

# Application of the Segmented “Band-RRF” approach for 8-hour Ozone NAAQS Attainment Demonstration

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## Introduction/Background:

The U.S. EPA modeling guidance (2007) recommends using the Relative Response Factors (RRF) to project current Design Values (DV) into the future for the NAAQS attainment demonstration of ozone (O<sub>3</sub>) and PM<sub>2.5</sub>. However, it is known that higher O<sub>3</sub> mixing ratios are, in general, more responsive to emission controls of limiting precursors than lower mixing ratios are. The current form of the RRF concept does not allow for this enhanced response to emissions controls at the high end of the simulated/measured O<sub>3</sub> distribution and uses a single RRF value to represent a broad range of O<sub>3</sub> values in the baseline and future years.

We have developed segmented RRF approach termed “Band-RRF” that takes into account the varied model responses for different ranges of O<sub>3</sub> mixing ratios. The Band-RRF approach was previously demonstrated for the now-revoked 1-hour O<sub>3</sub> NAAQS in the San Joaquin Valley (SJV) (Kulkarni et al., 2014). Here, we present the application of the band-RRF concept to the 8-hour O<sub>3</sub> NAAQS. We will also discuss the applicability of the Band-RRF concept to the 24-hour and annual PM<sub>2.5</sub> NAAQS.

## Meteorological and Photochemical Modeling:

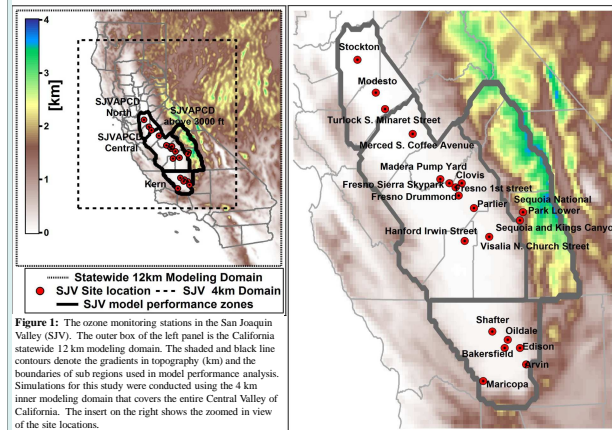


Figure 1: The ozone monitoring stations in the San Joaquin Valley (SJV). The outer box of the left panel is the California statewide 12 km modeling domain. The shaded and black line contours denote the gradients in topography (km) and the boundaries of sub regions used in model performance analysis. Simulations for this study were conducted using the 4 km inner modeling domain that covers the entire Central Valley of California. The insert on the right shows the zoomed in view of the site locations.

1. Meteorology Model: WRFv3.3.1
2. Air Quality Model: CMAQv4.7.1 with SAPRC99 chemical mechanism and the AEROS aerosol module
3. Modeling Period: 2007 O<sub>3</sub> Season (May – September)
4. Biogenic emission inventory: 2007 inventory calculated by MEGAN with California-specific emission factors
5. Boundary conditions for the 12 km domain: MOZART global model output
6. Two sets of anthropogenic emission inventory: Day-specific 2007 and 2019 inventory for model performance evaluation, calculating relative response factors (RRFs) and future DVs
7. CMAQ simulations: Modeling of 2007 and 2019 using the day specific inventory for calculating future DVs

## CMAQ Model Performance Statistics for 8-hour O<sub>3</sub>

Table 1: Daily maximum 8-hour O<sub>3</sub> (> 60 ppb) performance statistics by modeling sub-regions and entire SJV region for May-September 2007 (See Figure 1 for definition of sub-regions)

Parameter	SJVAPCD	SJVAPCD	SJVAPCD	Kern	Entire SJV
	North	Central	above 3000 ft.		
Number of data points	67	641	221	590	1519
Mean obs (ppb)	67.6	71.2	79.6	74.2	73.4
Mean model (ppb)	77.9	74.3	73.5	73.8	74.2
Mean Bias (ppb)	10.3	3.1	-6.1	-0.4	0.7
Mean Error (ppb)	12.5	7.6	9	7.6	8
Normalized Mean Bias (%)	15.3	4.4	-7.6	-0.5	1
Normalized Mean Error (%)	18.6	10.7	11.3	10.2	10.9
Index of Agreement	0.46	0.69	0.62	0.73	0.68

Note: The statistical metrics used in this table are defined in Simon, H., Baker, K. R., and Phillips, S.: Compilation and interpretation of photochemical model performance statistics published between 2006 and 2012, Atmospheric Environment, 61, 124-139, 2012.

## 8-hour O<sub>3</sub> Band-RRF Methodology Details:

The 8-hour O<sub>3</sub> DV is the average of the annual 4<sup>th</sup> highest daily maximum 8-hour O<sub>3</sub> mixing ratios over three consecutive calendar years (U.S. EPA, 2008). The 2007 8-hour O<sub>3</sub> DVs (based on the 2005-2007 measurement period) are shown in the 2<sup>nd</sup> column of Table 2 for representative sites in the SJV region. (See Figure 1 for site locations).

We now describe the procedure of applying the Band-RRF concept to the 8-hour O<sub>3</sub> standard using the example of the Arvin monitoring site. The time series (Figure 2) of the observed (solid black circles) and simulated “nearby” (i.e., in a grid cell within a 15 km radius of the monitor) daily maximum 8-hour O<sub>3</sub> values (black solid line) at Arvin shows good agreement.

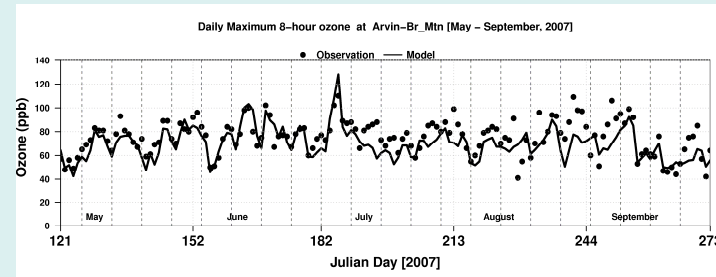


Figure 2: Time-series of observed (black circles), simulated (black line) daily maximum 8-hour O<sub>3</sub> for the simulation period (May-September 2007)

The calculation of future year 8-hr O<sub>3</sub> DV’s using the Band-RRF approach involves the following steps as described in Kulkarni et al. (2014)

### Calculation of Band-RRFs:

This builds upon the existing RRF approach. The reference-year simulated concentrations above a predetermined threshold (60 ppb for this work) were binned into regular 5 ppb bands from 60-100 ppb. All values above 100 ppb were segregated into a single band. Within each band, an RRF was calculated. The Figure 3 shows the Band-RRF values (y-axis) for each band (x-axis). The decrease in Band-RRF values with increasing band number confirms that the model is more responsive to emissions control at higher values. For the comparison, the “single” RRF for this site is shown as a dashed line parallel to the x-axis.

### Representing the RRFs for missing bands of 8-hour O<sub>3</sub> mixing ratios:

To represent the missing bands, we performed a linear regression of available RRFs starting from the 60 ppb bin and only when at least three bands with simulated 8-hour O<sub>3</sub> mixing ratio  $\geq 70$  ppb were available (solid black line). We chose this criterion to prevent the lower less-responsive bands from dominating the fit.

Based on an analysis for all the representative SJV monitoring sites (not shown here) that are included in the SIP, we selected the 60 ppb threshold (with at least three bands that have simulated O<sub>3</sub> mixing ratio  $\geq 70$  ppb) for the Band-RRF regression. This choice increases the number of bands available for the regression and provides more stability. It also ensures that low values will not dominate the regression. In addition, including only the reference year data that fall within  $\pm 20\%$  of the measured values in the RRF calculations further constrains the Band-RRF regression fit.

We have used the RRFs on the regression line for all bins instead of the actual Band-RRF points when available since the regression fit represents the average site specific RRF for that particular mixing ratio range. This approach also reduces the uncertainty caused by a band with very few data points (that are used in the RRF calculation for that particular band) and prevents it from having a disproportional impact on the future DV calculations.

### Calculation of Future Year Design Value (DV):

To account for potential reshuffling of the annual 4<sup>th</sup> highest 8-hour O<sub>3</sub> mixing ratio, larger number of days (10 days per year with a total of 30 days during three years) were projected to the future and subsequently used in the future year DV calculation. The top 10 daily maximum 8-hour O<sub>3</sub> mixing ratios from each of the three years (i.e., 2005-2007) were projected to the future using the corresponding Band-RRFs, re-sorted, and the 4<sup>th</sup> highest 8-hour O<sub>3</sub> value was calculated at each monitor. The future DV is then calculated as the three-year average of the annual 4<sup>th</sup> highest O<sub>3</sub> mixing ratios at each monitor (4<sup>th</sup> column of Table 2). These DVs are in general lower than the corresponding single-RRF DVs (3<sup>rd</sup> column of Table 2). For instance, at the Arvin monitoring site, the Band-RRF-based future DV of 85.58 ppb is  $\sim 3$  ppb lower than the corresponding single-RRF DV of 88.8 ppb.

## Band-RRF 8-hour O<sub>3</sub> Future DVs

Table 2: 2007 and 2019 O<sub>3</sub> DVs for representative monitoring sites in the San Joaquin Valley of California. Listed here are the top 10 2007 DV sites for 8-hour O<sub>3</sub>.

Monitoring Station	DV (ppb) Ambient (2005-2007) <sup>a</sup>	DV (ppb) Single (2007-2019) <sup>b</sup>	DV (ppb) Band (2007-2019) <sup>b</sup>
Arvin	107	88.8	85.5
Sequoia – King’s Canyon	103	86.2	84.7
Edison	99	83.2	81.0
Fresno 1 <sup>st</sup> street	98	81.6	78.3
Bakersfield	97	81.3	79.0
Fresno Sierra Skypark	95	79.1	76.1
Sequoia National Park	95	81.0	81.6
Visalia N. Church Street	95	80.4	78.7
Clovis	93	77.1	75.0
Parlier	93	76.7	74.3
Oildale	91	74.5	73.1

<sup>a</sup>The three year period included in the ambient design value calculations.

<sup>b</sup>The base year 2007 and future year 2019 used for air quality model simulations used in this study.

## Extending Band-RRF to PM<sub>2.5</sub>

Figure 4 illustrates that

the high PM<sub>2.5</sub> concentrations respond more to emissions controls in a similar manner as ozone. The four panels in Figure 4 show daily 2019/2007 PM<sub>2.5</sub> ratios as functions of 2007 simulated PM<sub>2.5</sub> concentrations for four representative locations in the SJV. The simulated PM<sub>2.5</sub> data used in Figure 4 are described in Chen et al. (2014). One can follow the same procedural steps that were described for the 8-hour O<sub>3</sub> NAAQS to calculate the quarter- and component-specific RRFs for the PM<sub>2.5</sub> species.

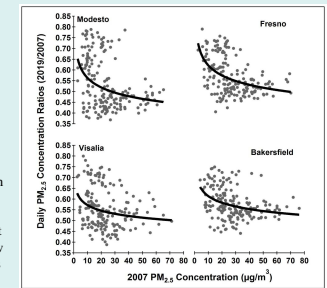


Figure 4: The daily concentration ratios (2019/2007) for total PM<sub>2.5</sub>. The solid line represents the power form of the regression.

## Implications:

Results of photochemical models are used in regulatory applications in a relative sense using Relative Response Factors (RRFs) which represent effects of emissions reductions over a wide range of ozone (O<sub>3</sub>) values. It is possible to extend the concept of RRFs to account for the fact that higher O<sub>3</sub> mixing ratios (both 1-hour and 8-hour) respond more to emissions controls of limiting precursors than do lower O<sub>3</sub> mixing ratios. We demonstrate this extended concept, termed Band-RRF, for the 1-hour and 8-hour O<sub>3</sub> National Ambient Air Quality Standard (NAAQS or standard) in the San Joaquin Valley of California. This extension can also be made applicable to the 24-hour and annual PM<sub>2.5</sub> standards.

## References:

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