## Research article Tropospheric ozone (O<sub>3</sub>) pollution in Johannesburg, South Africa: Exceedances, diurnal cycles, seasonality, O<sub>2</sub> chemistry and O<sub>3</sub> production rate

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#### Abstract

Ground-level ozone  $(O_3)$  is an air pollutant of major health and environmental concern. The Johannesburg-Pretoria megacity in South Africa is the industrial and economical capital of the country with more than 10 million inhabitants experiencing poor air quality. In 2004, the City of Johannesburg (CoJ) began monitoring trace gases to assess ground-level  $O_3$  pollution. Here, we use CoJ's publicly available air quality data, and present the first long-term data analysis of  $O_3$ , nitric oxide (NO), nitrogen dioxide (NO $_2$ ), NO $_4$  and carbon monoxide (CO) in the City from 2004 to 2011 at three air quality monitoring sites: Buccleuch, Delta Park and Newtown. We quantified CoJ's South African National Ambient Air Quality Standards (NAAQS) exceedances for  $O_3$  and NO $_2$ , and demonstrate the City's substantial  $O_3$  and NO $_2$  air pollution problem.  $O_3$  mixing ratios peak in the early afternoon as expected due to photochemical production. To estimate  $O_3$  production rates, we summed  $O_3$  and NO $_2$  diurnal profiles to obtain  $O_4$  mixing ratios at each site. This analysis provided insight into missing volatile organic compound (VOC) reactivity as well as primary NO $_2$  emissions information necessary for developing tropospheric  $O_3$  pollution mitigation strategies. Furthermore, CoJ experiences high  $O_3$  mixing ratios on weekends due to lower NO $_4$  traffic emissions titrating the  $O_3$ , thereby providing evidence of a VOC-limited regime for  $O_3$  production. Seasonal peak  $O_3$  occurs in the austral spring, a maximum that we link to increases in water (H $_2$ O) concentrations which in turn increases radical chemistry leading to  $O_3$ . In addition, wintertime VOC and aerosol emissions from biomass burning over the winter add important precursors for  $O_3$  formation once radical chemistry is initiated during the first rain events in early spring. In all, this study will help inform air quality modelling and policy work on air pollutants in the City of Johannesburg, South Africa.

## Keywords

ozone, nitrogen oxides, Ox, air quality, air pollution, monitoring, Johannesburg, South Africa

## Introduction

Ground-level ozone  $(O_3)$  is a major component of photochemical smog (Jacobs, 1999). It can negatively impact human health and the environment by causing oxidative stress in the human lungs and/or in plant stomata (Monks et al., 2015; Sillman, 2003).  $O_3$  is a stressor on agricultural crops, and consequently on the world's food supply (Mills et al., 2018; Wilkinson et al., 2012).  $O_3$  has been labelled as the most difficult pollutant to bring into compliance with air quality standards (Jacobs, 1999).

 $O_3$  is termed a secondary pollutant because it is formed in the atmosphere from precursor gases such as nitrogen oxides ( $NO_x$ ) and volatile organic compounds (VOCs) in the presence of sunlight (Jacobs, 1999; Pusede et al., 2015). However,  $O_3$  has a non-linear dependence on the concentrations of its precursors and thus is notoriously difficult to manage and mitigate. NO and  $NO_2$  interconvert rapidly in the atmosphere and their sum is denoted as  $NO_x$  (Figure 1). Daytime photolysis of  $NO_2$  leads to the production of an O atom (Reaction 1) which then goes on to

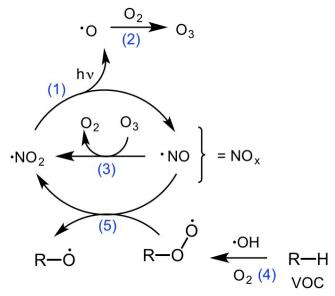
react with abundant oxygen molecules to form  $O_3$  (Reaction 2) and involves a third body molecule, most likely  $N_2$  (Figure 1).  $O_3$  is also destroyed by NO to regenerate  $NO_2$ , thus forming a null cycle (Reaction 3), traditionally termed the photo-stationary state (Jacobs, 1999). We subsequently refer to Reaction 3 as  $O_3$  titration. However, if NO is converted back into  $NO_2$  by peroxy radicals (RO $_2$ ) (Reaction 5), the latter originating from oxidation of VOCs often by OH radicals or direct photolysis (Reaction 4),  $O_3$  production ensues (Figure 1). It is the regeneration of  $NO_2$  from Reaction 5 instead of from Reaction 3 that leads to  $O_3$  production  $P(O_2)$  and therefore to ground-level  $O_3$  pollution.

Understanding the termination reactions that remove RO<sub>3</sub> and NO<sub>2</sub> radicals from this cycle are important in assessing O<sub>2</sub> production. In an area with elevated NO<sub>2</sub> mixing ratios, NO<sub>2</sub> can irreversibly react with OH to form nitric acid, HNO<sub>2</sub> (Reaction 6), which is soluble and will be washed out by wet deposition (Figure 1). The other termination pathway occurs in low NO regions when RO<sub>2</sub> (including HO<sub>2</sub>) radicals self-react to from ROOR (including H<sub>2</sub>O<sub>2</sub>) and O<sub>2</sub> (Reaction 7) (Figure 1). The latter pathway is negligible in urban areas where considerable NO, mixing ratios are expected. Furthermore, we define the sum of O<sub>3</sub> and NO<sub>3</sub> as O<sub>4</sub>, used as proxy for total oxidants in the atmosphere (Geddes et al., 2009). NO, and VOC emissions can vary considerably depending on location, yet O2 pollution is typically a regional problem due to the transport of precursors from their emission points, further complicating its source apportionment.

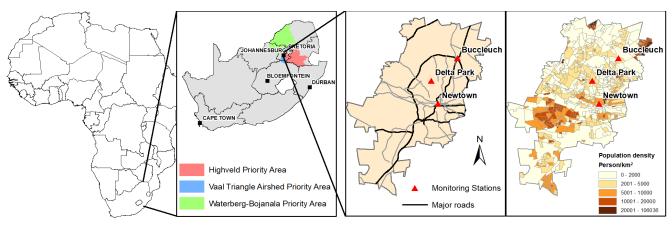
Tropospheric O<sub>3</sub> mixing ratios in southern Africa remain high, often exceeding air quality standards. A lack of spatiotemporal monitoring as well as elevated precursor emissions (Mills et al., 2018) hinders abilities to mitigate O<sub>3</sub> pollution. South Africa is one of the few countries on the African continent to have comprehensive air quality legislation (Schwela, 2012). The National Environmental Management: Air Quality Act (Act 39 of 2004) (AQA) enacted in 2004 identifies near-surface O<sub>2</sub> as a criteria pollutant. The National Ambient Air Quality Standards (NAAQS) for  $O_a$  was set in 2009 at 61 ppb (120  $\mu g/m^3$ ) for an 8-hour running average, with 11 allowable hourly exceedances per year (Sonjica, 2009). In South Africa, air quality priority areas can be declared for specific regions which consistently exceed standards, or are expected to exceed in the near future, and which require specific air quality management actions from a national level to improve air quality (Legislation, 2005). There are currently three air quality priority areas within South Africa, namely the Vaal Triangle Airshed Priority Area (VTAPA) (van Schalkwyk, DEAT, 2006), the Highveld Priority Area (HPA) (van Schalkwyk, DEAT, 2007) and the Waterberg-Bojanala Priority Area (WBPA) (DEA, 2012). A southern portion of the city of Johannesburg falls within the VTAPA, while the HPA borders the city to the east (Figure 2). The WBPA is approximately 75 km to the north of the city.

The City of Johannesburg (CoJ) is a rapidly growing urban area within the Gauteng Province of South Africa and is also the most populous city within the province (Figure 2). It is a noticeably higher altitude city at an elevation of 1750 m a.s.l. It

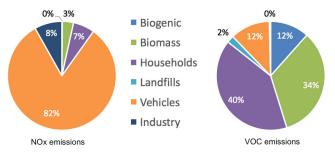
is the most economically active in the country, contributing 17% to the country's GDP (Parks Tau and Fowler, 2016). Amidst this economic activity and development, CoJ experiences degraded air quality due to emissions from sources such as a rapidly increasing commercial and private vehicle fleets, household fuel combustion of coal, wood, liquefied petroleum gas and paraffin, mine tailing dumps, and various other industries (Figure 3) (CSIR and Airshed Professionals, 2019). Additionally, emissions emanating outside the city boundaries can also impact the urban air quality, such as a 420 MW pulverized coal fired power plant (Kelvin Power Station) outside the north-eastern edge of the city, as well as pollutants emitted in the adjacent priority areas. Emissions from adjacent priority areas include those from 13 of the country's 15 coal-fired power stations with an installed nominal capacity of 38.5 GW. In addition, CoJ is impacted by large-scale biomass burning that occurs in southern Africa in the austral winter and early spring, from June to October (Archibald et al., 2010; Giglio et al., 2006). NO is emitted through high temperature combustion from sources such as vehicles and coal-fired power stations; as well as natural sources such as lightning strikes (Maseko et al., 2021). VOC emissions have a variety of sources to the atmosphere, which may be natural (biomass burning or biogenic) or anthropogenic, including from transport, industrial and residential sectors. Indeed, an air quality study in South Africa attributed continental O2 to biomass and residential burning (Laban et al., 2018). From the Irene O<sub>2</sub> sondes launch station 15 km north-east of CoJ, biomass burning and long-range transport are known to have important impacts on the variability and magnitude of column O<sub>3</sub> (Diab et al., 2004; Raghunandan et al., 2007; Thompson et al., 2007; Witte et al., 2017). However, there has been less research on groundlevel O<sub>2</sub> mixing ratios in Johannesburg and surrounding regions; though there have been some long-term measurements of O<sub>3</sub> in South Africa (Balashov et al., 2014; Krohm, 1993; Rorich and Galpin, 1998).



**Figure 1:** The mechanism for O<sub>3</sub> production involves NO<sub>3</sub>, VOCs and sunlight. The individual reactions are labelled according to the reactions in the text. Importantly, Reaction 3 is the O<sub>3</sub> titration reaction (Jacobs, 1999).

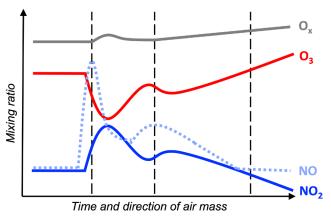


**Figure 2:** Maps of the study area within the context of the African continent, of South Africa and the Highveld Area as well as of Johannesburg. The three air quality monitoring stations, Buccleuch, Delta Park and Newtown are depicted as red triangles within Johannesburg. The population density (2015) is represented by the color scale.



**Figure 3:** Johannesburg emissions share by sector and  $O_3$  precursor of total tonnage per year (CSIR and Airshed Professionals, 2019).

Literature on ground-level O<sub>2</sub> mixing ratios in and around CoJ is primarily based on previous passive sampling measurements of monthly O<sub>2</sub> mixing ratios with some continuous monitoring (Zunckel et al., 2004). Indeed, in the 1980s, Oa levels were already known to be unusually high, with a recorded peak of 302 ppbv in the spring of 1984 in Johannesburg (Stevens, 1987). Furthermore, there were 84 exceedances of the previous US EPA hourly standard (80 ppbv) for the time period between 1984-winter 1985 (Stevens, 1987). In that study, emissions from traffic were identified as a key contributor to NO pollution. However, between 2005-2007, monthly averages of O<sub>2</sub>, measured by passive sampling, ranged between 0 and 43 ppbv at a rural site (Josipovic et al., 2010). Lourens et al. in 2011 saw few exceedances of the NAAQS in O<sub>2</sub> and NO<sub>2</sub> from passive sampling between 2007 and 2008, but did observe an anticorrelation between high spring O<sub>3</sub> mixing ratios and low spring NO, likely indicative of a VOC-limited regime. A study of groundlevel O<sub>3</sub> data of 1990-2007 in the Mpumalanga Province (east of Johannesburg) found no statistically significant trend in annual O<sub>3</sub>, and only one station exhibited a slight negative trend (-0.92 ppb/yr) in spring O<sub>3</sub> averages (Balashov et al., 2014). In addition, four out of five stations studied in Mpumalanga Province showed sensitivity to ENSO in December-May, with El Niño amplifying O<sub>3</sub> formation (Balashov et al., 2014). Measurement sites in the VTAPA, which include the Diepkloof site in the southern part of CoJ, recorded exceedances of the NAAOS as well as a seasonal increase in springtime O<sub>3</sub> (Govender and Sivakumar, 2019). Most of these studies conclude that further research in the Johannesburg-Pretoria Megacity area is needed.



**Figure 4:** Mixing ratios of  $O_x$  ( $O_3$  +  $NO_2$ ) as a function of air mass transport of a plume containing NO,  $NO_2$  and  $O_3$ . As a polluted air mass travels downwind of its emission source, along the x-axis,  $O_3$  and  $NO_2$  concentrations interconvert, and so  $O_x$  calculations allow the visualization of the sum of gas phase oxidants. Note that point source increases in  $NO_2$  can also lead to increases in  $O_x$ .

CoJ installed an air quality monitoring network in 2004 to quantify the extent of its air quality problem in its metropolitan area. Since then, air quality data including ozone (O<sub>3</sub>), nitrogen oxides (NO and NO<sub>2</sub>) and carbon monoxide (CO) have been measured in real time. In this study, we looked at a dataset from 2004 to 2011 of hourly O<sub>2</sub> mixing ratios and its precursors, namely NO, NO, NO, and CO, measured at three different monitoring sites within CoJ. Importantly, we quantify O, the sum of NO<sub>2</sub> and O<sub>3</sub>, to estimate the photochemical production of O<sub>3</sub> on a regional scale (see Figure 4). To mitigate tropospheric O<sub>2</sub> pollution, we must develop strategies to lower O<sub>2</sub> production rates, and O<sub>v</sub> represents a good proxy for this rate (Geddes et al., 2009; Sokhi et al., 2021). To be clear, high O<sub>3</sub> mixing ratios do not equate to high O<sub>3</sub> production rates because of the nonlinear formation of this secondary pollutant (see Figure 9 for examples). Since O<sub>2</sub> and NO<sub>3</sub> interconvert rapidly between each other and form a null cycle (R1, R2 and R3 in Figure 1), changes in either one of these pollutants do not necessarily translate into changes in ozone production (see Figure 4). Furthermore, as a polluted air mass travels downwind of its emission source, O<sub>3</sub> and NO<sub>2</sub> concentrations continue to interconvert, and so O<sub>2</sub> calculations allow the visualization of the sum of gas phase oxidants (Figure 4). We recommend considering  $O_x$  chemistry for  $O_3$  pollution mitigation strategies. Through this analysis, we aim to better understand  $O_3$  pollution within the city to better characterize the pollution and its drivers, and thus inform air quality management.

## **Methods**

## Description of studied area

The City of Johannesburg (CoJ) is surrounded by other populous cities (e.g. City of Tshwane), as well as heavily industrialized areas. Specifically, Ekurhuleni Metropolitan Municipality and Mpumalanga Province lie to the east, and the Vaal Triangle lies to the south (Figure 2). The southern part of Johannesburg falls within the Vaal Triangle Airshed Priority Area, and the Highveld Priority Area borders the city to the east (Figure 2). The recently declared Waterberg-Bojanala Priority Area is to the north and northeast of Johannesburg. Thus, transboundary pollution from these priority areas is a concern for the city.

## **Monitoring stations**

#### **Dataset length and availability**

The hourly air quality and meteorological data from four monitoring sites, Buccleuch, Delta Park, Newtown and Alexandra (Figure 2) were acquired through the South African Air Quality Information Systems (SAAQIS; https://saaqis.environment.gov. za) with permission from CoJ.  $O_3$  was measured at the Alexandra site from 2004 to 2008, but the data collection ended in 2008. Since the Alexandra time-series represented only 3.5 years of data, we omitted this site from our analysis. Therefore, only three air quality monitoring sites, Buccleuch, Delta Park, and Newtown, were chosen for this study for their  $O_3$  measurement availability from 2004 to 2011. After 2011, the data availability dropped significantly, and we therefore focus our analysis on the continuous time-series of pollutants between 2004-2011.

Relative humidity (RH) and dewpoint temperature data for the seasonal analysis were not available at Buccleuch, Delta Park or Newtown, and so we used RH, temperature and dewpoint temperature data from the Global Hourly Integrated Surface Database hosted by NOAA. We used weather data from 2004-2011 at the nearby location of OR Tambo International Airport considered part of the broader CoJ metropolitan area.

#### **Site descriptions**

The Buccleuch, Delta Park and Newtown sites are influenced by traffic, residential, and urban environments, respectively. The Buccleuch site (26.0453°S; 28.0991°E) is located at the interchange of three major highways (4 – 6 lanes per direction), the N1, N3 and M1, in the northern part of the city (Figure 2). According to the South African National Roads Agency Limited (SANRAL) vehicle counts, over 146 million vehicles passed through the interchange in 2016, with peak volumes seen at either 08:00 or 16:00 (The South African National Roads Agency LTD, 2016). This amounts to an average daily traffic of 403 590

vehicles per day which is comparable for major metropolitan areas around the world. For context, the Springfield Interchange on the Capital Beltway around Washington DC in the United States saw 430 000 vehicles per day in a 2008 estimate (Washington Post, 2007). Additionally, the interchange between Highway 401 and Highway 400 in Toronto, Canada is considered to be Canada's busiest interchange, with a peak flow over 400 000 vehicles per day in 2004 (Nikolic et al., 2005). Thus, the Buccleuch interchange may be considered to have particularly high volumes of vehicles.

The Delta Park site (26.125°S; 28.0086°E) is situated in the middle-class residential suburb of Blairgowrie. The station itself is located in a semi- to sparsely vegetated park with an approximately 1 km² area. According to the South African National Land Cover 2018 dataset, the dominant vegetation types in the park are dense forest, woodland and natural grassland (GeoTerralmage, 2018). The nearest busy road is a four lane arterial road (Jan Smuts Avenue) 1.6 km to the north-east.

The Newtown site (26.2052°S; 28.0321°E) is located in downtown Johannesburg in the central business district at an office parking lot, 145 m to the east of the double decker section of the M1 highway.

#### Instrumentation for trace gas analysis

 $\rm O_3$  measurements were made with Thermo 49C UV photometric  $\rm O_3$  analyzer (Thermo Fisher Scientific, Franklin, MA, USA), and NO, NO $_2$  and NO $_3$  data were from measurements made with the Thermo 42C chemiluminescent gas analyser (Thermo Fisher Scientific, Franklin, MA, USA)). These instruments both use U.S. EPA Designated Methods and show equivalency to the South African monitoring standards.

We further verified our dataset for the reported BTEX (benzene, toluene, ethylbenzene and xylene) interferences to  $O_3$  measurements (Xu et al., 2018). We conclude that this interference is unlikely in this study for 2 reasons. (1) BTEX compounds are co-emitted with CO but in our study, CO was anti-correlated with  $O_3$  in CoJ's VOC-limited regime for  $O_3$  production. In other words, the higher recorded mixing ratios of  $O_3$  occurred when CO, and thus BTEX, were lower, thereby avoiding a bias in high  $O_3$  mixing ratios due to interference. (2)  $O_3$  measurements at Buccleuch, the traffic site, show a clear photochemical diurnal profile, further supporting the validity of the  $O_3$  measurements despite a high BTEX environment which would likely have peaked during morning and evening traffic (see CO diurnal profile in Figure 8A).

We also note that alkyl nitrates, such as peroxyacetyl nitrate PAN, and HONO were also likely measured by the  $\mathrm{NO}_{\mathrm{x}}$  analyzer, and thus these measurements are likely an overestimate of  $\mathrm{NO}_{\mathrm{x}}$  (Wooldridge et al., 2010). Meteorological measurements at each site included wind speed, wind direction, temperature, relative humidity, solar radiation and atmospheric pressure data, although at times these datasets were incomplete. Buccleuch and Newtown also had available intermittent CO data measured

by a Thermo Model 48C CO analyser. Finally, Buccleuch had incomplete BTEX data and it was deemed unusable for data analysis. This study looks at the available data from July 2004 to December 2011, after which time, the data completeness decreases dramatically and thus is unreliable.

## Data analysis

#### **Data quality control**

These monitoring stations are intended to be continuous; however numerous issues relating to instrumentation errors, technical problems and power-failures have resulted in incomplete datasets throughout the 2004-2011 study period. Although the data can be publicly requested, we unfortunately do not have access to instrument logs, logbooks or flagged data. Consequently, our data quality control focused on obvious invalid data such as multi-day identical values (unrealistic for short lived species), negative values (nonsensical) and infinity values ("inf", nonsensical). Note that we did first look for baseline drifts which could have occurred due to lack of calibrations, but there was no obvious drift to account for (see Figures S1 and S2). The hourly concentrations were rounded to the nearest integer for  $O_3$  and  $NO_9$ , and to the nearest tenth of a decimal for CO.

To further substantiate the data quality control analysis, diurnal plots for all pollutants were generated with raw versus quality controlled data, to ensure no significant differences were introduced during our quality control. For example, diurnal profiles of CO at Buccleuch showed no difference in mean, concluding that our quality control methods have not altered the overall dataset (Figure S3).

#### **Data completeness**

Data completeness varied between years and months but did not show a significant difference between weekdays and weekends. Furthermore, no clear difference in data completeness was observed between seasons and hours of the day, indicating that despite incompleteness, the quality-controlled data showed good representativeness. In all, data availability over the 8-year period across sites binned hourly ranged between 58.8-77.3% for  $O_3$ , 54.3-64.1% for  $NO_x$  and 40.5-66.4% for  $CO_x$ , all with standard deviations of less than 5.2% (Table S6).

#### Statistical analysis

The quality-controlled datasets were checked for normal vs lognormal distributions. All inspected pollutant data showed lognormal distribution, indicating that the data was skewed to lower concentrations, which is typically observed in environmental and air quality observations (Limpert et al., 2001). Indeed, high values were observed, although at lower frequencies. Diurnal cycle plots are used to demonstrate daily profiles of O<sub>3</sub> and its precursors.

Statistics for the seasonal analysis were conducted in R using the Simple linear regression method, with the lm() function from the stats package. We report R<sup>2</sup> values of the regression models for quantifying how much variability of the monthly mixing ratios

of the trace gases can be explained by the change of time. We also report the p-values of the trend slopes, with p-value < 0.01 considered to represent a significant trend.

We attempted to look at trends in  $O_3$ ,  $NO_2$  and  $O_x$  over our study period, but the dataset is too short to draw conclusions (Figure S11).

#### Air quality exceedance calculations

 $\rm O_3$  and  $\rm NO_2$  exceedances were calculated based on the NAAQS for South Africa. An  $\rm O_3$  exceedance is an 8-hour running average concentration above 61 ppbv, with an annual allowance of 11 hourly exceedances. The prescribed  $\rm O_3$  exceedance is not limited to one exceedance per day, like the WHO (World Health Organization, 2021) and US EPA standards (US EPA, 2020), but rather any 8-h running average that exceeds 61 ppbv. Therefore, multiple exceedances per day can occur in South Africa.  $\rm NO_2$  exceedances are defined as those above 106 ppbv and 21 ppbv for hourly and yearly averages, respectively. 88  $\rm NO_2$  hourly exceedances per year and zero  $\rm NO_2$  yearly exceedances are allowed by the NAAQS.

#### H<sub>2</sub>O concentrations calculations

The partial pressure of H<sub>2</sub>O was calculated using the dew point temperature as input into the Tetens equation (mbar):

$$p_{H20} = 0.61078 \times \exp(17.27 \times \text{dewpointT/(dewpointT + 243.04)}) \times 10$$

The saturation vapour pressure of  $\rm H_2O$  was also calculated using the ambient recorded temperature within the Tetens equation and subsequently converted into  $\rm H_2O$  partial pressure using the RH data. Both methods corroborate the partial pressure of  $\rm H_2O$ . The concentration of  $\rm H_2O$  was then calculated using:

$$N_{H20} = \frac{P_{H20}A_V}{RT}$$

where  $A_v$  is Avogadro's number, R is the gas constant and T is the ambient temperature in K.  $H_2O$  concentrations are reported in molecules/cm<sup>3</sup>.

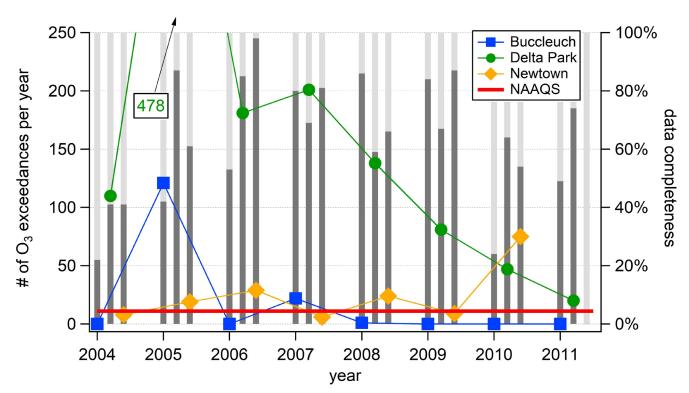
#### Data analysis software

Finally, plots were generated using either R version 3.4.1 or IGOR version 7.

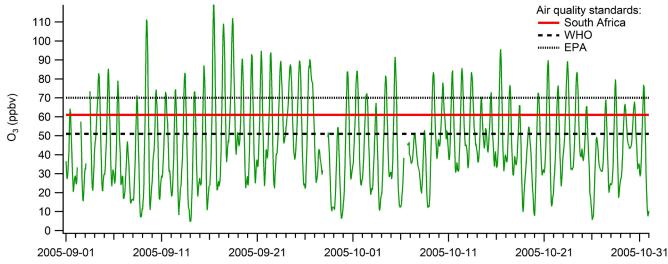
## Results and discussion

## O<sub>3</sub> exceedances in Johannesburg

 $O_3$  mixing ratios from three air quality monitoring sites show exceedances according to South Africa NAAQS (Figure 5). The number of yearly  $O_3$  exceedances from 2004-2011 at Buccleuch, Delta Park and Newtown ranged between 0 – 121, 20 – 427 and 6 – 75, respectively, out of a possible 8 760 hours (Figure 5 and Table S1). Note that since NAAQS exceedances are calculated on an hourly basis in South Africa, multiple exceedances per day are possible. Because of variable data completeness, the number of  $O_3$  exceedances likely represent a lower bound (Figure 5). Clearly, CoJ has a substantial and quantifiable ground-level  $O_3$  pollution problem, particularly at Delta Park.



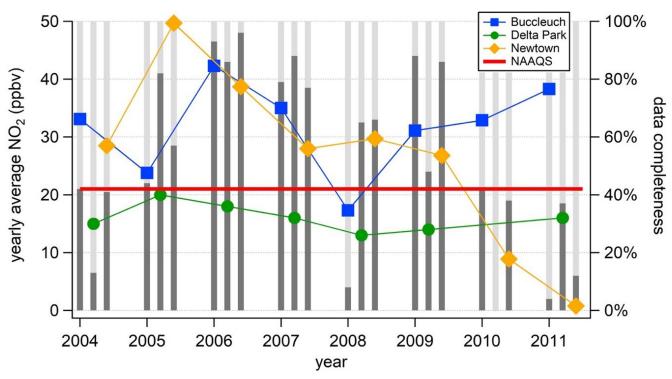
**Figure 5:** Number of  $O_3$  exceedances per year at Buccleuch, Delta Park and Newtown over the study period. The  $O_3$  exceedances were calculated using 8-h running averages of  $O_3$  at each monitoring station. The data completeness percentage is plotted as the grey bars and helps interpret the number of exceedances.



**Figure 6:** Time series of 8-h running average of  $O_3$  mixing ratios at Delta Park from September-October 2005 during an excessively high  $O_3$  pollution period. Red line represents the South African NAAQS. The 2015 US EPA standards (70 ppbv as the fourth-highest daily maximum 8-hour concentration, averaged across three consecutive years) and 2021 WHO guidelines (100  $\mu$ g/m³, or 50 ppbv, 8-hour daily maximum) are presented as references.

There are clear differences in the number of  $O_3$  exceedances per site.  $O_3$  exceedances occurred at Delta Park every year, with 478 recorded exceedances in 2005. Delta Park is a residential site and was initially intended to be an urban background site, however, it clearly experiences the highest  $O_3$  pollution, concurrently with lower  $NO_x$  concentrations. On the other hand, at Buccleuch, a heavily traffic influenced site, few annual  $O_3$  exceedances were observed. This low frequency of exceedance at Buccleuch is attributed to NO titrating  $O_3$  mixing ratios through Reaction 3 in Figure 1. At Delta Park, this titration does not occur to the same

extent, leading to higher  $O_3$  mixing ratios. Newtown is an innercity site near a busy road and experiences  $O_3$  exceedances near the NAAQS; however not as many as at Delta Park. Of note, a concerning sustained high  $O_3$  pollution period occurred at Delta Park from September to October 2005 (Figure 6, Table S1). 8-h running average  $O_3$  exceeded the 61 ppbv set by NAAQS, 51 out of 61 days during the spring of 2005 (Figure 6). Delta Park is in a residential area within Johannesburg, and we expect these high  $O_3$  mixing ratios had non-negligible effects on the health of the residents in the spring of 2005.



**Figure 7:** Annual average NO<sub>2</sub> per year, indicating years in exceedance of the NAAQS at Buccleuch, Delta Park and Newtown over the study period. The yearly NO<sub>2</sub> averages were calculated using hourly NO<sub>2</sub> data from each monitoring station. Data completeness percentage is plotted as the dark grey bars and helps interpret the number of exceedances.

CoJ is not the only city in South Africa to experience large numbers of  $O_3$  exceedances of the NAAQS. At the Marikana monitoring station located in a mining area northwest of CoJ,  $O_3$  exceedances of NAAQS more than 322 times per year were measured between February 2008 and May 2010 (Venter et al., 2012). These exceedances were attributed to regional air masses bringing  $O_3$  precursors to the monitoring site. In the Mpumalanga Province monitoring sites in the Highveld Priority Area (see Figure 2), annual  $O_3$  exceedances across five sites for 2012-2014 were between 17-761 per year (Lukey, Peter et al., 2011). The Vaal Priority Area also experienced notable exceedances over the period of 2007-2017, but were not numbered (Govender and Sivakumar, 2019). This large number of exceedances in the areas surrounding Johannesburg highlights that  $O_3$  pollution is an issue across the region.

## NO<sub>2</sub> exceedances in Johannesburg

Newtown and Buccleuch have high exceedances of the  $\mathrm{NO}_2$  annual NAAQS (21 ppbv), with yearly averages of  $\mathrm{NO}_2$  mixing ratios up to 49.7 ppbv and 42.3 ppbv, respectively, over the 8-year study period (Figure 7 and Table S2). The available data ranged from 0% to 96% completeness, and thus is important to consider when analysing the annual averages and number of exceedances calculated (Figure 7). Nonetheless, Buccleuch and Newtown appeared to consistently exceed the annual NAAQS for  $\mathrm{NO}_2$ , whereas Delta Park showed no exceedances in  $\mathrm{NO}_2$  regardless of the data fraction available. Since the lifetime of  $\mathrm{NO}_2$  in the boundary layer is relatively short (approximately 6 hours in summer time), it is often co-located with its sources, which in this case are majorly traffic emissions (see Figure 3) (Pusede et al., 2015).

## Diurnal profiles of O<sub>3</sub>, NO<sub>3</sub> and CO

Hourly diurnal profiles of O<sub>3</sub>, NO<sub>3</sub> and CO display strong timeof-day dependence at the sites (Figure 8 and refer to Tables S3, S4, S5 and S6). O<sub>2</sub> peaked in the afternoon as expected, coinciding with peak solar irradiance necessary for its photochemical production. The lowest O<sub>3</sub> mixing ratios were recorded during morning rush hour around 7:00AM, concurrent with high NO traffic emissions titrating O<sub>3</sub> from R3 in Figure 1 (Figure 8). Increasing O<sub>2</sub> mixing ratios overnight were perhaps due to the entrainment of residual O<sub>2</sub> above the shallow nocturnal boundary layer. O<sub>3</sub> mixing ratios were consistently anti-correlated with traffic emitted  $\mathrm{NO}_{\mathrm{x}}$ , as expected from the formation mechanism of O<sub>2</sub> from the photolysis of NO<sub>2</sub> (R1 and R2 in Figure 1). At all sites, the evening peak in NO<sub>v</sub> coincided with slightly higher NO2, indicative of a shallower boundary layer trapping pollutants and/or of a change in emission sources. Despite these similarities, Buccleuch, Delta Park and Newton had important differences in diurnal profiles of these criteria pollutants.

Buccleuch's diurnal profile showed remarkably high  $\mathrm{NO_x}$  mixing ratios, peaking around 250 ppbv every morning from traffic emitted NO (Figure 8A). Over 400 000 vehicles pass by the Buccleuch interchange on average per day (See Figure S10 for diurnal variation in hourly traffic counts) (The South African National Roads Agency LTD, 2016). NO clearly remains the major component of  $\mathrm{NO_x}$  throughout the day as expected for this traffic site (Figure 8A). Furthermore, the  $\mathrm{CO/NO_x}$  ratio is slightly lower in the evening from 7:00 PM to 11:00 PM, indicating a change in source emissions from traffic to other types of incomplete combustion sources (Figure 8A). In addition, domestic coal

combustion in nearby low-income settlements for cooking and heating could be contributing to the nighttime (from 11:00 PM to 5:00 AM) increased ratio of CO/NO<sub>2</sub> at Buccleuch.

Delta Park  $O_3$  mixing ratios are distinctively high with an average of 48 ppbv at 2:00 PM over the 8-year period (Figure 8B). Lower  $NO_x$  mixing ratios contribute to higher  $O_3$  levels at Delta Park, because less  $O_3$  titration is occurring (R3). Of note, the morning rush hour peak of  $NO_x$  at this station saw similar contributions from NO and  $NO_2$ , suggesting localized NO traffic emissions are low, reaching only 25 ppbv in the morning (Figure 8B). Average  $O_3$  mixing ratios peaked an hour later at Delta Park in comparison to the other stations. We hypothesize that in the presence of less  $NO_x$  compared to Buccleuch and Newtown,  $O_3$  production can peak later in the day at Delta Park (Figure 8).

Air pollutants at Newtown have intermediate mixing ratios between Buccleuch, a highly traffic influenced site, and Delta Park, a residential site (Figure 8). Newtown is located in downtown CoJ in an office parking lot, and experiences influences from medium to heavy traffic on the M1, 145 m to the west and light traffic from the immediate street. The morning rush hour signal at Newtown is similar in timing and composition to Buccleuch's, albeit in lower absolute concentrations (Figure 8). Newtown's diurnal profile also supports intermediate exceedances in both  $\rm O_3$  and  $\rm NO_x$  (Figure 5 and S1). Finally, CO mixing ratios follow an anthropogenic emission profile related to traffic emissions similar to Buccleuch.

# Ox $(NO_2 + O_3)$ chemistry to estimate $O_3$ production

The observed anticorrelation between  $O_3$  and  $NO_2$  in Figure 8 is difficult to interpret due to the dual role of  $NO_x$  (1) as an  $O_3$  precursor (R1 and R2 in Figure 1) and (2) as a temporary  $O_3$  reservoir (R3 in Figure 1). In other words, since  $O_3$  and  $NO_2$  interconvert rapidly between each other and form a null cycle (R1, R2 and R3 in Figure 1), increases in  $O_3$  are not necessarily proportional to chemical  $O_3$  production (Figure 4). Nonetheless, mitigation of regional  $O_3$  pollution depends strongly on controlling and understanding  $O_3$  production rates (Geddes et al., 2009). We therefore use  $O_x$  as the sum of  $NO_2$  and  $O_3$  to address this rapid interconversion and, assuming negligible direct sources of  $NO_2$ , we can use changes in  $O_x$  over time as a proxy for chemical  $O_3$  production from VOC oxidation (R4 and R5 in Figure 1 and Figure 4) (Clapp and Jenkin, 2001; Mazzeo et al., 2005; Sokhi et al., 2021).

The multi-year average diurnal profile of  $O_x$  is different at each location (Figure 9). During daytime, we can assume that the rise in  $O_x$  is solely driven by chemical  $O_3$  production, since  $NO_2$  mixing ratios are relatively constant (Figure 8). We can therefore approximate average  $O_3$  production rates from the change in  $O_x$  over time ( $\Delta[O_x]/\Delta t$ ). In other words, the steeper the slope of the  $O_x$  between 8:00 AM and 1:00 PM, the faster the rate of  $O_3$  production (Figure 9). At Buccleuch, Delta Park and Newtown, the estimated multi-year average  $O_3$  production rates were 3.3 ppb  $h^{-1}$ , 3.5 ppb  $h^{-1}$  and 2.7 ppb  $h^{-1}$ , respectively from 2004 to 2011 (Figure 9). We hypothesize that at the traffic site, there

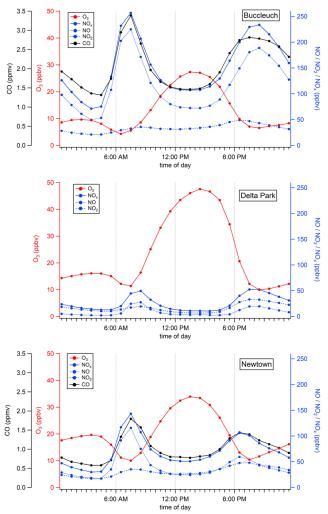
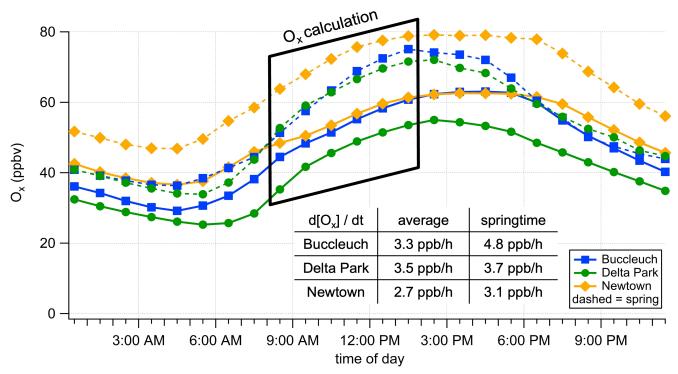


Figure 8: Multi-year averaged diurnal profiles at Buccleuch (A), Delta Park (B) and Newtown (C) with available data presented in Figure 5 and S1. Of note, axes on the three graphs are set to identical values for comparison. Standard deviations are not included here for clarity, but are presented in Tables S3, S4 and S5 for Buccleuch, Delta Park and Newtown, respectively. The data completeness for this figure is presented in Table S6 and shows consistent data availability throughout all the hours of the day. The data points are presented at the half hour as the average of the full hour.

must be high VOC reactivity to drive high  $\rm O_3$  production rates in the presence of peaks of 250 ppbv of  $\rm NO_x$  (Figure 8). We can further infer that the oxidative capacity at Buccleuch is highest.

## Weekend O<sub>3</sub> effect and evidence of a VOClimited regime

At all three sites, higher  $O_3$  mixing ratios were observed during the weekend, a previously documented observation in cities termed the "weekend effect" (Figure 10) (Murphy et al., 2007, 2006). During the weekend, lower NO mixing ratios are reported at Newtown (blue arrow in Figure 10), concurrent with higher  $O_3$  mixing ratios (red arrow in Figure 10). Govender and Sivakumar, (2019) also noticed that  $O_3$  mixing ratios were higher on Saturdays and Sundays in the Vaal Priority Area. This observation at the same site may be evidence of a VOC-limited regime for  $O_3$  production, but requires accounting for a decrease in the temporary titration effect of near-field NO sources.



**Figure 9:** Multi-year average O<sub>x</sub> diurnal profiles as a function of time-of-day for each sites provides the rate of change of O<sub>x</sub> which can be used to approximate O<sub>x</sub> production rates. The peak O<sub>x</sub> production in the springtime is earlier and steeper than the multi-year average, which also includes springtime data. P(O) is estimated to be equivalent to P(O) during the linear increase between 8:00 AM and 1:00 PM.

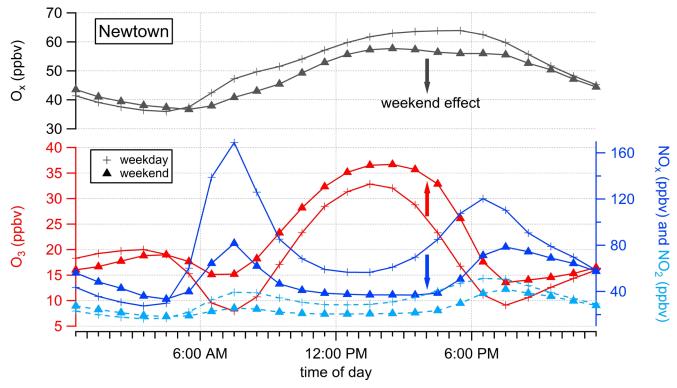


Figure 10: O<sub>3</sub> (in red), NO<sub>3</sub> (in blue) and O<sub>4</sub> (in grey) data at Newtown over the study period plotted as a function of day and separated into weekday (crosses) and weekend (triangles) diurnals. O<sub>4</sub> is shown to highlight the absence of a titration mechanism. We conducted this analysis for Newtown only for consistency with our O<sub>3</sub> production analysis in Section 8.

We looked at  $O_x$  ( $NO_2 + O_3$ ) diurnal profiles during the weekday and weekend at Newtown as a proxy for  $O_3$  production rates. Interestingly,  $O_x$  mixing ratios are lower on weekends than on weekdays by 8 ppbv (grey arrow in Figure 10). Assuming that

VOC reactivity is not strongly dependent on day of the week (given local emissions are dominated by household activities as seen in Figure 3), this weekend  $O_x$  decrease can be explained by two scenarios. First,  $O_3$  production rates in the region are

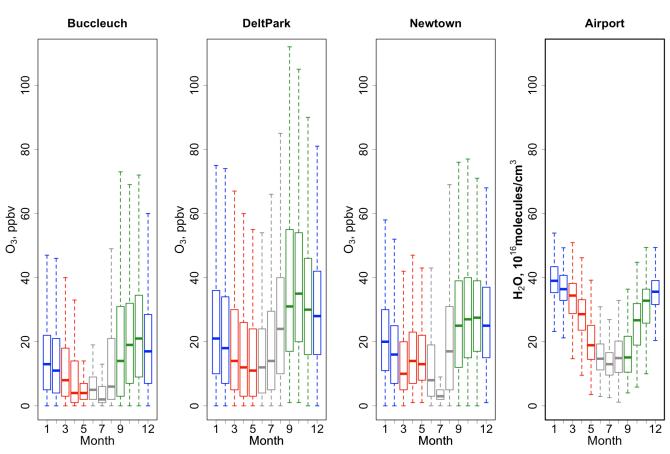


Figure 11: Box and whisker plots of monthly  $O_3$  mixing ratios at Buccleuch, Delta Park and Newtown as well as monthly  $H_2O$  concentrations at OR Tambo airport, colour coded by season where blue is summer (DJF), red is autumn (MAM), grey is winter (JJA) and green is spring (SON). The line is the median and the box limits show the  $25^{th}$  and  $75^{th}$  percentile and the lower and upper whiskers the  $1^{st}$  and  $99^{th}$  percentile. Corresponding monthly and seasonal solar irradiance data, although with incomplete datasets for Delta Park and Newtown, show an austral springtime and summer maxima, indicating that solar irradiance is not the only driving factor in the clear springtime  $O_3$  high in Johannesburg (Figure S5).

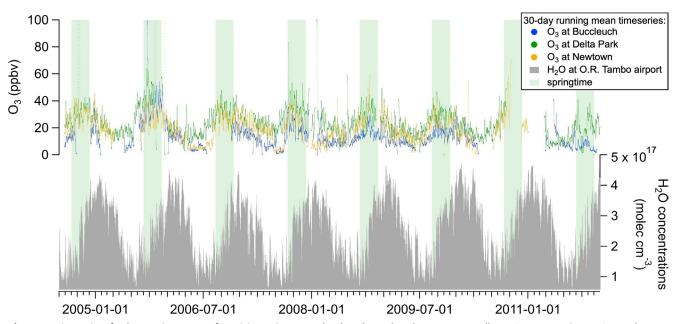
 $NO_x$ -limited, leading to  $O_x$  decreasing with decreasing in  $NO_x$  emission. Or second, there is a significant direct source of  $NO_2$  in the  $NO_x$  emissions which confound the use of  $O_x$  as a proxy for  $O_3$  production. In the following section, we use a mathematical model to argue that  $O_3$  production rates in this region are highly VOC-limited and we therefore reject the first scenario. The most likely culprit for the weekend  $O_x$  behaviour is direct emissions of  $NO_2$  from diesel fuels (Carslaw, 2005). In situations of  $NO_2$  direct emissions, we advise caution in interpreting  $O_x$  changes over time as indicative of  $O_3$  production rates. It is noteworthy that the weekend effect analysis which looked at changing  $O_3$  and  $NO_2$  mixing ratios, provided insight into likely  $NO_2$  direct emissions at Newtown.

## Seasonality of O<sub>3</sub>

 ${
m O_3}$  mixing ratios displayed a clear seasonality in CoJ (Figure 11), consistent with findings from the 2000 SAFARI field campaigns (Swap et al., 2002a) as well as from sites in north-eastern South Africa (Govender and Sivakumar, 2019; Laban et al., 2018). Buccleuch, Delta Park and Newtown experienced the highest ground-level  ${
m O_3}$  mixing ratios in the springtime, and notably the highest values were recorded at Delta Park (Figure 11). The seasonality of NO at all sites peaked in the wintertime, consistent with a shallow winter boundary layer and increased burning of

domestic fuel for heating (Figure S6).  $NO_2$  mixing ratios did not have as clear of a seasonality, although they peaked slightly during the wintertime (Figure S7). However, the magnitude of the  $NO_2$  mixing ratios is different between each site with implications for  $O_3$  production (Figure 8, S7, S8 and S9). Indeed,  $O_x$  mixing ratios also peaked in the spring at all sites (Figure S9), indicative of higher  $O_3$  production rates.

We also isolated average springtime  $O_x$  mixing ratios as a function of time-of-day to estimate changes in  $O_3$  production in the spring (Figure 9). Clearly, springtime  $O_x$  increased at all stations and during each hour of the day compared to annual means (Figure 9, dashed lines). At Buccleuch, Delta Park and Newtown, the average estimated  $O_3$  production rates from the calculated instantaneous  $O_x$  production rates during the spring are 4.8 ppb  $h^{-1}$ , 3.7 ppb  $h^{-1}$  and 3.1 ppb  $h^{-1}$ , respectively (Figure 9). These values are all higher than the calculated  $P(O_x)$  values using the data from all seasons, indicating that  $O_3$  production rates may be faster in the spring. Springtime  $O_3$  highs are therefore consistent with (1) increased  $O_3$  production and with (2) increased  $O_x$  even during the nighttime. The following section explores potential mechanisms leading to increased  $O_3$  production rates.



**Figure 12:** Timeseries of 3-day running means of  $O_3$  mixing ratios at Buccleuch, Delta Park and Newtown as well as  $H_2O$  concentrations at OR Tambo airport (JNB) east of CoJ. The  $H_2O$  concentrations were calculated using the dew point temperature reported hourly at OR Tambo airport in the broader Johannesburg area to the east of the three stations. The  $H_2O$  concentrations were also corroborated by the RH and T data at the same station. There is a remarkable connection between the onset of increasing  $H_2O$  concentrations in the late winter and high  $O_3$  mixing ratios, highlighted by the springtime green shaded regions.

# Mechanism for springtime increased O<sub>3</sub> production rates and the role of RH

High O<sub>2</sub> mixing ratios in the spring over CoJ may be attributed to meteorological effects, such as solar irradiance, relative humidity, temperature, stratospheric intrusions, etc. In addition to enhanced photochemical production, large synoptic effects may also impact springtime O<sub>3</sub> in CoJ by bringing in air masses with different precursors, such as biomass burning events (Laban et al., 2018; Swap et al., 2002b). In comparison to South Africa, North American and European cities have documented peak seasonal O<sub>3</sub> in summertime correlated to peak solar irradiance (Petetin et al., 2018; Pusede et al., 2015). Peak summertime O, across the United States has also been shown to correlate with low relative humidity through a mechanism involving dry deposition to leaf stomata (Kavassalis and Murphy, 2017). On the other hand, springtime O<sub>3</sub> has recently been shown to correlate with relative humidity in the interior of South Africa (Laban et al., 2020). Finally, there is evidence of springtime O<sub>3</sub> highs in the western US due to stratospheric intrusions of high altitude cites (Lin et al., 2012). There is the possibility that springtime O<sub>2</sub> caused by stratospheric O<sub>2</sub> intrusions could also be relevant for CoJ, which lies on the Gauteng plateau at 1750 m a.s.l. Mkololo et al., (2020) identified these phenomena using sonde data at a site approximately 30 km northeast of Delta Park, indicating the potential of O<sub>2</sub> intrusions in CoJ. Here, we further explore the mechanisms behind the seasonality of O<sub>2</sub> with data available at the monitoring sites.

CoJ has a dry winter season and a wet summer season, although summertime cloud cover often occurs in the evenings accompanied by thunderstorms. We had access to solar irradiance (Figure S5) and temperature at Buccleuch, Delta Park

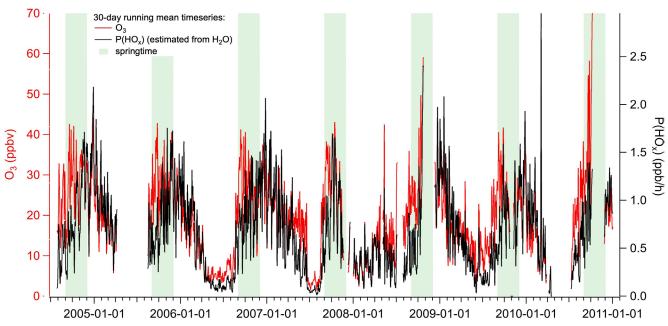
and Newtown as well as dew point temperature data from a nearby location which we used to calculate H<sub>2</sub>O concentrations (Figure 12) to investigate a seasonal meteorological effect on O<sub>3</sub>.

#### Minor role of solar irradiance and temperature

The seasonality of the solar irradiance shows that springtime irradiance is similar to summertime, and slightly higher than in wintertime (Figure S5, where the Buccleuch data is the most complete and reliable). This observation suggests that increased irradiance is not the primary driver of increased  $\rm O_3$  mixing ratios in the spring. Furthermore,  $\rm O_3$  exceedances at Buccleuch were not found to correlate with temperature (Figure S4), and thus temperature is unlikely to be responsible for seasonal  $\rm O_3$  variability (Wilkinson et al., 2012).

#### Intermediate role of O<sub>3</sub> precursor emissions

Next, we considered O<sub>3</sub> precursor emissions. Veld fires are common during the dry winters in CoJ and emit large concentrations of aerosols (Hersey et al., 2015; Segakweng et al., 2022). In fact, biomass burning has been identified as the instigator for high O<sub>3</sub> events such as those over Pretoria 12 Sept 1985 (Pillay et al., 1994) and in the Vaal Priority Area on 2 June 2013 (Feig et al., 2014). There is also recent evidence of an aerosol-inhibited regime where O<sub>3</sub> mixing ratios are reduced due to heterogeneous chemistry (Ivatt et al., 2022). Particulate matter concentrations in CoJ are highest in the wintertime (Hersey et al., 2015) concurrently with the lowest O<sub>3</sub> mixing ratios and thus this aerosol-inhibited mechanism would be worth exploring for South Africa. However, if biomass burning was responsible for increased O<sub>3</sub> production, we would have expected the seasonality of  ${\rm O_{_3}}$  to start peaking in mid-winter, which is clearly not observed. So why is the onset of high O and high O<sub>3</sub> only in August-September?



**Figure 13:** Timeseries of 30-day running means of  $O_3$  and of estimates of  $P(HO_2)$  based on  $H_2O$  concentrations. The shaded green areas indicate springtime (SON).

#### Major role of H<sub>2</sub>O concentrations

We found the most interesting meteorological phenomena in the H<sub>2</sub>O data, where the H<sub>2</sub>O concentrations drop by a factor of 6 in the springtime (Figure 12). We used RH and dew point temperature data from OR Tambo International Airport situated just east of the CoJ, and available by the Global Hourly Integrated Surface Database hosted by NOAA. CoJ experiences dry winters, with seasonal H<sub>2</sub>O concentrations dropping to ~5 x 10<sup>16</sup> molec/ cm3 in August (Figure 12). Since water vapour is necessary for OH radical production and consequently for the initiation of VOC oxidation leading to O<sub>3</sub> formation, it is likely that wintertime O<sub>3</sub> production is suppressed by slow initiation chemistry. To verify this hypothesis, we estimated the production of HO<sub>v</sub> (P(HO<sub>v</sub>)) radicals using Eq.1 (see SI), and subsequently used this value to estimate OH radical concentrations (Eq. 2 in the SI) (Figure 13). The calculation of OH radicals require CO and NO data and so we did this analysis for the Newtown station only, using the H<sub>2</sub>O concentrations from OR Tambo. We find a clear correlation between the onset of P(HO<sub>2</sub>), the increase in OH radicals and the increase O<sub>3</sub> in the spring (Figure 13).

Therefore, despite the presence of VOC and  $NO_x$  precursors, low  $O_3$  production rates occur in the wintertime due to the low oxidative capacity, including low OH radical concentrations, of the atmosphere to initiate VOC oxidation and to drive R4 in Figure 1. However, when the first spring rain events occur in September, and average  $H_2O$  concentrations increase, the rate of R4 increases, kickstarting  $O_3$  production rates. All the necessary precursors are then present and abundant; VOC and  $NO_x$  concentrations are high in the wintertime polluted shallow boundary layer, and facilitate radical chemistry propagation leading to  $O_3$ . Thus, we suggest that springtime O3 production rates increase in CoJ because of sharp increases in RH in the spring, leading to increases in OH radical products and thus to increases in radical initiation rates (R4 in Figure 1).

Laban et al., 2020 observed an anti-correlation between RH and  $O_3$  by Pearson correlations over the year at sites in the interior of South Africa. In our dataset, RH and  $O_3$  are also anti-correlated (Figure S12). We further emphasize the importance of measuring  $H_2O$  concentrations rather than RH in order to estimate  $P(HO_3)$ .

## **Conclusion and outlook**

#### Exceedances

We conducted a study on ground-level ozone (O2) and its precursors in the City of Johannesburg looking specifically at three different sites, Buccleuch, Delta Park and Newtown, in traffic-, residential- and urban-influenced areas, respectively, from 2004-2011. O<sub>3</sub> and NO<sub>2</sub> yearly exceedances showed inverse correlations; stations with large O<sub>2</sub> exceedances showed low NO<sub>2</sub> exceedances and vice versa. Indeed, Delta Park station is located furthest away from NO point emissions in a residential area and experienced a high number of O<sub>3</sub> exceedances. A clear weekend effect was also observed at all locations where NO concentrations, associated with transport, were significantly reduced by up to 80 ppbv on weekends, which led to higher O, mixing ratios. The hourly continuous data of O, mixing ratios presented in this study are informative for potential health impacts of O<sub>3</sub> pollution in South Africa, an impact only qualitatively captured by previous monthly passive sampling

## **VOC-limited regime**

The air quality monitoring data at the three distinctively different sites suggest a VOC-limited regime for  $O_3$  production across the entire city. Identifying Johannesburg's  $O_3$  production rate and regime allows us to speculate on the most effective mitigation strategies for air quality. Reducing  $NO_x$  concentrations by mandatory catalytic converters on engine exhausts for example

would in fact increase  $O_3$  production kinetics (assuming CO and VOC emissions are unaffected) near the highways. Rather, a more effective short-term strategy in reducing  $O_3$  in the city may be to reduce anthropogenic CO and VOC emissions. Yet, VOC measurements in Johannesburg do not exist in the literature; a clear gap to be addressed for effective air quality management in Johannesburg. Decreasing VOC emissions alongside  $NO_x$  emissions would lead to a more effective strategy to reducing  $O_3$  production in Johannesburg. As the urban plume moves further away from CoJ, less  $NO_2$  will be converted to NO and thus less  $O_3$  will be formed (R1 in Figure 1). Additional measurements at rural receptor sites in the City's outflow are needed to improve our understanding on the City's regional impact.

## Springtime O<sub>3</sub> and the role of H<sub>2</sub>O

We are proposing that increases in  $\rm H_2O$  concentrations during the first springtime rains in CoJ initiate spring-time ozone air pollution episodes. Radical chemistry is slow during dry winters despite the presence of  $\rm O_3$  precursors such as VOCs from biomass burning and  $\rm NO_x$  from traffic emissions in a low boundary layer. There is a clear correlation between the onset of rainfall in CoJ and the onset of  $\rm P(HO_x)$  production (Figure 13), despite the presence of an anti-correlation between RH and  $\rm O_3$  as observed here (Figure S12) and by Laban et al. 2020. We therefore hypothesize that changes in climate in CoJ in a warming future could lead to significant changes in ozone pollution in CoJ and in South Africa.

In all, this study further highlights the importance of long-term monitoring data in general to better understand and hence address air pollution in the hope of improving air quality, and human exposure to airborne pollutants.

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#### **Author contributions**

N.B.D and R.G. conceptualized and led the study. N.B.D and R.G. collected the data and N.B.D analysed and interpretated the data with help from R.G., M.N., B.Z and J.G.. N.B.D. wrote the manuscript and all authors contributed to the revisions.

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## Supplementary material

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