Impact of aromatics and monoterpenes on simulated tropospheric ozone and total OH reactivity

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7 Abstract

8 The accurate representation of volatile organic compounds (VOCs) in models is an important

9 step towards the goal of understanding and predicting many changes in atmospheric constituents

10 relevant to climate change and human health. While isoprene is the most abundant non-methane

11 VOC, many other compounds play a large role in governing pollutant formation and the overall

12 oxidative capacity of the atmosphere. We quantify the impacts of aromatics and monoterpenes,

- 13 two classes of VOC not included in the standard gas-phase chemistry of the chemical transport
- 14 model GEOS-Chem, on atmospheric composition. We find that including these compounds
- 15 increases mean total summer OH reactivity by an average of 11% over the United States,
- 16 Europe, and Asia. This increased reactivity results in higher simulated levels of O_3 , raising 17 maximum daily 8 hour average O_1 in the summer by up to 14 pph at some NOv seturated
- 17 maximum daily 8-hour average O_3 in the summer by up to 14 ppb at some NOx-saturated
- 18 locations.

19 **1** Introduction

- 20 Volatile organic compounds (VOCs) play a critical role within the Earth's troposphere, affecting
- 21 the global climate, controlling the formation of common pollutants, and influencing the lifetimes
- of other key atmospheric compounds. VOCs are emitted from both natural and anthropogenic
- sources, including combustion and industrial production processes (Piccot et al., 1992), as well
- as natural emissions from trees and other plant life (Guenther et al., 2012). The accurate
- 25 representation of these compounds within atmospheric models is a key goal of the atmospheric
- chemistry community, largely because they are direct precursors of ozone (O_3) and fine particular matter (PM_{2.5}), known pollutants which can also influence the global climate (Jenkin
- and Clemitshaw, 2000). VOCs also have major impacts on other key atmospheric species,
- 29 including the hydroxyl radical (OH), one of the key contributors to the oxidation capacity of the
- 30 atmosphere.
- 31 Tropospheric O_3 is an EPA criteria pollutant responsible for an estimated 200,000 premature
- 32 mortalities worldwide each year (Lim et al., 2013). Ozone concentrations are typically highest on
- 33 hot, stagnant days in the presence of abundant nitrogen oxides (NO_x) and VOCs. While there has
- 34 been some success in reducing the magnitude of extreme summertime O₃ events across the
- 35 United States and Europe, especially in urban areas (Guerreiro et al., 2014; Simon et al., 2015),
- 36 difficulties in predicting and reducing global tropospheric O₃ levels remain (Cooper et al., 2014).
- 37 Among the causes of these difficulties are uncertainties surrounding the emissions, chemistry,
- 38 and removal of VOCs and other O₃ precursors, especially due to the non-linearity of the
- 39 relationship between precursor concentrations and O₃ production. Understanding spatial and
- 40 temporal variability in atmospheric oxidative capacity, O₃ formation rates, and other
- 41 consequences of VOCs will require that gap to be closed, both in ambient observations of the

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- 42 atmosphere and within the models used to represent it. Many studies have reported a gap
- 43 between summed observed OH reactivity and observations based on OH lifetimes, a discrepancy
- 44 which could be explained by the presence of unidentifiable VOCs and/or their oxidation products
- 45 (Yang et al., 2016). Meanwhile, although the current generation of chemical transport models
- 46 typically includes a variety of species representing the most common and influential VOCs, this
- 47 is a small fraction of the 3,000-4,000 currently identifiable species, which is, in turn, only a small
- 48 fraction of the total compounds (estimated to be on the order of 10^4 - 10^5) present in the
- 49 atmosphere (Goldstein and Galbally, 2007).
- 50 GEOS-Chem, a model often used for the study of pollutants and tropospheric composition,
- 51 simulates the emission and oxidation of many of the most important atmospheric non-methane
- 52 VOC (NMVOC) classes, including natural compounds such as isoprene, monoterpenes, and
- 53 sesquiterpenes, as well as anthropogenically emitted compounds such as the aromatics benzene,
- 54 toluene, and xylene. However, while all of these species contribute to modeled PM_{2.5} through the
- 55 formation of secondary organic aerosol (SOA, Pye et al., 2010), only isoprene, the most
- abundant of the VOCs, is included in the standard gas-phase chemical mechanism. This
- 57 represents a gap in modeled OH reactivity, with potential consequences on the accuracy of
- 58 predicted O₃ formation, OH lifetimes, and other related species.

59 2 Methodology

60 To explore the impact of aromatics and monoterpenes on tropospheric chemistry, we use the

- 61 chemical transport model GEOS-Chem (www.geos-chem.org) v9-02, modified to include
- 62 additional VOC species within the gas-phase chemical mechanism. We performed two years of
- 63 global simulations (2010 and 2011) using a $2^{\circ} \times 2.5^{\circ}$ horizontal resolution and 47 vertical levels.
- 64 We also use these global simulations to produce boundary conditions for higher resolution (0.5°)
- $x 0.6^{\circ}$) nested regional simulations over North America, Europe, and Asia. With high O₃ events
- 66 primarily a summertime phenomenon, we focus on the months of June, July, and August in our
- 67 figures and analyses.
- 68 To better represent the chemical impacts of monoterpenes and aromatics, the GEOS-Chem gas-
- 69 phase chemical mechanism was modified using mechanisms from (Knote et al., 2014)) for
- aromatics and (Fisher et al., 2016)) for monoterpenes as part of a larger effort to track total
- reactive carbon with GEOS-Chem (Safieddine et al., 2017). To this end, we bring several
- aromatic and monoterpene species (previously included only as contributors to SOA formation)
- online with respect to OH reactivity and O₃ formation, tracking several generations of oxidation
- 74 products. These additions build upon the existing isoprene oxidation scheme (Paulot et al.,
- 75 2009b, 2009a), providing a fuller representation of VOC chemistry and ozone formation. All
- added species are shown on the left-hand side of Table 1, and include the aromatics benzene,
- toluene, and xylene, along with two lumped monoterpene tracers representing α-pinene, β -
- 78 pinene, sabinene, Δ -3-carene, limonene, myrcene, and ocimene. These two sets of modifications
- were made separately in individual simulations (AROM and TERP), as well as combined
 together in merged simulations (FULL) including all 42 additional compounds (32 associated
- 81 with aromatics and 10 with monoterpenes). In addition to these three cases, we evaluate a
- 82 simplified mechanism (SIMPLE) that delivers much of the total increased OH reactivity of the
- 83 FULL set, with only 14 additional species, and therefore less computational overhead. These two
- 84 additional mechanisms represent increases of 45% and 15%, respectively, over the original 93
- 85 species in the base GEOS-Chem mechanism. The tracers added to the SIMPLE cases, along with

- 86
- their literature sources, are listed on the right-hand side of Table 1. We compare these modified cases to base simulations (BASE) which lack the additional chemistry of the test cases, but are 87
- otherwise identical. 88

89 Table 1: Species added to FULL and SIMPLE GEOS-Chem simulations, with sources indicated90 by color.

FULL		SIMPLE		
Name	Description	Name	Description	
BENZ	Benzene	BENZ	Benzene	
TOLU	Toluene	TOLU	Toluene	
XYLE	Xylene	XYLE	Xylene	
BENP	Benzene peroxy radical	BENP	Benzene peroxy radical	
TOLP	Toluene peroxy radical	TOLP	Toluene peroxy radical	
XYLP	Xylene peroxy radical	XYLP	Xylene peroxy radical	
CSL	Cresol	CSL	Cresol	
PHEN	Phenol	PHEN	Phenol	
BEPOMUC	Unsaturated epoxide-dialdehyde	EPX	Epoxide from BENZ	
PHENO2	Bicyclic peroxy radical from OH addition to phenol	DCB	Unsaturated dicarbonyl	
PHENO	Bicyclic oxy radical from OH addition to phenol	TCO3	Unsaturated acyl peroxy radical	
PHENOOH	Bicyclic hydroperoxide from OH addition to phenol	MONX	Total monoterpenes	
C6H5O2	C6H5O2	TERPO2	Terpene peroxy radicals	
C6H5OOH	С6Н5ООН	TERPOOH	Terpene hydroperoxide	
BENZOOH	Bicyclic hydroperoxide from OH addition to benzene			
BIGALD1	Unsaturated dialdehyde	from Knote et	t al., 2014 (also in AROM case)	
BIGALD2	Unsaturated dicarbonyl	from Fischer	n Fischer et al., 2016 (also in TERP case)	
BIGALD3	Unsaturated dialdehyde	from (Goliff e	from (Goliff et al., 2013)13	
BIGALD4	Unsaturated dicarbonyls from xylene oxidation	from (Stockwell et al., 1990)90		
MALO2	Acyl radical from "BIGALD1" photolysis	from (Emmons et al., 2010)10		
PBZNIT	Peroxybenzoyl nitrate			
TEPOMUC	Unsaturated epoxide-dialdehyde			
BZOO	Peroxy radical formed following OH abstraction from toluene			
BZOOH	С6Н5СН2ООН			
BZALD	Benzaldehyde			
ACBZO2	Acylperoxy radical obtained from benzaldehyde			
DICARBO2	Acylperoxy radical obtained from photolysis of unsaturated dicarbonyls			
MDIALO2	Acylperoxy radical obtained from photolysis of unsaturated dicarbonyls			
XYLOL	Isomers of C6H3(CH3)2(OH)			
XYLOLOOH	Bicyclic hydroperoxide from OH addition to xylenols			
XYLENO2	Bicyclic peroxy radicals from OH addition to xylenes			
XYLENOOH	Bicyclic hydroperoxides from OH addition to xylenes			
API	α -pinene, β -pinene, sabinene, and Δ -3-carene			
APIO2	Peroxy radical formed from API			
LIM	Limonene, myrcene, and ocimene			
LIMO2	Peroxy radical formed from LIM			
PIP	Peroxides from API & LIM			
OLND	monoterpene-derived NO3-alkene adduct that primarily decomposes			
OLNN	monoterpene-derived NO3-alkene adduct that primarily retains the NO3 functional group			
MONITS	saturated first-generation monoterpene organic nitrate			
MONITU	unsaturated first-generation monoterpene organic nitrate			
HONIT	second generation monoterpene organic nitrate			

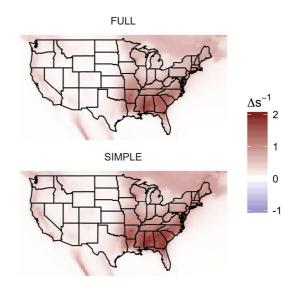
- 91 We use standard inventories for most emissions, including EDGARv3 for CO, NO_x, and SO_x,
- 92 along with RETRO for VOCs other than ethane, including benzene, toluene, and xylene the
- aromatics examined in this work (Olivier and Berdowski, 2001; Pulles et al., 2007). We take
- 94 ethane emissions from (Xiao et al., 2008)). Where available, high resolution regional alternatives
- are used in place of global inventories, including the EPA's NEI2005 inventory over the United
- 96 States, the CAC inventory over Canada, BRAVO for emissions over Mexico (Kuhns et al.,
- 2005), EMEP emissions over Europe (Auvray and Bey, 2005), and the Streets 2006 inventory for
- Asia (Zhang et al., 2009). In following with recent literature results suggesting that NEI NO_x
- emissions are too high by a factor of 2, we reduce anthropogenic NOx emissions over the UnitedStates following the recommendations of Travis et al., (2016), after first scaling up the NEI2005
- emissions to match NEI2011 totals for the years 2010 and 2011. Global emissions from biomass
- burning are taken from the GFED3 inventory, while biogenic emissions (including those of the
- additional monoterpene species) are calculated online using MEGAN v2.02 (Mu et al., 2011;
- 104 Guenther et al., 2006).
- 105 For comparison to observations in the United States, we use hourly station O₃ data taken from
- 106 the EPA's AQS network (US Environmental Protection Agency, n.d.) to calculate daily
- 107 maximum 8-hour averages.

108 **3 Results**

- 109 3.1 Increases in summer surface OH reactivity
- 110 The inclusion of aromatics and monoterpenes increases the simulated total summertime surface
- 111 OH reactivity, with rural increases largely resulting from new monoterpene reactivity, and urban
- 112 centers showing aromatic-driven changes. In the United States (Figure 1), regional reactivity
- 113 peaks in the southeast, coincident with extremely high rates of biogenic emissions. Highest
- 114 relative changes in OH reactivity occur over regions where both anthropogenic and natural
- emissions are present. For example, OH reactivity increases by 20-30% over much of the
- 116 southeast, which sees overall reactivity increases of over 2 s^{-1} .



Figure 1: Average summer (JJA) surface OH reactivity for United States BASE case (left, saturated at 15 s^{-1}) and change to summed OH reactivity (right) for online aromatic and monoterpene chemistry using FULL and SIMPLE cases.



BASE OH reactivity for Europe (Figure 2) is lower, overall, than that of the United States, with 117 118 only a few scattered maxima primarily associated with anthropogenic emissions near high population areas. We also note elevated BASE OH reactivity over Russia in 2010 as a result of 119 120 widespread wildfires over the region that summer. This region in particular shows low or even 121 negative changes in total OH reactivity due to drops in the extremely high levels of NO_x with additional VOC chemistry. Increases in reactivity from aromatics and monoterpenes are more 122 homogeneous in Western Europe than in the United States, with increases between 0.2 s⁻¹ and 123 0.5 s^{-1} throughout most of the region, representing relative increases of 4-20%. 124 125

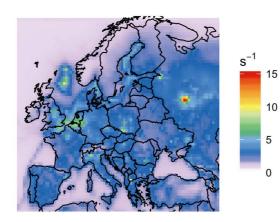
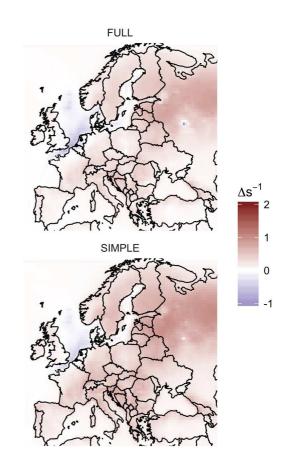
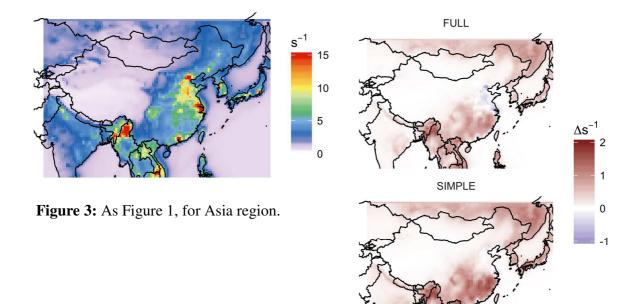


Figure 2: As Figure 1, for Europe region.



- 126 BASE case OH reactivity in China and Southeast Asia (Figure 3) is heavily concentrated in the
- south and east, roughly following population density, with biogenic peaks to the south in
- 128 Myanmar and Vietnam. Reactivity increases in China due to the addition of monoterpene and
- 129 aromatic chemistry are most pronounced in the southeast, where changes average 0.4 s^{-1} , or 7%
- 130 of BASE values. Negative changes in reactivity along the east coast from Beijing to Shanghai in
- 131 the FULL case are again the result of decreases in the exceptionally high NO_x concentrations due
- 132 to the additional chemical sinks provided by this mechanism.



133

134 Overall, increases in OH reactivity are similar between the FULL and SIMPLE cases, though magnitudes of changes are slightly higher in the SIMPLE cases (0.1 s⁻¹ higher on average across 135 136 all regions). This increased magnitude in the SIMPLE case is driven by two primary differences: differences in monoterpene oxidation products, and differences in NO_x sink efficiency. While the 137 138 FULL case includes explicit bins for monoterpene oxidation products, the simplified SIMPLE 139 case employs methyl vinyl ketone (MVK) and methacrolein (MACR). Differences in the reactivity and fate of the species in these two pathways end up leading to a net reactivity increase 140 141 for the SIMPLE case in most regions. Furthermore, reaction pathways present in the FULL case tend to lead to greater removal of NO_x, for example via reaction with the phenol oxidation 142 143 product PHENO, which does not exist in the SIMPLE case. In areas with extremely high NO_x 144 levels, particularly in the Europe and Asia regions, this decrease in NO_x appears as a net decrease 145 in total OH reactivity. While the FULL case adds reactive species and sinks that the SIMPLE 146 case does not (Figure 4), in most locations this is balanced by increases in other species. For example, while the FULL simulation contains two monoterpene species (API and LIM) and the 147 148 SIMPLE case uses only one (MONX) representing the binned sum of both FULL case species, total reactivity differences from the addition of these groups remains relatively balanced overall. 149 On average, changes in these monoterpenes proved most relevant to changes in summed OH 150 151 reactivity, as aromatic emissions are in general more localized. The additional aromatic and

152 monoterpene species in both the FULL and SIMPLE cases, along with their products, contribute

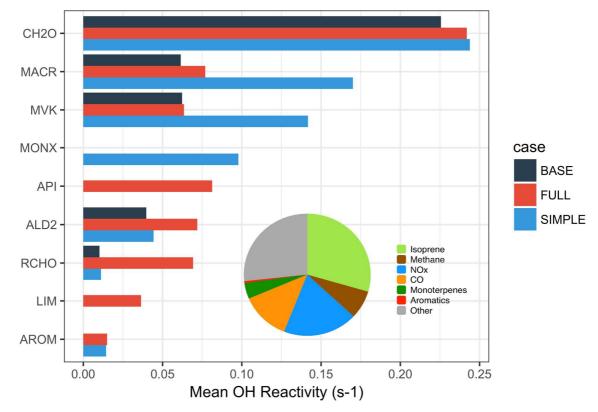


Figure 4: Mean contribution of select species to total average surface summertime OH reactivity. Pie chart shows relative contributions to global terrestrial OH reactivity for FULL case, while bars highlight the OH reactivity of key species impacted by the addition of monoterpene and aromatic chemistry.

153 an additional 7-12% to the total summed surface OHR in each of the three regions, or 18-35% of 154 the OH reactivity from VOCs.

155 The increases in total OH reactivity bring model results closer to observed totals, though large

156 gaps do remain. In general, modeled summed OH reactivity is much lower than observations,

- 157 mirroring the gap between observed and calculated reactivity in campaigns worldwide. For
- example, observed OH reactivities at forested sites in northern Michigan and Finland both 158
- 159 showed mean measured OH reactivities of around 11-12 s⁻¹, while the calculated reactivities
- 160 from the summation of known species contributions could explain only 30-50% of this,
- 161 depending on the time of day (Hansen et al., 2014; Nölscher et al., 2012). Summed simulated
- 162 summer reactivities for the grid cells containing these locations in the BASE case are each
- 163 around 2.5 s⁻¹, and additional reactivity provided by the FULL case adds only 0.5 s⁻¹ to that 164 value. Comparison to summer observations at urban sites in Houston and London show similar
- 165 model underpredictions and relative changes (Mao et al., 2010; Whalley et al., 2016). Together,
- 166 these results suggest that the inclusion of known aromatic and monoterpene chemistry is
- 167 insufficient to significantly close the gap between observed and modeled OH reactivities.
- 168

While the additional OH reactivity provided by including aromatics and monoterpenes in the

model does not close the gap between modeled and observed OH reactivities, it represents one 169 170 step towards a better representation of observed behaviors. Additional improvements may be

171 found through higher resolution simulations, as well as ongoing improvements to emission

- 172 inventories and multi-generational oxidative chemistry. Previous studies have indicated that
- 173 highly reactive hydrocarbons and secondary oxidation products missing from current inventories
- and mechanisms may be responsible for the large gaps in both calculated and modeled reactivity 174
- 175 totals (Yang et al., 2016).

176 Increases in tropospheric O_3 3.2

177 In most locations, the increased OH reactivity produced by the inclusion of aromatics and 178 monoterpenes leads to increases in surface O_3 levels as well, especially in regions rich in NO_x . 179 These changes are significant; for example they are comparable to or larger than the impact of 180 climate change on surface ozone concentrations (Tai et al., 2013). In the United States (Figure 181 5), increases in daily maximum 8-hour average summertime O_3 exceed 10 ppb over southern 182 California with the addition of aromatics alone. For context, a change of 14 ppb O₃ (the 183 maximum simulated increase due to the additional VOCs) is equivalent to 19% of the current 70 ppb EPA daily maximum 8-hr standard in the United States. Outside of southern California, 184 185 increases of 0.5 ppb are apparent throughout most of the country in the FULL case (1.5 ppb in 186 SIMPLE case), with the exception of the southeast, where VOC-insensitive O₃ production is consistent with high pre-existing VOC concentrations. Peak O₃ increases are largely driven by 187 188 the additional aromatic chemistry, though mean changes are strongly influenced by the 189 additional monoterpene reactivity, due to greater area of impact. In Europe (Figure 6), changes in 190 O₃ are more uniform, showing few spatial features, and peaks at 5 ppb. In Asia, increases of 191 around 4 ppb occur over eastern China and neighboring regions, where high existing NOx 192 concentrations enhance the impact of additional aromatic reactivity on O_3 levels (Figure 7). 193 Relatively small O₃ changes are observed in Burma and Thailand, where large increases in OH 194 reactivity from monoterpenes do little to change an already VOC-saturated regime.

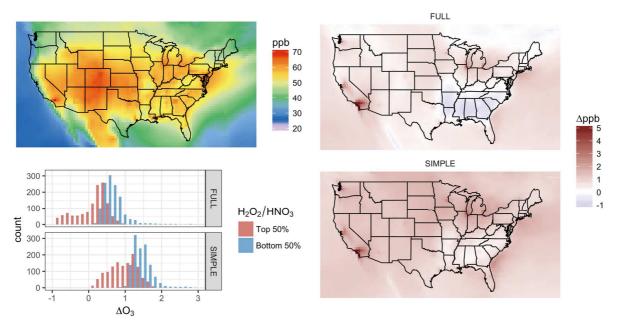


Figure 5: Mean peak 8-hour average O_3 in the United States summer (upper left), changes with additional VOC chemistry in FULL and SIMPLE cases (right), and the distribution of terrestrial O_3 changes for the FULL case (compared to BASE) segregated by mean simulated H_2O_2/HNO_3 ratio as a proxy representation of NO_x/VOC sensitivity (lower left). Histogram x-axis is trimmed for visibility. Full range of values extends from -1 ppb to 14 ppb (FULL) and 0 to 11 ppb (SIMPLE).

- 195 In all cases, changes in O_3 are heavily dependent on ambient NO_x/VOC ratios, as indicated by
- 196 lower-left panels of Figures 5-7. Here, the distribution of changes in O₃ are shown, divided into
- 197 two categories based on the ratio of hydrogen peroxide (H_2O_2) vs. nitric acid (HNO_3) . This ratio
- 198 is a simple metric for estimating NO_x/VOC sensitivity, assuming that nitric acid is the main NO_x
- sink (Milford et al., 1994; Sillman et al., 1997). In each region, terrestrial grid cells in the bottom
 50% of this ratio (indicating more VOC sensitivity) showed much more pronounced positive
- 201 increases in O₃, while more VOC-saturated regions showed reduced O₃ increases, or even
- reductions associated with the addition of monoterpene and aromatic chemistry. This highlights
- how the response of ozone to additional VOC sources is strongly dependent on chemical
- environment. The SIMPLE implementation also shows stronger positive changes in O_3 in all
- 205 three regions, averaging around 1 ppb higher values than found in the FULL case.
- 206 Comparison to O₃ observations through the EPA's AQS network of stations in the United States
- 207 show mixed results. The BASE case simulation overpredicts O_3 at most sites (total mean bias of
- 8.2 ± 6.5 ppb). California's San Joaquin Valley region stands as one notable exception, where
- 209 modeled O_3 actually underpredicts average summer observations for these years by up to 18 ppb.
- As would be expected, the additional O_3 generated by aromatic and monoterpene chemistry in
- 211 most areas increases an already positive bias; the FULL case shows a total mean bias of 9 ppb,
- ± 7 ppb. Exceptions to this can be found in California, where the previously noted O_3
- 213 underprediction is improved by an average of 1.6 ppb in the FULL case, as well as in the
- 214 Southeast, where reductions in O₃ resulting from additional VOC reactivity in an already

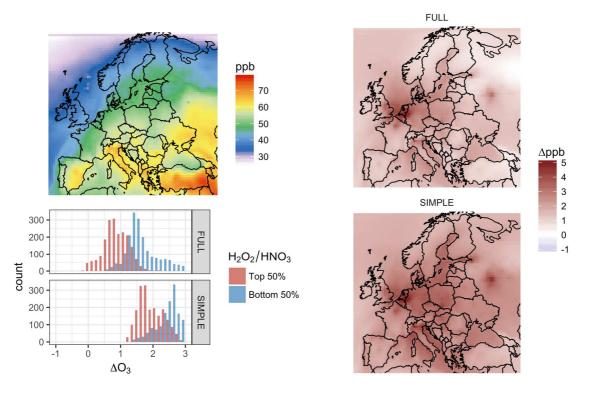


Figure 6: As Figure 5, for Europe. Histogram x-axis is trimmed for visibility. Full range of values extends from 0 ppb to 5 ppb (FULL) and 1 ppb to 4 ppb (SIMPLE).

- 215 saturated region slightly improve agreement with observations. In Europe, BASE case
- 216 comparison with observations from the EEA's AirBase inventory shows a similar overprediction
- of surface summertime O_3 of 9.5 ± 6.9 ppb. The additional VOC chemistry of the FULL case
- 218 enhances this bias by an average of 2.0 ± 0.8 ppb.
- 219 Comparison of aromatic levels themselves to AQS observations (not shown) shows a modest
- 220 overprediction in urban areas and a comparable underprediction in rural areas (overall bias of -
- 0.03 ppb, RMSE of 0.45 ppb), differences which may stem from uncertainties in aromatic
 emissions inventories. Unfortunately, no such record of systematic observations exist for
- monoterpenes at this time, making a direct comparison of these modeled species impossible.

224 **4** Conclusions

- 225 By integrating aromatics and monoterpenes into the GEOS-Chem gas-phase chemistry
- mechanism, we quantify the potential impacts of these species on total OH reactivity and O_3
- 227 production, finding important contributions to each. Although an already positive O₃ bias is
- 228 exacerbated by the additional effective VOC burden, we find slightly improved agreement with
- observed OH reactivity totals, a metric that in general has shown a significant negative bias in
- 230 model results. Furthermore, many uncertainties surround each step of O_3 formation, including
- precursor emissions, oxidative chemistry, transport, and removal. While the additional reactivity
- provided by bringing these species online pushes overpredicted O_3 even higher in these simulations, other ongoing and proposed changes (such as the addition of halogen chemistr
- simulations, other ongoing and proposed changes (such as the addition of halogen chemistry,
 (Sherwen et al., 2016)) may reduce O₃ values, making the additional production from aromatics

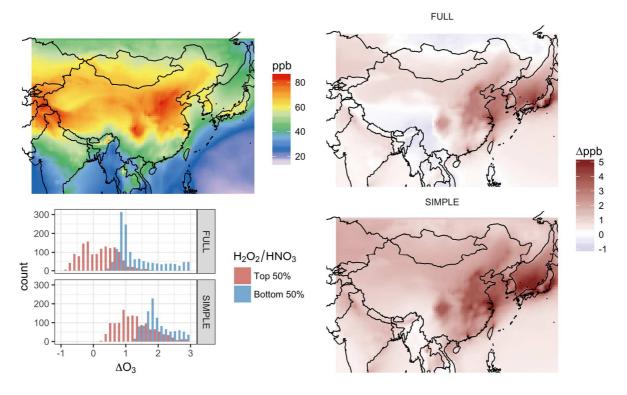


Figure 7: As Figure 5, for Asia. Histogram x-axis is trimmed for visibility. Full range of values extends from -1 ppb to 4 ppb (FULL) and 0 ppb to 6 ppb (SIMPLE).

and monoterpenes more beneficial to model skill. For these reasons, we propose that the

236 inclusion of aromatic and monoterpene chemistry is important for the effective representation

and prediction of ozone pollution, despite substantial uncertainties regarding product distribution

and rates of multigenerational chemistry. While the inclusion of additional advected species

239 increases computational demands, we show that this can be mitigated through a simplified

representation of this chemistry, representing the increased OH reactivity with less

computational cost. To further optimize these improvements, future laboratory experiments
 targeting the relevant chemical kinetics will be necessary, along with ongoing efforts to develo

targeting the relevant chemical kinetics will be necessary, along with ongoing efforts to develop a robust, efficient, and accurate chemical mechanism for the representation of these products and

244 their reactions in large-scale models.

245

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248 249

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