Investigating Alaskan methane and carbon dioxide fluxes using measurements from the CARVE tower

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Abstract

Northern high-latitude carbon sources and sinks, including those resulting from degrading permafrost, are thought to be sensitive to the rapidly warming climate. Because the near-surface atmosphere integrates surface fluxes over large (~500-1000 km) scales, atmospheric monitoring of carbon dioxide (CO_2) and methane (CH_4) mole fractions in the daytime mixed

layer is a promising method for detecting change in the carbon cycle throughout boreal Alaska. Here we use CO_2 and CH_4 measurements from a NOAA tower 17 km north of Fairbanks AK, established as part of NASA's Carbon in Arctic Reservoirs Vulnerability Experiment (CARVE), to investigate regional fluxes of CO_2 and CH_4 for 2012-2014. CARVE was designed to use aircraft and surface observations to better understand and quantify the sensitivity of Alaskan carbon fluxes to climate variability. We use high-resolution meteorological fields from the Polar Weather Research and Forecasting (WRF) model coupled with the Stochastic Time-Inverted Lagrangian Transport model (hereafter, WRF-STILT), along with the Polar Vegetation Photosynthesis and Respiration Model (PolarVPRM), to investigate fluxes of CO_2 in boreal Alaska using the tower observations, which are sensitive to large areas of central Alaska. We show that simulated PolarVPRM/WRF-STILT CO_2 mole fractions show remarkably good agreement with tower observations, suggesting that the WRF-STILT model represents the meteorology of the region quite well, and that the PolarVPRM flux magnitudes and spatial distribution are generally consistent with CO_2 mole fractions observed at the CARVE tower. One exception to this good agreement is that during the fall of all three years, PolarVPRM cannot reproduce the observed CO_2 respiration. Using the WRF-STILT model, we find that average CH_4 fluxes in boreal Alaska are somewhat lower than flux estimates by Chang et al. (2014) over all of Alaska for May-September 2012; we also find enhancements appear to persist during some wintertime periods, augmenting those observed during the summer and fall. The possibility of significant fall and winter CO_2 and CH_4 fluxes underscores the need for year-round in-situ observations to quantify changes in boreal Alaskan annual carbon balance.

1 Introduction

The carbon cycle of the high northern latitudes has been the subject of study and research for many decades (Harriss et al., 1992; Oechel et al., 1993; Walter et al., 2007; McGuire et al., 2010; Olefeldt et al., 2013), with scientists and policy makers more recently focused on its impact on global climate. This focus is in part due to the fact that global warming has affected temperatures in the high northern latitudes more significantly than any other region (IPCC, 2013). Higher temperatures could lead to a positive feedback of increased terrestrial emissions of CO_2 and CH_4 (McGuire et al., 2009; O'Connor et al., 2010; Hayes et al., 2014; Schuur et al., 2015), including a possibility of large emissions from thawing Arctic

permafrost. However, the timing and magnitude of such a feedback remain uncertain (Schuur et al., 2008; Schuur et al., 2009; Schuur et al., 2015), and analysis of CH_4 and CO_2 measurements from the Global Greenhouse Gas Reference Network (GGGRN; www.esrl.noaa.gov/gmd/ccgg) do not yet show signs of enhanced Arctic to mid-latitude gradients (Bruhwiler et al., 2014; CarbonTracker, 2013). Planned future studies of ecosystems and carbon cycling in Arctic and boreal regions are intended to monitor changes in climate and carbon fluxes (e.g. NASA's Arctic-Boreal Vulnerability Experiment (ABoVE), above.nasa.gov; Next-Generation Ecosystem Experiments (NGEE) Arctic, ngee-arctic.ornl.gov). To this end, quantification of current carbon fluxes from the northern high latitudes, including Alaska, is a crucial piece of any effort to detect changes in the Arctic and boreal carbon cycle.

The Carbon in Arctic Reservoirs Vulnerability Experiment (CARVE) was a 5-year NASA Earth Ventures (EV-1) airborne science investigation to quantify atmospheric mole fractions and surface-atmosphere fluxes of CO_2 and CH_4 and correlate these with key surface-state variables for terrestrial ecosystems in Arctic and boreal Alaska. In this region, both CO_2 and CH_4 fluxes are dominated by the terrestrial biosphere; CH_4, fluxes in particular are dominated by wetland emissions (Kirschke et al., 2013; Bruhwiler et al., 2014). Fossil fuel emissions are concentrated in urban areas and in parts of the North Slope associated with oil exploration and production near Prudhoe Bay. Studies have also shown some contribution to CH_4 emissions from ebullition from lakes, a source not usually included in wetland inventories (Walter et al., 2007). CARVE's goal is to bridge critical gaps in our knowledge and understanding of Arctic-boreal ecosystems, linkages between the hydrologic and terrestrial carbon cycles, and the feedbacks from disturbances such as thawing permafrost and fires. The principal components of CARVE were the intensive aircraft campaigns conducted monthly from March to November for four consecutive years (2012 – 2015). The aircraft payload included in-situ sensors measuring CO_2, CH_4, and carbon monoxide (CO) throughout the flights, which are based out of the Fairbanks airport and cover several regions throughout Alaska (Chang et al., 2014). A stationary tower-based GHG measurement site, the CARVE tower (NOAA site code CRV), was established as part of the CARVE project, in order to give year-round context to the intensive aircraft observations. These continuous observations from a single location can verify the temporal pattern of carbon cycle models, while the aircraft observations provide information on spatial accuracy.

Measurements of CO_2 and CH_4 from towers in northern high latitudes have previously been used to analyze emissions and trends in these regions (Sasakawa et al., 2010; Winderlich et al., 2010; Worthy et al., 2015). Concentration measurements from such towers generally have large regions of influence, on scales of hundreds of kilometers, in contrast to direct flux measurements from eddy covariance flux tower sites, which may represent spatial scales closer to tens or hundreds of meters, or chamber measurements that typically represent even smaller (~1-meter) scales. In this sense, the tall tower measurements are able to integrate fluxes that have been shown to be spatially heterogeneous (Olefeldt et al., 2013). Such concentration or mole fraction measurements require interpretation using a model framework to quantify terrestrial fluxes, because they do not measure them directly.

One way to infer and assess fluxes from mole fraction observations is to use a Lagrangian particle dispersion model (LPDM) coupled with a meteorological model to determine the influence function, or footprint, of a given observation (Lin et al., 2012). In this study, the WRF-STILT modeling framework has been used to generate footprints for CARVE tower observations. Henderson et al. (2015) provide details of the model configuration and validation of the meteorological simulations. We assess CO_2 fluxes from the land surface of Alaska by convolving surface fluxes from the PolarVPRM (Luus and Lin, 2015) with the footprints and comparing the resulting modeled CO_2 enhancements with tower observations. To infer CH_4 fluxes, we have convolved the footprints with a constant (in space and time) flux model and an elevation-based flux model and scaled the results to monthly mean observed enhancements to estimate monthly average fluxes over a wide region, using similar methods as Chang et al. (2014).

In the following sections, we describe the CARVE tower site, its location, and region of influence (Sect. 2). We then describe the measurement methods and the models used to infer CO_2 and CH_4 fluxes (Sect. 3). We present the results in Sect. 4, and conclusions, including future directions, in Sect. 5.

2 Site overview

2.1 Site location

The CARVE tower site was established in October 2011, 17 km north of Fairbanks, AK, using an existing 32 m tower at the NOAA National Environmental Satellite, Data, and Information Service (NESDIS) facility in Fox, AK (64.986°N, 147.598°W, ground elevation

611 m above sea level (asl); Fig. 1). The tower was chosen for its high elevation compared to the immediate surrounding mean ground level and its relatively large region of influence, to provide temporal and spatial context for CARVE aircraft measurements in interior Alaska. The site was also chosen to satisfy logistical requirements, specifically that the site be easily accessible year-round, and that the site be in a location that the CARVE aircraft could sample over or close to during its campaigns without impacting the flight schedules or science mission of each flight. NOAA/NESDIS personnel are stationed in a NESDIS office 5 km from the road-accessible tower, providing technical support and high-speed Internet connectivity throughout the year.

The surrounding land cover (within a 20-km radius, approximately the region shown in Fig. 1b) is composed of deciduous and evergreen forest, shrub/scrub, some scattered areas of woody wetlands, mainly south of the Chena River south of Fairbanks, and medium and low-intensity developed land in and immediately around Fairbanks (population 32,000) (2011 USGS National Land Cover Database (NLCD) (Homer et al., 2015)). The tower is located on a ridge, and measurements from the tower represent a wide region of interior Alaska, however, as indicated by surface influence fields generated from the WRF-STILT modeling framework (Henderson et al., 2015), which show that the tower's influence region encompasses a substantial part of Alaska (Fig. 1a).

3 Methods

3.1 Measurements

Three separate measurement systems for trace gases are deployed at the CRV tower site. Programmable flask packages (PFPs) are used to collect air samples from the top level of the tower at 32 m above ground level (agl), daily during the CARVE flight season (April – October) and twice weekly during the remainder of the year (November – March). Additionally, measurements of $^{14}CH_4$ are made from large-volume (~1000 L) whole-air samples collected approximately biweekly, also from the 32 magl level. Lastly, continuous in-situ measurements of CO_2, CH_4, and CO are made by drawing air from three heights (32 m, 17 m, and 5 m) through a Picarro G2401-m or G2401 Cavity Ring-Down Spectroscopic (CRDS) analyzer. In addition to the measurements described above, a two-dimensional (2D) sonic anemometer was deployed at the top of the tower and was operational from April 2012

through June 2014. Here we describe the continuous CO_2, CH_4 and CO measurements made from October 2011 through the present, focusing on the calendar years 2012-2014.

Two different CRDS units have been deployed at the site as part of the CARVE project: SN CFKBDS-2008 (model G2401-m, October 2011 – June 2013 and November 2014 – January 2015), and SN CFKADS-2067 (model G2401, June 2013 – October 2014 and January 2015 – present). The only differences between the two units as configured at the site are the flow rates (~550 standard cubic centimeters per minute (sccm) for CFKBDS-2008 and ~250 sccm for CFKADS-2067) and their precision, defined here as the standard deviation of 30-second averages, in measuring CO (1.3 ppb for CFKBDS-2008 and 4.3 ppb for CFKADS-2067). Analyzer precision for CO_2 and CH_4 is the same for both analyzers (0.03 ppm and 0.2 ppb, respectively).

The CRDS analyzer draws air through 0.635 cm (0.25 inch) outer diameter (OD) tubing (Synflex 1300) with three different inlets installed at different heights above ground level: 31.7 m (level 3), 17.1 m (level 2), and 4.9 m (level 1). The analyzer primarily draws from the highest level (level 3) for 50 minutes out of every hour, and then draws air for 5 minutes from each of the other levels, operating on an hourly cycle. In our analysis, we use measurements only from the top level, using measurements from level 2 to filter observations with large vertical gradients (section 3.4); level 1 observations are not used. Measurements are discarded for a time equivalent to three flushing volumes of the line (approximately 3 minutes) after a level switch or a switch to or from a calibration tank, to allow each line to flush, because there is no separate flushing of the lines during calibrations. The sample air is not dried, and a water correction to the measurements is made in post-processing. The instrument-specific water correction is based on a laboratory experiment conducted prior to deployment of each analyzer, using methods described in Chen et al. (2013) and Rella et al. (2013). Data is collected via serial communications on a Campbell Scientific CR1000 data logger along with all auxiliary measurements (room temperature, line pressure, tank pressures, sonic anemometer measurements of temperature and 2D winds), and averaged at 30-second increments prior to remote collection via the Internet connection provided by NOAA/NESDIS.

Two standard reference gases, calibrated against NOAA standards on the WMO scales for all three gases, are each sampled every 8 hours for 5 minutes. Mole fraction measurements of CO_2, CH_4, and CO are first corrected using a linear fit to either 5 or 6 NOAA reference tanks

from a calibration performed in the laboratory prior to each analyzer deployment, and then drift-corrected using the measurements of the two tanks at the site. The average offset (difference between corrected value and the actual tank value) is used for an offset drift correction. The two on-site tanks are at two different mole fractions for each gas (373 and 409 ppm CO_2; 1818 and 2087 ppb CH_4; 177 and 284 ppb CO), so that if either the slope of the correction changes, or one tank has significant drift, the measurements would show increasing residuals with time. All measurements are reported here on the WMO scales for each gas (CO_2 X2007, CH_4 X2004, and CO X2004, (Dlugokencky et al., 2005; Zhao and Tans, 2006)). At CRV, the water correction uncertainty is estimated to be 0.1 ppm for CO_2, 0.5 ppb for CH_4, and 4 ppb for CO, based on analysis by Chen et al. (2013) for CO and Rella et al. (2013) for CO_2 and CH_4, and is independent of other variables, including water vapor. Comparisons of measurements from whole air samples in PFPs during low-variability periods show differences (median ± 1-sigma) of -0.11±0.44 ppm, 0.8±1.2 ppb, and -1.3±4.5 ppb for CO_2, CH_4, and CO, respectively, over the entire 3-year period. Total uncertainty (reproducibility and comparability to other NOAA network sites) of hourly mole fraction measurements at the site are generally <0.2 ppm, 2 ppb, and 5 ppb for CO_2, CH_4, and CO, respectively (1-sigma), based on comparisons with flasks and residuals of the calibration correction.

3.2 Polar WRF – STILT Model

The scientific analysis of CARVE atmospheric trace gas measurements is enabled through use of the Stochastic Time-Inverted Lagrangian Transport (STILT) particle dispersion model (Lin et al., 2003) coupled to the Polar variant version 3.5.1 (Wilson et al., 2011) of the Advanced Research version of the Weather Research and Forecasting (WRF-ARW (Skamarock et al., 2008)) numerical weather prediction model. The WRF-STILT modeling framework has been used in many studies to estimate GHG emissions using airborne, surface, and tower-based observations (Kort et al., 2008; Jeong et al., 2013; Chang et al., 2014; Miller et al., 2014; McKain et al., 2015). Atmospheric dispersion in the LPDM is simulated by advecting tracer particles by the three-dimensional gridded wind field from the WRF model, plus a turbulent velocity component represented as a stochastic process (Markov chain) (Lin et al., 2003). Time-averaged mass fluxes and convective mass fluxes from WRF are used in the dispersion calculations (Nehrkorn et al., 2010). For each observation location (i.e. "receptor"), STILT produces a two-dimensional surface influence field called a "footprint" (units of ppm / (μmol

m^{-2} s^{-1})) that quantifies the influence of upwind surface fluxes on atmospheric concentrations measured at the receptor location. The footprint field is proportional to the number of particles in a surface-influenced volume (defined as the lower half of the planetary boundary layer) and the time spent in that volume (Lin et al., 2003). As utilized in the current study, the footprint can be multiplied by an *a priori* flux field (units of μmol m^{-2} s^{-1}) and integrated over space and time to give the incremental contribution to the mole fraction (units of ppm) as measured at the receptor location. The CARVE Polar WRF configuration consists of a triply nested grid, with the innermost domain covering mainland Alaska on a 3.3-km grid to take advantage of the improved representation at this scale of the underlying topography in this region of significant orography. The STILT model runs over the entire WRF domain (all three grids); footprints are gridded separately from WRF in post-processing over the whole domain (30°N-90°N and 180°E-180°W). The reader is directed to Henderson et al. (2015) for more detail and validation of the meteorological fields.

STILT footprints used for this analysis were generated every 3 hours during local nighttime and hourly during local daytime, for a total of 16 footprints per day, and gridded at 0.5° x 0.5° resolution. For each footprint, 500 particles were emitted from the tower location and altitude above sea level and traced backwards in time for 10 days. The altitude above sea level rather than ground level was used for the location of the particle emission because the elevation of the model grid cell containing the tower site was significantly lower than the actual elevation of the site (343 masl vs. 611 masl), despite use of the high-resolution grid (Henderson et al., 2015). To reduce biases induced by differences in actual and modeled topography, we use footprints generated during mid-afternoon hours (1 pm to 6 pm local Alaska standard time (LST), UTC+8) only for our analysis, except where noted specifically. During these hours, the lower atmosphere is generally well-mixed, and the difference between the mole fractions measured at the top level (32 magl) and the middle level (17 magl) average between -0.25 and 0.25 ppm for CO_2 and -0.2 and 0.3 ppb for CH_4 (maximum monthly averages for the whole time series), indicating good mixing and only a small influence from nearby sources that would cause a near-surface gradient.

We also compared measurements from the top level of the tower to CARVE aircraft measurements made above the tower site, generally during the months of March to October. We compared aircraft measurements of CO_2 and CH_4 that were made below 2000 masl (1389 magl) and within 0.2 degrees in latitude and longitude of the tower, between the hours of 1

pm and 6 pm LST. This allowed us to determine how well measurements made from the top level of the tower represent planetary boundary layer (PBL) average mole fractions during those times. Differences between the 29 aircraft observations and tower-based hourly means were -0.6 ± 2.0 ppb CH_4 and 0.3 ± 0.9 ppm CO_2 (mean ± 1-sigma) during the March-October air campaign period, indicating that the hourly average mole fractions at the tower are generally representative of average mole fractions in the PBL.

We expect, based on the measured gradients at the tower and the comparison with aircraft measurements above the tower, that during local mid-afternoon periods the tower measurements closely represent measurements within a well-mixed PBL, and that during those times, the impact of the height difference between the modeled site elevation and the real site elevation is minimized. In our flux analysis, described in the following sections, we also specifically filter out hourly averages during which the absolute value of the mole fraction gradient between 17 and 32 magl levels in CH_4 is larger than 2 ppb.

We performed a sensitivity analysis on the transport model by examining footprints generated at 300 magl (the default, or 611 masl) with those generated at 100 magl and 35 magl. We found that the footprint influence from March to September of all three years was increased by a small amount, resulting in estimated CH_4 fluxes (Section 3.5) that were 5-9% lower. The effect was greater in winter months, however, affecting our flux estimates by 12-17% using the 100 magl runs and by 26-32% using the 35 magl runs (again, decreasing the fluxes due to increased surface influence). These differences were calculated only based on observations used in the flux analysis, i.e. filtered for large vertical gradients as described above. Although CH_4 fluxes reported in Section 4.5 were estimated using the footprints from the higher 300 magl altitude, reflecting the true 611 masl altitude of the observations, this sensitivity analysis indicates that uncertainty in modeled transport is greater in winter months. We have added (in quadrature) the mean summer and winter differences for each year between the analysis at 35 and 300 magl to the flux estimates for CH_4 in Section 3.5.

3.3 Calculation of background mole fractions

To compare the mole fraction variability and enhancements at CRV tower to those from the modeling framework, it is necessary to determine the appropriate background mole fractions for both CO_2 and CH_4. We derive background mole fractions using the particle trajectories from the STILT runs and a data-based Pacific basin boundary "curtain" derived from

NOAA/ESRL Global Monitoring Division GGGRN measurements using an approach similar to the one described in Jeong et al. (2013) and Miller et al. (2014). Specifically, the boundary curtain is constructed using GGGRN surface and aircraft vertical profile CO_2 and CH_4 observations (Sweeney et al. (2015) and www.esrl.noaa.gov/gmd/ccgg/aircraft/) to create a smoothed curtain representing the Pacific boundary. The curtain is a function of time, latitude, and altitude. For each STILT run, the 500 particles are traced back in time until they either exit a box defined by [170°W, 130°W] and [0°N, 75°N] or remain in the box for the full 10-day run. All particles are then tagged with an exit time, longitude, latitude, and altitude. Any particles whose final longitude is east of 160°W with a final latitude between 55 and 72°N and altitude below 3000 masl are removed in order to eliminate particles that did not enter Alaska from either the western boundary or from high altitudes within the 10-days of the observation. This filter is necessary because air masses that contain surface influence from Canada or remain in Alaska for more than 10 days would not properly be represented by the Pacific boundary as background. We note that the footprint itself is not changed by this choice, but the particles that do not enter from the West are not used in the background calculation. However, if a given 500-particle run has more than 25% of its particles eliminated due to the above constraints, no background is computed for that hour, and therefore no enhancement is computed either. This choice removes 50% of the hours from the analysis over all three years. If at least 75% of the particles remain, these remaining particles are tagged with the mole fraction from the Pacific boundary curtain at their exit latitude, altitude, and time. The mole fractions for the particles are averaged to derive the background mole fraction for the corresponding tower measurement and WRF-STILT footprint.

To understand the sensitivity of the CH_4 analysis to this choice of filtering for influence from the east, we repeated the analysis with two additional background choices: one in which all particles were tagged with a mole fraction, regardless of their origin, but the background was only calculated if 75% or more particles originated in the west; and one for which all particles were tagged and there was no filtering based on the percentage of particles not originating in the west. We found that the difference in the background values was within the one-sigma uncertainty in the background itself, calculated as described below. However, we found that including hourly observations for which the air mass did not enter strictly from the West generally reduced the monthly methane flux estimates by 9-30%; this result is discussed further in Section 3.5.

Uncertainty in the background is determined similarly to Jeong et al. (2013): it is assigned the quadrature sum of the standard error of the mean mole fraction (i.e. the standard deviation of the particle mole fractions divided by the square root of the number of particles used) with the average value of the root mean square (RMS) residuals of the empirical background curtain of the particles. The RMS residuals of the curtain are calculated at every point along the curtain (a function of latitude, altitude and time); they are the residuals of the curve fit that generates the smoothed background curtain and the data that is used to generate the curve. Thus, it is a quantification of uncertainty of the curtain itself. The background uncertainty in this work is dominated by the RMS residuals of the boundary curtain component.

3.4 CO_2 Flux Model

The CO_2 measurements at the CRV tower were interpreted with the assistance of biospheric CO_2 flux estimates generated by the Polar Vegetation Photosynthesis and Respiration Model (PolarVPRM, (Luus and Lin, 2015)). PolarVPRM captures the strong diurnal and seasonal variability of CO_2 fluxes parsimoniously, according to empirical associations between environmental conditions and eddy covariance measurements of CO_2, and regionally across Alaska (3-hourly, 1/6 x 1/4 degrees latitude x longitude), using data products from the North American Regional Reanalysis (NARR) (Mesinger et al., 2006) and the Moderate Resolution Imaging Spectroradiometer (MODIS). Subnivean and growing season respiration are calculated as functions of NARR soil and air temperature, respectively; snow and growing seasons are differentiated using MODIS snow cover (Riggs and Hall, 2011). Photosynthesis is calculated as a function of NARR air temperature, NARR shortwave radiation, water availability (via MODIS), and vegetation (via the MODIS enhanced vegetation index (Solano et al., 2010)). The CO_2 fluxes from PolarVPRM were convolved with footprints from observations at the tower to derive model-based enhancement above background (ΔCO_2) for the 3-year period from 2012-2014. These modeled CO_2 enhancements were compared to CO_2 enhancements observed at CRV.

Hourly observations used for CO_2 analysis were restricted to periods between 1 pm and 6 pm LST, to minimize discrepancies between real and modeled boundary layer dynamics. In addition, as described above, samples that had no background determination for more than 25% of the released particles were omitted. Additional filters on the data were designed to restrict analysis to periods when the PBL was most likely well mixed, as determined from the vertical gradient in CH_4 mole fractions between the 17 m and 32 m levels; only data for which

the CH_4 vertical gradient was less than 2 ppb were retained. Also, only data observations with low temporal variability were retained, determined as having a standard deviation of 30-second measurements in an hour below 7 ppb in CO and 3 ppb in CH_4; this filter was applied to reduce influence from local sources, a concern at this site because of the proximity of Fairbanks. Lastly, biomass-burning (and some large pollution) events were filtered out by removing observations for which the enhancement in CO (relative to the background determined using methods described in Sect. 3.3) exceeded 20 ppb. The combined effect of these filters and the background filter eliminated 56% of the days analyzed – most were removed by the background filter described in Sect. 3.3. The filters described above were used to filter data only for the CO_2 flux-model comparison analysis described in this section with the results in Section 4.4, and for the CH_4 footprint and flux analyses described in Sections 3.5 with results in Sections 4.5 and 4.6.

3.5 CH_4 Flux Estimation

In the CH_4 analysis, as for CO_2, only hourly average mole fractions between 1 pm and 6 pm LST were used, with the same filters applied on the observations to limit instances of high variability, large vertical gradients, and biomass burning, as outlined in Sect. 3.4. We also carried out the analysis without the observational filters and did not find any difference in the resulting monthly fluxes within the 1-sigma uncertainty of the background presented here, with the exception of months with significant biomass burning events.

Chang et al. (2014) investigated the use of existing CH_4 flux models to interpret observations from CARVE airborne campaigns and found that none of them performed better than the assumption of a uniform flux. Hence, here we use two simple flux spatial distributions to interpret the tower observations and estimate average CH_4 fluxes. The first flux map is a uniform land-based flux (with oceanic flux set to zero, assuming the oceanic CH_4 flux contribution is negligible (Kirschke et al., 2013)) similar to what was used in Chang et al. (2014) to estimate CH_4 fluxes using aircraft observations from the 2012 CARVE campaign. This model assumes a spatially constant flux over all land regions. The second flux map pattern is based on elevation data from NOAA's NGDC, (http://www.ngdc.noaa.gov/mgg/topo/report/globedocumentationmanual.pdf) (Fig. 1a). The elevation map was averaged to the same spatial resolution as the footprints (0.5° x 0.5°) and adjusted so that the ocean and elevations higher than 1000 masl were assumed to have zero

CH_4 flux. Elevations between 0 and 1000 masl were scaled linearly from 1 to 0, with areas of zero elevation (including lakes) assigned 1 and 1000 masl assigned 0. Fluxes were assumed to be diurnally constant. A third map based on elevation gradients (in which highly sloped regions had less flux and flatter areas had higher flux) was also tested, but the results were very similar to the elevation-based map, so they are not shown here.

Observed CH_4 enhancements relative to the footprint background were averaged over the mid-afternoon hours (1 pm – 6 pm LST) to obtain daily averages. These daily enhancements were then averaged to obtain monthly average ΔCH_4 values throughout each year. However, in many winter months, fewer than 6 days of observations remained after the data filtering; those months were omitted from the analysis. The constant flux map and the elevation-based flux map were convolved with the hourly footprints from the WRF-STILT model to obtain initial values of modeled ΔCH_4. These were then averaged to create daily values (with the same filters as for the observations) and then to monthly values. The monthly flux maps were then scaled to the observations, so that the simulated monthly ΔCH_4 matched the observations. This method is equivalent to taking the mean of the individual daily flux estimates (F_D) weighted by their corresponding footprints (I_D). For the case of unit flux, the daily flux estimate (F_D) is the CH_4 enhancement (ΔCH_4) divided by the footprint influence:

$$F_D = \frac{(\Delta CH_4)_D}{I_D}$$

The monthly average flux (F_M), is the average of the daily fluxes weighted by each day's influence, which is equivalent to dividing an average methane enhancement by the average monthly influence, I_M:

$$F_M = \frac{\sum_D F_D I_D}{\sum_D I_D} = \frac{\overline{\Delta CH_{4,M}}}{\overline{I_M}}$$

Uncertainties on monthly fluxes were determined from the background mole fraction uncertainty and uncertainty based on a sensitivity analysis of influence functions calculated using different heights in the model (Section 3.2). A formal transport uncertainty analysis (e.g., error in PBL depth or wind speed) was not considered, but would likely increase the errors shown here. Monthly background errors (Section 3.3) for CH_4 ranged from 2-7 ppb (average 5 ppb), which was generally of the same order of magnitude as the CH_4

enhancements. Uncertainty on the monthly enhancements was calculated as the average of the uncertainty on the background for each day divided by the square root of the number of independent samples during that month, approximating the standard error of the monthly mean enhancement. The correlation time scale of the background for CH_4 (after a 60-day smoother was subtracted to eliminate the long-term temporal correlations) was approximated at 9 days, consistent with synoptic-scale variability. The number of independent realizations for each month was therefore derived as the number of days in that month divided by 9. This represents a 1-sigma uncertainty estimate; the fractional uncertainty on the monthly CH_4 enhancement was then summed in quadrature with the uncertainty based on the altitude sensitivity analysis and propagated to the monthly flux estimates.

A sensitivity analysis to the background filter, as described in Section 3.3, showed that the background mole fractions were within the 1-sigma uncertainty when calculated using the two additional background options. We did find, however, that the fluxes were generally 9-30% lower when the observations with the bulk of the air mass not entering from the West were included. We found that in this case, the average footprint influence was greater, likely because the air masses spent more time over land. With no corresponding increase in observed CH_4 enhancements, this led to a lower flux estimate on those days. However, the CH_4 enhancements in this case have high uncertainties because it is very hard to estimate what the background for those days might be.

4 Results

4.1 Diurnal cycles

The diurnal cycles of CO_2 and CH_4 at the tower have been analyzed over the study period, 2012-2014. All analysis shown is based on hourly-averaged measurements from the top-most level at 32 magl. Measurements during times when the CO mole fraction exceeded 200 ppb were removed to filter out the effect of large biomass burning events. No other filters were applied on the data in this portion of the analysis. The diurnal cycle of CO_2 shows an amplitude (maximum – minimum CO_2) of 10 ppm in July, with a wintertime (November-April) magnitude of approximately 2 ppm (Fig. 2, top panel), with similar patterns each year. CH_4 diurnal cycle amplitudes also show a maximum in summer (in either July or August, depending on the year) between 20 and 30 ppb. The wintertime diurnal cycle of CH_4, driven by boundary layer dynamics, shows an average amplitude of 10 ppb (Fig. 2, lower panel).

Shaded areas in Fig. 2 indicate the standard deviation of that month's average over all days in the 3-year period, indicating significant variability in the amplitudes for both gases, and especially for CH_4, where the amplitude variability (one-sigma) ranges from zero to 45 ppb.

The average amplitudes of the CH_4 and CO_2 diurnal cycles at the CARVE tower are significantly smaller than those that have been reported at other Arctic and boreal measurement sites. Worthy et al. (2015) compare diurnal cycle amplitudes of CH_4 at various Arctic tower sites throughout Canada and North America, finding that summertime diurnal CH_4 amplitudes at all the Arctic and boreal Canadian sites are significantly larger than at CRV tower. Sasakawa et al. (2010; 2013) report larger CH_4 and CO_2 diurnal cycle magnitudes as well from a network of Siberian tower sites. Winderlich et al. (2010) also report similarly large diurnal cycle amplitudes in CH_4 (~200 ppb) and CO_2 (~25 ppm) from the lower levels of the ZOTTO tall tower in boreal Siberia; however, at the highest level (301 magl) the average July 2009 diurnal cycle amplitude is significantly smaller at ~50 ppb CH_4 and ~5 ppm CO_2, presumably because the top of the night-time PBL is often below this tallest level. This may be the case at CRV, which despite its low height above ground level, is elevated above the surrounding area and does not observe high CH_4 mole fractions from lower-elevation wetlands at night, as their emissions would be trapped in the shallow valleys below the site. The CRV tower is surrounded by deciduous and evergreen forest, however, so the CO_2 cycle is comparably larger. The diurnal cycle at the 17 magl and 5 magl levels is slightly greater than at 32 magl in summer, but not significantly so (1-2 ppb larger for CH_4 and 1-2 ppm for CO_2 on average in July and August).

4.2 Seasonality of winds and influence functions

The mid-afternoon daily average footprints (the entire set of footprints, without applying a background or other filter) from the WRF-STILT model were examined to determine the influence of different regions on the measurements at the tower throughout the year. The total magnitude of land-surface influence (ocean influence is not included) on the tower measurements for each month of each of the three study years (2012, 2013, 2014) was determined (Fig. 3), along with the total influence of several sub-regions: Canada (light blue, Fig. 3), the North Slope of Alaska (defined as north of the Brooks Range, red, Fig. 3), the remainder of Alaska (dark blue, Fig. 3), and Eurasia (yellow, Fig. 3). The seasonality of the land surface influence is clear and consistent between all three years. Specifically, in all three years, the months of May through September show significantly less land surface influence on

the tower than October through April. This stems from the smaller influence of Canada, and to a lesser extent, lower Alaska, on the measurements during the summer months. The influence of the Eurasian continent is very small throughout the years, but so is the influence of the North Slope of Alaska. This is also apparent when the mid-afternoon footprint influences are aggregated over seasons and years, as shown in the 80% influence range (Fig. 1a), which does not include the North Slope region. The footprint influence from the subset of days used in the analysis in sections 4.4 and 4.5 is also shown in Fig. 1a, showing correspondingly less influence from Canada, since the main filter applied removed days for which significant portions of the air mass did not enter the domain from the West. Without a good method for estimating background concentrations when winds are coming from the eastern sector we are substantially limiting the potential of this tower to monitor fluxes from the domain east of the site. From this analysis we also conclude that measurements at the CRV tower are not substantially affected by emissions north of the Brooks Range, and any emissions estimates made using the tower measurements will not apply to the North Slope.

Daytime wind measurements from the 2D sonic anemometer (from all days when it was operational) at the tower support the finding of large seasonality in the footprints (Fig. 4). Winds at the tower during May-September are predominantly from the west and southwest, with some frequency of winds from the east as well. However, from October to April, the winds are almost exclusively from the east/northeast. These wind directions support the conclusion from the model influence functions that wintertime measurements are more influenced by Canadian land than in summertime, as shown in Fig. 3. In addition, winds in any season do not generally come from the North, supporting the lack of influence from the North Slope. Similar seasonality and lack of northern influence was found in a recent analysis of data from NOAA/ESRL Aircraft Network at Poker Flat, AK (Sweeney et al., 2015).

4.3 Background and Relative Enhancements of CH_4, CO_2, and CO

The definition of an appropriate background is a crucial aspect of analyzing the CRV tower CO_2 and CH_4 measurements. We calculate the background as described in Sect. 3.3, using the particle back trajectories and the empirical Pacific boundary curtain, and refer to this as the footprint background. We also compare this background to the value of the same Pacific curtain at 3500 masl and 65°N, i.e. the free troposphere at the latitude of the tower. For CO_2 (middle panel, Fig. 5) the definition of the background does not have as large an effect as it

does for CH_4. For CH_4 (top panel, Fig. 5) the choice of background is crucial to any analysis of the measurements, for two reasons. First, the CH_4 signal at CRV is relatively small compared to the variability of the background. Second, the CH_4 background varies depending on the latitudinal origin of the air mass, because of the large global latitudinal gradient in CH_4 (Dlugokencky et al., 2009). Comparison of the measurements with the footprint background and free-tropospheric background (Fig. 5) illustrates that the footprint background varies at synoptic time scales as air-mass origins change, and tracks the variability in the measurements at the site. CH_4 enhancements over background are small and thus very sensitive to background choice (top panel in Fig. 5). We note that despite the small signal, however, the time series of CH_4 observations clearly shows both wintertime and summertime enhancements, with wintertime enhancements sometimes correlated with CO enhancements as well, indicating a possible anthropogenic source for these signals (see Sect. 4.6 and Table 1). Evidence of biomass burning events is also clear in all three species, but most easily observed in the CO signals during the summers of 2012 and 2013.

4.4 CO_2 Model-Observation Comparison

Observations of monthly mean CO_2 relative to the background (ΔCO_2) show consistent features from year to year (Fig. 6), with the sign of the enhancements showing the sign of the monthly net CO_2 fluxes, or Net Ecosystem Exchange (NEE). Positive enhancements from January-April indicate that respiration is occurring even during this coldest period of the year. In addition, all years show the highest respiration signal in October, possibly indicative of photosynthesis stopping while soil temperatures are still high enough to sustain significant respiration, although some of this signal could also be due to the seasonality in vertical mixing and/or winds. Although the maximum drawdown occurs in July and is of similar magnitude in all years (~8 ppm), the transition from net respiration to net photosynthetic uptake occurs earlier in 2014 (April) than in 2012 and 2013 (May). The timing and magnitude of the ΔCO_2 observations relative to background represent a stringent test for the transport and surface flux models.

The modeled ΔCO_2 from the convolution of WRF-STILT footprints with PolarVPRM fluxes are compared to hourly averaged observed ΔCO_2 mole fractions at the tower during the mid-afternoon in Figs. 6 and 7. (Note that the time series data in Fig. 6 (top) has not been filtered, but the monthly averages in the lower panel and the data shown in Fig. 7 only use filtered

data.) Both the hourly time series and monthly average comparisons between modeled and observed ΔCO_2 at the tower during mid-day hours indicate that the PolarVPRM fluxes and WRF-STILT meteorology are able to reproduce the magnitude and timing of the tower CO_2 signal remarkably well during most seasons (Fig. 6). Hourly observations of ΔCO_2 that satisfy the filtering conditions are well correlated with modeled ΔCO_2 in all three years (Fig. 7). The data close to the 1:1 line indicate that the magnitude of the fluxes is generally well captured by the model. The correlations are strong in all three years (R^2 = 0.61 to 0.75), indicating that the PolarVPRM CO_2 fluxes and the WRF-STILT transport model are able to reproduce observed signals at the tower remarkably well with no adjustment to match the data.

There are two exceptions apparent in otherwise the very good comparison between the model and observations. First, monthly average ΔCO_2 observations compared to the model (Fig. 6, lower panel) indicate that the PolarVPRM/WRF-STILT modeled NEE is slightly more negative than observations in May and June in both 2012 and 2013, with an earlier spring drawdown in the model than the observations suggest. However, in all of these months the model results, with no uncertainty estimates, overlap with the one-sigma data uncertainty. This difference is also observable in the correlations between modeled and observed ΔCO_2 (Fig. 7), with some data points with more negative ΔCO_2 in the model than in the observations. Whether this small offset between model and observations results from insufficient modeled respiration or too much modeled photosynthesis during the spring is impossible to tell from CO_2 observations only. A second exception to the very good agreement is that the model systematically underestimates the magnitude of the observed late fall respiration flux (October to November) in all three years. This may be because model respiration is calculated as a function of air temperature when per-pixel snow cover area is <50%, whereas actual rates of late fall respiration are influenced by microbial activity sustained in the soil, which cools more gradually than the air. Despite these differences, the overall good agreement between model and observations indicates that in addition to capturing the magnitude, the PolarVPRM and WRF-STILT models are likely capturing most of the timing and spatial structure of the fluxes in boreal Alaska as well.

4.5 CH_4 Model-Observation Comparison

The scaled monthly CH_4 fluxes from the elevation-based and uniform (constant) flux maps were convolved with the WRF-STILT footprints corresponding to the observations. The

hourly ΔCH_4 from each model was compared with the observed enhancements (Fig. 8) for each year. The elevation-based model enhancements (lower row, Fig. 8) match the data slightly better than the uniform flux model (upper row, Fig. 8) in 2012 and 2014, but not 2013. We also investigated a third spatial flux map pattern that was based on the gradient in elevation, but did not find any improvement in the correlations over the simpler elevation-based and uniform flux models. Neither model was able to achieve good correlations between the model and the observations, a conclusion that was also reached by Chang et al. (2014) when they investigated multiple different CH_4 flux models. This result is in sharp contrast to the high correlations achieved using the PolarVPRM CO_2 fluxes with the same WRF-STILT footprints, leading to the conclusion that the WRF-STILT meteorology is able to replicate observations when an accurate spatial flux map is used. Although the approximate magnitude of the CH_4 enhancements is correct because of the monthly scaling, the large spread and lack of correlation around the 1:1 line indicates that the model cannot replicate hourly variability in enhancements, because the uniform spatial and temporal (we assume constant monthly fluxes) representation is likely to be incorrect, and likely because of higher relative uncertainty in the background.

4.6 Average Scaled CH_4 Fluxes

Monthly CH_4 fluxes from the uniform flux map were averaged over the state of Alaska to obtain average fluxes for each month and for each year, and compared with the results from (Chang et al., 2014) (Fig. 9). Results from the elevation-based flux map were statistically the same as those from the uniform flux map and are not shown. CH_4 fluxes are small relative to those determined from some flux tower or chamber-based studies in arctic wetlands (Euskirchen et al., 2014; Johnston et al., 2014; Whalen and Reeburgh, 1988; Fan et al., 1992; Olefeldt et al., 2013), but very similar in magnitude to CH_4 fluxes recently reported from a black spruce forest during the snow-free seasons from 2011-2013 at a flux tower site in Fairbanks, AK (Iwata et al., 2015), as well as those reported from the Zotino Tall Tower Observatory (ZOTTO) in Siberia during the summers of 2009-2011 (7.7 mg CH_4 $m^{-2}d^{-1}$) (Winderlich et al., 2014). They are also smaller than fluxes estimated by Chang et al. (2014) using CARVE aircraft observations in the summer of 2012 (Fig. 9), but the two results overlap within their 1-sigma uncertainty bands. One possible reason for the lower average fluxes observed at the CARVE tower could be the region to which the CARVE tower observations are sensitive in the summer. The CARVE tower observations do not capture

emissions over the North Slope of Alaska, where other studies have shown large (but highly variable) CH_4 emissions, at least over small areas (Euskirchen et al., 2014; Morrissey and Livingston, 1992; von Fischer et al., 2010; Olefeldt et al., 2013). The signal in CH_4 at CRV may also be small because of the CARVE tower's large region of influence, which integrates signals from a wide variety of ecosystems that have different flux profiles, including not only low-lying wetlands and forests, but also extensive upland and mountain regions.

The tower observations also suggest the presence of non-zero fall and wintertime fluxes. Mastepanov et al. (2008) observed a burst of CH_4 emissions in high-latitude wetlands in fall, and, more recently, Zona et al. (2016) reported significant natural CH_4 fluxes persisting through the late fall in the North Slope of Alaska; our results support the existence of late-fall (September-October) CH_4 fluxes in the boreal zone as well. Additionally, our analysis also suggests the presence of CH_4 emissions in late winter (January-March) in some years, , although this conclusion is uncertain and requires further investigation with a larger data set, given the smaller data sample in our analysis in winter and the larger uncertainty associated with modeled transport, as indicated by the sensitivity of the influence footprints to altitude during winter months. To understand the role that fossil sources from nearby Fairbanks or farther away might play, especially in winter, we analyze correlations between ΔCH_4 and ΔCO mid-afternoon hourly enhancements. These enhancements indicate that some wintertime CH_4 emissions are likely anthropogenic, with coefficients of determination (R^2) generally larger in the winter months and close to zero in June, July and August of all years. Not all winter months show high correlations, and May 2012 also has highly correlated ΔCH_4 and ΔCO (Table 1).

We note that total uncertainty on the quantitative flux analysis presented here has not been calculated, and would come from a number of components, including transport error in the model. We also note that transport uncertainty is higher in the winter months, when the elevation resolution in the model introduces a larger error than during spring and summer periods. Here we have calculated the uncertainty of the observed enhancements, based on the background uncertainty, and an estimate of the uncertainty associated with the model's representation of the tower's ridge-top location based on our sensitivity analysis; this total is still likely an underestimate of the total uncertainty of the flux estimates.

5 Conclusions

The CARVE tower, located on a ridge outside Fairbanks, is well situated to provide regional year-round CO_2 and CH_4 observations that provide context to the CARVE aircraft campaign measurements, which were made throughout Alaska from March to November from 2012 to 2015. The WRF-STILT transport model was used to determine the influence region of the site and its inter-annual and seasonal variability. The model results showed significantly more influence from the region east of the tower in wintertime, a pattern that was repeated in all three years and was confirmed by anemometer data from the site. The model also indicated that processes in the North Slope of Alaska have very little influence on the tower observations. This seasonality of transport to the region has been previously documented (Sweeney et al., 2015), and implies that additional long-term observing sites are required to constrain Alaskan fluxes; a site in Western Alaska, for example, would be more likely to have fluxes from interior Alaska in its observation footprint in the wintertime, and a site north of the Brooks Range would be required to investigate fluxes from the North Slope.

We calculated enhancements of CO_2 and CH_4 during local mid-afternoon times by subtracting a background also determined using the WRF-STILT model particle trajectories, and found that the background choice is critical for CH_4, for which enhancements are very small, and of the same order of magnitude as the uncertainties. CO_2 enhancements at the CARVE tower site are replicated remarkably well by the WRF-STILT model when convolved with PolarVPRM biogenic CO_2 fluxes (Luus and Lin, 2015), with a few noted exceptions. The high correlation between modeled and observed CO_2 give confidence in the STILT footprints and the WRF meteorological model that was used to generate them. The signal in CO_2 is larger than that for CH_4, such that the background uncertainty is not as large relative to the enhancements or depletions.

The WRF-STILT meteorological model enables us to constrain the magnitude of mean monthly CH_4 fluxes in the region of influence of the tower for all three years. Using two different distribution maps of CH_4 emissions we determine that average CH_4 emissions over Alaska in summer range between 3 and 8 mg CH_4 $m^{-2}d^{-1}$, albeit with large uncertainties stemming from the large uncertainty in the background. The modeled enhancements do not correlate well with observations, however, indicating that a model with a more accurate spatial and temporal distribution of CH_4 fluxes is needed. The tower observations also indicate that there are no significant differences between the three years. This simple analysis

provides a flux estimate range that applies as an average over a very large area of Alaska (Fig. 1a). CH_4 fluxes in this region are likely to be highly heterogeneous, but our measurements show that the average flux over the entire region is relatively small. This result suggests that although there may be small areas with large fluxes, there are other areas with little to no emissions, or possibly uptake by tundra (Juncher Jorgensen et al., 2015). For this reason, the observations at the tower give context to other flux estimates, from flux towers or chamber studies, for example, that are representative of much smaller areas and are difficult to scale to the larger domain because of high spatial and temporal variability. We also observe CH_4 enhancements persisting into the fall (September-October) in all three years, and the analysis shows some CH_4 enhancements in winter and early spring, depending on the year, which may be partially or entirely anthropogenic, based on an analysis of correlations of CH_4 with CO. These late fall and wintertime enhancements, and their large uncertainties in this analysis, demonstrate the need for year-round in-situ observations in the high northern latitudes.

The CARVE tower site provides a continuous observation platform that will contribute to future efforts to investigate the high-latitude carbon cycle and its response to warming. As a long-term measurement site with a large regional coverage it will provide understanding of changing emissions in interior Alaska. Our analysis of the years 2012-2014 indicates no measurable change in emissions influencing this site over this period. These tower observations are sensitive to changes in emissions and provide the capability to detect such changes in the future. However, the location of the CARVE tower prohibits any quantification or observation of processes on the North Slope, indicating that additional long-term observation sites with large regional coverage are required north of the Brooks Range of Alaska to detect changes in emissions in the higher northern latitudes. Future efforts will combine the observations from the CARVE tower with other aircraft and ground-based observations in a formal inversion framework to solve for spatially and temporally resolved CH_4 and CO_2 fluxes in Alaska.

Data availability

All the tower observations and WRF-STILT footprints used in our analysis are publicly available on the CARVE data portal at https://ilma.jpl.nasa.gov/portal/. They are also archived at the U.S. Oak Ridge National Laboratory Distributed Active Archive Center for Biogeochemical Dynamics (ORNL DAAC, https://daac.ornl.gov).

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Table 1. Coefficient of determination (R^2) between ΔCH_4 and ΔCO in each month. Months with $R^2 > 0.2$ are in bold.

	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec
2012	**0.30**	0.14	0.12	0.16	**0.81**	0.00	0.00	0.05	0.17	**0.22**	**0.49**	NA
2013	**0.66**	0.14	0.19	0.14	**0.26**	0.01	0.07	0.01	0.19	0.09	0.01	0.15
2014	**0.49**	**0.67**	**0.66**	0.03	0.17	0.00	0.07	0.00	0.10	0.06	0.10	0.00

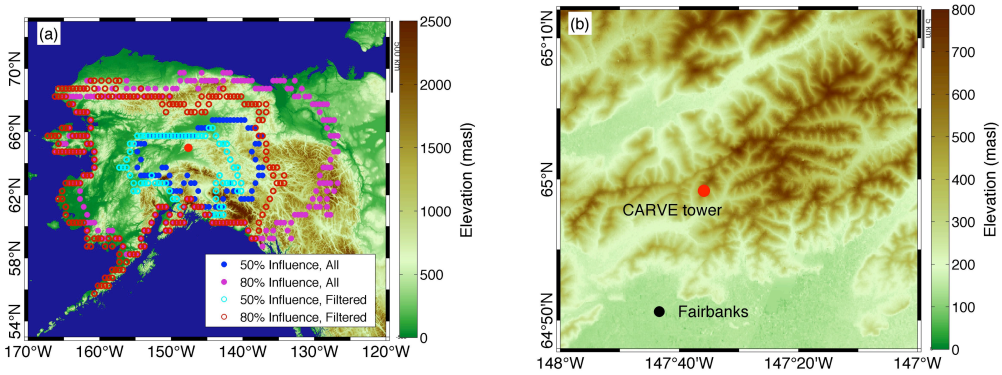

Figure 1. CO_2 and CH_4 measurements from the CARVE tower (filled red circle, both panels) have high sensitivity to the boreal forests and lowlands of interior Alaska as shown by the 50% (blue) and 80% (purple) surface influence contours for the average WRF-STILT influence functions calculated for mid-afternoon averages over the period 2012-2014 (a). The same influence contours (cyan and red open circles) are shown for the subset of footprints used in the flux analysis after filtering. Note the elevation scale differs between the panels. Elevation data in (a) is from NOAA's National Geophysical Data Center Global Land One-kilometer Base Elevation (GLOBE) Database (http://www.ngdc.noaa.gov/mgg/topo/report/globedocumentationmanual.pdf, (GLOBE Task Team and others (Hastings et al., 1999)). High-resolution elevation data in (b) is from ASTER GDEM, a product of METI and NASA.

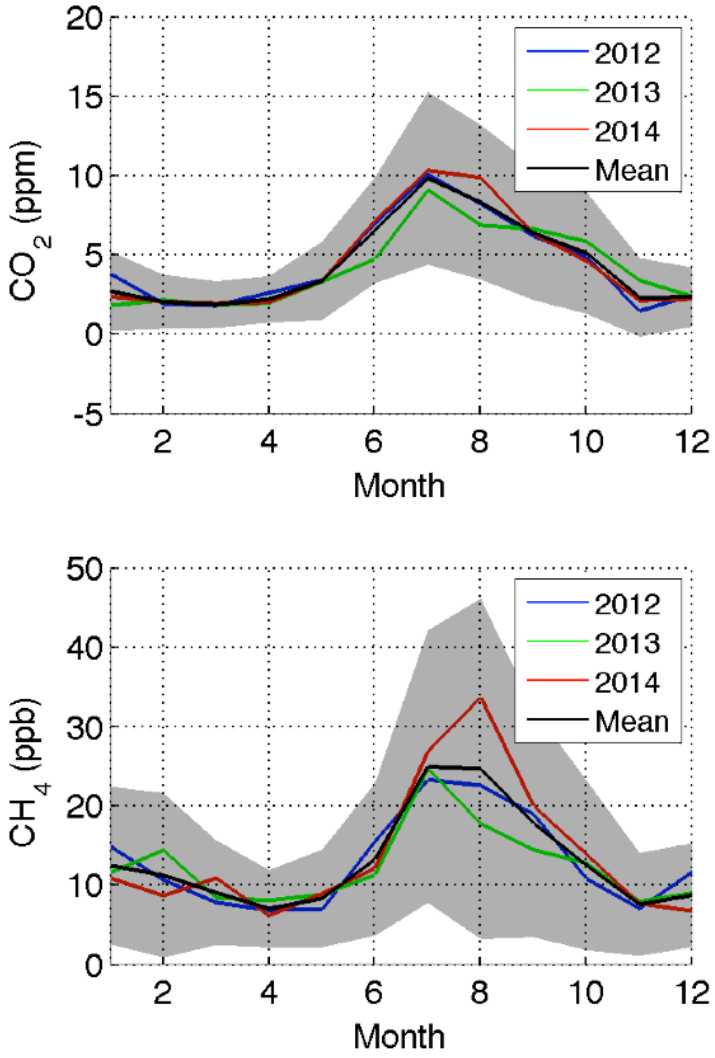

Figure 2. Mean monthly diurnal cycle amplitude of hourly averaged CO_2 (top) and CH_4 (bottom). The average over three full calendar years (2012-2014) is shown in black with the gray shading indicating one standard deviation of each month's average. The average diurnal cycles for each individual year are indicated by the blue (2012), green (2013) and red (2014) solid lines.

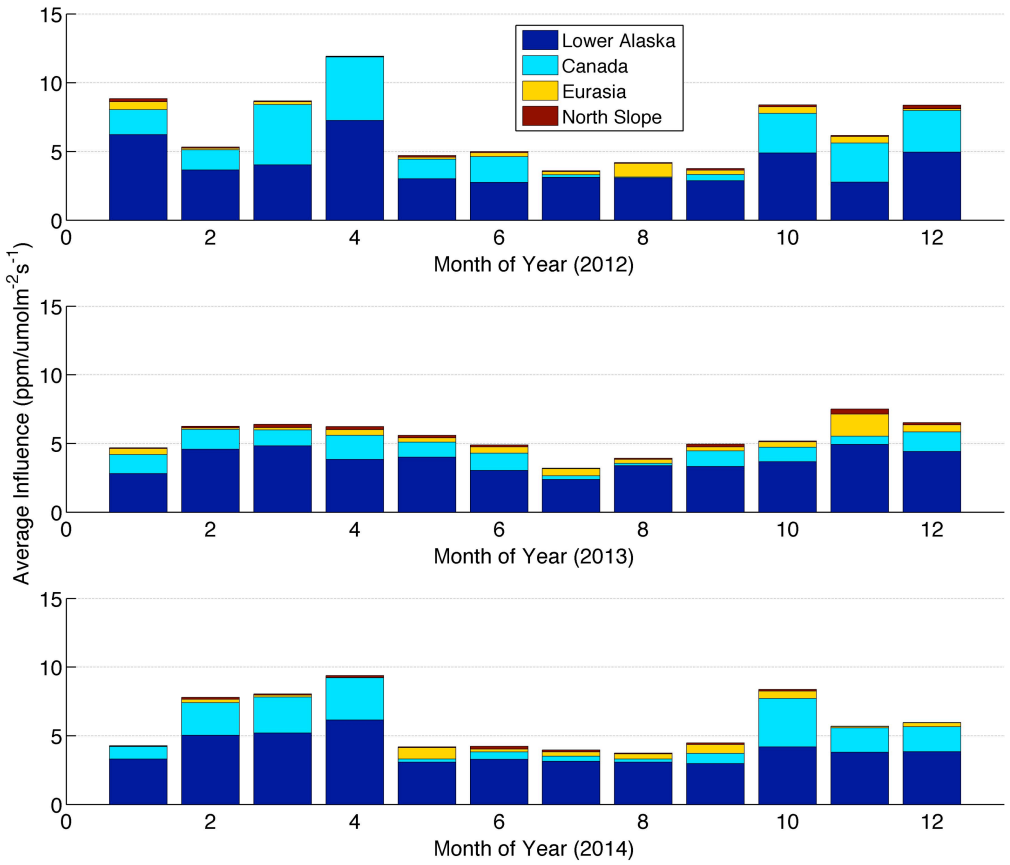

Figure 3. Magnitude of land surface influence on the tower measurements, in ppm/(μmol m^{-2} s^{-1}), for average monthly mid-afternoon footprints from the WRF-STILT model, for 2012 (top), 2013 (middle), and 2014 (bottom). Colors, as indicated in the figure legend, show the average monthly surface influence of Lower Alaska (defined as any part of Alaska south of the Brooks Range, i.e. not part of the North Slope), Canada, Eurasia, and the North Slope of Alaska.

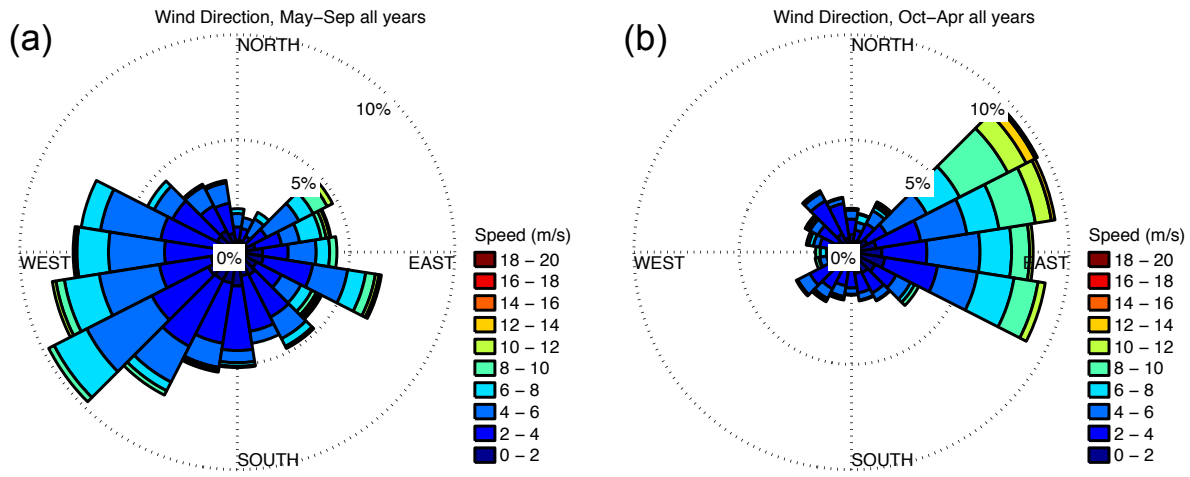

Figure 4. Wind roses for the tower averaged over (a) May-September and (b) October-April for all three years during mid-afternoon hours, from the 2D sonic anemometer at the 32 magl level of the tower.

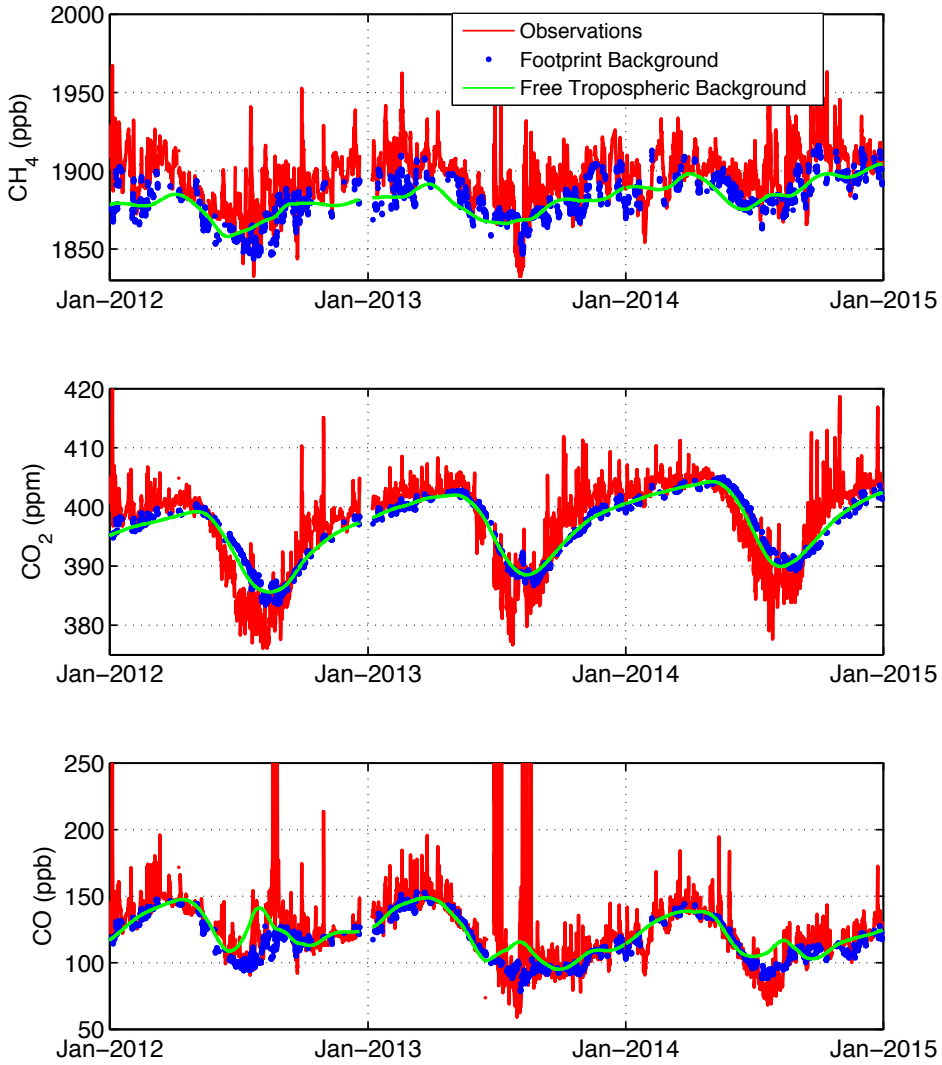

Figure 5. Time series of hourly average observed mole fractions (red) and background mole fractions (blue), 1 pm to 6 pm local standard time (LST) only for CH_4 (top), CO_2 (center), and CO (lower) at the CARVE tower. Observations are indicated by solid red lines, while the background mole fractions used for this analysis are shown in blue dots, and are derived using the particle trajectories from the STILT model and an empirical Pacific boundary curtain, described in the text. Gaps in the blue dots appear when the background could not be calculated using the model because the air masses did not enter the domain from the West (as described in Sect. 3.3). The green line represents the value of the same Pacific boundary curtain at the site latitude (65°N) at 3500 meters above sea level, i.e. the free troposphere. The vertical scale for CO has been truncated.

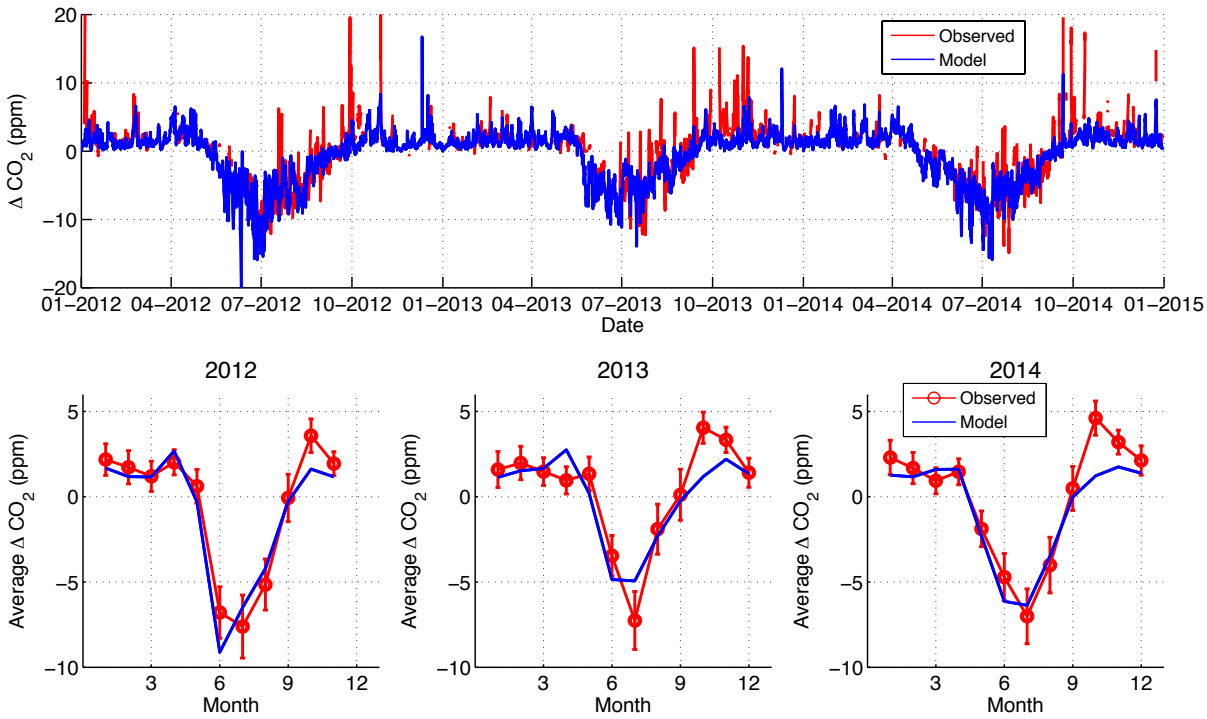

Figure 6. Top: ΔCO_2 observed (i.e. observations minus background, red), along with the modeled ΔCO_2 convolution (blue). Bottom: Monthly average comparisons between the model (blue) and observations (red line and circles) for each year. Error bars on the observations represent the average background uncertainty.

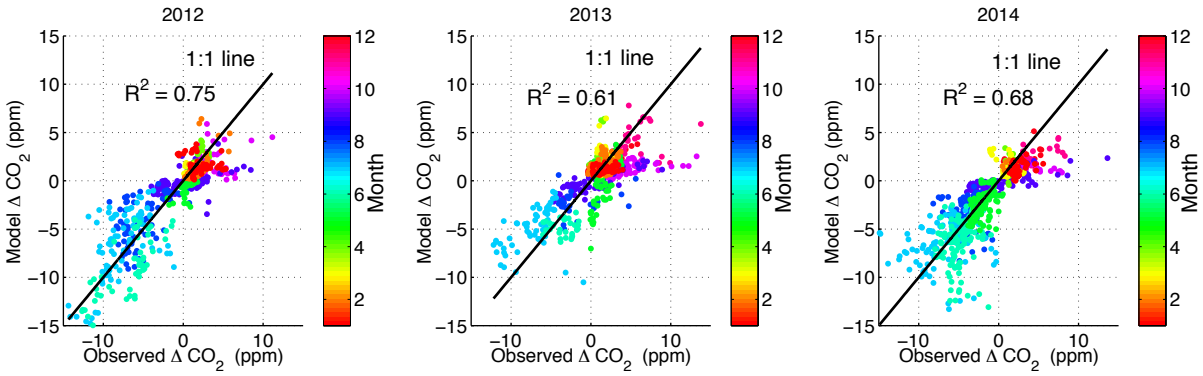

Figure 7. Correlation between observed and modeled ΔCO_2, for 2012 (left), 2013 (center), and 2014 (right), colored by month. The coefficient of determination, R^2, is indicated in each plot, along with the one-to-one line. Data points represent hourly averages between 1 pm and 6 pm LST and filtered according to criteria described in the text.

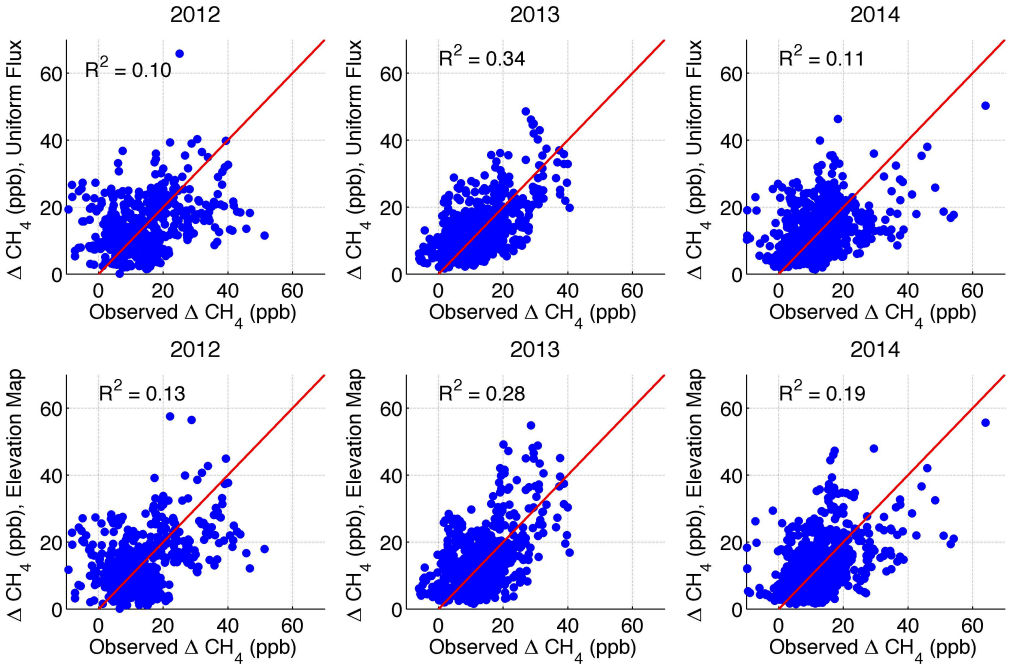

Figure 8. Optimized model ΔCH_4 (ppb) for the scaled uniform flux (top row) and scaled elevation-based flux map (bottom row), for 2012 (left), 2013 (center), 2014 (right), all plotted against observed ΔCH_4. Fluxes were scaled to match monthly average observed ΔCH_4 with monthly scaling factors. The coefficient of determination, R^2, is indicated in each plot, along with the one-to-one line. Data points represent hourly averages between 1 pm and 6 pm LST and filtered according to criteria described in the text.

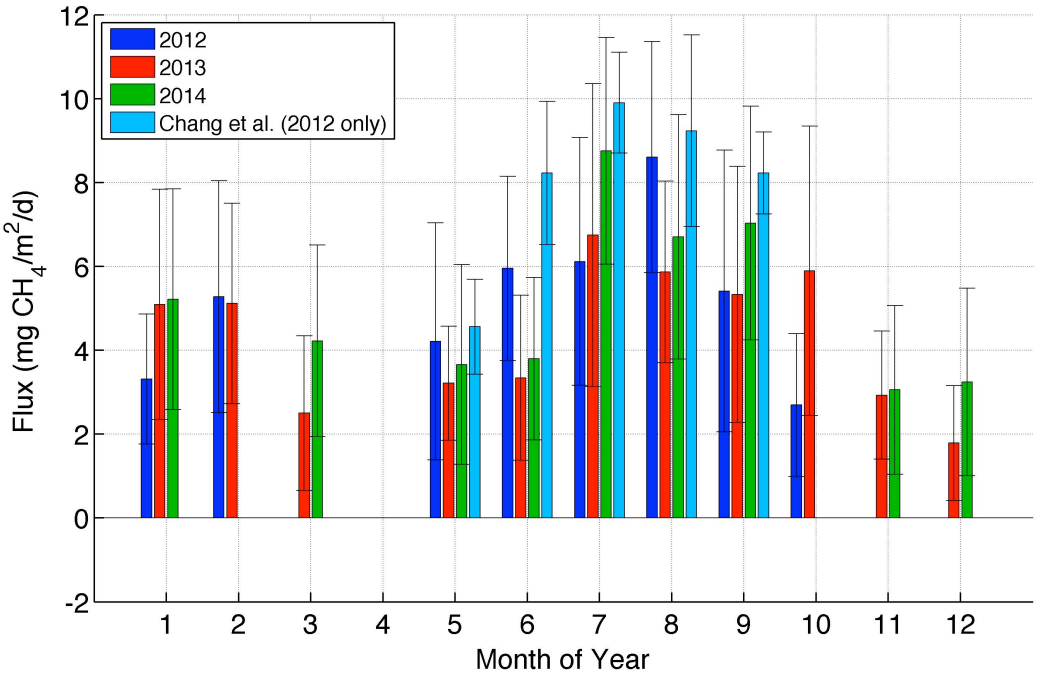

Figure 9. Average Alaska monthly CH_4 fluxes for 2012 (blue), 2013 (red), and 2014 (green), estimated based on a uniform Alaska-wide flux scaled to monthly mean observations at the CRV tower. Light blue bars indicate monthly fluxes derived from 2012 CARVE aircraft observations, with error bars representing the 68% confidence interval (CI), (calculated by dividing the 95% CI by 1.96), from Chang et al. (2014). Error bars on the tower-derived fluxes are based on propagating background uncertainty (1-sigma, Sect. 3.3) and uncertainty derived from a sensitivity analysis on the altitude of the model runs (Sect. 3.2) only. Months for which fluxes were based on six or fewer days were eliminated from the analysis.