Development and evaluation of an advanced National Air Quality Forecast Capability using the NOAA Global Forecast System version 16

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Supporting Information

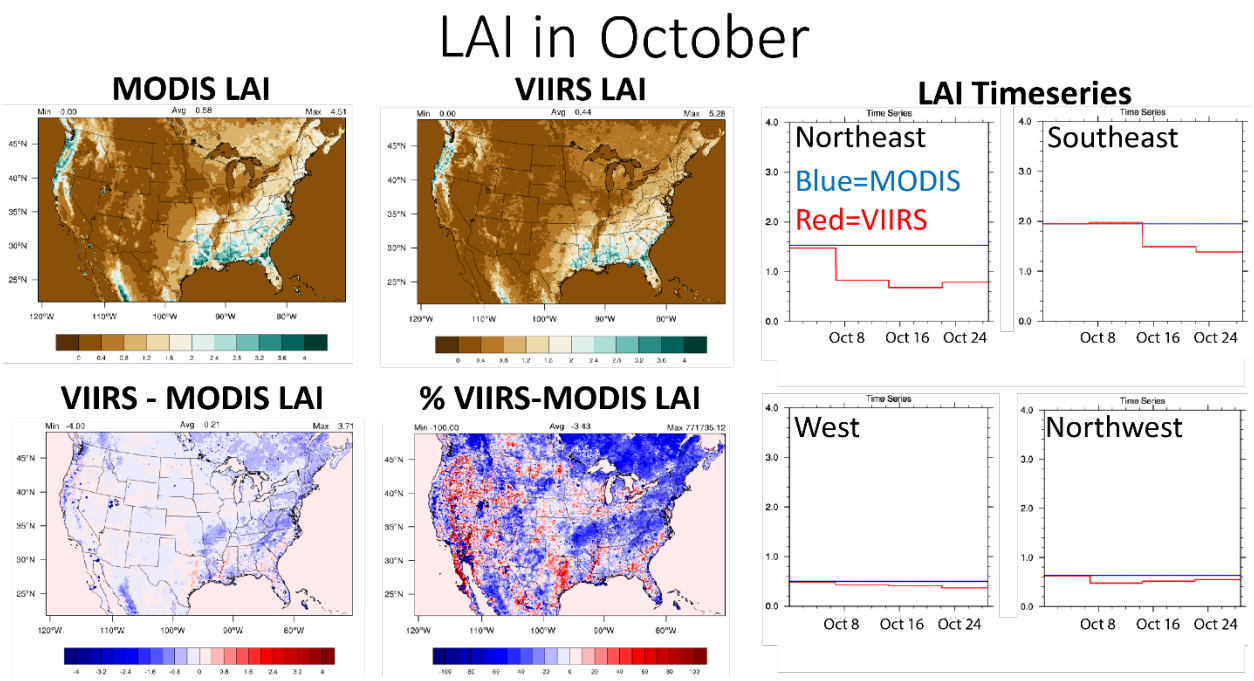


Figure S1. Left: Spatial comparison of October average MODIS-IGBP LAI in 2010 and VIIRS LAI in 2020 (top) and their absolute and relative differences (bottom). Right: Time series comparisons of October average MODIS-IGBP LAI in 2010 and VIIRS LAI 8-day product in 2020 for the northeast, southeast, west, and northwest U.S. regions defined by the U.S. EPA geographic regions.

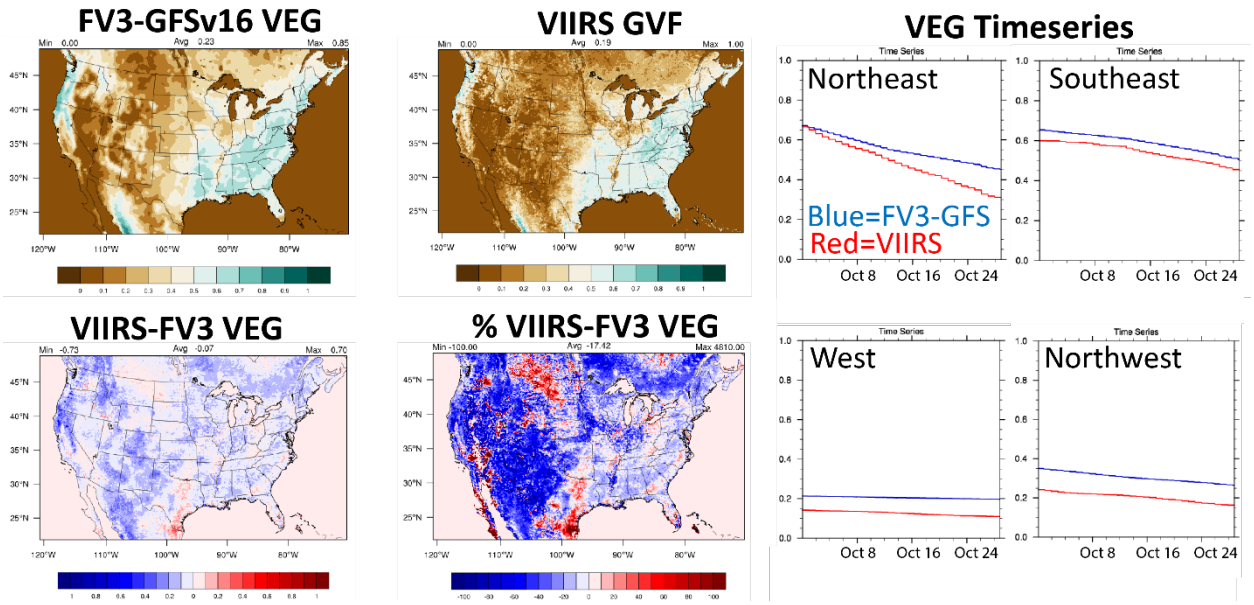
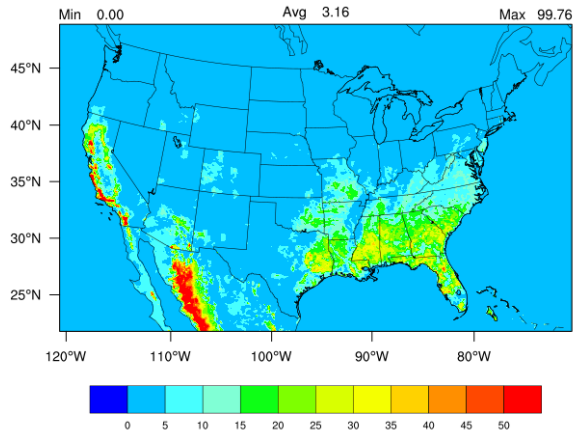
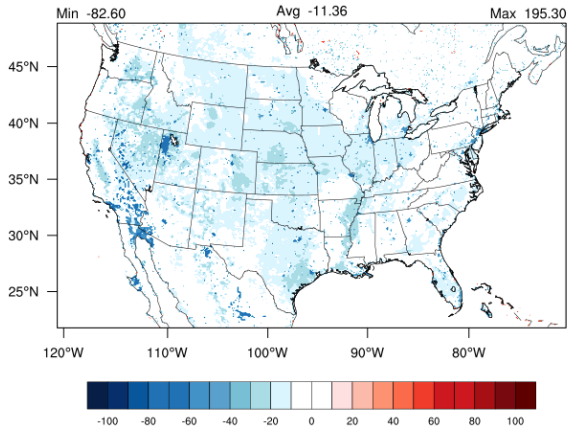


Figure S2. Same as in Figure S1, but for VEG fraction comparisons between GFSv16 and VIIRS average 8-day product.

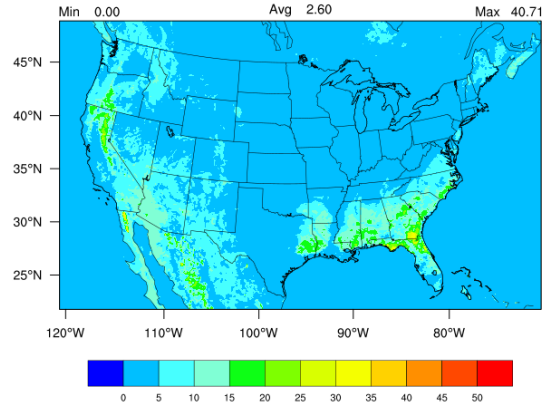
Isoprene Emissions (g/s)



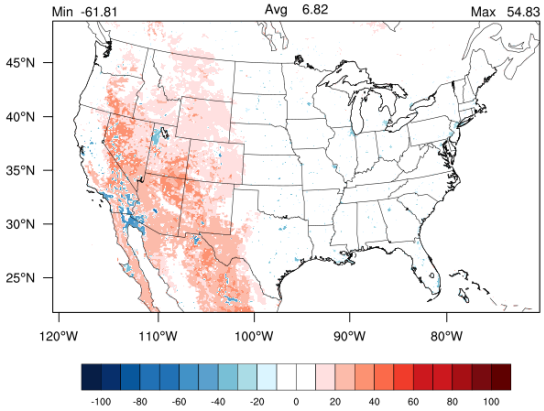
Isoprene Emissions Relative Change (%)



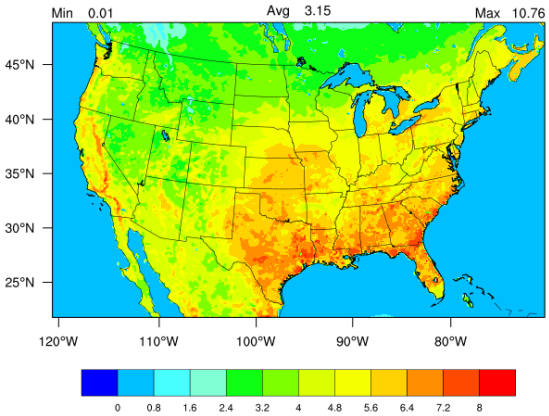
Terpene Emissions (g/s)



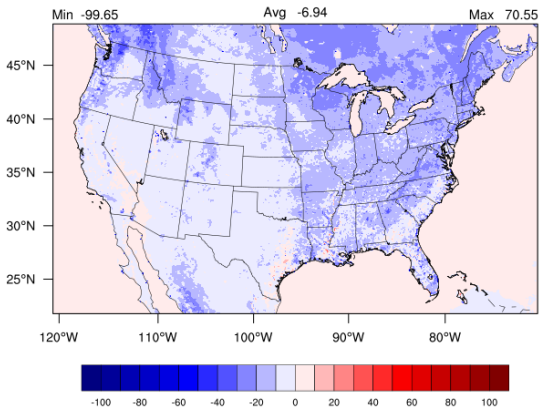
Terpene Emissions Relative Change (%)



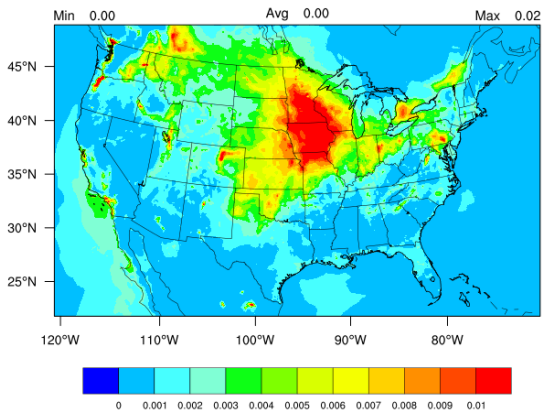
Ozone Dry Deposition (g/ha)



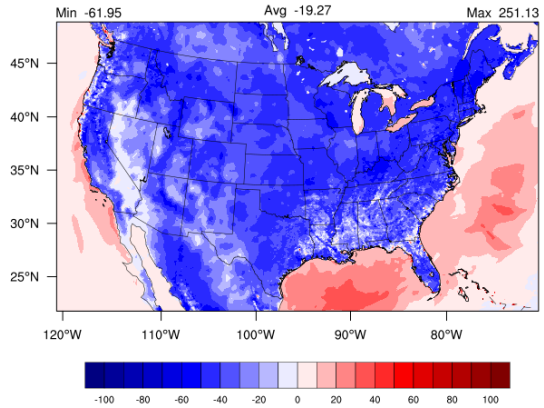
Ozone Dry Deposition Relative Change (%)



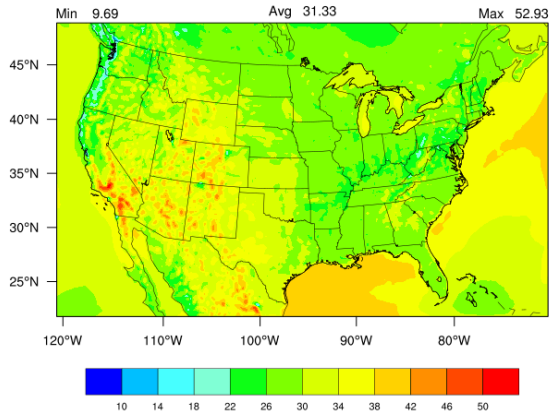
PM2.5 Ammonium Dry Deposition (g/ha)



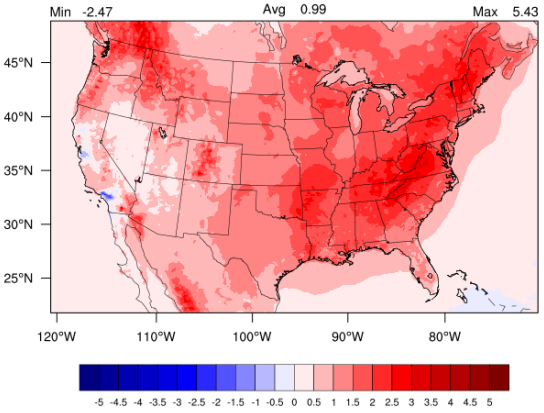
PM2.5 Ammonium Dry Deposition Change (%)



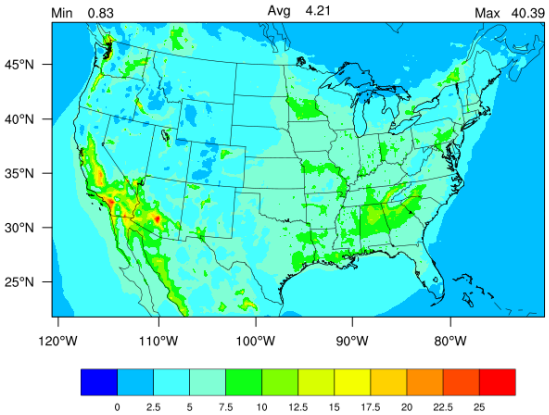
Ozone Concentration (ppb)



Ozone Concentration Change (%)



Total PM2.5 Concentration (ug/m^3)



Total PM2.5 Concentration Change (%)

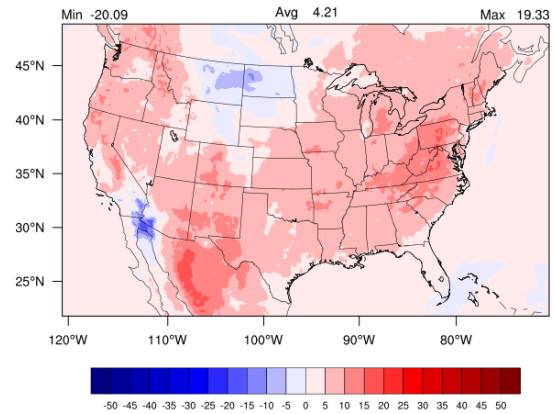


Figure S3. Spatial comparison plots of average October 2020 NACC-CMAQ simulation tests with an LAI=4 (left) and relative difference plots (right) with inclusion of VIIRS rapid-refresh (8-day product) of LAI and GVF for isoprene emissions (row 1), terpene emissions (row 2), ozone dry deposition (row 3), fine particulate ($PM_{2.5}$) ammonium dry deposition (row 4), ozone concentration (row 5), and total $PM_{2.5}$ concentration.

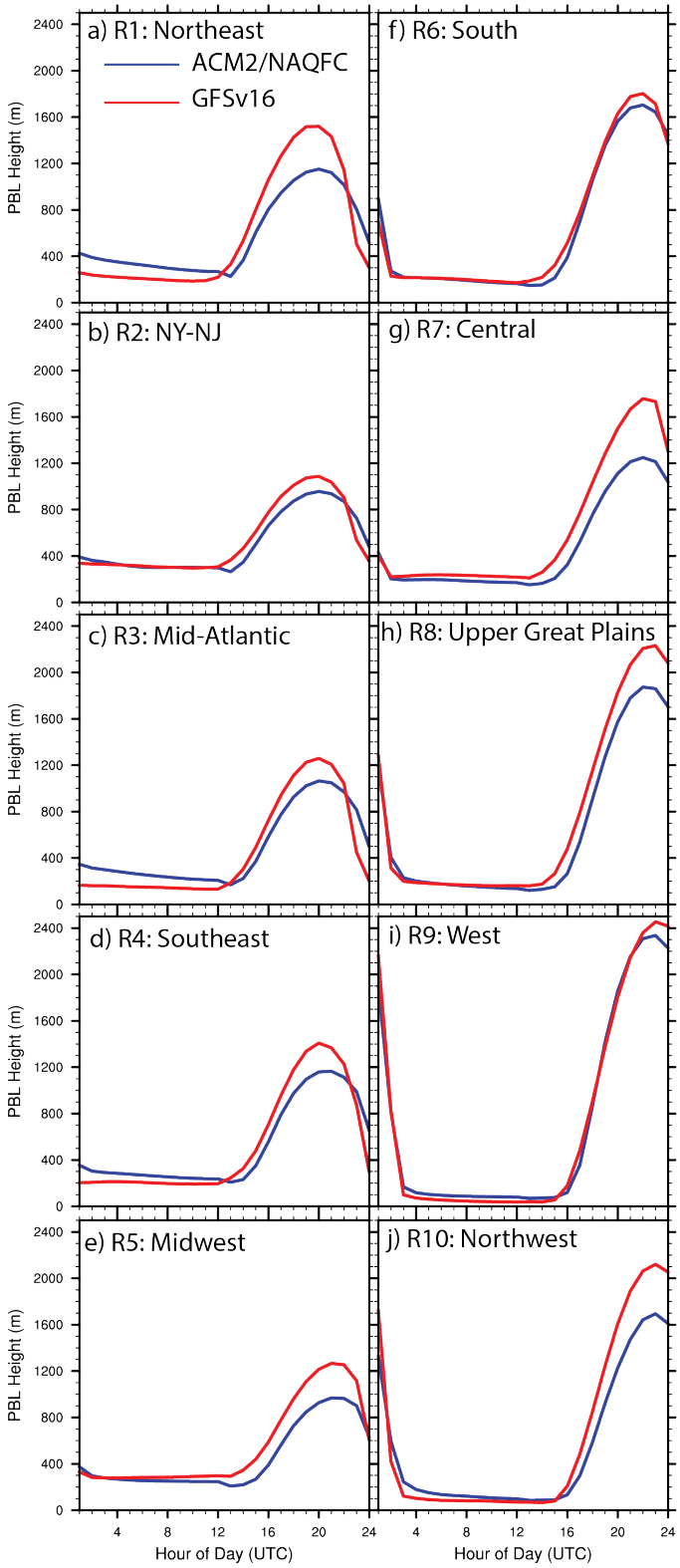


Figure S4. Average September 2020 regional diurnal patterns of PBLH (m) for ACM2/NAQFC (blue) and GFSv16 (red) over the CONUS. The regions are based on https://www.epa.gov/aboutepa/regional-and-geographic-offices.

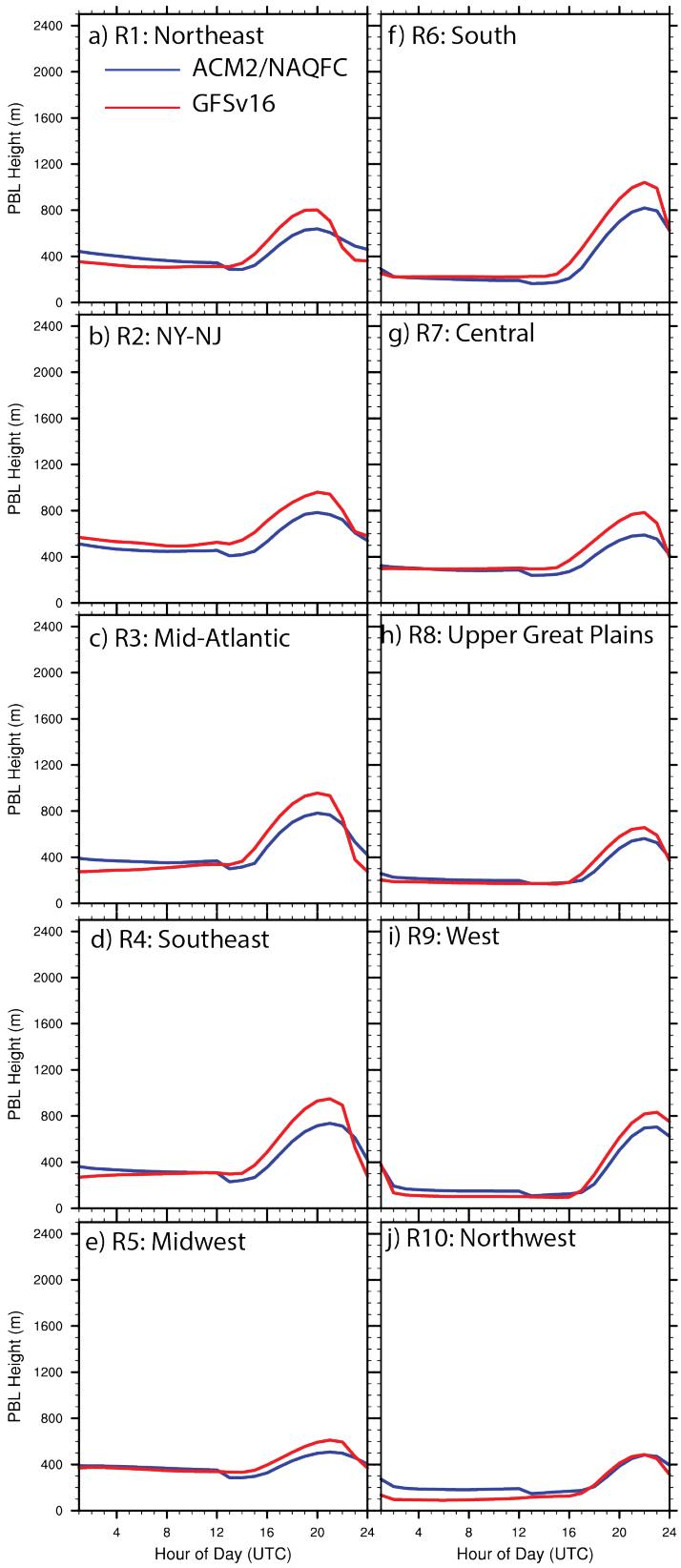


Figure S5. Same as Figure S4, but for January 2021.

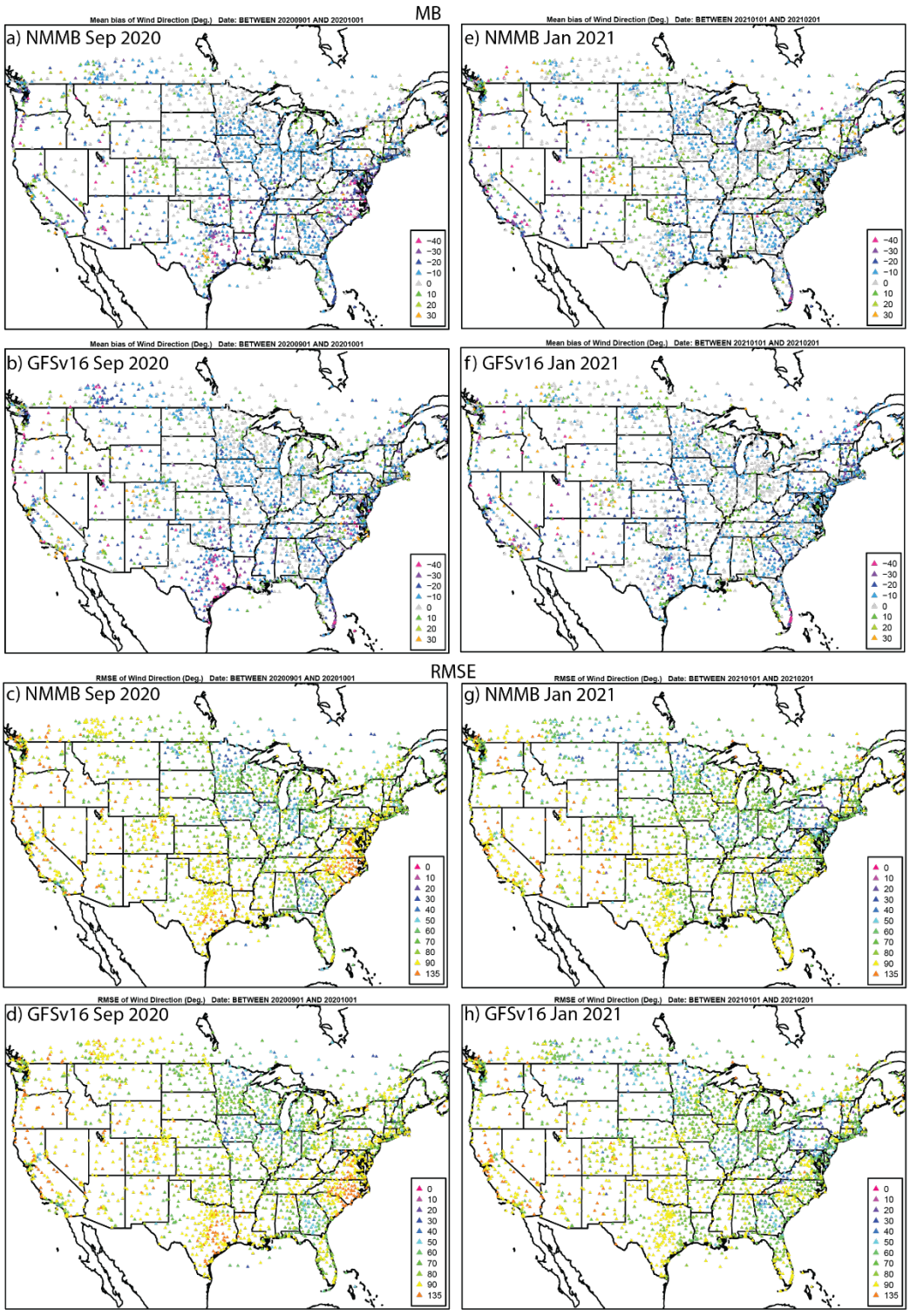
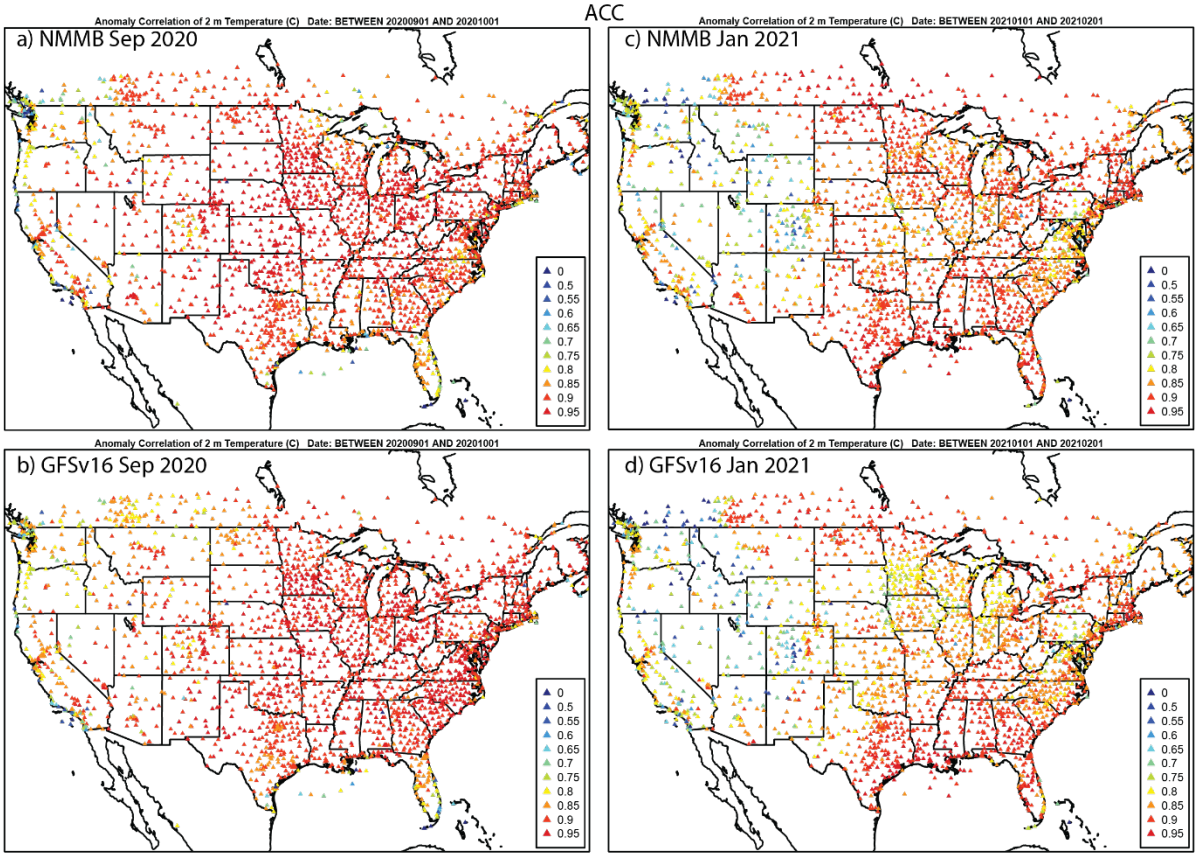
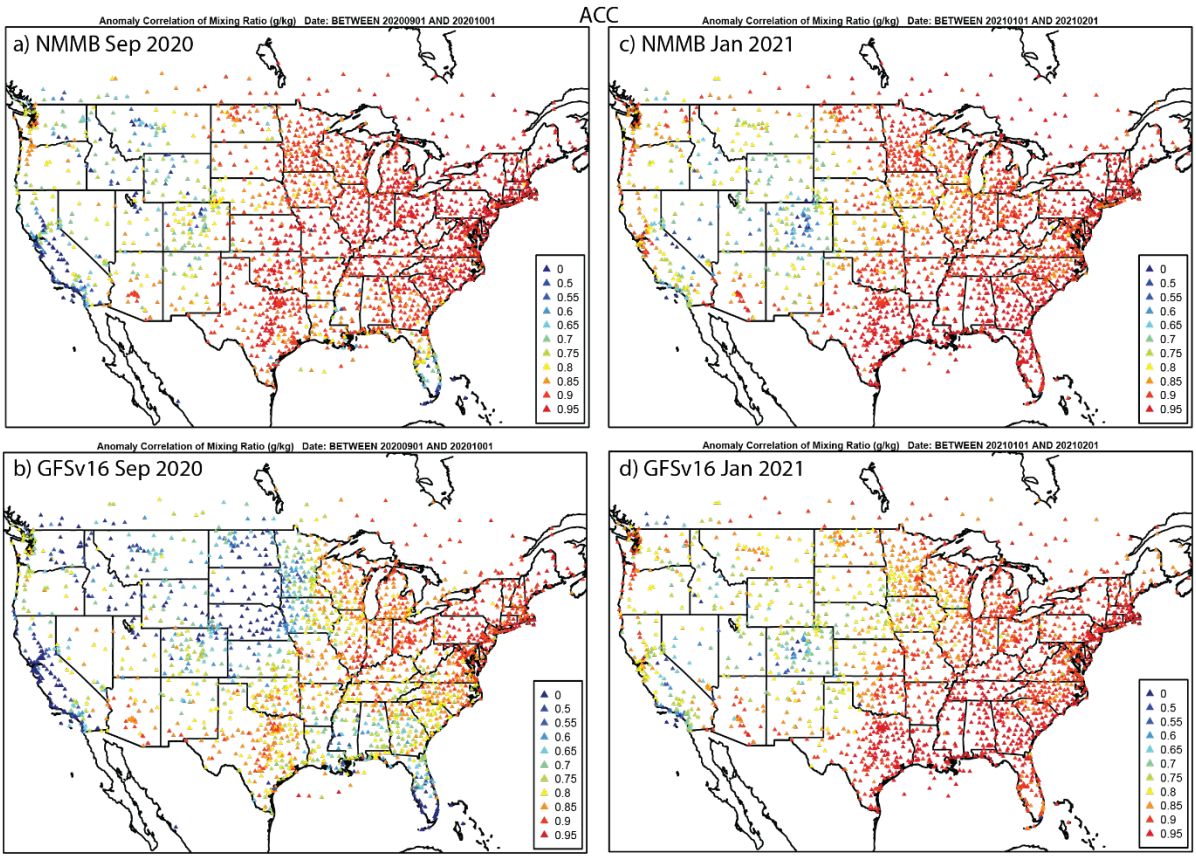


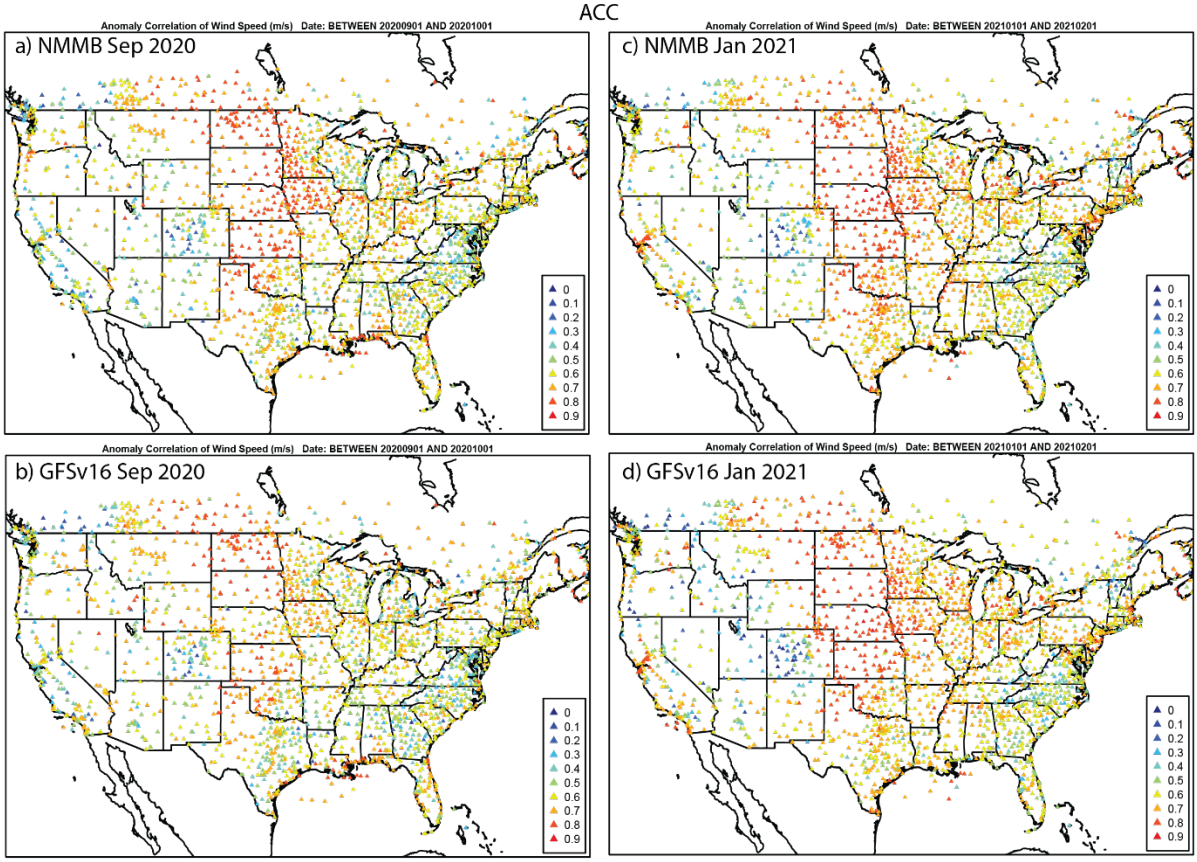
Figure S6. Average day 1 (0-24 hr) forecasted WDIR10 MB (degrees) and RMSE (degrees) for NMMB and GFSv16 during a)-d) September 2020 and e)-h) January 2021 compared to METAR-MADIS observations.

ACC

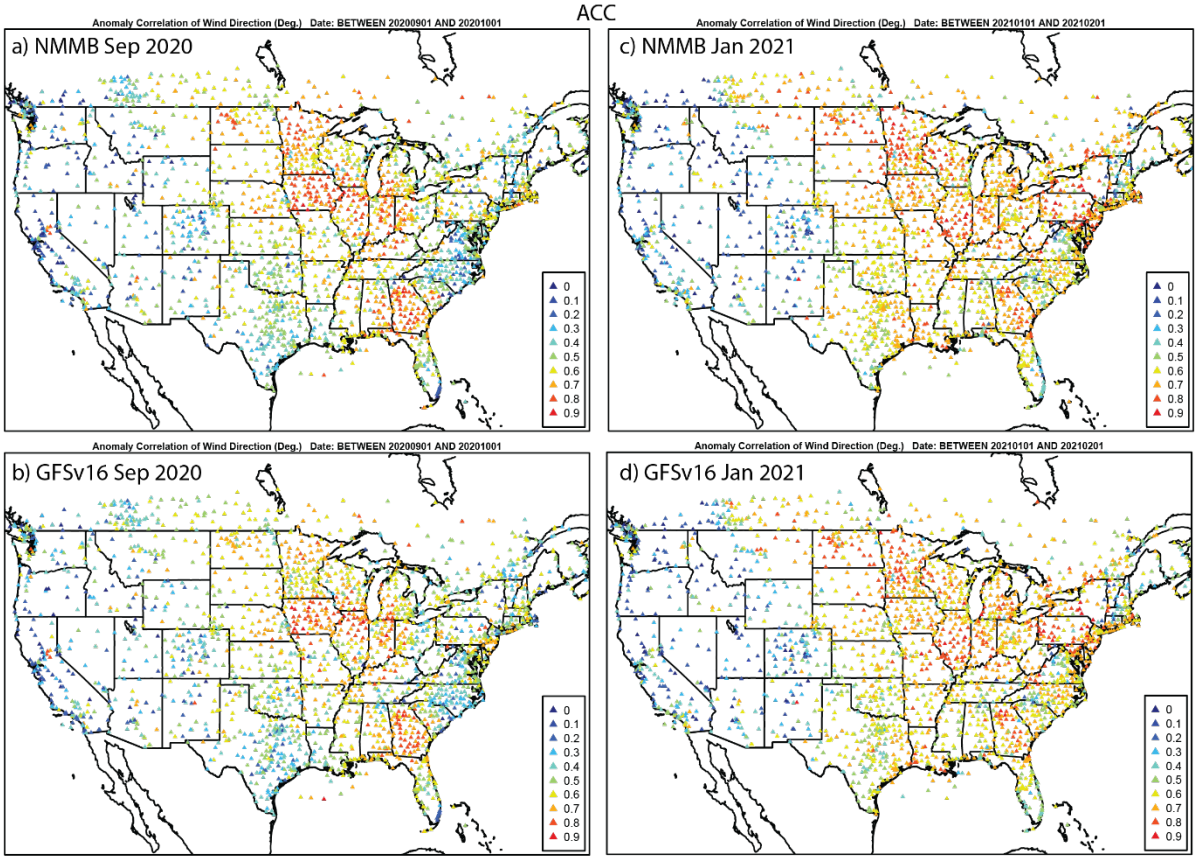

Anomaly Correlation of 2 m Temperature (C) Date: BETWEEN 20200901 AND 20201001
a) NMMB Sep 2020
Anomaly Correlation of 2 m Temperature (C) Date: BETWEEN 20210101 AND 20210201
c) NMMB Jan 2021
Anomaly Correlation of 2 m Temperature (C) Date: BETWEEN 20200901 AND 20201001
b) GFSv16 Sep 2020
Anomaly Correlation of 2 m Temperature (C) Date: BETWEEN 20210101 AND 20210201
d) GFSv16 Jan 2021
0
0.5
0.55
0.6
0.65
0.7
0.75
0.8
0.85
0.9
0.95


ACC
Anomaly Correlation of Mixing Ratio (g/kg) Date: BETWEEN 20200901 AND 20201001
a) NMMB Sep 2020
Anomaly Correlation of Mixing Ratio (g/kg) Date: BETWEEN 20210101 AND 20210201
c) NMMB Jan 2021
Anomaly Correlation of Mixing Ratio (g/kg) Date: BETWEEN 20200901 AND 20201001
b) GFSv16 Sep 2020
Anomaly Correlation of Mixing Ratio (g/kg) Date: BETWEEN 20210101 AND 20210201
d) GFSv16 Jan 2021
0
0.5
0.55
0.6
0.65
0.7
0.75
0.8
0.85
0.9
0.95

ACC


Anomaly Correlation of Wind Speed (m/s) Date: BETWEEN 20200901 AND 20201001
a) NMMB Sep 2020
Anomaly Correlation of Wind Speed (m/s) Date: BETWEEN 20210101 AND 20210201
c) NMMB Jan 2021
Anomaly Correlation of Wind Speed (m/s) Date: BETWEEN 20200901 AND 20201001
b) GFSv16 Sep 2020
Anomaly Correlation of Wind Speed (m/s) Date: BETWEEN 20210101 AND 20210201
d) GFSv16 Jan 2021
0
0.1
0.2
0.3
0.4
0.5
0.6
0.7
0.8
0.9

ACC


Anomaly Correlation of Wind Direction (Deg.) Date: BETWEEN 20200901 AND 20201001
a) NMMB Sep 2020
Anomaly Correlation of Wind Direction (Deg.) Date: BETWEEN 20210101 AND 20210201
c) NMMB Jan 2021
Anomaly Correlation of Wind Direction (Deg.) Date: BETWEEN 20200901 AND 20201001
b) GFSv16 Sep 2020
Anomaly Correlation of Wind Direction (Deg.) Date: BETWEEN 20210101 AND 20210201
d) GFSv16 Jan 2021
0
0.1
0.2
0.3
0.4
0.5
0.6
0.7
0.8
0.9

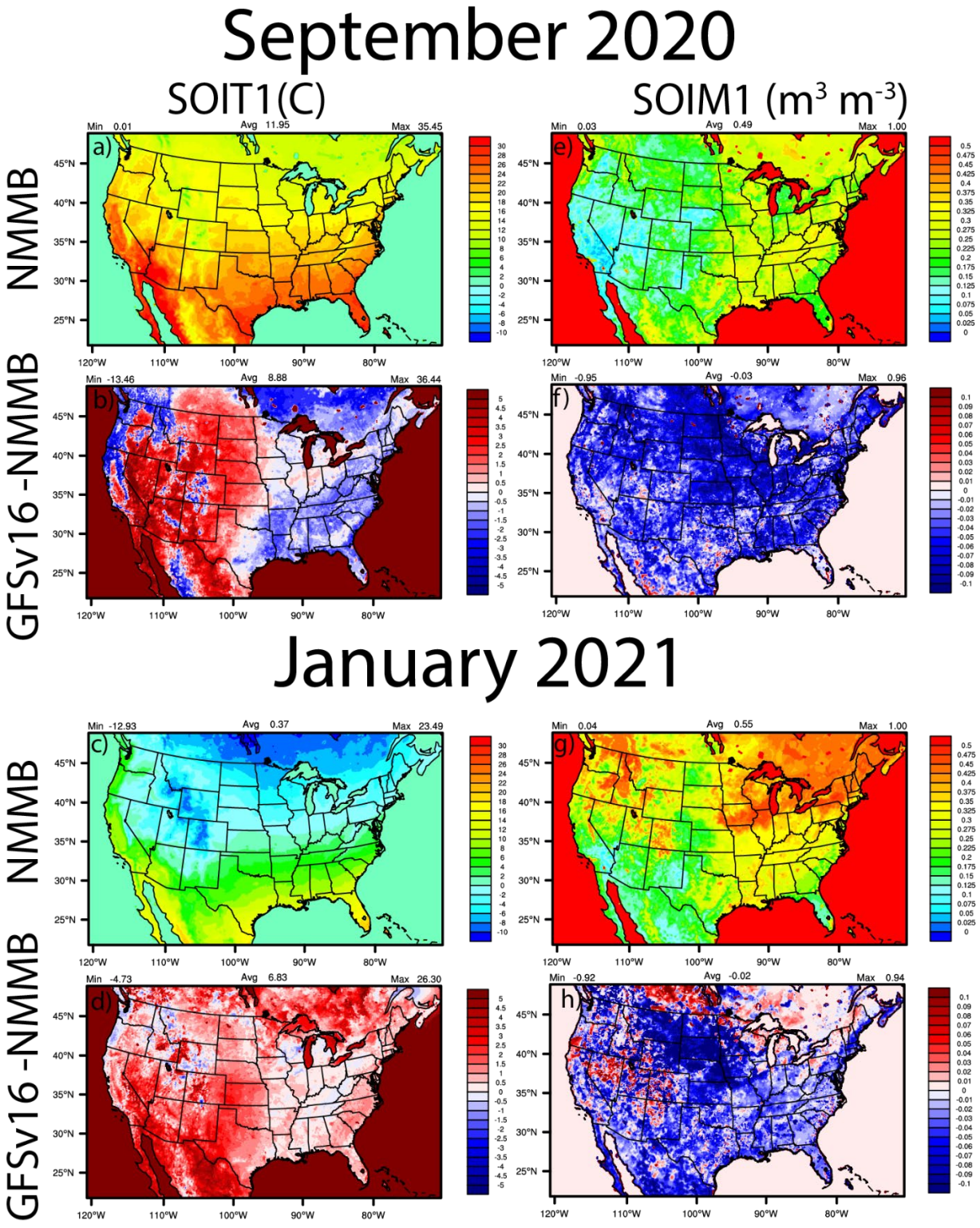


Figure S11. September 2020 and January 2021 spatial average plots for NMMB, and the absolute differences for GFSv16 - NMMB for the top layer soil temperature (SOIT1) and soil moisture (SOIM1).

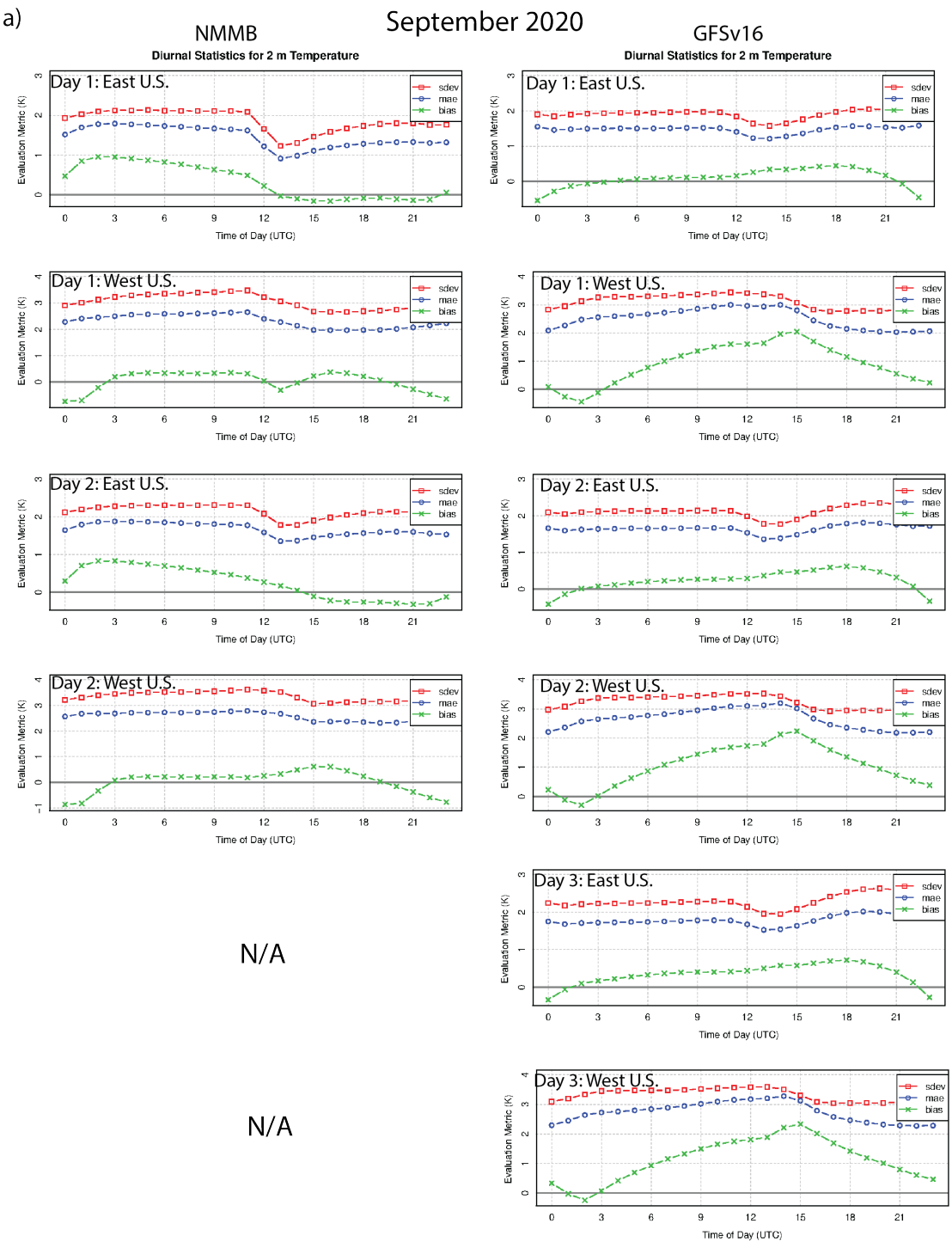


Figure S12a. September 2020 average diurnal TEMP2 statistics (red = standard deviation; blue = mean absolute error; green = bias) for day 1, 2, and 3 (GFSv16) forecasts in the east (< 100° W) and west CONUS (> 100° W).

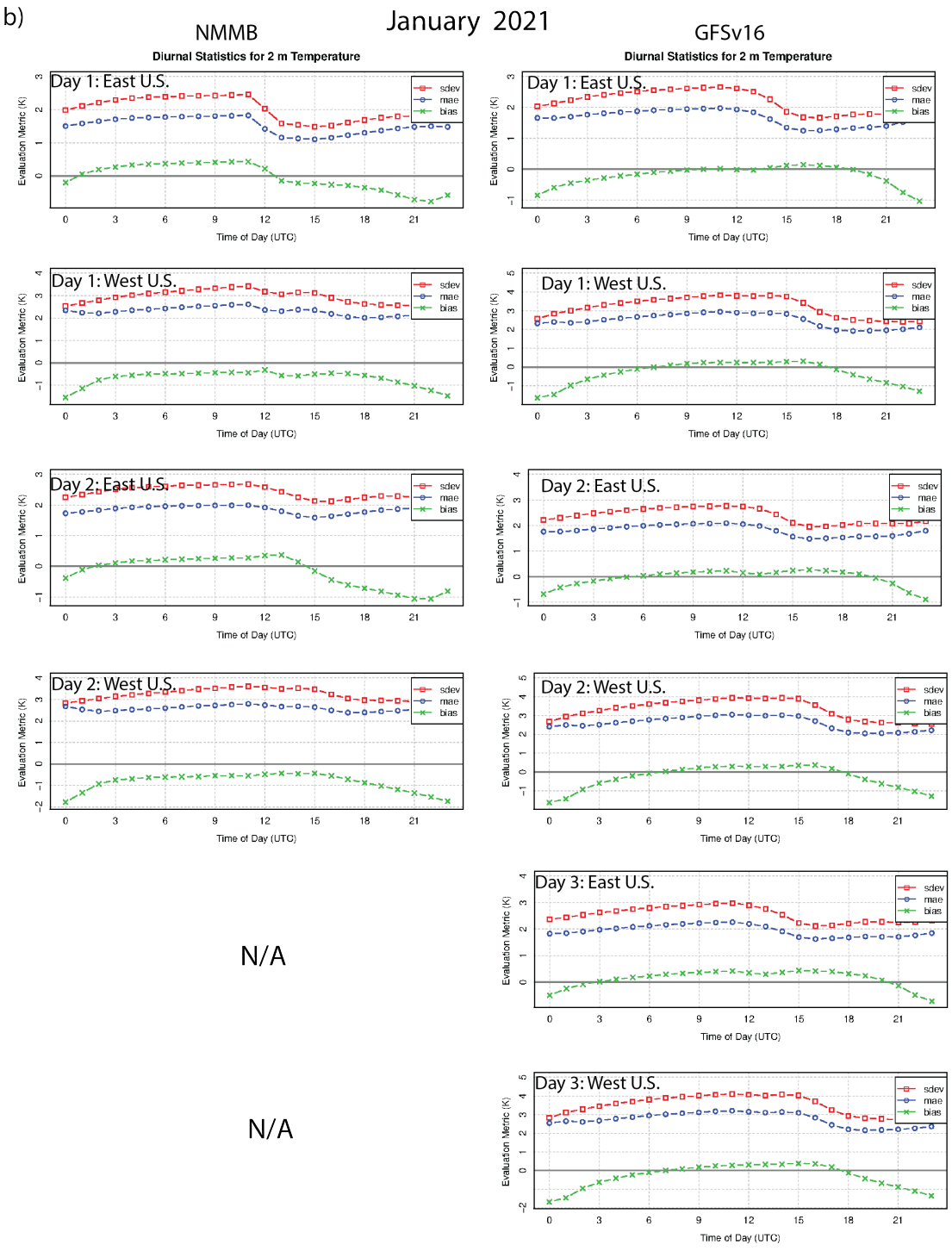


Figure S12b. Same as in Figure S12a, but for January 2021.

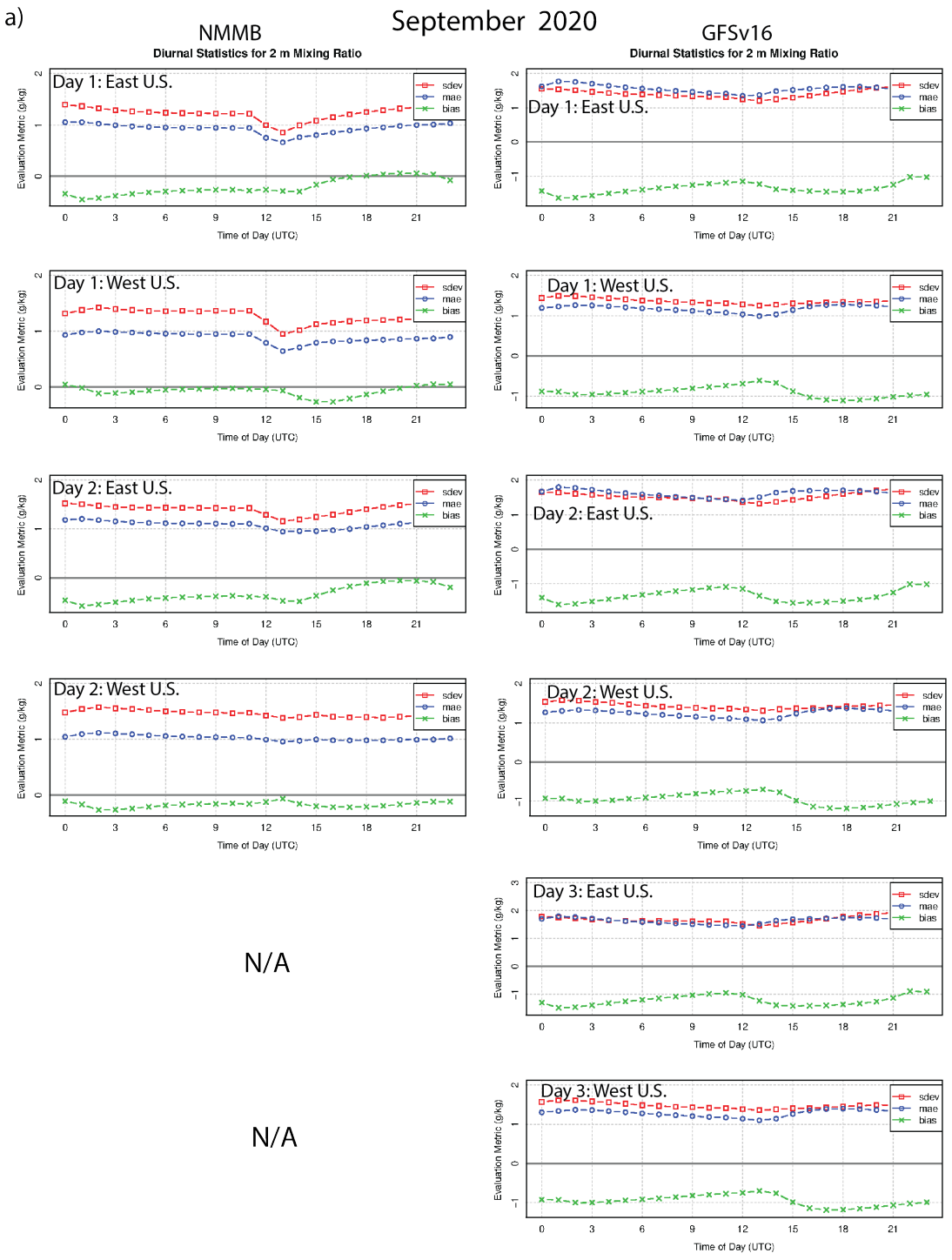


Figure S13a. September 2020 average diurnal Q2 statistics (red = standard deviation; blue = mean absolute error; green = bias) for day 1, 2, and 3 (GFSv16) forecasts in the east (< 100° W) and west CONUS (> 100° W).

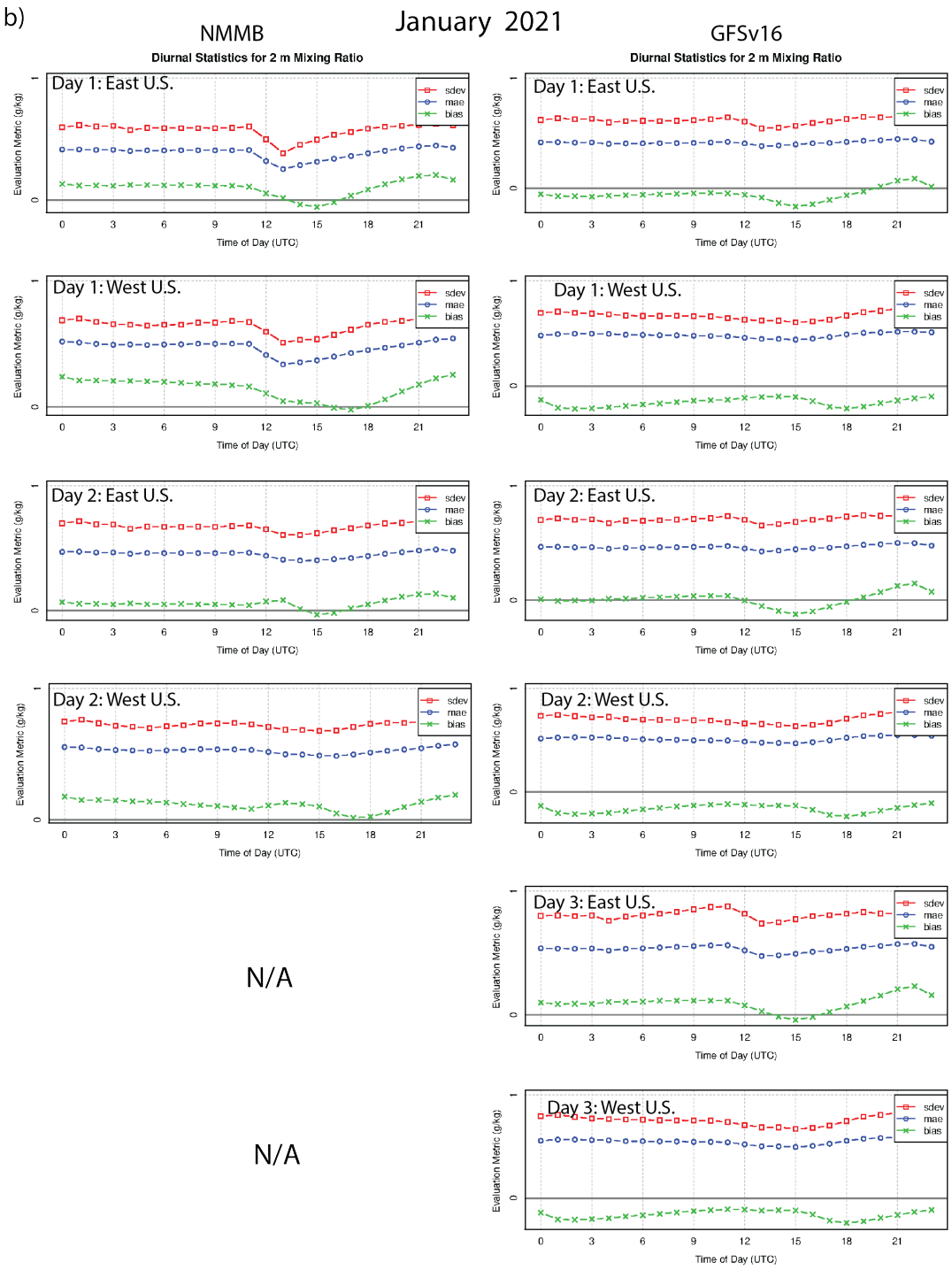


Figure S13b. Same as in Figure S13a, but for January 2021.

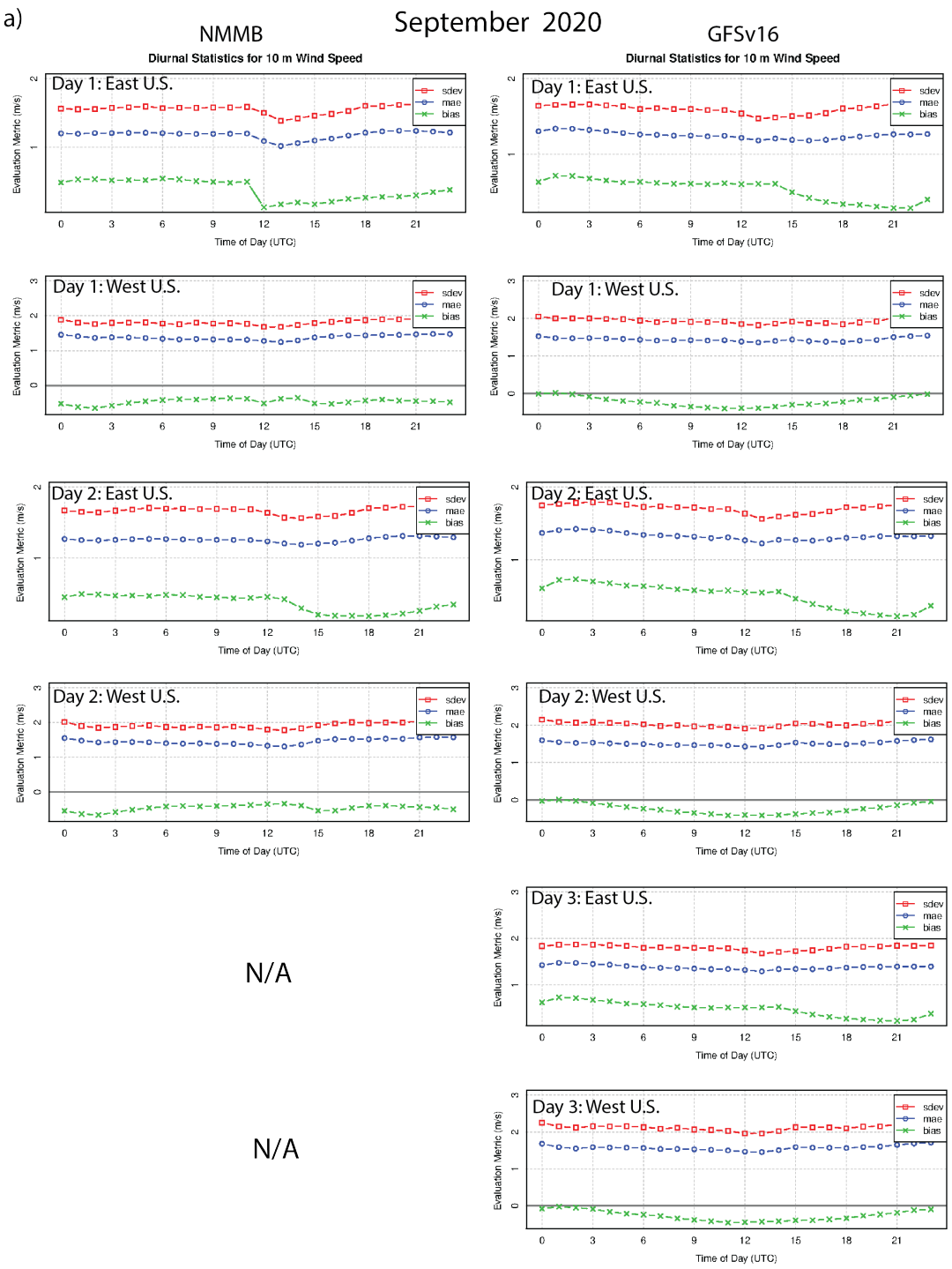


Figure S14a. September 2020 average diurnal WSPD10 statistics (red = standard deviation; blue = mean absolute error; green = bias) for day 1, 2, and 3 (GFSv16) forecasts in the east (< 100° W) and west CONUS (> 100° W).

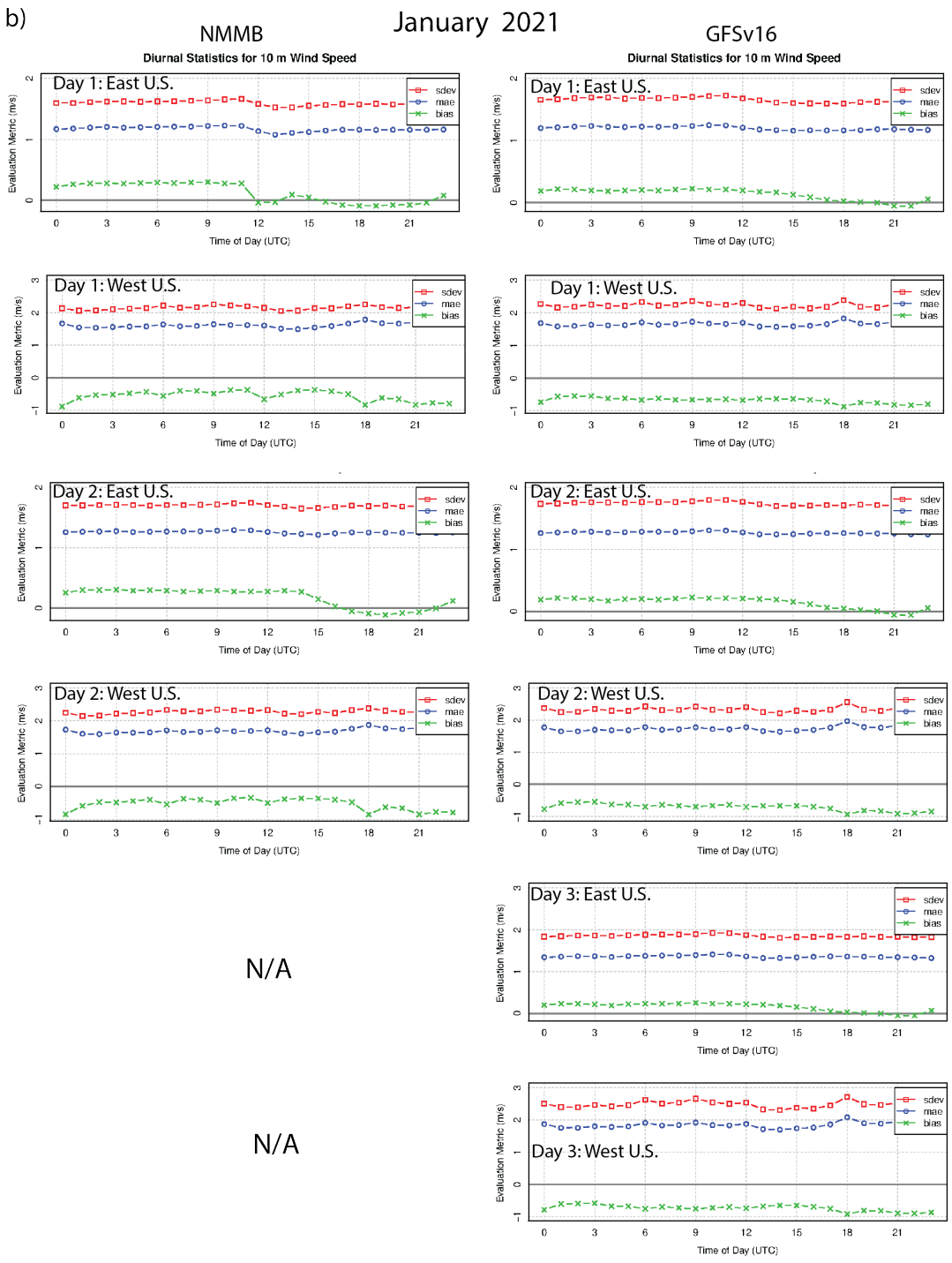
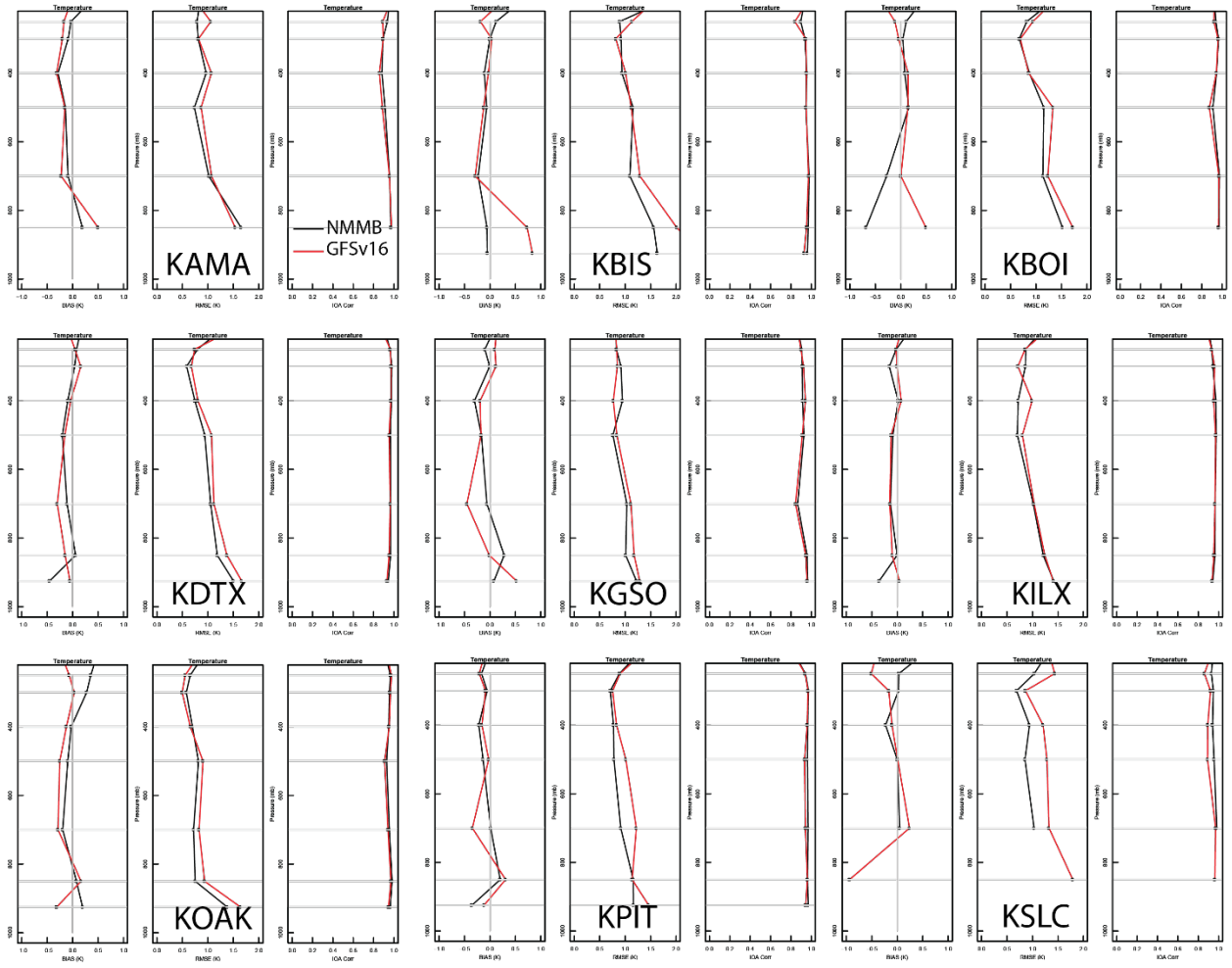
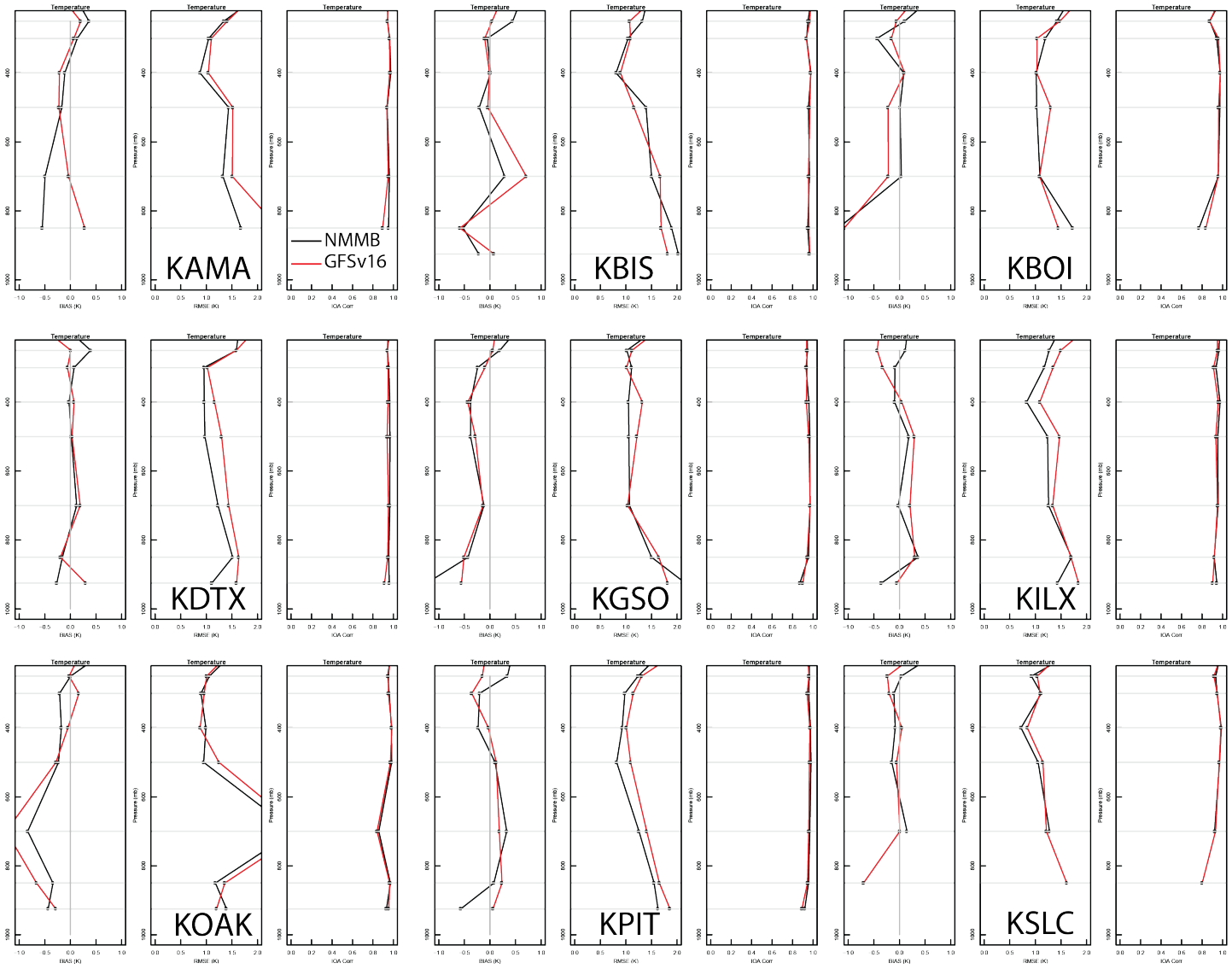
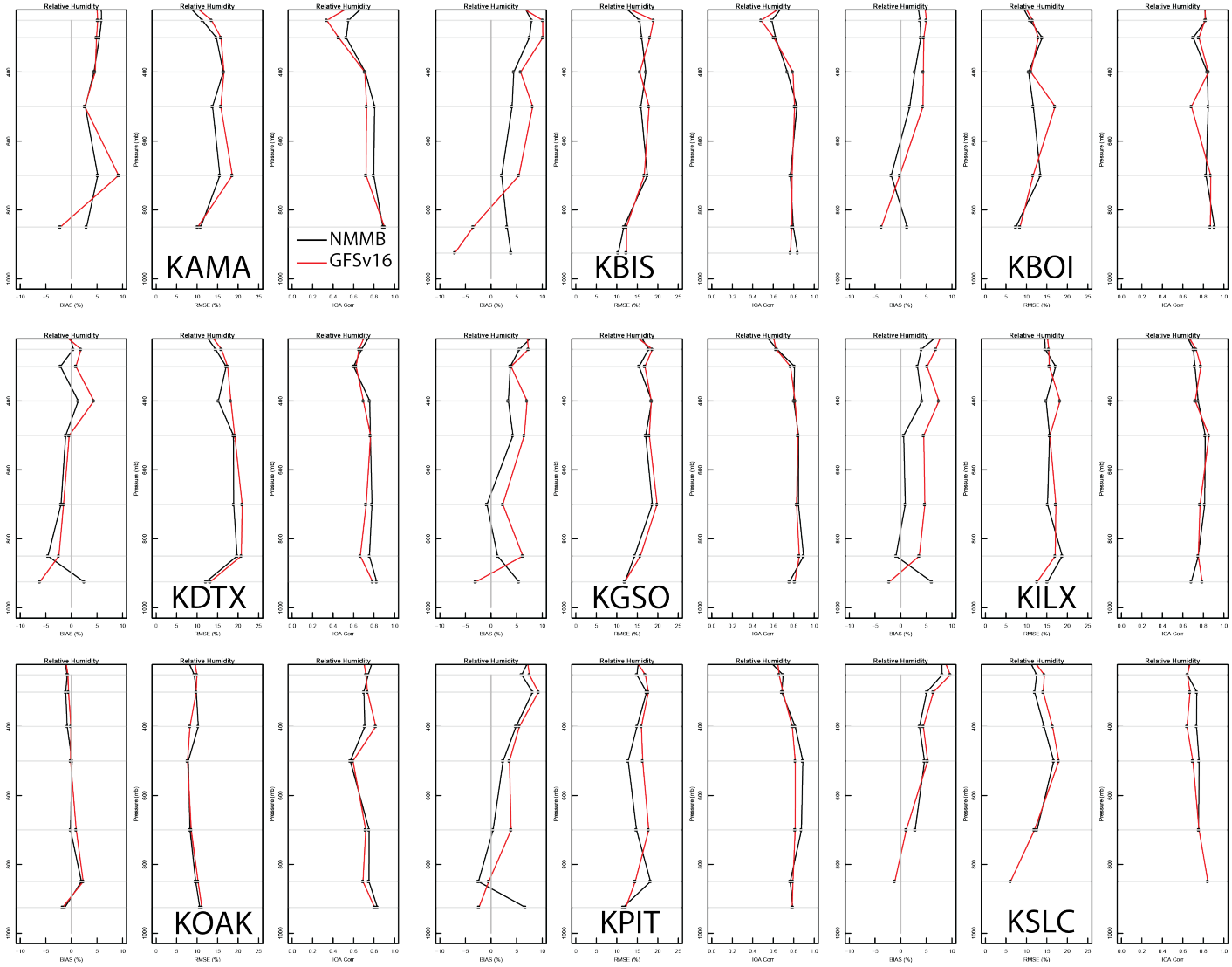
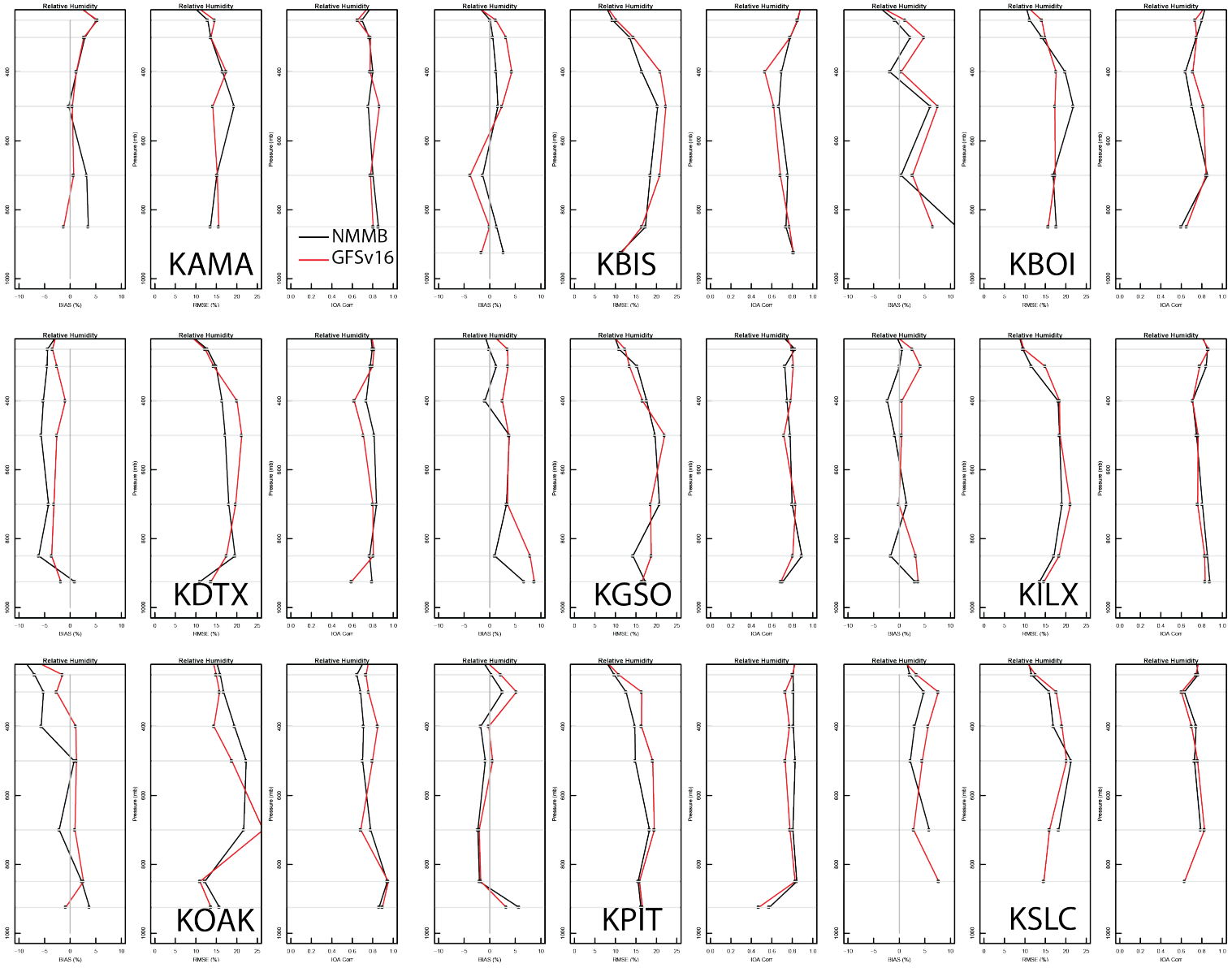


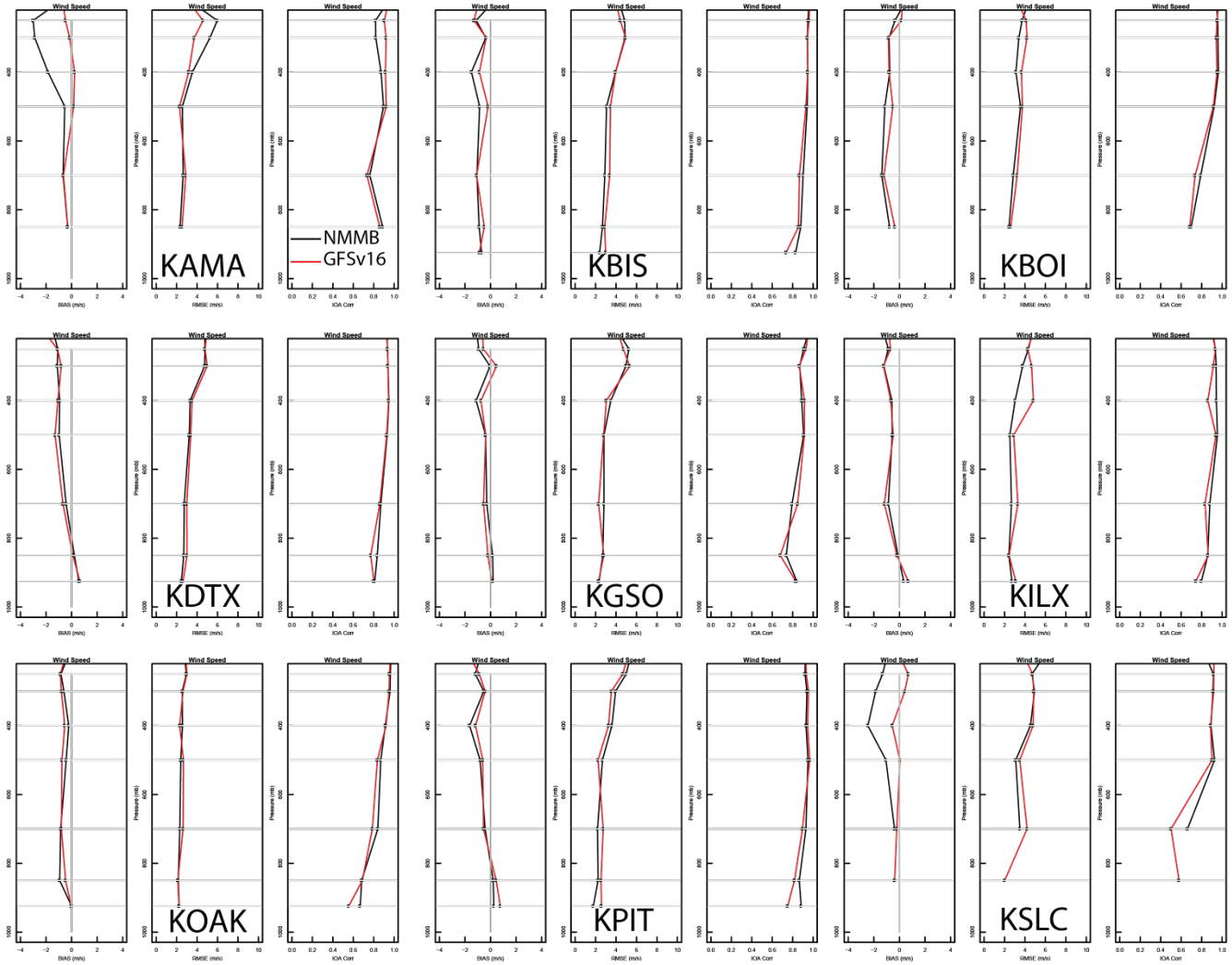
Figure S14b. Same as in Figure S14a, but for January 2021.

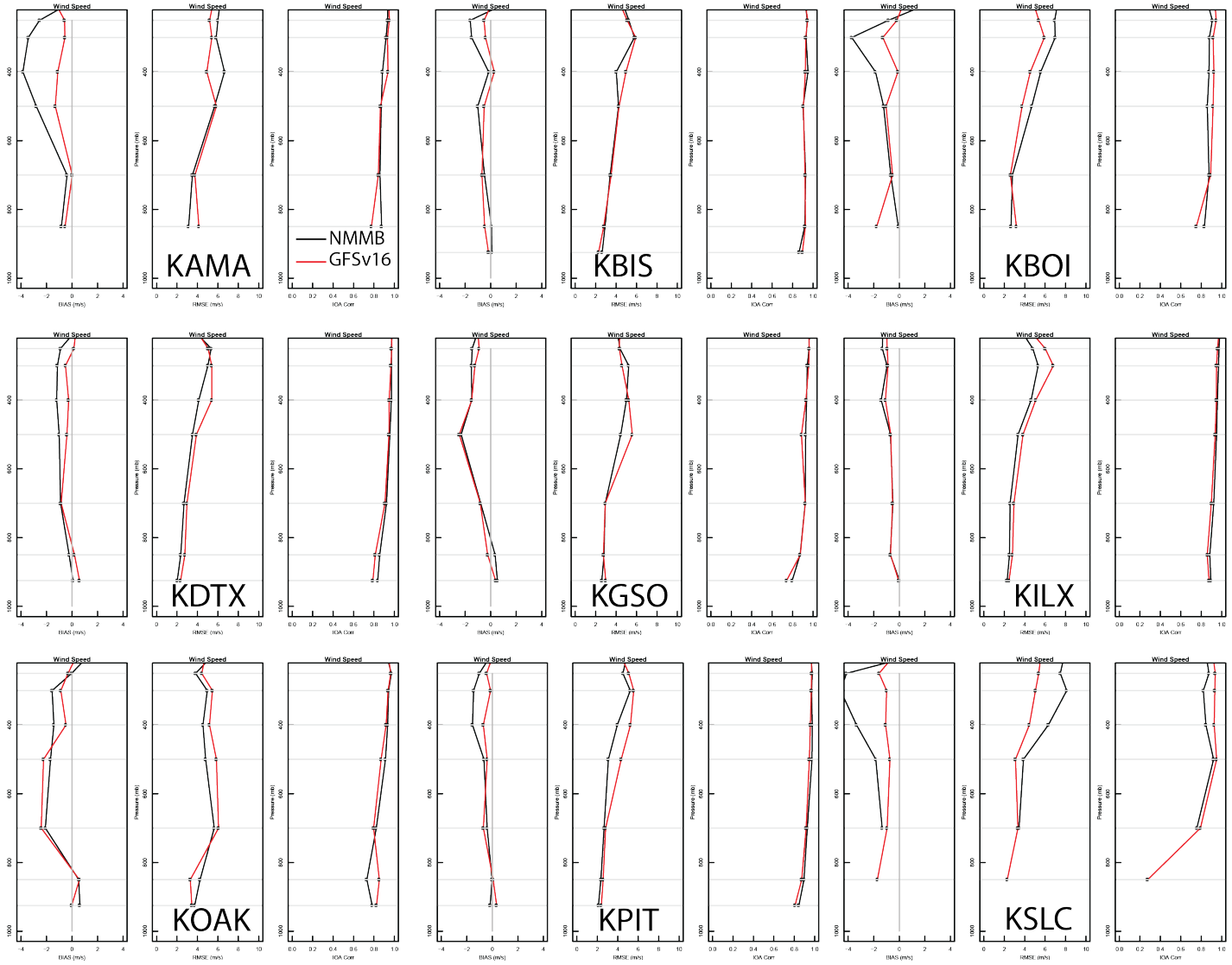

Temperature
NMMB
GFSv16
KAMA
KBIS
KBOI
KDTX
KGSO
KILX
KOAK
KPIT
KSLC


Temperature
KAMA
KBIS
KBOI
KDTX
KGSO
KILX
KOAK
KPIT
KSLC
NMMB
GFSv16
Pressure (mb)
BIAS (K)
RMSE (K)
COR Corr


Relative Humidity
KAMA
KBIS
KBOI
KDTX
KGSO
KILX
KOAK
KPIT
KSLC
NMMB
GFSv16
Pressure (mb)
BIAS (%)
RMSE (%)
IOA Corr

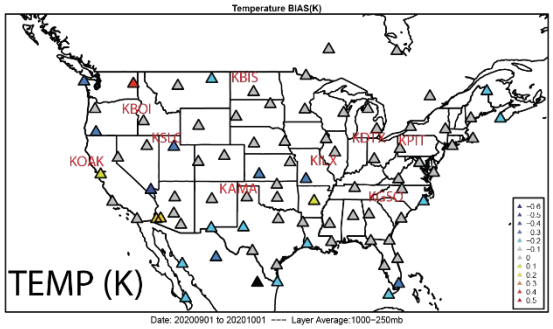

Relative Humidity
KAMA
KBIS
KBOI
KDTX
KGSO
KILX
KOAK
KPIT
KSLC
NMMB
GFSv16
Pressure (mb)
BIAS (%)
RMSE (%)
IOA Corr

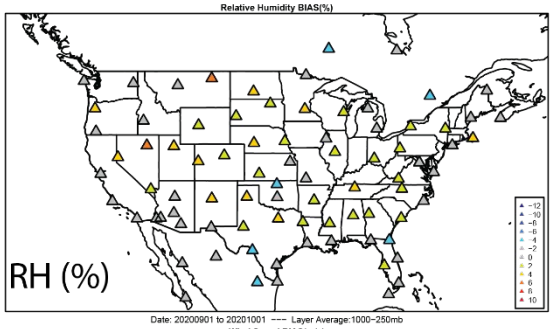

Wind Speed
KAMA
KBIS
KBOI
KDTX
KGSO
KILX
KOAK
KPIT
KSLC
NMMB
GFSv16
BIAS (m/s)
RMSE (m/s)
IOA Corr
Pressure (mb)

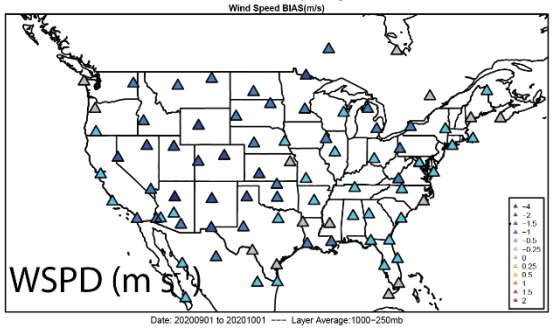

Wind Speed
KAMA
KBIS
KBOI
KDTX
KGSO
KILX
KOAK
KPIT
KSLC
NMMB
GFSv16
Pressure (mb)
BIAS (m/s)
RMSE (m/s)
IOA Corr

September MB

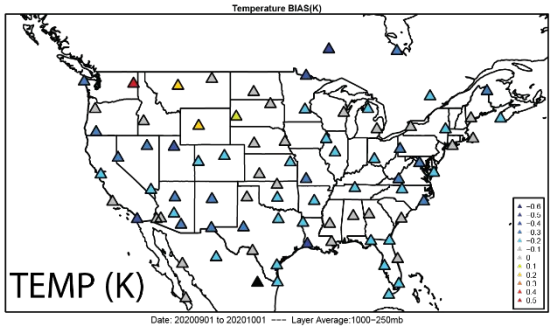
NMMB

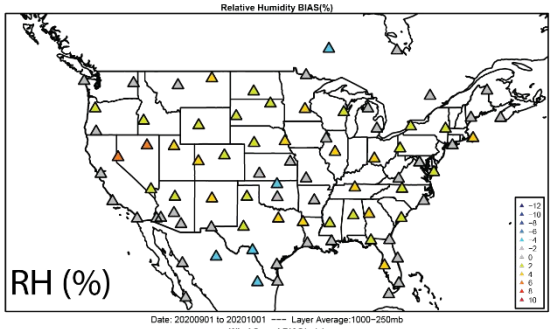


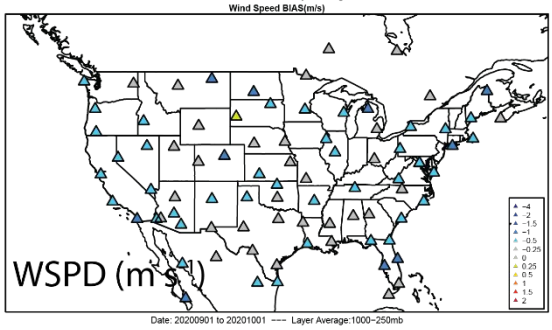




GFSv16

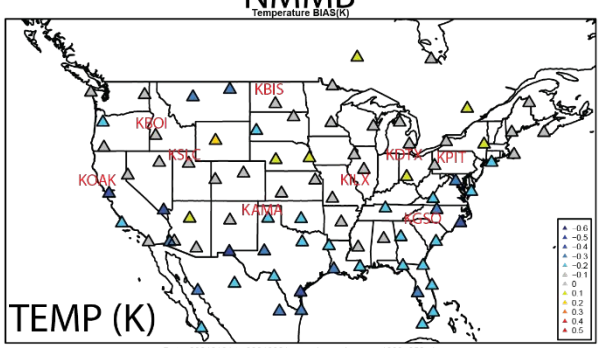


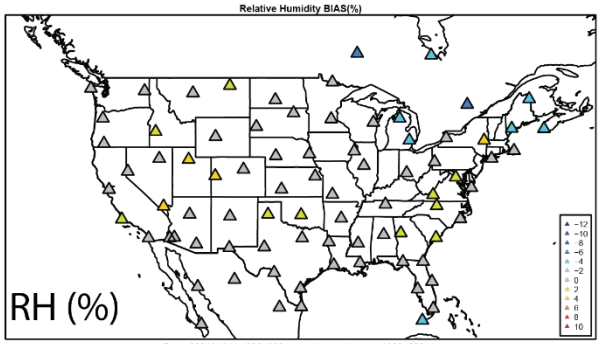


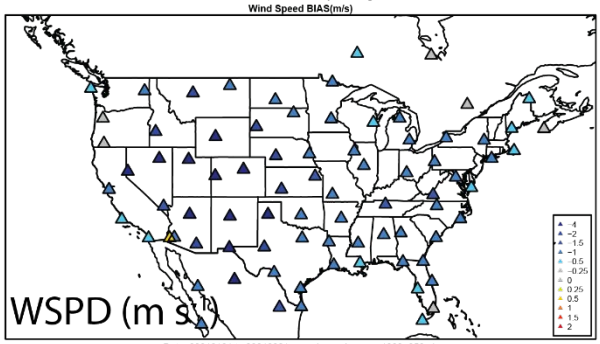


January MB

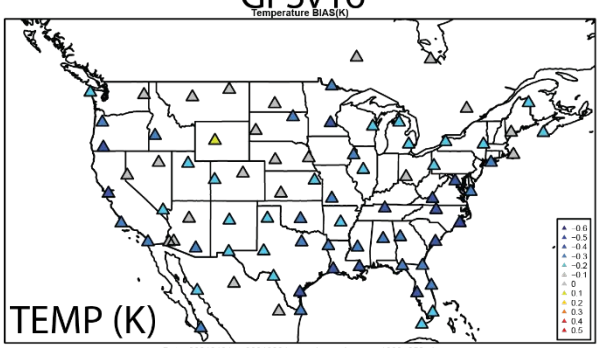
NMMB

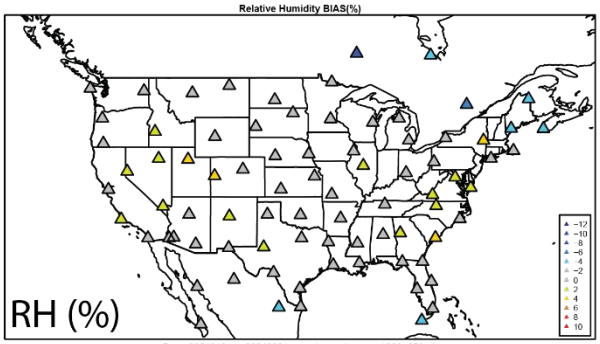


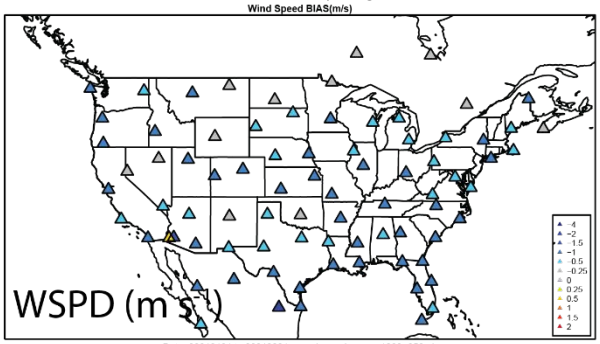




GFSv16

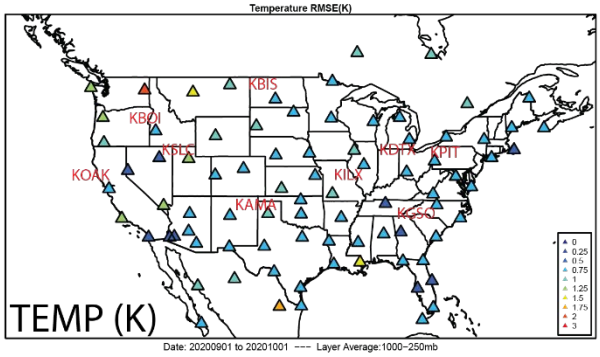




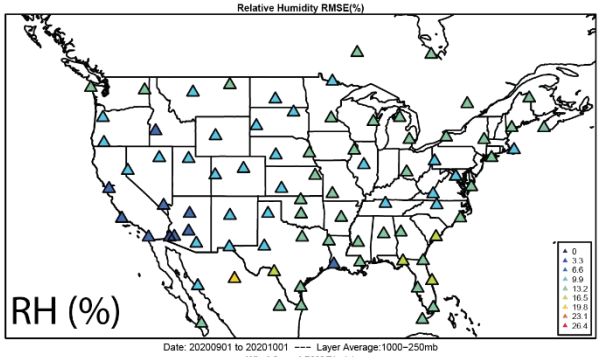


September RMSE

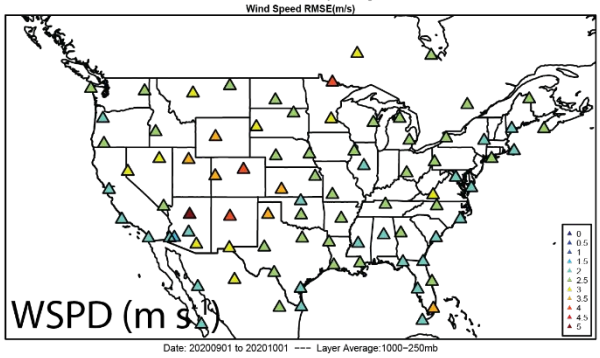
NMMB



Date: 20200901 to 20201001 --- Layer Average:1000–250mb

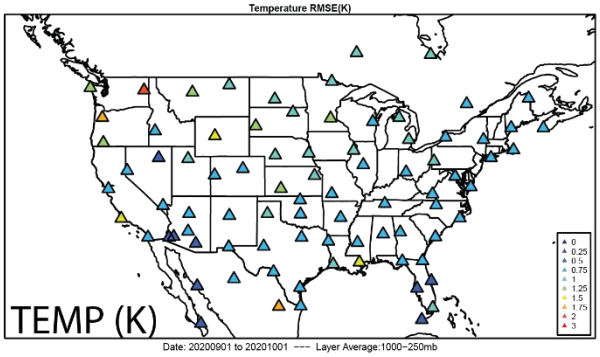


Date: 20200901 to 20201001 --- Layer Average:1000–250mb

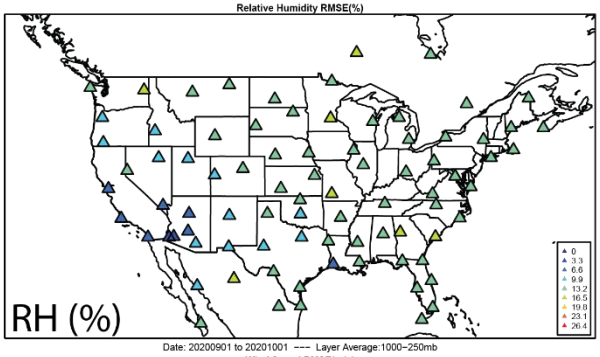


Date: 20200901 to 20201001 --- Layer Average:1000–250mb

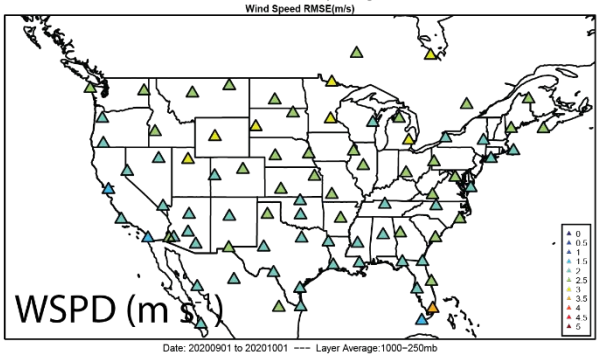
GFSv16



Date: 20200901 to 20201001 --- Layer Average:1000–250mb



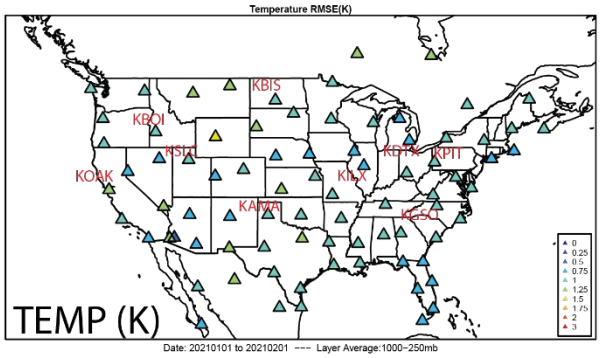
Date: 20200901 to 20201001 --- Layer Average:1000–250mb

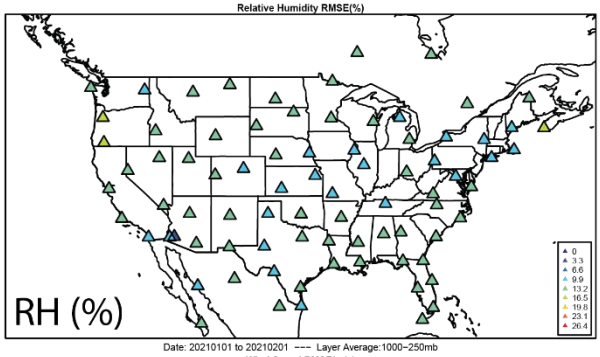


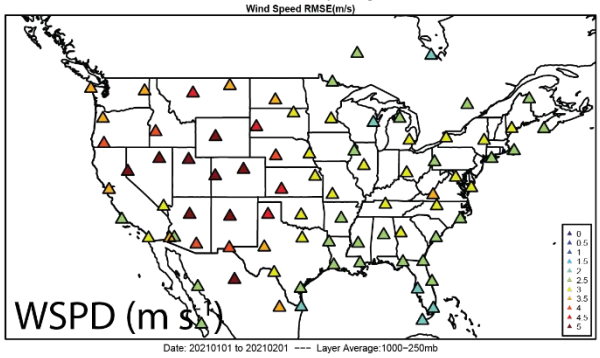
Date: 20200901 to 20201001 --- Layer Average:1000–250mb

January RMSE

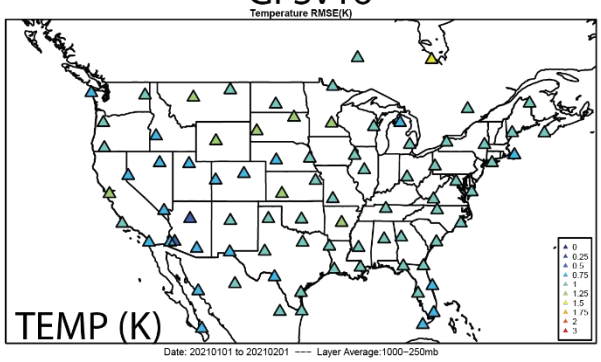
NMMB

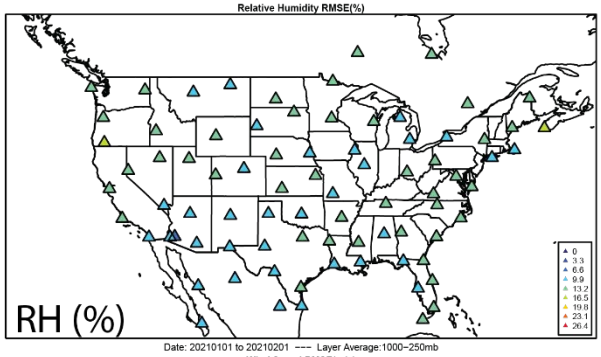


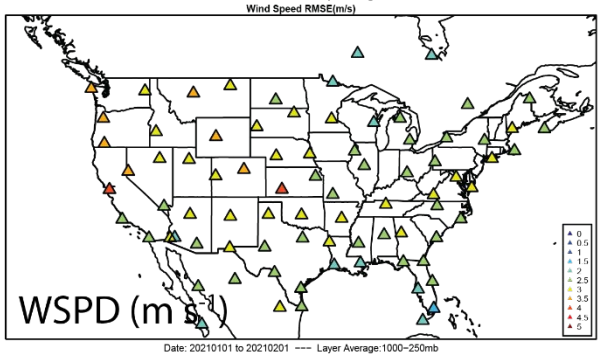


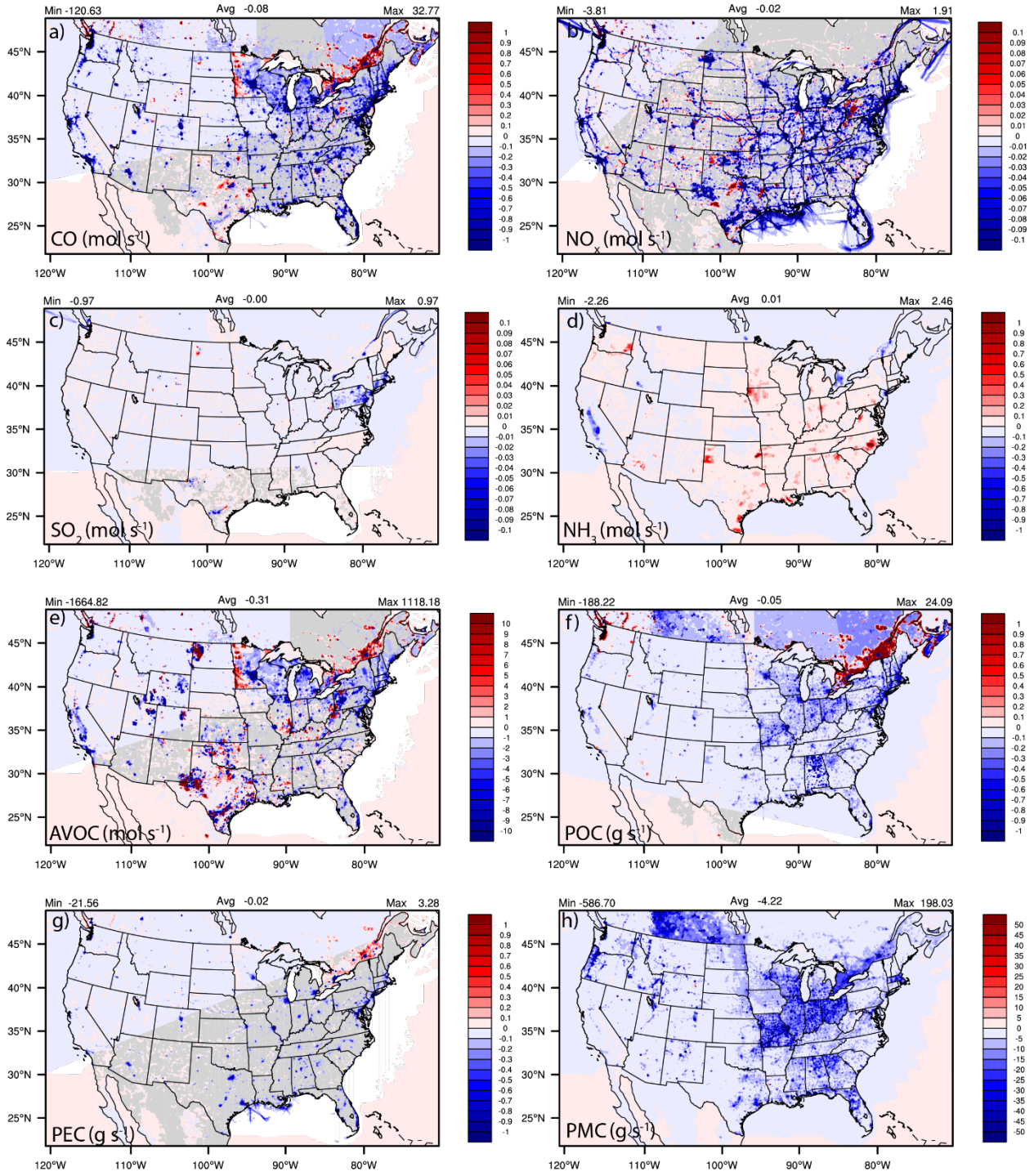


GFSv16








a)
Min -120.63
Avg -0.08
Max 32.77
CO (mol s-1)
b)
Min -3.81
Avg -0.02
Max 1.91
NOx (mol s-1)
c)
Min -0.97
Avg -0.00
Max 0.97
SO2 (mol s-1)
d)
Min -2.26
Avg 0.01
Max 2.46
NH3 (mol s-1)
e)
Min -1664.82
Avg -0.31
Max 1118.18
AVOC (mol s-1)
f)
Min -188.22
Avg -0.05
Max 24.09
POC (g s-1)
g)
Min -21.56
Avg -0.02
Max 3.28
PEC (g s-1)
h)
Min -586.70
Avg -4.22
Max 198.03
PMC (g s-1)
45°N
40°N
35°N
30°N
25°N
120°W
110°W
100°W
90°W
80°W

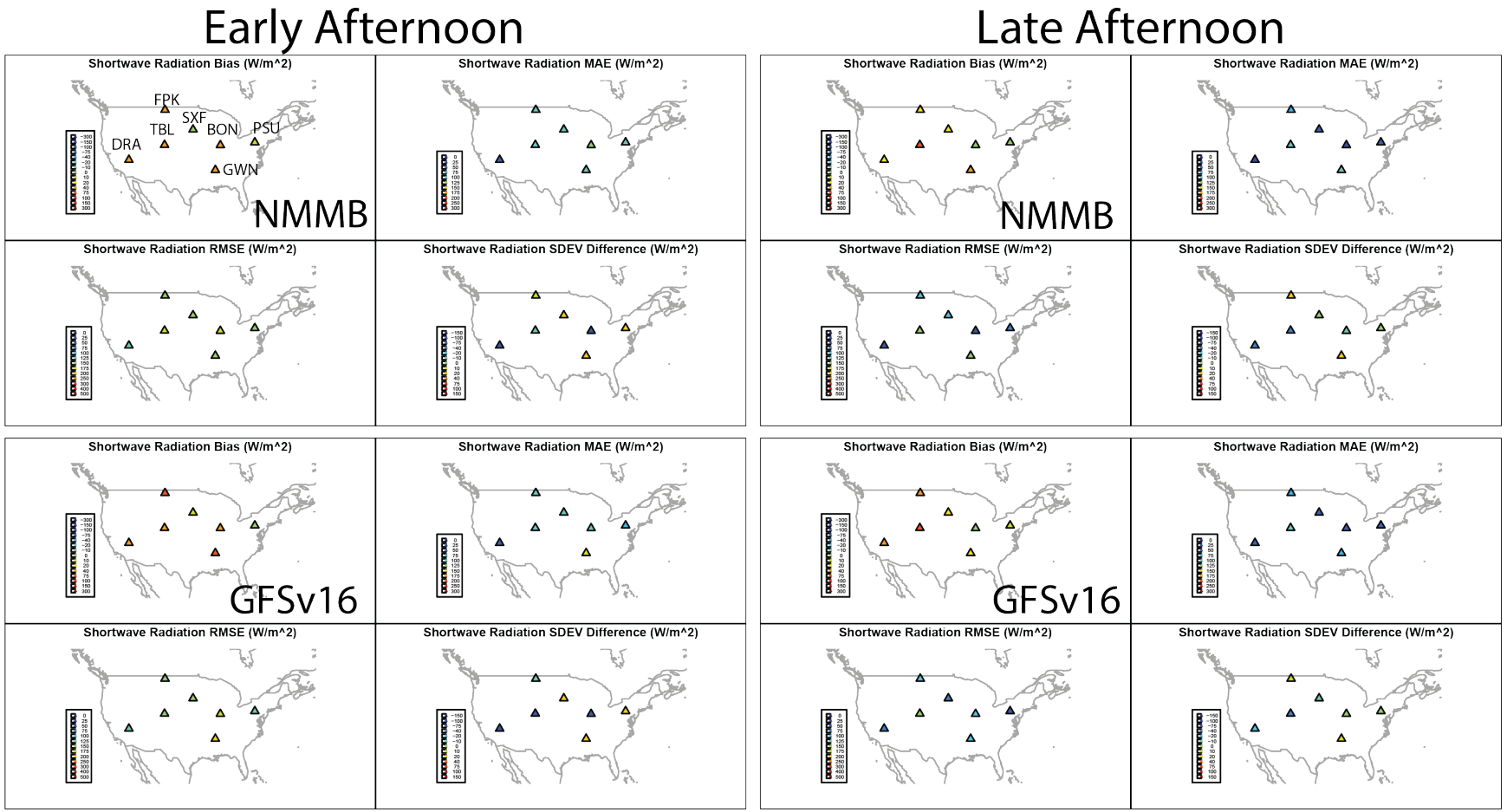


Figure S21. September 2020 spatial mean shortwave radiation bias, mean absolute error (MAE), root mean square error (RMSE), and standard deviation (SDEV) for early afternoon (left) and late afternoon (right) hours for NMMB (top) and GFSv16 (bottom) against the available eight BSRN-SURFRAD sites in CONUS. The SURFRAD site locations are labeled in the top left panel.

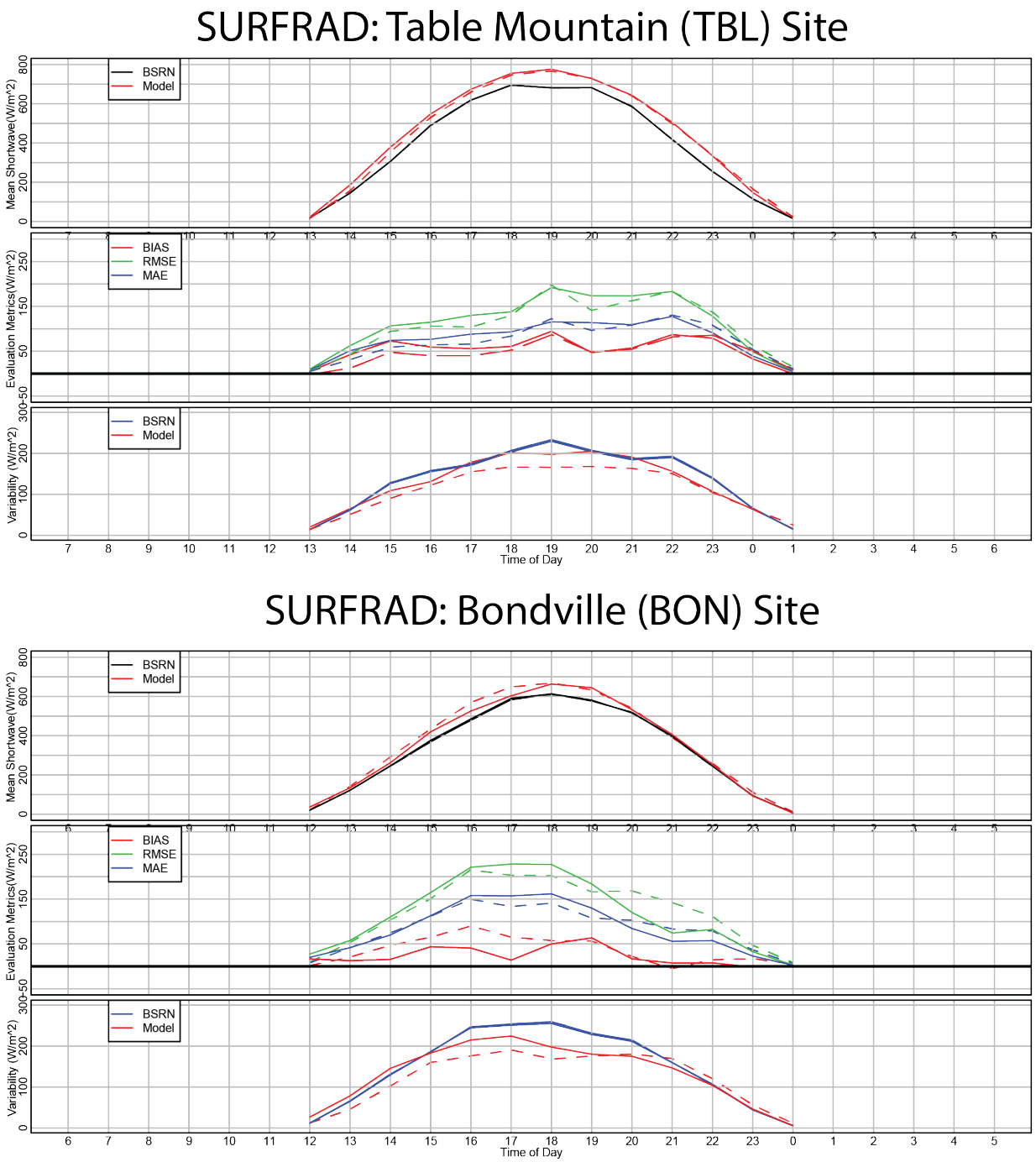


Figure S22. September 2020 diurnal mean shortwave radiation (top), evaluation metrics (middle), and variability (bottom) for the NMMB (solid) and GFSv16 (dashed) compared to the SURFRAD TBL and BON sites. Site locations are shown in Figure S21.

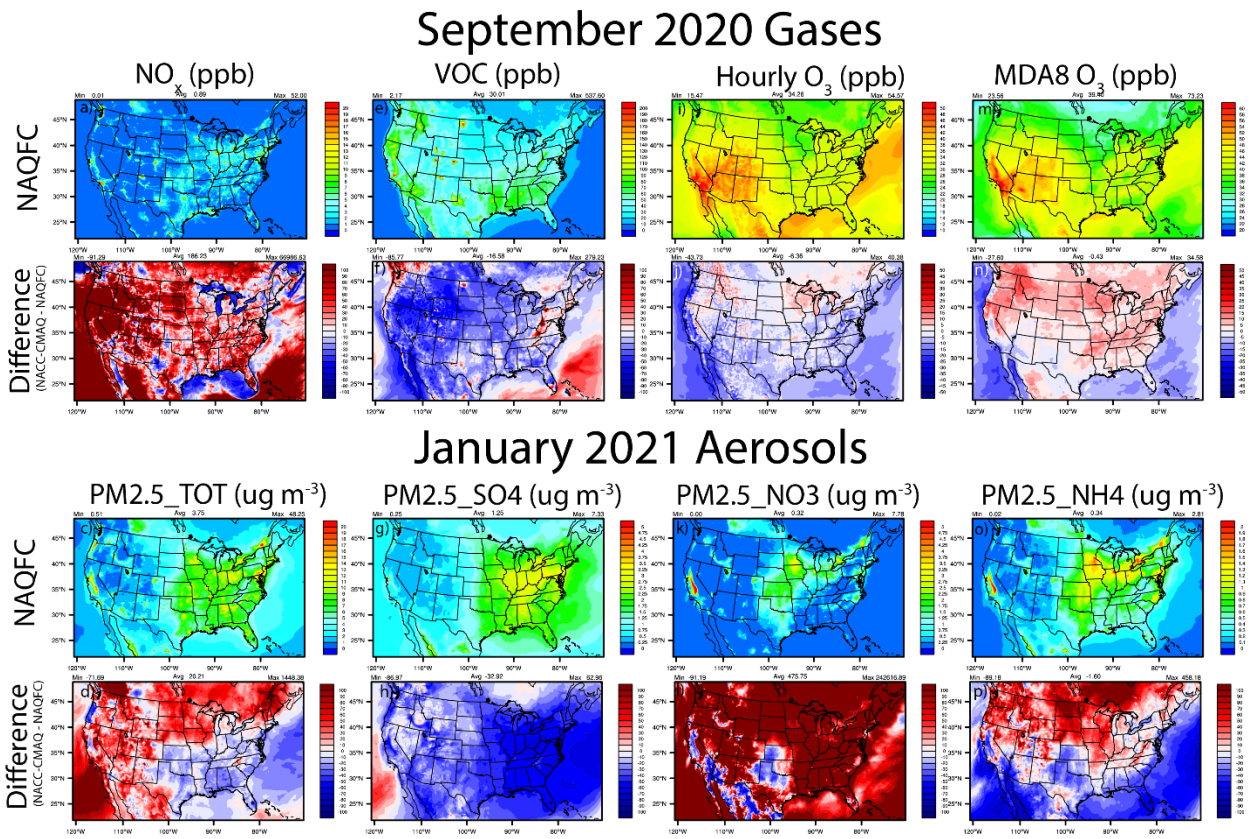


Figure S23. Average September 2020 NOx, total VOC, hourly O3, and MDA8 O3 and January 2021 PM2.5_TOT, PM2.5_SO4, PM2.5_NO3, and PM2.5_NH4 spatial plots for the operational NAQFC, and the relative (%) differences for NACC-CMAQ - NAQC.

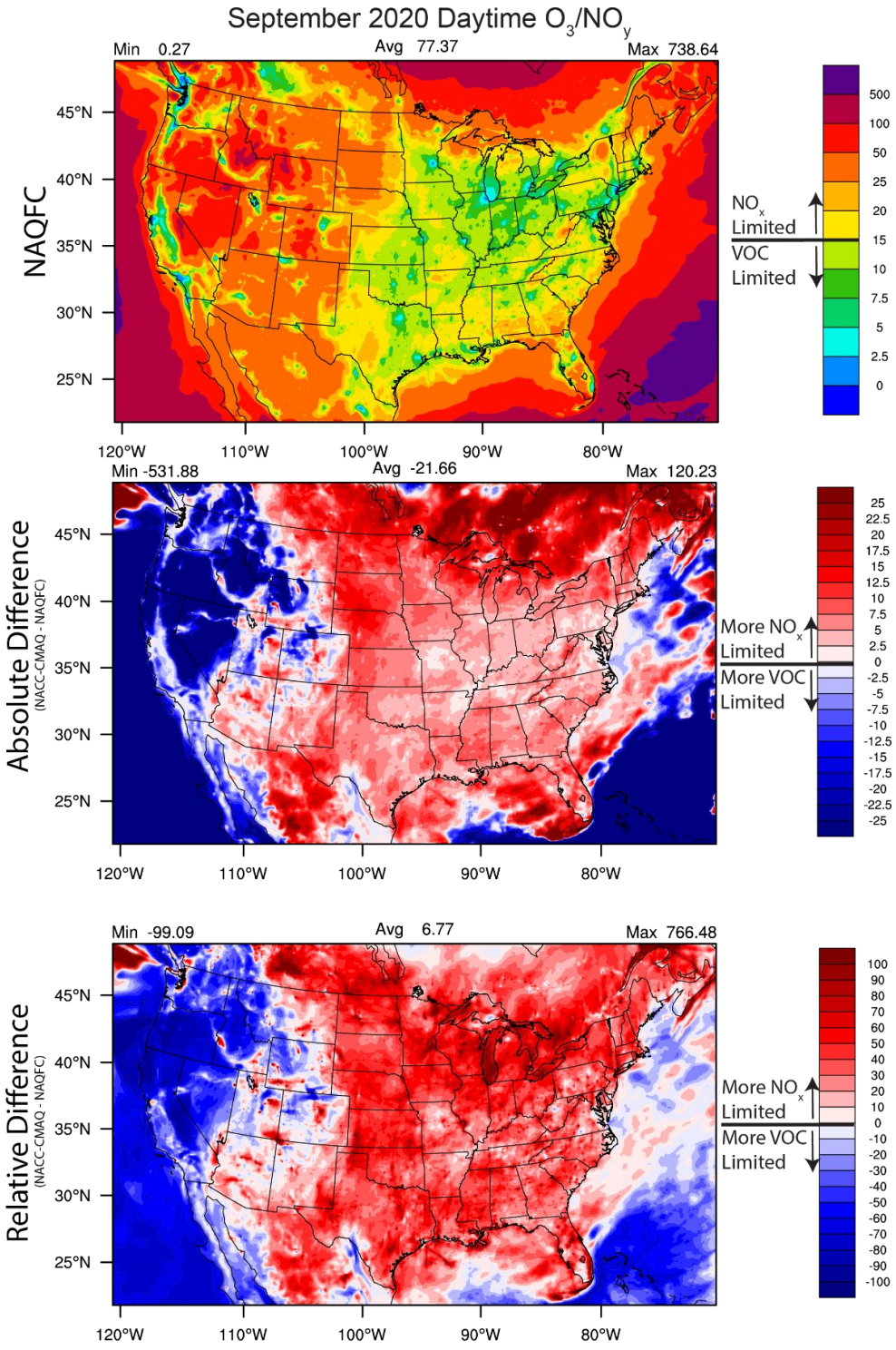


Figure S24. NAQFC simulated daytime (estimated using 17 – 23 UTC hours only) average O_3/NO_Y indicator ratio for September 2020, and the absolute and relative (5) change for NACC-CMAQ – NAQFC.

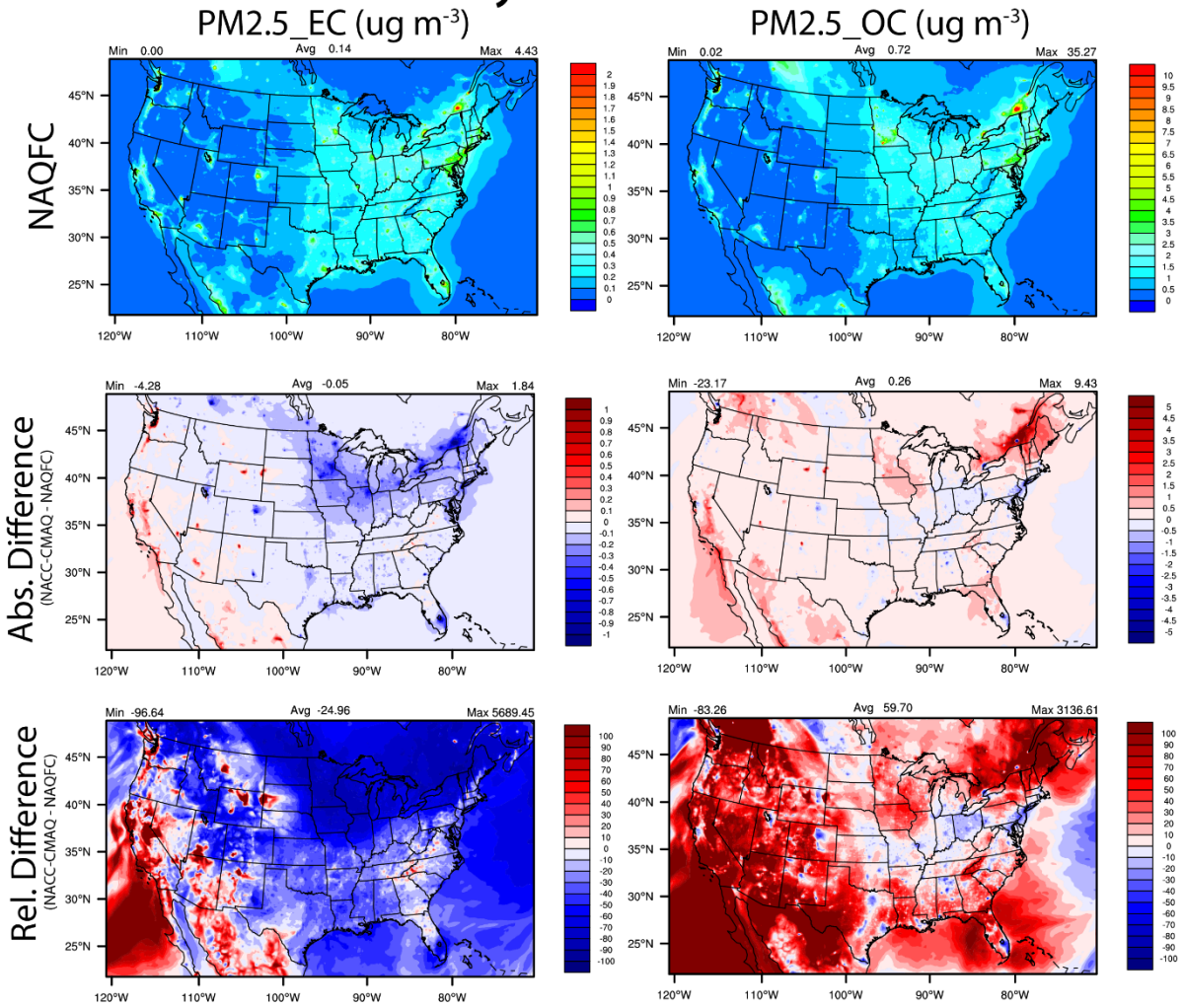


Figure S25. Average January 2021 PM25_EC and PM25_OC spatial plots for operational NAQFC and the absolute and relative (%) differences for NACC-CMAQ-NAQFC.

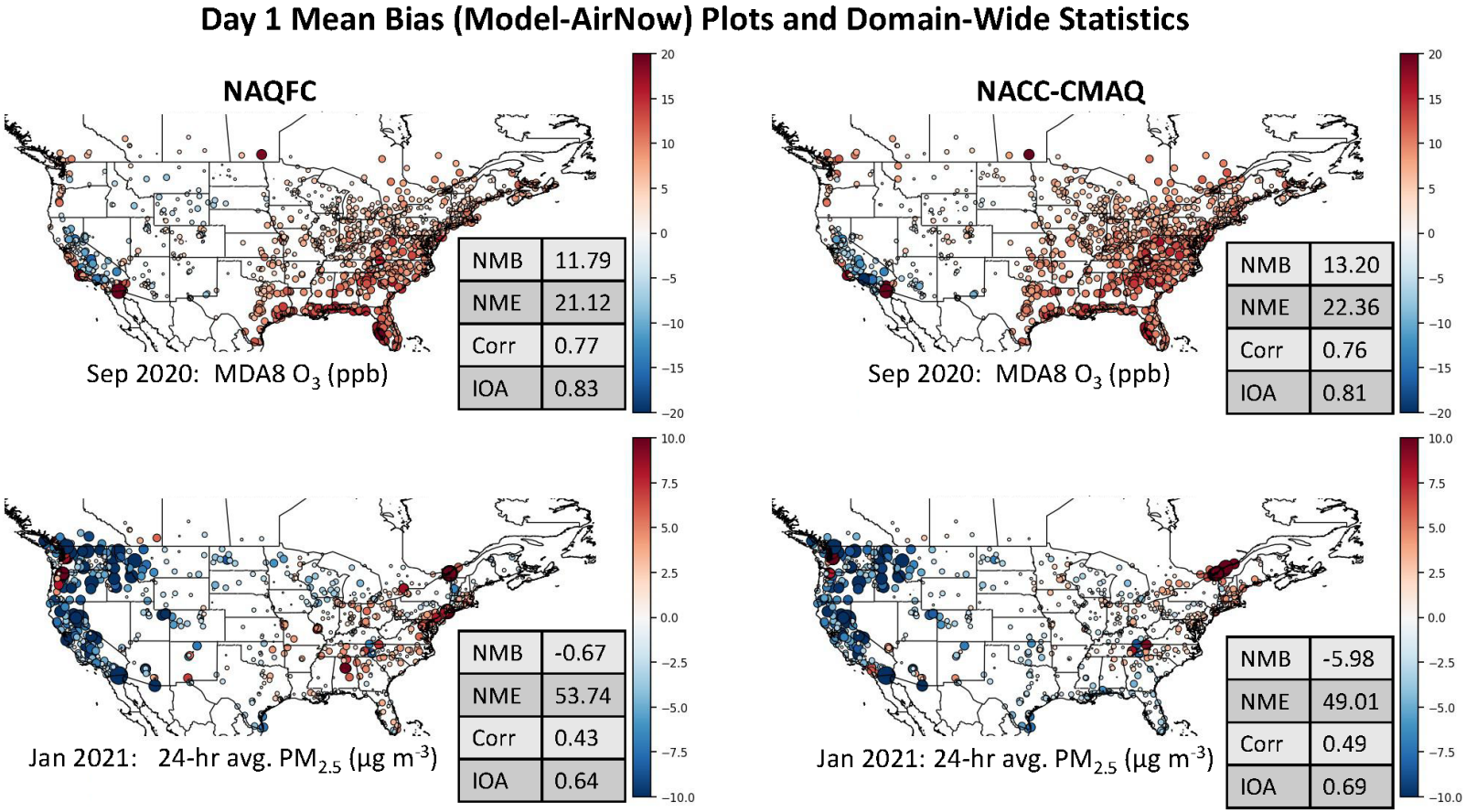


Figure S26. Day 1 forecast mean bias plots (model-AirNow) for the current operational NAQFC (left) and NACC-CMAQ (right) MDA8 O_3 (top) and 24-hr average $PM_{2.5}$ (bottom) in a)-b) September 2020 and c)-d) January 2021. Average domain-wide statistics are shown in the tables on the bottom left of each panel.

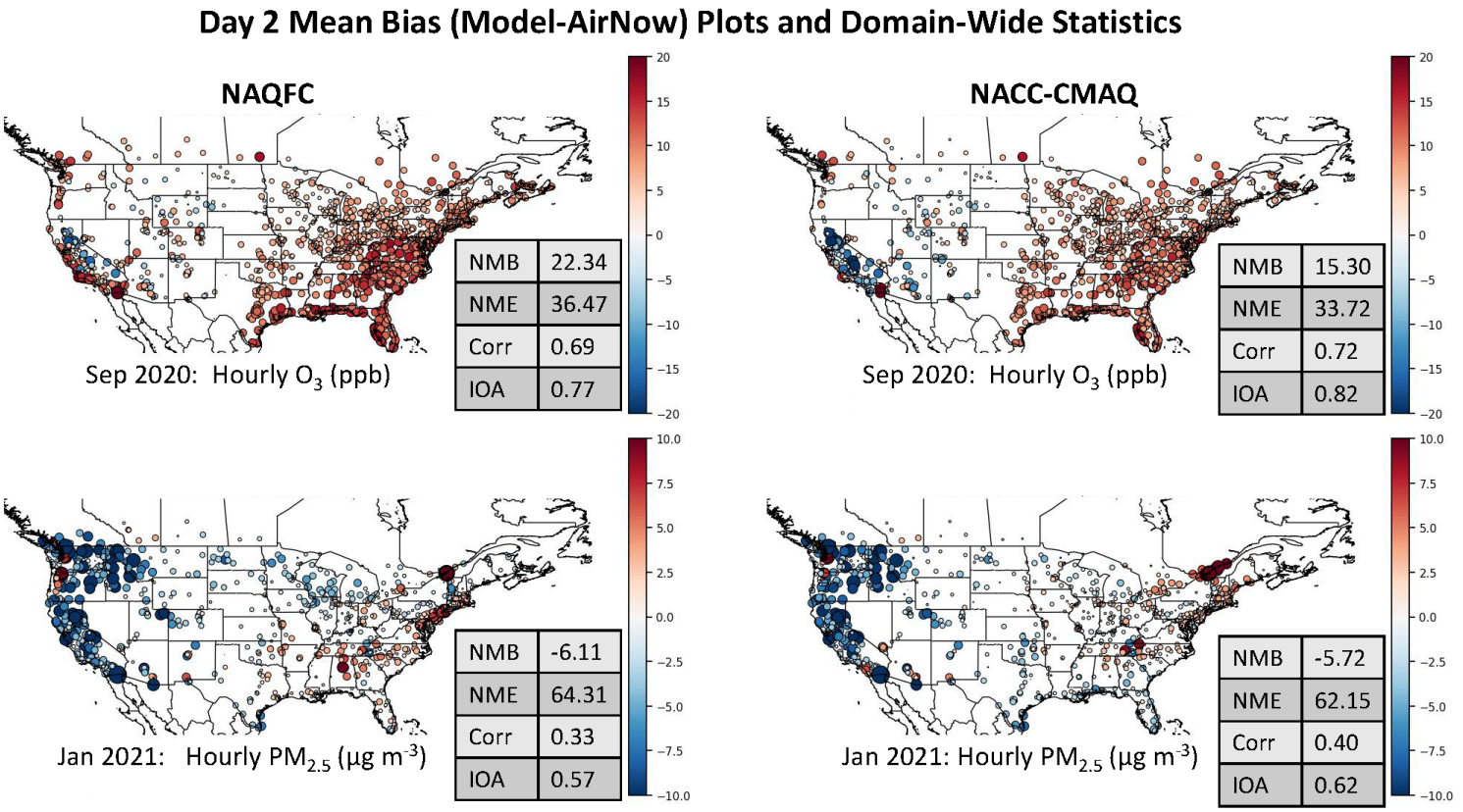


Figure S27. Same as in Figure S26, but for Day 2 forecasted hourly O_3 and $PM_{2.5}$

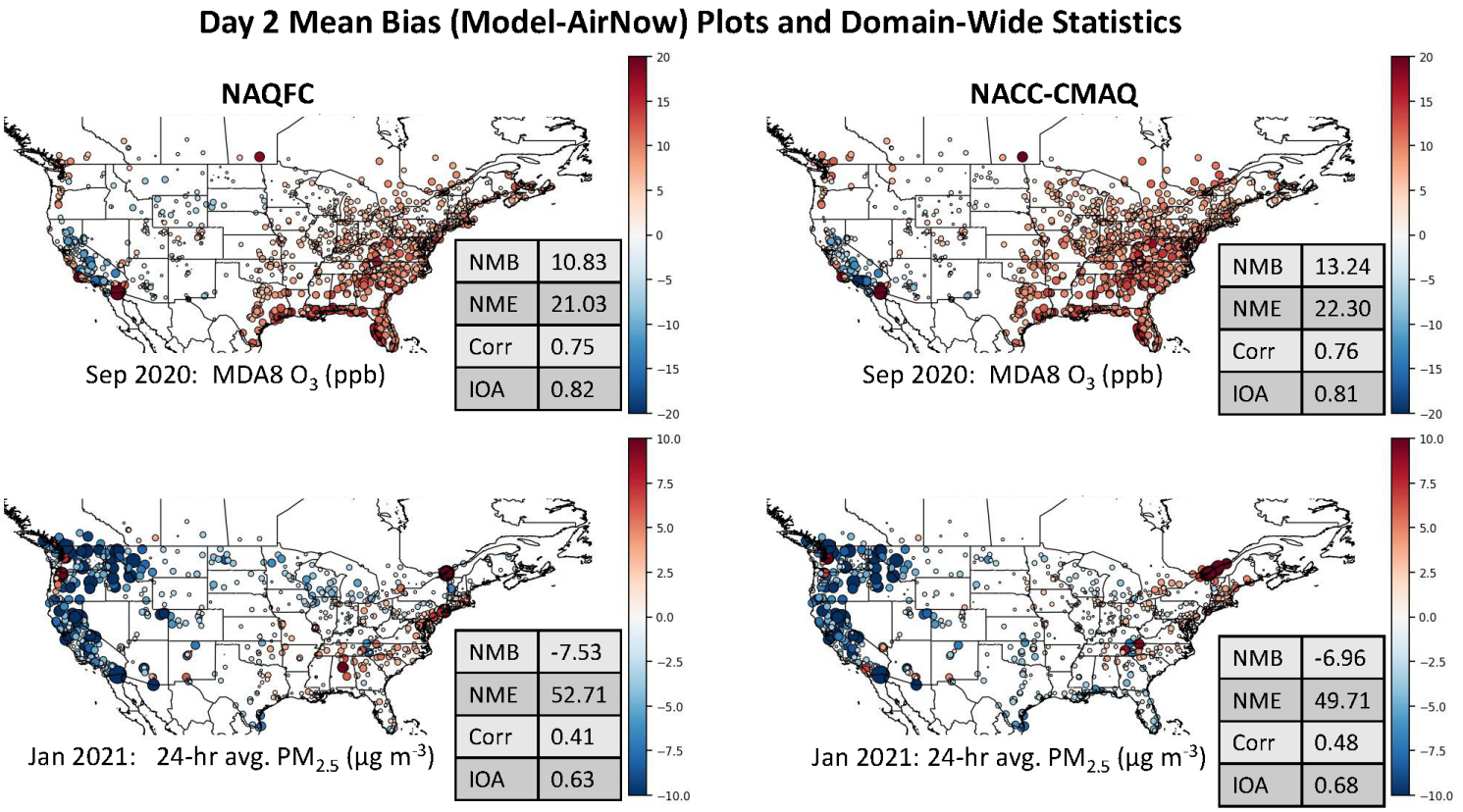


Figure S28. Same as in Figure S27, but for MDA8 O_3 and 24-hr average $PM_{2.5}$.

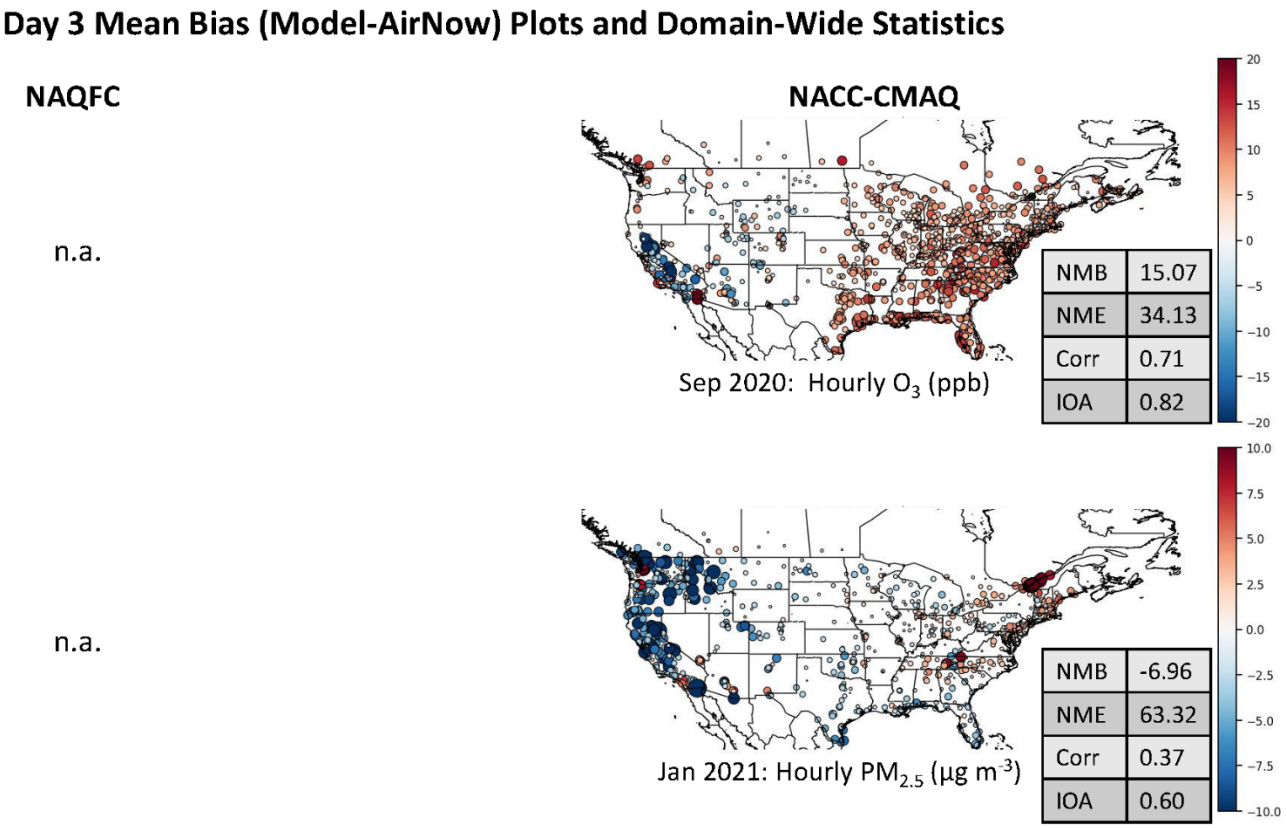


Figure S29. Same as in Figure S27, but for Day 3 forecasts (NACC-CMAQ only).

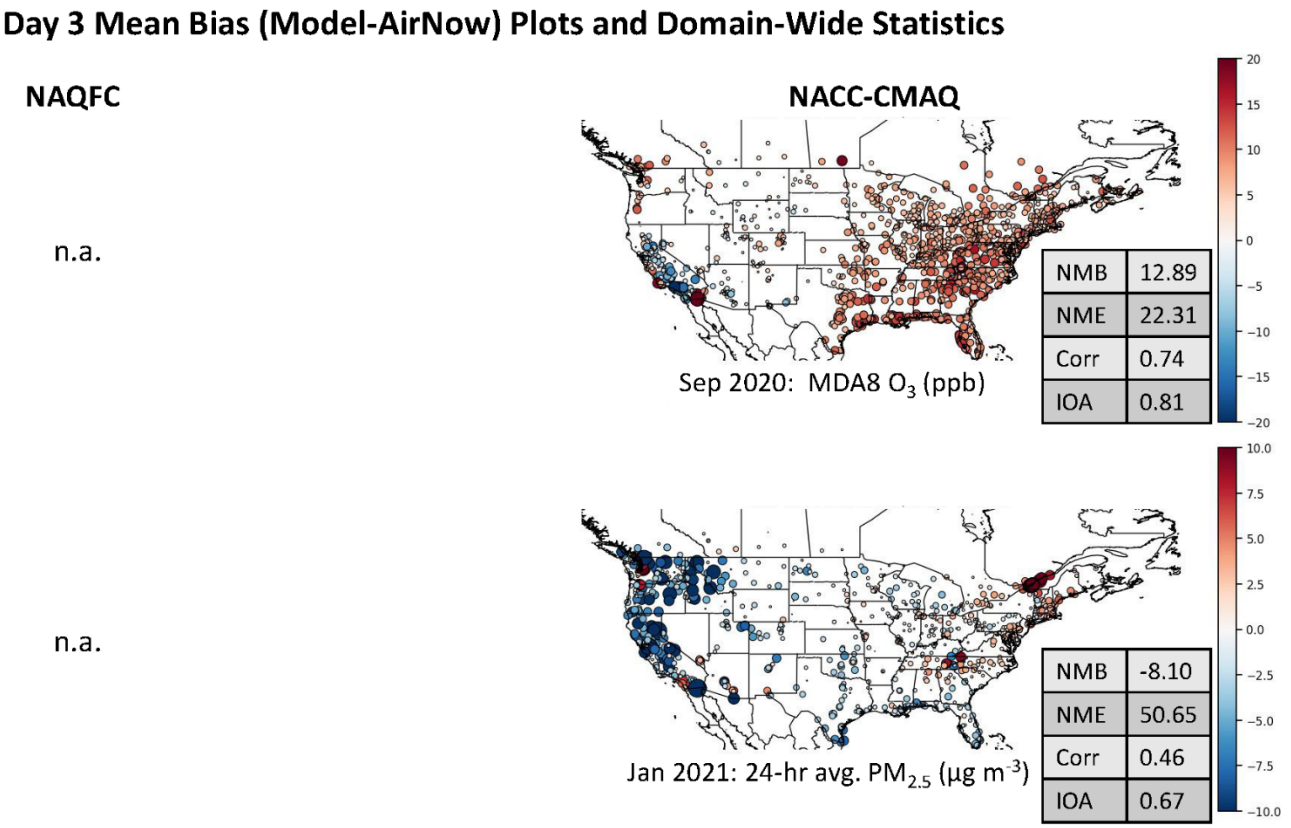


Figure S30. Same as in Figure S29, but for MDA8 O_3 and 24-hr average $PM_{2.5}$.

Table S1a. December 2020 average statistical performance of hourly ozone for the base simulation without vegetation frost switch (BASE), with frost switch and BELD3 (FROST3), and with frost switch and BELD5 (FROST5). The regions are defined by the U.S. EPA geographic regions (https://www.epa.gov/aboutepa/regional-and-geographic-offices).

Regions	R1	R2	R3	R4	R5	R6	R7	R8	R9	R10
Normalized Mean Bias (%)										
BASE	+11.3	+14.2	+11.5	+14.6	+23.5	+4.3	+16.3	+11.1	+5.1	-6.6
FROST3	+10.7	+13.4	+10.5	+14.3	+22.2	+3.8	+14.9	+9.9	+5.0	-6.8
FROST5	+9.8	+11.8	+8.4	+13.2	+19.3	+1.6	+12.2	+8.0	+2.3	-7.5
Normalized Mean Error (%)										
BASE	25.6	27.5	26.9	28.9	32.8	28.8	34.9	29.2	37.1	31.3
FROST3	25.4	27.1	26.5	28.8	31.9	28.6	34.0	28.8	37.1	31.3
FROST5	25.1	26.7	26.3	28.4	31.0	28.7	33.9	28.2	36.8	31.3
Correlation										
BASE	0.65	0.70	0.64	0.69	0.66	0.71	0.64	0.56	0.64	0.73
FROST3	0.66	0.71	0.64	0.69	0.66	0.71	0.65	0.57	0.64	0.73
FROST5	0.66	0.71	0.64	0.69	0.65	0.70	0.63	0.57	0.64	0.73
Index of Agreement										
BASE	0.78	0.81	0.78	0.79	0.75	0.83	0.77	0.74	0.80	0.85
FROST3	0.78	0.82	0.78	0.79	0.76	0.83	0.78	0.74	0.80	0.85
FROST5	0.79	0.82	0.79	0.79	0.76	0.83	0.78	0.75	0.80	0.85

Table S1b. Same as in Table S1a, but for hourly $PM_{2.5}$.

Regions	R1	R2	R3	R4	R5	R6	R7	R8	R9	R10
Normalized Mean Bias (%)										
BASE	+30.0	+55.3	+28.9	+7.9	+21.1	-1.1	+28.5	-17.4	-14.9	-6.2
FROST3	+27.4	+53.3	+26.9	+7.0	+19.1	-1.9	+26.7	-19.1	-15.3	-7.0
FROST5	+24.4	+50.2	+23.1	+0.8	+15.6	-9.0	+21.6	-27.4	-24.3	-14.1
Normalized Mean Error (%)										
BASE	67.9	88.3	60.7	50.9	53.1	61.2	59.5	66.1	63.7	81.5
FROST3	66.6	86.9	59.3	50.5	52.1	60.8	58.5	65.7	63.6	81.1
FROST5	65.1	85.0	57.7	48.2	50.6	58.6	56.4	64.6	61.7	79.9
Correlation										
BASE	0.61	0.53	0.63	0.49	0.62	0.32	0.57	0.34	0.39	0.30
FROST3	0.61	0.53	0.63	0.49	0.63	0.32	0.57	0.34	0.39	0.30
FROST5	0.61	0.52	0.62	0.49	0.62	0.32	0.56	0.34	0.40	0.28
Index of Agreement										
BASE	0.72	0.54	0.72	0.68	0.75	0.56	0.71	0.57	0.61	0.54
FROST3	0.73	0.55	0.72	0.68	0.76	0.56	0.71	0.57	0.61	0.54
FROST5	0.73	0.55	0.72	0.68	0.76	0.55	0.71	0.56	0.60	0.53

Table S2. Operational NAQFC (NMMB-CMAQv5.0.2) model components and configurations (Adapted from Lee et al., 2017). References are found in the main text.

Model Attribute	Configuration	Reference
Domain	Contiguous U.S.; Center = 33°N;97°W	n/a
Horizontal Resolution	12 km	n/a
Vertical Resolution	35 Layers from near-surface to about 14 km (~ 60 hPa)	n/a
Meteorological ICs and BCs	NMMB	*Black, 1994; Janjic and Gall, 2012*
Chemical ICs and BCs	2006 GEOS-Chem Simulation & NGAC Dust Ony CLBCs	http://acmg.seas.harvard.edu/geos/ Tang et al. (2021)
Anthropogenic Emissions	NEI2014v2	*EPA (2014)*
Biogenic Emissions	Inline BEISv3.1.4 & BELD3	*Vukovich and Pierce* (2002)*; Schwede et al.* (2005)
Wildfire Emissions/Plume Rise	NOAA/NESDIS Hazard Mapping System-Bluesky Methodology/ Inline Briggs	*Ruminski et al., 2008; Schroeder et al., 2008; Ruminski and Kondragunta, 2006; O'Neill et al. (2009); Pan et al. (2020)* *Briggs* (1965)
Microphysics	Ferrier-Aligo	*Aligo et al. (2014)*
PBL Physics Scheme	Mellor-Yamada-Janjic (MYJ) ACM2 (CMAQ recalculated)	*Janjic et al. (2001)* *Pleim (2007a;2007b)*
Shallow/Deep Cumulus Parameterization	Betts-Miller-Janjic	*Janjic (2000)*
Shortwave and Longwave Radiation	RRTMg	*Mlawer et al. (1997); Clough et al.* (2005); *Iacono et al.* (2008)
Land Surface Model	Noah Land Surface Model	*Chen and Dudhia (2001), Ek et al. (2003),Tewari et al. (2004)*
Surface Layer	Monin-Obukhov	*Monin-Obukhov* (1954); *Grell et al.* (1994); *Jimenez et al.* (2012)
Gas-phase Chemistry	CB05	*Yarwood et al., 2005*
Aqueous-phase Chemistry	CMAQ AQCHem Updates	*Martin and Good* (1991)*; Alexander et al.* (2009)*;* *Sarwar et al.* (2011)
Aerosol Module/Size	AERO4	*Binkowski and Roselle (2003)*
Other Model Attributes	-In-line Photolysis -Offline FENGSHA Wind-Blown Dust Emissions -In-line Sea-salt Emissions	*Binkowski et al.* (2007) Fu et al., 2014; Huang et al., 2015; Dong et al., 2016 *Kelley et al.* (2010)

Table S3. September 2020 average statistical summary of TEMP2, Q2, and WSPD10 for NMMB and GFSv16 against the MADIS-METAR network for day 1, 2, and 3 (GFSv16) forecasts in the east (< 100° W) and west CONUS (> 100° W).

TEMP2: September 2020-East U.S.					**TEMP2: September 2020-West U.S.**				
Day 1	MB (K)	*NMB (%)	RMSE (K)	R	**Day 1**	MB (K)	*NMB (%)	RMSE (K)	R
	NMMB					*NMMB*			
	0.33	0.69	1.94	0.96		0.03	0.04	3.1	0.93
	GFSv16					*GFSv16*			
	0.1	0.2	1.92	0.96		0.93	1.46	3.34	0.92
Day 2	MB (K)	*NMB (%)	RMSE (K)	R	**Day 2**	MB (K)	*NMB (%)	RMSE (K)	R
	NMMB					NMMB			
	0.24	0.5	2.2	0.95		0.04	0.06	3.39	0.91
	GFSv16					*GFSv16*			
	0.24	0.48	2.15	0.95		1.08	1.58	3.5	0.92
Day 3	MB (K)	NMB (%)	RMSE (K)	R	**Day 3**	MB (K)	NMB (%)	RMSE (K)	R
	NMMB					*NMMB*			
	n/a	n/a	n/a	n/a		n/a	n/a	n/a	n/a
	GFSv16					*GFSv16*			
	0.35	0.71	2.34	0.94		1.15	1.68	3.6	0.92
Q2: September 2020-East U.S.					**Q2: September 2020-West U.S.**				
Day 1	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R	**Day 1**	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R
	NMMB					*NMMB*			
	-0.2	-0.68	1.25	0.96		-0.07	-0.26	1.27	0.9
	GFSv16					*GFSv16*			
	-1.35	-4.85	1.97	0.95		-0.89	-3.19	1.64	0.88
Day 2	MB	*NMB (%)	RMSE	R	**Day 2**	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R
	NMMB					*NMMB*			
	-0.33	-1.12	1.46	0.95		-0.17	-0.61	1.47	0.86
	GFSv16					*GFSv16*			
	-1.33	-4.79	2.05	0.94		-0.94	-3.34	1.72	0.86
Day 3	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R	**Day 3**	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R
	NMMB					*NMMB*			
	n/a	n/a	n/a	n/a		n/a	n/a	n/a	n/a
	GFSv16					*GFSv16*			
	-1.21	-4.34	2.09	0.93		-0.94	-3.36	1.76	0.86
WSPD10: September 2020-East U.S.					**WSPD10: September 2020-West U.S.**				
Day 1	MB (m/s)	*NMB (%)	RMSE (m/s)	R	**Day 1**	MB (m/s)	*NMB (%)	RMSE (m/s)	R
	NMMB					*NMMB*			
	0.36	0.7	1.6	0.7		-0.47	-1.33	1.88	0.69
	GFSv16					*GFSv16*			
	0.52	1	1.69	0.69		-0.21	-0.59	1.96	0.69
Day 2	MB (m/s)	*NMB (%)	RMSE (m/s)	R	**Day 2**	MB (m/s)	*NMB (%)	RMSE (m/s)	R
	NMMB					*NMMB*			
	0.36	0.69	1.71	0.65		-0.46	-1.3	1.98	0.66
	GFSv16					*GFSv16*			
	0.49	0.96	1.79	0.65		-0.23	-0.66	2.05	0.67
Day 3	MB (m/s)	*NMB (%)	RMSE (m/s)	R	**Day 3**	MB (m/s)	*NMB (%)	RMSE (m/s)	R
	NMMB					NMMB			
	n/a	n/a	n/a	n/a		n/a	n/a	n/a	n/a
	GFSv16					GFSv16			
	0.46	0.9	1.87	0.62		-0.26	-0.74	2.15	0.63

* NMB stats are normalized by observation range.

Table S4. Same as in Table S3, but for January 2021.

TEMP2: January 2021-East U.S.					TEMP2: January 2021-West U.S.				
Day 1	MB (K)	*NMB (%)	RMSE (K)	R	**Day 1**	MB (K)	*NMB (%)	RMSE (K)	R
	NMMB					*NMMB*			
	-0.03	-0.04	2.08	0.97		-0.68	-0.95	3.05	0.93
	GFSv16					*GFSv16*			
	-0.19	-0.27	2.27	0.97		-0.3	-0.41	3.33	0.92
Day 2	MB (K)	*NMB (%)	RMSE (K)	R	**Day 2**	MB (K)	*NMB (%)	RMSE (K)	R
	NMMB					NMMB			
	-0.16	-0.23	2.48	0.96		-0.84	-1.19	3.37	0.92
	GFSv16					*GFSv16*			
	-0.04	-0.06	2.44	0.96		-0.27	-0.36	3.45	0.91
Day 3	MB (K)	NMB (%)	RMSE (K)	R	**Day 3**	MB (K)	NMB (%)	RMSE (K)	R
	NMMB					*NMMB*			
	n/a	n/a	n/a	n/a		n/a	n/a	n/a	n/a
	GFSv16					*GFSv16*			
	0.14	0.19	2.6	0.95		-0.28	-0.39	3.62	0.91
Q2: January 2021-East U.S.					**Q2: January 2021-West U.S.**				
Day 1	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R	**Day 1**	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R
	NMMB					*NMMB*			
	0.1	0.51	0.59	0.97		0.14	0.87	0.67	0.92
	GFSv16					*GFSv16*			
	-0.05	-0.28	0.62	0.97		-0.16	-0.98	0.69	0.91
Day 2	MB	*NMB (%)	RMSE	R	**Day 2**	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R
	NMMB					*NMMB*			
	0.06	0.3	0.68	0.96		0.11	0.71	0.73	0.89
	GFSv16					*GFSv16*			
	0.01	0.05	0.71	0.96		-0.16	-1.03	0.73	0.9
Day 3	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R	**Day 3**	MB (g/kg)	*NMB (%)	RMSE (g/kg)	R
	NMMB					*NMMB*			
	n/a	n/a	n/a	n/a		n/a	n/a	n/a	n/a
	GFSv16					*GFSv16*			
	0.09	0.48	0.82	0.95		-0.16	-1	0.78	0.88
WSPD10: January 2021-East U.S.					**WSPD10: January 2021-West U.S.**				
Day 1	MB (m/s)	*NMB (%)	RMSE (m/s)	R	**Day 1**	MB (m/s)	*NMB (%)	RMSE (m/s)	R
	NMMB					*NMMB*			
	0.11	0.18	1.61	0.7		-0.56	-1.14	2.23	0.72
	GFSv16					*GFSv16*			
	0.13	0.22	1.66	0.7		-0.68	-1.38	2.33	0.72
Day 2	MB (m/s)	*NMB (%)	RMSE (m/s)	R	**Day 2**	MB (m/s)	*NMB (%)	RMSE (m/s)	R
	NMMB					*NMMB*			
	0.16	0.27	1.72	0.67		-0.53	-1.08	2.34	0.68
	GFSv16					*GFSv16*			
	0.14	0.23	1.75	0.67		-0.71	-1.44	2.43	0.69
Day 3	MB (m/s)	*NMB (%)	RMSE (m/s)	R	**Day 3**	MB (m/s)	*NMB (%)	RMSE (m/s)	R
	NMMB					NMMB			
	n/a	n/a	n/a	n/a		n/a	n/a	n/a	n/a
	GFSv16					GFSv16			
	0.15	0.24	1.86	0.62		-0.74	-1.48	2.59	0.65

* NMB stats are normalized by observation range.

Table S5. Average September 2020 hourly O_3 evaluation of the operational NAQFC and NACC-CMAQ Day 2 forecasts against the AirNow network in different CONUS regions (based on https://www.epa.gov/aboutepa/regional-and-geographic-offices). Statistical benchmark values based on Emery et al. (2017) are also shown for comparison. Following Emery et al., a >40 ppb (i.e., daytime) cutoff for hourly O_3 is applied for the mean observations, mean models, mean bias, and the calculated values of NMB and NME, but not for the correlation value (r) or index of agreement (IOA). Total # of obs-model pairs are based on all values (i.e., no cutoff). **Bold** indicates statistical values outside of the Emery et al. criteria. Blue (red) shading indicates improved (degraded) NACC-CMAQ performance.

Day 2 Forecasts	**Total # of Pairs**	**Mean Obs (ppb)**	**Mean Mod (ppb)**	**Mean Bias (ppb)**	**NMB (%)**	**NME (%)**	**Corr (r)**	**IOA**
Benchmark Emery et al. (2017)	-	-	-	-	Goal: <±5% Criteria: <±15%	Goal: <15% Criteria: <25%	Goal: >0.75 Criteria: >0.50	-
Region 1 (Northeast)								
NAQFC	35975	46.85	42.11	-4.74	-10.12	16.69	0.59	0.70
NACC-CMAQ			43.14	-3.71	-7.92	15.45	0.70	0.81
Region 2 (NY-NJ)								
NAQFC	22920	46.63	42.37	-4.26	-9.14	17.12	0.56	0.71
NACC-CMAQ			44.50	-2.14	-4.58	15.35	0.71	0.81
Region 3 (Mid-Atlantic)								
NAQFC	88924	46.62	44.01	-2.60	-5.59	12.89	0.64	0.72
NACC-CMAQ			45.83	-0.79	-1.69	13.88	0.74	0.82
Region 4 (Southeast)								
NAQFC	105832	44.52	45.62	1.10	2.46	13.53	0.61	0.65
NACC-CMAQ			47.50	2.98	6.68	15.68	0.72	0.75
Region 5 (Upper Midwest)								
NAQFC	109589	46.57	43.26	-3.31	-7.10	13.86	0.67	0.77
NACC-CMAQ			46.57	0.00	0.01	11.29	0.76	0.83
Region 6 (South)								
NAQFC	83955	48.16	46.98	-1.18	-2.44	13.77	0.67	0.76
NACC-CMAQ			48.21	0.05	0.11	13.37	0.74	0.81
Region 7 (Central Plains)								
NAQFC	27120	45.10	44.63	-0.47	-1.05	10.64	0.77	0.83
NACC-CMAQ			47.40	2.31	5.11	9.74	0.81	0.85
Region 8 (Northern Plains)								
NAQFC	51728	48.97	44.52	-4.45	-9.09	14.43	0.69	0.81
NACC-CMAQ			45.03	-3.93	-8.03	14.13	0.72	0.84
Region 9 (West)								
NAQFC	124039	55.59	49.48	-6.11	-11.00	19.47	0.68	0.78
NACC-CMAQ			46.73	-8.87	**-15.95**	21.82	0.71	0.83
Region 10 (Northwest)								
NAQFC	14128	48.31	39.21	-9.10	**-18.83**	22.03	0.60	0.71

NACC-CMAQ			41.46	-6.84	-14.17	19.86	0.66	0.81

Table S6. Same as in Table S5, but for MDA8 O_3. Note: As discussed in Emery et al. (2017), there are no cutoff values applied for MDA8 O_3.

Day 2 Forecasts	**Total # of Pairs**	**Mean Obs (ppb)**	**Mean Mod (ppb)**	**Mean Bias (ppb)**	**NMB (%)**	**NME (%)**	**Corr (r)**	**IOA**
Benchmark Emery et al. (2017)	-	-	-	-	Goal: <±5% Criteria: <±15%	Goal: <15% Criteria: <25%	Goal: >0.75 Criteria: >0.50	-
Region 1 (Northeast)								
NAQFC	1680	33.22	38.12	4.89	14.73	21.68	0.62	0.71
NACC-CMAQ			38.50	5.28	**15.90**	20.65	0.73	0.76
Region 2 (NY-NJ)								
NAQFC	1160	33.13	37.37	4.24	12.81	19.95	0.66	0.75
NACC-CMAQ			39.03	5.90	**17.81**	23.09	0.70	0.75
Region 3 (Mid-Atlantic)								
NAQFC	4250	34.05	39.43	5.38	15.81	20.52	0.72	0.76
NACC-CMAQ			41.25	7.19	**21.13**	23.72	0.76	0.76
Region 4 (Southeast)								
NAQFC	5077	31.02	39.94	8.92	**28.75**	**30.76**	0.65	0.65
NACC-CMAQ			40.90	9.88	**31.84**	**33.22**	0.71	0.66
Region 5 (Upper Midwest)								
NAQFC	5210	34.34	37.68	3.34	9.73	18.24	0.74	0.82
NACC-CMAQ			40.36	6.01	**17.51**	20.50	0.80	0.81
Region 6 (South)								
NAQFC	3900	35.84	42.23	6.39	**17.83**	23.60	0.72	0.77
NACC-CMAQ			43.28	7.43	**20.74**	24.33	0.77	0.78
Region 7 (Central Plains)								
NAQFC	1255	33.69	37.50	3.81	11.30	16.54	0.81	0.85
NACC-CMAQ			40.00	6.31	**18.72**	20.50	0.84	0.83
Region 8 (Northern Plains)								
NAQFC	2378	44.12	43.56	-0.56	-1.27	13.23	0.73	0.84
NACC-CMAQ			44.91	0.79	1.79	11.84	0.79	0.88
Region 9 (West)								
NAQFC	5754	51.18	50.73	-0.45	-0.88	18.85	0.67	0.79
NACC-CMAQ			48.60	-2.59	-5.05	18.84	0.68	0.79
Region 10 (Northwest)								
NAQFC	695	33.14	35.62	2.49	7.51	25.12	0.61	0.70
NACC-CMAQ			36.71	3.58	10.80	24.95	0.59	0.74

Table S7. Same as in Table S5, but for 24-hr average $PM_{2.5}$. Note: As discussed in Emery et al. (2017), there are no cutoff values applied for 24-hr average $PM_{2.5}$.

Day 2 Forecasts	Total # of Pairs	Mean Obs (ppb)	Mean Mod (ppb)	Mean Bias (ppb)	NMB (%)	NME (%)	Corr (r)	IOA
Benchmark Emery et al. (2017)	-	-	-	-	Goal: <±10% Criteria: <±30%	Goal: <35% Criteria: <50%	Goal: >0.70 Criteria: >0.40	-
Region 1 (Northeast)								
NAQFC	1261	7.43	8.34	0.91	12.25	41.43	0.76	0.85
NACC-CMAQ			9.36	1.93	25.98	46.93	0.73	0.82
Region 2 (NY-NJ)								
NAQFC	598	8.54	14.37	5.83	**68.29**	**79.48**	0.73	0.60
NACC-CMAQ			10.95	2.41	28.21	47.05	0.77	0.74
Region 3 (Mid-Atlantic)								
NAQFC	1897	9.16	11.12	1.96	21.39	38.03	0.78	0.85
NACC-CMAQ			10.17	1.01	10.99	32.62	0.83	0.89
Region 4 (Southeast)								
NAQFC	3621	8.45	9.33	0.89	10.53	40.10	**0.39**	0.61
NACC-CMAQ			7.92	-0.53	-6.23	37.61	0.47	0.66
Region 5 (Upper Midwest)								
NAQFC	3270	9.61	8.67	-0.94	-9.74	39.45	0.49	0.70
NACC-CMAQ			9.41	-0.20	-2.05	32.51	0.68	0.81
Region 6 (South)								
NAQFC	2101	8.39	7.71	-0.68	-8.12	46.83	**0.26**	0.55
NACC-CMAQ			6.27	-2.12	-25.27	44.98	**0.33**	0.57
Region 7 (Central Plains)								
NAQFC	926	8.67	8.78	0.11	1.29	45.72	**0.30**	0.57
NACC-CMAQ			8.86	0.19	2.22	35.69	0.61	0.77
Region 8 (Northern Plains)								
NAQFC	1790	7.66	3.98	-3.68	**-48.01**	**62.79**	**0.29**	0.52
NACC-CMAQ			5.11	-2.55	**-33.24**	**55.73**	0.43	0.64
Region 9 (West)								
NAQFC	4118	10.09	6.77	-3.32	**-32.94**	48.56	0.59	0.72
NACC-CMAQ			7.81	-2.28	-22.62	**52.08**	0.54	0.72
Region 10 (Northwest)								
NAQFC	3922	7.93	6.08	-1.85	-23.31	**75.40**	**0.19**	0.47
NACC-CMAQ			6.02	-1.91	-24.10	**70.44**	**0.23**	0.50

Table S8. Same as in Table S5, but for the Day 3 forecast hourly O_3.

Day 3 Forecasts	Total # of Pairs	Mean Obs (ppb)	Mean Mod (ppb)	Mean Bias (ppb)	NMB (%)	NME (%)	Corr (r)	IOA
Benchmark Emery et al. (2017)	-	-	-	-	Goal: <±5% Criteria: <±15%	Goal: <15% Criteria: <25%	Goal: >0.75 Criteria: >0.50	-
Region 1 (Northeast)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	35903	46.72	43.66	-3.06	-6.55	15.97	0.68	0.79
Region 2 (NY-NJ)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	23116	46.60	44.53	-2.07	-4.45	14.64	0.71	0.81
Region 3 (Mid-Atlantic)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	88703	46.62	45.74	-0.89	-1.90	13.94	0.72	0.81
Region 4 (Southeast)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	105520	44.68	47.21	2.53	5.67	15.69	0.70	0.75
Region 5 (Upper Midwest)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	108852	46.62	46.34	-0.28	-0.60	11.48	0.74	0.82
Region 6 (South)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	83883	48.18	48.30	0.13	0.26	13.50	0.74	0.81
Region 7 (Central Plains)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	27070	45.11	46.98	1.87	4.15	11.04	0.79	0.84
Region 8 (Northern Plains)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	51645	48.99	44.89	-4.10	-8.36	14.04	0.71	0.84
Region 9 (West)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	123816	55.68	46.60	-9.09	**-16.32**	22.38	0.71	0.83
Region 10 (Northwest)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	14065	48.41	41.64	-6.77	-13.99	19.59	0.65	0.80

Table S9. Same as in Table S5, but for Day 3 forecast MDA8 O_3. Note: As discussed in Emery et al. (2017), there are no cutoff values applied for MDA8 O_3.

Day 3 Forecasts	Total # of Pairs	Mean Obs (ppb)	Mean Mod (ppb)	Mean Bias (ppb)	NMB (%)	NME (%)	Corr (r)	IOA
Benchmark Emery et al. (2017)	-	-	-	-	Goal: <±5% Criteria: <±15%	Goal: <15% Criteria: <25%	Goal: >0.75 Criteria: >0.50	-
Region 1 (Northeast)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	1680	33.40	39.21	5.80	**17.37**	22.09	0.68	0.73
Region 2 (NY-NJ)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	1161	33.11	38.83	5.72	**17.26**	21.61	0.73	0.77
Region 3 (Mid-Atlantic)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	4253	34.13	40.90	6.77	**19.84**	22.97	0.73	0.76
Region 4 (Southeast)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	5077	31.00	40.24	9.24	**29.82**	31.97	0.69	0.68
Region 5 (Upper Midwest)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	5159	34.50	40.54	6.04	**17.49**	20.86	0.77	0.79
Region 6 (South)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	3900	35.66	43.18	7.52	**21.08**	**25.10**	0.75	0.77
Region 7 (Central Plains)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	1256	33.64	39.69	6.05	**17.98**	20.86	0.79	0.82
Region 8 (Northern Plains)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	2379	44.23	44.86	0.63	1.42	11.66	0.78	0.88
Region 9 (West)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	5758	51.25	48.64	-2.61	-5.10	19.22	0.66	0.78
Region 10 (Northwest)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	697	33.22	37.03	3.81	11.46	**25.09**	0.57	0.73

Table S10. Same as in Table S5, but for Day 3 forecast 24-hr average $PM_{2.5}$. Note: As discussed in Emery et al. (2017), there are no cutoff values applied for 24-hr average $PM_{2.5}$.

Day 3 Forecasts	Total # of Pairs	Mean Obs (ppb)	Mean Mod (ppb)	Mean Bias (ppb)	NMB (%)	NME (%)	Corr (r)	IOA
Benchmark Emery et al. (2017)	-	-	-	-	Goal: <±10% Criteria: <±30%	Goal: <35% Criteria: <50%	Goal: >0.70 Criteria: >0.40	-
Region 1 (Northeast)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	1261	7.43	9.41	1.98	26.60	**50.07**	0.73	0.81
Region 2 (NY-NJ)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	598	8.54	10.80	2.26	26.42	45.71	0.79	0.78
Region 3 (Mid-Atlantic)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	1897	9.16	10.10	0.94	10.24	32.91	0.82	0.89
Region 4 (Southeast)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	3621	8.45	8.09	-0.36	-4.25	40.40	0.45	0.64
Region 5 (Upper Midwest)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	3270	9.61	9.23	-0.37	-3.87	34.63	0.63	0.79
Region 6 (South)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	2101	8.39	6.24	-2.15	-25.58	46.79	**0.31**	0.56
Region 7 (Central Plains)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	926	8.67	8.65	-0.02	-0.25	37.08	0.57	0.74
Region 8 (Northern Plains)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	1790	7.66	5.12	-2.53	**-33.09**	**55.27**	0.44	0.64
Region 9 (West)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	4118	10.09	7.55	-2.54	-25.15	**52.82**	0.52	0.70
Region 10 (Northwest)								
NAQFC	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
NACC-CMAQ	3922	7.93	5.90	-2.03	-25.60	**70.57**	**0.23**	0.49