1 Global GOSAT, OCO-2 and OCO-3 Solar Induced Chlorophyll

2 Fluorescence Datasets

Russell Doughty^{1*}, Thomas <u>P</u>. Kurosu², Nicholas Parazoo², Philipp Köhler³⁺, Yujie Wang³⁺, Ying
 Sun⁴³, Christian Frankenberg^{21,32}

 ¹ College of Atmospheric and Geographic Sciences, GeoCarb Mission, University of Oklahoma, OK, 73019, USA

7 ² Jet Propulsion Laboratory, California Institute of Technology, Pasadena, CA, 91109, USA

8 ³+ Division of Geological and Planetary Sciences, California Institute of Technology, Pasadena, CA, 91125, USA
 9 ²Jet Propulsion Laboratory, California Institute of TechnologyTropospheric Composition, Pasadena, CA, 91109, USA
 10 ⁴/₂ Soil and Crop Sciences Section, School of Integrative Plant Science, Cornell University, Ithaca, NY, 14853, USA

11 Correspondence to: Russell Doughty (<u>russell.doughty@ou.edurdoughty@ealtech.edu</u>)

12 Abstract. The retrieval of solar induced chlorophyll fluorescence (SIF) from space is a relatively new 13 advance in Earth observation science, having only become feasible within the last decade. Interest in SIF 14 data has grown exponentially, and the retrieval of SIF and the provision of SIF data products has become 15 an important and formal component of spaceborne Earth observation missions. Here, we describe the global 16 Level 2 SIF Lite data products for the Greenhouse Gases Observing Satellite (GOSAT), the Orbiting 17 Carbon Observatory-2 (OCO-2), and OCO-3 platforms, which are provided for each platform in daily 18 netCDF files. We also outline the methods used to retrieve SIF and estimate uncertainty, describe all the 19 data fields, and provide users the background information necessary for the proper use and interpretation 20 of the data, such as considerations of retrieval noise, sun-sensor geometry, the indirect relationship between 21 SIF and photosynthesis, and differences among the three platforms and their respective data products. OCO-22 2 and OCO-3 have the highest spatial resolution spaceborne SIF retrievals to date, and the target and 23 snapshot area mode observation modes of OCO-2 and OCO-3 are unique. These modes provide hundreds 24 to thousands of SIF retrievals at biologically diverse global target sites during a single overpass, and provide 25 an opportunity to better inform our understanding of canopy-scale vegetation SIF emission across biomes.

26 1 Introduction

27 Chlorophyll fluorescence is light that is emitted from chlorophyll after the absorption of photosynthetically

active radiation (PAR), which covers the spectral range of roughly 400 to 700 nm and corresponds to the

29 range of light visible to the human eye (Müller, 1874). The fluorescence emission occurs in the range of

30 ~650 to 800 nm during the light reaction of photosynthesis, where energy absorbed by leaf pigments is

converted into the chemical energy that is needed by the dark reactions for fixing atmospheric carbon dioxide into sugars. The absorption of a photon by chlorophyll excites an electron, and the excitation energy has three main pathways: photochemistry, non-photochemical quenching or heat, and chlorophyll fluorescence. Most of the excitation energy is used for photochemistry when vegetation is not stressed-and light conditions are not extreme, but at all times only a small fraction (~0.5-2%) is emitted as chlorophyll fluorescence (Porcar-Castell et al., 2014; Maxwell and Johnson, 2000).

37

38 Chlorophyll fluorescence has been a research tool for studying photosynthesis for nearly 150 years (Müller, 39 1874), but only recently have spaceborne retrievals of solar induced chlorophyll fluorescence (SIF) been 40 realized (Guanter et al., 2007; Joiner et al., 2011; Frankenberg et al., 2011b). The number of spaceborne 41 platforms from which SIF can be retrieved continues to grow, and the SIF temporal record continues to 42 lengthen. Spaceborne SIF data has generated much excitement in a plethora of fields within the biological, 43 biogeochemical cycle, climate, and Earth system science communities. Chlorophyll fluorescence has long 44 been a key component of the plant physiological and ecophysiological research communities (Maxwell and 45 Johnson, 2000) and has traditionally been studied in vivo at the subcellular and leaf level, and in situ using 46 pulse amplitude-modulated (PAM) fluorometry (Schreiber et al., 1986).

47

48 Most recently, remote sensing techniques have enabled the canopy and ecosystem-level retrieval of SIF 49 from towers, aircraft, and satellites. The evolution in our ability to retrieve SIF infrequently at the leaf-level 50 to frequent -canopy-level retrievals across regional to global scales continues to greatly advance our 51 understanding of plant and ecosystem function and carbon cycling. However, there are fundamental 52 differences between in-situ PAM fluorometry and SIF. The former measures steady-state and light-53 saturated fluorescence yields, which allow the derivation of photosynthetic yields (Genty et al., 1989) while 54 the latter only measures absolute SIF, following absorption of solar light by chlorophyll. The relationship 55 of SIF with photosynthetic yields is thus more complex (Porcar Castell et al., 2014; Frankenberg et al., 56 2014; Gu et al., 2019).

57

58 Here, we describe, compare, and discuss the Level 2 SIF Lite version 910 (v910) data produced from three 59 spaceborne platforms: the Greenhouse Gases Observing Satellite (GOSAT; 60 http://dx.doi.org/10.22002/D1.8771), and Level 2 SIF Lite version 10 (v10) data from the Orbiting Carbon 61 Observatory-2 (OCO-2), and OCO-3 (OCO-2 Science Team et al., 2020; OCO-3 Science Team et al., 62 2020). Our data description goes beyond previous documentation and publications via our description of 63 the SIF Lite files and our presentation and comparison of the SIF data from the three platforms. Also, our

64 discussions on SIF are intended to help the data user community to access and apply the data for scientific

65	research and prevent misinterpretation. Our data description is an update and synthesis of information that
66	has been dispersed among several user guides, publications, and supplementary materials related to these
67	three platforms. Our presentation and comparison of the SIF data from the three platforms and our
68	discussions on SIF are intended to help the user community find creative ways to apply the data and prevent
69	misinterpretation.
70	

Figure 12 data is ungridded (vector) data that contains geophysical variables that are of interest and use to the broader scientific community and is at same spatial and temporal resolution of the Level 0 and Level 1 data, Level 0 data_which are data obtained as is from the sensor (Level 0) to which and_aneillary information, such as radiometric and geometric calibration coefficients and georeferencing parameters, is appended to Level 0 data to form (Level 1 data.), such as radiometric and geometric calibration coefficients and georeferencing parameters. Level 3 products refer to gridded (raster) data, which can be found at https://climatesciences.jpl.nasa.gov/sif/download-data/level 3/.

The annual and monthly spatial distribution of the GOSAT and OCO Level 2 data for the globe and the 79 80 continental United States are presented in Figures 1 and 2 for visualization. These data are produced by the 81 OCO-2 and OCO-3 projects at the Jet Propulsion Laboratory (Frankenberg et al., 2014), quality controlled 82 by NASA's Making Earth System dData records for Use in Research Environments (MEaSUREs) SIF 83 team, and are publicly available on the NASA Goddard Earth Sciences Data and Information Services 84 Center (GES-DISC) website (https://disc.gsfc.nasa.gov/). Recent efforts by the OCO and MEaSUREs team 85 have focused on harmonizing the processing pipeline, attributes, and file structures of the GOSAT and OCO 86 SIF products (Parazoo et al., 2019). Here, we present a first analysis of these harmonized products and 87 demonstrate for the user community their key commonalities and differences.



GOSAT soundings is -10 km, and the widths of the OCO 2 and OCO 3 swaths are about 10 km and 13
 km, respectively. Thus, the data gaps shown here are larger than depicted and are not to scale.



99 CONUS. These panels are zoom ins of the contiguous United States from Figure 1.

100 2 Satellite platforms

101 The retrieval of SIF from space requires high spectral resolution and a high signal_to_noise ratio (SNR) as 102 solar Fraunhofer lines are very narrow and because SIF is a relatively weak signal (Frankenberg et al., 103 2011b). Coincidentally, the spaceborne spectrometers that have been used for retrieving Earth's 104 atmospheric carbon dioxide and methane concentrations include spectral channels covering Fraunhofer 105 lines in the vicinity of the oxygen A-band where atmospheric mass is retrieved with high spectral resolution 106 (< 0.2 nm), enabling SIF retrievals with <u>a mean</u> single measurement precision around ~0.5 W/m²/sr/µm. 107 Thus, the retrieval of SIF from space has been pioneered by the atmospheric science community (Guanter

to et al., 2007; Joiner et al., 2011; Frankenberg et al., 2011b), and spaceborne SIF retrievals and data products

109 have historically been a by-product of missions that have aimed to monitor Earth's atmospheric trace gases.

110 2.1 GOSAT

111 GOSAT (aka Ibuki) was developed by the Japan Aerospace Exploration Agency (JAXA) and launched in 112 January 2009. In fact, the first global satellite SIF observations came from GOSAT (Joiner et al., 2011; 113 Frankenberg et al., 2011b) (Joiner et al., 2011; Frankenberg et al., 2011b). Onboard the satellite is the 114 greenhouse gas observation sensor (TANSO-FTS), which has a spectral resolution of 0.012 nm (0.2 cm⁻¹ 115)-and an oxygen A band SNR > 300. The sensor has four bands: 0.758-0.775 μm, 1.56-1.72 μm, 1.92-2.08 116 μ m, and 5.56-14.3 μ m. It has a sun synchronous, descending orbit with an overpass time of 13:00 ± 15 117 minutes at the equator, a 3three-day repeat cycle, and a circular footprint of ~82 km² per sounding (~10 km 118 diameter) (Kuze et al., 2009).

119 2.2 OCO-2 and OCO-3

120 OCO-2 is a NASA satellite that was launched in July 2014, and OCO-3 is a duplicate of the OCO-2 grating 121 spectrometer attached to the Japanese Experimental Module Exposed Facility (JEM-EF) on the 122 International Space Station (ISS) in May 2019 (Eldering et al., 2019). Each platform houses a three3-123 channel grating spectrometer with a spectral resolving power of $\lambda \Delta \lambda > 17,000$ and a SNR signal to noise 124 ratio of >400 (Crisp et al., 2017; Eldering et al., 2019).-centered around the following wavelengthsThey 125 have three bands: an oxygen-A band at 0.765 µm and carbon dioxide bands at 1.61 µm and 2.06 µm. The 126 swath widths are ~10 km with eight measurements across-track. The spatial resolution at nadir is slightly 127 different for OCO-2 and OCO-3, about 1.3 km ×by 2.25 km and 1.6 km ×by 2.2 km (across × along track), 128 respectively.

129

OCO-2 has a 98.8 minute orbit with a 1:36 PM nodal crossing time and a 16-day ground-track repeat cycle
(Crisp et al., 2017). The ISS has a precessing low-inclination orbit that allows OCO-3 to view Earth at
absolute latitudes less than ~52°. The ISS orbits the Earth ~15.5 times a day and data acquisition is
sometimes halted during ISS maintenance and docking, thus overpass times, revisit periods, and data
availability are relatively irregular. Validation of the OCO-2 SIF retrievals was conducted by Sun et al.
(2017) by comparing OCO-2 SIF to coordinated airborne measurements using the Chlorophyll
Fluorescence Imaging Spectrometer (Frankenberg et al., 2018).

137 2.3 Observation Modes

138 GOSAT observation modes are described as Observation Mode 1 Sunshine (OB1D), Observation Mode 2 139 Sunshine (OB2D), and Specific Observation Mode Sunshine (SPOD). OB1D is the routine observation 140 mode, whereas OB2D is a non-routine mode in which the thermal-infrared observation and pointing 141 mechanism is stopped during low power supply. Over land, SPOD is a target observation mode designed 142 to observe specific sites. The TANSO-FTS sensor has a setting for low, medium, and high gain. The 143 medium gain data is recommended for scenes that are bright, such as deserts. Since the data used for SIF 144 retrievals are filtered to exclude bright scenes due to deserts, ice, snow, and cloud cover, the high gain data 145 is used for SIF retrievals.

146

150

159

Nadir, glint, target, and transition observation modes are common to each OCO platform. The OCO-2 target
mode provides repeated spatial sampling of a given target, such as an emission source or tower site. <u>Target</u>
<u>mode data for OCO-2 is absent from the v10 SIF Lite files, but will be included in the v11 update.</u>

151 -The OCO-3 target mode is a sequence of adjacent and partially overlapping segmentsswaths that allow for 152 increased spatial sampling. The target modes for both platforms provide over 10³ soundings. OCO-3 has an 153 additional observation mode using its pointing mirror assembly (PMA), which allows for snapshot area 154 mapping (SAM) of targets of interest. SAMs are a series of scans of a target that are nearly adjacent and 155 can cover an area of $\sim \frac{80 \text{ km}}{2}$ in about 2 minutes. The SAMs and their target locations, which 156 include volcanoes, various vegetation land cover types, and point sources of fossil fuel emissions, can be 157 viewed at https://ocov3.jpl.nasa.gov/sams/index.php. Target and SAM mode scans are prioritized and 158 scheduled several days in advance of an overpass of the ISS over the target (Taylor et al., 2020).

160 The target and SAM observation modes offer unique, spatially resolved acquisition of a target during a 161 single overpass at different sun-sensor geometries as solar illumination is relatively fixed during overpasses 162 and soundings are acquired over a range of viewing angles as the sensors pass over their targets. For SIF 163 applications, these measurements can be averaged to obtain SIF estimates with a reduced standard error or 164 binned by sun-sensor geometries to investigate the effect of observation geometry <u>onof</u> the retrieved SIF 165 values, as we demonstrate below.

166 3 Data description

175

185

167 3.1 SIF Lite file structure and content

Level 2 data is ungridded (vector) data that contains geophysical variables that are of interest and use to the broader scientific community and is at same spatial and temporal resolution of the Level 0 and Level 1 data., Level 0 data which are data obtained as-is from the sensor (Level 0) to which and ancillary information, such as radiometric and geometric calibration coefficients and georeferencing parameters, is appended to Level 0 data to form (Level 1 data.), such as radiometric and geometric calibration coefficients and georeferencing parameters. Level 3 products refer to gridded (raster) data, which can be found at https://climatesciences.jpl.nasa.gov/sif/download-data/level-3/.

176 The annual and monthly spatial distribution of the GOSAT and OCO Level 2 data for the globe and the 177 continental United States are presented in Figures 1 and 2 for visualization. These data are produced by the 178 OCO-2 and OCO-3 projects at the Jet Propulsion Laboratory (Frankenberg et al., 2014), quality controlled 179 by NASA's Making Earth System dData rRecords for Use in Research Environments (MEaSUREs) SIF 180 team, and are publicly available on the NASA Goddard Earth Sciences Data and Information Services 181 Center (GES-DISC) website (https://disc.gsfc.nasa.gov/). Recent efforts by the OCO and MEaSUREs team 182 have focused on harmonizing the processing pipeline, attributes, and file structures of the GOSAT and OCO 183 SIF products (Parazoo et al., 2019). Here, we present a first analysis of these harmonized products and 184 demonstrate for the user community their key commonalities and differences.

186 The ungridded Level 2 SIF Lite data are provided in netCDF-4 format and contain information for each 187 sounding from which a SIF retrieval was made. For each of the three satellite platforms, there is one file 188 for each day in which there is at least one sounding and each file contains information for all soundings 189 acquired on that day, including all measurement modes (glint, nadir, target). The SIF Lite files can be read 190 by, but are not limited to, MATLAB, Python, R, and Julia using their respective netCDF4 or HDF5 libraries. 191 The filename convention is, using the filename "oco2 LtSIF 200201 20210129t071949z.nc4" as an 192 example, platform (oco2), data product (LtSIF), date (YYMMDD), and file creation date (YYYYMMDD) 193 and time (tHHMMSS). The SIF Lite netCDF global attributes, dimensions, variables, and variable groups 194 are described below and listed in Table1.

195 3.1.1 Global attributes and dimensions

196 The global attributes provide file-level metadata information, the most important of which for data users 197 are the citation, contact information, and the time range of the data in the file. The times listed in the global 198 attributes can be used in instances where the file names may have been changed. A netCDF dimension is 199 an integer that specifies the shape of the multi-dimensional variables, and these are also described in Table

an integer that specifies the shape of the multi-dimensional variables, and these are also described in race

200 1. For the OCO-2 and OCO-3 data, there are dimensions for the footprint vertices (vertex_dim) and across 201 track footprint (footprint dim), which are not applicable for GOSAT. The polarization dimension

202 (polarization dim) is used for GOSAT's P and S polarizations. The only variable dimension is the

203 *sounding dim*, which is the number of soundings in the file.

204 3.1.2 Variables

205 The primary variables of interest in the SIF Lite files are the SIF, Daily SIF, and SIF Uncertainty variables, 206 which are available for SIF retrievals at 757 nm and 771 nm and estimated SIF at 740 nm. The variables 207 for GOSAT differ from those of OCO-2 and OCO-3 in that GOSAT has two polarizations, P and S, and 208 thus retrieval-related variables are provided as a two-2-dimensional (2D) array. It is important to note that 209 although the SIF values have traditionally been loosely labelled as being retrieved at 757 nm and 771 nm, 210 the retrieval fit windows used to produce the SIF Lite data is centered at 758.7 and 770.1 for OCO 2 and 211 OCO 3, and at 758 and 771 for GOSAT. However, we retain the 757 and 771 nomenclature to remain 212 consistent with previous publications and to avoid confusion.

213 3.1.3 Variable groups

214 Most of the variables have been grouped, as listed in Table 1. The ungrouped, root-level variables are those 215 that are most used and some of these variables are duplicated in the Geolocation and Science groups. The 216 Cloud group contains cloud and surface albedo variables from the L2ABP product, which are used in the 217 assignment of the quality flag. The Geolocation group contains variables related to the geolocation of the 218 sounding footprint, sun-sensor geometry, altitude, and acquisition time. GOSAT sounding footprints are 219 circular and have a radius of 5 km, in contrast to the OCO-2 and OCO-3 soundings, which are rhomboidal 220 and are described with coordinates for each of their four vertices. Thus, the GOSAT SIF Lite files do not 221 contain the footprint latitude and longitude vertices, whereas the OCO-2/3 SIF Lite files do.

222

The *Metadata* group houses variables with sounding-level metadata information, including build versionof the data, unique orbit and sounding identifiers, and measurement mode.

225

226 The Meteo group contains meteorological forecast variables, which were obtained from the GEOS-5 FP-IT

227 3h forecast (Lucchesi, 2015) and are provided as-is without validation. The *Offset* group is a collection of

228 variables of the bias/offset adjustments and statistics. These include mean, median, and standard deviations

of the adjusted and unadjusted SIF values separated by cross-track footprint. These data are reported on a

grid of signal level bins with a range of 3.0-229.0 W/m²/sɪ/µm and follows the SIF bias correction scheme
outlined by Frankengberg et al. (2011b).

232 **3.2** Quality flag criteriaen and rationale

233 The Quality Flag variable indicates the quality of the data for each sounding as being best (0), good (1), or 234 failed (2). We recommend using a combination of best and good for scientific analysis. The criteriaon for 235 the best and good quality flags are listed in Table 2, and soundings that do not meet either set of criteria are 236 flagged as *failed*. The rationale for the criterion is as follows: reduced chi-square (χ^2) thresholds exclude 237 fits that do not well represent the spectrum; continuum level radiance excludes scenes with brightness that 238 is too high or low; solar zenith angle (θ) excludes retrievals with extreme solar zenith angles, which are 239 more likely affected by rotational Raman scattering; and the O2 and CO2 thresholds exclude most cloudy 240 scenes.

241 4 Methods

242 4.1 SIF retrieval

243 The SIF values provided in the SIF Lite files are based on spectral fits covering Fraunhofer lines, as SIF 244 reduces the fractional depth of the Fraunhofer lines (Plascyk, 1975). The SIF retrieval methodologies are 245 fully explained by Frankenberg et al. (2011b, a) and SIF is retrieved using the identical method for GOSAT 246 and the OCO platforms at 757 nm and 771 nm. We estimated SIF at 740 nm for each sounding using both 247 retrieval windows as described in more detail below. In brief, Fthe main retrieval quantity in the retrieval 248 state vector is the fractional contribution of SIF to the continuum level radiance, or relative fluorescence 249 (SIF Relative 757nm and SIF Relative 771nm). The absolute SIF values (SIF 757nm and SIF 771nm) 250 are generated during post-processing in $W/m^2/sr/\mu m$.

251

252 It is important to note that although the SIF values have traditionally been loosely labeled as being retrieved

- at 757 nm and 771 nm, the retrieval fit windows used to produce the SIF Lite data is centered at 758.7 and
- 254 770.1 for OCO-2 and OCO-3, and at 758 and 771 for GOSAT. However, we retain the 757 and 771
- 255 nomenclature to remain consistent with previous publications and to avoid confusion.-We estimated SIF at
- 256 <u>740 nm for each sounding using both retrieval windows as described in more detail below.</u>

257 <u>4.2 SIF retrieval uncertainty</u>

- The determination of single sounding retrieval uncertainty is covered in great detail by Sun et al. (2018)
- and Frankenberg et al. (2014), and is provided in the SIF Lite files as SIF_Uncertainty_740nm,

260	<u>SIF_Uncertainty_757nm, and SIF_Uncertainty_771nm</u> . Briefly, these values are the 1-sigma (σ) estimated
261	single sounding measurement precision and represent the random component of the retrieval errors. It is
262	derived through standard least-square fitting by evaluating the error covariance matrix:
263	
264	$S_e = (K^T S_0 K)^{-1} $ (1)
265	
266	where K is the Jacobian matrix of the least-squares fit, and S_0 is the measurement error covariance matrix
267	and characterizes the instrument noise per detector pixel.
268	
269	For the OCO-2/3 data, the uncertainty for SIF757 usually ranges between 0.3 and 0.5 W/m2/sr/ μ m, or ~15-
270	50% of the absolute SIF value. Uncertainties for SIF771 are slightly higher due to less fluorescence and a
271	relatively less reduction in the fractional depth of the radiance at 771 nm. Uncertainty for SIF740 is
272	calculated from using the general formula for error propagation and the partial derivatives for the
273	uncertainties for SIF757 and SIF771:
274	
275	$SIE_{11} = 0.5 \cdot \left[((1.5 \cdot SIE_{11} + \dots + m^2)^2 + (2.25 \cdot SIE_{11} + \dots + m^2)^2 \right] $ (2)
[$\int \left(\frac{1}{10} - \frac{1}{10} + \frac{1}$
276	
277	4. <u>3</u> 2 SIF 740 nm and intersensor comparisons
278	The spectral window in which SIF retrievals are made depends on the wavelength bands of the platform.
279	Assuming the spectral shape of SIF is known and invariant, one can convert SIF to a standard reference
280	wavelength. Here, we use 740 nm as a reference as it corresponds to the 2 nd SIF peak and is not as strongly
281	affected by chlorophyll re-absorption as red SIF, thus showing a relatively stable shape at wavelengths
282	above 740 nm_(Magney et al., 2019; Parazoo et al., 2019). The differences in the retrieval windows
283	complicate the comparison of SIF retrievals from different sensors, thus it is useful to provide SIF at a well-

defined reference wavelength.

Although the range of the wavelengths used to retrieve SIF from the various sensors is small (740-771 nm),
absolute fluorescence can vary greatly depending on the spectral window used to retrieve SIF (Joiner et al.,
2013; Köhler et al., 2018; Sun et al., 2018). However, reference far-red SIF emission spectra at the leaf
level indicates that far-red fluorescence spectral shapes are consistent across species (Magney et al., 2019).
Thus, we provide an estimate of absolute SIF₇₄₀ (SIF_740nm) in the GOSAT and OCO-2/3 SIF Lite files
derived from the empirical relationship between SIF at 740 nm and SIF at 758.7 nm and 770.1 nm (denoted

as 757 nm and 771 nm; Eq. 1). The rationale for including SIF₇₄₀ in the SIF Lite files is to allow for more consistent and robust comparisons of SIF and SIF-based analyses across sensors (Parazoo et al., 2019), and to reduce the retrieval error by a factor of $\sqrt{2}$ (Sun et al., 2018). We stress that the reported SIF740 values are not retrieved, but are estimated under the assumption that the spectral shape of SIF is invariant.

296 297

298

$$SIF_{740} = 0.5 \cdot (1.5 \cdot SIF_{757} + 2.25 \cdot SIF_{771})$$
 (3)

We noted that although tThe ratios used in Eq. 1empirical ratio of SIF₇₅₇ and SIF₇₇₁ is 1.80 were based on leaf level measurements conducted by Magney et al. (2019), however we -observed a median ratio of 1.45 from OCO-2 over vegetated areas for 2015-2019 (Figure S1). The reason for this difference has not yet been discerned and requires further analysis, but the small potential bias introduced by the use of the empirical ratio does not infringe on the utility of the SIF₇₄₀ data.4.3 SIF retrieval uncertainty

The determination of single sounding retrieval uncertainty is covered in great detail by Sun et al. (2018)
 and Frankenberg et al. (2014), and is provided in the SIF Lite files as SIF_Uncertainty_740nm,
 SIF_Uncertainty_757nm, and SIF_Uncertainty_771nm. Briefly, these values are the 1 sigma (σ) estimated
 single sounding measurement precision and represent the random component of the retrieval errors. It is
 derived through standard least square fitting by evaluating the error covariance matrix:

310 4.4 Bias/offset correction

311 Biases in retrieved SIF can occur due to uncertainties in the exact instrument line-shape per footprint or 312 slight uncertainties in detector linearity. To correct for biases, we use reference targets that are non-313 fluorescent surfaces barren of vegetation, similar to the method described by Frankenberg (2011b). In short, 314 the background signal over reference targets is subtracted from all relative SIF values. We calculate the β15 background signal for each day as mean SIF over all barren surfaces within a 31-day window centered on 316 the current day for GOSAT and a three-day window for OCO-2/3. These windows were chosen to obtain a 317 robust background signal given their respective spatial-temporal resolution. Here, we identify barren 318 surfaces using a combination of the MODIS MCD12Q1 land cover data product (Friedl and Sulla-Menashe, 319 2019) and the Vegetation Photosynthesis Model (VPM) (Xiao et al., 2004; Zhang et al., 2017) from the 320 year 2018. The native spatial resolution of these data sets is 500 m, but we aggregated the data to a global 321 0.20-degree grid so that the barren surface reference targets had a coarser resolution than the soundings. 322 We classified barren surfaces as those grid cells which were 100% barren and/or snow and ice by 323 MCD12Q1 and had zero (0) annual gross primary production as estimated by VPM. We also excluded 324 coastal grid cells that overlapped with water using a global coastline shapefile and a buffer.

325 4.5 Daily average SIF and the daily correction factor

We provide an estimate of daily average SIF (Daily_SIF), which is instantaneous SIF scaled entirely upon the geometry of incoming solar radiation over a day. Instantaneous SIF is the absolute value of SIF for any given sounding and is a strong function of the illumination of the canopy at that instant in time. The differences in the illumination geometry of soundings at different overpass times and latitudes complicate direct comparisons of SIF at different points of Earth's surface and comparisons of SIF to other data that are more temporally coarse, such as daily estimates of GPP.

332

333 Downwelling solar radiation scales linearly with $cos(\theta)$ under clear sky conditions when ignoring Rayleigh 334 scattering and gas absorption. As described by Frankenberg et al. (2011b) and Köhler et al. (2018), a first 335 order approximation of daily average SIF (*SIF_{Daily}*) can be written as:

$$336 \quad SIF_{Daily} = SIF_{t\theta} \cdot \frac{1}{\cos(\theta(t_0))} \cdot \int_{t=t_0-12h}^{t=t_0+12h} \cos(\theta(t)) \cdot H(\cos(\theta(t)))dt$$
(43)

where SIF_{t0} is absolute instantaneous SIF, $\theta(t_0)$ is the solar zenith angle θ at the time of measurement t_0 with a heaviside function H to zero out negative values of $cos(\theta)$, and the integral is computed numerically in 10-min time steps (*dt*). In terms of the SIF Lite file variable names, this equation can be written for SIF at any wavelength as $Daily_SIF = SIF \cdot daily_correction_factor$.

341 5 Discussion

342 5.1 Scaling of SIF to GPP

343 We should note that SIF is, to first order, only a proxy for the electron transfer rate in the light reaction of 344 photosystem II. However, SIF is oblivious to the light-independent reactions that fix CO2. Nevertheless, many studies have reported on the linearity of SIF and GPP at bi-weekly or monthly timescales and at 345 346 coarse spatial resolutions (Verma et al., 2017; Doughty et al., 2019; Yang et al., 2015). The seasonality of 347 SIF and GPP tend to match well at such coarse temporal resolutions because both SIF and GPP are driven 348 by changes in canopy structure, the amount chlorophyll in the canopy, and the amount of sunlight 349 (photosynthetically active radiation; PAR) being absorbed by canopy chlorophyll (APAR_{chl}) (Magney et 350 al., 2020; Doughty et al., 2021; Dechant et al., 2019). The SIF-GPP relationship can also become more 351 linear at the canopy scale due to the contribution of total canopy SIF by sunlit, shaded, stressed, and non-352 stressed leaves (Magney et al., 2019). SIF and GPP have an indirect relationship through non-353 photochemical quenching and the electron transport rate (Porcar-Castell et al., 2014; Gu et al., 2019), which 354 can sometimes simultaneously downregulate photosynthesis and SIF, as has been seen in evergreen 355 needleleaf ecosystems, but not always (Magney et al., 2019).

357 At the leaf level, GPP saturates before SIF in response to APAR, such that we could see increased SIF 358 without any response in GPP at high levels of APAR (Gu et al., 2019). Conversely, vegetation stress can 359 cause a near or total cessation of GPP via stomatal closure with little or no change in SIF. This decoupling 360 has been seen at the leaf scale during forced stomatal closure of deciduous tree species (Marrs et al., 2020) 361 and a one-month drought experiment with Eastern cottonwood (Populus deltoides) (Helm et al., 2020). 362 However, these studies and others of deciduous vegetation and croplands have repeatedly found a better 363 correlation between SIF and APAR than SIF and GPP (Yang et al., 2018; Miao et al., 2018). For SIF to be 364 a reliable proxy of APAR, SIFvield (ratio of SIF to APAR) would need to remain constant. For a detailed 365 inquiry into SIF and photosynthesis, see Porcar-Castell et al. (2014), and a review of SIF remote sensing 366 applications and challenges from the leaf, tower, and satellite scale by Magney et al. (2020) and Mohammed 367 et al. (2019).

368 5.2 Negative SIF values

356

369 Data users are likely to find negative SIF values, which are due to retrieval noise, but these values should 370 generally not be discarded. The one-sigma uncertainty in retrieved SIF values (SIF Uncertainty) can be 371 substantial, but negative values are plausible in a retrieval sense although not in physical terms (actual SIF 372 emission cannot be negative). Discarding negative values will introduce a high bias when averaging. 373 Nevertheless, extremely negative values may indicate a problem with the retrieval. We recommend the 374 following guidelines for filtering negative SIF values: accept if SIF + 2- σ uncertainty \geq 0; questionable if 375 SIF + 2- σ uncertainty < 0 and SIF + 3- σ uncertainty \geq 0; and reject if SIF + 3- σ uncertainty < 0. These 376 thresholds have not been incorporated into the Quality Flag variable of the SIF Lite data.

377 5.3 Sun-sensor geometry

378 Users of SIF data from any source should be aware that sun-sensor geometry plays a role in the absolute 379 values of SIF, in addition to vegetation canopy characteristics (Joiner et al., 2020; Köhler et al., 2018). 380 Absolute SIF values increase rapidly when the phase angle approaches 0° (when the sun and sensor are 381 aligned), but the effect of sun-sensor geometry has been shown to be small when the phase angle is greater 382 than 20° (Köhler et al., 2018; Doughty et al., 2019). Thus, retrieved SIF values from target or SAM mode 383 scans during a single overpass can vary greatly despite homogeneous vegetation cover due to changing sun-384 sensor geometries during data acquisition. Figure 3 illustrates the phase angle and SIF757 for a SAM acquired over the Amazon rainforest, where the vegetation canopy is very homogenous. The figure also 385 386 illustrates how the phase angle changes during an OCO-3 SAM scan and that the sun-sensor geometries for 387 each individual swath are rather distinct from each other (Figure 3a). Mean SIF for each swath is also







405

Figure 4. Absolute phase angle and SIF₇₅₇ for an OCO-2 target mode sean over evergreen broadleaf*
 forest in Manaus, Brazil. As this figure demonstrates, retrieved SIF values increase as the phase angle

Formatted: Justified

406 5.4 Averaging over space and time to reduce retrieval uncertainty

approaches 0 degrees.

407 There are two main challenges to working with all spaceborne SIF data: 1) the inherently large uncertainties 408 for individual soundings due to retrieval noise, and 2) the effect of differences in sun-sensor geometry on 409 retrieved SIF values. Thus, we advise against using single soundings for analysis. However, averaging soundings across space and time can reduce the retrieval noise by a factor of $1/\sqrt{n}$, with n being the number 410 411 of soundings comprising the average (Frankenberg et al., 2014). For platforms with a wide swath, like the 412 TROPOspheric Monitoring Instrument (TROPOMI), the effect of sun-sensor geometry can be accounted 413 for by averaging soundings for a point of interest over the entire repeat cycle (16-days for TROPOMI) as 414 demonstrated by Doughty et al. (2019, 2021). In the case of OCO-2/3, as we demonstrate in Figure 3 and 415 in Braghiere et al. (2021), soundings can be grouped by phase angle and then averaged to reduce retrieval 416 uncertainty. Thus, retrieval uncertainty and sun-sensor geometry effects can be substantially minimized. 417 For GOSAT, we recommend averaging SIF retrieved from both the P and S polarizations, as demonstrated 418 in Figure 5.

419

420 Users should also keep in mind that when conducting analyses at large spatial scales, gridding the data prior

to analysis is largely unnecessary as the ungridded Level 2 data can be used directly (Doughty et al., 2019).

422 Doing so will allow the users to retain sounding-level information that may aid in the interpretation of the

423 results, which would otherwise be lost when merely gridding the SIF values. For instance, as demonstrated

424 by Doughty et al. (2019), ungridded Level 2 SIF data was used to calculate mean SIF for the entire Amazon

425 Basin at different phase angles to show that the seasonality of SIF in the Amazon Basin was consistent

426 across sun-sensor geometries. Such an analysis would not have been possible with gridded data because

427 after gridding it is impossible to group the data by sounding-level attributes, such as phase angle or cloud

428 <u>fraction.</u>

429 5.5 The use of SIF at 740, 757, and 771 nm

It is important to note that in areas where the SIF signal is <u>near zeroweak</u>, the use of SIF <u>at 757 nm₇₅₇ at</u> would be more appropriate as the SIF signal is stronger at this wavelength. In areas where vegetation is sparse or SIF_{yield} is low due to vegetation responses to environmental conditions or canopy leaf physiology, SIF <u>at 771 nm₇₇₄</u> could be within the noise range due to its relatively far distance from the far-red peak at 740 nm. In these cases, we advise the use of SIF <u>at 757 nm₇₅₇</u>. Since SIF <u>at 771 nm₇₇₄</u> is used to compute SIF <u>at 740 nm₇₄₀ in the SIF Lite files, diligence should likewise be used when using SIF <u>at 740 nm₇₄₀</u> in analyses.</u>

437 5.6 Comparison of GOSAT, OCO-2, and OCO-3

438 OCO-3 SIF has been shown to have a very high correlation (r > 0.9) with OCO-2 (Taylor et al., 2020). 439 Here, we present the first comparisons between GOSAT and OCO-2 Level 2 data. Currently, there are not 440 enough coincident soundings for GOSAT and OCO-3 to provide a robust analysis but given that OCO-2 441 and OCO-3 compare very well, we would expect a comparison between GOSAT and OCO-3 to mimic the 442 findings from our GOSAT and OCO-2 comparison.

443

Although the data records for GOSAT and OCO-2 overlap six years, only a small percentage of soundings flagged as best quality and cloud free from GOSAT and OCO-2 overlap on the same day (Figure 5a). Despite this filter, the mean SIF values may differ widely on the same day due to differences in overpass time (and thus solar illumination angle and environmental conditions), viewing geometry, and the number of OCO-2 soundings comprising the mean. We progressively filtered the data as illustrated in Figure 5 to ensure the soundings were of a vegetated land surface, had similar sun-sensor geometries, environmental, and atmospheric conditions, and that the temperature was high enough for photosynthesis to occur as

451 <u>indicated by the temperature_skin variable in the SIF Lite data</u>.



Formatted: Justified

453 454 filters and Deming regression. X-axis values are the mean of all OCO-2 soundings (-1.3 km Zby 2.25 455 km) that fall within the corresponding GOSAT sounding footprint (-10 km in diameter). Y axis values 456 represent the mean of SIF retrieved from P and S polarizations for a single GOSAT sounding. Six years of 457 data (2015 2020) were used to identify soundings that overlapped on the same day. (a) Soundings flagged 458 as best quality and cloud free. (b) Same as (a) but filtered as being over vegetation using the IGBP flag in 459 the OCO 2 SIF Lite file. (c) Same as (b) but filtered for data that was acquired from GOSAT and OCO 2 460 within one hour of each other. (d) Same as (c) but with viewing zenith angles (VZA) < 5° for both platforms. 461 (e) Same as (d) but with number (N) of OCO-2 soundings within a GOSAT sounding being \geq 10. (f) Same 462 as (e) but with skin temperature \geq 5 °C. 463

464 We found that the correlation and slope improved with more conservative filtering of the data, and that the 465 comparison between GOSAT SIF and OCO-2 SIF were reasonable. However, it is important to note that 466 any comparison between GOSAT and OCO data will inevitably be affected by spatial sampling bias, as the 467 swath width for both OCO platforms is smaller than the diameter of the GOSAT <u>sounding</u> footprints (Figure 468 6; left footprints). Also, it could be the case that only a small portion of the GOSAT footprint is sampled by OCO (Figure 6; right footprints). Our filter of ≥ 10 OCO-2 soundings within a GOSAT footprint aimed
to reduce this potential sampling bias in addition to reducing the uncertainty of the OCO-2 SIF retrievals.
It must also be remembered that in this comparison, we do not have the luxury to average several GOSAT
soundings to reduce the uncertainty as we did with OCO-2, so the uncertainties of the GOSAT SIF is much
higher than that for OCO-2.

474



475

Figure 6. Overlapping GOSAT and OCO 2 soundings near Quill Lakes, Saskatchewan, Canada.
Orange circles are GOSAT sounding footprints (~10 km) and the white rhomboids are OCO-2 sounding
footprints (~1.3 km <u>></u>by 2.25 km) acquired on the same day as the GOSAT soundings in which they fall.
The GOSAT and OCO 2 soundings on the left were acquired in February 2019, and the soundings on the
right were acquired in July 2017. The base map is a Google Satellite image.

Upon a more detailed comparison of GOSAT and OCO-2 SIF at 740 nm, 757 nm, and 771 nm using the strictest filter we applied in Figure 5f, we found SIF₇₄₀ from the two platforms to have higher correlations than for SIF₇₅₇ and SIF₇₇₁ alone (Figure 7). We also noticed that GOSAT and OCO-2 soundings most frequently overlap in the boreal winter, which corresponds to a period of little or no photosynthesis at mid and high latitudes (Figures S2 and S3). Thus, the direct comparison of GOSAT and OCO-2 SIF is severely restricted by the relatively infrequent overlap of the two platforms during the growing season.



487 488 489 490 491

490 OCO-2 to compare reasonably well at the global scale during the boreal summer (Figure 8). The
 491 relatively large differences in SIF illustrated at the gridcell level in Figure 8c are due to differences in the

-In addition to the sounding level comparisons, we found mean annual SIF757 for GOSAT and

493 <u>spatial resolution to improve the sampling by GOSAT (Fig. 1a).</u>

⁴⁹² spatial and temporal sampling of the two platforms. We presented the comparison here at 4.0-degree



495 Figure 8. Mean GOSAT to OCO-2 SIF740 and their ratio at 4.0 degrees for June-August 2015-2019.

496 5.7 Collocating Soundings with their Targets

497 Currently, the target and SAM soundings are not collated to the target to which they correspond, but 498 variables will be added to <u>upcomingfuture</u> versions (e.g., v11) of the SIF Lite files that will allow for the 499 <u>collocate theeollocation of</u> target and SAM soundings with their intended target site. For OCO-3, some of 500 the target sites are in close proximity to each other and thus a target site may fall within the scan of another 501 target. For these sites, users may also want to check scans that were intended for target sites adjacent to 502 their target of interest. The OCO-3 targets, the dates of their scans, and scan maps are available at https://ocov3.jpl.nasa.gov/sams/index.php. A list of target locations for OCO-2 and OCO-3 are available in
 Table S1 and Table S2, respectively.

505 6 Conclusions

506 Here, we have presented and described the Level 2 SIF Lite files for GOSAT, OCO-2, and OCO-3, which 507 have been standardized in the same netCDF format to maximize their interoperability and accessibility by 508 the data user community and allow for intersensor comparisons. Users of remote sensing data are more 509 accustomed to using Level 3 gridded data for analyses, but we incentivize data users to also exploit the 510 Level 2 data we have presented in the SIF Lite files. The OCO-2 and OCO-3 platforms provide the highest 511 spatial resolution spaceborne SIF data, and the target and SAM observation modes are unique to these 512 platforms. The observation scheme for the OCO platforms allow for time series to be constructed for the 513 target locations, and the repeated target and SAM scans allow for the investigation of the directionality and 514 escape of SIF at varying sun-sensor geometries across many biomes in different seasons. 515

516 We have demonstrated how users can break target and SAM observations into phase angles for analysis 517 and have described how the effect of sun-sensor geometry and retrieval noise can be mitigated through the 518 averaging of the data. The OCO platforms also provide a rich resource for the validation of radiative transfer 519 models, which is currently underutilized. Upcoming spaceborne platforms with frequent revisits and/or 520 high spatial resolution, such as the European Space Agency's FLuorescence EXplorer (FLEX) by the 521 European Space Agency and NASA's Geostationary Carbon Cycle Observatory (GeoCarb), are expected 522 to further our understanding of changes in vegetation structure and function (Drusch et al., 2016; Polonsky 523 et al., 2014; Moore et al., 2018).

524 7 Data availability

 OCOAll SIF Lite files presented here can be found at NASA Goddard Earth Sciences (GES) Data and Information Services Center (DISC) at https://disc.gsfc.nasa.gov/datasets/. OCO-2 SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datasets/. OCO-2 SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datasets/. OCO-2 SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datasets/. OCO-2 Lite SIF _____
 EarlyR.html. GOSAT SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datacollection/OCO3_L2_Lite_SIF_ EarlyR.html. GOSAT SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datacollection/OCO3_L2_Lite_SIF_ EarlyR.html. GOSAT SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datacollection/OCO3_L2_Lite_SIF_ EarlyR.html. GOSAT SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datacollection/OCO3_L2_Lite_SIF_ EarlyR.html. GOSAT SIF Lite files can be accessed at https://disc.gsfc.nasa.gov/datacollection/OCO3_L2_Lite_SIF_ SIF data products are listed at NASA Jet Propulsion Lab (JPL) website for SIF at https://climatesciences.jpl.nasa.gov/siff/.

532 8 Author contributions

- RD and CF conceived this manuscript. TK prepared and provided the data and RD performed theanalysis. RD prepared the manuscript with contributions from all co-authors.
- analysis. RD prepared the manuscript with contributions from an co-at

535 9 Competing interests

536 The authors declare that they have no conflict of interest.

537 10 Acknowledgements

- 538 We thank Lan Dang for helping to process the GOSAT data, and Annmarie Eldering for helping coordinate
- 539 the publication of the SIF Lite files at the GES-DISC, and Yi Yin for publishing the GOSAT data on the
- 540 Caltech data repository. Part of this research was carried out at the Jet Propulsion Laboratory, California
- 541 Institute of Technology, under a contract with the National Aeronautics and Space Administration.
- 542 Reference herein to any specific commercial product, process or service by trade name, trademark,
- 543 <u>manufacturer or otherwise does not constitute or imply its endorsement by the United States Government</u>
- 544 or the Jet Propulsion Laboratory, California Institute of Technology.-

545 11 Financial support

546 This research was supported by NASA Making Earth System dData Records for Use in Research
547 Environments (MEaSUREs) Program (NNN12AA01C) and the NASA OCO Science Team
548 (80NSSC18K0895).



Figure 1. Annual 2020 and June 2020 Mean Daily SIF757 for GOSAT, OCO-2, and OCO-3. The annual
and monthly nadir-mode coverage of GOSAT, OCO-2, and OCO-3 is presented here as mean daily SIF at
757 nm (SIF757) at a gridded resolution of 0.5° for visualization. Included are soundings from all
measurement modes flagged as best and good quality and clear of clouds. At nadir, the diameter of the
GOSAT soundings is ~10 km, and the widths of the OCO-2 and OCO-3 swaths are about 10 km and 13
km, respectively. Thus, the data gaps shown here are larger than depicted and are not to scale.



These panels are zoom-ins of the contiguous United States from Figure 1.



Figure 3. Phase angle and SIF757 for an OCO-3 SAM mode scan over the Amazon Rainforest in Guyana.
OCO-3 SAMs are composed of several scans of a target whereby the eight-sounding wide segment is
offset adjacent to the previous scan. Each segment has a distinctive, small range of phase angles as seen in
(a). SIF has higher values at lower phase angles, which is apparent in (b) where the higher SIF values
occur for the soundings in the southwestern portion of the SAM where phase angles are lowest.

570 571



- 573 Figure 4. Absolute phase angle and SIF757 for an OCO-2 target mode scan over evergreen broadleaf
- forest in Manaus, Brazil. As this figure demonstrates, retrieved SIF values increase as the phase angle
- 575 <u>approaches 0 degrees.</u>



Figure 5. Relationships of SIF740 from OCO-2 and GOSAT using progressively conservative data filters and Deming regression. X-axis values are the mean of all OCO-2 soundings (~1.3 km ×by 2.25 km) that fall within the corresponding GOSAT sounding footprint (~10 km in diameter). Y-axis values represent the mean of SIF retrieved from P and S polarizations for a single GOSAT sounding. Six years of data (2015-2020) were used to identify soundings that overlapped on the same day. (a) Soundings flagged as 583 best quality and cloud free. (b) Same as (a) but filtered as being over vegetation using the IGBP flag in 584 the OCO-2 SIF Lite file. (c) Same as (b) but filtered for data that was acquired from GOSAT and OCO-2 585 within one hour of each other. (d) Same as (c) but with viewing zenith angles (VZA) < 5° for both 586 platforms. (e) Same as (d) but with number (N) of OCO-2 soundings within a GOSAT sounding being ≥ 587 10. (f) Same as (e) but with skin temperature \geq 5 °C. 588



Figure 6. Overlapping GOSAT and OCO-2 soundings near Quill Lakes, Saskatchewan, Canada. Orange
 circles are GOSAT sounding footprints (~10 km) and the white rhomboids are OCO-2 sounding

3 footprints (~1.3 km ×by 2.25 km) acquired on the same day as the GOSAT soundings in which they fall.

The GOSAT and OCO-2 soundings on the left were acquired in February 2019, and the soundings on the

95 right were acquired in July 2017. The base map is a Google Satellite image.



Figure 7. Relationships between instantaneous (top) and daily (bottom) SIF740, SIF757, and SIF771 from
GOSAT and OCO-2 using Deming regression. The soundings presented here were those presented in
main text Figure 5f, which were data that had the most conservative filter: best quality and cloud free,
vegetation, co-occurring within 1 hour, viewing zenith angle < 5°, number of OCO-2 soundings within a
GOSAT footprint ≥ 10, and skin temperature ≥ 5 °C.



607 Table 1. Level 2 GOSAT, OCO-2, and OCO-3 SIF Lite netCDF File Global Attributes, Dimensions,

 $\label{eq:constraint} 608 \qquad \text{and Variables. Units for SIF and continuum level radiance variables are $W/m^2/sr/\mu m$, geolocation variables}$

609 are in decimal degrees, angles are in degrees, and the units for the meteorological variables are in the table

β10 below-. For GOSAT, data is provided for both the P and S polarizations as a two2-dimensional array. *

- 611 denotes the variable or dimension is only applicable to OCO-2 and OCO-3, and ** denotes that the
- 612 dimension is only applicable to GOSAT. Note that there are different MeasurementMode and OrbitID
- 613 descriptions for GOSAT, and that some root-level variables are duplicated in the Geolocation and Science
- 614 group.

Global Attributes				
date_time_coverage	UTC time string of the first and last observation			
day_of_year_coverage	Same as date_time_coverage, but with day-of-year			
InputCollectionLabel	Collection label of the L2 data products used to create the file			
InputBuildID	Build ID of the L2 data products used to create the file			
InputPointers	String with names of all input products and auxiliary data used to create the file			
Dimensions (length of dimension)	Dimensions (length of dimension)			
sounding_dim (variable)	Number of soundings in the file			
footprint_dim (8) *	Number of OCO-2/3 across-track footprints			
vertex_dim (4) *	Number of footprint corner coordinates			
signalbin_dim (227)	Number of entries in the signal histogram arrays in the Offset group			
statistics_dim (2)	Array dimension in the Mean and Median SIF values of the Offset group; adjusted and unadjusted values			
polarization_dim (2) **	Array dimension of the polarization for GOSAT; P and S polarization			
Root Level Variables				
Daily_SIF_740nm	Daily Corrected Solar induced chlorophyll fluorescence at 740 nm: Daily_SIF_740nm = SIF_740 * /Science/daily_correction_factor			
Daily_SIF_757nm	Daily Corrected Solar induced chlorophyll fluorescence at 757 nm: Daily_SIF_757nm =/Science/sif_757nm * /Science/daily_correction_factor			
Daily_SIF_771nm	Daily Corrected Solar induced chlorophyll fluorescence at 771 nm: Daily_SIF_771nm =/Science/sif_771nm * /Science/daily_correction_factor			
Delta_Time	Timestamp (seconds since 1 January 1990)			
Latitude	Center latitude of the measurement			
Latitude_Corners *	Corner latitude of the measurement			
Longitude	Center longitude of the measurement			
Longitude_Corners *	Corner longitude of the measurement			
Quality_Flag	0 = best (passes quality control + cloud fraction = 0.0); 1 = good (passes quality control); 2 = bad (failed quality control); -1 = not investigated			

SAz	Azimuth angle between the solar direction as defined by the sounding location, and the sounding local north
SIF_740nm	Solar induced chlorophyll fluorescence at retrieved wavelength: SIF_740nm = 0.75 * (/Science/sif_757nm + 1.5*/Science/sif_771nm)
SIF_Uncertainty_740nm	
SZA	Solar zenith angle is the angle between the line of sight to the sun and the local vertical
VAz	Azimuth angle between line of sight and local north
VZA	Sensor zenith angle is the angle between the line of sight to the sensor and the local vertical
Variable/Group Name	Description
Cloud Group Variables	
cloud_flag_abp	Indicator of whether the sounding contained clouds: 0 - Classified clear, 1 - Classified cloudy, 2 - Not classified, all other values undefined; not used in SIF Lite processing
co2_ratio	Ratio of CO2 retrieved in weak and strong CO2 band (value near 1 indicate scattering free scene)
delta_pressure_abp	Retrieved-predicted surface pressure from ABO2, usable as cloud screener; not used in SIF Lite processing
o2_ratio	Ratio of retrieved and predicted O2 column
surface_albedo_abp	Surface albedo (Lambertian equivalent) as retrieved in the ABO2 preprocessor at 760nm; not used in SIF processing
Geolocation Group Variables	
altitude	Surface altitude of observed footprint
footprint_latitude_vertices *	Latitude corner coordinates of the sounding location
footprint_longtitude_vertices *	Longitude corner coordinates of the sounding location
latitude	Center latitude of the measurement
longitude	Center longitude of the measurement
sensor_azimuth_angle	Azimuth angle between line of sight and local north
sensor_zenith_angle	Sensor zenith angle is the angle between the line of sight to the sensor and the local vertical
solar_azimuth_angle	Azimuth angle between the solar direction as defined by the sounding location, and the sounding local north
solar_zenith_angle	Solar zenith angle is the angle between the line of sight to the sun and the local vertical
time_tai93	Timestamp (seconds since 1 January 1993)
Metadata Group Variables	
BuildID	The ID of the Build, including the software version that created this product
CollectionLabel	The Collection Label of the Build, including the software version that created this product

FootprintID *	OCO-2 footprint identifier (1-8), identifying the 8 independent OCO-2 spatial samples per frame
	OCO-2/3: Instrument Measurement Mode, 0=Nadir, 1=Glint, 2=Target, 3=AreaMap, 4=Transition; users might consider separating these for analysis
MeasurementMode	GOSAT: Instrument Measurement Mode, 0=OB1D (FTS obs. mode I, sunlit), 1=OB2D (FTS obs mode II, sunlit), 2=SPOD (FTS specific obs. mode, sunlit); users might consider separating these for analysis
OrbitID	Orbit Identifier: Start Orbit Number (OCO-2) or Start Solar Day (OCO-3) of observation
	GOSAT: Orbit Identification String (\"NominalDay OrbitOfDay StartPathNumber-StopPathNumber\")"
SoundingID	Unique Identifier for each sounding
Meteo (Meteorological) Group V	ariables
specific_humidity	Specific humidity at surface layer at the sounding location, interpolated from GEOS- 5 FP-IT inst3_3d_asm_Nv field QV (specific_humidity); kg/kg
surface_pressure	Surface pressure at the sounding location; interpolated from GEOS-5 FP-IT inst3_3d_asm_Nv field PS (surface_pressure); Pa
temperature_skin	Skin temperature at the sounding location; interpolated from GEOS-5 FP-IT inst3_2d_asm_Nx field TS (surface_skin_temperature); K
temperature_two_meter	Two-meter temperature at the sounding location; interpolated from GEOS-5 FP-IT inst3_2d_asm_Nx field T2M (2-meter_air_temperature); K
vapor_pressure_deficit	Vapor pressure deficit at the sounding location (2m) (ECMWF forecast); Pa
wind_speed	Surface wind speed at sounding location; interpolated from GEOS-5 FP-IT inst3_2d_asm_Nx field U10M and inst3_2d_asm_Nx field V10M (10- meter_eastward_wind, 10-meter_northward_wind); m/s
Offset Group Variables	
SIF_Mean_757nm	Mean Solar Induced Fluorescence at 757nm (by footprint, for adjusted and unadjusted values)
SIF_Mean_771nm	Mean Solar Induced Fluorescence at 771nm (by footprint, for adjusted and unadjusted values)
SIF_Median_757nm	Median Solar Induced Fluorescence at 757nm (by footprint, for adjusted and unadjusted values)
SIF_Median_771nm	Median Solar Induced Fluorescence at 771nm (by footprint, for adjusted and unadjusted values)
SIF_Relative_Mean_757nm	Mean relative Solar Induced Fluorescence at 757nm (by footprint, for adjusted and unadjusted values)
SIF_Relative_Mean_771nm	Mean relative Solar Induced Fluorescence at 771nm (by footprint, for adjusted and unadjusted values)
SIF_Relative_Median_757nm	Median relative Solar Induced Fluorescence at 757nm (by footprint, for adjusted and unadjusted values)
SIF_Relative_Median_771nm	Median relative Solar Induced Fluorescence at 771nm (by footprint, for adjusted and unadjusted values)

SIF_Relative_SDev_757nm	Standard deviation of relative Solar Induced Fluorescence at 757nm (by footprint adjusted and unadjusted values)	t, for
SIF_Relative_SDev_771nm	Standard deviation of relative Solar Induced Fluorescence at 771nm (by footprint adjusted and unadjusted values)	t, for
signal_histogram_757nm	Signal level histogram for 757 nm radiances	
signal_histogram_771nm	Signal level histogram for 771 nm radiances	
signal_histogram_bins	Radiance level offset histogram bins	
Science Group Variables		
continuum_radiance_757nm	Continuum Level Radiance at 757 nm	
continuum_radiance_771nm	Continuum Level Radiance at 771 nm	
daily_correction_factor	Correction factor to estimate daily average SIF from instantaneous SIF (using geometric incoming light scaling)	pure
IGBP_index *	IGBP Index	
SIF_757nm	Offset-Adjusted Solar Induced Chlorophyll Fluorescence at 757nm	
SIF_771nm	Offset-Adjusted Solar Induced Chlorophyll Fluorescence at 771nm	
SIF_Relative_757nm	Relative Solar Induced Fluorescence at 757 nm	
SIF_Relative_771nm	Relative Solar Induced Fluorescence at 771 nm	
SIF_Unadjusted_757nm	Solar Induced Chlorophyll Fluorescence at 757nm, no offset adjustment	
SIF_Unadjusted_771nm	Solar Induced Chlorophyll Fluorescence at 771nm, no offset adjustment	
SIF_Unadjusted_Relative_757nm	Solar Induced Chlorophyll Fluorescence at 757nm in fractions of continuum leve offset adjustment	l, no
SIF_Unadjusted_Relative_771nm	Solar Induced Chlorophyll Fluorescence at 771nm in fractions of continuum leve offset adjustment	l, no
SIF_Uncertainty_757nm	One-Sigma Statistical Uncertainty in Solar Induced Chlorophyll Fluorescenc 757nm	e at
SIF_Uncertainty_771nm	One-Sigma Statistical Uncertainty in Solar Induced Chlorophyll Fluorescence 771nm	e at
sounding_land_fraction	Percentage of land surface type within the sounding	
sounding_qual_flag	Sounding Quality Flag: 0 = good, 1 = bad	

616 Table 2. Criterion of quality flags *best* and *good* for the Level 2 GOSAT, OCO-2, and OCO-3 data.

617 Soundings that do not meet either set of criteria are flagged as *failed* (2).

Quality_Flag = 0 (<i>best</i>)		Quality_Flag = 1 (good)		
	28 ≤ continuum radiance @757nm ≤ 195	28 ≤ continuum radiance @757nm ≤ 1	.95	
	[W/m ² /sr/µm]	[W/m ² /sr/µm]		
	$\chi^2 @ 757nm \le 2.0$	$\chi^2 @ 757nm \le 3.0$		
	$\chi^2 @ 771nm \le 2.0$	$\chi^2 @ 771nm \le 3.0$		

$0.85 \leq O_2 \text{ ratio} \leq 1.5$	$0.85 \leq O_2 \text{ ratio} \leq 1.5$
$0.5 \leq CO_2 \text{ ratio} \leq 4.0$	$0.5 \leq CO_2 \text{ ratio} \leq 4.0$
$\theta_{sun} \leq 80^{\circ} \text{ for GOSAT; } \theta_{sun} \leq 70^{\circ} \text{ for OCO-2/3}$	$\theta_{sun} \le 80^{\circ} \text{ for GOSAT; } \theta_{sun} \le 70^{\circ} \text{ for } 0C0-2/3$
Land Fraction = 100%	Land Fraction ≥ 80%

619

620 References

- 621 Braghiere, R. K., Wang, Y., Doughty, R., Sousa, D., Magney, T., Widlowski, J.-L., Longo, M.,
- 622 Bloom, A. A., Worden, J., and Gentine, P.: Accounting for canopy structure improves
- hyperspectral radiative transfer and sun-induced chlorophyll fluorescence representations in a
 new generation Earth System model, 261, 112497, 2021.
- 625 Crisp, D., Pollock, H. R., Rosenberg, R., Chapsky, L., Lee, R. A., Oyafuso, F. A., Frankenberg,
- 626 C., O'Dell, C. W., Bruegge, C. J., and Doran, G. B.: The on-orbit performance of the Orbiting
- 627 Carbon Observatory-2 (OCO-2) instrument and its radiometrically calibrated products, 10, 59– 628 81, 2017.
- 629 Dechant, B., Ryu, Y., Badgley, G., Zeng, Y., Berry, J. A., Zhang, Y., Goulas, Y., Li, Z., Zhang,

630 Q., and Kang, M.: Canopy structure explains the relationship between photosynthesis and sun-631 induced chlorophyll fluorescence in crops, 2019.

Boughty, R., Köhler, P., Frankenberg, C., Magney, T. S., Xiao, X., Qin, Y., Wu, X., and Moore,
 B.: TROPOMI reveals dry-season increase of solar-induced chlorophyll fluorescence in the

- 633 B.: TROPOMI reveals dry-season inc 634 Amazon forest, 201908157, 2019.
- Doughty, R., Xiao, X., Köhler, P., Frankenberg, C., Qin, Y., Wu, X., Ma, S., and Moore III, B.:
- Global-scale consistency of spaceborne vegetation indices, chlorophyll fluorescence, and
- 637 photosynthesis, e2020JG006136, 2021.
- 638 Drusch, M., Moreno, J., Del Bello, U., Franco, R., Goulas, Y., Huth, A., Kraft, S., Middleton, E.
- 639 M., Miglietta, F., and Mohammed, G.: The fluorescence explorer mission concept—ESA's earth 640 explorer 8, 55, 1273–1284, 2016.
- 641 Eldering, A., Taylor, T. E., O'Dell, C. W., and Pavlick, R.: The OCO-3 mission: measurement
- objectives and expected performance based on 1 year of simulated data., 12, 2019.
- 643 Frankenberg, C., Butz, A., and Toon, G. C.: Disentangling chlorophyll fluorescence from
- atmospheric scattering effects in O2 A-band spectra of reflected sun-light, 38, 2011a.
- Frankenberg, C., Fisher, J. B., Worden, J., Badgley, G., Saatchi, S. S., Lee, J.-E., Toon, G. C.,
- 646 Butz, A., Jung, M., and Kuze, A.: New global observations of the terrestrial carbon cycle from
- 647 GOSAT: Patterns of plant fluorescence with gross primary productivity, 38, 2011b.
- Frankenberg, C., O'Dell, C., Berry, J., Guanter, L., Joiner, J., Köhler, P., Pollock, R., and Taylor,
- T. E.: Prospects for chlorophyll fluorescence remote sensing from the Orbiting Carbon Observatory-2, 147, 1–12, 2014.
- Frankenberg, C., Köhler, P., Magney, T. S., Geier, S., Lawson, P., Schwochert, M., McDuffie, J.,
- 652 Drewry, D. T., Pavlick, R., and Kuhnert, A.: The Chlorophyll Fluorescence Imaging
- 653 Spectrometer (CFIS), mapping far red fluorescence from aircraft, 217, 523–536, 2018.
- 654 Friedl, M. and Sulla-Menashe, D.: MCD12Q1 MODIS/Terra+ aqua land cover type yearly L3
- 655 global 500m SIN grid V006 [data set], 10, 2019.
- 656 Genty, B., Briantais, J.-M., and Baker, N. R.: The relationship between the quantum yield of
- 657 photosynthetic electron transport and quenching of chlorophyll fluorescence, 990, 87–92, 1989.
- Gu, L., Han, J., Wood, J. D., Chang, C. Y.-Y., and Sun, Y.: Sun-induced Chl fluorescence and

- 659 its importance for biophysical modeling of photosynthesis based on light reactions, 223, 1179-660 1191 2019
- 661 Guanter, L., Alonso, L., Gómez-Chova, L., Amorós-López, J., Vila, J., and Moreno, J.:
- 662 Estimation of solar-induced vegetation fluorescence from space measurements, 34, 2007.
- Helm, L. T., Shi, H., Lerdau, M. T., and Yang, X.: Solar-induced chlorophyll fluorescence and 663
- short-term photosynthetic response to drought, 30, e02101, 2020. 664
- Joiner, J., Yoshida, Y., Vasilkov, A. P., and Middleton, E. M.: First observations of global and 665 seasonal terrestrial chlorophyll fluorescence from space, 8, 637-651, 2011. 666
- 667 Joiner, J., Guanter, L., Lindstrot, R., Voigt, M., Vasilkov, A. P., Middleton, E. M., Huemmrich, K.
- 668 F., Yoshida, Y., and Frankenberg, C.: Global monitoring of terrestrial chlorophyll fluorescence
- 669 from moderate-spectral-resolution near-infrared satellite measurements: methodology,
- simulations, and application to GOME-2, 6, 2803-2823, 2013. 670
- 671 Joiner, J., Yoshida, Y., Köehler, P., Campbell, P., Frankenberg, C., van der Tol, C., Yang, P.,
- 672 Parazoo, N., Guanter, L., and Sun, Y.: Systematic Orbital Geometry-Dependent Variations in
- Satellite Solar-Induced Fluorescence (SIF) Retrievals, Remote Sensing, 12, 2346, 2020. 673
- 674 Köhler, P., Frankenberg, C., Magney, T. S., Guanter, L., Joiner, J., and Landgraf, J.: Global retrievals of solar induced chlorophyll fluorescence with TROPOMI: first results and inter-sensor 675
- 676 comparison to OCO-2, 2018.
- Kuze, A., Suto, H., Nakajima, M., and Hamazaki, T.: Thermal and near infrared sensor for 677
- 678 carbon observation Fourier-transform spectrometer on the Greenhouse Gases Observing 679 Satellite for greenhouse gases monitoring, 48, 6716-6733, 2009.
- Lucchesi, R.: File Specification for GEOS-5 FP-IT. GMAO Office Note No. 2 (Version 1.3), 2015. 680 681 Magney, T. S., Frankenberg, C., Köhler, P., North, G., Davis, T. S., Dold, C., Dutta, D., Fisher,
- 682 J. B., Grossmann, K., and Harrington, A.: Disentangling changes in the spectral shape of 683 chlorophyll fluorescence: Implications for remote sensing of photosynthesis, 124, 1491–1507,
- 684 2019
- Magney, T. S., Barnes, M. L., and Yang, X.: On the covariation of chlorophyll fluorescence and 685 686 photosynthesis across scales, 47, e2020GL091098, 2020.
- 687 Marrs, J. K., Reblin, J. S., Logan, B. A., Allen, D. W., Reinmann, A. B., Bombard, D. M.,
- 688 Tabachnik, D., and Hutyra, L. R.: Solar-Induced Fluorescence Does Not Track Photosynthetic
- 689 Carbon Assimilation Following Induced Stomatal Closure, 47, e2020GL087956, 2020.
- 690 Maxwell, K. and Johnson, G. N.: Chlorophyll fluorescence-a practical guide, 51, 659-668, 691 2000
- 692 Miao, G., Guan, K., Yang, X., Bernacchi, C. J., Berry, J. A., DeLucia, E. H., Wu, J., Moore, C.
- E., Meacham, K., and Cai, Y.: Sun-induced chlorophyll fluorescence, photosynthesis, and light 693 use efficiency of a soybean field from seasonally continuous measurements, 123, 610-623, 694
- 695 2018.
- 696 Mohammed, G. H., Colombo, R., Middleton, E. M., Rascher, U., van der Tol, C., Nedbal, L.,
- 697 Goulas, Y., Pérez-Priego, O., Damm, A., and Meroni, M.: Remote sensing of solar-induced chlorophyll fluorescence (SIF) in vegetation: 50 years of progress, 231, 111177, 2019. 698
- 699
- Moore, B., Crowell, S., Rayner, P., Kumer, J., O'Dell, C., O'Brien, D., Utembe, S., Polonsky, I.,
- Schimel, D., and Lemen, J.: The potential of the geostationary carbon cycle observatory 700
- 701 (GeoCarb) to provide multi-scale constraints on the carbon cycle in the Americas, 6, 109, 2018. 702 Müller, N. J. C.: Beziehungen zwischen assimilation, absorption und fluoreszenz im chlorophyll des lebenden blattes, 9, 42-49, 1874. 703
- 704 OCO-2 Science Team, Gunson, M., and Eldering, A.: OCO-2 Level 2 bias-corrected solar-
- 705 induced fluorescence and other select fields from the IMAP-DOAS algorithm aggregated as
- daily files, Retrospective processing VEarlyR, https://doi.org/10.5067/XO2LBBNPO010, 2020. 706
- 707 OCO-3 Science Team, Gunson, M., and Eldering, A.: OCO-3 Level 2 bias-corrected solar-
- 708 induced fluorescence and other select fields from the IMAP-DOAS algorithm aggregated as
- 709 daily files, Retrospective processing VEarlyR,

- 710 https://disc.gsfc.nasa.gov/datacollection/OCO3 L2 Lite SIF EarlyR.html, 2020.
- 711 Parazoo, N. C., Frankenberg, C., Köhler, P., Joiner, J., Yoshida, Y., Magney, T., Sun, Y., and
- 712 Yadav, V.: Towards a harmonized long-term spaceborne record of far-red solar-induced
- 713 fluorescence, 124, 2518–2539, 2019.
- Plascyk, J. A.: The MK II Fraunhofer line discriminator (FLD-II) for airborne and orbital remote
 sensing of solar-stimulated luminescence, 14, 144339, 1975.
- 716 Polonsky, I. N., O'Brien, D. M., Kumer, J. B., and O'Dell, C. W.: Performance of a geostationary
- 717 mission, geoCARB, to measure CO 2, CH 4 and CO column-averaged concentrations, 7, 959– 718 981, 2014.
- 719 Porcar-Castell, A., Tyystjärvi, E., Atherton, J., Van der Tol, C., Flexas, J., Pfündel, E. E.,
- 720 Moreno, J., Frankenberg, C., and Berry, J. A.: Linking chlorophyll a fluorescence to
- photosynthesis for remote sensing applications: mechanisms and challenges, 65, 4065–4095,2014.
- 723 Schreiber, U., Schliwa, U., and Bilger, W.: Continuous recording of photochemical and non-
- photochemical chlorophyll fluorescence quenching with a new type of modulation fluorometer,
 10, 51–62, 1986.
- 726 Sun, Y., Frankenberg, C., Wood, J. D., Schimel, D. S., Jung, M., Guanter, L., Drewry, D. T.,
- 727 Verma, M., Porcar-Castell, A., and Griffis, T. J.: OCO-2 advances photosynthesis observation 728 from space via solar-induced chlorophyll fluorescence, 358, eaam5747, 2017.
- 729 Sun, Y., Frankenberg, C., Jung, M., Joiner, J., Guanter, L., Köhler, P., and Magney, T.:
- 730 Overview of Solar-Induced chlorophyll Fluorescence (SIF) from the Orbiting Carbon
- 731 Observatory-2: Retrieval, cross-mission comparison, and global monitoring for GPP, 209, 808– 732 823, 2018.
- 733 Taylor, T. E., Eldering, A., Merrelli, A., Kiel, M., Somkuti, P., Cheng, C., Rosenberg, R., Fisher,
- B., Crisp, D., and Basilio, R.: OCO-3 early mission operations and initial (vEarly) XCO2 and SIF
 retrievals, 251, 112032, 2020.
- 736 Verma, M., Schimel, D., Evans, B., Frankenberg, C., Beringer, J., Drewry, D. T., Magney, T.,
- 737 Marang, I., Hutley, L., and Moore, C.: Effect of environmental conditions on the relationship
- between solar-induced fluorescence and gross primary productivity at an OzFlux grassland site,
 122. 716–733. 2017.
- 740 Xiao, X., Hollinger, D., Aber, J., Goltz, M., Davidson, E. A., Zhang, Q., and Moore, B.: Satellite-
- based modeling of gross primary production in an evergreen needleleaf forest, 89, 519–534,
 2004.
- 743 Yang, K., Ryu, Y., Dechant, B., Berry, J. A., Hwang, Y., Jiang, C., Kang, M., Kim, J., Kimm, H.,
- and Kornfeld, A.: Sun-induced chlorophyll fluorescence is more strongly related to absorbed
- light than to photosynthesis at half-hourly resolution in a rice paddy, 216, 658–673, 2018.
 Yang, X., Tang, J., Mustard, J. F., Lee, J.-E., Rossini, M., Joiner, J., Munger, J. W., Kornfeld, A
- Yang, X., Tang, J., Mustard, J. F., Lee, J.-E., Rossini, M., Joiner, J., Munger, J. W., Kornfeld, A.,
 and Richardson, A. D.: Solar-induced chlorophyll fluorescence that correlates with canopy
- photosynthesis on diurnal and seasonal scales in a temperate deciduous forest, 42, 2977–2987,
- 749 2015.
- 750 Zhang, Y., Xiao, X., Wu, X., Zhou, S., Zhang, G., Qin, Y., and Dong, J.: A global moderate
- resolution dataset of gross primary production of vegetation for 2000–2016, 4, 170165, 2017.