1	Simulation of the chemical evolution of biomass burning organic
2	aerosol
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## 11 Abstract

12 The chemical transport model PMCAMx was extended to investigate the effects of partitioning and photochemical aging of biomass burning emissions on 13 organic aerosol (OA) concentrations. A source-resolved version of the model, 14 PMCAMx-SR, was developed in which biomass burning emissions and their 15 16 oxidation products are represented separately from the other OA components. The volatility distribution of biomass burning OA (bbOA) and its chemical aging were 17 simulated based on recent laboratory measurements. PMCAMx-SR was applied to 18 Europe during an early summer (1-29 May 2008) and a winter period (25 February-22 19 20 March 2009).

During the early summer, the contribution of biomass burning (both primary 21 22 and secondary species) to total OA levels over continental Europe was estimated to be approximately 16%. During winter the contribution was nearly 47% due to both 23 24 extensive residential wood combustion, but also wildfires in Portugal and Spain. The intermediate volatility compounds (IVOCs) with effective saturation concentration 25 values of  $10^5$  and  $10^6 \,\mu g \,m^{-3}$  are predicted to contribute around one third of the bbOA 26 during the summer and 15% during the winter by forming secondary OA. The 27 uncertain emissions of these compounds and their SOA formation potential require 28 additional attention. Evaluation of PMCAMx-SR predictions against aerosol mass 29 spectrometer measurements in several sites around Europe suggests reasonably good 30 performance for OA (fractional bias less than 35% and fractional error less than 50%). 31

The performance was weaker during the winter suggesting uncertainties in the residential heating emissions and the simulation of the resulting bbOA in this season.

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## 35 **1 Introduction**

Atmospheric aerosols, also known as particulate matter (PM), are suspensions of 36 fine solid or liquid particles in air. These particles range in diameter from a few 37 nanometers to tens of micrometers. Atmospheric particles contain a variety of non-38 volatile and semi-volatile compounds including water, sulfates, nitrates, ammonium, 39 40 dust, trace metals, and organic matter. Many studies have linked increased mortality (Dockery et al., 1993), decreased lung function (Gauderman et al., 2000), bronchitis 41 incidents (Dockery et al., 1996), and respiratory diseases (Pope, 1991; Schwartz et al., 42 1996; Wang et al., 2008) with elevated PM concentrations. The most readily 43 perceived impact of high particulate matter concentrations is visibility reduction in 44 polluted areas (Seinfeld and Pandis, 2006). Aerosols also play an important role in the 45 energy balance of our planet by scattering and absorbing radiation (Schwartz et al., 46 1996). 47

Organic aerosol (OA) is a major component of fine PM in most locations 48 49 around the world. More than 50% of the atmospheric fine aerosol mass is comprised of organic compounds at continental mid-latitudes and as high as 90% in tropical 50 51 forested areas (Andreae and Crutzen, 1997; Roberts et al., 2001; Kanakidou et al., 52 2005). There are many remaining questions regarding the identity, chemistry, lifetime, and in general fate of organic compounds, despite their atmospheric importance. OA 53 54 originates from many different anthropogenic and biogenic sources and processes and 55 has been traditionally categorized into primary OA (POA) which is directly emitted into the atmosphere as particles or secondary OA (SOA) that is formed from the 56 condensation of the oxidation products of volatile (VOCs), intermediate volatility 57 (IVOCs), and semivolatile organic compounds (SVOCs). Both POA and SOA are 58 usually characterized as anthropogenic (aPOA, aSOA) or biogenic (bPOA, bSOA) 59 depending on their sources. Biomass burning OA (bbOA) is treated separately from 60 61 the other anthropogenic and biogenic OA components in this work.

Biomass burning is an important global source of air pollutants that affect atmospheric chemistry, climate, and environmental air quality. In this work, the term biomass burning includes wildfires, prescribed burning in forests and other areas, residential wood combustion for heating and other purposes, and agricultural waste

burning. Biomass burning is a major source of particulate matter, nitrogen oxides,
carbon monoxide, volatile organic compounds, as well as other hazardous air
pollutants. Biomass burning contributes around 75% of global combustion POA
(Bond et al., 2004). In Europe, biomass combustion is one of the major sources of
OA, especially during winter (Puxbaum et al., 2007; Gelencser et al., 2007).

Chemical transport models (CTMs) have traditionally treated POA emissions 71 72 as non-reactive and non-volatile. However, dilution sampler measurements have indicated that POA is clearly semi-volatile (Lipsky and Robinson, 2006; Robinson et 73 al., 2007; Huffman et al., 2009a, 2009b). The semi-volatile character of POA 74 emissions can be described by the volatility basis set (VBS) framework (Donahue et 75 al., 2006; Stanier et al., 2008). The VBS is a scheme of simulating OA accounting for 76 changes in gas-particle partitioning due to dilution, temperature changes, and 77 photochemical aging. The third Fire Lab at Missoula Experiment (FLAME-III) 78 investigated a suite of fuels associated with prescribed burning and wildfires (May et 79 al., 2013). The bbOA partitioning parameters derived from that study are used in this 80 work to simulate the dynamic gas-particle partitioning and photochemical aging of 81 82 bbOA emissions. In this work we define bbOA as the sum of bbPOA and bbSOA 83 following the terminology proposed by Murphy et al. (2014).

A number of modeling efforts have examined the contribution of the semi-84 85 volatile bbOA emissions to ambient particulate levels using the VBS framework. For example, Fountoukis et al. (2014) used a three dimensional CTM with an updated 86 87 wood combustion emission inventory distributing OA emissions using the volatility distribution proposed by Shrivastava et al. (2008). However, this study assumed the 88 89 same volatility distribution for all OA sources. This volatility distribution is not in 90 general representative of biomass burning emissions since it was derived based on 91 experiments using fossil fuel sources (Shrivastava et al., 2008). Volatility distributions of wood smoke have been measured by Grieshop et al. (2009a) and May 92 et al. (2013) covering the volatility range up to approximately  $10^4 \ \mu g \ m^{-3}$  (at 298 K). 93 94 Alvarado et al. (2015) in a modelling study stressed the importance of the emissions of the rest of the IVOCs (at  $10^5$  and  $10^6 \ \mu g \ m^{-3}$ ) and attempted to constrain the 95 corresponding chemistry using observations from a biomass burning plume from a 96 97 prescribed fire in California

99 The main objective of this study is to develop and test a CTM treating biomass 100 burning organic aerosol (bbOA) emissions separately from all the other anthropogenic and biogenic emissions. This extended model should allow at least in principle more 101 accurate simulation of OA and direct predictions of the role of bbOA in regional air 102 quality. The rest of the manuscript is organized as follows. First, a brief description of 103 the new version of PMCAMx (PMCAMx-SR) is provided. The source-resolved 104 version of PMCAMx (PMCAMx-SR) treats bbOA emissions and their chemical 105 reactions separately from those of other OA sources. The details of the application of 106 107 PMCAMx-SR in the European domain for a summer and a winter period are presented. In the next section, the predictions of PMCAMx-SR are evaluated using 108 aerosol mass spectrometer (AMS) measurements collected in Europe. Finally, the 109 sensitivity of the model to different parameters is quantified. 110

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## 112 2 PMCAMx-SR description

PMCAMx-SR is a source-resolved version of PMCAMx (Murphy and Pandis, 113 2009; Tsimpidi et al., 2010; Karydis et al., 2010), a three-dimensional chemical 114 transport model that uses the framework of CAMx (Environ, 2003) and simulates the 115 116 processes of horizontal and vertical advection, horizontal and vertical dispersion, wet and dry deposition, gas, aqueous and aerosol-phase chemistry. The chemical 117 118 mechanism employed to describe the gas-phase chemistry is based on the SAPRC mechanism (Carter, 2000; Environ, 2003). The version of SAPRC currently used 119 120 includes 211 reactions of 56 gases and 18 radicals. The SAPRC mechanism has been updated to include gas-phase oxidation of semivolatile organic compounds (SVOCs), 121 122 and intermediate volatility organic compounds (IVOCs). In this work the IVOCs and SVOCs are described with 9 volatility bins  $(10^{-2} - 10^6 \text{ \mug m}^{-3} \text{ at } 298 \text{ K})$ . Different 123 surrogate species are used to represent the corresponding fresh (primary) and the 124 secondary organic compounds. The chemical reactions of these compounds 125 parameterized as one volatility bin reduction during each reaction with OH have been 126 added to the original SAPRC mechanism. Three detailed aerosol modules are used to 127 simulate aerosol processes: inorganic aerosol growth (Gaydos et al., 2003; Koo et al., 128 2003), aqueous phase chemistry (Fahey and Pandis, 2001), and secondary organic 129 aerosol (SOA) formation and growth (Koo et al., 2003). The above modules use a 130 sectional approach to dynamically track the size evolution of each aerosol component 131 132 across 10 size sections spanning the diameter range from 40 nm to 40  $\mu$ m.

## 134 2.1 Organic aerosol modelling

PMCAMx-SR simulates OA based on the volatility basis set (VBS) framework (Donahue et al., 2006; Stanier et al., 2008). VBS is a unified scheme of treating OA, simulating the volatility, gas-particle partitioning, and photochemical aging of organic pollutant emissions. PMCAMx-SR incorporates separate VBS variables and parameters for the various OA components based on their source.

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## 2.1.1 Volatility of primary emissions

PMCAMx-SR assumes that all primary emissions are semi-volatile. 142 According to the VBS scheme, species with similar volatility are lumped into bins 143 expressed in terms of effective saturation concentration values,  $C^*$ , separated by 144 factors of 10 at 298 K. POA emissions are distributed across a nine-bin VBS with  $C^*$ 145 values ranging from  $10^{-2}$  to  $10^{6}$  µg m<sup>-3</sup> at 298 K. SVOCs and IVOCs are distributed 146 among the 1, 10, 100 µg m<sup>-3</sup>  $C^*$  bins and 10<sup>3</sup>, 10<sup>4</sup>, 10<sup>5</sup>, 10<sup>6</sup> µg m<sup>-3</sup>  $C^*$  bins 147 respectively. Table 1 lists the generic POA volatility distribution proposed by 148 Shrivastava et al. (2008) assuming that the IVOC emissions are approximately equal 149 150 to 1.5 times the POA emissions (Robinson et al., 2007; Tsimpidi et al., 2010; Shrivastava et al., 2008). This volatility distribution is used in PMCAMx-SR for all 151 152 sources with the exception of biomass burning. In the original PMCAMx this volatility distribution is also used for biomass burning emissions. 153

154 The partitioning calculations of primary emissions are performed using the same module used to calculate the partitioning of all semi-volatile organic species 155 156 (Koo et al., 2003). This is based on absorptive partitioning theory and assumes that the bulk gas and particle phases are in equilibrium and that all condensable organics 157 form a pseudo-ideal solution (Odum et al., 1996; Strader et al., 1999). Organic gas-158 particle partitioning is assumed to depend on temperature and aerosol composition. 159 The partioning model assumes that the organic compounds form a single pseudo-ideal 160 solution in the particle phase and do not interact with the aqueous phase (Strader et 161 al., 1999). The Clausius-Clapeyron equation is used to describe the effects of 162 temperature on  $C^*$  and partitioning. Table 1 also lists the enthalpies of vaporization 163 currently used in PMCAMx and PMCAMx-SR. All POA species are assumed to have 164 an average molecular weight of 250 g mol<sup>-1</sup>. 165

## 167 2.1.2 Secondary organic aerosol from VOCs

Based on the original work of Lane et al. (2008a), SOA from VOCs (SOA-v) 168 is represented using four volatility bins (1, 10,  $10^2$ ,  $10^3 \mu g m^{-3}$  at 298 K). The model 169 uses 4 surrogate compounds for SOA from anthropogenic VOCs (aSOA-v) and 170 another 4 for SOA from biogenic VOCs (bSOA-v). These can exist in either the gas 171 or particulate phase so there are two model variables for each volatility bin. 172 Additional surrogate compounds and thus model variables are used to keep track of 173 the oxidation products of anthropogenic IVOCs (SOA-iv) and SVOCs (SOA-sv). 174 175 PMCAMx-SR includes additional SOA surrogate compounds to simulate the oxidation productions of the biomass burning emissions. aSOA components are 176 assumed to have an average molecular weight of 150 g mol<sup>-1</sup>, while bSOA species 177 180 g mol<sup>-1</sup>. Laboratory results from the smog-chamber experiments of Ng et al. 178 (2006) and Hildebrandt et al. (2009) are used for the anthropogenic aerosol yields. 179

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## 181 **2.1.3** Chemical aging mechanism

All OA components are treated as chemically reactive in PMCAMx-SR. 182 Anthropogenic SOA components resulting from the oxidation of SVOCs and IVOCs 183 184 (aSOA-sv, aSOA-iv) are assumed to react with OH radicals in the gas phase with a rate constant of  $k = 4 \times 10^{-11} \text{ cm}^3 \text{ molec}^{-1} \text{ s}^{-1}$  resulting in the formation of lower 185 volatility aSOA. Semi-volatile anthropogenic aSOA-v components are assumed to 186 react with OH in the gas phase with a rate constant of  $k = 1 \times 10^{-11} \text{ cm}^3 \text{ molec}^{-1} \text{ s}^{-1}$ 187 (Atkinson and Arey, 2003). All these aging reactions are assumed to reduce the 188 volatility of the reacted vapor by one order of magnitude, which is linked to an 189 190 increase in OA mass by approximately 7.5% to account for added oxygen. Biogenic 191 SOA (bSOA-v) aging is assumed to lead to zero net change of volatility and OA mass 192 (Lane et al., 2008b).

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## 194 2.2 PMCAMx-SR enhancements

In PMCAMx-SR, the fresh biomass burning organic aerosol (bbOA) and its secondary oxidation products (bbSOA) are simulated separately from the other POA components. The May et al. (2013) volatility distribution is used to simulate the gasparticle partitioning of fresh bbOA. This distribution includes surrogate compounds up to a volatility of  $10^4 \mu g m^{-3}$ . This means that the more volatile IVOCs, which could 200 contribute to SOA formation, are not included. To close this gap, the values of the volatility distribution of Robinson et al. (2007) are used for the  $10^5$  and  $10^6 \,\mu g m^{-3}$ 201 bins (Table 1). The sensitivity of PMCAMx-SR to the IVOC emissions added to the 202 May et al. (2013) distribution will be explored in a subsequent section. The effective 203 saturation concentrations and the enthalpies of vaporization used for bbOA in 204 PMCAMx-SR are also listed in Table 1. The new bbOA scheme requires the 205 206 introduction of 36 new organic species to simulate both phases of fresh primary and oxidized bbOA components. The rate constant used for the chemical aging reactions 207 is the same as the one currently used for all POA components and has a value of k = 4208  $\times$  10<sup>-11</sup> cm<sup>3</sup> molec<sup>-1</sup> s<sup>-1</sup>. The volatility distributions of bbOA in PMCAMx and 209 PMCAMx-SR are shown in Fig. 1a. The volatility distribution implemented in 210 PMCAMx-SR results in less volatile bbOA for ambient OA levels (a few  $\mu g m^{-3}$ ) 211 (Fig. 1b). A schematic representation of the organic aerosol module of PMCAMx-SR 212 is shown in Figure 2. 213

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## 215 **3** Model application

PMCAMx-SR was applied to a 5400×5832 km<sup>2</sup> region covering Europe with 216 217 36×36 km grid resolution and 14 vertical layers extending up to 6 km. The model was set to perform simulations on a rotated polar stereographic map projection. The 218 necessary inputs to the model include horizontal wind components, temperature, 219 220 pressure, water vapor, vertical diffusivity, clouds, and rainfall. All meteorological inputs were created using the meteorological model WRF (Weather Research and 221 Forecasting) (Skamarock et al., 2005). The simulations were performed during a 222 summer (1-29 May 2008) and a winter period (25 February-22 March 2009). In order 223 to limit the effect of the initial conditions on the results, the first two days of each 224 225 simulation were excluded from the analysis.

Anthropogenic and biogenic emissions in the form of hourly gridded fields were developed both for gases and primary particulate matter. Anthropogenic gas emissions include land emissions from the GEMS dataset (Visschedijk et al., 2007) and also emissions from international shipping activities. Anthropogenic particulate matter mass emissions of organic and elemental carbon are based on the Pan-European Carbonaceous Aerosol Inventory (Denier van der Gon et al., 2010) that has been developed as part of the EUCAARI project activities (Kulmala et al., 2009). All 233 relevant significant emission sources, including anthropogenic biomass burning emissions from agricultural activies and residential heating, are included in the two 234 inventories. Day-specific wildfire emissions were also included (Sofiev et al., 2008a; 235 2008b). Emissions from ecosystems were calculated offline by MEGAN (Model of 236 Emissions of Gases and Aerosols from Nature) (Guenther et al., 2006). The marine 237 aerosol emission model developed by O'Dowd et al. (2008) has been used to estimate 238 mass fluxes for both accumulation and coarse mode including the organic aerosol 239 fraction. Wind speed data from WRF and chlorophyll-a concentrations are the inputs 240 241 needed for the marine aerosol emissions module.

The gridded emission inventories of bbOA species for the two modeled periods 242 are shown in Fig. 3. During the early summer simulated period wildfires were 243 responsible for 60% of the bbOA emissions, agricultural waste burning for 15% and 244 residential wood combustion for 25% (Table 2). Details about the OA emission rates 245 from agricultural activities are provided in the Supplementary Information (Fig. S1). 246 During winter residential combustion is the dominant source (63%). The wintertime 247 wildfire emissions in the inventory, approximately 3,000 tn d<sup>-1</sup>, are quite high 248 especially when compared with the corresponding summer value which is 1,700 tn d<sup>-</sup> 249 250 <sup>1</sup>. The spatial distribution of OA emission rates from wildfires during 25 February-22 March 2009 is provided in the Supplementary Information (Fig. S2). Analysis of fire 251 252 counts in satellite observations used for the development of the inventory suggests that some agricultural emissions have probably been attributed to wildfires. All bbOA 253 254 sources are treated the same way in PMCAMx-SR so this potential misattribution 255 does not affect our results.

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## 257 4 PMCAMx-SR testing

258 To test our implementation of the source-resolved VBS in PMCAMx-SR we compared its results with those of PMCAMx using the same VBS parameters. For this 259 test we used in PMCAMx-SR the default PMCAMx bbOA partitioning parameters 260 shown in Table 1 as proposed by Shrivastava et al. (2008). In this way both models 261 should simulate the bbOA in exactly the same way, but PMCAMx-SR describes it 262 independently while PMCAMx lumps it with other primary OA. The differences 263 between the corresponding OA concentrations predicted by the two models were on 264 average less than  $10^{-3} \mu g m^{-3}$  (0.03%). The maximum difference was approximately 265  $0.03 \ \mu g \ m^{-3}$  (0.6%) in western Germany. This suggests that our changes to the code of 266

267 PMCAMx to develop PMCAMx-SR did not introduce any inconsistencies with the
268 original model. The small differences are due to numerical issues in the
269 advection/dispersion calculations.

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# 271 5 Contribution of bbOA to PM over Europe

In this section the predictions of PMCAMx-SR for the base case simulations during 1 - 29 May 2008 and 25 February - 22 March 2009 are analysed. Figure 4 shows the PMCAMx-SR predicted average ground-level  $PM_{2.5}$  concentrations for the various OA components for the two simulated periods.

The POA from non-bbOA sources will be called fossil POA (fPOA) in the rest 276 of the paper. fPOA levels over Europe were on average around 0.1 µg m<sup>-3</sup> during both 277 periods (Figs. 4a and 4b). However, their spatial distributions are quite different. 278 During May, predicted fPOA concentrations are as high as  $2 \mu g m^{-3}$  in polluted areas 279 in central and northern Europe but are less than 0.5  $\mu$ g m<sup>-3</sup> in the rest of the domain. 280 These low levels are due to the evaporation of POA in this warm period. For the 281 winter period peak fPOA levels are higher reaching values of around 3.5 µg m<sup>-3</sup> in 282 283 Paris and Moscow. fPOA contributes approximately 3.5% and 6% to total OA in Europe during May 2008 and February-March 2009 respectively. bbPOA 284 concentrations have peak average values 7  $\mu$ g m<sup>-3</sup> in St. Petersburg in Russia and 10 285  $\mu$ g m<sup>-3</sup> in Porto in Portugal during summer and winter respectively (Figures 4c and 286 287 4d). During the summer bbPOA is predicted to contribute 5% to total OA, and its contribution during winter increases to 32%. The average predicted bbOA 288 concentrations over Europe are 0.1  $\mu$ g m<sup>-3</sup> and 0.8  $\mu$ g m<sup>-3</sup> during the summer and the 289 290 winter period respectively.

291 The SOA resulting from the oxidation of IVOCs (SOA-iv) and evaporated POA (SOA-sv) has concentrations as high as 1 µg m<sup>-3</sup> in central Europe and the 292 average levels are around 0.3  $\mu$ g m<sup>-3</sup> (13% contribution to total OA) during summer 293 (Fig. 4e). During winter the peak concentration value was a little less than  $0.5 \ \mu g \ m^{-3}$ 294 in Moscow in Russia and the average levels were approximately 0.1  $\mu$ g m<sup>-3</sup> (5.5% 295 contribution to total OA) (Fig 4f). The highest average concentration of bbSOA-sv 296 and bbSOA-iv (biomass burning SOA from intermediate volatility and semi-volatile 297 precursors) was approximately 1  $\mu$ g m<sup>-3</sup> in Lecce in Italy during summer and 3.5  $\mu$ g 298 m<sup>-3</sup> in Porto during winter. During May bbSOA is predicted to contribute 11% to total 299 OA over Europe and during February-March 2009 its predicted contribution is 15%. 300

The average bbSOA is 0.3  $\mu$ g m<sup>-3</sup> during summer and approximately 0.4  $\mu$ g m<sup>-3</sup> during winter (Figs. 4g and 4h). During the summer, the remaining 67% of total OA is biogenic SOA (52%) and anthropogenic SOA (15%), and in winter of the remaining 41% of total OA, 36% is biogenic and 5% is anthropogenic SOA (not shown).

In areas like St. Petersburg in Russia predicted hourly bbOA levels exceeded 305 300 µg m<sup>-3</sup> due to the nearby fires affecting the site on May 3-5 (Fig. 5a). For these 306 extremely high concentrations most of the bbOA (90% for St. Petersburg) was 307 primary with the bbSOA contributing around 10%. The spatiotemporal evolution of 308 309 bbPOA and bbSOA during May 1–6 in Scandinavia and northwest Russia is depicted in Figure 6. A series of fires started in Russia on May 1, becoming more intense 310 during the next days until May 6 when they were mostly extinguished. bbSOA, as 311 expected, follows the opposite evolution with low concentration values in the 312 beginning of the fire events (May 1) and higher values later on. The bbSOA 313 production increases the range of influence of the fires. 314

In Majden (FYROM) fires contributed up to 25 µg m<sup>-3</sup> of bbOA on May 25-315 26. The bbSOA was 15% of the bbOA in this case (Fig. S3). Fires also occurred in 316 south Italy (Catania) and contributed up to 52 µg m<sup>-3</sup> of OA on May 15-17. During 317 318 this period the bbSOA was 13% of the bbOA (Fig. S3). Paris (France) and Dusseldorf (Germany) were further away from major fires but were also affected by fire 319 320 emissions during most of the month (Fig. S3). The maximum hourly bbOA levels in these cities were around 5  $\mu$ g m<sup>-3</sup>, but bbSOA in this case represents according to the 321 model around 35% of the total bbOA in Paris and 55% in Dusseldorf. 322

During the winter simulation period, there were major fires during March 20-22 in Portugal and northwestern Spain. The maximum predicted hourly bbOA concentration in Porto (Portugal) exceeded 700  $\mu$ g m<sup>-3</sup> on March 21 (Fig. 5b). During the same 3 days in March the average levels of bbPOA in Portugal and Spain were 9  $\mu$ g m<sup>-3</sup> and their contribution to total OA was 62%. bbPOA was 80% of the total bbOA during March 20-22 in the Iberian Peninsula.

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# 6 Role of the more volatile IVOCs

We performed an additional sensitivity simulation where we assumed that there are no emissions of more volatile IVOCs (those in the  $10^5$  and  $10^6 \,\mu g \,m^{-3}$  bins). The partitioning parameters used in this sensitivity test are shown in Table 1. The emissions rates for each volatility bin during the two modeled periods are provided in

335 the Supplementary Information (Table S1). The absolute emissions assigned to the lower volatility bins are approximately the same for both simulations. More 336 specifically, during May 2008, the emission rates of LVOCs ( $10^{-2}$ ,  $10^{-1}$  µg m<sup>-3</sup> C<sup>\*</sup> 337 bins) and SVOCs ( $10^0$ ,  $10^1$ ,  $10^2 \mu g m^{-3} C^*$  bins) are 530 and 1050 tn d<sup>-1</sup> respectively 338 for the base-case run and 580 and 1160 tn d<sup>-1</sup> respectively for the sensitivity run. 339 During February-March 2009, the emission rates of LVOCs and SVOCs are 2100 and 340 4100 tn d<sup>-1</sup> respectively for the base-case run and 2300 and 4500 tn d<sup>-1</sup> respectively 341 for the sensitivity run. The base case simulation assumes higher emissions in the 342 upper volatility bins of the IVOCs (10<sup>3</sup>, 10<sup>4</sup>, 10<sup>5</sup>, 10<sup>6</sup> µg m<sup>-3</sup>  $C^*$  bins) which can be 343 converted to bbSOA. During summer, the emission rate of IVOCs is 4460 tn d<sup>-1</sup> in the 344 base-case run and 1160 tn d<sup>-1</sup> in the sensitivity test. During winter, the emission rate 345 of IVOCs is 17400 tn d<sup>-1</sup> in the base case and 4500 tn d<sup>-1</sup> in the sensitivity test. 346

The base case and the sensitivity simulations predict practically the same 347 bbPOA concentrations in both periods (Fig. 7) as expected based on the emission 348 inventory. During summer, the average absolute change of bbPOA in Europe is 349 around 10% (corresponding to 0.01  $\mu$ g m<sup>-3</sup>) (Fig. 7a). The average difference in 350 bbSOA is significantly higher and around 60% (0.2  $\mu$ g m<sup>-3</sup> on average) due to the 351 higher IVOC emissions of the base case simulation. The atmospheric conditions 352 during this warm summer period (high temperature, UV radiation, relative humidity) 353 354 lead to high OH concentrations and rapid production of bbSOA.

During winter, the average absolute change for both bbPOA and bbSOA in Europe is approximately 0.1  $\mu$ g m<sup>-3</sup> (Fig. 7b and 7f). These correspond to 15% change for the primary and 25% for the secondary bbOA levels. The maximum difference for average bbPOA is approximately 5  $\mu$ g m<sup>-3</sup> and for bbSOA around 1.5  $\mu$ g m<sup>-3</sup> both in northwestern Portugal. However, during the fire period (March 20-22) in Spain and Portugal the maximum concentration difference between the two cases was 20  $\mu$ g m<sup>-3</sup> for bbPOA and 7  $\mu$ g m<sup>-3</sup> for bbSOA.

Figure 8 shows the total bbOA (sum of bbPOA and bbSOA) during both periods. Higher bbOA concentrations are predicted in the base case simulation due to the higher bbSOA concentrations from higher IVOC emissions. During summer the contributions of the biomass burning IVOC oxidation products to total bbOA exceed 366 30% over most of Europe, while during winter these components are important mostly over Southern Europe and the Mediterranean (Fig. S4).

#### **Comparison with field measurements** 370 7

In order to assess the PMCAMx-SR performance during the two simulation 371 periods the model's predictions were compared with AMS hourly measurements that 372 took place in several sites around Europe. All observation sites are representative of 373 374 regional atmospheric conditions.

The PMF technique (Paatero and Tapper, 1994; Lanz et al., 2007; Ulbrich et 375 al., 2009; Ng et al., 2010) was used to analyze the AMS organic spectra providing 376 377 information about the sources contributing to the OA levels (Hildebrandt et al., 2010; Morgan et al., 2010). The method classifies OA into different types based on different 378 temporal emission and formation patterns and separates it into hydrocarbon-like 379 organic aerosol (HOA, a POA surrogate), oxidized organic aerosol (OOA, a SOA 380 surrogate) and fresh bbOA. Additionally, factor analysis can further classify OOA 381 into more and less oxygenated OOA components. Fresh bbOA can be compared 382 directly to the PMCAMx-SR bbPOA predictions, whereas bbSOA should, in principle 383 at least, be included in the OOA factors. The AMS HOA can be compared with 384 predicted fresh POA. The oxygenated AMS OA component can be compared against 385 386 the sum of anthropogenic and biogenic SOA (aSOA, bSOA), SOA-sv and SOA-iv, bbSOA and OA from long range transport. 387

388 PMCAMx-SR performance is quantified by calculating the mean bias (MB), the mean absolute gross error (MAGE), the fractional bias (FBIAS), and the fractional 389 390 error (FERROR) defined as:

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$$MB = \frac{1}{n} \sum_{i=1}^{n} (P_i - O_i)$$
$$MAGE = \frac{1}{n} \sum_{i=1}^{n} |P_i - O_i|$$
$$BIAS = \frac{2}{n} \sum_{i=1}^{n} \frac{P_i - O_i}{n}$$
$$EERROR = \frac{2}{n} \sum_{i=1}^{n} \frac{|P_i - O_i|}{n}$$

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$$FBIAS = \frac{2}{n} \sum_{i=1}^{n} \frac{P_i - O_i}{P_i + O_i}$$
  $FERROR = \frac{2}{n} \sum_{i=1}^{n} \frac{|P_i - O_i|}{P_i + O_i}$ 

393 where  $P_i$  is the predicted value of the pollutant concentration,  $O_i$  is the observed value and n is the number of measurements used for the comparison. AMS measurements 394 395 are available in 4 stations (Cabauw, Finokalia, Melpitz and Mace Head) during 1-29 May 2008 and 7 stations (Cabauw, Helsinki, Mace Head, Melpitz, Hyytiala, 396 397 Barcelona and Chilbolton) during 25 February-23 March 2009.

During May 2008 a bbPOA factor was identified based on the PMF analysis 398 399 of the measurements only in Cabauw and Mace Head. In the other two sites (Finokalia and Melpitz) PMCAMx-SR predicted very low average bbPOA levels (less 400

than 0.1  $\mu$ g m<sup>-3</sup>), so its predictions for these sites can be viewed as consistent with the 401 results of the PMF analysis. Figure 9 shows the comparison of the predicted bbPOA 402 by PMCAMx-SR with the observed values in Cabauw. The average AMS-PMF bbOA 403 was 0.4  $\mu$ g m<sup>-3</sup> and the predicted average bbPOA by PMCAMx-SR was also 0.4  $\mu$ g 404  $m^{-3}$ . The mean bias was only -0.01 µg  $m^{-3}$ . The model however tended to overpredict 405 during the first 10 days and to underpredict during the last week. In Mace Head 406 407 PMCAMx-SR predicts high bbOA levels during May 14 – 15, but unfortunately the available measurements started on May 16. During the last two weeks of the 408 409 simulation the model predicts much lower bbOA levels (approximately 0.35  $\mu$ g m<sup>-3</sup> less) than the AMS-PMF analysis. The same problem was observed in Cabauw 410 suggesting potential problems with the fire emissions during this period. 411

During winter the model tends to overpredict the observed bbOA values in 412 Barcelona, Cabauw, Melpitz, Helsinki and Hyytiala. On the other hand, the model 413 underpredicts the bbOA in Mace Head and Chibolton by approximately 0.3 µg m<sup>-3</sup> on 414 average. The prediction skill metrics of PMCAMx-SR (base case and sensitivity test) 415 against AMS factor analysis during the modelled periods are also provided in the 416 Supplementary Information (Tables S2-S5). These problems in reproducing 417 418 wintertime OA measurements were also noticed by Denier van der Gon et al. (2015) and suggest problems in the emissions and/or the simulation of the bbOA during this 419 420 cold period with slow photochemistry.

Given that bbOA contributed on average less than half of the total OA during the 421 422 summer, the performance (fractional bias and error) for OA of PMCAMx-SR (both for the base case and the sensitivity test) was quite similar to that of the original 423 424 PMCAMx (Table S6). The performance of the sensitivity test was a little better suggesting that the bbSOA production from the corresponding IVOCs could be 425 426 overpredicted. However, this can be also due to other sources of error in the model. The situation was similar during the winter. There was a small reduction in the 427 already small fractional bias but overall the performance of PMCAMx-SR for OA and 428 OOA were quite similar to that of PMCAMx (Table S7). This however suggests that 429 the errors in the OA predictions are not due to the new treatment of bbOA but rather 430 to other errors that are also present in the original model. 431

## 433 8 Conclusions

A source-resolved version of PMCAMx, called PMCAMx-SR was developed and tested. This new version can be used to study independently specific OA sources (e.g. diesel emissions) if so desired by the user. We applied PMCAMx-SR to the European domain during an early summer and a winter period focusing on biomass burning.

The concentrations of bbOA (sum of bbPOA and bbSOA) and their contributions to total OA over Europe are, as expected, quite variable in space and time. During the early summer, the contribution of bbOA to total OA over Europe was predicted to be 16%, while during winter it increased to 47%. Secondary biomass burning OA was predicted to be approximately 70% of the bbOA during summer and only 30% during the winter on average. The production of bbSOA increases the range of influence of fires.

The IVOCs emitted by the fires can be a major source of SOA. In our simulations, the IVOCs with saturation concentrations  $C^*=10^5$  and  $10^6 \ \mu g \ m^{-3}$ contributed approximately one third of the average bbOA over Europe. The emissions of these compounds and their aerosol forming potential are uncertain, so the formation of bbSOA clearly is an importance topic for future work.

PMCAMx-SR was evaluated against AMS measurements taken at various 451 452 European measurement stations and the results of the corresponding PMF analysis. During the summer the model reproduced without bias the average measured bbPOA 453 454 levels in Cabauw and the practically zero levels in Finokalia and Melpitz. However, it 455 underpredicted the bbPOA in Mace Head. Its performance for oxygenated organic 456 aerosol (OOA) which should include bbSOA together with a lot of other sources was mixed: overprediction in Cabauw (fractional bias +42%), Mace Head (fractional bias 457 +34%), and Finokalia (fractional bias +23%) and underprediction in Melpitz 458 (fractional bias -14%). 459

During the winter the model overpredicted the bbPOA levels in most stations (Cabauw, Helsinki, Melpitz, Hyytiala, Barcelona), while it underpredicted in Mace Head and Chibolton. At the same time, it reproduced the measured OOA concentrations with less than 15% bias in Cabauw, Helsinki, and Hyytiala, underpredicted OOA in Melpitz, Barcelona, and Chibolton and ovepredicted OOA in Mace Head. These results both potential problems with the wintertime emissions of bbPOA and the production of secondary OA during the winter. 467 *Data availability*. The data in the study are available from the authors upon request468 (spyros@chemeng.upatras.gr).

469

- 470 Author contributions. GNT conducted the simulations, analysed the results, and wrote
- the paper. SNP was responsible for the design of the study, the synthesis of the results
- and contributed to the writing of the paper.
- 473 *Competing interests.* The authors declare that they have no conflict of interest.
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C <sup>*</sup> at 298 K (µg m <sup>-3</sup> )	10-2	10-1	10 <sup>0</sup>	10 <sup>1</sup>	10 <sup>2</sup>	10 <sup>3</sup>	10 <sup>4</sup>	10 <sup>5</sup>	106
				POA					
Fraction of POA emissions <sup>1</sup>	0.03	0.06	0.09	0.14	0.18	0.30	0.40	0.50	0.80
Effective Vaporization Enthalpy (kJ mol <sup>-1</sup> )	112	106	100	94	88	82	76	70	64
bbPOA (Base Case)									
Fraction of POA emissions	0.2	0.0	0.1	0.1	0.2	0.1	0.3	0.50	0.80
Effective Vaporization Enthalpy (kJ mol <sup>-1</sup> )	93	89	85	81	77	73	69	70	64
<b>bbPOA</b> (Sensitivity Test)									
Fraction of POA emissions	0.2	0.0	0.1	0.1	0.2	0.1	0.3	-	-
Effective Vaporization Enthalpy (kJ mol <sup>-1</sup> )	93	89	85	81	77	73	69	-	-

1	<b>Table 1.</b> Parameters used to simulate POA and bbPOA emissions in PMCAMx-SR.
2	

<sup>1</sup>This is the traditional non-volatile POA included in inventories used for regulatory purposes. The sum of all fractions can exceed unity because a large fraction of the IVOCs is not included in these traditional particle emission inventories.

	Emission rate (tn d <sup>-1</sup> )			
1 – 29 May 2008				
Wildfires	1,700			
Residential	700			
Agriculture - waste burning	300			
25 February – 22 March 2009				
Wildfires	3,000			
Residential	6,000			
Agriculture - waste burning	320			

Table 2. Organic compound emission rates (in tn d<sup>-1</sup>) over the modeling domain
 during the simulated periods.

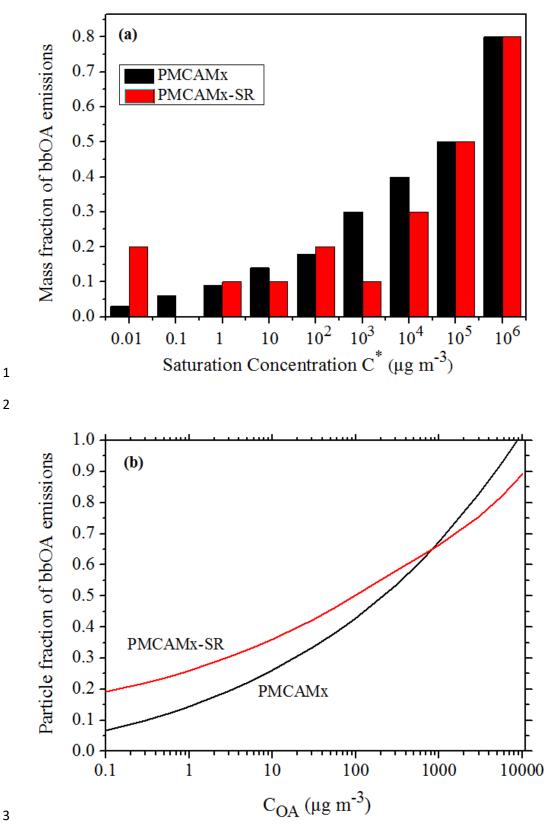
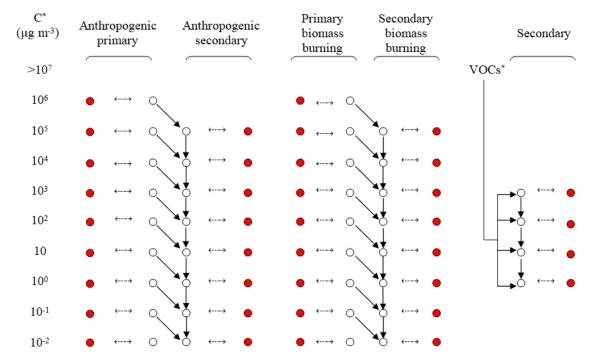


Figure 1. (a) Volatility distribution of bbOA in PMCAMx and PMCAMx-SR. (b)
Particle fractions of bbOA emissions as a function of OA concentration at 298 K.

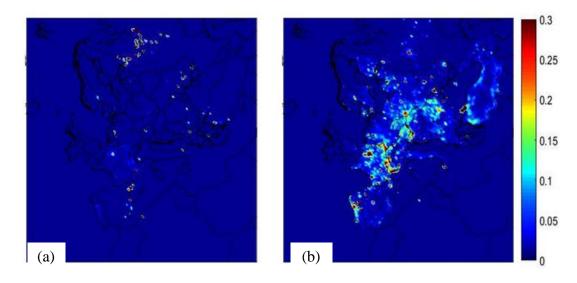




1 \*For this application it is assumed that SOA formed by biogenic VOCs does not participate in aging reactions.

```
    Particle phase
    Gas phase
    Gas – particle partitioning
    Aging reaction
```

4 Figure 2. Schematic of the organic aerosol VBS-based modeling scheme in
5 PMCAMx-SR.



- 1
- 2

**Figure 3.** Spatial distribution of average biomass burning OA emission rates (kg d<sup>-1</sup>

- 4 km<sup>-2</sup>) for the two simulation periods: (a) 1-29 May 2008 and (b) 25 February-22
- 5 March 2009.

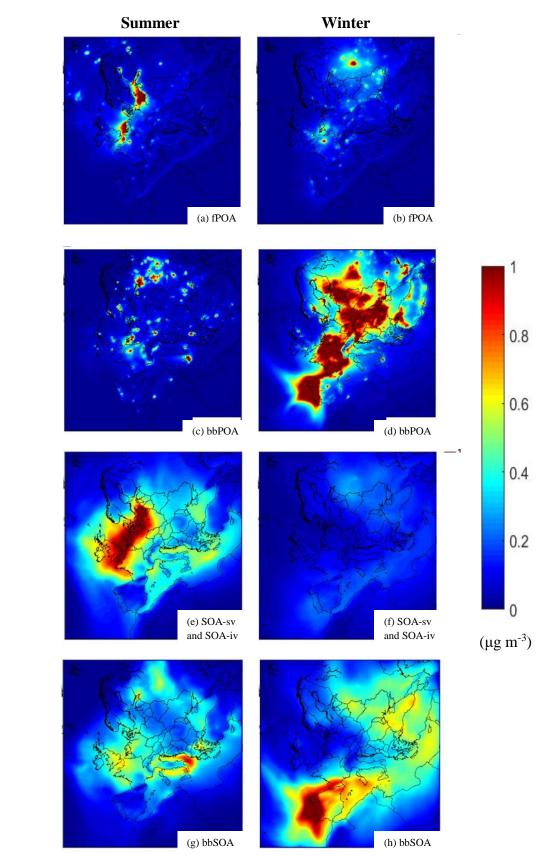


Figure 4. PMCAMx-SR predicted base case ground – level concentrations of PM<sub>2.5</sub>
(a-b) fPOA, (c-d) bbPOA, (e-f) SOA and (g-h) bbSOA, during the modeled summer

8 and winter periods.

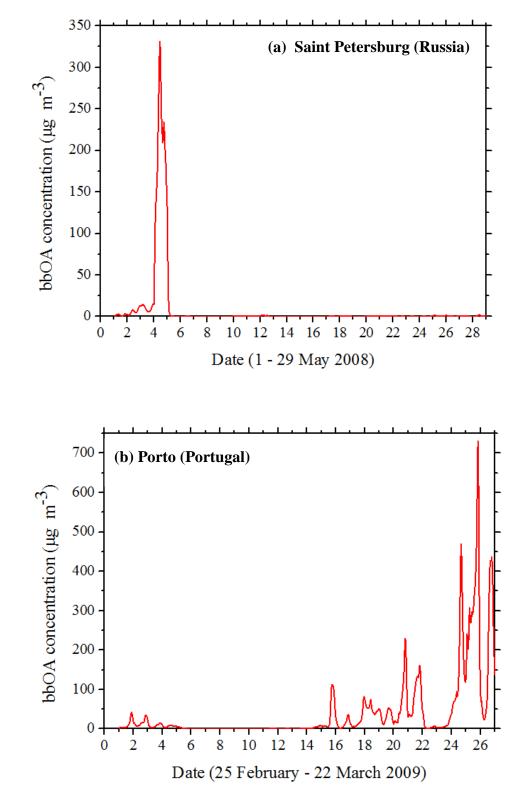


Figure 5. Timeseries of PM<sub>2.5</sub> bbOA concentrations in (a) Saint Petersburg in Russia
during 1-29 May 2008 and in (b) Porto in Portugal during 25 February-22 March
2009.

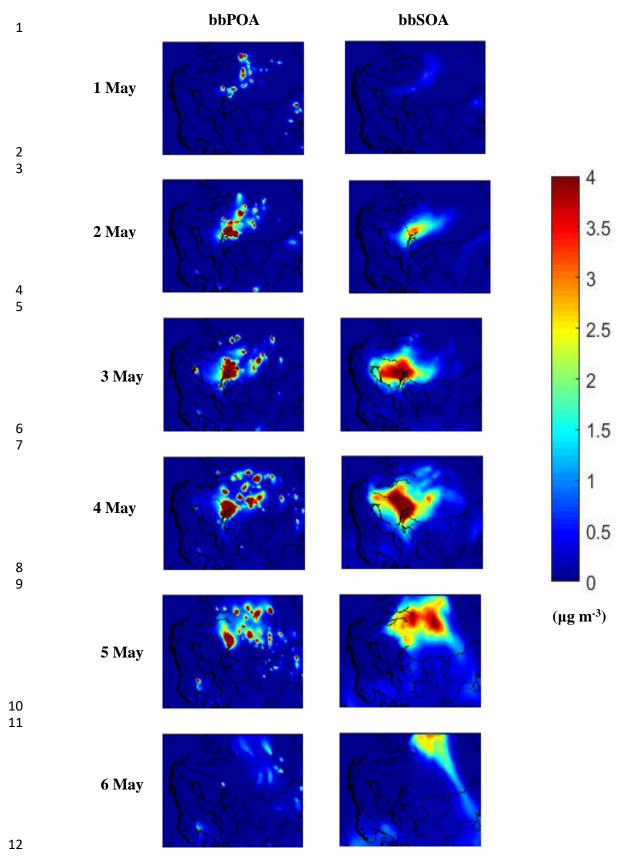


Figure 6. PMCAMx-SR predicted base case ground – level concentrations of PM<sub>2.5</sub>
bbPOA and bbSOA, during 1 – 6 May 2008 in the Scandinavian Peninsula and
Russia.

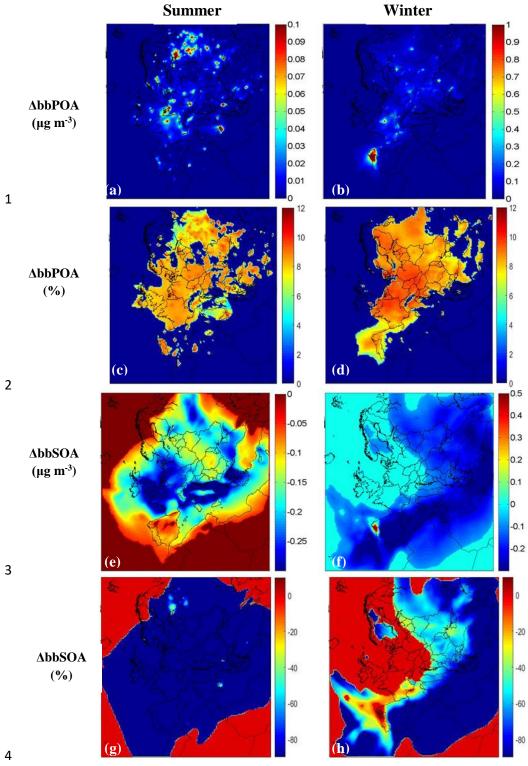


Figure 7. Average predicted absolute ( $\mu g m^{-3}$ ) difference (Sensitivity Case – Base 5 Case) of ground-level  $PM_{2.5}$  (a-b) bbPOA and (e-f) bbSOA concentrations from 6 PMCAMx-SR base case and sensitivity simulations during the modeled periods. Also 7 shown the corresponding relative (%) change of ground-level PM<sub>2.5</sub> (c-d) bbPOA and 8 9 (g-h) bbSOA concentrations during the modeled periods. Positive values indicate that 10 PMCAMx-SR sensitivity run predicts higher concentrations.

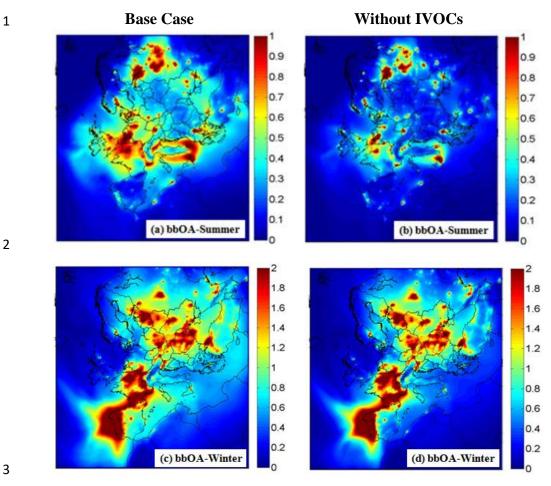


Figure 8. Predicted ground-level concentrations of PM<sub>2.5</sub> total bbOA (μg m<sup>-3</sup>) during
the modeled summer (a-b) and the modeled winter (c-d) period. The figures to the left
are for the PMCAMx-SR base case simulation while those to the right for the lowIVOC sensitivity test.

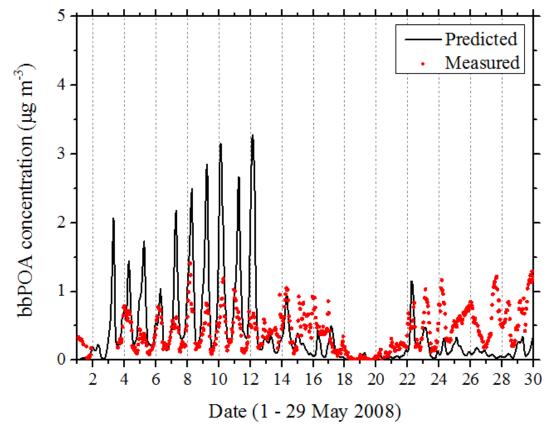


Figure 9. Comparison of hourly bbPOA concentrations predicted by PMCAMx-SR
with values estimated by PMF analysis of the AMS data in Cabauw during 1-29 May
2008.