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Regional background O_3 and NO_x in the Houston-Galveston-Brazoria (TX) region: A decadal-scale perspective

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Abstract. Ozone (O_3) in the lower troposphere is harmful to people and plants, particularly during summer, when photochemistry is the most active and higher temperatures favor local chemistry. Because of its dependence on the volatile organic compounds (VOCs) to nitrogen oxides (NO_x) ratio, ground-level O_3 is difficult to control locally, where many sources of these precursors contribute to its mixing ratio. In addition to local emissions, chemistry and transport, larger-scale factors also contribute to local O_3 and NO_x. These additional contributions (often referred to as "regional background") are not well quantified within the Houston-Galveston-Brazoria (HGB) region, impeding more efficient controls on precursor emissions to achieve compliance with the National Ambient Air Quality Standards for O_3. In this study, we estimate regional background O_3 and NO_x in the HGB region and quantify their decadal-scale trends.

We use four different approaches based on principal component analysis (PCA) to quantify background O_3 and NO_x. Three of these approaches consist of independent PCA on both O_3 and NO_x for both 1-h and 8-h levels to compare our results with previous studies and to highlight the effect of both temporal and spatial scales. In the fourth approach, we co-varied O_3, NO_x and meteorology.

Our results show that the estimation of regional background O_3 has less inherent uncertainty when it was constrained by NO_x and meteorology, yielding a statistically significant temporal trend of -0.69 ± 0.27 ppb y^{-1}. Likewise, the estimation of regional background NO_x trend constrained by O_3 and meteorology was -0.04 ± 0.02 ppb y^{-1}. Our best estimates of 17-y average of season-scale background O_3 and NO_x were 46.72 ± 2.08 ppb and 6.80 ± 0.13 ppb, respectively.

Regional background O_3 and NO_x both have declined over time in the HGB region. This decline is likely caused by a combination of state of Texas controls on precursor emissions since 2007 and the increase in frequency of flow from the Gulf of Mexico over the same time period.

Keywords: tropospheric ozone, nitrogen oxides, regional background, covariance of chemistry and meteorology, temporal trends

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Atmospheric Chemistry and Physics Discussions

1 Introduction

In the lower troposphere, ozone (O_3) has impacts on both human health and ecosystems (Pusede et al., 2015), and understanding its mechanisms of production is essential to managing these impacts. Surface O_3 is the result of both local and regional contributions when measured at any given location (Berlin et al., 2013). These contributions change in space and time because of dynamic factors that include emissions of O_3 precursors and meteorology. Understanding these contributions is fundamental to the design of more efficient controls on anthropogenic O_3 precursors to protect people and ecosystems, and to achieve compliance with the National Ambient Air Quality Standards (NAAQS) for O_3.

Regional contributions, often denoted as "regional background" (Berlin et al., 2013; Cooper et al., 2012), are more challenging to estimate because of variable influences from regional photochemistry and synoptic air circulation. In contrast, local contributions (e.g. from urban activities) are simply the difference between the total measured value and regional background. In the Houston-Galveston-Brazoria (HGB) area regional background O_3 is not well quantified on the decadal scale, likely due to lack of information on the spatio-temporal covariance of O_3, precursors and meteorology. Consequently, previous investigations of regional background O_3 in the HGB region were limited by the use of a single variable, the daily maximum 8-h average (MDA8) O_3 (Berlin et al., 2013). No study has yet to quantify the regional contributions to direct O_3 precursors themselves, such as nitrogen oxides (NO_x = nitrogen dioxide (NO_2) + nitric oxide (NO)). Our goal is to better characterize the trends in regional background O_3 and NO_x in the HGB region on the decadal scale.

Volatile organic compounds (VOCs) also are important O_3 precursors. VOCs perturb the photochemical NO_x cycle, the governing mechanism of tropospheric O_3 formation, so that O_3 mixing ratio increases in their presence. The relative abundance of NO_x and VOCs mediates O_3 production through their individual reactions with the hydroxyl radical (OH). The products of VOCs' reaction with OH (peroxy radicals) react more rapidly with NO compared to O_3, increasing the minimum O_3 maintained by the NO_x cycle. Therefore, VOC influence is included implicitly in the measured O_3 and NO_x mixing ratios. In this work, we focus on the O_3-NO_x-meteorology relationship to constrain regional background O_3 and NO_x and quantify their trends.

Meteorology influences both transport of pollutants and their chemistry. The relevant meteorological variables (wind speed (WS) and direction (WD), temperature (T), boundary layer height, etc.) and air pollution co-vary synoptically on time scales of days to weeks (Fiore et al., 2015). The effects of meteorology on tropospheric O_3 vary across the United States (US). Boundary layer height strongly and positively correlates with tropospheric O_3 in the western US (Reddy and Pfister, 2015). The O_3-T relationship is positive in the eastern US but weakens and turns negative along a north-south gradient, compared to the western US (Camalier et al., 2007; Tawfik and Steiner, 2013; Rasmussen et al., 2012; Reddy and Pfister, 2015). Wind speed negatively correlates with O_3 (Camalier et al., 2007; Banta et al., 2011; Reddy and Pfister, 2015). Wind direction can either enhance or diminish O_3, depending on altitude and topography-induced air circulation (Reddy and Pfister, 2015). More localized controls on decreasing surface O_3 include relative humidity in the southeast US (Tawfik and Steiner, 2013), shallow and deep convection in the Houston area (Langford et al., 2010), and the intensification of southerly flow in the

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Atmospheric Chemistry and Physics Discussions

HGB region (Liu et al., 2015). Meteorological controls on the scale of the US also are reflected by a more significant decline during recent decades of summer surface O_3 observed in the east, southeast and midwest (Cooper et al., 2012; Hudman et al., 2009) than in the west (Cooper et al., 2012).

Synoptic air circulation contributes to ground-level O_3 in the HGB area in various ways. This region is influenced by the development of high pressure centers at various altitudes during summer. Analyses of local and high altitude winds identified several such centers around the HGB region, which dictate the predominant WD (compass directions such as SW, S, SE, E, NE and N refer to the direction from which the wind originates at a given location) (Nielsen-Gammon et al., 2005; Rappenglück et al., 2008). Direct tropical storm influences from low pressure zones also were identified in the Houston area (Rappenglück et al., 2008). Dry continental air (higher O_3) is advected by northerly flow, industrial emissions from the Ship Channel and Galveston Bay area are transported by easterly flow, and marine air (lower O_3) enters via southerly flow (Rappenglück et al., 2008). The land-sea breeze effect complicates this picture through recirculation of local pollution and formation above the coast of the Gulf of Mexico (GOM) of stagnant air masses that entrain local precursors and favour local chemistry and formation of O_3 (Banta et al., 2005; Nielsen-Gammon et al., 2005; Rappenglück et al., 2008; Langford et al., 2009).

Two intensive air quality campaigns investigated peak O_3 in the HGB region during 2000 and 2006, respectively (Banta et al., 2005; Rappenglück et al., 2008; Parish et al., 2009; Pierce et al., 2009; Langford et al., 2010). The O_3 pollution in this region was likely a result of abundant precursors emitted locally (from industrial and urban sources) and enhanced local chemistry sustained by high summer temperature and land-sea breeze effects. Texas state controls on O_3 precursor emissions were implemented in 2007, resulting in apparent decreases in summer O_3 levels in the Houston area relative to the previous 8-h average NAAQS of 75 ppb (Berlin et al., 2013). It is not clear if a decline in regional background O_3 also contributed (Berlin et al., 2013).

Regional background O_3 in the HGB region has been quantified by many studies but results vary, depending on the temporal scale and the number of sites used (Banta et al., 2005; Nielsen-Gammon 2005; Rappenglück et al., 2008; Kemball-Cook et al., 2009; Langford et al., 2009; Zhang et al., 2011; Banta et al., 2011; Berlin et al., 2013; Liu et al, 2015). Overall, regional (continental) background O_3 ranges from 16 to 80 ppb, while marine background has values between 18 and 30 ppb. Local O_3 contributions are quantified between 25 and 80 ppb. Most of the above studies used the MDA8 O_3 to quantify background O_3. Meteorological variables, such as wind patterns, were used separately to characterize the transport regime in the HGB region and interpret their findings from data analysis; their covariance with O_3 and NO_x was not considered.

The temporal trend in regional background O_3 also is still uncertain. Previous efforts to quantify the temporal trends in regional background O_3 from decadal surface measurements of MDA8 O_3 in the HGB region were made by Berlin et al. (2013). This study focused on the high O_3 season (May-Oct) from 1998 to 2012 and used two methods to extract the regional background O_3: principal component analysis (PCA) and the Texas Commission on Environmental Quality (TCEQ) method. The former is a multivariate statistical analysis through which Berlin et al. (2013) co-varied MDA8 O_3 in time and space.

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Atmospheric Chemistry and Physics Discussions

The latter is a method used by the TCEQ and consists of manually selecting the lowest MDA8 O_3 measured at what are considered "background" sites (usually upwind). Using linear regression of regional background O_3 time, Berlin et al. (2013) estimated the temporal trends and compared them to different wind quadrants. Regional background O_3 associated with NW winds increased over time, while that associated with SW winds remained constant. The only declining trends were associated with the NE and SE winds, but the quantified slopes of both linear trends were highly uncertain (>50% error), suggesting that more work is needed to improve estimates of regional background O_3 trends.

Regional background NO_x also contributes to both surface O_3 and NO_x in the HGB region. Through photochemistry, NO_x can influence O_3 during transport, but it is unclear whether it enhances or diminishes the O_3 peaks observed locally during spring and summer. A previous study modelled both local and regional NO_x summertime contributions to surface O_3 in southeast Texas and found that both northern (suburban) and southeastern (coastal) sites were influenced by upwind sources (Zhang et al., 2011). The study concluded that regional NO_x contributes significantly to local O_3 (up to 50%) and recommended regional controls on NO_x emissions in addition to local controls. However, their findings are limited to 10 days and do not fully represent the seasonal and annual variations in regional NO_x, O_3, and meteorology, suggesting that a longer-term approach would refine the estimates of regional NO_x contributions in the HGB region.

In this work, we estimate regional background O_3 and NO_x by spatially and temporally co-varying chemistry and meteorology using up to seventeen years of hourly measurements and the PCA method for 8-h levels (MDA8 O_3 and 8-h average NO_x). In addition, we use two independent PCAs on O_3 and NO_x to separately estimate regional backgrounds and test for their interaction at both 1-h (i.e., hourly median) and 8-h levels. By comparing all approaches over a period of six months, we could highlight the effect of co-varying O_3 with precursor and meteorology, and the effect of varying the spatial and temporal scales. Using approaches based on continuous variables only, we quantify the temporal trends in regional background O_3 and NO_x. We compare the temporal trend in background O_3 with a previous study and report for the first time a decadal-scale trend in background NO_x.

2 Methods

2.1 Data collection and processing

Public data, representing 1-h average surface measurements of O_3, NO_x and meteorology (WD, WS and T), were downloaded from the Texas Air Monitoring and Information System website owned by TCEQ (see Data availability). The locations of the monitoring sites are mapped in Fig. S1 (in Supplemental Information). For each site, we generated and exported raw data reports (validated data only) for the period of May-Oct. 1998-2014. Using the hourly measurements, we computed three variables to be used in the estimation of background O_3 and NO_x: the hourly median per month, MDA8 O_3, and 8-h average NO_x corresponding to MDA8 O_3.

The hourly median was used for two purposes: (1) replacement of missing values, ensuring that multiple parameters are available at the 1-h level for multivariate data analysis, and (2) use in the analysis as a variable itself because it is a highly

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Atmospheric Chemistry and Physics Discussions

representative value, derived from many replicates of each daytime hour (i.e., years of observations) at various sites. Overall, up to 5% of the missing raw data was replaced by the hourly median (Fig. S2). The protocol for filling data gaps was to replace no more than six consecutive hours in a day (i.e., 25% of the day missing). Therefore, gaps from one to six hours were identified and replaced with the corresponding hourly median. Ten sites have data coverage for 13 years, and five sites have the largest data coverage for 17 years. Therefore it was possible to observe changes in background O_3 and NO_x over a time-scale of almost two decades, but the spatial coverage was limited to just five sites. Berlin et al. (2013) also identified six nearly continuous sites (five identical to those identified in this study) using directly the MDA8 O_3 from the same data source (not hourly data as we used here to calculate the MDA8 O_3). However, in our study, a one-decade analysis was also possible by doubling the number of sites, thus increasing slightly the spatial scale for analysis.

We ran a preliminary bi-variate site correlation analysis from five sites within the HGB area and found that the time-scale of variability in NO_x is much smaller than that of variability in O_3, affecting the correlation of hourly median NO_x between sites. Therefore, NO_x appears to be more sensitive than O_3 to fast changes in meteorology, for example. The temporal scale of analysis should be relevant to both O_3 and NO_x variabilities in order to test if there is any chemical interaction between them during transport, which could influence the estimation of background levels. An hourly median approach, in combination with those focused on 8-h averages, would allow for observation of the effect of temporal scale in the monthly trends of background O_3 and NO_x.

2.2 Data analysis

We used PCA to analyze single and multiple variables at various sites in the HGB area. The PCA method is a data reduction technique that uses the framework of linear algebra (eigenvector and eigenvalues) to reduce a larger data set to a smaller one, based on common modes of variance or strong correlations among variables (Wilks, 1995). In PCA, a non-square matrix n x K (i.e., time x space or site value) is converted to a square matrix K x K (variance-covariance or correlation matrix). The off-diagonal elements of the correlation matrix are important as they reflect the correlations of one or more variables at each location to any other location, while the diagonal elements are 1, representing the autocorrelation of each site in terms of the variable considered. This correlation matrix is transposed to compute an eigenvector matrix (or component matrix) of which elements are the loadings or the Pearson's correlation coefficients, if the correlation matrix is used instead of the variance matrix. The loadings range from -1 to +1 (the highest correlations possible) with a mean of 0 (no correlation). By summing the squared loadings of each component (column) we obtain the eigenvalue of that component. By squaring the loadings and summing them from all components for each variable (row), we get the maximum variance that could be explained by all the components, which is 1. This is not always the case, as not all the components are retained. For example, the maximum number of the components that can result from PCA equals the number of the original variables. In general, the first few components explain most of the variance in the original variables, while the remaining components explain very little. If only the first components are retained, then their squared loadings must be normalized by their respective sum (which is less than 1). These normalized values can be used to convert the PC scores (standardized regression coefficients) to original

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
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Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

variables (Wilks, 1995; Langford et al., 2009). The PC scores (also negative and positive) are the elements of the new variables (components) and they have a wider range than the loadings. The resulting PCs are unique and distinct due to the eigenvectors being perpendicular to each other. However, the fact that PCs are orthogonal and distinct is not enough to account for their physical meaning. Therefore, PCA uses rotation techniques (i.e., Varimax) to rotate the eigenvectors; thus, in addition to the fact that they are distinct from each other, they also have a physical meaning based on the association of the significant elements they contain (i.e., loadings). The output of this rotation is the rotated component matrix which has a different composition of loadings than the unrotated one. The percentage of the variance explained by each component also changes. We rotated the components in this study. Using the PCA method implemented in the IBM SPSS Statistics 24 software, we used different approaches to extract regional background of O_3 and NO_x from locally measured values that were converted to hourly median, MDA8 O_3 and 8-h average NO_x for analysis, as described below. In addition to PCA, we used linear regression of season-scale background O_3 and NO_x time (year) to quantify temporal trends. We also used linear regression to test for chemical interaction, to quantify how much the change in regional background O_3 could be explained by the change in regional background NO_x, and to estimate the regional contributions to locally observed O_3 and NO_x.

2.2.1 PCA of hourly median to estimate regional background O_3 and NO_x and other contributions

To estimate the characteristic hourly regional background O_3 and NO_x, we used the hourly median described in Sect. 2.1 for 28 monitoring sites (Table 1 and Fig. S1) when it could be determined from the available measurements during 1998-2014. Two independent PCAs of median O_3 and NO_x were run using daytime hours (local 10 am - 6 pm), over a period from May to October (eight median values for each month). In this approach, new from the perspective of the metric used in the PCA, we did not co-vary O_3, NO_x and meteorology as their respective hourly medians may not always represent coincident measurements of all of them. Instead, we used meteorology to interpret the PCA results as previous studies did.

2.2.2 PCA of MDA8 O_3 and 8-h average NO_x to estimate regional background O_3 and NO_x (Approach A)

In this approach, we used two independent PCAs on daily MDA8 O_3 and the corresponding 8-h average NO_x to extract the regional backgrounds, but fewer sites were used than in the hourly median approach (5 versus 28). Here we only considered sites with quasi-continuous data for the longest period possible (17 years) to estimate more accurately the regional background. These sites are all within Harris County: Aldine, Bayland Park, Deer Park, Houston East and NW Harris (Fig. S1). Like in the previous approach, we only used meteorology to interpret the principal components.

The MDA8 O_3 was used in previous studies to estimate background O_3 (Nielsen-Gammon et al., 2005; Langford et al., 2009; Berlin et al., 2013), but no study looked at background NO_x using coincident measurements from the same sites. To compare temporal trends obtained from this study with other studies (Berlin et al., 2013), we separately ran PCA for O_3 and NO_x. Additionally, we compared the background estimates from this approach with those obtained from the hourly median approach to isolate the effect of time-scale (which influences the dynamics of the 6-month trends) and with other approaches in this study (subsequent sections) to isolate the effect of chemical and meteorological interaction within the HGB area.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

2.2.3 PCA of MDA8 O_3 and 8-h average NO_x to estimate regional background O_3 and NO_x (Approach B)

As a novel approach, we ran five multivariate PCAs for each site (the same sites and period used in the previous approach) to constrain the estimation of background O_3 in the HGB area with chemistry and meteorology and to improve the quantification of its temporal trend. This approach is different from those described in previous sections and studies (single variable, multiple sites) because it takes into account more variables (multiple variables, single site). The variables considered at each site are MDA8 O_3 and the corresponding 8-h average NO_x, WD, WS, and T.

2.2.4 PCA of MDA8 O_3 and 8-h average NO_x to estimate regional background O_3 and NO_x (Approach C)

This approach is similar to Approach B except that we used more sites (10) and a shorter period of time (13 years), based on simultaneous data availability and continuity at these sites. The five additional sites are: Clinton, Channelview, Manvel Croix, Seabrook Friendship Park and Conroe Relocated (Fig. S1). Use of larger spatial data coverage could improve the estimation of regional background, even if the study period is shorter, because it would capture variations in chemistry and meteorology within the HGB area.

3 Results and Discussion

3.1 Hourly median approach

3.1.1 Main regional contributions to hourly median O_3 and NO_x

The PCA resulted in four components for O_3 and five components for NO_x. Table 1 summarizes the retained components, along with the fraction of variance explained by each of them. Only components with eigenvalues greater than 1 were retained. The first components explained most of the percentage of the variance in original O_3 and NO_x (~51% and ~45%, respectively) and were highly correlated at more than half of the initial sites (16 out of 28). Among these "PC1 sites," 12 are common sites for both O_3 and NO_x.

An interesting cluster-like pattern emerged when we mapped the sites that highly correlated with any of the PCs (e.g., loadings with absolute values of 0.5 or higher). The sites associated with these loadings (Table 2) are mapped in Fig.1, in which different point sizes are used to show the overlapping of both O_3 and NO_x sites, while color is used to show the correlation of the same component at various sites (i.e., clusters). The widespread cluster (PC1) suggests a larger-scale control on both O_3 and NO_x, while the smaller cluster (PC2) suggests a more localized control. The proximity to the GOM emphasizes that PC1 is mostly marine background. The proximity to the Houston Ship Channel indicates that PC2 likely represents local effects (i.e., chemistry, emissions, etc.). Given the proximity to the rural area in the north of the HGB region, PC3 might represent a mix between regional (continental) and local (urban) contributions.

The spatial patterns of the components, their extents and locations within the HGB region all indicate that PC1 represents regional background for both O_3 and NO_x. We arrive to this finding by spatially interpolating the three main clusters from

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
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Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Fig. 1 to reveal continuous patterns of correlations (Fig. 2). The O_3 pattern for the first component (the square-like pattern in the south of the HGB region) emphasizes the marine influence because of the higher loadings along the coast, while the lowest loadings are within the region overlapping with the second component, where local effects seem to be more important (the smaller rectangle in the proximity of the Houston Ship Channel). The PC1-derived NO_x pattern shows high correlations in the same area pointed out by PC1-O_3, but the highest correlations appear in the west of the Bay area; lower loadings also occur in the area controlled by the local effects.

Meteorology also supports the hypothesis that PC1 describes regional contributions and reveals that these are mostly marine in summer and continental in spring and fall. To test if PC1 is regional background, we plotted the PC1-O_3 and PC1-NO_x scores against WD and WS in Fig. S3a-e. Overall, two flow regimes explained the changes in PC1-O_3 (Fig. S3a): summer (marine) flow decreases PC1-O_3 (negative scores), while spring/fall (continental) amplifies it (positive scores). There was no sign of stagnation in summer (an increase in PC scores at lower WS) from which we could infer local chemistry (Fig. S3b). The PC1-NO_x tells roughly a similar story in terms of flow regimes (Fig. S3d) and the absence of stagnation during summer (Fig. S3e). Temperature indicates no consistent formation of O_3 with increasing T at the scale of the entire season (although the monthly relationship is positive) and very limited chemistry or some physical effect on NO_x, such as dilution at the surface due to a higher boundary layer (Fig. S3c and Fig. S3f).

The monthly background O_3 and NO_x trends are consistent between hours over the entire season. We determined this by converting the PC1 scores to O_3 and NO_x hourly mixing ratios and plotting them for each month to assess the 6-month trends (Fig. S4). Background O_3 trends compare well with those from previous estimates of 8-h average background O_3 (Nielsen-Gammon et al., 2005), showing two peaks in spring and summer/fall, respectively, and a drop in mid-summer, when local chemistry dominates regional background O_3 in the HGB region.

The season-characteristic hourly background O_3 and NO_x (the most typical daytime value on 1-h basis in the HGB region averaged over six months) points out consistency between hours and no significant chemistry between O_3 and NO_x (Fig. 3), particularly during midday, when important photochemistry occurs. When the 6-month values are also averaged over 8 hours, they compare reasonably well with similar estimates from previous studies (Nielsen-Gammon et al., 2005; Choi, 2014), ranging from 37 to 38 ppb for background O_3 and varying between 4-7 ppb for background NO_x.

We further assessed the relationship between regional background O_3 and NO_x at both 1-h and 8-h levels (Fig. S5). The positive relationships suggest that both O_3 and NO_x are related (possibly through regional transport) and there is some interaction between them (significant slopes of 1.89 ± 0.48 and 2.07 ± 1.99, respectively). However, background NO_x only explains ~60% of the changes in background O_3, at both 1-h and 8-h levels, implying that the unexplained ~40% might be related to other processes/sources, such as regional VOC chemistry or from unconsidered VOC emissions upwind, which can increase both O_3 and NO_x mixing ratios.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
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Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

3.1.2 Other contributions to hourly median O_3 and NO_x

Here, we report results from the analysis and interpretation of the other significant components (PC2-PC5) extracted by PCA using the hourly median approach (Table 1). The cluster of points localized around the Houston Ship Channel, where most of the petrochemical industry facilities are located, is likely related to local chemistry and/or emissions. The cluster of points representing highly correlated PC3 with both O_3 and NO_x at locations in the north of the HGB area (Fig. 1) likely represents a mixed local/regional (maybe continental) influence. Additionally, it was important to consider how the other components (PC4 for O_3 and PC4 and PC5 for NO_x) may factor into the average of local contributions within the HGB region, since the sites defining them are in close proximity to the PC2 sites, from which we primarily inferred local contributions.

The second component describes local contributions, given the locations of the sites and its relationship with meteorological variables. To test for local influence, we analyzed the PC2-O_3 and PC2-NO_x scores against meteorology (Fig. S6). Results revealed that PC2 is insensitive to WD for both O_3 and NO_x at the season scale using 1-h and 8-h levels. Within the high O_3 season, flow varies from SSW-S-SSE (in summer) to SE-ESE (in spring and fall). Highest PC2-O_3 scores are recorded in July and August, coinciding with the predominant flow from SSE-SE. A few high scores are also visible in September, but they appear to be related to easterly transport. Overall, the spring and fall PC2-O_3 scores all cluster under zero at relatively similar flow direction as observed in summer. This suggests some local effects, a reverse pattern than that inferred from PC1-O_3 in Fig. S3a. Local effects can also be inferred from PC_2-NO_x, with highs and lows in each month (Fig. S6d). Diurnal variability in PC2-NO_x scores is more pronounced for NO_x compared to O_3, suggesting that NO_x is lost photochemically in the afternoon hours (i.e., lower scores). With respect to WS, PC2-O_3 and PC2-NO_x show different relationships (Fig. S6b and Fig. S6e). Low WS facilitates the formation of O_3 and depletion of NO_x. As WS increases (> 4 m s^{-1}) NO_x increases (higher PC2-NO_x scores) but there is no sign of O_3 formation (low PC2-O_3 scores).

Relationships with temperature suggest active local chemistry by both month and season (Fig S6c and Fig. S6f). A positive PC2-O_3 versus T relationship indicates the build-up of O_3 as temperature increases to favor the chemistry of VOCs. A negative PC2-NO_x versus T relationship may suggest both chemical and physical controls on NO_x. However, the high scores in July and August might be related to NO_x and VOC_s chemistry, rather than vertical mixing due to a higher boundary layer. Therefore, we interpreted that PC2 represents mainly local chemistry. To test if PCA-inferred local O_3 is explained by PCA-inferred local NO_x, the converted PC2 variables are compared in Fig. S7. The negative relationship is consistent with NO_x chemistry and photochemical production of O_3; it also indicates the probability of a VOC-limited atmosphere. However, NO_x only explains about 30% of the changes in O_3. Note that the 8-h average did not reveal a significant dependence of O_3 on NO_x at the season scale (the empty circles), pointing out the importance of the time scale (1 h) needed to observe relevant chemistry. The unexplained portion for the 1-h level (70%) is quite significant. We believe it is related to rapid VOC chemistry in this area of the HGB region.

The third component may be dominated by regional influences, based on the locations of the associated sites within the HGB region and the comparison with meteorology. Traditionally, the upwind sites (Conroe, Conroe Relocated, NW Harris) are

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

considered to be "background" sites. One PC3 site (Houston Aldine), though, overlaps with a PC2 site resulting in a mixed contribution within PC3 at this site (Fig. 1). To consider mixed regional/local influences, the PC3-O_3 and PC3-NO_x scores were examined with respect to meteorological variables. In the morning, flow is from the GOM, which brings already processed air, characterized by low PC-O_3 scores (marine background); PC3-NO_x scores vary from positive to negative within this onshore flow. In the afternoon, flow is from the SSE-SE and intercepts some local/urban pollution on its way to the PC3 sites (i.e., Conroe); here, PC3-O_3 increases (continental background), while PC3-NO_x varies largely. Temperature increases PC3-O_3 while decreasing PC3-NO_x, suggesting active chemistry by both month and season. Winds are stable and stagnant in the afternoon, suggesting enhanced local pollution during that time. At the season scale, the O_3-WS relationship is positive, while the NO_x-WS relationship is positive during spring and summer months only, turning negative in fall. The positive relationship suggests advection of higher mixing ratios of both O_3 and NO_x to the HGB area, while a negative relationship suggests a chemical or a physical loss of NO_x. The former, indicates that regional contributions may dominate the local contributions within this component at the season scale (for O_3) and during spring and summer (for NO_x). Covariance with meteorology would probably better resolve PC3, but this approach was not possible using the hourly median.

The fourth component likely describes local transport effects. Results from analysis of PC4-O_3 and PC4-NO_x while considering meteorology indicate that the sites associated with this component (Clinton, La Porte) are influenced by the sea breeze rotation and recirculation of local pollution (flow is from S-SSE in summer/spring and from SE-ESE in fall), with higher scores occurring in spring/summer.

The fifth component, which explained a small portion of the variance in original NO_x, appears to be consistent with local VOC chemistry because its relationship with T is positive over the entire season. Primarily, NO_x increases in summer due to VOC chemistry and/or local emissions. On a monthly basis, PC5-NO_x is negative with increasing T (similar to PC2-NO_x), suggesting physico-chemical controls on NO_x. Flow is from SSE-SE-ESE and winds are weak and stable (~3 m s^{-1}) in summer (increases NO_x) and less stable in spring/fall (decreases NO_x). On a monthly basis, PC2-NO_x and PC5-NO_x are not very different, as they both may be controlled by physico-chemical interactions involving boundary layer height, solar radiation, VOC chemistry and possibly other chemistry. However, if we extend the time scale to six months, the two components are very different in terms of the NO_x-T relationship: PC2 is negative, while PC5 is positive with increasing T. A possible explanation is that the two components, when compared to T, are different because of the averaging over 8 hours. These averages are consistent with the 1-h based PC2-T relationships, but are inconsistent with the 1-h based PC5-T relationships. Consequently, the NO_x-T relationship turns positive for PC5 at the season scale. On the other hand, in this PCA approach, we did not use 8-h averages and T, but the method differentiated between PC2 and PC5. A possible explanation is that one of the PC5 sites (Baytown) overlaps with the PC2-defined cluster in Fig. 1, being more exposed to local chemistry and emissions from the industrial area, an influence standing out at the season scale only. La Porte is situated south of the Houston Ship Channel and near the GOM, likely being dominated by marine influences (lower NO_x) at the monthly level. Therefore, PC5 also describes mixed local/regional effects on surface NO_x.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

We primarily based our regional background O_3 and NO_x estimates on PC1, although some regional contributions could be inferred from other components (most notably, PC3). Since the components from which we inferred mixed regional-local contributions explain less variance than PC1 (particularly, PC5), we assumed these contributions are negligible, so we did not include them in the estimation of regional background O_3 and NO_x. Similarly, we estimated local O_3 and NO_x from the conversion of PC2 only. However, for estimating the contribution of regional background to measured hourly median O_3 and NO_x, we additionally considered average regional contributions from PC1 and PC3 and compared them with those estimated from PC1 only.

3.2 Regional and local contributions to MDA8 O_3 and 8-h average NO_x (Approach A)

The two independent PCAs using fewer sites with nearly continuous data for which the MDA8 O_3 and 8-h average NO_x could be calculated resulted in three components having eigenvalues greater than unity. However, we retained all five components because they were not significantly different in explaining the variance in the original variables, particularly for NO_x (Table 3).

Meteorology helped to interpret the components but was insufficient to clearly distinguish between regional and local contributions. For example, by looking at how the scores of each component varied with average WD we found that all sites were influenced by SSE winds (146-155 degrees), with the western sites (NW Harris and Bayland Park) experiencing a slightly more southern WD by 3 degrees. The flow from GOM encounters local/urban air on its way to the western sites, while eastern sites experience more direct marine air from the GOM area. These two patterns were also visible in the distributions of PC scores average T and WS.

Monthly trends helped to distinguish between regional and local contributions from the principal components. We used the monthly trends for each component to observe if these trends are consistent with expected regional and local trends from previous studies. Three components (PC2, PC3 and PC4) exhibit monthly trends (Fig. S8a) that are consistent with the expected bi-modal regional background O_3 (Nielsen-Gammon et al., 2005). The remaining components (PC1 and PC5) show monthly trends (Fig. S8b) similar to those expected from unimodal local contribution (Nielsen-Gammon et al., 2005). We found similar monthly trends for 8-h average NO_x (Fig. S8b). Here, regional contributions are suggested by PC1, PC2 and PC5, while local contributions are denoted by PC3 and PC4. Therefore, we based our regional and local estimates of O_3 and NO_x on the components identified as regional and local from their monthly trends.

The relationship between regional background O_3 and NO_x (Fig. S9) underscores that NO_x explained approximately 20% of the changes in background O_3, while no significant relationship between PCA-inferred local O_3 and NO_x was observed (Fig. S10). These poor relationships may be the result of using fewer sites, MDA8 O_3, and 8-h average NO_x compared to the hourly median approach.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

3.3 Regional and local contributions to MDA8 O_3 and 8-h average NO_x (Approach B)

In this new PCA approach, we co-varied O_3 with NO_x and meteorology at the sites used in Approach A. We conditioned the PCA to retain only components with eigenvalues greater than 1. Two components were retained at each site, as summarized in Table 4. The average eigenvalue was 1.5. Each component explained approximately 30% of the variance in the original variables, implying that they are equally important in explaining the original variables at the sites used in this approach.

We partially inferred the meaning of the components by considering how variables and their respective loadings (absolute values nearly or greater than 0.5) are associated within each component (Table 5). The first component (PC1) associated O_3 with WS and, sometimes, with NO_x at three sites (Bayland Park, Deer Park and NW Harris), while the same component combined NO_x with T at other sites (Houston Aldine and Houston East). On the other hand, the second component (PC2) associated O_3 with WS at two sites (Houston Aldine and Houston East) and combined NO_x with T at the remaining sites (Bayland Park, Deer Park and NW Harris). Overall, two patterns emerged from each component: "O_3-NO_x-WS" sites and "NO_x-T" sites. The association of O_3 with WS could indicate a physical control (i.e., advection or stagnation), while the NO_x-T relationship may suggest a chemical control (T-mediated chemical reactions). In the first component, O_3 and WS also associate with NO_x (with lower loadings), suggesting either some chemical interaction sustained by a lower WS or a similar transport source for both O_3 and NO_x. Temperature and NO_x at Houston Aldine confirmed that "NO_x-T" in the first component describes chemistry, possibly local formation of O_3 (Fig. S11). Ozone, NO_x and WS at Bayland Park together confirmed that "O_3-NO_x-WS" represents regional transport of O_3 and NO_x and/or local VOC chemistry, because both O_3 and NO_x increase with PC1, while WS decreases (Fig. S12). Local chemistry might be possible at lower WS, which causes an increase in PC1 scores.

By mapping how the input variables are partitioned between the two components we more clearly discriminated between regional and local contributions at each site (Fig. S13). For instance, O_3 is well represented by PC1 at three sites (NW Harris, Bayland Park and Deer Park). At these sites, some NO_x is also distributed in PC1, suggesting that O_3 and NO_x are related either through transport or chemistry. However, WS shows a pattern strongly similar to that of O_3 and less strongly to that of NO_x in PC1, reinforcing that PC1 at these sites is dominated by regional transport. At Houston Aldine and Houston East, O_3 shows an opposite partition compared to NO_x, indicating that PC1 at these sites is local chemistry, which also is supported by T and WS.

Regional background O_3 and NO_x were determined by averaging the converted PC scores from "O_3-NO_x-WS" sites, while local contributions were quantified by averaging the converted PC scores from "NO_x-T" sites. The conversion method (Langford et al., 2009) differs slightly from Approach A because in Approach B multiple variables defined one component at a particular site as opposed to a single variable at many sites. Therefore, the normalized relative contribution (in %) of the variable of interest in each component was used instead of the total variance (in %) explained by the component (Table 5).

We quantified the relationships between O_3 and NO_x, from both regional (Fig. S14) and local estimates (Fig. S15). Regional background NO_x explained regional background O_3 very well (97%), suggesting that they are strongly related, either through

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

a similar transport source and/or through VOC chemistry; they both can increase O_3 and NO_x. The relationship between the estimated local variables also reveals a similar strong dependence of local O_3 on local NO_x (98%). The improved relationships (both regional and local) are the effects of co-varying O_3, with NO_x and meteorology within a relatively small spatial scale. However, the sites are widespread within this spatial scale, and they all experience flow from the GOM area and impact from local sources to some extent.

3.4 Regional and local contributions to MDA8 O_3 and 8-h average NO_x (Approach C)

Results in this section were driven by the use of five more sites (but a shorter study period) compared to Approach B. Therefore, they point out the simultaneous effect of increasing the spatial scale and reducing the temporal scale of the analysis (constrained by the availability of continuous data). The same variables were used in PCA as in Approach B. For each site, there were two components retained (average eigenvalues of 1.3-1.6) and each explained, on average, 31% and 27 % of the variance in MDA8 O_3 and 8-h average NO_x, respectively. Similar to Approach B, we also identified two modes of variance among the original data: "O_3-NO_x-WS" (denoting a physical control) and "NO_x-T" (denoting a chemical control) based on loadings in Table 6 (those with absolute values nearly or greater than 0.5). Therefore, we obtained the regional background O_3 and NO_x by averaging the corresponding PC scores and using the adjusted equation from Langford et al. (2009) as described previously. Linear regression of estimated regional background O_3 versus NO_x (Fig. S16) shows that NO_x very poorly related with O_3. This contradicts the finding from Approach B (where a strong relationship was inferred) and shows that the analytical separation between regional and local contributions did not improve when more sites and fewer years were considered. A positive but weak relationship could be inferred from local O_3 local NO_x (Fig. S17). This is much weaker than what we observed in Approach B (12% versus 98%, respectively) and shows that separation of regional from local contributions did not improve in the present approach. It is possible that spatial heterogeneity of sources, chemistry and meteorology may have played a role in the poor performance of the model using this approach.

3.5 Similarities and differences between monthly trends of regional background O_3 and NO_x from all approaches

We compared the monthly trends from all approaches used to estimate regional O_3 and NO_x contributions. We found that the use of MDA8 O_3 (Approaches A-C) estimated larger background contributions for the entire season compared to the hourly median approach (either from PC1 only or from PC1 adjusted by PC3), as shown in Fig. 4. This likely is due not only to the difference in the number of sites used in the PCA (5-10 28, respectively) but also to the fact that the highest 8-h average was selected for each day in Approaches A-C, compared to the hourly median (the 50th percentile of the hourly measurements), which was averaged over 8-h for comparison. Approach A follows the trend described by the hourly median (although smoothed) because it was derived using a similar PCA (single variable/multiple sites). Approaches B and C deviate from this trend because they were derived using a different PCA (single site/multiple variables). However, the three approaches yield similar values for July, when local chemistry is expected to be more important (Nielsen-Gammon et al., 2005). The sudden increase from July to August is consistent in all approaches (significant regional summertime chemistry), but its decrease

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

starts earlier for Approaches B and C compared to the hourly median and Approach A, likely the result of changes in meteorology after August (less influence from sea breeze effects). Because meteorology was not used to estimate regional background O_3 in the hourly median approach or in Approach A, the enhancement of background O_3 continues until September and starts declining only after, as a result of changing regional transport and chemistry. Interestingly, approaches B and C agree with the hourly median approach in May and October, suggesting that the time scale of observations (1-h) is small enough to capture rapid changes in NO_x concentration and fluctuations in WS, which are reflected in the 8-h average regional background O_3.

A similar analysis was done for regional background NO_x (Fig. 5). Here, estimation of larger background NO_x resulted from Approaches A-C until mid-August, when compared to the hourly median approach based on PC1 only. All approaches intersect this hourly median approach sometimes between August and September. However, when the regional background from the hourly median approach is adjusted by PC3 (average of PC1 and PC3), Approaches A-C all gave higher estimates than the hourly median over the entire season. Approach A appears consistent with the hourly median "adjusted by PC3", for the same reasons described previously for background O_3. The effect of spatial scale is more visible between Approaches B and C from August to September, when local influences likely dominate within the HGB region.

3.6 Quantification of temporal trends in regional background O_3 and NO_x

The goal in this portion of the work was to quantify the temporal trends in the final background O_3 and NO_x and to investigate if the background O_3 and NO_x have declined over the past decades. We used linear regression of the season-averaged background O_3 and NO_x in each year time to quantify temporal trends.

3.6.1 Weak and negative linear trends resulted from Approach A

The temporal trend quantified from Approach A (Fig. 6) suggests that background O_3 has declined; corresponding average WD also is shown for the five sites. The linear model is statistically significant, yielding a slope of -0.13 ± 0.10 ppb y^{-1}, comparable in magnitude but smaller than that reported in a previous study and irrespective to WD (Berlin et al., 2013) using a similar approach (-0.33 ± 0.39 ppb y^{-1}). Compared to the SE wind-constrained slope from Berlin et al. (-0.92 ± 0.74 ppb y^{-1}), our slope is much smaller. The mean background O_3 over the seventeen years is 46.74 ± 0.58 ppb, while Berlin et al. (2013) reported a 14-y mean of 42.5 ± 6.3 ppb, representing SE influences only. The decadal time-scale explained about 27% of the changes in background O_3 in this study, similar to Berlin et al. (2013) (23%).

The decline in background NO_x is better explained by this approach (R^2=0.53) compared to O_3, due to less scatter in the data after 2003, while the slope is similar compared to that for O_3 (Fig. 7). On average, the 17-y background NO_x is 6.86 ± 0.19 ppb.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

3.6.2 The negative trend significantly improved for O_3 using Approach B

When background O_3 is adjusted by NO_x and meteorology, its decline over time is stronger and more significant than in Approach A (Fig. 6), though still of the same order of magnitude. The resulting slope is -0.69 ± 0.29 ppb/yr, while the 17-y mean of background O_3 is 46.72 ± 2.08 ppb, in agreement with the previous approach. Relative to a previous study (Berlin et al., 2013), the slope is less steep (-0.69 versus -0.92 ppb y^{-1}), but its error is halved (42% versus 80%, respectively). A slight shift in WD over the past seven years (more southerly flow) might have also played a role in the decline of background O_3, which is consistent with the findings in Liu et al. (2015). Also, state controls on precursor emissions implemented in 2007 may also have contributed to reduced background O_3 after that.

The slope of background NO_x versus time is slightly smaller compared to Approach A (-0.04 ppb y^{-1} versus -0.06 ppb y^{-1}), but the linear model performed better (R^2= 0.58 versus R^2=0.53), highlighting the effect of spatial and temporal covariance of chemistry and meteorology (Fig. 7). The 17-y mean of background NO_x (6.80 ± 0.13 ppb) is in good agreement with Approach A.

3.6.3 The negative trends did not improve using Approach C (spatial extension of Approach B)

By extending the spatial scale (from 5 to 10 sites) and lowering the period of analysis (from 17 to 13 years), the effect of co-varying O_3 with NO_x and meteorology within the HGB area did not make a significant difference in the temporal trend of background O_3 (Fig. 6), but it weakened the temporal trend in background NO_x (Fig. 7). It is possible that NO_x from additional sites was more sensitive to local influences (i.e., meteorology) than O_3 or that the years left out from analysis had higher 8-h average NO_x mixing ratio. The 13-year mean of background O_3 is 44.71 ± 1.28 ppb, while of mean background NO_x is 6.03 ± 0.05 ppb.

3.7 Regional background contributions to locally measured O_3 and NO_x from all approaches

We quantified the regional background contributions to locally measured O_3 and NO_x via linear regression for all the approaches in this study (Fig. S18 to Fig. S25). Based on slope values, these contributions ranged from 1.16 to 5.65 (mole measured per mole of background) for measured O_3 (hourly median and MDA8) and varied from 0.33 to 4.06 for measured NO_x (hourly median and 8-h average). Compared to the analogous slope from Berlin et al. (2013) (1.22 ± 0.04), our slope value for O_3 using approach A is about five times steeper (5.65 ± 0.15), while those from approaches B and C are slightly lower (0.91 ± 0.02) or slightly higher (1.47 ± 0.06), respectively. The intercept coefficients were significant in all approaches. Background O_3 explained between 57 % and 98 % of the variation in spatially averaged hourly median and MDA8, while background NO_x explained about 16-62 % of the changes in spatially averaged hourly median and 8-h average. In general, the linear model performed less well for NO_x (all approaches) compared to O_3. This could be explained by its smaller temporal scale of variability compared to O_3 but also by the fact that the corresponding 8-h average NO_x to MDA8 O_3 was used in the PCA. It is possible that this approach makes it more difficult to extract background NO_x, if

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

MDA8 O_3 is mainly the result of local chemistry. The larger estimates of background NO_x compared to measured median values from May through October could be the result of a stronger intra-seasonal variability for NO_x (Fig. S19). For example, the measured median relates negatively with background NO_x from May to July (the cluster around 5 ppb); it only turns positive after that, from July to October. As a consequence, hourly background NO_x is overestimated in spring compared to summer and fall and relative to measured values. A separate analysis of hourly median NO_x within the PCA for spring summer/fall, potentially could improve the estimates of background NO_x using the hourly median approach. Also, it should be noted that background NO_x was not adjusted by meteorology, as their covariance was not possible using the hourly median.

3.8 Summary

Approach B is our best estimate of the temporal trend in background O_3. Results from all approaches are summarized in Table 7, along with values from Berlin et al. (2013). Overall, the slope we report in our study (-0.69 ± 0.27 ppb y^{-1}) is larger and more accurate compared to the slopes reported by Berlin et al. (2013), which were quantified regardless of the WD (-0.33 ± 0.39 ppb y^{-1} and -0.21 ± 0.39 ppb y^{-1}). Compared to the value reported by Berlin et al. (2013), which represents the trend associated with SE winds only (-0.92 ± 0.74 ppb y^{-1}), our slope derived from Approach B is smaller but twice more accurate (-0.69 ± 0.27 ppb y^{-1}). The average background O_3 in this study is not statistically different than that reported by Berlin et al. (2013), in any of the approaches except for the hourly median approach, which is smaller by 5-8 ppb. No other long-term regional background NO_x studies exist, making comparison impossible.

Regional background contributions to measured MDA8 O_3 are consistent with previously reported contributions from Berlin et al. (2013), with the closest estimate of slope values spanning unity (from linear regression of measured MDA8 versus regional background) resulting from the approaches in which chemistry and meteorology were co-varied spatially and temporally; a higher estimate of slope value (by a factor of 5) resulted from the approach in which MDA8 O_3 was not constrained by NO_x and meteorology.

4 Conclusions

The overall goals of this study were to estimate regional background O_3 and NO_x in the HGB area and to quantify their temporal trends over the past decades. To design more efficient controls on local pollution, we need an improved understanding of regional contributions from a long-term perspective, and also better constraints on O_3 mixing ratio. We used up to seventeen years of hourly measurements of O_3 and NO_x mixing ratios in different multivariate analysis approaches, including one that allowed covariance of O_3 with NO_x and meteorology (T, WD and WS).

We found that the observed decline in regional background O_3 is real and quantifiable, regardless of the approach used to analyze the changes in regional background O_3 on the longest term possible. This is consistent with results from a previous study (Berlin et al., 2013). Similarly, we detected and quantified a decline in background NO_x in all approaches.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

By accounting for the space-time covariance of O_3 with NO_x and meteorology, we could better resolve the temporal trend of background O_3, with a more significant slope and improved coefficient of determination (R^2 of 0.62-0.63) on both time scales: 17 years and 13 years, respectively. Similarly, the temporal trend of background NO_x resulted in a better performance of the linear model (R^2 = 0.58 compared to R^2 = 0.53) when the covariance of variables was used for the longest term, although the associated slope decreased slightly.

Our findings support the claim of Berlin et al. (2013) that changes in regional background O_3 also contributed to a local decline in MDA8 O_3. However, this might be also related to the flow from S-SSE (from the GOM region), the frequency of which increased over the past seven years. This flow effect overlaps with the effect of controlling O_3 precursor emissions at the state level, starting with 2007.

Future work should extend the temporal trends in background O_3 and NO_x into future years to continuously determine the effectiveness of control measures and identify any regulatory changes that need to be made. Additionally, wherever VOCs data are available, the extraction of background O_3 and NO_x should be constrained over that period by VOCs as well and possibly by solar radiation. The related temporal trends should be compared over that period with those estimated from this study to highlight the effect of including VOCs and an additional meteorological variable in the multivariate analysis.

Author contribution

L. G. Suciu (data collection and processing, data analysis and interpretation, manuscript writing); R. J. Griffin (guidance on data analysis and interpretation, critical revision of the manuscript); C. A. Masiello (critical revision of the manuscript).

Data availability

Time series of data analyzed in this study (validated raw data reports, JMP) are available at the Texas Air Monitoring and Information System (TAMIS) website owned by Texas Commission on Environmental Quality. The website can be accessed at: http://www17.tceq.texas.gov/tamis/index.cfm?fuseaction=home.welcome

Competing interests

The authors declare that they have no conflict of interest.

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Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

References

Banta, R.M., Senff, C.J., Nielsen-Gammon, J., Darby, L.S., Ryerson, T.B., Alvarez, R.J., Sandberg, S.P., Williams, E.J., Trainer, M.: A Bad Air Day in Houston, B. AM. Meteorol. Soc., 86, 657–669, doi:10.1175/BAMS-86-5-657, 2005.

Banta, R.M., Senff, C.J., Alvarez, R.J., Langford, A.O., Parrish, D.D., Trainer, M.K., Darby, L.S., Michael Hardesty, R., Lambeth, B., Andrew Neuman, J.: Dependence of daily peak O_3 concentrations near Houston, Texas on environmental factors: Wind speed, temperature, and boundary-layer depth. Atmos. Environ., 45, 162–173. doi:10.1016/j.atmosenv.2010.09.030, 2011.

Berlin, S.R., Langford, A.O., Estes, M., Dong, M., Parrish, D.D.: Magnitude, Decadal Changes, and Impact of Regional Background Ozone Transported into the Greater Houston, Texas, Area, Environ. Sci. Technol., 47, 13985–13992. doi:10.1021/es4037644, 2013.

Camalier, L., Cox, W., Dolwick, P.: The effects of meteorology on ozone in urban areas and their use in assessing ozone trends, Atmos. Environ., 41, 7127–7137, doi:10.1016/j.atmosenv.2007.04.061, 2007.

Choi, Y.: The impact of satellite-adjusted NO_x emissions on simulated NO_x and O_3; discrepancies in the urban and outflow areas of the Pacific and Lower Middle US, Atmos. Chem. Phys., 14, 675–690, doi:10.5194/acp-14-675-2014, 2014.

Cooper, O.R., Gao, R.-S., Tarasick, D., Leblanc, T., Sweeney, C.: Long-term ozone trends at rural ozone monitoring sites across the United States, 1990-2010: Rural U.S. ozone trends, 1990-2010, J. Geophys. Res.-Atmos., 117, doi:10.1029/2012JD018261, 2012.

Fiore, A.M., Naik, V., Leibensperger, E.M.: Air Quality and Climate Connections. J. Air Waste Manage., 65, 645–685, doi:10.1080/10962247.2015.1040526, 2015.

Hudman, R.C., Murray, L.T., Jacob, D.J., Turquety, S., Wu, S., Millet, D.B., Avery, M., Goldstein, A.H., Holloway, J.: North American influence on tropospheric ozone and the effects of recent emission reductions: Constraints from ICARTT observations, J. Geophys. Res., 114, doi:10.1029/2008JD010126, 2009.

Kemball-Cook, S., Parrish, D., Ryerson, T., Nopmongcol, U., Johnson, J., Tai, E., Yarwood, G.: Contributions of regional transport and local sources to ozone exceedances in Houston and Dallas: Comparison of results from a photochemical grid model to aircraft and surface measurements, J. Geophys. Res., 114, doi:10.1029/2008JD010248, 2009.

Langford, A.O., Senff, C.J., Banta, R.M., Hardesty, R.M., Alvarez, R.J., Sandberg, S.P., Darby, L.S.: Regional and local background ozone in Houston during Texas Air Quality Study 2006, J. Geophys. Res., 114, doi:10.1029/2008JD011687, 2009.

Langford, A.O., Tucker, S.C., Senff, C.J., Banta, R.M., Brewer, W.A., Alvarez, R.J., Hardesty, R.M., Lerner, B.M., Williams, E.J.: Convective venting and surface ozone in Houston during TexAQS 2006, J. Geophys. Res., 115, doi:10.1029/2009JD013301, 2010.

Liu, L., Talbot, R., Lan, X.: Influence of Climate Change and Meteorological Factors on Houston's Air Pollution: Ozone a Case Study, Atmosphere, 6, 623–640, doi:10.3390/atmos6050623, 2015.

Nielsen-Gammon, J.W., J. Tobin, A. McNeel, G. Li.: A conceptual model for eight-hour exceedances in Houston, Texas (Part I), Houston Advanced Research Center, Houston, TX, 52 pp., 2005.

Parrish, D.D., Allen, D.T., Bates, T.S., Estes, M., Fehsenfeld, F.C., Feingold, G., Ferrare, R., Hardesty, R.M., Meagher, J.F., Nielsen-Gammon, J.W., Pierce, R.B., Ryerson, T.B., Seinfeld, J.H., Williams, E.J.: Overview of the Second Texas Air Quality Study (TexAQS II) and the Gulf of Mexico Atmospheric Composition and Climate Study (GoMACCS), J. Geophys. Res., 114, doi:10.1029/2009JD011842, 2009.

Pierce, R.B., Al-Saadi, J., Kittaka, C., Schaack, T., Lenzen, A., Bowman, K., Szykman, J., Soja, A., Ryerson, T., Thompson, A.M., Bhartia, P., Morris, G.A.: Impacts of background ozone production on Houston and Dallas, Texas, air quality during the Second Texas Air Quality Study field mission, J. Geophys. Res., 114, doi:10.1029/2008JD011337, 2009.

Pusede, S.E., Steiner, A.L., Cohen, R.C.: Temperature and Recent Trends in the Chemistry of Continental Surface Ozone, Chem. Rev., 115, 3898–3918, doi:10.1021/cr5006815, 2015.

Rappenglück, B., Perna, R., Zhong, S., Morris, G.A.: An analysis of the vertical structure of the atmosphere and the upper-level meteorology and their impact on surface ozone levels in Houston, Texas, J. Geophys. Res., 113, doi:10.1029/2007JD009745, 2008.

Rasmussen, D.J., Fiore, A.M., Naik, V., Horowitz, L.W., McGinnis, S.J., Schultz, M.G.: Surface ozone-temperature relationships in the eastern US: A monthly climatology for evaluating chemistry-climate models, Atmos. Environ., 47, 142–153, doi:10.1016/j.atmosenv.2011.11.021, 2012.

Reddy, P.J., Pfister, G.G.: Meteorological factors contributing to the interannual variability of midsummer surface ozone in Colorado, Utah, and other western U.S. states: July surface O_3, meteorology, and NO_2, J. Geophys. Res.-Atmos., 121, 2434–2456, doi:10.1002/2015JD023840, 2016.

Tawfik, A.B., Steiner, A.L.: A proposed physical mechanism for ozone-meteorology correlations using land–atmosphere coupling regimes, Atmos. Environ., 72, 50–59, doi:10.1016/j.atmosenv.2013.03.002, 2013.

Wilks, D.S.: Statistical methods in the atmospheric sciences, 3rd ed., Elsevier, Academic Press, Oxford, UK, 676 pp., 1995.

Zhang, H., Ying, Q.: Contributions of local and regional sources of NO_x to ozone concentrations in Southeast Texas, Atmos. Environ., 45, 2877–2887, doi:10.1016/j.atmosenv.2011.02.047, 2011.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 1: Description of the extracted principal components using the hourly median approach

Principal component	Eigenvalue		% Variance explained		Cumulative %	
	O_3	NO_x	O_3	NO_x	O_3	NO_x
PC1	14.35	12.72	51.24	45.44	51.24	45.44
PC2	6.71	6.07	23.95	21.69	75.20	67.13
PC3	3.76	2.92	13.43	10.43	88.63	77.56
PC4	1.28	1.77	4.56	6.31	93.19	83.86
PC5	-	1.70	-	6.06	-	89.92

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 2: The O_3 and NO_x sites and their loadings associated with each principal component using the hourly median approach

Site name	PC1		PC2		PC3		PC4		PC5	
	O_3	NO_x	O_3	NO_x	O_3	NO_x	O_3	NO_x	O_3	NO_x
Channelview	.714	.161	.501	.905	.233	.075	.367	-.042	N/A	.156
Clinton	.830	-.224	.387	.178	.326	.050	.130	.923	N/A	-.005
Conroe	-.084	-.088	.089	.382	.878	.794	-.188	.005	N/A	.235
Conroe Relocated	.273	.212	-.183	.233	.900	.700	.076	.530	N/A	-.296
Danciger	.969	.841	-.166	.112	.045	.103	.076	-.425	N/A	-.007
Galveston 99 St.	.925	.951	-.279	.020	.057	.190	.044	-.031	N/A	-.062
Galveston Airport	.960	.974	.100	.043	-.022	.052	-.133	-.020	N/A	-.013
Houston Aldine	.373	.413	.549	.788	.712	.368	.193	-.011	N/A	.043
Bayland Park	.856	.837	.272	.387	.390	.260	.046	-.073	N/A	.192
Houston Crawford	-.055	.835	.906	.441	.223	-.126	-.063	-.140	N/A	-.003
Deer Park	.881	.871	.369	.402	.274	.181	.067	-.051	N/A	.045
Houston East	.460	.918	.577	.341	.552	.064	.290	-.069	N/A	.103
Hayden Rd. (HRM3)	.765	.324	.481	.780	.334	.477	.205	-.014	N/A	-.013
Sheldon Rd. (HRM4)	.044	-.061	.921	.835	.142	.213	.014	.082	N/A	-.154
Baytown (HRM7)	.129	-.451	.952	.135	-.024	-.187	.008	-.057	N/A	.749
La Porte (HRM8)	.405	.444	-.336	.034	-.131	.159	.641	.009	N/A	.782
Mont Belvieu (HRM10)	-.141	-.736	.914	.394	.035	.044	-.237	.311	N/A	.257
East Baytown (HRM11)	.035	-.727	.891	.350	-.174	.124	-.102	-.094	N/A	-.042
Lynchburg Ferry	.827	.382	.410	.773	.156	.090	.194	.097	N/A	-.040
Lake Jackson	.978	.771	-.157	.207	-.010	.415	.037	-.340	N/A	-.193
Manvel Croix	.966	.847	-.021	.336	.223	.346	.087	-.092	N/A	-.127
Mustang Bayou	.977	.917	-.162	.209	.065	.149	.011	.152	N/A	-.056
NW Harris	.653	.567	.072	.499	.721	.576	-.056	.121	N/A	-.120
Park Place	.901	.829	.228	.484	.311	.223	.148	-.044	N/A	.029
San Jacinto Monument	.553	.808	.544	.301	-.029	.004	-.557	-.120	N/A	.160
Seabrook Fr. Park	.971	.931	.085	.236	.176	.164	.064	.103	N/A	-.008
Texas City 34 St.	.982	.652	-.104	.223	.049	.632	.017	-.178	N/A	-.108
Wallsville Rd.	.849	.171	.406	.829	.123	.077	.142	.263	N/A	.313

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 3: Description of the extracted principal components from Approach A

Principal component	Eigenvalue		% Variance explained		Cumulative %	
	O_3	NO_x	O_3	NO_x	O_3	NO_x
PC1	1.321	1.032	26.423	20.631	26.423	20.631
PC2	1.311	1.024	26.225	20.448	52.648	41.119
PC3	1.292	1.012	25.838	20.237	78.486	61.356
PC4	.826	.982	16.514	19.639	95.000	80.995
PC5	.250	.950	5.000	19.005	100.000	100.000

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 4: Description of the extracted principal components from Approach B

Site	Principal component	Eigenvalue	% Variance explained	Cumulative %
Houston Aldine	PC1	1.424	28.477	28.477
	PC2	1.403	28.055	56.532
Bayland Park	PC1	1.578	31.560	31.560
	PC2	1.445	28.904	60.465
Deer Park	PC1	1.740	34.800	34.800
	PC2	1.304	26.070	60.870
Houston East	PC1	1.609	32.187	32.187
	PC2	1.469	29.384	61.571
NW Harris	PC1	1.574	31.481	31.481
	PC2	1.211	24.212	55.693

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 5: The loadings or correlations of the components with variables at each site from Approach B

Site name	PC1					PC2				
	O_3	NO_x	T	WD	WS	O_3	NO_x	T	WD	WS
Houston Aldine	0.065	-0.794	0.802	0.310	0.223	0.813	0.183	0.319	-0.107	-0.771
Bayland Park	0.805	0.463	0.267	-0.160	-0.787	-0.075	-0.698	0.810	0.541	0.057
Deer Park	0.820	0.648	0.123	-0.159	-0.779	0.053	-0.549	0.929	0.330	0.167
Houston East	0.118	-0.823	0.798	0.439	0.295	0.804	0.200	0.344	-0.284	-0.763
NW Harris	0.825	0.498	0.147	-0.508	-0.605	0.097	-0.573	0.892	0.278	-0.013

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 6: The loadings or correlations of the components with variables at each site from Approach C

Site name	PC1					PC2				
	O_3	NO_x	T	WD	WS	O_3	NO_x	T	WD	WS
Houston Aldine	0.780	0.319	0.145	-0.243	-0.804	0.236	-0.773	0.835	0.086	0.127
Bayland Park	0.807	0.481	0.288	-0.203	-0.772	-0.031	-0.684	0.823	0.461	0.124
Deer Park	0.821	0.554	0.161	-0.392	-0.701	-0.030	-0.681	0.886	-0.168	0.358
Houston East	0.272	-0.794	0.859	0.223	0.155	0.736	0.344	0.149	-0.399	-0.814
NW Harris	0.784	0.451	0.130	-0.535	-0.668	0.082	-0.697	0.900	0.159	0.060
Channelview	0.625	0.484	0.047	0.271	-0.843	0.106	-0.627	0.709	0.567	-0.030
Conroe Relocated	0.741	0.560	-0.007	-0.015	-0.844	-0.207	-0.664	0.723	0.666	-0.139
Manvel Croix	-0.825	0.625	-0.042	0.627	0.717	0.103	0.065	0.941	0.510	0.074
Clinton	-0.220	0.117	0.254	0.694	0.785	0.792	0.035	0.736	0.007	-0.016
Seabrook Fr. Park	0.480	0.871	-0.602	0.278	-0.451	-0.578	-0.160	-0.040	0.833	0.634

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

Atmospheric Chemistry and Physics Discussions

Table 7: Comparison between all approaches in this study and literature

Method	Average regional background		Temporal trends in regional background			
	O_3 ppb	NO_x ppb	O_3 Slope (ppb y^{-1})	R^2	NO_x Slope (ppb y^{-1})	R^2
Approach A (17 years)	46.74 ± 0.58†	6.86 ± 0.19†	-0.13 ± 0.10	0.27	-0.06 ± 0.03	0.53
Approach B (17 years)	46.72 ± 2.08†	6.80 ± 0.13†	-0.68 ± 0.27	0.63	-0.04 ± 0.02	0.58
Approach C (13 years)	44.71 ± 1.28†	6.03 ± 0.05†	-0.49 ± 0.24	0.62	-0.013 ± 0.012	0.30
Hourly median (up to 17 years)	37.60 ± 1.55*	5.75 ± 0.62*	-	-	-	-
Adjusted hourly median (up to 17 years)	37.67 ± 0.80§	5.74 ± 0.32§	-	-	-	-
Berlin et al. (2013) (14 years)	42.5 ± 6.3Ł	-	-0.92 ± 0.74Ł	-	-	-
			-0.33 ± 0.39	0.23		
			-0.21 ± 0.39	0.12		

†The average values were obtained by averaging the yearly values over the respective study period; the yearly values represent the season means (May-Oct) and account for daytime hours only.

*The hourly background values (daytime hours during May-Oct) were averaged over 8 hours for each month to get the season mean that is comparable with the other approaches. This background is based on a single component (PC1).

§The hourly background was adjusted to include average regional contributions from two components (PC1 and PC3).

Ł Constrained by wind direction from southeast

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

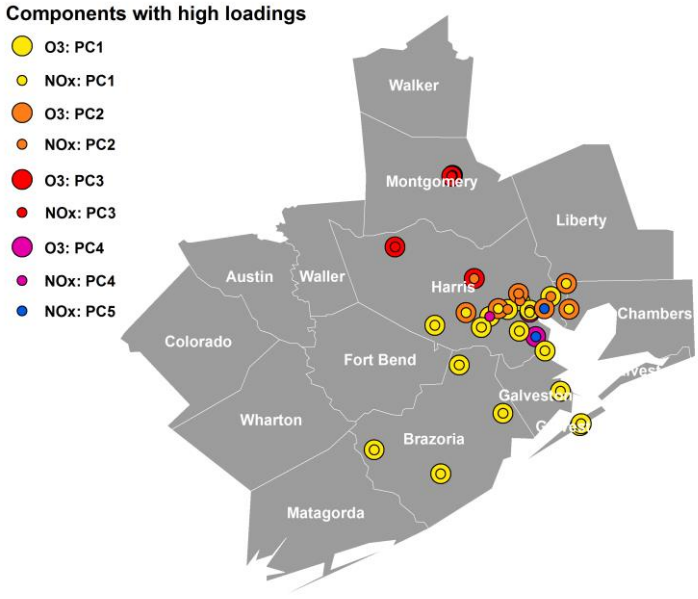

Figure 1: Distinct clustering of principal components. The cluster in yellow is PC1-O_3 and PC1-NO_x. The cluster in orange is PC2-O_3 and PC2-NO_x, and so on. Smaller circles represent NO_x clusters.

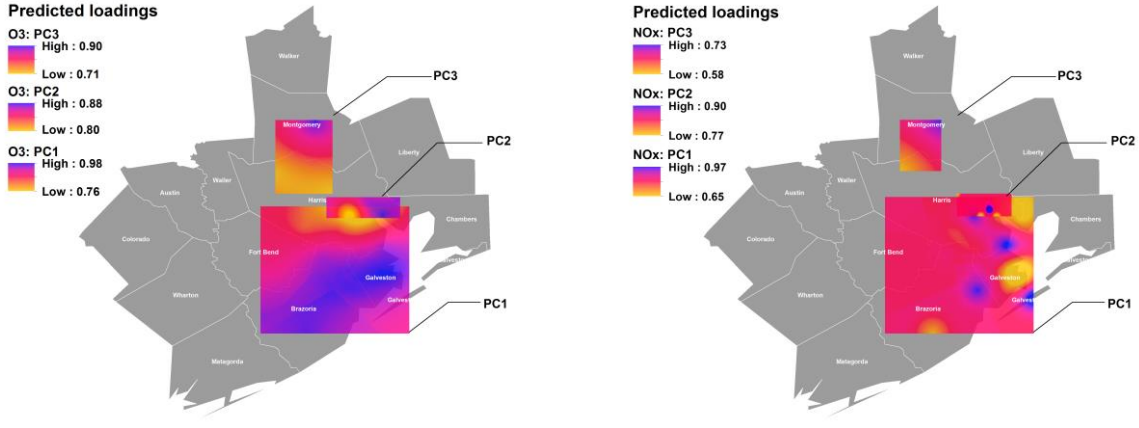

Figure 2: Spatial interpolation of normalized squared loadings from the highly correlated sites with the first three components in terms of O_3 (left) and NO_x (right). Range is from 0 to 1.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

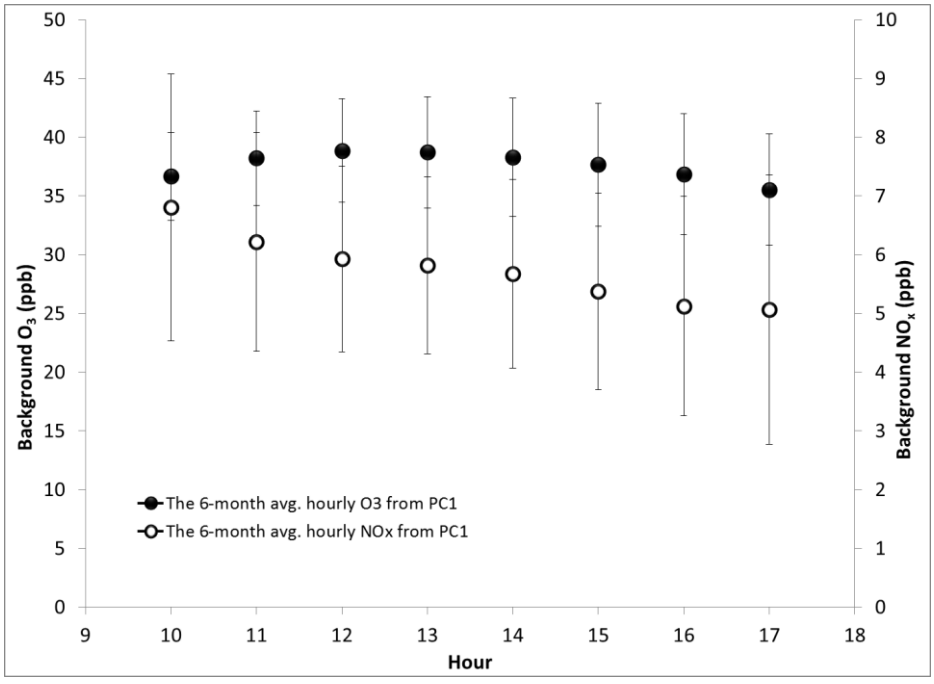

Figure 3: The season averaged hourly background O_3 and hourly background NO_x. Error bars represent the 95% confidence interval for the mean.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

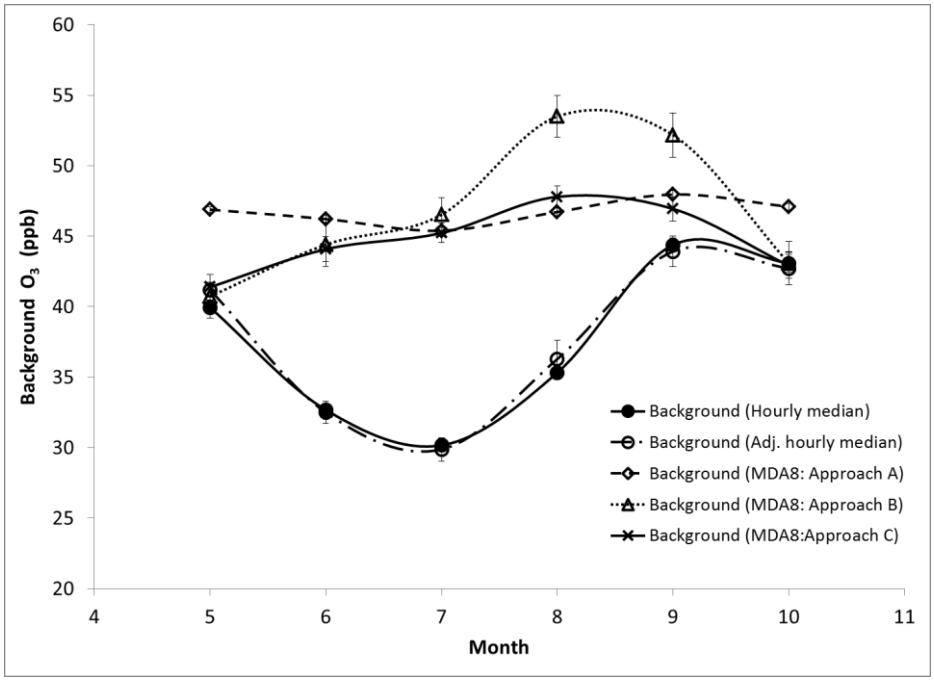

Figure 4: The 6-month trends in background O_3 from different approaches. Points represent the monthly average background values derived from the hourly median O_3 and MDA8 O_3. Error bars represent the 95% confidence interval for the mean.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
Manuscript under review for journal Atmos. Chem. Phys.
Published: 21 October 2016

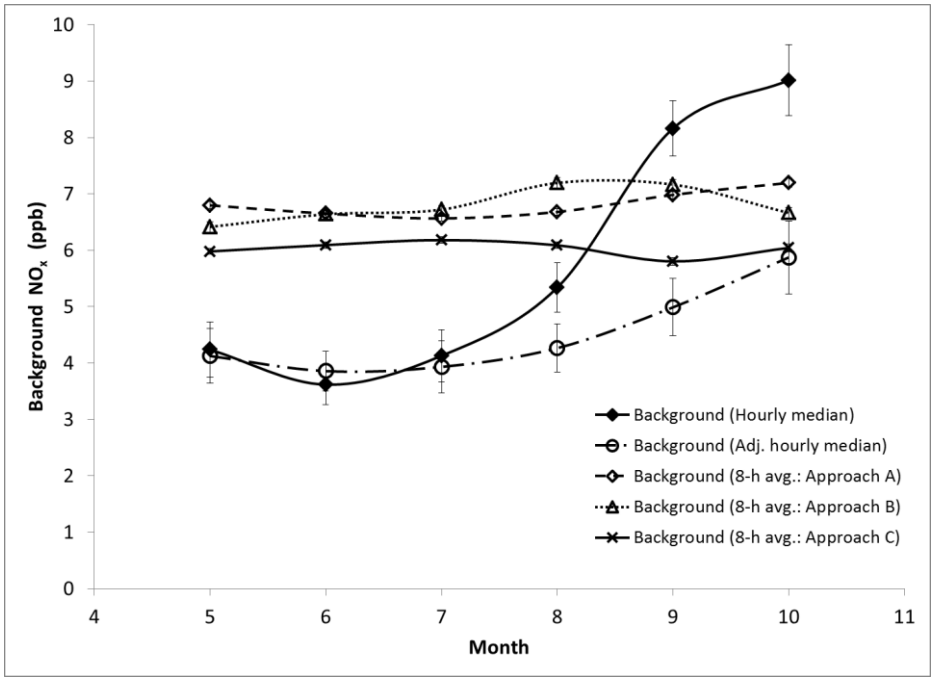

Figure 5: The 6-months trends in background NO_x from different approaches. Points represent the monthly average background values derived from the hourly median NO_x and the 8-h average NO_x. Error bars represent the 95% confidence interval for the mean.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
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Published: 21 October 2016

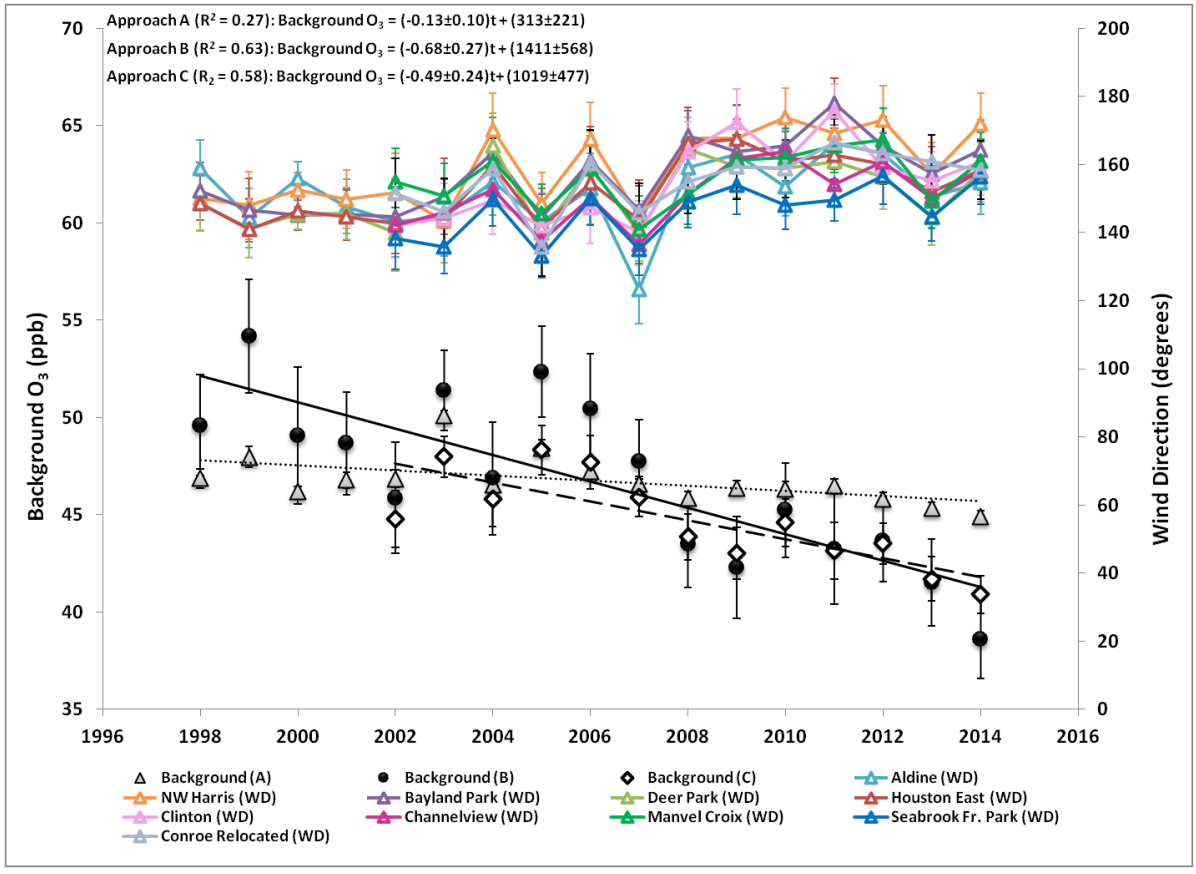

Figure 6: Temporal trends in background O_3 (Approaches A-C) and average wind direction. Error bars represent the 95% confidence interval for the mean.

Atmos. Chem. Phys. Discuss., doi:10.5194/acp-2016-893, 2016
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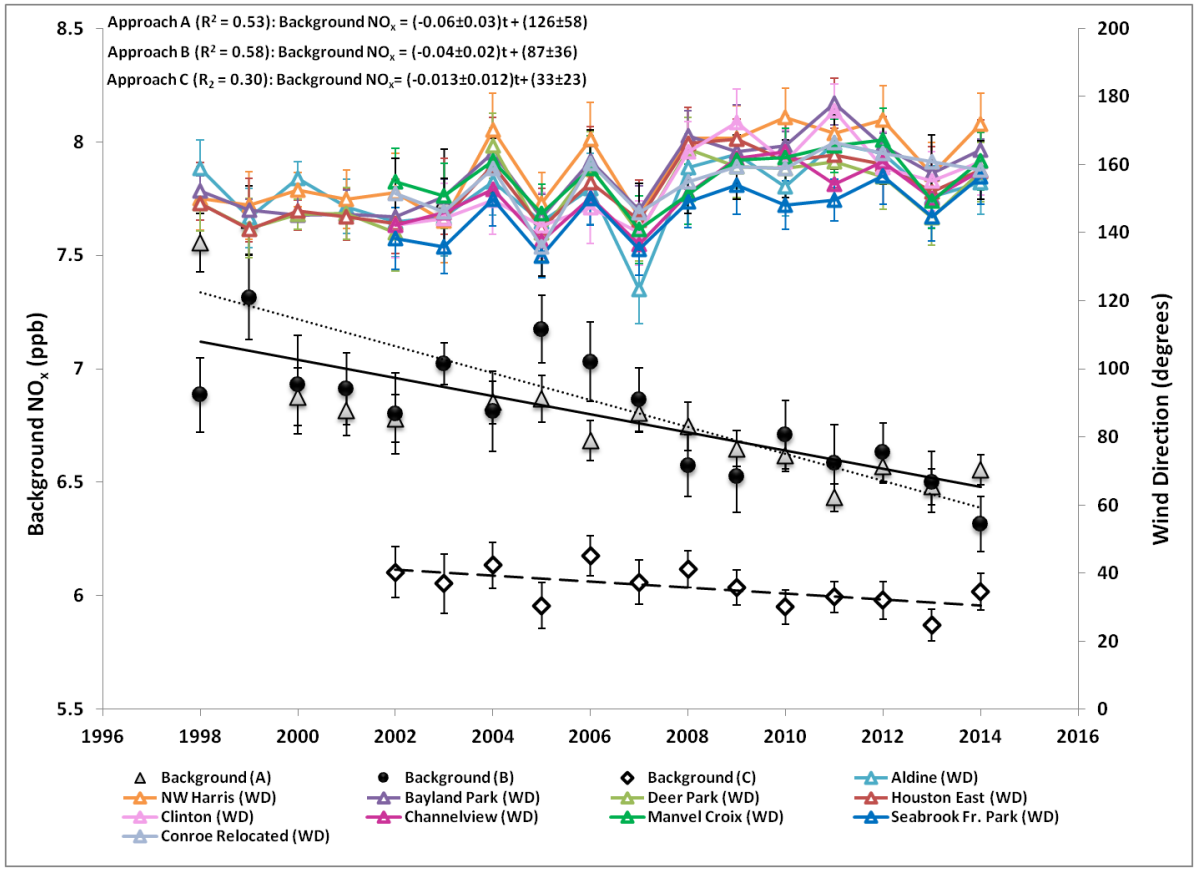

Figure 7: Temporal trends in background NO_x (Approaches A-C) and average wind direction at various sites. Error bars represent the 95% confidence interval for the mean.