



Evidence for a larger contribution of smoldering combustion to boreal forest fire emissions from tower observations in Alaska

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Abstract. With recent increases in burned area within boreal forests that have been linked to climate warming, there is a need to better understand the composition of emissions and their impact on atmospheric composition. Most previous studies have estimated boreal fire emission factors from daytime samples collected via aircraft near fire plumes or at the surface near actively burning fires. Here we quantified emission factors for CO and CH₄ from a massive regional fire complex in interior Alaska during the summer of 2015 using continuous high-resolution trace gas observations from the CRV tower (Fox, AK). Averaged over the 2015 fire season, the CO/CO₂ emission ratio was 0.138 ± 0.048 and the CO emission factor was 145 ± 50 g CO per kg of dry biomass consumed. The CO/CO₂ emission ratio was about 35% higher and more variable than most previous aircraft-based estimates for fresh wildfire emissions. The mean CH₄/CO₂ emission ratio was 0.010 ± 0.003 and the CH₄ emission factor was 6.05 ± 2.09 g CH₄ per kg of dry biomass consumed, with means similar to previous reports. CO and CH₄ emission factors varied in synchrony, with higher CH₄ emission factors observed during periods with lower modified combustion efficiency (MCE). By coupling a fire emissions inventory with an atmospheric model, we identified that at least 35 individual fires contributed to trace gas variations measured at the CRV tower, representing a significant increase in sampling compared to the number of boreal fires measured in all previous boreal forest fire work. The model also indicated that typical mean transit times between trace gas emission and tower measurement were 1-3 days, indicating that the time series sampled combustion across day and night burning phases. The high and variable CO emission factor estimates reported here provide evidence for a more prominent role of smoldering combustion, highlighting the importance of continuously sampling of fires across time-varying environmental conditions that are representative of typical burning conditions.

1 Introduction

Boreal forest fires influence the global carbon cycle and climate system through a variety of pathways. Boreal forest fires initiate succession, influence landscape patterns of carbon accumulation, and directly release carbon dioxide and other trace gases into the atmosphere [Johnson, 1996]. One of the largest reservoirs of global terrestrial carbon resides in organic soils underlying boreal forests [Apps *et al.*, 1993; McGuire *et al.*, 2010], and fires in the boreal forest can consume significant amounts of aboveground and belowground biomass [Harden *et al.*, 2000; French *et al.*, 2004; Bobby *et al.*, 2010; Walker *et al.*, 2018]. Many boreal forest fires are stand replacing and high energy [Rogers *et al.*, 2015], with enough convective power to inject smoke into



the upper troposphere and lower stratosphere where it can be transported across the Northern Hemisphere [Forster *et al.*, 2001; Turquety *et al.*, 2007; Peterson *et al.*, 2018].

Emissions from boreal fires can significantly influence atmospheric composition throughout the Northern Hemisphere. Fire plumes from regional fire complexes in Alaska and western Canada, for example, have been shown to influence air quality over Nova Scotia [Duck *et al.*, 2007] and across the south-central US [Wotawa *et al.*, 2001; Kasischke *et al.*, 2005] and Europe [Forster *et al.*, 2001]. Similarly, fire plumes from Siberia have caused deadly air quality in Moscow [Konovalov *et al.*, 2011] and have affected ozone and other trace gases concentrations across the western US [Jaffe *et al.*, 2004]. Over the past few decades, annual burned area in several regions in boreal North America has increased [Gillett *et al.*, 2004; Kasischke and Turetsky, 2006; Veraverbeke *et al.*, 2017], and future projections suggest further increases may occur in response to changes in fire weather and a lengthening of the fire season [Flannigan *et al.*, 2001; de Groot *et al.*, 2013; Young *et al.*, 2017]. As a consequence, fires are likely to play an increasingly important role in regulating air quality and climate feedbacks during the remainder of the 21st century.

To understand boreal fire impacts on the atmosphere, high quality observations characterizing the composition of emissions are necessary [Andreae and Merlet, 2001; Akagi *et al.*, 2011]. Here we used trace gas observations from the CARVE (CRV) tower located in interior Alaska (Fox, AK) to derive emission factors of CO and CH₄ from boreal forest fires that burned over a period of a month or more during the extreme 2015 fire season. In past work, the most common approach for measuring emission factors from boreal fires is to fly aircraft near or within plumes, measuring trace gases using infrared gas analyzers mounted in the aircraft or by collecting flasks of air that are measured later in the laboratory. A summary of past studies using this technique to measure CO and CH₄ emission factors is shown in Table 1. Over a period of more than 25 years, in-situ CO and CH₄ emission factors have been measured and reported from a total of 15 boreal fires sampled by aircraft, including 11 wildfires and 4 prescribed fires (Table 1). Additional airborne measurements of trace gas emissions from boreal forest fires are present in the literature, but do not include published CO and/or CH₄ emission factors for individual boreal fires. Aircraft sampling is a highly effective approach for sampling large and remote wildfires, especially for characterizing reactive trace gas emissions or aerosols that have lifetimes of hours to days. It also important to recognize potential limits associated with sampling fires in this way. Aircraft observations are mostly confined to periods with good visibility, often sampling well-developed fire plumes during mid-day and during periods with relatively low cloud cover. These environmental conditions represent a subset of the variability that a large wildland fire may experience as it burns over a period of weeks to months. An alternative approach to measuring in-situ emission factors involves using a tower that continuously measures trace gas concentrations located in an area downwind of fires. This has been done in a previous boreal forest fire study during a moderate fire season in Alaska [Wiggins *et al.*, 2016].

Environmental conditions, including weather, vegetation, and edaphic conditions are known to influence the composition of emissions, in part by regulating the importance of flaming and smoldering combustion phases [Ward and Radke, 1993; Yokelson *et al.*, 1997; Akagi *et al.*, 2011; Urbanski, 2014]. Flaming combustion is more efficient at oxidizing organic matter directly to CO₂ gas than smoldering combustion, and as a consequence, smoldering combustion produces more CO, CH₄, and organic carbon aerosol [Ward and Radke, 1993; Urbanski *et al.*, 2008]. Smoldering combustion can be defined as combustion with a degree of combustion completeness, or modified combustion efficiency, less than 0.9 [Urbanski, 2014]. Flaming combustion requires the presence of organic material that burns efficiently in a high oxygen environment [Ryan *et al.*, 2002], and often occurs in boreal forests when fires consume dry aboveground fuels, including vegetation components with low moisture content, litter, and fine woody debris [French *et al.*, 2004]. Smoldering, in contrast, is a dominant combustion phase for burning of belowground biomass and larger coarse woody debris. Residual smoldering combustion in boreal forests can continue to occur for weeks after a flaming fire front has passed through, especially in peatland areas with carbon rich organic soils [Bertschi *et al.*, 2003; Turquety *et al.*,



2007]. Over the lifetime of a large fire, smoldering combustion is more likely to occur during periods with lower temperatures and higher atmospheric humidity that increases the moisture content of fine fuels [Stocks *et al.*, 2001; Ryan, 2002].

Here we used trace gas observations of CO, CH₄, and CO₂ from the CRV tower to estimate emission factors from boreal forest fires that burned during the near-record high Alaska fire season of 2015. The summer of 2015 was the second largest fire season in terms of burned area since records began in 1940 with about 2.1 million hectares burned [Hayasaka *et al.*, 2016; Partain *et al.*, 2016]. An unseasonably warm spring and earlier snowmelt allowed fuels to dry early in the season [Partain *et al.*, 2016]. In mid-June, thunderstorms caused an unprecedented number of lightning strikes (over 65,000) that ignited over 270 individual fires on anomalously dry fuel beds over the course of a week [Hayasaka *et al.*, 2016; Veraverbeke *et al.*, 2017]. Fires expanded dramatically under favorable weather conditions through mid-July, until multiple precipitation events and cool, damp weather minimized fire growth for the rest of the summer fire season.

The CRV tower captured an integrated signal of trace gas emissions from fires across interior Alaska during the 2015 fire season [Karion *et al.*, 2016]. The data stream was comprised of continuous sampling from June 15 – August 15 with more than 65,000 30s averaged samples. The CRV tower experienced enhanced and highly correlated CO, CH₄, and CO₂ trace gas signals from fires for about 7% of the duration of the 2015 fire season. We identified events when fire emissions had a dominant influence on trace gas variability at CRV tower and used these events to derive emission factors. This data stream represents an order of magnitude increase in sampling density compared with the sum of observations from past work.

We coupled a fire emissions inventory, the Alaska Fire Emissions Database (AKFED) [Veraverbeke *et al.*, 2015] with an atmospheric transport model, the Polar Weather Research and Forecasting Stochastic-Time Integrated Lagrangian Transport (PWRF-STILT) model [Henderson *et al.*, 2015], to quantify the spatial and temporal variability of individual fires and their influence on CO, CH₄, and CO₂ at the CRV tower. Our tower-based approach allows for an integration of emission factors through the day-night fire cycle and over the full duration of many individual fires. Our results suggest the smoldering phase of boreal fires may have a higher contribution to emissions than previous estimates.

2 Methods

2.1 CARVE (CRV) Tower Observations

Atmospheric CO, CH₄, and CO₂ mole fractions were measured using a cavity ring-down spectrometer (CRDS, Picarro models 2401 and 2401m) [Karion *et al.*, 2016] at the CRV tower in Fox, Alaska (64.986°N, 147.598°W, ground elevation 611m above sea level). The tower is located about 20 km northeast of Fairbanks Alaska (Figure 1), within the interior forested lowlands and uplands ecoregion in interior Alaska [Cooper *et al.*, 2006]. There are three separate inlets on CRV tower at different heights above ground level from which the spectrometer draws sample air. The spectrometer samples air from the highest level for 50 minutes out of every hour, and then draws air from the other levels for 5 minutes at each level [Karion *et al.*, 2016]. The data stream from this spectrometer has gaps every 50 minutes as the spectrometer cycles to the lower inlets. We used observations from air drawn from the top intake height at a height of 32 m above ground level because this level had the highest measurement density and the smallest sensitivity to local ecosystem CO₂ fluxes near the tower [Karion *et al.*, 2016]. All raw 30 s average measurements were calibrated according to Karion *et al.* [2016]. Each 30 s average measurement served as an individual point in our calculation of emission factors described below.

2.2 Emission Factors and Modified Combustion Efficiency



We isolated intervals when fire had a dominant influence on trace gas variability observed at CRV tower to calculate emission factors. An interval with dominant fire influence was defined as a continuous period that had: 1) a minimum of at least thirty trace gas measurements (with each measurement representing a mean over 30 seconds), 2) a mean CO over the entire interval exceeding 0.5 ppm, and 3) significant correlations between CO:CO₂ and CH₄:CO₂ exceeding an r² of 0.80.

5 We used the gaps in the data stream when the spectrometer sampled air from the lower levels to separate the dataset into a set of continuous intervals of trace gas observations with less than 15 s between each new 30 s averaged measurement and by applying a minimum duration criterion of at least 30 measurements. We calculated the mean CO mole fraction for each interval and removed all intervals with a mean CO less than 0.5 ppm. For each interval with high levels of CO, we then extracted CO, CH₄, and CO₂ mole fractions and calculated correlation coefficients between all three gases. Only periods with high and significant
10 correlations between CO:CO₂ and CH₄:CO₂ (r² > 0.80; p < 0.01, n > 30) were retained, because covariance among these co-emitted species is a typical signature of fire emissions [Urbanski, 2014].

We calculated background mole fractions of CO and CH₄ by taking an average of observations prior to any major fire activity in interior Alaska during DOY 170 – 172.5. This yielded a CO background of 0.110 ppm and a CH₄ background of 1.90 ppm. We modeled hourly CO₂ background concentrations to account for the influence of net ecosystem exchange (NEE) using a
15 Bayesian approach multi-variable linear regression model trained on CRV tower observations during 2012, a year with little to no fire influence on trace gas variability. We assumed negligible influence from fossil fuel combustion on background mole fractions. The hourly CO₂ model was linearly interpolated to have the same temporal resolution as CRV tower data. The variables used in the CO₂ model include hourly observations of temperature, vapor pressure deficit, precipitation, day of year, latent heat flux, and hourly CO₂ observations from Barrow, AK (Figure 2). Meteorological variables were acquired from the National Climatic Data
20 Center Automated Weather Observing System for Fairbanks International Airport (<http://www7.ncdc.noaa.gov/CDO/cdopomain.cmd>). This location was chosen due to its proximity to the CRV tower. We obtained 3-hourly latent heat flux from the NOAA2.7.1 GLDAS/NOAH experiment 001 for version 2 of the Global Land Data Assimilation System (GLDAS-2) [Rodell et al., 2015]. Hourly in-situ CO₂ observations from a clean air site in Barrow, AK were attained from the Earth System Research Laboratory Global Monitoring Division [Thoning et al., 2007]. In a sensitivity analysis we found that the removal
25 of the background had only a small effect, because the background did not change appreciably during the duration of each ~50-minute time interval used to compute an emission factor.

We estimated emission ratios (ER_{CO/CO₂} and ER_{CH₄/CO₂}) by calculating the slope from a type II linear regression of CO and CH₄ excess mole fractions (ΔCO and ΔCH₄) relative to CO₂ (ΔCO₂) (Equation 1). Excess mole fractions refer to observations of trace gas mole fractions during intervals when fire had a dominant influence on tower trace gas variability with background
30 values subtracted. Emission factors (EF_{CH₄/CO₂} and EF_{CO/CO₂}) were calculated by multiplying the emission ratio by a scalar (S_{CO} or S_{CH₄}) to convert the molar ratio into grams of CO or CH₄ emitted per kilogram of dry biomass burned with the assumption that 450 g C is emitted per kilogram of dry biomass consumed (M_{Biomass}) [Yokelson et al., 1997; Akagi et al., 2011] (Equation 2).

$$ER_{\frac{CO}{CO_2}} = \frac{\Delta CO}{\Delta CO_2} = \frac{CO_{Fire} - CO_{Background}}{CO_{2\ Fire} - CO_{2\ Background}} \quad (1)$$

$$EF_{\frac{CO}{CO_2}} = ER_{\frac{CO}{CO_2}} * S_{CO} * M_{Biomass} \quad (2)$$

35 We calculated modified combustion efficiency (MCE) for each emission factor period. Modified combustion efficiency is defined as the excess mole fraction of CO₂ divided by the sum of the excess mole fractions of CO and CO₂ [Ward and Radke, 1993]. MCE was used to separate events into three categories: smoldering, mixed, or flaming. These categories reflect the dominant



phase of combustion from fires that contributed to trace gas anomalies at the CRV tower during the summer of 2015. Periods with an MCE less than 0.9 were considered to consist of mostly smoldering combustion, periods with a MCE of greater than or equal to 0.9 and less than 0.92 were classified as consisting of a mixture of smoldering and flaming combustion, and period with an MCE greater than 0.92 were classified as flaming [Urbanski, 2014].

5 2.3 Transport Modeling

We coupled a fire emission model, the Alaskan Fire Emissions Database (AKFED) [Veraverbeke *et al.*, 2015] with an atmospheric transport model, the Polar Weather Research and Forecasting Stochastic-Time Integrated Lagrangian Transport model (PWRF-STILT) [Henderson *et al.*, 2015] to estimate fire contribution to trace gas variability from CRV tower observations following Wiggins *et al.* [2016]. AKFED predicts carbon emissions from fires with a temporal resolution of 1 day and a spatial resolution of 450 m. We regridded AKFED to the same spatial resolution as the atmospheric transport model (0.5°) for the model coupling. To account for diurnal variability in emissions, here we imposed a diurnal cycle on daily emissions following Kaiser *et al.* [2009], where the diurnal cycle is the sum of a constant and a Gaussian function that peaks in early afternoon with 90% of emissions occurring during the day (hours 0600 to 1800) and 10% at night (hours 1800 to 0600). PWRF-STILT calculates the sensitivity of atmospheric trace gas measurements to upwind surface fluxes using an influence function or “footprint” [Henderson *et al.*, 2015]. The footprints are on a 0.5° latitude-longitude grid with a temporal resolution of 1 h during hours 0600 to 1800 (day) local time and 3 h during hours 1800 to 0600 (night), and provide an estimate of the impact of upwind surface fluxes on CRV tower trace gas measurements at a given time.

We convolved AKFED with the PWRF-STILT footprints to determine individual fire contributions to CO anomalies at CRV tower. This was achieved by calculating the total CO contribution from each individual 0.5° grid cell from the AKFED \times PWRF-STILT combined model and utilizing the fire perimeters from the Alaska Large Fire Database (data provided by Bureau of Land Management (BLM) Alaska Fire Service, on behalf of the Alaska Wildland Fire Coordinating Group (AWFCG) and Alaska Interagency Coordination Center (AICC)) to identify the location of individual fires. AKFED uses the Alaska Large Fire Database for burned area and carbon emissions estimates [Veraverbeke *et al.*, 2015]. We determined an individual fire’s contribution to CO at the CRV tower by setting all emissions in AKFED for a particular grid cell to zero and rerunning the model coupling with PWRF-STILT. We confirmed the signals were from a single fire through a complete absence of a modeled enhancement at CRV tower when a specific fire was removed from the simulation. The difference between the original model and the updated coupling is equal to an individual fire’s contribution to CO at the CRV tower. Due to the relatively coarse 0.5° grid cell size used for model coupling, more than one fire perimeter existed in some individual grid cells. The contributions for each fire in the same grid cell were determined by weighting the total contribution based on fire size. We also used the influence functions or “footprints” (ppm per $\mu\text{mol}/\text{m}^2/\text{s}$) from the atmospheric transport model to quantify the contribution of day and night emissions and mean transport times between the point of emission and measurement at the CRV tower. We analyzed the footprints for each time period associated with an emission factor period to confirm CRV tower observations represented an integration of emissions from multiple fires and captured variability in emissions across the diurnal fire cycle.

3 Results

35 3.1 Emission Factors and Modified Combustion Efficiency



During the 2015 Alaska fire season, we observed synchronized enhancements of CO, CH₄, and CO₂ well above background concentrations in CRV tower observations from DOY 173 – 196 (Figure 3). We identified 53 individual events that span about 50 minutes each to calculate emission factors from the elevated trace gas observations (Figure 4; Table 2). CO/CO₂ emission ratios ranged from 0.025 to 0.272 and CH₄/CO₂ emission ratios ranged from 0.002 to 0.020. MCE ranged from 0.786 to 0.975 (Table 2). CO emission factors ranged from 26 to 286 g CO per kg biomass combusted, and CH₄ emission factors ranged from 1.21 to 12.2 g CH₄ per kg biomass combusted. The mean CO/CO₂ emission ratio was 0.138 ± 0.044 , the mean CO emission factor was 145 ± 46 g CO per kg biomass combusted, and the mean MCE was 0.879 ± 0.068 . Concurrently, the mean CH₄/CO₂ emission ratio was 0.010 ± 0.003 and the mean CH₄ emission factor was 6.05 ± 1.95 g CH₄ per kg biomass combusted. A strong linear relationship existed between the CH₄ emission factor and MCE across the different sampling intervals (Figure 5).

Each event used to calculate emission factors was classified as a smoldering, mixed, or flaming emissions event using the MCE. We categorized 39 smoldering events, 9 mixed events, and 5 flaming events throughout the fire season (examples shown in Figure 6 and Table 3). Smoldering events had a mean CO/CO₂ ratio of 0.159 ± 0.036 , a mean CO emission factor of 167 ± 38 g CO per kg biomass combusted, a mean CH₄/CO₂ ratio of 0.012 ± 0.003 , a mean CH₄ emission factor of 6.93 ± 1.59 g CH₄ per kg biomass combusted, and a mean MCE of 0.864 ± 0.026 . Mixed events consisting of both smoldering and flaming combustion had a mean CO/CO₂ emission ratio of 0.096 ± 0.006 , a mean CO emission factor of 101 ± 7 g CO per kg biomass combusted, a mean CH₄/CO₂ emission ratio of 0.007 ± 0.002 , a mean CH₄ emission factor of 4.26 ± 0.95 g CH₄ per kg biomass combusted, and a mean MCE of 0.912 ± 0.005 . Flaming events had a mean CO/CO₂ emission ratio of 0.056 ± 0.020 , a mean CO emission factor of 58 ± 21 g CO per kg biomass combusted, a mean CH₄/CO₂ emission ratio of 0.004 ± 0.001 , a mean CH₄ emission factor of 2.49 ± 0.84 g CH₄ per kg biomass combusted, and a mean MCE of 0.947 ± 0.018 (Table 3).

3.2 The Influence of Individual Fires on Trace Gas Variability at the CRV Tower

The forward model simulations combining AKFED fire emissions with PWRP-STILT confirmed that the elevated CO signals at the CRV tower can be attributed primarily to boreal forest fire emissions (Figure 7). The AKFED model had a Pearson's correlation coefficient of 0.61 with observed daily mean CO and had a low bias of approximately 7%.

We identified 35 individual fires that contributed to at least 1% of the CO mole fraction time series at CRV tower (Figure 8; Figure 9; Table 3). On average, these fires were 295 ± 131 km away from CRV tower and located mostly to the west of Fairbanks, in the direction of the prevailing summer surface winds. The total CO emitted from these fires accounted for 75% of the excess CO mole fraction signal observed at CRV tower during DOY 160 – 200. The remaining CO signal originated from many smaller fires that were widely distributed across interior Alaska. The Tozitna fire was responsible for the greatest percentage of the total CO anomaly integrated over the 2015 fire season at CRV tower. This fire contributed 11% of the total CO anomaly observed at CRV tower. The fires that significantly contributed the most to the CO anomaly at CRV tower were not necessarily the closest fires to the tower or the largest fires of the 2015 fire season in terms of burned area. Combined, however, this set of 35 fires accounted for 0.97 Mha, or approximately 65% of the total burned area reported during the 2015 fire season [Veraverbeke *et al.*, 2017].

The footprints associated with each emission factor event also were used to determine how much of the signal was coming from burning on previous days and the fraction of emissions emitted during day and night periods. We found that 99% of the fire emissions that influenced CRV tower trace gas concentrations occurred within 3 days of the sampling interval used to derive the emission factor for an individual event at the CRV tower, with 76% occurring within the first 24 hours, 21% during the next 24 hours, and 2% occurring three days prior to the event (Figure 10). Overall, 64% of the fire emissions that impacted the tower occurred during the day (0900 to 1800 local time) and 36% occurred at night (1900 – 0600 local time).



4 Discussion

4.1 Comparison of tower and aircraft emission factors

Emission factors provide a straightforward way to convert fire emissions of dry biomass into specific trace gas species, such as CO, CH₄, and CO₂. This technique is commonly used to model emissions of select species and or to compare model results with in-situ or remotely sensed observations. There are limited previous studies on boreal forest fire emission factors, and almost all derived emission factors were determined from aircraft sampling (Table 1) [Cofer *et al.*, 1990; Radke *et al.*, 1991; Nance *et al.*, 1993; Cofer *et al.*, 1998; Goode *et al.*, 2000; Simpson *et al.*, 2011]. In total, all previous aircraft-based studies combined sampled 15 individual prescribed and/or wildfires and derived emission factors that were likely most representative of flaming fires that occurred in the afternoon and were strong enough to generate well-defined plumes. Our emission factors for CO were 35% higher than previous estimates for wildfires derived from the aircraft measurements. We believe a primary contributor to this difference is sampling methodology. Our CRV tower-based sampling was able to integrate over day-night burning cycles, flaming combustion at active fire fronts as well as residual smoldering combustion in soils that persists for days behind the fire line, and emissions associated with a wide range of environmental conditions that occurred during 2015 fire season. This integration was possible because the tower was located several hundred kilometers downwind of the core fire complex located western Alaska. The time delays between emission and detection of trace gas anomalies at CRV allowed for atmospheric mixing of signals from dozens of different fires in different stages of growth and extinction. Collectively, these fires experienced time-varying environmental conditions that were less ideal for flaming combustion than the fire plumes sampled in mid-afternoon by the aircraft.

4.2 Integration of emission factor observations across studies and time intervals

Our modeling study confirms that the entire day/night fire cycle was captured by anomalous trace gas observations at CRV tower that was used to calculate emission factors. Wiggins *et al.* [2016] used a similar tower-based approach to estimate boreal forest emission factors during a moderate fire year, and they found CO and CH₄ emission factors that were higher than the compiled mean from previous studies. We found a strong linear relationship between CH₄ emission factors and MCE that has also been observed in previous studies [Van Leeuwen and Van Der Werf, 2011; Yokelson *et al.*, 2013; Urbanski, 2014].

Although Table 1 appears to suggest CO emission factors from boreal forest fires are increasing over time, it is more likely that studies using the tower approach are better suited to sample a more thorough representation of all the phases of combustion that can occur in boreal forest fires. The tower approach is not limited by the time or scale of sampling, unlike aircraft measurement techniques. Aircraft based emission factors are often biased towards flaming fires, because most measurements are acquired during the afternoon when active fire plumes are visible. The emission factors derived from this study provide a more robust estimate of the mean, and indicate that the smoldering phase and nighttime emissions of boreal fires have likely been underestimated in previous studies. The improved emission factors from this study can be used in future modeling efforts to convert carbon emissions to CO and CH₄ trace gas emissions from boreal forest fires more accurately.

4.3 Relative Contributions of Smoldering and Flaming Combustion

Following ignition, boreal forest fires generally begin as stand replacing crown fires followed by smoldering combustion in organic soil layers and coarse woody debris behind the fire front that can continue for weeks after ignition [Bertschi *et al.*, 2003]. This residual smoldering combustion could substantially contribute to trace gas emissions, but is difficult to detect and quantify using remote sensing because of low radiative power associated with this phase of combustion. The relative contributions of



emissions from flaming and smoldering are uncertain for boreal forest fires, but previous studies have assumed 80% of aboveground carbon is consumed in flaming combustion, 20% is consumed in smoldering combustion, and vice versa for belowground carbon [French *et al.*, 2002; Kasischke and Bruhwiler, 2002]. Our results suggest that the smoldering phase of combustion contributes to more carbon emissions than has been previously estimated.

5 4.4 Implications of a larger contribution of smoldering combustion

Smoldering combustion produces significantly more CO and PM_{2.5} than flaming combustion [Bertschi *et al.*, 2003; Chen *et al.*, 2007; Stockwell *et al.*, 2016], and corresponding boreal forest fire emissions of these species are likely higher than previous studies suggest. This conclusion implies changes to the overall impact of boreal forest fires on human health, atmospheric composition, and climate. Emissions from boreal forest fires have the potential to be transported long distances across the Northern Hemisphere [Forster *et al.*, 2001], implying large-scale impacts. CO can lead enhanced tropospheric ozone production downwind of a fire [Lapina *et al.*, 2006], and higher concentrations of CO from fires may indirectly contribute to radiative forcing by consuming hydroxyl radicals and extending the lifetime of CH₄ [Levine and Cofer, 2000]. PM_{2.5} emissions, in contrast, can significantly degrade regional air quality, endanger cardiovascular and respiratory health, and influence the radiative balance of the planet [Reid *et al.*, 2016]. Much of the PM_{2.5} emitted by smoldering fires is composed of organic carbonaceous aerosol that often leads to climate cooling [Tosca *et al.*, 2010; Jayarathne *et al.*, 2018].

5 Conclusions

Our tower-based approach to calculate emission factors is a new technique that significantly improves our understanding of trace gas emissions from boreal forest fires. Unlike traditional approaches using aircraft observation, our method represents an integration of trace gas emissions across day and night burning cycles and varying environmental conditions that are both known to considerably influence the composition of fire emissions. We discovered 35 individual fires across interior Alaska significantly influenced trace gas variability at CRV tower from which our emission factors were derived from. This is more than double the number of individual wildfires that have been sampled to calculate boreal fire emission factors in all previous studies combined. Our results suggest the smoldering phase of boreal forest fires contributes to more trace gas emissions than previously believed, and as a consequence, total CO emissions from boreal forest fires may have been underestimated. The tower-based emission factor method introduced in this study can be applied to other biomes and potentially expand in-situ emission factor observations in regions of interest.

Author Contribution

EBW led the analysis and the writing of the manuscript with contributions from all co-authors. AA, CS, and JBM provided data from the CRV tower. SV provided AKFED data. RC and SW helped define the footprints used in PWRP-STILT. JMH ran the PWRP-STILT model for CRV tower and provided footprints. CEM and JTR contributed to the scientific analysis and the preparation of the manuscript. All authors contributed to the scientific discussion and article preparation.

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Figures

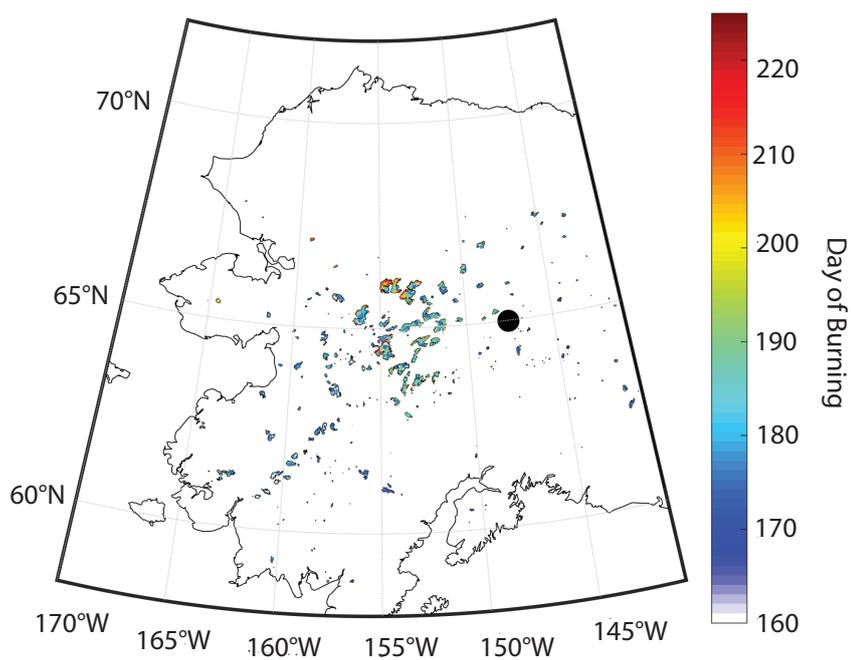


Figure 1. Burned area in Alaska during 2015 with colors representing the day of ignition. Black circle denotes the location of CRV tower.

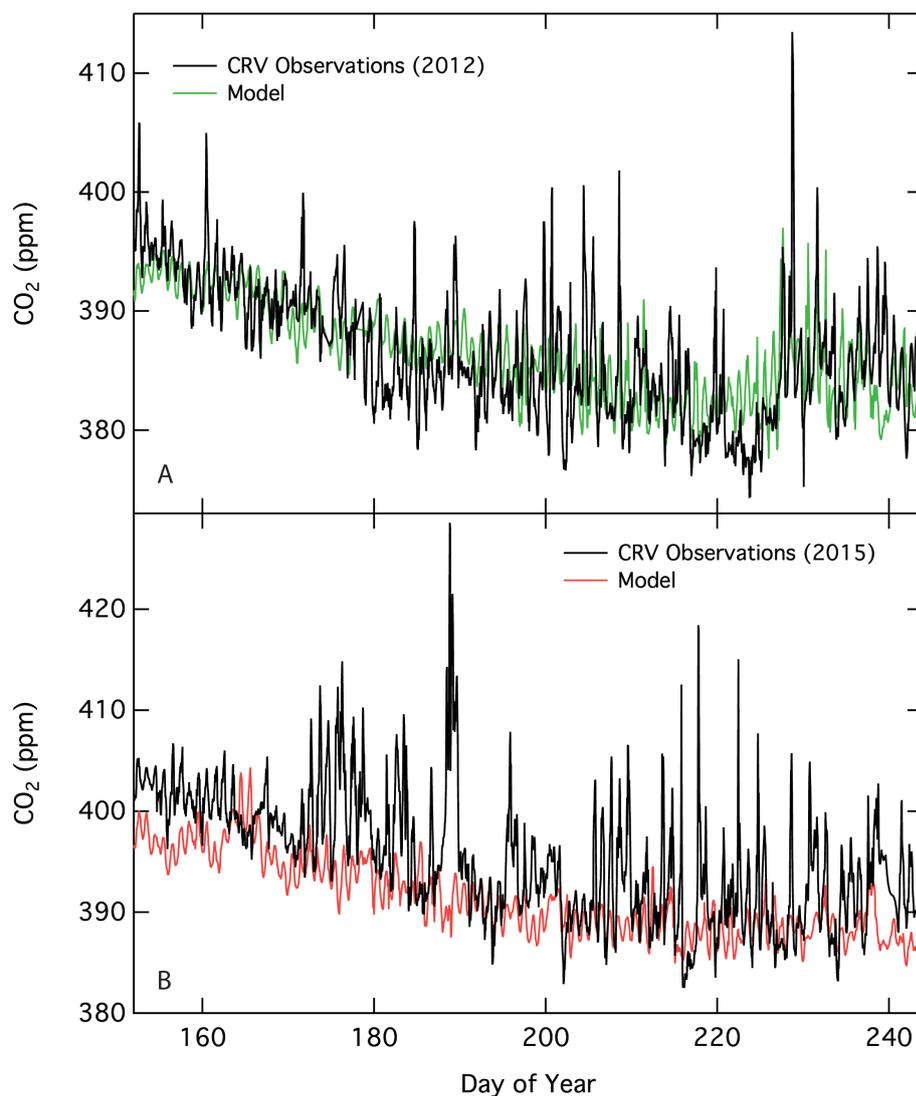


Figure 2. Panel A: 2012 CO₂ observations from CRV tower (black) during a low fire year versus modeled background CO₂ (green). Panel B: 2015 CO₂ observations from CRV tower (black) versus modeled background CO₂ (red).

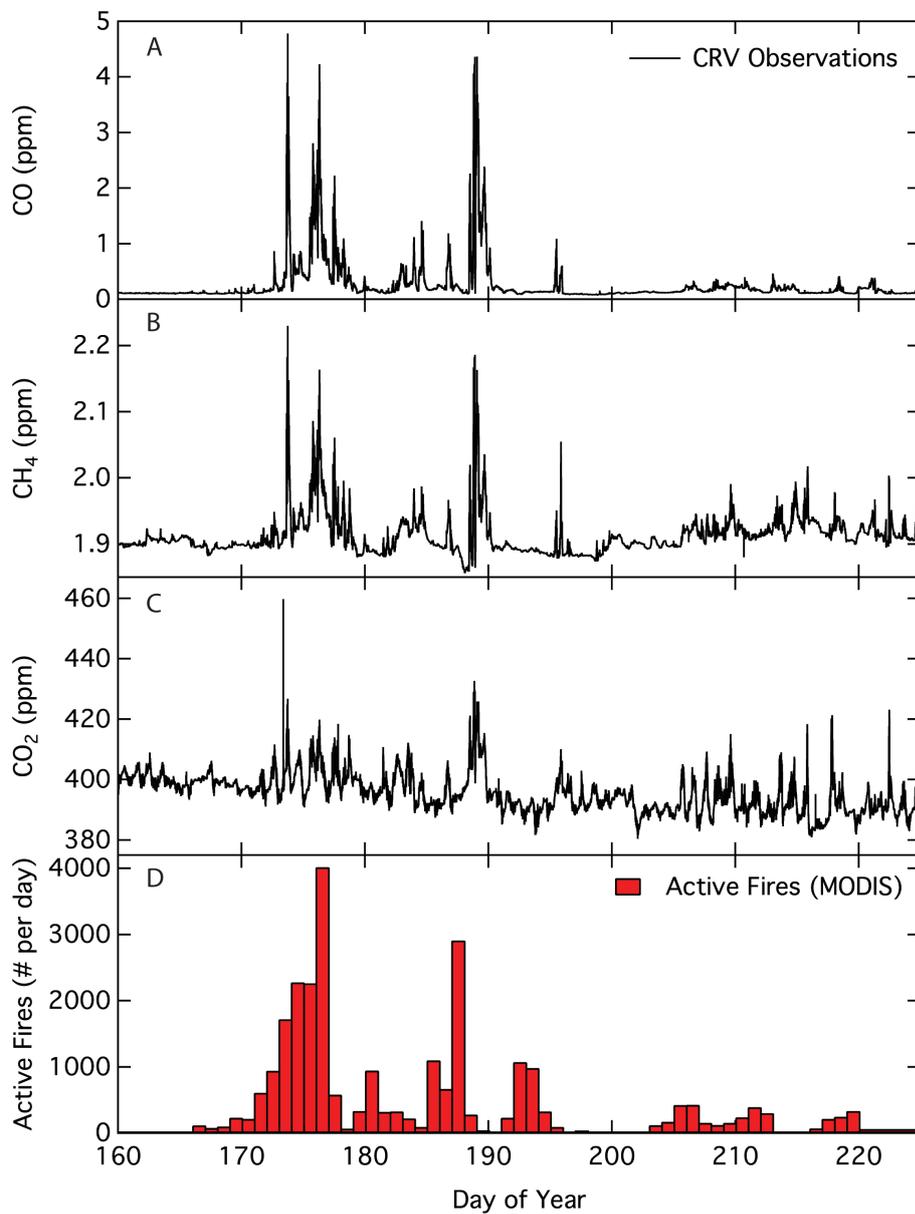


Figure 3. Panels A-C: trace gas observations (black) from CRV tower during the summer of 2015. Panel D: number of daily active fires from MODIS (red).

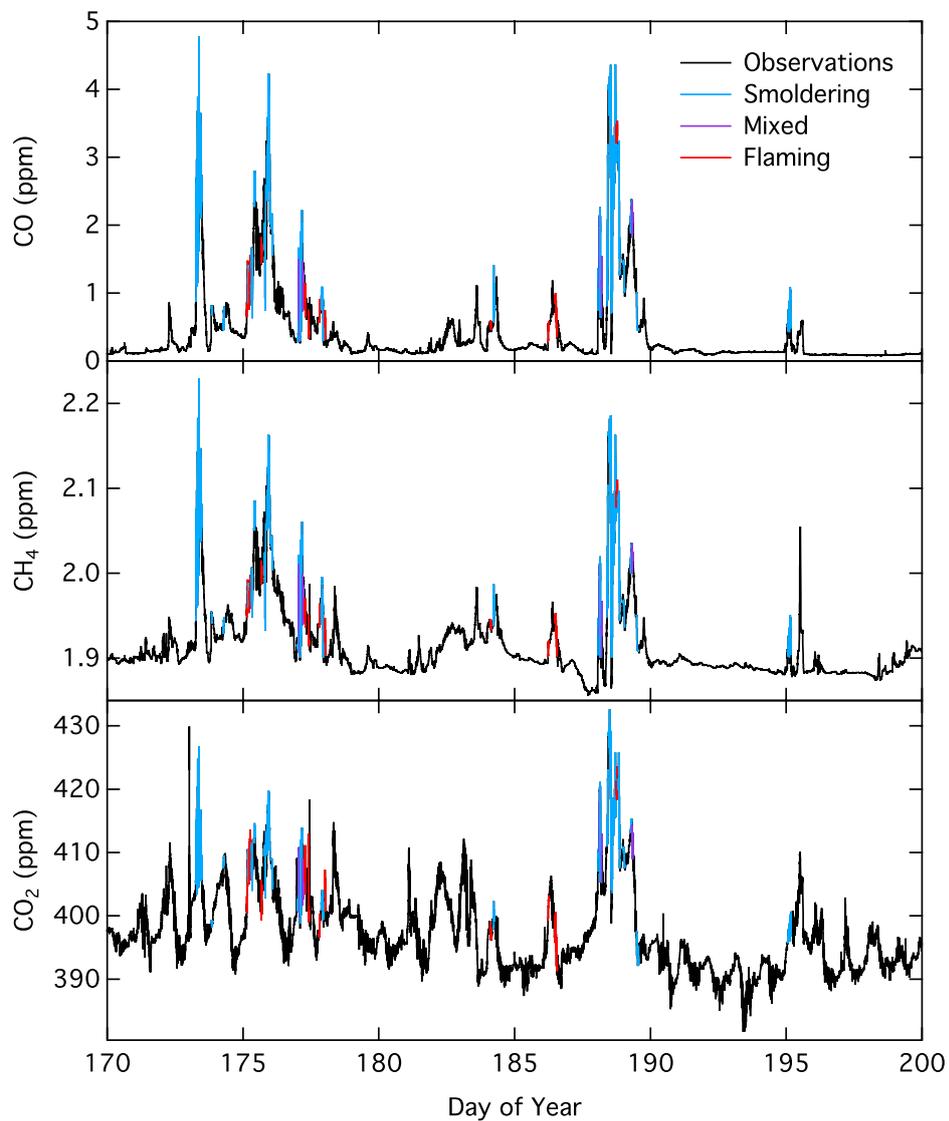


Figure 4. CRV tower observations of CO (panel A), CH₄ (panel B), and CO₂ (panel C) with periods used to calculate emission factors highlighted to denote the dominant phase of combustion - smoldering (blue), mixed (purple), and flaming (red).

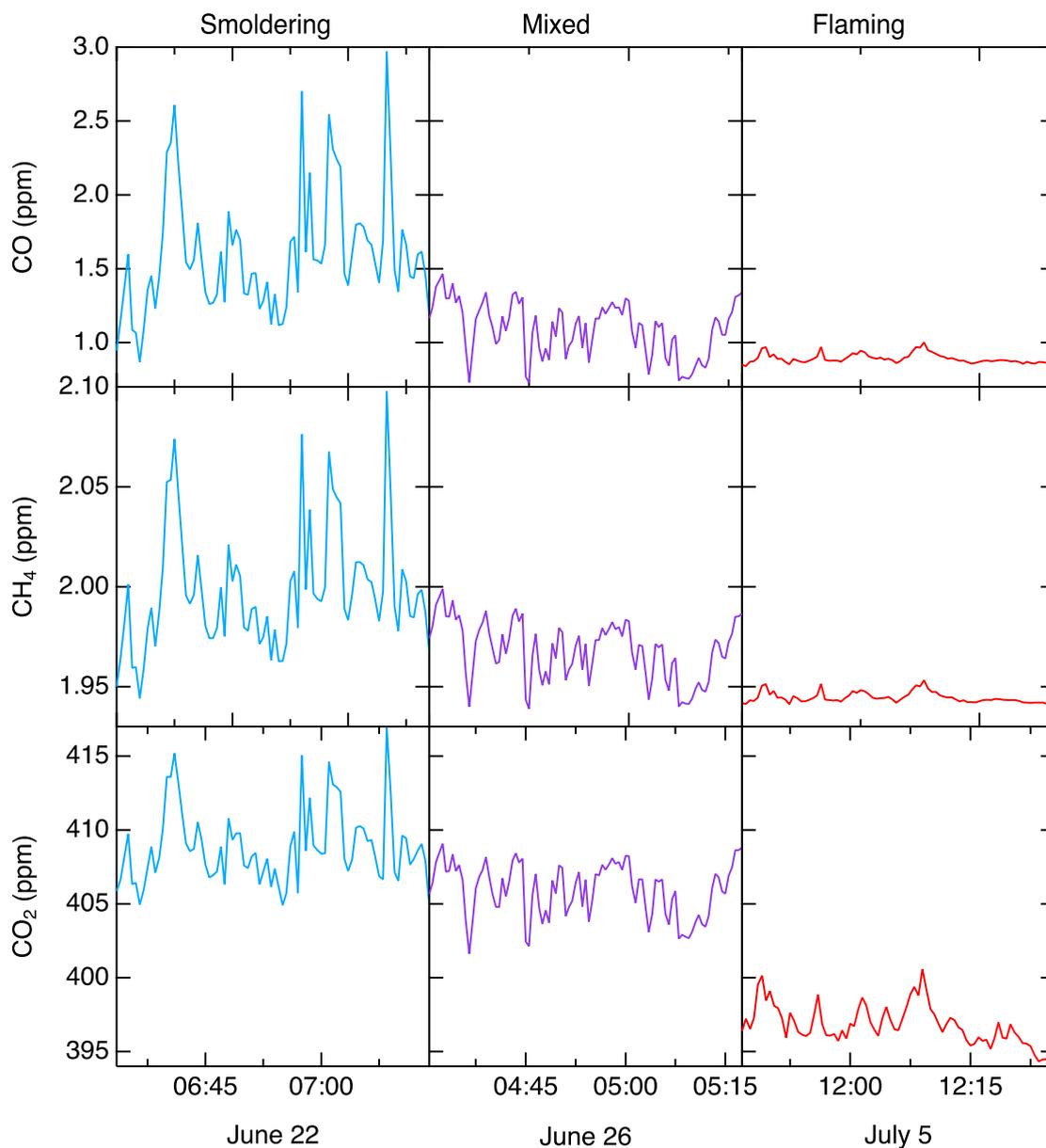


Figure 6. Examples of raw trace gas observations used to calculate emission factors for smoldering (blue), mixed (purple), and flaming (red) dominated combustion. All dates are from 2015 and in military time.

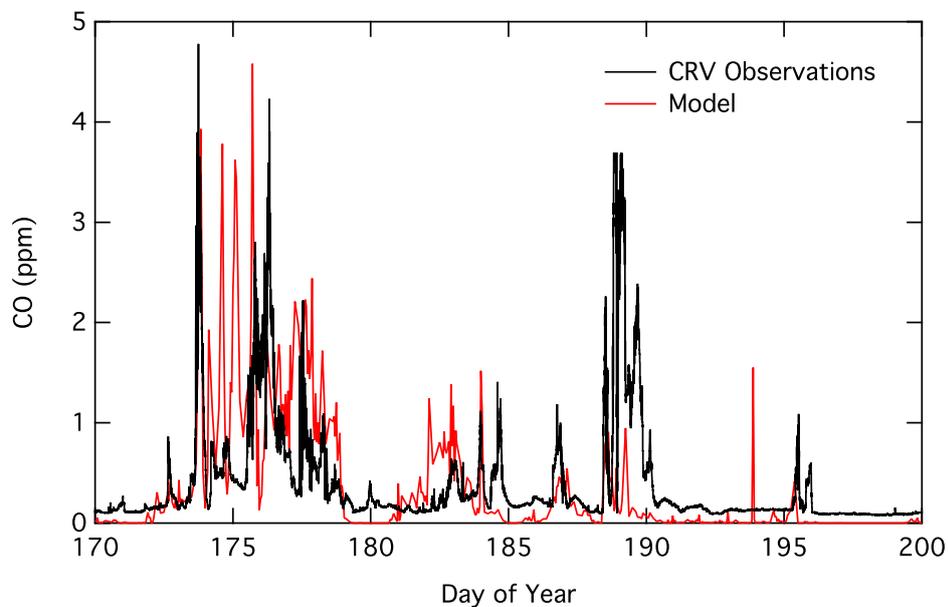


Figure 7. CRV observations of CO (black) compared to modeled CO anomaly due to fires (red).

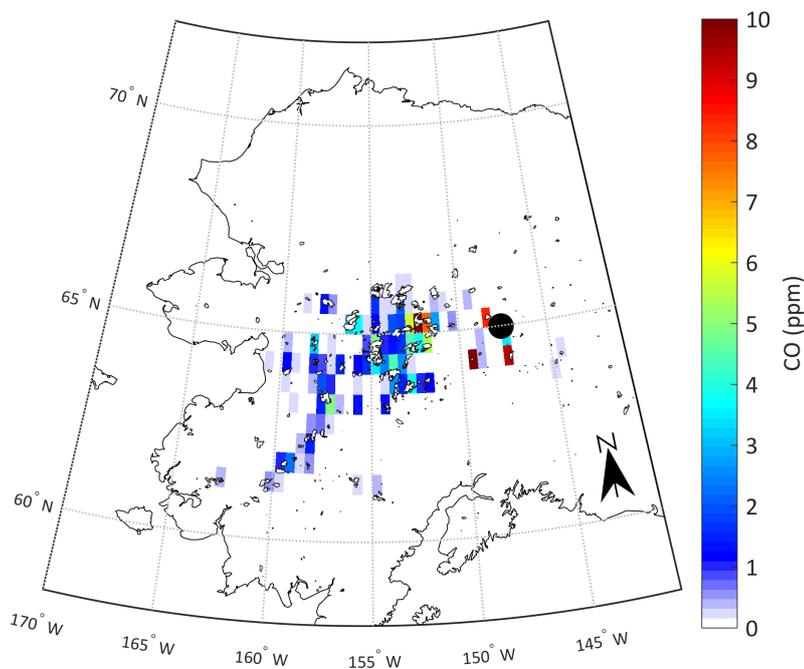


Figure 8. Total individual fire contributions to CO anomaly at CRV tower determined by convolving footprints from PWRF-STILT with fire emissions from AKFED. The location of CRV tower is shown as a black dot. Fire perimeters are shown as black outlines.

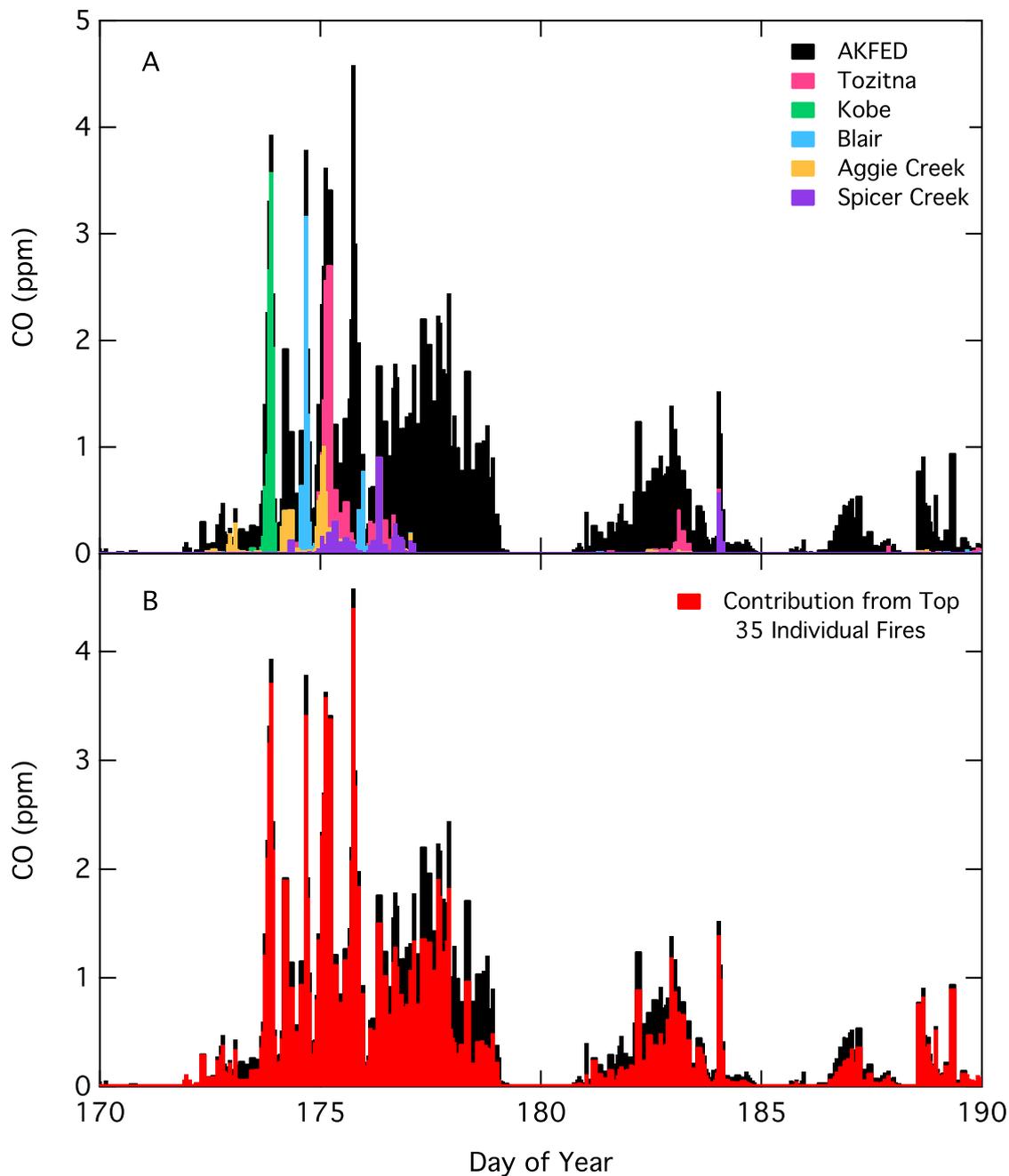


Figure 9. A) Largest 5 individual fire contributions to the CO anomaly simulated at CRV tower. Black shows original AKFED \times PWRP-STILT model, red depicts contributions from the Tozitna fire, green from Kobe fire, blue from Blair fire, gold from Aggie Creek fire, and purple from Spicer Creek fire. B) The total CO anomaly from all fires that contributed to at least 1% of the modeled CO anomaly at CRV tower (red) compared to the original model (black).

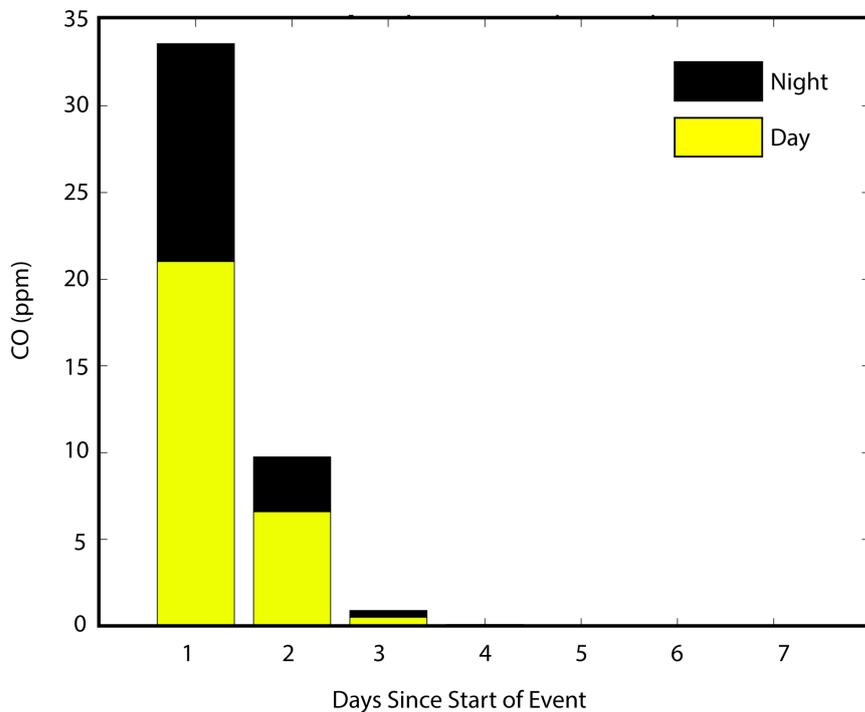


Figure 10. Temporal distribution of CO anomaly at the CRV tower caused by fires, calculated by multiplying footprints from PWRP-STILT with fire emissions from AKFED. Only times when emission ratios were calculated are used in the analysis.

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Tables

Study	Location	# Fires Sampled	Sampling Strategy	CO Emission Ratio				CO Emission Factor	MCE
				Mean	Flaming	Mixed	Smoldering		
Prescribed Fires									
Cofer et al. (1990)	Canada	2	Flask (A)	0.096 ± 0.010	0.064 ± 0.006	0.103 ± 0.006	0.122 ± 0.018	102 ± 29	0.912 ± 0.016
Cofer et al. (1998)	Canada	2	Flask (A)	0.140 ± 0.001	0.094 ± 0.001		0.185 ± 0.001	148 ± 13	0.877 ± 0.002
Wildfires									
Radke et al. (1991)	Canada	1	Gas Analyzer (A)	0.095 ± 0.049				101 ± 52	0.913 ± 0.082
Nance et al. (1993)	Alaska	1	Flask (A)	0.078 ± 0.001				83 ± 12	0.927 ± 0.002
Goode et al. (2000)	Alaska	4	Gas Analyzer (A)	0.085 ± 0.008				90 ± 9	0.922 ± 0.014
Simpson et al. (2011)	Canada	5	Flasks (A)	0.110 ± 0.070				117 ± 72	0.901 ± 0.061
Mean		15		0.102 ± 0.030	0.079 ± 0.004	0.103 ± 0.006	0.154 ± 0.010	109 ± 36	0.907 ± 0.032
This Study	Alaska	35	Gas Analyzer (G)	0.138 ± 0.048	0.056 ± 0.020	0.096 ± 0.006	0.159 ± 0.036	145 ± 46	0.879 ± 0.068

Table 1. Comparison of CO and CH₄ emission ratios, emission factors, and modified combustion efficiency (MCE) from previous studies that measured in-situ boreal fires. Number of fires sampled per study is given in parenthesis following the location. Aircraft based studies are denoted with an (A) following the sampling strategy and ground based studies are denoted with a (G) following the sampling strategy. The studies are organized based on the type of fire they measured, prescribed fires or wildfires. We did not include studies that measured slash and tramp prescribed fires or laboratory fires. The CO emission ratio column has units of ppmv ppmv⁻¹ and use CO₂ as the reference gas. This column is separated into the mean per study and by fire combustion phase including flaming, mixed, and smoldering when available. Emission factors were calculated from emission ratios assuming the carbon content of combusted fuel was 45% when not provided by the study. MCE was calculated as 1/(1+CO emission ratio) when not given in the study. The weighted mean of emission ratios, emission factors, and MCE for all previous aircraft based studies is shown in the row labeled mean, with each study weighted by the number of fires sampled.

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Event	N	Time of Event	CO Emission Ratio	CO Emission Factor	CH ₄ Emission Ratio	CH ₄ Emission Factor	Modified Combustion Efficiency	Combustion Phase
1	82	173.27 - 173	0.161 ± 0.004	169 ± 4.32	0.012 ± 0.0003	7.14 ± 0.16	0.861 ± 0.006	Smoldering
2	95	173.32 - 173	0.151 ± 0.004	159 ± 4.15	0.011 ± 0.0002	6.78 ± 0.15	0.869 ± 0.006	Smoldering
3	95	173.36 - 173	0.141 ± 0.003	148 ± 3.10	0.010 ± 0.0002	6.28 ± 0.13	0.877 ± 0.005	Smoldering
4	83	173.40 - 173	0.149 ± 0.008	156 ± 7.94	0.011 ± 0.0005	6.41 ± 0.32	0.870 ± 0.011	Smoldering
5	95	173.45 - 173	0.130 ± 0.006	137 ± 5.97	0.009 ± 0.0004	5.64 ± 0.25	0.885 ± 0.009	Smoldering
6	95	173.84 - 173	0.136 ± 0.008	143 ± 8.01	0.014 ± 0.0009	8.40 ± 0.52	0.880 ± 0.012	Smoldering
7	85	174.27 - 174	0.170 ± 0.008	178 ± 8.13	0.008 ± 0.0003	5.08 ± 0.20	0.855 ± 0.011	Smoldering
8	95	175.15 - 175	0.080 ± 3e-4	84 ± 0.33	0.004 ± 3e-5	2.51 ± 0.02	0.926 ± 0.001	Flaming
9	95	175.19 - 175	0.143 ± 0.007	151 ± 7.25	0.008 ± 0.0004	4.83 ± 0.25	0.875 ± 0.011	Smoldering
10	58	175.23 - 175	0.091 ± 0.002	96 ± 2.20	0.005 ± 0.0002	2.78 ± 0.11	0.916 ± 0.004	Mixed
11	88	175.27 - 175	0.091 ± 0.001	96 ± 1.43	0.005 ± 0.0001	3.15 ± 0.04	0.917 ± 0.002	Mixed
12	95	175.32 - 175	0.153 ± 0.003	161 ± 3.51	0.009 ± 0.0002	5.19 ± 0.10	0.867 ± 0.005	Smoldering
13	89	175.40 - 175	0.187 ± 0.012	196 ± 12.3	0.013 ± 0.0008	7.73 ± 0.48	0.842 ± 0.017	Smoldering
14	95	175.66 - 175	0.060 ± 0.003	63 ± 3.05	0.005 ± 0.0002	2.71 ± 0.12	0.943 ± 0.005	Flaming
15	55	175.75 - 175	0.129 ± 0.001	135 ± 1.43	0.009 ± 0.0001	5.13 ± 0.07	0.886 ± 0.002	Smoldering
16	35	175.77 - 175	0.237 ± 0.015	248 ± 15.4	0.017 ± 0.0010	10.1 ± 0.60	0.809 ± 0.019	Smoldering
17	95	175.80 - 175	0.147 ± 0.002	154 ± 2.00	0.011 ± 0.0001	6.32 ± 0.06	0.872 ± 0.003	Smoldering
18	95	175.88 - 175	0.155 ± 0.003	162 ± 3.40	0.009 ± 0.0002	5.71 ± 0.15	0.866 ± 0.005	Smoldering
19	95	175.92 - 175	0.198 ± 0.004	207 ± 4.44	0.012 ± 0.0001	7.37 ± 0.07	0.835 ± 0.006	Smoldering
20	80	175.98 - 176	0.193 ± 0.003	203 ± 2.67	0.011 ± 0.0001	6.50 ± 0.09	0.838 ± 0.004	Smoldering
21	95	176.06 - 176	0.119 ± 0.007	125 ± 7.49	0.008 ± 0.0004	5.00 ± 0.27	0.893 ± 0.011	Smoldering
22	95	177.06 - 177	0.105 ± 0.001	110 ± 1.01	0.010 ± 0.0001	5.77 ± 0.04	0.905 ± 0.002	Mixed
23	75	177.11 - 177	0.122 ± 0.002	128 ± 2.10	0.011 ± 0.0001	6.34 ± 0.09	0.892 ± 0.003	Smoldering
24	95	177.15 - 177	0.129 ± 0.001	135 ± 1.41	0.010 ± 0.0001	6.28 ± 0.07	0.886 ± 0.002	Smoldering
25	95	177.19 - 177	0.102 ± 0.002	107 ± 2.31	0.008 ± 0.0002	4.87 ± 0.11	0.908 ± 0.004	Mixed
26	58	177.23 - 177	0.148 ± 0.011	155 ± 11.6	0.012 ± 0.0009	6.94 ± 0.53	0.871 ± 0.017	Smoldering
27	94	177.27 - 177	0.060 ± 0.002	63 ± 1.61	0.004 ± 0.0001	2.47 ± 0.06	0.944 ± 0.003	Flaming
28	95	177.80 - 177	0.094 ± 0.002	98 ± 2.10	0.008 ± 0.0001	4.52 ± 0.09	0.914 ± 0.003	Mixed
29	95	177.88 - 177	0.120 ± 0.006	126 ± 5.99	0.020 ± 0.0012	12.2 ± 0.71	0.893 ± 0.009	Smoldering
30	95	177.92 - 177	0.161 ± 0.006	169 ± 5.94	0.017 ± 0.0007	10.3 ± 0.39	0.861 ± 0.008	Smoldering
31	95	183.62 - 183	0.114 ± 0.004	120 ± 4.47	0.009 ± 0.0003	5.58 ± 0.20	0.897 ± 0.007	Smoldering
32	95	184.23 - 184	0.232 ± 0.014	244 ± 14.9	0.013 ± 0.0007	8.06 ± 0.43	0.811 ± 0.019	Smoldering
33	80	186.49 - 186	0.025 ± 0.002	26 ± 1.77	0.002 ± 0.0001	1.21 ± 0.07	0.976 ± 0.003	Flaming
34	95	188.06 - 188	0.190 ± 0.002	200 ± 2.62	0.013 ± 0.0002	8.12 ± 0.10	0.840 ± 0.004	Smoldering
35	95	188.10 - 188	0.106 ± 0.002	111 ± 2.28	0.008 ± 0.0002	5.00 ± 0.10	0.904 ± 0.004	Mixed
36	95	188.14 - 188	0.115 ± 0.001	120 ± 1.12	0.008 ± 0.0001	5.03 ± 0.04	0.897 ± 0.002	Smoldering
37	85	188.19 - 188	0.097 ± 0.002	102 ± 2.11	0.007 ± 0.0002	4.34 ± 0.09	0.911 ± 0.003	Mixed
38	95	188.40 - 188	0.194 ± 0.003	204 ± 2.64	0.012 ± 0.0002	7.34 ± 0.09	0.837 ± 0.004	Smoldering
39	95	188.45 - 188	0.131 ± 0.004	138 ± 3.89	0.013 ± 0.0006	7.89 ± 0.34	0.884 ± 0.006	Smoldering
40	36	188.53 - 188	0.146 ± 0.002	153 ± 1.71	0.012 ± 0.0001	6.95 ± 0.05	0.873 ± 0.002	Smoldering
41	95	188.58 - 188	0.158 ± 0.001	166 ± 1.00	0.012 ± 0.0001	7.25 ± 0.04	0.863 ± 0.001	Smoldering
42	95	188.62 - 188	0.179 ± 0.002	188 ± 2.06	0.014 ± 0.0002	8.21 ± 0.10	0.848 ± 0.003	Smoldering
43	74	188.66 - 188	0.214 ± 0.011	224 ± 11.6	0.015 ± 0.0008	9.12 ± 0.47	0.824 ± 0.015	Smoldering
44	95	188.71 - 188	0.138 ± 0.005	145 ± 4.85	0.010 ± 0.0004	5.87 ± 0.22	0.879 ± 0.007	Smoldering
45	95	188.75 - 188	0.055 ± 0.003	58 ± 3.42	0.006 ± 0.0002	3.54 ± 0.13	0.948 ± 0.006	Flaming
46	95	188.79 - 188	0.272 ± 0.009	286 ± 9.92	0.012 ± 0.0005	7.29 ± 0.27	0.786 ± 0.012	Smoldering
47	52	188.84 - 188	0.120 ± 0.002	126 ± 1.72	0.009 ± 0.0001	5.52 ± 0.08	0.893 ± 0.003	Smoldering
48	39	188.86 - 188	0.091 ± 0.002	96 ± 2.12	0.007 ± 0.0001	4.39 ± 0.06	0.916 ± 0.003	Mixed
49	59	189.03 - 189	0.154 ± 0.012	162 ± 12.6	0.010 ± 0.0008	6.19 ± 0.47	0.867 ± 0.018	Smoldering
50	95	189.27 - 189	0.149 ± 0.008	156 ± 8.88	0.011 ± 0.0005	6.43 ± 0.33	0.871 ± 0.013	Smoldering
51	30	189.34 - 189	0.090 ± 0.009	95 ± 9.46	0.006 ± 0.0005	3.54 ± 0.32	0.917 ± 0.015	Mixed
52	89	189.49 - 189	0.165 ± 0.009	173 ± 9.44	0.012 ± 0.0007	7.19 ± 0.39	0.858 ± 0.013	Smoldering
53	95	195.14 - 195	0.140 ± 0.007	147 ± 7.61	0.010 ± 0.0006	6.31 ± 0.33	0.877 ± 0.011	Smoldering
Mean			0.138 ± 0.048	145 ± 50.0	0.010 ± 0.0035	6.05 ± 2.09	0.879 ± 0.037	

Table 2. Events of elevated trace gas concentrations at the CRV tower due to fire emissions. Columns show the number of 30 s measurements used to calculate emission factors for each event (N), the time of the event, emission ratios (ppmv ppmv⁻¹), emission factors (g per kg biomass combusted), and modified combustion efficiency (MCE). Dominant combustion phase is described as flaming, mixed, or smoldering.



	Fire Name	Distance (km)	Contribution (%)	Total Hectares	Fuel Type	Ignition Source	
1	Tozitna	229	10.7	31652	Black Spruce	Lightning	
2	Kobe	119	7.20	3444	Black Spruce	Lightning	
3	Blair	82	6.31	15217	Black Spruce	Lightning	5
4	Aggie Creek	41	5.63	12829	Black Spruce	Lightning	
5	Spicer Creek	195	5.30	39761	Black Spruce	Lightning	
6	Blind River	252	3.87	24608	Black Spruce	Lightning	
7	Holtnakatna	404	3.44	90308	Mixed	Lightning	
8	Blazo	514	3.39	49106	Black Spruce	Lightning	
9	Big Creek 2	351	3.23	126637	Black Spruce	Lightning	
10	Chitanana River	241	3.12	17483	Black Spruce	Lightning	10
11	Sea	309	3.06	172	Black Spruce	Human	
12	Sushgitit Hills	276	2.92	111712	Black Spruce	Lightning	
13	Big Mud River 1	254	2.72	42076	Black Spruce	Lightning	
14	Lost River	347	2.58	21088	Black Spruce	Lightning	
15	Munsatli 2	302	2.36	40682	Black Spruce	Lightning	
16	FWA Small Arms Complex	19	2.31	740	Black Spruce	Prescribed	15
17	Tobatokh	280	2.24	21868	Black Spruce	Lightning	
18	Trail Creek	363	2.24	11939	Black Spruce	Lightning	
19	Lloyd	201	2.22	26818	Black Spruce	Lightning	
20	Isahultila	342	2.17	60445	Black Spruce	Lightning	
21	Nulato	499	2.17	449	Black Spruce	Lightning	
22	Three Day	472	2.17	39378	Black Spruce	Lightning	20
23	Hay Slough	188	1.90	37007	Black Spruce	Lightning	
24	Rock	316	1.83	3714	Other	Lightning	
25	Sulukna	329	1.77	6760	Black Spruce	Lightning	
26	Titna	273	1.77	12415	Black Spruce	Lightning	
27	Quinn Creek	657	1.49	2002	Other	Lightning	
28	Harper Bend	188	1.45	17555	Black Spruce	Lightning	
29	Hard Luck	328	1.43	5230	Black Spruce	Lightning	25
30	Fox Creek	369	1.42	2346	Black Spruce	Lightning	
31	Bering Creek	280	1.36	45654	Black Spruce	Lightning	
32	Eden Creek	324	1.16	18614	Black Spruce	Lightning	
33	Falco	390	1.10	1817	Mixed	Lightning	
34	Jackson	202	1.00	2969	Black Spruce	Lightning	
35	Dulbi River	404	0.95	22057	Black Spruce	Lightning	30

Table 3. All fires that contributed to at least 1% of the total CO anomaly observed at CRV tower ordered by largest CO contribution. The distance column represents the distance of the center of the fire perimeter to CRV tower. Contribution is the percent contribution to the total integral of fire CO at CRV for the entire 2015 fire season. Some fires were grouped together if they were inside the same 0.5° grid cell during model coupling. For those cases, individual fire contribution to the CO anomaly observed at CRV tower was weighted based on fire size.