



The Turbulent Enhancement Ratio as a novel Approach for Characterizing Local Emission Sources in Complex Environments

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Abstract

- 10 In this study, we introduce the Turbulent Enhancement Ratio (TER) method as a new approach for characterizing local emission sources in complex urban environments, with a focus on the city of Innsbruck, Austria. The idea behind the approach is to take advantage of highly time resolved trace gas observations, that allow identifying turbulent air motions, from which a turbulent enhancement ratio can be constructed. We use a comprehensive measurement setup at the Innsbruck Atmospheric Observatory utilizing advanced instruments to test the approach. Our dataset, spanning from mid-2018 to early 2022, includes
- 15 periods affected by the COVID-19 pandemic, allowing us to assess the impact of reduced traffic and changes in domestic fuel use on NO_x/CO_2 emission ratios. We test the approach by comparing with direct eddy covariance flux measurements of these tracers. The results show a statistically significant linear relationship between TER and the flux ratio of NO_x over CO₂, with regression slopes ranging between 0.96 to 1.1. Weekday TER values are generally higher due to increased traffic, while weekend values are lower, reflecting reduced commuter activity. Seasonal analysis shows that winter TER is influenced sig-
- 20 nificantly by domestic heating, while in summer, traffic is the predominant source of NO_x and CO_2 emissions within the measurement footprint. The diurnal cycle of TER also highlights the role of valley wind systems in modulating local emissions through changes in footprint, with valley-up winds bringing higher traffic-related emissions to the site during the day. Our findings demonstrate that TER is a robust predictor for emission ratios in urban settings, offering insights into the dynamics of local emissions. The method's ability to capture turbulent fluctuations provides a more nuanced understanding of source
- 25 contributions, particularly in environments with complex and mixed emission sources.

1. Introduction

Excess mixing ratios (EMRs, defined as the background corrected concentration of a tracer within a plume) and Normalized Enhancement Ratios (NERs, defined as the ratio of two EMR) (Yokelson et al., 2009, Parrish et al., 2002, Warneke et al. 2007, Ehrnsperger and Klemm., 2021, Andreae and Merlet, 2001; Lefer et al., 1994, Derwent et al., 2000, Hobbs et al., 2003)





are often used to evaluate emission inventories or to infer emission ratios from previously unmeasured sources (e.g. biomass burning in Yokelson et al., 2009). For chemically reactive compounds such as non-methane volatile organic compounds (NMVOC), the chemical reactivity in the atmosphere (e.g. photochemical age) has to be taken into account when determining EMRs distant to the emission source (de Gouw et al., 2005). For example, the ratio of co-emitted compounds with well-

- 5 established primary emission ratios but exhibiting different lifetimes (e.g. benzene and toluene) can be used to obtain their photochemical age and consequently to infer their origin. By knowing the reaction rate constants of compounds to be measured, the excess mixing ratio can then be extrapolated back to an emission source ratio. This technique has been used extensively for urban outflow studies (e.g. de Gouw et al., 2005) and other langrangian type experiments (e.g. McKenna et al., 1995). Another approach for determining NERs of different pollutants close to the source has been employed in tunnel studies
- 10 (e.g. Ehlers et al., 2016, Liu et al., 2014, Nogueira et al., 2015) and in vehicle chasing experiments (Jiang et al., 2005). In these types of investigations, atmospheric oxidation often plays a minor role when inferring primary emission ratios (Ehlers et al., 2016). Parrish et al. (2002) demonstrated that urban vehicular NERs can also be obtained by determining EMRs from static hourly measurements during the rush-hour peak. The analysis thereby relies on the assumption that co-varying pollutants are rapidly emitted into a shallow boundary layer, resulting in steep concentration increases. This approach works well under
- 15 the assumption that the free tropospheric background concentrations of the compounds to be investigated is not significantly mixed into the surface layer during the rush-hour. For example, long-lived compounds such as CO_2 and CO exhibit significant background concentrations where entrainment could bias the correlation analysis. The issue of air parcels exhibiting different background mixing ratios of CO_2 and CO has been addressed by Yokelson et al. (2013) who found that inconsistent treatment of background concentrations can result in significant errors for NER calculations from biomass burning plumes. An alterna-
- 20 tive method for directly determining urban emissions of air pollutants can be based on eddy covariance observations (e.g. Lee et al., 2015, Straaten et al., 2023, Lamprecht et al., 2021, Nemitz et al., 2008). These rely on micrometeorological assumptions (e.g. Foken, 2008) and are mostly conducted above the roughness layer, which is about twice the average building height in urban environments (Christen et al. 2004, Ward et al., 2022).

In this study, we introduce a new concept for obtaining urban NERs based on fast (5 to 10 Hz) concentration measurements allowing to capture turbulent fluctuations in the atmosphere. The approach significantly enhances the ability to determine ensemble average aggregated NERs in complex urban environments compared to previous studies (e.g. Parish et al., 2002, Ehrnsperger and Klemm., 2021), and can be used, for example, in combination with factorization and un-mixing models (Karl et al., 2017) to extract characteristic source averaged NERs. These can be compared to emission inventories.





2. Methods

2.1. Fieldsite

The flux measurement tower of the Innsbruck Atmospheric Observatory (IAO) is situated on the rooftop of the University of Innsbruck's Bruno Sander Haus at 617 m a.s.l. (specific coordinates: 47°15'50.5" N, 11°23'08.5" E), with the inlet at 42.8 m

- 5 above the street canyon level. The surrounding area is heavily influenced by anthropogenic activities, with traffic and domestic fuel combustion serving as the dominant sources of emissions. Vegetation contributes only a minor fraction to the local environment (Kaser et al., 2022, Peron et al., 2024). The average building height around the tower is approximately 17.3 m, positioning the instrument inlets well within the constant flux layer, as confirmed by previous studies, including Karl et al. (2017, 2020).
- 10 This site is notably affected by the diurnal valley wind system, which dictates the local wind patterns with a predominant flow from northeast to southwest during the daytime, and a reversal from southwest to northeast during the nighttime (Supplement Fig. 1S). These wind directions play a crucial role in the dispersion and transport of pollutants, aligning with the characteristic daily cycle of emissions from traffic and domestic heating. However, deviations from these predominant wind patterns can occur during specific meteorological events, such as Foehn winds, which bring a shift to southerly winds, or during other

15 mesoscale weather phenomena like frontal passages that can introduce significant variability in wind direction and speed.

The flux tower's strategic location and its exposure to the complex wind systems of the alpine environment make it an ideal site for studying the interactions between local emissions and atmospheric dynamics. The data collected here provides critical insights into the impact of urban activities on air quality, particularly in regions with challenging topographies like Innsbruck, where local meteorology can significantly modulate pollutant concentrations and distribution.

20 2.2. Instrumentation

For data acquisition, we employed a comprehensive measurement setup at the IAO flux tower. A Campbell Scientific CPEC200 eddy-covariance system, consisting of an EC155 closed-path gas analyser and a CSAT3A sonic anemometer operating at 10 Hz, was directly mounted on the flux tower to measure momentum flux, CO_2 concentrations and fluxes. Adjacent to the EC155 inlet, air was drawn through a 14 m, 3/8 " heated and light-shielded PFA tube (1/4" ID), which was routed to the trace gas analysers in the nearby laboratory. The setup up was dimensioned such that the pressure was held constant at

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714 mbar, while keeping the sample delay time short (~2-3 s).

NO and NO_x measurements were conducted using a two-channel Ecophysics CLD899Y instrument operating in 5 Hz mode. This instrument was equipped with a molybdenum converter, with a conversion efficiency ranging from 80 % to 97 %, to reduce NO₂ to NO. The converter's efficiency was regularly tested to ensure accurate concentration calculations. To further





validate the NO₂ concentrations deduceed from the CLD899Y measurements, a Los Gatos Cavity-Ringdown Spectroscopy (CRDS) instrument was utilized to provide direct measurements of NO₂ volume mixing ratios. This dual approach enhanced the reliability of NO_x measurements by cross-verifying the data from two different methodologies (e.g. Karl et al., 2017).

Calibration checks were a critical component of the measurement protocol. The CLD899Y was calibrated daily with NO reference gas, typically around midnight, to maintain the accuracy of NO_x measurements. In contrast, the CRDS instrument was calibrated more frequently, with checks performed every half-hour, ensuring continuous accuracy and reliability of the NO₂ data. These calibration results were subsequently incorporated into the post-processing phase, where they were used to correct and refine the entire measured dataset. Table 1 provides an overview of all the instruments used in this study, along with additional information about their specifications and operational details.

10 Table 1: Overview of the measurement equipment used during the campaign at the IAO fieldsite.

Instrument Name	Measurement	Measured	Sample	Calibration	Reference	LOD
	Principle	Parameter(s)	Rate	Check(s)	Gas	
Campbell CSAT3A	Sonic	dd, ff	10 Hz	annual		
Campbell EC155	Infrared Absorption	CO ₂	10 Hz	daily	$CO_2 (499ppm \pm 2\%)^{3)}$	0.15ppb
Eco Physics CLD899Y	Chemiluminescence	NO _x , NO, NO ₂ ¹⁾	5 Hz	daily	Synthetic Air 5.0 ⁴⁾ NO (909ppb±5%) ³⁾	0.05ppb
LGR NO ₂ Analyzer	Cavity Ringdown	NO ₂	5 Hz	1⁄2 hourly	Scrubbed air ⁴⁾	0.05ppb
Geosphere TAWES ²⁾	multiple	T, p, dd, ff	1/(10 min)	annual		

 $^{1)}$ calculated from NO_{x} and NO

²⁾ operated by the national meteorological organization Geosphere

³⁾ used for calibration

⁴⁾ used for zeroing

15 **2.3. Dataset**

The dataset spans from mid-2018 to early 2022, achieving an overall data coverage of 88.9%. Data gaps are primarily due to laboratory and instrumentation maintenance, which were minimized as much as possible. The fluxes used for calculating the flux ratios were determined following the methodology outlined by Striednig et al. (2020). To account for lags between instruments, resulting from residence times within the sampling tubes and potential filter contamination, corrections were ap-

20 plied using a widely accepted cross-covariance analysis performed at half-hourly intervals. The dataset also captures the period of the global COVID-19 pandemic, which affected Austria from March 2020 to the end of 2022, including four lock-downs by the end of 2021. The dataset was filtered according to accepted micrometeorological criteria (Foken, 2008). We used the following quality assurance/quality control (QA/QC) criteria: a signal-to-noise ratio > 3, a steady-state criterion ≤





0.5, a noise RMSE \leq 20 for NO_x and CO₂ fluxes and a correlation coefficient \geq 0.5 for TER while TER and FR were calculated for 30 min averages.

3. Theory

The excess mixing ratio (Yokelson et al., 2013, Andreae and Merlet, 2001) is derived by subtracting the background of a species of interest *X* from its mixing ratio within a plume:

$$EMR_X = X - X_{bg} \tag{1}$$

where *X* is the measured mixing ratio within the plume and X_{bg} the background reference value measured outside the plume. The normalized enhancement ratio is then calculated by dividing the *EMR* of *X* by the *EMR* of a reference species *Y* (preferably of long atmospheric lifetime):

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$$NER_{X/Y} = \frac{X - X_{bg}}{Y - Y_{bg}} \tag{2}$$

If the background values of *X* and *Y* are not determinable, Yokelson et al. (2013) describes the $NER_{X/Y}$ as slope of the regression line between species *X* and *Y*:

$$NER_{X/Y} = \frac{\overline{\langle Y \rangle \langle X \rangle}}{\overline{\langle X \rangle^2}}$$
(3)

where $\overline{\langle Y \rangle \langle X \rangle}$ is the covariance between X and Y, and $\overline{\langle X \rangle^2}$ the variance of X. For single plume studies this approach is often 15 sufficient to characterize the source, but in areas with superimposed and different emitters, such as common in complex urban 15 settings, we propose an extension to eq. (3), by relating enhancement ratios to turbulent motions (e.g Van der Hoven, 1957). 16 Therefore, eq. (3) will be adapted to separate local and non-local sources by applying Reynold's decomposition which leads 17 to an approach that we term the Turbulent Enhancement Ratio (TER):

$$TER_{X/Y} = \frac{\overline{\langle \overline{Y} + Y' \rangle \langle \overline{X} + X' \rangle}}{\overline{\langle \overline{X} + X' \rangle^2}} \xrightarrow{Reynold's} \frac{\overline{\langle Y' \rangle \langle X' \rangle}}{\overline{\langle X' \rangle^2}}$$
(4)

20 where X'(Y') can be interpreted as the fluctuating parts around the mean $\overline{X}(\overline{Y})$.

For fast measurements (e.g. 1 - 10Hz) the fluctuating parts can be interpreted as a turbulent enhancement ratio (TER), and in analogy to eddy covariance flux measurements (F(X), F(Y)) reflects an aggregated primary source emission ratio between compounds X and Y:

$$FR_{X/Y} = \frac{\overline{\langle w'X' \rangle}}{\langle w'Y' \rangle}$$
(5)

25 where w' represents fluctuations in vertical wind speed.





4. Results

4.1. Validation of the Turbulent Enhancement Ratio

A key issue for measuring EMRs in complex urban environments is that the difference between background and plume enhancement is often not well defined due to the superposition of many individual plumes. This can introduce biases far away
from sources. Fig. 1 presents the comparison between the TER and the Flux Ratio (FR) of NO_x over CO₂, segregated into daytime (left panel) and nighttime (right panel) periods. We consider the flux ratio as the reference method as it is directly related to surface emission variations. The daytime period from 8 to 16 UTC typically features a well-mixed planetary boundary layer (PBL) with pronounced turbulence, so that the accuracy of eddy covariance (EC) methods is generally well accepted.

Conversely, nighttime conditions often do not meet EC criteria due to reduced turbulence and a higher relative influence of horizontal advection fluxes. Therefore, the time series data have been filtered using standard QA/QC criteria as outlined in Foken (2008). Due to the urban heat island effect, we typically do not see a pronounced stratified stable urban nocturnal boundary layer in Innsbruck. In fact, most of the time we observe unstable conditions during night time, which has been observed at many other urban sites (e.g. Christen et al., 2004, Oke et al., 2017, Ward et al 2022).

Both daytime and nighttime periods exhibit high linearity between TER and FR, with R² values of 0.99, indicating a strong correlation. The regression slopes range from 0.96 during the day to 1.1 at night, reflecting a consistent relationship within the uncertainty bounds. Daytime ratios typically exhibit a broader range, with most values extending up to ~ $4 \frac{nmol}{\mu mol}$, compared to nighttime ratios, which are generally lower. This variation is caused by differences in source contributions between day and night, such as reduced traffic emissions during night time.

The limits of the observed ratios align well with typical NO_x/CO₂ ratios reported in the literature for urban activities, support-20 ing the validity of the measurements (e.g., the NO_x/CO₂ ratio for domestic fuel derived from EMIKAT (https://www.emikat.at, last accessed: 28 August 2024) is $0.83 \frac{nmol}{\mu mol}$, the NO_x/CO₂ ratio for traffic is on the order of $3.3^{5.3}_{2.0} \frac{nmol}{\mu mol} (X_{min}^{max})$ (Peitzmeier et al., 2017)). Generally speaking, combustion processes from domestic fuel burning are "cleaner" in terms of NO_x emissions, due to lower combustion temperatures (Zeldovich mechanism) and better-controlled burning conditions; per emitted CO₂ about 3-4 times more NO_x is emitted from internal combustion engines of motor vehicles (Oland, 2002, Karl et al., 2017).







Figure 1: Comparison of TER and FRs for day (a) and nighttime (b). The turquoise points are QA/QC-filtered half-hourly ratios for the entire campaign. Black points (with error bars representing the standard error of the median) are the medians binned into intervalls of 0.2 nmol/µmol. The solid line is the regression line for the black points.

5 The analysis demonstrates a robust linear relationship between TER and FR across both day and night periods and underscores the reliability of using TER as an alternative of FR in complex urban settings.

Fig. 2 (A) illustrates the volume mixing ratios of NO_x and CO_2 over the course of a single, sunny summer day (June 11, 2019). The NO_x concentrations exhibit a characteristic diurnal pattern, with low levels and minimal variation during the night, followed by a marked increase in the early morning, coinciding with the rise in traffic activity. Throughout the day, strong

- 10 atmospheric turbulence ensures efficient vertical transport of NO_x from the street canyon to above the urban roughness layer, resulting in the detection of numerous plumes. These plumes have durations ranging from a few seconds to fractions of a minute. The CO₂ signal displays the expected diurnal cycle, characterized by elevated levels during the night and a daytime minimum attributable to photosynthetic activity, accompanied by increased variability. Spikes in the CO₂ signal frequently correlate with those in the NO_x data, suggesting a common source. The signals of NO_x and CO₂ reflect the influence of
- 15 multiple superimposed sources within a complex environment, where traditional methods for quantifying emissions are only partially effective.

Panel B provides a more detailed examination of this complexity by isolating a segment of data spanning 2.5 minutes during the morning rush hour (beginning at 07:20:00 local time = UTC +2 h). The original NO_x and CO₂ data have been artificially down-sampled to 5 s and 60 s intervals, respectively, representing typical sampling rates of slower measurement instruments.

20 While the original dataset clearly reveals correlating plumes (highlighted by a grey area) of NO_x and CO₂, these nuances are lost with longer sampling intervals. Accurate detection and quantification of these variations within the measurement interval



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is crucial for calculating correct emission ratios. Although most plumes remain visible at a 5 s sampling rate, averaging over 60 s significantly smooths the signal, obscuring critical details. The low pass filter caused by slower data acquisition introduces a systematic bias.

The correlation between the synthetic NER $_x$ (based on an averaging filter of x minutes) and the original TER is shown in Panel C for both sampling intervals. While the R² is still reasonable, the bias is significant (NER₅ = $0.43_{0.37}^{0.49} \frac{nmol}{\mu mol}$,

NER₆₀ = $0.39_{0.34}^{0.45} \frac{nmol}{umol}$) because of the variation of the background concentration that cannot be accurately separated anymore for slower sampling rates. It is important to highlight that even shorter averaging intervals do not significantly improve the quantification of emission sources, while the bias does not deteriorate much further with longer intervals. This clearly demonstrates that the detection of turbulence down into the inertial subrange is a crucial factor for the accurate determination of emission sources. In environments with multiple overlapping emission sources, such as cities, the turbulent enhancement ratio

is therefore the preferred methodology to quantify the sources.



Figure 2: (A) Volume mixing ratios for NO_x (turquoise line) and CO₂ (red line) on June 11, 2019, with a sampling rate of 5 Hz. (B) A focused view over a 2.5-minute period showing the original NO_x and CO₂ volume mixing ratios alongside the artificially calculated 15 moving averages for 5 s (olive (dashed) line) and 60 s (purple (dashed) line). (C) Comparison of the TER and NER. The olive and purple dots represent the corresponding TER/NER ratios, while the solid lines show the linear fit for the different sampling rates. The solid black line represents the 1:1 line (median).

4.2. Traffic Analysis

Traffic plays a crucial role for CO_2 and NO_x emissions in Innsbruck and, besides domestic fuel use, is the second prominent 20 emission source within the measurement footprint. Variations in traffic volume can significantly shift the NO_x/CO_2 ratio, resulting in a greater influence of other sources. Fig. 3 illustrates traffic data collected at a monitoring station operated by the government of Tyrol, located very close to the field site and representative of the traffic activity within the flux footprint. The predominant vehicle type is passenger cars with nearly 10 million vehicle counts during the campaign. Trucks, including





heavy-duty vehicles (HDVs), light-duty vehicles (LDVs) and busses account for 8.4 % of total traffic on weekdays and even lower (5.1 %) on weekends, making passenger cars a major player at the field site.

The diurnal traffic pattern remains consistent across all seasons, characterized by a rapid increase in the morning hours. After reaching a local maximum around 07:00 UTC, traffic volumes remain relatively stable throughout the day, with a slight up-

5 ward trend, peaking in the late afternoon. Nighttime traffic volumes typically hover around 99_{20}^{687} vehicles per hour (vph), increasing to approximately 936_{770}^{1330} vph (on average) during the day. Seasonal variations in traffic volume are minimal and do not indicate a significant change between summer and winter.



Figure 3: Seasonal traffic patterns and vehicle type distribution at the field site. Panels A-D show the average daily traffic volume, with the turquoise line representing weekdays (Mon-Thu) and the red line representing weekends (Sun). The green lines in Panels A and D indicate the daily traffic patterns during the first and second lockdown, respectively. The grey shaded area represents the standard error. Panels E and F display the overall traffic volume for weekdays (E) and weekends (F), with separate bars for cars and trucks.

The weekday/weekend effect typically results in a reduction of around 28.5 % during weekends, which is primarily driven by changes in commuter traffic. While weekend night time traffic is slightly elevated due to leisure activities, daytime values are significantly lower in line with reduced weekend activities. Notably, the rush-hour peaks are absent on weekends, after reaching a plateau, there is little variability until traffic levels approach the weekly average again towards the end of the day, when traffic activity drops off sharply.



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The COVID-19 pandemic and the associated lockdowns in Austria had a direct impact on traffic volumes due to mobility restrictions, though the effects varied across different lockdowns. The first, more stringent lockdown in March/April 2020, which included a total curfew, led to a nearly -55 % reduction in traffic activity. In contrast, subsequent lockdowns, which were more relaxed, resulted in a more modest traffic reduction and were comparable with the weekend traffic load and patterns. Interestingly, even during the lockdown periods, a small rush hour peak was still visible in the data, indicating some level of consistent traffic activity.

4.3. Case Studies

4.3.1. Weekly and seasonal trends

Based on these findings, we apply the TER analysis to a long-term data set of the same period as used in the previous traffic data comparison. Fig. 4 provides a detailed analysis of the TER of NO_x over CO₂ across various seasons and times of the day, highlighting the significant influence of both diurnal and seasonal variations. The figure discriminates TER analysis between weekdays (Monday to Thursday) and weekends (Sunday). Across all seasons, the lowest TER values are observed during nighttime, reflecting ratios typically associated with domestic fuel use. In contrast, the highest TER values occur in the early afternoon, corresponding to ratios indicative of traffic-related emissions.

15 The sharp increase in TER during morning hours is closely aligned with increasing traffic, a major contributor to NO_x and CO_2 emissions, and high TER values (2-5 nmol/µmol). Weekend TERs are generally lower compared to weekdays, which can be attributed to the absence or delay of morning rush hour traffic and an overall reduction in traffic load.

The variability in TER across different seasons reflects changes in both anthropogenic and meteorological factors. The primary driver is the shift in domestic fuel use, particularly the increased use of heating systems during winter, which signifi-

- 20 cantly impacts emissions. In contrast, during the intermediate seasons of spring and autumn, atmospheric conditions, such as warmer weather periods, play a crucial role in modulating domestic fuel consumption. The impact of vegetation on CO₂ fluxes at the fieldsite is negligible (Lamprecht et al., 2021). Another contributing factor is the seasonal variability of the measurement footprint, where even minor shifts can result in a greater or lesser influence of traffic-related emissions. The diurnal cycle of TER consistently shows a significant increase when wind patterns shift from valley-down winds (typically at night) to valley-
- 25 up winds during the day, due to the differing land use characteristics within the diurnal footprint (see Supplement Fig. 2S). During synoptic weather conditions in winter, west winds prevail almost throughout the entire day on average, resulting in signals originating from a region associated with low NO_x/CO₂ ratios (E, F).







Figure 4: Box plots of the hourly TER during weekdays (Monday to Thursday, left) and weekends (Sunday, right) throughout the seasons. Black dots represent median values, circles indicate outliers, and the bars the interquartile range and the overall distribution. The green points denote the predominant wind sectors for each time interval.

- 5 Fig. 5 provides a detailed analysis of the average NO_x and CO₂ fluxes as a function of the daily mean temperature. Panel A specifically illustrates the behaviour of CO₂ fluxes, which display a distinct negative correlation of $dCO_2/dT = -0.49 \ \mu mol/K$ at temperatures below 12 °C, what agrees well with Ward et al. (2022). On the other hand, at daily mean temperatures exceeding this threshold, the CO₂ flux stabilizes ($dCO_2/dT = +0.02 \ \mu mol/K$), indicating that sources contributing to CO₂ emissions at higher temperatures remain constant, irrespective of further temperature increases. The fact that this change in pattern
- 10 occurs around 12 °C aligns well with the heating threshold defined by the Austrian norm ÖNORM H 7500-3, locally known





as the "Heizgrenze" (heating threshold). Most automatically controlled heating systems are only activated when the outside temperature drops below this level.



Figure 5: (A) temperature dependency for CO₂ (red dots) and NO_x (turquoise dots) fluxes across daily mean temperatures ranging from -5.0 °C to 25.0 °C. The boxplot is split into 2.5K intervals, where the black dots indicate the median, and the other box plot elements illustrate the interquartile range and whiskers. Black circles are representing outliers. The linear fit for NO_x fluxes is calculated across the entire temperature range, while for CO₂ fluxes, it is separated into two regions (T₁ < 12 °C, T₂ > 12°C) excluding the values for < -2.5 °C. The black vertical line at 12 °C marks the heating temperature threshold for Austria. (B) displays the frequency of occurrence of the binned daily mean temperatures, grouped by season.

10 In contrast, the NO_x flux demonstrates a different pattern. It shows a very moderate positive temperature dependence $(dNO_x/dT = +0.14 \text{ nmol/K})$ that is relatively constant across the entire range of temperatures examined. This suggests that NO_x emissions, which are largely influenced by traffic, do not vary significantly with temperature changes. The interplay of



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these two trends is reflected in the Turbulent Enhancement Ratio, which decreases at lower temperatures. This decrease can be attributed to the increase in CO_2 sources, which become more prominent as temperatures drop, thereby altering the ratio between NO_x and CO_2 .

The temperature dependency of CO_2 fluxes aligns closely with the natural gas consumption analysis conducted by Stichaner et al. (2024), which also reveals a negative correlation at a specific temperature threshold. Natural gas is predominantly used for heating in the RCP (ie. residential/domestic, commercial and public) sectors. Since many heating systems within the footprint are powered by gas and oil, sources with lower NO_x/CO_2 ratios become more prominent during the heating season.

Panel B highlights the frequency of occurrence of daily mean temperatures, binned in 2.5 K sectors, across different seasons. This comparison reveals a clear trend towards higher CO_2 fluxes during colder seasons. The analysis suggests that the colder months are characterized by increased domestic heating, which significantly contributes to CO_2 emissions.

4.3.2. Lockdown vs. Non-Lockdown

emission changes, which introduces some limitations to the interpretation.

In March 2020, the COVID-19 pandemic reached Austria, with Tyrol becoming a hotspot during the first wave. A strict lockdown, including a state-wide quarantine, was implemented from 16 March to 13 April, with a full easing of measures by mid-May. According to an analysis of emission changes by Lamprecht et al. (2021) during this period, NO_x and CO_2 emissions decreased to different levels, which should also be evident in relative changes of the TER. For the analysis shown in Fig. 6, the first lockdown period was compared with the corresponding non-lockdown period in 2019. Panels (A, B) present

the associated TERs for weekdays (A) and weekends (B). Comparing the relative changes between the TER during the first lockdown (in March 2020) and the reference period (March 2019) show significant reductions of -32.18^{-49.24}/_{-14.86}% on weekdays and -55.14^{-76.06}/_{-22.88}% on weekends, with the most pronounced decrease occurring during rush hours, although the overall diurnal cycle remains unchanged. The large variability in reduction rates between weekdays and weekends can be attributed to the small number of Sundays (4) during this intense operational period (IOP), coinciding with a transitional phase in Austria from cold to warmer weather. Synoptic variability during this time had a significant influence on the local footprint and

Compared to the approximately -55 % reduction in weekday traffic during the lockdown, the TER remains higher. This is due to the complex interplay of various emission ratios that determine the TER. In addition to the reduction in traffic, there was also a decrease in emissions from domestic heating. This is evident from the diurnal temperature profile shown in Panel (C). In 2020, daytime maximum temperatures (08-16 UTC) were on average 2.44±0.34 °C higher (with a maximum of 4.27 °C) than in 2019, leading to a 16.67 % reduction in heating days and, consequently, reduced energy consumption for heating systems. According to the Google Environmental Insights Explorer (<u>https://insights.sustainability.google/</u>, last accessed:

30 26 August 2024), energy production for heating and hot water in the region is derived from electric power (37.47 %), gas



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(31.26 %), and oil (31.26 %), with the latter two being significant sources of NO_x and CO₂ emissions in the footprint. As emissions from sources with smaller ratios decrease, the relative impact of other emission ratios becomes more pronounced, resulting in a TER that remains higher than the traffic reduction alone would suggest. Overall, the observed TER changes with and without a lockdown are generally consistent with the modelled emission changes based on direct flux observations (Lamprecht et al., 2021) with changes between -59 % for NO_x and -38 % for CO₂ fluxes.

Panel D of Fig. 6 illustrates the dominant half-hourly wind directions during the IOPs, providing insights into potential differences in the turbulent footprint of the measurements. Both IOPs exhibit relatively similar wind regimes with minimal variability, except the time between 18 UTC and midnight. During this period, the wind direction during the lockdown phase shifts back to 240 ° (valley-down wind), whereas in 2019, the wind remains predominantly within the 0-60 ° sector. Never-

10 theless, the overall comparability between the two periods is strong, as the prevailing wind regimes ensure that the same source areas were consistently captured during the key daytime hours (08-16 UTC).



Figure 6: Comparison of the TER (A, B), temperature (C) and wind direction (D) during the first COVID-19 lockdown in 2020 with a non-lockdown period in 2019. The points in (A) and (B) represent the original TER values for the lockdown (red) and non-

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a non-lockdown period in 2019. The points in (A) and (B) represent the original TER values for the lockdown (red) and nonlockdown (turquoise) periods for weekdays and weekends, respectively. The corresponding solid lines represent a 3-point moving average, with the grey shaded area indicating the standard error. The relative change between the TER during lockdown and nonlockdown is shown by a solid green line. Panel (C) presents the diurnal temperature profiles, along with the numbers of heating days for the lockdown (LD) and non-lockdown (Non-LD) periods. Panel D illustrates the predominant wind directions in 10° intervals for both IOPs.



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5. Discussion and Summary

Here we demonstrated that time resolved observations of air pollutants, which capture most of the variance of the turbulent flow, can be used to determine local enhancement ratios of different air pollutants. These turbulent enhancement ratios (TER) are in excellent agreement with flux ratios from eddy covariance observations of NO_x and CO_2 in the city of Innsbruck. The advantage of the turbulent enhancement method is that, in principle, no additional instrumentation other than the tracer observations is needed. The analysis presented here can be used in combination with a growing number of instrumentation technology, that can capture multi species at high time-resolution, such as spectroscopic and mass – spectrometric techniques. The TER method opens up possibilities for measuring and interpreting tracer – tracer enhancement ratios in complex environments, where plume separation is difficult, such as in urban settings, and in principle does not require data pre-treatment that is often necessary for eddy covariance observations. We find that the sampling rate for determining TERs should be at least 1 Hz or faster to resolve the most important turbulent time scales in urban environments, and to avoid significant bias due to ensemble averaging.

In Innsbruck, long-term analysis of the TER shows that the NO_x/CO_2 enhancement ratio can be explained by the super-

position of two main sources: traffic and energy usage for heating and warm water generation. We are able to describe
the variation of the turbulent enhancement ratio of NO_x/CO₂ based on the superposition of traffic activity and temperature
driven activity in the RCP sector. In summer, the daytime TER lies close to the expected ratio from traffic emissions (e.g. 2-5.3 nmol/µmol; Peitzmeier et al., 2017). In winter a higher fraction from heating in the residential, commercial and
public sectors is evident and reduces the ratio. NO_x emissions in Innsbruck are predominantly associated with traffic (e.g. > 90 % e.g. Lamprecht et al., 2021). In contrast, CO₂ emissions have a sizeable contribution from traffic and the RCP
sector. The reduction of the NO_x/CO₂ ratio is therefore primarily driven by changes in CO₂ emissions throughout the season (i.e. higher emissions in winter). This explains the variation of the TER during weekend, weekdays, different seasons and during hard mobility restrictions during the COVID-19 pandemic.

Author contributions

CL and TK drafted the manuscript, which was edited by all authors. CL performed and analysed NO_x and CO_2 data, with support from MG, MaS and MiS. Interpretation of the results were performed by TK, CL, MG, AH, and WJ.

Conflict of interest:

The authors declare that they have no conflict of interest.





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Code and data availability

5 The eddy covariance flux code used for flux analysis was published by Striednig et al. (2020) and is available at the following link: https://git.uibk.ac.at/acinn/apc/innflux. The data is shared on Zenodo and can be accessed via Lamprecht et al. (2024).

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