



Global Patterns and Trends in Ground-Level Ozone Chemical Formation Regimes from 1996 to 2022

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Abstract. Ground-level ozone (O_3) formation in urban areas is nonlinearly dependent on the relatively availability of its precursors: oxides of nitrogen (NO_x) and volatile organic compounds (VOCs). To mitigate O_3 pollution, a crucial question is to identify the O_3 formation regime (NO_x -limited or VOC-limited). Here we leverage ground-based O_3 observations alongside space-based observations of O_3 precursors, namely NO_2 and formaldehyde (HCHO), to study the long-term

- 10 shifts in O₃ chemical regimes across global source regions. We first derive the regime threshold values for satellite-derived HCHO/NO₂ ratio by examining its relationship with the O₃ weekend effect. We find that a regime transition from VOC-limited to NO_x-limited occurs around 3.5 for HCHO/NO₂ with regional variations. By integrating data from four satellite instruments, including GOME, SCIAMACHY, OMI, and TROPOMI, we build a 27-year (1996 2022) satellite HCHO/NO₂ record, from which we assess the long-term trends in O₃ production regimes. A discernible global trend
- 15 towards NO_x-limited regimes is evident, particularly in developed regions such as North America, Europe, and Japan, with emerging trends in developing countries like China and India over the past two decades. This shift is supported by both increasing HCHO/NO₂ ratios and a diminishing O₃ weekend effect. Yet, urban areas still hover in the VOC-limited and transitional regime on the basis of annual averages. Our findings stress the importance of adaptive emission control strategies to mitigate O₃ pollution.

20 1 Introduction

Ozone (O₃) near the surface is an air pollutant with profound implications for human health and Earth's ecological system (Chiu et al., 2023; Nuvolone et al., 2018; Mills et al., 2016; Felzer et al., 2007). It is known to cause respiratory and cardiovascular diseases (Who, 2013). Chronic exposure to O₃ has been linked to an estimated 1.04 to 1.23 million premature mortalities globally in 2010, primarily due to respiratory ailments (Malley et al., 2017), and this issue of O_3 -

25 related deaths has the potential to worsen despite the improvement of other air pollutants like fine particulate matter (Lu et al., 2018; Li et al., 2019; Wang et al., 2021). In addition to its harmful effects on human health, O₃ poses a threat to other species by inducing DNA damage in animals and affecting crop productivity and yield through disrupting the plant microflora (Manisalidis et al., 2020).

Ground-level O₃ is a secondary air pollutant, formed through photochemical reactions between oxides of nitrogen (NO_x)
 and volatile organic compounds (VOCs). At ground level, O₃ formation is mostly in NO_x-limited regime globally, especially in rural or sparsely populated regions (Monks et al., 2015). In areas with high NO_x emissions and relatively





low HCHO emissions, such as urban and metropolitan centers, O₃ formation can become NO_x-saturated, or in other words, VOC-limited. Freshly emitted NO, particularly from vehicular traffic, can locally deplete O₃ by reacting with it (Solberg et al., 2005), thereby curtailing O₃ accumulation in the immediate vicinity. Consequently, lower O₃ concentrations are

- 35 typically observed in urban areas (Paoletti et al., 2014; Simon et al., 2024). Over the past several decades, the evolution of global O₃ formation has been shaped by a complex interplay of socio-economic factors, including varying industrial activities and population movements, as well as environmental policies and changing climate (Pfister et al., 2014; Zhang et al., 2019). The combined effects of these factors are highly intricate. For instance, sustained declines in NO_x and VOCs emissions have led to reductions in peak O₃ concentrations in many developed countries, but mitigating O₃ exposure at the urban scale is still challenging owing to the nonlinearity of O₃-NO_x-VOC chemistry (Simon et al., 2016). Therefore,
- understanding the O₃ production regimes transition and its drivers are essential for devising effective mitigation strategies.

O₃ sensitivity cannot be directly observed, which is often diagnosed through analyzing the relationship between observed O₃ and its precursors, or by using measurements of indicator species such as NO_y, formaldehyde (HCHO), reactive nitrogen (NO_y), hydrogen peroxide (H₂O₂), nitric acid (HNO₃) (Tonnesen and Dennis, 2000; Sillman, 1999, 1995).

- 45 However, ground-based measurements of these indicators are often limited, making satellite remote sensing a vital alternative for expanding the monitoring of these atmospheric species. Satellites provide retrievals of two key species: HCHO (Fu et al., 2007; Palmer et al., 2003), which is nearly proportional to the summed rate of VOC reactions with hydroxyl radicals (OH) and thus serves as an effective VOCs tracer (Sillman, 1995), and nitrogen dioxide (NO₂), which is prevalent in the boundary layer atmosphere and represent the majority of NO_x (Duncan et al., 2010). The ratio of HCHO
- 50 to NO₂ (HCHO/NO₂) has been used to infer O₃-NO_x-VOC sensitivity (Choi et al., 2012; Jin and Holloway, 2015; Martin et al., 2004; Duncan et al., 2010; Jin et al., 2020; Jin et al., 2017). An important issue to use satellite HCHO/NO₂ is to determine the threshold values separating the NO_x-limited and VOC-limited regimes. Martin et al. (2004) and Duncan et al. (2010) use 1 and 2 regime threshold values, but follow-up studies show that the regime threshold values are uncertain (Jin et al., 2017; Souri et al., 2023; Wang et al., 2021; Schroder et al., 2017).
- 55 Over the past two decades, the global distributions of HCHO and NO₂ concentrations have been shaped by diverse emission reduction policies, resulting in distinct regional changes. In terms of NO₂, many anthropogenic regions have witnessed non-linear shifts or reversal years in NO₂ pollutant levels (Georgoulias et al., 2019). In developed regions such as the U.S. and European countries, substantial reductions in NO_x emissions have been achieved, largely due to stringent national regulations (Russell et al., 2012; Krotkov et al., 2016; Toro et al., 2021; Gov.Uk, 2024), whereas in developing
- 60 regions, NO_x emission reductions have normally lagged behind. According to Zhao et al. (2013), there was a surge in NO_x emissions in China until around 2010, after which a decline was observed. This decrease has been linked to technological advancements and the implementation of emission control measures in key industries (Sun et al., 2018). Given the diverse trends of O₃ precursor emissions, less is known how the O₃ production regime has changed over the past decades because of the emission changes. Here we aim to identify the long-term trends in satellite HCHO/NO₂ and
- the reversal years in different region, which could signal a change in the direction of O₃ chemical regime changes.

Another widely used method to characterize O3 formation regimes is through comparing the weekend versus weekday





difference (WE-WD) in O₃ levels and its precursors. Under high NO_x, O₃ production rates paradoxically increase as NO_x concentration fall; conversely, in scenarios with low NO_x, O₃ production rates decline. In most urban areas, characterized by high NO_x levels, O₃ concentrations frequently display a significant rise on weekends relative to weekdays. Reasons

- for this "O₃ weekend effect" can be multifaceted and region-specific, involving reduced NO_x concentrations altering VOC ratios, timing shifts in NO_x emissions, increased VOCs and NO_x emissions on weekend nights, and enhanced sunlight due to lower particulate matter emissions (Carb, 2003). This distinctive WE-WD O₃ pattern has been observed globally, first documented in New York City, U.S. (Cleveland et al., 1974), and subsequently reported in various regions including Europe (Sicard et al., 2020; Adame et al., 2014), East Asia: Tokyo, Japan (Yasuhiro et al.), the Pearl River Delta (Zou et al.)
- 75 al., 2019), the North China Plain (Wang et al., 2014), the Yangtze River Delta (Tang et al., 2008) and Taiwan (Tsai, 2005), North America: Mexico (Stephens et al., 2008) and whole U.S (Jaffe et al., 2022; Atkinson-Palombo et al., 2006), as well as major cities in Latin America: Santiago, Chile (Seguel et al., 2012) and Rio de Janeiro, Brazil (Martins et al., 2015). The varying O₃ weekend effect provides an opportunity to evaluate the chemical regimes of O₃ (Simon et al., 2024; Jin et al., 2020).
- 80 In this study, we aim to elucidate the long-term shifts in O₃ chemical regimes on a global scale using the two indicators: satellited derived HCHO/NO₂ ratios and ground-based observation of O₃ weekend effect. In Section 3.1, we examined the surface WE-WD O₃ concentration as a function of the tropospheric column HCHO/NO₂ ratio to identify the thresholds distinguishing different O₃ regimes. In Section 3.2, we analyzed the long-term trend of satellite-based HCHO/NO₂ and identified the trend reversals. These two steps set the stage for evaluating the long-term evolution of O₃ production regime.
- In Section 3.3, we synthesize above analyses with the objective of pinpointing the year when the HCHO/NO₂ ratio crossed the critical thresholds, indicating a shift from the VOC-limited to the NO_x-limited regime. The HCHO and NO₂ retrievals integrate 27-year (1996 - 2022) data from four satellite instruments: GOME/ERS-2, SCIAMACHY/ENVISAT, OMI/Aura and TROPOMI/Sentinel-5P. Finally, we assess whether the satellite-based trends in O₃ chemical regimes are consistent with long-term trends of the O₃ weekend effect in Section 3.4. Overall, our goal is to provide a view of O₃
- 90 regime changes across regions and decades, which could have implications for environmental policy and air quality management.

2 Data and Methods

2.1 Harmonized Satellite Retrievals of O₃ Precursors

- We combine satellite retrievals of tropospheric NO₂ and HCHO vertical columns from four different satellite instruments,
 including: Global Ozone Monitoring Experiment (GOME), SCanning Imaging Absorption spectroMeter for Atmospheric CHartographY (SCIAMACHY) and Ozone Monitoring Instrument (OMI) and TROPOspheric Monitoring Instrument (TROPOMI). We use satellite-based products developed under the Quality Assurance for Essential Climate Variables (QA4ECV) project, which retrieves NO₂ and HCHO consistently using the same *a priori* profile obtained from TM5-MP (Boersma et al., 2018; Williams et al., 2017; De Smedt et al., 2017; Boersma et al., 2017b, a).
- 100 The nadir resolution is 320×40 km² for GOME, 60×30 km² for SCIAMACHY, 24×13 km² for OMI and 5.5×3.5 km³ km² km²





for TROPOMI. The overpass time is around 10:00 AM local time for SCIAMACHY and GOME, ~ 1:30 PM for OMI and TROPOMI,

To build the relationship between observed O₃ weekend effect and satellite HCHO/NO₂, we mainly use OMI retrievals of HCHO and NO₂, as it provides the longest record with fine resolution suitable for studying the urban O₃ chemistry, and the overpass time of OMI is well suited to detect the O₃ formation sensitivity during the afternoon as the O₃ photochemical production peaks and when the boundary layer is high and the solar zenith angle is small, maximizing the instrument sensitivity to HCHO and NO₂ in the lower troposphere (Jin and Holloway, 2015; Jin et al., 2017). To investigate the long-term changes in HCHO/NO₂, we construct annual average HCHO and NO₂ using tropospheric NO₂ and HCHO VCD data from the GOME (1996-2001), SCIAMACHY (2002-2003) and OMI (2004-2020) and TROPOMI (2020 - 2022) datasets. GOME and SCIAMACHY and TROPOMI data are harmonized with reference to OMI data with a resolution of 0.25° × 0.25°. The retrieval and harmonization scheme are described in Jin et al. (2020).



2.2 Ground-based O₃ observations



- For O₃ data, we rely on TOAR-II database (https://toar-data.org/surface-data, last access: April 2024). Initiated by the Global Atmospheric Chemistry Project (GACP), TOAR has developed a cutting-edge database that provides hourly surface O₃ concentrations on a global scale since 1970 (Schultz et al., 2017), serving as an unparalleled resources for examining temporal trends in surface O₃ levels (Sicard et al., 2020). Notably, the observation records period various across monitoring stations, with earlier data in the U.S., Europe and Japan dating back to the 1970s-1980s, and later in
- 120 countries like the South Korea and Latin America, starting from 1995 to 2005. For China, South Africa, Southwest Asia, and densely populated Australian areas, records typically begin around 2015. To ensure rigorous study standards, we selected over 8700 stations with at least 5 consecutive years of data for our global analysis. Figure 1 illustrates the distribution of TOAR sites and main regions we focus on.





2.3 Building Connections Between Satellite HCHO/NO2 and Ground-Based WE-WD O3 Observation

- 125 We utilize monthly HCHO/NO₂ derived from the OMI to establish correlations with ground-based TOAR O₃ observation. We extract gridded daily OMI HCHO and NO₂ data ($0.25^{\circ} \times 0.25^{\circ}$) for days and grid cells with corresponding O₃ monitoring data, ensuring that both datasets are paired consistently in time and location. To quantify O₃ differences between weekends and weekdays, we designate Sunday to represent weekends and Tuesday to Thursday to represent weekdays, excluding other days to minimize carryover effects from typical workdays and rest-days. For each site and
- 130 weekly interval throughout the observation period, we calculated the mean differences in MDA8 O₃ concentrations (WE-WD O₃). Given the global scope of this analysis and the inherent complexity in defining distinct O₃ seasons across various regions, we utilize all-year data without seasonal selection. Using t-test at each site or grid to ascertain the statistical significance of WE-WD difference (p-value<0.05). For annual trends, we apply the non-parametric Mann-Kendall test (Kendall, 1975; Mann., 1945) coupled with Theil-Sen's slope estimator (Raj and Koerts, 1992; Sen, 1968). We examine</p>
- 135 the annual trends in the WE-WD O₃ over 5-year rolling intervals to mitigate the effects of interannual meteorological variability (Pierce et al., 2010).

2.4 Detection of Long-term Trend Reversal in Annual HCHO/NO2

As most regions show bi-directional trends of O_3 precursors, we hypothesize that a reversal of trend in HCHO/NO₂ can be found during our study period. To identify trend reversal years for the HCHO/NO₂ ratio at each grid point, we adopt

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the method Georgoulias et al. (2019) used in the analysis of satellite-derived NO₂ trend reversals, originally adapted by Cermak et al. (2010) for studying solar radiation and global brightening trends. The approach is briefly described as follows:

Firstly, for each grid point and for each year t, a point score S(t) is calculated to quantify the potential for a trend reversal:

$$S(t) = \frac{\min(p(B_1), \ p(B_r))}{\operatorname{abs}(B_l - B_r) \times \sigma_{B_{l+r}}}$$
(1)

- Here, B_1 , B_r and B_{1+r} represent the trends calculated over 5-year periods to the left [t 4, t], right [t, t + 4], and spanning the year [t - 4, t +4], respectively. The 5-year interval is chosen to reduce the impact of interannual meteorology variability. $p(B_1)$ and $p(B_r)$ are the probabilities (p-value) of the trend B being statistically insignificant, while $\sigma_{B_{1+r}}$ signifies the error in trend fitting. The *p*-value of the hypothesis test, with the null hypothesis being a zero slope, using a Wald test with a *t*-distribution.
- 150 The time series data for each grid and period are fitted to a linear model:

$$Y_t = A + BX_t + N_t \tag{2}$$

where Y_t is the annual mean value for year t, X_t is time variable representing the year, A is the annual mean of the first year, B is the estimated slope of trend line, and N_t represents the residual, or the discrepancy between the fitted and the





observed value.

155 A year is identified as a trend reversal year if it exhibits the lowest S(t) value, an opposite sign between B_1 and B_r ($B_1 \times B_r < 0$), and significant trend starts and ends (both $p(B_1)$ and $p(B_r) < 0.05$). Selecting the year with the lowest S(t) ensures a maximal difference in trends slope (max $|B_1 - B_r|$) on either side of the year, with the fitting error of the trend at this juncture, σ_B , being as pronounced as possible. This method is estimated to be capable of identifying reversal years with a very limited error of 0.5-1% and standard deviation between 2 and 5% (Cermak et al., 2010). The trend calculation, based on data spanning 5 years before and after each year, helps to mitigate the impact of short-term extremes in pollutant concentrations, such as the dramatic decrease in emissions during the 2020 COVID-19 pandemic. This approach allows us to identify regions with long-term changes in trends.

3 Results and Discussions



3.1 Identification of regime thresholds for satellite HCHO/NO2

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Figure 2: Scatter plot of the monthly average satellite-derived HCHO/NO₂ ratio versus the WE-WD O₃ concentration in 9 representative urban sites from 2004 to 2022. The black line represents the fitted linear regression line. Red triangles denote the intersection points of the regression line with the WE-WD O₃ = 0 baseline.

O3 formation is a highly nonlinear process in relation to NOx and VOCs. When urban areas enter weekend, NOx emissions





- 170 typically decrease due to reduced commuting and industrial activities (Figure S1). In VOC-limited regime, NOx reduction leads to increased weekend O₃ levels (positive WE-WD O₃), whereas in NO_x-limited regime, it results in decreased weekend O₃ levels (negative WE-WD O₃). In theory, a transition threshold should exist between these two regimes. Figure 2 illustrates the correlation between monthly mean HCHO/NO2 ratio from satellite data compared to the in-situ WE-WD O3 in 9 representative metropolitan cities across 4 continents, showing a clear negative correlation and a transition from positive to negative WE-WD O3 values at a specific HCHO/NO2 ratio. Assuming that O3 formation differences are 175 attributable to NO_x changes only, HCHO/NO₂ value at the WE-WD $O_3 = 0$ crossing can be considered the threshold
 - separating VOC-limited and NOx-limited regimes. For example, in Washington, D.C., this key threshold is found to be 3.2 (Figure 2 b1).





Figure 3: (a) Global map of regime transitional threshold values for HCHO/NO₂, derived by assessing the correlation between monthly HCHO/NO2 and WE-WD O3 difference. We restrict our analysis to ground sites with at least 5 years' observation. Triangles represent sites with linear regression lines fitting within the 95% confidence interval (Wald test for slope, p-value < 0.05). Specific economic regions are highlighted with red rectangles, including: Specific economic regions are highlighted with red rectangles, including: East China; Great Lakes region (GL), Cascadia region (Gas.), California (Cal.), Lower Mississippi Valley region (LMV), West Gulf Coast (WGG), and Boston-Washington Corridor (BW Cor.) in the U.S. (b) Distribution of site 185 numbers across varying threshold bins, with solid/dashed lines representing continents with >100 sites and 20-100 effective sites, respectively. (c) Box plot of thresholds in economically advanced regions of East Asia, North America, and Europe, as marked in (a). The dark-blue numbers on the right axis indicate the median threshold value for all regions presented.





By aggregating all TOAR O_3 observations based on corresponding monthly OMI data, we evaluate the thresholds through linear regression between the monthly mean WE-WD O_3 and the HCHO/NO₂ ratio at the ground-based sites with at least

- 5 years' observations. The key thresholds indicating O₃ regime shifts are identified as the critical point where WE-WD O₃ changes sign. The spatial distribution and statistical results of the identified critical points are presented in Figure 3. Globally, robust linear relationships are observed, particularly pronounced in regions such as South Korea, Japan, the U.S., and Europe (Figure 3a), which also have the highest density of monitoring stations. We find a wide distribution of thresholds across different regions (Figure 3b), implying a large spatial variability in the threshold values. Among the
- 195 sites where the linear regression is statistically significant with *p*-value < 0.05, approximately 63% of the sites have threshold values between 2 to 5, with over 80% of these sites between 2.5 and 4.7, and the mean value around 3.5. East Asia has the lowest mean threshold value at 2.8 with the minimum over the East China (2.2) and maximum over Japan (4.4) (Figure 3c). In North America, the threshold value is around 2.9, with the eastern seaboard sites averaging 2.7±1 and the sites in western region, predominantly centered in California, slightly higher at 4.5±1, and the maximum value is</p>
- 200 around 4.8, which is located in the southwest of the Great Lakes region. Europe, with the densest sites of robust linear relationship, has the second-highest critical threshold at 4.3, comparable to Latin America, and just below Australia's 4.7. In Europe, a lower threshold cluster from 2.5 to 3.5 is centered in western Germany, extending to Belgium, northeastern France, the Netherlands, and parts of eastern U.K., with similar low spots in northern Portugal, southern Spain, and northern Italy. Southwest Asia's values are centered around 3.2. Africa and Southeast Asia, with fewer than 20 effective

sites (over 5-year continuous observation), are excluded from the analyses due to limited representativeness.

It should be noted that these calculations do not account for the effects of short-term synoptic processes on temperature and the conditions affecting O₃ transport and diffusion. The regime thresholds have uncertainties, and previous studies typically assume a range for regime threshold values (Sillman, 1999; Jin et al., 2020; Jin et al., 2017). This implies that the critical threshold values identified in this study should not be considered definitive indicators that guarantee a regime

210 shift. Nonetheless, this method remains valuable for leveraging large-scale satellite data to track the global progression of O₃ regimes, especially in regions and periods where in-situ O₃ data are limited. We will further explore this using the statistically derived threshold in Section 3.3.

3.2 Long-term Trends and Trend Reversals in Satellite-based HCHO/NO2

Using satellite-based HCHO/NO₂ as a determinant for identifying O₃ chemical regimes, we assess the spatial variations and long-term evolution of O₃ chemical regime over global anthropogenic regions from 1996 to 2022. Figure 4 show the multi-year average HCHO/NO₂ ratio maps from 1996 to 2022, derived from the harmonized satellite dataset. Notable areas with extremely low HCHO/NO₂ ratios of below 1 include East China, Seoul-Suwon region in South Korea, the major urban areas of southern Honshu in Japan, and European regions centered around Belgium, the Netherlands, and eastern United Kingdom, as well as northern Italy. Local minima are found in metropolitan areas such as China's Pearl

220 River Delta, U.S. regions including Los Angeles and San Francisco, urban clusters along the East Coast, and South Africa's Johannesburg etc. These regions are likely under long-term VOC-limited regime. Regions with ratios below 2 include the extensive area of the eastern U.S., the Mumbai and Delhi-New Delhi corridor in India, and major Australian



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cities like Canberra, Sydney, and Adelaide. The distribution of areas with low HCHO/NO₂ ratio close aligns with that of high NO₂ areas (Figure S2a). NO_x emissions, primarily linked to population density and economic activities, predominantly originate from high-temperature combustion processes involving nitrogen and oxygen, such as industrial emissions and vehicle exhaust (Liu et al., 2016). With its short atmospheric lifetime of a few hours to a day, the distribution of NO₂ reflects hotspots of power generation and fossil fuel consumption (Jamali et al., 2020). In contrast, HCHO, an intermediate in the degradation of various VOCs (De Smedt et al., 2015), exhibits a more uniform distribution due to the widespread biogenic sources of VOCs (Figure S2b).



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Figure 4: Tropospheric HCHO/NO₂ ratio patterns using the self-consistent GOME, SCIAMACHY and OMI dataset for the combined period 1996 – 2022.

Figure 5 shows the long-term linear trends of tropospheric HCHO/NO₂ ratios from 1996 to 2022. Here we focus on regions with long-term mean tropospheric NO₂ column greater than 1.5×10^{15} molecules/cm² and statistically significant trends with p-value < 0.05. Globally, satellite HCHO/NO₂ shows robust linear trends but with diverse directions. In densely populated area, we find positive trend in HCHO/NO₂ over developed nations and a downward trend in HCHO/NO₂ in developing regions. Significant positive trends, averaging 0.11 ± 0.05 yr⁻¹, are observed in Japan and extensive regions of the U.S., particularly along the eastern seaboard and in California. South Korea, the mid-south U.K., north France, Belgium, and part of the Netherlands, Germany, Spain and Italy exhibit a mild decline of 0.04 ± 0.03 yr⁻¹,

240 peaking at 0.12 yr⁻¹ in the urban cluster of northeast France. In contrast, central-eastern China, eastern India, show strong negative trends of -0.1 ± 0.05 yr⁻¹, with the steepest declines seen in China's lower Yangtze River region (over -0.18 yr⁻¹) and Kolkata, India (-0.13 yr⁻¹). Weaker negative trends of less than -0.08 yr⁻¹ are also seen in eastern Europe near the Black Sea, Melbourne and Sydney, Australia and along northern Algeria's Mediterranean coast in North Africa.







245 Figure 5: Satellite-based trends of tropospheric HCHO/NO₂ ratios (1996–2022) for grids with a mean NO₂ VCD > 1.5×10^{15} (molecules \cdot cm⁻²) and statistically significant trends at the 95 % confidence level.

While we apply linear regression to identify the overall trends, trends in Figure 5 could shift due to factors like environmental policies and economic changes etc. These minor trend changes do not affect the linear fit's confidence. However, in certain areas, such as the North China Plain, significant turning points can render the linear fit insignificant. Here, rapid population growth and industrialization were followed by substantial policy-driven reductions in gaseous

pollutant emissions, leading to trend reversals that the linear model fails to capture. This indicates that areas appearing blank in Figure 5 are not necessarily trendless but may have sharp turning points.



2000 2002 2004 2006 2008 2010 2012 2014 2016 2018 *HCHO/NO*₂ trend Reversal Years (negative-to-positive trend)



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Figure 6: The year of trend reversals of tropospheric HCHO/NO₂ ratio: (a) from negative to positive and (b) from positive to negative. Only grids with a with a long-term mean tropospheric NO₂ column greater than 1.5×10^{15} molecules/cm² and statistically significant trends with p-value < 0.05 for the period before and after the year of reversals are shown.

- Next, we assess whether reversals of the trends exist in satellite HCHO/NO₂, using the methods described in Georgoulias et al. (2019). Figure 6 shows our estimated year when a persistent reversal of the trend occurs for HCHO/NO₂. We only include grid cells with statistically significant trends (*p*-value < 0.05) for both pre- and post-reversal periods. Figure 6a shows the regions where we find trend changes from negative to positive, and Figure 6b shows the regions where the trend transitioned from positive to negative. It should be noted that some regions may experience several reversals, here we only highlight the most significant trend reversals at each grid. The timing of reversals in the HCHO/NO₂ ratio is
- 265 highly variable across different regions. In Asia, particularly in East China and North India, we observed a single reversal in the HCHO/NO₂ ratio from negative to positive trends around 2011. Conversely, major city clusters in North America exhibit a contrasting trend, with a significant shift from positive to negative trends occurring around 2012-2016. European countries generally display multiple distinct trend reversals. The first occurred in the early 2000s, transitioning from increase to decrease trends, followed by a shift back to positive trends around 2005-2012. Another notable shift to negative
- 270 trends occurred in central and western European countries between 2015 and 2017. Major urban areas in southeast Australia saw a delayed single negative to positive reversal between 2006 and 2009. Overall, since the 21st century, there has been a notable upsurge in HCHO/NO₂ within the industrialized western world. Till 2015, the U.S. experienced a substantial growth rate of 52-124%, Europe by 12%-17%, and Japan by 77%. From 2015, a minor decline emerged in some U.S. regions, with California being one of the most pronounced, yet not widespread enough to form a significant
- 275 regional pattern. This reversal correlates with the decline of HCHO and the leveling-off of NO₂ trends (Figure S3a). While meteorological factors can account for the 3-5 years cyclical fluctuations in HCHO/NO₂ ratios, the persistent changes in trends are primarily governed by variations in pollutant emission. In China, the post-2011 decline in HCHO/NO₂ ratio, aligned with the observed national NO_x emission reductions, is largely attributed to NO_x control measures in power plants





and industries and stricter vehicle emission standards (China IV) (Van Der A et al., 2017). Changes in VOCs emission
also contribute to this rapid increase; according to Liu et al. (2021), from 2011 to 2017, China's industrial VOCs emissions
increased from 11122.7 thousand tons/yr to 13397.9 thousand tons/yr. In the U.S., following the implementation of the
Clean Air Act Amendments in 1990, the EPA has placed a strong emphasis on the comprehensive assessment of pollutants,
moving from an focus on VOCs control to a more integrated strategy that addresses both VOCs and NOx in the formulation
of photochemical pollution control strategies (Amendments, 1990). This shift directly led to the significant reductions in
NO₂ levels across the U.S. since 2000, but the trends of HCHO are flat, largely due to the contributions from biogenic

NO2 levels across the U.S. since 2000, but the trends of HCHO are flat, largely due to the contributions from biogenic VOCs. Between 2000 and 2015, NO2 levels fell to ~46% and HCHO levels to 92-98% of their initial values (Figure S3). As a result, the long-term trend in HCHO/NO2 over U.S. are dominated by the trends of NO2.

Within the scope of our study period, NO_2 variations exceeded those of VOCs in the majority of the regions we interested. For these regions, the HCHO/NO₂ trend is predominantly influenced by NO_2 trends, with VOC trends showing minor

- 290 impacts. A distinct negative inflection point observed in the NO₂ trend around 2011 in eastern China and in the early 2000s in the U.S. and Europe supports this (Figure S4). From 1996 to 2022, China's NCP region's NO₂ levels increased fivefold, peaking at eightfold the initial value in 2011, while HCHO levels only rose to 1.5 times the initial value (Figure S3). Europe also showed a more significant changes in NO₂ levels: Europe's NO₂ levels fell to 36-73% and HCHO to 120-133% of 1996 levels. For an in-depth understanding of the factors influencing HCHO/NO₂ trends, we refer readers
- 295 to key literatures on the long-term monitoring of HCHO and NO₂. Specifically, Georgoulias et al. (2019) provided a satellite-based analysis of NO₂ trends from 1996 to 2017, which supports the long-term consistency of our observations, albeit with minor discrepancies in the examined time periods. For a nuanced understanding of HCHO trends, both regional studies (Fan et al., 2023; Kuttippurath et al., 2022) and global perspectives (De Smedt et al., 2008; De Smedt et al., 2015) are instrumental.
- 300 Collectively, by combining linear fitting and reversals analysis, we discern a predominant positive global trend in the HCHO/NO₂ ratio, or a shift from negative to positive in the past 27 years, with distinct regional variations. Developing regions like East China and North India, which have relatively late economic development and pollution control measures, typically show twice trend reversals. In contrast, developed regions such as North America and Europe, where HCHO/NO₂ ratios began to increase significantly in the early 2000s exhibit a more consistent upward trend. Although
- 305 these developed areas have experienced minor downward reversals or stagnation in recent years due to the rate of NOx reduction slowing down.

3.3 Global Transitions in O₃ Chemical Regimes Delineated by Satellite-Derived HCHO/NO₂ Ratios

As elaborated in Section 3.1, the correlation between the HCHO/NO₂ ratio and the WE-WD O₃ response patterns show similarities but also small variations across different regions. Here, for simplicity, we apply a uniform global threshold of

310 HCHO/NO₂=3.5 to explore potential years of O₃ regimes changes. To describe how the O₃ chemical regime has evolved, we categorize into four main categories based on the long-term trends of HCHO/NO₂ (Table 1): (1) constant O₃ chemical regimes: regions with a single VOC-limited or NO₂-limited regime status without regime transition during the study



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period; (2) constant quasi regime: regions with single regime for most of the time but has potential to exceed the threshold value of 3.5; (3) single shift of the regime: regions with single shift, either from VOC-limited to NO_x-limited, or vice versa; (4) multiple shifts of the regime: regions with nonlinear trends in HCHO/NO₂, in which a reversal of the trends in HCHO/NO₂ is identified, and HCHO/NO₂ crosses over the threshold values at least once. This classification takes into account the initial conditions of O₃ regimes and their transitional characters based on the observed HCHO/NO₂ trend. Here, we examine the O₃ regime changes based on annual average HCHO/NO₂, but the O₃ chemical regime should vary

seasonally (Jin et al., 2017; Jacob et al., 1995), typically becoming more NO_x-saturated in wintertime and more NO_x limited in summertime. We do not account for the seasonality of O₃ production regimes because the definitions of seasons vary by climate regions would complicate the comparisons across different regions.

Category	Subcategory	Description of HCHO/NO2Trend Pattern	Transition Year
Constant regimes	1.1 fixed NOx-limited	Typical NO _x -limited condition (HCHO/NO ₂ \geq 4.5) for 80% of the period.	No regime transition
	1.2 fixed VOC-limited	Typical NO _x -saturated condition (HCHO/NO ₂ \leq 2.5) for 80% of the period.	
Constant quasi regimes	2.1 fixed quasi-NO _x - limited	HCHO/NO ₂ ratio within 3.5 - 4.5 for 80% of the period, with the possibility of exceeding 4.5 but never falling below 3.5.	
	2.2 fixed quasi-VOC- limited	HCHO/NO ₂ ratio within 2.5 - 3.5 for 80% of the period, with the possibility of falling below 2.5 but never exceeding 3.5.	
Linear trend with regime transition	3.1 shift from VOC- limited to NO _x -limited	positive HCHO/NO ₂ trend (\checkmark) and crosses the HCHO/NO ₂ = 3.5.	Intersection with HCHO/NO ₂ = 3.5
	3.2 shift from NO _x - limited to VOC-limited	negative HCHO/NO ₂ trend (\mathbf{N}) and crosses the HCHO/NO ₂ = 3.5.	
Non-linear trend with regime transition	3.3 shift from VOC- limited to NO _x -limited	For negative to positive trend ($\checkmark 2$): HCHO/NO ₂ crosses 3.5 after the reversal year	
		For positive to negative trend (\nearrow): HCHO/NO ₂ crosses 3.5 before the reversal year	
	3.4 shift from NO _x - limited to VOC-limited	For negative to positive trend (\checkmark): HCHO/NO ₂ crosses 3.5 before the reversal year	

Table 1: Criteria for distinguishing different types of O₃ regime transitions.







Figure 7: Estimated transition year of O₃ regimes: grids where the annual HCHO/NO₂ ratio exceeds 3.5 (a) with a positive annual trend, and (b) with a negative annual trend. Only grids with a with a long-term mean NO₂ VCD > 1.5×10^{15} (molecules \cdot cm⁻²) are shown. Specific economic regions are highlighted with red rectangles, including: Specific economic regions are highlighted with red rectangles same as Figure 3a, adding: North China Plain (NCP), Yangtze River Delta (YRD), Pearl River Delta (PRD), and Chongqing Municipality (CM) in China; New Delhi (Nel D.), Mumbai (Mum.), and Kolkata (Kol.) in India; Melbourne (Mel.), Capital-Sydney Corridor (C-S Cor.), and Brisbane (Bri.) in Australia; Pretoria 330 (Pre.) and Cape Town (CT) in South Africa.

Figure 7 shows the classification of the regime changes. Globally, HCHO/NO₂ has shown a general upward trend post-2011, yet many central economic zones remain VOC-limited or quasi-VOC-limited, with the HCHO/NO₂ ratio not

exceeding the threshold of 3.5 (Figures 7 and 8). Key regions, including China's NCP, YRD and PRD, Seoul in South Korea, Japan's metropolitan areas, the U.S. East Coast and California's Los Angeles and San Francisco areas, parts of





- center-western Europe, India's New Delhi, South Africa's Pretoria and Cape Town region have been consistently VOClimited for the majority of period (over 80%) since1996. India, with its unique climate and emissions profile, exhibits a large area in the quasi-NO_x-limited range (3.5-4.5). India's hot and humid climate contributes to elevated BVOC and HCHO emissions (Kuttippurath et al., 2022), reducing NO_x lifetime and accumulation, which tends to be more NO_xlimited. We observe an urban-rural transition from VOC-limited to NO_x-limited in megacity clusters, with the periphery zones showing the initial shift toward NO_x-limited, progressing inward. This pattern is particularly evident in megacities
- such as Tokyo, San Francisco and Los Angeles. Regions have extensively transitioned to the typical NO_x-limited stage include the middle parts of Honshu in Japan, south California, parts of eastern U.S., and various regions in Europe.



Figure 8: Long-term trends of tropospheric HCHO/NO₂ ratio across major economic regions marked in Figure 7 based on the harmonized satellite data. Here we only focus on grid cells with long-term mean tropospheric NO₂ column greater than 1.5 × 10¹⁵ molecules/cm². The arrow lines depict the intersection points with HCHO/NO₂=3.5.

Figure 8 shows the long-term evolution of the satellite-based HCHO/NO2 in different sub-regions of the world. The temporal evolution of regional O3 regimes is intricately tied to a variety of emission policies, economic development, and geographical characteristics, such as surface coverage and regional meteorological conditions. Nations that embarked on
industrialization and VOCs reduction policies early on, like the U.S., Japan, and European countries, were predominantly in VOC-limited regime (HCHO/NO2<2.5) by 1996 and have since shown a significant increasing trend in the HCHO/NO2 ratio, particularly post-2000. Although most regions in the U.S. and some European countries (e.g., France, Germany, and Italy etc.) have reached peak levels around 2015-2017 and are currently experiencing a plateau or modest decline in the HCHO/NO2 ratio, this has not significantly altered the overall upward trajectory of the ratio over the past 27 years. A





- few regions have surpassed critical thresholds to NO_x-limited conditions—most notably observed in the southeast U.S. between 2006 and 2010—while most have yet to reach the 3.5 thresholds, either remaining in the typical VOC-limited (e.g., South Korea, China's NCP, YRD, etc.) or O₃ transitional regime (e.g., most regions in the U.S.). In regions that have attained HCHO/NO₂>3.5, such as the LMV, WGG, and California in the U.S., the post-peak decline did not cause a secondary transition point causing an O₃ regime shift. California, for example, surpassed the key threshold around 2009 and reached a maximum value within the quasi-NO_x-limited range by 2014, showing a re-crossing of the threshold around
- 2018, but still within the transitional regime.

Economies with relatively late industrial takeoffs, such as those in East China and India, initially had a high HCHO/NO₂ ratio around 1996, indicating NO_x-limited condition. As these economies bloomed in the late 1990s, NO_x emissions from fuel combustion caused a sharp decline in the HCHO/NO₂ ratio, particularly in 2000-2005 period. In eastern China, the

- 365 NCP and YRD regions saw a rapid decrease in the HCHO/NO₂ ratio (-0.56/year), dropping from ~4 in 2000 to ~1.2 in 2005 (Figure 8a). Post-2005, the decline rate slowed, and by 2011, a slow reversal (<0.1/year) began, but it still remains in a VOC-limited regime to date. In contrast, Indian cities like Mumbai and Kolkata experienced a rapid decline in the HCHO/NO₂ ratio since 2000, but have not significantly crossed the key threshold (Figure 8d). In the Southern Hemisphere, regions like Australia, Africa and Latin America, typically exhibit low NO_x emissions (<1.5 × 10¹⁵ molecules/cm²) across
- 370 vast areas due to the highly uneven population distribution. Melbourne's HCHO/NO₂ trend reversed around 2008, varying within a VOC-limited range of 1.8 to 2.8. The Canberra-Sydney corridor and Brisbane area show higher ratios (3.1 to 4.8) with no regime change throughout the observation period (Figure 8d). In Africa, the Pretoria region and Cape Town in South Africa exhibit a slow annual decrease of <-0.02/year (Figure 8e), averaging around 1.8 and 2.8. Latin American megacities have also remained in a transitional regime over the past two decades. These observations highlight the complexity of O₃ regime patterns and the significant influence of region-specific factors.

Note that the regime threshold values are subject to large uncertainties due to factors such as meteorological conditions and satellite detection noise (Jin et al., 2017; Souri et al., 2017; Souri et al., 2020; Schroeder et al., 2017). The key HCHO/NO₂ threshold of 3.5 used here is derived from observation sites from TOAR network, which tend to be in urban or accessible areas, which is more reflective of regions with significant human impact rather than pristine natural

380 environments. These factors have the potential to bias the estimated transition year. However, such bias is not significant. It is estimated that a ~10% variation in the threshold (e.g., from 3.5 to 3.9) would shift the estimated transition years by only about 1-2 years for the major global regions. The uncertainty introduced by this simplified approach is considered acceptable and does not compromise the analysis's effectiveness in pinpointing critical transition years.

3.4 O₃ Regime Transition Consistent with Diminishing O₃ Weekend Effect

385 Over the past 2 decades, a significant reduction in NO₂ concentrations is found (Figure S3). Despite this trend, weekend NO₂ levels remain lower than those on weekdays (WE-WD NO₂<0) in most areas, although this NO₂-weekend-low phenomenon is weakening (Figure S1). Differential NO_x saturation levels influence O₃ sensitivity to NO_x, resulting in varying WE-WD O₃ patterns. The interannual evolution in these patterns, in terms of sign and magnitude, provides another





piece of evidence of O₃ regimes changes. Figure 9 shows a spatial overview of the WE-WD O₃ differences across three
 distinct periods (2004 - 2013, 2014 - 2018, 2019 - 2023) over the past two decades. Figure 10 shows the long-term O₃ weekend effect averaged across the sites. For robust statistical analysis, continental regional-averaged trends are limited to sites with at least 10 years of data, focusing on East Asia, North America, Europe, and Latin America.



Figure 9: Two-decade evolution of WE-WD O₃ differences across three distinct period: (a) 2004-2013, (b) 2014-2018, (c) 2019-2023. Significant (p-value of t-test < 0.05) WE-WD O₃ difference and WE-WD NO₂ differences are denoted by triangles and







395 black-edged symbols respectively.

Figure 10: Long-term evolution WE-WD O₃ difference derived from TOAR ground-based O₃ observation. Only sites with \geq =10 years of data are included in the continental region-averaged statistics (black line), and sites with \geq =3 years of data are included in the major economic regions and selected countries statistics.

400 The WE-WD O₃ trend is inversely correlated with the HCHO/NO₂ ratio, showing an initial rise followed by a decline since 1980, with meteorological-driven interannual fluctuations observed throughout the period. The inflection points vary across different regions, generally occurring within the decade between 1995 and 2005 (Figure 10). The Theil-Sen slope, calculated from the most recent two decades of data, reveals a significant and widespread negative trend in WE-





- WD O₃ concentrations at the majority of global monitoring sites, with a robust trend significance (p-value <0.05)
 confirmed by the Mann-Kendall test, especially in North America, Europe, Japan, South Korea, and developed regions of Australia and Latin America (Figure S4). In Europe, before 2013, over 70% of TOAR sites demonstrated significant weekend O₃ increases (Figure 9a); by 2019-2023, only 2% of sites continued to show significant weekend elevations (Figure 9c). The ensembled time series of Europe sites indicates that the peak WE-WD O₃ occurred around 2005, at approximately 2.5 ± 1.1 ppbv, whereas by 2023, it had significantly decreased to near zero (Figure 10c). Similar reductions have been observed in the U.S., with the largest WE-WD O₃ occurring between 1995 and 2000, and the most substantial differences noted in California around 1998, peaking at approximately 4 ppbv (Figure 10b). In East Asia, where long-term O₃ observations spanning over a decade are confined to Japan and South Korea, the aggregated data from monitoring sites indicated a notable annual maximum around 1999, registering 3.3 ± 0.5 ppby (Figure 10a1). This value is more
- sites indicated a notable annual maximum around 1999, registering 3.3 ± 0.5 ppbv (Figure 10a1). This value is more reflective of Japan's data, given that South Korea's monitoring began in 2000, with its own maximum occurring around 415 2012.

In Latin America, developed countries such as Brazil and Chile observed their peaks around 2005, with values around 4 ppbv (Figure 10d). In China and India, extensive ground-based O₃ monitoring networks were established within the last decade. Eastern China, encompassing the NCP and YRD super urban agglomerations, aligns with the global trend of reduced weekend O₃ (Figure 10a2). In India, however, rapidly developing areas such as New Delhi, Mumbai, and Kolkata are experiencing a rise in WE-WD O₃, indicating a complex interaction between emissions and atmospheric dynamics

420 are experiencing a rise in WE-WD O₃, indicating a complex interaction between emissions and atmospheric dynamics (Figure 10e). Note that due to short observation periods and moderate statistical significance (p-values between 0.05 and 0.1 from the Mann-Kendall test) (Figure S5), results from China and India are best used for qualitative analysis only.

By 2023, a few regions show a reversal of O₃ weekend effect on annual basis. The U.S. LMV area, which first showed a WE-WD O₃ transition to negative values, has kept WE-WD O₃ levels around -1 ± 0.5 ppbv since 2010 (Figure 10b). France and Spain have also shown slightly higher weekend O₃ levels from 2020, but not significant (Figure 10c). Sporadic sub-zero WE-WD O₃ in areas such as parts of California, the BW and WGG regions in the U.S. indicate a potential move

Overall, the O_3 weekend effect's long-term changes are consistent with the weakening VOC-limited conditions outlined in Section 3.3, with most regions classified as VOC-limited or in transition. This is evident in the fact that, in most regions, weekend O_3 levels are slightly higher than or equal to those on weekdays. These results are consistent with the satellite-

derived HCHO/NO₂ observations, indicating a still ongoing transition in the O₃ chemical regime.

towards NO_x-limited conditions, though inconsistent.

4 Conclusion

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In this study, satellite-derived HCHO/NO₂ ratios and ground-based O₃ observations were directly connected to capture the nonlinearity of global shifts in O₃ chemical regimes. Key findings are as follows:

435 The evolution of O₃ regimes is discernible through the analysis of HCHO/NO₂ ratio and WE-WD O₃ trends. We have





pinpointed distinct regional thresholds—2.8 for East Asia, 3.2 for Southwest Asia, 3.0 for North America, 4.3 for Europe and Latin America, and 4.7 for Australia—that signify the pivotal transition points in O₃ regimes. These thresholds are shaped by variations in regional energy profiles, meteorological patterns etc.

- Amidst the ongoing changes in the ratios of O₃ precursors, a global trend towards NO_x-limited O₃ regimes have emerged over the past two decades. This is evidenced by both the rising HCHO/NO₂ ratios and the diminishing O₃ weekend effect, particularly in densely populated regions. Applying linear fitting and reversals analysis, we've observed a predominant positive or negative-to-positive shift global trend in the HCHO/NO₂ ratio over the past 27 years. Later-industrializing regions like East China and India initially saw a decline before rebounding around 2011; industrialized nations like the U.S., Europe, and Japan experienced significant increases in the HCHO/NO₂ ratio from the early 2000s due to substantial
- 445 NO_x emission reductions. However, by 2023, most urban regions' annual-mean HCHO/NO₂ ratios have not significantly surpassed the 3.5 threshold, indicating they remain within VOC-limited or transitional regimes. However, O₃ chemical regime varies seasonally, and we expect the regime transition has occurred during the warm season when O₃ pollution is highest. Regarding WE-WD O₃, while some regions like France and northern Spain show lower weekend levels, the majority still report slightly higher weekend O₃ on annual basis, but not statistically significant anymore. A few areas,
- 450 such as the southeastern U.S., heavily influenced by BVOCs, have clearly entered an NOx-limited regime on the annual basis. These results align with the general trend of weakening VOC-limited conditions.

The transitional zone for O₃ regimes should be a range rather than a fixed HCHO/NO₂ ratio. Our study simplifies this by using the central value of this range, acknowledging a limitation. Despite this, our findings provide valuable insights, highlighting the need for adaptable emission controls in response to atmospheric changes. Early industrialized nations could benefit from policies addressing both NO_x and VOCs to further curb O₃, while later industrializers should prioritize

455 could benefit from policies addressing both NO_x and VOCs to further curb O₃, while later industrializers should prioritiz NO_x controls to prevent excessive O₃ formation.

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Data Availability

Multi-satellite products (GOME, SCIMACHY, OMI) of tropospheric NO₂ and HCHO vertical columns are developed
 under the EU FP7-project Quality Assurance for Essential Climate Variables (QA4ECV) are publicly available at https://knmi.sitearchief.nl/?subsite=qa4ecv#archive. TROPOMI NO₂ data (https://doi.org/10.5270/S5P-s4ljg54) and TROPOMI HCHO (https://doi.org/10.5270/S5P-s4ljg54) are available from NASA Goddard Earth Sciences (GES) Data



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and Information Services Center (DISC, <u>https://disc.gsfc.nasa.gov/datasets/</u>). Ground-based O₃ observations are available from TOAR-II database (https://toar-data.org/surface-data). The harmonized annual satellite-based HCHO and NO₂ products will be made publicly available at the publication stage.

Author contribution

Y.T.: Methodology, Formal Analysis, Investigation, Visualization, Writing - Original Draft. **S.W:** Data Collection of Satellite NO₂ products. **X.J.:** Conceptualization, Supervision, Methodology, Data Curation, Funding Acquisition, Writing - Review & Editing. All authors have given approval to the final version of the manuscript.

475 Competing interests

The authors decline that they have no conflict of interest.

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