We thank the reviewers for the detailed and insightful comments. We have addressed the reviewers'
 comments point by point as indicated below.

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4 <u>Reviewer #1:</u>

5 This paper shows some interesting results from a novel experiment involving taking ambient air 6 in an urban environment and conducting a chamber experiment after enhancing the 7 concentrations of VOCs. The main emphasis of this paper is the use of α -pinene and β -8 caryophylene, the characterisation of the SOA produced using aerosol mass spectrometry and 9 inferences are drawn regarding their contribution to particulate concentrations in the region.

10 1. Overall, this is a nice piece of work and well within the journal's remit. However, I do think 11 that the significance is a little overblown in places and the authors need to express more caution 12 in how they interpret some of the results. In spite of their statements otherwise, this is not a true 13 simulation of atmospheric processes (see below), there are a few PMF-specific subtleties that 14 aren't taken account of and how reliably this can be projected onto the wider world is open to 15 question on a number of levels. But in spite of these issues, the conclusions are largely sound and 16 this deserves to get published. I therefore recommend publication with minor revisions. 17 Response: We thank the reviewer for the thoughtful insights. To address the reviewer's major

concerns, we have toned down the significance of our conclusions and expanded discussions on PMF-specific subtleties in the revised manuscript. We think that the lab-in-the-field experiments can mimic certain atmospheric processes, shed light on understanding the sources of OA factors, and reflect potential issues that PMF analysis encounters. These responses will be discussed in detail when we address the reviewer's specific comments. Meantime, we agree with the reviewer that more studies are warranted to test the reliability of our conclusions to the wider world.

24 General Comments:

25 2. This paper makes the assumption of α -pinene and β -caryophylene being representative of 26 monoterpenes and sesquiterpenes respectively. While these are common assumptions made in the 27 community and the VOCs are both very well studied, their overall representativeness is in question 28 because the level of oxidation in SOA from different precursors are known to vary substantially 29 between compounds (Alfarra et al., Atmos. Chem. Phys., 13, 11769-11789, 10.5194/acp-13-

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11769-2013, 2013). This is especially true of the sesquiterpenes, as difficulties in working with a
number of these compounds means that we lack data on a large subset of these. This should be
discussed and any evidence to support this assumption properly cited.

33 Response: In this study, we selected α -pinene and β -caryophyllene as representatives due to the 34 following reasons. Firstly, both VOCs are widely studied in the literature. Secondly, they are the 35 most abundant species in monoterpenes and sesquiterpenes, respectively (Guenther et al., 2012; 36 Helmig et al., 2007). Thirdly, the mass spectra of SOA from VOCs in the same class generally 37 share similar features. For example, the correlation coefficient (i.e., R) between the mass spectra 38 of SOA from the β -caryophyllene and α -humulene is 0.97 (Bahreini et al., 2005). Still using the 39 mass spectra reported in Bahreini et al. (2005), the R between α -pinene SOA and other 40 monoterpenes SOA (β -pinene, α -terpinene, myrcene, and terpinolene) is larger than 0.9. Fourthly, 41 in addition to the similar mass spectra, the time series of α -pinene in the southeastern U.S. is similar 42 to that of other monoterpenes, such as β -pinene and camphene (Xu et al., 2015a). The above 43 reasons have been added in the revised SI. We also add a caveat that future studies using other 44 monoterpenes and sesquiterpenes are still in need.

We agree with the reviewer that many properties of SOA (i.e., yield, hygroscropicity, etc)
from different monoterpenes or sesquiterpenes are different. To be precise, we have replaced
"representative" with "important" in some sentences in the revised manuscript.

48 3. Throughout the manuscript, there is a general tendency to treat LO-OOA and MO-OOA as 49 defined chemical entities, whereas the truth is that these represent reductions of highly complex 50 chemical systems and the exact factors reported are known to vary dataset to dataset. While 51 common trends have been noted in terms of behaviour and mass spectral profile, their exact mass 52 spectral nature depends on the measurement location and season and in many cases (particular 53 in the wintertime), PMF will fail to separate them at all, instead returning a single OOA factor. 54 This must be discussed in a meaningful manner in the introduction and discussion because it adds 55 an extra layer of nuance to the results.

Response: We agree with the reviewer that OA factors from PMF analysis represent complex chemical systems. Understand what these OA factors represent is one of many motivations of this study. In the revised manuscript, we have modified the language to avoid the confusion to treat OA factors as defined chemical entities. We also agree with the reviewer that the exact mass spectral nature of OA factors varies with locations. We would like to point out that the mass spectra of LO-OOA are highly similar (R > 0.95) across all the seven datasets in our study (Fig. R1). This is one of many evidence to suggest that LO-OOA at different datasets may have similar sources.

63 Regardless, we clearly limit our conclusions to the southeastern U.S.



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67 In the introduction and implications sections of the revised manuscript, we have added the 68 discussion that a single OOA factor is resolved in some cases, especially in winter.

69 4. Related to the above point, there seems to be a general assumption that PMF had adequately 70 accounted for the new SOA being formed, but in my mind, the decrease in MO-OOA in response 71 to the β -carvophylene experiments in particular raises a number of red flags because this implies 72 that the data model didn't hold and the factorization wasn't sound. The authors need to pay much 73 closer attention to whether the factorisations 'worked' or not; a good starting point would be 74 inspecting the residuals (e.g. *Q*/*Q*exp) as a function of time over the course of the experiments and 75 *if they positively correlate at all with the amount of additional SOA, this would imply that PMF* 76 has failed to capture the chemistry perfectly.

Response: We agree with the reviewer that the decrease in MO-OOA after β-caryophyllene injection raises a red flag and implies that factorization is not perfect. We have examined the PMF residual (i.e., Q/Q_{exp}) in α -pinene and β -caryophyllene perturbation experiments. As shown in Fig. R2a, in α -pinene experiments, the difference in Q/Q_{exp} between "Chamber_Bf" (before α -pinene injection) and "Chamber_Af" (after α -pinene injection) is not statistically significant. This suggests that PMF analysis has adequately accounted for the newly formed α -pinene SOA. This is consistent with the observation that in α -pinene experiments, no OA factors show unexpected dramatic decrease after α -pinene injection.

85 In contrast, in β -caryophyllene experiments, there is a clear pattern that Q/Q_{exp} in 86 "Chamber Af" is larger than that in "Chamber Bf" (Fig. R2b). This is likely because of the rapid 87 change in the subtleties of OA composition caused by the newly formed β -caryophyllene. However, 88 the behavior of Q/Q_{exp} is not quite expected because the OA mass spectra after injecting β -89 caryophyllene are almost identical to those before perturbation (i.e., R between Chamber Bf and 90 Chamber Af is >0.99 as shown in Fig. R3b). The larger Q/Q_{exp} in β -caryophyllene experiments 91 than α -pinene experiments may be a result of that ΔOA (i.e., the difference in OA concentration 92 between "Chamber Af" and "Chamber Bf") is larger in β -caryophyllene experiments (average value 1.95 μ g m⁻³ over 6 experiments) than α -pinene experiments (average value 0.98 μ g m⁻³ over 93 94 14 experiments). Regardless, under the simulated circumstances, PMF analysis cannot adequately 95 capture the newly formed β -caryophyllene SOA.

96 We would like to clarify that our conclusions are not dependent on if PMF has perfectly 97 accounted for the newly formed SOA, mainly because similar issues could also happen in the 98 analysis of ambient data. The β-caryophyllene perturbation experiments simulate a scenario when 99 there is a sudden change in the OA composition caused by an airmass encountering a plume or 100 change in OA sources due to shift in wind direction. Under these circumstances, PMF analysis 101 may have difficulty in accurately apportioning the OA sources. The simulated scenarios and the 102 observed PMF issues have been observed in previous studies. For example, in the Figure 9 of Sun 103 et al. (2016), an increase of hydrocarbon-like OA (HOA) is usually accompanied by a decrease in 104 cooking OA (COA) and verse vice. Another example is that figure 5 of Reyes-Villegas et al. (2018) 105 showed that a biomass burning plume leads to unexpected rapid variations in the concentration of 106 many OA factors on the time scale of minutes. Last example is that in the figure S10 of Milic et 107 al. (2017), the PMF residual during a biomass burning plume is orders of magnitude higher than 108 other sampling periods. Emphasizing the limitations of PMF analysis is one goal of this study.







Fig. R2. The PMF residual (Q/Qexp) during "Chamber Bf" and "Chamber Af" periods for (a) α-111

pinene and (b) β -caryophyllene perturbation experiments. 112



Fig. R3. The correlation coefficient by comparing the OA mass spectra between "Chamber Bf"

116 and "Chamber_Af" in (a) α -pinene and (b) β -caryophyllene perturbation experiments. 5. The modelling work presented in section 3.6 left me slightly confused as to what the authors were trying to achieve and how. The text in the main article would suggest that an updated scheme is being compared with a very old one, but the supplement seems to say that specific mechanisms have been added here. This must be clarified.

121 Response: We use the modelling work as one of the evidence to support our hypothesis that the 122 major source of LO-OOA in this region is the oxidation of MT and SQT by various oxidants. In 123 section 2.6, we described two simulations (i.e. "default simulation" and "updated simulation") with 124 different organic aerosol treatment. Compared to "default simulation", we incorporate two recent 125 findings in the "updated simulation". Firstly, we implemented MT+NO₃ chemistry to explicitly 126 account for semivolatile organic nitrate compounds that contribute to SOA. Secondly, we 127 improved the parameterization of SOA formation from MT+O₃/OH based on a recent study by 128 Saha and Grieshop (2016). In section 3.5 of revised manuscript, we pointed out that SOA_{MT+SQT} 129 in the updated simulation reasonably reproduces the magnitude and diurnal variability of LO-OOA 130 for each site. The model bias is within ~20%. The reasonable agreement between modeled 131 SOA_{MT+SOT} and LO-OOA at multiple sites and in different seasons serves as one piece of evidence 132 to support our hypothesis that LO-OOA largely arises from the oxidation of MT and SQT in the 133 southeastern U.S.

6. Also, as pointed out later in this section, this work does not directly preclude that other precursors may be contributing and the discussion dealing with this relies heavily on inferences drawn from the literature, so this work isn't really that dramatic a result in how it is presented now. I would suggest a more defined modelling experiment is constructed around a clear working hypothesis. This could just be a case of making the work shown here clearer and moving material from the supplement to the main article.

More generally, I noted a very odd tendency to leave certain pertinent (and in many cases interesting) details in the supplement that maybe should have been given more prominence or at least linked to the main article better. For example, the box modelling described in section S6 was very interesting, but it wasn't clear at all how this fit into the narrative of the main article. I also had a hard time reconciling the information about the CMAQ runs in the main article and the supplement as well (see above). I would revise what information goes where, using the main article

- for the discussions relating to the scientific arguments and making sure the material in thesupplement is purely technical detail in support of this.
- 148 Response: We have toned down the significance of conclusions in the revised manuscript. We
- 149 have also re-organized the main text and SI, and improved the linkage between two parts. Many
- 150 details, although interesting, are kept in the Appendix or SI, because we prefer to focus on the
- 151 main message and keep the logic of manuscript easy to follow.
- 152 Specific comments:
- 153 7. Line 95: When saying 'representative urban', please be specific about what type of urban site
- 154 *this (e.g. background) and how you qualify this statement.*
- 155 Response: We have deleted the word "representative".
- 156 8. Line 115: What counts as 'too much' SOA and why?

157 Response: As discussed in response to reviewer's comment #4, when there is a sudden change in 158 the OA composition, PMF analysis may have difficulty in accurately apportioning the OA sources, 159 as shown in β -caryophellene perturbation experiments and previous studies. This is why we tried 160 to avoid producing too much SOA in the perturbation experiments.

- 161 It is challenging to quantify what counts as "too much". As shown in β-caryophellene 162 perturbation experiments, even though (1) the newly formed β-caryophyllene SOA only increases 163 the OA concentration by roughly 2 μ g m⁻³ and (2) the OA mass spectra after injecting β-164 caryophyllene are almost identical to those before perturbation (i.e., R >0.99 as shown in Fig. R3b), 165 PMF analysis encounters difficulty in accurately apportioning the OA sources.
- 166 9. Line 265: It has long been shown that α -pinene SOA produced in chambers produces a mass 167 spectrum that is similar to LO-OOA and given that this mass spectral profile is also seen in the 168 presence of strong emitters of this VOC (e.g. temperate and boreal forests), the case for 169 α -pinene SOA being a strong contributor to LO-OOA has never really been in doubt in this 170 reviewer's opinion. Why is the evidence presented here any more 'direct' than those published 171 previous? While the perturbation experiment does indeed produce LO-OOA as retrieved using 172 PMF, this retrieval is still based solely on mass spectral similarity, so I would contend that this 173 does not really present any new evidence to this effect.

174 Response: We thank the reviewer for pointing this issue out. The "directness" of our conclusions 175 is not clearly communicated in the original manuscript and caused some confusions. While we 176 acknowledge that the mass spectra comparison approach largely improves our understanding of 177 OA factors, we think that the perturbation experimental approach provides more objective and 178 quantitative conclusions by addressing some limitations of the mass spectra comparison approach. 179 The mass spectra comparison approach has the following limitations. Firstly, the similarity 180 between two mass spectra is a subjective determination. In other words, what correlation 181 coefficient [®] value implies SOA from a certain source contributes to one OA factor? For example, 182 the R values between laboratory-generated α-pinene SOA (using HONO as OH source) with LO-183 OOA, isoprene-OA, and MO-OOA in this study are 0.96, 0.88, and 0.81, respectively. Using these 184 R values to imply whether α-pinene SOA contributes to a certain OA factor or not is subjective. 185 As another example, Jimenez et al. (2009) showed that the mass spectrum of α -pinene SOA 186 becomes more similar to that of MO-OOA (i.e., LV-OOA in older study) than that of LO-OOA 187 (i.e., SV-OOA in older study) with photochemical aging. The ability to determine when and how 188 much α-pinene SOA is apportioned to MO-OOA based on an R value is subjective. Secondly, the 189 conclusions from mass spectra comparison approach are qualitative. Even if the mass spectrum of 190 α -pinene SOA is the most similar to LO-OOA, this similarity does not guarantee that all α -pinene 191 SOA is apportioned into LO-OOA and this similarity does not provide information regarding what 192 fraction of α -pinene SOA is apportioned into LO-OOA.

193 The perturbation experiments could address the limitations of mass spectra comparison 194 approach and provide more objective and quantitative conclusions. Firstly, the perturbation 195 experiments simulate a short period of time with increasing α -pinene SOA concentration. we 196 perform PMF analysis on the combined ambient data and perturbation data. PMF analysis does 197 not distinguish SOA from natural α -pinene vs. from injected α -pinene, so that PMF analysis can 198 objectively apportion α -pinene SOA into factors. Thus, the conclusions from the perturbation 199 experiments are directly drawn without any subjective judgement on the similarity in mass spectra. 200 Secondly, using the perturbation data, we attempt to quantify the fraction of fresh α -pinene SOA 201 that is apportioned into different factors (i.e., ~80% into LO-OOA, ~20% into isoprene-OA, 0% 202 into MO-OOA, COA, and HOA). Although further studies are required to extrapolate the 203 conclusions from perturbation experiments to real atmosphere, a similar quantitative 204 understanding cannot be obtained from simple mass spectra comparison approach. Thirdly, the

205 perturbation experiments have the potential to utilize subtle differences across the entire the mass 206 spectrum to evaluate the sources of OA factors. Based on previous laboratory study, the mass 207 spectrum of α -pinene SOA is highly correlated (R = 0.97) with that of β -caryophyllene SOA 208 (Bahreini et al., 2005). Using a mass spectra comparison approach would suggest that these mass 209 spectra are too similar to be differentiated by PMF analysis. However, perturbation experiments 210 show different behaviors of α -pinene SOA and β -caryophyllene SOA. That is, a fraction of the 211 fresh β-caryophyllene SOA is apportioned into COA factor, but similar behavior is not observed 212 for α -pinene SOA. The different behaviors are likely due to the subtle differences in their mass 213 spectra. For example, f_{55} (i.e., the ratio of m/z 55 to total signal in the mass spectrum) is typically 214 higher in β -caryophyllene SOA than α -pinene SOA (Bahreini et al., 2005; Tasoglou and Pandis, 215 2015), and the mass spectrum of COA is characterized by prominent signal at m/z 55 (Fig. 2). 216 Overall, the perturbation experiments provide more objective and quantitative insights into the 217 sources of OA factors than traditional mass spectra comparison approach.

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We have added the above discussions in the revised manuscript.

219 10. Line 280: The fact that the oxidation rate of VOCs is dependent on oxidant concentration is
220 very well established in kinetics. The discussion regarding this observation would be considered
221 pointing out the obvious to many. It would be far more useful if a quantitative relationship with
222 ozone concentration could be reported here.

223 Response: In Line 280, we are not making the conclusion that the oxidation rate of VOCs depends 224 on oxidant concentration. Instead, we use this well-established conclusion to explain our 225 observation that the LO-OOA enhancement amount correlates with oxidant concentration. As the 226 SOA formation depends on a number of variables, including temperature, relative humidity, the 227 concentrations of oxidants, NO_x, and existing particles, etc, the VOCs oxidation rate is not 228 equivalent to SOA formation amount. In this study, the α -pinene perturbation experiments were 229 conducted at different times of day (i.e., from 9am to 9pm) and under different conditions (i.e., T, 230 RH, oxidant, NO_x, etc). Despite the large difference in reaction conditions, the LO-OOA 231 enhancement amount correlates well with O3 concentration, suggesting that the oxidant 232 concentration plays a more controlling role in the amount of OA formed in α -pinene experiments 233 than other reaction variables do.

As a side note, we also want to point out that the oxidant concentration is not the sole variable in determining the SOA formation from β -caryophyllene, which is in contrast to α -pinene experiments. As shown in Fig. S22 in revised SI, the LO-OOA enhancement amount in β caryophyllene perturbation experiments is greatly affected by NO₂ level. For example, for two experiments with similar O₃ concentration and injection time, more LO-OOA is formed in the experiment with a lower NO₂ level (Fig. S22f in revised SI).

240 11. Line 286: An alternative explanation here is that the experimental set-up here was not
241 conducive to HOM formation for whatever reason. This should be added as a caveat.

242 Response: We agree with the reviewer and have added this caveat in the revised manuscript.

243 12. Line 309: There is a major problem with this statement; the results indicate that the β -244 caryophylene SOA spectrum to be represented by PMF as a combination of the LOOOA and COA 245 mass spectra, but it would be a mistake to imply in any way that it is producing two 'types' of OA 246 (this is clarified later in the manuscript but it is ambiguous here). Issues about the quality of the 247 *PMF* retrieval aside (see above), in the hypothetical situation that there is an environment with a 248 mixture of cooking and biogenic SOA, PMF will likely still separate these because it determines 249 factors not just by mass spectral profile but by temporal profile, so would still return factors 250 corresponding to cooking and an average of biogenic SOA from all sources. The only situation I 251 could think where this would be a problem is if monoterpene and sesquiterpene SOA formation 252 were not well matched temporally, in which case I could see how the COA-like component of 253 sesquiterpene SOA would manifest as 'mixing' between the cooking and biogenic SOA factors, but 254 this would be evident in the temporal profiles.

255 Response: We agree with the reviewer that PMF separates factors based on features in both mass 256 spectrum and time series. However, we note that the temporal variations of COA and SOA from 257 monoterpenes and sesquiterpenes do not guarantee a clean separation between different sources. 258 For example, the concentrations of many oxidation products of monoterpenes (e.g. pinonic acid, 259 pinic acid, etc), COA, and LO-OOA show similar increasing trend near sunset (Allan et al., 2010; 260 Xu et al., 2015b; Zhang et al., 2018). The emissions of sesquiterpenes and diurnal variations of 261 sesquiterpene SOA are not well-studied. Thus, it is possible that some sesquiterpene SOA is 262 apportioned into COA.

As mentioned in the manuscript, we agree with that COA is mainly from cooking emissions. However, the perturbation experiments show the possibility that COA could include β caryophyllene SOA. There is no evidence in the literature to support that cooking OA factor is purely from cooking and does not have any biogenic SOA.

13. Line 350: How much more 'realistic' is this? While this would give a more life-like oxidant and NOx background, given that the chamber walls will act as a sink of VOCs, radicals and particles, I would still expect that the precursor perturbations would have to be higher than typical atmospheric concentrations to achieve realistic SOA concentrations and consequently have a higher VOC:NOx ratio. This must be discussed in an objective manner and while some of this is touched on in the supplement, it's kind of glossed over in the main article.

273 Response: We would like to clarify that we did not want to produce realistic SOA concentration. 274 Instead, we aimed to produce small amount of SOA, which would not significantly perturb the 275 composition of existing organic aerosol. Based on the chamber volume and injected α -pinene 276 volume, we injected about 14ppb α -pinene. Most of injected α -pinene is carried out of the chamber 277 by dilution air and we estimated that only 2-5 ppb α -pinene is reacted in the chamber. We have 278 added this information in the main text.

279 14. Figure 6: The caption of this figure is excessively long.

Response: We prefer to keeping the caption descriptive of the figure, such that the readers couldcomprehend the figure after reading the caption.

282 15. Line S477: This doesn't make sense. Why would the solver reduce the concentration of MO-

283 OOA because it had been added to? I find it more likely that there was a breakdown in the data

284 model and mass was being erroneously rotated out of the factor. This is undesirable, but also feeds

into the discussion above regarding the relationship with COA.

286 Response: As stated in the SI, the reason why MO-OOA decreases after adding β -caryophyllene

287 is unknown. One possible explanation is that since the mass spectrum of β -caryophyllene SOA is

288 more similar to LO-OOA than MO-OOA, PMF solver somehow decreases the concentration of

289 MO-OOA to reduce the overall fitting residual. We agree with the reviewer that this result is

290 undesirable. However, as pointed out in response to reviewer's comment #4, similar situation

291 could happen in ambient measurements. This issue deserves more attention.

- 292 16. Line S480: What other studies?
- 293 Response: Please see response to comment#4.
- 294 Technical comments:
- 295 17. Line 113: Please be more specific over which VOCs are anthropogenic vs biogenic. The word
- 296 *'respectively' does not work when four are listed.*
- 297 Response: We have deleted the word "respectively".
- 298 18. Line 179: Why not saturated fatty acids?
- 299 Response: We have deleted the word "unsaturated", so that the "fatty acids" in the revised sentence
- 300 includes both unsaturated and saturated compounds. We have also cited Allan et al. (2010) in this
- 301 sentence.
- 302 19. Line 119: Correct 'concentration' to 'concentrations'.
- 303 Response: We have made this correction in the revised manuscript.
- 304 20. Line 184: What are the oxidation states in each instance?
- Response: We have added the oxidation states (i.e., -0.70 to -0.34 for LO-OOA and from -0.18 to
- 306 0.71 for MO-OOA in the southeastern U.S.) in the revised manuscript.
- 307 21. Section 2.2: Please specify the materials used for the aerosol and gas sampling lines.
- Response: Teflon tubing and stainless steel tubings were used for gas and aerosol sampling lines,respectively.
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319 **<u>Reviewer #2:</u>**

- 320 The manuscript presented by Xu et al. proposes an interesting study on the contribution of the
- 321 oxidation of alpha-pinene and caryophyllene to the SOA mass observed in the S.E.-US. The
- 322 characterization of SOA generated in the lab-in-the-field smog chamber was performed using an
- 323 aerosol mass spectrometer. Overall the work performed in this study is good and fall within the
- 324 scope of the journal. However, I think the conclusions proposed from the PMF analysis/chamber
- 325 experiments are not always well sustained and more caution should be taken when extrapolating
- 326 *the results.*
- Response: We thank the reviewer for the positive comments. In the revised manuscript, we haveadded more caveats regarding our conclusions drawn from the perturbation experiments.
- 329 General comments
- 330 1. The authors should carefully review their paper and avoid the repetition between the main text
- and the SI. At many places, sentences are duplicated and are not useful. However, some important
- 332 *details are left within the SI and should be moved to the main manuscript.*

333 Response: We have re-organized the main text and SI, and improved the linkage between two parts.

- 334 2. The authors should provide more information in the PMF analysis and provide the elementary 335 checks to validate their analysis. For instance, it is a bit surprising that the factors don't change 336 throughout the experiments (i.e. bf vs af) while significant perturbation has been made to the 337 system. Or do the authors consider/claim that most of the SOA sampled in the ambient are formed 338 from the oxidation of alpha-pinene or carvophyllene? In addition, we could expect that the fresh 339 LO-OOA (formed within a few minutes, without lights) would have different signatures that LO-340 OAA formed in the atmosphere (aged SOA, formed from different chemistry, ...). How do the 341 factors correlate throughout the experiments: e.g. LO-OOA Amb Bf vs LO-OOA Chamber Af? 342 Response: We respond to the reviewer's comment by addressing some confusions regarding PMF 343 analysis. Firstly, we performed PMF analysis on the combined ambient and perturbation data. Each
- 344 OA factor has a constant mass spectrum throughout the study, regardless of ambient or chamber
- 345 periods. In other words, the mass spectra of factors do not change between "Chamber Bf" and
- 346 "Chamber_Af". Secondly, we did not introduce significant perturbation to the system. In contrast,
- 347 our goal is to produce small amount of SOA, which would not cause dramatic change in the OA

348 composition and would not bias PMF analysis. For example, the difference in average OA 349 concentration between "Chamber_Bf" and "Chamber_Af" is within 4 μ g m⁻³ for all perturbation 350 experiments. Thirdly, we did not consider/claim that most of the SOA sampled in the ambient are 351 formed from the oxidation of α -pinene or β -caryophyllene. This assumption is not related to our 352 conclusions.

Regarding the last question in this comment, we believe that the reviewer suggests to compare the OA mass spectra between "Chamber_Bf (before VOC injection)" and "Chamber_Af (after VOC injection)". As shown in Fig. R3 (in response to reviewer#1), the mass spectra between two periods are almost identical, with R larger than 0.99 for all experiments. This is desired because we do not intend to introduce significant change in the OA composition after perturbation.

358 3. How do the identified factors correlate with the reference MS? How do the residuals evolve 359 throughout an experiment? How does alpha-pinene-derived LO-OOA correlate with 360 caryophyllene derived LO-OOA? Overall, the authors should provide more statistical analyses in 361 order to give a robust validation of the analysis.

Response: In this study, we resolve and evaluate PMF factors according to the standard procedure outlined in Zhang et al. (2011). The detailed description on OA factors and justification of PMF results have discussed in section S3 of SI. As discussed in the SI, the PMF factors have the same features as those in the literature. More importantly, the PMF results in this study are consistent with our previous measurements (from 2012 to 2015) at the same site and in similar seasons, as shown in Fig. S14 in revised SI. The mass spectra of LO-OOA are similar (R > 0.95) across all the seven datasets in this study (Fig. R1 in response to reviewer#1's comment#3).

369 In α -pinene perturbation experiments, the PMF residual is not significantly different 370 between "Chamber_Bf" and "Chamber_Af", suggesting that PMF analysis has adequately 371 accounted for the newly formed α -pinene SOA. More detailed discussions can be found in response 372 to reviewer#1's comment #4.

As noted in response to the reviewer's comment#2, the mass spectrum of LO-OOA is the
same throughout the study, regardless of ambient vs. perturbation and regardless of α-pinene vs.
β-caryophyllene experiments.

376 4. The authors should report the concentration of the inorganics in their experiments and in case 377 of significant concentrations of sulfate estimate the aerosol acidity. Indeed, the presence of acidic 378 aerosols can lead to multiphase reactions (e.g. reactive uptake of IEPOX) that could greatly 379 impact the SOA composition. In addition, an estimation (modeling?) of the concentrations of other 380 VOCs would be interesting (especially isoprene). Ozonolysis of alpha-pinene leads to the 381 formation of OH radicals, which could further react and oxidize alpha-pinene but also other VOCs 382 present in the ambient air. The authors should discuss this possibility and provide more 383 information in the background of the chamber/ambient air. As it is, the conclusions proposed in 384 the paper on the potential increase of the IEPOX-OA or COA factors from the oxidation of alpha-385 pinene and caryophyllene, respectively appear speculative (correlations are not sufficient to 386 validate such trend: $r\sim0.5$). For instance, the authors could estimate the amount of IEPOX (thus 387 isoprene) formed in the chamber to explain the formation of IEPOX-OA and check if the numbers 388 make sense or not.

Response: We interpret that the reviewer's key question as the following: "is the enhancement in isoprene-OA factor due to the oxidation of isoprene in the chamber after injecting α -pinene?" The most direct evidence to rule out this hypothesis is that the concentration of IEPOX+ISOPOOH (C₅H₁₀O₃•I⁻) and isoprene hydroxyl nitrates (C₅H₉NO4•I⁻), measured by I⁻ HR-ToF-CIMS, did not change after α -pinene injection (Fig. S3b in revised SI). This suggests that the α -pinene injection does not introduce isoprene oxidation in the chamber.

395 The relatively weak correlation between Δ isoprene-OA and Δ LO-OOA (where the Δ 396 indicates the difference in concentration between the "Chamber Af" and "Chamber Bf") across 397 all α -pinene perturbation experiments is not contradictory to the conclusion that α -pinene SOA 398 influences isoprene-OA factor. The weak correlation could be because α -pinene SOA in different 399 perturbation experiments were formed under different conditions (e.g., NO_x) and had different 400 mass spectra (Fig. 7 in revised manuscript). Thus, the fraction of α -pinene SOA apportioned into 401 isoprene-OA factor varies with experiments and results in the weak correlation. However, we 402 would like to point out that although the correlation between Δ isoprene-OA and Δ LO-OOA across 403 all a-pinene perturbation experiments is relatively weak, the time series of isoprene-OA and LO-404 OOA in the same α -pinene perturbation experiment are strongly correlated. The R is 0.88 for the 405 α -pinene perturbation experiment on 07/20 (Fig. R4a). It is well studied that isoprene produces

406 SOA slower than α -pinene, as isoprene SOA involves higher-generation products. If the 407 enhancement in isoprene-OA factor is due to isoprene oxidation, the enhancement is expected to 408 occur later than the enhancement in LO-OOA, but it is not observed in the experiments. Thus, the 409 strong correlation between isoprene-OA and LO-OOA in the same α -pinene perturbation 410 experiment serves as another evidence that the enhancement in isoprene-OA factor is due to 411 interference from newly formed α -pinene SOA, rather than oxidation of isoprene after injecting α -412 pinene.



413

414 Fig. R4. (a) The correlation between isoprene-OA and LO-OOA in the "Chamber_Af" period of 415 one α -pinene perturbation experiment (i.e., ap_0720_2). (b) The correlation between COA and 416 LO-OOA in the "Chamber_Af" period of one β -caryophyllene experiment (i.e., ca_0726).

417 At the reviewer requested, the concentrations of inorganic species have been added into 418 the revised SI.

419 Specific comments:

420 5. Lines 104:111. Did the authors characterize the chamber? Mixing, wall losses,

421 Response: Since our goal is to qualitatively understand which OA factors the α-pinene SOA is
422 apportioned into, we did not characterize the mixing and wall loss of the chamber. We would like
423 to note that because of the continuous exchange air between chamber and ambient air, the particle
424 wall loss is difficult to characterize. The chamber characterization will be one focus of future work.
425 6. *Lines 141: The authors claim that by having an overflow, it suppressed the particle loss. Did*

425 6. Lines 141. The authors claim that by having an overflow, it suppressed the particle loss. Did

426 they mean reduce? Have you done some tests to validate such statement?

- 427 Response: We used a bypass flow to reduce the particle loss in sampling line. We have replaced
 428 "suppressed" with "reduced".
- 429 7. Lines 217-220: Why not using the outdoor chamber to do such experiments? Can the authors430 discuss the strategy here?

431 Response: In the laboratory studies, we follow traditional chamber experimental procedure 432 produce α -pinene SOA under controlled conditions. Then we compare laboratory experiments with 433 lab-in-the-field experiments to evaluate the representativeness of laboratory studies.

- 434 8. Lines 266-268: The decay of LO-OOA is quite fast and I do not think it can only explain by the
- 435 dilution and or dead-volume. The residence time in the chamber is ~100 min. Where were located436 the sampling inlets?
- 437 Response: The ~100min residence time is calculated with the assumption of no dead volume. The

438 existence of dead volume would largely decrease the residence time and change the decay rate of

- 439 LO-OOA, as shown in Fig. S21 in revised SI.
- 440 The sampling inlets were inserted into the center of the chamber, which has been specified441 in the revised SI.

442 9. *Lines* 278:284: It is quite expected. What is the point of the authors?

443 Response: Please see response to reviewer#1's comment#10.

- 444 10. SI Line 150:157: These results are a bit intriguing. The data reported for the boreal forest do
- 445 not exhibit prominent ions at m/z 53 or 82. The authors suggest that alpha-pinene/monoterpene
- 446 *can contribute to IEPOX-OA but according to Fig S7 the correlation is far to be obvious strong.*
- 447 The authors should compare the MS obtained in their study with other PMF data obtained from
- 448 monoterpene-dominated areas (e.g. boreal forest).
- 449 Response: In SI Line 150-157, we suggest that monoterpenes SOA may influence isoprene-OA
- 450 factor, if the isoprene-OA factor is present. In other words, for a location without isoprene-OA
- 451 factor, the influence of monoterpenes SOA on isoprene-OA does not exist. Regarding the
- 452 reviewer's comment on Fig. S7 (i.e., Fig S5 in revised SI), we have addressed it in response to
- 453 comment#4. As the reviewer suggest, we compared the mass spectrum of LO-OOA in this study
- 454 with that obtained in a coniferous forest mountain region in Whistler, British Columbia, Canada
- 455 (Lee et al., 2016). The correlation coefficient is 0.99.

456 **<u>Reviewer #3:</u>**

457 This paper presents results from experiments and model runs focusing on the monoterpene 458 contribution to biogenic SOA in the SE US. A small Teflon reactor was used to oxidize ambient 459 air to which single VOC precursor was added. Based on simple PMF analysis and simple CMAQ 460 model runs, it is concluded that monoterpenes are major contributors to ambient OA in the SE US. 461 The authors are wellknown in the field and have published much excellent work, the paper falls 462 within the scope of ACP, and has some interesting aspects. However, in my opinion the new 463 evidence is weak, partially supported with circular logic, and is very overinterpreted. The new 464 evidence is very insufficient to support the very strong conclusions. I don't see how this paper can 465 be published in ACP in anywhere near its present form. I recommend that the authors go back to 466 the drawing board and summarize the new experimental aspects into a paper whose conclusions 467 are actually supported by the evidence presented. For example, the results on Appendix B seem 468 more novel to this reviewer than the ones that are described in the main paper.

469 Note that I made this recommendation already in the access review, with the concurrence of the

470 previous Editor, and hoping to avoid having to post this review in public. However, after an appeal

471 by the authors, it was decided to publish the paper in ACPD anyway without significant revisions.

472 Response: We thank the reviewer for detailed comments in both access review and ACPD stages.
473 We appealed the reviewer's suggestion in the access review stage because we respectfully disagree
474 with many of the reviewer's comments. We would like to use the open discussion to clarify a
475 number of issues.

476 1. Brief statement of the major issue

477 1) The main problem of this paper is that the evidence presented does not support the conclusions.

478 The conclusions are summarized in the paper title "Large Contributions from Biogenic

479 Monoterpenes and Sesquiterpenes to Organic Aerosol in the Southeastern United States." Or L80-

480 84: "We provide direct evidence that newly formed SOA from α -pinene [...] and β -caryophyllene

481 (representative sesquiterpene) dominantly contributes to LO-OOA in the southeastern U.S."

482 *The new evidence presented in this manuscript has two parts:*

483 *1.a)* Some interesting, but incomplete, experiments with an ambient reactor, that have been
484 analyzed using PMF. What the authors have really shown with these experiments is (in their own

words) "to qualitatively understand which OA factors the α-pinene SOA is apportioned into"
(Supp. Info. L349-350). Most importantly, experiments with other precursors failed, and
experiments using for example cloud pathways were not even attempted. It is highly likely (based
on prior published work) that spectra from other precursors and pathways would also have looked
similar to LO-OOA, so it is very problematic that those experiments failed or where not even
attempted.

491 The authors do acknowledge (L415) that based on the experimental work alone "we do not 492 conclude that LO-OOA arises exclusively from MT and SQT." Next, they do acknowledge that 493 their title is just a hypothesis, after all the experimental evidence has been considered: (L387-391): 494 "we propose that the major source of OOA in this region is the oxidation of MT and SQT by 495 various oxidants (O3, OH, and NO3). To test this hypothesis, we use CMAQ to simulate pollutant 496 concentrations across the southeastern U.S."

497 So given how weak the evidence from (1.a) is in terms of supporting the paper's conclusions, how
498 strong is the complementary evidence from the model?

499 1.b) The CMAO model is run with a different parameterization for terpene SOA that has higher 500 vields than a very old one. Not surprisingly, the terpene contribution to SOA in the SE US goes up 501 in CMAQ. I understand that the parameterization is in principle improved compared to some older 502 ones, but how do we know it is really accurate? The parameterization is still very simple, and does 503 not included detailed chemistry such as a HOM mechanism. The justification about why this 504 parameterization would be accurate when implemented in as complex a region as the SE US is 505 very light and not satisfactory (sect. 2.6). I agree the model is "upgraded" (L25), but not that it 506 has been shown to be accurate. There is a long history of simple parameterizations (after various 507 "upgrades") being wrong when compared to ambient air. I do not see sufficient evidence that 508 supports the accuracy of these model runs, so that strong conclusions about MT + SOT509 contributions (that could not be reached with the experiments alone) could now be reached with 510 *certainty*.

511 In addition, the use of the CMAQ results suffers from circular logic. Section 1.a. ended with a

512 hypothesis that LO-OOA was arising from MT & SOT. Now the fact that the CMAO results are of

513 the same order as LO-OOA is used as confirmation that indeed LO-OOA comes from MT & SQT.

514 But we did not know that LO-OOA came from MT & SQT yet, that was only a hypothesis. The 515 logical structure here is therefore problematic.

516 Other evidence from the literature is mentioned, such as high emissions of MT & SQT in the SE 517 US, and the fact that some previous results suggest that anthropogenic SOA is not a major 518 contributor in this region. The first one has been known for decades. The second result is not quite 519 consistent with some modeling studies and measurements of fossil carbon (when taking into 520 account that urban pollution has a significant fraction of non-fossil carbon, see Kim et al. (2015) 521 and references therein). Together, the combined evidence is still not sufficient for the sweeping 522 conclusions.

523 Ten years ago we didn't know about the IEPOX-SOA pathway (Paulot et al., Science 2009), that 524 has since proven to be a major contributor to SOA over the SE US. A paper written in 2008 may 525 have used the existing literature to conclude that isoprene was a minor contributor to SOA in the 526 SE US, and would have been sorely wrong in doing so. We also didn't know till very recently about 527 autoxidation being important in the atmosphere (Ehn et al., 2014). The importance of autoxidation 528 for urban emissions in the US has recently been demonstrated (Praske et al., PNAS 2018), and is 529 not included in the CMAO runs or literature studies cited here. SOA formation in clouds is also 530 highly uncertain (Ervens et al., 2011), and could also lead to LO-OOA through various mixtures 531 of precursors and pathways (which remain almost completely unexplored). For example perhaps 532 there is an isoprene SOA pathway through clouds that has not been discovered yet and that 533 contributes half of the LO-OOA in the SE US. The present paper is implicitly saying that other 534 precursors and pathways are not important in the SE US, and risks shutting down research on 535 other alternatives. Is that justified? In my opinion it is not, and the evidence is this paper is not 536 anywhere near sufficient to justify its title and sweeping conclusions.

Response: We think the reviewer over-states the "weakness" of our evidence and the "strongness" of our conclusion. In many places of reviewer's comments, the reviewer indicates "the authors draw the conclusion that LO-OOA is exclusively monoterpenes SOA based on a single evidence" and that is a significant shortcoming. Our hypothesis is that "the major source of LO-OOA in the southeastern U.S. is the fresh SOA from the oxidation of monoterpenes (MT) and sesquiterpenes (SQT) by various oxidants (O₃, OH, and NO₃)". We never argue that LO-OOA is exclusively MT and SQT SOA and never state that SOA from other sources/pathways is not important. While

- 544 monoterpenes have been recognized an important SOA source for some time, until Zhang et al.
 545 (2018), there was no evidence for them being a contributor on the order of half of the ambient OA.
 546 Even with Zhang et al. (2018), the scientific literature lacks information on the role of
 547 monoterpenes on larger spatial (e.g. entire southeast U.S.) and temporal (different times of year)
 548 scales which are included in our work. We support our hypothesis based on a weight of evidence
 549 provided in the literature and this study, as listed and discussed below.
- (1) The large emissions of MT and SQT in the southeastern U.S. (Guenther et al., 2012), which
 has been established in decades and the reviewer agrees with.
- 552 (2) The majority (roughly 80%) of carbon in SOA is modern in the southeastern U.S. The reviewer 553 suspects that this evidence is not quite consistent with some modeling studies. We beg to differ 554 due to following reasons. Firstly, Weber et al. (2007) measured that the biogenic fraction of carbon 555 is roughly 70-80% at two urban sites in Georgia that were also used in our study. Note that 556 measurements in Weber et al. (2007) were performed in 2004 and the biogenic fraction is expected 557 to be higher in 2016 than 2004, as a result of reductions in anthropogenic emissions (Blanchard et 558 al., 2010). Secondly, we checked Kim et al. (2015) and found that the paper clearly stated that "we 559 estimate that 18% of the total OC burden is derived from fossil fuel use. This is consistent with an 560 18% fossil fraction from radiocarbon measurements made on filter samples collected in Alabama 561 during SOAS." In brief, Kim et al. (2015) is consistent with other studies (Zhang et al., 2018; 562 Lewis and Stiles, 2006; Weber et al., 2007).
- 563 (3) Previous studies suggest that the oxidation of β -pinene (another important monoterpene) by 564 nitrate radicals (NO₃) contributes to LO-OOA in the southeastern U.S. (Boyd et al., 2015; Xu et 565 al., 2015a) and this reaction alone cannot replicate the magnitude of LO-OOA (Pye et al., 2015).
- 566 (4) The mass spectra of LO-OOA are almost identical (i.e., R ranges from 0.95 to 0.99 in Fig. R1)
- 567 across all the seven datasets in our study. In addition, LO-OOA across all datasets also shares the
- same diurnal trends (Xu et al., 2015a). The similarity in LO-OOA features suggests that LO-OOA
- 569 may share similar sources across multiple sites and in different seasons in the southeastern U.S.
- 570 (5) Perturbation experiments in this study show that the majority of fresh SOA from the oxidation
- 571 of MT and SQT contributes to LO-OOA. Previous studies, mainly based on mass spectra
- 572 comparison, concluded that MT SOA contributes to LO-OOA, but did not quantitatively show the
- 573 fraction of MT SOA that is apportioned into LO-OOA. In other words, previous studies did not

574 show whether 100% or 50% of MT SOA is apportioned in to LO-OOA. The quantitative 575 understanding is the basis when comparing modeled MT SOA with PMF factors. The reviewer 576 raises concern regarding this conclusion in next comment and we will address his/her concern later.

577 (6) CMAQ model calculations for the region showed consistency between modeled SOA_{MT+SQT}
578 and observed LO-OOA in terms of both magnitude and diurnal trend at different sites and in
579 different seasons when an updated monoterpene SOA parameterization was used.

580 The new VBS parameterization implemented in the updated simulation represents a significant scientific improvement over the Odum 2-product parameterization currently used in the 581 582 public version of CMAQ (v5.2). Specifically, the VBS parameterization does promptly form low 583 volatility species, likely from autoxidation, which were absent from the previous Odum-2 product 584 parameterization. In addition, the new parameterization allows for enthalpies of vaporization that 585 are more consistent with species of the specified volatility, since the parameterization was 586 produced from a richer dataset than the original Odum 2-product representation. The work shown 587 here is an important step in the right direction and will allow for an improved representation of 588 monoterpene SOA in current models while mechanistic pathways are still being determined. As 589 shown in Fig. S16 in revised SI, implementing the new parameterization of MT SOA substantially 590 reduces the normalized mean bias (NMB) between modeled and measured OA for all six datasets.

(7) A recent study by Zhang et al. (2018), which was published after our manuscript submission, offered other evidence to support our hypothesis. Zhang et al. (2018) characterized the molecular tracers of MT SOA at Centreville, AL (a site included in our study as well) and concluded that monoterpenes are the largest source of summertime organic aerosol in the southeastern U.S.

595 Therefore, we use above weight of evidence to support our hypothesis. We have revised 596 the manuscript to clarify the logic and avoid confusions.

At last, we fully acknowledge the progress already made and the need to improve our understanding of atmospheric chemistry and all the unknowns the reviewer brought up. In fact, our study is motivated by many unknowns that the reviewer brought up. For example, due to the high O:C ratio of highly oxygenated molecules (HOMs) formed during monoterpene oxidation, it is hypothesized that HOMs maybe a potential source of MO-OOA. This hypothesis challenges our current understanding that MO-OOA represents aged SOA and also raises the question if monoterpenes SOA is exclusively apportioned into LO-OOA. Although previous studies

604 repeatedly showed the similar mass spectra between α -pinene SOA and LO-OOA, the mass spectra 605 comparison approach cannot tell us what is the fraction of α -pinene SOA apportioned into LO-606 OOA vs. other factors. The limitations of mass spectra comparison approach motivate us to explore 607 alternative approaches to understand the sources of PMF factors. Another example is still related 608 to HOMs. As the reviewer is aware of, the formation of HOMs and the contributions of HOMs to 609 SOA are not captured by the Odum 2-product model implemented in current regional models 610 which do not include prompt formation of material with saturation concentrations less than 10 611 $\mu g/m^3$. This is one of the reasons we replaced Odum 2-product model with VBS parameterization 612 in the updated simulation. The new parameterization based on Saha and Grieshop (2016) considers 613 the HOMs contribution to SOA and the HOMs yield in Saha and Grieshop (2016) is consistent 614 with recent observations.

615 Throughout the manuscript, we never imply that SOA sources, other than monoterpenes 616 and sesquiterpenes, are not important. Based on our measurements, LO-OOA accounts for 19-34% 617 of total OA in the southeastern U.S. The sources of MO-OOA, which accounts for 24-49% of OA 618 in the southeastern U.S., are highly uncertain. Many reaction pathways the reviewer brought up 619 are actually potential sources of MO-OOA. For example, SOA produced from aqueous-phase 620 chemistry is generally highly oxidized (Lee et al., 2011) and is likely apportioned into MO-OOA, 621 instead of LO-OOA. A recent study by Xu et al. (2016) suggests that aqueous-phase reaction has 622 a dominant impact on MO-OOA in China. There are also hypotheses in the literature that the SOA 623 formed through cloud chemistry together with long-range transport and entrainment from aloft 624 may contribute to MO-OOA (Crippa et al., 2013; Robinson et al., 2011; Xu et al., 2015b). In brief, 625 we never make any implication that SOA from other sources/pathways are not important in the 626 southeastern U.S.

627 *A little more detail on the major issues*

2) A very important problem with the manuscript is the logic of the PMF analysis (with both of the
other reviewers explicitly pointing out serious problems in it). Indeed the a-pinene SOA is most
similar to LOOOA (also referred to as SV-OOA in older works). This has been known for a decade,
see for example Fig 2C of Jimenez et al. (2009) (cited in the manuscript) and several other papers.
Or in the words of reviewer 1: "the case for a-pinene SOA being a strong contributor to LO-OOA
has never really been in doubt in this reviewer's opinion. Why is the evidence presented here any

634 more 'direct' than those published previous?" The same conclusion can be deduced quickly by 635 comparing spectra of chamber apinene SOA and ambient LO-OOA from the AMS spectral 636 databases (much like the authors do again in their Fig. 6). So this it is not a new finding of this 637 work. Here an interesting (though not completely new) experimental procedure is used to reach 638 once again a conclusion that was already firmly established in the literature. See for example the 639 figure below (Kiendler-Scharr et al., 2009, as an example, but there are quite a few such 640 comparisons in the earlier AMS literature. Note that the Chebogue BSOA represents the outflow 641 for the *E* US, similar to the work in the present paper).

Therefore the conclusion is not really new and has been known for over a decade. So it seems surprising that suddenly the same specific result allows the present authors to reach far more general conclusions. The critical flaw is in the logic flow. It is true that (a) a-pinene SOA is most similar to LO-OOA. However, that cannot be used to conclude that (b) ambient LO-OOA in the SE US is mostly from apinene. Hypothesis (a) being true is a necessary, but not sufficient condition for the converse hypothesis (b) to be true. Much more evidence is needed to prove hypothesis (b) and to disprove alternative hypotheses.

649 A critical piece of additional evidence would include proving that spectra from other sources of 650 SOA likely to be present in the region are not spectrally similar to LO-OOA. This is not shown in 651 the manuscript. Experiments with other precursors were attempted (L313): "by injecting isoprene, 652 mxylene, or naphthalene, which are major biogenic and anthropogenic emissions, respectively. 653 However, the SOA formation from these VOCs is not detectable." So the experiments failed, and 654 as a consequence no spectra from other likely sources are available to establish that spectra from 655 those sources do not look like LO-OOA. A look at the AMS literature and the AMS databases 656 suggest that spectra from these and other precursors have spectra which are indeed very similar 657 to ambient LO-OOA. So it is very problematic that the experiments did fail.

Inexplicably the authors do not use the publicly available database spectra, nor perform regular chamber experiments for other precursors, and have a very handwavy section (sect. 3.4) trying to justify that. This is simply not acceptable. I do not agree that the ambient perturbation experiments are better than regular chamber experiments, but I would agree that they can be just as good. Adding a-pinene to ambient air, and using the oxidants (O3 and OH) and OA seed from ambient air, is not significantly different to injecting O3 in a chamber and using either a sulfate seed or no 664 seed. If the authors expect that the spectra would be significantly different, they should explain 665 why this would be. But their own Figure 6 indicates that the spectra from the ambient perturbation 666 experiments and a regular chamber are indeed very similar. Why then not use chamber 667 experiments (either from the literature database, or the authors' chamber) to obtain spectra from 668 other precursors and pathways, and see whether they are similar to the ambient LO-OOA or not?

669 Response: The reviewer's comment targets on why our conclusions from perturbation experiments 670 are more "direct" than previous studies based on mass spectra comparison method. We have 671 carefully addressed this question in response to reviewer#1's comment#9. In brief, in the authors' 672 opinion, the mass spectra comparison approach is subjective and qualitative. It relies on subjective 673 judgement to determine whether lab SOA is similar to OA factor. Also, even if the mass spectrum 674 of α -pinene SOA is similar to LO-OOA, the similarity is not equivalent to that α -pinene SOA is 675 exclusively apportioned into LO-OOA. In contrast, in the perturbation approach, PMF analysis 676 does not distinguish SOA from natural α -pinene vs. from injected α -pinene, so that PMF analysis 677 can objectively apportion α -pinene SOA into factors. Further, we attempt to quantify the fraction 678 of α -pinene SOA that is apportioned into different factors.

The reviewer also argued that it is problematic that the perturbation experiments with other VOCs (isoprene, m-xylene, or naphthalene) failed. In fact, the results with other VOCs are expected and explainable as will be discussed in response to reviewer's comment #7.

682 3) Similar experiments and analysis (VOC addition to ambient air in a flow reactor, followed by 683 spectral comparison) have already been conducted and published by Palm et al. (2018) as part of 684 the GoAmazon campaign, an area comparable to the SE US with high biogenic impact, but also 685 other sources. In that work multiple VOCs were added to ambient air individually, and oxidized 686 to form SOA in an oxidation flow reactor, which was then measured by an HR-AMS. Those authors 687 were able to oxidize bcaryophyllene, longifolene, limonene, b-pinene, α -pinene, toluene, and 688 isoprene, and to obtain yields and HR-AMS mass spectra for all of them. They further state: "The 689 mass spectrum of the SOA formed from OH oxidation [of ambient air] was correlated (R2=0.72-690 0.93; shown in Fig. S12) with spectra of the SOA formed from the injected VOCs from the standard 691 injection experiments in Sect. 3.4. These correlations show that the SOA formed from OH oxidation 692 of ambient air appeared similar to SOA from known precursors, but the spectra from the different

693 precursors appear too similar to be able to differentiate the SOA sources in ambient air from the 694 spectrum alone." Fig. S12 of that work is reproduced below for reference.

695 Thus the difficulty of apportioning the SOA in ambient air through this type of experiments, and 696 given the high fragmentation and limited information content of AMS spectra is clear and has been 697 previously documented. If the authors disagree, the burden of proof is on them to show that they 698 can unequivocally associate ambient air spectra with those of specific VOC precursors, including 699 disproving that ambient LO-OOA may have major contributions from other precursors and 700 pathways. Let's imagine that Palm et al. had only conducted experiments with limonene, and the 701 rest of the experiments had failed. Then they would have observed R2 of 0.9 between SOA of those 702 experiments and SOA from ambient air. Would that have been sufficient evidence to justify the title 703 "Large Contributions from limonene to Organic Aerosol in the Amazon"? That paper performed 704 additional analyses, and concluded instead that biomass burning and anthropogenic precursors 705 were also important contributors at that particular location, in addition to biogenics. Therefore 706 one has to avoid making expansive conclusions based on narrow evidence.

707 Response: Firstly, we do not agree with the reviewer that the analysis in Palm et al. (2018) is 708 similar to our study. Palm et al. (2018) focused on the SOA formation from oxidizing ambient air 709 with OH in an oxidation flow reactor. This SOA is referred to as "potential SOA". Both the mass 710 spectra comparison and the "additional analysis" the reviewer referred to aim to understand the 711 "potential SOA", instead of the existing SOA in the atmosphere. As clearly stated in Palm et al. 712 (2018), "Importantly, this analysis does not provide information about what amounts or fractions 713 of the preexisting (i.e., ambient) OA measured at the T3 site came from each of these sources." 714 Thus, the analysis in Palm et al. (2018) is not similar to our study, as our study aims to understand 715 the sources of preexisting OA.

The reviewer quote from Palm et al. (2018) that "...but the spectra from the different precursors appear too similar to be able to differentiate the SOA sources in ambient air from the spectrum alone.". The R^2 in Palm et al. ranges from 0.72 to 0.93. We would like to ask the question what counts as "too similar"? We believe that the mass spectra comparison method cannot provide an objective answer to this question, but the PMF analysis as done in our study can potentially answer the question. That is, if Palm et al. (2018) performed PMF analysis on the combined ambient data and perturbation data, SOA from different precursors may be apportioned intodifferent factors.

724 Secondly, the reviewer raised one question that if Palm et al. had only conducted 725 experiments with limonene, would that have been sufficient evidence to justify the title "Large 726 Contributions from Limonene to Organic Aerosol in the Amazon"? We agree with the reviewer 727 that the answer is definitely no, because this conclusion is drawn based on simply mass spectra 728 comparison, instead of cumulative evidence as in our study. Let's imagine that Palm et al. simulate 729 the SOA formation from limonene in Amazon, would that match the LO-OOA in both magnitude 730 and diurnal trend at multiple sites and in different seasons? Is limonene the most abundant 731 monoterpenes in the Amazon? Is there any study to objectively show that the majority of limonene 732 SOA contributes to LO-OOA, instead of other factors? We state again that our hypothesis is 733 supported by a weight of evidence, instead of simple mass spectra comparison.

Thirdly, to support the hypothesis that LO-OOA is largely from the oxidation of monoterpenes and sesquiterpenes in the southeastern U.S., we have shown cumulative evidence in response to this reviewer's comment#1. Below, we list more evidence to support that LO-OOA unlikely has major contributions from anthropogenic VOCs.

(1) m-xylene, an important and abundant anthropogenic VOC is likely apportioned to MO-OOA. The mass spectrum of laboratory-generated m-xylene SOA (Bahreini et al., 2005) is more similar to the MO-OOA (R = 0.97) than LO-OOA (R = 0.83), using the standard mass spectra in Ng et al. (2010). Using the reviewer's recommendation to leverage the similarity of spectra between laboratory experiments and the ambient measurements, m-xylene SOA contributes to MO-OOA, instead of LO-OOA.

(2) As indicated in Fig. S8 in revised SI, the modeled concentration of SOA from anthropogenic VOCs is on the order of 0.1 μ g m⁻³. Even if we double the SOA yields of anthropogenic VOCs to account for the potential vapor wall loss in laboratory studies (Zhang et al., 2014) and even if we assume all SOA from anthropogenic VOCs oxidation contributes to LO-OOA, anthropogenic SOA only account for a small fraction of LO-OOA. Also, the modeled anthropogenic SOA peaks in the day, which is different from that of LO-OOA, which reaches daily maximum at night. This small amount of anthropogenic SOA is consistent with Zhang et al. (2018), who performed molecular-level characterization of OA and showed that anthropogenicSOA only accounts for 2% of total OA in Centreville, AL.

753 4) Some results of the PMF analysis appear to have been misinterpreted. The ambient data had 754 10 times as many points in time as the perturbation experiments. In such a situation, the ambient 755 data effectively "dictates" the spectra due to its much higher fractional contribution to the Q value 756 (weighed residual that PMF is minimizing). As expected in this situation (L167) "the perturbation 757 experiments do not create a new factor that does not already exist in the ambient data." Under 758 that setup, the PMF results for the chamber time periods are similar to multiple linear regression 759 onto the spectra already predetermined for ambient air (since the chamber results have a low 760 contribution to *Q*, and then are unable to change the factor spectra much).

761 As the spectra of SOA from the chamber are being forced to be represented by a linear combination 762 of a limited set of ambient spectra (which they cannot influence in practice), it is normal that some 763 SOA spectra from the chamber VOC additions "project" onto more than one ambient spectrum. 764 That is, if an SOA spectrum produced in the chamber is not exactly similar to one of the ambient 765 spectra, PMF may be able to reduce the residual by representing those experimental spectra as a 766 linear combination of two of the "basis" spectra that were determined primarily from the ambient 767 data. Those results are expected and not surprising. They do not "clearly demonstrate" at all that 768 if a given type of SOA was present in an ambient dataset, it would be split into two factors in the 769 same way. Mathematically these are two very different situations, with very different structures 770 and residual contributions. For example an ambient cooking OA (COA) factor would have a 771 different time variation, which PMF would also exploit in extracting the factors, but such 772 structural difference in the variance is not present here. Experiments (for example using simulated 773 data) could be carried out to investigate the interference point for ambient data alone. 774 Unfortunately, the authors misinterpret their results for a very specific PMF situation for non-775 ambient data, into completely unsupported general statements for PMF analyses of ambient data 776 (that for example ambient COA may contain caryophillene SOA, or that isoprene SOA may have 777 interferences from a-pinene SOA), even though such analyses have not been performed in this 778 work! Perhaps those interferences exist, but they have not been proven by this study. Rather here 779 the results of a complex PMF analysis are being misinterpreted.

780 In fact, the result that some of the a-pinene and carophyllene SOA apportions to other factors in

781 the authors' methods weakens the main stated conclusions further. Even these types of SOA are

not quite well represented by LO-OOA and need to "lean" on other ambient factors to reduce the

783 residual in PMF. Therefore making the conclusion that ambient LO-OOA is mainly from MT &

784 SQT is even more weakly supported.

Response: As stated in the manuscript, we designed our experiments in a way that the perturbation
experiments do not influence the mass spectra of OA factors and would not create a new factor.

The reviewer argued that "PMF results for the chamber time periods are similar to multiple 787 788 *linear regression onto the spectra already predetermined for ambient air*". Let's put aside whether 789 this interpretation is correct, we think the same argument/interpretation also applies for ambient 790 monoterpenes SOA. Imagine that there is a short period of ambient data with increasing 791 monoterpenes SOA concentration. For this short period, one can also argue that this short period 792 has small contribution to overall Q value and thus PMF results for this period are similar to 793 multiple linear regression onto the spectra already predetermined for ambient air. The perturbation 794 experiments simulate this short period with increasing α -pinene SOA concentration. It does not 795 matter how PMF treats the perturbation experiments, as long as the treatment is the same for 796 ambient data. Therefore, conclusions drawn from perturbation experiments are applicable to 797 ambient data from a similar situation. The perturbation experiments point out the possibility that 798 isoprene-OA factor could have interference from α -pinene SOA. This interference has not been 799 acknowledged in previous studies and there is no study in the literature to prove that this 800 interference does not exist. In fact, the interference of α -pinene SOA on isoprene-OA factor helps 801 to address some uncertainties regarding the isoprene-OA factor in the literature. For example, Liu 802 et al. (2015) compared the mass spectrum of laboratory-derived IEPOX SOA with isoprene-OA 803 factors at some sites. The authors observed stronger correlation for isoprene-OA factors resolved 804 at Borneo (Robinson et al., 2011a) and Amazon (Chen et al., 2015), and weaker correlation at 805 Atlanta, U.S. (Budisulistiorini et al., 2013) and Ontario, Canada (Slowik et al., 2011). As another 806 example, the fraction of measured total IEPOX-SOA molecular tracers in isoprene-OA factor 807 highly varies with location, ranging from 26% at Look Rock, TN (Budisulistiorini et al., 2015) to 78% at Centreville, AL (Hu et al., 2015). To address the uncertainties in above two examples, one 808 809 possible reason is that the isoprene-OA factors resolved at different sites are not purely from 810 IEPOX uptake. Isoprene-OA factors likely have interference from monoterpenes SOA or other

sources, but the interference magnitude varies with locations. We hope to use this study to raisethe public awareness of the possible interference in OA factors.

813 The reviewer proposed a great suggestion to use simulated dataset to investigate the 814 potential interference. However, a great amount of work is required to fully carry out this idea, as 815 the creation of the simulated dataset (i.e., what mass spectrum, time series, and concentration of 816 α -pinene SOA should be used?) is complicated and subjective. It would be an entire study in itself.

We agree with the reviewer that the perturbation experiments do not simulate all scenarios in the atmosphere and do not consider the temporal variation. The applicability of the conclusions drawn from the specific scenario to general atmosphere warrants further exploration. We have clearly discussed the caveats of the conclusions in the revised manuscript.

We agree with that PMF separates factors based on features in mass spectrum and time series. However, we do not agree that the temporal variations of monoterpenes and sesquiterpenes SOA and COA can guarantee a clean separation between different sources. For example, the concentrations of many oxidation products of monoterpenes (e.g. pinonic acid, pinic acid, etc), COA, and LO-OOA show similar increasing trend near sunset (Allan et al., 2010; Xu et al., 2015b; Zhang et al., 2018). As an attempt to test if our conclusion is affected by the temporal variation, we performed perturbation experiments at different times of day (9am to 9pm) in this study.

5) No uncertainty analysis, such as from bootstrapping, is performed for the PMF results. This is

829 more glaring given that very strong conclusions about the identity of a major fraction of the

830 ambient OA, and of potential interferences between factors are made, but we are not shown that

the results are even statistically significant or what the uncertainties in the analysis may be.

Response: As the reviewer requested, we performed 100 bootstrapping runs to quantify the uncertainty of PMF results. As shown in Fig. R5. The statistical uncertainties in the time series and mass spectra of 5 factors are small and the PMF results reported in this study are robust.



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Fig. R5. PMF results from bootstrapping analysis. (a) Average mass spectra (sticks) with 1- σ error bars (caps). (b) Average time series and 1- σ error bars (red).

839 6) The statements about the novelty of the approach (L19, L21, L87-88, L457-458) are exaggerated. 840 As cited in the paper, both Leungsakul et al. (2005) and Palm et al. (2017) have already published 841 results from very similar experiments. The only difference between the present experiments and 842 those previous ones is (in the authors' words, L22-123) that "no extra oxidant precursors were 843 added into the chamber." That is correct, but would the authors expect that ambient O3 or OH 844 produced from ambient air would be that different than those produced in other ways? I am sure 845 that the a-pinene molecules don't care about how the O3 or OH colliding with them were formed. 846 If the authors expected that adding a-pinene to ambient air but using ambient oxidants was going 847 to significantly change the results compared to standard chamber experiments, the reasons for 848 such expectations should be discussed in detail.

849 Otherwise the experiments are interesting, but follow on prior publications. I mention this because 850 in some places (e.g. abstract L20-25, also in L87-88, L457-458) the statement that the experiments 851 were "novel" is somehow used to prop the weak conclusions. As if somehow the "novel" 852 experiments would have allowed the authors to reach some conclusions that were not reachable 853 by previous authors. But the novelty is very minor. And the one reason why the experiments are a 854 little different from previous experiments (no added oxidants) is the reason why the experiments 855 failed in multiple cases! Therefore the "novelty" does not provide any real support for the 856 conclusions.

857 Response: As the reviewer noted, we already referenced and acknowledged previous studies which 858 used ambient air. However, the goals of previous studies are completely different from that of our 859 perturbation experiments. In Leungsakul et al., the main purpose of using rural ambient air is to 860 flush the 270m³ outdoor chamber reactor. In Palm et al., their main goal is to measure the SOA 861 yield from individual VOCs in the OFR under ambient RH and temperature conditions. Our goal 862 to use ambient air is to examine which factor the fresh α -pinene and β -caryophyllene SOA is 863 apportioned into by PMF analysis. With our goal in mind, we want to produce SOA only from α -864 pinene and β -caryophyllene. The reviewer is totally right that the α -pinene molecules don't care 865 about where the O_3 or OH comes from. However, adding extra oxidants will produce SOA via a 866 number of reactions (i.e., oxidize other existing VOCs/SVOCs/IVOCs). If so, we would not 867 unambiguously know if the LO-OOA enhancement in the perturbation experiments arise from 868 injected VOC or from other pathways.

869 We realize that the description of the novelty of our approach is not accurate in many places 870 and we have modified the language in the revised manuscript.

871 7) Statements such as (L316-318) "The perturbation experiments with other VOCs confirm the 872 stronger ability of α -pinene and β -caryophyllene to produce SOA" are misleading, and frankly 873 just perplexing. A lot was already known about the relative potential of different VOCs to make 874 SOA before this paper, and nothing new is learned from the experiments here about this point. The 875 low SOA observed for other precursors is attributed (SI, L405-406 "to the low SOA yields or slow 876 oxidation rates of these VOCs (Ng et al., 2007). Yields for naphthalene are certainly not low, but 877 are higher than for a-pinene (Chan et al., 2009). Later it is acknowledged (SI L412-414) that 878 *"isoprene oxidation products which form SOA are mostly second or higher generation products."*

They are not formed in large amount in the relatively short perturbation experiments (i.e., 40min)." The main issue is that a-pinene has a lifetime of ~1 h under the conditions of the ambient perturbation experiments (using well-known rate constants) and caroyphyllene has an even shorter lifetime. m-xylene has a lifetime of ~10 hrs, and therefore it reacts too slowly under the conditions of these experiments with no added oxidants. And for some precursors (other than isoprene) second or higher generation products are also needed to make SOA, which results in even longer time constants. However, those timescales are readily accessible in the atmosphere.

Response: The confusion regarding the referred statement mainly arises from the phrase "stronger 886 887 ability". We realize that this phrase is not properly defined, but we do not think this statement is 888 fundamentally wrong. Here, the "stronger ability of α -pinene and β -caryophyllene to produce SOA" 889 means that under the same atmospheric conditions (i.e., oxidants level, NO_x, per-existing particles, 890 etc) and the same initial VOC concentration, more SOA would be produced from α -pinene and β -891 caryophyllene than from other VOCs (i.e., isoprene, m-xylene) after the same oxidation time (i.e., 892 40min in perturbation experiments). This conclusion is well supported by laboratory studies in the 893 literature. This is why we used the word "confirm" in the sentence.

The "*main issue is that* ..." brought up by the reviewer is exactly the same meaning as "the low SOA yields or slow oxidation rates of these VOCs", which we wrote in the original manuscript. The timescale required to produce SOA of other VOCs (i.e., isoprene and m-xylene) is longer than our perturbation experiments. This is why we did not detect SOA formation from these VOCs in our experimental approach. Thus, the results are expected and explainable.

After submitting the manuscript, we realize another reason for the lack of SOA formation in naphthalene experiments. We injected naphthalene by passing pure air (1 liter per min) over the solid naphthalene flakes under ambient temperature for 1 min. Due to the relatively low vapor pressure of naphthalene (23.6Pa at 30°C) and rapid dilution in the chamber, the injected naphthalene concentration could be very low. We add this possible reason in the revised SI.

8) The discussion in the introduction about MO and LO OOA is unclear. Those factors do not represent the same sources or pathways in different studies. In some locations and times they are tied to biomass burning, in others to urban emissions, in others to biogenic SOA, and in others to various combinations. In older studies in which Isoprene-SOA (or "IEPOX-SOA) was not separated, it was necessarily part of MO and LO OOA. Care should be taken to clearly 909 communicate that any interpretations about sources contributing to MO or LO OOA are specific

910 to a given location and time period. And the possibility should be considered (including in the SE

911 US) that different periods may have larger contributions to these factors from different sources,

- 912 for example BB during one period, pollution during another, and biogenics during another (if the
- 913 sources impacting a site change substantially in time due to air mass changes or other causes).

914 See e.g. Palm et al. (2018) for an example of such a situation.

- 915 Response: We agree that the OOA factors represent different sources or pathways in different 916 regions. For example, in the original manuscript, we stated that "There is evidence that LO-OOA 917 in California is related to the oxidation of anthropogenic VOCs, as radiocarbon analysis suggests 918 68-75% of carbon in LO-OOA in California stems from fossil sources (Hayes et al., 2013; Zotter 919 et al., 2014)." We have further emphasized these points in the revised manuscript and expanded 920 the discussions on OOA factors in the introduction, as the reviewer requested.
- While we agree with the reviewer that interpretations about the sources contributing to OOA factors are location- and time-specific, we would like to point out that our study includes measurements at multiple sites in the southeastern U.S. and in different seasons. The LO-OOA across all datasets have similar diurnal variation (Xu et al., 2015a) and mass spectra (Fig. R1). Moreover, the modeled SOA_{MT+SQT} can capture the magnitude and diurnal variation of measured LO-OOA at all datasets. These evidence suggests a general source of LO-OOA on a regional scale.
- 927 Other points
- 928 9) L71-72: "The assumption that LO-OOA represents fresh SOA has yet to be directly verified."
- 929 Fig 2C, 2D, 2E in Jimenez et al. (2009) (where the older terminology SV-OOA was used for LO-
- 930 OOA), and similar results in other publications, would appear to have directly verified that long
- 931 ago.
- 932 Response: Please see response to reviewer#1's comment#9.
- 933 10) A paper with a similar title to this one, but using different lines of evidence, has been recently
 934 published (Zhang et al., 2018).
- Response: Thanks for pointing this out. We note that Zhang et al. (2018) was published after our
 manuscript submission. The conclusion in Zhang et al. (2018) is consistent with our study and has
- 937 been discussed in the revised manuscript.
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1102	Large Contributions from Biogenic Monoterpenes and Sesquiterpenes to Organic Aerosol
1103	in the Southeastern United States

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1116 Abstract

1117 Atmospheric organic aerosol (OA) has important impacts on climate and human health but its 1118 sources remain poorly understood. Biogenic monoterpenes and sesquiterpenes are critical 1119 precursors of OA. The OA generation from these precursors predicted by models has considerable 1120 uncertainty owing to a lack of appropriate observations as constraints. Here, we perform novel lab-1121 in-the-field experiments, which allow us to In this study OA formation under realistic atmospheric 1122 conditions and offer a connection between laboratory and field studies. Based on the lab-in-the-1123 field experimental approach and, we propose that the less-oxidized oxygenated organic aerosol 1124 (LO-OOA) factor resolved from positive matrix factorization (PMF) analysis on aerosol mass 1125 spectrometry (AMS) data, we provide a measure of OA can be used as a surrogate for fresh SOA 1126 from monoterpenes and sesquiterpenes in the southeastern U.S. We support this hypothesis based 1127 on a weight of evidence, including lab-in-the-field perturbation experiments, extensive ambient ground-level measurements, and state-of-the-art modeling. We performed lab-in-the-field 1128 1129 experiments, in which the ambient air is perturbed by the injection of selected monoterpenes and 1130 sesquiterpenes and subsequent SOA formation. PMF analysis on the perturbation experiments 1131 provides an objective link between LO-OOA and fresh SOA from monoterpenes and 1132 sesquiterpenes as well as insights into the sources of other OA factors. Further, we use an upgraded 1133 atmospheric model and show that modeled SOA concentrations from monoterpenes and measured OA concentration from 1134 sesquiterpenes could reproduce both the 1135 monoterpenesmagnitude and sesquiterpenesdiurnal variation of LO-OOA at multiple sites in the 1136 southeastern U.S., building confidence in the observed attribution of monoterpene SOA. We show 1137 that our hypothesis. We predict the annual average concentration of OASOA from monoterpenes and sesquiterpenes in the southeastern U.S. is $\sim 2.1 \ \mu g \ m^{-3}$. This amount is substantially higher 1138 than represented in current regional models and accounts for 21% of World Health Organization 1139 1140 PM_{2.5} standard, indicating a significant contributor of environmental risk to the 77 million 1141 habitants in the southeastern U.S.

1143 **1 Introduction**

1144 Organic aerosol (OA) constitutes a substantial fraction of ambient fine particulate matter (PM) and has large impacts on air quality, climate change, and human health (Carslaw et al., 2013; Lelieveld 1145 1146 et al., 2015). OA can be directly emitted from sources (primary OA, POA) or formed by the 1147 oxidation of volatile organic compounds (VOCs) (secondary OA, SOA). Global measurements 1148 revealed the dominance of SOA over POA in various atmospheric environments (Jimenez et al., 1149 2009; Ng et al., 2010). The VOCs can be emitted from natural sources (i.e., biogenic) or human 1150 activities (i.e., anthropogenic). However, the relative contribution of biogenic and anthropogenic 1151 sources to SOA formation in the atmosphere is poorly constrained. This knowledge is critical for 1152 formulating effective pollution control strategies that aim at reducing ambient PM concentrations 1153 and accurately assessing the climate effects of OA (Hallquist et al., 2009). Biogenic VOCs such 1154 as monoterpenes (MT, C10H16) and sesquiterpenes (SQT, C15H24) are recognized as critical 1155 precursors of SOA (Tsigaridis et al., 2014; Hodzic et al., 2016; Pye et al., 2010). The predicted 1156 global SOA production from MT and SQT varies from 14 to 246 Tg yr⁻¹ (Spracklen et al., 2011; 1157 Pye et al., 2010). This large variation in model estimates arises from a number of factors (including 1158 uncertainty in SOA yield) and introduces significant uncertainties in estimating OA concentrations 1159 and its subsequent influences on climate and human exposure.

1160 The large model uncertainties call for ambient observations to constrain model results. 1161 Isolating and measuring SOA production from specific sources are challenging because SOA is a 1162 complex mixture consisting of thousands of compounds and SOA evolves dynamically in the 1163 atmosphere. A widely used method to apportion OA into different characteristic sources is positive 1164 matrix factorization (PMF) analysis on the organic mass spectra measured by aerosol mass 1165 spectrometer (AMS) (Ulbrich et al., 2009; Jimenez et al., 2009; Ng et al., 2010). PMF-AMS 1166 analysis groups OA constituents with similar mass spectra and temporal variations into 1167 characteristic OA subtypes (i.e., factors). This analysis has revealed two ubiquitous OA subtypes 1168 in ambient environments, less-oxidized-that concentration of oxygenated OA (LO-OOA) and 1169 more-oxidized oxygenated OA (MO-OOA), which are differentiated by their degree of carbon 1170 oxidation. LO-OOA and MO-OOA together account for more is a surrogate of SOA, is much 1171 greater than half of total submicron OAthat of hydrocarbon-like OA (HOA), which is a surrogate 1172 of POA (CrippaZhang et al., 2014; Xu et al., 2015a; Jimenez et al., 20092007). Primarily based on 1173 comparison of their mass spectra with those of laboratory-generated SOA, previous studies

1174 proposed that LO-OOA is freshly formed SOA from various sources and evolves into MO-OOA 1175 with photochemical aging in the atmosphere. In many circumstances especially in warmer months, 1176 more than one SOA factor is resolved from PMF analysis, often including less-oxidized 1177 oxygenated OA (LO-OOA, also denoted as semi-volatile oxygenated organic aerosol in older 1178 studies) and more-oxidized oxygenated OA (MO-OOA, also denoted as low-volatility oxygenated 1179 organic aerosol in older studies). LO-OOA and MO-OOA are differentiated by their degree of 1180 carbon oxidation. These two factors together account for more than half of total submicron OA 1181 (Crippa et al., 2014; Xu et al., 2015a; Jimenez et al., 2009; Ng et al., 2010). These studies have 1182 significantly advanced our knowledge of the composition and evolution of ambient OA; however, there are still uncertainties associated with the sources of these OA factors. Firstly, the current 1183 1184 understanding on LO-OOA and MO-OOA offers little mechanistic information regarding the specific sources of these factors at a measurement site. Atmospheric models typically use the 1185 1186 lumped LO-OOA and MO-OOA concentration to constrain simulated total SOA concentration. 1187 Despite of their large abundance, the sources of LO-OOA and MO-OOA are unclear and likely 1188 vary with location and season. Early studies, primarily based on comparison of the mass spectra 1189 of OA factors with those of laboratory-generated SOA, proposed that LO-OOA is freshly formed 1190 SOA from various sources and evolves into MO-OOA with photochemical aging in the atmosphere 1191 (SpracklenJimenez et al., 2011; Tsigaridis2009; Ng et al., 20142010), which hinders our ability to 1192 diagnose the cause for the discrepancies between modeled and observed aerosol concentrations 1193 (Spracklen et al., 2011). Secondly, the assumption that LO-OOA represents fresh SOA has yet to 1194 be directly verified. Also, it is not known whether fresh SOA is exclusively apportioned into LO-1195 OOA. For example, rather than being produced from continued photochemical aging, recent 1196 studies hypothesize that the rapidly produced HOMs (highly oxygenated molecules) from the 1197 oxidation of VOCs may contribute to MO-OOA. Later, a number of possible sources have been 1198 proposed for MO-OOA, including SOA from long-range transport (Hayes et al., 2013; Robinson 1199 et al., 2011b), aged biomass burning OA (EhnBougiatioti et al., 2014; Grieshop et al., 2009). Thus, 1200 considering the large abundance of these two OA subtypes and that they are surrogates for ambient 1201 SOA, understanding the sources of compounds composing these two OA subtypes is critical to 1202 constrain atmospheric models and, humic-like substances (El Haddad et al., 2013), highly oxygenated molecules (HOMs) formed in the oxidation of monoterpenes (Mutzel et al., 2015; Ehn 1203 1204 et al., 2014), and aqueous phase processing (Xu et al., 2016c). Regarding the sources of LO-OOA,

1205 Zotter et al. (2014) applied radiocarbon analysis and showed that 68-75% of carbon in LO-OOA 1206 in California stems from fossil sources. In the southeastern U.S., Xu et al. (2015a) suggested that 1207 the oxidation of biogenic β -pinene by nitrate radicals (NO₃) contributes to LO-OOA, though this 1208 reaction alone cannot replicate the magnitude of LO-OOA (Pye et al., 2015). These studies 1209 significantly advanced our knowledge of the sources and evolution of ambient OA; however, 1210 uncertainties associated with the sources of these OA factors still exist. As a result, atmospheric 1211 models typically use the lumped LO-OOA and MO-OOA concentration to constrain simulated 1212 total SOA concentration (Spracklen et al., 2011; Tsigaridis et al., 2014), which hinders our ability 1213 to diagnose the cause of discrepancies between modeled and observed aerosol concentrations 1214 (Spracklen et al., 2011). Many sources of LO-OOA and MO-OOA are proposed based on 1215 comparing the mass spectra between OA factors and laboratory-generated SOA (Jimenez et al., 1216 2009; Palm et al., 2018; Kiendler-Scharr et al., 2009). However, the similarity between two mass 1217 spectra is a subjective determination. Further, the subjectively-defined similarity cannot tell what 1218 is the fraction of SOA from a certain source contributes to one OA factor. Overall, considering the 1219 large abundance of OOA subtypes and their use as surrogates for ambient SOA, understanding the 1220 sources of compounds composing these two OA subtypes is critical to constrain atmospheric 1221 models and the SOA budget.

1222 In this study, we integrate lab-in-the-field experiments, extensive ambient ground 1223 measurements, and state-of-the-art modeling to improve the understanding of the sources of OA 1224 factors and better constrain the OA budget from MT and SQT. WeBased on lab-in-the-field 1225 experiments, we provide directobjective evidence that newly formed SOA from α -pinene 1226 (representativean important monoterpene, which accounts for about half of monoterpenes 1227 emissions (Guenther et al., 2012))) and β -caryophyllene (representative an important sesquiterpene) 1228 is dominantly contributes apportioned to LO-OOA in the southeastern U.S. The modeled SOAIn 1229 addition, we model the SOA concentration from the oxidation of MT and SQT (denoted as 1230 SOA_{MT+SQT}) accurately and show that SOA_{MT+SQT} reasonably reproduces the magnitude and 1231 diurnal variability of LO-OOA measured at multiple sites in the southeastern U.S. The agreement 1232 between model and measurements supports the hypothesis Together with other evidence in the 1233 literature, we propose that LO-OOA can be used as a measure of SOA_{MT+SQT} in the southeastern 1234 U.S. TheFinally, we discuss how the lab-in-the-field approach allows for the study of SOA 1235 formation under realistic atmospheric conditions, which bridges laboratory studies and field

measurements and provides a direct way to evaluate the atmospheric relevancy of laboratorystudies.

1238 **2 Method**

1239 **2.1 Lab-in-the-field perturbation experiments**

1240 The perturbation experiments were performed in July-August 2016 on the rooftop of the 1241 Environmental Science and Technology building on the Georgia Institute of Technology campus. 1242 This measurement site is a representative an urban site in Atlanta, Georgia. Multiple ambient field 1243 studies have been performed at this site previously (Xu et al., 2015b; Hennigan et al., 2009; Verma 1244 et al., 2014). A 2m³ Teflon chamber (cubic shape) (Fig. 1) was placed outdoor on the rooftop of the building. The eight corners of the chamber were open ($\sim 2"\times 2"$) to the atmosphere to allow for 1245 1246 continuous exchange of air with the atmosphere. The perturbation procedure is briefly described 1247 below and illustrated in Fig. A1. Firstly, we continuously flushed the chamber with ambient air 1248 using two fans, which were placed at two corners of the chamber. During this flushing period, all 1249 instruments sampled ambient air and were not connected to the chamber. The flushing period 1250 lasted at least 3 hours to ensure that the air composition in the chamber is the same as ambient 1251 composition. Secondly, we stopped both fans and connected all instruments to chamber. Because 1252 of the continued sampling by the instruments (~20 liter per minute) and the open corners of the 1253 chamber, ambient air continuously entered the chamber, even though the two fans were turned off. 1254 Thirdly, after sampling the chamber for about 30min, we injected a known amount of VOC (liquid) 1255 into the chamber with a needle, where the liquid vaporized upon injection. We continuously 1256 monitored the chamber composition for ~40 min after VOC injection. Lastly, we disconnected all 1257 instruments from the chamber, sampled ambient air, and turned on two fans to flush the chamber 1258 to prepare for the next perturbation experiment.

We perturbed the chamber content by injecting one of the following VOCs: isoprene, αpinene, β caryophyllene, *m*-xylene, or naphthalene, which are major biogenic or anthropogenic emissions, respectively. The injected VOC amounts were carefully selected. If the injection amount is too large, it is not atmospherically relevant, produces too much SOA, and will bias subsequent analysis. If the injection amount is too small, the produced SOA would fall below the detection limit of the experimental approach. The OA concentration in the chamber after perturbation ranges from 4 to 16 µg m⁻³, which is within the range of typical ambient OA 1266 concentration. The VOC oxidation occurred in ambient air (inside the chamber) and lasted -40 1267 min.-Several previous studies have used ambient air as background (Palm et al., 2017; Leungsakul 1268 et al., 2005). An important distinction between our study and pervious work is that we perturbed 1269 the ambient air only by injection of VOCs and no extra oxidant precursors (i.e., O₃, photolysis of 1270 H_2O and O_2 , or photolysis of NO_{*}) were added to the chamber. Our approach allows for study of 1271 SOA formation from the specific VOCs injected and evaluate into which PMF factor the SOA is 1272 apportioned.

Each perturbation experiment can be divided into the following four periods: Amb_Bf 1273 1274 (30min ambient measurement period before sampling chamber), Chamber Bf (from sampling 1275 chamber to VOC injection, a period ~30min), Chamber Af (from VOC injection to stop sampling 1276 chamber, a period ~40min), and Amb Af (30min ambient measurement period after sampling 1277 chamber). We calculate the changes in the mass concentration of OA factors after perturbation 1278 based on the difference between Chamber Bf and Chamber Af, after taking ambient variation into 1279 account. The detailed procedure is presented in Appendix A. We develop a comprehensive set of 1280 criteria to determine if the changes are statistically significant and if the changes are simply due to 1281 ambient variations. The details of these criteria are also discussed in Appendix A.

1282 We perturbed the chamber content by injecting one of the following VOCs: isoprene, α -1283 pinene, β-caryophyllene, *m*-xylene, or naphthalene, which are major biogenic or anthropogenic 1284 emissions. We focused on α -pinene and β -caryophyllene, because they are widely studied in the 1285 literature (Eddingsaas et al., 2012a; Kurtén et al., 2015; Tasoglou and Pandis, 2015; Ehn et al., 1286 2014; Pathak et al., 2007) and they have large abundances in their classes. For example, α -pinene 1287 accounts for about half of monoterpenes emissions (Guenther et al., 2012) and β -caryophyllene is 1288 one of the most abundant sesquiterpenes (Helmig et al., 2007). The injected VOC amounts were 1289 carefully selected. If the injection amount is too large, it is not atmospherically relevant, produces 1290 too much SOA, and will bias subsequent analysis. If the injection amount is too small, the produced 1291 SOA would fall below the detection limit of the experimental approach. The VOC oxidation 1292 occurred in ambient air (inside the chamber) and lasted ~40 min. The OA concentration in the 1293 chamber after perturbation ranges from 4 to 16 µg m⁻³, which is within the range of typical ambient 1294 OA concentrations.

1295 We note that several previous studies have used ambient air (Palm et al., 2017; Leungsakul 1296 et al., 2005; Peng et al., 2016), but experimental approaches and purposes of previous studies are 1297 different from this study. For example, In Leungsakul et al. (2005), the rural ambient air was used 1298 to flush and clean the 270m³ outdoor chamber reactor. After the flushing, both VOCs and oxidants 1299 were injected to produce SOA, the concentration of which were orders of magnitude higher than 1300 atmospheric levels. In this study, we use ambient air with pre-existing OA in order to examine 1301 which factor(s) the fresh α -pinene and β -caryophyllene SOA are apportioned into by PMF analysis. 1302 We aim to produce SOA only from injected α -pinene or β -caryophyllene, so that an important 1303 distinction between our study and pervious work is that we perturbed the ambient air by only VOCs, 1304 not extra oxidant.

1305 **2.2 Analytical instruments**

1306 A suite of analytical instruments was deployed to characterize both the gas-phase and particle-1307 phase compositions. The particle-phase composition was monitored by a scanning mobility 1308 particle sizer (SMPS, TSI) and a high resolution time-of-flight aerosol mass spectrometer (HR-1309 ToF-AMS, Aerodyne), which shared the same stainless steel sampling line. A diaphragm pump 1310 (flow rate ~8 liter per minute) was connected to this sampling line, which increased the sampling 1311 flow rate and suppressed reduced particle loss in the sampling line by reducing the residence time 1312 in the tubing. The HR-ToF-AMS measures the chemical composition and size distribution of 1313 submicron non-refractory species (NR-PM₁) with high temporal resolution. The instrument details 1314 about HR-ToF-AMS have been extensively discussed in the literature (Canagaratna et al., 2007; 1315 DeCarlo et al., 2006) and the operation of HR-ToF-AMS in this study is described in the section 1316 S2 of Supplement.

1317 The gas-phase composition and oxidation products was monitored by an O_3 analyzer 1318 (Teledyne T400, lower detectable limit 0.6ppb), an ultrasensitive chemiluminescence NO_x monitor 1319 (Teledyne 200EU, lower detectable limit 50ppt), and a high-resolution time-of-flight chemical 1320 ionization mass spectrometer (HR-ToF-CIMS). The HR-ToF-CIMS with I⁻ as regent ion can 1321 measure a suite of oxygenated volatile organic compounds (oVOCs) at high frequency (1Hz). 1322 Detailed working principles and sampling protocol can be found in Lee et al. (2014). The 1323 concentrations of VOCs were not measured in this study. All gas-phase measurement instruments 1324 shared the same **Teflon** sampling line. Similar to the particle sampling line, a diaphragm pump

(flow rate ~8 liter per minute) was connected to the gas sampling line to reduce the residence timein the tubing.

1327 2.3 Positive Matrix Factorization (PMF) analysis

1328 PMF analysis has been widely used for aerosol source apportionment in the atmospheric chemistry 1329 community (Jimenez et al., 2009; Crippa et al., 2014; Xu et al., 2015a; Ng et al., 2010; Ulbrich et 1330 al., 2009; Beddows et al., 2015; Visser et al., 2015). PMF solves bilinear unmixing factor model 1331 (Paatero and Tapper, 1994; Ulbrich et al., 2009) by minimizing the summed least squares errors of the fit weighted with the error estimates of each measurement. (Paatero and Tapper, 1994; 1332 1333 Ulbrich et al., 2009). We utilized the PMF2 solver, which does not require a priori information 1334 and reduces subjectivity. In this study, we performed PMF analysis on the high-resolution mass 1335 spectra of organic aerosol (inorganic species are excluded) of combined ambient and perturbation 1336 data in the one-month measurements. Considering that (1) the perturbation data only account for 1337 ~10% of total data and (2) the OA concentration is similar inbetween the perturbation experiments 1338 and typical ambient measurements, the perturbation experiments do not create a new factor that 1339 does not already exist in the ambient data. This is desirable because it allows PMF analysis to 1340 apportion the newly formed OA in the perturbation experiments into pre-existing OA factors in 1341 the atmosphere.

1342 We resolved five OA factors, including hydrocarbon-like OA (HOA), cooking OA (COA), 1343 isoprene-derived OA (isoprene-OA), less-oxidized oxygenated OA (LO-OOA), and more-1344 oxidized oxygenated OA (MO-OOA). The time series and mass spectra of OA factors are shown 1345 in Fig. 2. The same 5 factors have been identified at the same measurement site and extensively 1346 discussed in the literature (Xu et al., 2015a; Xu et al., 2015b; Xu et al., 2017). Below, we only 1347 provide a brief description on these OA factors and more details are discussed in section S3 of Supplement. The mass spectrum of HOA is dominated by hydrocarbon-like ions ($C_xH_y^+$ ions) and 1348 1349 HOA is a surrogate of primary OA from vehicle emissions (Zhang et al., 2011). For COA, its 1350 concentration is higher at meal times and its mass spectrum is characterized by prominent signal 1351 at ions C₃H_{5⁺} (m/z 41) and C₄H_{7⁺} (m/z 55), which likely arise from unsaturated fatty acids (Huang 1352 et al., 2010; Mohr et al., 2009; Allan et al., 2010). The mass spectrum of isoprene-OA is 1353 characterized by prominent signal at ions C₄H₅⁺ (m/z 53) and C₅H₆O⁺ (m/z 82) and it is related to 1354 the reactive uptake of isoprene oxidation products, isoprene epoxydiols (IEPOX) (Budisulistiorini

1355 et al., 2013; Hu et al., 2015; Robinson et al., 20112011a; Xu et al., 2015a). LO-OOA and MO-

- 1356 OOA are named based on their differing carbon oxidation state. LO-OOA and MO-OOA are
- 1357 named based on their differing carbon oxidation state, that is, from -0.70 to -0.34 for LO-OOA
- and from -0.18 to 0.71 for MO-OOA in the southeastern U.S. (Xu et al., 2015b). We performed
- 1359 100 bootstrapping runs to quantify the uncertainty of PMF results. As shown in Fig. S1, the
- 1360 statistical uncertainties in the time series and mass spectra of 5 factors are small and the PMF
- 1361 results reported in this study are robust.

1362 **2.4 Details of multiple ambient sampling sites**

Measurements at multiple sites in the southeastern U.S. were performed as part of Southeastern Center for Air Pollution and Epidemiology study (SCAPE) and Southern Oxidant and Aerosol Study (SOAS): in 2012 and 2013. Detailed descriptions about these field studies have been discussed in the literature (Xu et al., 2015a; Xu et al., 2015b) and section S4 of Supplement. The sampling periods are shown in Table S1 and the sampling sites are briefly discussed below.

Georgia Tech site (GT): This site is located on the rooftop of the Environmental Science and
Technology building on the Georgia Institute of Technology (GT) campus, which is about 30-40m
above the ground and 840m away from interstate I75/85. This is a representative<u>an</u> urban site in
Atlanta. This is also where the perturbation experiments in this study were conducted.

Jefferson Street site (JST): This is a central SEARCH (SouthEastern Aerosol Research and Characterization) site, which is in Atlanta's urban area with a mixed commercial and residential neighborhood. It is about 2 km west of the GT site. The JST and GT sites are in the same grid cell in CMAQ.

- Yorkville site (YRK): This is a central SEARCH site located in a rural area in Georgia. This site
 is surrounded by agricultural land and forests and is at about 80 km northwest of JST site.
- 1378 Centreville site (CTR): This is a central SEARCH site in rural Alabama. The sampling site is
- 1379 surrounded by forests and away from large urban areas (55km SE and 84 km SW of Tuscaloosa
- 1380 and Birmingham, AL, respectively). The is the main ground site for the SOAS campaign.

1381 **2.5 Laboratory chamber study on SOA formation from α-pinene**

1382 To compare with results from the lab-in-the-field perturbation experiments, we performed 1383 laboratory experiments to study the SOA formation from α -pinene photooxidation under different 1384 NO_x conditions in the Georgia Tech Environmental Chamber (GTEC) facility. The facility consists 1385 of two 12 m³ indoor Teflon chambers, which are suspended inside a temperature-controlled 1386 enclosure and surrounded by black lights. The detailed description about chamber facility can be 1387 found in Boyd et al. (2015). The experimental procedures have been discussed in Tuet et al. (2017). 1388 In brief, the chambers were flushed with clean air prior to each experiment. Then, α -pinene and 1389 oxidant sources (i.e., H₂O₂, NO₂, or HONO) were injected into chamber. Once the concentrations 1390 of species stabilize, the black lights were turned on to initiate photooxidation. The experimental 1391 conditions are summarized in Table S2. Considering that the OA mass concentration affects the 1392 partitioning of semi-volatile organic compounds (Odum et al., 1996) and hence affects the organic 1393 mass spectra measured by AMS, we calculated the average mass spectra in these laboratory studies by only using the data when the OA mass concentration is below 10 µg m⁻³, which is similar to 1394 1395 that in our ambient perturbation experiments.

1396 2.6 Community Multiscale Air Quality (CMAQ) Model

1397 We used the Community Multiscale Air Quality (CMAQ) atmospheric chemical transport model 1398 to simulate the pollutant concentrations across the southeastern U.S. CMAQ v5.2gamma was run 1399 over the continental U.S. for time periods between May 2012 to July 2013 with 12km × 12km 1400 horizontal resolution. We focus our analysis on the southeastern U.S., which comprises 11 states 1401 (Arkansas, Alabama, Florida, Georgia, Kentucky, Louisiana, Mississippi, North Carolina, South 1402 Carolina, Tennessee, and Virginia). The meteorological inputs were generated with version 3.8 of 1403 the Weather Research and Forecasting model (WRF), Advanced Research WRF (ARW) core. We 1404 also applied lightning assimilation to improve convective rainfall (Heath et al., 2016). 1405 Anthropogenic emissions were based on the EPA (Environmental Protection Agency) NEI 1406 (National Emission Inventory) 2011 v2. Biogenic emissions were predicted by the BEIS (Biogenic 1407 Emission Inventory System) v3.6.1. The gas-phase chemistry was based on CB6r3 (Carbon Bond 1408 v6.3).

We performed two simulations with different organic aerosol treatment. The "default simulation" generally follows the scheme of Carlton et al. (2010), with <u>the addition of IEPOX</u> SOA following Pye et al. (2013) and documented in Appel et al. (2017) (Fig. <u>S1aS2a</u>). The traditional two-product absorptive partitioning scheme (Odum et al., 1996) is used in "default simulation" to describe SOA formation from monoterpenes using data from laboratory 1414 experiments by Griffin et al. (1999). In the "updated simulation", we incorporate two recent 1415 findings. Firstly, we implemented MT+NO₃ chemistry to explicitly account for the organic nitrate 1416 compounds that have recently been shown to be a ubiquitous and important component of OA 1417 (Pye et al., 2015; Kiendler-Scharr et al., 2016; Lee et al., 2016; Ng et al., 2017). We follow the 1418 scheme described in Pye et al. (2015) to represent the formation and partition of organic nitrates 1419 from monoterpenes via multiple reaction pathways (i.e., oxidation by NO₃ and oxidation by OH/O₃ 1420 followed by RO₂+NO). Secondly, we improved the parameterization of SOA formation from 1421 MT+O₃/OH based on a recent study by Saha and Grieshop (2016), who applied a dual-1422 thermodenuder system to study the α -pinene ozonolysis SOA. The authors extracted SOA yield 1423 parameters (i.e., SOA yields and enthalpies of evaporation) by using an evaporation-kinetics model 1424 and volatility basis set (VBS). The SOA yields in Saha and Grieshop (2016) are consistent with recent findings on the formation of HOMs (Ehn et al., 2014; Zhang et al., 2015) and help to explain 1425 1426 the observed slow evaporation of α -pinene SOA (Vaden et al., 2011). In the updated simulation, 1427 we use the VBS framework with parameters derived from Saha and Grieshop (2016). The new 1428 parameterization allows for enthalpies of vaporization that are more consistent with species of the 1429 specified volatility. The properties of 7the volatility bins in the VBS framework are listed in Table 1430 S3. A schematic of SOA treatment in "updated simulation" is shown in Fig. S1b. Additional details 1431 of the CMAQ simulations are given S2b. In the following discussions, we focus on the results from 1432 "updated simulation". The comparison between "default simulation" and "updated simulation" can 1433 be found in the section S5 of Supplement.

1434 **3 Results and Discussions**

1435 **3.1** α-pinene perturbation experiments

1436 A total of 19 α -pinene perturbation experiments were performed at different times of the day (i.e., 1437 from 9am to 9pm) to probe a wide range of reaction conditions. The injection time and 1438 concentrations of O₃ and NO_x during α-pinene perturbation experiments are summarized in Table 1439 S4. InitiallyBased on the chamber volume and injected liquid α -pinene volume, initially ~14 ppb 1440 α -pinene is injected into chamber, but. Due to lack of VOC measurements, we build a box model 1441 to simulate the fate of α -pinene in the chamber (section S6 of Supplement). We estimate that only a small fraction (2-5ppb) of α -pinene is reacted in the chamber, with and most of α -pinene being is 1442 carried out of the chamber due to dilution with ambient air (section S6 of Supplement). 1443

1444 Fig. 3 shows the time series of OA factors in a typical α -pinene perturbation experiment. 1445 The most striking feature is a An evident burst and increase of LO-OOA after a-pinene injection 1446 <u>occurs</u>. This is the most provides direct and compelling evidence that freshly formed α -pinene SOA 1447 contributes to LO-OOA. About 15 min after α -pinene injection, LO-OOA concentration starts to 1448 decrease, as ambient air continuously flows into the chamber and dilutes the concentration of LO-1449 OOA (section S6 of Supplement). As shown in Fig. <u>\$2\$3</u>, the major known gas-phase oxidation 1450 products of α-pinene measured by HR-ToF-CIMS (Eddingsaas et al., 2012; Yu et al.; 2012b; Lee 1451 et al., 2016; Yu et al., 1999) show an immediate increase after α -pinene injection. This verifies the 1452 rapid oxidation of α -pinene in the chamber.

1453 Fig. 4a shows the perturbation-induced changes in the concentrations of OA factors for all 1454 α-pinene experiments. Out of 19 experiments, the LO-OOA concentration is enhanced in 14 1455 experiments. Also, among all OA factors, LO-OOA shows the largest enhancement. This directly 1456 supports that freshly formed a-pinene SOA contributes to LO-OOA. The enhancement in LO-1457 OOA concentration differs between experiments, mainly because the perturbations were 1458 performed at different times of day under(i.e., from 9am to 9pm) and with different reaction 1459 conditions. Althoughvariables (i.e., temperature, relative humidity, oxidants concentrations, NOx, 1460 etc). Despite the large difference in reaction conditions vary between experiments, we note that 1461 both LO-OOA enhancement amount and LO-OOA formation rate (i.e., slope of LO-OOA increase) 1462 correlate positively with ozone concentration (Fig. 5). This correlation suggests that the 1463 concentration of oxidants, both ozone and hydroxy radical (OH, which is not measured in this 1464 study but is known to positively correlate with ozone in the atmosphere), isplays a more controlling 1465 variable for role in the amount of OA formation formed in α -pinene experiments experiment than 1466 other reaction variables do. This is likely because higher oxidant concentrations lead to more α -1467 pinene consumption and hence more OA production with the same reaction time.

MO-OOA only increases in 1 out of 19 α-pinene experiments. The The highly oxygenated molecules (HOMs), which are rapidly produced from the oxidation of α-pinene, are a hypothesized source of MO-OOA, because of the high O:C ratio of HOMs (Ehn et al., 2014; Mutzel et al., 2015). However, HOMs are first generation monoterpene products co-formed with semivolatile SOA species, and the lack of enhancement in MO-OOA suggests that the HOMs, which are rapidly produced from the α-pinene oxidation (Ehn et al., 2014), are unlikely contributors to MO-OOA, though more. We cannot rule out the possibilities that HOMs are not formed under our experimental conditions, and future studies on the simultaneous verification of HOMs formation
 and apportion of HOMs by PMF analysis are warranted.

1477 Isoprene-derived OA (isoprene-OA) increases in 7 out of 19 α -pinene experiments. This 1478 increase is surprising because the isoprene-OA factor is typically interpreted as SOA from the 1479 reactive uptake of IEPOX. Our results demonstrate that the isoprene-OA factor (also referred to as 1480 "IEPOX-OA" in some studies) could have interferences from α -pinene SOA. This conclusion 1481 could be applicable to isoprene-OA factor resolved at other monoterpenes-influenced sites. (also 1482 referred to as "IEPOX-OA" in some studies) is typically interpreted as SOA from the reactive 1483 uptake of IEPOX, but our results suggest that the isoprene-OA factor could have interferences 1484 from α -pinene SOA. The isoprene-OA enhancement is due to interference from newly formed α -1485 pinene SOA, rather than that the injected α -pinene affecting the oxidation of pre-existing isoprene 1486 or affecting the gas/particle partitioning of pre-existing semi-volatile species in the chamber, 1487 because of the following reasons. Firstly, based on I HR-ToF-CIMS measurement, the 1488 concentration of isoprene oxidation products, such as IEPOX+ISOPOOH (C5H10O3•I⁻) and 1489 isoprene hydroxyl nitrates (C₅H₉NO₄• Γ), did not change after α -pinene injection (Fig. S3b). In 1490 addition, after injecting α -pinene, the SOA concentration increases less than 4 μ g m⁻³, which does 1491 not substantially perturb the gas/particle partition of pre-existing semi-volatile species. Finally, the 1492 time series of isoprene-OA and LO-OOA in the same α -pinene perturbation experiment is strongly 1493 correlated (Fig. S4a). It is well studied that isoprene produces SOA slower than α-pinene, as 1494 isoprene SOA involves higher-generation products. If the enhancement in isoprene-OA factor is 1495 due to isoprene oxidation, the enhancement of isoprene-OA is expected to occur later than the 1496 enhancement of LO-OOA, but it is not observed in the experiments. Thus, the strong correlation 1497 between isoprene-OA and LO-OOA in the same α -pinene perturbation experiment serves as 1498 another evidence that the enhancement in isoprene-OA factor is due to interference from newly 1499 formed α -pinene SOA, rather than oxidation of isoprene after injecting α -pinene.

1500The interference of α-pinene SOA on isoprene-OA factor helps to address some1501uncertainties regarding the isoprene-OA factor in the literature. For example, Liu et al. (2015)1502compared the mass spectrum of laboratory-derived IEPOX SOA with isoprene-OA factors at some1503sites. The authors observed stronger correlation for isoprene-OA factors resolved at Borneo1504(Robinson et al., 2011a) and Amazon (Chen et al., 2015), and weaker correlation at Atlanta, U.S.1505(Budisulistiorini et al., 2013) and Ontario, Canada (Slowik et al., 2011). As another example, the

1506 fraction of measured total IEPOX SOA molecular tracers in isoprene-OA factor highly varies with
1507 location, ranging from 26% at Look Rock, TN (Budisulistiorini et al., 2015) to 78% at Centreville,
1508 AL (Hu et al., 2015). To address the uncertainties in above two examples, one possible reason is
1509 that the isoprene-OA factors resolved at different sites are not purely from IEPOX uptake.
1510 Isoprene-OA factors likely have interference from monoterpenes SOA or other sources, but the
1511 interference magnitude varies with locations.

- 1512While the perturbation experiments clearly point out the possibility that isoprene-OA factor1513could have interference from α -pinene SOA, two caveats should be kept in mind. First, in this1514study, the enhancement magnitude of isoprene-OA is ~20% of LO-OOA enhancement (Fig. S5a),1515but the interference magnitude would vary with locations and seasons. Second, the perturbation1516experiments simulate a period with increasing α -pinene SOA concentration. The applicability of1517the conclusions drawn from this specific scenario to general atmosphere with more dynamic1518variations of OA sources warrants further exploration.
- 1519 Primary OA factors, i.e., HOA and COA, only show slight increases in 1 or 2 α -pinene 1520 experiments, indicating a lack of interference from α -pinene SOA in these factors.
- **3.2** β-caryophyllene perturbation experiments

1522 ————A total of 6 β -caryophyllene perturbation experiments were performed. Initially ~10 ppb 1523 β -caryophyllene is injected into the chamber. The concentrations of O₃ and NO_x during β -1524 caryophyllene perturbation experiments are summarized in Table S4. In all β-caryophyllene 1525 perturbation experiments, LO-OOA also shows a significant enhancement (Fig. 4b). This clearly 1526 demonstrates shows that the freshly formed SOA from β -caryophyllene oxidation can be another 1527 source of LO-OOA. In addition to LO-OOA, COA shows an unexpected increase in 5 out of 6 β-1528 caryophyllene experiments. We have ample evidence that the COA factor at the measurement site 1529 has contributions from cooking activities. Firstly, the diurnal variation of COA peaks during meal 1530 times (Fig. S3a). SecondlyS6a). Additionally, the COA concentration shows clear increase on 1531 football days, consistent with barbecue activities on campus and close to the measurement site. 1532 Thirdly Finally, the COA concentration is enhanced on the days right before the start of a new 1533 semester when there are many fraternity/sorority rush events (i.e., barbecue activities) on campus 1534 (Fig. S3bS6b and S3eS6c). However, the COA enhancement in β -caryophyllene experiments

underscores the fact that COA may not be purely from cooking activities in areas with largebiogenic emissions.

1537 **3.3 Perturbation experiments with other VOCs**

1538 In addition to α -pinene and β -caryophyllene, we also performed <u>a few</u> perturbation 1539 experiments by injecting isoprene, *m*-xylene, or naphthalene, which are important biogenic and 1540 anthropogenic emissions, respectively. However, the SOA formation from these VOCs is not 1541 detectable. This is mainly due to either lower SOA yields (of isoprene) or slower oxidation rates 1542 (of *m*-xylene and naphthalene) compared to α -pinene and β -caryophyllene (section S6 of 1543 Supplement). The perturbation experiments with other VOCs confirm the stronger ability of α -1544 pinene and β-caryophyllene to produce SOA (Kroll et al., 2006; Ng et al., 2007; Griffin et al., 1545 1999), which are discussed in section S6 of Supplement.

We have also performed <u>four</u> perturbation experiments by injecting acidic sulfate particles to probe reactive uptake of IEPOX. We observed enhancement in isoprene-OA concentration after the injection of sulfate particles. The detailed results are included in Appendix B.

1549 3.4 Perturbation experiments Compare conclusions from lab-in-the-field perturbation 1550 experimental approach vs. mass spectra comparison approach

1551 The Based on the lab-in-the-field perturbation experiments provide more insights, we show 1552 that fresh SOA from α -pinene and β -caryophyllene oxidations are mainly apportioned into the 1553 sources of OA factors than traditional mass spectra comparison. Previous LO-OOA. This finding 1554 is consistent with previous studies which concluded that LO-OOA (also denoted as semi-volatile 1555 oxygenated organic aerosol, SV-OOA, in older studies) represents freshly formed SOA₅. The 1556 conclusion from previous studies is mainly based on the observation that mass spectra comparison 1557 approach, that is, the mass spectra of laboratory-generated fresh SOA from various sources better 1558 resemble the mass spectrumare similar to that of LO-OOA than other factors (Jimenez et al., 2009; 1559 Ng et al., 2010; Marcolli et al., 2006; Kiendler-Scharr et al., 2009). While this mass spectra 1560 comparison approach sheds light on the potential sources of LO-OOA, it does not allow for 1561 evaluating whether freshly formed SOA in the atmosphere is exclusively apportioned into LO-1562 OOA. The perturbation experiments, on the other hand, provide a way to evaluate this explicitly. 1563 Here, we directly produce SOA from a specific known VOC in ambient air matrix and determine 1564 where it is apportioned into. For example, we show that while fresh SOA from α-pinene and β1565 caryophyllene oxidations are mainly apportioned into LO-OOA, they could also be possibly
 1566 apportioned into isoprene-OA factor and COA, respectively.

1567 The. While we acknowledge that the mass spectra comparison approach largely improves our 1568 understanding of OA factors, we believe that the perturbation experimental approach provides 1569 more objective and quantitative conclusions by addressing some limitations of the mass spectra 1570 comparison approach. The mass spectra comparison approach has the following limitations. Firstly, 1571 the similarity between two mass spectra is a subjective determination. In other words, what 1572 correlation coefficient (R) value implies SOA from a certain source contributes to a specific OA 1573 factor? For example, the R values between laboratory generated α -pinene SOA (using HONO as 1574 OH source) with LO-OOA, isoprene-OA, and MO-OOA in this study are 0.96, 0.88, and 0.81, 1575 respectively. Using these R values to imply whether a-pinene SOA contributes to a certain OA 1576 factor or not is subjective. As another example, Jimenez et al. (2009) showed that the mass 1577 spectrum of α-pinene SOA becomes more similar to that of MO-OOA than that of LO-OOA with 1578 photochemical aging. The ability to determine when and how much α -pinene SOA is apportioned 1579 to MO-OOA based on an R value is subjective. Secondly, the conclusions from mass spectra 1580 comparison approach are qualitative. Even if the mass spectrum of α -pinene SOA is the most 1581 similar to LO-OOA, this similarity does not guarantee that all α -pinene SOA is apportioned into 1582 LO-OOA and this similarity does not provide information regarding what fraction of α -pinene 1583 SOA is apportioned into LO-OOA.

1584 The perturbation experiments could address the limitations of mass spectra comparison 1585 approach and provide more objective and quantitative conclusions. Firstly, the perturbation 1586 experiments simulate a short period of time with increasing α -pinene SOA concentration. We 1587 perform PMF analysis on the combined ambient data and perturbation data. PMF analysis does 1588 not distinguish SOA from natural α -pinene vs. from injected α -pinene, so that PMF analysis can 1589 objectively apportion a-pinene SOA into factors. Thus, the conclusions from the perturbation 1590 experiments are directly drawn without any subjective judgement on the similarity in mass spectra. 1591 Secondly, using the perturbation data, we attempt to quantify the fraction of fresh α -pinene SOA 1592 that is apportioned into different factors (i.e., ~80% into LO-OOA, ~20% into isoprene-OA, 0% 1593 into MO-OOA, COA, and HOA). Although further studies are required to extrapolate the 1594 conclusions from perturbation experiments to real atmosphere, a similar quantitative 1595 understanding cannot be obtained from simple mass spectra comparison approach. Thirdly, the 1596 perturbation experiments have the potential to utilize subtle differences across the entire the mass 1597 spectrum to evaluate the sources of OA factors. Based on previous laboratory studiesstudy, the 1598 mass spectrum of fresh SOA from α -pinene oxidation and SOA is highly correlated (R = 1599 (0.97) with that of β -caryophyllene oxidation share much similarity, but there are subtle differences 1600 in the mass spectra SOA (Bahreini et al., 2005; Tasoglou and Pandis, 2015). For example, in the 1601 perturbation experiments. Using a mass spectra comparison approach would suggest that these 1602 mass spectra are too similar to be differentiated by PMF analysis. However, perturbation 1603 experiments show different behaviors of α -pinene SOA and β -caryophyllene SOA. That is, a 1604 fraction of the fresh β-caryophyllene SOA is apportioned into COA factor, but we do not observe 1605 similar behavior is not observed for α -pinene SOA. This is The different behaviors are likely 1606 becausedue to the subtle differences in their mass spectra. For example, f_{55} (i.e., the ratio of m/z55 to total signal in the mass spectrum) is typically higher in β -caryophyllene SOA than α -pinene 1607 1608 SOA (Bahreini et al., 2005; Tasoglou and Pandis, 2015), and the mass spectrum of COA is 1609 characterized by prominent signal at m/z 55 (Fig. 2). Overall, the perturbation experiments 1610 provide more objective and quantitative insights into the sources of OA factors than traditional 1611 mass spectra comparison approach.

1612 **3.5 LO-OOA as a surrogate of SOA_{MT+SOT} in the Southeastern U.S.**

1613 We propose that the major source of LO-OOA in the southeastern U.S. is the fresh SOA from 1614 oxidation of MT and SOT by various oxidants (O₃, OH, and NO₃), based on the following piece 1615 of evidence. First, the southeastern U.S. is characterized by large biogenic emissions, including 1616 monoterpenes and sesquiterpenes (Guenther et al., 2012). Second, the majority of carbon in SOA 1617 is modern in the southeastern U.S. Weber et al. (2007) measured that the biogenic fraction of SOA 1618 is roughly 70-80% at two urban sites in Georgia that were also used in our study. We note that 1619 measurements in Weber et al. (2007) were performed in 2004 and the biogenic fraction of SOA is 1620 expected to be higher in 2016 than 2004, as a result of reductions in anthropogenic emissions 1621 (Blanchard et al., 2010). Third, previous studies suggest that the oxidation of β -pinene (another 1622 important monoterpene) by nitrate radicals (NO₃) contributes to LO-OOA in the southeastern U.S. 1623 (Boyd et al., 2015; Xu et al., 2015a), though this reaction alone cannot replicate the magnitude of 1624 LO-OOA (Pye et al., 2015). Fourth, the mass spectra of LO-OOA are almost identical (i.e., R ranges from 0.95 to 0.99 in Fig. S7) across all the seven datasets in our study. In addition, LO-1625 1626 OOA across all datasets also shares the same diurnal trends (Xu et al., 2015a). The similarity in

1627 LO-OOA features suggests that LO-OOA generally share similar sources across multiple sites and 1628 in different seasons in the southeastern U.S. Fifth, the lab-in-the-field perturbation experiments provide objective evidence that the majority of freshly formed SOA from the oxidation of MT and 1629 1630 SQT contributes to LO-OOA. Sixthly, using the updated CMAQ model (i.e., explicit organic 1631 nitrates and Saha and Grieshop (2016) VBS for MT+O₃/OH SOA), we found that the simulated 1632 SOA_{MT+SOT} reasonably reproduces both the magnitude and diurnal variability of LO-OOA for all 1633 sites (Fig. 6a). The model bias is within ~20% for most sites, except for Centreville, Alabama (i.e., 1634 43% for CTR June dataset). Fig. 6b present maps of ground-level SOAMT+SOT concentration 1635 corresponding to the time periods of observational data, and the SOAMT+SQT concentration is 1636 substantially higher in the southeast than other U.S. regions. While, the SOA_{MT+SOT} is present 1637 throughout the year, it reaches the largest concentration in summer. The spatial and seasonal variation of SOAMT+SOT concentration is consistent with MT and SQT emissions (Guenther et al., 1638 2012). The consistency between modeled SOAMT+SQT and measured LO-OOA at multiple sites 1639 and in different seasons builds confidence in our hypothesis that LO-OOA largely arises from the 1640 1641 oxidation of MT and SQT in the southeastern U.S.

1642 We note that we do not conclude that LO-OOA arises exclusively from MT and SQT. SOA 1643 from other precursors or other pathways may contribute to LO-OOA, but the related contributions 1644 are expected to be much smaller than MT and SQT in the southeastern U.S. Firstly, the 1645 contributions of anthropogenic SOA to LO-OOA are likely small. The emissions of anthropogenic VOCs are much weaker than that of biogenic VOCs in the southeastern U.S. (Goldstein et al., 1646 1647 2009). We modeled that the concentration of anthropogenic SOA is on the order of 0.1 μ g m⁻³ for 1648 our datasets (Fig. S8). Even if we double the SOA yields of anthropogenic VOCs to account for 1649 the potential vapor wall loss in laboratory studies (Zhang et al., 2014), the concentration of SOA from anthropogenic VOCs oxidation is still negligible compared to SOAMT+SOT. The low modeled 1650 1651 concentration of anthropogenic SOA is consistent with Zhang et al. (2018), who showed that the 1652 measured tracers of anthropogenic SOA only account for 2% of total OA in Centreville, AL. 1653 Secondly, other reaction pathways, like aqueous-phase chemistry or some unexplored reaction, 1654 may contribute to LO-OOA. However, the consistency between modeled SOAMT+SOT and LO-1655 OOA suggests that LO-OOA can be reasonably represented by a model based on current knowledge and it is not necessary to invoke any unexplored mechanisms. In addition, SOA 1656 produced from aqueous-phase chemistry is generally highly oxidized (Lee et al., 2011) and may 1657

- be apportioned into MO-OOA, instead of LO-OOA. A recent study by Xu et al. (2016c) suggests
 that aqueous-phase SOA is a major source of MO-OOA in China.
- We limit our hypothesis that major source of LO-OOA is the oxidation of MT and SQT to the southeastern U.S. There is clear evidence that LO-OOA factor represents different sources at different locations. For example, radiocarbon analysis shows that 68-75% of carbon in LO-OOA in California stems from fossil sources (Hayes et al., 2013; Zotter et al., 2014), suggesting the contribution from anthropogenic SOA to LO-OOA. Also, in the wintertime of many locations, LO-OOA and MO-OOA are not separated and a single OOA factor is resolved (Xu et al., 2016b; Lanz et al., 2008).

1667 **<u>3.6</u>** Connection between laboratory and field studies

1668 Due to the difficulties associated with accurately measuring complex chemical processes in the 1669 atmosphere, laboratory studies have been an integral part in our understanding of atmospheric 1670 chemistry (Burkholder et al., 2017). However, the representativeness of laboratory studies under 1671 simplified conditions with respect to the complex atmosphere is difficult to evaluate. One unique 1672 feature of our lab-in-the-field approach is that the VOC oxidation and SOA formation proceed 1673 under realistic atmospheric conditions. Taking advantage of this, we provide a direct link between 1674 laboratory studies and ambient observations. Previous laboratory studies have shown that NO can 1675 affect SOA composition by influencing the fate of organic peroxy radical (RO₂, a critical radical 1676 intermediate formed from VOC oxidation) (Kroll and Seinfeld, 2008; Sarrafzadeh et al., 2016; 1677 Presto et al., 2005). To evaluate the representativeness of laboratory studies and directly 1678 investigate the effects of NO on SOA composition, in Fig. 67, we compare the chemical 1679 composition of a-pinene SOA formed in laboratory studies under different NO conditions (denoted 1680 as SOA_{lab}) with those in α -pinene ambient perturbation experiments (denoted as SOA_{ambient}). The 1681 degree of similarity in OA mass spectra (i.e., evaluated by the correlation coefficient) between 1682 laboratory α-pinene SOA generated under NO-free condition (i.e., denoted as SOA_{lab,NO-free}, using 1683 H₂O₂ photolysis as oxidant source) and SOA_{ambient} shows a strong dependence on ambient NO 1684 concentration, under which the SOA_{ambient} is formed. The degree of similarity in mass spectra 1685 decreases rapidly when ambient NO increases from 0.1 to 0.2ppb, and then reaches a plateau at 1686 ~0.3ppb NO. The opposite trend is observed when laboratory α -pinene SOA generated in the 1687 presence of high NO concentrations (i.e., denoted as SOAlab,high-NO, using the photolysis of NO2 or 1688 nitrous acid as oxidant source) are compared with SOA_{ambient}. These observations directly 1689 demonstrateshow the transition of RO₂ fate as a function of NO under ambient conditions. For the 1690 perturbation experiments performed when ambient NO is below ~0.1ppb, the mass spectra of 1691 SOA_{ambient} are similar to SOA_{lab,NO-free}, consistent with that RO₂ mainly reacts with hydroperoxyl 1692 (HO_2) or isomerizes. In contrast, for the perturbation experiments performed when ambient NO is 1693 above ~0.3ppb, the mass spectra of SOA_{ambient} are similar to SOA_{lab.high-NO}, consistent with that the 1694 RO₂ fate is dominated by NO. This NO level (~0.3ppb) is consistent with the NO level required to 1695 dominate the fate of RO2 in the atmosphere, as calculated by using previously measured HO2 and 1696 kinetic rate constants (section S8 of Supplement). These observations also directly illustrate that 1697 the SOA composition from laboratory studies can be representative of atmosphere. We note that 1698 the mass spectra of SOA_{ambient} are generally more similar with that of laboratory SOA generated 1699 using NO₂ photolysis as oxidant source than using nitrous acid photolysis. This suggests that 1700 laboratory experiments using NO₂ photolysis as oxidant source better represent ambient high NO 1701 oxidation conditions in the southeastern U.S. than experiments using nitrous acid do. Possible 1702 explanations are discussed in section S7 of Supplement. -This finding provides new insights into 1703 designing future laboratory experiments to better mimic the oxidations in ambient environments.

1704 <u>4 Implications</u>

1705 **3.6 Abundance of SOA_{MT+SQT}-In this study, we performed lab-in--the-Southeastern U.S.**

1706 The ambient-field perturbation experiments provide direct and provided objective evidence that the 1707 majority of freshly formedfresh SOA from the oxidation of MT and SQT contributes to LO-OOA. 1708 Previous studies suggest that the oxidation of β-pinene (another important monoterpene) by nitrate 1709 radicals (NO₃) contributes to Based on weight of evidence, we propose that LO-OOA can be used 1710 as a surrogate of fresh SOA from MT and SQT in the southeastern U.S. (Boyd et al., 2015; Xu et 1711 al., 2015a), though this reaction alone cannot replicate the magnitude of LO-OOA, particularly 1712 during the daytime (Pye et al., 2015). Considering the large biogenic emissions in the southeastern 1713 U.S. We showed that modeled SOA_{MT+SOT} could reasonably reproduce both (Guenther et al., 2012) and the new results from our perturbation experiments, we propose that the major source of LO-1714 1715 OOA in this region is the oxidation of MT and SQT by various oxidants (O₃, OH, and NO₃). To test this hypothesis, we use CMAQ to simulate pollutant concentrations across the southeastern 1716 1717 U.S.

1718 The SOA_{MT+SOT} concentration in the default simulation (i.e., no explicit organic nitrate 1719 partitioning, Griffin et al. (1999) photooxidation parameterization) is significantly lower than LO-1720 OOA by 55-84% (Fig. 7). In contrast, SOA_{MT+SQT} in the updated simulation (explicit organic 1721 nitrates and Saha and Grieshop (2016) VBS for MT+O₂/OH) accurately reproduces the magnitude 1722 and diurnal variability of LO-OOA for each site (Fig. 8a). The model bias is reduced to within 1723 -20% for most sites, except for Centreville, Alabama (i.e., 43% for CTR June dataset). The 1724 consistency between modeled SOAMT+SQT and measured LO-OOA at multipledifferent sites and 1725 in different seasons supports our hypothesis. Based on the model simulation, we estimate that LO-1726 OOA largely arises from the oxidation of MT and SOT in the southeastern U.S. Fig. 8b present maps of ground-level SOA_{MT+SOT} concentration corresponding to the time periods of observational 1727 1728 data. The SOA_{MT+SOT} concentration is substantially higher in the southeast than other U.S. regions. 1729 The SOA_{MT+SQT} is present throughout the year and reaches the largest concentration in summer. 1730 The spatial and seasonal variation of SOAMT+SOT concentration is consistent with MT and SQT emissions (Guenther et al., 2012). Thethe annual concentration of SOAMT+SQT in PM2.5 in the 1731 southeastern U.S. is $\sim 2.1 \ \mu g \ m^{-3}$ (i.e., average concentration over the six sampling periods and 1732 1733 over the southeastern U.S. in the updated simulation). This accounts for 21% of World Health Organization PM_{2.5} guideline (i.e., 10 µg m⁻³ annual mean) and indicates a significant contributor 1734 1735 of environmental risk to the 77 million habitants in the southeastern U.S. Also, the estimated 1736 concentrationabundance of SOA_{MT+SQT} is substantially higher larger than represented in current 1737 models (Lane et al., 2008; Zheng et al., 2015)-, but in line with the conclusion from Zhang et al. 1738 (2018). Zhang et al. (2018) used a different methodology, characterization of molecular tracers of 1739 MT SOA at Centreville, AL (a site included in our study as well), to conclude that monoterpenes 1740 are the largest source of summertime organic aerosol in the southeastern United States. The 1741 oxidation of MT and SQT is likely an under-estimated contributor to natural PM in the 1742 present day and perhaps during the pre-industrial period, which determines the baseline state of 1743 atmosphere and the estimate of climate forcing by anthropogenic emissions (Carslaw et al., 2013). 1744 Models need to improve the description of the MT and SQT oxidation to reduce the uncertainties 1745 in estimated OA budget and subsequent climate forcing.

1746 We note that we do not conclude that LO-OOA arises exclusively from MT and SQT, SOA

1747 from anthropogenic VOCs may also contribute to LO-OOA. However, the SOA contribution from

1748 anthropogenic VOCs is expected to be much smaller than that from biogenic monoterpenes and

1749 sesquiterpenes in the southeastern U.S. Firstly, as shown in the perturbation experiments, a pinene 1750 and *B*-carvophyllene produce more SOA than *m*-xylene and naphthalene using the same 1751 experimental approach in ambient air matrix. Together with weaker emissions of anthropogenic 1752 VOCs than biogenic VOCs in the southeastern U.S. (Goldstein et al., 2009), the small contribution 1753 to SOA from anthropogenic VOCs is expected. Secondly, as indicated in Fig. S5, the modeled concentration of SOA from anthropogenic VOCs is on the order of 0.1 µg m⁻³. Even if we double 1754 1755 the SOA yields of anthropogenic VOCs to account for the potential vapor wall loss in laboratory 1756 studies (Zhang et al., 2014), the concentration of SOA from anthropogenic VOCs oxidation is still 1757 negligible compared to SOAMT-SOT-SOA from anthropogenic VOCs oxidation could be abundant 1758 in urban areas of the western U.S. There is evidence that LO-OOA in California is related to the 1759 oxidation of anthropogenic VOCs, as radiocarbon analysis suggests 68-75% of carbon in LO-OOA in California stems from fossil sources (Hayes et al., 2013; Zotter et al., 2014). The contribution 1760 1761 from anthropogenic VOCs to LO-OOA awaits exploration through ambient perturbation 1762 experiments in various locations around the world.

1763 **4 Implications**

In this study, we propose that LO-OOA can be used as a surrogate of fresh SOA from MT and
SQT in the southeastern U.S., based on the weight of evidence provided by: (1) the large emissions
of MT and SQT in this region; (2) the contribution from MT + NO₃ to LO-OOA as shown in
previous studies; (3) perturbation experiments providing direct evidence that the majority of fresh
SOA from the oxidation of MT and SQT contributes to LO-OOA; (4) the consistency of modeled
SOA_{MT+SQT} with the magnitude and diurnal trend of LO-OOA at different sites and in different
seasons.

1771 Using LO-OOA as a surrogate of SOA_{MT+SQT} in the southeastern U.S., our ambient ground 1772 measurements suggest that at least 19-34% of OA in the southeastern U.S. is from the oxidation 1773 of biogenic monoterpenes and sesquiterpenes (Xu et al., 2015a). The fraction of biogenic OA in 1774 the southeastern U.S. is even larger if we consider that isoprene-OA could account for 21-36% of 1775 OA in summer (albeit potential interferences of SOA from monoterpenes oxidation) and that MO-1776 OOA (24-49% of OA) likely contains SOA from long-term photochemical oxidation of biogenic 1777 VOCs. The dominant biogenic origin of SOA poses a challenge to control its burden in the 1778 southeastern U.S., if the roles of anthropogenic oxidants and other controlling factors are not 1779 recognized. Previous studies have shown that the SOA formation from biogenic VOCs can be 1780 mediated by anthropogenic emissions, such as nitrogen oxides and sulfur dioxide (Hoyle et al., 1781 2011; Goldstein et al., 2009; Surratt et al., 2010; Rollins et al., 2012; Xu et al., 2015a). Thus, 1782 regulating anthropogenic emissions could help reduce SOA concentration (Lane et al., 2008; Pye 1783 et al., 2015; Zheng et al., 2015). For example, as observed in our ambient perturbation experiments, 1784 one controlling parameter of a-pinene SOA formation is the concentration of atmospheric oxidants 1785 (O₃, OH, and NO₃), which are known to strongly depend on NO_x concentration. As it has been 1786 shown that anthropogenic emissions exert complex and non-linear influences on biogenic SOA 1787 formation (Zheng et al., 2015), the effectiveness of regulating anthropogenic emissions on 1788 biogenic SOA burden requires careful investigations. Importantly, the novel

The lab-in-the-field perturbation experiments substantially improve our understanding of ambientprovide insights into the OA sourcesfactors. This experimental approach iscan be easily applicable to other regions in the worldadapted. Future experiments conducted under various ambient environments and with diverse SOA precursors would facilitate accurate quantification of global OA sources as well as their climate and health impacts.the understanding of OA factors in other regions of the world.



Two fans are used to flush the chamber. The fans are turned off after VOC injection. After turning off the fans, flow rate of air going into the chamber is equal to the instruments pulling flow rate.

1795

1796 Fig. 1. The instrument setup for ambient perturbation experiments.



Fig. 2. The mass spectra and time series of OA factors in perturbation study. The time seriesincludes both the ambient data and perturbation experiments data.



1805 Fig. 3. The time series of OA factors in an α -pinene perturbation experiment (Expt ID: ap 0801 1). 1806 Each perturbation experiment includes four periods: Amb Bf (~30min), Chamber Bf (~30min), 1807 Chamber Af (~40min), and Amb Af (~40min). "Amb" and "Chamber" represent that instruments are sampling ambient and chamber, respectively. "Bf" and "Af" stand for before and after 1808 1809 perturbation, respectively. The solid lines are measurement data. The dashed red lines are the linear fits of ambient data (i.e., combined Amb Bf and Amb Af). The slopes are used to extrapolate 1810 Chamber Bf data to Chamber Af period (i.e., dashed black lines). The validity of the linearity 1811 1812 assumption is discussed in Appendix A. The difference between measurements (i.e., solid lines) 1813 and extrapolated Chamber Bf (i.e., dashed black lines) represents the change caused by 1814 perturbation.





1822 Fig. 4. The statistically significant changes in the concentrations of OA factors after perturbation by (a) α -pinene and (b) β -caryophyllene. The experiments are sorted by average [O₃] during 1823 1824 Chamber Af. The average [NO_x] during Chamber Af are shown on top of the figure. The changes 1825 in concentration are the differences between measurements during Chamber Af and extrapolated 1826 Chamber Bf (Appendix A). A set of criteria are developed to evaluate if the changes are 1827 statistically significant and if the changes are due to ambient variation (Appendix A). Isoprene-1828 OA decreases after β -caryophyllene injection. The reason for this decrease is unclear, but likely 1829 due to the limitations of PMF analysis, which assumes constant mass spectra of OA factors over 1830 time (section <u>\$9</u>\$3 of Supplement).



1831

Fig. 5. Observations of trends in (a) LO-OOA enhancement amount and (b) LO-OOA formation rate with O_3 concentration in α -pinene perturbation experiments. The data points are colored by average NO concentration during Chamber_Af period. The slopes, intercepts, and correlation coefficients (R) are obtained by least square fit.





- intensive ambient sampling. Model results shown here are from the updated simulation.
 Abbreviations correspond to Centreville (CTR), Jefferson Street (JST), Yorkville (YRK), Georgia
 Institute of Technology (GT). Detailed sampling periods are shown in Table S1. In panel (a), since
 the perturbation experiments show that 16% of SOA from α-pinene oxidation is apportioned into
 isoprene-OA (Fig. S5a), we only include 84% of modeled SOA from MT+O₃/OH when comparing
 with LO-OOA for the sites with isoprene-OA. The mean bias (MB), mean error (ME), and
- 1850 normalized mean bias (NMB) for each site are shown in each panel. The slopes and correlation

- 1851 1852 coefficients (R) are obtained by least square fit. The error bars indicate the standard error. In panel
- (b), average SOA_{MT+SQT} concentration in PM_{2.5} during each sampling period is reported.



1855 Fig. 7. The correlation coefficients between the mass spectra of OA formed in laboratory under 1856 different NO conditions ("SOAlab") and those of OA formed in ambient a-pinene perturbation 1857 experiments ("SOAambient"). The subscripts "lab" and "ambient" indicate the SOA formed under 1858 laboratory conditions and ambient conditions, respectively. Three different oxidant sources (i.e., 1859 H₂O₂, HONO, and NO₂) are used to create different NO concentrations in laboratory studies. The 1860 mass spectra of "SOA_{ambient}" are calculated by comparing the mass spectra of OA during 1861 Chamber Af and those of extrapolated Chamber Bf (section S7 of Supplement). To calculate 1862 reliable mass spectra of "SOA_{ambient}", only the experiments with significant OA enhancement are 1863 analyzed and shown here (Appendix A). The x-axis is the average NO concentration during each 1864 perturbation experiment. The data points on the same vertical line (i.e., the same NO concentration) 1865 are from the same perturbation experiment, but compared to three different laboratory experiments. The dashed lines are used to guide eyes. The bars on top of the figure represent the 10th, 50th, and 1866 90th percentiles of NO concentration for CTR (Centreville, AL), YRK (Yorkville, GA), and JST 1867 (Jefferson Street, GA) in 2013. The NO concentration is measured by the SouthEastern Aerosol 1868 Research and Characterization (SEARCH) network. The 90th percentile of NO concentration in 1869 1870 JST is 14.8 ppb, which is not shown in the figure.



1873 Fig. 7. The diurnal trends of LO-OOA and modeled SOA from monoterpenes and sesquiterpenes

- 1874 at different sampling sites in the southeastern U.S. in the default simulation. The mean bias (MB),
 1875 mean error (ME), and normalized mean bias (NMB) are shown for each site. The slopes and R are
- 1876 obtained by least square fit.


1879 Fig. 8. (a) top panel: the diurnal trends of LO-OOA and modeled SOA from monoterpenes and 1880 sesquiterpenes (SOA_{MT+SQT}) at different sampling sites in the southeastern U.S. (b) bottom panel: 1881 maps of modeled ground-level SOA_{MT+SOT} concentration.-Model results shown here are from the 1882 updated simulation. Abbreviations correspond to Centreville (CTR), Jefferson Street (JST), 1883 Yorkville (YRK), Georgia Institute of Technology (GT). Detailed sampling periods are shown in 1884 Table S1. In panel (a), since the perturbation experiments show that 16% of SOA from α-pinene 1885 oxidation is apportioned into isoprene-OA (Fig. S7a), we only include 84% of modeled SOA from 1886 MT+O₃/OH when comparing with LO-OOA for the sites with isoprene-OA (Fig. S7a). The mean 1887 bias (MB), mean error (ME), and normalized mean bias (NMB) for each site are shown in each 1888 panel. The slopes and correlation coefficients (R) are obtained by least square fit. The error bars 1889 indicate the standard error. In panel (b), average SOA_{MT+SOT} concentration in PM_{2.5} during each 1890 sampling period is reported.

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2438 Appendix A. Data Analysis Method for Perturbation Experiments

The most challenging and important analysis is to determine if the perturbation results in a statistically significant change in the mass concentration of OA factors. We perform the following analysis to calculate the changes in the mass concentration of OA factors after perturbation, to determine if the change is significant, and to evaluate if the change is simply due to ambient variation.

2444 The duration of one perturbation experiment is about 130min, including four periods: 2445 Amb Bf (~30min), Chamber Bf (~30min), Chamber Af (~40min), and Amb Af (~30min), as 2446 illustrated in Fig. A1. Firstly, we assume that the ambient variation is linear during both the 2447 Chamber Bf and Chamber Af periods (i.e., when instruments are connected to chamber and not 2448 sampling the ambient aerosol) and that the ambient variation can be represented by interpolating 2449 Amb Bf and Amb Af. The validity of this assumption will be discussed shortly. To obtain the 2450 slope of ambient variation, we analyze the combined Amb Bf and Amb Af data and use Theil-2451 Sen estimator(Sen, 1968). The Theil-Sen estimator is a method to robustly fit a line to a set of twodimensional points (i.e., concentration "C" and time "t" in this study). This method chooses the 2452 2453 median of the slopes $(C_i-C_i)/(t_i-t_i)$ determined by all pairs of sample points. Compared to simple 2454 linear regression using ordinary least squares, the Theil-Sen estimator is robust and insensitive to 2455 outliers. Unless specifically noted, the slope is Appendix A is calculated from Theil-Sen estimator. 2456 Secondly, we use the slope to extrapolate the Chamber Bf data to estimate aerosol concentration 2457 inside the chamber during the Chamber Af period if there were no VOC injection. We refer to this 2458 estimated aerosol concentration as "extrapolated Chamber Bf" and use it as the reference to 2459 calculate the change in aerosol mass concentration after perturbation. We extrapolate the 2460 Chamber Bf data, instead of ambient data, because the OA concentration in chamber is lower than 2461 that in the atmosphere due to wall loss. Thirdly, we calculate the changes in the concentration of 2462 OA factors based on the difference between measured Chamber Af data and "extrapolated 2463 Chamber Bf".

For each perturbation experiment, after calculating the changes in the concentration of OA factors, we develop a set of criteria to determine if the changes are statistically significant and if the changes are simply due to ambient variation. The increase in the concentration of an OA factor needs to satisfy all criteria to be considered as statistically significant and not due to ambientvariation.

Criterion 1: The difference in concentration between Chamber_Af and extrapolated Chamber_Bf
must be significant. We use T-test and 95% confidence interval.

Criterion 2: The slope of all data points or the first 8 data points during the Chamber_Af period
is significantly different from the slope of aerosol concentration during the Chamber_Bf period.
The rationale behind this criterion is that if the perturbation causes a substantial change in the
concentration of an OA factor, its slope during the Chamber_Af period should be different from
that during the Chamber Bf period.

2476 The slope of aerosol concentration during the Chamber Af period is obtained in the 2477 following way. We calculate the slope by using (1) all data points and (2) only first 8 data points 2478 during the Chamber Af period. This is because the concentration of factors firstly increases after 2479 perturbation and then decreases due to dilution (Fig. A1). In this case, the slope obtained by fitting 2480 all data points might be negative and will not reflect the initial increase in concentration (e.g., LO-2481 OOA of ap 0805 1 in Fig. S4aS9a). Using only the first few data points during the Chamber Af 2482 period can avoid this issue. We select the first 8 data points in this period because the 2483 concentrations of total OA and OA factors typically reach the highest at the 8th point (i.e., ~16min 2484 after injection). The slope is calculated by Theil-Sen estimator.

2485 The slope of aerosol concentration during the Chamber Bf period is analyzed in the 2486 following way. In order to determine if the slope in Chamber Af is significantly different from 2487 that in Chamber Bf, we use bootstrap analysis (1000 times) to obtain a distribution of the slope of 2488 Chamber Bf. In brief, in each random resampling of Chamber Bf with replacement, a slope is 2489 calculated by Theil-Sen estimator. Then, 1000 times resampling provides a distribution of slope in 2490 Chamber Bf. The 5% and 95% percentiles of the slope distribution are compared to the slope of 2491 Chamber Af to determine if the slopes are significantly different. If the slope of Chamber Af 2492 (from either all data points or the first 8 data points) is smaller (or larger) than the 5% (or 95%) 2493 percentile, the slopes in Chamber Bf and Chamber Af are significantly different.

Criterion 3: The slope of all data points or the first 8 data points during the Chamber_Af period
is significantly different from the slope of ambient data (i.e., combined Amb_Bf and Amb_Af).
The rationale behind this criterion is the same as the second criterion. That is, if the perturbation

causes a substantial change in the concentration of an OA factor, its slope during the Chamber_Af
period should be different from that in ambient data. The procedure to obtain a distribution of
slopes in the ambient data (combined Amb_Bf and Amb_Af) is same as Criterion 2.

2500 As mentioned above, one critical assumption is that the ambient variation is linear during 2501 both the Chamber Bf and Chamber Af periods (i.e., when instruments are connected to chamber 2502 and not sampling the ambient aerosol) and that the ambient variation can be represented by 2503 interpolating Amb Bf and Amb Af. We design the following pseudo-experiment to test the validity of this assumption. In brief, we perform the same analysis as we did for the perturbation 2504 2505 experiments, but using ambient data **only** (i.e., no perturbation data). We firstly randomly select a 2506 data point, which defines the start point of one pseudo-test. Secondly, based on the start point, we 2507 obtain the concentration of OA factors during "Amb Bf" period, (i.e., from start point to start point 2508 + 30min), "Chamber Bf" period (i.e., from start point + 30min to start point + 60min), 2509 "Chamber Af" period (i.e., from start point + 60min to start point + 100min), and "Amb Af" 2510 period (from start point + 100 min to start point + 130min). This mimics the sampling periods in 2511 a real perturbation experiment. Thirdly, we calculate the slope of ambient period (i.e., combined 2512 "Amb Bf" and "Amb Af" periods) and the slope of chamber period (i.e., combined "Chamber Bf" 2513 and "Chamber Af" periods). Fourthly, we calculate if the slope of chamber period is significantly 2514 different from the slope of ambient period. We repeat this test 1000 times and then obtain the 2515 probability of whether the slopes of chamber period and ambient period are significantly different.

Fig. A2a shows the probability that the slopes of chamber period and ambient period are not significantly different for five factors. The larger this probability is, the more reliable the linearity assumption is. The average probability is \sim 50% for all factors, without discernible diurnal trends. This suggest that there is \sim 50% chance that the linear variation assumption is valid. Since the linearity assumption is not perfect, we develop another criterion to constrain the potential influence of ambient variation on the interpretation of perturbation results.

2522 **Criterion 4**: From the above pseudo-experiment on ambient data only, we can calculate the 2523 relative change in slope between "chamber period" and "ambient period" by



2526 In each pseudo-experiment test, we calculate a relative change in slope between "chamber period" 2527 and "ambient period". By repeating the pseudo-experiment test 1000 times, we obtain a frequency 2528 distribution of the relative change in slope for each OA factor (Fig. A2b). This frequency 2529 distribution indicates the probability that certain relative change in slope occurs due to ambient 2530 variation. Take LO-OOA as an example, the probability that the relative change in slope varies by 2531 a factor 8 due to ambient variation is $\sim 1\%$. Thus, if the relative change in slope of LO-OOA in a 2532 α -pinene experiment is 8, the change is unlikely due to ambient variation. We use the 5% and 95% 2533 percentiles from the frequency distribution as the fourth criterion to determine if the changes in 2534 the concentrations of OA factors in each perturbation experiment are due to ambient variation. In other words, if the relative change in slope between Chamber Af and ambient data in a real 2535 2536 perturbation experiment falls outside of the 5% or 95% percentiles, the changes in the 2537 concentrations of OA factors are likely due to perturbing chamber with VOC, instead of ambient 2538 variation. This criterion strictly considers the influence of ambient variation. In general, the 2539 comparison in slope is an optimal option to account for ambient variation, because the influence 2540 of ambient variation is unlikely to coincide with the perturbation.

2541 Based on these 4 criteria, the OA factors with significant changes in their mass 2542 concentrations as a result of perturbation are shown in Fig. 4. LO-OOA is enhanced in 14 out of 2543 19α -pinene experiments. However, total OA is only enhanced in 8 out of 19 α -pinene experiments. 2544 Several reasons can contribute to the different behaviors of LO-OOA and OA. Firstly, as total OA 2545 has multiple sources, the enhancement in one factor does not guarantee an enhancement of total 2546 OA. For instance, in some perturbation experiments, while LO-OOA is enhanced, the 2547 concentration of other factors steadily decreases due to ambient variation. The increase in LO-2548 OOA and decrease in other factors compensate each other and result in a lack of enhancement in 2549 total OA. Secondly, based on the pseudo-experiment, we note that total OA is more easily affected 2550 by ambient variation than a single OA factor. For example, the 95% of the relative change in slope 2551 of total OA is 3.59, which is larger than any OA factors (Fig. A2b). Thus, the criteria for the change 2552 in total OA concentration to be considered as significant are stricter than those for a single OA 2553 factor. Thus, some experiments with significant changes in LO-OOA do not have significant 2554 changes in total OA.



2557 Fig. A1. Time series of OA in experiment ap 0801 1 to illustrate the analysis method. Each 2558 perturbation experiment includes four periods: Amb Bf (~30min), Chamber Bf (~30min), 2559 Chamber Af (~40min), and Amb Af (~40min). "Amb" and "Chamber" correspond to the periods 2560 when the instruments are sampling ambient and chamber, respectively. "Bf" and "Af" stand for before and after perturbation, respectively. The solid lines are measurement data. The dashed red 2561 lines are the linear fit of ambient data (i.e., combined Amb Bf and Amb Af). The slope is used to 2562 extrapolate Chamber Bf data to Chamber Af period (i.e., black dashed line). The dense dashed 2563 2564 purple line is the linear fit of the first 8 points during the Chamber Af period. The sparse dashed 2565 purple line is the linear fit of all data points during the Chamber Af period. During this period, the difference between measurements (i.e., solid green data points) and extrapolated Chamber Bf (i.e., 2566 2567 dashed black line) represents the change in organic concentration caused by perturbation.



Fig. A2. (a) The diurnal trends of the probability that the slopes between ambient periods (i.e., Amb_Bf and Amb_Af periods) and chamber periods (i.e., Chamber_Bf and Chamber_Af periods) are not significantly different in the pseudo-experiment. (b) The frequency distribution of the relative change in slope. The data points are fitted using Gaussian function. The numbers in the box represent the 5% and 95% percentile of the Gaussian fit.

2578 Appendix B. Ambient Perturbation Experiments with Acidic Sulfate Particles

2579 Previous field observations showed strong correlation between isoprene-OA and sulfate (Xu et al., 2580 2015a; Xu et al., 20162016a; Budisulistiorini et al., 2015). Moreover, airborne measurements over 2581 power plant plumes in Georgia, U.S. observed enhanced isoprene-OA formation in the sulfate-rich 2582 power plant plume (Xu et al., 2016).(Xu et al., 2016a). To probe the relationship between isoprene-2583 OA and sulfate, we conducted perturbation experiments in August 2015 by injecting acidic sulfate particles (i.e., a mixture of H₂SO₄ and MgSO₄) into the 2 m³ Teflon chamber. This mimics the 2584 2585 airborne measurements over power plants, which introduce sulfate into the atmosphere (Xu et al., 2586 2016).(Xu et al., 2016a).

2587 The experimental procedure in 2015 experiments is generally similar to those in 2016 2588 experiments, but has the following modifications. Firstly, in order to avoid the depletion of species 2589 which can uptake to sulfate particles, we kept one fan on during the Chamber Bf and Chamber Af 2590 periods to enhance the air exchange between chamber and atmosphere. Secondly, considering the 2591 fan is on during sulfate injection to enhance mixing chamber air with ambient air, we only use the 2592 Chamber Bf and Chamber Af periods to calculate the changes in OA factors. The Criteria (1)(2)(4)2593 are applied in 2015 experiments. Thirdly, the Chamber Bf period is ~40 min in 2015 experiments, 2594 which is slightly longer than the 30 min in 2016 experiments. Fourthly, the HR-ToF-CIMS was 2595 not deployed in 2015 experiments.

2596 The acidic sulfate seed particles were introduced into chamber by atomizing 0.88mM 2597 H₂SO₄ + 0.48mM MgSO₄ mixture solution from a nebulizer (U-5000AT, Cetac Technologies Inc., 2598 Omaha, Nebraska, USA). One important interference in these sulfate perturbation experiments is 2599 the trace amount of organics in solvent water [i.e., HPLC-grade ultrapure water (Baker Inc.)], 2600 which is used to prepare the $H_2SO_4+MgSO_4$ solution. These organics were injected into chamber 2601 together with sulfate. We utilize the multilinear engine solver (ME-2) to constrain the organics 2602 from solvent water (i.e., H₂O-Org). Unlike the PMF2 solver which does not require any a priori 2603 information of mass spectrum or time series, the ME-2 solver uses a priori information to reduce 2604 rotational ambiguity among possible solutions(Canonaco et al., 2013; Paatero, 1999). We obtained 2605 the reference spectrum of organic contamination (i.e., the a priori information for ME-2 solver) by 2606 atomizing the H₂SO₄+MgSO₄ solution directly into AMS. The ME-2 solver successfully extracted a factor (i.e., denoted as H₂O-Org factor, Fig. B1), which showed a clear enhanced concentration
during atomization (Fig. B2).

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2610 A total of four experiments were performed and details are summarized in Table B1. As 2611 shown in Fig. B2, the isoprene-OA factor increases in all three daytime experiments, but not the 2612 nighttime experiment. Based on current understanding of isoprene-OA factor, this enhancement is 2613 likely due to the reactive uptake of IEPOX. The lack of enhancement in nighttime experiment is 2614 consistent with low IEPOX concentration at night (Hu et al., 2015). Our results provide direct 2615 observational evidence that acidic sulfate particles lead to increase in isoprene-OA, which supports 2616 results from previous studies (Xu et al., 2015a; Xu et al., 20162016a; Budisulistiorini et al., 2015). 2617 Due to lack of measurements of gas-phase organic compounds, we are unable to identify the 2618 reactive species. Other species, such as glyoxal (Kroll et al., 2005), isoprene hydroperoxides (Liu 2619 et al., 2016), and HOMs (Ehn et al., 2014), also have the potential to uptake to acidic sulfate 2620 particles and form SOA. Future experiments with comprehensive measurements of gas-phase 2621 organic compounds can provide more insights into the identities of reactive uptake species.

2622 We note that in non-atomizing period, the concentration of H₂O-Org factor is close to zero, 2623 but not zero. Since H2O-Org arises from the atomizing solution, it should only exist during atomizing periods. Thus, the non-zero concentration suggests the limitation of the ME-2 solver 2624 2625 and cautions are required when using ME-2 solver to resolve one factor based on a specific mass 2626 spectrum. This limitation does not affect the conclusion that the enhancement in isoprene-OA is 2627 likely due to the reactive uptake of organic species, as we further verify that the organic increase 2628 in three daytime perturbation experiments with sulfate particles cannot be solely explained by the 2629 organic contamination in atomizing water, from the following two aspects. For example, we 2630 atomize the solution directly into AMS and find that the Org/SO4 ratio is 0.025. This value is 2631 significantly lower than the Org/SO4 ratio in the three daytime sulfate perturbation experiments 2632 (i.e., 0.048-0.059), but close to the nighttime sulfate perturbation experiment (i.e., 0.022) (Fig. B4).



Fig. B1. The mass spectra and time series of OA factors in the 2015 acidic sulfate particle perturbation measurements. Note that the perturbation periods are included in the time series.



Fig. B2. The statistically significant changes in the concentrations of OA factors after perturbation by acidic sulfate particles. The experiments are sorted by perturbation time. The changes in concentration are the difference between measurements during the Chamber_Af period and mass concentration extrapolated from the Chamber_Bf period. A set of criteria are developed to evaluate if the changes are significant and if the changes are due to ambient variation (Appendix A). H₂O-Org factor in these sulfate perturbation experiments represents organic contaminations in atomizing water.



2648 Fig. B3. Time series of OA factors in each sulfate perturbation experiment.





Fig. B4. The Org/SO₄ ratio in sulfate perturbation experiments and laboratory tests by directly
atomizing H₂SO₄ + MgSO₄ mixture solution into AMS (i.e., SO4_direct).

Perturbation	Expt ID ^a	Date	Injection	Perturbation	NO ^c	NO ₂ ^c	O ₃ ^c
			Time	Amount ^b	(ppb)	(ppb)	(ppb)
sulfate	SO4_0814	8/14/2015	13:32	16.29	0.51	5.86	59.8
	SO4_0815	8/15/2015	14:12	14.33	0.18	4.79	63.0
	SO4_0816_1	8/16/2015	12:46	14.52	0.36	4.08	53.2
	SO4_0816_2	8/16/2015	21:53	13.92	0.03	5.40	35.6

2662 Table B1. Experimental conditions for sulfate perturbation experiments.

2663 "Expt ID is named as "perturbation species + date + experiment number". For example,

2664 SO4_0816_1 represents the first sulfate perturbation experiment on 08/16.

2665 ^bThe unit for the perturbation in sulfate experiments is $\mu g m^{-3}$. The perturbation amounts of sulfate

 $2666 \qquad are \ calculated \ from \ Chamber_Af-extrapolated \ Chamber_bf.$

^cAverage concentration during the Chamber_Af period.