Tropospheric ozone changes and ozone sensitivity from present-day to future under shared socio-economic pathways

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Abstract. Tropospheric ozone is important to future air quality and climate. We investigate ozone changes and ozone sensitivity to changing emissions in the context of climate change from the present day (2004–2014) to the future (2045–2055) under a range of shared socio-economic pathways (SSPs). We apply the United Kingdom Earth System Model, UKESM1, with an extended chemistry scheme including more reactive volatile organic compounds (VOCs) to quantify ozone burdens as well as ozone sensitivities globally and regionally based on nitrogen oxide (NO_x) and VOC mixing ratios~~concentrations~~. We show that the tropospheric ozone burden increases by 4 % under a development pathway with higher NO_x and VOC emissions (SSP3-7.0), but decreases by 7 % under the same pathway if NO_x and VOC emissions are reduced (SSP3-7.0-lowNTCF) and by 5 % if atmospheric methane (CH_4) mixing ratios~~concentrations~~ are reduced (SSP3-7.0-lowCH4). Global mean surface ozone mixing ratios~~concentrations~~ are reduced by 3–5 ppb under SSP3-7.0-lowNTCF and by 2–3 ppb under SSP3-7.0-lowCH4. However, surface ozone changes vary substantially by season in high-emission regions under future pathways, with decreased ozone mixing ratios~~concentrations~~ in summer and increased ozone mixing ratios~~concentrations~~ in winter when NO_x emissions are reduced. VOC-limited areas are more extensive in winter (7 %) than in summer (3 %) across the globe. North America, Europe and East Asia are the dominant VOC-limited regions in the present day but North America and Europe become more NO_x-limited in the future mainly due to reductions in NO_x emissions. The impacts of VOC emissions on ozone sensitivity are limited in North America and Europe because reduced anthropogenic VOC emissions are partly offset by higher biogenic VOC emissions. Ozone sensitivity is not greatly influenced by changing CH_4 mixing ratios~~concentrations~~. South Asia becomes the dominant VOC-limited region under future pathways. We highlight that reductions in NO_x emissions are required to transform ozone production from VOC- to NO_x-limitation, but that these lead to increased ozone mixing ratios~~concentrations~~ in high-emission regions, and hence emission controls on VOC and CH_4 are also necessary.

1 Introduction

Ozone (O_3) is a chemically reactive component in the atmosphere that is produced from natural and anthropogenic sources. Emissions of O_3 precursors including nitrogen oxides (NO_x), volatile organic compounds (VOCs), methane (CH_4) and carbon monoxide (CO) lead to the formation of O_3 by a series of photochemical reactions in the presence of sunlight. O_3 has important

impacts on human health, ecosystems and climate change (Lefohn et al., 2018; Zhang et al., 2019; Agathokleous et al., 2020).

25 O_3 ~~mixing ratios~~ concentrations are largely governed by the magnitudes of O_3 precursor emissions, transport, deposition and transport from the stratosphere. O_3 exerts a positive radiative forcing ~~on climate forcing~~ (Stevenson et al., 2013; O'Connor et al., 2021; Thornhill et al., 2021a), and changes in climate in turn influence ozone (Fiore et al., 2012; Doherty et al., 2013). Climate change can alter natural emissions of biogenic VOCs (BVOC), lightning NO_x and CH_4, along with temperature, humidity, convection and clouds, which further influence O_3 ~~mixing ratios~~ concentrations (Thornhill et al., 2021b). The interactions

30 between air quality and climate play an important role in the coupled Earth system, and we focus on the impacts of future emissions in the context of climate change on tropospheric O_3 in this study.

The tropospheric O_3 burden is controlled by the amount of O_3 production, O_3 destruction, O_3 deposition and the O_3 transport from the stratosphere (Lelieveld and Dentener, 2000; Wild, 2007). From pre-industrial times to the present day, the tropospheric O_3 burden has increased from approximately 240 Tg to 350 Tg mainly due to substantial increases in anthro-

35 pogenic O_3 precursor emissions (Lamarque et al., 2010; Young et al., 2013; Griffiths et al., 2021). However, regional surface O_3 changes between the pre-industrial and present day vary substantially due to different regional emission changes (Turnock et al., 2020) and to differences in O_3 sensitivity to NO_x and VOC emissions. In recent decades, there has been a decrease in surface O_3 ~~mixing ratios~~ concentrations in North America and Europe due to emission controls (Simon et al., 2015; Colette et al., 2016; Tarasick et al., 2019). In contrast, increases in surface O_3 levels are observed in South Asia and East Asia due

40 to industrialization, urbanization and social development (Hakim et al., 2019; Lu et al., 2020). Furthermore, while emission controls have been implemented across industrial regions of China in recent years, these have focused on emissions of NO_x and particulate matter, and have led to increased O_3 pollution in some places (Wang et al., 2017; Silver et al., 2018).

It is important to investigate O_3 sensitivity to understand how O_3 chemical regimes might change in different parts of the world, and to guide suitable emission control strategies. ~~However, few studies have focused on O_3 sensitivity from a global~~

45 ~~perspective, or on how this might change in the future.~~ O_3 sensitivity~~,~~ is typically characterised by NO_x- or VOC-limited ~~O_3~~ ~~production regime~~ regimes for O_3 production, and this determines the effectiveness of different emission control strategies. It is dependent on the relative abundances of NO_x and VOC ~~concentrations~~ (Sillman, 1999), ~~and determines the extent and~~ ~~effectiveness of different emission control strategies.~~ or of their oxidation products, nitric acid (HNO_3) and hydrogen peroxide (H_2O_2) (Kleinman, 1994; Sillman, 1995). VOC-limited regimes typically occur in highly urbanised regions with high NO_x

50 ~~mixing ratios~~ concentrations in which decreases in NO_x emissions increase O_3 ~~mixing ratios~~ concentrations, and O_3 production increases with higher VOC emissions. In contrast, changes in NO_x ~~mixing ratios~~ concentrations dominate O_3 changes in NO_x-limited regimes such that decreases in NO_x emissions decrease O_3 ~~mixing ratios~~ concentrations, and O_3 ~~mixing ratios~~ concentrations are less sensitive to VOC emissions. ~~O_3 sensitivity can be assessed by quantifying the ratio between NO_x and~~ ~~VOC concentrations and we apply this approach in this study to present-day and future conditions.~~ O_3 sensitivity indicators

55 such as the ratios of NO_x/VOCs and HNO_3/H_2O_2 allow us to identify O_3 sensitivity regimes relatively easily. However, most studies focus on O_3 sensitivity in specific regions and for short time periods (Dunker et al., 2002; Sillman and West, 2009; Ye et al., 2016), leading to inconsistency in the critical indicator values that distinguish O_3 sensitivity regimes. To address this, we generalise the approach by quantifying O_3 sensitivity using a consistent indicator across the globe. This is the first time that the

full range of surface chemical environments across the globe has been explored with a global chemistry-climate model, as far as we are aware. We quantify O_3 sensitivity based on the ratio of NO_x and VOC mixing ratios, and investigate how regional O_3 sensitivity might change in the future.

The shared socio-economic pathways (SSPs) are future emission and climate scenarios accounting for future social, economic and environmental developments (O'Neill et al., 2014; van Vuuren et al., 2014). The SSPs represent a range of levels of policy strength (weak, medium and strong) to control emissions of near-term climate forcers (NTCFs) that include tropospheric O_3, O_3 precursors and aerosols (Rao et al., 2017). Our study is based on simulations using historical and future SSPs emissions and climate undertaken as part of the Aerosol Chemistry Model Intercomparison Project (AerChemMIP; Collins et al., 2017) and the wider Coupled-Model Intercomparison Project Phase 6 (CMIP6; Eyring et al., 2016). The aim of AerChemMIP is to quantify the effects of chemistry and aerosols on air quality and climate in CMIP6 by conducting historical and future experiments using chemistry-climate models with specified climate and emission trajectories.

We examine tropospheric O_3 and surface O_3 sensitivity under present-day (2004–2014) and future conditions (2045–2055). Model development and application are described in Sect. 2 along with descriptions of the emission and climate scenarios used. We compare and evaluate the present-day tropospheric O_3 burden and surface O_3 mixing ratios~~concentrations~~ with two different chemistry schemes in Sect. 3. We then investigate the seasonal, daytime and nighttime differences in O_3 changes in the future compared to present-day for different regions in Sect. 4. Analysis of O_3 mixing ratios~~concentrations~~ and production is used to quantify O_3 sensitivity and to explain contrasting regional O_3 changes in Sect. 5. We then show the changes in O_3 sensitivity between different seasons and scenarios in Sect. 6 and present our conclusions in Sect. 7.

2   Materials and methods

2.1   Model description, development and application

We use version 1 of the United Kingdom Earth System Model, UKESM1 (Sellar et al., 2019), to reproduce present-day (2004–2014) O_3 mixing ratios~~concentrations~~ and to predict O_3 responses to emissions and climate in the future (2045–2055). UKESM1 consists of a physical climate model, the Hadley Centre Global Environment Model version 3 (HadGEM-GC3.1), configured with the Global Atmosphere 7.1 and Global Land 7.0 (GA7.1/GL7.0) components (Walters et al., 2019) to which Earth System (ES) processes have been coupled (Sellar et al., 2019). Atmospheric composition is modelled using a state-of-the-art chemistry and aerosol module, the United Kingdom Chemistry and Aerosol model (UKCA; Morgenstern et al., 2009; O'Connor et al., 2014). UKCA includes a stratosphere-troposphere gas-phase chemistry scheme (StratTrop; Archibald et al., 2020a) coupled to the aerosol scheme GLOMAP-mode (Mann et al., 2010; Mulcahy et al., 2020). The model resolution is N96L85 in the atmosphere, with 1.875° in longitude by 1.25° in latitude, 85 terrain-following hybrid height layers and a model top at 85 km.

While the UKESM1 configuration for CMIP6 used the UKCA StratTrop mechanism, this study also uses an extended gas-phase chemistry scheme that incorporates more reactive VOC species to permit a more realistic representation of O_3 production in polluted environments. The extended chemistry scheme (denoted as Ext_StratTrop hereafter) is based on the StratTrop

scheme and includes oxidation of the additional chemical components propene (C_3H_6), butane (C_4H_{10}) and toluene (C_7H_8) to represent alkenes, alkanes and aromatic VOC classes, as described in Liu et al. (2021). The extended chemistry scheme includes 101 species, 244 bimolecular reactions, 26 uni- and termolecular reactions, 70 photolytic reactions, 5 heterogeneous reactions and 3 aqueous phase reactions for the sulphur cycle.

The atmosphere-only configuration of UKESM1 is used with prescribed sea surface temperatures and sea ice to show the transient impacts of emissions under present-day and future climates. These are prescribed using monthly-mean time-evolving fields from the fully coupled UKESM1. Greenhouse gas mixing ratios~~concentrations~~ are prescribed as in historical and future simulations conducted by UKESM1 as part of CMIP6 (Meinshausen et al., 2017, 2020).

2.2 Emissions and experiments

Present-day CMIP6 anthropogenic and biomass burning emissions are taken from Hoesly et al. (2018) and van Marle et al. (2017), respectively. Biogenic VOC emissions are calculated interactively within the iBVOC emissions scheme (Pacifico et al., 2011) in the Joint UK Land Environmental Simulator (JULES) land-surface scheme which is coupled to UKCA. Other aspects of the emissions used here are the same as described in Turnock et al. (2020). Anthropogenic emissions are categorised into five sectors (industry, power plants, transport, residences and agriculture) as inputs to the model, with independent diurnal and vertical emission profiles applied for each sector (Bieser et al., 2011; Mailler et al., 2013; Liu et al., 2021).

Three CMIP6 SSP scenarios are used for future simulations: SSP3-7.0, SSP3-7.0-lowNTCF and SSP3-7.0-lowCH4. SSP3-7.0 pathway has~~is a 'regional rivalry' policy scenario with~~ a large anthropogenic climate forcing signal (a radiative forcing of 7.0 W m-2 at 2100) , and~~. It has~~ weak emission controls on O_3 precursors and aerosols, and rapidly increasing CH_4 mixing ratios~~concentrations~~ (Fujimori et al., 2017; Rao et al., 2017). SSP3-7.0-lowNTCF and SSP3-7.0-lowCH4 are additional pathways which use the same underlying climate policies as SSP3-7.0. SSP3-7.0-lowNTCF has strong controls on all NTCF emissions. SSP3-7.0-lowCH4 follows SSP3-7.0 but assumes strong mitigation of CH_4 emissions in the future, with 24 % decreases in surface CH_4 mixing ratios from 1802 ppb to 1364 ppb. The last time that historical surface CH_4 mixing ratios were this low was more than 50 years ago, in the late 1960s (Prather et al., 2014). BVOC emissions increase under all these pathways due to a warmer climate. We perform four model experiments in this study to investigate tropospheric O_3 for the present-day (2004–2014) and three future pathways (SSP3-7.0, SSP3-7.0-lowNTCF and SSP3-7.0-lowCH4; 2045–2055). Table 1 shows the model configuration for the four simulations. Table 2 lists the CMIP6 global mean NTCF total surface emissions and surface CH_4 mixing ratios~~concentrations~~ for the four scenarios.

2.3 O_3 sensitivity indicators

A number of different indicators have been used to distinguish O_3 sensitivity regimes, and typical indicators are the ratios of NO_x/VOC mixing ratios or emissions and the ratio of HNO_3/H_2O_2 mixing ratios (Kleinman, 1994; Sillman, 1999). For the NO_x/VOC ratio, it is often more appropriate to use mixing ratios than emissions because this accounts for emissions, transport, chemical reactions and deposition. Indicators based on HNO_3/H_2O_2 ratios also account for differences in photochemical conditions and VOC reactivity. In a previous study we found that O_3 sensitivity regimes diagnosed with HNO_3/H_2O_2 and

Table 1. Model configurations for present-day and future simulations. "Emissions" refers to emissions of O_3 precursors and aerosols. "CH_4 ~~conc.~~" refers to prescribed surface CH_4 mixing ratios~~concentrations~~. "SST/SI" refers to prescribed sea surface temperature and sea ice concentrations. "Historical" means that the emissions, CH_4 mixing ratios~~concentrations~~ or SST/SI evolve as for the CMIP6 historical simulations, and "Reference" means that they evolve as for SSP3-7.0. "Low" emissions or CH_4 mixing ratios~~concentrations~~ evolve following SSP3-7.0 but with lower emissions or CH_4 mixing ratios~~concentrations~~.

Experiment name	Time period	Emissions	CH_4 ~~conc.~~	SST/SI
Present day	2004–2014	Historical	Historical	Historical
SSP370	2045–2055	Reference	Reference	Reference
SSP370_lowNTCF	2045–2055	Low	Reference	Reference
SSP370_lowCH4	2045–2055	Reference	Low	Reference

125 NO_x/VOC ratios were similar (Liu et al., 2021). However, the HNO_3/H_2O_2 indicator is more sensitive to uncertainties in chemical mechanism, and studies have shown that there are errors in the simulation of short-lived radicals in polluted areas (Whalley et al., 2021). The HNO_3/H_2O_2 ratio also does not account for gas-aerosol conversion as a termination route for NO_x, a mechanism that is included in many chemistry-climate models. We hence choose the ratio between NO_x and VOC mixing ratios as a simple indicator of O_3 sensitivity indicator in this study.

130 We quantify the sensitivity of O_3 to NO_x and VOC mixing ratios by examining monthly mean O_3 mixing ratios and O_3 net production in each UKESM1 surface grid cell in each of the scenarios in turn. This provides a global overview of the dependence of O_3 and its production on NO_x and VOC across different environments. It also allows us to determine a globally-averaged critical threshold value distinguishing NO_x-limited and VOC-limited regimes.

We note that dilution of short-lived NO_x over coarse resolution model grid cells may lead to the underestimation of local 135 NO_x mixing ratios in high-emission regions. This results in underestimation of NO_x/VOC ratios in these conditions and the regimes may thus be more VOC-limited in reality than are able to simulate in a global model.

3 Model evaluation of tropospheric and surface O_3

3.1 Comparison of StratTrop and extended chemistry schemes

We first compare averaged tropospheric O_3 burdens, chemical lifetime, chemical production, chemical loss and deposition 140 during 2004–2014 from the extended chemistry scheme (Ext_StratTrop) with those from the StratTrop chemistry scheme used in AerChemMIP simulations (Table 3). We define the O_3 production rate as the sum of reactions fluxes through HO_2/RO_2 + NO, and the O_3 loss rate as the sum of $O(^1D) + H_2O$, $O_3 + HO_2/OH/alkenes$. The O_3 burden with the extended chemistry scheme (376 Tg) lies at the upper end of the uncertainty range for the observed burden, 340 ± 34 Tg for 2000 (Archibald et al., 2020b). The magnitude of the O_3 burden is also consistent with the CMIP6 multi-model mean burden of 356 ± 31 Tg 145 for 2005–2014 (Griffiths et al., 2021). The extended chemistry scheme produces a 5 % higher tropospheric O_3 burden than

Table 2. Overview of global annual mean time-varying surface emissions of NO_x, VOCs, CO, sulfur dioxide (SO_2), black carbon (BC) and organic carbon (OC) from anthropogenic (ANT), biomass burning (BB), biogenic (BIO) sources for the present day (2004–2014) and future (2045–2055) SSP3-7.0, SSP3-7.0-lowNTCF and SSP3-7.0-lowCH4. Annual mean surface CH_4 mixing ratios~~concentrations (ppb)~~ are also shown.

Emission (Tg yr^{-1})		Present day	SSP3-7.0	SSP3-7.0-lowNTCF	SSP3-7.0-lowCH4
NO_x	ANT	136.0	149.6	68.8	149.6
	BB	13.6	12.1	10.2	12.1
	Total	149.6	161.7	79.0	161.7
VOCs	ANT	156.3	195.3	117.6	195.3
	BB	62.7	57.1	47.5	57.1
	BIO	727.9	786.1	795.2	785.7
	Total	946.9	1038.5	960.3	1038.1
CO	ANT	600.8	662.7	328.4	662.7
	BB	324.6	318.5	264.5	318.5
	Total	925.4	981.2	592.9	981.2
SO_2	ANT	115.4	95.7	43.0	95.7
	BB	2.1	2.2	1.8	2.2
	Total	117.5	97.9	44.8	97.9
BC	ANT	7.4	9.1	4.4	9.1
	BB	1.7	1.7	1.4	1.7
	Total	9.1	10.8	5.8	10.8
OC	ANT	18.0	23.3	10.1	23.3
	BB	15.0	14.5	11.9	14.5
	Total	33.0	37.8	22.0	37.8
CH_4 (ppb)		1802.8	2471.9	2471.9	1363.7

that of StratTrop (358 Tg), demonstrating a more reactive environment for net O_3 formation throughout the troposphere due to reactive VOCs. This is also reflected in the higher rates of chemical O_3 production (11 %), loss (6 %) and deposition (6 %) with the extended chemistry scheme. However, the higher O_3 production is offset by greater O_3 destruction and by faster O_3 deposition, and hence the mean O_3 chemical lifetime remains very similar at about 22 days, which is consistent with previous multi-model estimates of the mean lifetime of 22.2 ± 2.2 days (Stevenson et al., 2006).

Simulated surface O_3 mixing ratios~~concentrations~~ during 2004–2014 with the two chemistry schemes are compared in Fig. 1. Using the extended chemistry scheme, the spatial distribution of surface O_3 is similar to that using StratTrop in both winter

Table 3. Comparison of tropospheric O_3 burden and budget terms during 2004–2014 simulated with StratTrop and Ext_StratTrop chemistry schemes in UKCA. One standard deviation in the annual terms over the 2004–2014 period is shown. We define the tropopause based on the highest layer with an O_3 mixing ratio~~concentration~~ less than 150 ppb.

	StratTrop	Ext_StratTrop
O_3 burden (Tg)	358±3	376±3
O_3 lifetime (days)	22.6±0.2	22.5±0.2
O_3 net production (Tg year^{-1})	895±45	996±40
O_3 production (Tg year^{-1})	5698±40	6080±66
O_3 loss (Tg year^{-1})	4803±45	5084±59
O_3 deposition (Tg year^{-1})	883±9	936±9

and summer, but shows a general increase in global O_3 levels of about 2 ppb (Fig. 1a–d) due to inclusion of the additional reactive VOCs. The O_3 increases (Fig. 1e–f) are most notable for South Asia and East Asia due to the relatively high VOC emissions in these regions (Janssens-Maenhout et al., 2015; Huang et al., 2017; Feng et al., 2020). There is a much larger O_3 increase in South Asia in winter than in summer (Fig. 1e), mainly due to greater transport of O_3 precursors during the summer monsoon in South Asia (Lu et al., 2018). This leads to higher O_3 mixing ratios~~concentrations~~ in winter than that in summer, consistent with Gao et al. (2020), and demonstrates a larger seasonal variation in O_3 mixing ratios~~concentrations~~ with the Ext_StratTrop chemistry scheme than with the StratTrop chemistry scheme. In addition, there are substantial O_3 increases in East Asia and in other polluted continents in summer (Fig. 1f) when using the extended chemistry scheme. This is not seen in winter (Fig. 1e) because titration of O_3 by nitric oxide (NO) remains strong, despite high VOC emissions. The relatively small influence of the additional VOCs on O_3 in winter is also seen in other heavily populated regions that have high NO_x emissions such as North America and Europe.
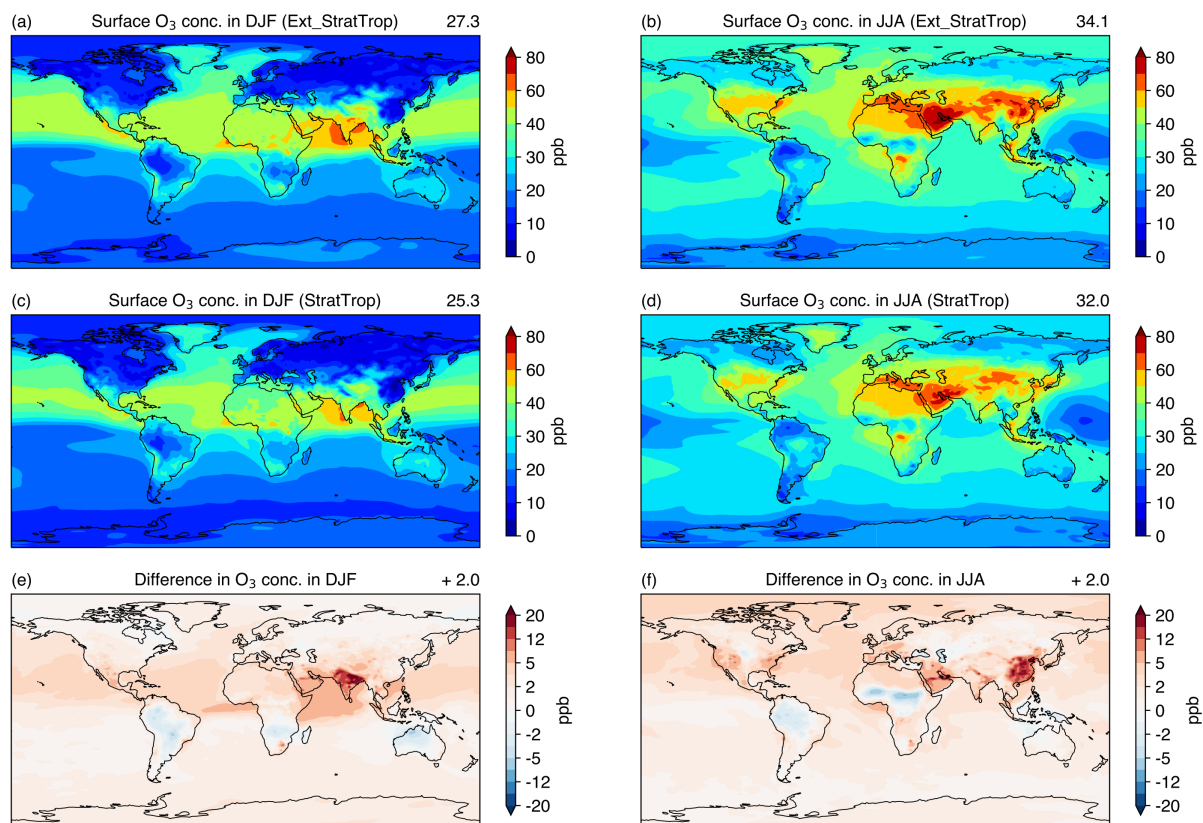
Figure 1. Comparison of present-day seasonal mean surface O_3 ~~mixing ratios~~concentrations (2004–2014) between the Ext_StratTrop chemistry scheme **(a, b)** and the StratTrop chemistry scheme **(c, d)**. Winter time (December–January–February, DJF) and summer time (June–July–August, JJA) global mean O_3 ~~mixing ratios~~concentrations are shown. Seasonal differences in surface O_3 ~~mixing ratios~~concentrations between the two chemistry schemes are shown in the bottom panels **(e, f)**.

3.2 Evaluation of surface O_3 ~~mixing ratios~~concentrations

165   We now evaluate surface O_3 ~~mixing ratios~~concentrations simulated with the Ext_StratTrop chemistry scheme against gridded monthly mean rural observations from the TOAR dataset over the 2004–2014 period (Schultz et al., 2017a, b). Surface O_3 ~~mixing ratios~~concentrations for winter (DJF) and summer (JJA) during 2004–2014 are shown in Fig. 2. We find that global mean surface O_3 ~~mixing ratios~~concentrations are underestimated in winter (-7.3 ppb) and overestimated in summer (+13.5 ppb), with relatively small biases in spring and autumn. The positive biases in summer and negative biases in winter for O_3

170   ~~mixing ratios~~concentrations are also seen in results using the StratTrop chemistry scheme (Archibald et al., 2020a; Turnock et al., 2020). The model seasonality with both schemes (19.4–45.5 ppb; DJF-JJA) is rather stronger than that observed (26.7–32 ppb; DJF-JJA), but the Ext_StratTrop chemistry scheme improves the model performance slightly in DJF for surface O_3 (Fig. 2b) despite larger biases in summer (Fig. 2d). Numerical diffusion of O_3 precursor emissions due to coarse model horizontal

resolution may explain the biases (Wild and Prather, 2006; Stock et al., 2014; Fenech et al., 2018), and we note that these
175 seasonal O_3 biases are also evident in other chemistry-climate models (Young et al., 2018; Turnock et al., 2020). Insufficient
turbulent mixing in the planetary boundary layer may also contribute to the bias (O'Connor et al., 2014), as accumulation of
NO_x at the surface leads to greater O_3 production in summer and greater titration by NO in winter. However, we note that a
much more comprehensive chemistry scheme applied in UKCA, the Common Representative Intermediates Mechanism (CRI-
Strat), shows similar systematic biases in surface O_3 mixing ratios~~concentrations~~, -4.6 ppb in DJF and +12.0 ppb in JJA for
180 the 2010–2018 period (Archer-Nicholls et al., 2020). This suggests that other biases in the model are primarily responsible for
the biases in surface O_3. We choose to apply the extended chemistry scheme as it permits representation of a more appropriate
chemical environment for O_3 production in high-emission areas and is thus more suitable to investigate O_3 sensitivity.
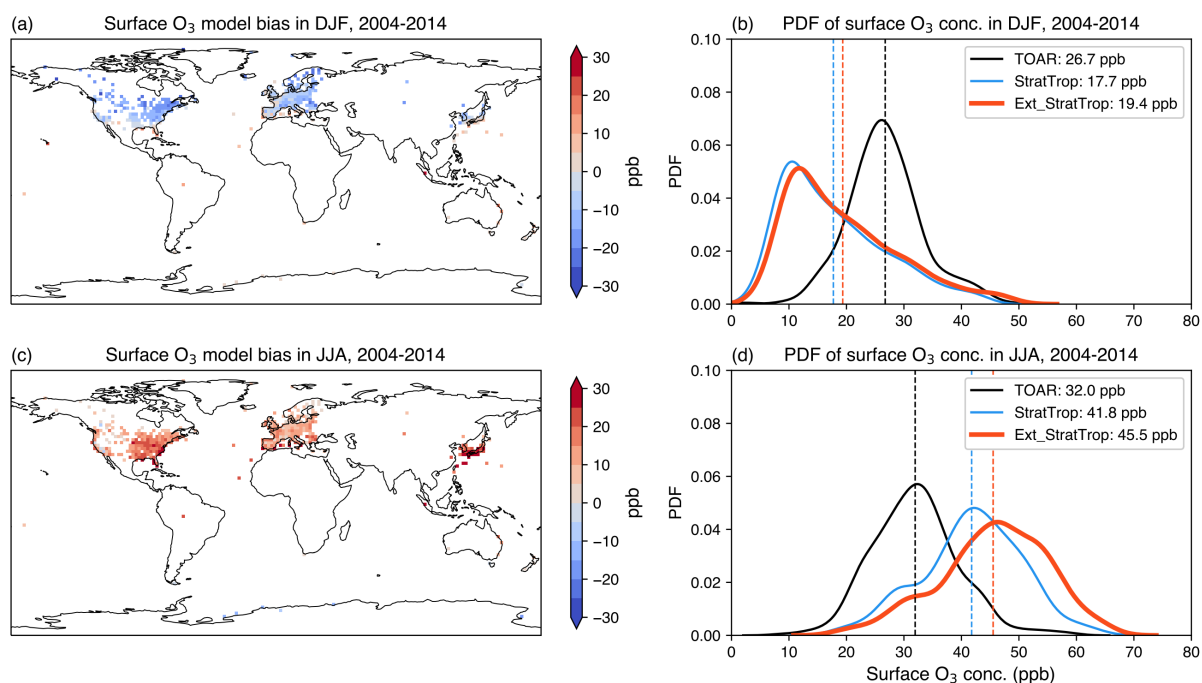
Figure 2. Modelled surface O_3 biases with the Ext_StratTrop chemistry scheme for winter (DJF) and summer (JJA) over 2004–2014 **(a, c)**.
Probability distribution function (PDF) of seasonal mean O_3 mixing ratios~~concentrations~~ between observations, StratTrop and Ext_StratTrop
chemistry schemes **(b, d)**. Vertical dashed lines indicate seasonal mean surface O_3 mixing ratios~~concentrations~~. Observations from the
Tropospheric Ozone Assessment Report (TOAR) dataset (Schultz et al., 2017a) are used for comparison.

4 O$_3$ changes under future scenarios

4.1 Emission changes

185   The SSP3-7.0 pathway is characterized by relatively strong emission controls in some parts of the world such as North America and Europe but weaker controls or emission increases elsewhere. Increases in NO$_x$ and VOC emissions from anthropogenic and biomass burning sources are seen in Central and South America, North Africa, the Middle East, and South and East Asia (Fig. 3a, c). SSP3-7.0-lowCH4 has the same NTCF emissions as SSP3-7.0 but lower CH$_4$ emissions that lead to lower CH$_4$ mixing ratios~~concentrations~~ (Table 2). SSP3-7.0-lowNTCF represents strong emission controls across the globe, with
190   reductions in emissions in most major high-emission regions except for South Asia (Fig. 3b, d). Total BVOC emission changes are driven by changes in land-use, vegetation and temperature. Fig. 3e, f shows general increases in total BVOC emissions in most parts of the Northern Hemisphere except for South Asia in the future, which partly offset the decreased anthropogenic and biomass burning VOC emissions in North America and Europe. Similar BVOC emission changes are found under SSP3-7.0 and SSP3-7.0-lowNTCF relative to the present day as the climate change signal and carbon dioxide concentrations under future
195   pathways are the same.

4.2 Tropospheric O$_3$ changes

Changes in tropospheric O$_3$ from the present day to the future are shown in Table 4. Changes in NTCF emissions control O$_3$ burden changes with a 4 % increase in the O$_3$ burden under SSP3-7.0 and a 7 % decrease under SSP3-7.0-lowNTCF relative to the present day. Changes in O$_3$ production rates are also controlled by changes in NTCF emissions, and there is higher
200   O$_3$ production under SSP3-7.0 and lower O$_3$ production under SSP3-7.0-lowNTCF. The decrease in the O$_3$ burden (5 %) under SSP3-7.0-lowCH4 is slightly less than that under SSP3-7.0-lowNTCF (7 %), and shows that reductions in CH$_4$ mixing ratios~~concentrations~~ effectively reduce the tropospheric O$_3$ burden despite high NTCF emissions under SSP3-7.0-lowCH4. O$_3$ production rates under SSP3-7.0-lowCH4 are slightly higher than in the present day partly due to higher hydroxyl radical (OH) concentrations that promote O$_3$ production. However, these higher O$_3$ production rates are offset by higher O$_3$ loss rates, and
205   result in lower O$_3$ net production under SSP3-7.0 and SSP3-7.0-lowCH4. We find that the O$_3$ chemical lifetime decreases slightly by 0.4–1.6 days under future pathways partly due to decreased O$_3$ net production, and partly due to increased O$_3$ loss associated with higher temperature and humidity in a warmer climate (Young et al., 2018). Changes in O$_3$ dry deposition rates principally reflect changes in surface O$_3$ mixing ratios~~concentrations~~, although high temperatures under a warmer climate may reduce O$_3$ deposition rates due to vegetation stress (Lin et al., 2020).
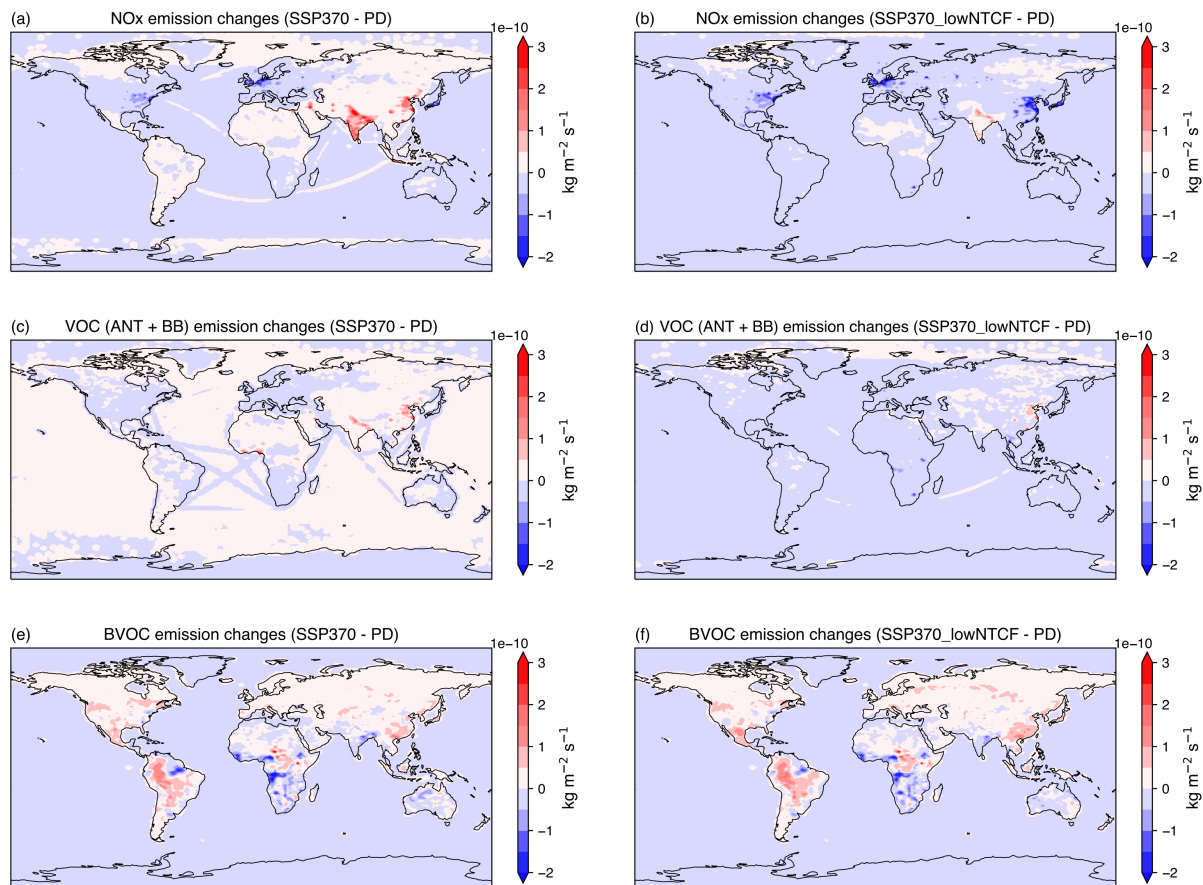
Figure 3. Differences in annual mean surface emissions of NO_x **(a, b)**, anthropogenic and biomass burning VOCs **(c, d)** and total biogenic VOCs **(e, f)** between the present day (PD; 2004–2014) and SSP3-7.0 and SSP3-7.0-lowNTCF (2045–2055).

Table 4. Comparison of the tropospheric O_3 budget under present-day (2004–2014) and future conditions (2045–2055).

	Present day	SSP3-7.0	SSP3-7.0-lowNTCF	SSP3-7.0-lowCH4
O_3 burden (Tg)	376±3	393±5	351±7	357±6
O_3 lifetime (days)	22.5±0.2	20.9±0.1	22.1±0.1	21.1±0.2
O_3 net production (Tg year^{-1})	996±40	934±38	638±60	869±32
O_3 production (Tg year^{-1})	6080±66	6728±43	5536±108	6108±65
O_3 loss (Tg year^{-1})	5084±59	5795±45	4898±78	5239±56
O_3 dry deposition (Tg year^{-1})	936±9	961±9	810±19	856±14

4.3 Surface seasonal O$_3$ changes

Seasonal differences in simulated surface O$_3$ mixing ratios~~concentrations~~ between the present day (2004–2014) and future pathways (2045–2055) are shown in Fig. 4a–f, along with a comparison between SSP3-7.0 and SSP3-7.0-lowCH4 (Fig. 4g, h). SSP3-7.0 represents less stringent emission control policies, and has slightly higher global mean O$_3$ mixing ratios ~~concentrations~~ (0.7–0.9 ppb; Fig. 4a, b) than the present day. In contrast, tightened emission controls under SSP3-7.0-lowNTCF reduce surface O$_3$ mixing ratios~~concentrations~~ substantially across many parts of the world (3.3–5.2 ppb; Fig. 4c, d). The reduction in CH$_4$ mixing ratios~~concentrations~~ from 1803 to 1364 ppb under SSP3-7.0-lowCH4 relative to the present day successfully reduces O$_3$ mixing ratios~~concentrations~~ (2.7–3.5 ppb; Fig. 4e, f) for regions that show O$_3$ increases under SSP3-7.0. SSP3-7.0-lowCH4 with reduced CH$_4$ mixing ratios~~concentrations~~ alone shows uniform O$_3$ decreases across the globe (3.4–4.4 ppb; Fig. 4g, h) compared with SSP3-7.0, where mean CH$_4$ mixing ratios~~concentrations~~ are 2472 ppb, and this offsets high O$_3$ levels in regions with high NTCF emissions. This demonstrates the importance of CH$_4$ in governing surface O$_3$ mixing ratios~~concentrations~~, and the need to account for CH$_4$ in mitigating O$_3$ pollution in future (Fiore et al., 2008; Allen et al., 2021). We highlight that O$_3$ changes vary by season. From Fig. 4a, c we can see that O$_3$ mixing ratios~~concentrations~~ generally increase in winter in continental areas such as North America and Europe under SSP3-7.0 and SSP3-7.0-lowNTCF. These regions have large reductions in NTCF emissions under future pathways, and thus there is less O$_3$ titration due to lower NO$_x$ emissions in these regions. Since NO$_x$ emissions decrease in East Asia under SSP3-7.0-lowNTCF, we also see O$_3$ increases in winter in this region. This highlights that NO$_x$ emission reductions are not beneficial for reducing surface O$_3$ mixing ratios ~~concentrations~~ in winter. Conversely, NO$_x$ emission increases under SSP3-7.0 lead to O$_3$ decreases in winter in South and East Asia for the same reason. The situation is different in summer, with O$_3$ decreases in North America and Europe, but O$_3$ increases in South and East Asia under SSP3-7.0 (Fig. 4b). This demonstrates a shift in O$_3$ sensitivity from VOC limitation in winter to NO$_x$ limitation in summer. O$_3$ changes in summer and winter are generally consistent in South America and Africa, and reflect NO$_x$ limitation in these regions throughout the year. For regions that are projected to have lower NO$_x$ emissions in SSP3-7.0-lowNTCF, such as eastern China, we note that O$_3$ mixing ratios~~concentrations~~ increase in both winter and summer. The industrial regions of China are in VOC limited regimes throughout the year, and thus decreased NO$_x$ emissions increase O$_3$ mixing ratios~~concentrations~~ (Jin and Holloway, 2015; Wang et al., 2021; Liu et al., 2021). This suggests that reductions in both NO$_x$ and VOC emissions may be needed to reduce O$_3$ in these regions.

Surface O$_3$ mixing ratios are also influenced by climate change, reflecting changing natural emissions, O$_3$ production and destruction rates and O$_3$ deposition rates (Doherty et al., 2013, 2017). Global annual mean surface O$_3$ mixing ratios decrease by 1 ppb with a 1.5 °C temperature rise, but show little change in continental areas (Naik et al., 2021). This is principally due to increased humidity and greater O$_3$ destruction in oceanic areas, but in continental areas these effects may be offset by O$_3$ increases due to higher soil NO$_x$ (Romer et al., 2018) and BVOC emissions, and by decreased O$_3$ deposition rates (Lin et al., 2020). O$_3$ mixing ratios can also be impacted by more frequent and intense heat waves under a warmer climate (Schnell and Prather, 2017; Ma et al., 2019). We find that the resulting changes in surface O$_3$ mixing ratios in continental regions due to
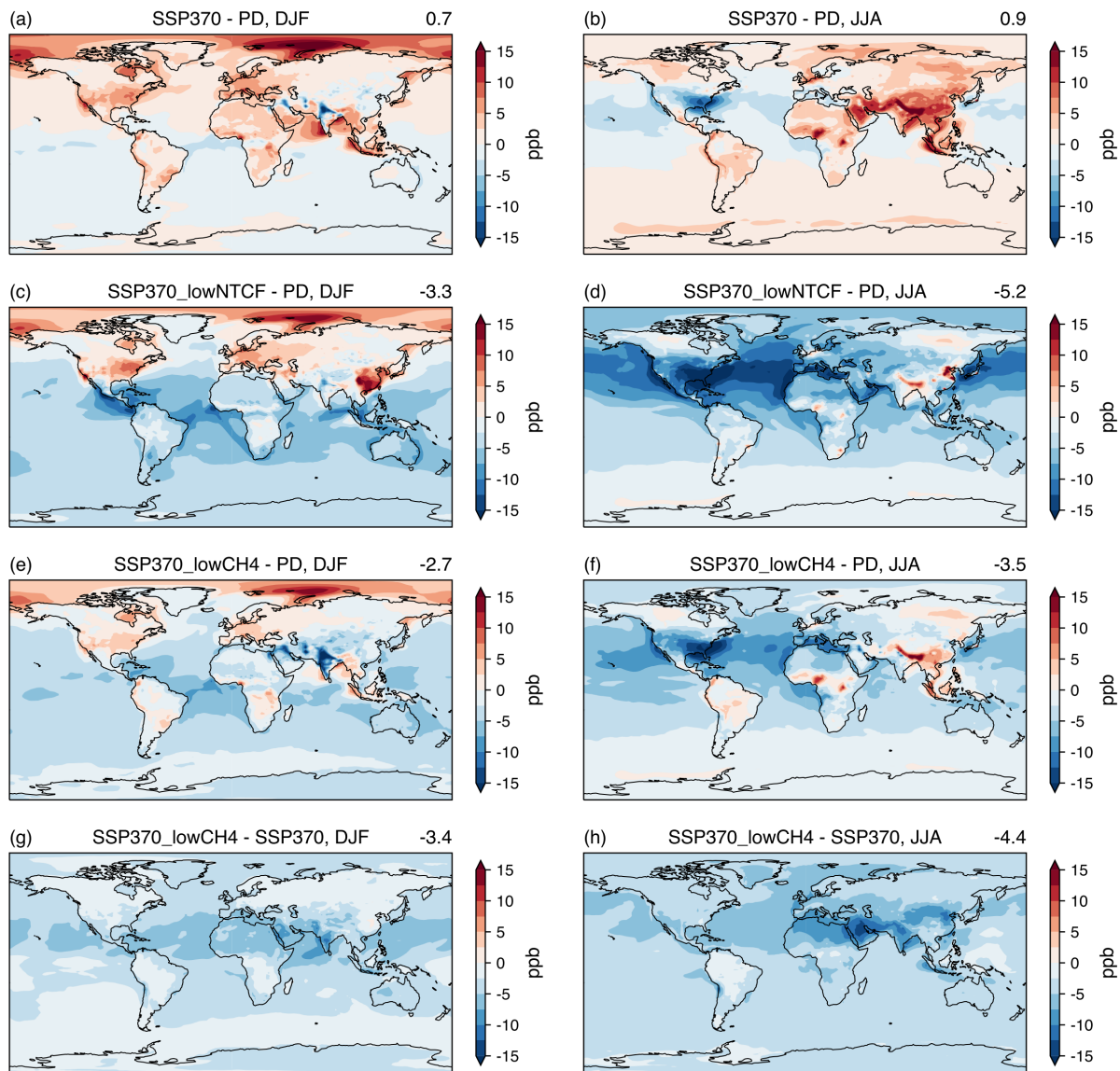
Figure 4. Differences in seasonal mean surface O_3 mixing ratios~~concentrations~~ between the present day (PD; 2004–2014) and the future SSP3-7.0 **(a, b)**, SSP3-7.0-lowNTCF **(c, d)** and SSP3-7.0-lowCH4 **(e, f)** (2045–2055) in winter (DJF) and summer (JJA). Differences between SSP3-7.0 and SSP3-7.0-lowCH4 are shown **(g, f)** to isolate the impacts of reduced CH_4 mixing ratios~~concentrations~~. Absolute global mean O_3 changes (ppb) are shown at the right top of each panel.

climate change are relatively small, and reduction in anthropogenic emissions is the dominant factor governing surface O_3 mixing ratios in the near future.

245   We also examine daytime and nighttime O_3 changes for different regions under future pathways because daytime O_3 mixing ratios~~concentrations~~ are typically more relevant for human health. For daytime O_3 ~~concentrations~~ we consider the maximum daily average 8 h O_3 mixing ratio~~concentration~~ (MDA8), an important metric used to evaluate O_3 impacts on human health. Nighttime O_3 mixing ratios~~concentrations~~ are correspondingly given by the minimum daily average 8 h O_3 mixing ratio~~concentration~~ (MIN8). We show a comparison of the changes in these metrics in Fig. 5.

250   In general, differences in global mean O_3 changes are relatively small in both daytime and nighttime under all pathways. However, in South and East Asia with increased NO_x emissions under SSP3-7.0 and SSP3-7.0-lowCH4, O_3 mixing ratios ~~concentrations~~ tend to increase in daytime but show smaller increases or reduction at night. This demonstrates the impact of O_3 titration by NO at nighttime in high-NO_x environments. In North America and Europe that have lower NO_x emissions in the future, daytime O_3 mixing ratios~~concentrations~~ decrease greatly in summer, but daytime and nighttime changes are

255   similar in winter, demonstrating the large influence of NO_x emissions on summer daytime O_3 mixing ratios~~concentrations~~. The substantial differences between daytime and nighttime O_3 changes suggest that the underlying impacts of O_3 changes on human health are likely to be larger than those estimated using seasonal mean O_3 mixing ratios~~concentrations~~, and this is particularly important for high-emission areas with increased NO_x emissions in the future.
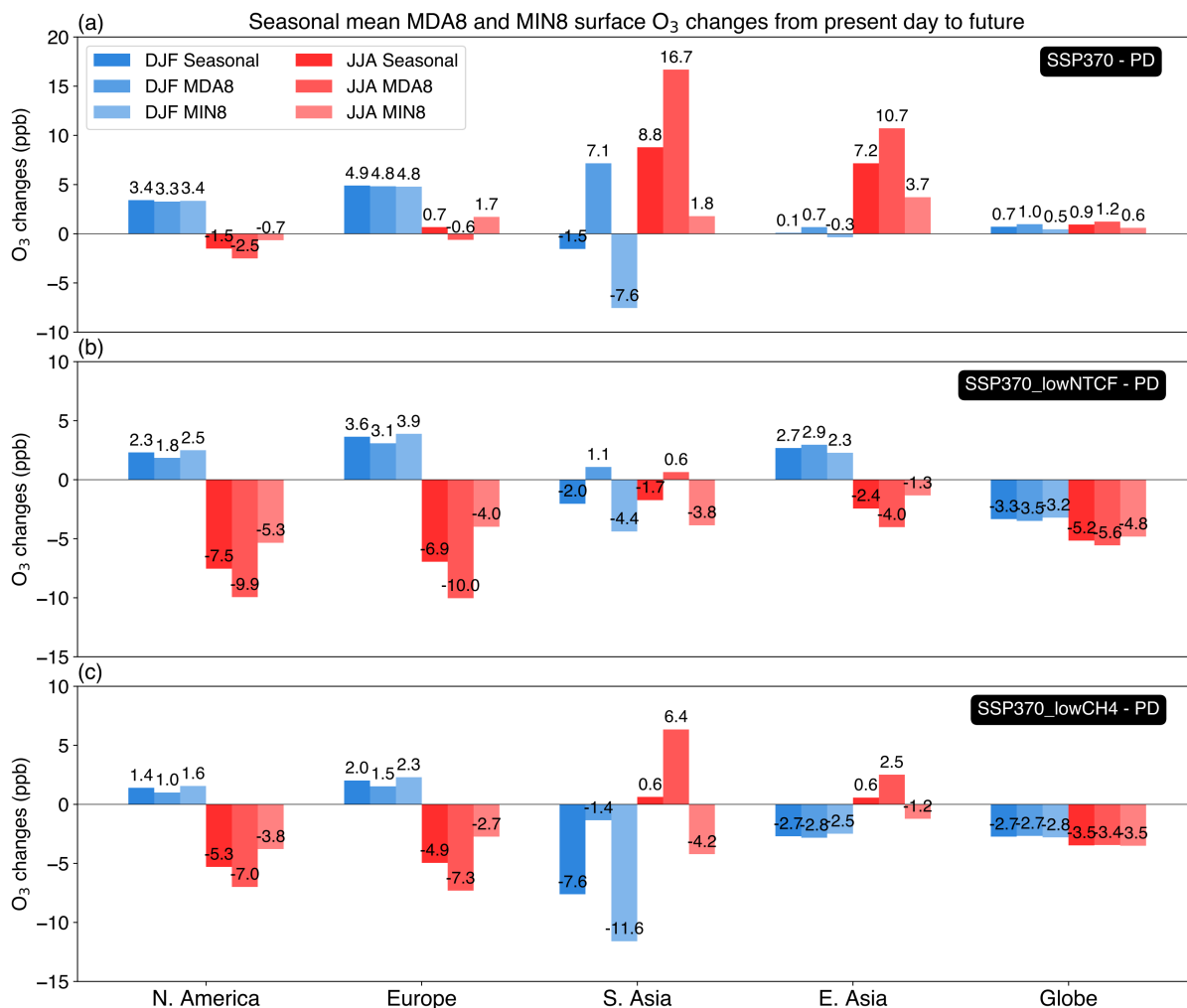
Figure 5. Seasonal mean maximum daily average 8 h (MDA8) and minimum daily average 8 h (MIN8) surface O_3 changes for North America, Europe, South Asia, East Asia and the globe from the present day (PD; 2004–2014) to SSP3-7.0 **(a)**, SSP3-7.0-lowNTCF **(b)** and SSP3-7.0-lowCH4 **(c)** (2045–2055). DJF and JJA situations are shown with blue and red bars, respectively.

5 O_3 sensitivity in the present day and the future

260   Non-linearity in chemical O_3 formation can result in differences in the effectiveness of emission control strategies regionally, and may aggravate O_3 pollution issues. We therefore investigate O_3 sensitivity for the present day and the future, as it is important to understand how O_3 mixing ratios~~concentrations~~ will respond to changing emissions. Ratios of NO_x and VOC mixing ratios~~concentrations~~ provide a useful indicator of regional O_3 sensitivity regimes. Here we quantify the critical NO_x/VOC ratio that distinguishes VOC-limited and NO_x-limited regimes by examining monthly mean surface O_3 mixing ratios~~concentrations~~

265 and net chemical production rates as a function of monthly mean NO_x and VOC ~~concentrations~~ mixing ratios, see Fig. 6.

Monthly mean ~~data~~ O_3 mixing ratios and net production rates in the lowest model layer from all months and all scenarios are used to plot the ~~isopleths~~ figure. For NO_x we use the sum of NO and NO_2 mixing ratios, and for total VOC we use the sum of the mixing ratios of primary emitted VOC species. CO and CH_4 are not included due to their relatively low reactivity. We classify NO_x and VOC mixing ratios in each model grid cell into 150 bins on a logarithmic scale ranging from 0.01 ppb to 100

270 ppb, and calculate mean O_3 mixing ratios and mean O_3 net chemical production rates in each NO_x-VOC bin. Approximate thresholds of monthly mean NO_x/VOC ratios for O_3 sensitivity are shown in Fig. 6, ranging from 0.6 to 1 with a central value of 0.8. We hence apply a threshold value of 0.8 to distinguish O_3 sensitivity regimes hereafter. Areas above the threshold represent VOC-limited regimes in which increased NO_x emissions reduce O_3 ~~concentrations~~ mixing ratios and O_3 production rates, and areas below the threshold represent NO_x-limited regimes. We find the highest O_3 ~~concentrations~~ mixing ratios and

275 O_3 production close to the threshold line, demonstrating that the threshold values are consistent and that the approach is robust.

We further investigate O_3 sensitivity for different regions. The regions considered here are those defined for the Task Force on Hemispheric Transport of Air Pollutants Phase 2 (TF HTAP2; Janssens-Maenhout et al., 2015), see Fig. 7a; the regions dominating each part of the NO_x-VOC ~~concentration~~ mixing ratio space are shown in Fig. 7b, c. We determine the dominant region contributing to each bin in NO_x-VOC space based on the region contributing the greatest number of model grid cells

280 to that bin. ~~We identify the dominant region based on the number of model grid cells with the corresponding NO_x and VOC mixing ratios.~~ This approach reveals differences in regional O_3 sensitivity. We also show the shift in O_3 sensitivity in different regions between the present day (Fig. 7b) and the future (SSP3-7.0-lowNTCF; Fig. 7c) to demonstrate the impacts of decreased NTCF emissions on the evolution of O_3 sensitivity on a regional basis.
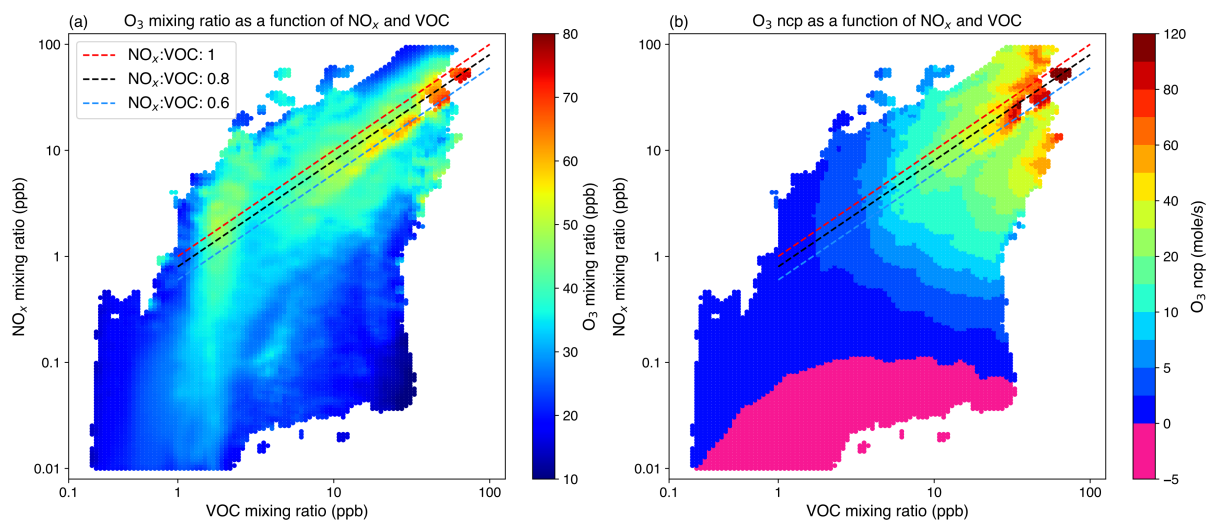
Figure 6. Surface O_3 mixing ratios~~concentrations~~ **(a)** and O_3 net chemical production (ncp) rates **(b)** as a function of monthly mean NO_x and VOC mixing ratios~~concentrations~~. Monthly mean data for all months and all scenarios are used. The straight lines show the approximate thresholds of NO_x/VOC to distinguish VOC-limited (above the line) and NO_x-limited (below the line) regimes.
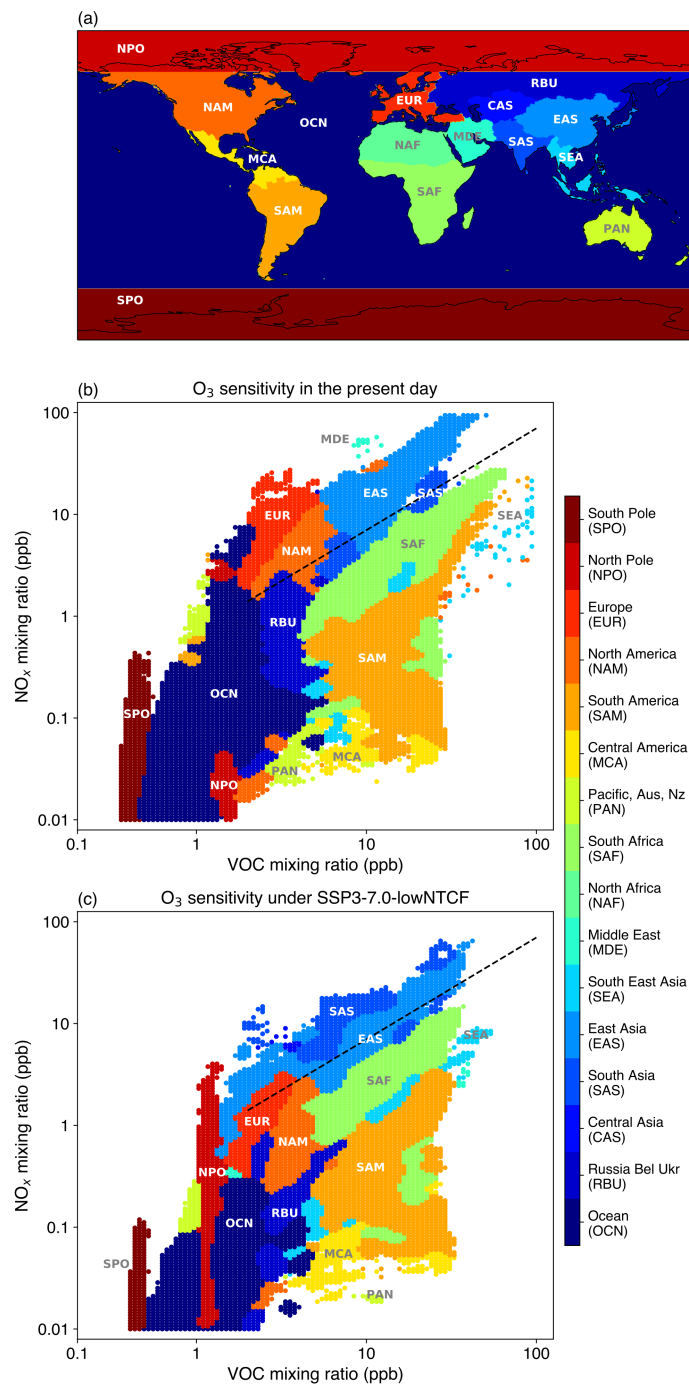
Figure 7. Geographical regions defined in the Task Force on Hemispheric Transport of Air Pollutants Phase 2 (TF HTAP2) **(a)**. Regions dominating each part of NO_x-VOC mixing ratio~~concentration~~ space in the present day **(b)** and under SSP3-7.0-lowNTCF **(c)**. The straight line shows the NO_x/VOC threshold of 0.8. Monthly mean data for all months under each pathway are used to plot **(b)** and **(c)**.

Figure 7b clearly shows that low-NO_x and low-VOC environments are most common in oceanic and polar regions where surface O_3 levels are typically low and where O_3 production is NO_x-limited. In contrast, Europe, North America and East Asia dominate the high-NO_x and high-VOC environments in the present day where O_3 levels are high and O_3 production is VOC-limited. Europe and North America have similar VOC mixing ratios~~concentrations~~ but NO_x mixing ratios~~concentrations~~ are generally higher in Europe than in North America, which results in Europe lying further above the NO_x/VOC threshold. This demonstrates that stricter controls on NO_x emissions are required for Europe to shift from VOC-limited to NO_x-limited regimes than for North America. East Asia dominates VOC-limited regimes due to much higher NO_x and VOC mixing ratios~~concentrations~~ than other regions. Parts of South Asia and Middle East are also VOC-limited. Major biogenic emission source regions such as South America, South Africa and South East Asia have high VOC mixing ratios~~concentrations~~ but moderate levels of NO_x, and the chemical environment is therefore NO_x-limited.

The impacts of reductions in NTCF emissions are shown in Fig. 7c. We find that Europe and North America are no longer the most dominant VOC-limited regimes due to decreased NO_x mixing ratios~~concentrations~~. East Asia is still a dominant VOC-limited region under SSP3-7.0-lowNTCF, but reduced NO_x emissions shift parts of East Asia into NO_x-limitation. South Asia becomes the main VOC-limited region with relatively high NO_x mixing ratios~~concentrations~~. South America, South Africa and South East Asia are still NO_x-limited because there are no large NO_x increases in these regions.

O_3 sensitivity in major present-day VOC-limited regions under different scenarios are shown in Fig. 8. Reductions in NO_x emissions are important and effective in transforming VOC-limitation to NO_x-limitation, reflected in large NO_x-limited areas in Europe and North America under all scenarios. In contrast, most parts of East Asia are VOC-limited under SSP3-7.0 and SSP3-7.0-lowCH4 due to increased NO_x emissions. Since changes in VOC mixing ratios~~concentrations~~ are relatively small for all scenarios, they have little substantial influence on O_3 sensitivity. Under future climate, increased biogenic VOC emissions in Europe and North America partly offset decreased anthropogenic and biomass VOC emissions, and are hence beneficial to maintain a NO_x-limited environment. We note that South Asia is the only region that is substantially VOC-limited in the future due to increased NO_x emissions. Reductions in CH_4 mixing ratios~~concentrations~~ have relatively little impact on O_3 sensitivity, although they greatly reduce surface O_3 mixing ratios~~concentrations~~ (Sect. 4.3).
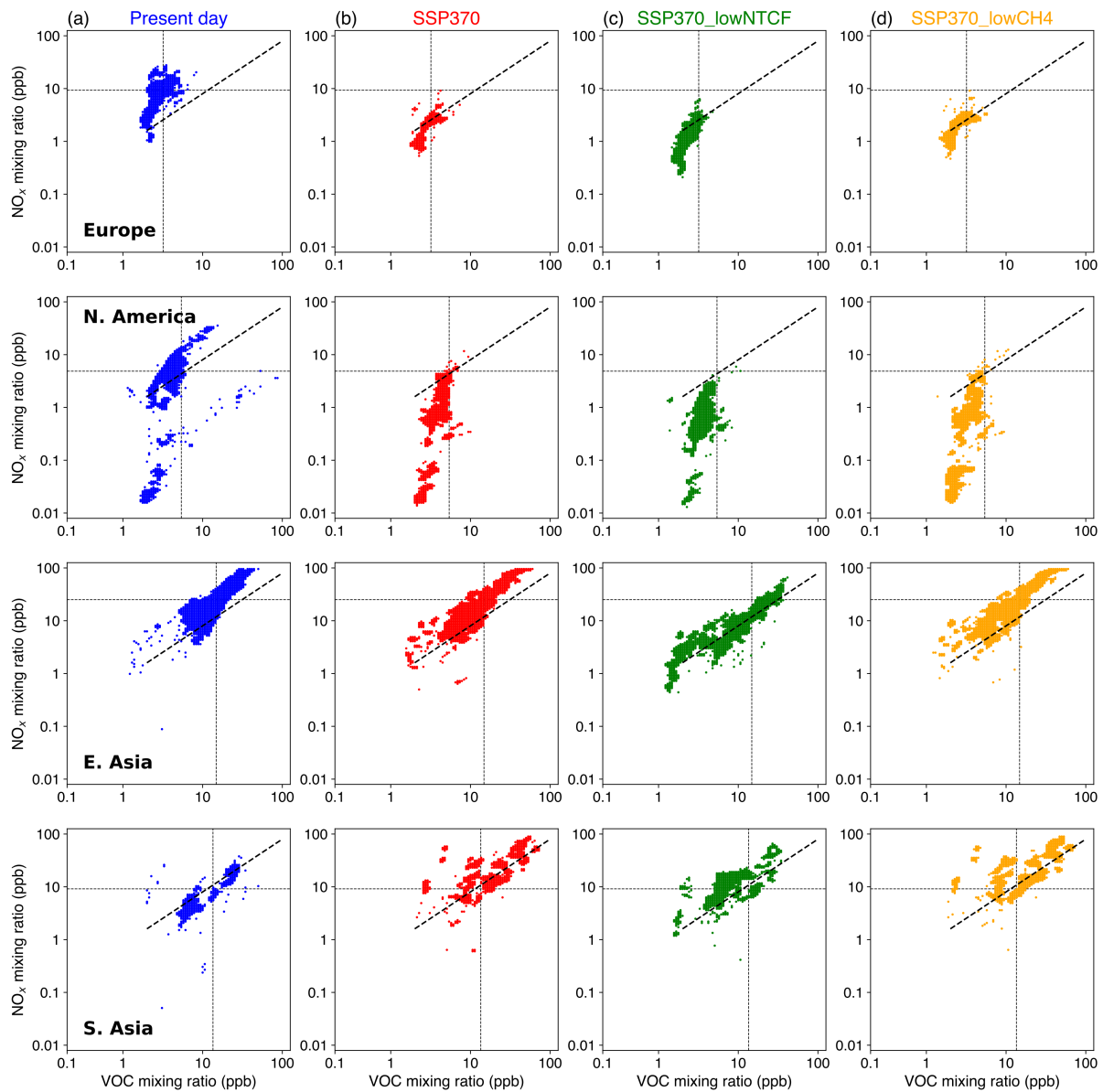
Figure 8. O_3 sensitivity across Europe, North America, East Asia and South Asia in the present day **(a)** and under SSP3-7.0 **(b)**, SSP3-7.0-lowNTCF **(c)** and SSP3-7.0-lowCH4 **(d)**. The NO_x/VOC threshold of 0.8 is shown. Horizontal and vertical lines indicate regional mean NO_x and VOC mixing ratios~~concentrations~~ in the present day.

6 Spatial distributions of O_3 sensitivity

Global spatial distributions of annual O_3 sensitivity in the present day and the future are shown in Fig. 9. VOC-limited regimes
are represented by high NO_x/VOC ratios, reflecting relatively high NO_x or low VOC ~~mixing ratios~~concentrations. In the
present day, high NO_x emissions contribute to VOC-limitation in large areas of North America, Western and Central Europe
and East Asia. While North America and Europe have lower NO_x ~~mixing ratios~~concentrations than East Asia, lower VOC
~~mixing ratios~~concentrations still lead to VOC-limitation. Only south-west parts of India are VOC-limited. In the future, O_3
production in more areas of North America and Europe becomes NO_x-limited. However, VOC limited regimes in East Asia,
particularly China, are persistent due to projected increases in NO_x emissions until 2055 under SSP3-7.0 and SSP3-7.0-
lowCH4. We find that reductions in CH_4 ~~mixing ratios~~concentrations have relatively little influence on O_3 sensitivity over
continental regions (Fig. 9b vs 9d). We note that SSP3-7.0-lowNTCF shows the smallest VOC-limited areas across the globe.
East Asia is still partly VOC-limited under this scenario, particularly in northern China (Fig. 9c), which indicates that further
reductions in NO_x emissions are required in addition to those expected in this region in the future (Fig. 3b).
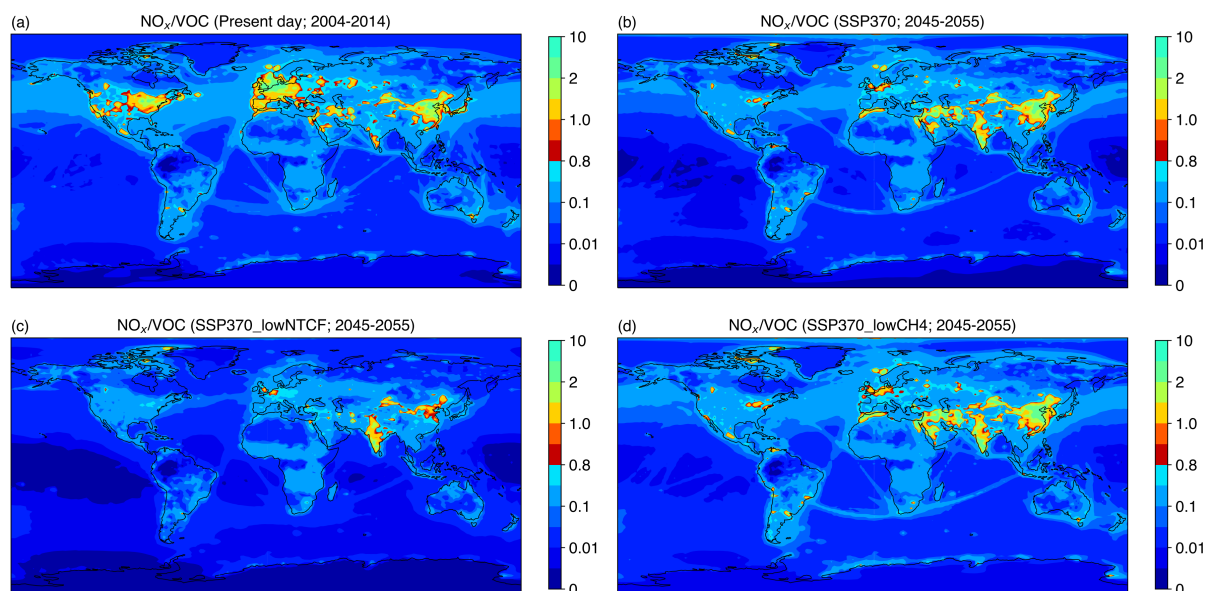
Figure 9. Spatial distributions of annual mean NO_x/VOC in the present day (2004–2014; **a**) and under SSP3-7.0 (**b**), SSP3-7.0-lowNTCF
(**c**) and SSP3-7.0-lowCH4 (**d**) (2045–2055). A NO_x/VOC threshold ratio of 0.8 is used here to distinguish O_3 sensitivity regimes.

We contrast regional O_3 sensitivities for winter and summer seasons in Fig 10, as we note that O_3 responses in different
seasons can be substantially different in high-emission regions. This suggests that static emission control strategies throughout
the year may not be the best way to lower annual-mean O_3 pollution, and adjustments may be needed according to seasonal
O_3 sensitivities. More extensive VOC-limited areas are found in winter than in summer under both present day and future
conditions, but these account for less than 7 % of the total area of the world in the present day (Table 5). Over 50 % of North

325 America, Europe and East Asia are VOC-limited in winter in the present day. This explains why North America and Europe show O_3 increases in winter (Fig. 4) despite reduced NO_x emissions. However, there are fewer VOC-limited regions across the globe under all future pathways (Fig. 10). About 1 % of North America is VOC-limited in summer, and less than 7 % of Europe. In contrast, over 48 % (winter) and 39 % (summer) of South Asia is VOC-limited in future. Slightly more areas are VOC-limited under SSP3-7.0-lowCH4 than under SSP3-7.0 (Fig 10c, d). Overall, reductions in NO_x emissions are important

330 to reduce O_3 production in high-emission regions and shift VOC-limited areas to NO_x-limitation but this may lead to higher O_3 mixing ratios~~concentrations~~ in winter without further emission controls on VOC and CH_4.
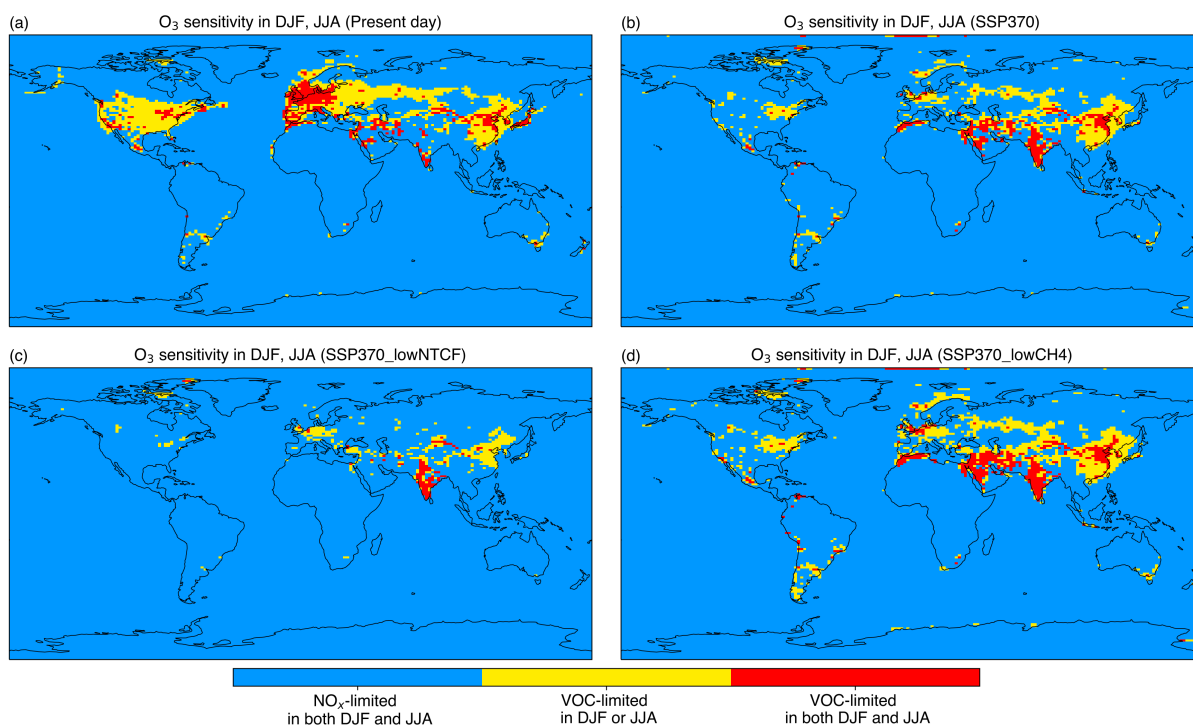
Figure 10. Seasonal differences in O_3 sensitivity regimes for the present day (2004–2014; **a**) and under SSP3-7.0 (**b**), SSP3-7.0-lowNTCF (**c**), SSP3-7.0-lowCH4 (**d**) (2045–2055). A NO_x/VOC threshold ratio of 0.8 is used here to distinguish O_3 sensitivity regimes.

Table 5. The percentage of VOC-limited areas (%) in different regions under different pathways in winter (DJF) and in summer (JJA).

	Present day		SSP3-7.0		SSP3-7.0-lowNTCF		SSP3-7.0-lowCH4	
	DJF	JJA	DJF	JJA	DJF	JJA	DJF	JJA
N. America	50.4	6.4	12.5	0.4	2.4	0	16.9	1.0
Europe	79.8	37.4	27.0	2.6	27.5	0.9	41.6	6.1
S. Asia	15.1	15.3	54.8	49.6	48.1	39.5	60.4	56.7
E. Asia	60.3	18.3	63.3	15.8	37.7	3.5	68.7	19.3
Globe	6.9	2.7	4.8	2.0	2.0	0.6	5.9	3.0

7 Conclusions

We use a global chemistry-climate model, UKESM1, to assess the impacts of changing near-term climate forcer (NTCF) emissions and CH_4 mixing ratios~~concentrations~~ in the context of climate change on tropospheric O_3 in the present day
335 (2004–2014) and the near future (2045–2055). CMIP6 future scenarios including~~representing 'regional rivalry' development pathways (~~ SSP3-7.0, SSP3-7.0-lowNTCF and SSP3-7.0-lowCH4~~)~~ are used from the AerChemMIP project. We have examined O_3 changes from the present day to the future and investigated regional O_3 sensitivities to explain contrasting O_3 changes in different seasons.

An extended chemistry scheme incorporating more reactive VOC species is used to permit representation of more active
340 photochemical environments for O_3 production. This shows higher surface O_3 mixing ratios~~concentrations~~ in high-emission regions and a 5 % higher tropospheric O_3 burden. While simulated surface O_3 mixing ratios~~concentrations~~ are biased low in winter and high in summer, these systematic model biases are similar to those using the original chemistry scheme as well as a more comprehensive chemistry scheme. This indicates that other factors in the model are likely to be responsible for the biases but the extended chemistry scheme permits representation of a more appropriate chemical environment for O_3 production in
345 high-emission areas.

From the present day to the future, the tropospheric O_3 burden increases by 4 % under SSP3-7.0 and decreases by 7 % and 5 % under SSP3-7.0-lowNTCF and SSP3-7.0-lowCH4. The tropospheric O_3 chemical lifetime remains similar (21–22 days) under all scenarios, and this is similar to previous estimates. Seasonal global mean surface O_3 mixing ratios~~concentrations~~ increase by 0.7–0.9 ppb under SSP3-7.0, and decrease by 3.3–5.2 ppb under SSP3-7.0-lowNTCF and by 2.7–3.5 ppb under SSP3-
350 7.0-lowCH4. We find that reductions in NTCF emissions are effective in reducing surface O_3 mixing ratios~~concentrations~~, and reductions in CH_4 mixing ratios~~concentrations~~ are also important. We also find that both the magnitude and direction of seasonal, daytime and nighttime O_3 changes relative to the present day can vary greatly across different regions especially South and East Asia.

O$_3$ sensitivity is quantified using monthly mean NO$_x$/VOC ~~concentration~~ ratios to give a broad assessment of regional O$_3$ sensitivity. The estimated monthly mean NO$_x$/VOC thresholds range from 0.6 to 1.0, and 0.8 is used to distinguish O$_3$ sensitivity regimes. Most VOC limited regimes occur in high-emission regions across the northern hemisphere, such as North America, Europe, the Middle East, South Asia and East Asia. More areas in North America and Europe become NO$_x$-limited under all future pathways due to the projected decrease in NO$_x$ emissions. There are more VOC-limited areas in East Asia under SSP3-7.0 and SSP3-7.0-lowCH4 due to the projected increase in NO$_x$ emissions, although there are fewer VOC-limited areas in East Asia under SSP3-7.0-lowNTCF. South Asia becomes the dominant region for VOC-limited O$_3$ production in the future. Projections of regional O$_3$ sensitivity demonstrate that reductions in NO$_x$ emissions are the most important factor to shift VOC-limited regimes to NO$_x$-limitation.

We highlight that O$_3$ sensitivity varies by season. There are more VOC-limited regimes in winter (7 %) than in summer (3 %) across the globe. Reductions in NO$_x$ emissions increase surface O$_3$ mixing ratios~~concentrations~~ in high-emission areas particularly in winter, and reductions in VOC emissions should be targeted. In the future, reductions in NO$_x$ and VOC emissions should both be effective in mitigating O$_3$ pollution in most areas of North America and Europe in summer because there are only 1 % and 7 % VOC-limited areas in these two regions. However, further reductions in NO$_x$ emissions are needed for parts of East Asia and South Asia to convert most VOC-limited areas to NO$_x$-limited. While anthropogenic and biomass emissions may be controlled in the future, more biogenic emissions under a warmer climate would hinder the impacts of VOCs on O$_3$ mitigation. Reductions in CH$_4$ mixing ratios~~concentrations~~ are also important to reduce surface O$_3$ pollution. NO$_x$ decreases are important to reduce surface O$_3$ mixing ratios~~concentrations~~ from a global~~globe~~ perspective but will lead to increased O$_3$ mixing ratios~~concentrations~~ in some regions, and hence emission controls on VOC and CH$_4$ are necessary to mitigate regional O$_3$ pollution during the transition from VOC- to NO$_x$-limitation.

Data availability. The data generated in this study are available upon request.

Author contributions. ZL, RD, OW, FO'C, ST designed the study. ZL set up the model, conducted model simulations and performed the analysis. ZL, RD and OW prepared the paper. All co-authors contributed to reviewing and editing the paper.

Competing interests. The authors declare that they have no conflict of interest.

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