



# The long-term impact of biogenic volatile organic compound emissions on urban ozone patterns over central Europe: contributions from urban and rural vegetation

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**Abstract.** The paper evaluates the long-term (2007–2016) impact of biogenic volatile organic compound (BVOC) emissions on urban ozone patterns over central Europe, specifically focusing on the contribution of urban vegetation using a regional climate model coupled offline to a chemistry transport model. BVOCs are emitted by terrestrial ecosystems, and their impact is considered especially important over  $\text{NO}_x$ -rich environments such as urban areas. The study evaluates the impact of BVOC emissions on ozone ( $\text{O}_3$ ), formaldehyde (HCHO), and hydroxyl radical (OH) near-surface concentrations, showing an increase in summer ozone by 6%–10% over large areas in central Europe due to their emissions. It also demonstrates a substantial increase in formaldehyde concentrations. Additionally, the impact of BVOC emissions on hydroxyl radical concentrations shows a decrease over most of the modeled region by 20%–60%, with some increases over urban areas. Impacts on peroxy radicals ( $\text{HO}_2$  and higher  $\text{RO}_2$ ) are shown too.

Importantly, the study explores the partial role of urban vegetation in modulating ozone and evaluates its contribution to the overall ozone formation due to all BVOC emissions. The findings reveal that urban BVOC emissions contribute to around 10% of the total impact on ozone and formaldehyde concentrations in urban areas, indicating their significant but localized influence.

The study also conducts sensitivity analyses to assess the uncertainty arising from the calculation of the urban fraction of BVOC emissions. The results show that the impact of urban BVOC emissions responds to their magnitude nearly linearly, with variations up to 4-fold, emphasizing the importance of accurately quantifying the urban BVOC fluxes. Overall, the study sheds light on the intricate relationship between urban vegetation, BVOC emissions, and their impact on atmospheric chemistry, providing valuable insights into the regional chemistry of BVOC emissions over central Europe and the causes of urban ozone pollution.

## 1 Introduction

Biogenic volatile organic compounds (BVOCs) are atmospheric organic trace gases which are emitted by terrestrial ecosystems. The function of these emissions is connected to the protection of these ecosystems against environmental changes (Simpraga et al., 2019) or herbivory (Yu et al.,

2021) as a way of signaling communication, which enhances their growth and their reproduction. Emission inventories have shown that the prominent species are the terpenoids (i.e., isoprene, monoterpenes, and sesquiterpenes), followed by alcohols, carbonyls, and acids. Annually, global isoprene emissions can reach values of  $440 \text{ Tg yr}^{-1}$  and contribute to 50% to the total BVOC emissions (Guenther et al., 2012;

Sindelarova et al., 2022). Measured BVOC concentrations showed their chemical lifetimes ranging between few minutes to hours, and their reactivity is dependent on many atmospheric factors (Kesselmeier and Staudt, 1999). Due to their high reactivity, BVOCs significantly affect the chemistry of the lower troposphere by reacting with hydroxyl radical (OH), nitrate radical ( $\text{NO}_3$ ), and ozone ( $\text{O}_3$ ), leading also to the formation of secondary organic aerosols (Seinfeld and Pandis, 2016; Gu et al., 2021; Bartík et al., 2024).

Several factors influence the magnitude of BVOC emissions. First, meteorological factors such as the temperature and the solar radiation intensity have a positive correlation with the emission rates (Guidolotti et al., 2019). Grote et al. (2013) proved that the temperature sensitivity of these emissions depends also on different tree and plant species. Humidity is also another factor that affects the stress response of the plants. Droughts are linked with elevated BVOC emissions, whereas higher levels of humidity can reduce these emissions by closing the stomata of the leaves (Duan et al., 2023). The existence of herbivores and pathogens in the environment adds another factor that contributes to the BVOC emission rates. Injuries from these organisms can stress the plants, resulting in higher emissions (Fitzky et al., 2019).

BVOCs have a complicated role in the tropospheric chemistry. By reacting with OH radicals, BVOCs are oxidized to organic peroxy radicals ( $\text{RO}_2$ ), following with the reaction with NO to oxidize into  $\text{NO}_2$  if sufficient  $\text{NO}_x$  is available (e.g., in urban areas).  $\text{NO}_2$  then undergoes photolysis, leading to ozone formation (Coates et al., 2016; Li et al., 2019). However, for low- $\text{NO}_x$  areas and/or those already rich in volatile organic compounds (VOCs),  $\text{RO}_2$  will react with each other or with  $\text{HO}_2$  with even a small negative effect on tropospheric  $\text{O}_3$  (Lerdau, 2007; Seinfeld and Pandis, 2016; Zhao et al., 2022). Apart from contributing to ozone formation, BVOCs can also reduce their abundance as  $\text{O}_3$  is another oxidant leading to the formation of Criegee biradical intermediates that consequently become aldehydes and ketones (ending in formaldehyde). Finally, during nighttime, the main oxidizing mechanism is the reaction with the nitrate radical dominating over the reaction with nighttime ozone (Seinfeld and Pandis, 2016).

It was also shown (e.g., Harrison et al., 2006; Seinfeld and Pandis, 2016) that Criegee intermediates further decompose to hydroxyl radicals and can significantly impact the OH budget over urban areas by being a dominant source for OH besides the well-known ozone photolysis pathway.

Among the wide family of BVOCs, a great deal of attention was given to isoprene for being the most abundant biogenic species – especially for its oxidation and its impact on recycling of hydroxyl radical and peroxy radicals ( $\text{HO}_2$  and higher  $\text{RO}_2$ ). Archibald et al. (2010) pointed out the complicated pathways that isoprene undergoes and showed that any simplification made in the chemical representation (as usually done in chemistry mechanisms within current chemistry transport models) reduces the  $\text{HO}_x$  ( $\text{OH} + \text{HO}_2$ ) recy-

cling, leading to lower OH values compared to measurements. More recently, Bates et al. (2019) also argued that the distribution of its products is highly dependent on the addition of OH and  $\text{O}_2$  to isoprene, and its proper representation allows a more prompt regeneration of OH. This consequently improves the ozone- $\text{NO}_x$  chemistry, leading more accurate ozone simulation in numerical models (Schwantes et al., 2020).

In summary, BVOCs affect the  $\text{HO}_x$  and ozone concentrations and thus have a great impact on the oxidative capacity of the lower troposphere which refers to the ability of the atmosphere to remove air pollutants and trace gases (Thompson, 1992). Moreover, BVOCs can oxidize into low-volatility substances and thus also contribute to secondary organic aerosol (SOA) formation (Aksoyoglu et al., 2017; Liu et al., 2021; Huszar et al., 2024; Bartík et al., 2024).

Many studies have shown the overall impact of BVOC emissions on tropospheric ozone concentrations. On the global scale, it was found by many that, as expected, biogenic hydrocarbon emissions increase tropospheric ozone concentrations especially over high- $\text{NO}_x$  regions, while they can lead to even some decreases for the low- $\text{NO}_x$  case (Williams et al., 2009; Zeng et al., 2008; Rowlinson et al., 2020). Over continental scales, works often focused on highly polluted regions of North America or eastern Asia, where BVOC emissions are expected to have a large impact on ozone levels. Sartelet et al. (2012) showed that over North America, average summer ozone concentrations are about 10 % larger if BVOC emissions are considered. Zhang et al. (2017) performed a detailed source apportionment using Ozone Source Apportionment Technology (OSAT) and showed a similar contribution of BVOCs to regional ozone levels over the USA, while they also applied a brute-force (“zero-out”) method, which gave even higher contributions, especially over high- $\text{NO}_x$  areas. The increase in biogenic emissions of VOCs within a warming climate is also examined, and Lam et al. (2011) showed that in future BVOC emissions will become even more important with regards to ozone formation. The abovementioned OSAT technique to attribute the simulated ozone concentrations to different sources was applied by Zhang et al. (2017), and a contribution of more than 10 % to regional ozone concentrations was found, mainly above and near urban areas. Over Canada, Sakulyanontvittaya et al. (2016) showed that region-specific land use and plant-type data are needed to achieve a better performance in modeling regional-scale ozone, especially over urban areas, where the effect of BVOCs was found to be higher.

Over highly populated areas in eastern Asia, ozone is also strongly modulated by BVOC emissions, especially in connection with  $\text{NO}_x$  plumes over downwind areas near large cities (Kim et al., 2013; Lee et al., 2014; Liu et al., 2018; Li et al., 2018; Wu et al., 2020). The elevated role of BVOCs in the ozone formation during heat waves when BVOC emissions are higher than average was calculated by Ma et al. (2019). Qu et al. (2013) and Gao et al. (2022b) pointed out that the in-

terplay of anthropogenic and BVOC emissions is synergical, leading to higher-ozone concentrations than the sum of their separate contribution. It was shown for eastern Asia that the change in BVOC emissions is responsible for the observed ozone increases (Wang et al., 2022) during the 21st century. The role of BVOC modifications within the changing climate over China was also of interest, and due to the increase in BVOC emissions, ozone increases are also foreseen (Liu et al., 2019).

Over Europe, studies in the Mediterranean region showed that the maximum O<sub>3</sub> increase due to the BVOC emissions can be of the order of 10 µg m<sup>-3</sup> (Thunis and Cuvelier, 2000). The dominant role of natural VOC emissions over anthropogenic ones in ozone production (i.e., ozone concentrations are sensitive mostly to BVOC emissions) over the Mediterranean was shown also by Richards et al. (2013), especially over urban downwind areas, as highlighted earlier by Im et al. (2011). Previously, Curci et al. (2009) calculated an average of 5 % increase in daily ozone maxima as a result of BVOC emissions for 4 hot years (1997, 2000, 2001, and 2003), especially during the hottest summers. Many others pointed out the crucial role of BVOC emissions in air quality during heat waves (Castell et al., 2008; Strong et al., 2013; Hodnebrog et al., 2012). Furthermore, Castell et al. (2008) and Tagaris et al. (2014) showed that the magnitude of the impact of BVOCs depends on the NO<sub>x</sub> emission magnitude, and a reduction in these emissions in cities would decrease the BVOC impact on ozone. A more elaborate source attribution of European ozone was conducted by Karamchandani et al. (2017), who used OSAT and found too that biogenic emissions are important for summer ozone. As for the uncertainty in the effect on ozone due to the method of BVOC flux calculation, Jiang et al. (2019) showed that despite the “large differences in isoprene emissions (i.e., 3-fold), the resulting impact in predicted summertime ozone proved to be minor”. In central Europe, the produced ozone concentrations due to BVOC emissions are on average 12 % higher and can reach values up to 60 % on warm days in Berlin (Churkina et al., 2017).

It is clear from the studies above that from an ozone production perspective, BVOC emissions are important above urban areas with high-NO<sub>x</sub> pollution, where there is sufficient NO to be oxidized by peroxy radicals. Certainly, BVOC concentration “clouds” arriving over cities can have a large effect on ozone in this regard too (von Schneidemesser et al., 2011); however, urban areas in Europe are never totally non-vegetated, so the VOCs emitted by urban vegetation might have a very important role too. These emissions will probably be lower than emissions from rural/natural areas, but urban vegetation injects BVOCs right into a NO<sub>x</sub>-rich environment, potentially resulting in efficient ozone production (Gao et al., 2022a; Huszar et al., 2022) and being a dominant factor in the regulation of urban ozone (Fitzky et al., 2023). Moreover, the physiology of trees in urban environments differs from their rural/natural counterparts due to the

different urban conditions. As an example, the so-called urban heat island effect creates higher temperatures compared to the rural environments (Huszar et al., 2018; Karlický et al., 2018, 2020). The increased CO<sub>2</sub> concentrations can enhance the growth of vegetation and the release of BVOC emissions, a process which is also highly dependent on the plant/tree species (Yu and Blande, 2021). The low levels of soil moisture and humidity also act as a catalyst for increasing emissions. Fitzky et al. (2019) showed that the size of urban trees and the canopy play an important role in mitigating the air pollution, with taller trees being more suitable for this goal. Last, the global trend of an urban greening solution poses a further threat to urban ozone as it introduces new BVOC emissions in cities that can potentially enhance ozone concentrations (Ma et al., 2021; Gu et al., 2021)

A few studies already analyzed the partial role of urban vegetation in air quality in general and in ozone formation and removal via deposition specifically. Nowak et al. (2000) showed that by analyzing various micro-climatic conditions above the urban domain of Washington, D.C., to Massachusetts that the uptake of O<sub>3</sub> due to BVOC emissions increases more than the formation of O<sub>3</sub> during the daytime, while at night the formation of O<sub>3</sub> dominates the uptake. Lerda (2007) discussed that in an atmosphere of existing elevated O<sub>3</sub> concentrations the physiology of the plants will be affected in a way that will produce further BVOC emissions, thus creating a positive feedback loop of O<sub>3</sub> formation. Ghirardo et al. (2016) observed how the urban trees affected the emissions and the uptake of BVOCs. Between constitutive non-stressful conditions and stress-induced BVOCs, the stress-induced BVOCs constituted about 40 % of the total annual BVOC emissions, and this budget could be doubled with the increasing urban greening, highlighting the importance of the urban parameters in BVOC emission models. Calfapietra et al. (2013) and Bonn et al. (2018) further stressed that the choice of the urban trees within urban greening has a crucial importance too with high-BVOC-emitter trees being dangerous in typical urban conditions (i.e., VOC-limited ones). Using a box model to analyze the urban micro-climatic conditions, Simon et al. (2019) showed that increasing isoprene concentrations as a result of urban greening can significantly increase the street level ozone concentrations. Recently, Maisson et al. (2024) calculated the role of urban vegetation in ozone and organic matter formation for Paris during a chosen summer which included a heat wave too. They found that ozone increased on average by about 2 %–3 % during summer, while the heat wave causes an even larger, 4 %–6 %, increase in near-surface ozone.

In summary, there is generally well-established knowledge on the role of BVOC emissions on ozone formation; however, most of the studies looked at only selected months or seasons or selected urban areas. It is certainly true that emissions of VOCs from vegetation are most important during the hottest days of the year; however, the long-term regional impact of BVOCs over decadal timescales has not been well ad-

dressed. Moreover, very few studies looked at the partial role of urban vegetation in modulating ozone, especially in the long term. Here, we try to address these gaps and propose a regional chemistry-transport-model-based study to evaluate the long-term impact of BVOC emissions on present-day ozone values in and around urban areas over central Europe. Our study, moreover, calculates the partial role of the urban vegetation and evaluates its contribution to the overall ozone formation due to all BVOC emissions. Apart from ozone, the study further assesses the changes in the oxidative capacity of the atmosphere in terms of OH and RO<sub>2</sub> concentrations, as well as the impact on the products of BVOC oxidation (formaldehyde).

A further aim of the study is to better understand the causes of urban ozone pollution over Europe. According to the European Environmental Agency with regard to Europe's air quality status in 2022 (EEA, 2022), 12 % of the EU population is exposed to elevated ozone burdens (taking 120 µg m<sup>-3</sup> as a threshold value for the daily maximum 8 h ozone), while if the WHO guidelines are taken into account (100 µg m<sup>-3</sup>), this percentage increases to 95 %.

## 2 Methodology

### 2.1 Models used

To achieve the objectives of the study, the chemical transport model Comprehensive Air quality Model with extensions (CAMx) was coupled offline to the regional climate model, namely the Weather Research and Forecasting (WRF) Model. Biogenic emissions were calculated by the Model of Emissions of Gases and Aerosols from Nature (MEGAN). These three models are described in detail below.

#### 2.1.1 Driving meteorological model

The BVOC emission model used and the chemical transport model were driven by the WRF (Weather Research and Forecasting) model version 4 (Skamarock et al., 2019) using the following parameterizations: the RRTMG (rapid radiative transfer model for GCMs) scheme (Iacono et al., 2008) for radiation; the Purdue–Lin scheme (Chen and Sun, 2002) and the Grell 3D scheme (Grell, 1993) for microphysical processes and convection, respectively; the Noah scheme for the land surface exchange (Chen and Dudhia, 2001); and, finally, the BouLac scheme (Bougeault and Lacarrère, 1989) to resolve the boundary layer processes. Static land use data for WRF are derived from CORINE Land Cover data, version CLC 2012 (CORINE, 2012). For urban grid boxes, the single-layer urban canopy model (SLUCM; Kusaka et al., 2001) is used with parameters for the urban built-up, as in Karlický et al. (2018). The choice of the combination of parameterizations follows the results of Karlický et al. (2020), who performed a series of sensitivity experiments to achieve the best possible model–observation agreement.

#### 2.1.2 Chemical transport model

To account for the chemical transformation and transport of chemical species, we used the chemical transport model CAMx, version 7.20 (Comprehensive Air quality Model with extensions; Ramboll, 2022; Emery et al., 2024). CAMx is a Eulerian chemical transport model to calculate photochemistry, as well as aerosol processes. The CB6r5 gas phase chemical mechanism (Carbon Bond 6 revision 5) was used in this study. It is described in detail by Cao et al. (2021), with the complete list of chemical species and reactions in Ramboll (2022). Here we provide the most important oxidation pathways for BVOCs, namely for isoprene (ISOP) and monoterpenes (TERP).

In CB6r5, ISOP is oxidized most efficiently through a reaction with the OH radical, followed by a lumped species called ISO2 (“peroxy radicals followed by the reaction of OH with ISOP”). ISO2 then enters reaction chain, starting with the addition of NO to form NO<sub>2</sub>, along with further products like organic nitrates, formaldehyde, methacrolein, and methyl vinyl ketone, including the formation of peroxy radicals (HO<sub>2</sub> and higher RO<sub>2</sub>). ISO2 can also react with other peroxy radicals (including acetyl peroxy radicals). Oxidation of ISOP by ozone is slower in CB6 and is included in one summary reaction resulting in the formation of formaldehyde (HCHO), methyl vinyl ketone, methacrolein, aldehydes, lumped paraffins, a hydroxyl radical, and peroxy radicals (both HO<sub>2</sub> and higher RO<sub>2</sub>). This means that Criegee biradicals, as intermediate products of these oxidation pathways, are not explicitly included in the mechanism. CB6r5 considers a steady-state approximation for them, and only products from their decay are considered. Finally (and especially during the night), ISOP is oxidized in CB6r5 by the nitrate radical (NO<sub>3</sub>) resulting in formation of HCHO, higher aldehydes, methyl vinyl ketone, NO<sub>2</sub>, and organic nitrates, as well as peroxy radicals. The reaction of ISOP with nitrate is faster than with ozone but still slower than the OH oxidation. The main ISOP oxidation products (methyl vinyl ketone and methacrolein) are further oxidized by either OH, ozone, or NO<sub>3</sub>, ending in simpler aldehydes, ketones, methyl glyoxal, formic acid, hydroxyl radical, and, of course, some peroxy radicals.

In the case of monoterpenes, they are represented with one lumped species (called TERP) that represents all monoterpenes. Their oxidation in CB6r5 again follows three pathways (i.e., reaction with OH, ozone, and nitrate radicals). The fastest oxidation occurs with OH, followed by the reaction with nitrate radicals and ozone. These oxidation pathways are again represented by three summary reactions, with the products involving HCHO and higher aldehydes, organic nitrates, paraffins, a hydroxyl radical, and peroxy radicals. Again, Criegee intermediates are not explicitly calculated; this is only the case for consequent products (which include also hydroxyl radical). The monoterpene oxidation pathways are based on the older CB05 gas phase chemistry mechanism

(Sarwar et al., 2008) which uses the reaction rate constants taken from the SAPRC99 mechanism (Carter, 2000). These reaction constants represent an average of the individual reaction constants for different compounds that comprise the monoterpene family.

It is seen that the oxidation of ISOP and TERP in CAMx is represented by a relatively simple set of reaction equations and does not account for the intermediate reaction steps and products including possible feedbacks, including the consideration of Criegee intermediates. In this regard, the Master Chemical Mechanism (MCM; <https://mcm.york.ac.uk/MCM/>, last access: 9 December 2024) could provide a much more detailed degradation scheme; alternatively, there are attempts to incorporate special schemes aimed at only isoprene (Bates et al., 2019) or isoprene and terpenes (Schwantes et al., 2020) that better represent, e.g., the HO<sub>x</sub> recycling and thus the impact on NO<sub>x</sub>–ozone chemistry, as detailed by Archibald et al. (2010) and with recent updates provided by Khan et al. (2021). CAMx is, however, intended to be employed over large domains, and in the case of longer numerical integrations like in this study, some compromise has to be made between the complexity of the chemistry and the computational feasibility. On the other hand, the “summary” reactions for TERP and ISOP mentioned above may introduce some error in the distribution of the oxidants, and efforts should be made towards a more explicit mechanism in future model works (e.g., the new CB7 mechanism; Schwantes et al., 2020).

As gas-phase chemical reactions are tightly coupled to heterogeneous chemistry and aerosol processes, we also invoked the full aerosol chemistry in our simulations using the ISORROPIA thermodynamic equilibrium model v1.7 (Nenes et al., 1998, 1999) and RADM-AQ aqueous chemistry algorithm. A semi-volatile equilibrium scheme called SOAP (Strader et al., 1999) is used to form secondary organic aerosol from condensable vapors.

CAMx is coupled offline to WRF output using the WRFCAMx preprocessor that is provided with the CAMx code <https://www.camx.com/download/support-software/> (last access: 25 September 2024). Vertical eddy diffusion coefficients (K<sub>v</sub>) are computed in WRFCAMx, following the similarity method adopted from the Community Multiscale Air Quality (CMAQ) modeling system (Byun, 1999). The sensitivity to the choice of the method for the calculation of K<sub>v</sub> was tested by Huszar et al. (2020a), and they found that the CMAQ method provides K<sub>v</sub> values in the middle of the uncertainty range.

### 2.1.3 The biogenic emission model

Biogenic emissions from terrestrial ecosystems are calculated offline with MEGANv2.1 (Model of Emissions of Gases and Aerosols from Nature) (Guenther et al., 2012). MEGAN provides meteorology-dependent emission fluxes of a whole range of biogenic volatile compounds

such as isoprene, monoterpenes, and sesquiterpenes, as well as methanol, ethanol, acetaldehyde, acetone,  $\alpha$ -pinene,  $\beta$ -pinene, *t*- $\beta$ -ocimene, limonene, ethene, and propene. MEGAN2.1 estimates emissions ( $F_i$ ) of chemical species  $i$  from terrestrial landscapes according to

$$F_i = \gamma_i \sum_{j=1}^n \epsilon_{i,j} \chi_j, \quad (1)$$

where  $\epsilon_{i,j}$  is the emission factor at standard conditions for vegetation type  $j$  with fractional grid box areal coverage  $\chi_j$ . The emission activity factor ( $\gamma_i$ ) accounts for the processes controlling emission responses to environmental and phenological conditions. This includes a light response based on electron transport; a temperature response due to enzymatic activity; and further a dependence on leaf age, soil moisture, leaf area index (LAI), and CO<sub>2</sub> concentration (called CO<sub>2</sub> inhibition). MEGAN considers 16 vegetation types called plant functional types (PFTs) and emission factors for 19 biogenic species that are speciated to the target chemical mechanism (CB6r5 in our case). The meteorological input to MEGAN is obtained from WRF hourly outputs. The outputs of MEGAN are hourly emission fluxes for the target grid (see below).

## 2.2 Model setup and data

The WRF model and CAMx were run on a central European domain with a size of 189 × 165 grid boxes (from France to Ukraine and Italy to Denmark) at a 9 km × 9 km horizontal resolution centered over Prague (Czechia) (50.075° N, 14.44° E; Lambert conic conformal projection). WRF used 40 layers in the vertical, reaching 50 hPa as model top, while the lowermost layer was about 30 m thick. CAMx was applied over 18 layers, with the top layer at about 12 km. The first 10 CAMx layers matched the WRF layers.

Simulations were carried out for the 2007–2016 period. This length of time (10 years) ensures higher representativeness of the results providing “climatology” of the air quality impact of BVOC emissions.

To drive the regional climate in WRF, the ERA-Interim reanalysis (Simmons et al., 2010) was used. Chemical initial and boundary conditions for CAMx were adopted from CAM-Chem global model data (Buchholz et al., 2019; Emmons et al., 2020).

The TNO-MACC-III data (an update of the MACC-II version; Kuenen et al., 2014) from 2011 were used as anthropogenic emission data for the whole decade. This high-resolution (1/16° latitude, 1/8° longitude; roughly 6 km × 6 km) European emission database provides annual emission totals for non-methane volatile organic compounds (NMVOCs), NO<sub>x</sub>, methane (CH<sub>4</sub>), sulfur dioxide (SO<sub>2</sub>), ammonia (NH<sub>3</sub>), carbon monoxide (CO), and PM<sub>10</sub> and PM<sub>2.5</sub> (particles with diameters < 10 and 2.5 μm, respectively) in 11 activity categories. To redistribute the emissions to model grid cells, FUME version 2.0 (Flexible Universal processor for Modeling Emissions) was used (Benešová et al.,

2018; Belda et al., 2024; <http://fume-ep.org/>, last access: 25 September 2024). FUME further performs the standard emission-processing steps, like chemical speciation and time disaggregation to hourly emissions with speciation profiles and temporal factors, based on Passant (2002) and van der Gon et al. (2011). The outputs of FUME are CAMx-ready hourly emission files speciated to model species (consistent with the used mechanism).

For MEGAN, the MODIS  $0.1^\circ \times 0.1^\circ$  LAI data from the year 2010 for an 8 d period were used (Yuan et al., 2011). Plant-functional-type data are extracted also from MODIS, following Lawrence and Chase (2007) for the same year (2010). Finally, emission factors for different plant types are based on Guenther et al. (2012). To justify to choice of 1 year as a representative one for the whole period, we plot the average monthly time series of LAI from the year-by-year data in Yuan et al. (2011) as the domain average in Fig. 3. The plot shows that for each simulated year, the LAI for summer months reaches slightly above 2.5 on average (about 2.6–2.7), while the year 2010 is not an outlier, meaning that it is a good representation of the decade (there are larger differences during winter between the years, but we were interested only in the summer months in this study). Regarding the plant-functional-type data, here we assume negligible modifications in land use over central Europe during this decade. This is true especially for crops and other farm land types and also for forests (EUROSTAT, 2020; FOREST EUROPE, 2020), at least compared to areas where intense urban development such as in China (Zhu et al., 2022) took place in the last few decades, thus requiring us to take the evolution of PFT distribution and LAI into account much more (Ma et al., 2021).

MEGAN was driven with a WRF-generated hourly meteorological output, resulting in hourly BVOC emissions files on a daily basis for the entire 2007–2016 period.

### The modeled BVOC emissions

Figure 1 depicts the 2007–2016 average summer (June–July–August, JJA) emissions of BVOCs, as well as the sum of all anthropogenic VOC emissions for the same period. This allows us to compare the magnitudes of both sources.

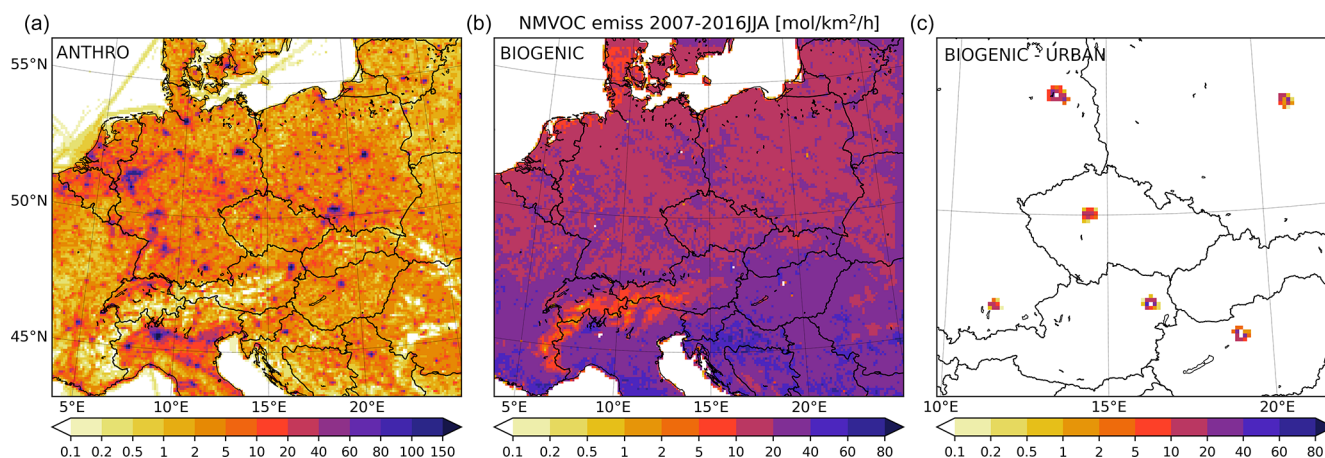
As one of the objectives of the study is to evaluate the partial role of BVOC emissions originating from urban areas, the figure also shows the urban BVOC emissions for the six selected cities. The urban fraction was calculated by masking out the PFT data at the city boundaries such that, first, it was calculated that how much of the grid cell falls within the urban area, and second, this factor was applied to the PFT fractional data, thus allowing us to calculate the emissions of BVOCs from this fraction only.

From Fig. 1, it is seen that BVOC emissions are usually between 10 and  $40 \text{ mol km}^{-2} \text{ h}^{-1}$ , with emissions up to  $60\text{--}80 \text{ mol km}^{-2} \text{ h}^{-1}$  over natural areas over the southern part of the domain (Italy and the Balkans). In the case

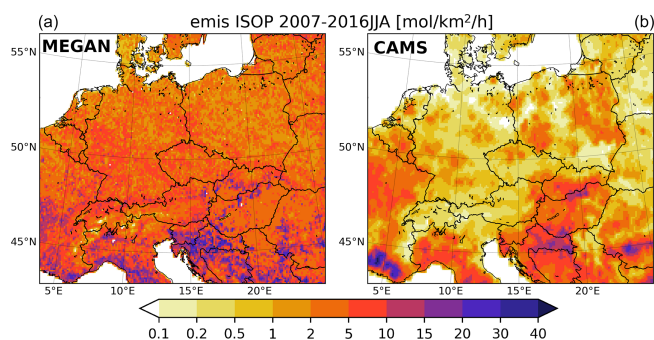
of anthropogenic VOCs (except methane), they are usually lower over nonurban areas ranging up to  $5 \text{ mol km}^{-2} \text{ h}^{-1}$  and thus smaller than the biogenic source. However, over cities – as expected – the anthropogenic source of VOCs is much stronger, reaching  $100\text{--}150 \text{ mol km}^{-2} \text{ h}^{-1}$ . The domain-wide average of anthropogenic and biogenic emissions of non-methane VOCs is  $5.2$  vs.  $18.9 \text{ mol km}^{-2} \text{ h}^{-1}$ , respectively. This means that VOCs have a roughly  $3 \times$  larger biogenic source over the area compared to anthropogenic ones during the summers in the examined decade; however, they have, of course, a substantially different spatial distribution.

The BVOC emissions originating from cities were calculated by masking out the total biogenic emission fields with the individual cities' administrative boundaries, based on shapefiles provided by GADM public database (<https://gadm.org>, last access: 8 May 2024). As the resolution of the MEGAN inputs (LAI and PFT), as well as the output resolution, were approximately the same and relatively coarse (around  $0.1^\circ$ , which is about 10 km in central Europe), this was the only possible method for an estimate of the urban portion of the BVOC emissions. However, we admit that the urban BVOC emissions can be higher or lower, depending on the exact distribution of the vegetation in and around cities. Therefore this study also contains sensitivity experiments aiming to evaluate the uncertainty in the results to the magnitude of the urban portion of the BVOC emissions (see below). The resulting BVOC emissions from urban vegetation are depicted in the right panel of the figures, and this shows that these emission are usually below  $20 \text{ mol km}^{-2} \text{ h}^{-1}$ ; however, for some cities, there are model grid boxes with emissions up to  $60 \text{ mol km}^{-2} \text{ h}^{-1}$ . On the other hand, grid boxes that match the inner part of cities can exhibit almost zero BVOC emissions (like in the case of Berlin, Prague, or Budapest), creating a ring-like emission pattern.

As the modeled BVOC fluxes are dependent on the meteorology supplied, and this meteorology is marked with some biases, we also compared the modeled emission fluxes with emissions that were driven with more accurate meteorological data. For this purpose, the CAMS-GLOB-BIO3.1 data from the Copernicus Atmosphere Monitoring Service (Sindelarova et al., 2022) were chosen. These data are provided at  $0.25^\circ \times 0.25^\circ$  resolution, so they are somewhat comparable to our resolution, and they are driven by the ERA5 reanalysis. The results are depicted in Fig. 2. Both sets of emission data (those from MEGAN and from CAMS) lie between 0 and  $40 \text{ mol km}^{-2} \text{ h}^{-1}$ , but the CAMS fluxes are usually smaller. Over central Europe, CAMS fluxes often reach only  $0.5\text{--}2 \text{ mol km}^{-2} \text{ h}^{-1}$ , while, at the same locations, our emissions are around  $5\text{--}10 \text{ mol km}^{-2} \text{ h}^{-1}$ . On the other hand, over southern Europe, the isoprene emission peaks are similar in magnitude and have a similar geographic distribution (southern France, Italy, and the Balkans). The reason for these differences is probably due to the fact that version 3.1 of these data incorporated updated region-specific emission factors for different plants instead of using the default



**Figure 1.** The 2007–2016 JJA average emissions of anthropogenic (a) and biogenic (b) VOC emissions and the urban fraction of BVOCs (c) (in  $\text{mol km}^{-2} \text{h}^{-1}$ ). Please note that the color bars for the BVOC emission panels are slightly different from the anthropogenic emission figure.



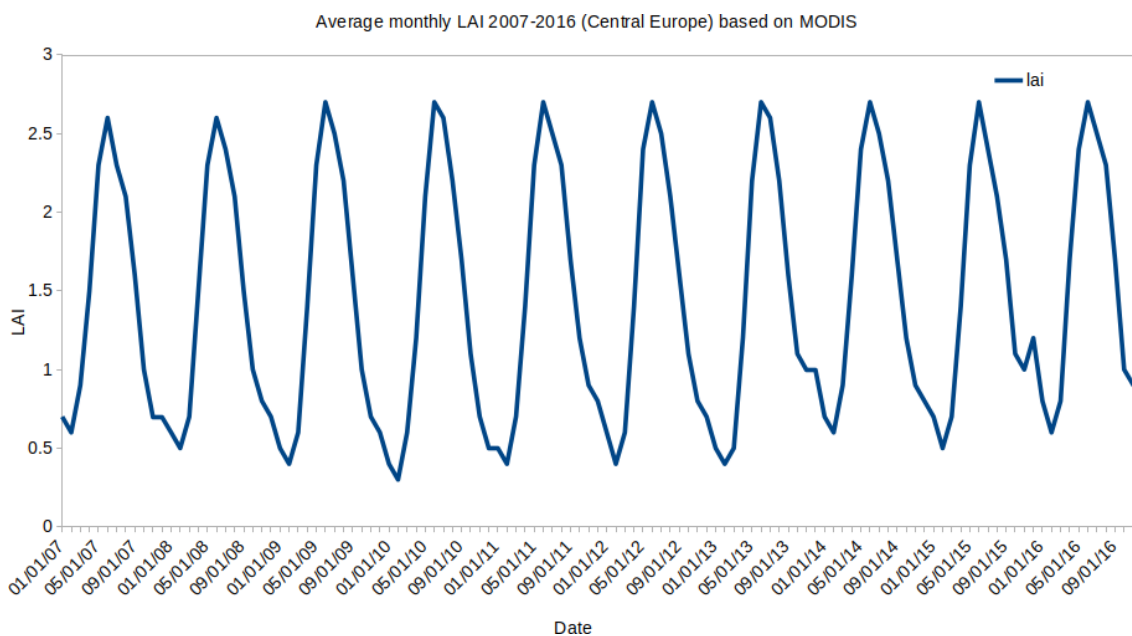
**Figure 2.** Comparison of the 2007–2016 JJA average emissions of isoprene from biogenic sources from the MEGAN model (a) and from the CAMS global biogenic emission data (CAMS-GLOB-BIO; (b)) (in  $\text{mol km}^{-2} \text{h}^{-1}$ ).

MEGAN emission factors (used in CAMS-GLOB-BIO2.1, as well as in our study), and this resulted in lower emissions over Europe compared to the default emission factors used in our setup (see the difference between versions 2.1 and 3.1 in the aforementioned study). Moreover, CAMS-GLOB-BIO3.1 was calculated based on ERA5, while the earlier version of CAMS-GLOB-BIO2.1, as well as WRF, were driven by ERA-Interim. Karlický et al. (2018), who used WRF driven by ERA-Interim over the same domain (and resolution) and with a similar set of parameterizations, showed some overestimation of near-surface temperatures in central Europe, which is connected to the overall positive bias in ERA-Interim temperatures. Consequently, we can expect that the temperatures in our simulations are also higher than they would have been if using ERA5. Lower temperatures in ERA5 thus also add to the difference between our BVOC fluxes and the ones in CAMS-GLOB-BIO3.1.

In summary, these results indicate that our emission fluxes might be somewhat overestimated over the central part of the domain, which probably means that the effects on ozone are overestimated as well.

### 2.3 Model simulations

Multiple model experiments (simulations) were made by CAMx, depending on whether all BVOC emissions or only the urban/nonurban fractions of them were accounted for. The list of simulations is presented in Table 1. Note that each of these CAMx simulations was driven by the same WRF simulation; i.e., no differences between the driving meteorology between the individual simulations were present (the same WRF outputs were also used to drive the CAMx model in Liaskoni et al., 2023; Karlický et al., 2024). In the first simulation denoted “allBVOC”, all BVOC emissions were considered, i.e., those from rural and natural areas, as well as those originating from urban vegetation. In the “noBVOC” simulation, BVOC emissions were removed from the entire domain. For partitioning between the effect of the urban portion of BVOC emissions, we performed a further simulation in which all BVOC emissions were considered, except those originating from the six selected cities (called “nuBVOC” as only “nonurban” BVOCs are considered), and a simulation in which only the urban portion of the BVOC emissions is considered (“uBVOC”). To assess the sensitivity of the results to the number of urban BVOC emissions (i.e., the way the urban and rural fraction of the BVOC emissions is calculated), we performed two additional simulations, namely “2nuBVOC” and “0.5nuBVOC”, where the fraction of the BVOC emissions falling within the boundaries of the urban area is  $2 \times$  larger and half of the original fraction, respectively. These sensitivity simulations were carried out only over a 3-year-long period from 2007 to 2009.



**Figure 3.** Time series of the monthly mean LAI averaged over the domain for the 2007–2016 period, based on MODIS data.

**Table 1.** The list of CAMx simulations performed with the information from BVOC emissions considered, i.e., their rural (nonurban) and urban fraction.

Regional chemistry transport model (CAMx) simulations				
	Experiment	Rural BVOC emissions	Urban BVOC emissions	Period
1	allBVOC	Yes	Yes	2007–2016
2	noBVOC	No	No	2007–2016
3	nuBVOC	Yes	No	2007–2016
4	uBVOC	No	Yes	2007–2016
5	2nuBVOC	Yes (elevated urban fraction)	No	2007–2009
6	0.5nuBVOC	Yes (reduced urban fraction)	No	2007–2009

### 3 Results

#### 3.1 Model validation

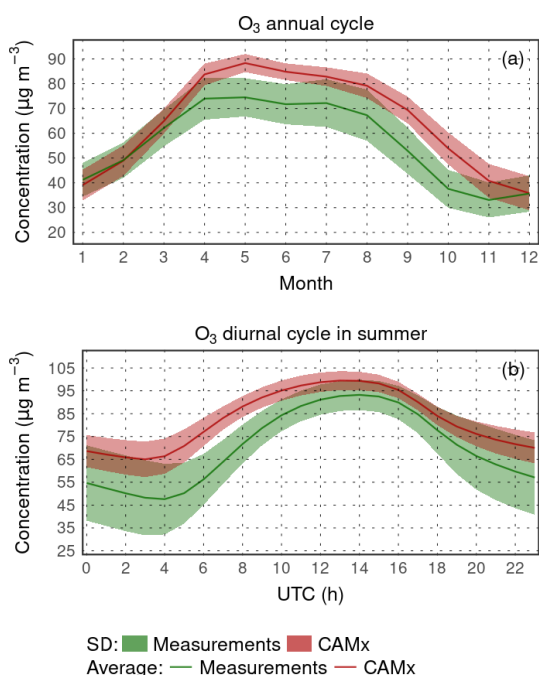
A comparison with both rural and urban air base station measurements for ozone and its precursor  $\text{NO}_2$  has been performed in order to assess CAMx's ability to capture the long-term monthly and daily variability in these pollutants. For ozone, 117 rural stations were used in total, while for each of the six selected cities, we chose all urban and suburban background stations that lie within the city (resulting in two to five stations per city). For  $\text{NO}_2$ , we used stations from the previous selection that also contain this pollutant (to maintain consistency between the validation results for ozone and nitrogen dioxide). The model validation over rural stations aims to show the overall model performance in describing regional-scale concentrations, while the urban comparison serves to evaluate the model strengths and weaknesses over

individual urban areas which logically have a different ozone regime (towards a VOC-limited one compared to the rural  $\text{NO}_x$ -limited one). The complete list of the stations used is provided in the Supplement.

In Fig. 4, the annual cycle of the monthly means and the summer average diurnal variation for rural stations is shown, while we averaged over all stations (the corresponding standard deviation is shown too). The annual cycle is overestimated during almost all months, with the best match in winter. In summer, model values are overestimated by up to  $15 \mu\text{g m}^{-3}$ . The summer diurnal cycle shows that while the daily maxima are overestimated only slightly (by  $5 \mu\text{g m}^{-3}$ ), the nighttime values are higher in CAMx by almost  $20 \mu\text{g m}^{-3}$ . This means that the overestimated nighttime ozone is probably the main cause of the summer overestimation of monthly means.

Over urban areas (Fig. 5), the summer overestimation is even larger, reaching  $20 \mu\text{g m}^{-3}$ , while the nighttime ozone





**Figure 4.** Comparison of modeled surface ozone concentrations with rural background stations for the annual cycle of the average monthly means (a) and average JJA diurnal cycle (b) (in  $\mu\text{g m}^{-3}$ ).

values are higher in model by more than  $30\text{--}40\ \mu\text{g m}^{-3}$ . Moreover, over cities, the ozone daily maxima are also overestimated (by around  $5\text{--}10\ \mu\text{g m}^{-3}$ ), while the maxima are often reached a bit earlier than in the measured values.

The annual cycle of  $\text{NO}_2$  monthly means (Fig. 6a) shows a systematic underestimation by  $2\text{--}3\ \mu\text{g m}^{-3}$ , while the largest occurs during January to April (up to  $4\ \mu\text{g m}^{-3}$ ). The overall shape of the annual cycle is, however, captured very well. The measured summer diurnal cycle (Fig. 6b) shows two maxima during the morning and evening hours, corresponding to morning and evening rush hours. These are somewhat captured in CAMx too, but the concentrations are underestimated, while the largest negative bias occurs between 08:00 and 12:00 LT (local time) ( $2\text{--}3\ \mu\text{g m}^{-3}$ ).

The underestimation of nitrogen dioxide is even larger over urban areas, but the magnitude is different across different cities. As monthly averages (Fig. 7; left), the negative bias ranges from  $5\ \mu\text{g m}^{-3}$  for Vienna to some  $10\text{--}15\ \mu\text{g m}^{-3}$  seen over Budapest, while it is usually larger during the cold season. The summer diurnal cycles show that the model has a tendency to predict the two measured  $\text{NO}_2$  maxima; however, their modeled timing is often not well captured (occurs a bit earlier) or the evening maximum is not present at all (over Berlin, Budapest, or Warsaw). Additionally, the underestimation is large and often exceeds  $30\ \mu\text{g m}^{-3}$  (but is usually around  $10\ \mu\text{g m}^{-3}$ ).

### 3.2 The impact of all BVOC emissions

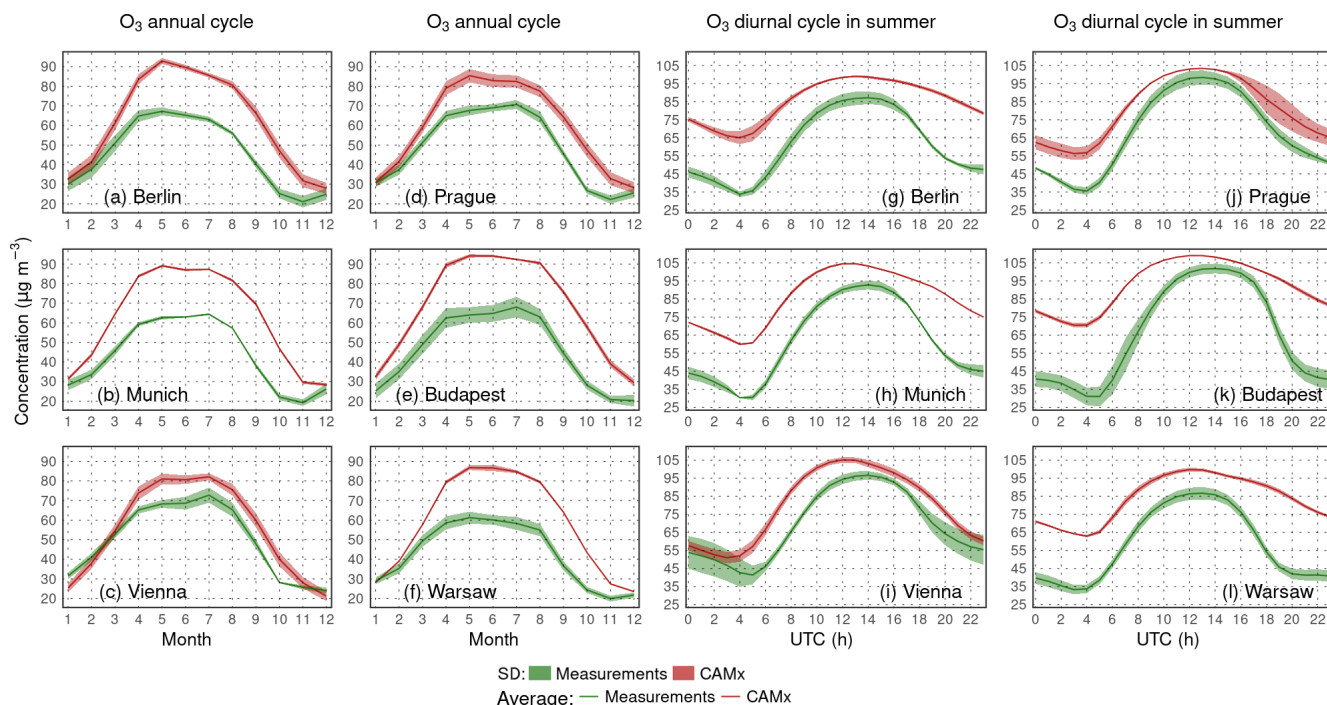
The spatial and temporal distribution of the impact of all BVOC emissions on ozone, formaldehyde, and the hydroxyl radical is presented in this section as the difference between the allBVOC and noBVOC experiments (see Table 1). In the case of ozone and formaldehyde, the relative plots denote the relative contribution of BVOC emissions to the total concentrations that are calculated as  $(\text{allBVOC} - \text{noBVOC}) / \text{allBVOC} \times 100\%$ . For OH, the relative changes are calculated after introducing BVOC emissions, i.e., as  $(\text{allBVOC} - \text{noBVOC}) / \text{noBVOC} \times 100\%$ .

The impact on 2007–2016 summer (JJA) average MDA8 ozone is presented in the upper row of Fig. 8, and it shows that ozone increases by  $2\text{--}4\ \text{ppbv}$  (6%–10% relative contribution) over large areas in central Europe, with maxima over urbanized areas exceeding  $6\ \text{ppbv}$  (10%–12%), while the highest impact is modeled over northern Italy and exceeds  $12\ \text{ppbv}$  (15%–20%).

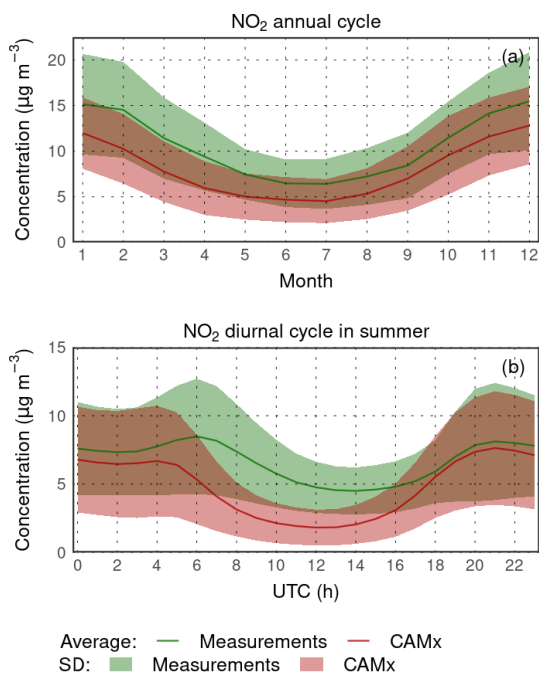
We also plot, in the same figure (Fig. 8), the main oxidation product of BVOCs, namely formaldehyde, to see how it is increased due to this natural VOC source. The average JJA HCHO usually increases by  $0.5\text{--}1\ \text{ppbv}$ , which is around 40%–60% in the relative contribution, showing a substantial increase due to biogenic emissions. Over urban areas, however, the relative contribution is smaller due to the large anthropogenic VOC source over cities. The highest HCHO increases are modeled over the southern part of the domain, aligning with the largest BVOC emissions reaching  $1\text{--}2\ \text{ppbv}$  or 60%–80% in relative numbers.

Finally, as the hydroxyl radical is a key oxidant that is modulated by the presence of VOCs, it is also desirable to plot the impact of BVOC emissions on OH concentrations. Here, we are interested in the daytime OH values, so the impact on the JJA average daily maxima is plotted. Due to BVOC emissions, OH decreases over most of the domain by around  $0.1\text{--}0.5\ \text{pg m}^{-3}$  (20%–40%), while the decrease over urban areas is smaller or some increases are even modeled over cities. Over areas without BVOC emissions (sea), however, OH increases by around  $0.01\text{--}0.02\ \text{pg m}^{-3}$  (2%–5%).

Apart from the average impacts for summer, we also plot the day-by-day evolution of the impact on MDA8 ozone for six selected urban areas over central Europe (Berlin, Budapest, Munich, Prague, Vienna, and Warsaw) in Fig. 9. We also included the results for the vicinities of these cities to evaluate the difference in impact over urban centers with high- $\text{NO}_x$  environment vs. urban surroundings, where the  $\text{NO}_x / \text{VOC}$  ratio is much lower, leading to a potentially smaller BVOC impact. The plot shows that, as expected, the winter impacts are small, barely exceeding  $1\ \text{ppbv}$ . The JJA impacts are, on the other hand, usually above  $5\ \text{ppbv}$ , but extreme values in selected years can exceed  $15\ \text{ppbv}$  (especially for Berlin and Vienna, where it is exceeded at least once each year). It is also seen that the impact over urban surroundings



**Figure 5.** Comparison of modeled surface ozone concentrations with urban background stations from six selected cities for the annual cycle of the average monthly means (a–f) and average JJA diurnal cycle (g–l) (in  $\mu\text{g m}^{-3}$ ).

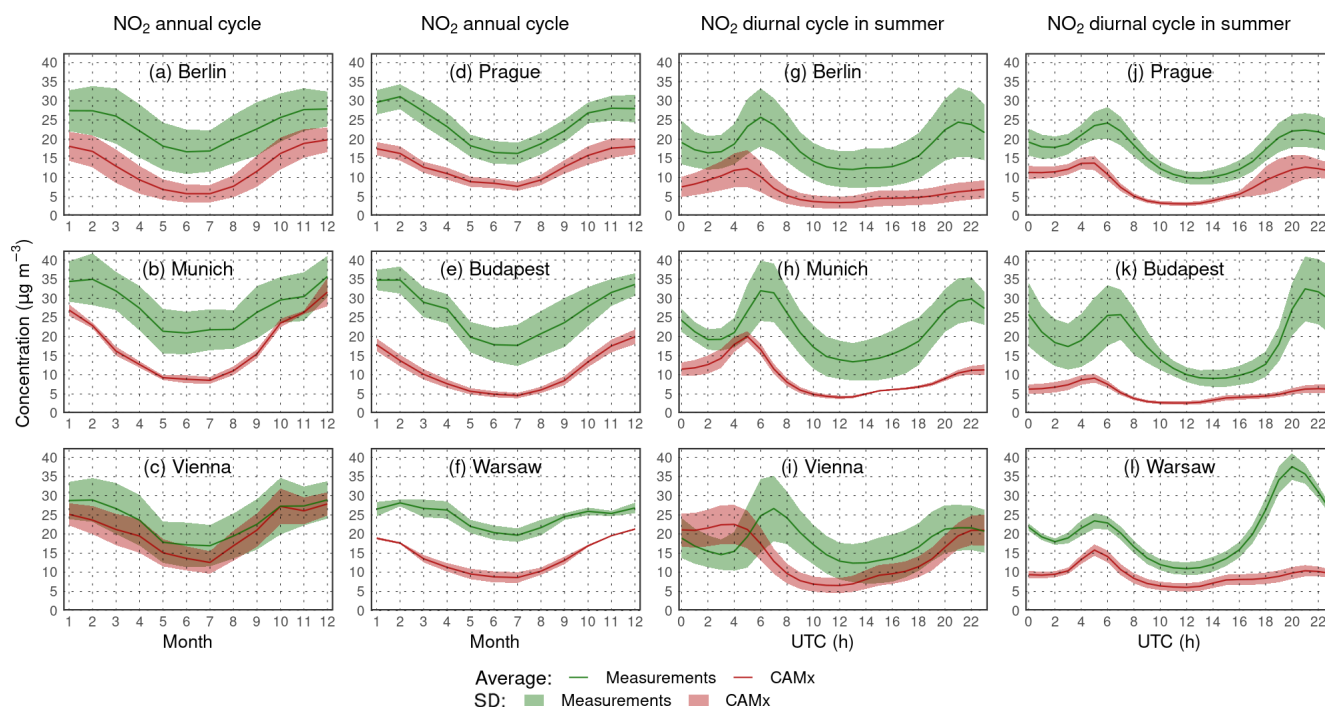


**Figure 6.** Comparison of modeled surface NO<sub>2</sub> concentrations with rural background stations for the annual cycle of the average monthly means (a) and average JJA diurnal cycle (b) (in  $\mu\text{g m}^{-3}$ ).

is somewhat smaller, with maximum impacts lower by 2–3 ppbv compared to the maximum impacts over city centers.

Additionally, in the Supplement, we present the spatial impacts also calculated for individual simulated year. This also helps to reveal the inter-annual variability in the impacts (see Figs. S1–S6 in the Supplement).

We also plot the diurnal cycle of the BVOC impact on the three analyzed species to analyze the variation in the BVOC role during different parts of the day. Figure 10 presents the results for the six cities and their vicinities, along with the absolute ozone concentrations. The diurnal variation in ozone values has the expected shape, with minima around sunrise and maxima during early afternoon, with values in the cities between 25–30 and 45–50 ppbv for the minimum and maximum values, respectively. Over the city surroundings, the corresponding values are slightly lower during afternoon and evening hours (by around 5 ppbv). The impact of BVOCs has a well-described shape during the day, with minimum values aligned with the minima of the absolute ones (around 1.5–2.5 ppbv). During the morning hours, there is a rapid increase in the impact reaching the maxima around noon (up to 4–5 ppbv), and this exhibits a slower decrease during afternoon and evening time. There is an indication for a small secondary maxima (for some cities) during late afternoon which might be caused by elevated emissions of NO<sub>x</sub> during this part of the day (afternoon rush hour). The impact of BVOCs over the city surroundings has a slightly different shape, with minima occurring around the same time as over city centers with similar values. However, the maxima are lower by around 1 ppbv.



**Figure 7.** Comparison of modeled surface  $\text{NO}_2$  concentrations with urban background stations from six selected cities for the annual cycle of the average monthly means (a–f) and average JJA diurnal cycle (g–l) (in  $\mu\text{g m}^{-3}$ ).

Analogous to  $\text{O}_3$ , Fig. 11 depicts the diurnal cycles for formaldehyde. The absolute HCHO concentrations show a rather uniform pattern during the day with values around 1.5–2.5 ppbv for all city centers, while over city surroundings, the values are usually lower during the daytime. For nighttime, the values can be higher than city center values for some cities (Budapest, Prague, and partly Munich too) but are usually lower owing to smaller VOC emissions compared to city centers that decompose into formaldehyde. The impact of BVOC emissions has a double-peak pattern, with the highest values during nighttime reaching 0.7–1.2 ppbv, while the lowest values usually occur during the early afternoon (0.6–1 ppbv). A secondary maximum of the BVOC impact is visible in Budapest, Munich, Prague, and (to a smaller extent) Berlin during morning hours, reaching 0.6–1.2 ppbv. Over the urban vicinities, the impact of BVOCs on HCHO is slightly lower during the day compared to the impact over city centers, but it is about 0.1–0.2 ppbv higher during the evening hours.

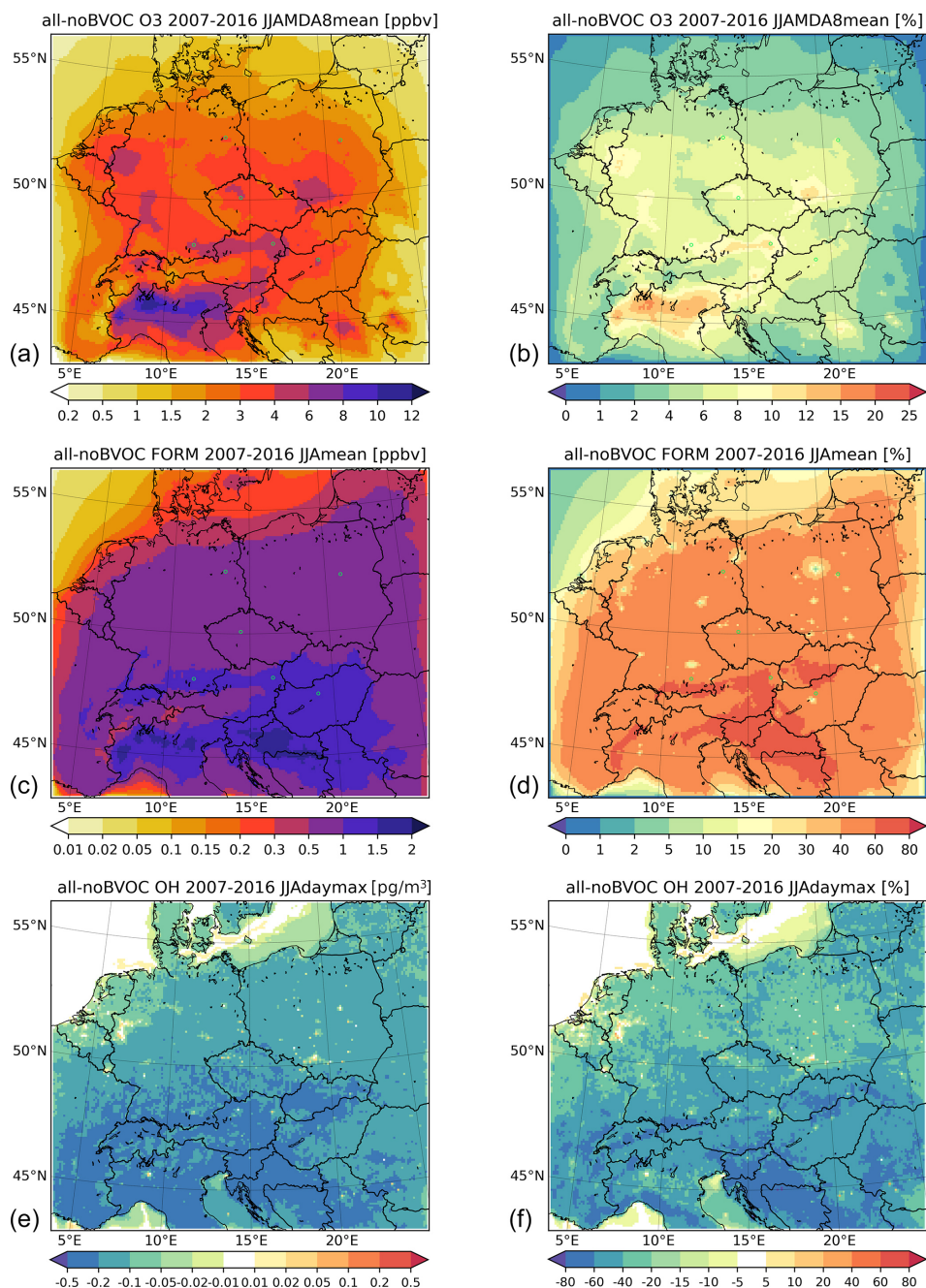
Finally, the diurnal variation in the absolute urban OH concentration and the impacts of BVOC emissions are plotted in Fig. 12. The absolute OH concentrations have the well-known diurnal pattern with very low residual values during the night and a strong peak during noon when solar insolation is at maximum. The maxima over urban centers reach about 0.25–0.35  $\text{pg m}^{-3}$ , while the maxima over city surroundings are somewhat lower at around 0.2  $\text{pg m}^{-3}$ . The impact of BVOC emissions is substantially different between the city

centers and their vicinities. While there is a strong decrease over the vicinities during the day that peaks at around  $-0.1$  to  $-0.2 \text{ pg m}^{-3}$ , over urban centers, there is first a slight increase during morning hours that turns to a decrease during noon and to an increase again during evening hours. However, in some cities (Vienna and Warsaw) the decrease in the impact during noon does not lead to negative values.

### 3.3 The impact of urban BVOC emissions

The partial impact of BVOC emissions from vegetation within the selected urban areas is plotted in Fig. 13. The impact is calculated as the difference in allBVOC and nuBVOC simulations, and the domain is enlarged to show the six cities (i.e., not showing the entire domain). Alternatively, we also calculated the impact of urban BVOCs as the difference in the simulations of uBVOC and noBVOC in Fig. 14. Thus, the impact is calculated with respect to two reference states, where the first one considers all BVOC emissions except for those in cities, while the second one considers no BVOC emissions at all (at least within the computational domain).

The impact of urban BVOCs on ozone is a clear increase up to 0.6 ppbv over city centers, while a few tens of kilometers away from cities the impact reduces below 0.1 ppbv. HCHO increases due to urban BVOCs by about 0.08 ppbv, with maximum values often found at the edges of the cities which already have large vegetation cover and still belong to the city outskirts. This ring-like feature (seen in the emis-

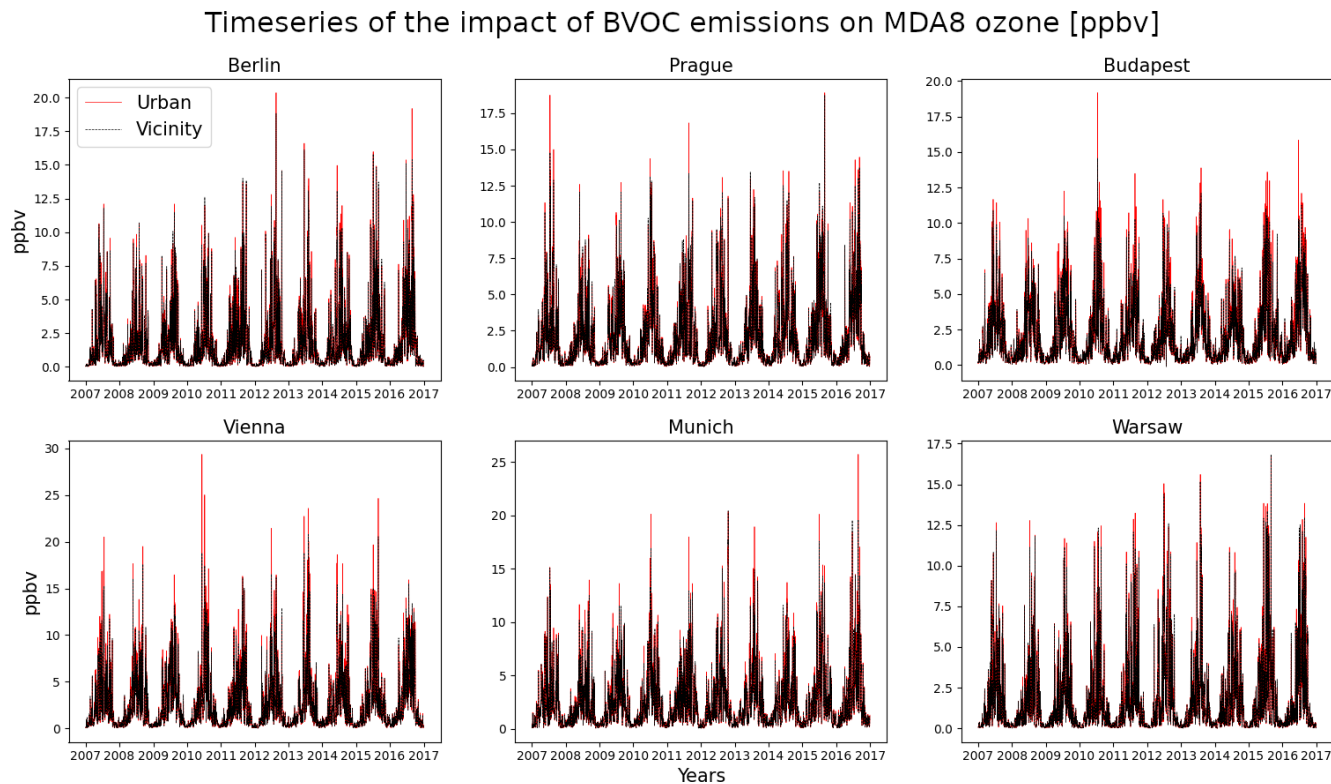


**Figure 8.** The average 2007–2016 JJA impact of all BVOC emissions on the maximum daily 8 h ozone (MDA8; **(a, b)**), daily mean formaldehyde, and daily max hydroxyl radical near-surface concentrations (in ppbv) for O<sub>3</sub> and HCHO (FORM in figure titles) and (in pg m<sup>-3</sup>) (10<sup>-6</sup> μg m<sup>-3</sup>) for OH. Panels **(a)**, **(c)**, and **(e)** show the absolute impact. Panels **(b)**, **(d)**, and **(f)** show the relative contribution in percent.

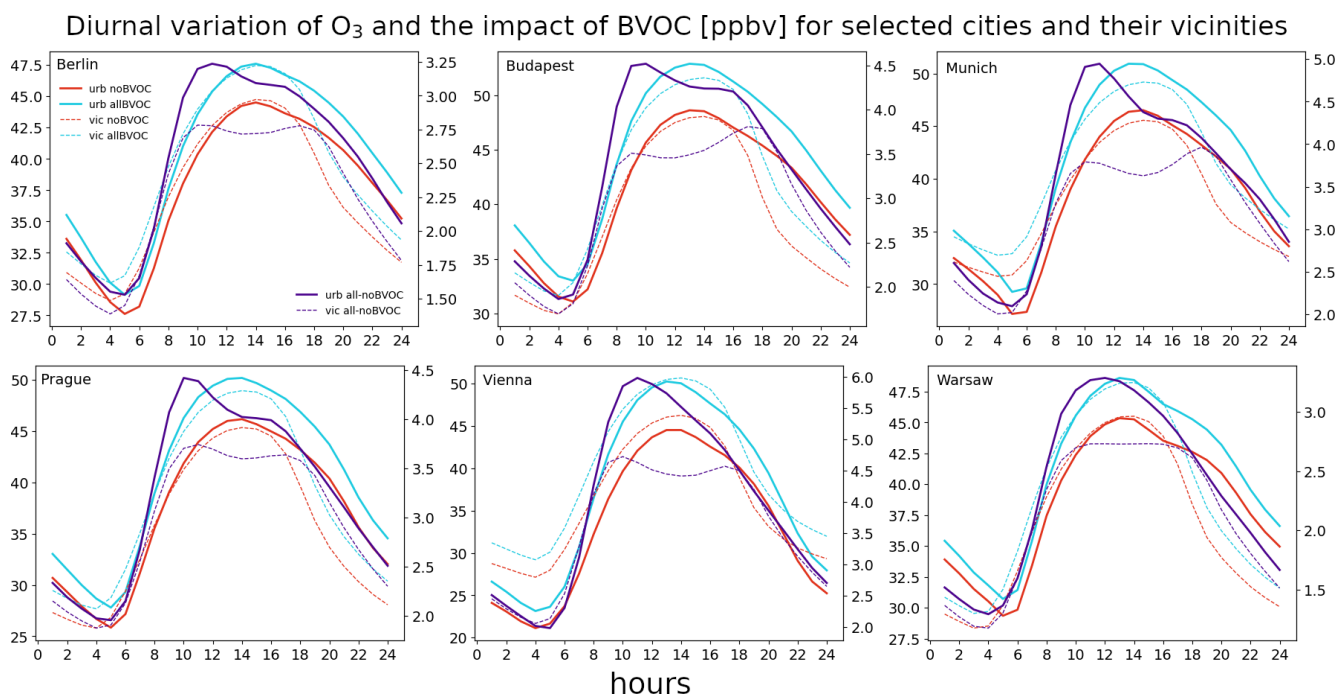
sion plots) is also seen for OH, which decreases due to urban BVOCs by around 0.1–0.2 pg m<sup>-3</sup>. If the impact of urban BVOCs is calculated from the noBVOC background reference, it is clearly larger. The O<sub>3</sub> increases reach 0.8 ppbv, and the diameter of the 0.1 ppbv increase around cities is larger. A larger impact is also seen for HCHO, where the increase reaches or even exceeds 0.1 ppbv. Finally, OH also decreases to a larger extent, reaching -0.2 pg m<sup>-3</sup>. This clearly shows

the importance of the choice of a reference state towards which the impact is calculated.

In a similar fashion, as for the impact of all BVOC emissions, we plot the diurnal cycle of the impact of urban BVOCs in Figs. 15–17 for O<sub>3</sub>, HCHO, and the OH radical, respectively. We also plot the absolute values for the allBVOC and nuBVOC cases.



**Figure 9.** The 2007–2016 time series of the BVOC impact of MDA8 ozone for the centers and vicinities of six selected cities (in ppbv).



**Figure 10.** The average 2007–2016 JJA diurnal cycle of near-surface  $O_3$  for six city centers (bold) and their vicinities (dashed) for the noBVOC (red) and allBVOC cases (cyan). The right y axis corresponds to the impact of BVOC emissions (allBVOC–noBVOC; violet). Cities are Berlin, Budapest, Munich, Prague, Vienna, and Warsaw (units in ppbv).

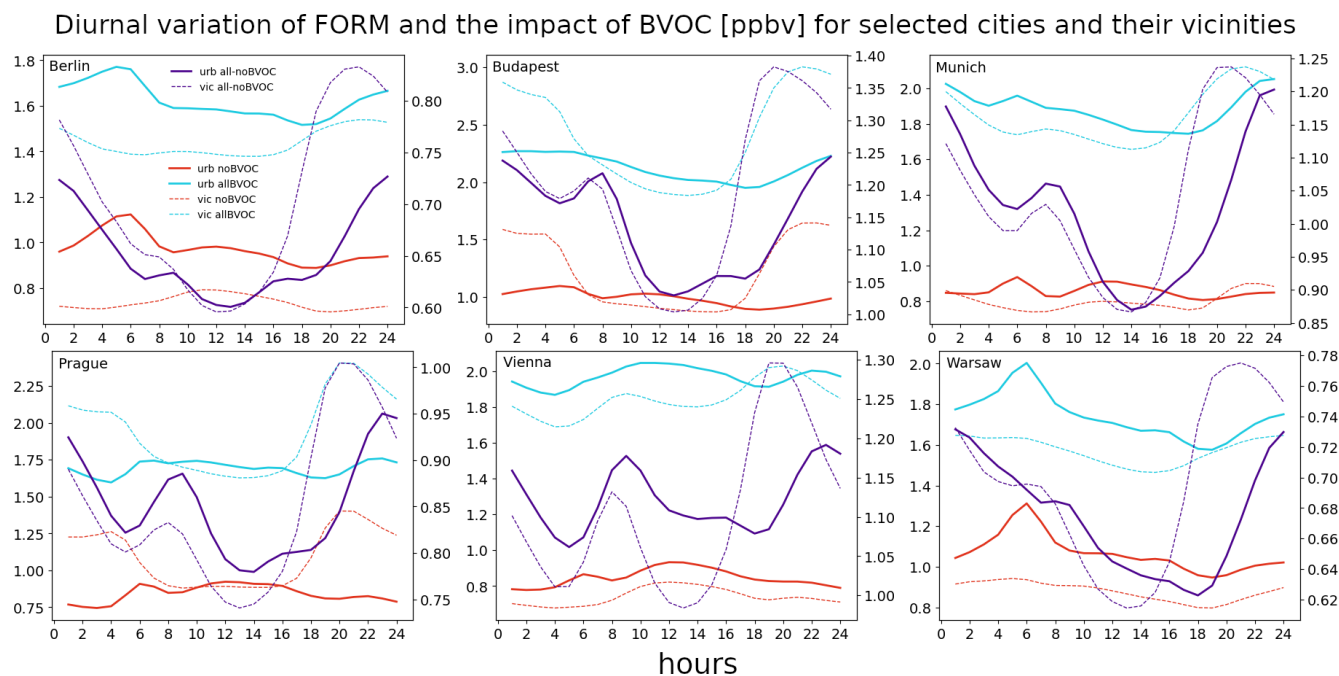


Figure 11. Same as Fig. 10 but for formaldehyde.

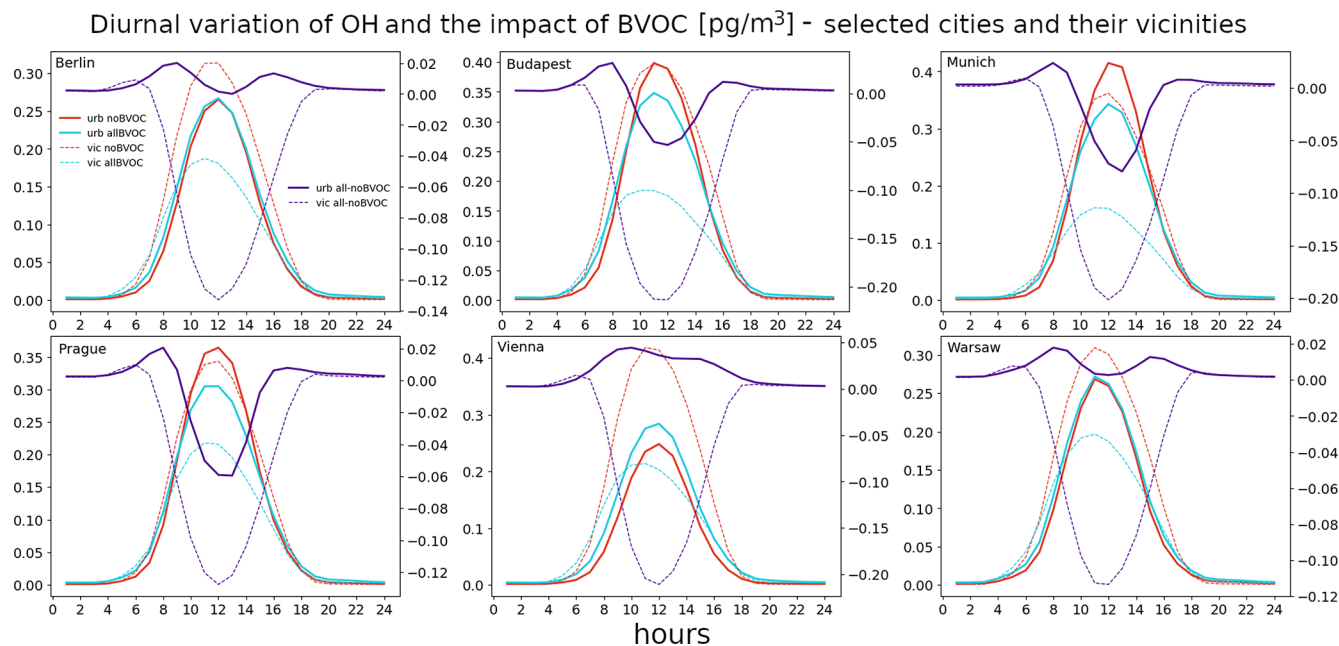
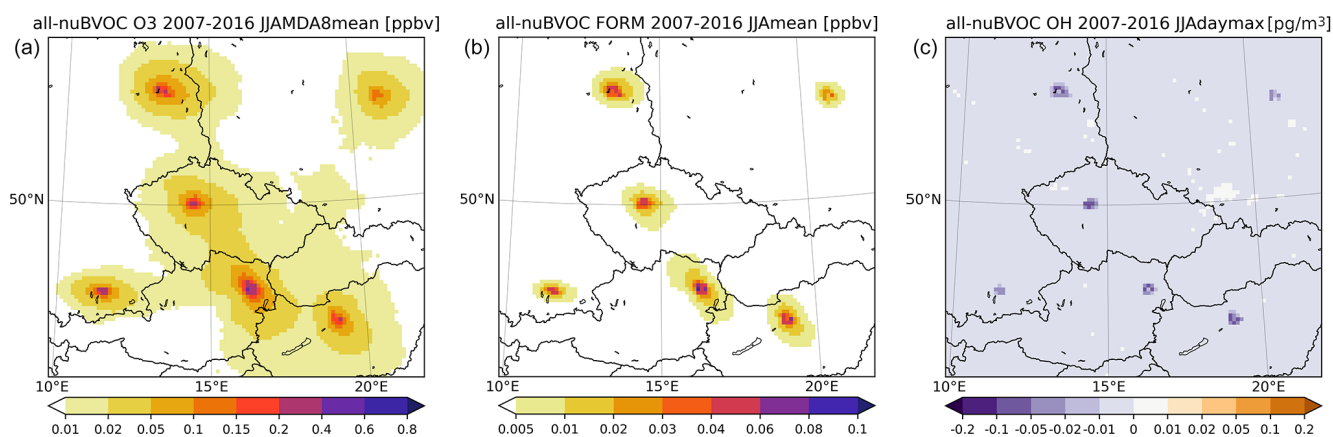


Figure 12. Same as Fig. 10 but for OH (in  $\text{pg}/\text{m}^3$ ) ( $10^{-6} \mu\text{g}/\text{m}^3$ ).

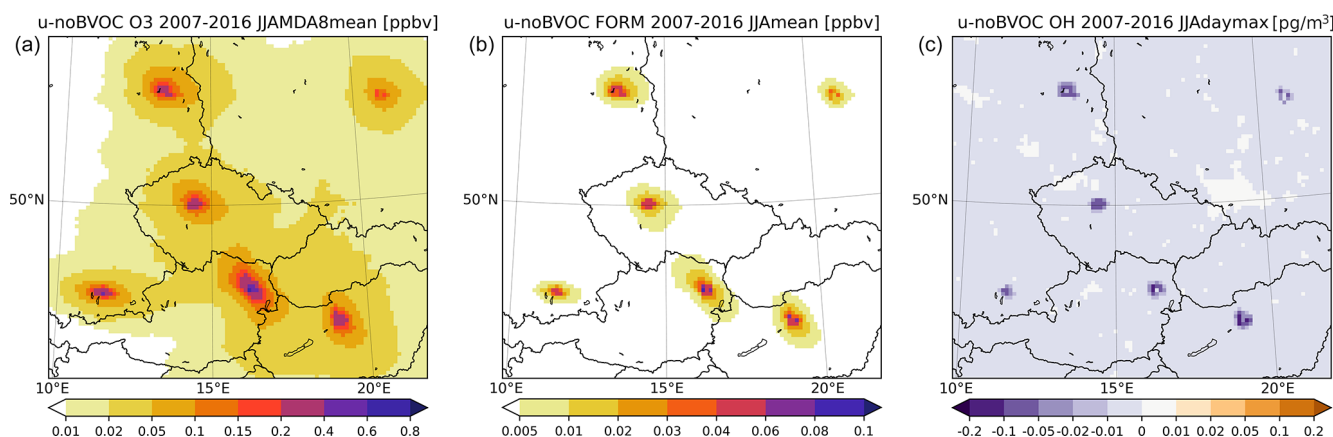
The impact of urban BVOCs on ozone over city centers has a distinct diurnal cycle with minimum values overnight up to 0.02 ppbv, while the maxima occur around noon and reach 0.1 to 0.4 ppbv, depending on the city (maximum for Vienna). Unlike the impact of all BVOCs, this impact has only one peak, which is much narrower than in the former case. The impact over the vicinities is (as expected) much

smaller, reaching around 0.05 ppbv, with the peak occurring a few hours later than the peak over centers.

For formaldehyde, the urban BVOC impact has a very similar shape to ozone, with the maximum impact in city centers occurring at around noon and reaching 0.08 to 0.13 ppbv (highest for Prague), with the nighttime impact often below



**Figure 13.** The impact of urban BVOC emissions (calculated as allBVOC–nuBVOC) on the MDA8 ozone (a), daily mean HCHO (b), and maximum daily OH (c) averaged over 2007–2016 JJA. The plot is enlarged to show the cities analyzed (units are ppbv for ozone and FORM and  $\text{pg m}^{-3}$  ( $10^{-6} \mu\text{g m}^{-3}$ ) for OH).



**Figure 14.** The impact of urban BVOC emissions (calculated alternatively as uBVOC–noBVOC) on the MDA8 ozone (a), daily mean FORM (b), and maximum daily OH (c) averaged over 2007–2016 JJA. The plot is enlarged to show the cities analyzed (units are ppbv for ozone and FORM and  $\text{pg m}^{-3}$  ( $10^{-6} \mu\text{g m}^{-3}$ ) for OH).

0.01 ppbv. Over the city vicinities, the impact remains very small, peaking at around 0.01–0.02 ppbv during noon.

Finally, the impact of urban BVOCs on OH over urban centers has a distinct negative peak occurring during noon. It usually reaches  $-0.01$  to  $-0.02 \text{ pg m}^{-3}$ , with a maximum decreases over Munich and Prague reaching  $-0.04 \text{ pg m}^{-3}$ . The impact over the vicinities is almost negligible, with a small peak around noon too.

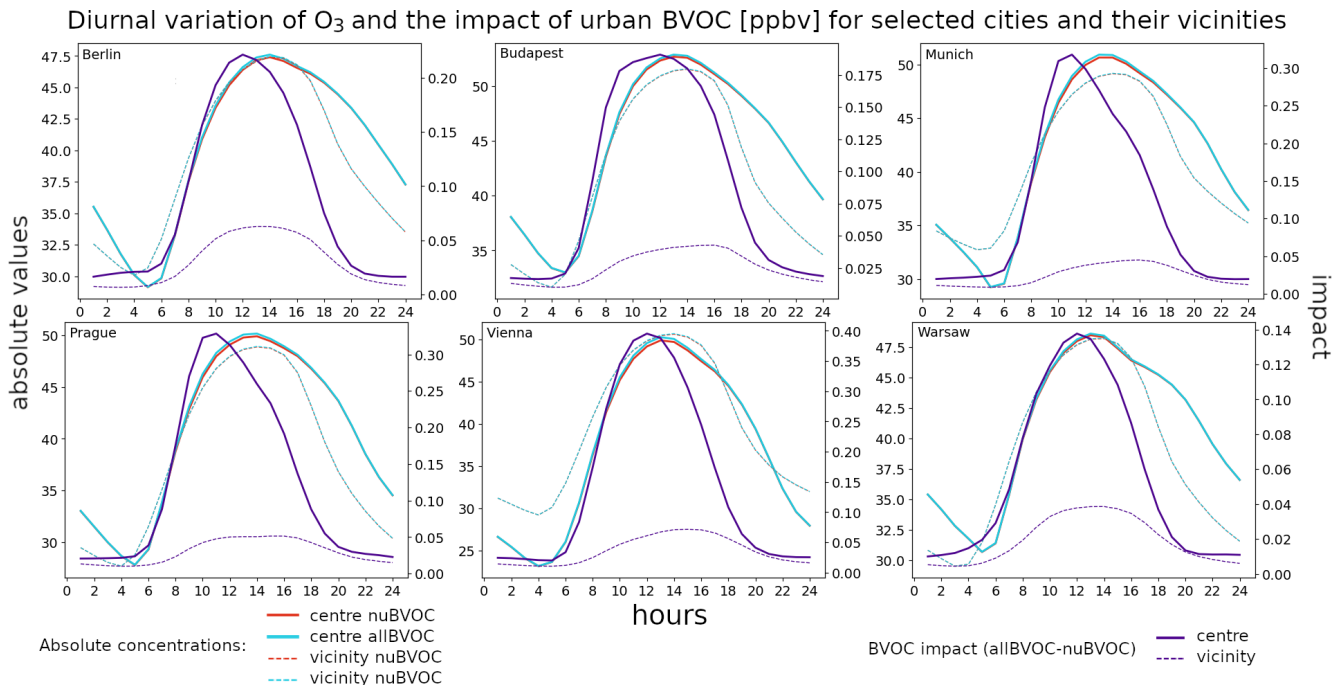
The quantification of the magnitude of the partial impact of urban BVOCs allows us to calculate their relative contribution to the impact of all BVOCs. This was calculated for ozone and formaldehyde and plotted in Fig. 18. OH was omitted from this figure, as the impact of all BVOCs is positive, while the impact of the urban vegetation is negative.

For ozone, urban BVOCs have a contribution to the total impact over city centers up to 8%–10% (highest share over Vienna and Berlin). In the case of HCHO, the contribution has a similar magnitude peaking at 8%–10%. For

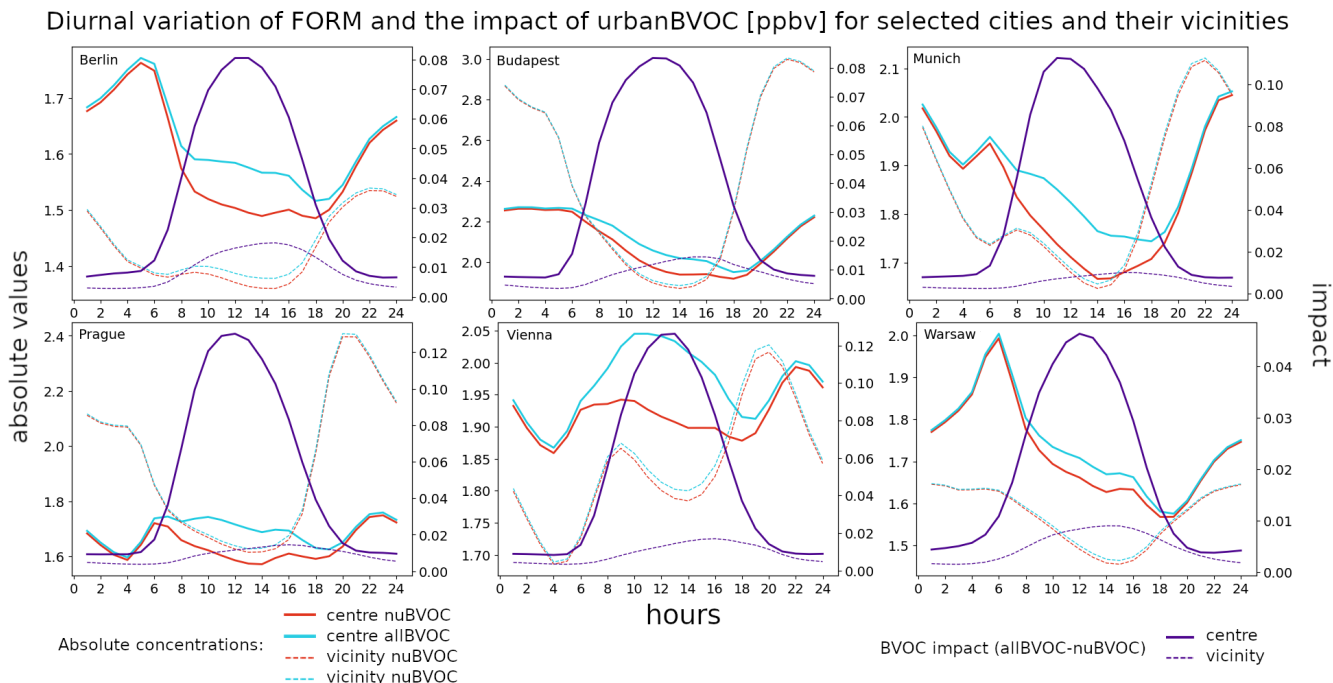
OH, we cannot clearly define its “contribution” to the total OH changes; however, comparing the positive impact of all BVOCs to the negative impact of urban BVOCs, these are very similar in absolute numbers. This indicates that if one considers only the urban vegetation, the impact can be qualitatively totally different from the impact of considering all vegetation (i.e., also from those above rural areas).

### 3.4 Impact on hydroxyl and peroxide radicals (OH, HO<sub>2</sub>, and RO<sub>2</sub>)

Given their importance in urban (but also rural) tropospheric chemistry and the atmospheric oxidation of VOCs including ozone formation, as well as facilitating the interpretation of the modeled impacts on ozone and formaldehyde, we further present the impact of BVOC emissions on peroxide radicals (HO<sub>2</sub> and higher RO<sub>2</sub>). For completeness, we also included the impact on average OH (besides the impact on daily max-

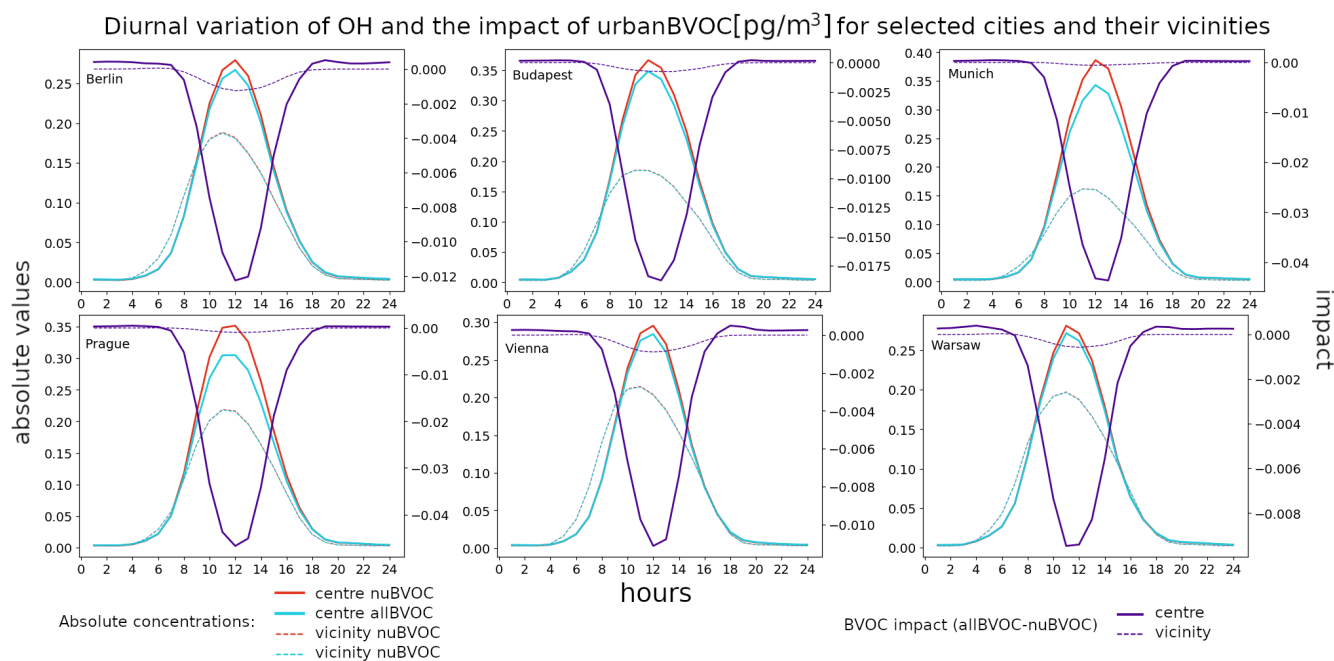


**Figure 15.** The average 2007–2016 JJA diurnal cycle of near-surface O<sub>3</sub> for six city centers (bold) and their vicinities (dashed) for the nuBVOC (red) and allBVOC cases (cyan). The right y axis corresponds to the impact of urban BVOC emissions (allBVOC–nuBVOC; violet). Cities are Berlin, Budapest, Munich, Prague, Vienna, and Warsaw (with units in ppbv).

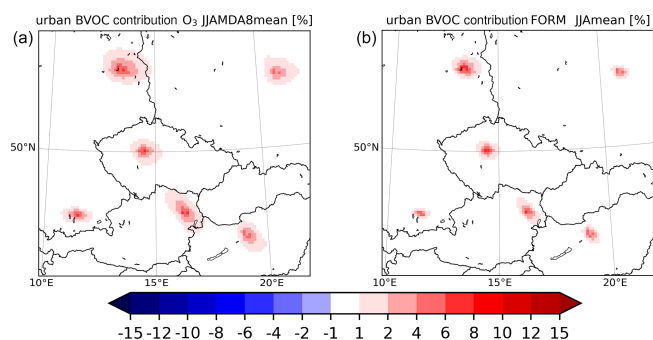


**Figure 16.** Same as Fig. 15 but for FORM.





**Figure 17.** Same as Fig. 15 but for OH (in  $\text{pg m}^{-3}$  ( $10^{-6} \mu\text{g m}^{-3}$ )).



**Figure 18.** The relative contribution of the impact of urban BVOC emissions to the total impact in percent for the MDA8 ozone (a) and daily mean HCHO (b) averaged over 2007–2016 JJA. The plot is enlarged to show the cities analyzed.

imum OH presented above) to account for the whole  $\text{HO}_x$  family.

Figure 19 shows that the impact on absolute OH is about  $-0.02$  to  $-0.08 \text{ pg m}^{-3}$  over large regions, with the largest decreases over the southern parts of the domain reaching  $-0.1 \text{ pg m}^{-3}$ . This means that the decrease in the average values is about one-third of the decrease in the daily maximum ones. Over urban areas (similar to daily maximum values), concentrations tend to increase due to BVOCs by up to  $0.02$ – $0.04 \text{ pg m}^{-3}$ . In relative numbers, OH decreases by about 20%–60%, reaching 80% over southern parts of the domain. Over cities, the increase is about 10%.

The hydroperoxyl radical shows a clear increase due to BVOC emissions above  $1 \text{ pg m}^{-3}$  over many areas, with val-

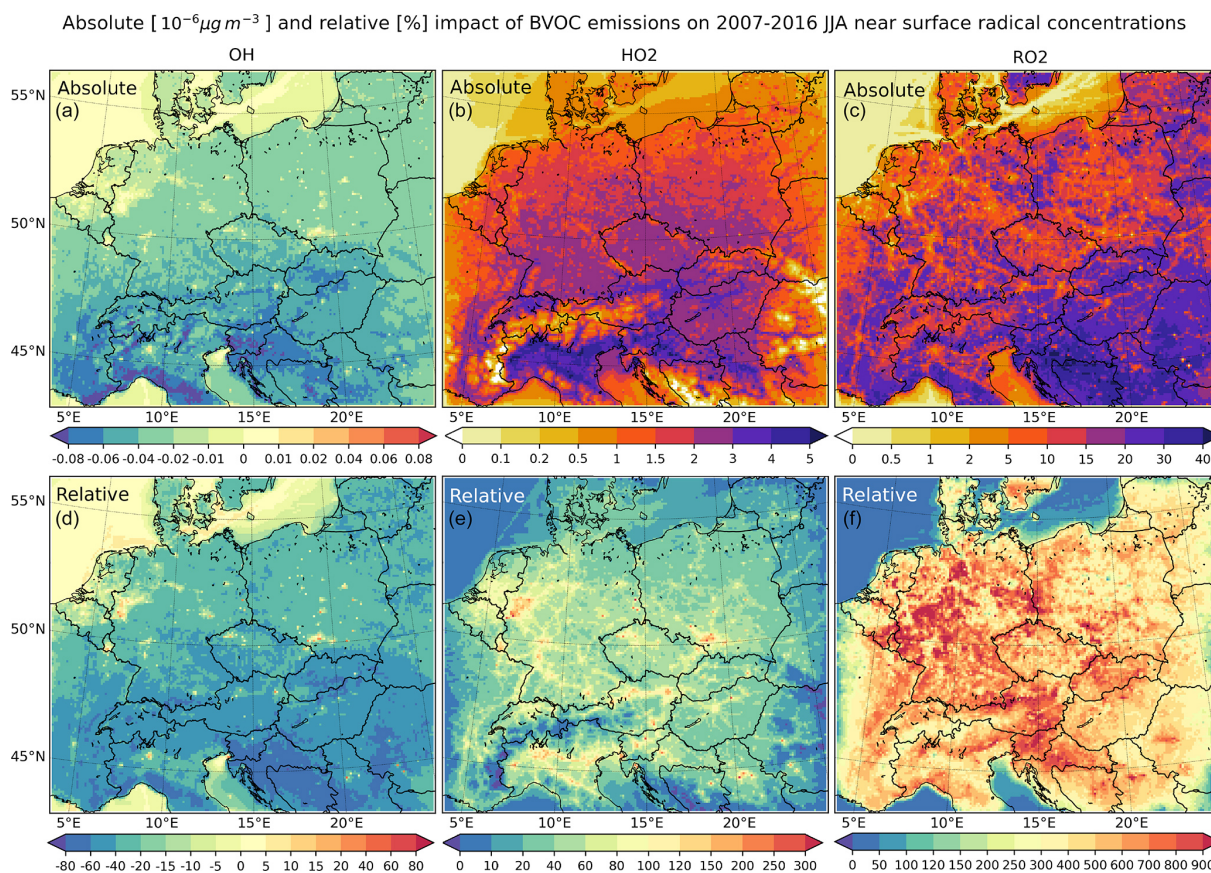
ues being the highest over the southern part of the domain, where it reaches  $4$ – $5 \text{ pg m}^{-3}$ . In relative numbers, this means a 40%–80% increase over rural areas; however, over highly polluted regions (mostly urban areas), the increase is over 100%, reaching as much as 300%.

Finally, for total peroxy radicals ( $\text{RO}_2$ ), we modeled a  $10$ – $40 \text{ pg m}^{-3}$  increase over rural areas (especially over the southern part of the domain), while the increase over urban areas is smaller, usually below  $10$ – $15 \text{ pg m}^{-3}$ . In relative numbers, the  $\text{RO}_2$  increase over rural areas due to BVOC emissions is remarkable, reaching 600%–900%, while over urban areas, this is about 200%–300%, confirming that BVOCs are a dominant source for  $\text{RO}_2$ .

Focusing on urban BVOC emissions only, in Fig. 20 we see that the average summer OH is reduced by up to  $0.02 \text{ pg m}^{-3}$ , representing a decrease of about  $-10\%$  to  $-20\%$ . In the case of  $\text{HO}_2$ , it increases due to urban BVOCs by up to about  $0.3$ – $0.6 \text{ pg m}^{-3}$ , with peaks up to  $1 \text{ pg m}^{-3}$ , making an increase of about 10%–20%. For the total peroxy radical concentrations, the increase is about  $0.5$ – $1 \text{ pg m}^{-3}$  (up to  $4 \text{ pg m}^{-3}$ ) over the selected cities, meaning an increase of about 10%–30% (up to 40%–50% for Berlin).

### 3.5 Sensitivity to urban fraction of BVOC emissions

As already mentioned, the partition between urban and rural BVOC emissions was based on calculating the fraction of the grid cell that lies within the given city boundaries. This, however, brings some degree of uncertainty to the results as the distribution of vegetation within the given grid cell is usually not uniform. Here we assess this uncertainty by conducting



**Figure 19.** The absolute (a–c) and relative (d–f) impact of all BVOC emissions on the near-surface concentrations of OH (a, d), HO<sub>2</sub> (b, e), and RO<sub>2</sub> (c, f) averaged over 2007–2016 JJA (units are  $\text{pg m}^{-3}$  ( $10^{-6}\mu\text{g m}^{-3}$ ) or % for the relative impact).

further experiments with reducing/increasing the fraction of BVOC emissions that lie within or outside of the urban area. As already mentioned in Sect. 2, we took (1) a case for which only half of the urban fraction of grid cell area is considered and (2) a case for which the urban fraction of grid cell area is  $2\times$  as large (upper-bounded by the grid cell total area itself). Of course, if a grid cell is entirely within the urban boundaries, 100 % of the BVOC emissions are considered urban. Figure 21 shows how the modified urban BVOC emissions differ from the default case in relative numbers. As expected, emissions are either reduced by around 50 %, with a smaller reduction near city edges and a larger one near centers, while in the second case, the emissions are almost twice as large as in the default case.

Figure 22 shows that, under the reduced urban fraction of BVOC emissions, the impact on MDA8 ozone over city centers reduces to around 0.1–0.2 ppbv, while if the opposite is considered, the impact reaches 0.8 ppbv. In other words, it is roughly half or twice as large than in the default case, showing the strong sensitivity of ozone production to the amount of urban BVOCs. For HCHO (Fig. 23), the situation is similar. While at reduced urban BVOCs the impact is at around 0.02–0.04 ppbv over city centers, in the dou-

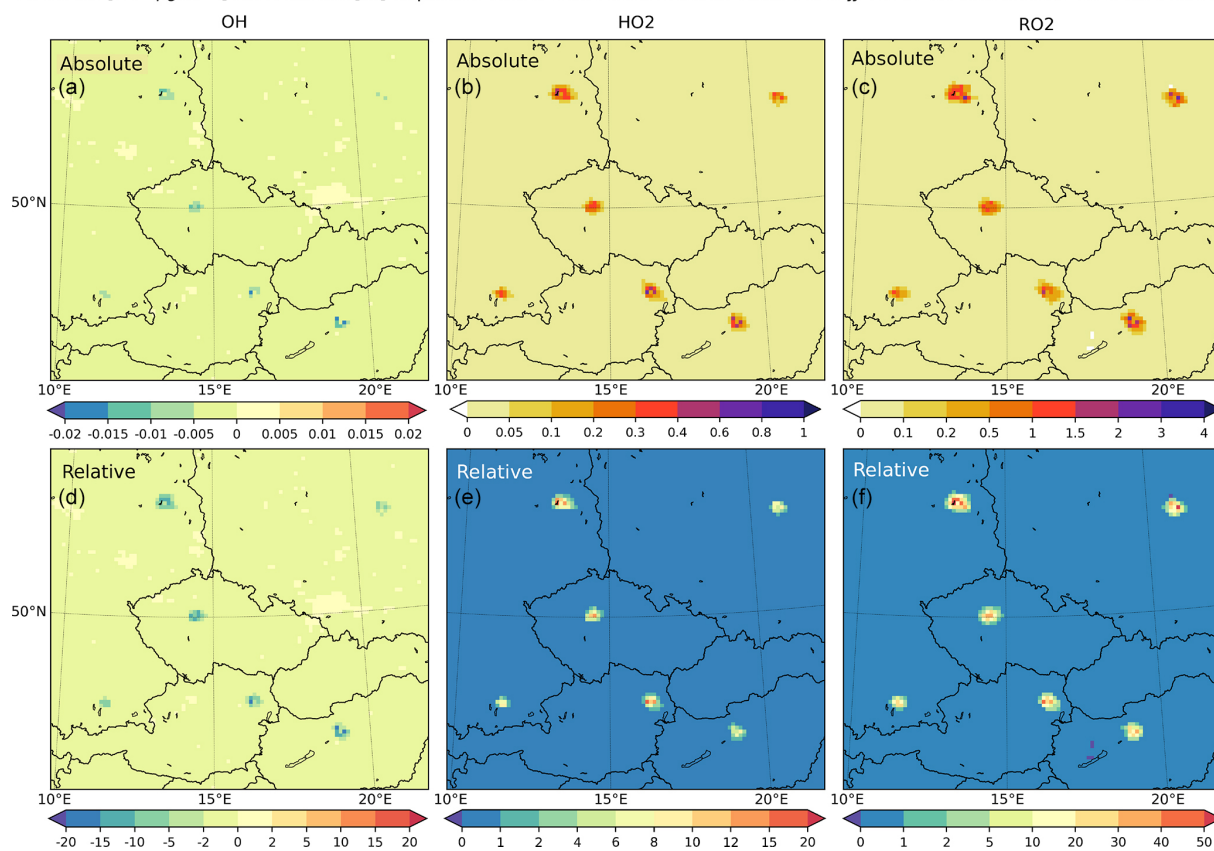
bled urban BVOC case, the impact reaches 0.08–0.1 ppbv. These numbers represent, again, half and twice those in the default case, respectively. For the impact on the OH radical (Fig. 24), reduced urban BVOC emissions result in a negative impact smaller than  $0.02\text{ pg m}^{-3}$  (usually even smaller than  $0.01\text{ pg m}^{-3}$ ) in absolute numbers, while for the increased urban fraction of these emissions, the impact is much higher, reaching  $-0.2\text{ pg m}^{-3}$ , which is more than double the default impact of urban BVOCs.

#### 4 Discussion and conclusions

The study evaluated the present-day impact of emissions of biogenic volatile organic compounds on near-surface concentrations of ozone and formaldehyde, as well as on the oxidative capacity of the atmosphere in terms of hydroxyl and peroxy radical concentrations.

The comparison with surface measurements performed for ozone showed some distinct patterns in model biases that include (i) the overestimation of spring-to-autumn average ozone values and (ii) a large overestimation of summer nighttime ozone concentrations and a smaller overestimation of summer daily ozone maxima, especially over cities. Regard-

Absolute [ $10^{-6}\mu\text{g m}^{-3}$ ] and relative [%] impact of urban BVOC emissions on 2007–2016 JJA near surface radical concentrations

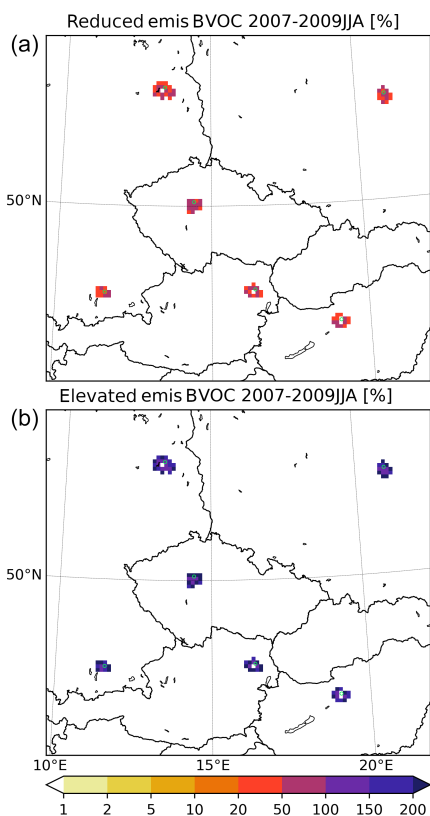


**Figure 20.** The absolute (a–c) and relative (d–f) impact of urban BVOC emissions on the near-surface concentrations of OH (a, d), HO<sub>2</sub> (b, e), and RO<sub>2</sub> (c, f) averaged over 2007–2016 JJA (units are in  $\text{pg m}^{-3}$  ( $10^{-6}\mu\text{g m}^{-3}$ ) or % for the relative impact). The plot is enlarged to show the cities analyzed.

ing the first bias pattern (an overestimation over rural areas up to  $20\mu\text{g m}^{-3}$ , while it is up to  $30\mu\text{g m}^{-3}$  over cities), similar positive model bias was encountered earlier by Huszar et al. (2020a) for the same region for urban and rural stations, and they found that it occurs at all used horizontal resolutions (3, 9, or 27 km). Later, Huszar et al. (2020b) confirmed this bias too. It is probably caused mainly by the large nighttime overestimation of ozone, while the daytime values are captured more accurately. This behavior was seen in many previous and similarly oriented studies (e.g., Karlicky et al., 2017; Huszar et al., 2018; Otero et al., 2018) or recently in de la Paz et al. (2024) and is caused probably by inaccurate vertical mixing in the nocturnal boundary layer, as pointed out by Zanis et al. (2011), although the nocturnal ozone chemistry (CB6 in our case) is marked with deficiencies too (Im et al., 2015). It is thus clear that more emphasis should be made on improving the modeling of nighttime ozone to get a more reasonable starting point for the daytime ozone formation (Wong and Stutz, 2010). Another feature seen is the higher daily ozone maxima during summer in model compared to observations, especially over cities. Urban centers are affected by a high rate of titration due to concentrated

NO<sub>x</sub> emissions. When the coarse resolution is used as in this study, then these concentrated city center emissions are not resolved, and they are instead diluted to the model grid, so the increase in the NO<sub>x</sub> concentration is not high enough for the first-order ozone titration; instead, it efficiently causes ozone production (Markakis et al., 2015). This behavior was recently seen in Zhu et al. (2024), where the daily urban ozone maxima were often overestimated for the mentioned reason. The conclusions above are also well supported by the NO<sub>2</sub> model biases encountered. In our simulations, and especially over cities, nitrogen dioxide is strongly underestimated, which is probably connected to the instant dilution of emissions into the model grid box (of  $9\text{ km} \times 9\text{ km}$  size), as well as the overestimated vertical eddy diffusion which removes too much NO<sub>x</sub> from the lowermost model layer (Huszar et al., 2020a). However, this means ozone removal by titration (as stated above).

We modeled on average an increase of about 6–8 ppbv (up to 12 ppbv over southern Europe) in the near-surface ozone due to all BVOC emissions. This is in line with previous chemistry transport model studies applied over Europe (Thunis and Cuvelier, 2000; Curci et al., 2009; Richards et al.,



**Figure 21.** The urban BVOC emissions used in the 0.5nuBVOC (a) and 2nuBVOC (b) experiments relative to the default urban emission fluxes seen in Fig. 1 (units in %).

2013). For example, Hodnebrog et al. (2012) found a peak impact of BVOC on ozone up to 10 ppbv over the Mediterranean, which corresponds well to our results. Moreover, we found that the highest impacts are often over regions with high- $\text{NO}_x$  pollution (Po Valley, western Germany, southern Poland, etc.), which is also reasonable, as these areas are VOC-limited; i.e., any addition of VOCs (of any origin, namely natural or anthropogenic) results in efficient ozone formation (Li et al., 2018; Gao et al., 2022a).

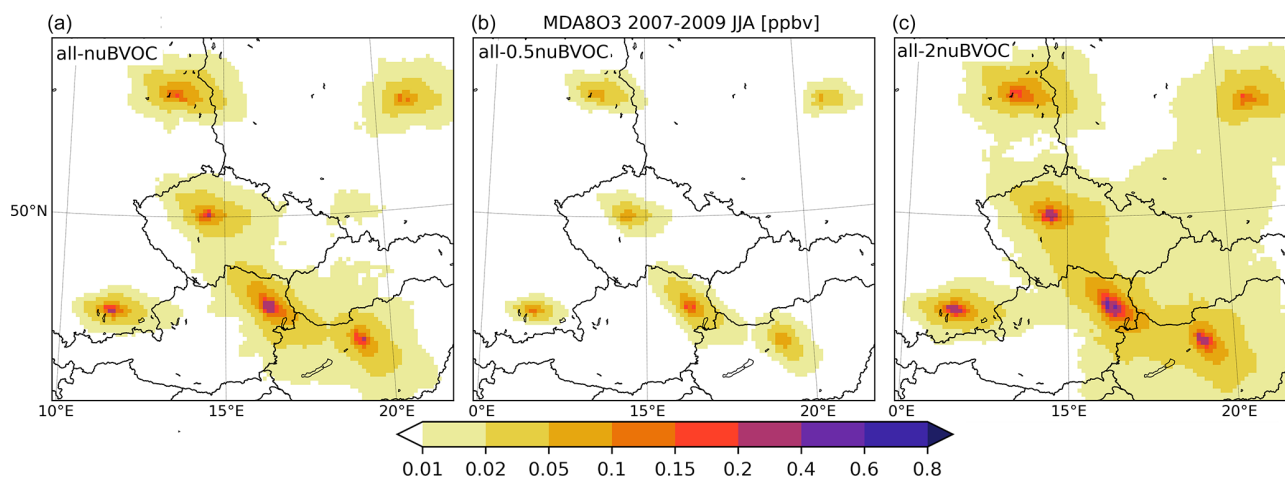
We have also seen that due to BVOC emissions, formaldehyde concentrations significantly increased (contributing by up to 40%–60%) with smaller increases in cities. This is in line with the fact that HCHO is the main product of the oxidation of most of the hydrocarbons, including those of biogenic origin (Luecken et al., 2012; Kaiser et al., 2015; Chen et al., 2023). The strong ties between BVOC emissions and HCHO burdens were studied earlier by many, often to infer biogenic emissions from HCHO columns (Dufour et al., 2009; Curci et al., 2010), and our results confirm the expectation. Indeed, the highest increases in formaldehyde are modeled for the southern part of the domain that exhibits the largest emissions. On the other hand, over urban areas with limited biogenic emission sources, the contribution is much smaller. Previously, Bastien et al. (2019) modeled the HCHO

contributors and found a relative contribution from biogenic sources of the order of 20%–40%, which is a bit smaller than our number of 40%–60%. This latter number also corresponds to the fact that (as domain average) BVOC emissions are about 3 times higher during summer compared to anthropogenic ones, while it has to be kept in mind that not all VOCs are oxidized to formaldehyde with the same efficiency. Therefore, we cannot assume that the relative contribution to HCHO of a particular VOC source category (biogenic in this case) will equal to the relative contribution of the source to the total VOC emissions.

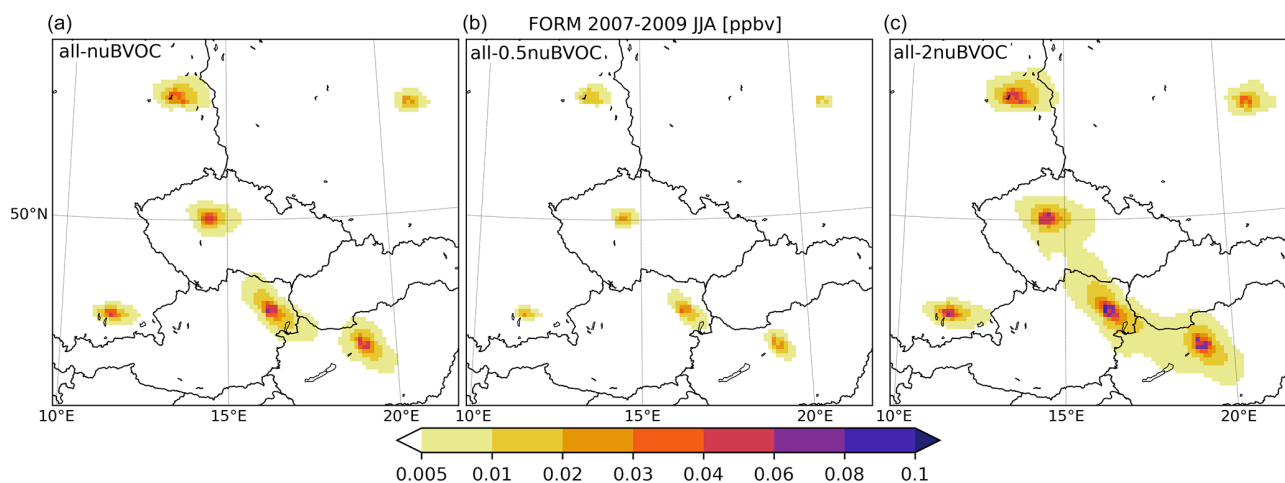
For the hydroxyl radical, large areas exhibited a decrease in the daily maxima, while over cities and oceans, increases were modeled due to BVOC emissions. As OH is one of the main oxidants of BVOCs (Kelly et al., 2018) (besides the nitrate radical and ozone), it is clear that introducing BVOCs adds a new sink to OH, making OH daytime concentrations lower, while not all OH is recycled. This apparently outweighs the additional OH production from ozone (via the atomic oxygen  $\text{O}^1\text{D}$  and water vapor) or from the ozonolysis of BVOCs via Criegee intermediate decay (Seinfeld and Pandis, 2016). On the other hand, this later process is probably the reason for some increases in OH over urban areas. Over them, the BVOC emissions are very small, while the ozone increases were large, causing OH increases due to the direct production from atomic oxygen. Moreover, as already mentioned in Sect. 1, the ozonolysis of BVOCs (as well as of alkenes in general) leads to Criegee intermediate production which further decomposes, thus yielding additional OH. Averaged over day and night, this may exceed the OH yields from ozone photolysis (Johnson and Marston, 2008).

As for the diurnal variation in the above-presented impact in and around cities, it has a very distinct pattern for each of the three chemicals. For ozone, the impact follows more or less the absolute values as a result of the photochemical activity being the strongest during noon. However, the maximum impact occurs sooner than noon, indicating that maybe the maximum of the  $\text{NO}_2$  production from reaction of NO and peroxy radicals is playing a role here. This, besides  $\text{RO}_2$ , is influenced by the available NO, which gets lower towards noon due to decrease in emissions after the morning peak. There is also an indication of an early evening peak for ozone formation due to BVOCs, which again might be connected to increased  $\text{NO}_x$  emissions during evening rush hours. Over urban vicinities, the peak impact is smaller, which is a natural result of lower  $\text{NO}_x$  emissions limiting the  $\text{NO}_2$  formation due to a reaction with peroxy radicals (Seinfeld and Pandis, 2016).

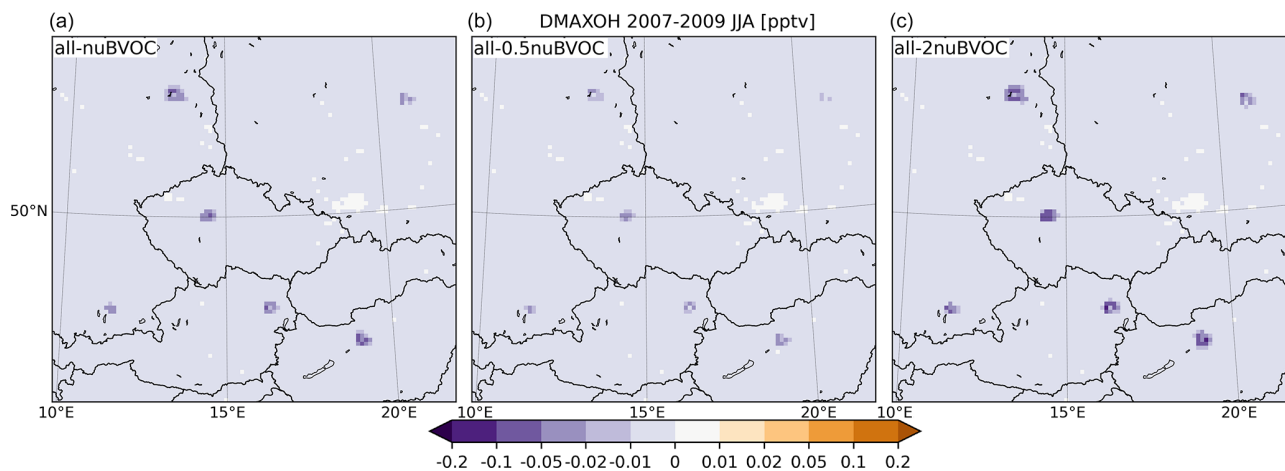
The impact on formaldehyde over urban centers has a more complicated diurnal cycle, often with two minima occurring during morning and late-afternoon hours and maximum values during evening. To explain this behavior, we have to understand the sinks and the sources of this chemical. The production of HCHO during daytime is mainly by the oxidation of VOCs due to OH, which is largest when



**Figure 22.** The sensitivity of MDA8 ozone on the number of urban BVOC emissions (in ppbv) for the default situation (allBVOC–nuBVOC; (a)) and the modified urban fraction of the BVOC emissions (allBVOC–0.5nuBVOC, (b); allBVOC–2nuBVOC, (c)) averaged over 2007–2009 JJA. The plot is enlarged to show the cities analyzed.



**Figure 23.** Same as Fig. 22 but for formaldehyde.



**Figure 24.** Same as Fig. 22 but for OH (in  $\text{pg m}^{-3}$  ( $10^{-6} \mu\text{g m}^{-3}$ )).

both OH and VOC peak (e.g., Wu et al., 2023; Geo et al., 2023). This would imply a maximum impact of BVOCs during daytime. However, BVOCs can also be oxidized by ozone and nitrate radicals, which form the main mechanism during nighttime and low solar insolation (and also low OH), so HCHO is produced during nighttime too. There is, however, a strong sink for HCHO during the daytime in both the reaction with OH and photolysis, which is even more important than the reaction with OH during the day (Possanzini et al., 2002; Seinfeld and Pandis, 2016). During nighttime, the additional HCHO produced from BVOCs has thus a suppressed sink, leading to higher impact over the night than during the day. The impact over vicinities is even higher, which is a clear consequence of higher BVOC emissions, but the suppressed reactions forming peroxyacetyl nitrates (PANs) due to smaller  $\text{NO}_x$  concentrations can play a role too.

In the case of OH, the diurnal pattern of the BVOC impact over city vicinities shows a clear decrease during noon, which is in line with the expectation that OH is consumed by the oxidation of BVOCs. However, over city centers, the pattern indicates that two competing processes take place; the first is the already mentioned OH decrease due to the oxidation of BVOCs. However, the impact on OH first shows some increase before this decrease occurs. Here the fact that extra OH is produced from the BVOC-induced ozone via atomic oxygen ( $\text{O}^1\text{D}$ ), as well as from the ozonolysis of BVOCs and depending on the counteractions between this production and the loss due to BVOC oxidation, probably determines whether the average impact on OH will be negative or positive.

We showed that the hydroperoxide radical is increased due to BVOCs by more than 200 %, and this increase is larger over cities. This is due to the fact that absolute  $\text{HO}_2$  concentrations are much smaller over cities or over areas with a high- $\text{NO}_x$  source due to the reaction with NO. This in turn caused a large relative importance of BVOC emissions over such areas in terms of  $\text{HO}_2$  production. On the other hand, the total  $\text{RO}_2$  produced is highest in relative numbers (but also absolute numbers) over rural areas, which is probably connected to the simple fact that  $\text{RO}_2$  is largely composed of peroxides originating from BVOC oxidation yielding a high relative impact over areas with high-BVOC emissions. Or, in other words, most of the  $\text{RO}_2$  mass comes from BVOC oxidation. In both cases ( $\text{HO}_2$  or the total peroxides), however, the increases clearly explain the impact on ozone, as more NO can be oxidized to  $\text{NO}_2$  by a reaction with peroxy radicals.

Our analysis showed that the urban BVOC emissions alone act rather locally and cause an increase in urban ozone by less than 1 ppbv (usually a few 0.1 ppbv). One of the very important results of this study is that the urban fraction of BVOC emissions contributed to the total impact of all BVOCs by around 10 %. In the case of HCHO, the urban BVOC-induced changes are of the order of less than 0.1 ppbv, making this

again a contribution of about 10 % to the total HCHO increases due to all BVOC emissions.

For OH, urban BVOCs caused a clear decrease, which is a crucial difference compared to the impact of all BVOCs. As already detailed above within the diurnal variation in the impacts, multiple competitive processes act to modulate OH modifications due to BVOC emissions. Evidently, if the isolated effect of urban BVOCs on OH is analyzed, the  $\text{VOC} + \text{OH}$  oxidation dominates over the extra OH produced due to photolysis of increased  $\text{O}_3$  or from BVOC ozonolysis (via the decay of Criegee intermediates). Also, the diurnal cycle of the impact of urban BVOCs on OH only shows a clear decrease during the day. The impact of urban BVOCs on OH is also very limited to the city outskirts, which means that the local BVOC emissions are important mainly for short-term chemical effects and radicals with a short lifetime (Seinfeld and Pandis, 2016); regarding the effect on chemicals with a longer lifetime, like ozone and formaldehyde, the impact propagates over a larger area (a few tens of kilometers from the city center), as seen in Fig. 13.

We also showed that if the impact of urban BVOCs is calculated from a “clean” reference with no BVOC emissions at all, then the impact is larger. This can be attributed to the fact that the OH radical competes for fewer BVOC molecules when urban BVOCs are emitted into a “BVOC-free” air, making their oxidation more efficient. This consequently leads to more  $\text{RO}_2$  formed and hence more NO oxidized into  $\text{NO}_2$ , leading to enhanced ozone formation. With more BVOCs oxidized, more OH is removed, leading to larger decreases in OH.

A shortcoming of the study is the way the urban fraction of BVOCs is calculated, i.e., based on the fraction of emitting grid boxes that lie within the urban boundaries. To address the uncertainty arising from this approach, we calculated the impact of urban BVOCs under a decreased and increased urban fraction corresponding to about 50 % and 200 % of the original BVOC emissions. The uncertainty analysis showed that the impact on ozone ranges between about 0.2 to 0.8 ppbv, giving an almost 4-fold difference which corresponds well to the 4 times larger BVOC emissions in the former case. The situation was similar in the case of HCHO and OH too. This means that the impact of the urban fraction of BVOC emissions responds to their magnitude nearly linearly. The accurate quantification of the urban BVOC fluxes is therefore crucial and requires a precise description of the vegetation within the urban built-up environment (Calfapietra et al., 2013).

In summary, our study showed that an ineligible portion of the overall impact of BVOC emissions over central Europe’s urban areas is attributable to local BVOC emissions. This is especially true for influencing the oxidative capacity of urban air via OH radicals. However, it also stressed a relatively high uncertainty regarding the quantification of this fraction. Future research should focus on high-resolution model assessments of the impact of local BVOC emissions to reflect

the large spatial diversity of the vegetation within the urban areas. We also have to add that overall the BVOC emission fluxes are marked with uncertainty too (not only their “urban” fraction) as was seen from the comparison with available global biogenic emission data. This uncertainty has to be assessed in future research too.

**Code and data availability.** CAMx version 7.20 is available at <https://www.camx.com/download/source/> (CAMx, 2022; Ramboll, 2022). WRF version 4.0 can be downloaded from <https://www2.mmm.ucar.edu/wrf/src/WRFV4.0.TAR.gz> (WRF, 2018). The MEGAN v2.10 code can be obtained from <https://bai.ess.uci.edu/megan/data-and-code/megan21> (Guenther et al., 2014), while the FUME emission model used is found at <https://doi.org/10.5281/zenodo.10142912> (Belda et al., 2023). The raw CAMx model outputs from all simulations comprise about 20TB of the 3-dimensional data of the concentrations of the main pollutants and are stored on the authors’ storage facilities. These can be obtained upon request to the corresponding author. The extracted hourly near-surface concentrations (which are the basis of the presented analysis) are available from the Czech National Repository at <https://doi.org/10.48700/datst.b6as3-v2y27> (Huszár, 2024). The observational data from the air base database can be obtained from <https://discomap.eea.europa.eu/map/fme/AirQualityExport.htm> (EEA, 2023).

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**Author contributions.** ML and PH conceptualized and designed the experiments and wrote the majority of the text. PH conducted the CAMx simulations. JK performed the WRF experiments. ML, LB, and APPP contributed to the analysis of the results. KS helped with processing the biogenic emissions and writing the text.

**Competing interests.** The contact author has declared that none of the authors has any competing interests.

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