



## RESEARCH LETTER

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## Key Points:

- Lab and field OA elemental composition follow a line in Van Krevelen space
- Mixing and aging largely explain ambient data but gaps exist
- Processing that produce OA with both high O:C and high H:C are needed

## Supporting Information:

- Text S1, Figures S1–S3, and Tables S1–S4

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## Elemental composition of organic aerosol: The gap between ambient and laboratory measurements

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**Abstract** A large data set including surface, aircraft, and laboratory observations of the atomic oxygen-to-carbon (O:C) and hydrogen-to-carbon (H:C) ratios of organic aerosol (OA) is synthesized and corrected using a recently reported method. The whole data set indicates a wide range of OA oxidation and a trajectory in the Van Krevelen diagram, characterized by a slope of  $-0.6$ , with variation across campaigns. We show that laboratory OA including both source and aged types explains some of the key differences in OA observed across different environments. However, the laboratory data typically fall below the mean line defined by ambient observations, and little laboratory data extend to the highest O:C ratios commonly observed in remote conditions. OA having both high O:C and high H:C are required to bridge the gaps. Aqueous-phase oxidation may produce such OA, but experiments under realistic ambient conditions are needed to constrain the relative importance of this pathway.

### 1. Introduction

Organic aerosol (OA) is an important, sometimes dominant, component of submicron particle mass in the troposphere [Zhang *et al.*, 2007]. OA particles consist of a large number of individual compounds. The average elemental composition is one approach to simply describe OA chemistry [Kroll *et al.*, 2011]. The O:C and H:C ratios of OA are highly variable, characterizing both the source profiles and the atmospheric evolution of OA [Heald *et al.*, 2010; Ng *et al.*, 2011]. These ratios may also dictate other properties of OA such as hygroscopicity and particle density, both important for evaluating particle dynamics and the climate impacts of OA [Jimenez *et al.*, 2009; Kuwata *et al.*, 2012]. The elemental ratios of OA have been measured in the laboratory and ambient environment using modern mass spectrometry and spectroscopy [Kroll *et al.*, 2011]. In particular, the Aerodyne high-resolution aerosol mass spectrometer (HR-AMS) is a sensitive, online instrument that has been widely used in recent years for OA elemental composition measurements [Aiken *et al.*, 2008]. Recently, Canagaratna *et al.* [2015] have shown that most AMS O:C and H:C ratios published previously are underestimated due to assumptions in the data analysis that do not fully account for H<sub>2</sub>O produced from thermally induced dehydration in the AMS and in some cases CO produced from decarboxylation. Large corrections are needed for OA that are particularly rich in specific molecular functionalities [Canagaratna *et al.*, 2015]. These corrections create uncertainties in the interpretation of previously published AMS results. In this study, we synthesize a data set of laboratory and ambient observations of the elemental ratios from surface and aircraft measurements around the world, including unpublished results. Case-by-case corrections are made according to the Improved-Ambient method described in Canagaratna *et al.* [2015]. The Van Krevelen diagram of OA composition is reevaluated in light of a decade of AMS observations and used to assess how well-reported laboratory OA represent ambient OA composition.

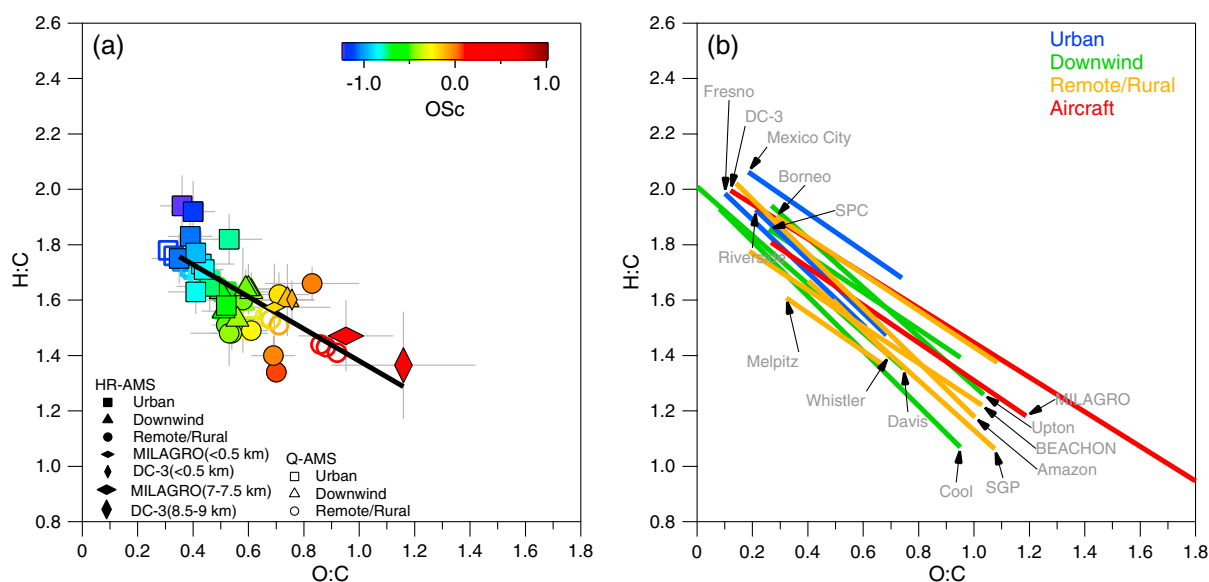
## 2. Description of Observations and Corrections

The combined HR-AMS and quadrupole AMS (Q-AMS) data set used here consists of a total of 56 surface observations at 48 locations (Figure S1 in the supporting information), in which rural/remote (21), pollution/fire-influenced (24), and downwind conditions (11) are classified. The data set has dense coverage of the Northern Hemisphere midlatitudes for both polluted and unpolluted areas. One site from the Southern Hemisphere is in the central Amazon rainforest [Chen *et al.*, 2009]. The majority of the observations are near sea level and within the boundary layer. Observations at Whistler Peak Station may sample air from the free troposphere [Sun *et al.*, 2009]. Because low  $(\text{H}_2\text{O}^+)_{\text{org}}:(\text{CO}_2^+)_{\text{org}}$  ratios have been widely used in previous data analysis, the reported O:C and H:C ratios of OA are mostly biased low [Canagaratna *et al.*, 2015]. We apply the “Improved-Ambient” correction that uses composition-dependent factors to the surface HR-AMS data sets (see supporting information). The HR-AMS O:C and H:C ratios increase by  $27 \pm 7\%$  and  $11 \pm 3\%$ , respectively, on average after corrections. The Q-AMS measures the unit-mass-resolution (UMR) mass spectra of OA. Correlations of O:C and H:C with the relative intensity of UMR ions are exploited by the updated HR-AMS data and are used to estimate the corrected ratios for the Q-AMS data. The sampling information, the OA mass loadings, and both the reported and corrected O:C and H:C ratios are listed in Tables S1 and S2. Airborne HR-AMS observations are also examined in this study. The Megacity Initiative: Local and Global Research Observations (MILAGRO; C-130; 4–31 March 2006) took place in Mexico City where urban pollution and biomass burning emissions are the dominant sources of aerosol particles [DeCarlo *et al.*, 2010]. The Deep Convective Clouds and Chemistry (DC-3; DC-8; 14 May to 22 June 2012) campaign sampled air over the south central U.S. which represents a mixture of continental background air with convective outflow. The O:C and H:C ratios of OA for the airborne campaigns are reported as 1 min averages and are scaled up by 27% and 11% (the average corrections for ambient OA), respectively. The O:C and H:C ratios published previously for laboratory-generated OA are also corrected as necessary based on average corrections for similar ambient OA types (see supporting information and Table S3).

## 3. Results and Discussion

The Van Krevelen diagram has been used to illustrate the changes in the elemental composition of OA stemming from atmospheric processing. Heald *et al.* [2010] first showed an approximate slope of  $-1$  for a suite of data sets including both ambient and laboratory-generated OA in this diagram. Such a slope can be produced by the simultaneous addition of both carbonyl and alcohol moieties to form a hydroxycarbonyl or carboxylic acid. A flattening of the slope at higher O:C was also observed, suggesting a tendency toward either alcohol addition or fragmentation. Ng *et al.* [2011] further examined the evolution of ambient oxygenated organic aerosol components and reported a slope of  $-0.5$  for this subset of OA, suggesting net changes equivalent to the addition of both acid and alcohol/peroxide functional groups without fragmentation and/or the addition of acid groups with fragmentation. This study reexamines these trends for an expanded elemental ratio data set consisting of laboratory and ambient (ground and aircraft) measurements that are corrected according to recent findings.

Figure 1a shows the Van Krevelen diagram of the corrected elemental ratios for ambient OA. Campaign-average O:C and H:C ratios observed for the ground sites range from 0.3 to 0.9 and 1.3 to 1.9, respectively. OA in urban environments have the lowest O:C (ave. 0.4) and the greatest H:C ratios (ave. 1.7); O:C ratios increase (ave. 0.6) and H:C ratios decrease (ave. 1.6) for downwind locations. The remote/rural category includes forested, coastal, and agricultural locations and shows a broad range of O:C (ave. 0.7) and H:C (ave. 1.5). These O:C and H:C ratios correspond to OM:OC ratios of 1.7 for urban and 2.0 for remote/rural sites on average, which are in good agreement with the ratios of  $1.6 \pm 0.2$  for urban and  $2.1 \pm 0.2$  for nonurban OA derived from molecular-level measurements by Turpin and Lim [2001]. Airborne measurements are influenced by both surface sources and transported or chemically produced OA aloft. As shown in Figure 1a, the mean O:C and H:C ratios near surface (i.e., less than 0.5 km) for both the MILAGRO and DC-3 campaigns are similar to those for the remote/rural locations. Figure S3 shows the vertical profiles of O:C and H:C measured during MILAGRO and DC-3. The O:C increases with altitude in the mixed layer during MILAGRO, where fast photochemical aging of anthropogenic semivolatile (SVOC) and intermediate-volatility organic compounds (IVOC) can lead to highly oxidized OA [Volkamer *et al.*, 2006; Robinson *et al.*, 2007], while lower O:C at midaltitude is consistent with

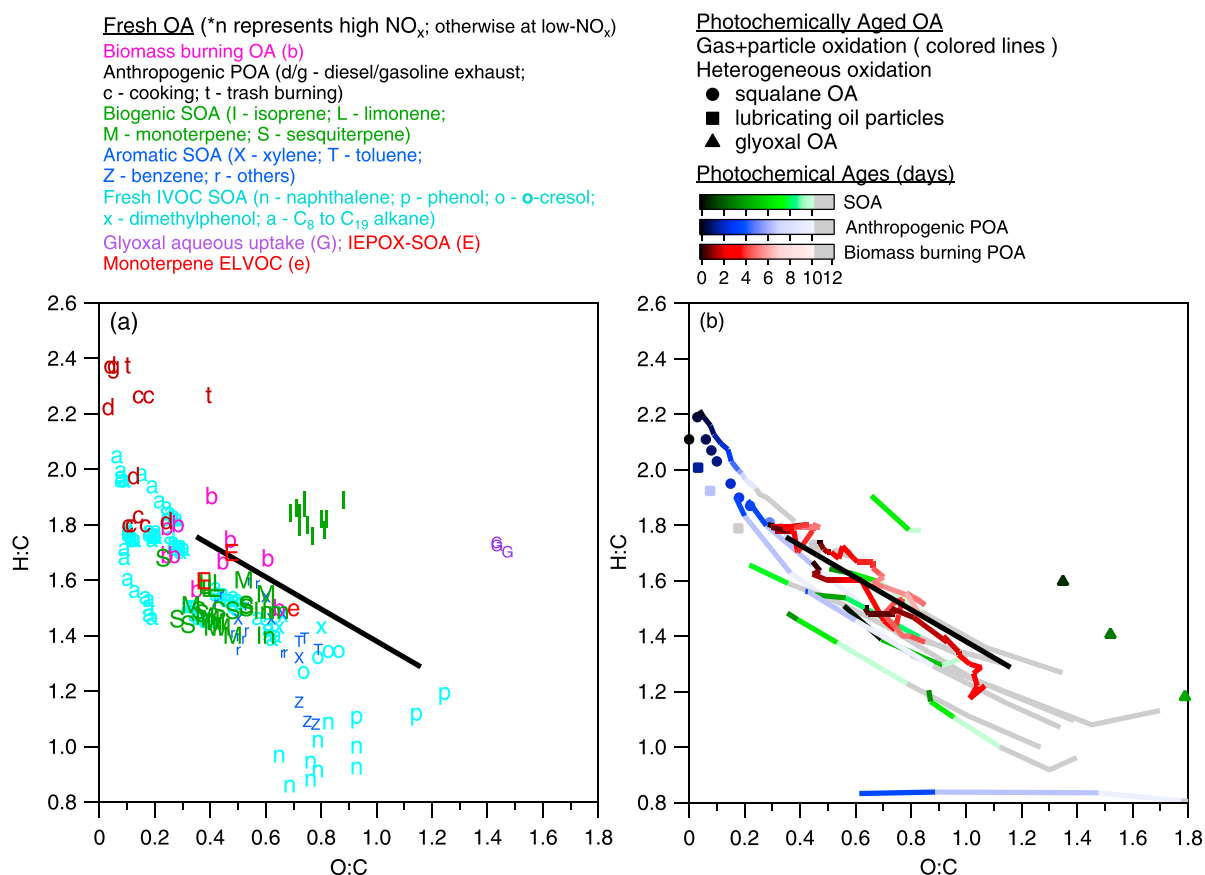


**Figure 1.** Van Krevelen diagrams for the O:C and H:C ratios of (a) mean surface and airborne field observations, (b) lines fitted to 15 individual campaigns from previous panel (observations with OA loadings less than  $0.3 \mu\text{g}/\text{m}^3$  are excluded). The campaign averages are shown as closed symbols for HR-AMS data and open ones (overlapped) for Q-AMS data. Error bars show the standard deviations of the observations. Black line shows the fitted line to ambient means ( $R = 0.82$ ; Slope =  $-0.58 \pm 0.04$ ; Intercept =  $1.96 \pm 0.03$ ). All fittings are done with the Reduced Major Axis (RMA) method.

strong influences of fresh biomass burning outflow [DeCarlo *et al.*, 2010; Heald *et al.*, 2011]. Unlike MILAGRO, the O:C increases with altitude for the DC-3 campaign, consistent with atmospheric aging. Substantial production of highly oxidized SOA in cloud or aerosol water could also increase O:C at elevated altitude, depending on the cloud type, the changes of liquid water content with altitude, and the processing time [Lim *et al.*, 2010; Lee *et al.*, 2011; Hao *et al.*, 2013]. A maximum O:C ratio of 1.16 associated with a minimum H:C ratio of 1.35 is observed for the mean values of each 0.5 km binned altitude interval, representing the most oxidized OA observed in ambient environment.

The whole data set indicates a wide range of average carbon oxidation state ( $\text{OSc} \approx 2\text{O:C} - \text{H:C}$ ) of ambient OA [Kroll *et al.*, 2011]. The OSc values range from  $-1.2$  to  $+1.0$  and exhibit an increasing trend from urban (ave.  $-0.8$ ), downwind ( $-0.5$ ), and remote/rural ( $-0.2$ ) to aloft environments ( $+0.3$ ). This result is consistent with the understanding of persistent oxidation during atmospheric dilution and evolution [Jimenez *et al.*, 2009]. The elemental composition of ambient OA can be fitted by a line with a slope of  $-0.6$  and an intercept of 2.0 by the reduced-major-axis (RMA) regression method [Smith, 2009]. Because the Improved-Ambient correction leads to a greater percent increase in O:C than for H:C, shallower slopes are expected compared to those reported previously (e.g.,  $-1$  for bulk OA) [Heald *et al.*, 2010]. The slope and intercept for individual campaigns are different from each other (Figure 1b). The slopes range from  $-1.0$  to  $-0.7$  (Table S4), all steeper than the campaign mean, suggesting that the mean fit is compensating for both different slopes and different intercepts, and it is the latter that flattens out the mean slope. The intercepts range from 1.8 to 2.2, and the values for urban and downwind sites (2.1–2.2) are slightly greater than the values for remote/rural sites (1.8–2.2) (Table S4). Remote regions are characterized by the largest diversity of fits. The Improved-Ambient correction of the elemental ratios increases the variability of the fits.

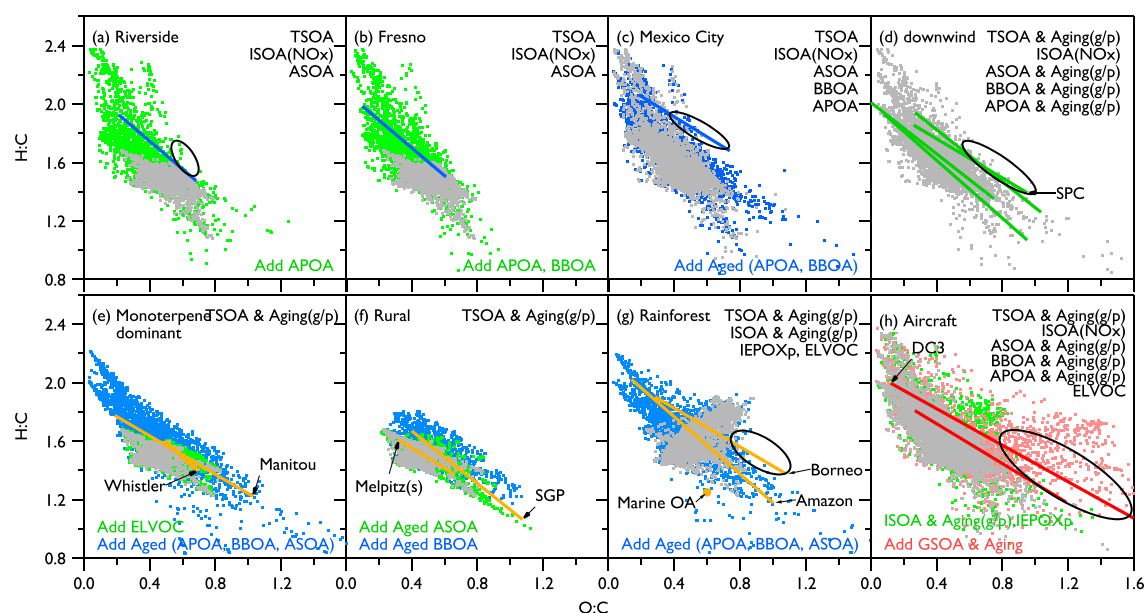
Figure 2 shows the bulk elemental composition of various types of laboratory-generated OA in the Van Krevelen space. The O:C and H:C ratios for fresh laboratory OA occupy a large range and tend to populate the region below and to the left of the ambient mean line (Figure 2a). Only a few measurements sit above the mean line, including fresh primary organic aerosol (POA), secondary organic aerosol (SOA) formed by isoprene photooxidation at low  $\text{NO}_x$  (i.e.,  $\text{HO}_2$  dominant conditions) [Chen *et al.*, 2011], and glyoxal uptake on particles [Chhabra *et al.*, 2010]. Lower H:C and greater O:C ratios are obtained for anthropogenic POA (APOA) and biomass burning OA (BBOA) sampled at low mass loading compared to measurements of similar systems at high mass loading, consistent with loading-dependent condensation [Mohr *et al.*, 2009;



**Figure 2.** Van Krevelen diagrams for the O:C and H:C ratios of (a) laboratory-generated fresh OA and (b) laboratory-generated aged OA from photochemical-aging experiments. Data are taken from literature and corrected herein (Tables S1–S3). The photochemical ages are calculated based on a mean OH concentration of  $1.2 \times 10^6$  molecules  $\text{cm}^{-3}$ . Black line shows the fitted line to ambient means.

Chirico *et al.*, 2010]. The elemental ratios of fresh SOA produced by IVOC photochemical oxidation are highly dependent on carbon number and the structure of the precursors but generally lie below the ambient mean line [Tkacik *et al.*, 2012]. The compositions of POA emitted by marine sources are taken from ambient observations over regions of high oceanic biological activity and measurements of generated marine particles [Ovadnevaite *et al.*, 2011; Frossard *et al.*, 2014]. Some of the single precursor SOA data line up with a slope (e.g.,  $-0.7$  for monoterpene oxidation) [Shilling *et al.*, 2009], explained by the changes of relative abundance of SOA products that have different volatilities due to loading-dependent condensation. Reactive uptake of isoprene epoxydiol (IEPOX) forms products such as C<sub>5</sub>-alkene triols, 2-methyltetrols, and methyltetrahydrofuran-diols that have high O:C (0.6–1) and H:C (2–2.4) [Surratt *et al.*, 2010; Lin *et al.*, 2012]. However, the bulk composition of IEPOX SOA sits below the ambient mean line with mean O:C and H:C ratios of 0.4 and 1.6 (Table S3), presumably due to other unknown products or dehydration during oligomerization [Kuwata *et al.*, 2015].

Figure 2b shows the composition changes of OA observed in laboratory photochemical-aging experiments. Similar to fresh OA, the observed elemental composition of aged OA tends to populate below the ambient mean line. The O:C ratios generally increase with higher OH exposure, and the H:C ratios decrease except for naphthalene SOA for which H:C only drops by about 10% after ~20 days of photochemical aging [Lambe *et al.*, 2011; Ortega *et al.*, 2013]. The fitted slopes for these photochemical-aging experiments range from  $-1.0$  to  $-0.5$ , consistent with functionalization via acid addition or simultaneous acid and alcohol addition, as described above. Heterogeneous oxidation of OA leads to small increases of O:C and decreases of H:C within atmospherically relevant aging time scales ( $<10$  days) [Pye and Seinfeld, 2010]. Observed slopes for squalane, lubricating oil, and glyoxal OA particles are about  $-1$  but flat out to  $-0.5$  when fragmentation becomes a dominant process [Kroll *et al.*, 2009; George and Abbatt, 2010; Lambe *et al.*, 2011].



**Figure 3.** (a–h) Van Krevelen diagrams of simulated laboratory mixtures (dots) compared to ambient data sets (lines). Laboratory mixtures are generated randomly from classes that are indicated in the right corner of each panel. Classes include terpene SOA (TSOA), isoprene SOA produced under low (ISOA) and high  $\text{NO}_x$  (ISOA( $\text{NO}_x$ )) conditions, aromatic SOA (ASOA), biomass burning OA (BBOA), anthropogenic POA (APOA), IEPOX SOA (IEPOXp), and extremely low volatility compounds (ELVOC) formed in monoterpene oxidation. Fitted lines to individual ambient data sets (blue: urban; green: downwind; orange: remote/rural; red: aircraft) are taken from Figure 1b. The aging data represent less than 10 days of atmospheric aging of both gas (oxidation of SVOC/IVOC and SOA) and particle-phase constituents (heterogeneous oxidation). Green, blue, and red dots represent the simulated mixtures with additional classes indicated at the bottom of the panels. Black ovals are illustrative for the space where there are dense populations of ambient data but a lack of simulated mixtures without consideration of glyoxal SOA.

Ambient OA is a complex mixture of OA from different sources and processing. Direct comparison of laboratory to ambient can be made when source contributions are known. Alternatively, statistical mixtures of laboratory OA provide a general picture of all possible compositions. The comparisons of those mixtures to ambient may reveal critical gaps regardless the uncertainties in the source apportionment. We develop a series of statistical mixtures of laboratory OA, including both diverse source types and OA obtained at different OH exposure equivalent to up to ~10 days of aging (Figure 3). For each case, we generate 5000 mixtures by combining 10 random laboratory OA compositions with uniformly distributed random mass fractions that sum up to 1. We equally weight each category of laboratory OA such that selection is not biased by the number of observations within a category.

The composition trajectories of ambient OA are generally consistent with those simulated OA mixtures, but critical gaps are revealed with this analysis. Figures 3a–3d reveal the diversity of elemental composition in polluted environments. A slope of  $-1.0$  with an intercept of 2.1 is observed at the sites in Riverside (summer) and Fresno (winter), California (Figure 2a). During the measurement periods, fresh POA (mainly APOA) contributes about 20% of OA mass at Riverside site [Docherty *et al.*, 2011], and APOA and BBOA together contribute about 60% of OA mass at Fresno site [Ge *et al.*, 2012]. The mixtures of POA with SOA capture the majority of the ambient trajectory, suggesting that mixing rather than chemical aging dominates during the two campaigns. Another urban site at Mexico City (T0) exhibits different behavior (Figure 3c). Although fresh POA contributed nearly half of the OA mass, the observed trajectory is shallower ( $-0.7$ ) with higher intercept (2.2) [Aiken *et al.*, 2009]. This shallower slope may be more consistent with chemical aging. However, the laboratory mixtures cannot capture the observations even when photochemically aged SVOC and IVOC from APOA and BBOA emissions are included. Downwind locations are characterized by composition trajectories having slopes of  $-0.7$  to  $-1.0$  and intercepts of 2.0 to 2.2, which extend out to higher O:C (Figure 3d) [Saarikoski *et al.*, 2012; Setyan *et al.*, 2012]. Except for San Pietro Capofiume, Po Valley site, these trajectories are captured by the statistical laboratory mixtures that further include photochemical aging of biogenic and anthropogenic SOA (gas + particle), although few points extend to the highest O:C. This is consistent with the growing importance of chemical aging moving away from source.

The observations at remote/rural locations (Figures 3e–3g) are also characterized by slopes of  $-0.7$  to  $-1.0$ . We find that the observed trajectory at Whistler mountain during a biogenic event [Schwartz *et al.*, 2010] matches with the mixtures of fresh and aged laboratory terpene SOA (TSOA) with the addition of extremely low volatility organic compounds (ELVOC) that are produced by monoterpene ozonolysis [Ehn *et al.*, 2014] (Figure 3e). Another monoterpene-dominant site, Manitou forest, was periodically influenced by anthropogenic sources [Ortega *et al.*, 2014], and as a result, the observed trajectory agrees better with the simulated mixtures if aged pollution is included. Two other continental background sites, Melpitz (summer) and Southern Great Plains (SGP), are heavily influenced by regional secondary formation which include both biogenic and anthropogenic SOA as well as biomass burning emissions [Martin *et al.*, 2008; Poulain *et al.*, 2011]. Figure 3f shows that the observed trajectories at these two sites are reproduced by the laboratory mixtures. In particular, aged anthropogenic SOA contributes to the highest O:C population of simulated mixtures in the diagram, which are important for representing the anthropogenic influence at SGP. The Amazon and Borneo sites are highly influenced by isoprene chemistry. Figure 3g shows that the mixing of fresh and aged SOA from terpene, isoprene, ELVOC, and IEPOX could produce a  $+1$  slope in the Van Krevelen diagram, which is completely opposite to the observations. Both sites are influenced by long-range transport of anthropogenic or biomass burning emissions as well as regional anthropogenic background [Chen *et al.*, 2009, 2014; Robinson *et al.*, 2011a, 2011b]. If we include these in the mixtures (shown as blue dots), the composition trajectory is correctly reoriented. The progression does not generally achieve the higher O:C observed in Borneo. Marine emissions may also contribute OA mass to the two sites. However, the data available for ambient marine OA falls below the trajectories and including this source would not bridge the gap [Ovadnevaite *et al.*, 2011; Frossard *et al.*, 2014].

The aircraft trajectories represent large-scale sources and transformations. Figure 3h shows that the mixtures generated from source and aged laboratory OA (grey dots) as well as IEPOX and isoprene SOA formed at  $\text{HO}_2$ -dominant conditions (green dots) capture half of the aircraft trajectories. Sources of OA having both high O:C and high H:C are missing to extend the mixtures above the ambient trajectories. Similar gaps can be found in polluted and remote tropical environments (Figures 3a, 3c, 3d, and 3g). In addition, few points extend to the highest O:C, and these mixtures must be dominated by highly aged material ( $\sim 10$  days). This is particularly evident for the aircraft observations (Figure 3h) but is also evident at downwind (Figure 2d), rural (Figure 3f), and forested (Figures 3e and 3g) sites. Unless the lifetime of OA in the atmosphere is greater than typically assumed, it seems unrealistic that ambient OA would be dominated by such well-aged material across this range of environments.

Aqueous-phase chemistry may be an efficient pathway across various environments to produce highly oxidized material [Ervens *et al.*, 2011, and references therein]. Water-soluble products of gas-phase photochemistry such as small carbonyls, acids, and phenolic compounds have low carbon numbers, which may produce organic acids and oligomers that have high O:C ( $\sim 1$ – $2$ ) when reacted further with hydroxyl radicals in haze, fog, and cloud water. These products may also have high H:C (e.g., 2.0 for glycolic acid). The addition of glyoxal SOA, as an example, improves the match between laboratory and ambient aircraft data (assuming that aging is also important) (Figure 3h). However, the relative importance of aqueous-phase pathways in ambient environment remains unclear. Simulations based on the yields obtained in bulk aqueous experiments suggest substantial contribution of these pathways to the total SOA mass [Fu *et al.*, 2008; Ervens *et al.*, 2011; Lin *et al.*, 2014]. A large contribution of glyoxal SOA, however, would produce a flat slope, inconsistent with observations (Figure 3). The yields of aqueous SOA may also be lower under realistic ambient conditions. Daumit *et al.* [2014] showed that particles lose more carbon during aqueous-phase oxidation compared to in bulk solutions, causing different product distributions. The bulk elemental composition of SOA produced by aqueous oxidation from various precursors is also largely unknown and may be quite different from those of identified individual species [Zhao *et al.*, 2013]. Moreover, the relative aqueous-phase contribution to SOA depends on the time scales of gas-phase chemistry, cloud cycles, and relative humidity changes. Other possibilities for bridging the gaps include chemistry such as fast addition of alcohol or peroxide groups to APOA and BBOA, or alternatively the possibility that laboratory experiments do not adequately mimic the ambient environment. Laboratory studies typically focus on a single compound, whereas OA types and precursors are mixed in the real atmosphere [Chen *et al.*, 2011; Tkacik *et al.*, 2012; Nakao *et al.*, 2013]. Furthermore, flow-tube photochemical-aging experiments require high oxidant concentrations, which are not representative of

ambient conditions [Lambe *et al.*, 2011]. Wall losses may also lead to the underrepresentation of SOA constituents in chamber studies [Zhang *et al.*, 2014].

In summary, we show that ambient data follows a general trajectory in Van Krevelen space toward higher oxidation state. The overall fit for ambient data characterizes measurements that span a wide range of OA oxidation, providing simplifications for modeling the complex atmospheric OA system. We also show that the large diversity in the observed slope and intercept across environments can generally be explained by the generated mixtures of laboratory OA with a combination of atmospheric mixing and photochemical aging, supporting the use of laboratory measurements to explicitly constrain model framework. However, these comparisons also reveal significant gaps between ambient and laboratory measured OA composition. Sources of OA that have high O:C (>0.6) and, more importantly, high H:C (>1.6) are needed to drive the match. Aqueous-phase chemistry may be a pathway to contribute such material. Our study highlights the need to characterize the yields and bulk composition of SOA produced by aqueous-phase processing under atmospherically relevant conditions.

### Acknowledgments

Data supporting Figures 1 and 2 are available as in supporting information Tables S1–S4. This work was supported by the National Science Foundation (ATM-1238109). The University of Colorado group was supported by NASA NNX12AC03G, NSF AGS-1243354, and NOAA NA13OAR4310063. Q.Z. was supported by the Office of Science (BER), DOE, DE-FG02-11ER65293. The authors thank Anne Marie Macdonald, Richard Leaitch, Andrew Lambe, Amber Ortega, Sanna Saarikoski, Niall Robinson, Yele Sun, Jesse Kroll, and other group members for helping with sampling and aspects of data analysis.

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