Temporal variations of atmospheric CO$_2$ and CO at Ahmedabad in western India

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Abstract. About 70% of the anthropogenic carbon dioxide (CO$_2$) is emitted from the mega-cities and urban areas of the world. In order to draw effective emission mitigation policies for combating future climate change as well as independently validate the emission inventories for constraining their large range of uncertainties, especially over major metropolitan areas of developing countries, there is an urgent need for greenhouse gases measurements over representative urban regions. India is a fast developing country, where fossil fuel emissions have increased dramatically in the last three decades and predicted further to continue to grow by at least 6% per year through 2025. In the absence of systematic CO$_2$ measurements over the Indian urban locations, CO$_2$ along with an anthropogenic emission tracer carbon monoxide (CO) are being measured at Ahmedabad, a major urban site in western India, using a state-of-the-art laser based cavity ring down spectroscopy technique from November 2013 to May 2015 with a break during March to June 2014. These measurements enable us to understand the diurnal and seasonal variation in atmospheric CO$_2$ with respect to its sources (both anthropogenic and biospheric) and biospheric sinks. The observed annual average concentrations of CO$_2$ and CO are 413.0$\pm$13.7 ppm and 0.50$\pm$0.37 ppm respectively. Both CO$_2$ and CO show strong seasonality, with lower concentrations (400.3$\pm$6.8 ppm and 0.19$\pm$0.13 ppm) during the south-west monsoon and higher concentrations (419.6$\pm$22.8 ppm and 0.72$\pm$0.68 ppm) during the autumn (SON) season. Strong diurnal variations are also observed for both the species. The common factors for diurnal cycles of CO$_2$ and CO are the vertical mixing and rush hour traffic, while the influence of biospheric fluxes is also seen in CO$_2$ diurnal cycle. Using CO and CO$_2$ covariation, we differentiate the anthropogenic and biospheric components of CO$_2$ and found that significant contributions of biospheric respiration and anthropogenic emission in the late night (0000-0500 hrs) and evening rush hours (1800-2200 hrs) respectively. We compute total yearly emission...
of CO to be 69.2±0.07 Gg for the study region using the observed CO:CO$_2$ correlation slope and bottom-up CO$_2$ emission inventory. This calculated emission of CO is 52% larger than the estimated emission of CO by the EDGAR inventory. The observations of CO$_2$ have been compared with an atmospheric chemistry transport model (i.e., ACTM), which incorporates various components of CO$_2$ fluxes. ACTM is able to capture the basic variabilities, but both diurnal and seasonal amplitudes are largely underestimated compared to the observations. We attribute this underestimation by model to uncertainties in terrestrial biosphere fluxes and coarse model resolution. The fossil fuel signal from the model shows fairly good correlation with observed CO$_2$ variations, which supports the overall dominance of fossil fuel emissions over the biospheric fluxes in this urban region.

1 Introduction

Carbon dioxide (CO$_2$) is the most important anthropogenically emitted greenhouse gas (GHG) and has increased substantially from 278 to 390 parts per million (ppm) in the atmosphere since the beginning of the industrial era (circa 1750). It has contributed to more than 65% of the radiative forcing increase since 1750 and hence leads to the significant impact on the climate system (Ciais et al., 2013). Major causes of CO$_2$ increase are anthropogenic emissions, especially fossil fuel combustion, cement production and land use change. Land and oceans are the two important sinks of atmospheric CO$_2$, which remove about half of the anthropogenic emissions (Le Quéré et al., 2014). The prediction of future climate change and its feedback rely mostly on our ability to quantifying fluxes of greenhouse gases, especially CO$_2$ at regional (100-1000 km$^2$) and global scale. Though the global fluxes of CO$_2$ can be estimated fairly well, the regional scale fluxes are associated with quite high uncertainty especially over the South Asian region; the estimation uncertainty being larger than the value itself (Patra et al., 2013; Peylin et al., 2013). Detailed scientific understanding of the flux distributions is also needed for formulating effective mitigation policies.

Along with the need of atmospheric measurements for predicting the future levels of CO$_2$, quantifying the components of anthropogenic emissions of CO$_2$ is similarly important for providing independent verification of mitigation strategies as well as understanding the biospheric component of CO$_2$. Alone CO$_2$ measurements could not be helpful in making such study due to the large role of biospheric fluxes in its atmospheric distributions. The proposed strategy for quantification of the anthropogenic component of CO$_2$ emissions is to measure simultaneously the anthropogenic tracers (Duren and Miller, 2012). CO can be used as a surrogate tracer for detecting and quantifying anthropogenic emissions from burning processes, since it is a major product of incomplete combustion (Turnbull et al., 2006; Wang et al., 2010; Duren and Miller, 2012). The vehicular as well as industrial emissions contribute large fluxes of CO$_2$ and CO to the atmosphere in urban regions. Several grounds based and aircraft based simultaneous studies of CO and CO$_2$ have been done in the past.
from different parts of the world (Turnbull et al., 2006; Wunch et al., 2009; Wang et al., 2010; Newman et al., 2013) but such study has not been done in India except recently reported results from weekly samples for three Indian sites by Lin et al. (2015).

Measurements at different regions (e.g., rural, remote, urban) and at different frequency (e.g., weekly, daily, hourly etc) has their own advantage and limitations. For example, the measurements at remote locations at weekly interval can be useful for studying seasonal cycle, growth rate, and estimating the regional carbon sources and sinks after combining their concentrations with inverse modelling and atmospheric tracer transport models. However, some important studies, like theirs diurnal variations, temporal covariance...etc are not possible from these measurements due to their limitations. Analysis of temporal covariance of atmospheric mixing processes and variation of flux on shorter time scales, e.g., sub-daily, is essential for understanding local to urban scale CO₂ flux variations (Ahmadov et al., 2007; Pérez-Landa et al., 2007; Briber et al., 2013; Lopez et al., 2013; Ammoura et al., 2014; Ballav et al., 2015). Urban regions contribute about 70% of global CO₂ emission from anthropogenic sources and further projected to increase further over the coming decades (Duren and Miller, 2012). Therefore, measurements over these regions are very helpful for understanding emissions growth as well as verifying the mitigation policies. The first observations of CO₂, CO and other greenhouse gases started in February 1993 from Cape Rama (CRI: a clean site) on the south-west coast of India using flask samples (Bhattacharya et al., 2009). After that, several other groups have initiated the measurements of surface level greenhouse gases (Mahesh et al., 2014; Sharma et al., 2014; Tiwari et al., 2014; Lin et al., 2015). Most of these measurements are made at weakly or fortnightly time intervals or at lower accuracy. Two aircraft based measurement programs, namely, Civil Aircraft for the regular Investigation of the atmosphere Based on an Instrument Container (CARIBIC) (Brenninkmeijer et al., 2007) and Comprehensive Observation Network for TRace gases by AIrLiner (CONTRAIL) (Machida et al., 2008) have provided important first look on the South Asian CO₂ budget, but these data have their own limitations (Patra et al., 2011; Schuck et al., 2010; 2012). It is pertinent to mention here that till now, there are no reports of CO₂ measurements over the urban locations of the Indian subcontinent, which could be an important player in the global carbon budget as well as mitigation purpose due to strong growing anthropogenic activities specifically fast growing traffic sector and sinks (large areas of forests and croplands). Hence, the present study is an attempt to reduce this gap by understanding the CO₂ mixing ratios in light of its sources and sinks at an urban region in India.

In the view from above, simultaneous continuous measurements of CO₂ and CO have been made since November 2013 from an urban site Ahmedabad located in the western India using very highly sensitive laser based technique. The preliminary results of these measurements for one month period have been reported in Lal et al. (2015). These detailed measurements are utilized for studying the
temporal variations (diurnal and seasonal) of both gases, their emissions characteristics on diurnal and seasonal scale using their mutual correlations, estimating the contribution of anthropogenic and biospheric emission components in the diurnal cycle of CO$_2$ using the ratios of CO to CO$_2$ and rough estimate of the annual CO emissions from study region. Finally, the measurements of CO$_2$ have been compared with simulations using an atmospheric chemistry-transport model to discuss roles of various processes contributing to CO$_2$ concentrations variations.

2 Site description, local emission sources and meteorology

The measurement facility is housed inside the campus of the Physical Research Laboratory (PRL), situated in the western part of Ahmedabad (23.03°N, 72.55°E, 55 m AMSL) in the Gujarat state of India (Fig.[1]). It is a semi-arid, urban region in western India, having a variety of large and small scale industries (Textile mills and pharmaceutical production facilities) in east and north outskirts. The institute is situated about 15-20 km away from these industrial areas and surrounded by tree on all sides. The western part is dominated by the residential areas. The city has a population of about 5.6 million (Census India, 2011) and has large number of automobiles (about 3.2 million), which are increasing at the rate of about 10% per year. Most of the city buses and auto-rickshaws (three-wheelers) use compressed natural gas (CNG) as a fuel. The transport-related activities are the major contributors of various pollutants (Mallik et al. 2015). An emission inventory for this city, which is developed for all known sources, shows the annual emissions (for year 2010) of CO$_2$ and CO about 22.4 million tons and 707,000 tons respectively (http://www.indiaenvironmentportal.org.in/files/file/Air-Pollution-in-Six-Indian-Cities.pdf). Out of these emissions, transport sector contribute about 36% in CO$_2$ emission and 25% in CO emissions, power plants contribute about 32% in CO$_2$ emissions and 30% in CO emission, industries contribute about 18% in CO$_2$ emissions and 12% in CO emissions and domestic sources contribute about 6% in CO$_2$ emissions and 22% in CO emissions. The Indo-Gangetic Plain (IGP) is situated in the northeast of Ahmedabad, which is very densely populated region and has high levels of pollutants emitted from various industries and power plants along with anthropogenic emissions from burning of fossil fuels and traditional biofuels (wood, cow-dung cake etc). The Thar Desert and the Arabian Sea are situated in the northwest and southwest of Ahmedabad respectively.
Figure 1: (A1) Spatial distribution of total anthropogenic CO$_2$ emissions from the EDGARv4.2 inventory over Ahmedabad and surrounding regions. (A2) The Ahmedabad city map showing location of the experimental site (PRL). (A3: a-d) Monthly average temperature with monthly maximum and minimum value, relative humidity (RH), rainfall, wind speed, PBL height and ventilation coefficient (VC) over Ahmedabad during the year 2014. Temperature, RH and wind speed are taken from Wunderground weather (www.wunderground.com) while rainfall and PBLH data are used from Tropical Rainfall Measuring Mission (TRMM) satellite and MEERA reanalysis data. (A4) Wind rose plots for Ahmedabad for the four seasons of 2014 using daily average data from Wunderground.

Figure 1 shows average monthly variability of temperature, relative humidity (RH), wind speed based on data taken from Wunderground (http://www.wunderground.com), rainfall from Tropical Rainfall Measuring Mission (TRMM) and planetary boundary layer height (PBLH) from the Modern-Era Retrospective Analysis for Research and Applications (MEERA). The wind rose plot shows the surface level wind speed and direction during different seasons over Ahmedabad in 2014. Large seasonal variations are observed in the wind speed and direction over Ahmedabad. During the summer monsoon season (June-July-August), the inter-tropical convergence zone (ITCZ) moves northward across India. It results in the transport of moist and cleaner marine air from the Arabian Sea and the Indian Ocean to the study location by south westerly winds, or the so-called southwest monsoon (summer monsoon). The first shower due to the onset of the southwest monsoon occurs in July and it retreats in the mid of September over Ahmedabad. Due to heavy rain and winds mostly
from oceanic region, RH shows higher values in July, August and September. Highest RH of about 83% is observed in September. The long-range transport of air masses from the northeast part of the Asian continent starts to prevail over Indian region when ITCZ moves back southward in September and October. These months are regarded as transition period for the monsoon. During autumn (September-October-November), the winds are calm and undergo a change in their direction from south west to north east. When the transition of winds takes place from oceanic to continental region in October, the air gets dryer and RH decreases until December. The winds are north easterly during winter (December- January - February) and transport pollutants mostly from continental region (IGP region). During the spring season (March - April - May), winds are north westerly and little south westerly which transport mixed air masses from continent and oceanic regions. The average wind speed is observed higher in June and July while lower in October and March when transition of wind starts from oceanic to continental and continental to oceanic respectively. The monthly averaged temperature starts increasing from January and attains maximum (34.6±1.4°C) in June, followed by a decrease until September and temperature is slightly warmer in October compared to the adjacent months. The monthly variation in planetary boundary layer height (PBLH) closely resembles with the temperature pattern. Maximum PBLH of about 1130 m is found in June and it remains in the lower range at about 500 m during July to January. The ventilation coefficient (VC) is obtained by multiplying wind speed and PBL height which gradually increases from January to attain the maximum value in June and the lowest values of VC are observed in October and November.

3 Experiment and model details

3.1 Experimental method

The ambient measurements of CO\textsubscript{2} and CO concentrations have been made using the wavelength scanned cavity ring down spectroscopic (CRDS) technique based analyser (Picarro-G2401) at 0.5 Hz. CRDS offers highly sensitive and precise measurements of trace gases in the ambient air, due to its three main characteristics (Bitter et al., 2005; Chen et al., 2010; Karion et al., 2013). (1). It provides very long interaction path length (around 20 km) between the sample and the incident wavelength, by utilizing a 3-mirror configuration, which enhances its sensitivity over other conventional techniques like Non-dispersive Infrared Spectroscopy (NDIR) and Fourier Transform Infrared Spectroscopy (FTIR). (2). The operating low pressure (140 Torr) of cell allows to isolate a single spectral feature with a resolution of 0.0003 cm\textsuperscript{-1}, which ensures that the peak height or area is linearly proportional to the concentration. (3). The measurements of trace gases using this technique are achieved by measuring the decay time of light intensity inside the cavity while the conventional optical absorption spectroscopy technique is based on absorption of light intensity. Hence, it increases the accuracy of measurements because it is insensitive to the fluctuations of incident light. The cell
temperature of analyzer was maintained at 45°C throughout the study period.

Figure 2: Schematic diagram of the experimental set-up. We introduce additionally a Nafion dryer upstream of the inlet of instrument for removing the water vapour. Three calibration mixtures from NOAA, USA are used to calibrate CO₂ measurements and one calibration mixture from Linde, UK is used to calibrate CO measurements. The red color box covers the analyser system received from the company, while two blue colours box cover the two stage moisture removing systems, designed at our lab in PRL.

Figure 2 shows the schematic diagram of the experimental set-up, which consists of the analyser, a glass bulb, a Nafion dryer, a heat less dryer, other associated pumps and a set of calibration mixtures. Atmospheric air is sampled continuously from the terrace of the building (25 meter above the ground level) through 1/4 inch PFA Teflon tube via a glass manifold. An external pump is attached on one side of the glass manifold to flush the sample line. Water vapor affects the measurements of CO₂ by diluting its mole fractions in the air and by broadening the spectroscopic absorption lines of other gases. Although, the instrument has ability to correct for the water vapour interferes by using an experimentally derived water vapor correction algorithms (Crosson, 2008), but it has an absolute H₂O uncertainty of ~ 1% (Chen et al., 2010) and can introduces a source of error using a single water vapor correction algorithm (Welp et al., 2013). This error can be minimized by either generat-
ing the correction coefficients periodically in the laboratory or by removing the water vapour from the sample air. Conducting the water vapor correction experiment is bit tricky and need extra care as discussed by Welp et al. (2013). Hence, we prefer to remove water vapour from the sample air by introducing a 50-strand Nafion dryer (Perma Pure, p/n PD-50T-24MSS) in the upstream of the analyser. Nafion dryer contains a bunch of semi-permeable membrane tubing separating an internal sample gas stream from a counter sheath flow of dry gas in stainless steel outer shell. The partial pressure of water vapour in the sheath air should be lower than the sample air for effectively removing the water vapour from the sample air. A heatless dryer generates dry air using a 4 bar compressor (KNF, MODEL: NO35ATE) which is used as a sheath flow in Nafion dryer. After drying, sample air passes through the PTFE filter (polytetrafluoroethylene; 5 µm Sartorius AG, Germany) before entering the instrument cavity. This setup dries the ambient air near to 0.03% (300 ppm) concentration of H₂O.

The measurement system is equipped with three high pressure aluminium cylinders containing gas mixtures of CO₂ (350.67±0.02, 399.68±0.01 and 426.20±0.01 ppm) in dry air from NOAA, Boulder USA, and one cylinder of CO (970 parts per billion (ppb)) from Linde UK. These tanks were used to calibrate the instrument for CO₂ and CO. An additional gas standard tank (CO₂: 338 ppm, CO: 700 ppb), known as the “target”, is used to monitor the instrumental drift and to assess the dataset accuracy and repeatability. The target tank values are calibrated against the CO₂ and CO calibration mixtures. The target tank and calibration gases were measured mostly in the mid of every month (Each calibration gas is passed for 30 minute and target tank for 60 minutes). The target gas is introduced into the instrument for a period of 24 hours also once in a six month, for checking the diurnal variability of instrument drift. Maximum drift for 24 hours has been calculated by subtracting the maximum and minimum value of 5 minute average, which were found to be 0.2 ppm and 0.015 ppm respectively for CO₂ and CO. For all calibration mixtures, the measured concentration is calculated as the average of the last 10 minutes. The linearity of the instrument for CO₂ measurements has been checked by applying the linear fit equation of the CO₂ concentration of the calibration standards (350.67 ppm, 399.68 ppm and 426.20 ppm) measured by the analyzer. The slope is found in the range of 0.99 - 1.007 ppm with a correlation coefficient (r) of about 0.999. Further, linearity of the instrument for CO is also checked by diluting the calibration mixture from 970 ppb to 100 ppb. The calibration mixture is diluted in a glass made dead volume using highly precise and accurate pure air (air free from water vapor, particles, carbon monoxide (CO), sulphur dioxide (SO₂), oxides of nitrogen (NOx), ozone (O₃), and hydrocarbons (HC)) from ECO Physics generator. The flows of calibration mixture and pure air were regulated using two separate mass flow controllers from Aalborg. For increasing the interaction time of both the gases (zero air and calibration mixture) and to insure a homogeneous mixing, the spring shaped dead volume is used. Each diluted mixture is passed for 30 minutes in the instrument and average of last 10 minute
data are used for the test. The instrument shows excellent linearity for CO and slope is observed to be 0.98. The accuracy of the measurements is calculated by subtracting the mean difference of measured CO$_2$ and CO concentration from the actual concentration of both gases in target gas. The accuracies of CO$_2$ and CO are found in the range of 0.05-0.2 ppm and 0.01-0.025 ppm respectively. The repeatability of both gases are calculated by the standard deviation of the mean concentration of target gas measured by the analyser over the period of observations and found 0.3 ppm and 0.04 ppm for CO$_2$ and CO respectively.

### 3.2 Description of AGCM-based Chemistry Transport Model (ACTM)

This study uses the Center for Climate System Research/National Institute for Environmental Studies/Frontier Research Center for Global Change (CCSR/NIES/FRCGC) atmospheric general circulation model (AGCM)-based chemistry-transport model (ACTM). The model is nudged with reanalysis meteorology using Newtonian relaxation method. The U and V components of horizontal winds are used from the Japan Meteorological Agency Reanalysis (JRA-25) \cite{Onogi2007}. The model has 1.125$^\circ \times$ 1.125$^\circ$ horizontal resolution (T106 spectral truncation) and 32 vertical sigma-pressure layers up to about 50 km. Three components namely anthropogenic emissions, monthly varying ocean exchange with net uptake and terrestrial biospheric exchange of surface CO$_2$ fluxes are used in the model. The fossil fuel emissions are taken from EDGAR inventory for the year of 2010. Air-sea fluxes from \cite{Takahashi2009} have been used for the oceanic CO$_2$ tracer. The oceanic fluxes are monthly and are linearly interpolated between mid-months. The terrestrial biospheric CO$_2$ tracers are provided from the Carnegie-Ames-Stanford-Approach (CASA) process model \cite{Randerson1997}, after introducing a diurnal variability using 2 m air temperature and surface short wave radiation from the JRA-25 as per \cite{Olsen2004}. The ACTM simulations has been extensively used in TransCom CO$_2$ model inter-comparison studies \cite{Law2008, Patra2008}.

### 4 Results and Discussion

#### 4.1 Time series and general statistics

Figures 3a and 3c show the time series of 30 minute average CO$_2$ and CO concentrations for the period of November, 2013 - February, 2014 and July, 2014 to May, 2015. Large and periodic variations indicate the stronger diurnal dependence of both the gases. Concentrations and variability of both the gases are observed lowest in the month of July and August, maximum scatter in the concentrations and several plumes of very high levels both gases have been observed from October, 2014 until mid-March 2015. Almost all plumes of CO$_2$ and CO are one to one correlated and are mostly found during evening rush hours and late nights. Figures 3e and 3f show the variations of CO$_2$ and CO concentrations with wind speed and direction for the study period except July, August
and September due to non-availability of wind data. Most of the high and low concentrations of both gases are found to be associated with low and high wind speeds. There is no specific direction for high levels of these gases. This probably indicates the transport sector is an important contributor to the local emissions since the measurement site is surrounded by the city roads.

Figure 3: (a and c) Time series of 30 minute average values CO$_2$ and CO measured at Ahmedabad for the study period. (b and d) The frequency distribution in CO$_2$ and CO concentrations for the study period using 30 minute mean of both gases. (e and f) The polar plots show the variation of 30 minute averaged CO$_2$ and CO at this site with wind direction and speed during the study period except July, August and September due to unavailability of meteorology data.

Figures 3b and 3d show the probability distributions or frequency distributions of CO$_2$ and CO concentrations during the study period. Both gases show different distributions from each other. This difference could be attributed to the additional role of biospheric cycle (photosynthesis and respiration) on the levels of CO$_2$ apart from the common controlling factors (local sources, regional transport, PBL dynamics etc) responsible for distributions of both gases. The control of the boundary layer is common for the diurnal variations of these species because of their chemical lifetimes are longer (> months) than the timescale of PBL height variations (∼ hrs). However, biospheric fluxes...
of CO$_2$ can have strong hourly variations. During the study period the CO$_2$ concentrations varied between 382 - 609 ppm, with 16% of data lying below 400 ppm, 50% lying in the range 400-420 ppm, 25% between 420-440 ppm and 9% in the range of 440-570 ppm. Maximum frequency of CO$_2$ is observed at 402.5 ppm during the study period. The CO concentrations lies in the range of 0.071-8.8 ppm with almost 8% data lies below the most probable frequency of CO at 0.2 ppm, while 70% data lies between the concentrations of 0.21 ppm and 0.55 ppm. Only 8% data lies above the concentration of 1.6 ppm and rest of 14% data lies between 0.55 and 1.6 ppm. The annual mean concentrations of CO$_2$ and CO are found to be 413.0±13.7 ppm and 0.50±0.37 ppm respectively, after removing outliers beyond 2$\sigma$ values.

4.2 Seasonal variations of CO$_2$ and CO

The seasonal cycles of CO$_2$ and CO are mostly governed by the strength of emission sources, sinks and transport patterns. Although they follow almost identical seasonal patterns but the factors responsible for their seasonal behaviors are distinct as for the diurnal variations. We calculate the seasonal cycle of CO$_2$ and CO using two different approaches. In the first approach, we use the monthly mean of all measurements and in the second approach we use monthly mean of the afternoon period (1200-1600 hrs) measurements only. The seasonal cycle from first approach will present the overall variability in both gases. On the other hand, the second approach removes the auto-covariance by excluding CO$_2$ and CO data mainly affected by local emission sources and represent seasonal cycles at the well mixed volume of the atmosphere. The CO$_2$ time series is de-trended by subtracting a mean growth rate of CO$_2$ observed at Mauna Loa (MLO), Hawaii, i.e., 2.13 ppm yr$^{-1}$ or 0.177 ppm/month (www.esrl.noaa.gov/gmd/ccgg/trends/) for clearly depicting the seasonal cycle amplitude. Figure 4a and Figure 4b show the variations of monthly average concentrations of CO$_2$ and CO using all daily (0-24 hrs) data and afternoon (1200-1600 hrs) data.

Figure 4: The seasonal variation of CO$_2$ and CO from July, 2014 to May, 2015 using their monthly mean concentrations. The blue dots and red rectangles show the monthly average concentrations of these gases for the total (0-24 hrs) and noon time (1200-1600 hrs) data respectively with 1$\sigma$ spread.
In general, total mean values of CO$_2$ and CO are observed lower in July having concentration 398.78±2.8 ppm and 0.15±0.05 ppm respectively. During summer monsoon months predominance of south-westerly winds which bring cleaner air from the Arabian Sea and the Indian Ocean over to Ahmedabad and high VC (Figure 1) are mostly responsible for the lower concentration of total mean of both the gases. CO$_2$ and CO concentrations are also at their seasonal low in the northern hemisphere due to net biospheric uptake and seasonally high chemical loss by reaction with OH, respectively. In addition, deep convections in the summer monsoon season efficiently transport the Indian emission (for CO, hydrocarbons) or uptake (for CO$_2$) signals at the surface to the upper troposphere, resulting lower concentrations at the surface in the summer compared to the winter months (Kar et al., 2004; Randel and Park, 2006; Park et al., 2009; Patra et al., 2011; Baker et al., 2012).

During autumn and early winter (December), lower VC values cause trapping of anthropogenically emitted CO$_2$ and CO and is the major cause for high concentrations of both gases during this period. In addition to this, wind changes from cleaner marine region to polluted continental region, especially from IGP region and hence could be additional factor for higher levels of CO$_2$ and CO during these seasons (autumn and winter). Elevated levels during these seasons are also examined in several other pollutants over Ahmedabad as discussed in previous studies (Sahu and Lal, 2006; Mallik et al., 2016). Maximum concentrations of CO$_2$ and CO are observed to be 424.8±17 ppm and 0.83±0.53 ppm, respectively, during November. From January to May the total mean concentration of CO$_2$ decreases from 415.3±13.6 to 406.1±5.0 ppm and total mean concentration of CO decreases from 0.71±0.22 to 0.22±0.10 ppm. Higher VC and predominance of comparatively less polluted mixed air masses from oceanic and continental region results in lower total mean concentrations of both gases during this period. There are some clear differences which are observed in the afternoon mean concentrations of CO$_2$ as compared to daily mean. The first distinct feature is that significant difference of about 5 ppm is observed in the afternoon mean of CO$_2$ concentration from July to August as compared to the difference in total mean concentration about ~0.38 ppm for the same period. Significant differences in the afternoon concentrations of CO$_2$ from July to August is mainly due to the increasing sink by net biospheric productivity after the Indian summer monsoonal rainfall. Another distinct feature is that the daily mean concentration of CO$_2$ is found highest in November while the afternoon mean concentration of CO$_2$ attains maximum value (406±0.4 ppm) in April. Prolonged dry season combined with high daytime temperature (about 41°C) during April-May make the tendency of ecosystem to become moderate source of carbon exchange (Patra et al., 2011) and this could be responsible for the elevated mean noon time concentrations of CO$_2$. Unlike CO$_2$, seasonal patterns of CO from total and afternoon mean concentrations are identical, although levels are different. It shows that the concentrations of CO is mostly governed by identical sources during day and night time through out the year.
The average amplitude (max - min) of the annual cycle of CO$_2$ is observed around 13.6 and 26.07 ppm from the afternoon mean and total mean respectively. Different annual cycles and amplitudes have been observed from other studies conducted over different Indian stations. Similar to our observations of the afternoon mean concentrations of CO$_2$, maximum values are also observed in April at Pondicherry (PON) and Port Blair (PBL) with amplitude of mean seasonal cycles about 7.6±1.4 and 11.1±1.3 ppm respectively [Lin et al., 2015]. Cape Rama (CRI), a coastal site on the south-west coast of India show the seasonal maxima one month before than our observations in March annual amplitude about 9 ppm [Bhattacharya et al., 2009]. The Sinhagad (SNG) site located over the Western Ghats Mountains, show very larger seasonal cycle with annual amplitude about 20 ppm [Tiwari et al., 2014]. The amplitude of mean annual cycle at the free tropospheric site Hanle at altitude of 4500 m is observed to be 8.2±0.4 ppm, with maxima in early May and the minima in mid-September [Lin et al., 2015]. Distinct seasonal amplitudes and patterns are due to differences in regional controlling factors for the seasonal cycle of CO$_2$ over these locations, e.g., the Hanle is remotely located from all continental sources, Port Blair site is sampling predominantly marine air, Cape Rama observes marine air in the summer and Indian flux signals in the winter, and Sinhagad represents a forested ecosystem. These comparisons show the need for CO$_2$ measurements over different ecosystems for constraining its budget.

The annual amplitude in afternoon and daily mean CO concentration is observed to be about 0.27 and 0.68 ppm, respectively. The mean annual cycles of CO over PON and PBL show the maxima in the winter months and minima in summer months same as our observations with annual amplitudes of 0.078±0.01 and 0.144±0.016 ppm, respectively. So the seasonal levels of CO are affected by large scale dynamics which changes air masses from marine to continental and vice versa and by photochemistry. The amplitudes of annual cycle at these locations differ due to their climatic conditions and sources/sinks strengths.

### 4.3 Diurnal variation

The diurnal patterns for all months and seasons are produced by first generating the time series from the 15 min averages and then averaging the individual hours for all days of the respective month and season after removing the values beyond 2σ- standard deviations for each month as outliers.

#### 4.3.1 Diurnal variation of CO$_2$

Figure 5 shows the mean diurnal cycles of atmospheric CO$_2$ and associated 1-σ standard deviation (shaded region) during all the four seasons. All times are in Indian Standard Time (IST), which is 5.5 hrs ahead of the Universal Time (UT). Noticeable differences are observed in the diurnal cycle of CO$_2$ from season to season. In general, maximum concentration has been observed during morning (0700-0800 hrs) and evening (1800-2000 hrs) hours, when ABL is shallow, traffic is dense and veg-
etation respiration dominate due to absence of photosynthetic activity. The minimum of the cycles occurred in the afternoon hours (1400-1600 hrs), when PBL is deepest and well mixed as well as when the vegetation photosynthesis is active. There are many interesting features in the period of 0000-0800 hrs. CO$_2$ concentrations start decreasing from 0000 to 0300 hrs and increases slightly afterwards till 0600-0700 hrs during summer and autumn. Respiration of CO$_2$ from the vegetation is mostly responsible for this night time increase. During winter and spring seasons CO$_2$ levels are observed constant during night hours and small increase is observed only from 0600 to 0800 hrs during the winter season. In contrary to this, subsequent section shows a continuous decline in the night time concentrations of main anthropogenic tracer CO, which indicates that there is enough vertical mixing of low CO air from above that once the CO source is turned off, its concentration drops. Hence, constant levels of CO$_2$ at night hours during these seasons give the evidence of a continued but weak sources (such as respiration) in order to offset dilution of mixing of low CO$_2$ air from aloft. Dry soil conditions could be one of the possible causes for weak respirations. Further, distinct timings have been observed in the morning peak of CO$_2$ during different seasons. It is mostly related to the sunrise time, which will decide the evolutions time of PBL height and beginning of vegetation photosynthesis. The sunrise occurs at 0555-0620 hrs, 0620-0700 hrs, 0700-0723 hrs and 0720-0554 hrs during summer, autumn, winter and spring, respectively. During spring and summer, rush hour starts after sunrise, so the vehicular emissions occur when the PBL has been already high and photosynthetic activity has begun. The CO$_2$ concentration is observed lowest in the morning during the summer monsoon season as compared to other seasons. This is because CO$_2$ uptake by active vegetation deplete entire mixed layer during day time and when the residual layer mixes to the surface in the morning, low-CO$_2$ air is mixed down. In winter and autumn, rush hour starts parallel with the sunrise, so the emissions occur when the PBL is low and concentration builds up is much stronger in these seasons than in spring and summer seasons.

The diurnal amplitude is defined as the difference between the maximum and minimum concentrations of CO$_2$ in the diurnal cycle. The amplitudes of monthly averaged diurnal cycle of CO$_2$ from July, 2014 to May 2015 are shown in Figure[5]. The diurnal amplitude shows large month to month variation with increasing trend from July to October and decreasing trend from October onwards. The lowest diurnal amplitude of about 6 ppm is observed in July while highest amplitude about 51 ppm is observed in October. The amplitude does not change largely from December to March and is observed in the range of 25-30 ppm. Similarly from April to May the amplitude also varies in a narrow range from 12 to 15 ppm. The jump in the amplitude of the CO$_2$ diurnal cycle is observed highest (around 208%) from July to August. This is mainly due to significant increase of biospheric productivity from July to August after the rains in Ahmedabad. It is observed that during July the noon time CO$_2$ levels are found in the range of 394-397 ppm while in August the noon time levels are observed in the range of 382-393 ppm. The lower levels could be due to the higher PBL height.
during afternoon and cleaner air, but in case of CO (will be discussed in next section), average day
time levels in August are observed higher than in July. It rules out that the lower levels during Au-
gust are due to the higher PBL height and presence of cleaner marine air, and confirms the higher
biospheric productivity during August.

Near surface diurnal amplitude of CO\textsubscript{2} has been also documented in humid subtropical Indian
station Dehradun and a dry tropical Indian station Gadanki \cite{Sharma et al. 2014}. In comparison
to Ahmedabad, both these stations show distinct seasonal change in the diurnal amplitude of CO\textsubscript{2}.
The maximum CO\textsubscript{2} diurnal amplitude of about 69 ppm is observed during the summer season at
Dehradun (30.3°N, 78.0°E, 435m), whereas maximum of about 50 ppm during autumn at Gadanki
(13.5°N, 79.2°E, 360 m).

4.3.2 Diurnal variation of CO

Figure 6a shows seasonally averaged diurnal variation of CO. In general, the mean diurnal cycle
of CO show lower concentration during noon (1200-1700 hrs) and two peaks in the morning (0800
to 1000 hrs) and in the evening (1800 to 2200 hrs) hours. This cycle exhibits the same pattern as
the mean diurnal cycle of traffic flow, with maxima in the morning and at the end of the afternoon,
which suggests the influence of traffic emissions on CO measurements. Along with the traffic flow,
PBL dynamics also play a critical role in governing the diurnal cycle of CO. The amplitudes of the
evening peak in diurnal cycles of CO are always greater than the morning peaks. It is because the
PBL height evolves side by side with the morning rush hours traffic and hence increased dilution,
while on the other hand, during evening hours, PBL height decrease along with evening dense traf-
cic and favors accumulation of pollutants until the late evening under the stable PBL conditions.
The noon time minimum of the cycle is mostly associated with the deepest and well mixed PBL.In

Figure 5: (a) Average diurnal variation of CO\textsubscript{2} over Ahmedabad during all the four seasons. (b)
Monthly variation of average diurnal amplitude of CO\textsubscript{2} during from July, 2014 to May, 2015. All
times are in Indian Standard Time (IST), which is 5.5 hrs ahead of Universal Time (UT).
general, the average diurnal cycle patterns of both gases (CO$_2$ and CO) are similar, but having few
noticeable differences. The first difference is observed in the timing of the occurrence of morning
peaks: CO$_2$ peaks occur slightly before the CO peak due to the triggering photosynthesis process by
the sunrise. On the other hand, the morning peaks of CO mostly depend on the rush hour traffic and
are consistent at 0800-1000 hrs in all seasons. The second difference is that the afternoon concentra-
tions of CO show little seasonal spread as compared to the afternoon concentrations of CO$_2$. Again,
this is due to the biospheric control on the levels of CO$_2$ during the afternoon hours of different sea-
sons while CO levels are mainly controlled by the dilution during these hours. The third noticeable
difference is that the levels of CO decrease very fast after evening rush hours in all the seasons while
this feature is not observed in the case of CO$_2$ since respiration during night hours contributes to the
levels of CO$_2$. The continuous drop of nighttime concentrations of CO indicates that there is enough
vertical mixing of low CO air from above once the CO source is turned off. The average morning
(0800-0900 hrs) peak values of CO is observed minimum (0.18±0.1 ppm) in summer and maximum
(0.72±0.16 ppm) in winter while evening peak shows minimum value (0.34±0.14 ppm) in summer
and maximum (1.6±0.74 ppm) in autumn. The changes in CO concentrations show large fluctuations
from morning peak to afternoon minima and from afternoon minima to evening peak. From
early morning maxima to noon minima, the changes in CO concentrations are found in the range
of 20 -200%, while from noon minima to late evening maxima the changes in CO concentrations
are found in the range of 85% to 680%. Similar diurnal variations with two peaks have also been
observed in earlier measurements of CO as well as NOx at this site ([Lal et al., 2000]).

![Graph](image_url)

Figure 6: (a) Diurnal variation of CO over Ahmedabad during all the four seasons. (b) Monthly
variation of the diurnal amplitude of CO.

The evening peak contributes significantly to the diurnal amplitude of CO. The largest amplitude
in CO cycle is observed in autumn (1.36 ppm) while the smallest amplitude is observed in summer
(0.24 ppm). The diurnal amplitudes of CO are observed to be about 1.01 and 0.62 ppm, respectively
during winter and spring. Like CO$_2$, the diurnal cycle of CO (Figure 6b) shows the minimum (0.156
445 ppm) amplitude in July and maximum (1.85 ppm) in October. After October the diurnal amplitude keeps on decreasing till summer. The evening peak contributes significantly to the diurnal amplitude of CO. The largest amplitude in CO cycle is observed in autumn (1.36 ppm) while the smallest amplitude is observed in summer (0.24 ppm). The diurnal amplitudes of CO are observed to be about 1.01 and 0.62 ppm, respectively during winter and spring. The monthly diurnal cycle of CO (Figure 6b) shows the minimum (0.156 ppm) amplitude in July and maximum (1.85 ppm) in October. After October the diurnal amplitude keeps on decreasing till monsoon.

4.4 Correlation between CO and CO$_2$

The relationships of CO to CO$_2$ can be useful for investigating the CO source types and their combustion characteristics in the city region of Ahmedabad. The measurements are generally affected by the dilution due to the boundary layer dynamics, but considering their ratios will cancel this effect. Further, the interpretation of correlation ratios in terms of their dominant emission sources needs to isolate first the local urban signal. For this, the measurements have to be corrected from their background influence. The background concentrations are generally those levels which have almost negligible influence from the local emission sources. Although, the most ideal case of determining the background levels are the continuous measurement of respective gases at a cleaner site. But due to unavailability of such measurements for our study period, we use the 5$^{th}$ percentile value of CO$_2$ and CO for each day as a background for corresponding day. It is observed that the mixing ratios of both gases at low wind speed, which show the influence of local urban signal, are significantly higher than background levels and hence confirm that the definition of background will not significantly affect the derived ratios (Ammoura et al., 2014). This technique of measuring the background is extensively studied by Ammoura et al. (2014) and found suitable for both the gases CO and CO$_2$, even having the role of summer uptake on the levels of CO$_2$. The excess CO$_2$ (CO$_2$(exc)) and CO (CO$_{(exc)}$) above the background for Ahmedabad city, are determined for each day after subtracting the background concentrations from the hours of each day (CO$_2$(exc) = CO$_2$(obs) - CO$_2$(bg), CO$_{(exc)}$ = CO$_{(obs)}$ - CO$_{(bg)}$).
Figure 7: Scatter plots and regression fits of excess CO ($CO_{exc}$) vs. excess $CO_2$ ($CO_{2(exc)}$) during morning (0600-1000 hrs), noon (1100-1700 hrs), evening (1800-2200) and night (0000-0500 hrs) hours for all the four different seasons. Excess values of both species are calculated after subtracting their background concentrations. Each data points are averaged for 30 minutes. Emission ratios range of CO/$CO_2$ for different sources from the literature are also plotted in each figure.

We use robust regression method for the correlation study. It is an alternative to least squares regression method and more applicable for analysing time series data with outliers arising from extreme events (http://www.ats.ucla.edu/stat/stata/dae/rreg.htm). Figure 7 illustrates the correlations between CO$_{exc}$ and CO$_{2(exc)}$ for the four seasons at different time windows of the day. Based on the dominance of different atmospheric processes and different emission sources as discussed in Section 4.3, the measurements are divided into the group of four different time windows: (1) Morning period (0600-1000 hrs), when PBL height is slowly evolving and rush hour traffic is there, (2) Afternoon period (1100-1700 hrs), when atmospheric is well mixed and traffic is relatively less, (3) Evening period (1800-2200 hrs), when influence of rush hour traffic is significantly high, (4) Night period (0000-0500 hrs), when atmospheric is calm and the anthropogenic sources of both gases are switched off. The measured slopes values for these time intervals are given in Table 1. The ranges of the emission ratios of CO/$CO_2$ for transport, industrial and domestic sources, as given in Table 2 are also plotted in the figures for broadly showing the dominance of different sources. The $\Delta CO_{exc}/\Delta CO_{2(exc)}$ ratios are observed lowest during summer, with a range varying from 0.9 ppb/ppm in morning to 19.5 ppb/ppm in evening period. Lowest coefficient of determination is also observed during this season, which suggest that the levels of CO and $CO_2$ are controlled by different
factors. As discussed previously, higher biospheric productivity during this season mostly controls the CO$_2$ concentrations while CO concentrations are mostly controlled by the long range transport. During the winter season $\Delta$CO$_{(exc)}$/\Delta$CO$_2$ ratios are observed highest and varies from 14.3 ppb/ppm in morning to 47.2 ppb/ppm in evening period. Relatively higher ratios during winter than other three seasons indicates contribution of CO emission from additional biofuel burning sources. From day to night, highest coefficient of determination is observed during spring season. As illustrated by the diurnal cycle, the CO$_2$ is not significantly removed by the biosphere during spring with lower draw down in daily CO$_2$. Along with this, higher VC during this season will result in very fast mixing. Therefore, very fast mixing will mostly regulate their relative variation and will result in higher correlation in this season. Other factors like soil and plant respiration during this period may also control CO$_2$ concentrations due to which the correlation coefficient is not equal to 1. Except monsoon, the $\Delta$CO$_{(exc)}$/\Delta$CO$_2$ ratios and their correlations are fairly comparable in other seasons in the evening rush hours, which indicate stronger influence of common emission sources. Ratios during this time can be considered as fresh emissions since dilution and chemical loss of CO can be considered negligible for this time. Most of these data fall in the domestic and transport sector emission ratio lines, which indicate that during this time intervals these sources mostly dominate (Table 2). On the other hand, during other time intervals most of data is scattered between industrial and transport sectors emission ratio lines. Hence, from this we can conclude that during evening hours, transport and domestic sources mostly dominate while during other periods transport and industrial emission sources mostly dominate. The observed ratios are similar to the airmass influenced by both fossil fuel and biofuel emissions as discussed by Lin et al. (2015) over Pondicherry. Using CARIBIC observations, Lai et al. (2010) also reported the $\Delta$CO/$\Delta$CO$_2$ ratio in the range of 15.6-29.3 ppb/ppm from the airmass influenced by both biofuel and fossil fuel burning in the Indo-Chinese Peninsula. Further, $\Delta$CO/$\Delta$CO$_2$ ratio is also observed of about 13 ppb/ppm in South-east Asian outflow in February-April, 2001 during the TRACE-P campaign and suggest the combined influence of fossil fuel and biofuel burning (Russo et al., 2003). The overall ratios (using all data) from autumn to spring (8.4 - 12.7 ppb/ppm) suggest the dominance of local emission sources during these seasons, and this range is correspond to the range of anthropogenic combustion sources (10-15 ppb/ppm) in developed countries (Suntharalingam et al., 2004; Takegawa et al., 2004; Wada et al., 2011). This suggest that the overall emissions of CO over Ahmedabad are mostly dominated by the anthropogenic combustion during these seasons.
Table 1: Correlation slopes ($\Delta \text{CO}_{(exc)}/\Delta \text{CO}_2(\text{exc})$ in ppb/ppm) measured during different time intervals of distinct seasons. Coefficient of determination ($r^2$) is given inside the bracket.

<table>
<thead>
<tr>
<th>Seasons</th>
<th>Slope in ppb/ppm (Coefficient of determination ($r^2$))</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>Morning (0600-1000 hrs)</td>
</tr>
<tr>
<td>Summer (JA)</td>
<td>0.9 (0.15)</td>
</tr>
<tr>
<td>Autumn (SON)</td>
<td>8.3 (0.48)</td>
</tr>
<tr>
<td>Winter (DJF)</td>
<td>14.3 (0.51)</td>
</tr>
<tr>
<td>Spring (MAM)</td>
<td>9.3 (0.68)</td>
</tr>
</tbody>
</table>

Table 2: Emission ratios of CO/CO$_2$ (ppb/ppm), derived from emission factors (gram of gases emitted per kilogram of fuel burned).

<table>
<thead>
<tr>
<th>Emission Source</th>
<th>Biomass burning</th>
<th>Transport</th>
<th>Industry</th>
<th>Domestic</th>
</tr>
</thead>
<tbody>
<tr>
<td>Crop-residue</td>
<td>45.7-123.6</td>
<td>8.6-65.2</td>
<td>23.5-40.4</td>
<td>53.3-62.2</td>
</tr>
<tr>
<td>Diesel</td>
<td>33.5</td>
<td>40.4</td>
<td>52.9-98.5</td>
<td></td>
</tr>
<tr>
<td>Gasoline</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Coal</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Coal</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Biofuel</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

\[ \text{E}_{\text{CO}} = \left( \alpha_{\text{CO}} \frac{M_{\text{CO}}}{M_{\text{CO}_2}} \right) \text{E}_{\text{CO}_2} \] (1)

4.5 Top-down CO emissions from observations

If the emissions of CO$_2$ are known for study locations, the emissions of CO can be estimated by multiplying the correlation slopes and molecular mass mixing ratios. Final emissions of CO will depend on choosing the values of correlation slopes. The slopes should not be biased from particular local sources, chemical processing and PBL dynamics. We exclude the summer monsoon season data as the CO$_2$ variations mainly depend on the biospheric productivity during this season. As discussed previously, the morning and evening rush hours data are appropriate for tracking vehicular emissions, while the afternoon data are affected by the other environmental factors, e.g., the PBL dynamics, biospheric activity and chemical process. The stable, shallow night-time PBL accumulates emissions since the evening and hence the correlation slope for this period can be used as a signature of the city’s emissions. Hence, we calculate the slopes from the data corresponding to the period of night time (2300-0500 hrs) and evening rush hour (1900-2200 hrs). The CO emission ($E_{\text{CO}}$) for Ahmedabad is calculated using the following formula.
Where, $\alpha_{CO}$ is the correlation slope of CO$_{(\text{exc})}$ to CO$_2(\text{exc})$ ppb ppm$^{-1}$, $M_{CO}$ is the molecular mass of CO in g mol$^{-1}$, $M_{CO_2}$ is the molecular mass of CO$_2$ in g mol$^{-1}$ and $E_{CO_2}$ is the CO$_2$ emission in Gigagram (Gg) over Ahmedabad. The EDGARv4.2 emission inventory reported an annual emissions of CO$_2$ at 0.1° x 0.1° for the period of 2000-2008 (http://edgar.jrc.ec.europa.eu/overview.php?v=42). It reported an annual CO$_2$ emission of 6231.6 Gg CO$_2$ yr$^{-1}$ by EDGARv4.2 inventory over the box (72.3<longitude<72.7°E, 22.8<latitude<23.2°N) which contain Ahmedabad coordinates in center of the box. We assume that the emissions of CO$_2$ are linearly changing with time and using increasing rate of emission from 2005 to 2008, we extrapolate the emission of CO$_2$ for 2014 over same area. The bottom-up CO$_2$ emission for the Ahmedabad is thus estimated of about 8368.6 Gg for the year of 2014. Further, for comparing the estimated emission with inventory emissions we extrapolated the CO emissions also for the year of 2014 using same method applied as for CO$_2$. Further, we assumed same slopes for the year of 2008 and calculate CO emission for that year also. The slope values for different time period, estimated and inventory emissions of CO using different values of slope are given in Table 3.

Table 3: Estimates of emissions of CO using the the CO$_2$ emission from EDGAR inventory over the box (72.3<longitude<72.7°E, 22.8<latitude<23.2°N) and observed CO$_{(\text{exc})}$:CO$_2(\text{exc})$ slopes for different time periods. The correlation coefficient for corresponding slopes are given inside the bracket in slope column. Data for the summer monsoon season are not included for calculating slopes.

<table>
<thead>
<tr>
<th>Time (IST)</th>
<th>Slope (ppb/ppm)</th>
<th>Correlation coefficient (r)</th>
<th>EDGAR Emissions (Gg/yr)</th>
<th>Estimated Emissions (Gg/yr)</th>
</tr>
</thead>
<tbody>
<tr>
<td>2300 - 0500 hrs</td>
<td>13±0.14 (0.84)</td>
<td>CO$_2$ 8368.6, CO 45.3</td>
<td>69.2±0.7</td>
<td></td>
</tr>
<tr>
<td>1900 - 2100 hrs</td>
<td>47±0.27 (0.95)</td>
<td></td>
<td>250.2±1.5</td>
<td></td>
</tr>
</tbody>
</table>

The correlation between CO$_{(\text{exc})}$ and CO$_2(\text{exc})$ for the period of 2300-0500 hrs is tight and emission are mostly representative of the local anthropogenic sources. Hence, slope for this period can be considered for estimating the fossil fuel CO emissions for Ahmedabad. Further the uncertainty is total emission due to uncertainty associated with used slope is also calculated. Using this slope and based on CO$_2$ emissions from EDGAR inventory, the estimated fossil fuel emission for CO is observed 69.2±0.7 Gg (emission±uncertainty) for the year of 2014. The EDGAR inventory underestimates the emission of CO as they give the estimate about 45.3 Gg extrapolated for 2014. The slope corresponding to the night hours (1800-0600 hrs) give the highest estimate of CO. Using combinations of slopes for other periods also, the derived CO emissions are
larger than the bottom-up EDGAR emission inventory. The EDGAR inventory estimate the relative contributions of CO from industrial, transport and slum/residential sector to be about 42%, 42% and 10%, respectively. The possible cause for underestimation of CO by the EDGAR inventory could be the underestimation of residential emission, since other inventories particularly for major urban Indian cities (http://www.indiaenvironmentportal.org.in/files/file/Air-Pollution-in-Six-Indian-Cities.pdf) show large relative contributions from residential sector. The uncertainty associated with the emission factors for different sectors could be another cause for the underestimation of CO emissions, since these are important parameters for developing the inventory (Sahu et al., 2015).

4.6 Diurnal tracking of CO\textsubscript{2} emissions

CO has virtually no natural source in an urban environments except oxidation of hydrocarbons and hence, can help to disentangle the relative contributions of anthropogenic (from transport, power plant, industrial etc) and the biospheric sources (mainly from respiration) of CO\textsubscript{2}, by serving as a tracer of combustion activity attribute CO\textsubscript{2} enhancements to fossil fuel combustion on shorter timescale (Duren and Miller, 2012). Several studies have used the simultaneous time-series measurements of CO\textsubscript{2} and CO to segregate the fraction of CO\textsubscript{2} from anthropogenic sources and natural biospheric sources from it atmospheric concentrations and validated this method using carbon isotope ($\Delta^{14}$CO\textsubscript{2}) measurements (Levin et al., 2003; Turnbull et al., 2006; 2011; Lopez et al., 2013; Newman et al., 2013). This quantification technique is more practical, less expensive and less time consuming in comparison to the $^{14}$CO\textsubscript{2} method (Vogel et al., 2010). For performing this analysis, the background concentrations of CO and CO\textsubscript{2} and the emission ratio of CO/CO\textsubscript{2} from anthropogenic emissions are required. The methods for calculating the background concentrations of CO\textsubscript{2} and CO are already discussed in Section 4.4. The observed concentrations of both gases can also be directly used for calculating the emission ratio, provided that the measured levels are not highly affected from natural sources as well as share the same origin. We have used the evening time (1900-2100 hrs) data of CO\textsubscript{2}(exc) and CO(exc) for whole study period to calculate the emission ratio of CO/CO\textsubscript{2} from predominant anthropogenic emission sources. The emission ratio for this time is calculated to be 47±0.27 ppb CO/ppm CO\textsubscript{2} with very high correlation ($r = 0.95$) (Figure 8b), after excluding those data points, corresponding for which the mean wind speed is greater than 3 ms\textsuperscript{-1} for avoiding the effect of fast ventilation. The tight correlation imply that there is not a substantial difference in the emission ratio of these gases during the measurement period from November, 2013 to May, 2015. CO\textsubscript{2}(exc) and CO(exc) will be poorly correlated with each other if their emission ratio varies largely with time, assuming the correlation is mainly driven by emissions. Since anthropogenic emissions are very high for this period, contribution of respiration sources in the levels of CO\textsubscript{2} can be considered negligible during this period. This ratio can be considered as the representative of anthropogenic sources, as discussed in previous section also. We define it as $R_{\text{CO/CO}_2}$ (ant). 

The standard deviation shows the uncertainty associated with slope which is very small. The contribution of transport sector
(CO2_{ant}) in the diurnal cycle of CO2 is calculated using following formula.

\[ COV_{veh} = \frac{CO_{obs} - CO_{bg}}{R_{CO/CO2_{ant}}} \]  

(2)

where CO_{obs} is the observed CO concentration and CO_{bg} is a background CO value. Uncertainty in the CO2_{ant} is dominated by the uncertainty in the R_{CO/CO2_{ant}} and by the choice of CO_{bg}. The uncertainty in CO2_{ant} due to the uncertainty in the R_{CO/CO2_{ant}} is about 0.5% or 0.27 ppm and can be considered negligible. As discussed in Section 3, the uncertainty in the measurements of CO_{bg} is very small and also can be considered negligible. Further, the contributions of CO2 from other major sources are calculated by subtracting the CO2_{ant} from the excess concentrations of CO2. These sources are those sources which do not emit significant amount of CO and can be considered mostly as natural sources (respiration), denoted by CO2_{bio}.

Figure 8: (a) Diurnal cycle of excess CO2 over background levels during all the four seasons. (b) Correlation between excess CO and CO2 for evening hours (1800-2100 hrs) during the study period. Contributions of fossil fuel (c) and biosphere (d) in the diurnal variation of excess CO2 in all the four seasons.
The average diurnal cycles of \(\text{CO}_2\) above its background for each season are shown in (Figure 8a). In Section [4.3.1] we have discussed qualitatively the role of different sources in the diurnal cycle of \(\text{CO}_2\). With the help of the above method, now the contributions of anthropogenic (\(\text{CO}_2(\text{ant})\)) and biospheric sources (\(\text{CO}_2(\text{bio})\)) are discussed quantitatively. Due to unavailability of PBL measurements, we cannot disentangle the contributions of boundary layer dynamics. The diurnal pattern of \(\text{CO}_2(\text{ant})\) (Figure 8c) reflects the pattern like CO, because we are using constant \(R_{\text{CO}/\text{CO}_2(\text{ant})}\) for all seasons. Overall, this analysis suggests that the anthropogenic emissions of \(\text{CO}_2\), mostly from transport and industrial sectors during early morning during 0600-1000 hrs varied from 15 to 60\% (4-15 ppm). During afternoon hours (1100-1700 hrs), the anthropogenic originated (transport and industrial sources, mainly) \(\text{CO}_2\) varied between 20 and 70\% (1-11 ppm). During evening rush hours (1800-2200 hrs), highest contributions of combined emissions of anthropogenic sources (mainly transport and domestic) are observed. During this period the contributions vary from 50 to 95\% (2-44 ppm). During night/early morning hours (0000-0700 hrs) non-anthropogenic sources (mostly biospheric respiration) contribute from 8 to 41 ppm of \(\text{CO}_2\) (Figure 8d). The highest contributions from 18 to 41 ppm are observed in the autumn from the respiration sources during night hours, since there is more biomass during this season after the South Asian summer monsoon. During the afternoon hours, lower biospheric component of \(\text{CO}_2\) could be due to a combination of the effects of afternoon anthropogenic emissions, biospheric uptake of \(\text{CO}_2\) and higher PBL height.

**4.7 Model – Observations comparison**

**4.7.1 Comparison of diurnal cycle of \(\text{CO}_2\)**

We first evaluate the ACTM in simulating the mean diurnal cycle of \(\text{CO}_2\) over Ahmedabad by comparing the model simulated surface layer mean diurnal cycle of \(\text{CO}_2\). The atmospheric concentrations of \(\text{CO}_2\) are calculated by adding the anthropogenic, oceanic and biospheric component from CASA process model. Figure [9a] and Figure [9b] show the residuals (Hourly mean - daily mean) of diurnal cycles of \(\text{CO}_2\) based on the observations and the model simulations respectively. Model shows very little diurnal amplitude as compared to observations. Larger differences and discrepancies in night time and morning \(\text{CO}_2\) concentrations between the model and observations might be contributed by diurnal cycle of the anthropogenic fluxes from local emissions and biospheric fluxes, and uncertainties in the estimation of PBL height by the model [Law et al., 2008]. Hence, there is a need for efforts in improving the regional anthropogenic emissions as well as module for estimating the PBL height. It may be pointed out that the model’s horizontal resolution (1.125° × 1.125°) is coarse for analysing local scale observations. However, the model is able to capture the trend of the diurnal amplitude, highest in autumn and lowest in the summer monsoon season. Figure [9c] shows better agreement (\(r = 0.75\)) between the monthly change in modelled and observational diurnal amplitude of \(\text{CO}_2\) from monthly mean diurnal cycle however slope (\(m = 0.17\)) is very poor. We include the
diurnal amplitudes of CO$_2$ for November and December, 2013 also for improving the total number of data points. The model captured the spread in the day time concentration of CO$_2$ from summer to spring with a difference that the model shows lower concentration of CO$_2$ during noon hours in autumn while observations show lowest in the summer monsoon season.

Figure 9: Residual of the diurnal cycle of CO$_2$ (in ppm) for (a) observations and (b) modal simulation over Ahmedabad in all the four seasons. Please note that the scales of the model and observational diurnal cycles are different. (c) Correlation between observed and the model simulated monthly mean diurnal cycle amplitudes.

The monthly average diurnal cycles of the biospheric net primary productivity from the CASA model for Ahmedabad and for the year of 2014 are shown Figure 10. The details of CASA flux are given in the Section 3.2. It is clear from Figure 10 that the CO$_2$ flux diurnal cycle as modelled by CASA show minimum day-night variations amplitude during the summer monsoon time (Jun-July-August). Given that biosphere over Ahmedabad is water stressed for all other three seasons (except the summer monsoon time, Figure 1A3), the behaviour of CASA model simulated diurnal variation is not in line with biological capacity of the plants to assimilate atmospheric CO$_2$. Due to this underestimation of CO$_2$ uptake in the summer monsoon season, we also find very large underestimation of the seasonal through by ACTM in comparison with observations (Figure 9). Hence, there is a discrepancy in the diurnal flux of CO$_2$ simulated by CASA model. Similar discrepancy in the timing of maximum biospheric uptake is also discussed earlier by Patra et al. (2011) using inverse model CO$_2$ fluxes and CASA biospheric fluxes. It clearly suggest that there is a need for improving the biospheric flux for this region. It should be mentioned here that the CASA model used a land
use map corresponding the late 1980s and early 1990s, which should be replaced by rapid growth in urbanised area in Ahmedabad (area and population increased by 91% and 42%, respectively, between 1990 and 2011). The model resolutions may be another factor for discrepancy. As Ballav et al. (2012) show that a regional model WRF-CO$_2$ is able to capture both diurnal and synoptic variations at two closely spaced stations within 25 km. Hence the regional models could be helpful for capturing these variabilities.

Figure 10: Diurnal variation of biospheric fluxes from the CASA ecosystem model.

4.7.2 Comparison of seasonal cycle of CO$_2$

Figure 11a shows the performance of ACTM simulating mean seasonal cycle of CO$_2$ over Ahmedabad by comparing the model simulated mean surface seasonal cycle of CO$_2$. Due to unavailability of data from March, 2014 to June, 2014 we plotted the monthly average of the year 2015 for same periods for visualizing the complete seasonal cycle of CO$_2$. The seasonal cycles are calculated after subtracting the annual mean from each month, and corrected for growth rate using the observations at MLO. For comparison, we used the seasonal cycle calculated from afternoon time average monthly concentrations, since the model is not able to capture the local fluctuations and produce better agreements when boundary layer is well mixed. In Table 4 we present the summary of the comparisons of the model and observations. The model reproduces the observed seasonal cycle in CO$_2$ fairly well but with low seasonal amplitude about 4.15 ppm compared to 13.6 ppm observed.
Positive bias during the summer monsoon season depicts the underestimation of biospheric productivity by the CASA model. The root mean square error is observed highest to be 3.21% in the summer monsoon season. For understanding the role of biosphere, we also compared the seasonal cycle of CO$_2$ from noon time mean data with the seasonal cycle of CO$_2$ fluxes over South Asia region which is taken from the [Patra et al., 2011] where they calculated it using a inverse model with including CARIBIC data and shifted a sink of $1.5$Pg C yr$^{-1}$ sink from July to August and termed it as “TDI64/CARIBIC-modified”. Positive and negative values of flux show the net release and net sink by the land biosphere over the South Asia. This comparison shows almost one to one correlation in the monthly variation of CO$_2$ and suggest that the lower levels of CO$_2$ during July, August and higher level in April are mostly due to the moderate source and sink of South Asian ecosystem during these months respectively. Significant correlation ($r = 0.88$) between South Asian CO$_2$ fluxes and monthly mean CO$_2$ data for day time only suggest that the day time levels of CO$_2$ are mostly controlled by the seasonal cycle of biosphere (Figure 11b).

![Graph](image)

Figure 11: (a) The red circles and blue triangles show the mean seasonal cycles of CO$_2$ (in ppm) using afternoon values only, calculated from measurements and model over Ahmedabad. The green triangles show the seasonal cycles of CO$_2$ flux over South Asia, calculated from TDI64/CARIBIC-modified inverse model as given in [Patra et al., 2011] (Figure 3d). (b) Blue bar and red bar shows the correlation coefficient ($r$) of model CO$_2$ concentration of biospheric tracer and fossil fuel tracer component with observed concentrations of CO$_2$ taking the entire annual time series of daily mean data, respectively. The green bar shows the correlation coefficient between the monthly residuals of afternoon mean only and the CO$_2$ flux over South Asia.

Separate correlations of each CO$_2$ tracer with the observations are helpful to determine relative importance of each flux component in the CO$_2$ variation [Patra et al., 2008]. Hence, we perform separate correlation study between the measurements and biospheric, anthropogenic and oceanic component of CO$_2$, estimated by model using CASA-3hr fluxes [Randerson et al., 1997; Olsen and Randerson, 2004], EDGAR v4.2 inventory and air-sea fluxes from [Takahashi et al., 2009] respect-
tively. The correlation coefficient give the hint about dominating controlling factors of deriving the levels of CO₂. Figure 11b shows the resulting correlations for separate flux component with respect to measurements. We did not include the oceanic tracer and observed CO₂ correlation result, since no correlation has been observed between them. The comparison is based on daily mean of entire time series. Correlation between biospheric tracers and observed CO₂ have been found negative. This is because during growing season biospheric sources act as a net sink for CO₂. Correlation of observed CO₂ with fossil fuel tracer has been observed fairly well (r = 0.75). Hence, individual tracers correlation study also give the evidence of the overall dominance of fossil flux in overall concentrations of CO₂ over Ahmedabad for entire study period, and by assuming fossil fuel CO₂ emission we can derive meaningful information on biospheric uptake cycle.

Table 4: Performance matrices used to quantify the level of agreement between the model simulations and observations. These statistics are based on hourly values in each day.

<table>
<thead>
<tr>
<th>Parameter</th>
<th>Winter</th>
<th>Autumn</th>
<th>Summer</th>
<th>All months</th>
</tr>
</thead>
<tbody>
<tr>
<td>MB (ppm)</td>
<td>-2.72</td>
<td>12.64</td>
<td>-2.45</td>
<td>2.27</td>
</tr>
<tr>
<td>FGE (%)</td>
<td>0.96</td>
<td>3.12</td>
<td>2.0</td>
<td>1.76</td>
</tr>
<tr>
<td>RMSE (ppm)</td>
<td>5.21</td>
<td>12.82</td>
<td>9.14</td>
<td>8.60</td>
</tr>
<tr>
<td>RMSE (%)</td>
<td>1.27</td>
<td>3.21</td>
<td>2.20</td>
<td>2.09</td>
</tr>
</tbody>
</table>

This study suggest that the model is able to capture seasonal cycle with lower amplitude for Ahmedabad. However, the model fails to capture the diurnal variability since local transport and hourly daily flux play important roles for governing the diurnal cycle and hence there is a need for improving these features of the model.

5 Conclusions

Atmospheric concentrations of CO₂ were measured along with an anthropogenic tracer CO at Ahmedabad, a semi-arid urban region in western India using laser based CRDS technique during 2013-2015. The air masses, originated from both polluted continental regions as well as cleaner marine regions over the study location during different seasons, make this study most important for studying the characteristics of both type of air masses (polluted and relatively cleaner). The observations show the range of CO₂ concentrations from 382 to 609 ppm and CO concentrations from 0.07 to 8.8 ppm, with the average of CO₂ and CO to be 416±19 ppm and 0.61±0.6 ppm respectively. The higher concentrations of both the gases are recorded for lower ventilation and for winds from north-east direction, while lowest concentrations are observed for higher ventilation and for the cleaner south-west winds from the Indian Oceanic region. Along with these factors, the biospheric activity also
controls the seasonal cycle of CO₂. Lowest day time CO₂ concentrations ranging from 382–393 ppm in August, suggest for the stronger biospheric productivity during this month over the study region, in agreement with an earlier inverse modelling study. This is in contrast to the terrestrial flux simulated by the CASA ecosystem model, showing highest productivity in September and October months. Hence, the seasonal cycles of both the gases reflect the seasonal variations of natural sources/sinks, anthropogenic emissions and seasonally varying atmospheric transport. The annual amplitudes of CO₂ variation after subtracting the growth rate based on the Mauna Loa, Hawaii data are observed to be about 26.07 ppm using monthly mean of all the data and 13.6 ppm using monthly mean of the afternoon period (1200-1600 hrs) data only. Significant difference between these amplitudes suggests that the annual amplitude from afternoon monthly mean data only does not give true picture of the variability. It is to be noted that most of the CO₂ measurements in India are based on day time flask samplings only.

Significant differences in the diurnal patterns of CO₂ and CO are also observe, even though both the gases have major common emission sources and undergo PBL dynamics and advection. Differences in their diurnal variability is probably the effect of terrestrial biosphere on CO₂ and chemical loss of CO due to reaction with OH radicals. The morning and evening peaks of CO are affected by rush hours traffic and PBL height variability and occur almost same time throughout the year. However, the morning peaks in CO₂ changes its time slightly due to shift in photosynthesis activity according to change in sun rise time during different seasons. The amplitudes of annual average diurnal cycles of CO₂ and CO are observed about 25 and 0.48 ppm respectively (Table 5). Both gases show highest amplitude in the autumn and lowest in the summer monsoon season. This shows that major influencing processes are common for both the gases, specific to this city and the monsoon India.

Table 5: Seasonal mean concentrations and diurnal amplitudes (max-min) of CO₂ and CO over Ahmedabad.

<table>
<thead>
<tr>
<th>Period</th>
<th>Mean (ppm)</th>
<th>CO₂ (ppm)</th>
<th>CO₂ (ppm)</th>
<th>CO (ppm)</th>
<th>CO (ppm)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Monsoon</td>
<td>400.3±6.8</td>
<td>0.19±0.13</td>
<td>12.4</td>
<td>0.24</td>
<td></td>
</tr>
<tr>
<td>Autumn</td>
<td>419.6±22.8</td>
<td>0.72±0.71</td>
<td>40.9</td>
<td>1.36</td>
<td></td>
</tr>
<tr>
<td>Winter</td>
<td>417.2±18.5</td>
<td>0.73±0.68</td>
<td>31.7</td>
<td>1.01</td>
<td></td>
</tr>
<tr>
<td>Spring</td>
<td>415.4±14.8</td>
<td>0.41±0.40</td>
<td>15.9</td>
<td>0.62</td>
<td></td>
</tr>
<tr>
<td>Annual</td>
<td>413.0±13.7</td>
<td>0.50±0.37</td>
<td>25.0</td>
<td>0.48</td>
<td></td>
</tr>
</tbody>
</table>
The availability of simultaneous and continuous measurements of CO$_2$ and CO have made it possible to study their correlations at different time windows (during morning (0600-1000 hrs), noon (1100-1700 hrs), evening (1800-2200) and night (0000-0500 hrs) hours) of distinct seasons. Using the correlation slopes and comparing them with the emission ratios of different sources, contributions of distinct sources is discussed qualitatively. It is observed that during the evening hours, measurements over the study region are mostly affected by transport and domestic sources, while during other periods the levels of both gases are mostly dominated by the emissions from transport and industrial sources. Further, using the slope from the evening rush hours (1800-2200 hrs) data as anthropogenic emission ratios, the relative contributions of dominant anthropogenic emissions and biospheric emissions have been disentangle from the diurnal cycle of CO$_2$. At rush hours, this analysis suggests that 90-95% of the total emissions of CO$_2$ are contributed by anthropogenic emissions. Using the relationship, the CO emission from Ahmedabad has been estimated. In this estimation, fossil fuel derived emission of CO$_2$ from EDGAR v4.2 inventory is extrapolated linearly from 2008 to 2014 and it is assumed that there are no year-to-year variations in the land biotic and oceanic CO$_2$ emissions. The estimated annual emission CO for Ahmedabad is estimated to be 69.2±0.7 Gg for the year of 2014. The extrapolated CO emission from EDGAR inventory for 2014 shows a value smaller than this estimate by about 52%.

The observed results of CO$_2$ are also compared with an atmospheric general circulation model based chemistry transport model simulated CO$_2$ concentrations. The model captures some basic features like the trend of diurnal amplitude, seasonal amplitude etc, qualitatively but not quantitatively. The model captures the seasonal cycle fairly good but the amplitude is very less as compared to the observations. Similarly, performance of the model capturing the change in monthly averaged diurnal amplitude is quiet good (r = 0.72), however the slope is very poor. We also examined the correlation between the hourly averaged observed CO$_2$ and tracer of fossil fuel from model simulation and found fairly good correlation between them. However, no significant correlation has been observed between observed CO$_2$ and biospheric tracer. It suggests that the levels of CO$_2$ over Ahmedabad are mostly controlled by the fossil fuel combustion throughout the year.

This work demonstrate the usefulness of simultaneous measurements of CO$_2$ and CO in an urban region. The anthropogenic and biospheric component of CO$_2$ have been studied from its temporally varying atmospheric concentrations, and validity of “bottom-up” inventory have been assessed independently. Use of CO$_{(_{exc})}$:CO$_2(_{(_{exc})}$ ratios avoid some of the problems with assumptions that have to be made with modelling. These results represent a major urban region of India and will be helpful in validating emission inventories, chemistry-transport and terrestrial ecosystem models. However, a bigger network of sites is needed to elucidate more accurate distribution of emissions and their
source regions, and run continuously over multiple years for tracking the changes associated with anthropogenic activities and emission mitigation policies.

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