





Figure 1. An example of the particle volume weighted size distributions observed as a function of

- 6 TD temperature from one experiment. The temperatures range from room temperature (296 K, light blue) to 453 K (purple). This experiment had a bypass  $C_{OA} = 9\mu g \text{ m}^{-3}$  and  $d_{p,V,bypass} = 39 \text{ nm}$ .



**Figure 2.** Mass thermograms measured for each of the experiments (symbols). Results are grouped according to the bypass mass loading as (a) high ( $C_{OA} > 300 \ \mu g \ m^{-3}$ ), (b) medium ( $90 \le C_{OA} < 300 \ \mu g \ m^{-3}$ ), and (c) low loading ( $C_{OA} \le 30 \ \mu g \ m^{-3}$ ). Results from isothermal dilution experiments are shown in (d), where the initial number is the  $C_{OA}$  before dilution and the number in parentheses that after dilution. Traces represent the fit of Eq. 2 to each experiment.



1

Figure 3. Model predictions for the mass thermograms of α-pinene+O<sub>3</sub> SOA using the semivolatile monomer TD model where the initial model  $C_{OA}$  was 650 µg m<sup>-3</sup> (black, short dash), 100 µg m<sup>-3</sup> (red, long dash), 10 µg m<sup>-3</sup> (green, solid) or 1 µg m<sup>-3</sup> (blue, dot-dash) for evaporation coefficients,  $\gamma_e$ , equal to (a) 1 and (b) 0.001. Neither set of predictions agree well with the observed mass thermogram for medium/low  $C_{OA}$  (black line with black •).







4 Figure 4. (a) Comparison between observed medium/low  $C_{OA}$  grouping (black •) and best-fit 5 calculated mass thermograms for the TD model that includes dimer decomposition and for the 6 low-volatility compound model. For the dimer-decomposition model, the concentration of dimers 7 is much greater than the concentration of monomers. (b) Simulated isothermal, room temperature 8 evaporation based on the best-fit model parameters determined in (a). The initial SOA concentration was 100 µg m<sup>-3</sup>, which was diluted by a factor of 30 and evaporated vapors were 9 lost to the simulated chamber walls with a rate coefficient of  $10^{-3}$  s<sup>-1</sup>. The grey crosses (+) in panel 10 b are the experimental data from the isothermal dilution of  $\alpha$ -pinene+O<sub>3</sub> SOA ( $d_p$  = 160 nm) from 11 12 Vaden et al. (2011).





Figure 5. (a) Calculated mass thermograms for variable  $C_{OA}$  based on the best-fit parameters for the  $K_{eqm} = 10^{-16}$  cm<sup>3</sup> molecules<sup>-1</sup> dimer-decomposition model as compared to the observations for the average medium/low and high  $C_{OA}$ . (b) Same as (a), but for the best-fit low-volatility model.





**Figure 6.** Variation in the relative particle composition with temperature from the (a) dimerdecomposition and (b) low-volatility monomer evaporation TD models. The colors correspond to the various dimer and monomer species, defined by the monomer  $C^*$  values. For the dimerdecomposition model the monomer fractional contributions are too small to be seen, and the reported  $C^*$  values in the legend correspond to the parent monomer values associated with each dimer. For the low-volatility monomer case, the  $C^*$  values correspond to the actual evaporating monomer values. The simulations were run for an initial  $C_{OA} = 100 \,\mu g \,m^{-3}$ .





**Figure 7.** Dependence of the isothermal evaporation simulations on the assumed vapor loss rate  $(k_{\text{loss}})$ , dilution factor (*DF*) or particle diameter ( $d_p$ ) for (a) the dimer-decomposition and (b) the low-volatility models. All simulations were run for an initial  $C_{\text{OA}} = 100 \,\mu\text{g m}^{-3}$ . For the dimer-decomposition model, the  $K_{\text{eqm}} = 10^{-16} \,\text{cm}^3$  molecules<sup>-1</sup> best-fit results were used.