Atmos. Chem. Phys. Discuss., 10, 17435–17466, 2010 www.atmos-chem-phys-discuss.net/10/17435/2010/ doi:10.5194/acpd-10-17435-2010 © Author(s) 2010. CC Attribution 3.0 License.



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

Measurement of the ambient organic aerosol volatility distribution: application during the Finokalia Aerosol Measurement Experiment (FAME-2008)

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Received: 16 June 2010 - Accepted: 5 July 2010 - Published: 20 July 2010

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





Abstract

A variable residence time thermodenuder (TD) was combined with an Aerodyne Aerosol Mass Spectrometer (AMS) and a Scanning Mobility Particle Sizer (SMPS) to measure the volatility distribution of aged organic aerosol in the Eastern Mediterranean

during the Finokalia Aerosol Measurement Experiment in May of 2008 (FAME-2008). 5 A new method for the quantification of the organic aerosol volatility distribution was developed combining measurements of all three instruments together with an aerosol dynamics model.

Challenges in the interpretation of ambient thermodenuder-AMS measurements include the potential resistances to mass transfer during particle evaporation, the effects 10 of particle size on the evaporated mass fraction, the changes in the AMS collection efficiency and particle density as the particles evaporate partially in the TD, and finally potential losses inside the TD. Our proposed measurement and data analysis method accounts for all of these problems combining the AMS and SMPS measurements.

The AMS collection efficiency of the aerosol that passed through the TD was found 15 to be approximately 10% lower than the collection efficiency of the aerosol that passed through the bypass. The organic aerosol measured at Finokalia is approximately 2 orders of magnitude less volatile than fresh laboratory-generated biogenic secondary organic aerosol. This low volatility is consistent with its highly oxygenated AMS mass spectrum. The results are found to be highly sensitive to the mass accommodation 20 coefficient of the evaporating species.

Introduction 1

Atmospheric particulate matter contains a variety of both inorganic and organic compounds. Organic compounds often are the major fraction of fine particulate matter, contributing 20-90% to its mass depending on the location and season (Kanakidou et al., 2005). Organic aerosol is either emitted directly (primary organic aerosol, POA)





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or formed in the atmosphere by condensation of low vapor pressure products of the oxidation of volatile organic compounds (VOCs) (secondary organic aerosol, SOA). Since the oxidation pathways for VOCs are complex and the reactions lead to several sets of oxygenated products, our understanding of organic aerosol formation mech-

- anisms and their chemical and physical properties is still incomplete. The volatility of atmospheric organic aerosol (OA) is one of its most important physical properties determining its ambient concentration. The OA volatility distribution provides indirect information about its chemical composition and can reflect its origin and history in the atmosphere (Jonsson et al., 2007).
- ¹⁰ Volatility measurements have been performed for over four decades. The general method for volatility measurement is to pass the aerosol through a heated tube in which the more volatile components evaporate leaving less volatile components behind in the particulate phase to be detected and analyzed by various instruments downstream of the heated flow tube. For example, Pinnick et al. (1987) used a light scattering aerosol
- ¹⁵ counter downstream of a fused-quartz tube wrapped with a nichrome ribbon heating element to gain information about the composition of ambient aerosol at a rural site in southern New Mexico. Clarke (1991) used six heated tubes in front of differential mobility analyzer (DMA) and a laser optical particle counter to obtain size dependent measurement of aerosol volatility. Burtscher et al. (2001) improved the simple heated
- tube method by developing a thermodenuder (TD) which is a heated flow tube followed by an adsorption/cooling section in which gases are removed by adsorption onto activated charcoal to avoid potential recondensation. Wehner et al. (2002) improved the design further by improving the homogeneity of the temperature profile and increasing the residence time in the heating section. Numerous TDs have been designed and
- ²⁵ built upon the ideas of Burtscher et al. (2001) and Wehner et al. (2002); however the operating characteristics of existing TD systems vary dramatically from instrument to instrument. For example, the reported average residence time in the heated zone of the thermodenuder is as small as 0.57 s in Jonsson et al. (2007) and as large as 53 s in Lee et al. (2010). An et al. (2007) investigated effects of residence times on the





aerosol volatility and suggested that TDs need to be operated at a range of residence times due to the potential resistances to mass transfer from the particulate to the gas phase.

- Volatility measurements of organic aerosol have received considerable attention recently and have been carried out both in the field (Engler et al., 2007; Huffman et al., 2009) and in the laboratory (An et al., 2007; Jonsson et al., 2007; Faulhaber et al., 2009). Lee et al. (2010) used an aerosol dynamics model based on the volatility basis set (VBS) approach (Donahue et al., 2006) and SOA yield parameters derived from smog chamber studies to show that, due to mass transfer resistances in the particulate phase or at the interface, an effective accommodation coefficient of 0.05 was needed for the description of at least the early stage of the evaporation. Using the model, they suggested that particles do not reach equilibrium with the surrounding gas phase even after 16 s. Riipinen et al. (2010) have estimated that ambient aerosol almost never reaches equilibrium inside TDs, and therefore TDs provide information on the evaporation.
- of OA from the TD measurements requires use of mass transfer models that can account for the effects of particle size, concentration and mass transfer resistances.

Recently, TD systems have been combined with Aerosol Mass Spectrometers (AMSs) (Jayne et al., 2000; Jimenez et al., 2003; DeCarlo et al., 2006) to obtain information about the relationships between the aerosol composition and its volatility

- formation about the relationships between the aerosol composition and its volatility (Faulhaber et al., 2009; Grieshop et al., 2009; Huffman et al., 2009; Kostenidou et al., 2009). The challenges in the interpretation of ambient TD-AMS measurements, which include the potential resistances to mass transfer during particle evaporation, the role of particle size, the changes in the AMS collection efficiency and particle density as the
- particles evaporate partially during heating, and finally potential losses inside the thermodenuder, have not been fully addressed. Due to these challenges and the lack of the corresponding theoretical analysis, comparisons of the findings of different studies are difficult.





In this study, a variable residence time thermodenuder, a Quadruple-AMS and a Scanning Mobility Particle Sizer (SMPS), were combined to investigate the volatility of organic aerosol in the Eastern Mediterranean during the Finokalia Aerosol Measurement Experiment – 2008 (FAME-2008). A new data analysis method, which addresses the challenges of ambient TD-AMS measurements, is applied for the quantification of the organic aerosol volatility distribution.

2 Methods

2.1 Field operation of thermodenuder-AMS system

Aerosol volatility measurements were made using a thermodenuder-AMS system in the May 2008 EUCAARI (European Integrated Project on Aerosol Cloud Climate Air Quality Interactions) intensive campaign (Kulmala et al., 2009). The measurements took place during 8 May–9 June 2008 at a remote sampling site close to Finokalia in Crete, Greece. There were no local sources close-by, allowing the study of aged organic aerosol from different source regions (Pikridas et al., 2010).

- The thermodenuder (TD) used is based on the design of Wehner et al. (2002) and An et al. (2007). It consists of two parts; a heating section followed by organic vapor adsorption and cooling section. The heating section consists of two concentric stainless steel tubes, 55 cm in length, wrapped in a heating tape (OMEGALUX, HTWC 102-010). The aerosol flows through the inner tube (3.5 cm ID), and fine sand occupied
- the space between the outer (6 cm ID) and the inner tube to retain a uniform internal temperature profile. The outer tube is wrapped in the heating tape with a percentage controller which semi-automatically controls temperature in the heating tube. The TD temperature remains stable within 1 °C for several hours at various flow rates and temperature up to 250 °C. The temperature profile was measured with a 60 cm long the measured (OMECAC) AD KOVI (107).
- thermocouple (OMEGACLAD, KQXL-18E) positioned in the center of the heating tube in the direction of the flow at flow rates of 1.15 and 0.15 L min⁻¹, which were used in FAME-2008 (Fig. 1). At flow rates of 1.15 L min⁻¹ and 0.15 L min⁻¹, the corresponding





centerline residence times of the aerosol in the heating section are 14 s and 105 s, respectively. As shown on Fig. 1, the temperature increases relatively slowly at the entrance of the heating tube and reaches the maximum temperature at around 25 cm from the entrance staying within ± 3 °C of this value before falling near the exit, 50 cm from the entrance, of the heating tube. This maximum temperature will be referenced

for each measurement and the measured temperature profile will be used for the analysis.

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The adsorption/cooling section, 45 cm in length, has a tubular mesh (3.5 cm ID) inside the stainless steel tube (6.5 cm ID) to hold activated carbon (Fisher Scientific, 6–14 Mesh). The connection, a 3.5 cm ID stainless steel tube, between the heating and adsorption/cooling section is insulated by fiberglass in order to prevent potential re-condensation due to cooling.

A Quadrupole Aerodyne Aerosol Mass Spectrometer and a Scanning Mobility Particle Sizer (SMPS, TSI 3936), placed downstream of the thermodenuder, were combined to investigate the volatility of organic aerosol during FAME-2008. During ambient aerosol compliant particular particular through the thermodenuder or the

- ent aerosol sampling, particles passed alternatively through the thermodenuder or the bypass line (0.25 inch, copper tube). The aerosol flow direction was controlled by three-way solenoid valves (Alcon, U33-42-21-12). The valves were automatically switched using Labview and FieldPoint units (National Instruments, FP-1000, FP-RLY-422, and
- FP-TC-120). Switching between the ambient and thermodenuded measurements occurred every 12 min. Particles exiting or bypassing the thermodenuder were split into two streams; one entering the SMPS, the other going to the AMS for real-time size and composition measurements at various temperatures. The comprehensive analysis of AMS spectra is presented by Hildebrandt et al. (2010). Three thermocouples (OMEGA-
- ²⁵ CLAD, KTSS-HH) were used to measure centerline temperatures in the middle of heating section (T_1), at the exit of heating section (T_2), and at the exit of adsorption/cooling section (T_3). Temperatures reported in this paper are the centerline temperatures in the middle of heating section (T_1) corresponding to the maximum temperature mentioned above.





2.2 Thermodenuder-AMS data analysis

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The analysis of ambient thermodenuder-AMS measurements is complicated by potential changes in the AMS collection efficiency and organic aerosol density as particles partially evaporate upon heating in the TD, particle losses within the TD, and the potential resistances to mass transfer during particle evaporation. Here we propose a data analysis method for ambient thermodenuder-AMS data accounting for all of these problems.

2.2.1 Collection efficiency and organic density

The AMS does not always measure the whole aerosol sample due to the partial trans mission of particles, bouncing of less "sticky" particles on the vaporizer, and to a lesser extent shape-related collection losses at the vaporizer (Slowik et al., 2004; Huffman et al., 2005; Canagaratna et al., 2006; Matthew et al., 2008). Thus, the overall collection efficiency (CE) depends on the aerosol composition, morphology, shape and size. The CE values may also change after partial evaporation of particles in the TD. This
 may be due to different behavior in the AMS vaporizer of particles with less-volatile compounds, or changes in particle shape, or combination of these. Another parameter that may change upon heating, evaporation of the more volatile OA components, and subsequent cooling is the organic aerosol density.

The AMS-SMPS measurement matching algorithm of Kostenidou et al. (2007) is used to calculate the CE of the AMS and the organic density for both the ambient and thermodenuded aerosol as a function of time for the full study. The approach combines the mass distributions from the AMS and the volume distributions provided by the SMPS. The aerosol water content during the FAME-2008 measurements varied from 0–20% of the total mass (the particles were not dried before sampling) and was included in the algorithm. The total density for the algorithm is given by:

 $\rho = x_{a/s}\rho_{a/s} + x_{org}\rho_{org} + x_w\rho_w$



(1)

where $x_{a/s}$ is the mass fraction of the ammonium sulfate, x_{org} is the mass fraction of the organics, x_w is the mass fraction of the water, $\rho_{a/s}$ is the density of the ammonium sulfate (1.77 g cm⁻³), $\rho_{\rm org}$ is the unknown organic density and $\rho_{\rm w}$ is the water density $(1.0 \,\mathrm{g}\,\mathrm{cm}^{-3})$. The AMS nitrate concentration was only about 1% of the total aerosol mass measured by the AMS during FAME-2008 and is not included in the analysis. 5 The contribution of sea-salt and dust in the size range used by the algorithm (less than 500 nm) was negligible (Pikridas et al., 2010). The method takes into account that the particles have a size-dependent density but assumes that OA density is size independent. The matching algorithm matches the AMS mass distribution and the SMPS volume distribution using the OA density and collection efficiency as fitting parameters. 10 The best fit is selected using the minimum error score (Kostenidou et al., 2007) resulting in estimates of these two parameters and their corresponding uncertainty range. Using the optimization algorithm of Kostenidou et al. (2007) the collection efficiency of the AMS (Fig. 2) and the organic density for the ambient and thermodenuded samples for the FAME-2008 periods were calculated. The calculated average collection ef-15 ficiency of AMS for the denuded and ambient samples are 0.76 ± 0.09 and 0.85 ± 0.08

respectively. The AMS collection efficiency is found to be approximately 10% lower for the aerosol that passes through the TD. This may be due to the increase in the less sticky, less volatile compounds in the aerosol as more volatile compounds are vapor-

²⁰ ized in the TD. After application of this collection efficiency, the AMS sulfate concentration agreed well ($R^2 = 0.95$) with concentrations measured independently by PM_{1.3} filters (Hildebrandt et al., 2010) during the full duration of the study. This agreement increases our confidence in the estimated CE values.

For FAME-2008, the average organic aerosol densities for the thermodenuded and ambient aerosol are $1.27 \pm 0.28 \text{ g cm}^{-3}$ and $1.35 \pm 0.22 \text{ g cm}^{-3}$ respectively. This value is in agreement with the ambient OA density determined by Cross et al. (2007). The variability of the estimated density is in general higher than that of collection efficiency. Part of this variability is probably due to the higher uncertainty of the estimated density given the relatively low contribution of OA (a little less than 30% on average) to





the submicrometer PM during FAME-08. Part of it may also be due to changes in the morphology of the OA during the study including its partial dissolution in the aqueous phase and a corresponding change of its density. To test the robustness of the calculated CE we repeated the optimization assuming a constant density of $1.3 \,\mathrm{g\,cm^{-3}}$

- for the OA during the whole campaign. The average calculated CE for this case was within 1% of the values calculated based on the variable density. The calculated collection efficiency was also not sensitive to potential differences in the water content of the aerosol measured by the AMS and the SMPS. As a sensitivity test we assumed that half of the aerosol water evaporated inside the AMS inlet system (Zelenyuk et al.,
- ¹⁰ 2006). Repeating the optimization with this assumption resulted in changes of the CE by less than 5% suggesting once more that the estimated CE values are quite robust.

2.2.2 Particle losses inside the thermodenuder

Particle losses inside the TD are caused by a combination of sedimentation, diffusion and thermophoresis. Losses due to sedimentation increase with increasing particle size, diffusive losses increase as particle size decreases, and losses due to thermophoresis are weakly size dependent (Burtscher et al., 2001). For FAME-2008, the total losses in the thermodenuder are determined by comparing the SMPS number distributions of the ambient and heated samples. The size distribution during FAME-2008 was that of aged continental aerosol with relatively few particles smaller than 50 nm (Dikrides et al., 2010). With the execution of aix nucleation execute that losted entry on

- (Pikridas et al., 2010). With the exception of six nucleation events that lasted only an hour to two each during the month of the measurements, the distribution was quite stable. This stability resulted in constant number losses in the TD, approximately 15% of the total (Fig. 3). These losses are comparable with losses in other TDs reported by Wehner et al. (2002) and Huffman et al. (2008).
- Since sedimentation, diffusional, and thermophoretic processes are size- and temperature-dependent, the total mass losses may be size and temperature dependent. We explored these dependencies by plotting the losses as a function of the particle fraction smaller than 0.1 μ m and also as a function of temperature (not shown). The





losses were not strongly size-dependent but more strongly temperature-dependent. Based on these results we assumed that the losses are size independent but are different for each sample and temperature. Therefore, we assume that a size-independent correction factor that is determined for each sample (every 24 min) is sufficient for this dataset. The error introduced by this simplification is examined in the next section.

2.2.3 Algorithm consistency check

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Since the aerosol volatility measurement combines the AMS, which provides a mass distribution as a function of aerodynamic diameter, and the SMPS, which measures a number distribution as a function of a mobility diameter, a consistency check between the AMS and SMPS are be made accounting for estimated lagges inside the thermal

the AMS and SMPS can be made accounting for estimated losses inside the thermodenuder and the calculated changes in organic aerosol density and the AMS collection efficiency. The check is made by calculating the evaporated SMPS number and volume distributions from the corresponding ambient measurements and then comparing them with the SMPS measurements after the thermodenuder. This procedure uses the measured OA mass distribution by the AMS, the aerosol composition measured also by the AMS, and the estimated number losses, OA density, and collection efficiency.

The aerosol volume fraction remaining (VFR) after heating, correcting for the TD losses, varying CE and density, is estimated based on the AMS measurements as:

$$VFR = \left[\frac{\frac{[OA]_{TD}}{\rho_{org_TD}} + [Sulfates]_{TD}}{\frac{[OA]_{amb}}{\rho_{org_amb}} + [Sulfates]_{amb}}{\rho_{a/s}} + [Water]_{amb}} - \frac{CE_{amb}}{CE_{TD}} \cdot \frac{1}{1 - f_N}\right]$$
(2)

²⁰ where subscript TD represents a sample that passes through the TD, subscript amb represents a sample that bypasses the TD (i.e. ambient sample), [OA] is the mass concentration of organic aerosol, [Sulfates] is the mass concentration of ammonium sulfate or bisulfate, [Water] is the mass concentrations of water, $\rho_{a/s}$ is the density of the ammonium sulfate, ρ_w is the water density, ρ_{org} is the OA density estimated by



the optimization algorithm of Kostenidou et al. (2007) (Fig. 3), CE_{amb} is the collection efficiency of AMS for the ambient sample, CE_{TD} is the CE for the thermodenuded sample, and f_N is the fraction of particle number losses in the TD, calculated based on the SMPS number distributions of the ambient and heated samples. The concentrations of other PM₁ components (nitrates, chloride, EC) were very small during FAME-2008 (Pikridas et al., 2010) and are not included in this ratio. From Eq. (2), the diameter of an evaporated particle, $D_{p,TD}$ is given by:

 $D_{p,TD} = D_{p,amb} (VFR)^{\frac{1}{3}}$

where $D_{p,amb}$ is the diameter of the ambient (bypassed) aerosol. Then the estimated evaporated number distribution after the TD, $n_n(D_{p,TD})$, is given by:

$$n_{\rm n}(D_{\rm p,TD}) = n_{\rm n}(D_{\rm p,amb}) \cdot ({}^{dD}_{\rm p,amb}/{}_{dD_{\rm p,TD}}) \cdot (1 - f_N)$$

$$\tag{4}$$

where $n_n(D_{p,amb})$ is the ambient number distribution from the SMPS. Likewise the estimated evaporated volume distribution, $n_v(D_{p,TD})$, can be represented as:

$$n_{\rm v}(D_{\rm p,TD}) = n_{\rm v}(D_{\rm p,amb}) \cdot \left(\frac{dD_{\rm p,amb}}{dD_{\rm p,TD}}\right) \cdot \left(1 - f_N\right)$$
(5)

where $n_v(D_{p,amb})$ is the ambient volume distribution from the SMPS.

The estimated evaporated number and volume distributions (Eqs. 4 and 5) were compared with the actual thermodenuded number and volume distributions, respectively, for consistency in our analysis algorithm and the corresponding AMS and SMPS measurements. Typical results are shown in Figs. 4 and 5. The predicted evaporated distributions are in agreement with the actual thermodenuded distributions for all particle diameters. This confirms that (1) the losses were not strongly size-dependent for this dataset, (2) the method for the post-correction for the losses inside the TD and the changes in the AMS CE and organic aerosol density during heating is reasonable, (3) the measurements from the AMS and SMPS are consistent with each other and or-

²⁵ ganic information from the AMS can be used to estimate the actual evaporated fraction of organic aerosol as a function time and temperature for the FAME-2008 period.



(3)



2.2.4 Multi-component organic aerosol evaporation model

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In the last step of the analysis, a mass transfer model (Lee et al., 2010; Riipinen et al., 2010) is used to simulate the time-dependent evaporation of the aerosol in the thermodenuder. The model is based on the volatility basis set approach, where effective saturation concentrations are predetermined using a lognormally spaced fixed basis set (Donahue et al., 2006), and it assumes that organic vapors in are in equilibrium with the aerosol phase at the entrance of the TD. The temperature profile in the heating section is simulated based on piecewise polynomial fits to the measured temperature profile in the heating section for the flow rates used in the study (Fig. 1).

- ¹⁰ Besides the volatility distribution, also other properties particularly the vaporization enthalpies and mass accommodation coefficients – of the aerosol constituents affect their evaporation in the TD. An effective vaporization enthalpy of 80 kJ mol⁻¹ is used for the aerosol as a base case, which is not far from the Saathoff et al. (2009) estimate for the less volatile α -pinene SOA components. The effective mass accommodation coef-
- ficient is chosen to be 0.05, consistent with the TD results by Lee et al. (2010) for biogenic SOA evaporation. There is no quantitative information about the accommodation coefficients of organic aerosol constituents available in the current literature (Kulmala and Wanger, 2001; Kolb et al., 2010) however the possibility of low accommodation coefficients of organic aerosol have been found (Grieshop et al., 2007; Lee et al.,
- 20 2010). The corresponding average volatility distribution of the ambient organic aerosol is then estimated by letting the volatility distribution vary and minimizing the sum of the squared differences between the MFR model predictions and the thermodenuder measurements. The aerosol was approximated with a monodisperse aerosol with a diameter of 300 nm, the median diameter of the average volume distribution during EAME 2009 (Dibridge et al. 2010). Use of the full distribution resulted in differences.
- ²⁵ FAME-2008 (Pikridas et al., 2010). Use of the full distribution resulted in differences in evaporated mass fraction of only a few percent but increased the optimization time considerably.





3 Results and discussion

3.1 Volatility of organic aerosol

For FAME-2008 data, 24 min averaged values of CE and particle losses inside the TD are used for the post-correction. Figure 6 shows the effect of making these corrections

on the estimated organic mass fraction of organic aerosol remaining after the TD. The thermogram, a plot of the organic mass fraction remaining (MFR) after heating as a function of TD temperature, shows that the particle losses inside the TD and the changes in the AMS CE during heating result in approximately 20% underestimation of the MFR. The differences between the corrected and uncorrected data are greater at higher temperature (around 30% differences in MFR) since the particle losses inside the TD are greater at higher temperature.

The ambient aerosol during FAME-2008 was much less volatile than fresh laboratory-generated α -pinene SOA (generated in the same manner as Lee et al., 2010) of the same average size (Fig. 6). This is due to the fact that the ambient aerosol

- ¹⁵ during FAME-2008 was highly oxidized as suggested by its organic mass spectrum (Hildebrandt et al., 2010) due to the strong oxidizing conditions and remote sampling site without local sources (Pikridas et al., 2010). More detailed analyses of the AMS spectra from the ambient measurements are presented elsewhere (Hildebrandt et al., 2010). Approximately 70% of the OA evaporated at 150°C for a residence time of
- 14 s. The evaporated fraction increased to 80% at this temperature after 105 s in the heating zone. This suggests that most of the OA even after significant aging in the atmosphere appears to be semivolatile in the TD operating at 150 °C. The mass spectra of the ambient OA and the OA left after passing through the TD were surprisingly similar (Hildebrandt et al., 2010).





3.2 OA volatility distribution

Three different sets of four logarithmically-based volatility bins were used in the simulations: one ranging from effective saturation concentration at 298 K of 0.001 to $1 \,\mu g \,m^{-3}$, one from 0.01 to $10 \,\mu g \,m^{-3}$, and one from 0.1 to $100 \,\mu g \,m^{-3}$. The MATLAB least-

- ⁵ squares fitting algorithm *lsqcurvefit* was used to obtain the best possible fit between the measured and modeled MFRs. To obtain the best fit, first the appropriate volatility basis set bins were chosen based on two-parameter fits to the measured MFR vs. temperature data, where lower and upper limits of the volatilities were defined. Then the initial aerosol mass fractions of each of the bins in the chosen volatility basis set were
- varied. The MFR data set was averaged over each 2°C range to reduce the computational burden of the fitting procedure. The measurement points corresponding to both residence times (14 and 105 s) were given the same statistical weight in the fits. This was achieved by duplicating the data points in the 105 s data set to yield the same number of data points as in the 14 s data set.
- ¹⁵ The aerosol mass fractions corresponding to the best fit in the base case runs are given in Table 1. These results suggest that 70% of the OA had effective saturation concentrations of $1 \,\mu g \, m^{-3}$ or less at 298 K. The observations can be explained with all the OA being semivolatile (C* $\geq 10^{-2} \,\mu g \, m^{-3}$). The measurement data for the two residence times and the modeled MFR are illustrated in Fig. 7.
- The sensitivity of the results was tested by letting the mass fraction vary by ± 0.1 in one volatility bin at a time from the best fit value reported in Table 1. Since the mass fractions need to sum to unity, the variation in one bin was compensated in a corresponding opposite variation in one of the other bins, thus resulting in 12 separate sensitivity runs for the 4-bin basis set. The dark shaded areas in Fig. 7 represent the
- ²⁵ minimum variation as compared to the optimum solution and correspond to the cases where the 0.1 variation was exchanged between the two least volatile bins, keeping the higher volatility bins unchanged. The maximum sensitivity was expectedly observed for the cases where the variation was introduced in the least and most volatile bins. The





sensitivity studies suggest that it is difficult to separate the exact distribution in the two least volatile of the bins. However, it can be concluded that the ratio between the contribution of the two least volatile bins $(0.1 \,\mu g \,m^{-3}$ or less) and the two most volatile bins $(1-10 \,\mu g \,m^{-3})$ is close to 2/3, at least if the vaporization enthalpy can be approximated with a constant value of 80 kJ mol⁻¹.

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In Fig. 8, the obtained volatility distributions for total organic concentration of $10 \,\mu\text{g/m}^3$ and total organic aerosol concentration of $2.8 \,\mu\text{g/m}^3$ (the average OA concentration during FAME-2008) are compared to the corresponding distributions for fresh α -pinene SOA (produced in dark, low NO_x, and low RH conditions) reported by Pathak et al. (2007). These results suggest that the aged aerosol measured during FAME-2008 is approximately 2 orders of magnitude less volatile than the fresh laboratory-generated SOA from α -pinene ozonolysis.

As mentioned earlier, the model results are obtained assuming a monodisperse aerosol of 300 nm. To test the sensitivity of the results to this assumption, we compared the simulated results of the MFRs (using the optimum volatility distribution given for the baseline case in Table 1) for a monodispersed aerosol size distribution and a full size distribution corresponding to the mean mass size distribution during the FAME-2008 campaign. The difference in the MFR simulations using the full distribution and the monodisperse distribution was less than 2% in all the studied temperatures. The

²⁰ corresponding uncertainty in the fitted volatility distribution is thus much less than the uncertainty related to constraining the data in the fitting procedure.

Since the predicted MFRs are likely to depend strongly on the values used for the vaporization enthalpies and mass accommodation coefficients of the aerosol, we tested the sensitivity of the obtained volatility distribution to these variables. Assuming an ef-

fective vaporization enthalpy of 45 kJ mol⁻¹ (consistent with Lee et al., 2010 for fresh monoterpene SOA) did not reproduce the measurements as successfully as the base-line case (Table 1 and Fig. 9a) We also attempted to estimate the volatility distribution using a distribution of tabulated vaporization enthalpies based on data of real compounds, as suggested by Epstein et al. (2010) but we could not reproduce the





observations with this set of parameters: the volatilities corresponding for the best fit were extremely low, ranging from 10⁻⁶ to 10⁻³ μg m⁻³, and the predicted temperature-dependence was considerably steeper than observed (Table 1 and Fig. 9a). Corresponding comparisons to the case where the mass accommodation coefficient was assumed to be unity – thus corresponding to the case of maximum evaporation – or 0.005 are also presented in Fig. 9b and Table 1. These results highlight the fact that roughly an order of magnitude change in the mass accommodation coefficient is "equivalent" to a corresponding change in the volatility distribution. This uncertainty could potentially be overcome by varying residence times in the heated section of the thermodenuder to the extent where no variation with time would be seen in the MFRs – thus ensuring the uncoupling of kinetic and thermodynamic effects in the evaporation inside TDs. The volatility distributions obtained from the fits are presented in Table 1, and the corresponding modeled MFRs in Fig. 9. The unity effective accommodation coefficient is also compatible with our measurements resulting in an estimated volatility distribution that is roughly an order of magnitude lose than the or = 0.05 area (Fig. 10).

distribution that is roughly an order of magnitude less than the α = 0.05 case (Fig. 10).

4 Conclusions

A data analysis method for ambient TD-AMS measurements is developed and applied to the data taken during FAME-2008. The method takes account of the challenges that arise in the interpretation of ambient TD-AMS measurements. The ambient data are post corrected for the changes in the AMS collection efficiency as the particles evaporate partially during heating, and particle losses inside the thermodenuder. Particle losses in the thermodenuder are approximately 15% and the AMS CE of the thermodenuded samples was around 10% lower than that of the ambient/bypass samples. Overall these corrections increased the MFR by approximately 20%, for FAME-2008.

An organic aerosol evaporation model is used to simulate the time-dependent behavior of the aerosol inside the TD and estimate the volatility distribution of the ambient organic aerosol. The model shows that the organic aerosol measured during FAME-2008





is approximately two orders of magnitude less volatile than laboratory-generated α -pinene SOA.

Use of two residence times allows for a more constrained determination of the aerosol volatility by – at least partly – uncoupling the kinetic and thermodynamic influences on the TD output. However, even with the two residence times used a rather wide range of effective accommodation coefficients (from 0.05 to 1) were consistent with the data resulting in significant uncertainty (almost an order of magnitude) in

the estimated volatility distribution. Our analysis suggests that measurements at even higher residence times (several 100 s) may be needed to further constrain the volatility
 distribution of OA at these low concentration levels.

Acknowledgements. This research was supported by the US National Science Foundation (ATM-0336296) and the EUCAARI European Union FP6 Project.

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Table 1. The input parameters (α is the effective mass accommodation coefficient, ΔH_{vap} the vaporization enthalpy) in the model calculations, and the corresponding mass fractions on each volatility in the aerosol phase, as determined from least squares fits of modeled to measured VFR data. The norm of residuals describes the goodness of the fit.

	Base case	Low vaporization enthalpy	Vaporization enthalpies from Epstein et al. (2010)	Unity accommodation coefficient	Accommodation coefficient 0.005
α	0.05	0.05	0.05	1.00	0.005
$\Delta H_{\rm vap}$ (kJ mol ⁻¹)	80	45	ΔH_{vap} (C*)	80	80
C^{*} (µg m ⁻³)	[0.01 0.1 1 10]	[1 10 100 1000]	$[10^{-6} \ 10^{-5} \ 10^{-4} \ 10^{-3}]$	[0.001 0.01 0.1 1]	[0.1 1 10 100]
X	[0.2 0.2 0.3 0.3]	[0.3 0.3 0.2 0.2]	[0.3 0.4 0.1 0.2]	[0.2 0.2 0.3 0.3]	[0.2 0.2 0.3 0.3]
Norm of residuals	0.1	0.5	1.6	0.1	0.2







Fig. 1. Temperature profile along the axis of the heating section at a flow rate of 1.15 L min⁻¹. Lines are fitted to describe the temperature profile in the TD for the aerosol dynamics model.







Fig. 2. Changes in the AMS collection efficiency for the ambient (top) and thermodenuded (bottom) aerosol during the month long FAME-2008 period. The shading represents the solutions within 10% of the minimum error score of the distribution matching algorithm and the horizontal lines represent the mean value.















Fig. 4. Number and volume distributions of ambient aerosol and thermodenuded aerosol while TD was operated at 106 °C during 1–2 a.m. on 2 June. Also plotted is the predicted aerosol distribution accounting for both the changes in the AMS CE and density and the losses in the TD system. The fraction of number losses (f_N) was 0.140, and the collection efficiencies for the TD and ambient samples were 0.85 and 0.90, respectively.





Fig. 5. Number and volume distributions of ambient aerosol and thermodenuded aerosol while TD was operated at 108 °C during 5–6 p.m. on 3 June. Also plotted is the predicted aerosol distribution accounting for both the changes in the AMS CE and density and the losses in the TD system. The fraction of number losses (f_N) was 0.153, and the collection efficiencies for the TD and ambient samples were 0.80 and 0.95, respectively.



Fig. 6. Mass fraction remaining after heating in the TD (for 14 s) as a function of temperature for uncorrected TD-AMS data, corrected (for the losses in TD and the changes in AMS collection efficiency and density) data during FAME-2008. Each data point is the average of 30 MFR data sets (each MFR data set is 24 min averaged). Also plotted is the thermogram of fresh lab-generated α -pinene SOA with mass concentration of approximately 10 µg m⁻³ and size of approximately 250 nm. Lines are linear fits to guide the eye.







Fig. 7. The modeled mass fractions remaining (lines, see Table 1 for details) corresponding to different input data to the TD model, along with the fitting data set (markers with error bars of one standard deviation). The base case runs (lines) and the runs corresponding to maximum (lighter shaded areas) and minimum (darker shaded areas) variation in MFR upon an $X \pm 0.1$ shift in the volatility distribution.







Fig. 8. The volatility distributions of aged ambient organic aerosol during FAME-2008 (bottom) for (b) total organic concentration of $10 \,\mu g \,m^{-3}$ and (d) total organic aerosol concentration of $2.8 \,\mu g \,m^{-3}$ are compared to the corresponding distributions for (a, c) fresh α -pinene SOA (produced in dark, low NO_x, and low RH conditions) reported by Pathak et al. (2007).















Fig. 10. The effect of mass accommodation coefficient on the predicted volatility distributions of the ambient aerosol as predicted from fits between modeled and measured MFR for (**a**, **b**) total organic concentration of $10 \,\mu g \,m^{-3}$ and (**c**, **d**) total organic aerosol concentration of $2.8 \,\mu g \,m^{-3}$.

