

Motivation

- Many previous studies have used CO and NO_x linear regressions to evaluate onroad mobile source inventories[1-8]
- Mobile sources were isolated using near-road or morning rush-hour observations.
- The regression slope was interpreted as the ratio of emitted CO to emitted NO_x from onroad sources
- To our knowledge, no previous research tested the assumption that linear regression slopes from near-road data accurately reflect CO:NO_x emitted ratios (ERs)

Overview

- Combined upwind and downwind measurements made during a recent EPA-FHWA near-road study in Las Vegas provides a unique opportunity to measure onroad mobile source contributions of CO (ΔCO) and NO_x (ΔNO_x)
- We use onroad source contributions to validate $\Delta\text{CO}:\Delta\text{NO}_x$ derived from linear regressions
- Traffic data collected during this campaign can also be used as inputs into EPA's Motor Vehicle Emissions Simulator (MOVES) model to compare modeled CO:NO_x ERs with ambient measurements

Methods

Las Vegas near-road measurements

- CO and NO_x were measured between December 2008 and February 2010
- Measurements were made at one upwind site (nominal distance of 100m) and three downwind sites (nominal distances of 20m, 100m, 300m) near a section of I-15 on the south side of Las Vegas
- Data selection criteria:
 - Cross-road flow (230-300° wind direction) at ≥ 1 m/s
 - Data completeness (5 valid, 5-min average measurements in each hour)

Using upwind monitor to determine

- Ratio of cross-road gradient of CO and NO_x at each of the 3 downwind monitors (at distance x) and hourly resolution is calculated as follows:

$$\frac{\Delta\text{CO}^x}{\Delta\text{NO}_x^x} = \frac{[\text{CO}]_{1h}^x - [\text{CO}]_{1h}^{-100m}}{[\text{NO}_x]_{1h}^x - [\text{NO}_x]_{1h}^{-100m}}$$

Using linear regressions to determine roadway $\Delta\text{CO}:\Delta\text{NO}_x$

- Figure 2 provides an example linear regression of CO vs NO_x
- 1 regression per hour using 5-minute average measurements
- Three different linear regression methods
 - Ordinary Least Squares (OLS) – minimizes **vertical** distance between points and the line-of-best-fit. Assumes no uncertainty in the independent variable
 - Orthogonal – minimizes **perpendicular** distance between points and the line-of-best-fit. Assumes uncertainty in both variables.
 - Constant coefficient: treats uncertainty as % of measured value for both variables
 - Constant variance: treats uncertainty as constant value for both variables

$$[\text{CO}]_{5min}^x = \frac{\Delta\text{CO}^x}{\Delta\text{NO}_x^x} [\text{NO}_x]_{5min}^x + b$$

Evaluation of regression-based $\Delta\text{CO}:\Delta\text{NO}_x$ ratios for estimating onroad emissions

Figure 3. Boxplots summarizing the distribution of $\Delta\text{CO}:\Delta\text{NO}_x$ from cross-road gradient and all three regression methodologies at each of the downwind monitor locations. Regressions slopes with p-values > 0.05 are not included in the boxplots.

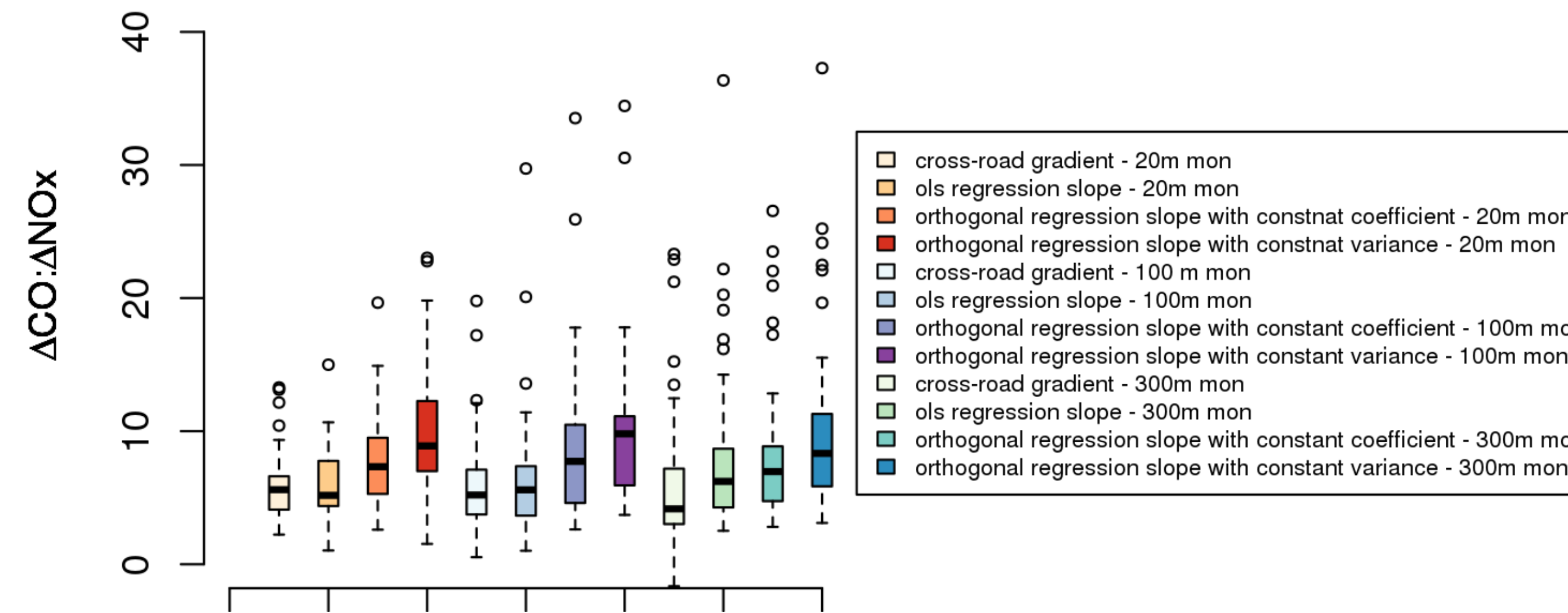


Figure 4 Comparison of $\Delta\text{CO}:\Delta\text{NO}_x$ derived using all 3 regression methodologies versus the $\Delta\text{CO}:\Delta\text{NO}_x$ derived from the cross-road gradient for the 100m downwind monitor. Regressions slopes that with p-values > 0.05 are not shown.

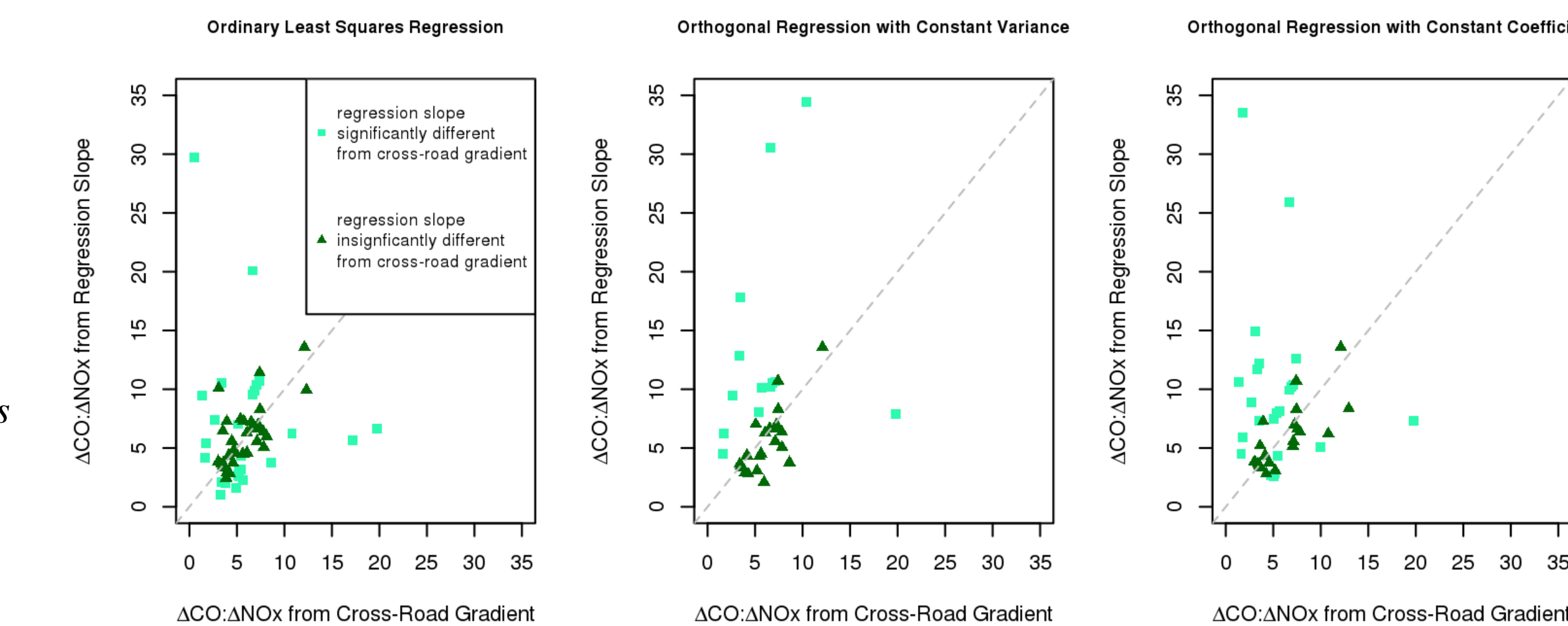


Table 1. $\Delta\text{CO}:\Delta\text{NO}_x$ values and performance information for the all regression methods.

| | DW Monitor Distance (m) | % of regressions with a significant slope | Mean $\Delta\text{CO}:\Delta\text{NO}_x^*$ | cross-road gradient not within 95% CI of regression slope* (% of regressions) | $\Delta\text{CO}:\Delta\text{NO}_x$ Difference from cross-road gradient* | |
|--------------------------------------|-------------------------|---|--|---|--|----------------------|
| | | | | | mean | Welch t-test p-value |
| Cross-road gradient | 20 | N/A | 5.8 | N/A | N/A | N/A |
| | 100 | N/A | 5.8-6.2** | N/A | N/A | N/A |
| | 300 | N/A | 6.4-6.7** | N/A | N/A | N/A |
| Ordinary Least Squares | 20 | 25% | 6.1 | 32% | 0.3 | 0.60 |
| | 100 | 35% | 6.4 | 43% | 0.6 | 0.43 |
| | 300 | 38% | 8.4 | 52% | 2.0 | 0.15 |
| Orthogonal with Constant Coefficient | 20 | 23% | 8.1 | 21% | 2.3 | <0.01 |
| | 100 | 25% | 8.8 | 52% | 3.0 | <0.01 |
| | 300 | 27% | 9.5 | 38% | 2.9 | 0.12 |
| Orthogonal with Constant Variance | 20 | 21% | 10.0 | 19% | 4.1 | <0.01 |
| | 100 | 21% | 10.4 | 36% | 2.9 | <0.01 |
| | 300 | 31% | 11.2 | 49% | 4.5 | <0.01 |

*These values are only calculated using results from regressions with statistically significant slopes ($p < 0.05$).
**Mean $\Delta\text{CO}:\Delta\text{NO}_x$ differs for each regression method comparison due to different sets of hours with valid regressions

Comparison of cross-road gradient $\Delta\text{CO}:\Delta\text{NO}_x$ to MOVES ERs

Using MOVES to simulate roadway $\Delta\text{CO}:\Delta\text{NO}_x$

- MOVES 2014a used generate emissions for range of speed, temperature, and RH with county-level defaults
- On-site traffic and meteorology used to generate hourly emissions for each lane
- Emissions were summed across all lanes for comparison with cross-road gradient $\Delta\text{CO}:\Delta\text{NO}_x$
- Suspected issues with traffic data in DJF may be reflected in poor ER and $\Delta\text{CO}:\Delta\text{NO}_x$ agreement



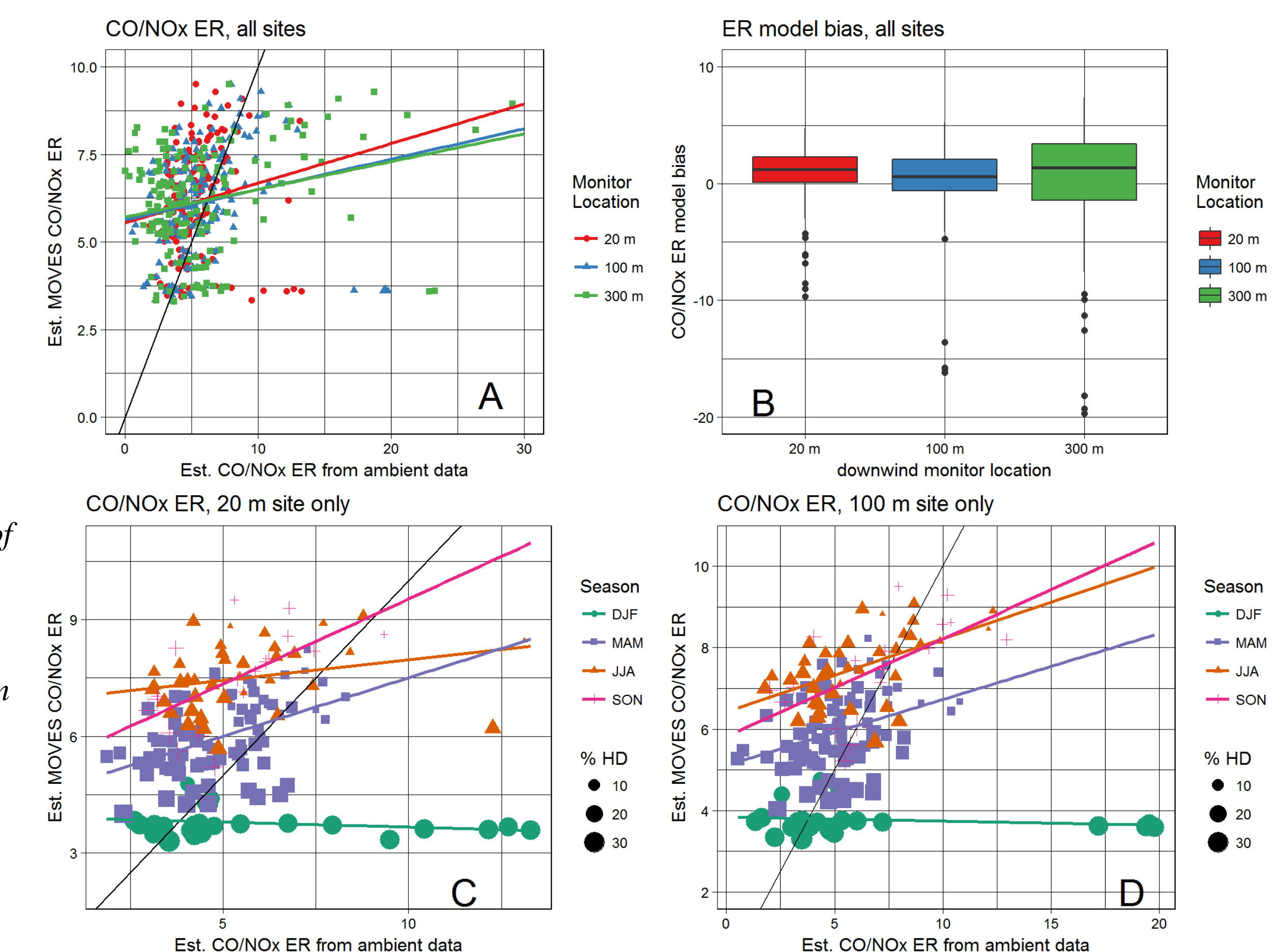
Figure 1. Las Vegas Study Sites

Figure 5.

(A) comparison of cross-road gradient $\Delta\text{CO}:\Delta\text{NO}_x$ against the MOVES generated ER

(B) Distribution of ER bias based on estimates from each downwind monitor

(C&D) comparison of $\Delta\text{CO}:\Delta\text{NO}_x$ ER broken down by Season and Heavy Duty fraction for 20m and 100m downwind sites



Conclusions

- The regression method that performed the best was the OLS regression at the 20m and 100m downwind sites.
 - Performance was mixed for comparisons between regression-based $\Delta\text{CO}:\Delta\text{NO}_x$ and cross-road gradient $\Delta\text{CO}:\Delta\text{NO}_x$ for individual hours
 - OLS may be a reliable method for characterizing the ratio of CO to NO_x emissions coming from vehicles on that roadway over a large number of hours
- The orthogonal regressions, in most cases, had distributions that were significantly different from the cross-road gradient ($p < 0.01$) on average by 2.3-4.5
- Despite the large range of variability, cross-road gradient $\Delta\text{CO}:\Delta\text{NO}_x$ and MOVES ER have good average agreement with potentially small over-predictions. Over-predictions of the ER could mean that estimated CO emissions are too high or that NO_x emissions are too low.