Measuring Atmospheric CO₂ Enhancements From the 2017 British Columbia Wildfires Using a Lidar

Jianping Mao, James B. Abshires, Stephan R. Kawa, Haris Riris, Xiaoli Sun, Niels Andela, and Paul T. Kolbeck

Abstract During the summer 2017 ASCENDS/ABOVE airborne science campaign, the NASA Goddard CO₂ Sounder lidar overflew smoke plumes from wildfires in the British Columbia, Canada. In the flight path over Vancouver Island on 8 August 2017, the column XCO₂ retrievals from the lidar measurements at flight altitudes around 9 km showed an average enhancement of 4 ppm from the wildfires. A comparison of these enhancements with those from the Goddard Global Chemistry Transport model suggested that the modeled CO₂ emissions from wildfires were underestimated by more than a factor of 2. A spiral-down validation performed at Moses Lake airport, Washington showed a bias of 0.1 ppm relative to in situ measurements and a standard deviation of 1 ppm in lidar XCO₂ retrievals. The results show that future airborne campaigns and spaceborne missions with this type of lidar can improve estimates of CO₂ emissions from wildfires and estimates of carbon fluxes globally.

Plain Language Summary Wildfires are a major source of greenhouse gases. However, there are large uncertainties in the estimated CO₂ emissions from wildfires in global emissions inventories. The estimates of column-averaged CO₂ (XCO₂) from satellite measurements using passive remote sensing techniques are significantly degraded or screened out by the scattering from smoke in the scene. NASA Goddard Space Flight Center has developed an integrated-path, differential absorption lidar approach to measure XCO₂ from space. Measurements of time-resolved laser backscatter profiles from the atmosphere allow this technique to accurately estimate XCO₂ and range to terrain and water surfaces even in the presence of wildfire smoke. We demonstrate this capability over Vancouver Island through the dense smoke plumes from wildfires in the Canadian Rockies during the summer 2017 ASCENDS/ABOVE airborne science campaign. To our knowledge this is the first use of lidar to remotely sense CO₂ enhancements from large wildfires. Future airborne campaigns and spaceborne missions with this capability can improve estimates of CO₂ emissions from wildfires and help estimates of carbon fluxes globally.

1. Introduction

Wildfires are a major source of greenhouse gases. Fires were responsible for as much as a fifth of the carbon released in 2019 from burning fossil fuels, down from about a quarter at the beginning of the century (Ciais et al., 2013; Le Quéré et al., 2018; Tian et al., 2016). While this long-term decrease in fire emissions was driven by a decline in savanna and grassland fires (Andela et al., 2017), a recent increase in forest fires has resulted in concerns about the future role of fire in the global carbon cycle. Total carbon emissions from forest fires in 2019 were 26% higher than in 2018, to 7.8 billion metric tons, the highest since 2002, according to the Global Fire Emissions Database (GFED; van der Werf et al., 2017). The unprecedented bushfires in Australia in 2019 emitted a combined 306 million metric tons of carbon dioxide (CO₂) in the August–November 2019 period, which is more than half of Australia’s total carbon footprint in the year. Brazilian Amazon fires emitted 392 million metric tons of CO₂ in 2019 which was equivalent to more than 80% of Brazil’s 2018 greenhouse gas emissions (Lombrana et al., 2020).

During 2017, Canada had a record-breaking wildfire season in the province of British Columbia (BC). A total of 1.2 million hectares had burned by the end of the 2017 fire season, the largest ever in the province (Duran, 2017) and massive smoke plumes were lofted into the stratosphere in the mid-August (Torres et al., 2020).
Generally, there are large uncertainties in the estimated CO₂ emissions from wildfires with fire emissions inventories (Andreae, 2019; Meyer et al., 2012). Ground-based and airborne measurements of fire emissions are few and are difficult to obtain. Atmospheric column-averaged dry air mole fraction of CO₂ (XCO₂) retrievals using surface reflected sunlight, for example, the Orbiting Carbon Observatory-2 (OCO-2; Crisp et al., 2004) and the Greenhouse gases Observation SATellite (GOSAT; Kuze et al., 2016) are significantly degraded by scattering effects of fire smoke in the scene (Aben et al., 2007; Butz et al., 2009; Guerlet et al., 2013; Houweling et al., 2005; Mao & Kawa, 2004; Uchino et al., 2012).

NASA Goddard Space Flight Center has developed an integrated-path, differential absorption (IPDA) lidar approach to measure global XCO₂ from space as a candidate for NASA’s planned Active Sensing of CO₂ Emissions over Nights, Days, and Seasons (ASCENDS) mission (Kawa et al., 2018). This pulsed laser approach uses a step-locked laser source and a high-efficiency detector to measure atmospheric absorption at multiple wavelengths across the CO₂ line centered at 1572.335 nm. It has a high spectral resolution and sub-ppm sensitivity to changes in XCO₂ (Abshire et al., 2018). Measurements of time-resolved atmospheric backscatter profiles allow this technique to estimate XCO₂ and range to any significant reflective surfaces with precise knowledge of the photon path-length even in the presence of atmospheric scattering (Mao et al., 2018; Ramanathan et al., 2015).

During July and August 2017, NASA conducted a joint ASCENDS/ABove (Arctic Boreal Vulnerability Experiment) airborne science campaign using the NASA DC-8 aircraft based in Fairbanks, Alaska (Mao et al., 2019). The CO₂ Sounder lidar measured XCO₂ from aircraft altitudes to ground, along with height-resolved backscatter profiles. Other instruments on the DC-8 aircraft included the NASA Langley Research Center ACES CO₂ lidar (Obland et al., 2018) along with a suite of in situ instruments including AVOCET for CO₂ (Halliday et al., 2019), Picarro for CO₂, CH₄, and H₂O, and an engineering test version of DLH for H₂O, CO, CH₄, and N₂O (Diskin et al., 2002). The DC-8 aircraft’s housekeeping data provided temperature, pressure, geolocation, and positioning such as altitude and pitch/roll angles at flight altitude. Its radar altimeter also provides a reference for ground elevation under all conditions since the radar measurement penetrates clouds and smoke.

During the return flight from Alaska to California on August 8, the aircraft overflew dense smoke plumes from fires in the Canadian Rockies on the segment from Vancouver Island to central Washington State. Here we present the XCO₂ and backscatter measurements over this region along with the validation spiral maneuver at Moses Lake airport in central Washington, performed shortly after the region of XCO₂ enhancement. We then compare the measured XCO₂ enhancements with those from the Goddard Parameterized Chemistry Transport Model (PCTM) using GFED. This case study demonstrates the capability of the CO₂ Sounder lidar approach to measure enhanced XCO₂ through dense smoke plumes, which allows improving the estimates of CO₂ emissions from wildfires.

2. Lidar Measurements From 2017 ASCENDS/ABoVE Airborne Science Campaign

2.1. 2017 ASCENDS/ABoVE Airborne Campaign to Alaska

The CO₂ Sounder lidar has flown on DC-8 five times since 2010 over a variety of sites in the US, along with other ASCENDS airborne lidar candidates and in situ CO₂ sensors (Abshire et al., 2010, 2013, 2014, 2018). The ASCENDS/ABoVE airborne science campaign to Alaska was the first to extend these lidar measurements to the arctic region. The 2017 campaign also allowed determining the horizontal gradients in XCO₂ during the long transit flights between California and Alaska. In all, eight flights were conducted over the Central Valley of California, the Northwest Territory Canada, and south and central Alaska between July 20 and August 8, 2017. Forty-seven vertical spiral maneuvers were conducted over a variety of atmospheres and surface types like desert, vegetation, permafrost, and both the Pacific and Arctic Oceans. The XCO₂ retrievals from the lidar measurements were validated against those computed from in situ measurements of CO₂ vertical profiles made during the spiral maneuvers.

The final flight of the campaign was conducted on August 8, 2017, based out of Fairbanks, AK and transited south back to Palmdale, CA (Figure 1, top panel). The flight had six spiral-down maneuvers when over land including ones at Northway airport in Alaska, Whitehorse airport in Yukon, Canada, Moses Lake airport
Figure 1. Top: map of the ground track for the return flight from Fairbanks, AK to Palmdale, CA on August 8, 2017. Fairbanks and the locations of eight spiral down flight segments are marked in circles, including two in-line descent-ascent maneuvers over Pacific Ocean labeled as Pacific 1 & Pacific 2. Bottom: 3-D (latitude, longitude, and flight altitude) sideview of in situ CO$_2$ mixing ratio measurements from onboard AVOCET for this flight. The data were sampled at 1-s intervals.
in Washington, Wildhorse airport in Oregon, Winnemucca airport in Nevada, and Edwards Air Force Base in California. The flight also conducted two in-line descent-ascent maneuvers above the Pacific Ocean just off the southern tip of Alaska before flying to Vancouver Island. Other than the spirals, almost all the flight was at 8–9 km altitude, except for the final segment between Reno NV and Edwards CA, which was flown at 12 km to allow sampling upper tropospheric air.

The bottom panel of Figure 1 shows in situ CO$_2$ concentrations at aircraft altitudes measured by AVOCET for the flight. AVOCET has a stated precision of ±0.1 ppm (1-sigma) and accuracy of ±0.25 ppm (Halliday et al., 2019). It shows significant horizontal and vertical gradients of CO$_2$ at the aircraft altitude, which is a typical seasonal pattern in the area. The CO$_2$ concentrations were higher near the surface at Fairbanks, Northway, and Whitehorse airports during the morning time of the flight due to the overnight accumulation of respiration and local emissions. Meanwhile, the higher CO$_2$ over Winnemucca, NV and Edwards Air Force Base, CA were presumably due to regional emissions, as there is little surface uptake over the deserts. The in situ measurements show high CO$_2$ in the free troposphere during the flight segment over Pacific Ocean and lower CO$_2$ in the following segment onto land before the spiral at Moses Lake, WA. It was notable that no outstanding CO$_2$ enhancements were seen at the aircraft altitude between the spirals at Pacific 2 and Moses Lake compared to CO$_2$ values at the same flight altitude before and after the segment.

2.2. XCO$_2$ Measurements From the CO$_2$ Sounder Lidar

The airborne CO$_2$ Sounder lidar uses a tunable laser to measure absorption across the vibration-rotational line of CO$_2$ centered at 1572.335 nm (Abshire et al., 2018). The lidar transmits 1-µs wide laser pulses at a rate of 10 kHz and the laser is stepped in 30 wavelengths across the CO$_2$ line at a rate of 300 Hz. The wavelength separation of each laser pulse was 250 MHz near line center and increased to 2 GHz at line wings to allow for more online samples. The laser line width is narrower than 30 MHz. The spectral resolution of the laser is over two hundred times higher than that of GOSAT, over three hundred times higher than that of OCO-2, and over 20 times higher than that of the ground-based Fourier Transform Spectrometers for the Total Carbon Column Observing Network (Wunch et al., 2011). The high spectral resolution allows sampling the fully resolved CO$_2$ line shape, including line width and line center position (Ramanathan et al., 2013), resulting in high sensitivity to CO$_2$ changes in the atmospheric column (Mao & Kawa, 2004).

The lidar retrieval algorithm uses a least-squares fit between the 30 wavelengths of the lidar measurements and the calculated CO$_2$ absorption line shape to retrieve XCO$_2$ (Ramanathan et al., 2018; Sun et al., 2021). The approach allows use of a standard linear least squares method to simultaneously solve for Doppler frequency shift, surface reflectance at off-line wavelengths, and a linear non-uniformity (slope) in the receiver spectral response as well.

In the retrieval forward calculations, the spectroscopy database HITRAN 2008 (Rothman et al., 2009) and the Line-By-Line Radiative Transfer Model (Clough et al., 1992; Clough & Iacono, 1995) V12.1 were used to calculate CO$_2$ optical depth and create look-up tables (LUTs) for a prior with a vertically uniform CO$_2$ concentration of 400 ppm. We then used these LUTs to retrieve the best-fit XCO$_2$ by comparing the lidar sampled line shapes with the calculated absorption line shapes and then scaling the prior without any inversion constraints. The retrievals used the atmosphere state (pressure, temperature, and water vapor profiles) from the near real time forward processing data of the Goddard Earth Observing System Model, Version 5 (GEOS-5; Rienecker et al., 2011). Data on the full model grid (0.25° latitude × 0.3125° longitude × 72 vertical layers, every 3h) were interpolated to flight ground track position and time for the atmospheric CO$_2$ and H$_2$O absorption calculations.

3. Data Analysis Results

3.1. CO$_2$ Enhancements From BC Wildfires

Figure 2a shows the cloud-free XCO$_2$ retrievals from the lidar for the entire flight on August 8, 2017. Significant XCO$_2$ enhancements were clearly seen in the segment over Vancouver Island and across the Strait of Juan de Fuca into Washington State. Such CO$_2$ enhancements were not evident in the in situ measurements.
at flight altitudes (Figure 1). Compared to single-point in situ measurements, this shows a benefit of the lidar’s XCO$_2$ measurements to capture CO$_2$ variations in the full atmospheric column below the aircraft.

The smoke plumes from wildfires in the Canadian Rockies were clearly seen from DC-8 aircraft over Vancouver Island and the fire and thermal anomalies map from Aqua/MODIS on the same day (Figures 2b and 2c). The smoke plumes were transported by wind from the Canadian Rockies into eastern Washington State and further down into Montana. Meanwhile, some smoke plumes and a large amount of CO$_2$ emissions from the fires were also transported to Vancouver Island.

Figure 3 shows the time series of the cloud-free XCO$_2$ retrievals together with the attenuated backscatter profiles for the flight segment from Pacific Ocean to Washington State. Dense smoke layers were seen in the lidar backscatter profiles near Vancouver Island and peaked at the top of the boundary layer near 2 km. The lidar range was used to distinguish ground returns from cloud returns after comparison to onboard radar altimetry. The XCO$_2$ retrievals over Vancouver Island and western Washington State have a median value of 406.5 ppm. The XCO$_2$ computed from the in situ vertical profiles of CO$_2$ mixing ratio during the spiral maneuvers at Pacific 2 and Moses Lake were 401.9 and 402.6 ppm, respectively. Therefore, the averaged XCO$_2$ enhancement within the segment from Vancouver Island to western Washington State was estimated to be 4 ppm. The XCO$_2$ enhancement segment spanned about 30 min, which at DC-8 aircraft speed of 200 m/s, corresponds to a ground-track length of 360 km.

### 3.2. Validation of the Lidar XCO$_2$ Measurements

A vertical spiral-down maneuver was conducted shortly after the CO$_2$ enhancement segment shown in Figure 3 from a flight altitude of 9 km to ground over Moses Lake in central Washington State. This allowed a comparison between the XCO$_2$ retrievals from the lidar and those constructed from the in situ vertical profile of CO$_2$. During the spiral hazy conditions were seen below 4.5 km in the lidar backscatter profiles (Figure 3). The AVOCET analyzer sampled every 1-s and the lidar XCO$_2$ retrievals were also based on 1-s
averaged laser signals returned from ground. For the best estimation of the atmosphere state during the spiral maneuver, these retrievals used vertical profiles simultaneously measured by onboard DC-8 in situ instruments at an interval of 1-s. The in situ XCO$_2$ was computed from the in situ vertical profile integrated using the lidar’s retrieval averaging kernel as vertical weighting. Both lidar and in situ XCO$_2$ were then averaged in each 1-km atmosphere layer for comparison. Figure 4 shows an average difference of less than 0.1 ppm for flight altitudes above 5-km and an average standard deviation of approximately 1 ppm. Validation results from other profiles throughout the campaign were within ±0.5 ppm (1-sigma) of the in situ data. Therefore, the 4 ppm XCO$_2$ enhancement from the Canadian wildfires was highly significant in relative to the lidar measurement uncertainty.

### 3.3. Improving Estimates of CO$_2$ Emissions From Wildfires

Figure 5 shows the integrated XCO$_2$ below 320 mb (~9 km) from CO$_2$ simulations by the Goddard PCTM (Kawa et al., 2004, 2010) on the same day. Note that averaging kernels were not applied to the model XCO$_2$ for estimating relative changes due to fire emissions. The PCTM CO$_2$ simulation is driven by meteorological...
Figure 4. Comparison of cloud-free lidar XCO$_2$ retrievals with those from in situ measurements as a function of flight altitude during the spiral maneuver at Moses Lake, WA on August 8, 2017. The in situ XCO$_2$ values are marked in blue squares and the lidar's XCO$_2$ retrieval values are marked in red squares. The red error bars are ±1 standard deviation of the lidar's XCO$_2$ retrievals. The XCO$_2$ vertical averaging kernel for this profile segment is shown at right.

Figure 5. Map of XCO$_2$ (ppm) from ground to 320 mb simulated by Goddard Parameterized Chemistry Transport Model at 21 GMT on August 8, 2017. White line is the ground track of the airborne campaign flight and the two red pluses and red dashed line mark the flight segment where the XCO$_2$ enhancements were seen in the lidar retrievals. The box delineated by the dashed blue line indicates the area over which the British Columbia fire emissions were calculated.
data from the Modern-Era Retrospective analysis for Research and Applications (Bosilovich, 2013), which is a NASA reanalysis using GEOS-5. The vertical mixing in PCTM is parameterized for both turbulent diffusion in the boundary layer and convection. PCTM is run at 0.625° longitude × 0.5° latitude with 56 hybrid vertical levels and outputs hourly. PCTM uses GFED4s (including small fires) for the CO₂ emissions from wildfires. GFED includes an ecosystem model that uses satellite observations of burned area and ecosystem productivity to estimate fuel loads and combustion (van der Werf et al., 2017).

The modeled XCO₂ at 21 GMT shows enhancements up to ~2 ppm over the Canadian Rockies in response to a total release of 837 Gg C day⁻¹ from the BC fires within the area (51–54°N, 120–125°W) on August 8 estimated by GFED. The modeled XCO₂ enhancements near Vancouver Island (estimated from the local maximum on the contour map near the flight track in Figure 5 as well as from the model-interpolated XCO₂ along the track similar to Figure 3) were about 1 ppm. Compared to 4 ppm averaged enhancement of lidar XCO₂ for the equivalent atmospheric columns, the modeled enhancements were low. The underestimate of XCO₂ in the model could be due in part to model diffusion and transport shortcomings. Given, however, the spatial scale of the observed XCO₂ perturbation (~360 km) and multi-day duration of the fires, along with past performance of PCTM using analyzed winds to simulate CO₂ gradients in frontal systems and other relatively fine-scale features (Parazoo et al., 2008) as well as the parent GEOS-5 model use for aerosol plume simulations, we expect that the XCO₂ perturbation would be close to that observed if the emissions were correct. The daily CO₂ release estimate from another data set of fire emissions, the Quick Fire Emissions Dataset (QFED; Darmenov & da Silva, 2015), in the same area on the same day was 1,122 Gg C day⁻¹. The QFED estimate was 34% higher than that from GFED but proportionally still underestimated at least by a factor of 2. QFED is based on the detection of fire radiative power calibrated against observations of aerosol optical depth. Our findings in this case study highlight the potential of airborne and spaceborne lidar XCO₂ measurements for evaluating atmospheric models and global emissions inventories.

4. Conclusion and Discussion

Analysis of lidar measurements from the summer 2017 ASCENDS/ABoVE airborne science campaign show the capability to measure XCO₂ enhancements through dense smoke plumes from wildfires in British Columbia, Canada. On the overpass of Vancouver Island on August 8, the retrievals from the lidar measurements showed an average 4 ppm enhancement in XCO₂ beneath the aircraft. A spiral maneuver made after the smoke plume showed the XCO₂ measurements had small bias and high precision, and a high spatial resolution (~200-m). The modeled enhancements from the Goddard PCTM which uses the GFED fire emission database were about 1 ppm near Vancouver Island. The result suggests that the CO₂ emissions from GFED for the BC wildfires were underestimated by a factor of two or more for that day.

The results show that future airborne campaigns and spaceborne missions with this capability should improve modeling of CO₂ emissions from wildfires. This will benefit atmospheric transport process studies, carbon data assimilation, and global and regional carbon flux estimates. Along with the expected increase in the net contribution of forest fires to global carbon emissions, improved capabilities to constrain wildfire emissions is greatly needed.

Data Availability Statement

All the data used in this work can be downloaded at the LaRC airborne science data site, https://www-air.larc.nasa.gov/cgi-bin/ArcView/ascends.2017.

References

Abish, J. R., Ramanathan, A., Riris, H., Mao, J., Allan, G. R., Hasselbrack, W. E., et al. (2014). Airborne measurements of CO₂ column concentration and range using a pulsed direct-detection IPDA lidar. Optical Remote Sensing of the Atmosphere, 6(1), 443–469. https://doi.org/10.3390/rs6010443

Abish, J. R., Ramanathan, A. K., Riris, H., Allan, G. R., Sun, X., Hasselbrack, W. E., et al. (2018). Airborne measurements of CO₂ column concentrations made with a pulsed IPDA lidar using a multiple-wavelength-locked laser and HgCdTe APD detector. Atmospheric Measurement Techniques, 11, 2001–2025. https://doi.org/10.5194/amt-11-2001-2018

Acknowledgments

This work was supported by the NASA ASCENDS pre-formulation activity, the ABoVE project, and the Airborne Science Program. We gratefully acknowledge the work of the DC-8 team at NASA Armstrong Flight Center for helping plan and conduct the flight campaign. We also thank Joshua P. DiGangi, Glenn Diskin and Yonghoon Choi from NASA Langley Research Center for providing the in situ CO₂ and H₂O data. This paper is dedicated to our friend and colleague Dr. Graham R. Allan who had a key role in the 2017 ASCENDS/ABoVE airborne campaign but who passed away in May 2020. Dr. Allan’s work was essential in the development of the Goddard CO₂ Sounder lidar, airborne campaigns, and data analysis over the past decade and he is missed. We thank two anonymous reviewers whose edits and comments/suggestions helped improve and clarify this manuscript.
Abshire, J. B., Riris, H., Allan, G. R., Weaver, C. J., Mao, J., Sun, X., et al. (2010). Pulsed airborne lidar measurements of atmospheric CO2 column absorption. Tellus, 62, 770–783. https://doi.org/10.1111/j.1600-0889.2010.00502.x

Abshire, J. B., Riris, H., Weaver, C. W., Mao, J., Allan, G. R., Hasselbrack, W. E., et al. (2013). Airborne measurements of CO2 column absorption and range using a pulsed direct-detection integrated path differential absorption lidar. Applied Optics, 52, 4446–4461. https://doi.org/10.1364/AO.52.004446

Andela, N., Morton, D. C., Giglio, L., Chen, Y., van der Werf, G. R., Kasibhatla, P. S., et al. (2017). A human-driven decline in global burned area. Science (New York, N.Y.), 356(6345), 1356–1362. https://doi.org/10.1126/science.aai4108

Andreae, M. O. (2019). Emission of trace gases and aerosols from biomass burning – An updated assessment. Atmospheric Chemistry and Physics, 19, 8523–8546. https://doi.org/10.5194/acp-19-8523-2019

Bosilovich, M. G. (2013). Regional climate and variability of NASA MERRA and recent reanalyses: U.S. summertime precipitation and temperature. Journal of Applied Meteorology & Climatology, 52, 1939–1951. https://doi.org/10.1175/JAMC-D-12-0291.1

Buitz, A., Hasekamp, O. P., Frankenberg, C., & Aben, I. (2009). Retrievals of atmospheric CO2 from simulated space-borne measurements of backscattered near-infrared sunlight: Accounting for aerosol effects. Applied Optics, 48, 3322–3336. https://doi.org/10.1364/ao.48.003322

Clais, P., Sabine, C., Baia, G., Bopp, L., Brovkin, V., Canadell, J., et al. (2013). Carbon and Other Biogeochemical Cycles, chap. 6. In T. F. Stocker, D. Qin, G.-K. Plattner, M. Tignor, S. K. Allen, J. Boschung, A. Nauels, Y. Xia, V. Bex, & P. M. Midgley (Eds.), Climate change 2013: The physical science basis. Contribution of working group I to the fifth assessment report of the intergovernmental panel on climate change (Vol. 1, p. 38). Cambridge University Press.

Clough, S. A., & Iacono, M. J. (1992). Line-by-line calculations of atmospheric fluxes and cooling rates 2. Application to carbon dioxide, methane, nitrous oxide and the halocarbons. Journal of Geophysical Research, 100, 16519–16535. https://doi.org/10.1029/95JD01836

Clough, S. A., & Iacono, M. J. (1995). Line-by-line calculations of atmospheric fluxes and cooling rates: Application to carbon dioxide, methane, nitrous oxide and the halocarbons. Journal of Geophysical Research, 100, 16519–16535. https://doi.org/10.1029/95JD01836

Ciais, P., Sabine, C., Bala, G., Bopp, L., Brovkin, V., Canadell, J., et al. (2013). Carbon and Other Biogeochemical Cycles, chap. 6. In T. F. Stocker, D. Qin, G.-K. Plattner, M. Tignor, S. K. Allen, J. Boschung, A. Nauels, Y. Xia, V. Bex, & P. M. Midgley (Eds.), Climate change 2013: The physical science basis. Contribution of working group I to the fifth assessment report of the intergovernmental panel on climate change (Vol. 1, p. 38). Cambridge University Press.

Diskin, G. S., Podolske, J. R., Sachse, G. W., & Slate, T. A. (2002). Open-path airborne tunable diode laser hygrometer. Proc. SPIE Diode Laser Sounder lidar: Toward atmospheric CO2 data assimilation system. Journal of Geophysical Research, 107, D18S26. https://doi.org/10.1029/2001JD000400

Diskin, G. S., Pusede, S. E., Rana, M., et al. (2010). Using short-term CO2/CO2 ratios to assess air mass differences over the Korean Peninsula during KORUS-AQ. Journal of Geophysical Research: Atmosphere, Earth Science, 118, 4887–4905. https://doi.org/10.1002/jgrd.50332

Darmenov, A., & da Silva, A. (2013). The Quick Fire Emissions Dataset (QFED). Documentation of versions 2.1, 2.2 and 2.4, NASA Technical Report Series on Global Modeling and Data Assimilation NASA-TM-2015-104606 (Vol. 38). http://gmao.gsfc.nasa.gov/pubs/docs/Darmenov796.pdf

Darmenov, A., & da Silva, A. (2013). The Quick Fire Emissions Dataset (QFED). Documentation of versions 2.1, 2.2 and 2.4, NASA Technical Report Series on Global Modeling and Data Assimilation NASA-TM-2015-104606 (Vol. 38). http://gmao.gsfc.nasa.gov/pubs/docs/Darmenov796.pdf

Darmenov, A., & da Silva, A. (2013). The Quick Fire Emissions Dataset (QFED). Documentation of versions 2.1, 2.2 and 2.4, NASA Technical Report Series on Global Modeling and Data Assimilation NASA-TM-2015-104606 (Vol. 38). http://gmao.gsfc.nasa.gov/pubs/docs/Darmenov796.pdf

Darmenov, A., & da Silva, A. (2013). The Quick Fire Emissions Dataset (QFED). Documentation of versions 2.1, 2.2 and 2.4, NASA Technical Report Series on Global Modeling and Data Assimilation NASA-TM-2015-104606 (Vol. 38). http://gmao.gsfc.nasa.gov/pubs/docs/Darmenov796.pdf

Darmenov, A., & da Silva, A. (2013). The Quick Fire Emissions Dataset (QFED). Documentation of versions 2.1, 2.2 and 2.4, NASA Technical Report Series on Global Modeling and Data Assimilation NASA-TM-2015-104606 (Vol. 38). http://gmao.gsfc.nasa.gov/pubs/docs/Darmenov796.pdf
Ramanathan, A. K., Nguyen, H. M., Sun, X., Mao, J., Abshire, J. B., Hobbs, J. M., & Braverman, A. J. (2018). A singular value decomposition framework for bias-free retrievals with vertical distribution information from column greenhouse gas absorption spectroscopy measurements. *Atmospheric Measurement Techniques, 11*, 4909–4928. https://doi.org/10.5194/amt-11-4909-2018

Rienecker, M. M., Suarez, M. J., Gelaro, R., Todling, R., Bacmeister, J., Liu, E., et al. (2011). MERRA: NASA's modern-era retrospective analysis for research and applications. *Journal of Climate, 24*, 3624–3648. https://doi.org/10.1175/jcli-d-11-00015.1

Rothman, L., Gordon, I. E., Barbe, A., Chris Benner, D., Bernath, P. F., Birk, M., et al. (2009). The HITRAN 2008 molecular spectroscopic database. *Journal of Quantitative Spectroscopy & Radiative Transfer, 110*(9), 533–572. https://doi.org/10.1016/j.jqsrt.2009.02.013

Sun, X., Abshire, J. B., Ramanathan, A., Kawa, S. R., & Mao, J. (2021). Retrieval algorithm for the column CO\textsubscript{2} mixing ratio from pulsed multi-wavelength lidar measurements. *Atmospheric Measurement Techniques, 14*, 3909–3922. https://doi.org/10.5194/amt-14-3909-2021

Tian, H., Lu, C., Clais, F., Michalak, A. M., Canadell, J. G., Saikawa, E., et al. (2016). The terrestrial biosphere as a net source of greenhouse gases to the atmosphere. *Nature, 531*, 225–228. https://doi.org/10.1038/nature16946

Torres, O., Bhartia, P. K., Taha, G., Jethva, H., Das, S., Colarco, P., et al. (2020). Stratospheric injection of massive smoke plume from Canadian boreal fires in 2017 as seen by DISCOVR-EPIC, CALIOP, and OMPS-LP observations. *Journal of Geophysical Research: Atmospheres, 125*, e2020JD032579. https://doi.org/10.1029/2020JD032579

Uchino, O., Kikuchi, N., Sakai, T., Morino, I., Yoshida, Y., Nagai, T., et al. (2012). Influence of aerosols and thin cirrus clouds on the GOSAT-observed CO\textsubscript{2}; A case study over Tsukuba. *Atmospheric Chemistry and Physics, 12*, 3393–3404. https://doi.org/10.5194/acp-12-3393-2012

van der Werf, G. R., Randerson, J. T., Giglio, L., van Leeuwen, T. T., Chen, Y., Rogers, B. M., et al. (2017). Global fire emissions estimates during 1997–2016. *Earth System Science Data, 9*, 697–720. https://doi.org/10.5194/essd-9-697-2017

Wunch, D., Toon, G. C., Blavier, J.-F. L., Washenfelder, R. A., Notholt, J., Connor, B. J., et al. (2011). The total carbon column observing network. *Philosophical Transactions of the Royal Society A, 369*, 2087–2112. https://doi.org/10.1098/rsta.2010.0240