



The background of the slide features a horizontal band of abstract, colorful imagery at the top, consisting of various shades of blue, red, and white, resembling a textured or processed image. The main title text is overlaid on this background.

# UAV-BASED OBSERVATIONS FOR BRDF ESTIMATION

*IDEAS-QA4EO Cal/Val Workshop #3*

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# SUMMARY

GEO-K is responsible for WP 2175 which focuses on the **estimation of BRDF** by UAS platform.

More in general, this activities aims to establish an UAV flight protocol for collecting **reference in-situ dataset** to assess the quality of BRDF correction algorithms.

- Set-up of a system composed by UAV + Multispectral camera S2 likes
- Design of flight plan on selected test sites
- Elaboration of multiangular dataset
- Evaluation and modelling of BRDF using Ross-Li model



# System Set-up

# UAV + Multispectral sensor S2 likes



Band (nm)	Approx. color
1 433-453	Violet (Coastal)
2 457-523	Blue
3 542-578	Green
4 650-680	Red
5 697-713	Red Edge 1
6 732-748	Red Edge 2
7 773-793	NIR 1
8 784-900	NIR 2
9 855-875	NIR 3

- 9 CMOS sensor with global shutter
- GSD: 4cm at 75m flight altitude
- FOV: 47m x 36 m at 75m flight altitude
- Size and weight 10 x 13 x 4,6 cm, 470 g



- Hexarotor MTOM up to 6 kg
- Up to 20 minutes of flight time
- Automatic flight capabilities, controlled gimbal for orienting MAIA camera between 0° and 90° respect to surface normal direction



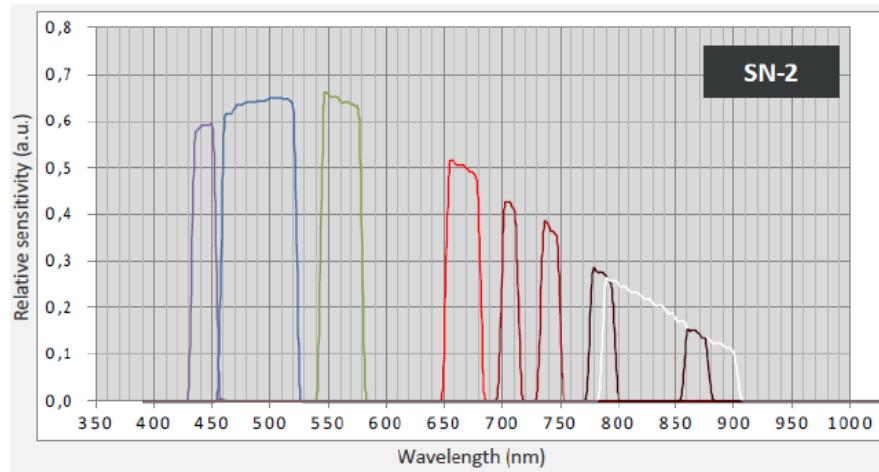
The **Incident Light Sensor (ILS)** measures the level of the down-welling light in each band.

ILS provides irradiance data at the exact time of shooting for each image and spectral band, substantially improving the accuracy of radiometric correction.

# Multispectral Camera Sentinel-2 likes

Technical Features	
Sensors	9 CMOS sensor 1.2Mpix (1280x960) with global shutter
Acquisition	Single shot or continuous up to 5fps
Image Format	Multi-layer/multi-band RAW 8 - 10 - 12bits per pixel; TIFF
File Size	from 10.7 to 21.2MB depending on the format
Internal Storage	210GB internal storage
Size and weight	99 x 129 x 46 mm <sup>3</sup> , 470 g

Distanza dal suolo (m)	GSD (mm/pixel)	FOV (m <sup>2</sup> )
50	23	30 x 23
75	35	45 x 34
100	47	60 x 45
150	70	90 x 68

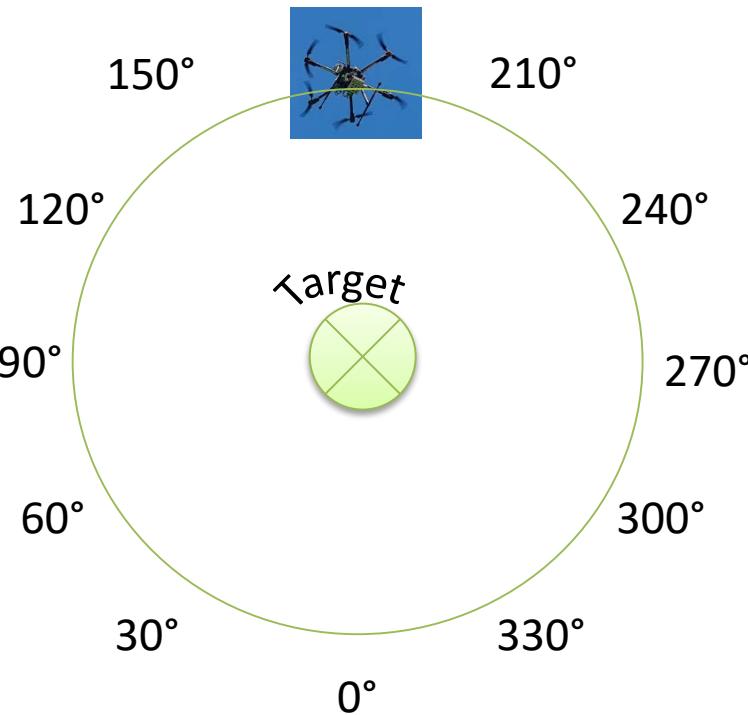


MAIA SN-2 BANDS	
Band (nm)	Name
433-453	Violet (Coastal)
457-523	Blue
542-578	Green
650-680	Red
697-713	Red Edge 1
732-748	Red Edge 2
773-793	NIR1
784-900	NIR2
855-875	NIR3

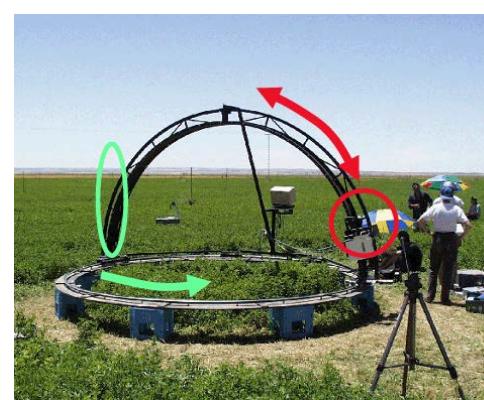
Sentinel-2 bands	Central wavelength (μm)
Band 1 – Coastal aerosol	0.443
Band 2 – Blue	0.490
Band 3 – Green	0.560
Band 4 – Red	0.665
Band 5 – Vegetation red edge	0.705
Band 6 – Vegetation red edge	0.740
Band 7 – Vegetation red edge	0.783
Band 8 – NIR	0.842
Band 8A – Vegetation red edge	0.865
Band 9 – Water vapour	0.945
Band 10 – SWIR – Cirrius	1.375
Band 11 – SWIR	1.610
Band 12 – SWIR	2.190

# Flight Planning

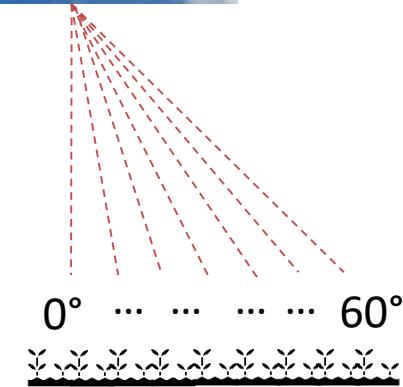
View Azimuth Angle (VAA) variation



View Zenith Angle (VZA) variation



On ground Goniometer  
Acquisition System  
for BRDF measurements



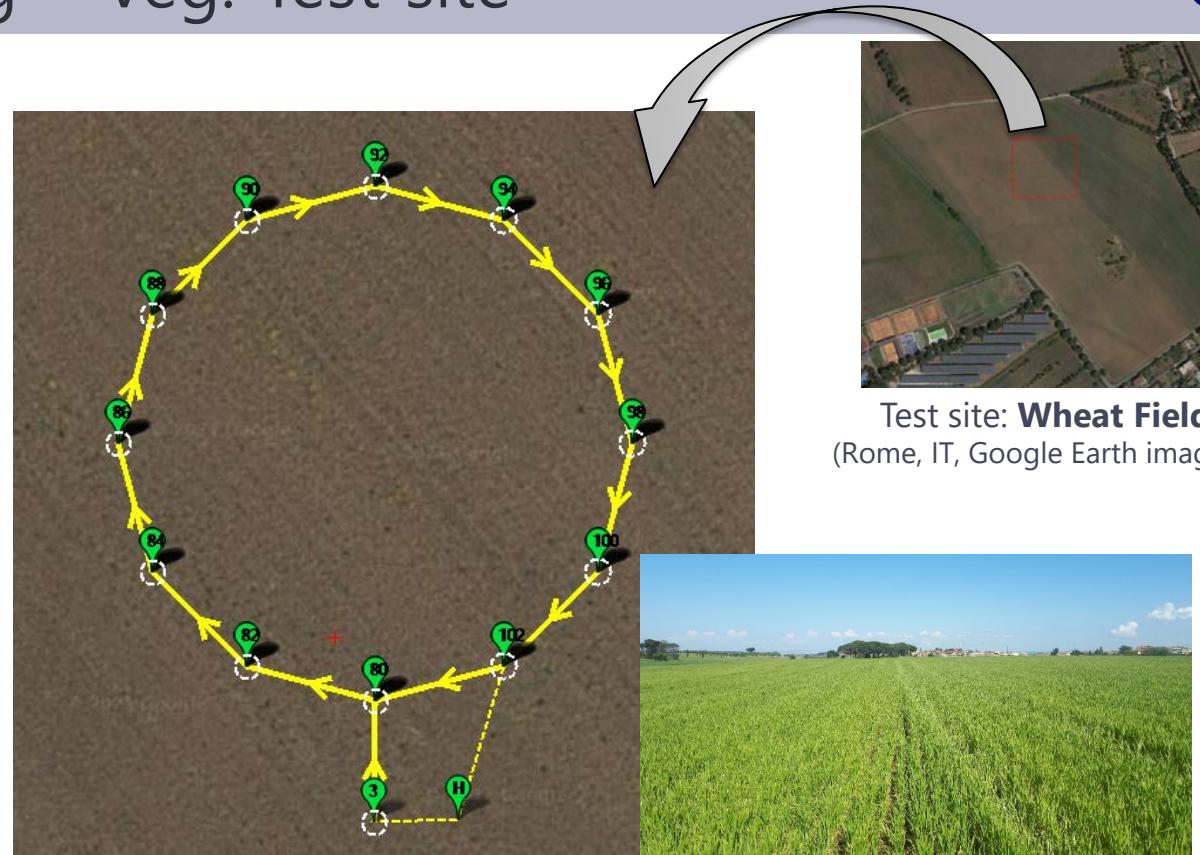


# Flight Planning and Dataset Elaboration: Vegetation Surface

# Flight Planning – Veg. Test site

- Acquisition details:

- **View Azimuth Angles:**  
0° to 360° with 30° steps
- **View Zenith Angles:**  
0° to 60° with 10° steps
- **Dataset amount:**  
84 acquisition each survey
- **More info:**
  - Flight time about 15min
  - Flight altitude: 120m
  - Overlapping Sentinel-2 passage (30/04/2021)

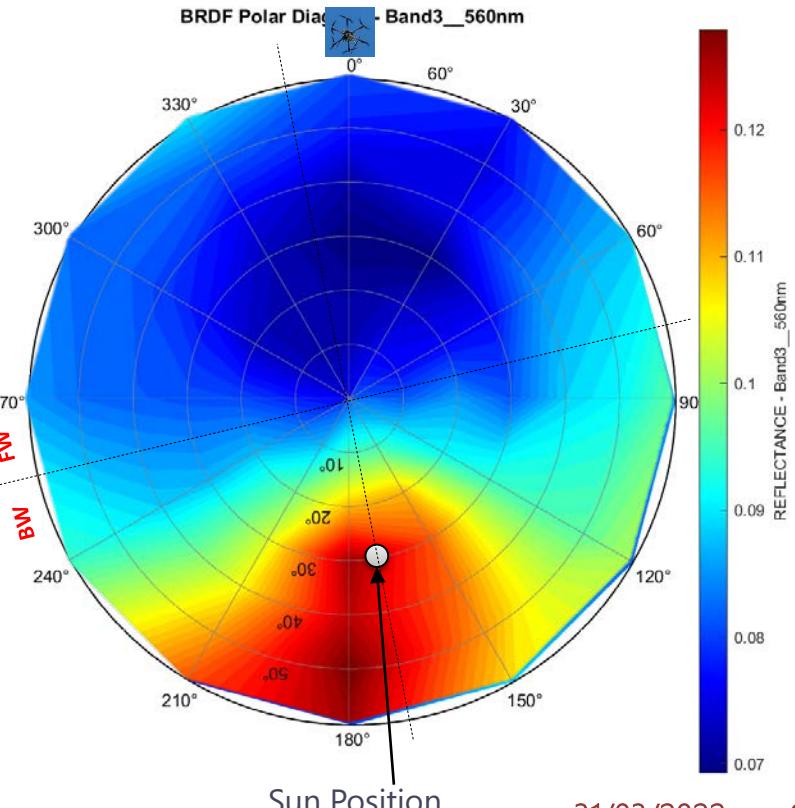
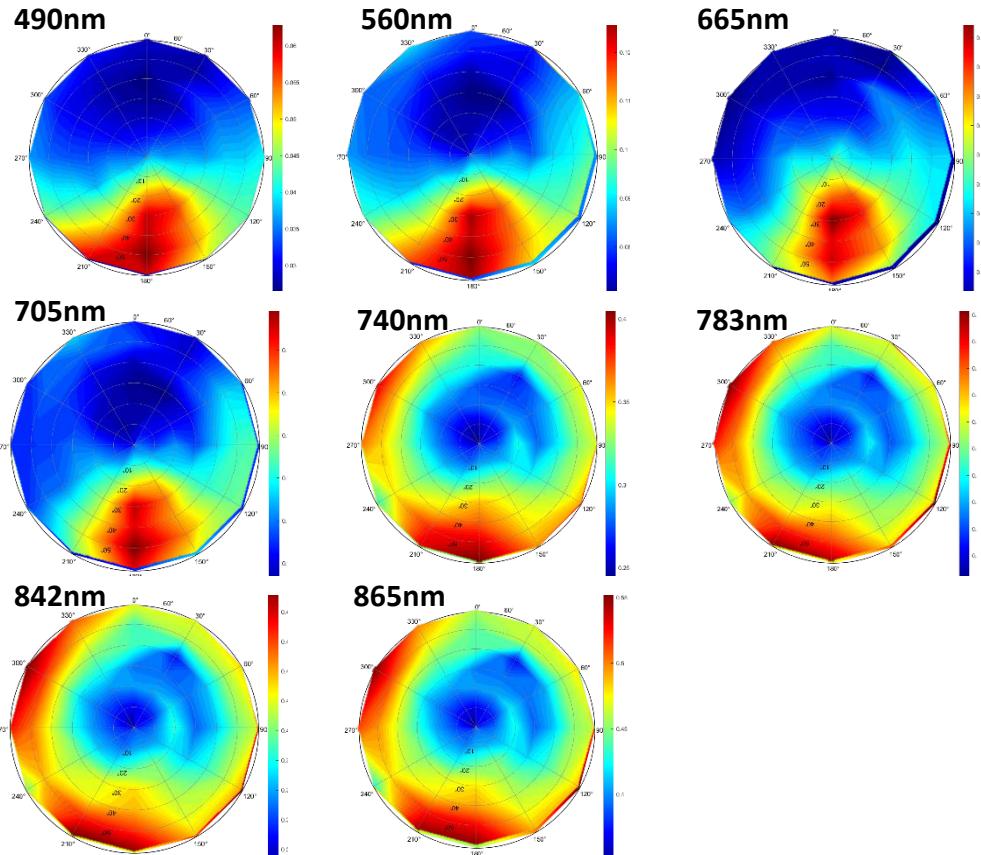


Test site: **Wheat Field**  
(Rome, IT, Google Earth imagery)

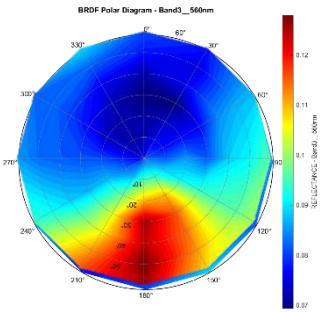


On ground picture: **Wheat Field** 31/03/2022 - 8

# MAIA Field Measurements – Evaluation of BRDF



# BRDF Modeling: Ross-Li model



## Computing Ross-Li Kernels

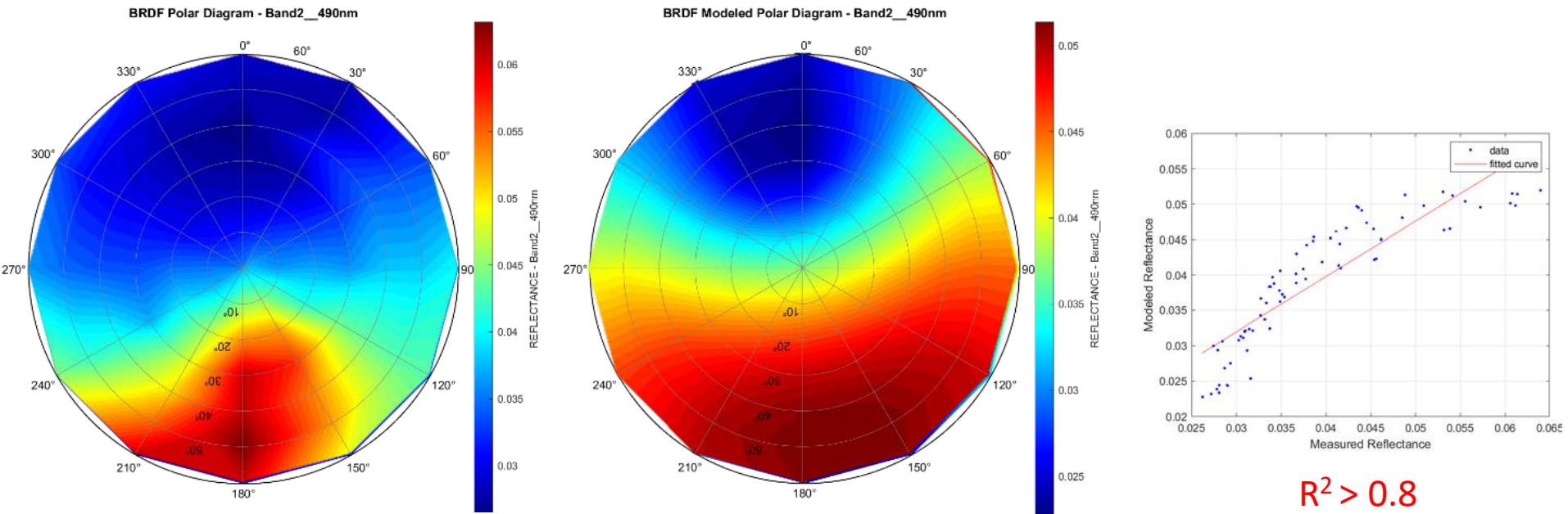
$$K_{RT} = [(\pi/2 - \xi)\cos \xi + \sin \xi]/[\cos \theta_s + \cos \theta_v] - \pi/4$$

$$K_{LS} = O(\theta_s, \theta_v, \phi) - \sec \theta'_s - \sec \theta'_v + \frac{1}{2}(1 + \cos \xi') \sec \theta'_s \sec \theta'_v$$

$$R(\theta_s, \theta_v, \phi; \lambda) = f_{iso} + f_{vol} K_{vol}(\theta_s, \theta_v, \phi; \lambda) + f_{geo} K_{geo}(\theta_s, \theta_v, \phi; \lambda)$$

Inversion of the model using least squared method

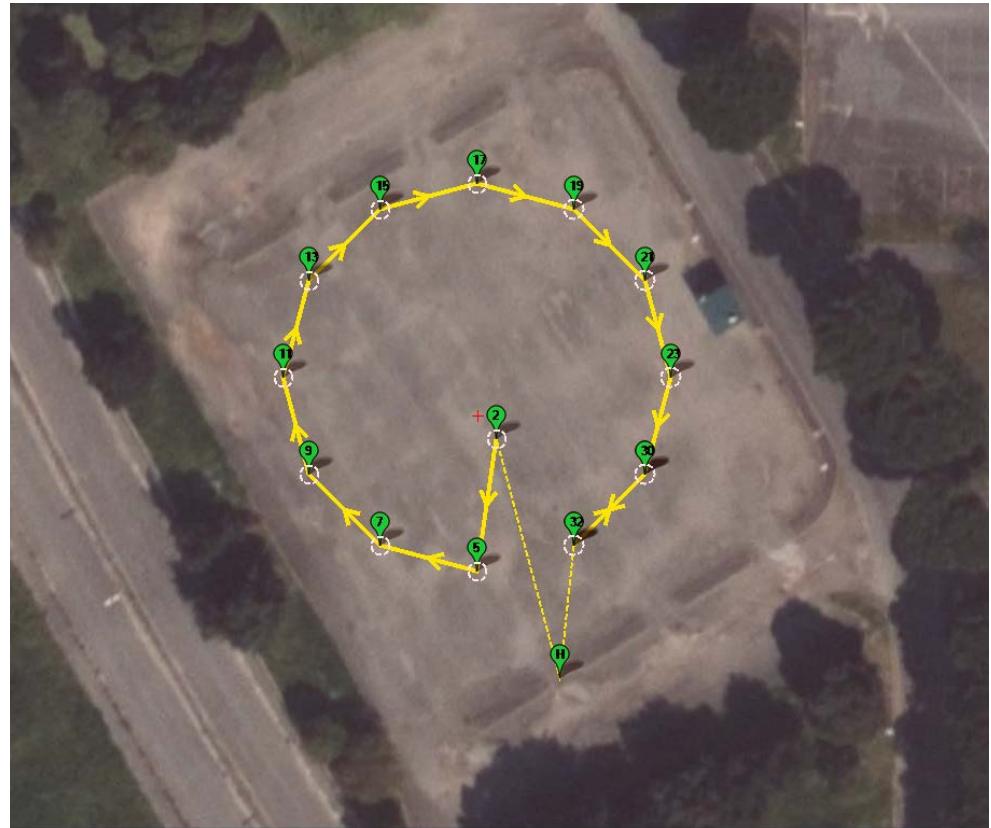
# BRDF Comparison: Measured vs Model



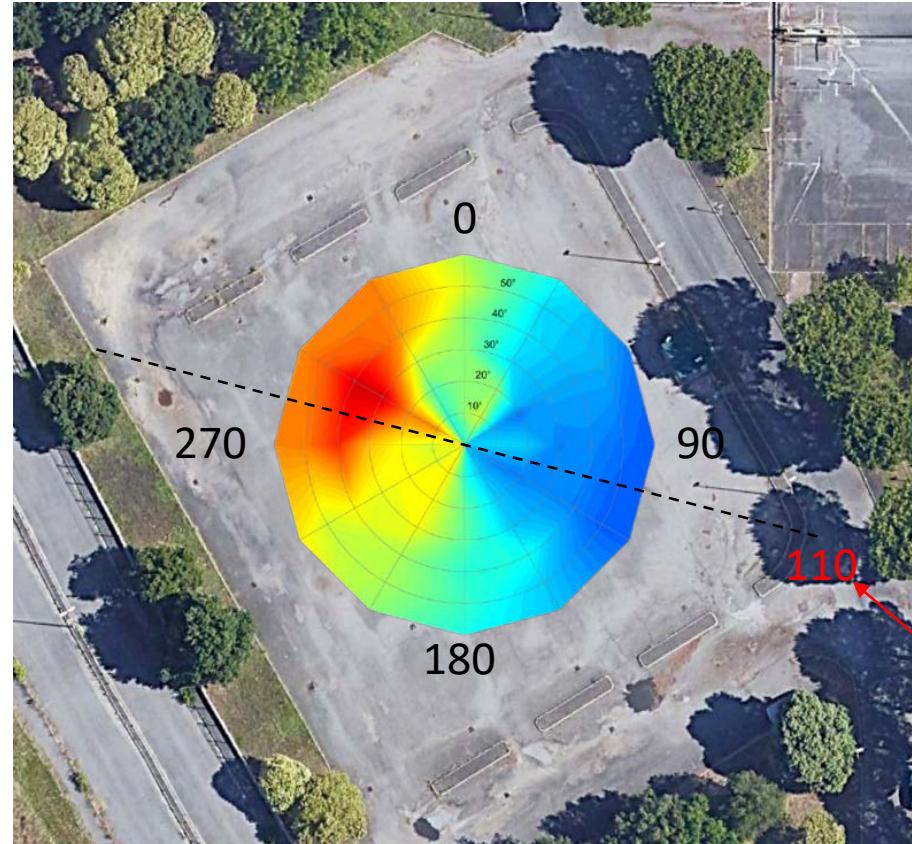
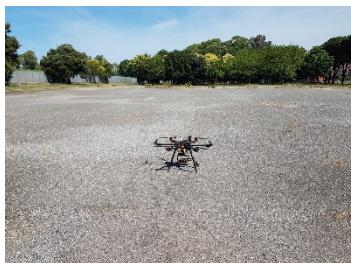


# Flight Planning and Dataset Elaboration: Asphalt

# Flight Planning – Asphalt Test site

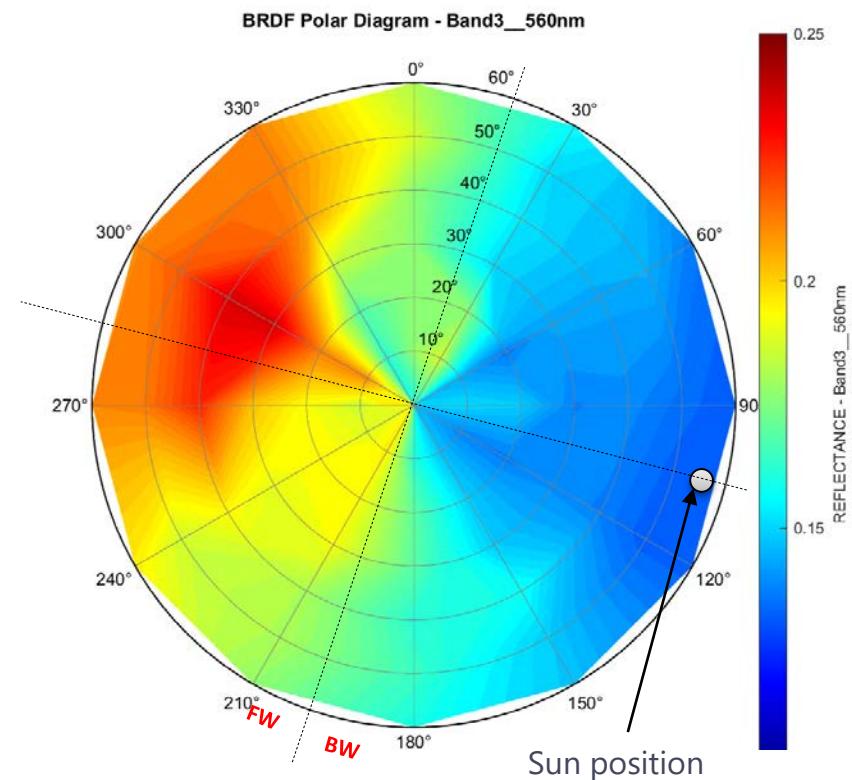
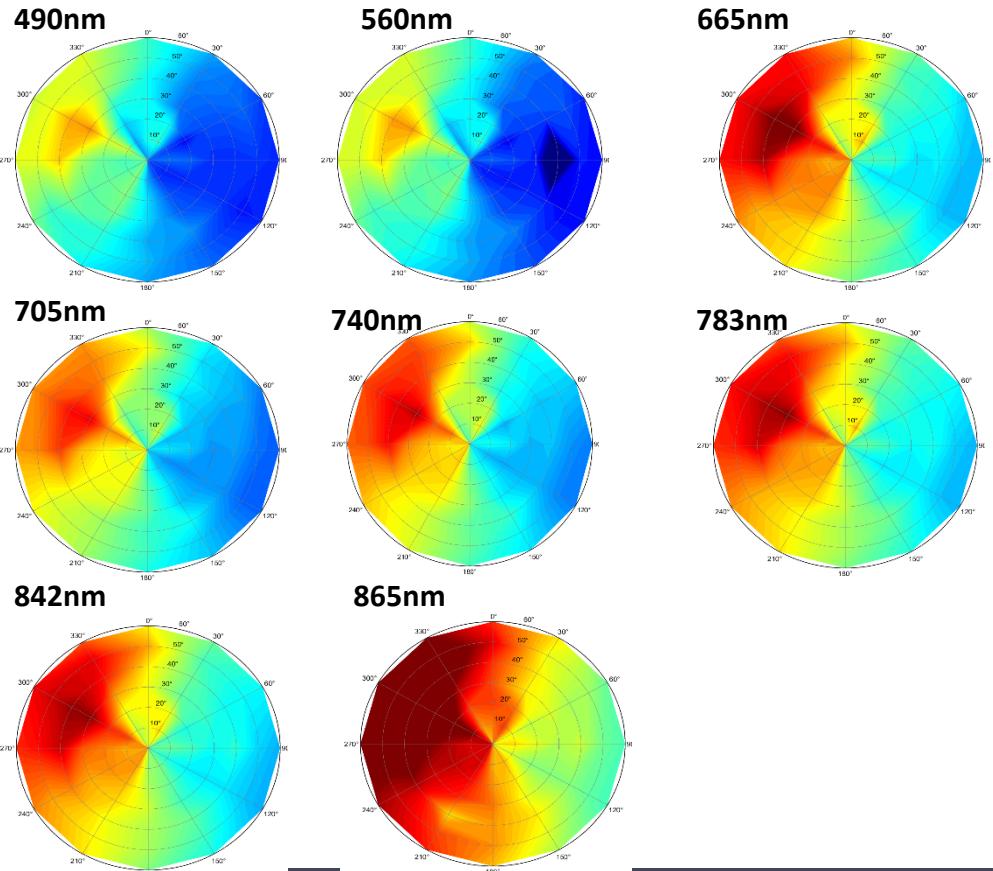


# Flight Planning – Asphalt Test site

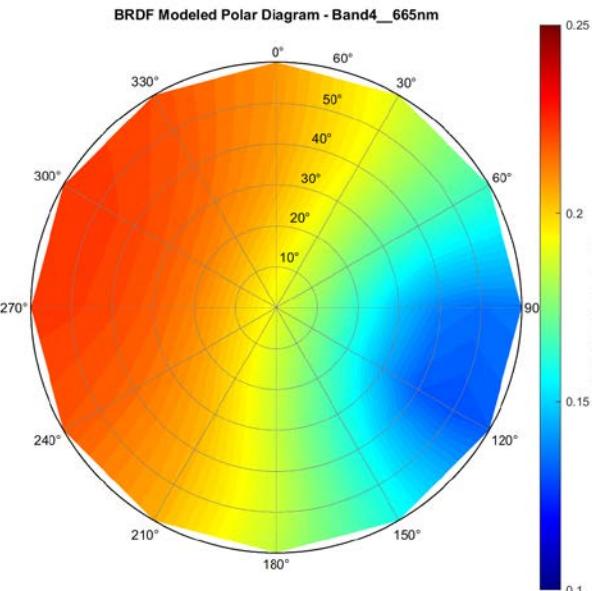
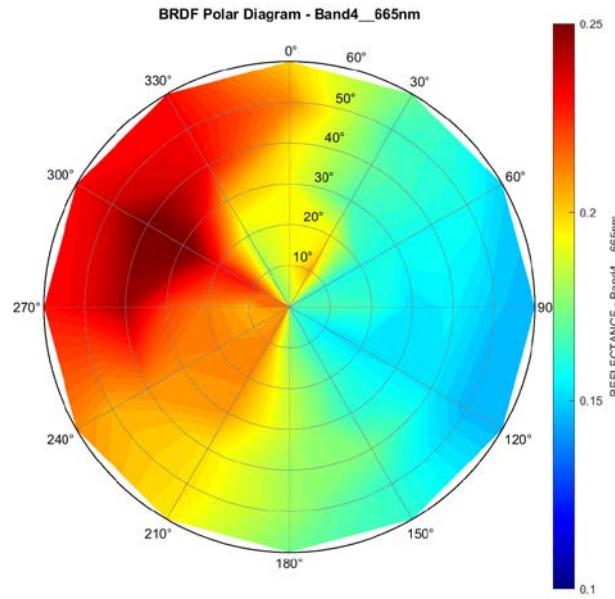


Sun position

# MAIA Field Measurements – Evaluation of BRDF



# BRDF Comparison: Measured vs Model



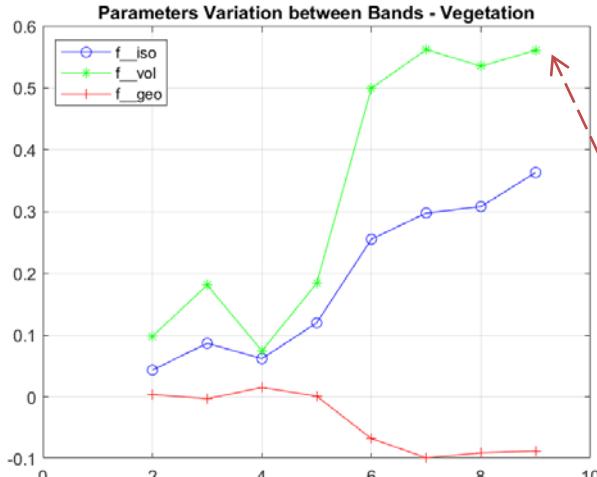
$R^2 > 0.8$   
For all modeled bands



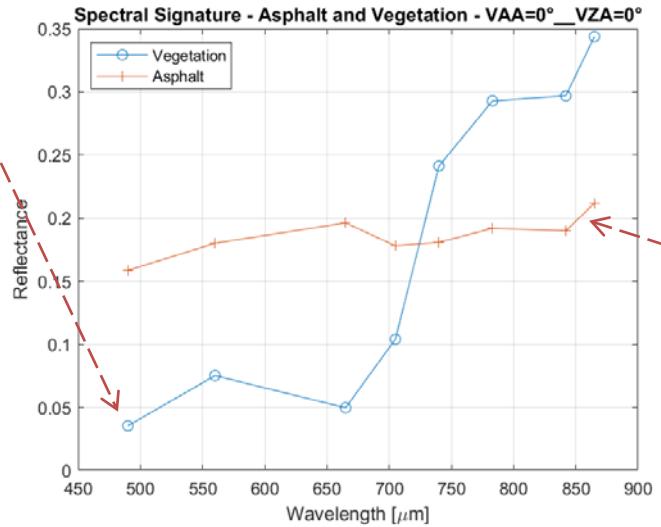
# BRDF model parameters: Sensitivity and Statistical analysis

# Sensitivity of Ross-Li Parameters to Surfaces and Bands

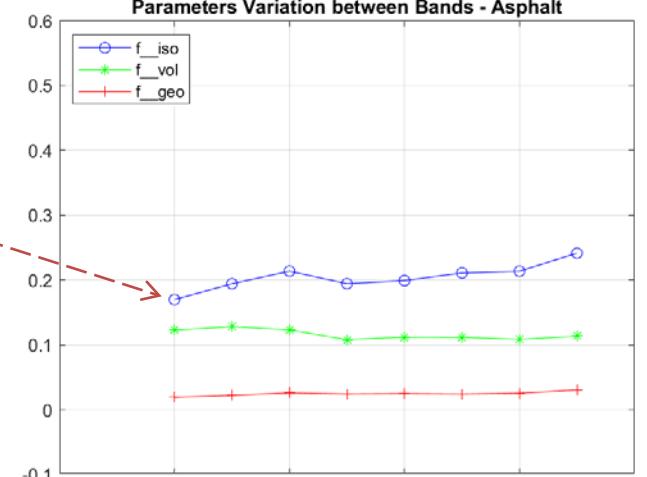
Paramaters on Veg.



Spectral Signature



Paramaters on Asph.



$f_{iso} \rightarrow$  predominant in Asph

$f_{vol} \rightarrow$  predominant in Veg

$f_{geo}$  → Asph → constant values

Veg → some negative values and variability

$$R(\theta_s, \theta_v, \phi; \lambda) = f_{iso} + f_{vol}K_{vol}(\theta_s, \theta_v, \phi; \lambda) + f_{geo}K_{geo}(\theta_s, \theta_v, \phi; \lambda)$$

# Random Uncertainty - RossLi

	MAIA Band	RMSE	CORRcoeff	f1 - f <sub>iso</sub>	Confidence Interval - f1	f2 - f <sub>vol</sub>	Confidence Interval - f2	f3 - f <sub>geo</sub>	Confidence Interval - f3
Vegetation	Band2_490nm	0.004	0.933	0.044	0.046 - 0.042	0.098	0.109 - 0.087	0.004	0.006 - 0.002
	Band3_560nm	0.007	0.891	0.087	0.091 - 0.083	0.181	0.204 - 0.159	-0.003	0.001 - -0.007
	Band4_665nm	0.005	0.913	0.062	0.065 - 0.059	0.075	0.091 - 0.059	0.015	0.018 - 0.013
	Band5_705nm	0.009	0.859	0.12	0.125 - 0.115	0.184	0.213 - 0.155	0.002	0.007 - -0.004
	Band6_740nm	0.024	0.829	0.256	0.269 - 0.242	0.5	0.577 - 0.423	-0.067	-0.053 - -0.081
	Band7_783nm	0.032	0.813	0.298	0.315 - 0.28	0.563	0.663 - 0.462	-0.098	-0.08 - -0.116
	Band8_842nm	0.031	0.802	0.308	0.326 - 0.291	0.536	0.634 - 0.438	-0.09	-0.072 - -0.108
	Band9_865nm	0.033	0.787	0.364	0.382 - 0.345	0.561	0.666 - 0.457	-0.087	-0.068 - -0.106
Asphalt	Band1_443nm	0.012	0.848	0.168	0.176 - 0.16	0.114	0.143 - 0.085	0.017	0.024 - 0.01
	Band2_490nm	0.014	0.83	0.17	0.179 - 0.161	0.123	0.157 - 0.088	0.019	0.027 - 0.011
	Band3_560nm	0.014	0.853	0.194	0.203 - 0.185	0.128	0.162 - 0.094	0.022	0.03 - 0.014
	Band4_665nm	0.014	0.863	0.214	0.223 - 0.205	0.123	0.157 - 0.089	0.026	0.034 - 0.018
	Band5_705nm	0.012	0.862	0.194	0.202 - 0.186	0.108	0.139 - 0.077	0.024	0.031 - 0.017
	Band6_740nm	0.012	0.867	0.199	0.207 - 0.191	0.112	0.143 - 0.081	0.025	0.032 - 0.017
	Band7_783nm	0.012	0.874	0.211	0.219 - 0.203	0.112	0.141 - 0.082	0.024	0.031 - 0.017
	Band8_842nm	0.011	0.884	0.214	0.221 - 0.206	0.108	0.137 - 0.08	0.025	0.032 - 0.019
	Band9_865nm	0.013	0.887	0.241	0.25 - 0.233	0.113	0.145 - 0.082	0.03	0.038 - 0.023

# Comparison with RossLi Parameters from literature

**Table 2** The  $f_{\text{iso}}$ ,  $f_{\text{vol}}$ , and  $f_{\text{geo}}$  of the RossThick–LiSparse model for the WFI sensor.

Band	$f_{\text{iso}}$	$f_{\text{vol}}$	$f_{\text{geo}}$
CoverType: <b>Bare soil</b>	Band1 0.1936	0.1193	0.0199
	Band2 0.2323	0.1331	0.0258
	Band3 0.2566	0.1373	0.0298
	Band4 0.2656	0.1308	0.0322

Pan, Z., Zhang, H., Min, X., & Xu, Z. (2020). Vicarious calibration correction of large FOV sensor using BRDF model based on UAV angular spectrum measurements. *Journal of Applied Remote Sensing*, 14(2), 027501.

RossLi									
Band	CoverType	RMSE	CORRcoeff_RL	$f_1 - f_{\text{iso}}$	Confidence Interval - $f_1$	$f_2 - f_{\text{vol}}$	Confidence Interval - $f_2$	$f_3 - f_{\text{geo}}$	Confidence Interval - $f_3$
Band2_490nm	Vegetation	0.004	0.933	0.044	0.046 - 0.042	0.098	0.109 - 0.087	0.004	0.006 - 0.002
Band3_560nm	Vegetation	0.007	0.891	0.087	0.091 - 0.083	0.181	0.204 - 0.159	-0.003	0.001 - -0.007
Band4_665nm	Vegetation	0.005	0.913	0.062	0.065 - 0.059	0.075	0.091 - 0.059	0.015	0.018 - 0.013
Band8_842nm	Vegetation	0.031	0.802	0.308	0.326 - 0.291	0.536	0.634 - 0.438	-0.09	-0.072 - -0.108
Band2_490nm	Asphalt	0.014	0.83	0.17	0.179 - 0.161	0.123	0.157 - 0.088	0.019	0.027 - 0.011
Band3_560nm	Asphalt	0.014	0.853	0.194	0.203 - 0.185	0.128	0.162 - 0.094	0.022	0.03 - 0.014
Band4_665nm	Asphalt	0.014	0.863	0.214	0.223 - 0.205	0.123	0.157 - 0.089	0.026	0.034 - 0.018
Band8_842nm	Asphalt	0.011	0.884	0.214	0.221 - 0.206	0.108	0.137 - 0.08	0.025	0.032 - 0.019

# Conclusions

- Develop of an automatic and repeatable flight plan for acquiring multi-angular UAV dataset using a multispectral camera Sentinel-2 like.
- Planning and execution of automatic and repeatable UAV surveys over different landcover types.
- Dataset processed and applied for the estimation of BRDF parameters of Ross-Li linear model.
- Sensitivity and statistical analyses of BRDF parameters have been carried out.
- Participation to SRIX4VEG initiative in Barrax (ES) planned in July 2022.
- Extension of the activities to second phase of QA4EO.



*Thanks*

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