



# SpaFLEX: Evaluation of Systematic and Random Uncertainties in Sun-Induced Chlorophyll Fluorescence and Reflected Radiance Retrievals in the Framework of the Spanish FLEX Cal/Val Campaigns

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## SpaFLEX

### FLEX Mission and SpaFLEX Project

ESA's FLEX (Fluorescence Explorer) mission will provide global data on vegetation photosynthetic activity by retrieving sun-induced chlorophyll fluorescence (SIF) and surface reflectance from space.



To ensure the reliability of these Level-2 products, the SpaFLEX project supports ESA's calibration and validation (Cal/Val) requirements through:

- The development of **test sites in Spain**
- Instrument characterization (ground, UAV, and airborne)
- Fiducial reference measurements
- Ground measurements and sampling protocols
- The estimation of **systematic and random uncertainties** in SIF and reflectance retrievals

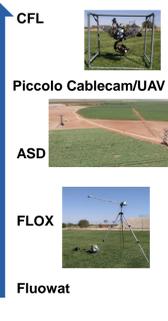
### Field Campaigns

As part of the Spanish FLEX calibration and validation (Cal/Val) activities, airborne, cable-suspended, and in-situ measurements, including those from the FLOX system, were collected during field campaigns in Spain to support the uncertainty analysis of SIF and surface reflectance under varying canopy conditions.

In particular, the **CalValFLEX campaign (2020)**, conducted at the **Las Tiesas agricultural site** (Barrax, Albacete), included measurements over multiple vegetation plots, among them a homogeneous *Festuca* grassland. Additional measurements were acquired during the **2024 Sarrión campaign** over a **Holm oak forest**, representing heterogeneous conditions.



Instruments



### FLOX Processing Chain

#### FLOX System

FLOX is a dual-channel hyperspectral field spectroradiometer used to continuously measure upwelling (L<sub>↑</sub>) and downwelling radiance (E<sub>↓</sub>). It is designed for SIF and reflectance monitoring under natural sunlight conditions.

Parameter	FLUO MODULE	FULL MODULE
Wavelength range	~ 650–800 nm	~ 400–950 nm
Spectral sampling interval (SSI)	~ 0.17 nm	~ 0.65 nm
Spectral resolution (FWHM)	~ 0.3 nm	~ 1.5 nm
Signal to noise ratio (SNR)	~ 1000	~ 250
Field of View (FOV)	L <sub>↑</sub> 25° E <sub>↓</sub> 180°	L <sub>↑</sub> 25° E <sub>↓</sub> 180°

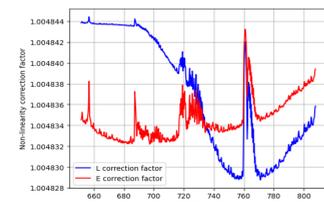
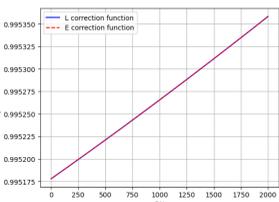


#### Non-linearity correction:

$DN_{corr} = \sum_{i=0}^7 a_i \cdot DN_{raw}^i$

- $DN_{raw}$ : raw digital number (uncorrected)
- $DN_{corr}$ : corrected digital number, after applying non-linearity correction
- $a_i$ : non-linearity correction coefficients derived from laboratory calibration

i	$a_i$
0	$9.95177822 \times 10^{-1}$
1	$8.47455122 \times 10^{-8}$
2	$2.95313508 \times 10^{-12}$
3	$-1.19969818 \times 10^{-16}$
4	$1.82129111 \times 10^{-21}$
5	$-1.46119140 \times 10^{-24}$
6	$5.96795747 \times 10^{-29}$
7	$-9.81466058 \times 10^{-34}$



FLOX non-linearity correction function

FLOX non-linearity correction factors (CorNonlin)

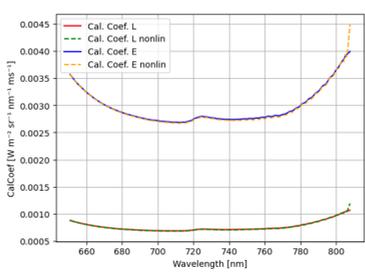
#### L0 to L1: radiometric calibration

The raw output of the FLOX system (L0) is converted into calibrated upwelling and downwelling radiance (L1):

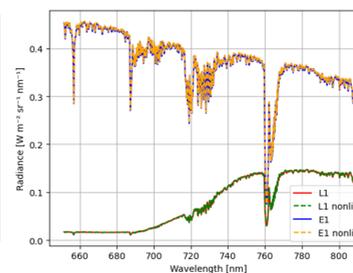
$$L_1 = \left( \frac{DN_{L0} - DN_{dark,L0}}{IT} \right) \cdot cal\_coef_{L0\_nonlin} \cdot CorNonlin_{L0}$$

$$E_1 = \left( \frac{DN_{E0} - DN_{dark,E0}}{IT} \right) \cdot cal\_coef_{E0\_nonlin} \cdot CorNonlin_{E0} \cdot CorCos$$

- $DN_{L0}, DN_{E0}$ : raw digital number (counts) from radiance and irradiance
- $DN_{dark,L0}, DN_{dark,E0}$ : dark signal (counts)
- $IT$ : integration time (ms)
- $cal\_coef_{L0\_nonlin}, cal\_coef_{E0\_nonlin}$ : radiometric calibration coefficients ( $W \cdot m^{-2} \cdot sr^{-1} \cdot nm^{-1} \cdot ms^{-1}$ )
- $CorNonlin_{L0}, CorNonlin_{E0}$ : non-linearity correction factors (dimensionless)
- $CorCos$ : cosine correction factor for downwelling radiance (dimensionless)
- $L_1, E_1$ : calibrated upwelling/downwelling radiance ( $W \cdot m^{-2} \cdot sr^{-1} \cdot nm^{-1}$ )



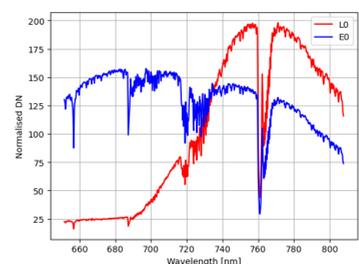
FLOX radiometric calibration coefficients (cal\_coef)



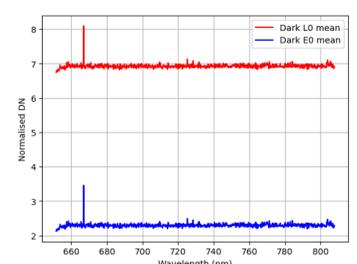
Calibrated upwelling/downwelling radiance

FLOX measurements over the homogeneous *Festuca* plot at Las Tiesas, Barrax, on 21 July 2020 at 11:00 UTC:

(a) Upwelling and downwelling radiance (DN / IT)



(b) Corresponding dark signals (DN / IT)



#### L1 to L2: apparent reflectance, SIF and true reflectance

$$R_{app} = \frac{L_1}{E_1}$$

$R_{app}$ : apparent reflectance (dimensionless)

SpecFit (Cogliati et al., 2019) models upwelling radiance as the sum of reflected downwelling radiance and a fluorescence emission term. Reflectance  $R(\lambda)$  is parameterized using a cubic spline, while the SIF( $\lambda$ ) is represented as a linear combination of two Lorentzian functions. The retrieval is performed by minimizing the residuals between the measured and modeled radiance:

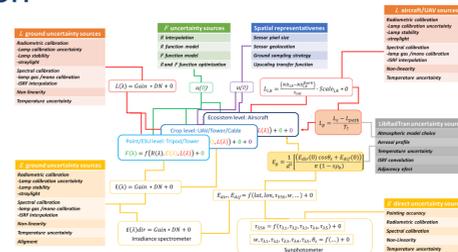
$$L_{mod}^1(\lambda) = R(\lambda) \cdot L_1(\lambda) + SIF(\lambda)$$

### Uncertainty Estimation and Propagation

A metrological approach based on the Guide to the Expression of Uncertainty in Measurement (GUM; JCGM, 2008) was adopted to assess both systematic and random uncertainty components. Uncertainty contributions were organized in an **uncertainty tree diagram**, covering all sources from instrument calibration to field sampling. This approach ensures full traceability of uncertainties across instruments and retrieval levels.

Uncertainty propagation from Level-0 to Level-2 products (SIF and surface reflectance) was performed using **Monte Carlo methods**, implemented through the **CoMet-Punpy tool** (Community Metrology Toolkit - Propagation of UNCertainties in Python). The total uncertainty was assessed by combining systematic and random components:

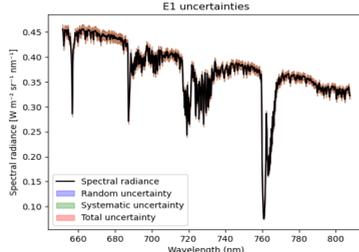
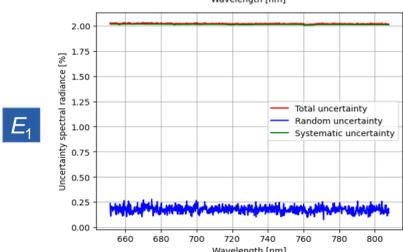
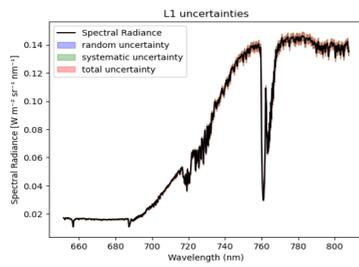
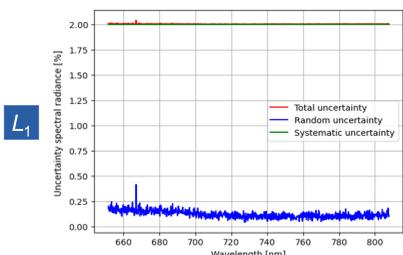
$$u_{total} = \sqrt{u_{systematic}^2 + u_{random}^2}$$



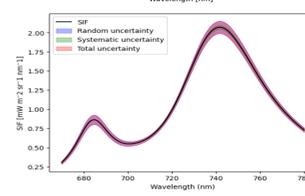
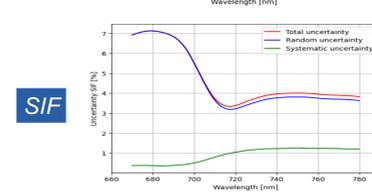
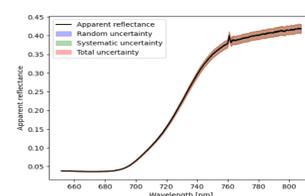
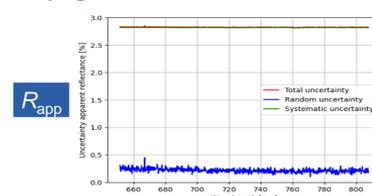
#### Sources of uncertainty

- Systematic uncertainties**
    - **Instrument calibration**: estimated as 2% of the calibration coefficients for both radiance and irradiance sensors.
    - **Non-linearity**: the effect of correcting the detector's non-linearity was evaluated as the difference between radiance values with and without the correction.
    - **Cosine receptor**: assumed to have negligible uncertainty due to ideal cosine response or correction of the effect.
  - Random Uncertainties**
- These represent **instrumental noise**, computed as the standard deviation of repeated measurements in a calibration sphere.

#### Propagation from L0 to L1



#### Propagation from L1 to L2



The uncertainty obtained with the FLOX system ( $u_{SIF} \approx 4\%$  at O<sub>2</sub>A and  $\approx 7\%$  at O<sub>2</sub>B) complies with the FLEX mission requirements for SIF ( $\approx 10\%$ ). However, a large discrepancy is observed between the uncertainty of the true surface reflectance obtained with SpecFit ( $<0.5\%$ ) and the uncertainty estimated for apparent reflectance ( $\approx 2.8\%$ ), which exceeds the mission requirement of  $\approx 1\%$ .

### Conclusions

The FLOX system plays a key role in providing high-quality point-level SIF and reflectance measurements, which are essential for **characterizing the uncertainty of integrated observations over a 300 x 300 m FLEX-S3 pixel**. While the **random uncertainty component**, estimated here for a single measurement, meets the FLEX mission requirements, it can be further reduced by increasing the number of repetitions. **Systematic uncertainty sources**, in turn, can be reduced by improving correction procedures, such as those related to radiometric calibration. An accurate estimation of SIF and apparent reflectance ( $R_{app}$ ) uncertainties is crucial to support the validation of FLEX products at the pixel scale.

### References

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