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Comparison of XCH₄ Derived from g-b FTS and GOSAT and Evaluation Using Aircraft In-Situ Observations over TCCON Site

Samuel Takele Kenea¹ · Young-Suk Oh^{1,2} · Tae-Young Goo¹ · Jae-Sang Rhee¹ · Young-Hwa Byun¹ · Lev D. Labzovskii¹ · Shanlan Li¹

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Abstract

It is evident that evaluating the measurement of greenhouse gases (GHGs) obtained from multi-platform instruments against accurate and precise instrument such as aircraft in-situ is very essential when using remote sensing GHGs results for source/sink estimations with inverse modeling. The results of the inverse models are very sensitive even to small biases in the data (Rayner and O'Brien 2001). In this work, we have evaluated ground-based high resolution Fourier Transform Spectrometer (g-b FTS) and the Greenhouse gases Observing SATellite (GOSAT) column-averaged dry air mole fraction of methane (XCH₄) through aircraft in-situ observations over Anmyeondo station (36.538° N, 126.331° E, 30 m above sea level). The impact of the spatial coincidence criteria was assessed by comparing GOSAT data against g-b FTS. We noticed there was no any systematic difference based on the given coincidence criteria. GOSAT exhibited a bias ranging from 0.10 to 3.37 ppb, with the standard deviation from 4.92 to 12.54 ppb, against g-b FTS with the spatial coincidence criteria of ± 1 , ± 3 , ± 5 degrees of latitude and longitude and ± 1 h time window. Data observed during ascent and descent of the aircraft is considered as vertical profiles within an altitude range of 0.2 to a maximum of 9.0 km so that some assumptions were applied for the construction of the profiles below 0.2 and above 9.0 km. In addition, the suitability of aircraft data for evaluation of remote sensing instruments was confirmed based on the assessment of uncertainties. The spatial coincidence criteria is $\pm 1^{\circ}$ latitude and $\pm 2^{\circ}$ longitude and for temporal difference is ± 1 h of the satellite observation overpass time were applied, whereas g-b FTS data are the mean values measured within ±30 min of the aircraft observation time. Furthermore, the sensitivity differences of the instruments were taken into account. With respect to aircraft, the g-b FTS data were biased by $-0.19 \pm 0.69\%$, while GOSAT data were biased by $-0.42 \pm 0.84\%$. These results confirm that both g-b FTS and GOSAT are consistent aircraft observations and assure the reliability of the datasets for inverse estimate of CH₄.

Keywords Aircraft in-situ \cdot G-b FTS \cdot GOSAT \cdot XCH₄

1 Introduction

Next to CO_2 , atmospheric methane (CH₄) is one of the potent greenhouse gases. Its concentrations have been increasing since pre-industrial era as a result of intense human activities

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Samuel Takele Kenea samueltake@yahoo.ca

such as burning of fossil fuel and changes in land use. CH₄ plays a major role in the chemistry of the Earth's atmosphere through the decomposition process; its increase is considered to change the balance of related chemical species (Cicerone and Oremland, 1998). Therefore, accurate and precise measurements of CH₄ play a substantial role for better comprehension in global carbon cycle as well as its contribution to the global warming (Jain et al. 2000). Even though CH_4 is the dominant anthropogenic greenhouse gas, there are still high uncertainties in CH₄ sources and sinks at a global scale (Frankenberg et al. 2008). A number of instruments deployed onboard at various platforms (ground-based, airborne, and space-borne) have been involved in measuring of atmospheric concentrations of CH₄. Aircraft in-situ measurements are highly accurate and precise and, therefore, capable to validate the ground-based instruments such as g-b FTS, as well as

¹ Climate Research Division, National Institute of Meteorological Sciences (NIMS), 33, Seohobuk-ro, Seogwipo-si, Jeju-do 63568, Republic of Korea

² Department of Electrical Eng. and Center for Edge Plasma Science, Hanyang University, Seoul, Republic of Korea

evaluate satellites instruments such as GOSAT. However, aircraft observations are very sparse; this gap needs to be filled by highly accurate and precise measurements from satellite. Several studies on validation of remote sensing products of greenhouse gases such as CO_2 and CH_4 were conducted based on aircraft in-situ measurements at various sites (Araki et al. 2010; Messerschmidt et al. 2011; Geibel et al. 2012; Tanaka et al. 2012; Miyamoto et al. 2013; Inoue et al. 2013, 2014). The satellite products of CH_4 should attain a demanding precision of <2% (< 34 ppb), in order to improve the precision of inversion models. In addition, achieving high relative accuracy (< 10 ppb for XCH₄) is more crucial and demanding than precision to derive reliable surface fluxes via inverse modelling (Buchwitz et al. 2016).

In this study, we have addressed two major issues. First, observations of XCH₄ and comparison between GOSAT and g-b FTS XCH₄ observations over the Anmyeondo station are discussed. Second, we assessed the suitability of aircraft insitu observations for validating other datasets and then evaluate the correlative remote sensing measurements (g-b FTS and GOSAT) against aircraft. Here, the aircraft in-situ XCH₄ was computed based on the approach suggested by Inoue et al. (2013) and Ohyama et al. (2015). In fact, our g-b FTS was calibrated with respect to TCCON (Total Carbon Column Observing Network) common scale factor which is basically derived from the aircraft data made at the other TCCON sites, therefore, our study will be useful for the scale factor examination for Anmyeondo station by increasing the number of sample size. This paper is organized as follow: Section 2 gives short descriptions about the Anmyeondo station. A brief overview of data and method is provided in Section 3. Section 4 presents results and discussion and followed by conclusions in Section 5.

2 The Anmyeondo Station

The Anmyeondo station is located at 36.538 °N, 126.331 °E, and 30 m above sea level. The topographic feature of the Anmyeondo station is a complex terrain which consists of hills and valley within a few hundred meters. The climatic condition of the site is categorized as: winter is the coldest season (a minimum temperature is about 2.7 °C) while summer is the warmest season (a maximum temperature is about 25.6 °C), (the Anmycondo station description is also given in Oh et al. (2018) paper). In other aspects, industries are available within 100 km of the station. This area consists of agriculture, forests, and urban areas. Several instruments are being operated at the Anmyeondo station which makes this site is important for validating remote sensing products from different platforms such as GOSAT. Figure 1 depicts all TCCON sites (including operational, future, and previous sites) globally.

3 Data and Methods

3.1 Aircraft Measurements

To provide in-situ measurements of atmospheric CO₂, CH₄, CO, and H₂O concentrations, the aircraft was equipped with a Wavelength-Scanned Cavity Ring Down Spectrometer (CRDS; Picarro, G2401-mc) providing mixing ratio data recorded at ~0.3 Hz intervals. The position (latitude, longitude, and height) of the aircraft was monitored by GPS, and information on the outside temperature, static pressure, and ground speed was provided by the aircraft's instruments. Figure 2 displays schematic views of the CRDS instruments. Data collected during ascent and descent of the aircraft is considered as vertical profiles of CH₄ over the Anmyeondo station. Typical durations are in the range of 0.5-3 h. The temperature and pressure of the gas sample have to be tightly controlled at 45 °C and 140 Torr in the CRDS (variations of less than 20 mK and 0.1 Torr, respectively), which leads to highly stable spectroscopic features (Chen et al. 2010). Any deviations from these values cause a reduction of the instrument's precision. Data recorded beyond these range of variations in cavity pressure and temperature were discarded in this analysis. Variance of the cavity pressure and temperature during flight results in noise in the CH₄ mixing ratios. The Picarro CRDS instrument has been regularly calibrated with respect to the standard gases within the error range recommend by WMO.

3.2 In-Situ Observation Data

As for complementary information below the lower boundary of the aircraft observation, we utilized the CH_4 concentration data measured by the meteorological tower in the Anmyeondo site (36.53 °N, 126.32 °E, and 47 m above sea level), in close vicinity to the TCCON station. Atmospheric concentrations of CH_4 at 86 m above sea level were continuously measured with a precision <2 ppb using CRDS and provided as hourly averaged data. Sensors for detection of wind speed and direction, air temperature, barometric pressure, and humidity have been also installed at this height. The in-situ data closest to the aircraft measurement time were selected to complement CH_4 profiles. These data can be obtained from the WMO World Data Center for Greenhouse Gases (WDCGG) (http://ds.data. jma.go.jp/gmd/wdcgg/catalogue.cgi).

3.3 Ground-Based FTS

The g-b FTS has been operating at Anmycondo station within the network of TCCON since 2014; and detailed information about g-b FTS at this station was recently reported in Oh et al. (2018). The TCCON is a worldwide network of ground-based FTSs that was founded in 2004. It has been widely used as a calibration and validation resource for satellite measurements





Fig. 1 Global distributions of the TCCON sites. (https://tccondata.org/)

(e.g. Morino et al. 2011), but it is also offered for better understanding of the carbon cycle (e.g. Yang et al. 2007). The g-b FTS provides spectra in the near infrared spectrum with a high spectral resolution of 0.02 cm^{-1} and a temporal resolution of $\sim 2 \text{ min}$. From the recorded spectra, the target species (XCH₄) was retrieved with the GFIT nonlinear least-squares fitting algorithm, which verifies a vertical scale factor (γ) of an a priori vertical profile based on the best spectral fit of the solar absorption signal. The scaled profile is then vertically integrated, and the resulting column abundance is divided by the vertical column of dry air, calculated using the retrieved column of oxygen (O₂) (Wunch et al. 2011).

3.4 Greenhouse Gases Observing SATellite (GOSAT)

GOSAT was launched into a sun-synchronous orbit on 23 January 2009 by H-IIA launch vehicle. It was placed in a sun-synchronous orbit at a 666-km altitude and has a 3-day revisit orbit cycle and a 12-day operation cycle. It carries two

sensors: the TANSO-FTS (Thermal And Near-infrared Sensor for carbon Observation Fourier Transform Spectrometer) and TANSO-CAI (TANSO Cloud and Aerosol Imager) with the IFOV of 10.5 km and 0.5-1.5 km, respectively. The TANSO-FTS onboard GOSAT makes global observations both at nadir and off-nadir modes; and makes use of four spectral bands for deriving CO₂ and CH₄ (Kuze et al. 2009) accurately. The TANSO-FTS records the solar radiation reflected from the surface at three Short Wavelength InfraRed (SWIR) bands at the respective wavelength of 0.76, 1.6, and 2.0 µm and the Earth's radiation from the surface and atmosphere at the wide Thermal InfraRed (TIR) band which is in the range between 5.5 and 14.3 μ m with a resolution of 0.2 cm⁻¹. The retrieval algorithm is a non-linear maximum a posteriori method with linear mapping based on Rodgers (2000). In this work, we have used column-averaged dry air mole fractions of CH₄ (XCH₄) V022 derived from the NIES retrieval algorithm (Yoshida et al. 2011, 2013). The achieved single measurement precision (random error) of the GOSAT XCH₄ is



Fig. 2 Left panel is CRDS instrument and right panel depicts the CRDS laboratory including gas cylinders for calibration purposes and computer

approximately 16 ppb (1.0%) while systematic errors (relative accuracy or relative bias) are approximately 6 ppb (0.3%) (Buchwitz et al. 2016). We accessed the GOSAT data through website (https://data2.gosat.nies.go.jp).

3.5 Methods

The vertical profiles of CH₄ mixing ratio are obtained during ascent and descent of the aircraft in spiral path (see Fig. 3) over Anmyeondo station. Since the altitude range of the aircraft measurements were limited to approximately 0.2-5.0 km from 2012 to 2016 aircraft campaign and the maximum flight altitude was 9.0 km in 2017, the in-situ data were utilized near the surface to complement the CH₄ profiles of aircraft-based data, while above the aircraft ceiling, the highest altitude of the aircraft observation data were extended up to the tropopause level to construct the complete CH₄ profiles in a similar way as proposed by Miyamoto et al. (2013); Ohyama et al. (2015). We have used the insitu data at the surface level to complement the aircraft profile. Local planetary boundary layer (PBL) heights were obtained from National Centers for Environmental Prediction (NCEP) NOAA (National Oceanic and Atmospheric Administration) reanalysis data. The mole fractions between the uppermost aircraft measurement and the tropopause are assumed to be maintained constant as the highest aircraft measurements because at these higher altitudes the air is well mixed. For this analysis, the tropopause height was determined from European Center for Medium range Weather Forecasting (ECMWF) ERA-Interim reanalysis data, a horizontal resolution of 0.75×0.75 degrees. Above the tropopause height, GFIT a priori profiles were fixed to the aircraft data as shown by black dashed line in the left panel of Fig. 4. The dry air number density profiles derived from radiosonde observation and ERA-Interim reanalysis data were utilized for the calculation of the total column amounts of CH_4 . The total column amounts of CH_4 were numerically integrated from the in-situ aircraft profiles weighted by dry air density from the surface up to the altitude of 70 km using the following equation (e.g., Tanaka et al. 2012):

$$VC_{s} = \int_{0}^{P_{s}} \frac{f_{CH_{4}}^{dry} \left(1 - f_{H_{2}O}\right)}{g.\mathrm{m}} dp \tag{1}$$

where P_s is surface pressure, f_{H_2O} - mole fraction of H₂O, f_{CH_4} - mole fraction of CH₄, m – molecular mass of air, and g - gravitational acceleration. The column averaged dry-air mole fractions of CH₄ are calculated from the integrated column amounts using the equation given below:

$$XCH_4 = \frac{column \ CH_4}{column \ air} \tag{2}$$

where XCH₄ is the column-averaged dry-air mole fraction of CH₄. We set the coincidence criteria for comparison between satellite data (GOSAT) and aircraft data as follows: GOSAT data are considered within ±1 degree latitude and ± 2 degree longitude boxes centered at the Annyeondo station and the aircraft data temporally nearest to the GOSAT overpass time were selected, a maximum of 1 h difference. While the g-b FTS data were averaged within ± 30 min of the aircraft overpass, which reduce the random error. During validation of remote sensing vertical profiles, it is reasonable to consider the effect of vertical resolution and sensitivity of the data (Rodgers and Connor 2003). In this analysis, vertically highly resolved aircraft CH₄ profiles were degraded by applying the column averaging kernels (a_i) of low resolution of vertical profiles derived from the



Fig. 3 Typical flights path of the aircraft taken on May 09, 10, and 16, 2015 from left to right panels, respectively, are depicted. The right panel depicts vertical spiral flight path over Anmyeondo



Fig. 4 The left and right panels display the complete CH_4 profile and aircraft profile appended with surface measurements, respectively, October 05, 2014. The red and blue broken lines represent the

remote sensing instruments based on the following equation:

$$XCH_4^{in-situ} = XCH_4^a + \sum_j h_j a_j (t_{in-situ} - t_a)$$
(3)

where $XCH_4^{in-situ}$ is the column-averaged dry-air mole fraction of CH₄ from the aircraft in-situ measurement, XCH_4^a and t_a are a priori column-averaged dry-air mole fraction and profile of CH₄, respectively (from g-b FTS or GOSAT), h_j is the pressure weighting function, and $t_{in-situ}$ is the in-situ profile from aircraft measurement. The averaging kernel for the column retrieval is a vector representing the sensitivity of the retrieved total



Fig. 5 Column Averaging Kernels (CAKs) of CH4 are shown



tropopause and planetary boundary heights, respectively, and green broken line shows the maximum aircraft observation altitude

column to perturbations of the partial columns at the various atmospheric levels. The typical columnaveraging kernels for the g-b FTS and GOSAT at the Anmyeondo station are shown in Fig. 5. The differences of XCH₄ between the aircraft and the remote sensing instruments or between g-b FTS and GOSAT are expressed in terms of absolute and relative differences and the following mathematical expressions are:

Abso.diff. =
$$X_{ins} - X_{in-situ/FTS}$$
 (4)

Rel.diff. =
$$100\% \frac{(X_{ins} - X_{in-situ/FTS})}{X_{in-situ/FTS}}$$
 (5)

where $X_{in-situ/FTS}$ and X_{ins} are XCH₄ of the aircraft and the correlative remote sensing instruments (g-b FTS and GOSAT) or g-b FTS and GOSAT (which is used for the comparison between g-b FTS and GOSAT), respectively. We examined the weather conditions at the measurement station during all observation periods. For this period, we showed meteorological parameters such as relative humidity, temperature, wind speed, and wind direction from radiosonde data in Fig. 6 in order to speculate the weather conditions at the Anmycondo station. Approximately above 3 km, the amount of atmospheric moisture was very low which was depicted by the relative humidity (RH) of below 40% in Fig. 6(a). As shown in panels c and d of Fig. 6, the northerly and north easterly winds was blowing with a magnitude of lower than 8 m s^{-1} below 2 km, whereas between 2 and 6 km, the westerly and north westerly winds advected at a maximum speed of 20 m s^{-1} over the measurement station. Therefore, this could bring a continental air mass from the Northern Hemisphere to the Anmyeondo station.



Fig. 6 Radiosonde measurements of (a) relative humidity, (b) temperature, (c) wind speed, and (d) wind direction, taken on October 05–07, 2014

4 Results and Discussion

In the following subsections, we have discussed observations and comparison of XCH_4 between g-b FTS and GOSAT, and then evaluated them based on the aircraft in-situ observations.

4.1 Observations of XCH₄ and Comparisons between g-b FTS and GOSAT

Here, the time series of XCH_4 comparison between g-b FTS and GOSAT was performed in the period between 2014 and 2016 (see Fig. 7). We assessed to what extent



Fig. 7 Time series of XCH₄ obtained from the g-b FTS and the GOSAT (left top panel) and GOSAT versus g-b FTS (right panel) in the period of 2014 to 2016 with a one-to-one dashed line, green circle denotes hourly mean values of the g-b FTS, while the asterisks represent single day observations of the GOSAT. Right top panel shows g-b FTS vs GOSAT

at the spatial coincidence criteria of $\pm 1, \pm 3, \pm 5$ degrees latitude/longitude green, blue, and red colors, respectively, and error bars indicate the standard deviations of the coincident datasets. Bottom left panel shows the time series of XCH₄ on monthly mean basis and bottom right panel depicts annual cycle 2014–2016

Lat./ lon.(deg)	Ν	R	RMSE (ppb)	bias \pm std. (ppb)	Rel. diff. ± std. (%)
±1	9	0.86	5.73	3.37 ± 4.92	0.18 ± 0.27
±3	16	0.96	6.01	1.68 ± 6.00	0.09 ± 0.33
±5	27	0.76	12.31	0.10 ± 12.54	0.01 ± 0.68

Table 1Statistical results for the XCH4 difference between GOSAT and g-b FTS (bias = GOSAT - g-b FTS) data based on coincidence criteria of ± 1 , ± 3 , and ± 5 degrees of lat/lon and ± 1 h. N = number of coincident data, R = correlation coefficient

the impact of spatial coincidence criteria affects the comparison results. To match up the GOSAT data against g-b FTS, we chose geometric coincidence criteria of ± 1 , ± 3 , and ± 5 degrees of latitude/longitude centered at the Anmyeondo station within the temporal window of ± 1 h. Following the match-ups, all g-b FTS data coinciding with one satellite observation which were within 1 h time window are averaged, minimizing the g-b FTS random error. As a result of those coincidence criteria, we obtained different sample size that might also affect the statistics to have robust conclusion. As can be seen in the top left panel of Fig. 7, the overall results suggested that both instruments agreed in capturing the seasonal variability of XCH₄ over the Anmyeondo station. Relatively large discrepancies were detected in peak methane season, summer which might reflect the high spatial heterogeneity of methane source and sink strength (details are beyond the scope of this paper). The seasonal and annual cycles of XCH4 derived from the GOSAT were compared with in g-b FTS observations over the Anmyeondo station, which are provided in the bottom panels of Fig. 7. Because of sample size, we used GOSAT data that extracted within ±5 degrees latitude/ longitude coincidence criteria. As can be seen in Fig. 7 bottom panels, the overall patterns of seasonal and annual cycle of the g-b FTS XCH4 are reproduced by GOSAT XCH₄. The maximum and minimum amounts of methane were observed during summer and winter seasons, respectively. However, the seasonal cycle of CH₄ in the Northern Hemisphere is more complex (Dlugokencky et al. 1994). While the destruction of CH_4 due to reaction with OH is expected to be stronger in summer, source strengths also strongly vary with the seasons. East Asia is one of the largest source regions of methane,

and enhanced concentrations over this region are predicted by model studies (Houweling et al. 2000). Dlugokencky et al. (1993) reported that significantly elevated CH₄ mixing ratio was observed at Tae-ahn Peninsula, Korea (36° 44' N, 126° 08' E) during summer correlated with northwesterly airflow from northeast China and east Siberia. In fact, taking a coarse collocation criteria can induce collocation errors, but considering a very strict criterion leads to a small sample set (which affects statistics) due to the sparseness of GOSAT soundings. Buchwitz et al. (2017) described the spatial variability in the bias of XCH₄ termed as "relative bias". It can arise from different surface reflectivity, aerosol interference, and sloping terrain. They estimated 10 ppb relative bias for solar backscatter satellite observations. Correlations, root mean square error (RMSE), bias, and relative differences for these comparisons are detailed in Tables 1 and 2 for varying collocation criteria. As RMSE values increases from 5.73 to 12.31 ppb with increasing the spatial window ± 1 to ± 5 degrees, which cover land and ocean parts since the Anmyeondo station is located at the coastal area. In general, there was no systematic difference noticed by changing the collocation space. It was found low bias $(\pm \sigma)$ in GOSAT XCH₄ against g-b FTS, which is about 3.37 ± 4.92 ppb, with a corresponding relative difference of $0.18 \pm 0.27\%$, when applying the strict collocation criteria within a time window of ± 1 h and ± 1 degree of latitude/longitude (see Table 1). Since we set the same time window but changing the spatial window by ± 3 and ± 5 degrees that resulted in the mean bias of 1.68 ± 6.0 and 0.10 ± 12.54 ppb, respectively. The standard deviations of the differences are progressively increasing as increasing the collocation space, but those values are

Table 2	The same as Table 1, but
for daily	mean basis. (bias =
GOSAT	minus g-b FTS)

Lat./lon.(deg)	Ν	R	RMSE (ppb)	bias \pm std. (ppb)	Rel. diff. \pm std. (%)
±1	12	0.80	6.10	0.77 ± 6.30	0.04 ± 0.34
± 3	20	0.90	8.30	1.68 ± 8.34	0.09 ± 0.45
±5	35	0.79	10.90	0.36 ± 10.98	0.04 ± 0.60



Fig. 8 The comparisons of XCH₄ between the aircraft observation versus g-b FTS data (represented by blue square) and GOSAT (denoted by red square) over Anmyeondo station are shown. The dashed line shows oneto-one line

compatible with the combined measurement errors of the instruments. Similarly, we investigated the impact of the coincidence criteria by setting the time window on daily mean basis of g-b FTS measurements of XCH₄ with varying the spatial coincidence ± 1 , ± 3 , and ± 5 degrees of latitude/longitude, and the bias was estimated to be less than 1.68 ppb. For a case of ± 1 degree latitude/longitude, GOSAT was biased by 0.78 ± 6.3 ppb with respect to g-b FTS. Those values are within the range of validation results reported in previous findings (e.g. Yoshida et al. 2013; Gavrilov et al. 2014; Ohyama et al. 2015) but with slightly smaller biases. Yoshida et al. (2013) performed a validation of GOSAT XCH₄ (V02.xx) using the 723 measurements provided by TCCON and showed that bias was -5.90 ± 12.6 ppb. Gavrilov et al. (2014) compared GOSAT XCH₄ (V02.xx) with 256 ground-based FTS measurements ob-

Table 3 Summary for thestatistics of XCH_4 difference	Instruments	N Date (KST)	Bias \pm std. (ppb)	Rel. diff. ± std. (%)
between remote sensing and aircraft in-situ data is given. The statistical estimators are expressed in terms of bias and relative differences with respect to aircraft	Aircraft vs. g-b FTS	2014-10-05		
		10:29:03-10:45:01	-14.60	-0.78
		10:46:10-11:00:01	-15.50	-0.83
		11:45:19-12:01:05	-13.00	-0.70
		13:23:10-13:38:21	-16.40	-0.88
		13:39:30-13:53:33	-13.70	-0.74
		14:23:46-14:48:23	-13.70	-0.74
		14:49:40-15:04:30	-10.30	-0.56
		2014-10-07		
		13:39:32-13:54:00	-8.00	-0.43
		13:54:15-14:09:07	-4.50	-0.24
		14:39:38-14:54:00	-8.70	-0.47
		15:55:32-15:10:00	-0.30	-0.56
		15:39:47-15:54:21	-6.50	-0.35
		15:39:40-15:54:00	-11.60	-0.63
		15:55:32-16:09:00	-11.00	-0.59
		2017-10-29		
		09:59:16-10:31:08	0.90	0.05
		10:31:09-11:03:24	4.90	0.26
		12:58:58-13:37:07	15.10	0.82
		13:37:07-14:19:40	-2.70	-0.14
		2017-11-12		
		11:12:20-11:38:01	14.40	0.78
		11:38:02-12:13:00	15.10	0.82
		14:14:46-14:45:55	16.50	0.89
		14:45:56-15:23:47	13.00	0.70
		4	-3.66 ± 11.50	-0.19 ± 0.61
	Aircraft vs. GOSAT (NIES V0221)	Date		
		2012-10-17	4.53	0.25
		2012-10-18	2.40	0.13
		2014-10-05	-20.90	-1.13
		3	-4.65 ± 14.11	-0.42 ± 0.84



Fig. 9 The XCH₄ total errors are shown for GOSAT (left panel) and for g-b FTS (right panel). (It was displayed only for the coincident days)

tained near St. Petersburg, Russia and reported that the mean difference was -1.9 ± 14.5 ppb. Ohyama et al. (2015) reported that the average differences XCH₄ between TANSO-FTS and g-b FTS data (TANSO-FTS minus g-b FTS) is -7.6 ± 13.7 ppb. Right panel of Fig. 7 demonstrates the results of XCH₄ comparisons between the GOSAT and g-b FTS at the spatial coincidence criteria of ± 1 , ± 3 , ± 5 degrees latitude/longitude green, blue, and red colors, respectively, and error bars indicate the standard deviations of the coincident datasets. This depicts that the GOSAT data is well consistent with the g-b FTS that lie on the best line. Therefore, we can infer that the impact the coincidence criteria (at least, up to ± 5) for performing the comparison of XCH₄ over the Anmyeondo station is insignificant.

4.2 Aircraft XCH₄ Comparison with g-b FTS

Several aircraft observation campaigns over Anmyeondo site were carried out in the period between 2012 and 2017. However, a few numbers of aircraft data matched with the remote sensing instruments were available during this observation period. The g-b FTS XCH₄ was compared with the aircraft measurements. Here, g-b FTS data were averaged over a time window of ± 30 min with respect to the aircraft measurement time. In addition, the averaging kernel of the g-b FTS was applied to the aircraft data to equalize the sensitivities of CH₄ mole fraction at each altitude for the total column. Wunch et al. (2010) reported that the airmass-dependent artifacts in XCH₄ due to spectroscopic inadequacies (e.g. line widths, inconsistencies in the relative strengths of weak and strong lines) in TCCON instruments were not seen. Here, a total number of the aircraft measurements that matched with g-b FTS were only four during the observation period of 2014 to 2017. The diurnal range of g-b FTS data reflects not only variability of airmass transport but source also sink processes and the effect of measurement errors as well (KeppelAleks et al. 2011). The overall results indicated that g-b FTS estimated slightly lower than aircraft. The statistical results for XCH₄ comparisons between aircraft and g-b FTS are shown in Fig. 8 and summarized in Table 3, (correlation coefficient was not computed because of small sample numbers). The mean absolute difference of XCH₄ between aircraft and g-b FTS is -3.66 ± 11.50 ppb, with a corresponding mean relative difference of $-0.19 \pm 0.69\%$. Previous findings have revealed that the unsampled part of the atmosphere above the aircraft ceiling contributes to the largest uncertainty in the total column calculated from the aircraft profiles (Wunch et al. 2010). We estimated the error contributions on aircraft-based XCH₄. The error components below the aircraft ceiling were derived by adding twice the precision of the aircraft data to the profile, and then re-integrated the profile (Wunch et al. 2010; Ohyama et al. 2015), the amount of error resulted in 3.03 ppb. The tropopause height variation induced an error of 0.40 ppb on averaged in estimating aircraft XCH₄ and the stratospheric error contribution were estimated by vertical shifting of the a priori by 1.0 km. That resulted in 6.30 ppb change on the aircraft XCH₄ values. The total errors were estimated to be 7.0 ppb (Table 4).

Table 4 Error budget for the estimated aircraft measurement of XCH₄. The total error is the sum, in quadrature, of the three errors. The aircraft error was estimated by adding the precision of the aircraft measurements to the profile and re-integrated the profile. Tropopause error was determined by varying 1.0 km, while stratospheric error was estimated by shifting the stratospheric apriori profile of CH₄ by 1.0 km. The fourth row on the given table shows the average value of the total retrieval errors from individual sounding of XCH4 from g-b FTS and GOSAT

Aircraft error	Tropopause error	Stratospheric error	Total	
3.03 ppb	0.40 ppb	6.30 ppb	7.00 ppb	
g-b FTS total retrieval error		GOSAT total retrieval error		
3.60 ppb		7.70 ppb		



4.3 Aircraft XCH₄ Comparison with GOSAT

In this section, the comparison of the GOSAT retrieval product (V02.xx) of XCH₄ against the aircraft observations over the Anmyeondo station was analyzed. Based on the coincidence criteria, we obtained only three coincident days of observations. We took the mean values when obtaining more than one GOSAT measurements. As noted the aircraft data was smoothed by GOSAT column averaging kernels. The comparison results of XCH₄ between aircraft and GOSAT revealed a better agreement. The mean absolute difference of XCH₄ was about -4.65 ± 14.11 ppb, also shown in Table 3. The absolute value of XCH₄ difference on 5 October, 2014 was 20.9 ppb, which is larger than the other two coincident dates despite the fact that the matching data were observed on the closest time window. The discrepancy occurred at this particular date significantly affected the mean of difference and standard deviations. The difference could be attributable to the CH₄ variability in the lower atmosphere, the effect of aerosols/cirrus (Ohyama et al. 2015), or the large interval between air sampling levels, which is not sufficient to be captured the thinlayered structure of CH₄ profiles by GOSAT. We tried to look at atmospheric condition and aerosols during 5th October, 2015 using the information obtained from COMIS.4 (http:// uis.comis4.kma.go.kr/comis4/uis/common/index.do#), Cloud-Aerosol Lidar and Infrared Pathfinder Satellite Observations (CALIPSO), and Aerosol Robotic Network (AERONET) (see Appendix Figs. 10, 11, and 12). However, we noticed tropospheric aerosols that might be suggesting that it tends to cause an underestimation of XCH₄ retrievals. Still further investigation is required in the future. However, the overall mean bias shown here is consistent with the previous results reported by Inoue et al. (2014, 2016). Inoue et al. (2014) made a comparison of GOSAT XCH₄ (V02.00) with 3 aircraft measurements from Yakutsk, Siberia and reported that the bias was 9.2 ± 15.2 ppb (3.7 ± 16.7 ppb) within $\pm 2^{\circ}$ $(\pm 5^{\circ})$. When considering 2 days average excluding a date of October 05, 2014, we obtained a bias 3.47 ± 1.51 ppb, which is agreed with Inoue et al. (2016) who showed a 4.5 ± 15 . 20 ppb over land. Fig. 4 shows the total retrieval errors (the room sum of the squares of smoothing error, retrieval noise, and interference error components) of XCH₄ obtained from GOSAT and g-b FTS. The standard deviation of the differences that we obtained here is slightly larger than the total estimated error of GOSAT (see Fig. 9 and Table 4) and the aircraft XCH₄. Further work is still required to have more robust conclusion by increasing the sample numbers.

5 Conclusions

Evaluating measurement of GHGs derived from multiplatform instruments against accurate and precise instrument such as aircraft in-situ is very essential when utilizing remote sensing GHGs results for source/sink estimations with inverse modeling. The results of the inverse models are very sensitive even to small biases in the data (Rayner and O'Brien 2001). In this work, we carried out the comparison of XCH₄ between g-b FTS and GOSAT over the Annyeondo station. Based on the comparison results between g-b FTS and GOSAT, both instruments are generally well captured the seasonal variability of XCH₄, the maximum and minimum amount of methane was observed during summer and winter seasons, respectively. The overall results indicate that a relatively high variability was exhibited during a peak methane season. In addition, the impact the coincidence criteria was assessed and there was no systematic difference was observed. The bias was estimated to be from 0.1 to 3.37 ppb, and standard deviation was from 4.92 to 12.54 ppb. Column-averaged dry air mole fraction of CH₄ from 2012 to 2017 over the Anmyeondo station were derived by using CH₄ profiles measured by aircraft. Aircraft measurements have good accuracy, but are limited in altitude floor and ceiling, and so we have to use additional information for surface and the stratosphere. As to my knowledge, this is the first report on evaluation of remote sensing observations based on aircraft in-situ measurements of XCH₄ over this station. The uncertainty analysis of the aircraft measurements of XCH₄ confirmed the suitability of data for evaluating the remote sensing products. These insitu observations of the target species were compared against g-b FTS, and GOSAT over there. It is noted that the averaging kernels of the remote sensing instruments were applied into the aircraft measurements. The retrieved XCH₄ values from the g-b FTS and GOSAT measurements showed a better agreement with the aircraft in-situ observations. Both instruments revealed a negative bias against aircraft. The relative differences of XCH_4 were found to be -0.19 $\pm 0.69\%$ and $-0.42 \pm 0.84\%$ with respect to g-b FTS and GOSAT, respectively. The small number of coincidences considered here hinders more robust conclusions, so we recommend to carry out further works on validation by taking more coincident data using in-situ and remote sensing instruments, as well as combining the model simulations in the future. This will allow us to improve clear identification of all the potential sources of uncertainties, as well as to understand the role of local source/sink and dynamics.

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Appendix



Fig. 10 Atmospheric sky conditions for 17th, 18th Oct. 2012, and 5th Oct. 2014, left to right panels, respectively, from COMIS.4. Red star shows Anmyeondo site. (http://uis.comis4.kma.go.kr/comis4/uis/common/index.do#)



Vertical Feature Mask UTC: 2014-10-05 04:47:31.2 to 2014-10-05 05:00:59.9 Version: 4.10 Standard Daytime

Fig. 11 Cloud and aerosol information from CALIOP data



Fig. 12 Aerosol Optical Depth (AOD) from AERONET Level 2.0 data during 5th October, 2014 over Anmyeondo

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