

GeoHealth

Supporting Information for

A Refined Satellite-based Emissions Estimate from Onshore Oil and Gas Flaring and Venting Activities in the United States and their Impacts on Air Quality and Health

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S.1. Flaring emission estimates from VIIRS flared gas volume (FGV)

The following governing equation is used to estimate emissions from flaring:

$$E \left(\frac{\text{tons}}{\text{yr}} \right) = V \left(\frac{\text{BCM}}{\text{yr}} \right) \times \frac{10^9 \text{m}^3}{\text{BCM}} \times \frac{26700 \pm 114000 \text{ BTU}}{\text{m}^3} \times EF \left(\frac{\text{lb}}{\text{BTU}} \right) \times \frac{\text{tons}}{2000 \text{ lbs}} \quad (1)$$

where V is annual natural gas flared volume for individual flare location from VIIRS in 2019; E is annual emission and EF is emission factor which will be discussed for each pollutant explicitly in the below section.

Various studies reported wide range of EF. To characterize the uncertainties associated with EF and the above heating value (26,700±114,000 BTU), we performed Monte-Carlo simulations with the following approach:

- In each Monte Carlo integration, a heating value and an EF were randomly selected,
- Emission for each VIIRS-detected flare location was estimated using equation 1,
- Repeat the above steps for 5,000 integrations,
- Calculated mean and standard deviation from 5,000 estimates.

The Eq.(1) is also applied to estimate emissions for flared gas volume reported by Rystad Energy (2022) for individual counties in Texas, New Mexico, North Dakota, Wyoming and Colorado.

NO_x emissions

Table 13.5-1 of AP42 (EPA, 2022) lists EF of NO_x as 0.068 lb/MMBtu. Francoeur et al. (2021) apply 0.065 ± 0.038 lb NO_x/MMBtu which we applied in this study. Since there is not much differences in these values, we applied EF for NO_x from Francoeur et al. (2021) in this study to Eq.1 to estimate NO_x emissions for each VIIRS-detected flare.

CO emissions

EF of CO at 0.31 lb/MMBtu from Table 13.5-1 of AP42 (EPA, 2022) is commonly applied for estimating CO emissions. We applied this EF to Eq. (1) to estimate CO emission from VIIRS-detected flare.

VOC emissions

As discussed in the main text, VOC emissions from flare are taken as VOC emissions from venting of the associated flare-SCC nonpoint sources. Default VOC speciation profiles in the NEI 2017 were applied for VOC emission from flaring and venting (F&V).

SO₂ emissions

SO₂ emissions are only estimated for certain flare-SCCs in the NEI 2017. In Texas, SO₂ is only estimated for SCCs 2310011450 and 2310021450 (oil and gas well casinghead) based on county-level weight percentage of hydrogen sulfide (H₂S) in the flared gas and a 98% conversion of H₂S to SO₂.

In this study, EF for SO₂ emissions from VIIRS-detected flare is estimated as:

$$EF_{SO_2} \left(\frac{\text{lb}}{\text{BTU}} \right) = MW * W_{H_2S} * 0.98$$

where MW is molecular weight of flared gas and W_{H_2S} is weight percentage of H_2S in flared gas. The EF_{SO_2} assumes 98% conversion of H_2S to SO_2 . In each Monte Carlo simulations, a pair of MW and W_{H_2S} values from one of the 8 O&G production fields in Texas (Table S5) is randomly selected to determine EF_{SO_2} which is then applied to Eq.(1) to estimate SO_2 emissions.

From the above treatment F&V SO_2 emissions are accounted for about 82% of total O&G SO_2 emissions in the CONUS, and the total SO_2 emissions from O&G jumped from ~49,000 tpy in NEI 2017 to ~115,500 tpy in wFlare2 scenario. This may look like a significant jump. However, the pre-release version of the NEI 2020¹² also shows more than three times increase in O&G SO_2 emissions in 2020 (257,572 tpy) from NEI 2017 (73,250 tpy) as a result of updating SO_2 emission factors based on recent field surveys in the O&G production fields. This also implies that O&G SO_2 emissions are underestimated in the NEI 2017.

PM₁₀ and PM_{2.5} emissions

Emissions of PM_{10} and $PM_{2.5}$ is not estimated for flare-SCCs in the NEI 2017. From our personal communication with emission inventory experts at EPA and TCEQ, PM emissions from flare are assumed to be low. Table 13.5-1 of AP42 (EPA, 2022) only lists emissions for soot from flare but is in concentrations unit ($\mu g/L$) and thus are not applicable for estimating PM emissions.

Our search for prior studies on EF for PM emissions from flare yielded limited results. For studies performed over the Bakken basin, EF for black carbon emissions from flaring is reported by Weyant et al. (2016) at 0.13 ± 0.36 g/m^3 and by Schwarz et al. (2015) at 0.57 ± 0.14 g/m^3 . We applied these two EFs to Eq.(1) and Monte-Carlo simulations to estimate black carbon emission from flaring. For this study, 100% of $PM_{2.5}$ and PM_{10} emissions from flaring are attributed to black carbon which is mapped to CMAQ model as elemental carbon (EC) species.

Stack parameters and temporal profiles

The combustion in flaring occurs at the flare stack's tips which differs from conventional stacks where combustion occurs in a combustion chamber and the exhausts are released through the stack. Therefore, the effective stack parameters of flaring are functions of physical stack height and diameter, heating value of flared gas and ambient wind velocity.

Stack parameters for VIIRS-detected flare are estimated using refined methods developed by San Joaquin Valley Air Pollution Control District (SVAPCD, 2022) based on algorithms developed by American Petroleum Institute Standard 521 (API, 2014) and with several empirical flare parameters taken from Texas Commission on Environmental Quality (TCEQ, 2004). Figure S1 show the histogram of flare stack parameters estimated from this study.

In summary: the effective flare stack height H_{eff} , effective stack diameter D_{eff} , and effective stack exist velocity V_{eff} are estimated as

$$H_{eff}(m) = 3.28084 \frac{m}{ft} \times (h + \Delta y)$$
$$D_{eff}(m) = 0.000988 \times (Q \times 0.45 \times 239)^{0.5}$$

¹ https://gaftp.epa.gov/Air/emismod/2020/2020emissions_prerelease

² https://gaftp.epa.gov/Air/nei/2020/doc/supporting_data/nonpoint/oilgas/OIL_GAS_TOOL_v1.3

$$V_{eff}(m) = U_j \times 3.28084$$

The physical stack height $h = 20$ ft and physical stack diameter $d = 0.254$ m are assigned to all VIIRS-detected flares. It is assumed that 45% of net heat released from flaring, Q (kW/hr), is available for plume rise. Q is determined as 25,076 kW/hr for flared gas comprised of 79% methane, 10% ethane, 5% propane and 1% butane. Stack exit temperature is assigned to VIIRS detected temperature of each VIIRS-detected flare.

The flame vertical length Δy is determined as:

$$\Delta y (ft) = L \times \left[-0.0392 + \frac{0.1267}{U^2} + \frac{0.0178}{U} - \frac{0.003}{U^{1.5}} \right]$$

$$L (m) = e^{(0.4562 \times \log(Q)) - 5.3603}$$

U is unitless quantity representing flame distortion due to ambient wind velocity:

$$U = \frac{U_x}{U_j}$$

$$U_j \left(\frac{m}{s} \right) = \frac{4 \times F}{\pi \times d^2} \times 0.707$$

The actual volumetric flow rate of exhausted gas from flaring F is determined as 0.56 m³/s for average flared gas parameters: flow rate at 64,000 scf/hr; natural gas specific density 0.056 lb/scf; molecular weight 19.5 g/mole, and flowing gas temperature at 293.15 K. U_x is ambient wind speed and is determined for each VIIRS-detected flare using reanalysis data from National Centers for Environmental Prediction (NCEP) for 2019³.

To allocate the annual emissions estimated from Eq.(1) to monthly emissions, the monthly vented and flared gas data at state level were retrieved from U.S. Energy Information Administration (EIA, 2022). The monthly emissions are then evenly distributed to hourly emissions. In this approach, each state that has VIIRS-detected flares has its own temporal allocation, and all VIIRS-detected flares in a same state have identical temporal allocation.

³ <https://psl.noaa.gov/data/gridded/data.ncep.reanalysis2.html>

S.2. Additional Health Impact Analyses

For childhood asthma outcomes, we used concentration response functions (CRFs) from two publications. One set was pulled from Orellano et al. (2017) which derived relationships between PM_{2.5} and NO₂ and asthma outcomes; the other is from Alhanti et al. (2016) which derived relationships between asthma outcomes and the pollutants PM_{2.5}, NO₂, and ozone. We compare the results using the different CRFs to evaluate the sensitivity of results to different choices of CRFs.

We conducted an environmental justice analysis to estimate the distribution of health impacts in overburdened and underserved areas. We acquired a shapefile of Justice40 data, from the [Climate and Economic Justice Screen Tool \(CJEST\)](#)⁴, with environmental and economic justice demographic data, 2010 census tract IDs, and county names. We filtered tracts that were identified as ‘low income’ (i.e., census tracts that are 65th percentile or above for household income that is less than or equal to twice the federal poverty level, excluding students), and tract data for percent ‘American Indian / Alaskan Native’ and percent ‘Hispanic or Latino’. (While we recognize ‘American Indian / Alaskan Native’ is used for official government documentation, these populations will be referred to as ‘Native’ for the remainder of this publication). Tracts with percent race/ethnicity data were categorized dichotomously, based on whether tract populations were above or below the 65th percentile. This cutoff was 2% for Native populations and 14% for Hispanic/Latino populations. The 65th percentile for Native populations was calculated by dropping all census tracts with 0% identified Native persons. Justice40 tracts were merged with the *wFlare2* health outcome polygons, grouped by Justice40 categories and aggregated by health outcome.

An “impact risk ratio” (IRR) was calculated for each aggregated health outcome by Justice40 category using Eq. (2), which is similar to the method used by Flores et al., (2022) to calculate whether persistently marginalized members of racial and ethnic groups were disproportionately impacted by power outages. This IRR serves as measurement if underserved tracts are disproportionately impacted by *wFlare2* emissions.

$$IRR = \frac{\frac{\text{Cases of health outcome occurring within J40 designated tracts}}{\text{Population residing within J40 designated tracts}}}{\frac{\text{Cases of health outcome occurring nationwide}}{\text{Population nationwide}}} \quad (2)$$

⁴ <https://screeningtool.geoplatform.gov/en/downloads>

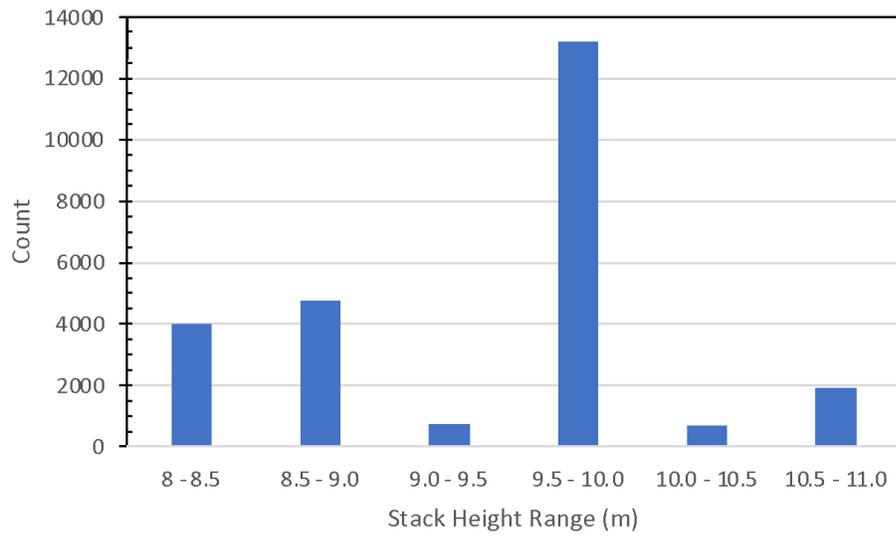


Figure S1. Distribution of flare effective stack height

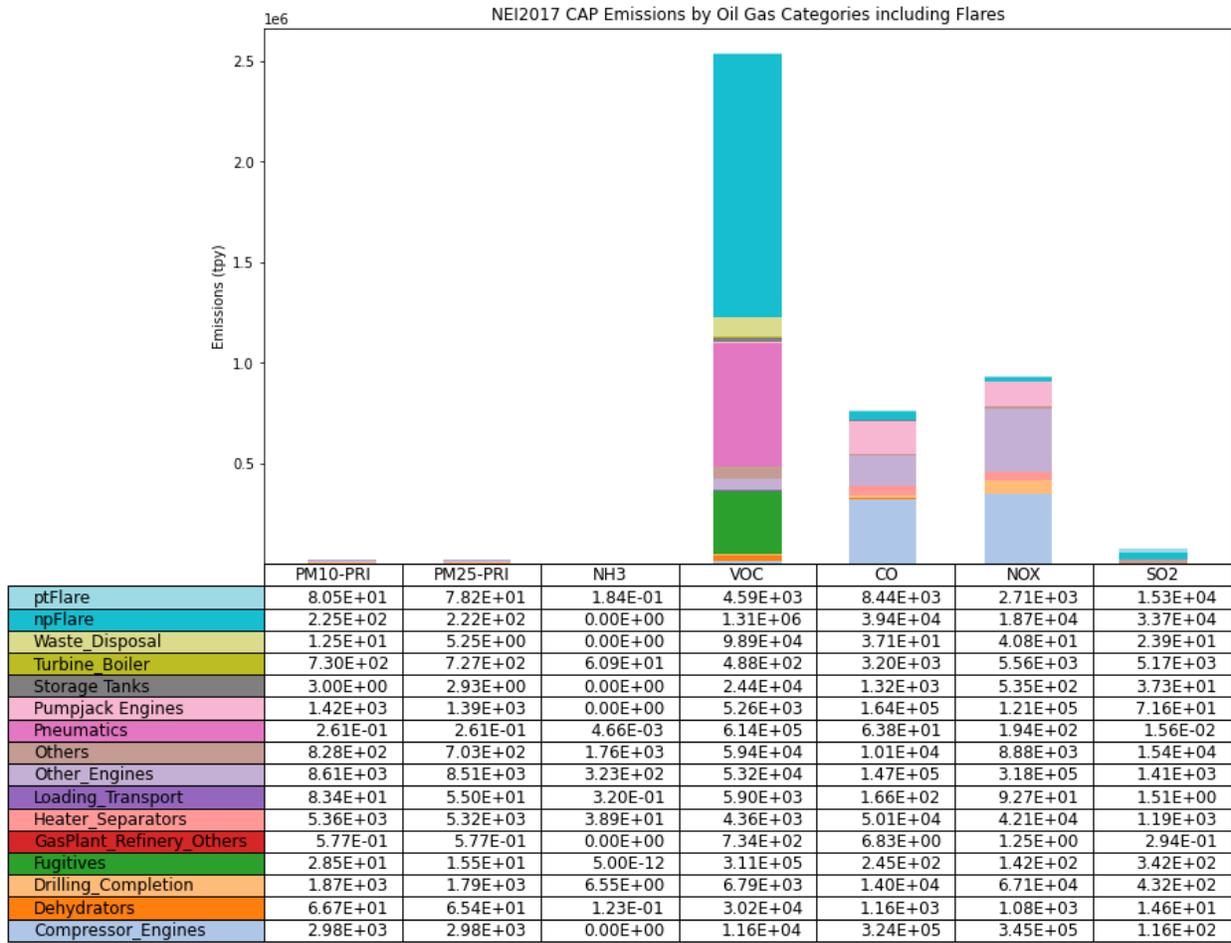


Figure S2. Emissions of criteria pollutants from O&G categories in NEI 2017

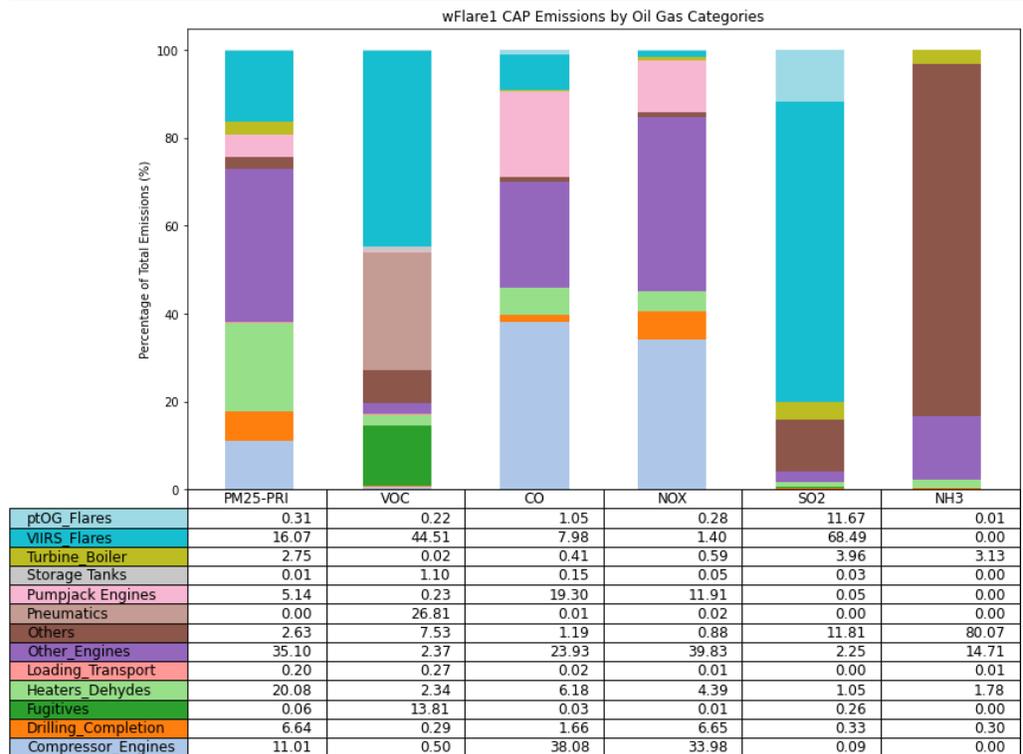
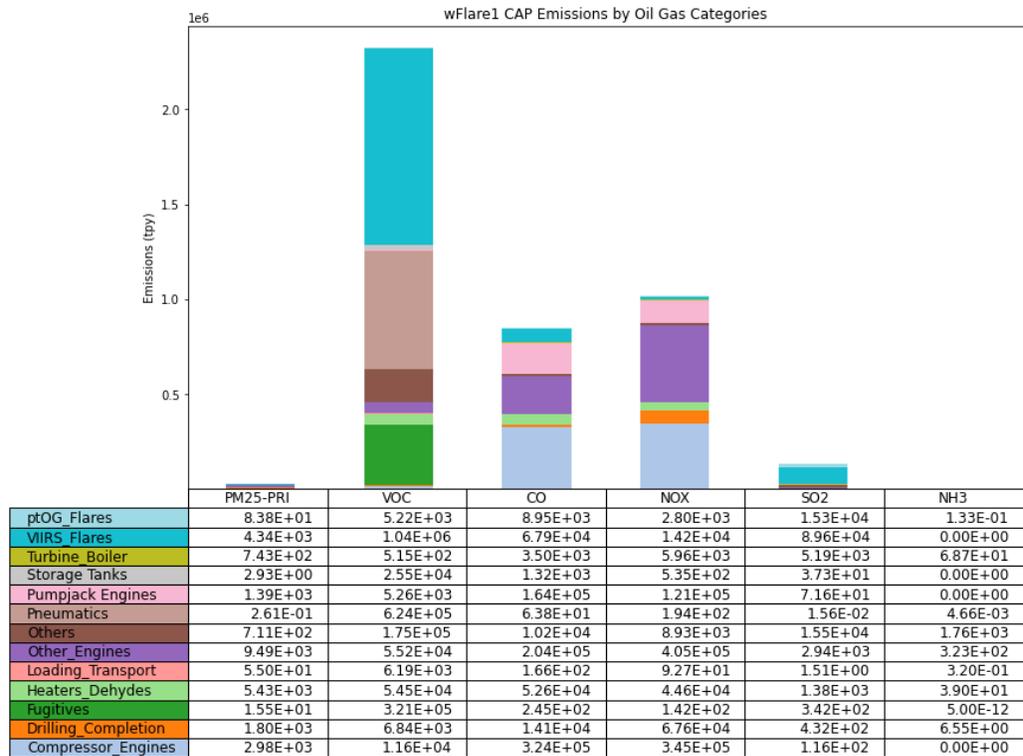


Figure S3. Emissions of criteria pollutants from O&G categories in wFlare1

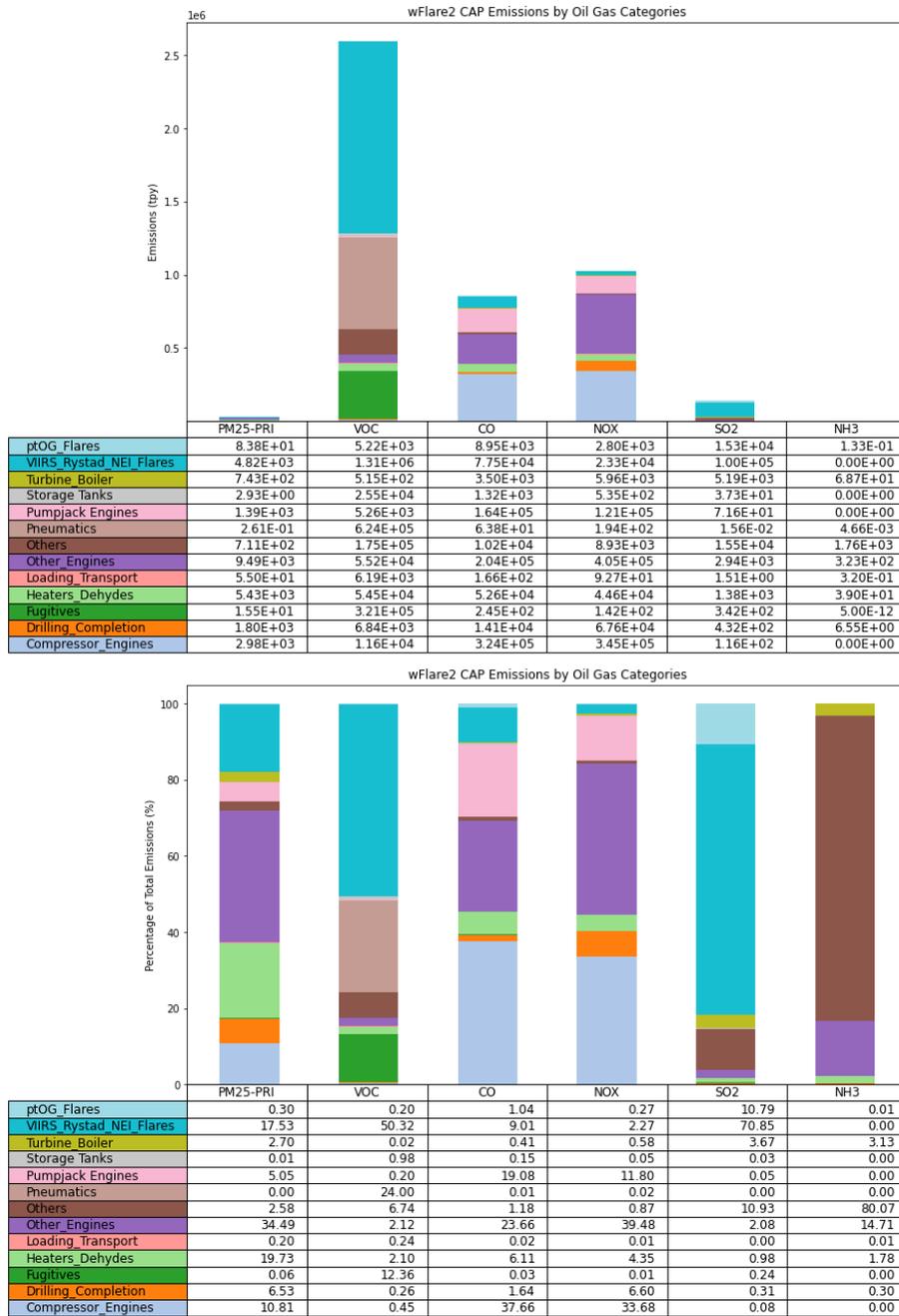


Figure S4. Emission of criteria pollutants from O&G categories in wFlare2

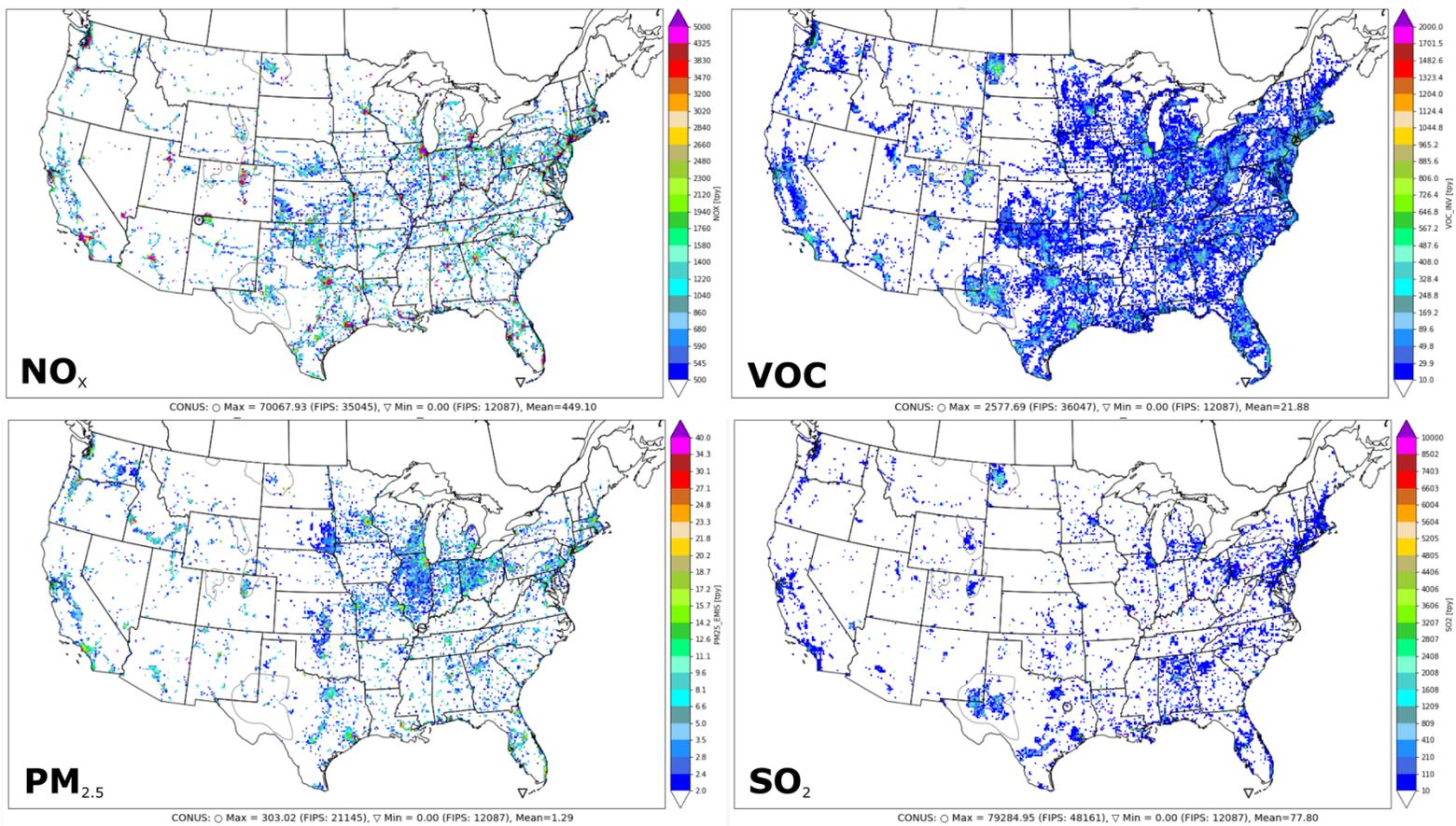


Figure S5. Annual anthropogenic emissions (tpy) of criteria pollutants NO_x, VOC, PM_{2.5} and SO₂ in wFlare2 scenario

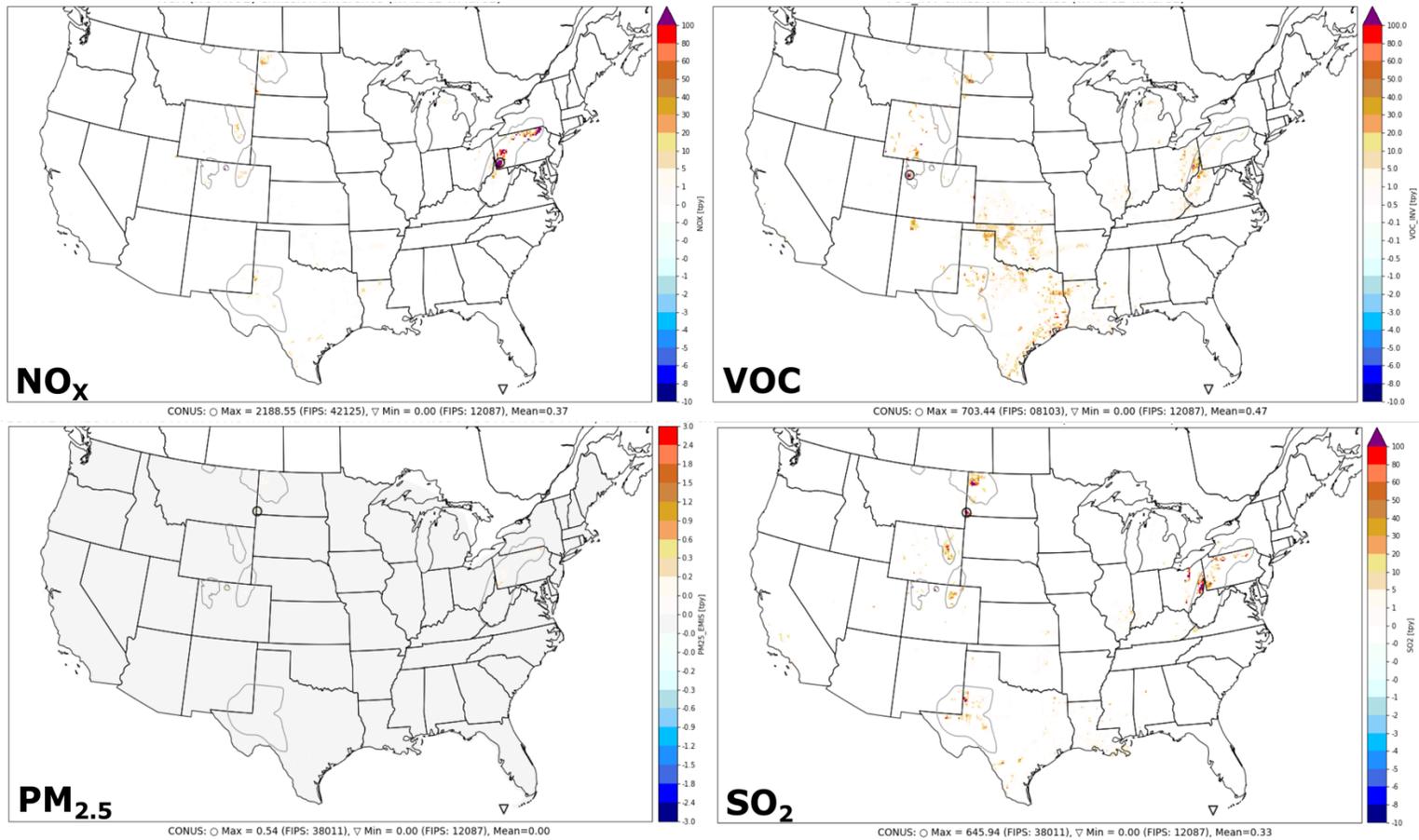


Figure S6. Differences in annual anthropogenic emissions (tpy) of criteria pollutants NO_x, VOC, PM_{2.5} and SO₂ counties between wFlare2-wFlare1 scenarios

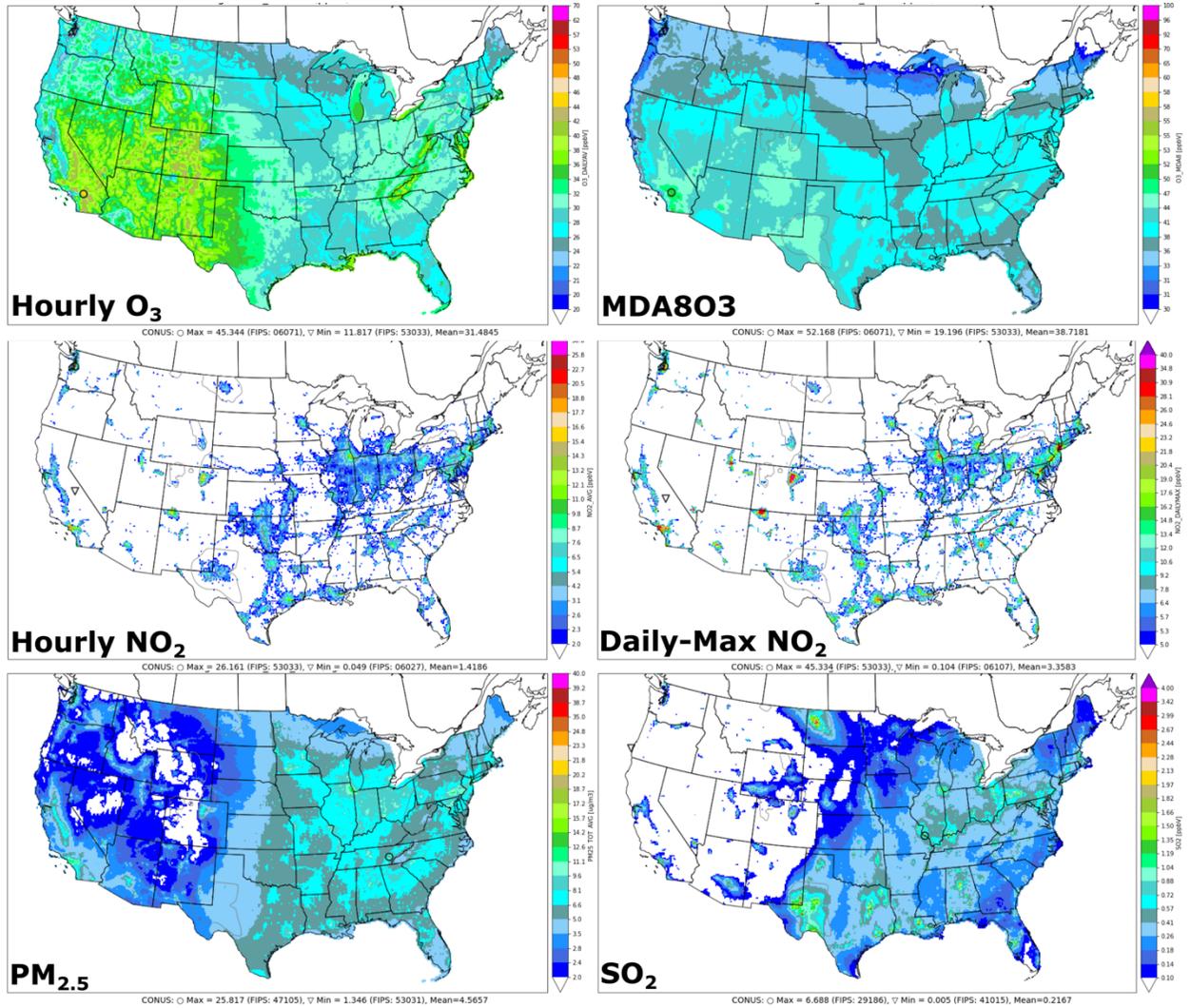


Figure S7. Annual averaged concentrations of hourly O₃ and MDA8O₃ (ppb), daily-average and daily-max NO₂ (ppb), PM_{2.5} ($\mu\text{g}/\text{m}^3$), and SO₂ (ppb) as simulated in wFlare2 scenario

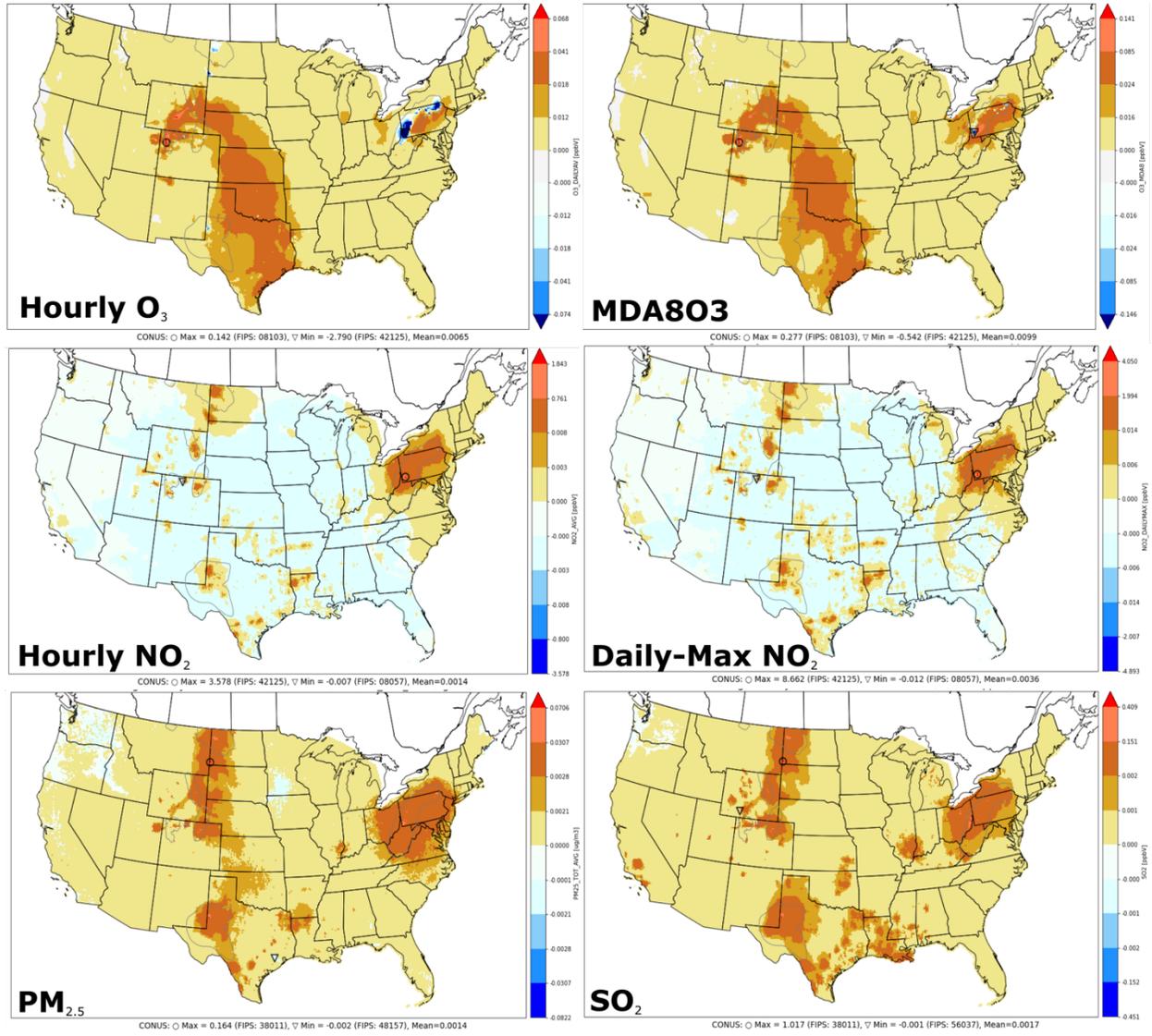


Figure S8. Differences (wFlare2 - wFlare1) between the two F&V emission scenarios in annual averages of MDA8 Ozone (ppb), 24-hour average PM_{2.5} (µg/m³), daily-average and daily-maximum NO₂ concentrations (ppb), and SO₂ (ppb)

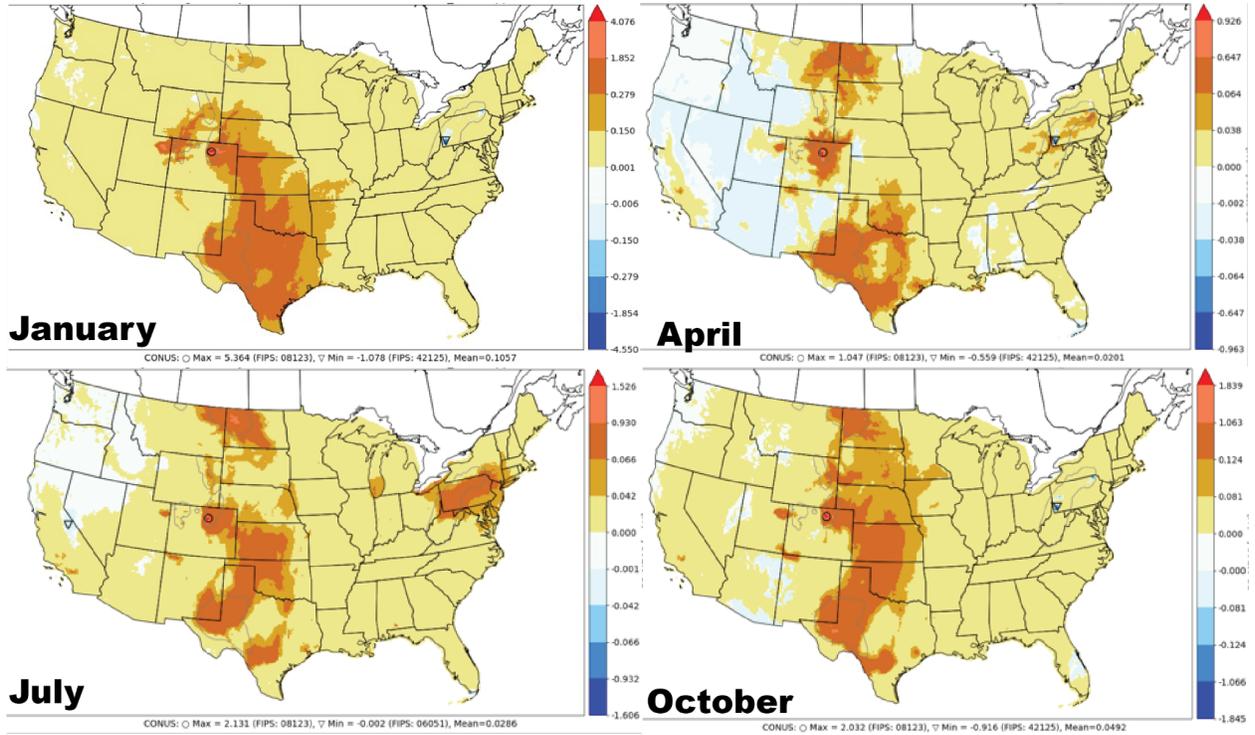


Figure S9. Differences (wFlare2 - woFlare) of monthly average MDA8O3 (ppb)

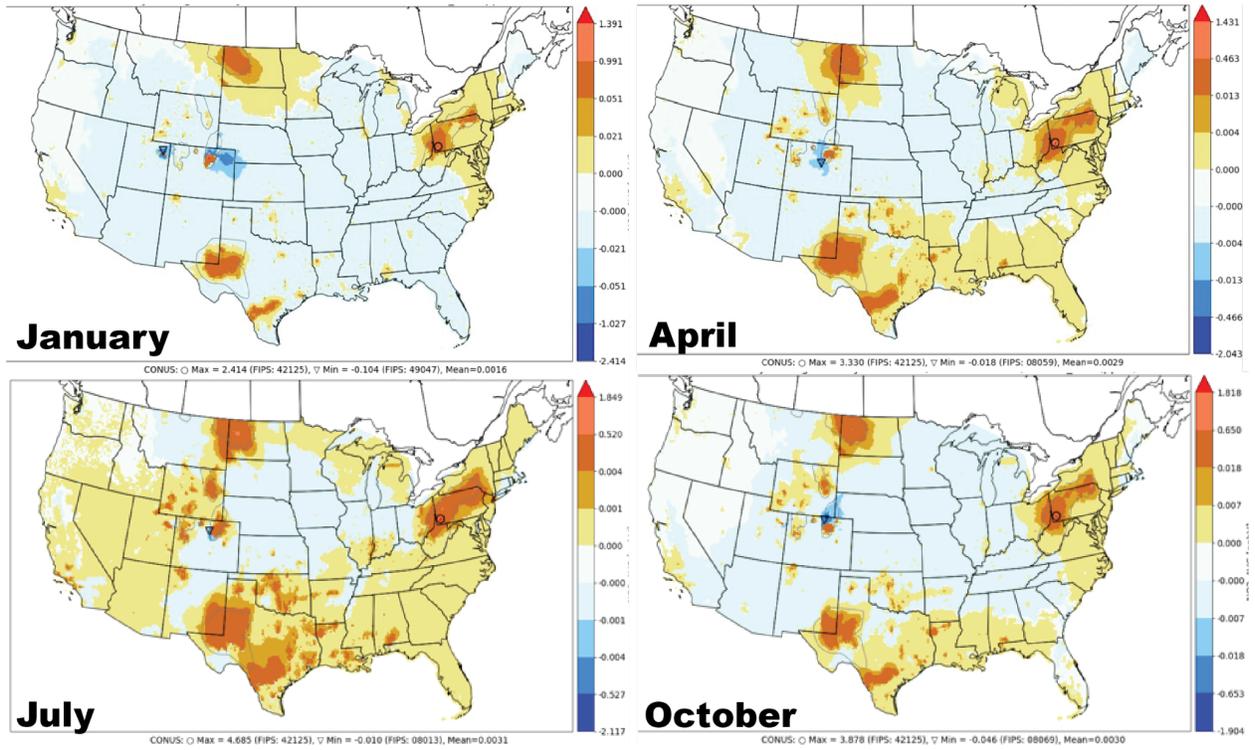


Figure S10. Differences (wFlare2 - woFlare) of monthly average NO2 (ppb)

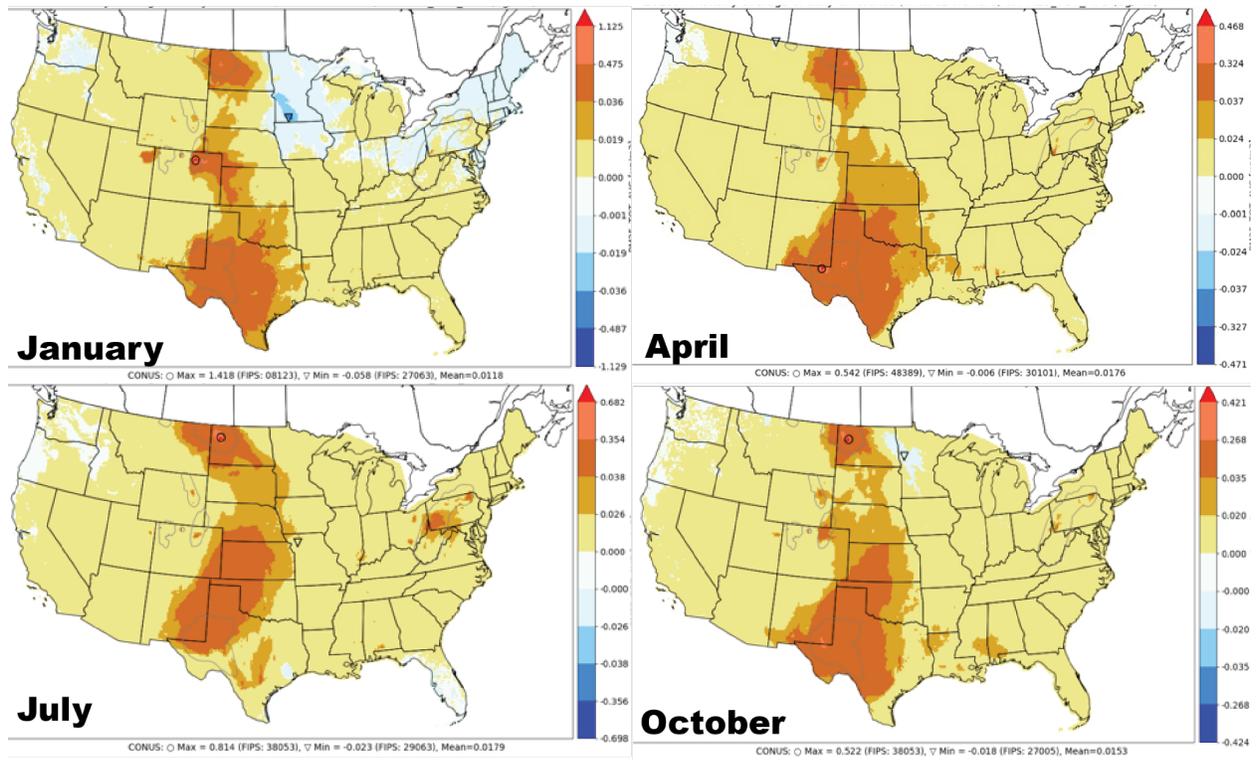


Figure S11. Differences (wFlare2 – woFlare) of monthly average PM_{2.5} ($\mu\text{g}/\text{m}^3$)

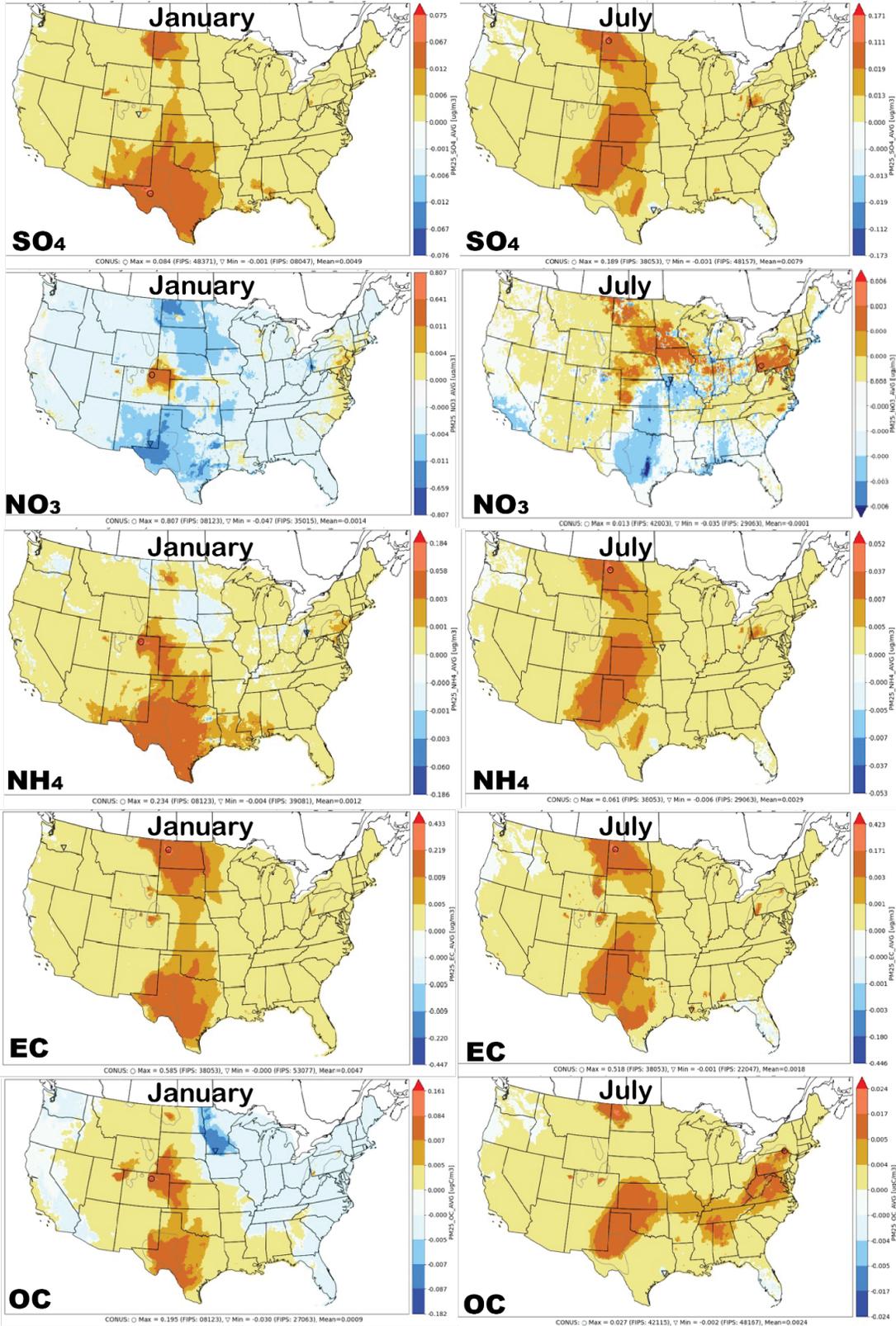


Figure S12. Differences of monthly average $PM_{2.5}$ chemical components (wFlare2 – woFlare) in (left column) January and (right column) July

Table S1. Source Classification Codes (SCCs) associated with point O&G sources

SCC	Descriptions
31000160	Industrial Processes; Oil and Gas Production; Crude Oil Production; Flares
31000205	Industrial Processes; Oil and Gas Production; Natural Gas Production; Flares
31000215	Industrial Processes; Oil and Gas Production; Natural Gas Production; Flares Combusting Gases :1000 BTU/scf
30600903	Industrial Processes; Petroleum Industry; Flares; Natural Gas
20190099	Internal Combustion Engines; Electric Generation; Flares; Heavy Water
30190022	Industrial Processes; Chemical Manufacturing; Fuel Fired Equipment; Flare: Residual Oil
30190023	Industrial Processes; Chemical Manufacturing; Fuel Fired Equipment; Flare: Natural Gas
30390023	Industrial Processes; Primary Metal Production; Fuel Fired Equipment; Natural Gas: Flares
30590023	Industrial Processes; Mineral Products; Fuel Fired Equipment; Natural Gas: Flares
30600401	Industrial Processes; Petroleum Industry; Blowdown Systems; Blowdown System with Vapor Recovery System with Flaring
30600904	Industrial Processes; Petroleum Industry; Flares; Process Gas
30600905	Industrial Processes; Petroleum Industry; Flares; Liquefied Petroleum Gas
30600906	Industrial Processes; Petroleum Industry; Flares; Hydrogen Sulfide
30600999	Industrial Processes; Petroleum Industry; Flares; Not Classified **
31000216	Industrial Processes; Oil and Gas Production; Natural Gas Production; Flares Combusting Gases <1000 BTU/scf
30990023	Industrial Processes; Fabricated Metal Products; Fuel Fired Equipment; Natural Gas: Flares
39990023	Industrial Processes; Miscellaneous Manufacturing Industries; Miscellaneous Manufacturing Industries; Natural Gas: Flares
39990024	Industrial Processes; Miscellaneous Manufacturing Industries; Miscellaneous Manufacturing Industries; Process Gas: Flares
40290023	Chemical Evaporation; Surface Coating Operations; Fuel Fired Equipment; Natural Gas: Flares
49090023	Chemical Evaporation; Organic Solvent Evaporation; Fuel Fired Equipment; Flare: Natural Gas
50100410	Waste Disposal; Solid Waste Disposal - Government; Landfill Dump; Waste Gas Destruction: Waste Gas Flares
50300601	Waste Disposal; Solid Waste Disposal - Industrial; Landfill Dump; Waste Gas Flares

Table S2. Source Classification Codes (SCCs) associated with well completion flaring

SCC	Short Descriptions
2310111700	On-Shore Oil Exploration: Oil Well Completion: All Processes
2310121700	On-Shore Gas Exploration: Gas Well Completion: All Processes
2310023600	On-Shore CBM Exploration: CBM Well Completion: All Processes
2310111701	On-Shore Oil Exploration; Oil Well Completion: Flaring
2310021500	On-Shore Gas Production; Gas Well Completion - Flaring

Table S3. Source Classification Codes (SCCs) associated with nonpoint O&G sources

SCC	Descriptions
2310011000	On shore crude oil production all processes (casinghead gas)
2310021000	On shore gas production: all processes
2310011020	On shore oil production crude tanks (including flash)
2310021010	On-shore gas production: storage tanks: condensate (including flash)
2310030220	Gas Well Tanks - Flashing & Standing/Working/Breathing, Controlled
2310023010	On-shore gas production; Coal Bed Methane Natural Gas; Storage Tanks: Condensate
2310021400	On-shore gas production dehydrators
2310011201	On shore oil production truck/rail loading of crude
2310021030	On shore gas production truck and rail loading of condensate
2310011001	On-Shore Oil Production; Associated Gas Venting
2310010200	Oil & Gas Exploration & Production /Crude Petroleum /Oil Well Tanks - Flashing & Standing/Working/Breathing
2310021603	On-Shore Gas Production / Gas Well Venting - Blowdowns
2310011450	On-Shore Oil Production; Wellhead
2310021450	On-Shore Gas Production; Wellhead

Table S4. Annual natural gas flared volume (MCM/yr) as estimated by VIIRS and Rystad

States	VIIRS 2017	VIIRS 2018	VIIRS 2019	VIIRS 2020	RYSTAD 2019
Texas	4,850	6,753	8,958	6,577	5,851
North Dakota	3,230	5,180	6,093	3,809	5,815
New Mexico	644	1,169	1,394	1,026	1,048
Louisiana	194	202	276	356	N/A
Alaska	210	206	231	220	N/A
Wyoming	128	155	128	72	247
Oklahoma	102	150	99	80	N/A
Montana	11	69	86	54	N/A
Utah	35	54	57	45	N/A
Mississippi	73	65	44	39	N/A
Colorado	41	65	22	18	136
Pennsylvania	18	33	22	4	N/A

Table S5. Flared gas parameters from O&G production fields in Texas

Production fields	Molecular Weight of flared gas (g/mole)	H₂S weight content (W_{H2S})
Anadarko	21.8	0.06
Fort Worth	23.4	0.20
Eagle Ford	23.7	0.17
East Texas	21.7	0.95
Marathon Thrust Belt	28.6	0.01
Palo Duro	23.7	0.01
Permian	28.6	0.50

Table S6. Annual emissions (tpy) of criteria pollutants from flaring and venting in top 5 states

		PM _{2.5}	VOC	CO	NO _x	SO ₂
Colorado	<i>NEI 2017 point flare</i>	1	1,800	1,150	348	23
	<i>NEI 2017 nonpoint flare</i>	0	81,900	0	868	0
	<i>Total NEI2017 flare</i>	1	83,700	1,150	1,220	23
	<i>VIIRS + Rystad + NEI hybrid</i>	39 (6.5%)	83,672 (70.6%)	1,728 (5.7%)	491 (1.1%)	784 (69.6%)
	Ratio**	29.2	1.0	1.5	0.4	34.2
Texas	<i>NEI 2017 point flare</i>	9	604	2,780	1,010	6,820
	<i>NEI 2017 nonpoint flare</i>	0	569,000	20,600	4,580	23,300
	<i>Total NEI2017 flare</i>	9	570,000	23,400	5,590	30,100
	<i>VIIRS + Rystad + NEI hybrid</i>	2,244 (29.8%)	578,902 (63.1%)	38,112 (18.4%)	8,440 (3.0%)	53,336 (91.5%)
	Ratio	240.6	1.0	1.6	1.5	1.8
Wyoming	<i>NEI 2017 point flare</i>	4	385	338	264	2,130
	<i>NEI 2017 nonpoint flare</i>	0	54,600	652	2,610	56
	<i>Total NEI2017 flare</i>	4	55,000	990	2,870	2,190
	<i>VIIRS + Rystad + NEI hybrid</i>	69 (4.8%)	55,964 (58.8%)	1,361 (9.4%)	479 (1.7%)	3,487 (61.0%)
	Ratio	15.9	1.0	1.4	0.2	1.6
New Mexico	<i>NEI 2017 point flare</i>	1	311	425	109	2,470
	<i>NEI 2017 nonpoint flare</i>	1	74,900	705	137	2,170
	<i>Total NEI2017 flare</i>	2	75,200	1,130	246	4,640
	<i>VIIRS + Rystad + NEI hybrid</i>	370 (29.1%)	84,177 (52.0%)	6,189 (9.4%)	1,319 (2.4%)	10,019 (77.5%)
	Ratio	222.9	1.1	5.5	5.4	2.2
North Dakota	<i>NEI 2017 point flare</i>	2	17	115	27	532
	<i>NEI 2017 nonpoint flare</i>	0	308,000	11,200	2,110	2,490
	<i>Total NEI2017 flare</i>	2	308,000	11,300	2,140	3,020
	<i>VIIRS + Rystad + NEI hybrid</i>	1,713 (62.7%)	307,755 (84.6%)	26,886 (60.4%)	5,638 (22.0%)	35,900 (85.7%)
	Ratio	1068.8	1.0	2.4	2.6	11.9
Continental USA	<i>VIIRS + Rystad + NEI hybrid</i>	4,907 (17.8%)	1,312,511 (50.5%)	86,484 (10.0%)	26,067 (2.5%)	115,505 (81.6%)

* Numbers in parentheses indicate percentage of emissions from FV to total emissions from O&G

** Ratio of VIIRS + Rystad + NEI hybrid-flare emissions over NEI 2017 flare

Table S7. Contribution of FV to NAAQS exceedances in 2016

States	MDA803 > 70 ppbV	24-hour PM _{2.5} > 35 µg/m ³	Daily Max NO ₂ > 60 ppbV*	Annual PM _{2.5} > 10 µg/m ³ **
Colorado	65	0	9	0
Texas	31	0	0	0
California	20	0	0	0
Pennsylvania	17	1	0	3
Michigan	13	0	0	0
North Dakota	0	0	0	0
New Mexico	0	0	0	0
Wyoming	0	0	0	0
Remaining CONUS	64	-1	1	1

* Showing hypothesized daily-maximum NO₂ exceedances if the current ambient standard (100 ppbV) is lowered to 60 ppbV.

** Showing hypothesized annual PM_{2.5} exceedances if the current annual standard (12 µg/m³) is lowered to 10 µg/m³ as being considered in latest EPA's proposal (EPA, 2023).

Table S8: Baseline health data for included health outcomes, associated pollutants, sources, years, and spatial resolution

Health Outcome	Pollutant	Background Prevalence/Incidence Data		
		Source	Year	Spatial Resolution
Mortality	PM _{2.5}	U.S. Centers for Disease Control Wide-ranging Online Database for Epidemiological Research (CDC WONDER) ⁵	1999 - 2016	County
Mortality	O ₃	U.S. Centers for Disease Control Wide-ranging Online Database for Epidemiological Research (CDC WONDER)	1999 - 2016	County
Mortality	NO ₂	U.S. Centers for Disease Control Wide-ranging Online Database for Epidemiological Research (CDC WONDER)	1999 - 2016	County
Respiratory Hospitalizations	PM _{2.5}	BenMAP and Health Care Utilization Project (HCUP) ⁶	2011 - 2014, varies by outcome	State
Cardiovascular Hospitalizations	PM _{2.5}	BenMAP and Health Care Utilization Project (HCUP)	2011 - 2014, varies by outcome	State
Heart Attacks (acute non-fatal)	PM _{2.5}	BenMAP and Health Care Utilization Project (HCUP)	2011 - 2014, varies by outcome	State
Heart Attacks (acute non-fatal)	NO ₂	BenMAP and Health Care Utilization Project (HCUP)	2011 - 2014, varies by outcome	State
Respiratory Hospitalizations	O ₃	BenMAP and Health Care Utilization Project (HCUP)	2011 - 2014, varies by outcome	State
Asthma Incidence	PM _{2.5}	Winer et al. (2012)	2006 - 2008	National
Asthma Incidence	NO ₂	Winer et al. (2012)	2006 - 2008	National

⁵ <https://wonder.cdc.gov>

⁶ <https://hcup-us.ahrq.gov>

Health Outcome	Pollutant	Background Prevalence/Incidence Data		
		Source	Year	Spatial Resolution
Asthma Exacerbations	PM _{2.5}	State Prevalence: https://ephtracking.cdc.gov/DataExplorer/ National Prevalence: https://www.cdc.gov/asthma/nhis/2017/table4-1.htm Exacerbation Rate: Ostro et al., 2001	1993	State and National
Asthma Exacerbations	NO ₂	State Prevalence: https://ephtracking.cdc.gov/DataExplorer/ National Prevalence: https://www.cdc.gov/asthma/nhis/2017/table4-1.htm Exacerbation Rate: Ostro et al., 2001	1993	State and National
Preterm Birth	PM _{2.5}	U.S. Centers for Disease Control Wide-ranging Online Database for Epidemiological Research (CDC WONDER)	2018	State and National
Low Birth Weight	PM _{2.5}	U.S. Centers for Disease Control Wide-ranging Online Database for Epidemiological Research (CDC WONDER)	2018	State and National

Table S9. Concentration response functions for all health outcomes

		Concentration-Response Function			
Health Outcome	Population at risk	Study	Pollutant	Metric	CRF central estimate (95% CI)
Mortality	Adults ≥ 25 years of age	(Vodonos et al., 2018)	PM _{2.5}	Annual Average PM _{2.5} (µg/ m ³)	1.29% (1.09 - 1.5%) [note: slope at 10µg/m ³]
Mortality	Adults ≥ 25 years of age	(Turner et al., 2016)	O ₃	Annual Average of the 8hr Maximum Daily Average (ppb)	0.2% (0.1 - 0.4%)
Mortality	Adults ≥ 25 years of age	(Faustini et al., 2014)	NO ₂	Annual Average (µg/ m ³)	0.4% (0.2% - 0.6%)
Respiratory Hospitalizations	Adults ≥ 65 years of age	(Levy et al., 2012; Zanobetti et al., 2009)	PM _{2.5}	Daily Average (µg/ m ³)	0.11% (0.057 - 0.16%)
Cardiovascular Hospitalizations	Adults ≥ 65 years of age	(Levy et al., 2012; Zanobetti et al., 2009)	PM _{2.5}	Daily Average (µg/m ³)	0.094% (0.065 - 0.12)
Heart Attacks (acute non-fatal)	Adults ≥ 18 years of age	(Mustafic et al., 2012)	PM _{2.5}	Daily Average (µg/ m ³)	0.25% (0.15 - 0.36%)
Heart Attacks (acute non-fatal)	Adults ≥ 18 years of age	(Mustafic et al., 2012)	NO ₂	Daily Average (µg/ m ³)	0.11% (0.06 - 0.16%)
Respiratory Hospitalizations	Adults ≥ 65 years of age	(Ji et al., 2011)	O ₃	Annual Average of the 8-hr max (ppb)	0.16% (0.058 - 0.26%)
Asthma Incidence	Children 5 -17 years of age	(Khreis et al., 2017)	PM _{2.5}	Annual Average (µg/ m ³)	3.0% (1.0 - 4.9%)
Asthma Incidence	Children 5 -17 years of age	(Khreis et al., 2017)	NO ₂	Annual Average (µg/ m ³)	1.2% (0.5 - 1.7%)
Asthma Exacerbations	Children 5 -17 years of age	(Orellano et al., 2017)	PM _{2.5}	Annual Average (µg/ m ³)	0.22% (0 - 0.44%)
Asthma Exacerbations	Children 5 -17 years of age	(Orellano et al., 2017)	NO ₂	Annual Average (µg/ m ³)	0.39% (0.01 - 0.78%)
Asthma Exacerbations	Children 5 -17 years of age	(Alhanti et al., 2016)	PM _{2.5}	Annual Average (µg/ m ³)	0.25% (0.13 - 0.5%)
Asthma Exacerbations	Children 5 -17 years of age	(Alhanti et al., 2016)	O ₃	Annual Average of the 8hr Maximum Daily Average (ppb)	0.25% (0.14 - 0.36%)

		Concentration-Response Function			
Health Outcome	Population at risk	Study	Pollutant	Metric	CRF central estimate (95% CI)
Asthma Exacerbations	Children 5 -17 years of age	(Alhanti et al., 2016)	NO ₂	Annual Average of the 1hr Maximum Daily Average (ppb)	0.42% (0.33 - 0.58%)
Asthma ED Visits	Children 5 -17 years of age	(Alhanti et al., 2016)	PM _{2.5}	Annual Average (µg/m ³)	0.25% (0.13 - 0.5%)
Asthma ED Visits	Children 5 -17 years of age	(Alhanti et al., 2016)	O ₃	Annual Average of the 8hr Maximum Daily Average (ppb)	0.25% (0.14 - 0.36%)
Asthma ED Visits	Children 5 -17 years of age	(Alhanti et al., 2016)	NO ₂	Annual Average of the 1hr Maximum Daily Average (ppb)	0.42% (0.33 - 0.58%)
Asthma Hospitalizations	Children 5 -17 years of age	(Alhanti et al., 2016)	PM _{2.5}	Annual Average (µg/m ³)	0.25% (0.13 - 0.5%)
Asthma Hospitalizations	Children 5 -17 years of age	(Alhanti et al., 2016)	O ₃	Annual Average of the 8hr Maximum Daily Average (ppb)	0.25% (0.14 - 0.36%)
Asthma Hospitalizations	Children 5 -17 years of age	(Alhanti et al., 2016)	NO ₂	Annual Average of the 1hr Maximum Daily Average (ppb)	0.42% (0.33 - 0.58%)
Preterm Birth	Infants	(Sun et al., 2015)	PM _{2.5}	Annual Average (µg/m ³)	1.2% (0.29 - 2.1%)
Low Birth Weight	Infants	(Sun et al., 2016)	PM _{2.5}	Annual Average (µg/m ³)	0.86% (0.31 - 1.4%)
Autism Spectrum Disorder	Infants	(Becerra et al., 2013)	PM _{2.5}	Annual Average (µg/m ³)	0.014% (0 - 0.03%)

Table S10. Valuation functions for all outcomes evaluated

Health Outcome	Pollutant	Valuation (\$2016 USD)	
		Value (low - high, if it exists)	Source
Mortality	PM _{2.5}	\$10.3 million (\$6.2 - \$14.5 million)	U.S. EPA BenMAP
Mortality	O ₃	\$10.3 million (\$6.2 - \$14.5 million)	U.S. EPA BenMAP
Mortality	NO ₂	\$10.3 million (\$6.2 - \$14.5 million)	U.S. EPA BenMAP
Respiratory Hospitalizations	PM _{2.5}	\$36,000	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Cardiovascular Hospitalizations	PM _{2.5}	\$30,000	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Heart Attacks (acute non-fatal)	PM _{2.5}	\$70,000	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Heart Attacks (acute non-fatal)	NO ₂	\$70,000	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Respiratory Hospitalizations	O ₃	\$36,000	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Asthma Incidence	PM _{2.5}	\$58,000 (24,000 - 93,000)	Nurmagambetov et al. (2018)
Asthma Incidence	NO ₂	\$58,000 (24,000 - 93,000)	Nurmagambetov et al. (2018)
Asthma Exacerbations	PM _{2.5}	\$60 (\$22 - \$99)	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Asthma Exacerbations	NO ₂	\$60 (\$22 - \$99)	U.S. EPA BenMAP, Health Care Utilization Project, Agency for Healthcare Research and Quality
Preterm Birth	PM _{2.5}	\$330,000	Institute of Medicine (2007), Kerr-Wilson et al. (2012)
Low Birth Weight	PM _{2.5}	\$16,000	Russell et al. (2007)

Table S11: Case counts and health impact valuation due to FV

Health Outcome	Pollutant	Cases	Value (2016 USD)
Deaths (Vodonos et al.)	PM _{2.5}	360 (300 - 420)	\$3,700,000,000 (\$1,900,000,000 - \$6,000,000,000)
Deaths (Turner et al.)	O ₃	230 (120 - 470)	\$2,400,000,000 (\$720,000,000 - \$6,800,000,000)
Deaths (Faustini et al.)	NO ₂	120 (61 - 180)	\$1,300,000,000 (\$380,000,000 - \$2,700,000,000)
Cardiovascular Hospitalizations (Levy & Zanobetti Pooled)	PM _{2.5}	18 (12 - 24)	\$650,000 (\$440,000 - \$850,000)
Respiratory Hospitalizations (Levy & Zanobetti Pooled)	PM _{2.5}	19 (9.8 - 28)	\$570,000 (\$290,000 - \$840,000)
Respiratory Hospitalizations (Ji et al.)	O ₃	110 (40 - 180)	\$3,400,000 (\$1,200,000 - \$5,500,000)
Heart Attacks (Mustafić et al.)	PM _{2.5}	16 (9.7 - 23)	\$1,100,000 (\$680,000 - \$1,600,000)
Heart Attacks (Mustafić et al.)	NO ₂	6.9 (3.7 - 10)	\$480,000 (\$260,000 - \$700,000)
Asthma Incidence (Khreis et al.)	PM _{2.5}	140 (47 - 230)	\$8,200,000 (\$1,100,000 - \$22,000,000)
Asthma Incidence (Khreis et al.)	NO ₂	47 (19 - 65)	\$2,800,000 (\$460,000 - \$6,100,000)
Asthma Hospitalizations (Orellano et al.)	PM _{2.5}	1.1 (0 - 2.2)	\$20,000 (\$0 - \$41,000)
Asthma Hospitalizations (Orellano et al.)	NO ₂	2.1 (0.053 - 4.1)	\$38,000 (\$960 - \$75,000)
Asthma ED Visits (Orellano et al.)	PM _{2.5}	11 (0 - 22)	\$5,000 (\$0 - \$10,000)
Asthma ED Visits (Orellano et al.)	NO ₂	17 (0.43 - 34)	\$7,700 (\$190 - \$16,000)
Asthma Exacerbations (Orellano et al.)	PM _{2.5}	8,500 (0 - 17,000)	\$500,000 (\$0 - \$1,700,000)
Asthma Exacerbations (Orellano et al.)	NO ₂	13,000 (340 - 26,000)	\$790,000 (\$7,300 - \$2,600,000)

Health Outcome	Pollutant	Cases	Value (2016 USD)
Asthma Hospitalizations (Alhanti et al.)	PM _{2.5}	1.3 (0.63 - 2.5)	\$23,000 (\$12,000 - \$46,000)
Asthma Hospitalizations (Alhanti et al.)	O ₃	5.7 (3.2 - 8.1)	\$100,000 (\$59,000 - \$150,000)
Asthma Hospitalizations (Alhanti et al.)	NO ₂	3.2 (2.5 - 4.5)	\$58,000 (\$46,000 - \$81,000)
Asthma ED Visits (Alhanti et al.)	PM _{2.5}	13 (6.3 - 25)	\$5,700 (\$2,700 - \$12,000)
Asthma ED Visits (Alhanti et al.)	O ₃	54 (31 - 77)	\$24,000 (\$13,000 - \$36,000)
Asthma ED Visits (Alhanti et al.)	NO ₂	25 (20 - 36)	\$11,000 (\$8,800 - \$17,000)
Asthma Exacerbations (Alhanti et al.)	PM _{2.5}	9,700 (4,900 - 19,000)	\$580,000 (\$110,000 - \$1,900,000)
Asthma Exacerbations (Alhanti et al.)	O ₃	43,000 (24,000 - 61,000)	\$2,500,000 (\$530,000 - \$6,000,000)
Asthma Exacerbations (Alhanti et al.)	NO ₂	21,000 (16,000 - 29,000)	\$1,200,000 (\$360,000 - \$2,800,000)
Low Birth Weight (Sun et al.)	PM _{2.5}	25 (8.9 - 40)	\$390,000 (\$140,000 - \$630,000)
Preterm Birth (Sun et al.)	PM _{2.5}	64 (16 - 110)	\$21,000,000 (\$5,100,000 - \$37,000,000)
Autism Spectrum Disorder (Becerra et al.)	PM _{2.5}	18 (0 - 36)	\$44,000,000 (\$0 - \$110,000,000)
Deaths	All Three	710 (480 - 1,100)	\$7,300,000,000 (\$3,000,000,000 - \$16,000,000,000)
Asthma Incidence	PM _{2.5} and NO ₂	190 (66 - 300)	\$11,000,000 (\$1,600,000 - \$28,000,000)
Asthma Hospitalizations Orellano	PM _{2.5} and NO ₂	3.2 (0.053 - 6.3)	\$58,000 (\$960 - \$120,000)
Asthma ED Visits Orellano	PM _{2.5} and NO ₂	28	\$13,000

Health Outcome	Pollutant	Cases	Value (2016 USD)
		(0.43 - 56)	(\$190 - \$26,000)
Asthma Exacerbations Orellano	PM _{2.5} and NO ₂	22,000 (340 - 43,000)	\$1,300,000 (\$7,300 - \$4,300,000)
Asthma Hospitalizations Alhanti	All Three	10 (6.4 - 15)	\$180,000 (\$120,000 - \$280,000)
Asthma ED Visits Alhanti	All Three	92 (58 - 140)	\$42,000 (\$25,000 - \$65,000)
Asthma Exacerbations Alhanti	All Three	73,000 (46,000 - 110,000)	\$4,300,000 (\$990,000 - \$11,000,000)
Respiratory Hospitalizations	PM _{2.5} and O ₃	130 (50 - 210)	\$3,900,000 (\$1,500,000 - \$6,400,000)
Heart Attacks	PM _{2.5} and NO ₂	23 (13 - 33)	\$1,600,000 (\$940,000 - \$2,300,000)
Grand Total*			\$7,400,000,000 (\$3,000,000,000 - \$16,000,000,000) **

*Grand Total includes summations of: Deaths, Asthma Incidence, Asthma Hospitalizations (Alhanti), Asthma Exacerbations (Alhanti), Asthma ED Visits (Alhanti), Respiratory Hospitalizations, and Heart Attacks

**Sums may not add up perfectly due to independent rounding

Table S12. Flaring and Venting Impacts on Disadvantaged Populations

Justice 40 Category	Health outcome	Cases occurring within Justice40 tracts	All attributable wFlare2 cases	% of Health Impact Cases occurring within Justice 40 tracts
Is Low Income (tracts in 65 th percentile or above of household income 200% below Federal Poverty Limit, excluding students)?	Adult Premature Mortality	220	710	31%
	Childhood Asthma Exacerbations	22,000	73,000	30%
Native-identified Tracts (Greater than or equal to the 65th percentile for “American Indian/Alaska Native” as a percent of total reported population)	Adult Premature Mortality	65	710	9%
	Childhood Asthma Exacerbations	6,600	73,000	9%
Hispanic/Latino-identified Tracts (Greater than or equal to the 65th percentile for “Hispanic / Latino” as a percent of total reported population)	Adult Premature Mortality	230	710	32%
	Childhood Asthma Exacerbations	29,000	73,000	40%

Table S13: Impact Risk Ratio (IRR) of Flaring and Venting Impacts on Disadvantaged Populations*

		Adult Premature Mortality	Childhood Asthma Exacerbations
Is Low Income (tracts in 65 th percentile or above of household income 200% below Federal Poverty Limit, excluding students)?	Proportion of cases occurring in this category of tract	0.31	0.30
	Proportion of populations in age groups at risk in this category of tract	0.30	0.33
	How disproportionate is the impact (IRR)	1.0	0.92
Native-identified Tracts (Greater than or equal to the 65th percentile for “American Indian/Alaska Native” as a percent of total reported population)	Proportion of cases occurring in this category of tract	0.091	0.091
	Proportion of populations in age groups at risk in this category of tract	0.077	0.082
	How disproportionate is the impact (IRR)	1.2	1.1
Hispanic/Latino-identified Tracts (Greater than or equal to the 65th percentile for “Hispanic / Latino” as a percent of total reported population)	Proportion of cases occurring in this category of tract	0.32	0.4
	Proportion of populations in age groups at risk in this category of tract	0.33	0.36
	How disproportionate is the impact (IRR)	0.97	1.1

*All numbers have been independently rounded to 2 significant figures