Confronting Uncertainties of Simulated Air Pollution Concentrations during Persistent Cold Air Pool Events in the Salt Lake Valley, Utah

Supporting Information

Xia Sun^{1,2*}, Cesunica E. Ivey³, Kirk R. Baker⁴, Athanasios Nenes^{5,6}, Neil P. Lareau⁷, Heather A. Holmes⁸

- 1. Cooperative Institute for Research in Environmental Sciences, University of Colorado, Boulder, Colorado 80309, United States
- 2. NOAA Global Systems Laboratory, Boulder, Colorado 80305, United States
- 3. Civil and Environmental Engineering University of California, Berkeley, California 94720, United States
- 4. U.S. Environmental Protection Agency, Research Triangle Park, North Carolina 27703, United States
- 5. Institute for Chemical Engineering Sciences, Foundation for Research and Technology Hellas, Patras, GR-26504, Greece
- 6. School of Architecture, Civil & Environmental Engineering, Ecole Polytechnique Fédérale de Lausanne, CH-1015, Lausanne, Switzerland
- 7. Atmospheric Sciences Program, Department of Physics, University of Nevada, Reno, Nevada 89557, United States
- 8. Department of Chemical Engineering, University of Utah, Salt Lake City, Utah 84112, United States

* Corresponding author: Xia Sun (xia.sun@noaa.gov)

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S1 WRF Model Setup

The Asymmetric Convective Model version 2 (ACM2) PBL scheme uses a combination of local and non-local turbulence closure schemes and is reported to generate more mixing in the boundary layer compared with both local schemes and non-local schemes [1]. The Yonsei University (YSU) PBL scheme uses a non-local closure scheme. The Mellor-Yamada-Janjic (MYJ) and Mellor-Yamada–Nakanishi–Niino (MYNN) schemes both use local closure schemes that use turbulent kinetic energy to determine the eddy diffusivity coefficients [2]. The MYNN scheme uses large eddy simulation results to estimate stability and mixing length rather than values based on observations as in the MYJ scheme [3]. Other uniform physical parameterizations across the WRF simulations included Thompson cloud microphysics scheme [4], RRTM scheme for longwave radiation [5], Dudhia scheme for shortwave radiation [6], and Kain-Fritsch cumulus scheme [7].

All four WRF simulations were configured using two two-way nested domains. The outer domain covered the Contiguous United States (CONUS) with 12 km horizontal resolution. The inner domain was centered on the Salt Lake Valley and encompasses much of Utah, southwest of Idaho, western Wyoming, and northwestern Colorado with a 4 km horizontal resolution. The vertical grids included 41 layers with 20 levels below 1 km. The initial and boundary meteorological conditions were provided by the National Centers for Environmental Prediction's (NCEP) North American Mesoscale (NAM) model, including the NAM reanalysis dataset (0000, 0600, 1200, and 1800 UTC) and the NAM forecasting dataset (0300, 0900, 1500, and 2100 UTC). Four-dimensional data assimilation (FDDA) was implemented in the WRF simulations similar to Otte [8]. For better model performance, we restarted the model every six days with one day as the model spin up time to cover the whole January of 2011. The ModACM2 case that used the Pleim-

Xiu LSM ran for an extra 10 days for model spin up to initialize its own soil nudging as recommended by Gilliam and Pleim [9].

S2 Vertical Profiles of Temperature and Aerosol Backscatter

Qualitative comparisons of simulated and observed potential temperature, as well as simulated PM_{2.5} concentrations and lidar profiles of aerosol backscatter, are presented in Figure S2 for PCAP3, where large deficiencies existed for H22. The lidar backscatter profiles are taken as approximations of the PM_{2.5} mass [10] and can also provide information on cloud formation. For example, stratiform boundary layer clouds were observed overnight on 28 Jan to 30 Jan. The observations show that strong stratifications occurred during the clear night on 27 Jan and 28 Jan. Weaker near-surface stratification with more mixing due to the limited surface radiative cooling (figure not shown) occurred on nights with boundary layer clouds (28 Jan to 30 Jan). The atmospheric stratifications were more intense above the cloud to the ridge height (2200 m MSL) because of the cloud top radiative cooling on cloudy nights compared with clear nights. This yields an increased H22 (Figure 1) and is accompanied by enhanced surface PM_{2.5} concentrations (Figure 2).

The model generated less stable atmospheric stratification according to the potential temperature contour lines, compared with the Radio Acoustic Sounding System (RASS) observations at the ISS site during PCAP3 (0300 MST 27 Jan to 1800 MST 30 Jan). The ModYSU showed more mixing compared with other models. This leads to an underestimated H22 at the same time, which partly accounts for the underestimated PM_{2.5} concentrations. The strongest atmospheric stratification below ridge height occurred on the night of 28 Jan to 29 Jan in simulations that was one day before the observations (on the night of 29 Jan to 30 Jan). This leads to a faster depletion of surface PM_{2.5} levels in the models compared to observations.

S3 SO₂ Simulation Analysis

Consistently high SO₂ concentrations were simulated by the CMAQ runs (Figure S5). The maximum SO₂ level from simulations reached up to 13.2 ppb, which was around three times higher than the observations (4.7 ppb). The low observed SO₂ levels might be related to improvements in the smelting processes and equipment from local mining companies (personal communication with Bradley R. Adams, Brigham Young University). Impacts associated with these kinds of local activities on SO₂ levels are not included in the emission inventory estimates or the emissions processing models [11]. There were no distinct diel patterns in the SO₂ observations. Overestimations of simulated SO₂ mainly occurred during daytime (Figure S6). Interestingly, the overestimation of SO₂ (Figure S5) did not lead to an overestimation of sulfate. Underestimation of sulfate in the cold season has also been reported by Tesche, Morris, Tonnesen, McNally, Boylan and Brewer [12], which might be attributed to uncertainties in the chemical processes converting SO₂ to sulfate in the CMAQ model.

Experiment	PBL scheme	Surface layer scheme	LSM	
ModACM2	ACM2 [12]	Pleim-Xiu	Pleim-Xiu	
	ACM2 [15]	[14]	[15]	
ModYSU	YSU	Revised MM5	Noch [18]	
	[16]	[17]	INOali [10]	
ModMYJ	MYJ	Eta similarity	Noah	
	[19]	[19]		
ModMYNN	MYNN	MYNN	Noah	
	[20]	[21]	INUAII	

Table S1 Details of the PBL schemes, surface layer schemes, and LSM options used in the four WRF model experiments

Table S2 Statistical comparisons of hourly simulated and observed NO_x, O₃, SO₂, and PM_{2.5} at the HW site during PCAPs/non-PCAPs. The r values are significant at 95% confidence level. The model experiments with the least NME were denoted with *.

	MB	ME	NMB	NME	r	IOA
NO _x (ppb)						
ModACM2*	4.65 / 8.66	58.46 / 49.64	5.19 / 13.04	65.22 / 74.72	0.15 / -	0.48/0.39
ModYSU	20.56 / 17.53	64.97 / 62.84	22.94 / 26.38	72.47 / 94.59	0.20 / -	0.49/0.28
ModMYJ	18.34 / 25.05	69.68 / 64.46	20.46 / 37.71	77.74 / 97.03	- / -	0.40/0.28
ModMYNN	17.42 / 19.95	65.97/61.16	19.44 / 30.03	73.59/92.07	0.15 / -	0.46/0.29
O ₃ (ppb)						
ModACM2	0.41 / -2.04	5.94 / 6.89	6.58 / -20.48	95.70 / 69.22	0.33 / 0.54	0.58/0.71
ModYSU	0.68 / -0.12	6.90 / 8.75	11.00 / -1.22	111.11 / 87.95	0.13 / 0.29	0.41/0.57
ModMYJ*	-0.26 / -2.27	5.90 / 7.76	-4.21 / -22.78	94.96 / 78.00	0.23 / 0.40	0.51/0.61
ModMYNN	0.48 / -1.30	6.56 / 7.67	7.74 / -13.11	105.70 / 77.05	0.21 / 0.42	0.48/0.65
SO ₂ (ppb)						
ModACM2	0.58 / 0.44	1.32 / 0.87	37.06 / 36.68	84.66 / 93.44	- / 0.15	0.19/0.24
ModYSU	1.15 / 0.73	1.72 / 1.19	73.77 / 61.33	109.82 / 99.67	- / 0.23	0.17/0.20
ModMYJ*	0.56 / 0.49	1.20 / 0.86	36.00 / 40.80	76.82 / 72.30	- / 0.20	0.23/0.23
ModMYNN	0.85 / 0.51	1.49 / 0.92	54.38 / 43.22	95.08 / 77.49	0.13 / 0.22	0.20/0.24
PM _{2.5} (µg.m ⁻³)						
ModACM2	-17.37 / 0.23	20.86 / 10.69	-41.45 / 1.45	49.79 / 67.32	0.34 / 0.15	0.50/0.45
ModYSU*	-13.30 / 2.25	17.89/11.10	-31.76 / 14.14	42.71 / 69.88	0.49 / 0.33	0.61/0.59
ModMYJ	-15.23 / 2.70	19.00 / 11.59	-36.36 / 17.02	45.35 / 72.93	0.45 / 0.23	0.57/0.52
ModMYNN	-14.03 / 2.54	18.34 / 11.33	-33.49 / 16.00	43.78 / 71.34	0.48 / 0.28	0.60/0.55



Figure S1 CMAQ domain setup



Figure S2 Topography map of the Salt Lake Valley (SLV) in Utah showing the observation sites. Red solid circles denote the seven ISFS sites that measured surface meteorology parameters and energy fluxes during the PCAPS field campaign. Yellow triangle indicates the location of the main air quality monitoring station (Hawthorne, HW) in Salt Lake City, Utah that is part of both EPA's Air Quality System (AQS) and Chemical Speciation Network (CSN). The NCAR ISS site is denoted by a black cross mark.



Figure S3 Time-height plot of hourly aerosol (color contour) and potential temperature (bold line every 5 K and thin line every 1K) for PCAP3. (a) Laser ceilometer backscatter (m⁻¹ sr⁻¹) and RASS potential temperature (K), and simulated PM_{2.5} (µg m⁻³) and potential temperature (K) from (b) ModACM2, (c) ModYSU, (d) ModMYJ, and (e) ModMYNN.



Figure S4 Simulated vertical profiles of potential temperature at 1200 MST 20 Jan 2010 at the NCAR ISS site located at the center of Salt Lake Valley.



Figure S5 Time series of the hourly simulated and observed (a) 2-m temperature (T2), (b) 10-m wind speed (WS10), (c) 2-m relative humidity (RH2), and (d) net radiation (Rn) averaged over the seven ISFS sites.



Figure S6 Time series of hourly simulated and observed mixing ratios of SO₂



Figure S7 Diel variations of observed and modeled hourly mean values of SO₂ during PCAP events and non-PCAP events. The lower (10th) and upper (90th) dectile values are presented for reference by opaque dashed lines and opaque solid lines, respectively. The data gaps in the PCAPs panel are because there are not enough data to plot the lower and upper dectile at that time.



Figure S8 Bar chart of the observed and modeled difference in mean, 10^{th} percentile, median, and 90^{th} percentile of SO₂ between hourly values during PCAPs and non-PCAPs events (PCAPs-

non-PCAPs).



Figure S9 Daily maximum PM_{2.5} concentrations from observations and the four simulations.



Figure S10 CMAQ simulated aerosol pH variations with simulated aerosol liquid water content from Mod_ACM2. The datapoints are color-coded by RH.



Figure S11 Simulated variations of the nitrogen ratio with PM_{2.5} and PM₁

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