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## Investigating the role of anthropogenic terpenoids in urban secondary pollution under summer conditions by a box modeling approach†

M. Farhat,<sup>ab</sup> L. Pailler,<sup>a</sup> M. Camredon,<sup>c</sup> A. Maison,<sup>‡d</sup> K. Sartelet,<sup>id e</sup> L. Patryl,<sup>f</sup> P. Armand,<sup>f</sup> C. Afif,<sup>bg</sup> A. Borbon,<sup>id \*a</sup> and L. Deguillaume,<sup>id \*ah</sup>

Terpenoids, including isoprene and monoterpenes, are highly reactive volatile organic compounds (VOCs) that play an essential role in atmospheric chemistry, contributing to the formation of ozone and secondary organic aerosols (SOAs). While known for decades for their biogenic origin, their anthropogenic origin is now well established in urban areas worldwide. Nevertheless, there is still a lack of clarity regarding the relative significance of these emissions and their impact on secondary pollution at the urban scale where biogenic and anthropogenic emissions coexist. The objective of this study is to evaluate the role of anthropogenic terpenoids in secondary pollution over the megacity of Paris, a typical northern mid-latitude urban area, using a box model. The model employs the Master Chemical Mechanism (MCM v3.3.1) to describe the gaseous reactivity. A physico-chemical scenario was developed to reproduce a typical summertime environment built upon *in situ* observations collected during the EU-MEGAPOLI campaign in Paris. Emission ratios of anthropogenic VOCs over carbon monoxide were used to parametrize the primary emissions of more than 60 species (including anthropogenic terpenoids). The comparison between *in situ* observations and modelled trace gas concentrations demonstrated the model's capacity to reproduce the levels and their temporal variability. Two sensitivity tests were conducted to quantify the impact of terpenoid emissions on ozone formation and their potential to form SOA mass concentration according to two simulations modulating anthropogenic and biogenic emissions of terpenoids based on the uncertainties associated with their estimation. Ozone concentration slightly increases by 1 ( $\pm 0.5$ )% when increasing anthropogenic terpenoid emissions and by 3 ( $\pm 2$ )% when increasing biogenic terpenoid emissions; the increase of O<sub>3</sub> with increasing VOCs is consistent with the high-NO<sub>x</sub> chemical regime. Looking at the potential terpenoid derived SOA production, isoprene and limonene dominate. The estimated total mass concentration of SOAs produced over a 24 h period is 0.53  $\mu\text{g m}^{-3}$ , with a maximum hourly produced mass concentration of 0.045  $\mu\text{g m}^{-3}$  observed in the morning. This modelling study suggests that the production of SOAs through the oxidation of terpenoids emitted from anthropogenic sources is competitive with that derived from their biogenic sources and remains significant at night.

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<sup>a</sup>Université Clermont Auvergne, Laboratoire de Météorologie Physique, OPGC/CNRS UMR 6016, Clermont-Ferrand, France. E-mail: laurent.deguillaume@uca.fr

<sup>b</sup>EMMA Research Group, Center for Analysis and Research, Faculty of Sciences, Saint Joseph University of Beirut, Beirut, Lebanon

<sup>c</sup>Univ Paris Est Creteil and Université Paris Cité, CNRS, LISA, Créteil, F-94010, France

<sup>d</sup>Université Paris-Saclay, INRAE, AgroParisTech, UMR EcoSys, Palaiseau, 91120, France

<sup>e</sup>CEREA, École nationale des ponts et chaussées, EdF R & D, IPSL, Marne la Vallée, France

<sup>f</sup>CEA, DAM, DIF, Arpajon, 91297, France

<sup>g</sup>Climate & Atmosphere Research Centre (CARE-C), The Cyprus Institute, Nicosia, Cyprus

<sup>h</sup>Université Clermont Auvergne, Observatoire de Physique du Globe de Clermont-Ferrand, UAR 833, Clermont-Ferrand, France. E-mail: agnes.borbon@uca.fr

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‡ Current address: Laboratoire de Météorologie Dynamique-IPSL, CNRS/Sorbonne Université/École Normale Supérieure-PSL Université/École Polytechnique-Institut Polytechnique de Paris, Paris, 75005, France.



## Environmental significance

Terpenoids are crucial in atmospheric chemistry, given their high reactivity and involvement in the production of secondary pollutants. Recent studies have demonstrated their anthropogenic origin but have given little consideration to their contribution to secondary pollution in urban environments where anthropogenic and biogenic emissions coexist. Using a modelling approach, we aim to evaluate the role of anthropogenic terpenoids in secondary pollution at the urban scale. We simulate an urban scenario representative of a northern mid-latitude megalopolis: Paris. We used emission ratios of anthropogenic VOCs over CO to parametrize the primary emissions of 60 species, including anthropogenic terpenoids. This study suggests that the SOA production through the oxidation of terpenoids from anthropogenic sources is competitive with that derived from biogenic sources.

## 1. Introduction

Among Volatile Organic Compounds (VOCs), terpenoids, including isoprene and monoterpenes with the  $(C_5H_8)_n$  formula, have at least one double bond, making them extremely reactive. Thus, they play a key role in atmospheric chemistry by being involved in the ozone cycle and in the formation of a range of organic compounds contributing to the complex composition of secondary organic aerosols (SOAs).<sup>1–3</sup> SOAs and  $O_3$  are key compounds in the evaluation of air quality<sup>4</sup> and belong to short-lived climate forcers. Given the important role of terpenoids in secondary air pollution, several studies have focused on their quantification and their source identification. Terpenoids have been known for a long time to be emitted from biogenic sources; their biogenic emissions are estimated to be  $347.7 \text{ Tg year}^{-1}$  for isoprene and  $184.4 \text{ Tg year}^{-1}$  for monoterpenes on a global scale.<sup>5</sup>

However, few studies have also focused on the anthropogenic origin of terpenoids from multiple sources. Since the work of Rouvière *et al.*<sup>6</sup> in the Alpine valleys, several studies have shown that wood heating is one of the anthropogenic sources of terpenoids.<sup>7</sup> Recently, studies in North American cities have highlighted terpenoid emissions from Volatile Chemical Product (VCP) use; they demonstrated that 50% of monoterpenes result from VCP volatilization.<sup>8–10</sup> Since terpenoids are associated with the use of solvents, several industrial activities have been identified as emitters of these compounds. For example, they account for 8.2 tons per year of monoterpenes in the Dunkirk urban area, North of France.<sup>11</sup> It is in the same order of magnitude as the non-industrial anthropogenic emissions of monoterpenes determined in Paris by Borbon *et al.*,<sup>12</sup> which were estimated to be 11.8 tons per year. Moreover, Dominutti *et al.*<sup>13</sup> demonstrated that traffic could be a source of terpenoid emissions, where up to 40% of monoterpenes were attributed to road transport in cities around the world, extending the seminal work by Borbon *et al.*<sup>14</sup> on isoprene. Nevertheless, there is still uncertainty on the relative importance of these emissions and their effect on secondary pollution. Global modeling studies have estimated that SOA production from isoprene oxidation ranges from 6 to 20  $\text{Tg year}^{-1}$ <sup>15–17</sup> and that from monoterpene oxidation accounts for 13 to 40  $\text{Tg year}^{-1}$ .<sup>18,19</sup> While the role of anthropogenic VOCs as precursors in SOA formation has been extensively studied, the impact of anthropogenic terpenoids on air pollution remains an area of active investigation in cities worldwide.

The objective of this study is to evaluate the impact of anthropogenic terpenoids on secondary pollution at the urban scale under summer conditions. To do so, we optimized an

explicit gas phase box model to assess how terpenoids from biogenic and anthropogenic origins participate in the secondary production of oxidants such as ozone and to the VOC multiphase chemistry over a northern mid-latitude urban area. This model considers the gas-phase Master Chemical Mechanism (MCM v3.3.1) and has been developed to enhance its capability to capture both local-scale dynamics and biogenic and anthropogenic sources to simulate the atmospheric processes governing terpenoid concentrations and their effect on atmospheric chemistry. To simulate realistic concentrations, we constrained and evaluated the model with *in situ* observations that were collected over the Paris metropolitan area during the EU-MEGAPOLI field campaign (megacities: emissions, urban, regional, and global atmospheric pollution and climate effects, and integrated tools for assessment and mitigation) conducted in July 2009.<sup>20</sup>

We first present the developments performed on the model to reproduce the chemical environment over the Paris area. Diel emissions of  $NO_x$ ,  $SO_2$ , and CO follow the emission database of the “association for Air Quality Monitoring Network in the Paris region” (AIRPARIF), and emission ratios of anthropogenic VOCs over carbon monoxide were used to parametrize their primary emissions. Biogenic emissions were also considered in the model based on recent modeling work over the Paris region during the STREET project (impact of STress on uRban trEEs on ciTy air quality). The temporal variation of the boundary layer height is also considered to modulate the intensity of emissions/depositions and the concentration of chemical compounds through dilution/entrainment. Dilution and advection by the wind have also been implemented in the model to represent sources/sinks induced by atmospheric transport. These developments were evaluated by comparing the concentrations of the reference simulation to the observations from the MEGAPOLI campaign. Then, the second part of this work is devoted to sensitivity studies to quantify the effect of terpenoid emissions on atmospheric chemistry (*i.e.*, the secondary production of ozone and SOAs). In this framework, we also performed sensitivity analysis by modulating the relative proportion of their anthropogenic and biogenic emissions based on the uncertainties associated with their quantification.

## 2. Methodology

### 2.1 *In situ* measurements during the summer MEGAPOLI campaign

The EU-MEGAPOLI project included two one-month field campaigns in Paris and its surrounding areas. The first one took



place in July 2009, while the second began on January 15, 2010, and finished in February 15, 2010. This project aimed to provide a comprehensive, coherent, and more quantitative description of the impact of megacities on air quality, tropospheric chemistry, and climate. To this purpose, the objective was to document and analyze primary and secondary gases and particulates in the Paris area, including their concentrations, their spatial and temporal variations, their emission sources, and origins (local or long-range advected).<sup>21,22</sup> In this study, the summertime field campaign was privileged to leverage the increased photochemical activity that occurs due to high temperatures and long daylight hours. It relies on the measurements performed at the urban background site of the Laboratoire d'Hygiène de la Ville de Paris (LHVP) (*i.e.*, meteorological parameters, VOCs, oxygenated VOCs, peroxy acyl nitrates, CO, NO, NO<sub>2</sub>, and O<sub>3</sub>). The site is representative of Paris background pollution for its location on the southern outskirts of Paris in a large public garden 150 m away from a major street.<sup>23,24</sup> Measurements performed at the Site Instrumental de Recherche par Télédétection Atmosphérique (SIRTA) (*i.e.*, OH and O<sub>3</sub>) are also used to support the analysis featured in this paper. The SIRTA site is qualified as suburban for its location 14 km southwest of Paris, surrounded by wooded areas, fields, houses, and industries.<sup>25,26</sup> During this campaign, a wide variety of measurement instruments were used and are listed in Table S1.† All measurements were subject to strict QA/QC protocols (*e.g.*, calibration against certified standards and regular cross-validation with reference methods); the uncertainties were evaluated at ±5–20%. All the above-mentioned observations will be used in the model assessment for its capacity to simulate the urban environment.

## 2.2 Box model description and developments

The 0D box model CLEPS (Cloud Explicit Physico-Chemical Scheme) has been used in this study to numerically describe the chemical and physical atmospheric processes as a function of time.<sup>27,28</sup> In the following sections, the main developments of the model to reproduce an adequate urban environment are presented. This model is based on the Dynamically Simple Model for Atmospheric Chemical Complexity (DSMACC),<sup>29</sup> using the Kinetic Pre-Processor (KPP).<sup>30</sup> This box model was developed to cover the full range of chemical reactions in both the gaseous phase and aqueous phase.<sup>27</sup> The box model CLEPS previously considered a reduced version of the gaseous MCM (Master Chemical Mechanism) v3.3.1 (*i.e.*, 2049 reactions including 678 species) adapted to reproduce remote environments influenced by biogenic emissions.<sup>31</sup> In this work, the entire MCM was implemented in the model (*i.e.*, 16 707 reactions and 5837 species). The actinic flux and the subsequent photolysis rates are calculated using the radiative transfer model TUV version 4.5, while only the gaseous phase chemistry is activated in the model. In this section, we will present the physical and chemical scenario that we worked on, and then the development of the model adapted to the urban area in Paris. The model allows performing a chemical budget to quantify the sources and sinks of a chemical compound over the duration of the simulation.

**2.2.1 Physical and chemical scenario.** A physical and chemical scenario has been constructed in part using data from the MEGAPOLI campaign. A 7-day long simulation was carried out to reach a daily photo-stationary state. Regarding the photolytic conditions, the simulation is performed during the summer of 2009 considering the latitude and longitude of Paris (48.9°, 2.33°) and the 9th of July at 00:00 UTC as the start date. Temperature, wind speed, and relative humidity were defined based on the mean diel profiles extracted from the summer MEGAPOLI campaign conducted in July 2009 (Fig. 1Ⓞ). The temperature evolves from 25 °C during the day to 17 °C at night, and the relative humidity reaches a maximum value at night (73%) and a minimal value during the day (43%). The diel variability of the boundary layer height (BLH) quantified during the MEGAPOLI campaign is also considered in the model (Fig. 1Ⓟ), with a minimal value of around 500 m at night, a significant increase during the day reaching 1750 m, followed by a strong drop in the late afternoon. These ranges of meteorological parameters are representative of urban environments during the summer in Europe and North America.<sup>32</sup> All the different temporal profiles are presented in Fig. S1(a) and (b).† The concentrations simulated on the last day of the simulation are then compared to MEGAPOLI measurements to evaluate the model performance.

**2.2.2 Emission & deposition processes.** The consideration of an anthropogenic-influenced chemical environment in the CLEPS model required a detailed description of the anthropogenic and biogenic emissions of inorganic and organic gaseous precursors emitted by the urban area. For anthropogenic emissions, three diel emission profiles were defined for CO, NO<sub>x</sub>, and SO<sub>2</sub> (Fig. 1Ⓠ and S3†) based on the AIRPARIF inventory.<sup>33</sup> July 2010 emissions (tons per month) were used to calculate the mean quantity of compounds emitted during a summer day. Then, daily emissions are distributed over the day to create a diel profile. A detailed description of the profile design is provided in the ESI (Section 2.a.ii.). The diel profiles of emission are almost similar for NO<sub>x</sub> and CO emissions, while they are different for SO<sub>2</sub> based on the AIRPARIF emission database. NO<sub>x</sub> emissions are distributed between NO and NO<sub>2</sub> according to a 93/7 molecular ratio.<sup>34</sup> The representation of speciated VOC emissions and their temporal variability in models is complex, given the diversity of VOC emission sources and the diversity of VOC species. It usually relies on the emission inventory in which VOCs are partitioned into source categories and their aggregation into model species compatible with the photochemical mechanism used by the model.<sup>33</sup> Moreover, the current VOC speciation is outdated or poorly representative of regional practices. The way the emissions are represented has a strong impact on simulated concentrations. Many studies using *in situ* observations showed significant inventory-measurement discrepancies from local to global scales.<sup>33,35,36</sup> These studies compared the atmospheric measured enhancement emission ratios of individual VOCs relative to CO (ER) to parallel ratios in the inventory. CO is considered a conservative tracer of anthropogenic emissions. To counter-balance VOC emission uncertainties and to include the





Fig. 1 Description of the scenario implemented in the box model to reproduce the urban environment: emissions, deposition, boundary layer height, advection/dilution, and meteorological parameters (T, P, RH, and wind speed).

anthropogenic emissions of terpenoids, we propose here a compromise by multiplying the hourly CO emissions from the AIRPARIF inventory by the measured VOC-to-CO emission ratios to derive speciated VOC emissions for the modelling study (Fig. 1③).<sup>12,33,35–38</sup> The emissions of VOCs therefore follow the same diel emission profile as CO, assuming that the emission ratio is constant over the course of the day. Among the 67 species measured during the MEGAPOLI campaign, the emission ratios of 27 VOCs relative to CO were previously estimated in Paris using the linear regression fit method described in Borbon *et al.*<sup>33</sup> This method considers the effect of chemistry for both primary and secondary VOCs. Twenty-two more species were considered here using the emission ratios determined by de Gouw *et al.*<sup>37,38</sup> in Los Angeles. Indeed, the ERs determined in Los Angeles and Paris are comparable in terms of orders of magnitude.<sup>33</sup> These compounds including alkanes, alkenes, aromatics, and some OVOCs are presented in Table S2† with their emission ratios. A similar methodology detailed in the ESI† (Section 2.a.i.) was applied in this study to calculate the emission ratios of 11 additional gases, including four terpenoids (Table S3†), using measured concentrations during MEGAPOLI. For  $\beta$ -pinene and limonene, emission ratios were calculated using Los Angeles measurements since these two compounds were not measured during the MEGAPOLI campaign. Paris and Los Angeles are two megacities of the northern mid-latitudes; as for other hydrocarbons, the similarity of terpenoid ER can be assumed. Borbon *et al.*<sup>12</sup> also compared the ER of isoprene,  $\alpha$ -pinene and limonene relative to CO between contrasting cities worldwide: the ones in Los

Angeles fall within the average value of emissions ratios. As discussed by Borbon *et al.*,<sup>12</sup> the nighttime chemistry of terpenoids with the nitrate radical and the biogenic emissions of monoterpenes at night cannot be excluded and could affect the value of the quantification of the ER in an opposite way. This will be taken into account in the discussion.

For biogenic emissions, VOCs from biogenic origin were also described in the model. Biogenic emissions in urban environments are usually poorly or incompletely entered in inventories despite their presence in urban atmospheres and their potential reactivity.<sup>13</sup> A recent modeling study focused on the description of biogenic emissions in Paris in the framework of the STREET (impact of STress on uRban TREES on ciTy air quality) project.<sup>39</sup> This work described the development of an emission inventory to model biogenic emissions in Paris during the months of June and July 2022 using the tree database called “ARBRE” from Paris city, allometric relations to determine tree characteristics and meteorological parameters estimated using the WRF model. Biogenic emissions were computed for each tree based on their leaf dry biomass, tree-species dependent emission factors and activity factors representing the effects of light and temperature. Here, gaseous emissions of 8 chemical compounds were estimated using the mean hourly emissions from the study of Maison *et al.*<sup>39</sup> Three emission profiles were implemented in the model based on the mean diel profile of the eight compounds: the first one for isoprene and CO, the second one for  $\alpha$ -pinene, limonene, and methanol, and the third one for  $\beta$ -pinene, acetone, and NO (Fig. 1④). All details and profiles are available in the ESI (Section 2.b.†).



All deposition rates were adapted from Michoud *et al.*<sup>20</sup> and are reported in Table S6.† As explained above, a variable temporal BLH profile was also implemented in the model (Fig. 1Ⓢ and S1(d)†). Thus, deposition and emission rates are a function of the BLH variation according to the equations below:

$$\left(\frac{dC}{dt}\right)_{\text{emission}} = \frac{F_{\text{emission}}}{\text{BLH}} \quad (1)$$

$$\left(\frac{dC}{dt}\right)_{\text{deposition}} = -\frac{v_{\text{deposition}} \times C}{\text{BLH}} \quad (2)$$

where  $C$  is the concentration of the species concerned in molec  $\text{cm}^{-3}$ , BLH is the boundary layer height in cm,  $F_{\text{emission}}$  is the emission flux in molec  $\text{cm}^{-2} \text{s}^{-1}$  and  $v_{\text{deposition}}$  is the deposition velocity in  $\text{cm s}^{-1}$ .

**2.2.3 Dynamical frame.** The CLEPS model evolves to include a simplified representation of atmospheric dilution and advection induced by the horizontal wind. The dilution/advection terms account for the loss/gain in concentrations of chemical compounds caused by the transport. Dilution/advection effects were introduced through an additional sink/source in the differential equations calculated using the model following eqn (3):

$$\left(\frac{dC}{dt}\right) = \frac{WS}{\Delta x} \times (C_{\text{ext}} - C) \quad (3)$$

where WS stands for the wind speed ( $\text{cm s}^{-1}$ ) represented by a temporal profile (Fig. S1(c)†);  $\Delta x$  is the box model length which represents the diameter of Paris Intramuros ( $1.5 \times 10^6 \text{ cm}$ );  $C$  stands for the calculated concentration of the concerned compound ( $\text{molec cm}^{-3}$ );  $C_{\text{ext}}$  is the concentration of the concerned species outside the area of the simulation (here it is outside of Paris Intramuros) and  $t$  is time (s). This function can be used in the model to account for the dilution of all species (Fig. 1Ⓢ).

In this study, all compounds are subject to dilution, and only ozone is advected. No dominant wind direction was observed during the campaign. The ozone concentration outside Paris Intramuros was defined as a mean diel profile based on measurement from the peri-urban SIRTAs site (Fig. 1Ⓢ). The profile was determined from data obtained during the MEGAPOLI summer campaign (Fig. S1(e)†).

Vertical dilution and entrainment were also implemented in the model. This defines the dilution of all compounds and the exchange between the residual layer and the boundary layer when the BLH is increasing (Fig. 1Ⓢ) ( $\frac{\Delta \text{BLH}}{\Delta t} > 0$ ). The following equation describes these processes:

$$\left(\frac{dC}{dt}\right) = \frac{1}{\text{BLH}} \times \frac{\Delta \text{BLH}}{\Delta t} \times (C_{\text{residual}} - C) \quad (4)$$

where  $C$  is the concentration ( $\text{molec cm}^{-3}$ ),  $C_{\text{residual}}$  is the concentration in the residual layer ( $\text{molec cm}^{-3}$ ) and  $\frac{\Delta \text{BLH}}{\Delta t}$  is the BLH variation ( $\text{m s}^{-1}$ ). In this study, all compounds are

diluted vertically ( $C_{\text{residual}} = 0$ ); only ozone entrainment is considered ( $C_{\text{residual}} \approx 40 \text{ ppb}$ ).<sup>40</sup>

## 3. Results and discussion

### 3.1 Evaluation of the reference simulation towards *in situ* observations

Fig. 2 shows the temporal variability of the modeled concentrations (continuous curve) obtained on the last simulation day (*i.e.*, at a daily stationary state) that was compared to the diel variability of measurements over one month (July 2009). This comparison is conducted for all compounds measured in this study, except for those having more than 75% of the measured values below the detection limit (see Section 3 in the ESI†).

In practice, we confronted the hourly modeled concentrations for the last day with the 5th, 25th, 50th, 75th, and 95th percentiles of concentration measured during the MEGAPOLI campaign. This comparison is reported in the †SI (Comparison\_Obs\_Model.xls file).†

### 3.2 The O<sub>3</sub>/NO<sub>x</sub> chemical sub-system

Generally, the model appears to perform properly with regard to the temporal trend of NO concentrations emitted throughout the day (Fig. 2). As expected, at night, NO levels are low (below 1 ppb), since the traffic sources are reduced. However, the model overestimates the morning concentrations by a factor of 2.5 with a maximum value of 16.5 ppb at 8 AM (*vs.* observation at 6.3 ppb – median value). Fig. 2 also shows the considerable variability of NO<sub>2</sub> observations, suggesting that at different times, the NO<sub>2</sub> levels fluctuate significantly, which is common in urban areas due to varying traffic patterns and industrial activities.<sup>41</sup> Nevertheless, the observed NO<sub>2</sub> data show considerable variability and sharper peaks than the modeled NO<sub>2</sub> concentration during the morning hours, but the simulated concentration is within the right order of magnitude. NO<sub>x</sub> simulated concentration is in line with observations demonstrating that the conversion of NO into NO<sub>2</sub> may not be efficient enough in our simulation. This latter reaction represents the essential source of NO<sub>2</sub> and sink for NO according to the chemical budget, while the key source of NO is the photolysis reaction of NO<sub>2</sub>, and the sink of NO<sub>2</sub> is the reaction triggered by photolysis.

The O<sub>3</sub> diel pattern is well represented by the model. The analysis of the chemical budget of ozone shows that the O<sub>3</sub> sink is controlled by its reaction with NO (titration) to give NO<sub>2</sub> and by its photolysis. These two sinks are almost completely counterbalanced by the reaction of monoatomic O with O<sub>2</sub> leading to O<sub>3</sub>. The additional source represented by the advection process together with the dilution allows the reproduction of a realistic O<sub>3</sub> concentration. In the simulation, the contribution of horizontal advection of O<sub>3</sub> by the wind is dominant in comparison to the advection of O<sub>3</sub> by entrainment. With low levels of VOCs, the generated peroxy radical (RO<sub>2</sub>) through VOC oxidation is probably not enough to contribute to the ozone production explaining the need of implementing ozone advection in the model (Fig. S4†).





Fig. 2 Comparison of a selection of simulated concentration (continuous line) vs. observations (box plots) during the MEGAPOLI field campaign. Measurements performed during the month of July 2009 are presented as hourly boxplots showing the average (markers "+"), the median, and the inter-quartile range in addition to the range of *in situ* data from the minimum to the maximum values highlighting outliers that could represent "unusual" events (\* on figure legend: measured by PTR-MS).

Regarding OH, the simulated data are realistic in comparison with the observations, even if some discrepancies can be highlighted, particularly when photolysis conditions are at their

maximum (Fig. 2) with a significant production of OH through  $O_3$  photolysis (20% of produced OH). The simulated OH concentrations are slightly higher (+25% for the maximal



values) during these hours with respect to the measurements, with a slight time shift to the right (approx. 1 h), which is explained by the temporal profile of O<sub>3</sub>.

### 3.3 VOC chemical sub-system

**3.3.1 Anthropogenic compounds.** Anthropogenic aromatic diel profiles (Fig. 2) are characterized by elevated concentrations during traffic rush hours in the morning and a lower increase in the evening.<sup>22</sup> Their atmospheric concentrations are controlled by their primary emissions, modulated by their ER and the boundary layer height time evolution and by dilution. The strong decrease of their concentrations in the afternoon in the simulation results from the increase of the BLH combined with potential oxidation processes; the peak at the end of the afternoon is less important because the BLH remains highly elevated until 6:00 PM. The impact of the photochemical reactions is expected to be low even at a relatively high OH concentration of  $5 \times 10^6$  molec cm<sup>-3</sup> in the middle of the day. The low impact of photochemical reactions during the day was already demonstrated by Borbon *et al.*<sup>33</sup> The model underestimates the late afternoon concentrations probably due to potential missing emissions such as non-combustion related emissions (solvent use and gasoline evaporation). Salameh *et al.*<sup>42</sup> showed the seasonal temperature dependence of aromatics-to-benzene monthly emission ratios in Paris and their multiyear increase until 2012 due to gasoline evaporation from two-wheelers. The calculated emission ratios in this study may not reflect those additional emissions.

Alkanes up to C12 (dodecane) follow the same temporal pattern as butane (Fig. 2). Similar to aromatics, the modelled concentrations of alkanes are mainly driven by the emission and dilution processes, with a slight underestimation between 5 PM and 5 AM, most probably due to low emissions in the model. For alkenes, the model simulates concentrations comparable to observations.

However, the most significant biases in aromatic, alkene, and alkane concentrations are observed for compounds presenting ERs calculated from Los Angeles,<sup>37,38</sup> namely 2-methyl propene, 3-methyl-hexane, and *o*-ethyltoluene, demonstrating the possible specificity of Paris emissions and the need to reconsider these ratios for these species.

**3.3.2 Terpenoids.** Isoprene and monoterpenes result from both biogenic and anthropogenic sources in urban areas<sup>12</sup> and are more reactive than anthropogenic VOCs.

Modelled isoprene showed morning and evening peaks with a decrease between 9 AM and 2 PM. A delay in the morning peak exists between isoprene and the anthropogenic compounds. Indeed, the isoprene concentration is mainly governed by the biogenic emissions that are 4.5 times more important than anthropogenic emissions during daytime. The isoprene morning peak is the result of biogenic emission controlled by the BLH with higher concentrations in the model (maximum concentration of 0.54 ppb for modelled concentration *vs.* 0.25 ppb for the observed value). This urban cycle of isoprene is governed by traffic-related emissions, temperature, and light dependent biogenic emissions during the day, which

counterbalance its consumption by the OH radical.<sup>44</sup> In our simulation, this trend is not properly reproduced due to underestimation of biogenic emissions and the additional effect of local biogenic emissions from the trees of the nearby public garden affecting the observed concentrations.

In comparison with the study conducted by Guo *et al.*,<sup>43</sup> the diel variability of  $\alpha$ -pinene concentrations does not show a typical biogenic diel cycle (Fig. 2) as already shown in other urban areas such as Beirut;<sup>44</sup> it appears to be similar to the urban anthropogenic diel cycle demonstrating the significant anthropogenic sources contributing to  $\alpha$ -pinene concentrations in Paris.<sup>45</sup> Indeed, the anthropogenic emission intensity is greater than the biogenic emissions by a factor of 1.3 on average. The model seems to capture the overall evolution of the observations but fails to reproduce the mean concentration with a significant underestimation, probably due to the modelled emissions.

**3.3.3 Oxygenated compounds.** Oxygenated VOCs (OVOCs) have multiple primary and secondary sources in urban areas:<sup>44</sup> anthropogenic emissions combined with biogenic emissions for some species (*i.e.*, methanol and acetone) and secondary production from gaseous precursors. Thus, these are the chemical species for which observation/model biases are the most significant. Additionally, some observation *vs.* model comparison should be considered with caution since measurements of some of these compounds were performed by PTR-MS and present certain limitations because isomeric chemical species respond to the same mass-to-charge ratio. Looking at the simulation, the model presents different behaviors with chemical species showing either a daytime maximum due to their secondary production (*i.e.*, glyoxal, MVK, MACR, formaldehyde and methylglyoxal) or a temporal profile driven by primary emission and comparable to anthropogenic compounds (*i.e.*, acetaldehyde, acetone, butanal, propanal, methanol, and MEK). This is confirmed by the analysis of the chemical budget, where emission and dilution are the two main parameters controlling the concentration levels of the second group of molecules, namely acetaldehyde, acetone, butanal, propanal, methanol, and MEK.

Observations of certain compounds such as acetaldehyde and methanol show a pronounced cycle similar to the model but with generally higher values probably due to emissions or advection issues. This seems to indicate that the model is not correctly considering emissions of these compounds and/or that they need to be advected in the box model. These compounds could be transported at a regional/continental scale as underlined in a previous study analyzing VOC data measured in Paris.<sup>23</sup>

The PTR-MS sum of MEK + butanal + methylglyoxal (*m/z* 73) shows acceptable concentrations from 8 AM to 8 PM when compared to observations. In the model, MEK and butanal are primarily emitted in the morning and in the afternoon, and methylglyoxal is efficiently produced, which explains why concentration levels remained stable during the afternoon. However, the model simulates a lower concentration during nighttime, which is also potentially explained by the lack of advection of MEK and butanal, for example.



### 3.4 Sensitivity tests on terpenoid emissions

Looking at the emissions of terpenoids in the model, Fig. 3 presents the temporal variability of anthropogenic and biogenic emissions in terms of injected concentrations in the model ( $\text{molec cm}^{-3} \text{ s}^{-1}$ ). These values result from multiplying the prescribed emissions by the BLH temporal variability. For isoprene, as underlined before, the biogenic sources dominate the diel emissions with maximum intensity a factor of 8.7 higher than its anthropogenic emissions; the opposite is observed for  $\beta$ -pinene and limonene, where anthropogenic emissions can be up to an order of magnitude higher than the biogenic emissions on an hourly basis. For  $\alpha$ -pinene, diel emissions are comparable, with slightly higher anthropogenic emissions (maximum hourly factor of 1.7) for maximum emission values.

Evaluating the role of anthropogenic terpenoid emissions in secondary pollution relies on sensitivity tests by varying both anthropogenic and biogenic emissions of terpenoids. As for other VOCs (see the previous section), the emission ratio of anthropogenic isoprene,  $\alpha$ -pinene,  $\beta$ -pinene, and limonene to CO during nighttime was quantified by implementing the regression fit method on the observed data. The scatterplots of  $\alpha$ -pinene,  $\beta$ -pinene, and limonene to CO are illustrated in Fig. 4(a). The mean emission ratio is derived from the value of the linear fit (Table S3†).

The scatterplots of isoprene,  $\beta$ -pinene and limonene are dispersed with an  $R^2$  between 0.1 and 0.4 but still show a linear relationship with CO.  $\alpha$ -Pinene shows a much-scattered plot ( $R^2 = 0.1$ ) partly explained by the high amount of data below the detection limit (58%). This dispersed data behavior suggests either the presence of potent non-combustion and biogenic terpenoid sources or the nighttime reactivity with ozone and the nitrate radical. These might include terpenoid emissions from VCPs as demonstrated in some recent studies in North American urban cities where it was revealed that more than 50% of urban monoterpene loads are explained by VCP-dominated emissions.<sup>8,10,46</sup> To consider the additional contribution of non-combustion emissions in the simulation, we derived a linear fit along the data point delimiting the upper part of the scatterplot (in dark blue). This value represents an estimate of the maximum emission ratio of terpenoids from anthropogenic origin. Fig. 4(b) shows the increase in terpenoid emissions considered in the model for this sensitivity test (“Anthro\_high”). Emission ratios of isoprene,  $\alpha$ -pinene,  $\beta$ -pinene and limonene to CO have increased by a factor of 4, 15, 2, and 3, respectively. The “Anthro\_high” scenario for  $\alpha$ -pinene shows the largest difference from the reference one because of the high dispersion of the scatterplot.

We also varied the biogenic emissions of terpenoids by relying on the work by Maison *et al.*<sup>39</sup> over the Paris region. For



Fig. 3 Comparison of anthropogenic and biogenic emissions of terpenoids implemented in the model for the reference simulation. Emissions are presented in terms of injected concentration ( $\text{molec cm}^{-3} \text{ s}^{-1}$ ) controlled by the boundary layer height that evolves during the day.





Fig. 4 (a) Terpenoid scatter plots as a function of CO at nighttime, (b) and (c) comparison between the reference simulation and the "Anthro\_high" test simulation on the one hand, and the "Bio\_high" test simulation on the other hand.

this, we used this work where the effect of abiotic parameters on biogenic emissions was evaluated. In particular, they simulated the effect of micrometeorology at the street level with reflection and shading effects on the leaf temperature of trees, which is a more relevant variable of biogenic emissions compared to ambient temperature. They showed that the leaf temperature was on average +1.2 °C higher than the air temperature, resulting in an increase in isoprene and monoterpene emissions. Based on these results, we performed "Bio\_high" sensitivity test where the biogenic emissions of isoprene and monoterpenes have been increased by a percentage of 36% and 25%, respectively, with respect to the reference simulation

(Fig. 4(c)). This 1.2 °C temperature modulation is consistent with the temperature variability measured during the MEGA-POLI campaign, with standard deviations between 2 and 4 °C.

As expected, since concentrations of terpenoids are mostly controlled by the emission rates, modulating biogenic or anthropogenic emissions induces a change in their concentrations. We decided to present only in Table 1 the two tests where the biogenic and anthropogenic emissions of terpenoids have been increased. Under the "Anthro\_high" scenario, the biogenic emissions of isoprene still dominate, while the anthropogenic ones of  $\alpha$ - and  $\beta$ -pinenes and limonene prevail even more. With increasing anthropogenic emissions, the effect



**Table 1** Relative increase in concentrations of terpenoids and their oxidation products of the two sensitivity tests “Anthro\_high” and “Bio\_high” with respect to the reference simulation

Sensitivity tests	Min-max		Mean ( $\pm$ SD)	
	Anthro_high	Bio_high	Anthro_high	Bio_high
<b>Terpenoids</b>				
Isoprene	22–282	5–125	103 ( $\pm$ 87)	87 ( $\pm$ 42)
$\alpha$ -Pinene	35–59	37–58	47 ( $\pm$ 7)	45 ( $\pm$ 5)
$\beta$ -Pinene	71–91	9–32	80 ( $\pm$ 7)	19 ( $\pm$ 8)
Limonene	106–138	12–34	123 ( $\pm$ 10)	19 ( $\pm$ 5)
<b>Oxidation products</b>				
MVK	7–35	4–112	20 ( $\pm$ 7)	61 ( $\pm$ 39)
MACR	18–47	12–123	30 ( $\pm$ 6)	81 ( $\pm$ 39)
Methylglyoxal	11–33	11–58	18 ( $\pm$ 7)	43 ( $\pm$ 16)
Glyoxal	7–23	5–31	12 ( $\pm$ 5)	24 ( $\pm$ 9)
Glycolaldehyde	22–42	24–107	29 ( $\pm$ 6)	88 ( $\pm$ 26)
Hydroxyacetone	30–77	88–156	44 ( $\pm$ 13)	141 ( $\pm$ 20)
Nopinone	71–98	17–30	83 ( $\pm$ 9)	24 ( $\pm$ 4)
Pinonaldehyde	37–60	44–54	46 ( $\pm$ 6)	50 ( $\pm$ 3)
Pinonic acid	38–58	41–53	48 ( $\pm$ 5)	48 ( $\pm$ 3)
Limonaldehyde	108–142	17–24	121 ( $\pm$ 9)	22 ( $\pm$ 2)
<b>Oxidants</b>				
OH	3–8	3–21	4 ( $\pm$ 1)	10 ( $\pm$ 5)
Ozone	0.3–2	0.3–6	1 ( $\pm$ 0.5)	3 ( $\pm$ 2)

on concentrations is highest for limonene (123% of increase), and this leads to a significant rise for the 3 other targeted terpenoids (47% for  $\alpha$ -pinene, 80% for  $\beta$ -pinene, and 103% for isoprene in average). The increase in biogenic emissions leads to a much more limited rise in concentrations, with the highest value observed for isoprene (87%).

Hence, as anticipated, these sensitivity tests not only impact the concentrations of the precursors but also those of their oxidation products. The latter, which are produced by chemical reactivity, are modified in almost the same order of magnitude as their emitted precursors (Table 1). MVK and MACR, the two main first generation oxidation products of isoprene, present concentrations affected by the increase in anthropogenic isoprene emissions by almost half of those affected by the increase in biogenic isoprene emissions. This is related to the fact that increasing biogenic emissions results in isoprene concentration almost double the isoprene concentration level reached by increasing anthropogenic emissions. The same conclusions can be drawn for other first- and second-generation products of isoprene such as methylglyoxal, glyoxal, glycolaldehyde and hydroxyacetone. However, nopinone and limonaldehyde produced through the oxidation of  $\beta$ -pinene and limonene show the highest concentrations for the “Anthro\_high” scenario. Nevertheless, the relative increase in concentration of pinonaldehyde and pinonic acid produced by the oxidation of  $\alpha$ -pinene is similar for both anthropogenic and biogenic sensitivity tests.

Concerning oxidants, increasing anthropogenic terpene emissions over 24 hours results in OH and ozone concentration changes of 4 ( $\pm$ 1)% and 1 ( $\pm$ 0.5)%, respectively, while

increasing the biogenic terpene emissions impacts the two species by 10 ( $\pm$ 5)% and 3 ( $\pm$ 2)%, respectively. The increase in ozone with increasing VOC is consistent with the high-NO<sub>x</sub> chemical regimes.

In addition, the scenarios for varying terpene emissions have no significant effect on the concentrations of alkanes, aromatics or alkenes.

### 3.5 Secondary organic aerosols (SOAs) estimated from modeled terpene levels

The reactivity of terpenoids can contribute to the generation of SOAs, a key process in the evaluation of air quality. This last section evaluates the ability of terpenoids to form SOAs under the Paris summertime conditions and the respective role of their biogenic and anthropogenic emissions. SOAs are formed by the condensation or reactive uptake of oxidation products of VOC; the SOA formation potential (*i.e.*, yield) through VOC oxidation depends mainly on their structures (carbon chain length, number and type of functional groups, *etc.*) and environmental conditions such as temperature, relative humidity, oxidant, organic aerosol, and NO<sub>x</sub> concentrations.<sup>47</sup>

Formation yield “*Y*” expresses the capacity of a precursor to form SOAs. Defined by Pandis *et al.*,<sup>48</sup> *Y* corresponds to the quantity of a precursor gaseous organic compound that is converted into a SOA, *i.e.* (eqn (5)):

$$Y = \frac{M_0}{\Delta\text{VOC}} \quad (5)$$

where  $M_0$  is the total mass concentration of produced aerosol ( $\mu\text{g m}^{-3}$ ) and  $\Delta\text{VOC}$  is the mass concentration of reacted terpenoids, expressed as a mass ratio in ppm. *Y* is then expressed in  $\mu\text{g m}^{-3} \text{ ppm}^{-1}$ . The mass of SOAs formed by a precursor can thus be estimated by multiplying *Y* by the quantity of the reacted precursor.

These yields are determined in simulation chambers and/or in field experiments. These yields are usually quantified under different conditions such as high or low NO<sub>x</sub> concentrations.<sup>49</sup> All these yield estimates were performed on a selection of precursor gases for specific oxidants (OH, O<sub>3</sub>, and NO<sub>3</sub>). In the work of Ait-Helal *et al.*,<sup>21</sup> the potential SOA mass production was estimated from the measured concentrations of its anthropogenic gaseous precursors. They used a time resolved approach adapted from a previous study from Sjostedt *et al.*<sup>50</sup> to quantify the relative contribution of measured anthropogenic gaseous precursors to SOA formation, namely aromatics and long-chain alkanes. In this work, we followed this approach to evaluate SOA production from simulated concentrations of terpenoids.

By assuming that these VOC precursors only form SOAs through their oxidation and SOAs are not subject to loss by deposition,<sup>50</sup> we can estimate the potential SOA mass concentration  $C(\text{SOA})$  produced on an hourly basis  $\Delta t$  by each terpene oxidized by a specific oxidant.

The potential produced SOA mass concentrations for a compound *i*  $C(\text{SOA})_{\text{estimated}(i)}(t)$  have been calculated with the model over the simulation time (*t*). For this, we are using the outputs of the model  $k_{\text{Terp}_i}(t)$ ,  $[\text{Ox}(t)]$ , and  $k_{\text{Terp}_i}(t)$  as follows:



$$\Delta[\text{Terp}_i](t) = k_{\text{Terp}_i}(t) \times [\text{Terp}_i(t)] \times [\text{Ox}(t)] \times \Delta t \quad (6)$$

where:

- $k_{\text{Terp}_i}(t)$  is the rate constant of terpenoid  $i$  with an oxidant (Ox) ( $\text{cm}^3 \text{ molec}^{-1} \text{ s}^{-1}$ ) during the simulation time ( $t$ );
- $[\text{Ox}(t)]$  is the concentration of the oxidant (molecule  $\text{cm}^{-3}$ ) (Ox = OH, O<sub>3</sub>, NO<sub>3</sub>) during the simulation time ( $t$ );
- $[\text{Terp}_i(t)]$  is the concentration of a given terpenoid (isoprene,  $\alpha$ -pinene,  $\beta$ -pinene, or limonene) during the simulation time ( $t$ );
- $\Delta t$  corresponds to the time step of the model (3600 seconds in our case).

Each hour, we can estimate the produced SOA concentration for each terpenoid  $i$ :

$$C(\text{SOA})_{\text{estimated}(i)}(t) = \Delta T \text{Terp}_i(t) \times Y_{\text{SOA},i} \quad (7)$$

The 24 h SOA concentration produced for one specific terpenoid is therefore:

$$C(\text{SOA})_{\text{estimated}(i)} = \sum_t C(\text{SOA})_{\text{estimated}(i)}(t) \quad (8)$$

Finally, the total concentration of SOAs for all terpenoids over 24 h of simulation is then calculated as follows:

$$C(\text{SOA})_{\text{estimated}(\text{total})} = \sum_i C(\text{SOA})_{\text{estimated}(i)} \quad (9)$$

Table 2 lists the SOA yields used in this work from chamber experiments; the conditions of the chamber experiments are highly variable. We selected SOA yields with the 3 oxidants that were evaluated under conditions representative of those encountered during the MEGAPOLI field campaign (NO<sub>x</sub>, RH, T, ...).

We used the model-simulated concentration data and model kinetic constants from the MCM mechanism to calculate over the last day of the simulation the potential daily total mass concentration of SOAs produced by the 4 studied terpenoids (isoprene,  $\alpha$ - and  $\beta$ -pinene and limonene), for the reference case and the sensitivity scenarios “Anthro\_high” and “Bio\_high” (Fig. 5). SOA mass concentration was also analyzed by distinguishing the contribution of the oxidation by OH, O<sub>3</sub> and NO<sub>3</sub> for the 4 studied compounds (Fig. S6–S8†).

For the reference case, the total estimated produced SOA mass concentration over 24 h is equal to 0.4  $\mu\text{g m}^{-3}$  with

a maximum hourly produced mass concentration of 0.032  $\mu\text{g m}^{-3}$ . When anthropogenic and biogenic terpenoid emissions are maximized, the SOA mass concentration level increases by a factor of 1.7 for both to reach 0.7  $\mu\text{g m}^{-3}$  each, over 24 h (Fig. 5(d)). Regarding the reference case, the two main contributors to SOA mass formation are isoprene and limonene, representing 46% and 38% of the potential daily SOA mass production, respectively. During the day, the higher reactivity of isoprene and limonene compared to that of  $\alpha$  and  $\beta$ -pinenes explains this statement; the contribution of O<sub>3</sub> to SOA production is much lower than OH since it represents 28% of the diurnal SOA production (Fig. S6 and S7†). Moreover, limonene has the highest SOA formation yield compared to the other three terpenoids (Table 2) by one order of magnitude, explaining its major contribution even when its concentration is the lowest. At night, isoprene and limonene still contribute to the SOA production through their reactivity with NO<sub>3</sub> (Fig. S8†). The nighttime production is significant since it represents 27% of the total SOA potential production through the reactivity of terpenoids with OH, O<sub>3</sub>, and NO<sub>3</sub>.

For the “Bio\_high” scenario, isoprene and limonene are responsible for 90% of the SOA total mass production during one day. For isoprene, its relative contribution reached 65% on average, knowing that its emission intensity has been increased by 252% compared to a 195% increase for other terpenes. This increase is observed during daytime (Fig. 5(c)), resulting in a lower contribution of the nighttime production of SOAs (18%). For the “Anthro\_high” case, the two main contributors to SOA mass formation are isoprene and limonene, representing 43% and 45% of the SOA production, respectively. The SOA production is enhanced during the 24 h of simulation; the nighttime production is, therefore, still important around 24% of the SOA production.

Among VOCs, BTEX (benzene, toluene, ethylbenzene, and xylenes) are also well-known SOA precursors.<sup>59</sup> To answer the question of how terpenoids can compete with other anthropogenic compounds in SOA formation, we applied the same methodology using model outputs (see Fig. S9 and Table S8†). In the reference case, the estimated total concentration of SOAs produced over 24 h from BTEX is comparable to that from terpenoids. It is estimated to be 0.68  $\mu\text{g m}^{-3}$  (vs. 0.4  $\mu\text{g m}^{-3}$  for terpenoids). The maximum concentration at midday reaches a value of 0.094  $\mu\text{g m}^{-3}$  for BTEX, which is significantly higher than the maximal SOA production from terpenoids. Daily production levels of SOAs from BTEX and terpenoids are

Table 2 SOA formation yields of some terpenoid precursors and rate constants with OH, O<sub>3</sub>, and NO<sub>3</sub> in the model

Oxidant	Terpenoids	Isoprene	$\alpha$ -Pinene	$\beta$ -Pinene	Limonene
OH	SOA yield ( $\mu\text{g m}^{-3} \text{ ppm}^{-1}$ )	85 <sup>a</sup>	192 <sup>b</sup>	881 <sup>c</sup>	1186 <sup>b</sup>
	$k(\text{OH})$ ( $\text{cm}^3 \text{ molec}^{-1} \text{ s}^{-1}$ )	$1.0 \times 10^{-10}$	$5.3 \times 10^{-11}$	$7.9 \times 10^{-11}$	$1.7 \times 10^{-10}$
O <sub>3</sub>	SOA yield ( $\mu\text{g m}^{-3} \text{ ppm}^{-1}$ )	20 <sup>d</sup>	1298 <sup>e</sup>	452 <sup>f</sup>	1807 <sup>g</sup>
	$k(\text{O}_3)$ ( $\text{cm}^3 \text{ molec}^{-1} \text{ s}^{-1}$ )	$1.2 \times 10^{-17}$	$9.3 \times 10^{-17}$	$1.9 \times 10^{-17}$	$2.1 \times 10^{-16}$
NO <sub>3</sub>	SOA yield ( $\mu\text{g m}^{-3} \text{ ppm}^{-1}$ )	395 <sup>h</sup>	339 <sup>b</sup>	1863 <sup>i</sup>	1468 <sup>b</sup>
	$k(\text{NO}_3)$ ( $\text{cm}^3 \text{ molec}^{-1} \text{ s}^{-1}$ )	$6.9 \times 10^{-13}$	$6.3 \times 10^{-12}$	$2.5 \times 10^{-12}$	$1.2 \times 10^{-11}$

<sup>a</sup> Ref. 51. <sup>b</sup> Ref. 52. <sup>c</sup> Ref. 53. <sup>d</sup> Ref. 54. <sup>e</sup> Ref. 55. <sup>f</sup> Ref. 56. <sup>g</sup> Ref. 56. <sup>h</sup> Ref. 57. <sup>i</sup> Ref. 58.





Fig. 5 Potential SOA mass concentrations produced from terpenoids predicted with the model: (a) "Reference" case; (b) "Anthro\_high" case; (c) "Bio\_high" case. (d): SOA mass concentration predicted over one day.

comparable; as in the case of terpenoids, we were able to assess SOA production through their reactivity with other oxidants such as  $\text{O}_3$  or  $\text{NO}_3$ , leading to significant SOA production at night. More specifically, toluene accounts for 91% of the SOA total mass production from BTEX over one day, despite the higher yield of benzene. This is attributed to the significantly higher simulated concentration of toluene compared to that of benzene.

This study is the first one attempting to estimate the contribution of anthropogenic and biogenic terpenoids to SOA production. While the terpenoid-derived SOA potential production cannot be directly compared to previous SOA estimations, our estimations bring new insights into the

MEGAPOLI hypothesis. By combining two approaches derived from *in situ* observations, Ait-Helal *et al.*<sup>21</sup> estimated that aromatics and intermediate VOC precursors (alkanes from C10 to C16) explained 11–36% and 2–7% of the measured SOA, respectively. However, 62 to 78% of the SOA remained unexplained. One reason was the exclusion of biogenic precursors, which was supported by the regional modelling<sup>60</sup> that attributed 40% of SOAs to biogenic VOCs and long-range transport. By assimilating SOA mass concentration to its PMF-OOA factor derived from aerosol mass spectrometer measurements,<sup>61</sup> the hourly mean mass concentration of SOAs is approximately  $1 \mu\text{g m}^{-3}$  over the month of July and is consistent between the three Paris stationary sites, including LHVP and SIRTa. By applying



the percentage contribution of aromatics and IVOCs to SOAs from Ait-Helal *et al.*,<sup>21</sup> the anthropogenic SOA mass concentrations lie between 0.13 and 0.43  $\mu\text{g m}^{-3}$ . The terpenoid-derived SOA mass concentrations estimated here lie between 0.01 and 0.07  $\mu\text{g m}^{-3}$  (Fig. 5): it is in the same order of magnitude as the IVOC-derived SOA mass concentrations (0.02 and 0.07  $\mu\text{g m}^{-3}$ ), giving confidence to our estimations. However, almost half of the measured SOAs is not explained, and the contribution of terpenoids is not sufficient to fill the gap. While it is out of the scope of the paper, other hypotheses still need to be investigated including the ones already raised by Ait-Helal *et al.*<sup>21</sup> and Zhang *et al.*<sup>60</sup>: the role of long range transport given the regional feature of SOAs in the Paris area, the underestimation of IVOC emissions for which the range of volatility was limited, the underestimation of the biogenic emissions of terpenoids, the non-representation of sesquiterpene biogenic emissions, the non-representation of VCP anthropogenic emissions in the model including terpenoids and other compounds,<sup>8</sup> and the non-representation of the autooxidation processes of terpenes leading to highly oxygenated molecules (HOMs).

To go further, Fig. 6 represents the relative contribution of terpenoids to the SOA production by distinguishing their biogenic vs. anthropogenic origins for the reference and the two sensitivity tests. For the reference case, terpenoids from anthropogenic sources could exhibit 50% of the potential SOA formation during the 24 h of the simulation; their relative contribution can reach 80% at night and be as low as 28% during the day. For the “Anthro\_high” case, this relative contribution reaches 71% over 24 h, whereas for the “Bio\_high” case, the terpenoids from biogenic origin induce 70% of the SOA formation over 24 h. Therefore, the production of SOAs through the oxidation of terpenoids emitted from anthropogenic sources has been shown by this modeling study to be competitive with that derived from their biogenic sources.



Fig. 6 SOA mass concentration predicted over one day by separating the contribution of biogenic and anthropogenic sources of terpenoids.

## 4. Conclusions

This study evaluated the role of anthropogenic and biogenic terpenoids in secondary pollution in the Paris megacity as representative of northern mid-latitude cities by a box modelling approach. A physico-chemical scenario typical of summertime conditions was defined based on the Paris MEGAPOLI-EU campaign of July 2009.

First, the model was designed to reproduce the summertime physico-chemical environment by including the complete version of the Master Chemical Mechanism, anthropogenic VOC emissions by the application of VOC-to-CO emission ratios, and a new biogenic VOC emission inventory recently developed for Paris. The model demonstrated its ability to reproduce major oxidants and trace gas concentrations.

The increase in ozone does not exceed  $3\% \pm 2\%$  in all the simulations (reference case and sensitivity tests modulating anthropogenic and biogenic emissions of terpenoids). However, terpenoid emissions result in a significant increase in total potential SOA mass concentration over a 24 h period, with isoprene and limonene identified as the primary contributors accounting for 42 and 41% of total SOA mass production ( $0.53 \mu\text{g m}^{-3}$ ). Moreover, terpenoids from anthropogenic sources induce 57% of the SOA formation during the 24 h of simulation; their relative contribution can be up to 86% at night and down to 34% during the day.

This work is the first modelling work evaluating the respective role of anthropogenic and biogenic terpenoids in secondary pollution at the urban scale. First, it suggests that the anthropogenic emissions of terpenoids are competitive with their biogenic emissions regarding SOA production. The systematic presence of anthropogenic emissions of terpenoids is now well established in contrasting cities worldwide,<sup>12</sup> and therefore, there is an urgent need to accurately quantify those emissions in emission inventories. Hence, source apportionment studies of organic aerosol relying on the chemical tracer approach must incorporate the new findings. Second, implementing the box model to other contrasting urban environments in terms of climatic conditions and emissions would be useful to complete this work. Third, our study raises the role of terpenoids in nighttime chemistry and secondary pollutant production. It may therefore be useful for simulating concentrations during other field campaigns to use emission ratios determined with *in situ* measurements when emission inventories do not detail all the emissions of VOCs.

## Data availability

The model used in this study is based on the DSMACC model available at <https://github.com/barronh/DSMACC>. The gaseous chemical mechanism is the Master Chemical Mechanism (v3.3.1) available at <https://mcm.york.ac.uk/MCM/>. VOC and trace gas concentrations measured at LHVP during the MEGAPOLI experiment can be retrieved from <https://cds-espri.ipsl.upmc.fr/etherTypo/index.php?id=1450&L=1>.



## Author contributions

AB, CA and LD designed the project. LP, MF and LD were responsible for the modeling and performed the simulations and data analysis. MC participated actively in the model developments. CA, MF, LP, AB and LD conducted the scientific analyses. MF, LP, and LD prepared the manuscript, analyzed the data, and designed the figures, with contributions from all authors. MC, AM, KS, and CA revised the manuscript.

## Conflicts of interest

There are no conflicts to declare.

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