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Atmospheric chemistry regimes in intercontinental air traffic corridors: Ozone versus NO<sub>x</sub> sensitivity

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Abstract

This study focusses on the environmental consequences of aircraft NO<sub>x</sub> emissions and their role and impact on ozone formation in the upper troposphere and lower stratosphere (UTLS). We use a global chemistry transport/box model approach to quantify the impacts of NO<sub>x</sub> on UTLS ozone over time scales of hours and over distance scales appropriate to air traffic corridors and aircraft flight paths. An important feature of our study has been to provide a marked contrast to the coarse spatial resolution of the global model studies typically employed to assess the impacts of aviation NO<sub>x</sub> on UTLS ozone. Real operational aviation routing data are used to quantify the NO<sub>x</sub> impacts on ozone at 235 locations on 21 flight paths. The NO<sub>x</sub> impact on ozone in the intercontinental air traffic corridors is strongest in the great circle routes from North America and Europe into Asia and weakest in the trans-polar routes. The NO<sub>x</sub> impacts identified with the CTM/box model combination are significantly smaller compared with those identified in the current global models typically used to assess aviation NO<sub>x</sub> impacts. Further research is required to confirm our assessment of those flight paths that appear to show greatest NO<sub>x</sub> – O<sub>3</sub> impacts and those the least and extend our analyses into the tropics and southern hemisphere.

## 1. Introduction

There is much current interest from policy-makers in the global-scale environmental impacts of aviation and how the aviation industry will cope with the shift to low- or zero-carbon futures (for example: IATA, 2023; Transport & Environment, 2018). These global scale impacts include global climate change driven by emissions of carbon dioxide and oxides of nitrogen (NO<sub>x</sub>), cirrus cloud formation, soot emissions and contrail formation (IPCC, 2018; Lee et al., 2021,2023; and the references therein). In this study, our interest lies in the environmental consequences of aircraft NO<sub>x</sub> emissions and their role and impact on ozone (O<sub>3</sub>) formation in the upper troposphere and lower stratosphere (UTLS). The impact of aviation NO<sub>x</sub> emissions on tropospheric O<sub>3</sub> has two components with distinctly different time-scales (Wild and Prather, 2000). The first component is a rapid O<sub>3</sub> production which occurs over a time-scale of hours to days. The second component leads to net O<sub>3</sub> destruction, builds up over months, decays away over several years and is driven by the impact of NO<sub>x</sub> on the hydroxyl radical (OH) – methane – O<sub>3</sub> chemistry. Aviation NO<sub>x</sub> is not alone in showing this two-component behaviour which is also shown by ground-level NO<sub>x</sub> emissions (Wild et al. 2001), hydrogen (Derwent et al., 2020) and organic compounds

(Derwent et al., 2023). This study addresses only the first, rapid and direct impact of  $\text{NO}_x$  on  $\text{O}_3$ . It is understood that this is only one aspect of the larger global aviation impact story.

An unintended consequence of any present or future aircraft propulsion system based on combustion is the emission of  $\text{NO}_x$ , irrespective of the fuel combusted whether fossil fuel-based, biofuel-derived (Transport & Environment, 2018; Lee et al., 2023) or hydrogen (Transport & Environment, 2023). It is conceivable that  $\text{O}_3$  formation from  $\text{NO}_x$  can be mitigated by rerouting aircraft corridors, formation flying and other options (Khan et al., 2023). Whether any of these mitigation options would actually reduce the climate consequences of ozone formation in the real atmosphere will depend on the adequacy and completeness of the current global chemistry-transport models (CTMs) and the representation of the atmospheric  $\text{O}_3$ - $\text{NO}_x$  chemistry upon which they depend. Because of the uncertainties in assessment models, it has been difficult to recommend definitive policy actions because of their limited impacts and perhaps unintended consequences (Lee et al., 2021). If it is acknowledged that there are considerable uncertainties in assessment models, then an important issue is the extent to which further research could narrow these uncertainties. Carslaw et al., (2018) have recognised this issue in the context of climate models and climate science. Understanding uncertainty in the models of  $\text{NO}_x$  impacts on UTLS ozone is the main motivation behind this study.

Here, a CTM/box model approach is employed to quantify the impacts of aviation  $\text{NO}_x$  on UTLS ozone over timescales of hours and distance scales appropriate to flightpaths. An important feature of our study is the marked contrast between these time and spatial scales offered by the CTM/box model approach and those offered by the current CTMs typically used to assess impacts of global aviation. The global CTM models typically used in studies of aircraft  $\text{NO}_x$  emissions are coarse scale models when viewed from the aspect of an individual aircraft flight path. The emission grids are typically several hundreds of kilometres in scale and aircraft  $\text{NO}_x$  emissions are instantly mixed throughout these emission grid squares over timescales of months. However, in the real atmosphere it would take many hours for the aircraft  $\text{NO}_x$  emissions to mix across distances of the order of hundreds of km during which time  $\text{NO}_x$  levels would have decayed away through the action of the photochemistry. The result is that the  $\text{NO}_x$  –  $\text{O}_3$  impacts estimated using global CTMs may not describe accurately the real situation in the intercontinental air traffic corridors and may lead to the overestimation of the impact of aircraft  $\text{NO}_x$  emissions on UTLS ozone as shown by comparison with the CTM/box model approach adopted here. Further research is recommended to confirm our assessment of those air traffic corridors that appear to show greatest  $\text{NO}_x$  –  $\text{O}_3$  impacts and those the least.

## 2. Methods

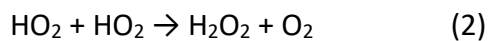
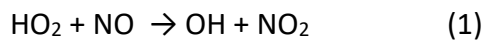
### 2.1 Flight-path information

Details of the flight paths taken by commercial aviation were taken from the open-source air traffic data set Open Sky (<https://opensky-network.org>). The OpenSky Network sources data from Automatic Dependent Surveillance-Broadcast (ADS-B) ground-based crowdsourced receivers which determine aircraft latitude, longitude and altitude, along with additional measurements such as flight track and ground speed, at a temporal resolution of one second.

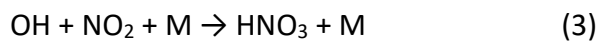
We focussed on twenty-one intercontinental flight paths, eleven of which left Europe bound for North America and Asia and ten left Asia for North America and Europe, as detailed in Table 1. All these flight paths stayed within the northern hemisphere and within the latitude range from 22° to 84° N. The locations of the flight paths were noted at hourly intervals in the Open Sky data sets. These flight paths present a reasonable coverage of northern hemisphere mid-latitudes as shown in the location map In Figure 1.

## 2.2 Atmospheric chemistry of ozone versus NO<sub>x</sub> sensitivity in the UTLS

It is well understood that atmospheric photochemical O<sub>3</sub> formation rate, PO<sub>3</sub>, is dependent on the availability of NO<sub>x</sub> (Chameides and Walker, 1973; Crutzen, 1973). In the polluted atmospheric boundary layer, photochemical O<sub>3</sub> formation can be described as NO<sub>x</sub>- or VOC-sensitive if reductions in NO<sub>x</sub> or volatile organic compounds (VOCs) give greater or lesser reductions in O<sub>3</sub> (Sillman et al., 1990). In low-NO<sub>x</sub> conditions, increasing NO<sub>x</sub> promotes photochemical O<sub>3</sub> formation by promoting the reaction of the hydroperoxy (HO<sub>2</sub>) radical with nitric oxide (NO) in reaction (1) over its self-reaction leading to radical loss in reaction (2):

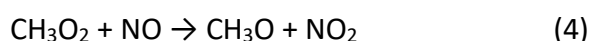


and O<sub>3</sub> formation is said to be NO<sub>x</sub>-sensitive or NO<sub>x</sub>-limited, whilst changes in VOCs have little impact. Ultimately as NO<sub>x</sub> levels increase, photochemical ozone formation is inhibited by hydroxyl (OH) radical loss through its reaction with nitrogen dioxide (NO<sub>2</sub>) in reaction (3):



and photochemical ozone formation becomes increasingly sensitive to VOCs, relatively insensitive to NO<sub>x</sub> levels and ultimately decreases with increasing NO<sub>x</sub>. O<sub>3</sub> formation is then said to be VOC-limited or VOC-sensitive or NO<sub>x</sub>-saturated (Sillman, 1999).

The use of the photochemical O<sub>3</sub> production rate, PO<sub>3</sub>, and its response to reductions in NO<sub>x</sub> versus VOCs, as an indicator of atmospheric chemistry regime is not without drawbacks. One such drawback is its essential reliance on air quality modelling, ruling it out as an observations-based approach. As a consequence, a number of indicator species ratios have been developed with a view to the diagnosis of atmospheric chemistry regime in the polluted atmospheric boundary layer in the base case (or from observations) without the need for the additional NO<sub>x</sub> and VOC reduction scenario cases. These indicator species ratios include O<sub>3</sub>/NO<sub>z</sub>, where NO<sub>z</sub> = HNO<sub>3</sub> + PAN + nitrate aerosol, HCHO/NO<sub>2</sub>, H<sub>2</sub>O<sub>2</sub>/HNO<sub>3</sub> and α<sup>CH<sub>3</sub>O<sub>2</sub></sup> (Sillman, 1995; Jaegle, et al., 1998; Nussbaumer et al., 2023). Sillman (1995) proposed the indicator ratio HCHO/NO<sub>y</sub> which compares the reaction of OH with VOCs, leading to HCHO and enhancing O<sub>3</sub> formation, in competition with radical loss through OH + NO<sub>2</sub> in reaction (3). The indicator ratio H<sub>2</sub>O<sub>2</sub>/NO<sub>y</sub> was also proposed by Sillman (1995) which compares the loss of HO<sub>2</sub> radicals in reaction (2) with the loss of OH radicals in reaction (3). The α<sup>CH<sub>3</sub>O<sub>2</sub></sup> metric provides a relatively recent method of defining NO<sub>x</sub>- and VOC-sensitivity based on the fate of methyl peroxy (CH<sub>3</sub>O<sub>2</sub>) radicals forming HCHO by reaction with NO in reaction (4) and (5) versus radical loss through reaction with HO<sub>2</sub> in reaction (5), (Nussbaumer et al., 2023):





In the paragraphs that follow, these indicator species ratios are evaluated against  $\text{PO}_3$  for their specificity and applicability to locations within the intercontinental air traffic corridors.

In this study, a combination of a global chemistry-transport model (CTM) and a box model are employed in the study of the impact of aviation  $\text{NO}_x$  emissions on  $\text{O}_3$  levels in the upper troposphere – lower stratosphere (UTLS) region, the atmospheric region where  $\text{O}_3$  changes exert a dramatic impact on radiative forcing and climate change. We build confidence in our CTM/box model approach by investigating how the concepts of  $\text{NO}_x$ -sensitive and VOC-sensitive can be applied successfully in the UTLS region through detailed comparisons with the indicator species ratios:  $\text{O}_3/\text{NO}_z$ ,  $\text{HCHO}/\text{NO}_2$ ,  $\text{H}_2\text{O}_2/\text{HNO}_3$  and  $\alpha^{\text{CH}_3\text{O}_2}$ .

### 2.3 STOCHEM-CRI model

A state-of-the-art global-scale Lagrangian three-dimensional chemistry-transport model (STOCHEM-CRI) is used to generate a comprehensive description of the atmospheric composition in the air traffic corridors in the upper troposphere and lower stratosphere. STOCHEM-CRI has been employed to describe the tropospheric distribution of ozone (Utembe et al., 2010) and of organic aerosol. STOCHEM-CRI has been employed to describe the tropospheric distribution of ozone (Utembe et al., 2010; Derwent et al., 2015) and of organic aerosol (Utembe et al., 2011). It has been used to explore different aspects of tropospheric chemistry involving formaldehyde (Cooke et al., 2010), peroxyacetic acid (Bacak et al., 2011), the ozonolysis of ethene (Leather et al., 2012), Criegee intermediates (Percival et al., 2013), methanol (Khan et al., 2014), organic peroxy radicals (Khan et al., 2015a), organic hydroperoxides (2015b), acetone (Khan et al., 2015c), nitrate radicals (Khan et al., 2015d), alkyl nitrates (Khan et al., 2015e), dimethyl sulphide (Khan et al., 2016), peroxyacetyl nitrate (Khan et al., 2017a) and sesquiterpenes (Khan et al., 2017b). These studies each include a comprehensive comparison between observations and the predictions from STOCHEM-CRI.

STOCHEM-CRI has also been used to evaluate the impact of global aircraft  $\text{NO}_x$  emissions on atmospheric composition (Wasiuk et al., 2016a). An operational mitigation strategy for commercial aircraft impact on air quality and climate referred to as the turboprop replacement strategy (TRS) in which jets on short-haul missions were replaced with turboprops was investigated by the STOCHEM-CRI model (Wasiuk et al., 2016b). In a recent study, STOCHEM-CRI was used to assess the  $\text{NO}_x$  related climate impact of a switch from kerosene fuel to hydrogen fuel in the modelled aircraft (Khan et al., 2022).

The STOchastic CHEMistry (STOCHEM) model was initially developed to describe the global distributions of  $\text{O}_3$ ,  $\text{NO}_x$  and  $\text{CH}_4$ . A detailed description of the model together with its horizontal and vertical coordinates, advection scheme and meteorological parameterisations and datasets is given in Collins et al., (1997). It has taken part in a number of global model intercomparisons and has performed satisfactorily in each (see, for example, Fiore et al., 2009; Naik et al., 2013; Stevenson et al., 2013; Young et al., 2013). This early version is called STOCHEM-OC. Subsequently in Utembe et al., (2011), the representation of the atmospheric chemistry of  $\text{O}_3$ ,  $\text{NO}_x$ , carbon monoxide (CO),  $\text{CH}_4$  and a range of organic compounds has been expanded considerably by incorporating the Common Representative Intermediate (CRI) chemical mechanism (Jenkin et al., 2008) and this newer version is called STOCHEM-CRI. Use of this enhanced version in combination with the box

model is particularly important for the accurate global representation O<sub>3</sub> formation from the photochemical oxidation of methane and other organic compounds under the low-NO<sub>x</sub> conditions of the upper troposphere and lower stratosphere (Derwent et al., 2021).

In this study, STOCHEM-CRI was employed to generate background environmental conditions in the intercontinental air traffic corridors. STOCHEM-CRI was run with no aircraft NO<sub>x</sub> emissions as input, whilst retaining NO<sub>x</sub> emissions from lightning, stratospheric exchange, anthropogenic and soils. Results from a sensitivity case 'with aircraft' emissions are described in the Supplementary Information. STOCHEM-CRI model output was provided as background conditions appropriate to each latitude, longitude and altitude of each flight path location. These background conditions were set for the main tropospheric trace gases: CH<sub>4</sub>, CO, H<sub>2</sub>, O<sub>3</sub>, NO<sub>x</sub>=NO+NO<sub>2</sub>, HNO<sub>3</sub>, seven VOCs (ethane, propane, butane, ethylene, propylene, formaldehyde, acetaldehyde), CH<sub>3</sub>OOH, and two peroxyacylnitrates.

#### 2.4 Photochemical box model

The formulation of the box model was based on the Photochemical Trajectory Model (PTM), the details of which are given elsewhere (Derwent et al., 2010). The model follows the chemical development of O<sub>3</sub>, NO<sub>x</sub>, CH<sub>4</sub>, CO and 7 organic compounds (ethane, propane, butane, ethylene, propylene, formaldehyde, acetaldehyde) within an air parcel for five days. The box model employs a near-explicit chemical mechanism based on the Master Chemical Mechanism v3.3.1 (Jenkin et al., 2015) taken from <https://mcm.york.ac.uk>.

The rate of change of the concentration of a chemical species,  $c_i$ , in molecule cm<sup>-3</sup> within the air parcel was described by a series of differential equations of the form in equation (6):

$$dc_i/dt = P_i - L_i c_i \quad (6),$$

where  $P_i$  is the instantaneous production rate of species,  $i$ , from chemistry and  $L_i c_i$  is the instantaneous loss rate of species,  $i$ , from chemistry. The system of up to five thousand simultaneous stiff differential equations was integrated with a variable order Gear's method (FACSIMILE, Curtis and Sweetenham, 1987).

The box model was run for each of the 235 locations on 21 flight paths and was initialised with background environmental data for 36 species taken from STOCHEM-CRI as detailed above. Each box model was then run for five days beginning at 18:00 hours (UTC) on the first day. The start time was chosen so as to include a complete night-time during spin-up. The model run time was set at 5 days, long enough to include processes that return NO<sub>y</sub> to NO<sub>x</sub> but not too long as to move out of the linear regime. The photochemical O<sub>3</sub> production rate was calculated from the O<sub>3</sub> mixing ratios at the end and start of the five-day calculations. Mixing ratios of photochemically-generated reaction products such as HNO<sub>3</sub>, H<sub>2</sub>O<sub>2</sub> and HCHO were estimated from the box model results for midday on the second-day, the time of their maximum mixing ratios.

#### 2.5 NO<sub>x</sub>- and VOC-sensitivity indicator species and their ratios in the main intercontinental air traffic corridors

We began the analysis of the atmospheric chemistry regimes in the main intercontinental air traffic corridors in the UTLS region by focussing on twenty-one intercontinental flight paths during the spring season. The locations of the flight paths were noted at hourly intervals and atmospheric composition data from STOCHEM-CRI were employed as

background environmental conditions for the photochemical box modelling. A five-day box model run was performed for each of the 235 hourly flight path locations along the twenty-one flight paths to generate detailed atmospheric composition data for trace gases, reactive intermediates and free radicals with which to characterise the atmospheric chemistry regimes in the intercontinental air traffic corridors.

The photochemical box model was initialised using STOCHEM-CRI model output appropriate to mid-April at each latitude, longitude and altitude of each flight path. These initial conditions were set for the main tropospheric trace gases: CH<sub>4</sub>, CO, H<sub>2</sub>, O<sub>3</sub>, NO<sub>x</sub>=NO+NO<sub>2</sub>, HNO<sub>3</sub>, seven VOCs (ethane, propane, butane, ethylene, propylene, formaldehyde, acetaldehyde), CH<sub>3</sub>OOH, and two peroxyacylnitrates. The five-day photochemical box model was then used to generate PO<sub>3</sub> values, OH, HO<sub>2</sub> and CH<sub>3</sub>O<sub>2</sub> free radical number densities and mixing ratios of reaction products species such as H<sub>2</sub>O<sub>2</sub>, HCHO and PANs for each of the 235 flight path locations.

The first indicator of the atmospheric chemistry regime evaluated was the photochemical O<sub>3</sub> production rate (PO<sub>3</sub>) over the five-day box model integration, calculated from the starting and ending O<sub>3</sub> mixing ratios. In the base case, the PO<sub>3</sub><sup>base</sup>, averaged -0.24 ppb O<sub>3</sub> per 5 days over the 235 flight path locations, with a range from -0.62 to +0.45 ppb O<sub>3</sub> per 5 days. Overall, 206 locations showed net O<sub>3</sub> loss over the 5 days, with the remainder showing net O<sub>3</sub> production.

Two sensitivity cases were then performed at each location: in one, the initial NO<sub>x</sub> and NO<sub>2</sub> mixing ratios were decreased by 30% and, in the other, the VOC mixing ratios were decreased by 30%. These are the NO<sub>x</sub>-control and VOC-control sensitivity cases, respectively. In the NO<sub>x</sub>-control scenario case, the photochemical O<sub>3</sub> production rates, PO<sub>3</sub><sup>nox</sup>, decreased relative to PO<sub>3</sub><sup>base</sup> at all of the 235 flight path locations. The NO<sub>x</sub> responses, ΔPO<sub>3</sub><sup>nox</sup> = PO<sub>3</sub><sup>base</sup> – PO<sub>3</sub><sup>nox</sup>, averaged 0.12 ppb O<sub>3</sub> per 5 days, covering a range from 0.02 to 0.55 ppb O<sub>3</sub> per 5 days. In the VOC-control scenario case, again all the photochemical O<sub>3</sub> productions rates, PO<sub>3</sub><sup>voc</sup>, decreased relative to PO<sub>3</sub><sup>base</sup> at all locations. The VOC responses, ΔPO<sub>3</sub><sup>voc</sup> = PO<sub>3</sub><sup>base</sup> – PO<sub>3</sub><sup>voc</sup>, averaged 0.12 ppb O<sub>3</sub> per 5 days and covered a range from 0.05 to 0.35 ppb O<sub>3</sub> per 5 days.

As in the polluted atmospheric boundary layer, the issue was whether the O<sub>3</sub> responses to the 30% NO<sub>x</sub> controls were greater than or less than the O<sub>3</sub> responses to the 30% VOC controls at each flight path location. If the O<sub>3</sub> response to the NO<sub>x</sub> control was greater than the response to the VOC control, then the atmospheric chemistry regime is said to be NO<sub>x</sub>-sensitive or NO<sub>x</sub>-limited. However, if the O<sub>3</sub> responses to the NO<sub>x</sub> control was less than the response to the VOC control, then the atmospheric chemistry regime is said to be VOC-sensitive or VOC-limited. Out of the 235 flight path locations, 90 were classed as NO<sub>x</sub>-sensitive, 137 were classed as VOC-sensitive and 8 could not be classified because the NO<sub>x</sub>- and VOC-responses were identical.

To more clearly delineate those locations within the different atmospheric chemistry regimes, a metric N – V was defined as:  $N - V = \Delta PO_3^{nox} - \Delta PO_3^{voc}$ , then positive values of N – V would represent NO<sub>x</sub>-sensitivity and negative values represent VOC-sensitivity. Averaged over all flight path locations, the mean N – V for spring was found to be 0.0031 ± 0.1 (quoting 2 – σ confidence limits here and elsewhere below) ppb O<sub>3</sub> per 5 days. Broadly speaking, the longitude of the flight path location made little difference to the atmospheric

chemistry regime. There was a tendency for locations in the western hemisphere to be more VOC-sensitive than those in the eastern hemisphere, that is to say  $N - V$  was more negative,  $-0.02 \pm 0.08$  ppb  $O_3$  per 5 days versus  $0.02 \pm 0.1$  ppb  $O_3$  per 5 days, respectively, but these differences were not statistically significant. There was a strong influence of latitude on atmospheric chemistry regime, with  $N - V$  being more positive at low latitudes and more negative at high latitudes.

The use of  $PO_3$ , as an indicator of atmospheric chemistry regime in the UTLS (Nussbaumer et al., 2023) is not without drawbacks and a number of other indicator species and their ratios have been proposed in the literature, including  $O_3/NO_z$ ,  $HCHO/NO_2$ ,  $H_2O_2/HNO_3$  and  $\alpha^{CH_3O_2}$ , as discussed above. These indicators and their ratios were estimated from box model output taken at midday on the second-day. To assess the applicability and specificity of the different indicator species ratios, scatter plots were employed of the indicator species ratios versus  $N - V$  at each flight path location. The aim is to ascertain if there is a sufficiently clear demarcation in the indicator species ratios between  $NO_x$ - and VOC-sensitivity.

A scatter plot of the four indicator ratios plotted out against  $N - V$  is presented in Figure 2. There was a demarcation between the  $NO_x$ -sensitive ( $N - V$  positive) and VOC-sensitive ( $N - V$  negative) locations, with  $O_3/NO_z$  ratios below 200 being the former and above 200 being the latter. An analogous demarcation was found for the  $HCHO/NO_2$  indicator ratio with a demarcation at about  $HCHO/NO_2 = 7.5$  between  $NO_x$ -sensitive and VOC-sensitive locations. There was also a demarcation at  $H_2O_2/HNO_3 = 6$ . The  $\alpha^{CH_3O_2}$  indicator provided the clearest demarcation between  $NO_x$ -sensitive and VOC-sensitive regimes at  $\alpha^{CH_3O_2} = 0.69$ , in confirmation of the analyses performed by Nussbaumer et al., (2023). The scatter plot in Figure 2 confirms that all five metrics:  $PO_3$ ,  $O_3/NO_z$ ,  $HCHO/NO_2$ ,  $H_2O_2/HNO_3$  and  $\alpha^{CH_3O_2}$  generate a consistent and robust evaluation of the atmospheric chemistry regimes active in the intercontinental air traffic corridors in the UTLS region during the spring season. The CTM/box model approach has therefore provided a robust basis on which we can proceed to evaluate the impact of aviation  $NO_x$  emissions on  $O_3$  in the UTLS region.

### 3. Quantifying the impact of $NO_x$ on $O_3$ in the intercontinental air traffic corridors

Having identified that the rate of photochemical ozone formation ( $PO_3$ ) provides an accurate and consistent indicator of atmospheric chemical regime by comparison with four other indicators, we can be confident that  $\Delta PO_3^{nox}$  values can be used as a robust gauge of the impact of  $NO_x$  emissions from aviation on  $O_3$  levels in the international air traffic corridors of the UTLS. The aim is to provide some insights into which locations within the intercontinental air traffic corridors are more likely to be strongly impacted by aircraft  $NO_x$  emissions and those which are likely to be much less impacted.

As a measure of the impact of  $NO_x$  on  $O_3$ , we define the  $\partial O_3/\partial NO_x$  metric from the  $O_3$  responses to the 30% reductions in  $NO_x$  and  $NO_y$ ,  $\Delta PO_3^{nox}$ , normalised by the  $NO_x$  reduction,  $\Delta NO_x$ , as follows:

$$\partial O_3/\partial NO_x = \Delta PO_3^{nox} / \Delta NO_x \quad (7).$$

The values of the  $\partial O_3/\partial NO_x$  metric are presented in Figures 3a-d for each flight path location and each season.  $\partial O_3/\partial NO_x$  values varied from 5.4 to 37.5 per ppb  $NO_x$  per 5 days (henceforward ppb ppb<sup>-1</sup> per 5 days), with highest values towards low latitudes and lowest



values towards high latitudes. Metric values in these maps appeared highest during July and lowest during April.

Taking all 235 flight locations, all four seasons, we found a grand average for  $\partial O_3/\partial NO_x$  of  $22 \pm 6$  ppb ppb<sup>-1</sup> per 5 days. Averaging the photochemical ozone production over the five days, this is equivalent to an O<sub>3</sub> productivity of about 4 – 5 molecules of O<sub>3</sub> produced per molecule of NO<sub>x</sub> oxidised in the intercontinental air corridors of the UTLS.

Average  $\partial O_3/\partial NO_x$  values over the 235 flight locations are tabulated in Table 2 and showed evidence of a seasonal variation.  $\partial O_3/\partial NO_x$  peaked in the July at 26.4 ppb ppb<sup>-1</sup> per 5 days, being slightly lower at 24.8 ppb ppb<sup>-1</sup> per 5 days in October and reached a minimum in April at 15.7 ppb ppb<sup>-1</sup> per 5 days. The January value of 22.7 ppb ppb<sup>-1</sup> per 5 days was close to the annual average. Average  $\partial O_3/\partial NO_x$  values showed a small difference between the western and eastern hemispheres, 22.0 versus 22.7 ppb ppb<sup>-1</sup> per 5 days, respectively, but this was not likely to be statistically significant. Annual average  $\partial O_3/\partial NO_x$  values exhibited a decreasing trend polewards. Low latitudes (below 45°N) averaged 30.8 ppb ppb<sup>-1</sup> per 5 days, whilst mid-latitudes (45°N – 55°N) gave 22.5 ppb ppb<sup>-1</sup> per 5 days. High latitudes (above 70°N) averaged only 9.4 ppb ppb<sup>-1</sup> per 5 days during April.

Armed with this impact measure of NO<sub>x</sub> upon O<sub>3</sub>, we will begin to study how the impact of aviation NO<sub>x</sub> emissions varies with season and location in the intercontinental air traffic corridors, with a view to assessing the likely effects of mitigation options. Since there was unlikely to be any significant variation of  $\partial O_3/\partial NO_x$  with longitude, attention was initially focussed on variations of  $\partial O_3/\partial NO_x$  with the latitudes of the 235 flight path locations in each season, see Figure 4. Figure 4 presents a scatter plot of  $\partial O_3/\partial NO_x$  with latitude, with the different seasons plotted with different symbols. Latitudinal variations were apparent in all seasons, with a strong tendency for  $\partial O_3/\partial NO_x$  to decrease polewards and increase towards low latitudes. Highest  $\partial O_3/\partial NO_x$  were found below 40°N and lowest above 70°N. Highest  $\partial O_3/\partial NO_x$  were found during summer and autumn and lowest during spring. Annual averages varied by about a factor of two between low and high latitudes, whilst maxima and minima  $\partial O_3/\partial NO_x$  showed a factor of seven variation.

Whilst variations of  $\partial O_3/\partial NO_x$  with longitude generally exhibited a significant amount of scatter and small differences between the hemispheres, the longitudinal distribution of  $\partial O_3/\partial NO_x$  is worthy of some comment, see Figure 5. Figure 5 presents a scatter plot of  $\partial O_3/\partial NO_x$  versus longitude for autumn (shown as black plus signs) overlaid with the corresponding spring, summer, winter and annual data averaged over 30° longitude bins. Whilst there is considerable scatter in the 235 autumn data points, a series of low  $\partial O_3/\partial NO_x$  points is apparent between 0° and 10° E. The average  $\partial O_3/\partial NO_x$  over 0° – 100°E was found to be 18.3 ppb ppb<sup>-1</sup> per 5 days, compared with 26.8 ppb ppb<sup>-1</sup> per 5 days elsewhere. The lowest point with  $\partial O_3/\partial NO_x = 10.7$  ppb ppb<sup>-1</sup> per 5 days was found at (23.86°E, 57.92°N) over the Baltic region on a great-circle flight from London, UK to Peking, China. The maximum point with  $\partial O_3/\partial NO_x = 37.5$  ppb ppb<sup>-1</sup> per 5 days was found at (101.81°E, 29.8°N) over China on great-circle flights from Paris, France and Munich, Germany to Hong Kong, China. These maxima and minima serve to reinforce the general trend with  $\partial O_3/\partial NO_x$  decreasing polewards and increasing towards lower latitudes.

To aid the exploration of the geographical variations in the NO<sub>x</sub> – O<sub>3</sub> impact metric  $\partial O_3/\partial NO_x$ , Table 2 presents the averages over 30° longitude x 10° latitude cells for each

season. The 235 flight path locations are distributed over 40 cells, with significant variations in occupancy, as dictated by our choice of intercontinental flight departures and arrivals. In winter, the impact metric varied from 19 to 35 ppb ppb<sup>-1</sup> per 5 days, with an average of 22.2 ppb ppb<sup>-1</sup> per 5 days. The maximum impact metric occurred over southern China and was found to be about 60% higher than the seasonal average. This location is associated with the intercontinental flight paths from Europe to Asia. In spring, the impact metric varied from 6 to 29 ppb ppb<sup>-1</sup> per 5 days, with an average of 14.8 ppb ppb<sup>-1</sup> per 5 days, significantly lower than the winter seasonal average. The maximum occurred over southern China, again, as in the winter season but a factor of two higher than the spring season average.

The summer values of the impact metric varied from 17 to 33 ppb ppb<sup>-1</sup> per 5 days, with an average of 26.0 ppb ppb<sup>-1</sup> per 5 days, the highest of all four seasons. The maximum metric was found over northern China, south east Russia, a location associated with intercontinental flights from North America to Asia. The impact metric varied from 17 to 35 ppb ppb<sup>-1</sup> per 5 days during autumn, with an average of 25.4 ppb ppb<sup>-1</sup> per 5 days. The maximum impact metric was found over central China, some 40% higher than the seasonal average, associated with intercontinental flight paths from Europe to Asia.

A notable feature of the impacts of NO<sub>x</sub> upon O<sub>3</sub> in the intercontinental air traffic corridors is that the impact metrics are not spatially invariant, indeed they are highly spatially variable. The spatial variability of the impact metrics implies that there is a highly non-linear relationship between O<sub>3</sub> and NO<sub>x</sub>. This non-linearity is more pronounced at low-NO<sub>x</sub> levels. We can illustrate this non-linearity by plotting out the NO<sub>x</sub> – O<sub>3</sub> impact metrics versus background NO<sub>x</sub> for spring in the intercontinental air traffic corridors as shown in Figure 6. The impact of the non-linear chemistry is most noticeable at low-NO<sub>x</sub> levels. A consequence of this non-linearity is that care must be taken in setting up the background environmental conditions for CTM/box model calculations, hence our use of ‘no aircraft’ emissions.

In summary, we have employed a robust NO<sub>x</sub> – O<sub>3</sub> impact metric to explore locations within the intercontinental air traffic corridors that are likely to be more or less strongly impacted by aircraft NO<sub>x</sub> emissions. O<sub>3</sub> levels in the region bounded by 20 – 50°N and 90 – 150°E, over Asia, are much more strongly impacted by NO<sub>x</sub> compared to air traffic corridor averages. These impacts could be up to a factor of two stronger compared to air traffic corridor averages. Trans-polar routes are associated with regions where the NO<sub>x</sub> – O<sub>3</sub> impact metrics are over a factor of two lower than air traffic corridor averages.

#### 4. Discussion and conclusions

This study, a CTM/box model approach has been employed to quantify the ozone versus NO<sub>x</sub> sensitivity in air traffic corridors over time-scales of hours and over distance scales appropriate to aircraft flight paths. An important feature of this study is the marked contrast that the CTM/box model approach offers over the global CTM models currently used to assess the impacts of aviation NO<sub>x</sub> on ozone and their mitigation options. We show how the concepts of NO<sub>x</sub>-sensitive and VOC-sensitive can be applied successfully in the air traffic corridors through detailed comparisons with indicator species ratios such as: O<sub>3</sub>/NO<sub>z</sub>, HCHO/NO<sub>2</sub>, H<sub>2</sub>O<sub>2</sub>/HNO<sub>3</sub> and α<sup>CH<sub>3</sub>O<sub>2</sub></sup>. By this means, we are able to demonstrate that the impact of NO<sub>x</sub> on the rate of photochemical ozone production in the box model is likely to be a robust indicator of the impact of aircraft NO<sub>x</sub> on O<sub>3</sub> levels in the air traffic corridors of the UTLS. To this end, an impact metric  $\partial O_3 / \partial NO_x$  has been defined for use in identifying

those locations in the air traffic corridors that are more and less likely to be impacted by aircraft NO<sub>x</sub> emissions.

Taking all 235 flight locations, all four seasons, we found an average photochemical ozone production that was equivalent to an O<sub>3</sub> productivity of about 4 – 5 molecules of O<sub>3</sub> produced per molecule of NO<sub>x</sub> oxidised in the intercontinental air corridors of the UTLS. This O<sub>3</sub> productivity is exactly similar to that found on the urban and regional scales in the European polluted boundary layer where the productivity was found to be between 4 – 6 molecules per molecule (Derwent and Davies, 1994). Our study is also comparable to the study of Song et al. (2022) who showed 1–6 molecules of O<sub>3</sub> production for each NO<sub>x</sub> molecule oxidized at a polluted city in China, Guangdong. O<sub>3</sub> productivities in the range of 2 – 12 have been reported in US studies as reviewed by Zaveri et al., (2003), who reported a productivity of  $4.7 \pm 0.2$  in the Southern Oxidant Study, in excellent agreement with our findings.

The O<sub>3</sub> versus NO<sub>x</sub> sensitivities found here with the CTM/box model approach appear to be significantly smaller than reported in global CTM studies of aviation impacts and their mitigation. For example, Stevenson and Derwent (2009) find OPEs of between 6 and 24 O<sub>3</sub> molecules per NO<sub>x</sub> molecule whilst Dahlmann et al. (2011) report an efficiency of 50 O<sub>3</sub> molecules per NO<sub>x</sub> molecules for aviation. Lee et al., (2010) (in their Figure 13) report globally integrated OPEs in the range 13 – 42 from seven early literature studies of the global impacts of aircraft NO<sub>x</sub> emissions. These ozone productivities from global CTM studies are up to 10 times higher than we have found here with the CTM/box model approach. In addition to the OPEs, Lee et al., (2010) also report the short-term radiative forcing from the additional O<sub>3</sub> as  $36.9 \text{ mWm}^{-2} / \text{Tg N yr}^{-1}$  from the same seven early studies. Sovde et al., 2014 reviewed three CTM and two climate-chemistry models and reported a short-term radiative forcing of  $27.4 \text{ mWm}^{-2} / \text{Tg N yr}^{-1}$ . Recent reviews quote  $36.0 \text{ mWm}^{-2} / \text{Tg N yr}^{-1}$  (Lee et al., 2021), so it appears that more recent global CTM studies are also showing similar elevated OPEs.

It is concluded that this contrast is likely to be due in part to the larger spatial scale of the global CTMs which leads to the spreading of the aviation NO<sub>x</sub> emissions over 100s of kilometres and maintains NO<sub>x</sub> emissions over timescales of a month, an order of magnitude longer than the CTM/box model approach used here. This conclusion supports the findings of Lee et al., (2023) that coarse resolution global CTMs have overestimated aviation's impacts on air quality because they are unable to resolve local-scale effects.

Average  $\partial\text{O}_3/\partial\text{NO}_x$  values over the 235 flight locations showed evidence of a seasonal variation.  $\partial\text{O}_3/\partial\text{NO}_x$  peaked in the summer season, was slightly lower in autumn and reached a minimum in spring. The winter O<sub>3</sub> productivity was close to the annual average. The peak solar flux is located at about 20°N during summer and thus the photochemistry due to more incoming solar radiation between 30°N and 60°N covering 235 flight locations during summer is more rapid resulting in higher ozone production than that during other seasons. Our study showed the summer values of the impact metric is higher at midlatitudes (40°N–60°N) compared with lower latitudes (<40°N), which is consistent with Maruhashi et al. (2022) and Gauss et al. (2006). The winter O<sub>3</sub> production in our study was smaller than that found by Maruhashi et al. (2022) and Frömming et al. (2021). In our study, the winter low latitudes showed the highest O<sub>3</sub> productivities relative to mid-latitudes. Similar trends are seen for autumn and spring. The latitudinal variations for different seasons in our study

are found to be consistent with Maruhashi et al. (2022), Frömming et al. (2021), Rosanka et al. (2020), Stevenson and Derwent (2009), Köhler et al. (2008), Köhler et al. (2013), Grewe and Stenke (2008), Berntsen et al. (2005) studies.

It is further concluded that the widening of the spatial scales and extension of timescales found in global CTM studies does not appear to have inadvertently hidden the geographical variations found here with the CTM/box model approach, with O<sub>3</sub> versus NO<sub>x</sub> sensitivities appearing largest in low latitudes and smallest in high latitudes. We have shown that NO<sub>x</sub> impacts are significantly smaller and but not distributed differently across northern midlatitudes, as a result of the different time and distance scales employed in the CTM/box model approach. Trans-polar routes are associated with regions that are much less strongly impacted by NO<sub>x</sub> as the low latitude routes into Asia. Further research will be required to confirm our assessment of those air traffic corridors that appear to show greatest NO<sub>x</sub> – O<sub>3</sub> impacts and those the least. Consideration should be given to a metric or measure which considers NO<sub>x</sub> – O<sub>3</sub> climate impacts. The climate-optimal aircraft routing may have the potential for a drastic climate impact reduction in a relatively short time-frame, whilst requiring minimal technology changes to the current fleet and ground information.

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Table 1. Details of the 21 flight paths studied, giving flight lengths, start and end locations and three-letter airport codes.

No.	Route	Flight length, hours	Flight start and end locations, airport codes
1	CDG-JFK	10	Paris (CDG) – New York (JFK)
2	PEK-MUC	10	Beijing (PEK) – Munich (MUC)
3	HKG-JFK	16	Hong Kong (HKG) – New York
4	PEK-JFK	14	Beijing – New York
5	CDG-HKG	12	Paris – Hong Kong
6	CDG-PEK	11	Paris - Beijing
7	CDG-SFO	11	Paris – San Francisco (SFO)
8	HKG-JFK	16	Hong Kong – New York
9	PEK-LHR	11	Beijing – London (LHR)
10	PEK-YVR	11	Beijing – Vancouver (YVR)
11	SFO-PEK	12	San Francisco – Beijing
12	HKG-LHR	12	Hong Kong – London
13	HKG-MUC	11	Hong Kong - Munich
14	HKG-SFO	14	Hong Kong – San Francisco
15	HKG-YVR	13	Hong Kong – Vancouver
16	LHR-JFK	8	London – New York
17	LHR-SFO	11	London – San Francisco
18	LHR-YVR	10	London – Vancouver
19	MUC-JFK	9	Munich – New York
20	MUC-SFO	12	Munich – San Francisco
21	MUC-YVR	11	Munich – Vancouver

Table 2. NO<sub>x</sub> – O<sub>3</sub> impact metric  $\partial O_3/\partial NO_x$  averaged over each 30° longitude and 10° latitude cell during each season in the intercontinental air traffic corridors.

Latitude range, °N	180 – 150°W	150 – 120°W	120 – 90°W	90 – 60°W	60 – 30°W	30 – 0°W	30 – 60°E	60 – 90°E	90 – 120°E	120 – 150°E	150 – 180°E
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<b>Winter</b>											
80 – 90°N		19	19							20	19
70 – 80°N			19	19	22	22				21	
60 – 70°N	21	22	22	20	22	23	24	22	21	22	22
50 – 60°N	20	23	23	21	22	24	22	22	22	20	20
40 – 50°N		25	24	21				26	23	19	
30 – 40°N									31	22	
20 – 30°N									35		
<b>Spring</b>											
80 – 90°N		8	10							6	8
70 – 80°N			10	8	13	13				9	
60 – 70°N	11	8	11	10	17	15	14	10	14	12	10
50 – 60°N	14	14	14	15	16	17	18	18	18	19	18
40 – 50°N		16	12	19				24	23	21	
30 – 40°N									27	24	
20 – 30°N									29		
<b>Summer</b>											
80 – 90°N		17	19							20	21
70 – 80°N			24	22	21	20				25	
60 – 70°N	24	25	24	24	23	23	26	27	25	27	25
50 – 60°N	28	26	28	28	30	26	27	28	31	31	32
40 – 50°N		27	30	33				31	33	33	
30 – 40°N									24	30	
20 – 30°N									25		
<b>Autumn</b>											
80 – 90°N		23	23							24	24
70 – 80°N			26	25	28	27				24	
60 – 70°N	26	27	29	27	28	23	17	18	21	24	26
50 – 60°N	28	29	29	25	26	20	18	21	23	25	26
40 – 50°N		32	30	23				24	24	24	
30 – 40°N									35	29	
20 – 30°N									34		

Notes: the maximum in each season is shown with a yellow highlight.

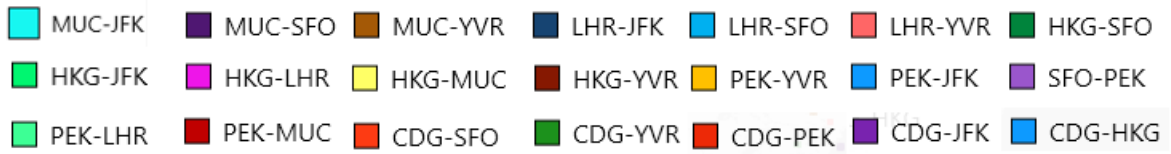


Figure 1. Locations of the hourly points on 21 intercontinental flight paths in which 11 left Europe bound for North America and Asia and 10 left Asia bound for Europe and North America. Details of the three-letter airport codes are given in Table 1.

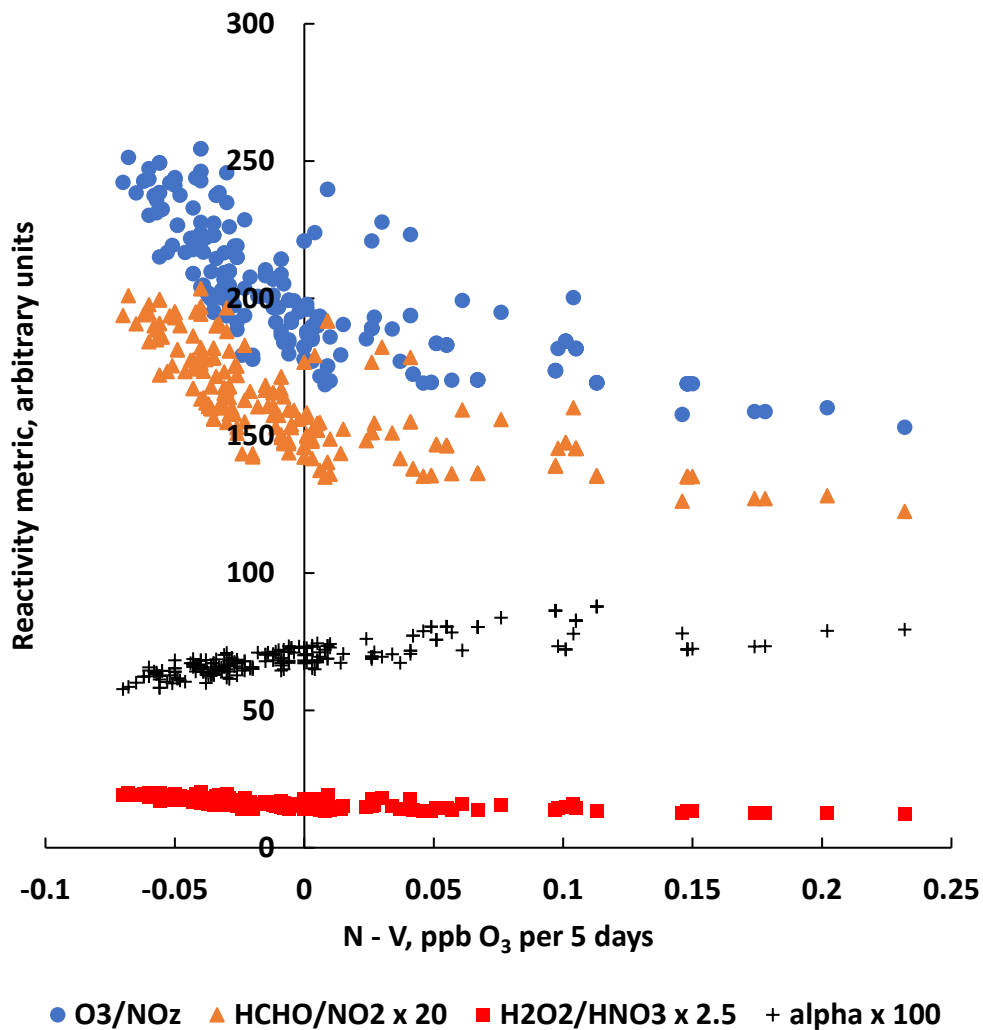


Figure 2. Scatter plot of  $N - V$  versus four independent indicator species and their ratios for the 235 flight path locations, showing the reactivity metric  $O_3/NO_z$  (filled circles),  $HCHO/NO_2$  (scaled by a factor of 25, filled triangles),  $H_2O_2/HNO_3$  (scaled by a factor of 25, filled squares) and  $\alpha^{CH_3O_2}$  (scaled by a factor of 100, plus signs).

a. January



b. April



c. July



d). October



Figure 3a-d. NO<sub>x</sub> – O<sub>3</sub> impact metric  $\partial O_3/\partial NO_x$  in ppb ppb<sup>-1</sup> per 5days for each hourly flight path location during each season in the intercontinental air traffic corridors.

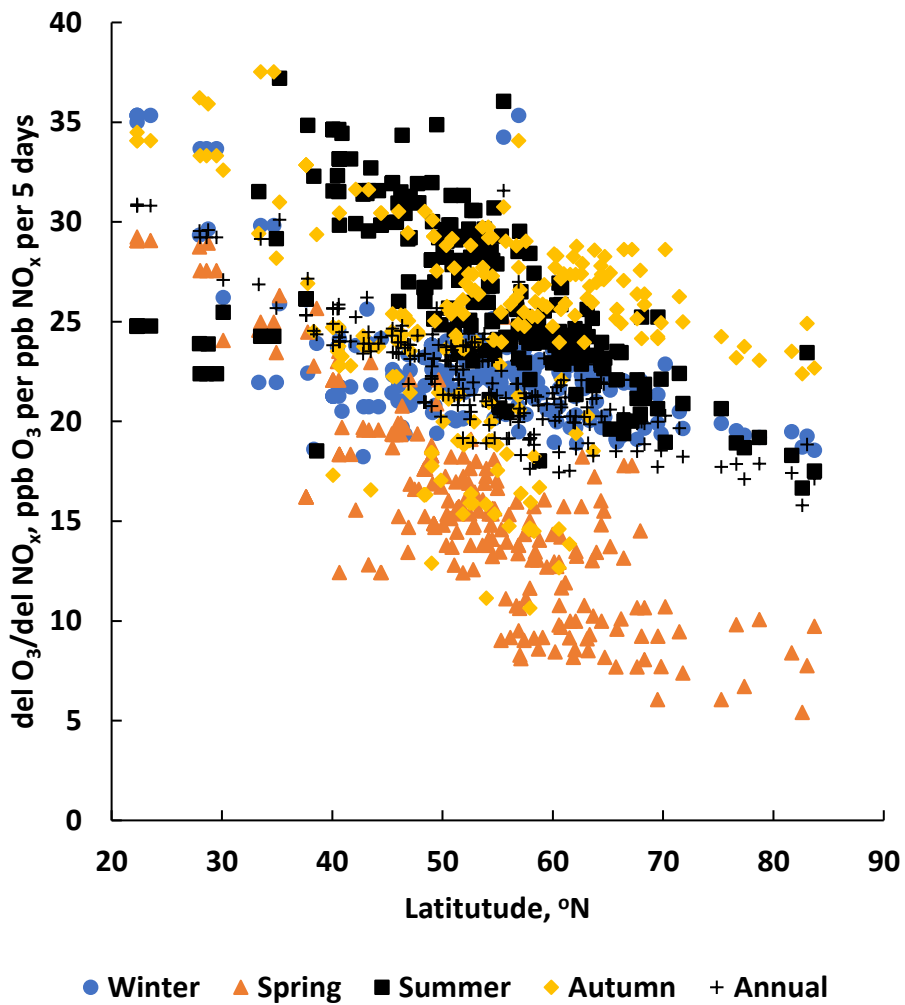


Figure 4. A scatter plot of the impact metric  $\partial O_3/\partial NO_x$  in ppb  $O_3$  per ppb  $NO_x$  per 5 days versus latitude in °North, showing winter points (filled circles), spring (filled triangles), summer (filled squares), autumn (filled lozenges) and annual points (plus signs).



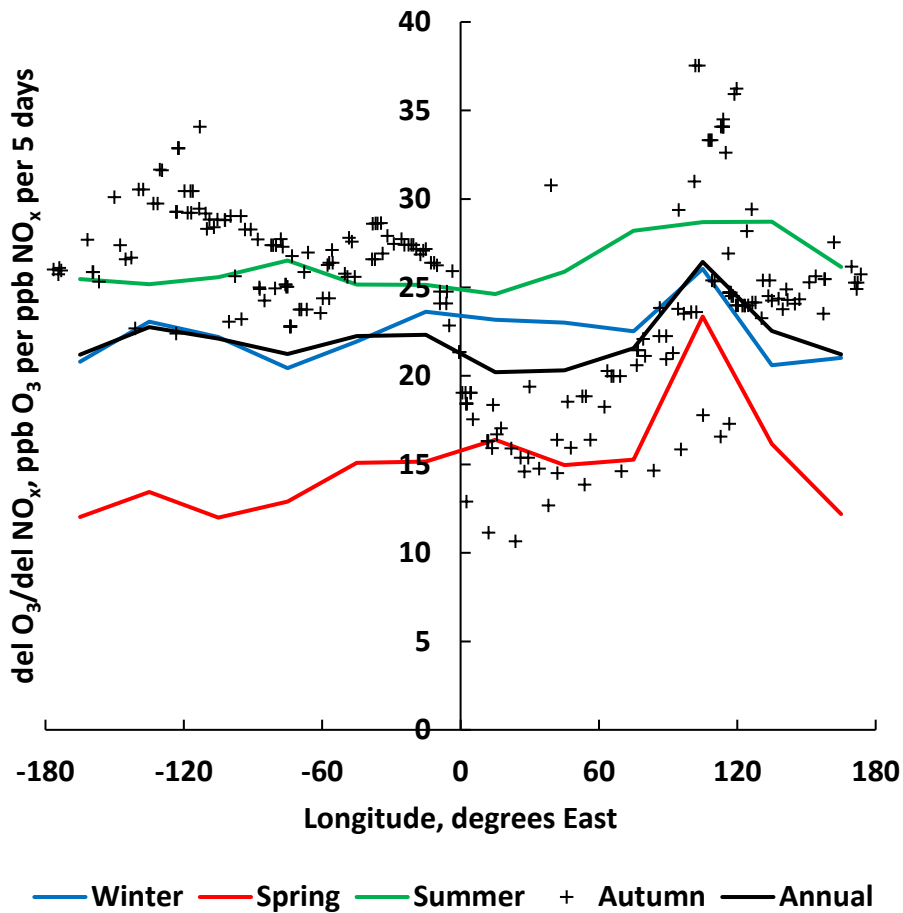


Figure 5. Scatter plot of  $\partial O_3/\partial NO_x$  versus longitude (plus signs) for autumn overplotted with the corresponding winter, spring, summer and annual data versus averaged longitude in  $30^\circ$  degree bins (coloured lines).

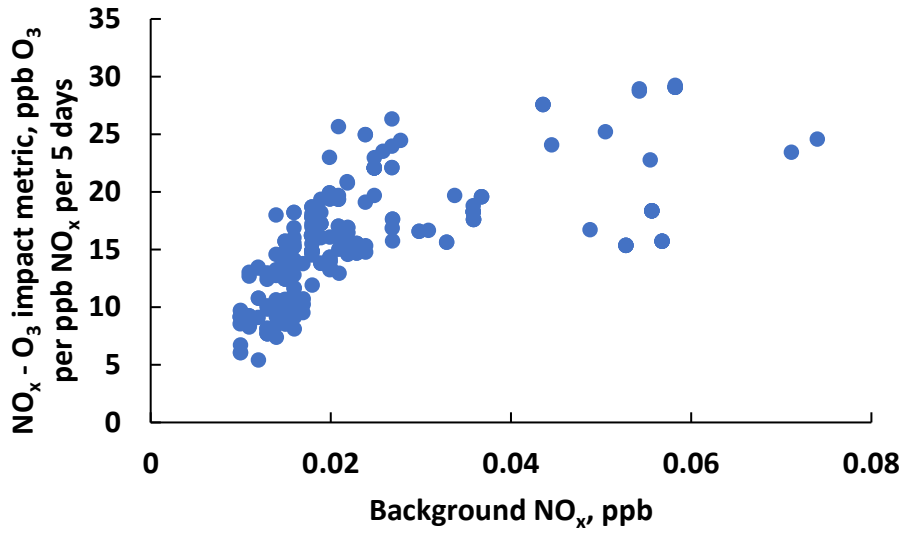


Figure 6. Scatter plot of the NO<sub>x</sub> – O<sub>3</sub> impact metric versus background NO<sub>x</sub> for spring conditions for the 235 flight path locations.