First evaluation of the GEMS formaldehyde retrieval algorithm reduct against TROPOMI and ground-based column measurements during the in-orbit test period

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20 Abstract. The Geostationary Environment Monitoring Spectrometer (GEMS) onboard GEO-KOMPSAT 2B was successfully launched in February 2020 and has been monitoring atmosphericed chemical compositions over Asia. We present the first evaluation of the operational GEMS formaldehyde (HCHO) vertical column densities (VCDs) during and after the in-orbit test period (IOT) period (August–October 2020) and onward by comparing them with the products from the Tropospheric Monitoring Instrument (TROPOMI) and, Fourier-Transform Infrared (FTIR), and Multi-Axis Differential Optical Absorption Spectroscopy (MAX-DOAS) instruments. During the IOT in orbit test period, the GEMS HCHO VCDs reproduced the observed spatial pattern of TROPOMI VCDs over the wholentire domain (r=0.62) with high biases (10–16%). In the afternoon, GEMS VCDs were too high over the west side of the tropics. We corrected this issue by adding polarization sensitivity vectors of the GEMS instrument as an additional fitting parameter in the retrieval algorithm. Using observed radiances from clear sky

pixels as the reference spectrum in the spectral fitting significantly contributed to reducing artifacts in radiance references, resulting in 10–40 % lower HCHO VCDs over the latitude including cloudy areas in the updated GEMS product. We found that the agreement between the GEMS and the twoTROPOMI is was much substantially higher in Northeast Asia (r=0.90), including encompassing the Korean Ppeninsula and East China. GEMS HCHO VCDs well-captured the seasonal variation of in HCHO, mainly-primarily driven by biogenic emissions and photochemical activities, but showed larger variations than those of the TROPOMI over coastal regions (Kuala Lumpur, Singapore, Shanghai, and Busan). In addition, GEMS HCHO VCDs showed consistent hourly variations with MAX-DOAS (r=0.789) and FTIR (r=0.865) but were lower by 30–40 % lower than relative to the ground-based observations. Different vertical sensitivities of the between GEMS and ground-based instruments caused these systematic biases. The use of Utilizing the averaging kernel smoothing method reduces the low biases by about approximately 10 to 15 % (normalized mean bias (NMB): -478.45 % to -312.64 % and, -389.61 % to -267.63 % for MAX-DOAS and FTIR, respectively). The remaining discrepancies are due to multiple factors, including spatial collocation and different instrumental sensitivities, which need requiring further investigation using inter-comparable datasets.

1. Introduction

Non-methane volatile organic compounds (NMVOCs) are precursors of surface ozone (O₃), a harmful pollutant; that affects the human respiratory system (Shrubsole et al., 2019) and the plant photosynthetics of plants (Matyssek and Sandermann, 2003). NMVOCs also play a critical roles in the formation of secondary organic aerosols (DiGangi et al., 2012). They are emitted from both anthropogenic and biogenic sources (Vrekoussis et al., 2010). The latter is more important significant globally but has significant uncertainty (Abbot et al., 2003; Palmer et al., 2001). Previous studies (Cao et al., 2018; Choi et al., 2022; Palmer et al., 2003) have attempted to reduce this uncertainty using observational constraints, including satellite-derived vertical column densities (VCDs) of formaldehyde (HCHO), which is produced by the oxidation of NMVOCs and used as a proxy of for NMVOCs.

Since tarting with the Global Ozone Monitoring Experiment (GOME) launched in 1995 (Chance et al., 2000), HCHO has been observed globally by sun-synchronous low earth orbit (LEO) satellites. The Scanning Imaging Absorption Spectrometer for Atmospheric Chartography, launched in 2002, had measured HCHO VCDs with a 60 km km × 30 km spatial resolutions at the nadir for 2002–2012 (Wittrock et al., 2006). Observations from these satellites have provided global and

regional distributions of HCHO VCDs and <u>werehave been</u> effectively used to constrain NMVOCs emissions in biogenic source_dominant regions worldwide (Stavrakou et al., 2009). However, the spatial resolutions of theose satellites <u>were is</u> too coarse to detect local pollution plumes.

Subsequent LEO satellites, including the Ozone Monitoring Instrument (OMI), Tropospheric Monitoring Instrument (TROPOMI), Global Ozone Monitoring Experiment 2A (GOME-2A), and Ozone Mapping and Profiler Suite (OMPS) nadir mapper, have substantiallyadopted much finer spatial resolutions (approximately 5.5 km-km × 3.5 km-80 km km × 40 km), enabling to the observation ofe local pollution plumes and the provision of ean be effectively used to provide observational constraints for biogenic and anthropogenic sources globally (Veefkind et al., 2012; De Smedt et al., 2015, 2021; Li et al., 2015; González Abad et al., 2016; Levelt et al., 2018; Nowlan et al., 2023; Kwon et al., 2023). Moreover, De Smedt et al. (2015) examined the diurnal characteristics of global HCHO VCDs from GOME-2 and OMI with different overpass times (GOME-2: 9:30, OMI: 13:30, local time), showing that afternoon HCHO VCDs are higher than in the morning over most regions, with exceptions in the tropical rainforest. However, limited by the overpass time, these LEO satellites provide observations at most once a daydaily, which could can be significantly compromised by the presence of clouds, especially in East Asia.

In East Asia, anthropogenic NMVOC emissions of NMVOCs-are also highly uncertain, causing significant errors in chemical transport models (Park et al., 2021). Cao et al. (2018) used satellite HCHO products from GOME-2A and OMI with an inverse modeling technique to estimate "top-down" anthropogenic VOCs (AVOCs) emissions in China. Recently, Choi et al. (2022) showed a large underestimatione of VOCs emissions (29–115 %) in the anthropogenic emission inventory in East Asia using the top-down inversion with OMI and OMPS HCHO VCDs. Kwon et al. (2021) estimated top-down AVOCs emissions using aircraft HCHO vertical column observations during the Korea—US cooperative air quality campaign; and they demonstrated the efficacy of remote sensing HCHO VCDs observations to in estimatinge AVOC emissions in polluted urban areas. However, the previous studies based on LEO satellites or aircraft observation products had did not considered the continuous daytime variability of HCHO VCDs to the emission estimates, suggesting the necessity of deploying a geostationary satellite over East Asia.

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The Geostationary Environment Monitoring Spectrometer (GEMS), launched on 19 February 2020 by the Korean Ministry of Environment, has started begun hourly observations of trace gases (NO₂, SO₂, O₃, HCHO, and CHOCHO) and aerosols with $3.5 \, \underline{\text{km-km}} \times 8 \, \text{km}$ pixels or co-added pixels $(2 \times 2 \, \text{or} \, 4 \times 4)$ over Seoul, Korea (Kim et al., 2020). Kwon et al. (2019) developed the GEMS HCHO retrieval algorithm and evaluated its performance with before launch using OMI Level 1B data before the launch. In this study, we describe several updates implemented in the operational GEMS HCHO retrieval

algorithm and present its evaluation results by comparing GEMS HCHO VCDs with TROPOMI products and ground-based observations, including Multi-Axis Differential Optical Absorption Spectroscopy (MAX-DOAS) and Fourier-Transform Infrared (FTIR), during and after the in-orbit test (IOT) period (August–October 2020) and onward. We also performed sensitivity tests of the GEMS HCHO on theto input parameters to improve the precision of the retrieved column's precision.

2. Operational GEMS HCHO algorithm description

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GEMS is located at 128.25° E and conducts hourly observations for Asia (5° S–45° N, 75–145° E). The spectral range of GEMS covers 300–500 nm, with a spectral resolution of 0.6 nm and a wavelength interval of 0.2 nm. The GEMS's spatial resolution of GEMS is 3.5 km km × 8 km for NO₂, O₃, HCHO, and aerosols at Seoul, and relatively weak absorbers, including sulfur dioxide (SO₂) and glyoxal (CHOCHO), use 2 × 2 or 4 × 4 co-added pixels (7 km km × 16 km and 14 km + x 32 km, respectively) to increase the signal-to-noise ratio. HCHO As a weak absorber in the UV spectral region, HCHO can be retrieved at from 2 × 2 or 4 × 4 co-added pixels. However, Tto reduce the representation error and discern heterogeneous plumes, however, HCHO is retrieved infrom the original spatial resolution (Souri et al., 2023; Kwon et al., 2023). Detailed information on about the GEMS instrument can be found is available in Kim et al. (2020).

Kwon et al. (2019) described the GEMS HCHO retrieval algorithm (version-0.3), which consistsing of three-steps processes: pre-processing, spectral fitting, and post-processing. The pPre-processing includes the calibration of radiances and irradiances from Level 1C data and the convolution of absorption cross-sections. The sSpectral fitting derives the slant column densities (SCDs) using the basic optical absorption spectroscopy algorithm (Chance, 1998), a non-linearized fitting method, to solve the the Lambert-Beer's equation. Finally, the post-processing performs background corrections by using model columns from unpolluted elean clear areassector and convertsion from SCD to VCD by applying an air mass factor (AMF) (Palmer et al., 2001). HereIn this study, we briefly describe several updates in the retrieval algorithm compared to that of Kwon et al. (2019).

We updated the absorption cross-sections and a-fitting window for GEMS HCHO retrieval, as shown in Fig. 1 and Table 1, based on our the sensitivity tests discussed in Sect. 3. The operational retrieval uses the fitting window of 329.3–358.6 nm, which is within the ranges of 328.5–346.0 nm (De Smedt et al., 2008, 2012, 2015) and 328.5–359.0 nm (De Smedt et al., 2018) used for GOME-2 and TROPOMI, respectively. Variables of the GEMS HCHO Level 2 product are detailed listed in Table S1.

In the spectral fitting, the measured radiances over clean regions, referred to as—a radiance references, can be used instead of the solar irradiance. The Uuseing of athe radiance reference ean—minimizes ozone and bromine monoxide interferences in the stratosphere (Kwon et al., 2019). Radiance references sampled from the Pacific Ocean were have been used for the LEO satellites (De Smedt et al., 2008, 2021; González Abad et al., 2015, 2016). In the case of GEMS, a radiance reference is computed by averaging the measured radiances from the clean pixels, mainly-primarily consisting of ocean pixels, from the easternmost part within its domain as a function of cross-tracks (north-south direction) and is used as the default option for the spectral fitting with an alternative option using irradiance references. In Sect. 3, www discuss the sensitivity of the retrieval to regions sampled for radiance references and compare the operational products with those using irradiance references in Sect. 3.

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In the case of When using radiance references, we need should add the HCHO background concentrations included in the measured radiances, which is called a background correction. As described in Kwon et al. (2019), the background correction is to adds slant columns simulated by a chemical transport model over to the reference sector to retrieve the slant columns as a function of latitude. Using Eq. (1), which is described in Kwon et al. (2019), background correction was conducted using the model VCDs (VCD_{CTM}) and the satellite-derived AMFs (AMF_0) at a given latitude, resulting in a corrected SCD (SCD_{corr}) at each cross-track i and along-track j.

$$125 \quad SCD_{corr}(i, j) = dSCD(i, j) + AMF_0(lat) VCD_{CTM}(lat)$$

$$(1)$$

-For GEMS HCHO, GEOS-Chem simulations in with a $0.25^{\circ} \times 0.3125^{\circ}$ spatial resolutions provides provided the zonal mean HCHO VCDs over the radiance reference sector. Next, the model HCHO VCDs are were converted to SCDs by multiplying them with the pre-calculated zonal mean AMFs.

During the IOT, GEMS scanning plans were changed from a fixed scan area to varying scan areas from east to west to obtain more additional observations in the western areas, including India. Therefore, GEMS cannot sufficiently obtain sufficient clean pixels from the Pacific Ocean on an hourly every hour basis. We widened the sampling regions for the radiance reference from 143—to 150° E (Kwon et al., 2019) to 120—to 150° E (Fig. S1). The new reference sector partially includes polluted areas over in East China, Korea, and Japan, which can affect the and could affect the background contributions to the VCD. The simulated background VCDs of the new reference sector exhibited 30 % higher values on average (Fig. S2). In Sect. 4. Wwe examined the impact of the changed reference sector on the background correction in Sect. 4.

High reflectance conditions, such as thick clouds, can affect the radiance references owing to the different magnitudes of radiances compared with typical background conditions. We select eClear-sky pixels with minimal clouds (cloud radiance fraction < 0.4) were selected. Figure 2-1 compares the radiance references with (Fig. 2a1a) and without (Fig. 2b1b) cloud masking. Radiance references sampled in the minimal cloud condition showed fewer artifacts with exceptionally high radiances (-(approximately 230 W cm⁻² cm⁻¹ sr⁻¹) along latitudes and wavelengths, implying the better quality of the reference spectra. However, despite its extended reference sector in operation, the GEMS HCHO has often failed to reserve sufficient clean radiance pixels from the reference sector under cloudy conditions, resulting in a few missing tracks. We used mean radiance references from the previous two days²-of observations to fill in the missing latitudinal points of in the reference spectra. Because the observed light path varies significantly with the solar zenith angle (SZA), we used radiance references at the same observation time. As shown in Fig. 2e1c, running mean radiance references efficiently recovered the missing tracks, presenting consistent spatial and spectral distributions, as shown in to Fig. 2a1a. Consequently, the use of the updated radiance references to HCHO spectral fitting reduces highresulted in 10-40 % small differential SCDs (dSVCDs) compared to those using radiance references without cloud masking of the previous retrieval by 10-40 % over the entire scan domain, showing negative normalized mean bias (NMB) (-22.9 %).

Figure 3-2 shows the fitted optical depths as a function of the wavelengths for a specific pixel in Midwest Northern MyanmarChina at 12:45 Korean Standard Time (KST) on 3 August 2020. The black solid line shows represents the fitted optical depth of the chemical species HCHO, and the red solid line represents the optical depth together along with the fitting residuals. In the case of the uncertainty of the fitted slant columns, we estimated the uncertainty due to random noise in the operational Level 1C radiances. The Aaveraged random uncertainty and its fitting root-mean-square (RMS) of GEMS radiances at 12:45 KST on 3 August 2020 are were 87.97 × 10¹⁵ molecules cm⁻² and 91.71 × 10⁻⁴³, which are comparable with the synthetic radiances (Random-random uncertainty: 9.1 × 10¹⁵ molecules cm⁻² in molecules cm⁻²; RMS: 1.2 × 10⁻³) and OMI Level 1B data (Random-random uncertainty: 1.1 × 10¹⁶ molecules cm⁻² molecules cm⁻²; RMS: 1.2 × - 10⁻³) computed by Kwon et al. (2019). The random uncertainty on in the GEMS HCHO retrieval is was also consistent with that in TROPOMI (6.0 × 10¹⁵ molecules cm⁻² molecules cm⁻²) (De Smedt et al., 2021). GEMS also showed high residuals (approximately 1.5 × 10⁻³) and uncertainties (approximately 1.0 × 10¹⁶ molecules cm⁻²) under high SZAs, rendering the spectral fitting more uncertain.

Kwon et al. (2019) Kwon et al. (2019) employed a look-up-table approach to efficiently calculate AMFs to convert the fitted SCDs to VCDs. The AMF look-up-table of Kwon et al. (2019) consists of pre-calculated scattering weights, based

on monthly mean trace gas (O₃, NO₂, SO₂, and HCHO) and temperature a priori profiles simulated from GEOS-Chem, with a spatial resolution of 2°_-× 2.5°, and vertical shape factors calculated from identical a priori profiles. In this study, wWe only updated the vertical shape factors from the new it using monthly mean hourly a priori profiles simulated from by GEOS-Chem with a much substantially finer spatial resolution of 0.25° × 0.3125° and the most up-to-date anthropogenic and biomass burning emission inventories in Asia (Table 2). We compared the two discrete AMFs derived from the initial and operational algorithms to evaluate the impacts of the updated a priori profiles (Fig. 4a-3a and b, respectively). Their absolute differences in Fig. 4e-3c present decreased AMFs over Southeast Asian megacities, which increased their VCDs, and the opposite behaviors over the ocean pixels above 5° N. Disparities between the two AMFs are mainly-primarily due to the updates of anthropogenic emission inventories pertaining to metropolitan cities and biomass burning occurrences over in East Asia. In addition, the fine spatial resolution of the new a priori profile better separates ocean pixels in the AMF calculation, resulting in high AMFs and, ultimately, eventually low VCDs over the coastal areas such as Borneo and Hanoi.

3. Sensitivity tests

This section <u>conducts_presents</u> several sensitivity tests of <u>the GEMS HCHO</u> retrievals <u>ftoor</u> key input parameters, including polarization correction, fitting window, and irradiance reference. Unlike TROPOMI <u>andor</u> OMI, GEMS is not equipped with a polarization scrambler. <u>The Oo</u>bserved radiances can be sensitive to polarization, especially <u>atfor</u> the wavelengths of HCHO absorption (Choi et al., 2021; Kotchenova et al., 2006; Choi et al., 2023). Therefore, <u>a polarization</u> correction <u>needs to should</u> be applied <u>to in</u> the retrieval algorithm. We included the <u>instrument's polarization</u> sensitivity vectors <u>of the instrument</u> as a pseudo absorption cross-section in the spectral fitting. The polarization sensitivity values shown in Fig. <u>5-4</u> were measured before the launch of the GEMS instrument and provided a single spectrum for the central part of the charge-coupled_device (Choi et al., 2023).

Figure 6-5 shows the monthly mean hourly GEMS HCHO VCDs-dSCDs with and without polarization correction during the IOT. High VCDs-dSCDs (> 1.5-2 × 10¹⁶ molecules cm⁻molecules cm⁻²) occuroccurred over the west of the tropics without polarization correction, especially in the late afternoon (15:45 KST) (Fig. 6b5b). After applying the polarization correction, these high values are were eliminated, as shown in Fig. 6a5a, with slightly increased columns over Northeast Asia. In addition, the absolute relative differences (Fig. 6e5c) induced by polarization correction resulted in about an approximately 30 % variations in HCHO VCDs-dSCDs from the scan domain's east to the west edge side of the scan domain. These spatial

patterns <u>eould_can</u> occur <u>due tobecause of</u> the geometric dependency of <u>the</u> polarization vectors, as previously <u>presented</u> described by Choi et al. (2021). Polarization correction <u>eould_can</u> also affect the <u>sensitivity of the</u> fitting window <u>sensitivity</u> to the retrieved slant columns because it is not linearly considered in the spectral fitting. We evaluated the fitting window of <u>the</u> GEMS HCHO in the next step to <u>discern_determine the retrieval sensitivity of</u> the algorithm's <u>retrieval sensitivity</u> under polarization correction.

To find_determine an optimized fitting window, we conducted a sensitivity test one the retrieved HCHO dSCDs with polarization correction by varying the lower limit of the fitting window from 327 to 329.5 nm and the upper limit from 354 to 360 nm with the wavelength interval of 0.2 nm over the reference sector (120–150° E). As shown in Fig. 7a6a, negative values of the mean dSCDs over the reference sector weare shown observed over the entire fitting window, except for the upper limits at 358.5–359.5 nm. Based on the low RMS of the fitting residuals and fitting uncertainty shown in Figures 7b-6b and 7e6c, we chose-selected the fitting window of 329.3–358.6 nm for the GEMS HCHO operational retrieval. Figure 7 compares the retrieved HCHO dSCDs under the pre-launch and optimized fitting windows at 13:45 KST (04:45 UTC) on 2 September 2020. HCHO dSCDs using an optimized fitting window (Fig. 7a) presented 10–30 % higher values than those of the pre-launch fitting window (Fig. 7b) but showed consistent spatial correlations (r=0.95) and good representations of local emissions over East China and the Korean Peninsula.

We conducted a sensitivity test <u>effor</u> the GEMS HCHO retrieval using solar irradiances as <u>thea</u> reference spectrum. The use of irradiance for trace gas retrieval often causes stripe patterns, <u>owingdue</u> to the cross-track dependent factors including <u>the</u> diffuser, dark current, noise, and other factors along the scan tracks for the satellite (Chan Miller et al., 2014). We performed a de-striping process (Lerot et al., 2021), <u>by</u> subtracting the median values of each cross-track—with background correction. Figure <u>8-8</u> compares the GEMS HCHO <u>VCDs-dSCDs</u> retrieved using <u>the</u> irradiance and radiance references during <u>the</u> IOT. HCHO <u>dVSCDs</u> using irradiance spectra <u>have-were in</u> good agreement (r=0.9787) with those using radiance references but are were 20–50 % higher <u>VCDs-oin</u> the <u>high latitudeswest side of the scan domain</u> (\leq > 1040° EN). AlsoIn addition, HCHO products using the irradiance reference showed 10–50 % higher fitting RMS (approximately— 2.5 × 10⁻³) and random uncertainties (—(approximately 8 × 10¹⁵ molecules cm⁻molecules cm⁻²) than those using the radiance reference. The elevated fitting RMS and uncertainties in the irradiance reference retrieval could be due to the unaccounted spectral signals in the spectral fitting process, which were addressed when employing the radiance reference. Based on the lower fitting RMS and uncertainties, Therefore, results using a radiance reference are almost identical with those using an irradiance with the fitting parameter, and a radiance reference was used as athe reference spectrum in the operational retrieval. However, as discussed

in Sect_ion 4.1, the reference sector, including the polluted regions, can lead make ato small contribution of from the retrieved slant columns to the total column in some certain regions. Future studies should investigate the possibility of using irradiance and update the reference sector to minimize the inclusion of polluted regions. It is required to investigate the possibility to use an irradiance and to update the reference sector minimizing inclusion of polluted regions in a future study.

4. GEMS HCHO VCDs evaluation

4.1. Comparison with TROPOMI

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In this section, we compare the GEMS HCHO VCDs with those from TROPOMI, which have a similar spatial resolution (5.5 km-km × 3.5 km). We filtered out unqualified values of TROPOMI HCHO VCDs using the "Quality Assurance (QA)" variable (QA < 0.5), which is a recommended limit determined from observation conditions and other retrieval flags. For GEMS, we used the operational Level 2 HCHO product (version 2.0) and selected pixels in a "good" quality flag (FinalAlgorithmFlags = 0), which filters out pixels with high fitting residuals by using median absolute deviations (MADs) derived from the fitting RMS in a scan domain (fitting RMS < median (fitting RMS) + 3 × MAD (fitting RMS)). In addition, pixels with cloud radiance fractions less than 0.4 and low geometric angles (SZA < 70° and VZA < 70°) were used for the validation. We filter out unqualified values of TROPOMI HCHO VCDs using the "Quality Assurance (QA)" variable (QA < 0.5). For GEMS, we use operational Level 2 HCHO product (version 2.0) and select pixels in a "good" quality flag (FinalAlgorithmFlags = 0) with cloud radiance fraction less than 0.4 and less effect from SZA (< 70°) and VZA (< 70°) for validation. GEMS pixels were temporally collocated using the TROPOMI observation time within a ± 15 min time window. GEMS pixels are collocated with TROPOMI at the overpass time of 13:30 local time (LT).

Then Subsequently, GEMS the GEMS and TROPOMI data are were re-gridded using an area-weighted mean with a spatial resolution of $0.1^{\circ} \times 0.1^{\circ}$ to create a comparable dataset.

Figure 9-9 shows the GEMS HCHO VCDs against that of TROPOMI during the IOT. HCHO VCDs over the continent weare high during summer due-owing to active photochemistry and high biogenic VOC emissions. Large anthropogenic emissions also contributed to high VCDs in megacities (e.g., Shanghai, Beijing, Hong Kong, and Seoul). These characteristics are well-accurately delineated by GEMS observations, which are consistent with TROPOMI with a correlation

coefficient of 0.62 overacross the entire domain. Over north-eastern Asia, the GEMS HCHO VCDs have showed better agreement with that of the TROPOMI (r=0.90).

However, the GEMS VCDs are were lower by 4 × 10¹⁵ molecules cm⁻² than compared to those of TROPOMI over the north-western edge of the scan domain with high viewing zenith angles (VZA > 60°), as shown in Fig. 9e9c. When we use utilizing GEMS pixels under low viewing zenith angles (VZA < 60°), the correlation coefficient between GEMS and TROPOMI increases increased from 0.62 to 0.66, showing an increase in thed NMB (17 % → % to 22 %), attributed to by the eliminated of low biases from the north-western edge. The low GEMS VCDs could can be attributed to the longer light path with a high VZA, which is more susceptible to light scattering, making rendering the spectral fitting more uncertain. In addition, GEMS is a geostationary satellite sensor and has the with retrieval sensitivity of retrievals—with respect to the SZA. The value uncertainty of the cloud fraction retrieval eloud fraction increases increases exponentially for SZA values above 40° and has becomes significant large uncertainty—above 60° (Kim et al., 2021). Multiple scatterings by gases and aerosols with a longer light paths could—could also affect the AMF calculations. Further investigations are required to consider the scattering effects on the SCDs and AMFs forunder highly geometric conditions.

The changes in the GEMS scan domain also affect the construction of the radiance reference and eventually ultimately, the retrieved HCHO VCDs. In October 2020, the GEMS changed its afternoon scan schedule for 12:45–13:45 KST from the nominal (100–147° E) to the full west (FW) region (77–133° E), and the available sector for the reference spectrum was narrowed. However, we examined the GEMS HCHO VCDs retrieved using the radiance references sampled from the FW scan to assess the impact of a narrower reference sector. GEMS HCHO VCDs derived retrieved using from FW radiance references during the IOT entirely showed 5–20 % lowehigher values than the operational GEMS HCHO in Fig. 99, and presented indecreased NMBs (17 % \rightarrow to 13-29 %) against compared to that of TROPOMI, showing enhanced negative biases over Midwest China. This comparison implies that further investigations should be conducted to for reserving reserve sufficient radiance reference pixels to prevent potential biases in the spectral fitting results.

Several factors, including cloud properties, surface albedo, and trace gas profiles, contribute to AMF calculations. We focused on the differences in the cloud properties between GEMS and TROPOMI. GEMS cloud properties are available at 331, 360, and 420 nm as well as 477 nm. GEMS and TROPOMI use the observed radiances at different wavelength bands to derive cloud properties (O₄ at 477 nm for GEMS vs. the O₂—A band at 760 nm for TROPOMI), retrieving the different physical meanings interpretations of cloud fractions and cloud pressures (Kim et al., 2023; Loyola et al., 2018). This discrepancy makes

leads to different results in the AMF calculation; despite being observed at the same timesimultaneously. In Tthis study, utilized a cloud radiance fraction of 331 nm, as cloud fraction, which iwas the nearest to the HCHO fitting window, was utilized as the cloud fraction. To exclude the cloud dependency on the HCHO AMF in the comparison between GEMS and TROPOMI, we defined cloud-free VCDs (VCDs_{cf}) by applying AMFs under a cloud-free assumption, which was introduced by Lorente et al. (2017) and De Smedt et al. (2021). Figures S2d-S3d and S2h-S3h illustrate VCDs_{cf}, displaying a similar agreements to those from the comparisons in Fig. 9-9, but with slight changes in statistics. In particular, the presence of the clouds mainly primarily affects Southeast Asian cities and less_-polluted mid-latitude areas with 4–8 % lower NMBs compared tothan the original VCDs. It is probably This was likely due to the cloudy conditions related to the Asian rainy monsoon from August to October, which affectinged the AMF calculation.

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Figure 10-10 compares the seasonal variations in theof monthly mean GEMS and TROPOMI HCHO VCDs in the 22 cities shown in Fig. \$3\$4, which have high population densities, petrochemical complexes, or and power plants in East Asia. We used the averaged values over pixels within a 20 km km × 20 km grid box centering centered on the center of each city's center. The Ppanels ion the first and second rows in Fig. 10-10 represent Southeast Asian cities, and those ion the third and fourth rows are represent Northeast Asian cities. GEMS shows showed good agreements with TROPOMI, with a correlation coefficients of r=0.58-0.82.

In Southeast Asian cities (Vientiane, Ho Chi Minh, Hanoi, Bangkok, Yangon, and Phnom Penh), the highest HCHO VCDs occur in spring due owing to biomass burning. In other cities, the HCHO VCDs peak in summer, resulting from high photochemical reactivity witandh increased biogenic VOCs emissions. The GEMS captures—capturedwell this seasonal variation well. The GEMS HCHO VCDs in Tokyo showed a relatively poor correlation coefficient (r=0.58) with TROPOMI because of the insufficient GEMS pixels from the westward scan domain from May 2021. For this reason, Therefore, Tokyo only shows—showed only—a correlation coefficient from August 2020 to—April 2021. The total numbers of sampled—pixels sampled (Fig. S5) over Japan (Tokyo: 60, Osaka: 76) was nearly are almost one-third of the overall mean pixel count for the entireall cities (mean pixel number: 200.4).

For VCDs_{cf}, shown in Fig. S4S6, the monthly mean GEMS and TROPOMI HCHO columns in Southeast Asian cities-such as Ho Chi Minh, Hanoi, Taipei, and Kuala Lumpur increased by 5×10^{15} molecules cm molecules cm⁻² from February to March. On-In the other handcontrast, VCDs_{cf} over the Northeast Asian cities do did not show remarkable changes in their concentrations. These results are very highly similar to those the results of De Smedt et al. (2021), who reported that the cloud-free assumption could highly greatly reduce existing biases when comparing satellites over South Asian regions and perform

less effectively works—in mid-latitude polluted areas. VCDs_{cf} from GEMS and TROPOMI presented higher correlation coefficients (r=0.6–0.85) for all cities than compared to VCDs_x including some certain cloudy conditions, showing more distinctive seasonal and annual variations, as the clear sky assumption excludes the cloud dependency on the vertical columns.

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Background correction also plays a crucial role in the VCD computation of VCDs. However, obtaining clean radiance references from uncontaminated background pixels for GEMS is challenging in Northeast Asia. This difficulty arises because the scan domain of GEMS scan domain predominantly covers the continental areas at high latitudes, which resulting results in a higher number of background columns. We evaluated the effect of background contributions from the GEMS HCHO a priori profiles using VCDs without background correction (VCD₀). Figure S5-S7 shows the same comparison between GEMS and TROPOMI except for the VCD₀. In Southeast Asia, TROPOMI shows showed 10–15 %p higher contributions of VCD₀ to VCDs than GEMS did, showing consistent correlation coefficients of r=0.51–0.73. However, in Northeast Asia, the difference in VCD₀ contributions between TROPOMI and GEMS has widened by 70 % p with lower correlation coefficients of r=0.36–0.7. Consequently, the simulated background model values contributed significantly contribute to the final VCD columns in the retrieval in Northeast Asia.

4.2. Direct and harmonized comparison with ground-based MAX-DOAS and FTIR observations

We evaluated GEMS HCHO VCDs by comparing them with ground-based MAX-DOAS and FTIR observations at Xianghe (116.96° E, 39.75° N), in China. We set a spatial grid of 0.4° × 0.4° centered around the ground observatory and averaged GEMS observations within the grid. The effective size of the sampling grid was adopted from De Smedt et al. (2021), who determined a similar radius circle as the optimal value in the TROPOMI and MAX-DOAS HCHO comparisons. For temporal collocation, the MAX-DOAS and FTIR datasets were averaged to hourly data by a satellite observation time window of approximately 30 min.

We use GEMS observations averaged in pixels within a 20 km × 20 km grid box centering on the ground observatory, following De Smedt et al. (2021) who determined the similar size radius circle as an optimal value in TROPOMI and MAX-DOAS HCHO comparison. First, we compared the daily and monthly mean HCHO VCDs of GEMS and TROPOMI with those of MAX-DOAS and FTIR during the TROPOMI overpass time (1:30 pm, local time), as shown in Fig. S8. GEMS (r=0.74) and TROPOMI (r=0.73) presented good correlations but showed negative NMBs (GEMS=-45.22 %, TROPOMI=-34.7 %) with MAX-DOAS. Similar statistics are presented in the case of the comparison with FTIR, except for

the lower value of NMBs, showing correlation coefficients of r=0.85 and 0.63 and NMBs of -37.7 % and -31.37 % for GEMS and TROPOMI, respectively. However, it should be noted that the FTIR products from October 2020 to January 2021 had insufficient data points overlapped with the TROPOMI overpass time.

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The FTIR and MAX-DOAS products use different HCHO a priori profiles than the GEMS does, resulting in model dependencies when comparing their VCDs (Vigouroux et al., 2020; De Smedt et al., 2021; Kwon et al., 2023). To create intercomparable datasets among GEMS and ground observations, we replaced the a priori profiles of the ground-based observations with those of GEMS interpolated by the same vertical grid based on a smoothing method (Rodgers and Connor, 2003) and Eqs. 2 and 3 of Vigouroux et al. (2020). To make inter-comparable datasets among GEMS and ground observations, we apply a smoothing method (Rodgers and Connor, 2003) and a priori substitution following equations 2 and 3 of Vigouroux et al. (2020) using averaging kernel and a priori profile of GEMS:

Figure 11a-11a presents the daily and monthly mean HCHO VCDs for GEMS and MAX-DOAS during the GEMS observation time-period (08:45–15:45 KST). GEMS shows showed a good correlation (r=0.79) of daily mean VCDs with MAX-DOAS but also presents presented a low NMB (=-48.5 %) in the direct comparison without any corrections. Averaging kernel smoothing with a priori profile correction reduces reduced the differences between GEMS and MAX-DOAS. As shown in-by the orange line in Fig. 11a11a, the negative NMB between GEMS and MAX-DOAS decreases (NMB=--4847.45 % > to --312.637 %), and the linear regression slope becomes close to one (slope=0.5 >-to 0.756) with a consistently high correlation coefficient (r=0.789 >-to 0.82)₂₇ which This is consistent with the results of in De Smedt et al. (2021), indicating the different vertical sensitivities between two remote-sensed products. Therefore, the difference in the instrument's vertical sensitivity of the instrument should be considered when comparing the two remote-sensed products. For example, Fig. S8-S9 shows the daily mean averaging kernels for GEMS, MAX-DOAS, and FTIR over Xianghe; and-MAX-DOAS iwas more sensitive near the surface than compared to FTIR and GEMS.

Figure 11b-11b shows that the GEMS HCHO VCDs are inhave good agreement with those from FTIR with high correlation coefficients (r=0.865) in the direct comparison. The NMB between GEMS and FTIR is-was -389.609 %, which is-was less negative than those of MAX-DOAS. While the correlation coefficient between the smoothed FTIR and GEMS VCDs is-was slightly lower than that from the direct comparison (r=0.865 \rightarrow -to 0.832), NMB (-38.69.09 % \rightarrow -to -267.625 %) and RMSE (6.35 \times 10¹⁵ \rightarrow -to 5.742 \times 10¹⁵) are reduced. Although the vertical sensitivity of FTIR is already similar to that of the satellite observations (De Smedt et al., 2021), the above results showed that the effect of averaging kernel smoothing is still not negligible.

The remaining discrepancies between the GEMS and the two ground-based observations become reached a maximum during the summertime, likely owing topossibly due to the dilution of HCHO in the large GEMS area. Xianghe is a suburban area that primarily consists of agricultural areas with partial residential areas where large isoprene emissions occur (Xue et al., 2021). The HCHO production from isoprene oxidation in_summertime can be localized, inducing a steep spatial gradient. The GEMS pixel observing covering the MAX-DOAS station hadeovers a much larger area, leading to diluted HCHO VCDs, especially when the observing observation area has had a high HCHO concentration.

Figure 12-12 shows the diurnal variations in the GEMS and MAX-DOAS HCHO VCDs. De Smedt et al. (2015) showed the diurnal variation of in HCHO from the MAX-DOAS at Xianghe from 2010 to 2013, with two peaks occurring in the morning (06-08 LT) and afternoon (14-16 LT) due to the anthropogenic emissions during in peak traffic rush hour and the high insolation with increasing temperature, respectively. The diurnal variation of VCDs from the GEMS is consistent with the previous results from De Smedt et al. (2015), showing with an the increasing trend of HCHO VCDs in during the daytime.

Figure S6-S10 shows the same analysis from FTIR, which presents a consistent diurnal variation consistent with that of GEMS. Smoothed FTIR VCDs weare 2.5 × 10¹⁵ molecules cm molecules cm⁻² lower than the original VCDs throughout the daytime. FTIR shows showed decreasing HCHO VCDs from 14 LT while those from the MAX-DOAS continuously increased. The discrepancy between MAX-DOAS and FTIR appears appeared because the FTIR products have two2-ten-fold+0 times fewer observations numbers than MAX-DOAS, especially in the afternoon (14–16 LT). In Fig. S7S11, the MAX-DOAS HCHO VCDs sampled in during the FTIR observation time showed consistent diurnal variations consistent with those from the FTIR.

When a shallow boundary layer in the early morning restricts HCHO concentrations to the surface, GEMS can cause large uncertainties in the observation of HCHO columns owing to its limited sensitivity. In this scenario, the a priori profiles can dominantly contribute to the calculation of VCDs. To examine the impact of a priori profiles in the morning, we recalculated the VCDs using the dSCDs divided by the geometric AMF (GAMF) (Palmer et al., 2001): Figure S12 shows the diurnal variations in the HCHO dSCDs, VCDs using the GAMF, and model VCDs from the GEMS a priori profile, averaged from August 2020 to July 2021. Both dSCDs and VCDs using GAMF showed consistent diurnal variations with the a priori profiles, implying that the GEMS observes the morning time variabilities well without using the a priori profiles. Further studies on the possible uncertainties of the a priori profile simulations from the model should be conducted (Yang et al., 2023).

5. Conclusions

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The first geostationary satellite observation of HCHO was started conducted by the GEMS, which enables enabled the investigating investigation of the diurnal variability of HCHO over East Asia. In this study, we improved the initial GEMS HCHO retrieval algorithm and evaluated its performance in during operation. The initial algorithm caused high positive biases in the slant columns from the spectral fitting, primarily due to mainly led by radiance references constructed under cloudy conditions with high reflectance. We removed the existing artifacts of from the sampled radiance references by collecting clear-sky pixels over from the reference sector. In addition, GEMS also showed high positive biases over the western tropics nearby the Bay of Bengal and Indonesia under high solar zenith angles SZAs. These high biases are primarily due to caused by the interference of polarized lights from aerosols and gases. We considered the polarization sensitivity vectors of the GEMS instrument, which is not equipped with a polarization scrambler, as a pseudo-absorber in the spectral fitting and reduced the high biases of the HCHO VCDs in during the afternoon. Based on these modifications, we performed a sensitivity test for the GEMS-fitting window of GEMS and concluded that 329.3–358.6 nm is an optimized range to fit the slant column.

We evaluated the GEMS HCHO using the TROPOMI product. During the IOT, GEMS and TROPOMI showed a good agreement (r=0.65) for of HCHO VCDs over the entire scan domain, with especially higher correlation coefficients in East Asia (r=0.9). However, we found that the changes in the reference sector highly significantly affected the retrieved columns' precision of the retrieved columns. We tested three-day running mean radiance references to reduce missing tracks in the observations, which provided an improved better quality of the sampled spectra. Although the irradiance references can also be utilized as a reference spectraum, as mentioned in Sect. 3, they showed a substantially much higher fitting RMS and random uncertainty than the radiance references. To use solar irradiances as a reference spectrum, we need to study an efficient methodway forto correcting the retrieved slant columns retrieved from the irradiance references.

We found high correlations between GEMS and TROPOMI HCHO VCDs and -a good representation of seasonality and with the regional characteristics of GEMS HCHO among the major cities, showing active emissions from biogenic and anthropogenic sources over East Asia. Using VCDs under the cloud-free assumption, we determined that the effect of the cloud products in the AMF calculations does did not significantly contribute to the retrieval quality of polluted Northeast Asian cities, similar to the results from of De Smedt et al. (2021). However, there weare also highlarge variations in the differences between GEMS and TROPOMI over coastal areas, such as Kuala Lumpur, Singapore, Shanghai, and Busan.-These can be associated with the scene heterogeneity problem of measured radiances caused by the heterogeneous terrain heights or materials, such as mountains or coastal areas over the scanning track. This problem is detectable in a satellite product with a

410 fine spatial resolution because the large pixel size dilutes an error from the problematic area (De Smedt et al., 2021). Richter et al. (2018) presented a correction method by considering the heterogeneity factor in the spectral fitting, showing better performance of OMI NO₂-VCDs. Further studies need to be conducted to characterize the effects of the heterogeneity factor on the GEMS observation.

The GEMS HCHO VCDs were also consistent with the ground-based MAX-DOAS and FTIR observations in Xianghe. GEMS produced approximately 30 % lower columns—VCDs than MAX-DOAS but showed high correlations and good seasonality during thea year. We harmonized the MAX-DOAS and FTIR products using the GEMS a priori profile and averaging kernel. The MAX-DOAS and FTIR—recalculated VCDs showed evident declines—decreases, with a better correlation coefficient against GEMS after harmonization. We found that uUsing an identical a priori profile with vertical smoothing enableds a precise intercomparison, partially resolving the systematic discrepancy between the satellite and ground-based instruments.

In addition, a representation error, a mismatch between the high value of the point measurements and satellite pixels under in polluted areas, could be one of thea possible causes for of the low values of the satellite-retrieved columns (Brasseur and Jacob, 2017). Ground-based observation products over background regions should be jointly compared with the GEMS HCHO in to examining examine the sensitivity of the GEMS pixels of GEMS to point measurements based on the by pollution level of the target regions. Recently, Souri et al. (2022) presented an effective way method to deal with the spatial heterogeneity between satellite and ground-based observations by using kriging interpolation, which statistically converts point data into gridded values. They reduced the systematic biases of NO₂ VCDs between OMI and ground-based Pandora observations. However, but this method requires needs at least three ground observation points nearby the satellite pixel to be applied. Therefore, additional More ground-based observations must be conducted to tackle-address the underlying limitations in of satellite validation.

Data availability.

The GEMS Level 1C data are available upon request from the National Institute of Environmental Research (NIER) – Environmental Satellite Center (ESC). The GEMS Level 2 products are available at https://nesc.nier.go.kr/ko/html/index.do (last access: 22 August 2023). The TROPOMI HCHO product is available at https://disc.gsfc.nasa.gov/datasets/ (last access: coi22 August 2023) (De Smedt et al., 2021). MAX-DOAS HCHO and FTIR HCHO products are available at https://www-air.larc.nasa.gov/missions/ndacc/data.html?RapidDelivery=rd-list (last access: 22 August 2023) (Vigouroux et al., 2020).

440 Author contributions.

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GTL, RJP, and HAK designed the study, <u>earried-performedout</u> the analyses, and wrote the manuscript. ESH, SDL, and SS participated in <u>the</u> algorithm development. MHA and MK provided the GEMS Level 1B products. JK, HC, and YC provided the GEMS Level 1C products. YSC and GK provided the GEMS cloud products. DWL, DRK, and HH supported <u>the</u>-GEMS instrument management. IDS and CL provided the TROPOMI HCHO products. MVL, FH, <u>and</u> GP <u>earried-performedout</u> the MAX-DOAS measurements at Xianghe. BL, CV, and PW <u>earried-out</u>performed the FTIR measurements at Xianghe.

Competing interests.

Michel Van Roozendael is a Chief-executive editor of the ACP journal. The peer-review process was guided by an independent editor, and the authors have also no other competing interests to declare. Michel Van Roozendael is an editor of the journal.

Special issue statement.

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	Spectral range	300–500 nm
	Spectral resolution	< 0.6 nm
	Wavelength sampling	< 0.2 nm
	Signal-to-noise ratio	> 720 at 320 nm
		> 1500 at 430 nm
GEMS system attributes	Field of regard (FOR)	≥ 5000 (N/S) km × 5000 (E/W) km (5°
		S–45° N, 75–145° E)
	Spatial resolution	< 3.5 km × 8km for gas and aerosol
	(at Seoul)	
	Duty cycle	~ 8 times per day
	Imaging time	≤ 30 min
	Fitting window	329.3–358.6 nm (326.3–361.0 nm)
	(calibration window)	
	Reference	Three-day mean measured radiances
		from easternmost swaths (120–150° E)
		under clear-sky condition (cloud
		radiance fraction < 0.4)
Radiance fitting parameters	Solar reference spectrum	Chance and Kurucz (2010)
	Absorption cross-sections	HCHO at 300 K (Chance and Orphal,
		2011)
		O ₃ at 223 K and 243 K (Serdyuchenko
		et al., 2014)
		NO ₂ at 220 K (Vandaele et al., 1998)
		BrO at 228 K (Wilmouth et al., 1999)

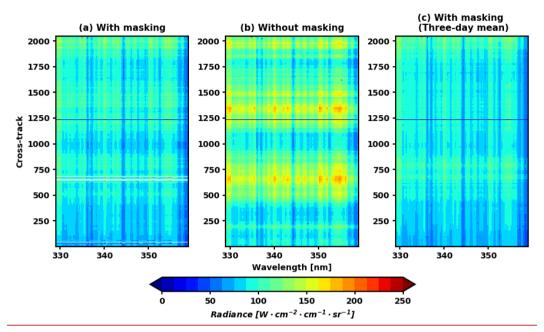
		O ₄ at 293 K (Finkenzeller and
		Volkamer, 2022)
	Ring effect	Chance and Kurucz (2010)
	Common mode	Online common mode from
		easternmost swaths (120–150° E) for a
		day
	Scaling and baseline polynomials	Third order
	Longitude (degree) (n=33)	70 to 150 with <u>a</u> 2.5 grid
	Latitude (degree) (n=30)	-4 to 54 with <u>a</u> 2.0 grid
	Solar zenith angle	0, 10, 20, 30, 40, 50, 60, 70, 80
	(degree) (n=9)	
AMF lookup table parameters	Viewing zenith angle	0, 10, 20, 30, 40, 50, 60, 70, 80
AWI lookup table parameters	(degree) (n=9)	
	Relative azimuth angle	0, 90, 180
	(degree) (n=3)	
	Cloud top pressure (hPa) (n=7)	900, 800, 700, 600, 500, 300, 100
	Surface albedo (n=7)	0, 0.1, 0.2, 0.3, 0.4, 0.6, 0.8, 1.0

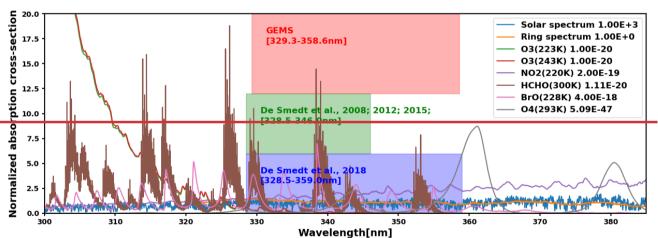
Table 2. Summary of the input options of a priori profiles for the GEMS HCHO algorithm.

Version	Initial	Operational
Model	GEOS-Chem (v9-01-02) (Bey et al.,	GEOS-Chem (v13) (Bey et al., 2001)
	2001)	
Period	2014	August 2020–July 2021
Horizontal resolution	2° × 2.5°	0.25° × 0.3125°
Vertical layers	47	47

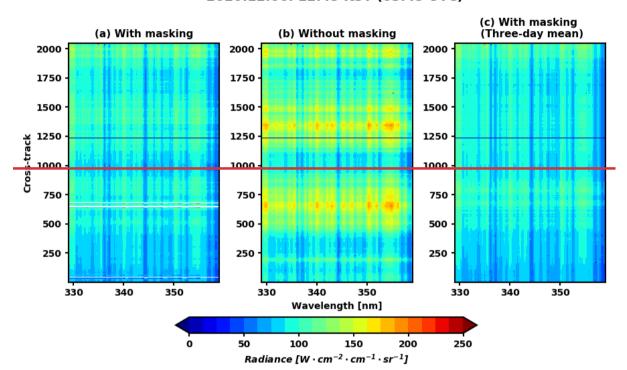
Meteorology	Modern-Era Retrospective Analysis for	GEOS-FP (Goddard Earth Observing System
	Research and Applications (MERRA)	-Forward Processing) assimilated meteorology
	(Rienecker et al., 2011)	
Emission inventory	Biogenic	Biogenic
	- Model of Emissions of Gases and	- Model of Emissions of Gases and Aerosols
	Aerosols from Nature (MEGAN)	from Nature (MEGAN) version 2.1 (Guenther
	version 2.1 (Guenther et al., 2006)	et al., 2006)
	Anthropogenic	Anthropogenic
	- Database for Global Atmospheric	- Community Emissions Data System (CEDS)
	Research (EDGAR) version 2.0	v2018-04 (Hoesly et al., 2018)
	inventory (Olivier et al., 1996)	- KORUS version 5 over Asia (Woo et al.,
	- Mosaic fashion with the	2020)
	Intercontinental Chemical Transport	Monthly biomass burning
	Experiment Phase B (INTEX B)	Global Fire Emissions Database (GFED)
	(Zhang et al., 2009)	version 4 inventory (Giglio et al., 2013)
	Monthly biomass burning	
	Global Fire Emissions Database	
	(GFED) version 3 inventory (van der	
	Werf et al., 2010)	

GEMS radiance reference 2020.12.06. 12:45 KST (03:45 UTC)

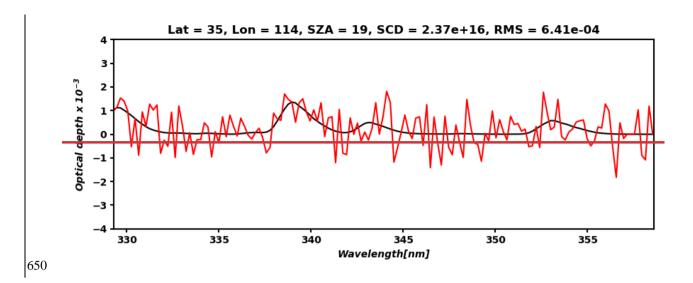




GEMS radiance reference 2020.12.06. 12:45 KST (03:45 UTC)



645 Fig. 21. Latitudinally averaged radiance references of GEMS (03:45 UTC (12:45 KST), 6 December 2020): With cloud masking (cloud radiance fraction > 0.4) (a), without cloud masking (b), and cloud masking with three-day mean radiances (c). Shadings The shadings are radiance spectra. Radiance The radiance spectra in the 1233–1241 cross tracks have bad L1C quality flags.



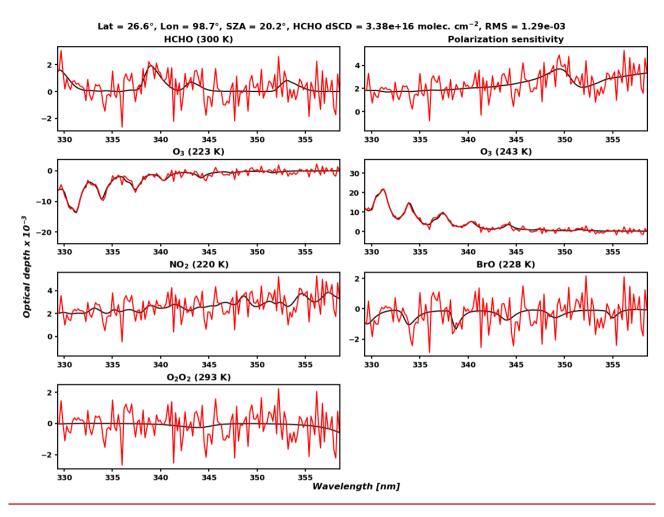


Fig. 3-2. Fitted HCHO optical depths (black solid line) and optical depths plus the fitting residuals (red solid line) of the operational GEMS HCHO retrieval algorithm in Midwest Northern Myanmar China at 12:45 KST (03:45 UTC), 3 August 2020.

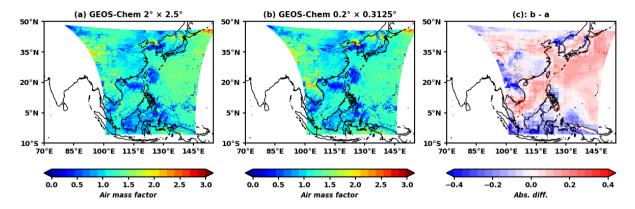
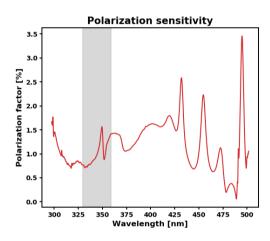
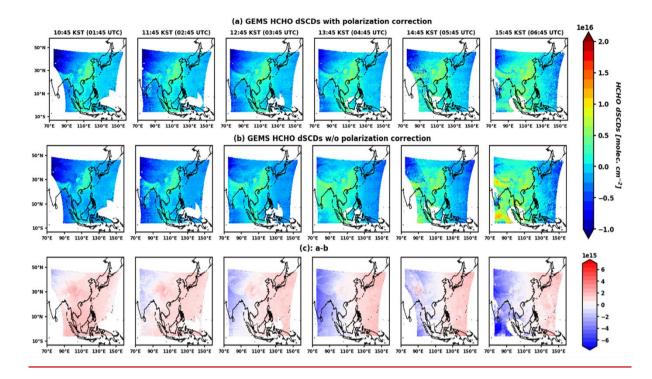
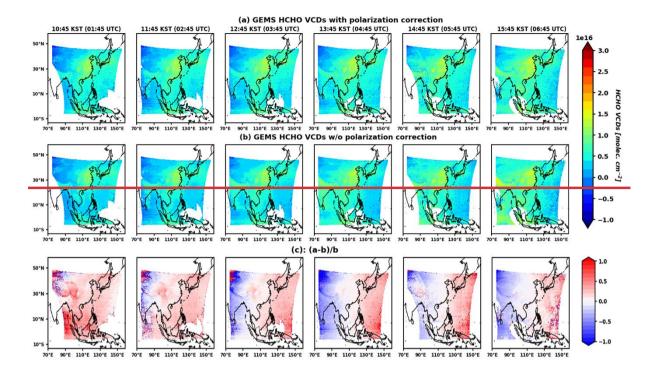


Fig. 34. GEMS HCHO Air air mass factor (3 August 2020, 12:45 KST (03:45 UTC)): The GEMS algorithm with initial a priori profile (a)-, GEMS with the updated a priori profile (b), and the absolute differences of b—a (c).

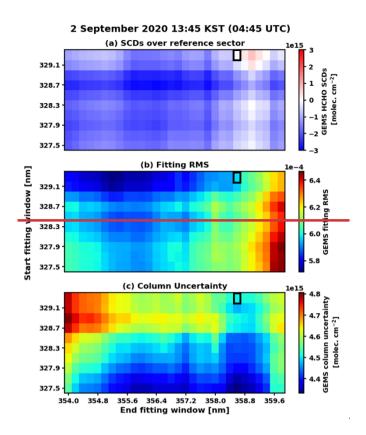


660 Fig. 54. Polarization sensitivity vector of the GEMS instrument (shaded area: fitting window of the GEMS HCHO).





665 Fig. 65. Average time dependence of GEMS HCHO VCDs dSCDs with (a) and without (b) polarization correction, and their relative differences (c) ((a—b)/b) during the IOT (August–October 2020).



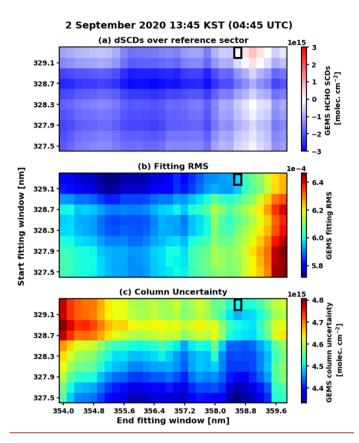
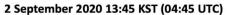


Fig. 76. HCHO dSCDs over the reference sector (120–150° E) (a), fitting RMS (b), and column uncertainty (c) retrieved from GEMS for 2 September 2020. All pixels satisfy the clear-sky condition (cloud radiance fraction < 0.4) and the "good" main data quality flag. Background correction is not applied in this result. The optimum fitting window is shown in the black solid rectangle.



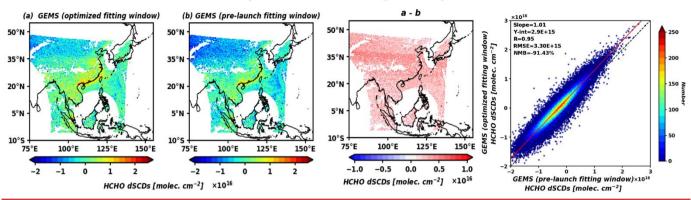
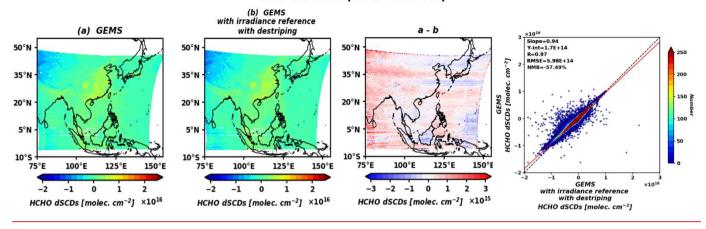


Fig. 7. Mean dSCDs from the GEMS HCHO algorithm with the optimized (a) and pre-launch fitting windows (b) for 13:45 KST (04:45 UTC) on 2 September 2020, with their absolute differences (a–b) and scatter plot.

August-October 2020 09:45-15:45 KST (00:45-06:45 UTC)



August-October 2020

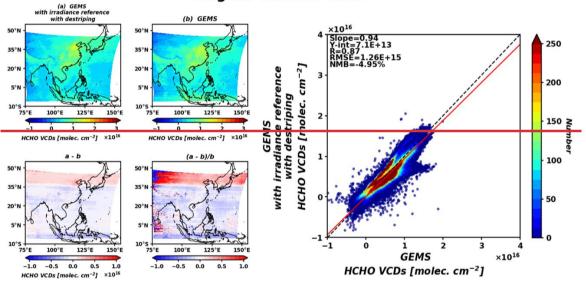


Fig. 88. Mean HCHO VCDs-dSCDs from the GEMS using measured radiance references (a) and irradiance with de-striping (upper leftb), radiance references (upper right) for 09:45–15:45 KST (00:45–06:45 UTC) during the IOT (August-October 2020), and with their absolute differences (a-b) and scatter plots (right) between them.

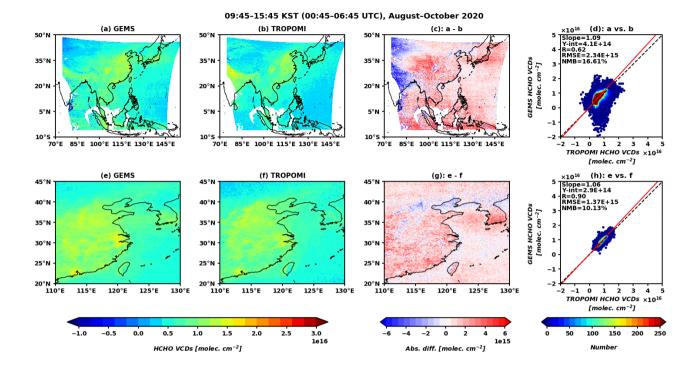


Fig. 99. Mean HCHO VCDs from (a) GEMS and (b) TROPOMI products for TROPOMI overpass time (13:30, local time) during the IOT (August-October 2020). Absolute differences between the GEMS and TROPOMI (a—b) are presented in (c), and their scatterplot is shown in (d) with the statistics. (e) to (h) in the second row are the same as (a) to (d) but are restricted to East China and the Korean peninsula-Peninsula (110–130° E, 20–45° N).

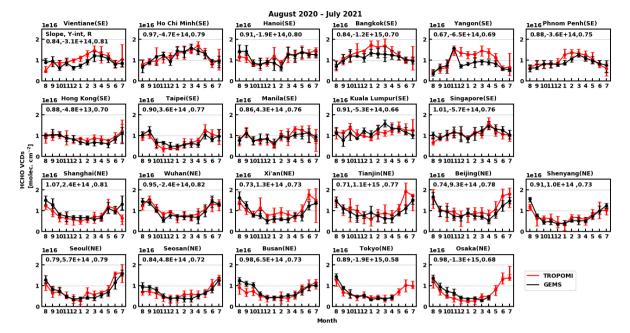
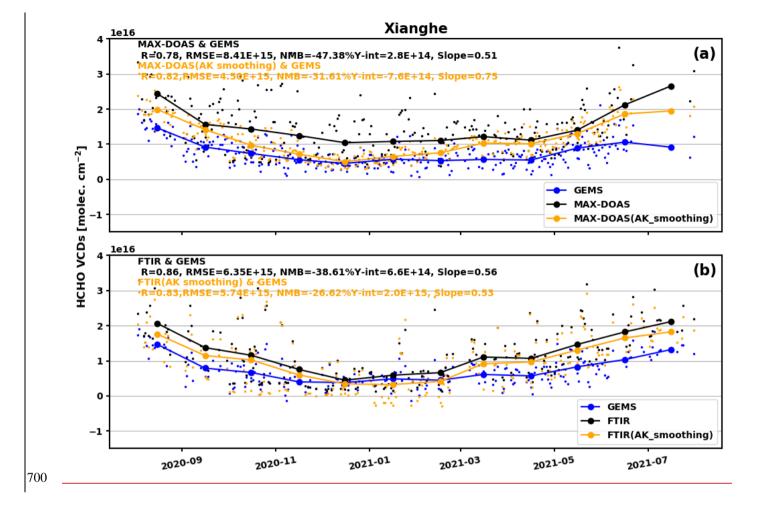


Fig. 1010. Comparison of the monthly mean HCHO vertical columns for GEMS and TROPOMI over 22 major cities in Southeast (SE) and Northeast (NE) Asia. The Bblack and red solid lines represent GEMS and TROPOMI, respectively. Error bars are the first (25 %), second (50 %), and third (75 %) quantiles of the columns and markers representing the means of each monthly dataset. Because GEMS does not observeing eastern Japan during the TROPOMI overpass time after May 2021, VCDs over Tokyo and Osaka ion June and July 2021 are missing.



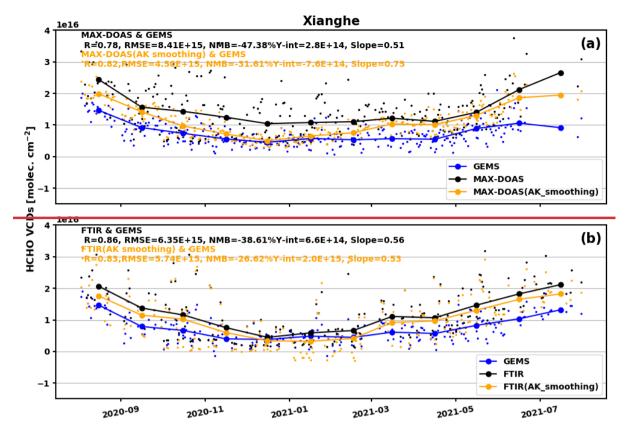


Fig. 4111. Daily (small marker) and monthly (large marker) mean HCHO VCDs of GEMS (blue), MAX-DOAS (black), and MAX-DOAS with averaging kernel smoothing (orange) from August 2020 to July 2021 (a). (b): Same as (a) except for FTIR observation.

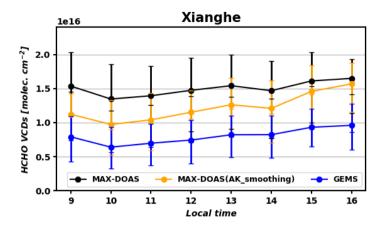


Fig. 1212. Hourly mean HCHO VCDs of GEMS (blue), MAX-DOAS (black), and MAX-DOAS with averaging kernel smoothing (orange) from August 2020 to July 2021. Error bars are the first (25 %), second (50 %), and third (75 %) quantiles of the columns.