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# **SIF and Vegetation Indices in the US Midwestern Agroecosystems, 2016-2021**

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Documentation Revision Date: 2023-03-17

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### **Summary**

This dataset contains half-hourly ground solar-induced chlorophyll fluorescence (SIF) and vegetation indices including NDVI, EVI, Red edge chlorophyll index, green chlorophyll index, and photochemical reflectance index at seven crop sites in Nebraska and Illinois for the period 2016-2021. Four sites were located at Eddy Covariance (EC) tower sites (sites US-Ne2, US-Ne3, US-UiB, and US-UiC), and three sites were located on private farms (sites Reifsteck, Rund, and Reinhart). The sites were either miscanthus, corn-soybean rotation or corn-corn-soybean rotation. The spectral data for SIF retrieval and hyperspectral reflectance for vegetation index calculation were collected by the FluoSpec2 system, installed near planting, and uninstalled after harvest to collect whole growing-season data. Raw nadir SIF at 760 nm from different algorithms (sFLD, 3FLD, iFLD, SFM) are included. SFM\_nonlinear and SFM\_linear represent the Spectral fitting method (SFM) with the assumption that fluorescence and reflectance change with wavelength non-linearly and linearly, respectively. Additional data include two SIF correction factors including calibration coefficient adjustment factor (f\_cal\_corr\_QEPRO) and upscaling nadir SIF to eddy covariance footprint factor (ratio\_EC footprint, SIF pixel), and measured FPAR from quantum sensors and Rededge NDVI calculated FPAR. The data are provided in comma-separated values (CSV) format.

There is one data file in comma-separated values format (.csv) with this dataset.



Figure 1. Field sites for ground measurements of solar-induced fluorescence with examples of FluoSpec2 systems.

### **Citation**

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### <span id="page-1-0"></span>**1. Dataset Overview**

This dataset contains half-hourly ground solar-induced chlorophyll fluorescence (SIF) and vegetation indices including NDVI, EVI, Red edge chlorophyll index, green chlorophyll index, and photochemical reflectance index at seven crop sites in Nebraska and Illinois for the period 2016-2021. Four sites were located at Eddy Covariance (EC) tower sites (sites US-Ne2, US-Ne3, US-UiB, and US-UiC), and three sites were located on private farms (sites Reifsteck, Rund, and Reinhart). The sites were either miscanthus, corn-soybean rotation or corn-corn-soybean rotation. The spectral data for SIF retrieval and hyperspectral reflectance for vegetation index calculation were collected by the FluoSpec2 system, installed near planting, and uninstalled after harvest to collect whole growing-season data. Raw nadir SIF at 760 nm from different algorithms (sFLD, 3FLD, iFLD, SFM) are included. SFM\_nonlinear and SFM\_linear represent the Spectral fitting method (SFM) with the assumption that fluorescence and reflectance change with wavelength non-linearly and linearly, respectively. Additional data include two SIF correction factors including calibration coefficient adjustment factor (f\_cal\_corr\_QEPRO) and upscaling nadir SIF to eddy covariance footprint factor (ratio\_EC footprint, SIF pixel), and measured FPAR from quantum sensors and Rededge NDVI calculated FPAR.

### **Project:** Carbon [Monitoring](https://daac.ornl.gov/cgi-bin/dataset_lister.pl?p=33) System

The NASA Carbon Monitoring System (CMS) program is designed to make significant contributions in characterizing, quantifying, understanding, and predicting the evolution of global carbon sources and sinks through improved monitoring of carbon stocks and fluxes. The System uses NASA satellite observations and modeling/analysis capabilities to establish the accuracy, quantitative uncertainties, and utility of products for supporting national and international policy, regulatory, and management activities. CMS data products are designed to inform near-term policy development and planning.

### **Related Publication**

Wu, G., K. Guan, H. Kimm, G. Miao, X. Yang, and C. Jiang. 2022. Ground solar-induced chlorophyll fluorescence and vegetation indices in the U.S. Midwestern Agroecosystems. In Process.

### **Acknowledgements**

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### <span id="page-1-1"></span>**2. Data Characteristics**

**Spatial Coverage:** Illinois and Nebraska, US

**Spatial Resolution:** Point

**Temporal Coverage:** 2016-08-07 to 2021-09-18

**Temporal Resolution:** Half-hourly

**Study Area:** Latitude and longitude are given in decimal degrees



### **Data File Details**

There is one data file in comma-separated values format (.csv) with this dataset: **SIF\_VegIndices\_Illinois\_Nebraska\_Halfhour.csv**

**Table 1.** Variables in the data file.





## <span id="page-2-0"></span>**3. Application and Derivation**

These long-term ground SIF and vegetation indices are important for satellite SIF validation, mechanistic interpretations of canopy SIF signals and understanding of the relationship between SIF and photosynthesis when combined with leaf- and canopy-level auxiliary measurements.

## <span id="page-2-1"></span>**4. Quality Assessment**

Estimate of Uncertainty: The uncertainty of half-hourly canopy SIF760 is estimated as the standard error of 5-min SIF760 within the half hour.

## <span id="page-2-2"></span>**5. Data Acquisition, Materials, and Methods**

**Study sites**

The FluoSpec2 system was installed at seven sites (refer to Figure 1) in the US Corn Belt near planting and uninstalled after harvest to collect whole growing-season data. Two of the sites are in Lincoln, Nebraska (US-Ne2 and US-Ne3), and the other five sites are in Champaign, Illinois (US-UiB, US-UiC, Reifsteck, Rund, and Reinhart). For examples of the field set-up, refer to Figure 2. Except for US-UiB where miscanthus emerged each year after the establishment in 2010, other sites were either corn-soybean rotation or corn-corn-soybean rotation. US-Ne2 was an irrigated site while other sites were rain-fed. Fertilizers were applied for corn and miscanthus at all the sites. US-Ne2, US-Ne3, US-UiB, and US-UiC are registered on the AmeriFlux site [\(https://ameriflux.lbl.gov/](https://ameriflux.lbl.gov/)), where eddy covariance and meteorological data can be freely downloaded. Reifsteck, Rund, and Reinhart sites are on private farms.

**Table 2.** Information of the seven field sites deployed with Fluospec2 systems.



#### **Spectral system description**

FluoSpec2 is a directional-hemispherical system designed by Yang et al. (2018) and was used for spectral data collection (Figure 2). It consists of two paths, with each path equipped with one spectrometer, one splitting fiber, one inline shutter, and two fibers for downwelling irradiance and upwelling radiance collection, respectively. The data collected by the two paths were used for SIF retrieval and vegetation indices estimation, respectively. For SIF data collection, the spectrometer, QEPRO, covered wavelengths from 730 –780 nm with a Full Width Half Maximum (FWHM) of 0.15 nm. For vegetation indices, the HR2000+ spectrometer with a wavelength coverage of 350 – 1100 nm and FWHM 1.1 nm were used (Ocean Optics). One cosine corrector (CC3, Ocean Optics) was attached to the irradiance fiber to achieve a FOV of 180° while a bare fiber with a FOV of 25° was installed as the nadir for canopy radiance collection. Two spectrometers were connected to a laptop to conduct automatic data collection. The spectral system (with the exception of the fibers), was placed in an enclosure with temperature controlled by an air conditioner. The target temperature was set to 25 °C. A temperature and humidity sensor (THC-4) was used to monitor the change in temperature and humidity continuously. Desiccant bags were added into the enclosure periodically to ensure the relative humidity was below 70%.



Figure 2. Schematic layout and deployment of FluoSpec2. (a) Schematic diagram of a FluoSpec2 system; (b) Conceptual field deployment of a FluoSpec2 system. FOV: field of view.

#### **Data Collection**

FluoSpec Manager, a software written in Visual Basic with libraries provided by Ocean Optics was installed on the laptop to control the automatic irradiance and radiance data collection at 5-min intervals (Yang et al., 2018). The integrating time for each spectrum was optimized by the algorithm in FluoSpec Manager with the target maximum digital number (DN) 120000 for QEPRO and 12000 for HR2000+, respectively. For each 5-min interval, data were collected in the following sequence: 150 HR2000+ irradiance – HR2000+ radiance – HR2000+ irradiance – QEPRO irradiance – QEPRO radiance – QEPRO irradiance. The dark current for QEPRO was collected after each observation with the same integrating time as the observation through controlling the internal shutter of QEPRO. For HR2000+, the dark signal was collected using OceanView (Ocean Optics) under various integrating times, and the dark signal with a similar integrating time as the observation was used to match with each observation. From 2016 to 2021, a total of 15 site-years data were collected with eight site-years for corn, five site-years for soybeans, and two site-years for miscanthus. For each site-year, corn and soybean were planted during April or May and harvested in September or October. Miscanthus emerged in March and was harvested in the following year in February or March. At each site-year, the FluoSpec2 system was installed close to the eddy covariance (EC) tower to integrate with EC flux measurements.

#### **Data process and analysis**

Collected solar irradiance and canopy radiance data from QEPRO and HR2000+ were used for SIF retrieval and VIs estimation, respectively. At each site year, different SIF retrieval algorithms were first used to derive raw SIF at 760 nm (SIF760). Radiometric calibration coefficients were then adjusted to account for the calibrating light source degradation across years. Calibration-corrected SIF760 was finally upscaled to match the EC footprint. Different vegetation indices were estimated from the visible to near-infrared band reflectance calculated from HR2000+ irradiance and radiance. The Simple Analytical Footprint model on Eulerian coordinates (SAFE) developed by Chen et al. (2009) was used to calculate the EC footprint weights. This upscaling was not conducted at the US-UiC 2016 soybean and US-Ne3 2019 corn sites due to the unavailability of PlanetScope data in 2016 and the missing inputs for the EC footprint models at the US-Ne3 2019 corn site.



Figure 3. Flow chart of data processing at each site-year. sFLD: standard Fraunhofer line depth; 3FLD: three-band Fraunhofer line depth; iFLD: improved Fraunhofer line depth; SFM-nonlinear: spectral fitting method with the assumption of non-linear variation of fluorescence and reflectance over the absorption band; SFM-linear: spectral fitting method with the assumption of linear variation of fluorescence and reflectance over the absorption band; fcalcorr-QEPRO: the calibration adjustment factor for SIF; EC: eddy covariance; the ratio between EC footprint weighted vegetation index and SIF tower located pixel vegetation index.

#### **SIF retrieval methods**

SIF adds a weak signal to the reflected solar radiation, which results in two contributions to the upwelling radiance (L). Most retrieval algorithms for ground SIF are based on the Fraunhofer line depth (FLD) principle and the spectral fitting method (SFM). FLD approaches exploit the reduced downwelling irradiance (E) inside the oxygen absorption bands (O<sub>2</sub>A and O<sub>2</sub>B) reaching the surface, which result in an increase in the relative contribution of SIF to L. Several FLD methods are commonly used in ground SIF retrieval, including standard FLD (sFLD), three bands FLD (3FLD), and improved FLD (iFLD). All of them rely on the measurements of E and L inside and outside the absorption window ( $\lambda_{in}$  and  $\lambda_{out}$ ). This study specifically focused on the O <sub>2</sub>A absorption window (760 nm) considering the wavelength coverage of QEPRO. The upwelling radiance inside and outside the O<sub>2</sub>A band (L( $\lambda_{\text{in}}$ ), L( $\lambda_{\text{out}}$ )) is a function of reflectance  $(R(\lambda_{\text{in}}), R(\lambda_{\text{out}}))$ , irradiance  $(E(\lambda_{\text{in}}), E(\lambda_{\text{out}}))$  and SIF (SIF( $\lambda_{\text{in}}$ ), SIF( $\lambda_{\text{out}}$ )) inside and outside the absorption band, respectively.

Different from FLD-based approaches, the SFM method aims to decouple SIF and reflectance from radiance observations through general mathematical representations of canopy SIF and R within the narrow absorption windows centered at 760 nm. The parameterization of functions for SIF and R is optimized by the least-square optimization process with observed radiance as a reference. Both linear and non-linear functions can be used to represent SIF and R. In this study, both the linear method which assumes that SIF and R both linearly change with wavelength (Miao et al., 2018), and the nonlinear method for which a Gaussian function is used to SIF and a cubic spline function is used to model R (Cendrero-Mateo et al., 2019) were used.

#### **Radiometric calibration coefficient adjustment for SIF**

To account for the degradation of the light source used for irradiance calibration, a cross-calibration method was used to adjust the change of radiometric calibration coefficients across years. Signal degradation would affect the estimation of SIF since SIF is an absolute light signal, while it does not affect the calculation of vegetation indices since these indices are derived from reflectance which is a ratio. To adjust for the degradation effect, for each site- year, the PAR from HR2000+ was first calculated by integrating the irradiance from 400 to 700 nm, then HR2000+-based PAR was compared with a LiCor quantum sensor that was well calibrated and obtained a correction factor. Second, the near-infrared irradiance from 730 to 780 nm was compared between QEPRO and HR2000+, from which a second corrector factor was obtained. Last, the product of the first correction factor and the second correction factor was used as the final radiometric calibration coefficient adjustment factor for QEPRO.

#### **Footprint upscaling for in-situ nadir SIF to match GPP footprint**

PlanetScope satellite provides the surface reflectance at daily timestamp with 3-m spatial resolution (Houborg and McCabe, 2016), from which daily NIRv was calculated and used for upscaling SIF to EC footprint. To further reduce the soil background impact on NIRv, soil adjusted NIRv (SANIRv) was calculated following the method in (Jiang et al., 2020) and used for SIF footprint upscaling. EC footprint models were run at half-hourly timestamps to obtain the footprint weights (w<sub>i</sub>) of each 3-m × 3-m pixel within 2 km × 2 km centered at the EC tower. SIF tower location was represented by one 3-m × 3m pixel. The Simple Analytical Footprint model on Eulerian coordinates (SAFE, Chen et al., 2009) was used to calculate the EC footprint weights. This upscaling is not conducted at the US-UiC 2016 soybean and US-Ne3 2019 corn sites due to the unavailability of PlanetScope data in 2016 and the missing inputs for the EC footprint models at the US-Ne3 2019 corn site.

### **Vegetation indices estimation and SIF decomposition analysis**

Several commonly used vegetation indices including NDVI, EVI, NIRv, CIrededge, CIgreen and PRI were estimated from the hyperspectral reflectance collected by HR2000+. The reflectance beyond 800 nm was noisy, therefore, reflectance from 770 to 780 nm was used as the near-infrared reflectance. The enclosure temperatures at some site-years were not well controlled at 25°C due to the high summer temperatures at the sites (air temperature up to 35°C); therefore, the SIF retrievals were specifically compared under different enclosure temperatures. Four representative site-years were selected to cover the four species as well as different enclosure temperature ranges: US-UiC 2017 corn, US-UiC 2018 Corn, US-Ne3 2018 soy, and US-UiB 2019 Mis.

fPAR at most of the site-years were derived from in-situ PAR measurements, except US-UiC 2016 soybean, US-UiC 2017 corn and US-UiC 2018 corn. Specifically, incoming PAR (PAR<sub>in</sub>) and surface reflected PAR (PAR <sub>out</sub>) were measured by point quantum sensors (LI-190; LICOR Bioscience, NE, USA). Transmitted PAR (PAR<sub>trans</sub>) was measured by line quantum sensors (LI-191; LICOR Bioscience) placed about 2 cm above the ground. For US-Ne2 and

US-Ne3, PAR reflected by soil (PAR<sub>soil</sub>) was measured by line quantum sensors facing downward. For the three site-years without PAR trans measurements, fPAR was estimated by the red edge normalized difference vegetation index (Rededge NDVI) (Miao et al., 2018; Viña and Gitelson, 2005; Yang et al., 2021). This method for fPAR calculation was not applied at the miscanthus site since it was developed for corn and soybean. Except for US-Ne3 2019 corn where fPAR<sub>Meas</sub> and APAR<sub>Meas</sub> were estimated at an hourly scale due to the missing raw data, fPAR and APAR at other site-years were at a half-hourly scale.

Refer to Wu et al. (2022, In Process) for additional details.

### <span id="page-4-0"></span>**6. Data Access**

These data are available through the Oak Ridge National Laboratory (ORNL) Distributed Active Archive Center (DAAC).

Contact for Data Center Access Information:

- E-mail: [uso@daac.ornl.gov](mailto:uso@daac.ornl.gov)
- Telephone: +1 (865) 241-3952

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