



Large differences of highly oxygenated organic molecules (HOMs) and low volatile species in SOA formed from ozonolysis of β -pinene and limonene

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Abstract. Secondary organic aerosols (SOA) play a key role in climate change and public health. However, the oxidation state and volatility of SOA are still not well understood. Here, we investigated the highly oxygenated organic molecules (HOMs) in SOA formed from ozonolysis of β -pinene and limonene. Fourier transform ion cyclotron resonance mass spectrometry (FT-ICR MS) was used to characterize HOMs, and a scanning mobility particle sizer (SMPS) was used to measure the concentration and size distribution of SOA particles. The abundance of HOMs in limonene SOA was 5-13% higher than in β -pinene SOA (3-13%) exhibiting different trends with increasing ozone concentrations. β -pinene oxidation-derived HOMs prefer to stabilize at high ozone concentration, accompanied by substantial formation of ultra-low-volatility organic compounds (ULVOCs). Limonene-oxidation-derived HOMs prefer to stabilize at moderate ozone concentrations, with semi-, low-, and extremely low-volatility organic compounds (SVOCs, LOVCs, and ELVOCs) play a major role. Combined experimental evidence and theoretical analysis indicate that oxygen-increasing-based peroxy radical chemistry is a plausible mechanism for the formation of compounds with 10 carbon atoms. Our findings show that HOMs and low volatile species in β -pinene and limonene SOA are largely different. The ozone concentration-driven SOA formation and evolution mechanism of monoterpenes is suggested to be considered in future climate or exposure risk models, which may enable more accurate air quality prediction and management.



1 Introduction

Secondary organic aerosols (SOA) are key component of airborne particulate matter, which play a crucial role in air quality, public health, climate, and hydrological cycle (Laden et al., 2006; Cohen et al., 2017; Kourtchev et al., 2016; Jokinen et al., 2015; Tröstl et al., 2016; Perraud et al., 2012; Ramanathan et al., 2001; Noziere et al., 2015). Monoterpenes ($C_{10}H_{16}$) are a class of biogenic source volatile organic compounds (BVOCs) acting as important precursors of SOA (Kanakidou et al., 2005; Hallquist et al., 2009; Ehn et al., 2012; Fu et al., 2009). SOA formation is a complex multiphase process (Shrivastava et al., 2017), in which biogenic SOA can be formed via the peroxy radical (RO_2) chemistry of BVOCs initiated by ozone (O_3), nitrate radicals (NO_3), and hydroxyl radicals ($\cdot OH$), etc. (Hallquist et al., 2009; Griffin et al., 1999; Jokinen et al., 2014). These competitive oxidation processes depend on the nature of the parent VOC and atmospheric conditions (Mahilang et al., 2021). However, our current understanding of the mechanisms of SOA formation is limited and the impact of biogenic emissions on global climate remains uncertain (Hallquist et al., 2009; Shah et al., 2019).

SOA contains organic species with a wide range of volatility, which has a strong temperature-dependence (Hallquist et al., 2009; Simon et al., 2020). In contrast, ambient species are thought to consist mainly of low volatile species, potentially reducing the atmospheric relevance of laboratory-generated SOA (Kim and Paulson, 2013). As SOA functionalization and oxygenated compounds increase, the vapor pressure decreases and gaseous compounds condense on existing particles or nucleate to form new compound particles (Donahue et al., 2012; Saukko et al., 2012). Ozonolysis as the most effective formation pathway of semi-, low-, or extremely low-volatile organic compounds (ELVOCs) that contribute significantly to SOA formation (Kroll and Seinfeld, 2008; Kirkby et al., 2016). Recent experimental results have shown that BVOCs can produce large amounts of aerosol particles by forming ultra-low-volatility organic compounds (ULVOCs) even in the absence of sulfuric acid (Kirkby et al., 2016; Guo et al., 2022). In particular, the (extremely) low volatility of the oligomer, it is expected that its irreversible distribution on the aerosol surface will be enhanced (Zhang et al., 2017). Moreover, ELVOCs play a crucial role in the generation of atmospheric cloud condensation nuclei (Kerminen et al., 2012). ELVOCs are mainly derived from monoterpene oxidation and enhance new particle formation in most continental regions (Jokinen et al., 2015). And a key starting point for the formation and growth of new particles is the formation of highly oxidized organic molecules (HOMs), which are a class of organic compounds with a variety of functionalities and a large amount of oxygen atoms (Ehn et al., 2014). HOMs with high oxygen-containing but low oxidation state should determine the oxidation potential of ambient fine particles and laboratory-generated SOA (Tong et al., 2019). HOMs refer to the process of autoxidation in which a RO_2 undergoes an intramolecular hydrogen atom shift (H-shift) to form a hydroperoxide functionality ($HOO-$) and an alkyl radical (RO), and then molecular oxygen rapidly attaches to form a new more oxidized RO_2 , and this process is repeated several times (Bianchi et al., 2019). Recent research has shown that after a single oxidant attack, the BVOCs can be oxidized to low-volatility aerosol precursors on sub-second timescales, which are then decomposed into aerosols, and even participate in the formation of new particles (Iyer et al., 2021). Laboratory studies of HOMs observed by ozonolysis of monoterpenes are closely corresponded to observations from boreal forests (Ehn et al., 2012; Ehn et al., 2014). Bianchi et al. (2019) have described the relation between



60 HOMs and the volatility classes. The classes are ULVOCs/ELVOCs, low-volatile organic compounds (LVOCs), and semi-
volatile organic compounds (SVOCs). Among them, HOMs are an important component of (E)LVOCs, and a small part may
be volatile enough to be classified as SVOCs (Li et al., 2019). The ELVOCs in this paper refer to formula for calculating the
volatility of organic aerosols based on effective saturation mass concentrations ($3 \times 10^{-9} < C_0 < 3 \times 10^{-5} \mu\text{g m}^{-3}$) according to
Schervish and Donahue (Schervish and Donahue, 2020), while the HOMs are determined on the basis of the oxygen number
65 in a formula (see section 2.4).

Due to their low volatility, monoterpene HOMs can provide nucleation conditions for the early growth of nanoparticles (Tröstl
et al., 2016). The more abundant atmospheric β -pinene and limonene, which are used in this study, are released approximately
30.3 Tg yr⁻¹ globally (Guenther et al., 2012). The molecules of β -pinene and limonene have the same number of carbon and
hydrogen atoms as well as double bond equivalents (DBE). β -pinene has a bicyclic structure with an exocyclic double bond
70 as the second-most-abundant-VOC and limonene has a monocyclic structure with an exocyclic and an endocyclic double bond,
though the endocyclic double bond is more reactive (Gallimore et al., 2017; Kenseth et al., 2018). Thus, even at low
concentrations in the atmosphere, limonene has a high potential for SOA formation due to its greater reactivity toward ozone
(Tomaz et al., 2021; Bianchi et al., 2019). For limonene, the attack of ozone takes place predominantly on the endocyclic
double bond, and for β -pinene, it is the only reactive site. Laboratory studies have shown that the molar yield of HOMs by β -
75 pinene ozonolysis is much lower than that of limonene ozonolysis (Ehn et al., 2014; Jokinen et al., 2015). The ozone chemistry-
based SOA formation potential of these two compounds (limonene > β -pinene) is described in other literature (Lee et al., 2006;
Jokinen et al., 2015). Notably, β -pinene and limonene showed opposite trends in SOA formation potential under the condition
of $\cdot\text{OH}$ oxidation (Jokinen et al., 2015; Mutzel et al., 2016). This reflects that BVOCs in the atmosphere exhibit diverse
oxidation chemistry and have different product responses.

80 The nucleation rate of monoterpene SOA is largely dependent on oxidant types and concentrations. For instance, Zhao et al.
found that the SOA yield of ozone degradation of monoterpenes was higher than that of $\cdot\text{OH}$ oxidation (Zhao et al., 2015).
Moreover, the initial nucleation of limonene SOA was found to be maximum at low ozone concentrations, while the opposite
behavior was observed at high ozone concentrations (Waring et al., 2011). In addition, high BVOC emissions has been found
to increase surface ozone and SOA levels in China (Wu et al., 2020). Laboratory studies often use high concentrations of ozone
85 to reduce the loss of semi-volatile vapors to the walls of the chamber (Pathak et al., 2008). To deepen the understanding of
ozone concentration-dependent SOA formation mechanisms, it is necessary to study the effect of ozone concentration on the
molecular composition of monoterpene SOA particularly the volatility and oxidation state driven constituents (e.g., HOMs
and ELVOCs).

The aim of this study was to analyze the influence of ozone concentration on the chemical composition of SOA formed from
90 β -pinene and limonene ozonolysis. The experiments were carried out in a flow tube reactor at three gradient ozone
concentrations. Then Fourier transform ion cyclotron resonance mass spectrometer equipped with a 7 Tesla superconducting
magnet (7T FT-ICR MS) was used to obtain the molecular composition and reaction mechanism of polar SOA organic
extracted with ultrapure Milli-Q water. These efforts provide highly accurate mass measurements of organic compounds to



95 clearly assign molecular formulas including carbon, hydrogen, and oxygen up to 850 Da to explore the difference of particulate HOMs originating from β -pinene and limonene oxidation.

2 Method

2.1 Laboratory SOA generation and collection

A schematic description of the experimental procedure used in this study is shown in Figure 1. Laboratory SOA were generated by gas-phase ozonolysis of β -pinene or limonene in a 7 L quartz flow tube reactor. More detailed information about this reactor has been described in previous studies (Tong et al., 2016; Tong et al., 2019). Briefly, 1 mL of β -pinene (99%, Sigma Aldrich) or limonene (99%, Sigma Aldrich) were separately kept in 1.5 mL amber glass vials (VWR International GmbH) as SOA precursor sources. Flows of 1 bar and 1 standard liter per minute N_2 (99.999%, Westfalen AG) were used as a carrier gas to introduce the evaporated volatile organic compounds (VOC) into the reactor for ~ 5 min gas-phase ozonolysis reaction. The O_3 was generated via passing synthetic air (Westfalen AG, $1.8\sim 2.1$ L min^{-1}) through a 185 nm UV light (O_3 generator, L.O.T.-Oriol GmbH & Co. KG). The ozone concentrations in the flow tube reactor were 50 ± 10 ppb, 315 ± 20 ppb or 565 ± 20 ppb, which were measured with an ozone monitor (model 49i, Thermo Fisher Scientific Inc.). On the basis of a calibration function measured by gas chromatography–mass spectrometry, the precursor concentration was estimated to be in the range of 1–2 ppm for β -pinene and limonene. The reaction conditions are shown in Table S1. Ozonolysis of β -pinene and limonene SOA were performed under dark and dry conditions to reduce the complexity of SOA formation. Seed aerosols and hydroxyl radical scavenger were not added. When concentrations of β -pinene SOA, limonene SOA, and ozone are stable, the SOA were collected twice in a row for each ozone concentration condition on 47 mm diameter Omnipore Teflon filters (JVWP04700, Merck Chemicals GmbH). The sampling time varied from several minutes to several hours depending on the required aerosol mass. SOA filter samples were wrapped in aluminum foil and kept cool during transport between laboratories. A scanning mobility particle sizer (SMPS, GRIMM Aerosol Technik GmbH & Co. KG) was used to characterize the size distribution and number concentration of the generated SOA. A flow rate of ~ 3 L min^{-1} was controlled using a common diaphragm vacuum pump ($0\sim 3$ L min^{-1}), which was connected after the aerosol samplers. Experimental tests confirmed that blank filters did not produce aqueous phase radicals. The condensation of water vapor on a filter during SOA collection and wall loss were negligible in this study. A Teflon filter with particle loading was weighed using XSE105DU balance with accuracy of ± 10 μg .

2.2 FT-ICR MS measurement

120 The β -pinene and limonene SOA filter samples and blank filters were extracted three times with ultrapure Milli-Q water. Each extraction was carried out in a sonicating ice bath for 10 min. The extracts were combined and added to a solid-phase extraction (SPE) cartridge (Oasis HLB, Waters Corporation, 60 mg, 3 mL) on the Supelco Visiprep SPE Vacuum Manifold (USA), which had been preconditioned with 3×6 mL methanol and Milli-Q water, respectively. Then, the cartridges were washed three times



with 6 mL Millipore Q water and dried under a nitrogen flow for around 1 h. Subsequently, the organic compounds retained
125 on the cartridge were eluted using 6 mL of methanol. The eluate was immediately concentrated to about 10 μL by a rotary
evaporator and sample concentrator to achieve the minimum detection concentration for detection. Low molecular weight
compounds (<100 Da) are expected to be excluded in the rinsing and drying step of extraction, as reported by Bianco et al (Bianco
et al., 2018). Finally, the eluate was stored at $-20\text{ }^\circ\text{C}$ in a brown glass vial with TEFLON® cap until analysis.

The chemical composition of organics for pretreated extracts were finally analyzed with a 7 T FT-ICR MS (Bruker Daltonik,
130 GmbH, Bremen, Germany) equipped with an electrospray ionization (ESI) ion source at the School of Earth System Science,
Tianjin University, Tianjin, China. The instrument was externally calibrated in the negative ion mode with Suwannee River
fulvic acid (SRFC) and the resulting mass accuracy was better than 1 ppm. Because the target species were water-soluble polar
compounds, all the samples were analyzed in the negative ionization mode and infused into the ESI unit by syringe infusion
at a flow rate of $220\text{ }\mu\text{L h}^{-1}$. Ions were accumulated for 0.05 s in the hexapole collision cell. For each mass spectra were from
135 150 to 1000 Da. The ESI capillary voltage was 5.0 kV and the spectra are the accumulation of 256 scans. An average resolving
power ($m/\Delta m$ 50 %) of over 400 000 (at mass-to-charge (m/z) 400 Da) was achieved. The capillary temperature was maintained
at $200\text{ }^\circ\text{C}$. Filter blank was analyzed following the same procedure as the aerosol sample analysis. Other details of the
experiment setup can be found elsewhere (Cao et al., 2016; Xie et al., 2020a).

2.3 Molecular formula assignment

140 The original FT-ICR MS data was processed using Data Analysis 5.0 (Bruker Daltonics). The mass spectra were internally
recalibrated using an abundant homologous series of oxygen-containing organic compounds in the samples over the mass
range between 150 and 1000 Da. Molecular formulae were assigned for peaks with a signal-to-noise (S/N) ratio ≥ 4 by allowing
a mass error threshold of ± 1 ppm between the measured and theoretically calculated mass. The molecular formula calculator
was set to calculate formulae in the mass range between 150 and 800 Da with elemental compositions up to 40 carbon (C), 80
145 hydrogen (H), and 30 oxygen (O) atoms with a tolerance of ± 1 ppm when only C, H and O are studied. Furthermore, DBE
must be an integer value, the elemental ratio limits of hydrogen-to-carbon ratio (H/C) (0.3~2.5), oxygen-to-carbon ratio (O/C)
(0~1.2) and a nitrogen rule for even electron ions were used to eliminate chemically unreasonable formula (Koch et al., 2005).
Unambiguous molecular formula assignment was determined with help of the homologous series approach for improving the
reliability on multiple formula assignments (Koch et al., 2007). No isotopic peaks were considered in this study. To minimize
150 the effects of the experimental procedure, all samples were subtracted from the blank test for organic molecules with the S/N
 ≥ 20 and intensity greater than those of the analyzed samples. The lower peak intensity of common ions suggests they resulted
from carry-over within the electrospray ionization source (Kundu et al., 2012). In addition, because of the instrument limitation,
the absolute mass concentration of each compound cannot be obtained.

The assigned molecular formulae were examined using the DBE and Kendrick mass defect (KMD) series (Wu et al., 2004).

155 To assess the saturation and oxidation degree of β -pinene and limonene SOA, the value of DBE is calculated along Eq. (1).

$$DBE = 1 + C - 0.5H \quad , \quad (1)$$



where C and H are the number of carbon and hydrogen atoms, respectively.

The maximum carbonyl ratio (MCR) was used to estimate the contribution of carbonyl equivalent groups in the molecule with oxygen number greater than or equal to DBE (Zhang et al., 2021). The value of MCR is calculated as Eq. (2).

$$160 \quad MCR = \frac{DBE}{O}, \quad (2)$$

where O is the number of oxygen atoms in the formula. Based on the MCR values, the HOMs were categorized into 4 groups: (I) very highly oxidized organic compounds (VHOOCs; $0 \leq MCR \leq 0.2$), (II) highly oxidized organic compounds (HOOCs; $0.2 < MCR \leq 0.5$), (III) intermediately oxidized organic compounds (IOOCs; $0.5 < MCR \leq 0.9$), and (IV) oxidized unsaturated organic compounds (OUOCs; $0.9 < MCR \leq 1$).

165 The carbon oxidation states (OS_C) is used to describe the composition of complex mixtures of organic matter undergoing oxidation processes. OS_C is calculated as follows (Kroll et al., 2011):

$$OS_C = 2O/C - H/C, \quad (3)$$

The weighted average of molecular weight (MW), O atom, O/C ratio, OS_C and DBE was calculated using Eq. (4).

$$X = \frac{\sum(Int_i \times X_i)}{\sum Int_i}, \quad (4)$$

170 where X is the weighted average of parameter above, X_i is the parameter values above and Int_i is the relative intensity for each individual formula, i .

Molecular corridors can help to constrain chemical and physical properties as well as reaction rates and pathways involved in organic aerosol evolution (Shiraiwa et al., 2014). Saturation vapor pressure (C_0) is a consequence of the molecular characteristics of molar mass, chemical composition, and structure. Li et al. have developed a parameterization to estimate C_0 as $\log_{10}C_0 = f(n_C, n_O)$ (Li et al., 2016). The C_0 is defined by the 2D volatility basis set (2D-VBS) as follows,

$$175 \quad \log_{10}C_0 = (n_C^0 - n_C)b_C - n_O b_O - 2 \frac{n_C n_O}{n_C - n_O} b_{CO}, \quad (5)$$

where n_C^0 is the reference carbon number; n_C and n_O denote the number of carbon and oxygen atoms, respectively; b_C and b_O denote the contribution of each kind of atoms to $\log_{10}C_0$, respectively, and b_{CO} is the carbon-oxygen nonideality (Donahue et al., 2011). The above parameters obtained at 298 K of this work were adapted to the work of Li et al. (2016). The target compounds were grouped into (I) intermediate-volatility organic compounds (IVOCs; $300 < C_0 < 3 \times 10^6 \mu\text{g m}^{-3}$), (II) semi-volatility organic compounds (SVOCs; $0.3 < C_0 < 300 \mu\text{g m}^{-3}$), (III) low-volatility organic compounds (LVOCs; $3 \times 10^{-5} < C_0 < 0.3 \mu\text{g m}^{-3}$), (IV) extremely low-volatility organic compounds (ELVOCs; $3 \times 10^{-9} < C_0 < 3 \times 10^{-5} \mu\text{g m}^{-3}$) and (V) ultra-low-volatility organic compounds (ULVOCs; $C_0 < 3 \times 10^{-9} \mu\text{g m}^{-3}$) (Donahue et al., 2011; Bianchi et al., 2019; Schervish and Donahue, 2020).

185 In order to compare the composition difference between β -pinene SOA and limonene SOA, the data of the samples collected twice for the corresponding conditions were integrated and pooled in a subsequent study to investigate the effect of ozone concentration on the organic fraction.

2.4 Determination of highly oxygenated molecules (HOMs)



190 Due to their low saturation vapor pressure, HOMs are low-volatility organic compounds (LVOCs) or even extremely low-
volatility organic compounds (ELVOCs) (Vogel et al., 2016). In this study, HOMs with molecular formulae of $C_{8-10}H_{12-16}O_{6-9}$
and $C_{17-20}H_{26-32}O_{8-15}$ were used for assigning the detected monomers and dimers formed from monoterpene ozonolysis, and
compounds with O/C ratio < 0.7 was used to filter out non-HOM monomers (Tong et al., 2019; Tröstl et al., 2016; Tu et al.,
2016). The formation pathways of HOMs were estimated based on previous research, and mainly through hydroperoxide
channel and Criegee channel (Tomaz et al., 2021; Shen et al., 2021; Kundu et al., 2012). In this paper, monomer refers to C_{8-10}
195 molecule, dimer refers to C_{17-20} molecule.

3 Results and discussion

3.1 Effects of ozone concentration on size distribution and oxidation state of SOA

Particle size distributions of β -pinene SOA and limonene SOA are shown in Figure 2, which typically ranged from 20 to 200
nm, and the median diameters of the mass size distribution were 35~80 nm. The ozone concentration elevation increased the
200 particle size and number concentration of β -pinene SOA and limonene SOA, which may be due to the formation of high
molecular weight and low-volatile dimers (Kristensen et al., 2014). The low-volatile organics promote the formation and
growth of molecular clusters and survive to cloud condensation nuclei-active sizes (Shrivastava et al., 2017). At 50 ppb ozone
concentration, the particle size of limonene SOA exhibit a broader distribution than β -pinene SOA, indicating a plausible
different partition and agglomeration kinetics of them.

205 The weighted average of MW, O atom, O/C ratio, DBE and OS_c increased with the increase of ozone concentration (Table 1).
It shows that high oxidation and high carbon number organic matter prefer to form at high ozone concentration, and most of
the less oxidized organic molecules may be converted into highly oxidized organic molecules (HOMs). Results also show that
high ozone concentration tends to increase oxygen reaction. This may indicate the importance of ozone in the formation of
particulate organic peroxides by ozonation of β -pinene. The higher abundance of organic peroxides in β -pinene SOA than
limonene SOA can explain the higher yield of $\cdot OH$ of β -pinene SOA in liquid water (Tong et al., 2016). Figure S1 shows that
210 the total intensity of the organic signal in the β -pinene SOA sample increased significantly with the increase of ozone
concentration, while the number of organic molecules reached the maximum value at 315 ppb ozone concentration. In contrast,
the total intensity of the organic signal in the limonene SOA sample reached the maximum value at 315 ppb ozone
concentration, and the number of organic molecules decreased significantly with the increase of ozone concentration. The peak
215 intensity of MW ranged from 350 to 450 Da, with β -pinene SOA exhibit a maximum proportion at 565 ppb ozone, but limonene
SOA have the highest proportion at 315 ppb. This trend indicates that MW of biogenic SOA formed from different precursors
have different responses to ozonolysis.

Table S2 shows that for β -pinene SOA, the predominant molecules are $m/z = 274$ ($C_{17}H_{26}O_4$) and $m/z = 183$ ($C_{10}H_{16}O_3$, pinonic
acid) (Jaoui and Kamens, 2003) at 50 ppb ozone concentration, and $m/z = 337$ ($C_{19}H_{30}O_5$), $m/z = 183$ ($C_{10}H_{16}O_3$), $m/z = 186$



220 (C₉H₁₄O₄) and m/z = 370 (C₁₉H₃₀O₇) at 315 ppb and 565 ppb ozone concentration. A higher abundance of m/z = 474 (C₃₂H₄₂O₃)
molecule was only found in β-pinene SOA formed at 50 ppb ozone condition, which is high carbon-containing and less oxygen-
containing compound, indicating that β-pinene ozonolysis products prefer carbon-carbon bonding or oligomerizing at low
ozone concentration. The mostly abundant organics in limonene SOA is always the molecule of m/z = 199 (C₁₀H₁₆O₄, 7-
225 hydroxy limononic acid) in three ozone concentrations, which has also been observed as a major product from limonene
oxidation by ozone (Kundu et al., 2012; Gallimore et al., 2017; Hammes et al., 2019). At 50 ppb ozone concentration, both β-
pinene SOA and limonene SOA exhibited higher abundance of organic molecules with less oxygen-containing (monomer: O
≤ 2 and dimer: O ≤ 4), while the abundance of organic molecules with less oxygen-containing was quite low at 565 ppb ozone
condition. This indicates that high ozone concentration is not conducive to the formation of less oxygen-containing organic
molecules or promotes the conversion of less oxidized organic molecules into high oxygen-containing organic molecules.

230 For limonene SOA, when the ozone concentration is increased from 315 ppb to 565 ppb, the MW, O atom and DBE are
decreased, indicating that the high carbon-containing and oxygen-containing organic molecules in limonene SOA may crack
at high ozone concentration to form low carbon number and less oxidized organic molecules. The element characteristic values
of SOA produced by limonene were generally higher than those of β-pinene, probably due to the faster rate at which ozonolysis
proceeds for limonene ($k_{\text{limonene}+\text{O}_3} = 2.1 \times 10^{-16} \text{ cm}^3 \text{ molecules}^{-1} \text{ s}^{-1}$) as compared to β-pinene ($k_{\beta\text{-pinene}+\text{O}_3} = 1.5 \times 10^{-17} \text{ cm}^3$
235 $\text{molecules}^{-1} \text{ s}^{-1}$) (Atkinson and Arey, 2003). This shows that limonene is preferred to proceed oxygenate and accretion reaction
than β-pinene. Compared to the precursor β-pinene, the unique SOA formed by ozonation of limonene is more concentrated
in high OS_C and O/C ratio, as well as low H/C ratio organic molecules. It seems that the condensation reaction channel of
limonene is more important than β-pinene. Perhaps the high oxygen-containing organic matter contributes more to the larger
size particles of molecular clusters.

240 The maximum carbonyl ratio (MCR) index is suggested as a tool for a better characterization of the sources and the processing
of atmospheric OA components (Zhang et al., 2021). Figure 3 shows the β-pinene SOA- and limonene SOA-contained HOMs
depicted in an MCR-Van Krevelen (VK) diagram. The largest fraction of β-pinene SOA components at 565 ppb ozone
concentration (66%) and the largest fraction of limonene SOA components at 315 ppb ozone concentration (59%) are located
in region II, while only a few compounds show up in region I and IV. Such a distribution pattern indicates that most HOMs
245 formed from ozone-oxidation of β-pinene and limonene are moderately oxidized with MCR values of 0.2~0.5 and only a few
of them with MCR values between 0~0.2. The organic compounds with higher relative abundance (RA) fall mainly in the
region III. Interestingly, the larger RA value HOMs in β-pinene SOA increased, whereas the larger RA value HOMs in
limonene SOA decreased with increasing ozone concentration. It seems that the 565 ppb ozone concentration had some
inhibitory effect on the oxidation of limonene to form HOMs.

250 3.2 Composition and relative abundance of HOMs in β-pinene and limonene SOA



As shown in Figure 4, the identified HOMs mainly exist as dimers with m/z of 350~450 Da. Therein, the limonene SOA has higher RA_{HOMs} than β -pinene SOA. As the ozone concentration increased from 50 to 315 ppb, the peak number-based RA_{HOMs} in β -pinene and limonene SOA kept constant to be ~3% and ~5%, whereas the peak intensity-based RA_{HOMs} increased significantly from 3% to 7% and 14% to 20%, respectively. This indicates that HOMs yield rather than chemical composition diversity of β -pinene and limonene SOA responded to the increasing oxidation degree of precursors. As the ozone concentration is increased further to 565 ppb, both of the peak number- and peak intensity-based RA_{HOMs} in β -pinene SOA increased significantly to 13% and 5%, respectively. In contrast, and the peak number-based RA_{HOMs} in limonene SOA did not change, and the peak intensity-based RA_{HOMs} even decreased slightly to 18%. Thus, we estimate that under high ozone concentration conditions, the ozonolysis of β -pinene produced more HOMs, whereas the overoxidation and disassociation of preformed particulate HOMs may happen to limonene SOA.

Figure 5 shows the O/C, H/C, carbon number and OS_C of common or unique molecules in β -pinene SOA, limonene SOA, or HOMs formed under three ozone concentrations. The comparison revealed that the number of molecules formed by ozonation of β -pinene was higher than by limonene. The distribution of oxidation states in the unique molecules of β -pinene SOA was broad and mostly in the region of lower O/C ratio, while the unique molecules in limonene SOA were distributed in higher OS_C and lower H/C ratio (Figure 5a and 5b), indicating a higher ozonation degree of limonene than that of β -pinene. The HOMs in Figure 5c and 5d showed a similar variation trend as the SOA, confirming the contribution of HOMs to the formation of biogenic SOA.

The identified HOMs in β -pinene and limonene SOA are categorized into groups with different carbon number (C_n) or oligomer clusters and their RA are plotted versus the ozone concentration in Figure 6. Figure 6a shows that the respective distribution pattern of HOM monomers in β -pinene and limonene SOA kept the same under different ozone concentrations. Therein, the HOM monomers in limonene SOA are mostly exist as C_{10} species, while HOM monomers in β -pinene SOA mainly comprise compounds with eight carbon atoms (C_8). This may be due to the fact that the carbon backbone of endocyclic limonene is retained on ozonolysis, whereas the terminal vinylic carbon of exocyclic β -pinene is cleaved (Ma and Marston, 2008; Kundu et al., 2012). Figure 6b shows that the RA_{HOMs} dimmers in β -pinene and limonene SOA exhibits different variation trends as the increasing of ozone concentrations. About the β -pinene SOA, the carbon numbers of HOM dimmers have the same pattern at 50 and 315 ppb ozone concentrations, with the RA increased from C_{17} to C_{18} and then gradually decreased for C_{19} and C_{20} species. However, at 565 ppb ozone condition, the RA of HOM dimers continually decreased from C_{17} to C_{20} compounds. In contrast, the C_n pattern of HOM dimers in limonene SOA kept the same under different ozone concentrations, which reached a maximum for C_{19} species. The different C_n patterns of HOM dimers in β -pinene and limonene SOA may be due to the front ones tend to form via the combination of C_8 and C_9 or C_9 and C_9 , whereas the later ones are preferred to form via the combination of C_{10} and C_9 . Such an inference may also explain the higher averaged carbon number, oxygen number, and molecule weight of limonene SOA than β -pinene SOA (Table 1).



3.3 Volatility of HOMs in β -pinene and limonene SOA

To explore the volatility of HOMs, the identified HOMs have been assigned to semi-, low-, and extremely low-volatile organic compounds (SVOCs, LVOCs, and ELVOCs) and their RA were shown in Figure 7. Figure 7a shows that the LVOCs subgroups dominate the peak intensity of both β -pinene and limonene SOA-contained HOMs, the pattern of which resembles the combined RA of SVOCs, LVOCs, and ELVOCs. Moreover, the RA of LVOC type HOMs in β -pinene SOA increases with increasing ozone concentration, while that in limonene SOA reaches the maximum value at the ozone concentration of 315 ppb. Figure 7b shows that formula number-based total RA of SVOCs, LVOCs, and ELVOCs increased as the increasing of ozone concentrations for both β -pinene and limonene SOA, with the RA of LVOCs equivalent to the ELVOCs. Thus, Figure 7 reflects that mass variation of β -pinene and limonene SOA during ozone chemistry are largely driven by LVOCs and ELVOCs. In addition, the peak intensity- and formula number-based RA_{HOMs} of LVOCs and ELVOCs in limonene SOA is significantly higher than that of β -pinene SOA, indicating that LVOCs and ELVOCs contribute more to the HOMs of limonene SOA. These findings agree with previous discovery of limonene ozonolysis to be more efficient than β -pinene ozonolysis in generating ELVOCs (Jokinen et al., 2015). Moreover, the volatility and carbon oxidation state averages of HOMs were also found to change in similar trends as that of LVOCs, ELVOCs, and ULVOCs in SOA, but the trends of β -pinene SOA and limonene SOA are different as shown in Figure S2.

Figure 8 shows the O/C ratio of β -pinene and limonene SOA constituents versus their estimated volatility. Figure 8a-8c shows that the O/C ratio distribution of ULVOCs in β -pinene SOA is broadened as the increase of ozone concentration. Meanwhile, both of O/C ratios and RA of IVOCs, SVOCs, LVOCs, and ELVOCs increased prominently, and the abundance of compounds with low O/C ratios decreased. This indicates that deeper oxidation of β -pinene may decrease the overall volatility of SOA particles via changing the relative abundance of organic matter with different volatilities. Figure 8d-8f shows that O/C ratio and volatility distribution of limonene SOA components vary slightly. This may correlate with the preference of forming highly oxygenated, low-volatility reaction products by limonene via an autoxidation mechanism (Jokinen et al., 2015). Moreover, the enrichment of high RA ELVOCs in limonene SOA confirms that limonene is more likely to form particulate ELVOCs even ULVOCs than β -pinene via ozonolysis, which may be related to the higher reactivity of limonene due to its intrinsic two double bonds and endocyclic structure.

The molecular corridor is a two-dimensional framework of volatility and molecular weight of SOA components bounded by two boundary lines of n-alkanes (C_nH_{2n+2}) with O/C = 0 and sugar alcohols ($C_nH_{2n+2}O_n$) with O/C = 1, which helps to explain the physicochemical properties in the evolution of SOA (Li et al., 2016; Xie et al., 2020b). Figure 9 shows the correlation between the volatility and molecular weight of the common and unique molecules of β -pinene SOA and limonene SOA under three ozone conditions. The number of unique organic molecules formed by monoterpene oxidation is higher at 50 ppb ozone concentration, accounting for about 15~20% of the total number of molecules. Furthermore, unique organic molecules at 50 ppb ozone concentration are mainly concentrated in the SVOCs and LVOCs regions, while unique organic molecules at 315 ppb and 565 ppb ozone concentration are mainly concentrated in the ELVOCs and ULVOCs region. Compared to limonene



SOA, many low volatile organic components close to the sugar alcohol ($C_nH_{2n+2}O_n$) line were found in β -pinene SOA, indicating that ozone concentration has a greater impact on the SOA formed from ozonolysis of β -pinene. ULVOCs with molar mass of $500\sim 800\text{ g mol}^{-1}$ account for a substantial fraction of β -pinene SOA formed at 565 ppb ozone, whereas the SVOCs, LVOCs, and ELVOCs with molar mass of $200\text{--}600\text{ g mol}^{-1}$ dominate the limonene SOA. The volatility difference of β -pinene and limonene SOA associates with the plausible different partition or stabilization mechanisms of HOMs and low volatility species under different ozone concentrations, including the SOA aging related volatilization.

3.4 Potential formation mechanisms of HOM monomers and dimers in β -pinene and limonene SOA

Previous study shows that gas-phase monomer and dimer products formed through $RO_2 + RO_2$, $RO_2 + HO_2$, RO_2 isomerization, and stabilized Criegee intermediate + carboxylic acid contributed to SOA formation. But aldehydes and ketones are often converted to carboxyl and ester groups by Baeyer-Villiger reactions with the hydroperoxides and peroxyacid in particle phase, while hydroperoxides and peroxyacid are converted to acids, alcohols, or ketones (Claflin et al., 2018). Due to the high activity of these pathways, the dimers with very low volatility are expected to be distributed directly onto particles after gas phase production. The dimers are strongly influenced by particle phase chemistry, possibly involving the combined effects of accretion reactions ($C_{8-10} + C_{8-10} \rightarrow C_{17-20}$) and decomposition of high molecular weight compounds ($C_{20} \rightarrow C_{17-19}$) (Pospisilova et al., 2020). The formation of HOMs dimers is mainly through the accretion reaction of various HOMs monomers RO_2 and the termination reaction of dimer RO_2 formed by the further reaction of the closed shell dimer with O_3 , and they may also be through C_{10} reaction of RO_2 with monoterpenes. The HOMs trimers may be formed via the accretion reaction of dimer RO_2 and monomer RO_2 , which will not be analyzed in detail later.

HOMs monomers may be formed via hydroperoxide channel and oxygen-increasing reactions (OIR) of Criegee channel (Tomaz et al., 2021; Shen et al., 2021; Kundu et al., 2012). The possible formation mechanisms of C_{10} HOMs monomers from the β -pinene and limonene ozonolysis are shown in Figure 10. There is a high probability that ozone first reacts with endocyclic double bond of limonene, opens the chain to form Criegee radical, and then formed $C_{10}H_{14}O_7$ and $C_{10}H_{16}O_8$. Ozone concentration had a great influence on HOMs of C_9 and C_{10} in β -pinene system, and the formation path is as depicted in Figure S3. Here, a number of series of HOM monomers with CH_2 were found (Fig. 11). Among them, $C_{10}H_{16}O_7$ was formed in all three ozone concentrations, but $C_9H_{14}O_7$ and $C_{10}H_{14}O_7$ were formed at 315 ppb and 565 ppb ozone concentrations, and $C_9H_{12}O_7$ was formed at high ozone concentrations. This suggests that β -pinene increases the possibility of carbonyl formation at high ozone concentrations. The formation of $C_{10}H_{16}O_9$ corresponds to the monoterpene oxidation product (Ehn et al., 2014; Berndt et al., 2016; Brean et al., 2019). In this experiment, only β -pinene SOA was detected at high ozone concentration, and the O number of HOMs dimers under this condition could be up to 15, while $C_{10}H_{16}O_9$ was not detected in the limonene SOA, and the maximum O number of the HOMs dimers was 13. This may be due to the fact that the oxidation degree of RO_2 termination reaction of some HOMs in β -pinene SOA is higher than that of limonene.



The presence of $C_{17}H_{26}O_8$ through the decomposition of $C_{19}H_{28}O_{11}$ with loss of a ketene from the internal containing a labile trioxide functionality, and the conversion of the unstable acyl hydroperoxide groups to carboxyl groups (Kahnt et al., 2018). Tomaz et al. (2021) found that the reaction between $C_{10}H_{15}O_6$ and $C_{10}H_{15}O_8$ radicals may also contribute to the formation of $C_{20}H_{30}O_{12}$ dimer, corresponding monomers and dimers were found in the limonene system, β -pinene at high ozone concentration, $C_{10}H_{16}O_8$ organic matter, and subsequently detected the $C_{20}H_{30}O_{12}$ dimer, which verified this conclusion. The chemical formulas along with suggested molecular structures of the identified dimer compounds are shown in Tables S3. Most of the HOMs products of the two monoterpenes were very similar, while the RA of the different HOMs varied widely, suggesting that the reaction pathways are similar, but the degree of branching in the reaction mechanism is different.

Accretion reactions transform the mass from monomers to oligomers, yielding products with a higher number of carbon atoms and converting semi-volatile molecules into higher-molecular weight compounds with lower saturation vapor concentrations (Barsanti et al., 2017). These reactions have been studied under laboratory conditions and suggested to play an important role in ambient environment (Berndt et al., 2018). This observation shows that the particle-phase chemistry causes changes in the overall SOA composition over the ozone concentration observed here. High molecular weight and low volatile dimer compounds have been identified as important components of environmental compounds. The monomeric building blocks of the dimer esters formed by β -pinene ozonolysis are attributed to one of the dicarboxylic acids, such as $C_9H_{14}O_4$ (*cis*-pinic acid), $C_8H_{12}O_4$ (*cis*-norpinic acid), and $C_8H_{14}O_5$ (diaterpenylic acid), which can be well characterization of pinene oxidation products during dimer formation (Kenseth et al., 2018). Trimer-like compounds are typically in the range of 450~650 Da (Kundu et al., 2012), with limonene SOA having a higher RA than β -pinene SOA as shown in Figure 4. The formation of trimers is associated with the presence of two double bonds in limonene. One of the C=C double bonds is first oxidized to the dimer products, while the double bond of the other provides a reaction point for further oxidation of the dimers, making it easier to form dimer RO_2 radicals (Guo et al., 2022). It is noticeable that the mechanism of dimer formation in similar monoterpene systems remains unresolved and warranty follow up studies (Kenseth et al., 2018).

4 Conclusions

The composition of aerosols varies systematically with gas-particle partitioning. At lower mass concentrations, polar components seem to dominate the aerosol, while at higher concentrations, VOCs may condense (Grieshop et al., 2007). Environmental SOA components are considered to be concentration-dependent, in agreement with the results of this paper. HOMs in SOA formed by ozone oxidation are also affected differently by ozone concentration. The precursors of β -pinene and limonene have the same molecular formula but different structures, with β -pinene was found to be more obviously affected. The RA_{HOMs} in β -pinene SOA was more significantly affected by ozone concentration, while that of limonene SOA was almost hardly affected by ozone concentration, which was related to the high activity of limonene with two double bonds and endocyclic structure. β -pinene was found more inclined to form the monomer (C_8) and dimer (C_{17}) of HOMs, while limonene



was more inclined to form HOMs monomer (C_{10}) and dimer (C_{19}), which is obviously related to the way of broken bonds after ozone oxidation. In addition, distinct volatilities and abundances of HOMs in β -pinene and limonene SOA reflects the different molecular response of particulate reaction products to biogenic precursor oxidation states, leading to different SOA size and number concentration distribution profiles. Higher ozone concentrations (315 ppb and 565 ppb) were favorable for the formation of HOMs and ELVOCs, and the number of unique organic molecules was higher. Compared with β -pinene SOA, the abundance of ELVOCs in limonene SOA contributes more.

In addition to the effect of ozone concentration on HOMs, other oxidants in the atmosphere have different effects on them. For example, NO_2 inhibited the formation of highly oxidized dimer products by suppression of autoxidation (Rissanen, 2018). When considerable $\cdot OH$ was present, the potential dimer sources were also suppressed (Zhang et al., 2017). Moreover, Simon et al. (2020) found a continuous decrease in the oxidation level of α -pinene SOA and yields of HOMs as the temperature decreased from 25 to -50 °C. Similar result was also confirmed in urban field samples (Brean et al., 2020). Current mass spectrometry techniques can only obtain information on the molecular formula of the HOMs, hindering the study of the detailed formation mechanism of many atmospheric precursors. Therefore, experimental conditions and new analytical techniques need to be developed to characterize HOMs rapidly and in detail.

Data availability. The dataset for this paper is available upon request from the corresponding author (fupingqing@tju.edu.cn).

Author contribution. DL participated in the investigation, methodology, software development, formal analysis, and writing of the original draft. SZ and SC participated in the methodology and formal analysis. YZ collected the samples. All co-authors participated in validation as well as in reviewing and editing of the manuscript. PF and HT participated in the conceptualization, project administration, and funding acquisition.

Competing interests. The authors declare that they have no conflict of interests.

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Table 1. The chemical characteristics of β -pinene and limonene SOA samples.

[O ₃] / ppbs	MW	O	O/C	DBE	OS _c	Volatility fractions (%)				
						ULVOCs	ELVOCs	LVOCs	SVOCs	IVOCs
β -Pinene SOA										
50	305	4.77	0.30	4.69	-0.98	14	28	33	17	8
315	307	5.49	0.35	4.40	-0.89	24	23	28	17	8
565	319	5.93	0.37	4.54	-0.84	30	23	23	16	8
Limonene SOA										
50	326	6.07	0.36	4.78	-0.82	12	21	30	25	12
315	349	6.88	0.39	4.99	-0.76	26	21	22	21	10
565	339	6.58	0.38	4.87	-0.78	26	21	23	20	10

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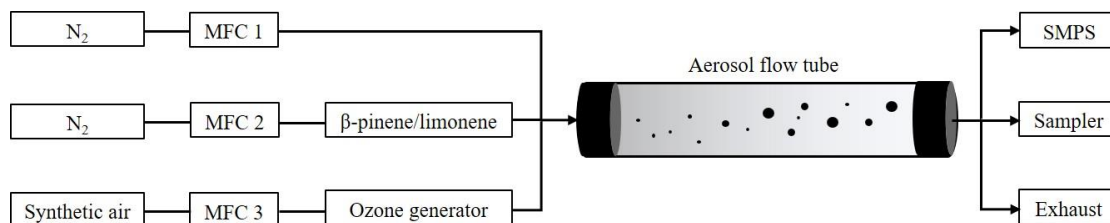
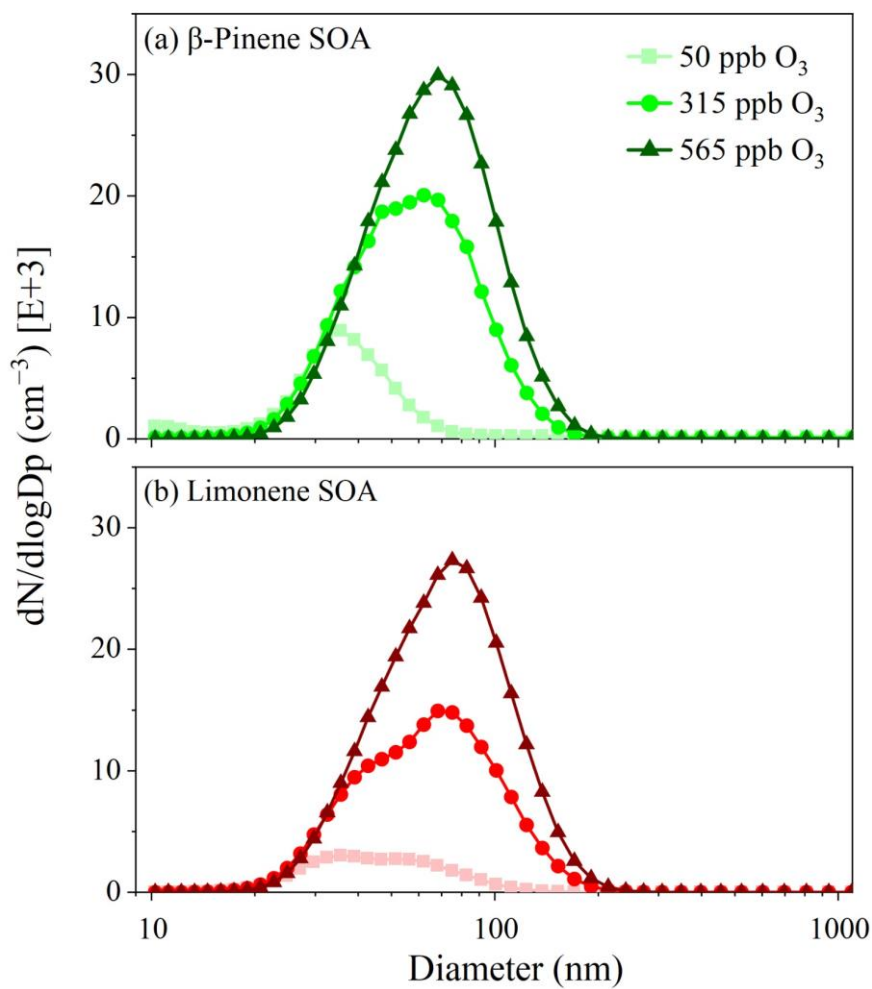


Figure 1. Schematic of the experimental setup for generation and collection of SOA. MFC: mass flow controller. SMPS: scanning mobility particle sizer.



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Figure 2. Distribution of the apparent particle sizes as measured by SMPS of β -pinene SOA (a) and limonene SOA (b).

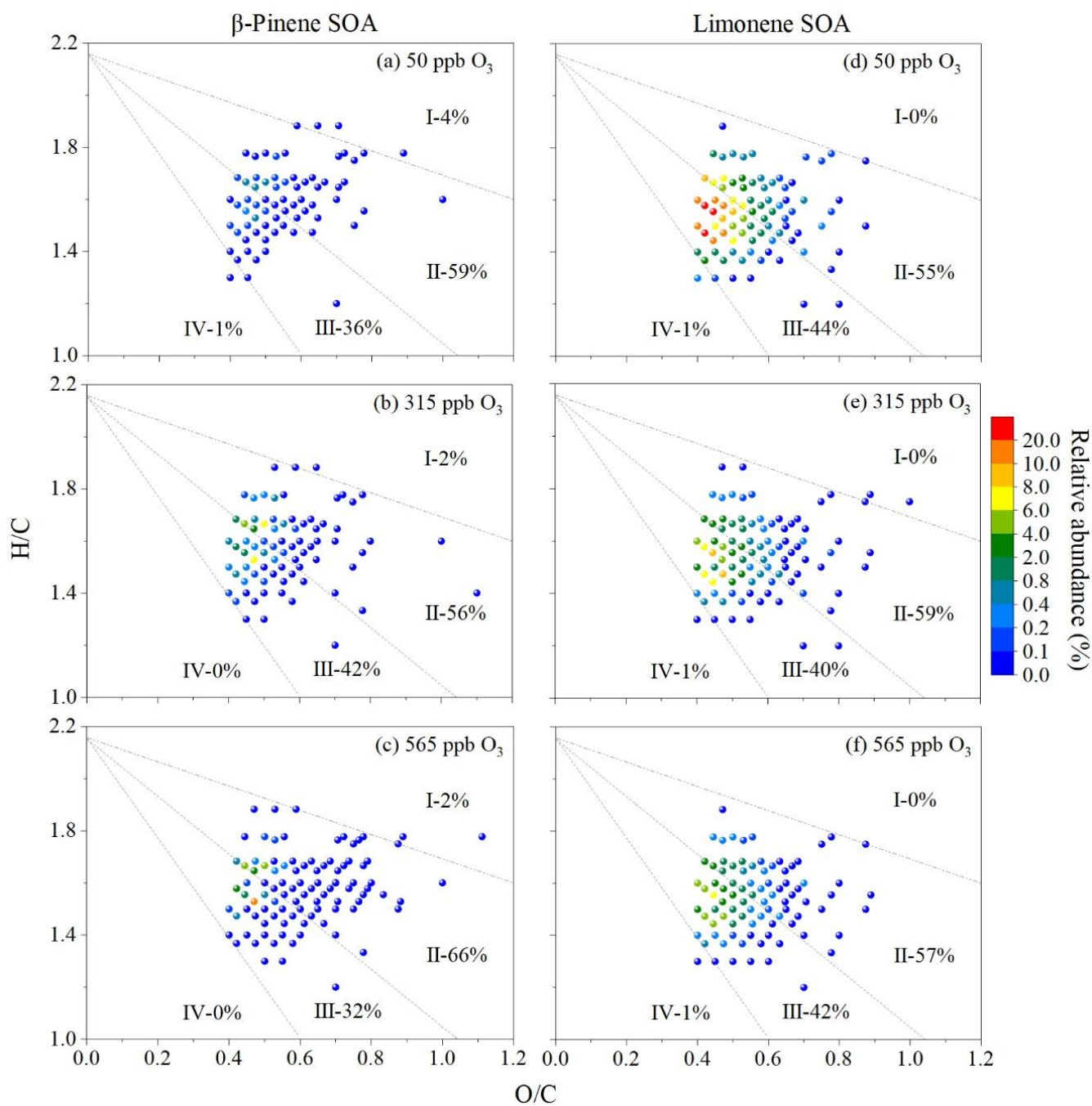
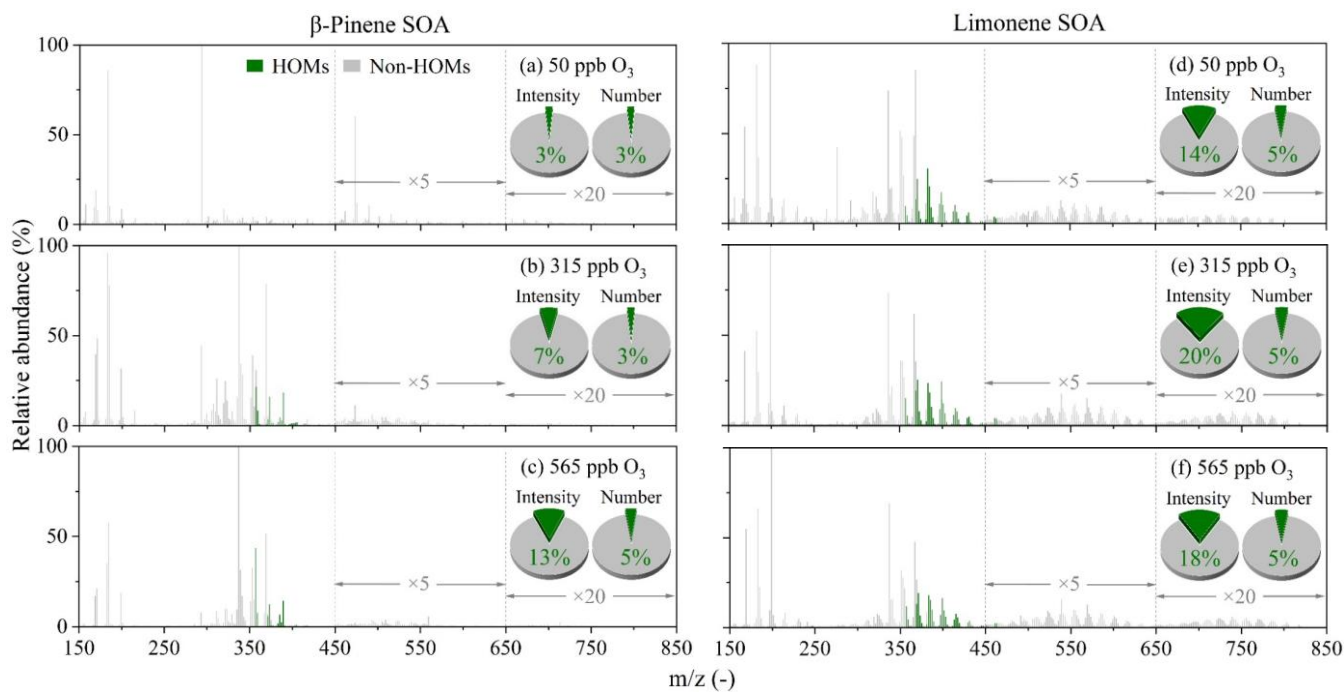
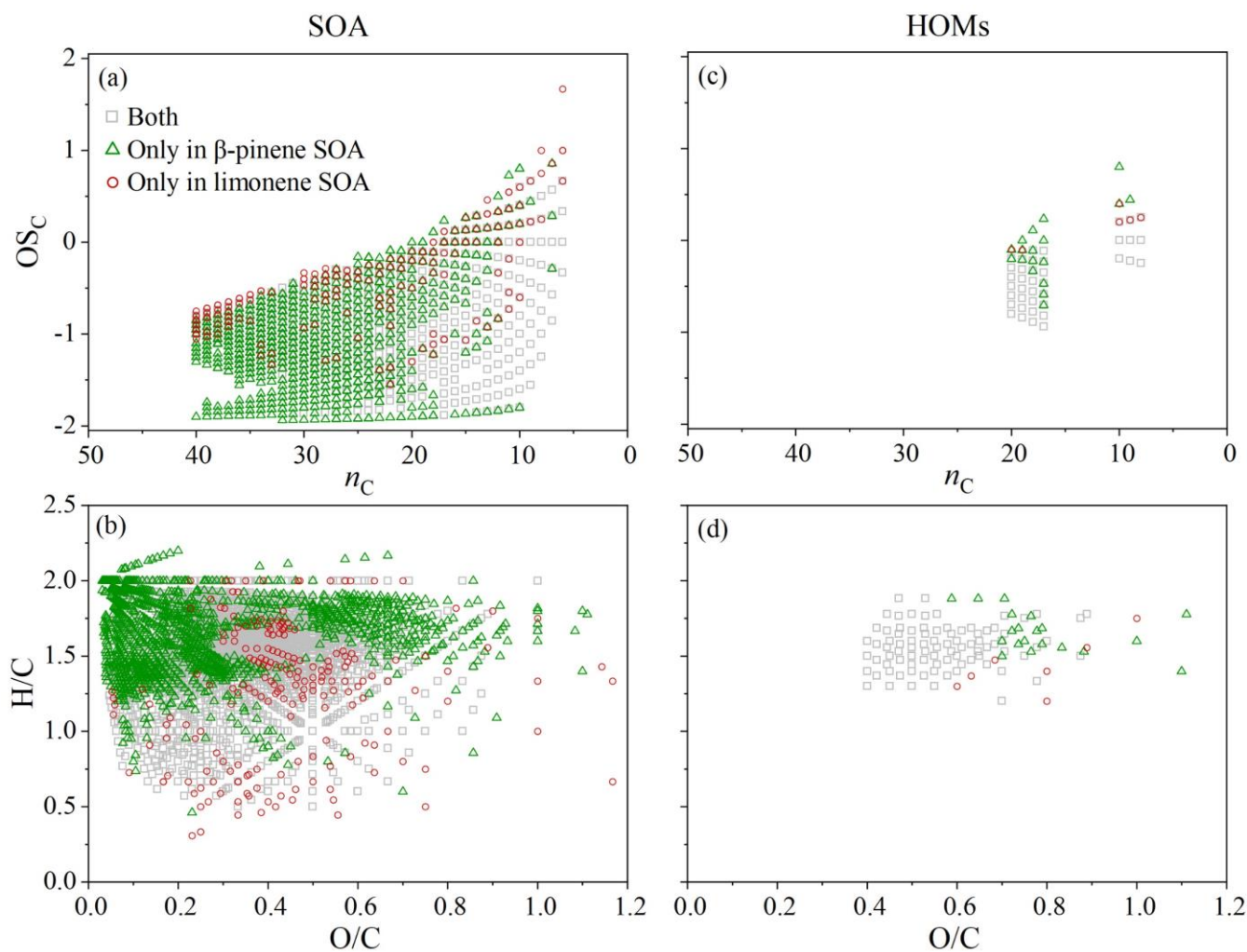


Figure 3. MCR-VK diagrams of β -pinene SOA (a, b, c) and limonene SOA (d, e, f) that formed at different ozone concentrations. The colors of the dots indicate the relative abundances of compounds.



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Figure 4. Mass spectral fingerprint and relative abundances of HOMs (green) and non-HOMs (gray) in β -pinene SOA (a, b, c) and limonene SOA (d, e, f) that formed at different concentrations of ozone. The relative abundances of compounds with m/z 450 - 650 and 650 - 850 were increased by factors of 5 and 20, respectively. The pie charts indicate the ion intensity- and ion number- based relative abundances of different compounds.



650

Figure 5. The carbon oxidation state (OS_C) vs. the number of C atoms (n_C) (a, c) and Van Krevelen diagrams (b, d) for the unique assigned formulas from β -pinene SOA and limonene SOA and the corresponding HOMs (c, d). Gray squares represent assigned formulas observed both in β -pinene SOA and limonene SOA. Green triangles and red circles represent assigned formulas observed only in β -pinene SOA and limonene SOA, respectively.

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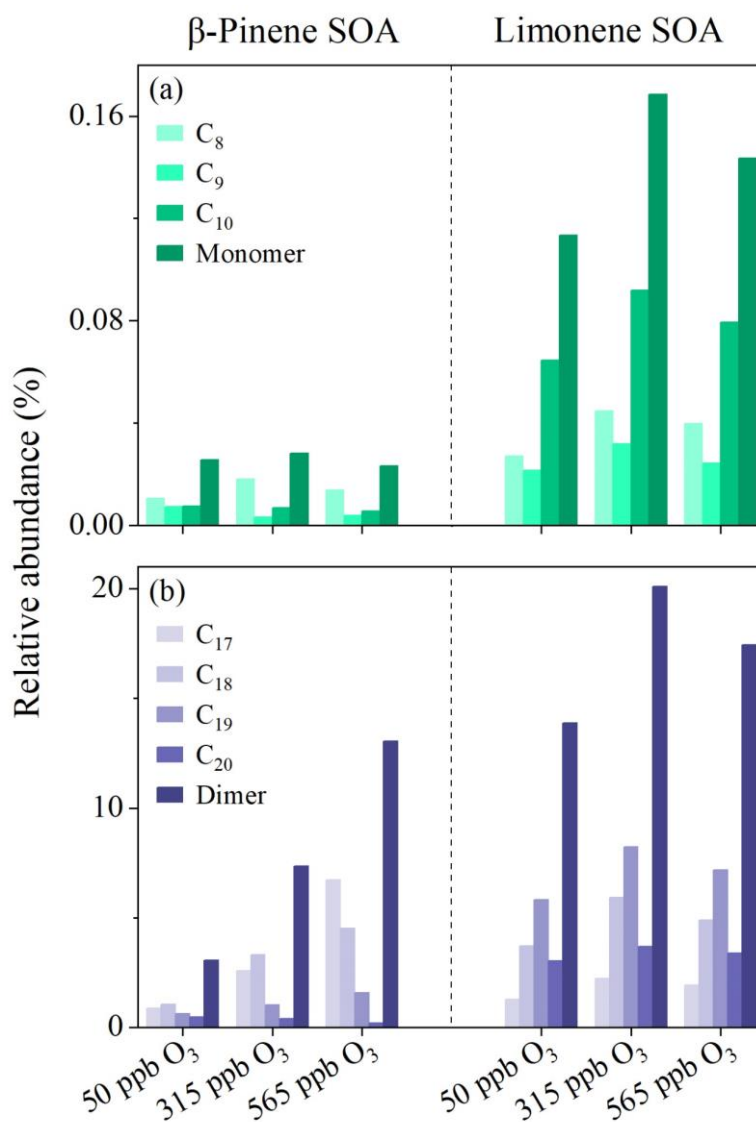
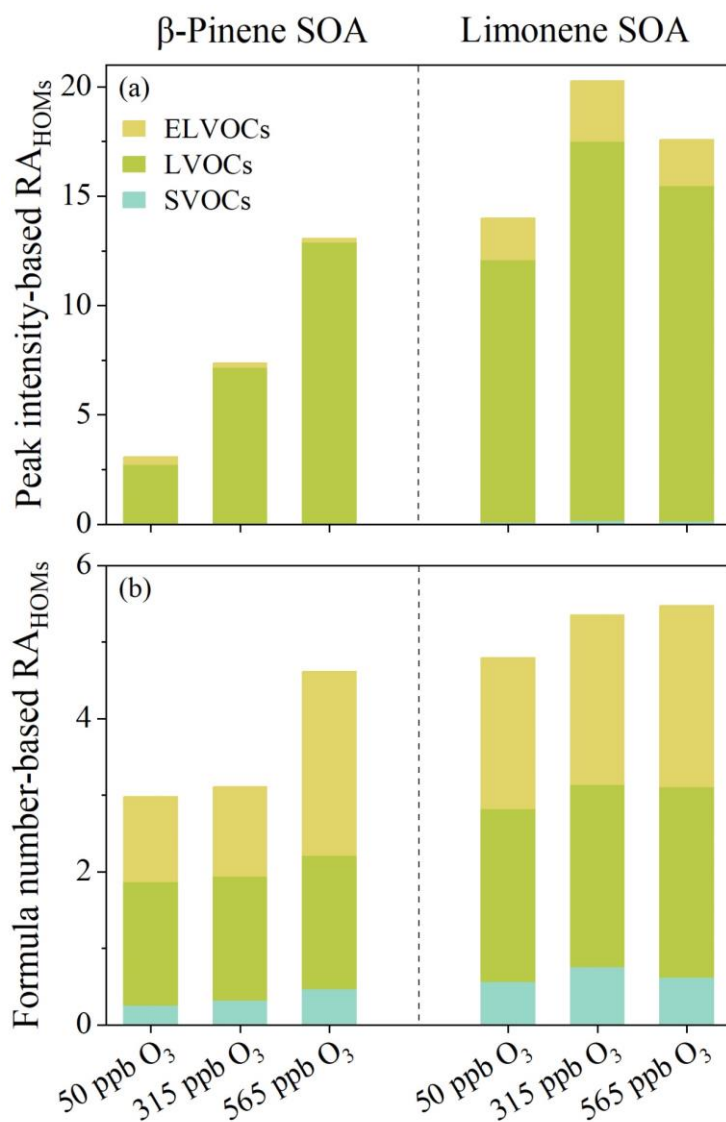
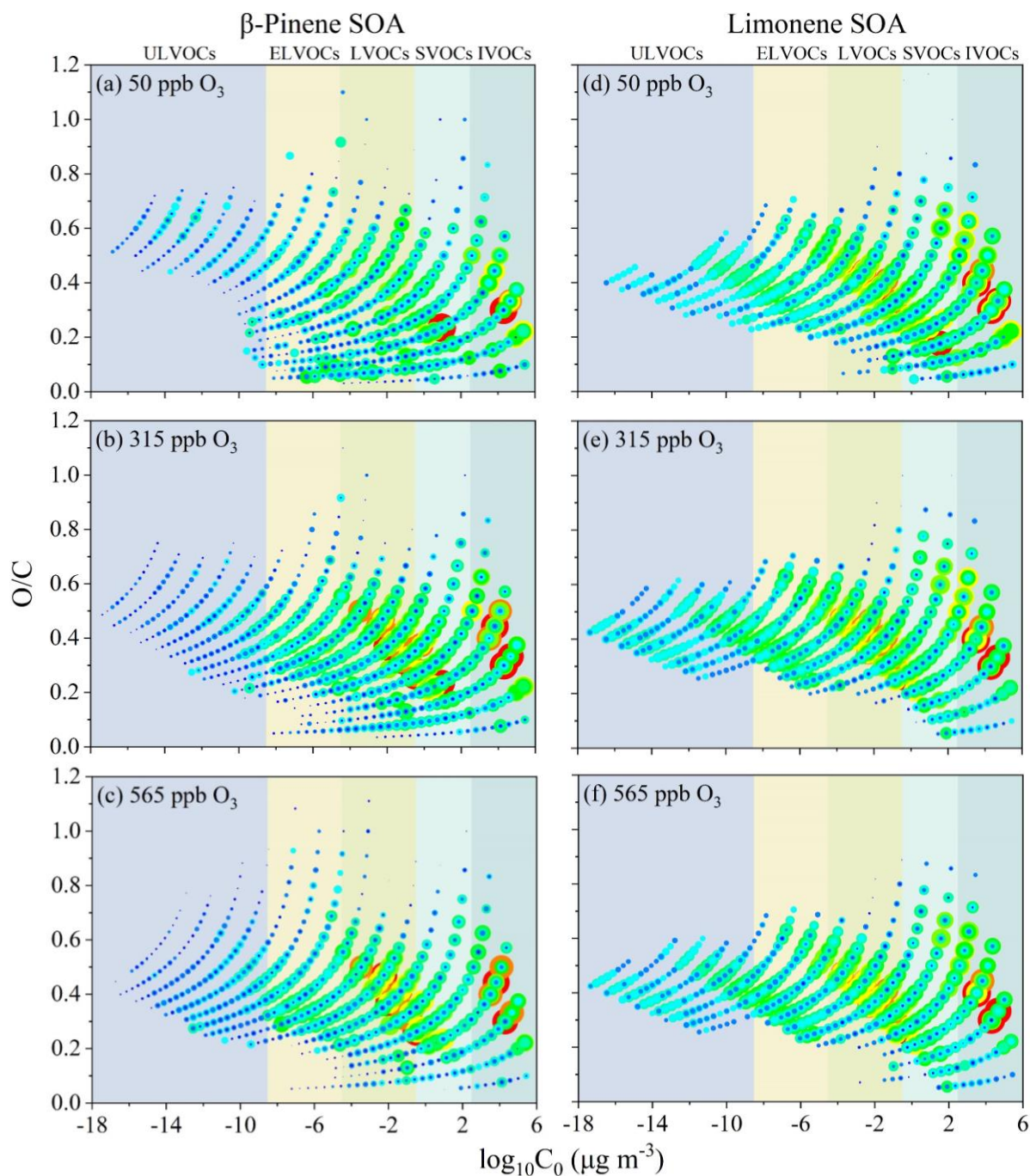


Figure 6. The relative abundance of HOMs monomers (a) and dimers (b) identified in β -pinene and limonene SOA as a function of carbon number (C_n).



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Figure 7. The peak intensity- (a) and formula number- (b) based relative abundance of HOMs with different volatilities in SOA particles produced from ozonolysis of β -pinene and limonene under the three ozone concentrations.



665 **Figure 8.** The pure compound saturation mass concentration (C_0) and the atomic oxygen and carbon ratios (O/C) of β -pinene SOA (a, b, c) and limonene SOA (d, e, f). Markers are color-coded and the dot size is scaled to the logarithm of relative abundance.

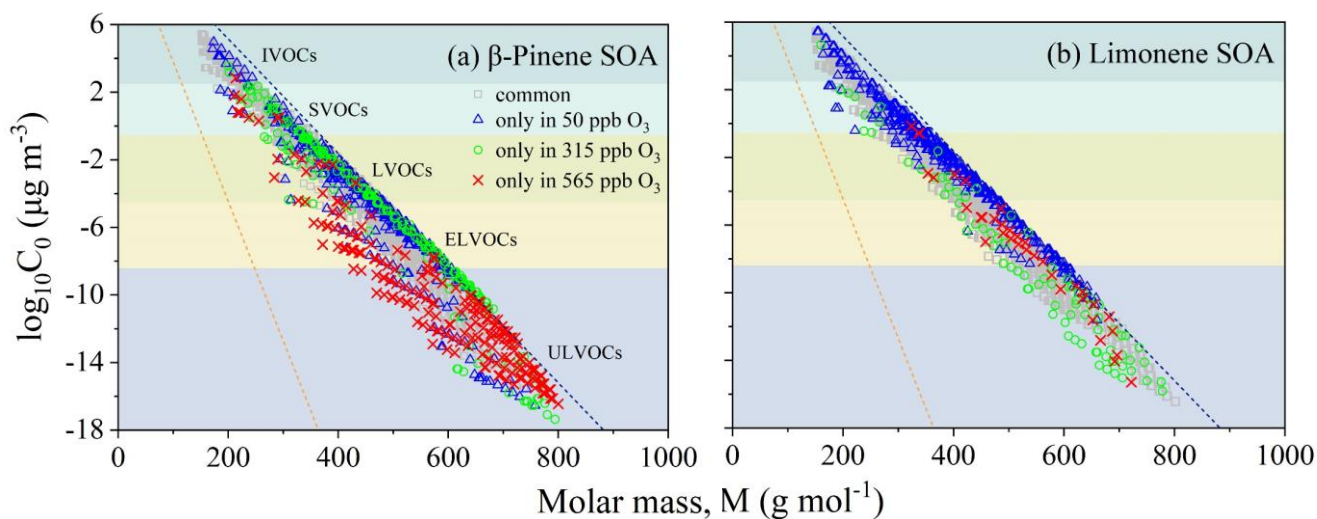
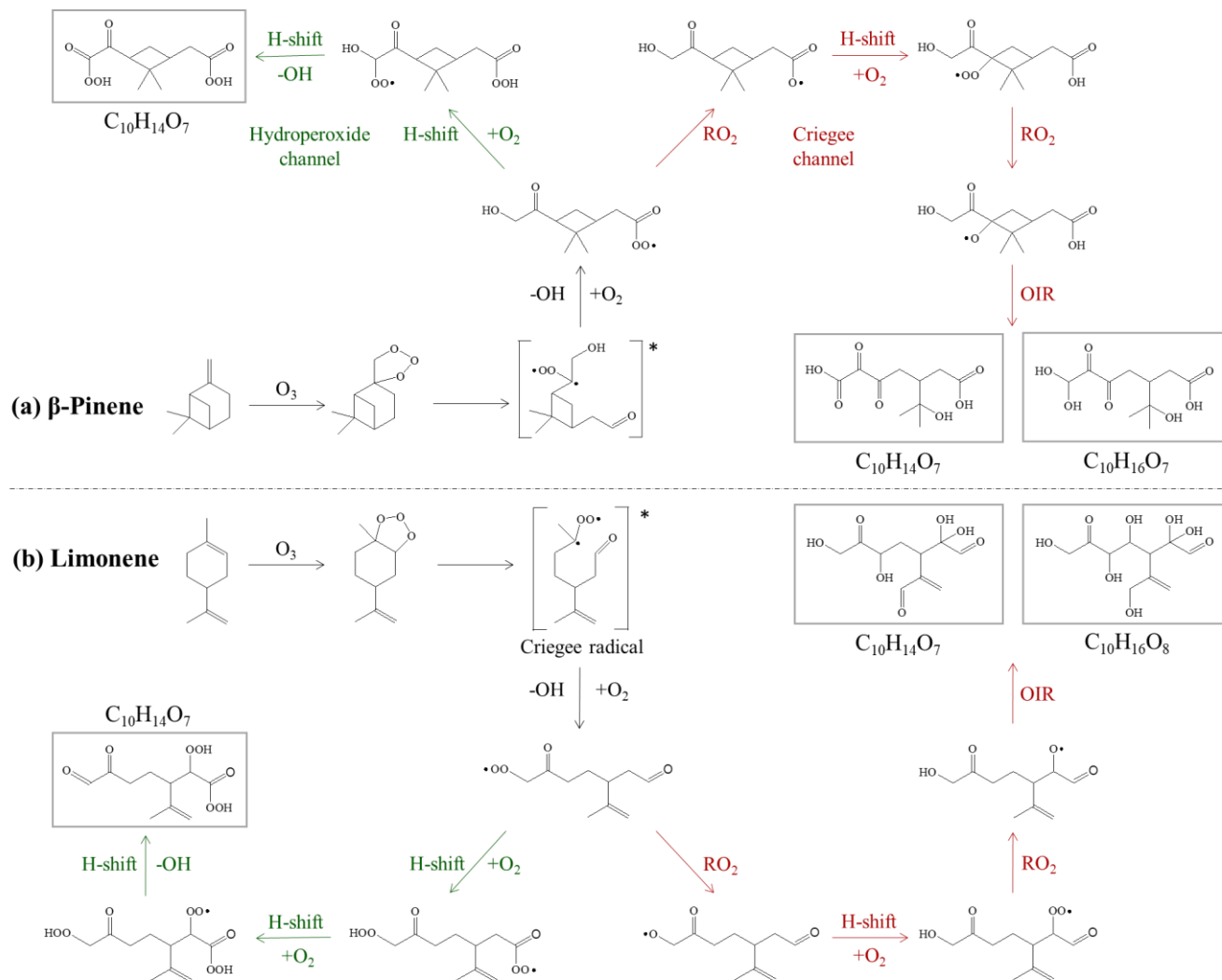


Figure 9. Molecular corridors of β -pinene (a) and limonene SOA (b) formed at 50 ppb, 315 ppb and 565 ppb ozone conditions. The gray squares represent the common compounds identified in SOA formed at three different ozone concentrations. The blue triangles, green circles, and red crosses indicate compounds only found in 50, 315, and 565 ppb ozone, respectively. The dotted lines represent linear n -alkanes C_nH_{2n+2} (blue with $O/C = 0$) and sugar alcohols $C_nH_{2n+2}O_n$ (orange with $O/C = 1$).

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675 **Figure 10.** Proposed formation mechanism of C_{10} HOMs from the β -pinene and limonene ozonolysis via hydroperoxide channel (green) and oxygen-increasing reactions (OIR) (H-shift \rightarrow O₂ \rightarrow RO₂) of Criegee channel (red) (Tomaz et al., 2021; Shen et al., 2021; Kundu et al., 2012). The organic molecules in the gray rectangle are the hypothesized structures.

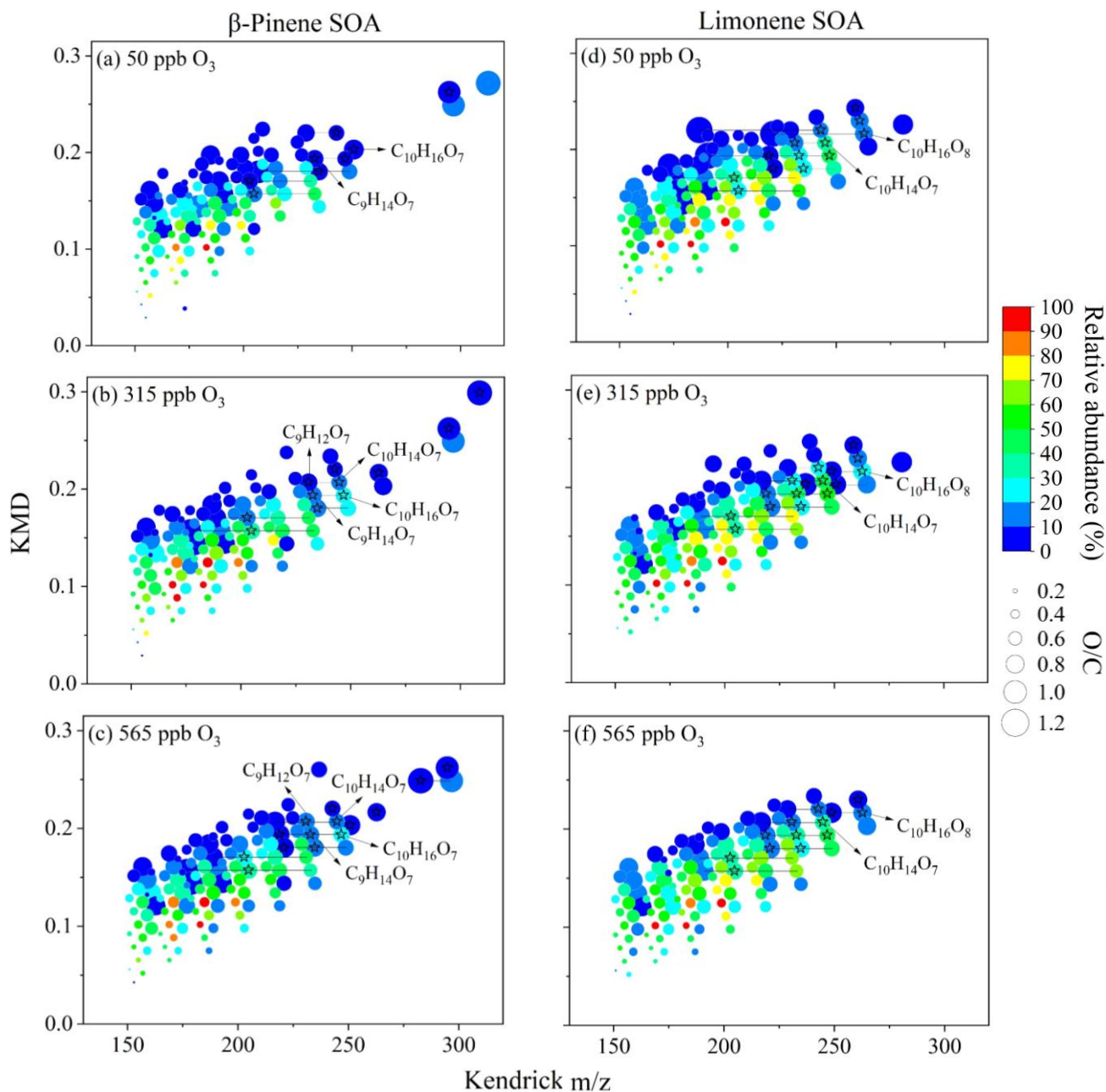


Figure 11. Kendrick mass defect of detected organic compounds in β -pinene SOA (a, b, c) and limonene SOA (d, e, f). Different colors represent the logarithm of relative abundance. Different dot sizes denote the atomic ratio of oxygen to carbon (O/C). The black pentagrams delegate HOMs.