

## THE BELHARMONY APPROACH FOR HARMONIZATION OF PROBA-V, DEIMOS-1 LANDSAT-8 AND SENTINEL-2 TIMESERIES

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## **BELHARMONY OVERALL OBJECTIVE**

- To assess and improve the consistency of multi-sensor high resolution time series. (HARMONY)
- Landsat-8, Sentinel-2, PROBA-V (central camera) and Deimos-1/DMC
- How ?

Bottom-up approach (from L1 to L2 to L3)









## 1. Are the L1 TOA data consistent ?

## Medium to high radiances



\*OSCAR (Optical Sensor Calibration with simulated Radiances). Govaerts, Y., S. Sterckx, and S. Adriaensen (2013). Use of simulated reflectances over bright desert target as an absolute calibration reference. Remote Sensing Letters, , Vol. 4: 6, 523-531.

## Low radiances





4

- 1. Are the the L1 data consistent ?
- 2. What is the impact of intrinsic differences in the RSRF of the different sensors ?
  - Can BELHARMONY through the introduction of band or index dependent spectral adjustment functions correct for this ?





- 1. Does there exist a bias in the L1 data ?
- 2. What is the impact of intrinsic differences in the RSRF of the different sensors ?
- 3. Can differences in L2 and L3 data be reduced through the use of a common processing chain ?





De Keukelaere et al. (2018)



- 1. Does there exist a bias in the L1 data ?
- 2. What is the impact of intrinsic differences in the RSRF of the different sensors ?
- 3. Can differences in L2 and L3 data be reduced through the use of a common processing chain ?
- 4. What is impact of all these harmonization measures on the consistency of the multi-sensor L2/L3 time series?

=> <u>BEL</u>HARMONY APPROACH: <u>BEL</u>AIR CASE STUDIES



## 1 Doos thoro ovist a bias in the

Medium to high radiances

# 1. Does there exist a bias in the L1 data ?

# Inter-comparison over the Libya-4 PICS desert site following the OSCAR\* desert approach La Crau Baotou

**RESULTS** 

Bias Assessment over instrument RadCalNet sites (Land Equipped Sites (LIS))

#### Open Access Article

Radiometric Top-of-Atmosphere Reflectance Consistency Assessment for Landsat 8/OLI, Sentinel-2/MSI, PROBA-V, and DEIMOS-1 over Libya-4 and RadCalNet Calibration Sites

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### Low radiances



#### Open Access Article

### Calibration of Satellite Low Radiance by AERONET-OC Products and 6SV Model

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## **RESULTS : LIBYA-4 DESERT**





### RADCALNET





## **RadcalNet portal**

- **TOA reflectances:** 
  - Nadir
  - Max. time diff 30 min
  - Spectral resampling of RadCalNet TOA reflectances (at 10 nm)



Sensor	LCFR	RVUS	GONA	Total
Sentinel-2A	32	14	27	73
Sentinel-2B	20	8	22	50
Landsat 8	24	6	14	44
PROBA-V	103	28	42	173
Deimos1	4	7	0	11
	CNR-IIA			

## **RESULTS : GOBABEB RADCALNET**





No Deimos1 data available for GONA







## **RESULTS : RAILROAD RADCALNET**









## **BRDF effects RVUS, RED**



L8 B2

**S2A B4** 

S2B B4

**PV B2** 

D1 B3



## **RESULTS : RAILROAD RADCALNET**



●S2A\_b1 ●S2B\_b1



## **RESULTS : LA CRAU RADCALNET**





## **Brdf effects LCFR, RED**



L8 B2

**S2B B4** 

**D1 B3** 

**PV B2** 





### Does there exist a bias in the L1 data ?

<b>S2</b>	<b>S2</b>	S2A	% dif S2B	LS8	LS8	% dif LS8	Deimos1	Deimos-1	% dif D-1	PV	PV	% dif PV
band	cwv	ratio	vs S2A	band	cwv	vs S2A	band	CWV	vs S2A	band	cwv	vs S2A
1	443	1.008	-1.05%	CA	443	-1.05%				Dive	460	-1.30%
2	490	0.985	-0.03%	Blue	492	0.94%				blue	460	0.97%
3	560	0.999	-0.16%	Green	561	0.82%	Green	549	-3.5%			
4	665	1.005	-0.76%	Red	654	0.08%	Red	679	0.2%	Red	658	-1.55%
5	705	1.016	-1.32%									
6	740	1.023	-1.49%									
7	783	1.034	-1.35%									
8	842	0.999	-0.40%				NIR	803	0.8%	NIR	834	0.78%
8A	865	1.027	-0.84%	NR	865	-0.28%						
9	945	NA	NA									
10	1375	NA	NA	Cirrus	1373	NA						
11	1610	0.998	-0.40%	SWIR1	1610	-0.30%				SWIR	1610	-0.21%
12	2190	0.973	-0.12%	SWIR2	2200	0.28%						

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- Relative differences between sensors small Lybia 4 (< ±1.5%) and Gobabeb (< ±2.5%)</li>
- Deimos 1 green band larger differences 3.5%
- Differences between S2A and S2B of the same magnitude as differences observed between Sentinel-2A and the other sensors.
- S2A possibly slightly brighter than S2B, but within uncertainty range of reference methods





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Spectral correction functions derivation

1. Generate simulations of vegetation and mixtures with different background

 $\rightarrow$  Coupled Soil-Leaf-Canopy (SLC) RTM



Spectral correction functions derivation

- Generate simulations of vegetation and mixtures with different background
   → Coupled Soil-Leaf-Canopy (SLC) RTM
- Add man-made and water spectra
   → Spectral library + ASD measurements





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- 3. Calculate sensor-specific responses using RSRFs
- 4. Estimate correction functions per band

Different models were explored for each band

- Linear model
  - $\bar{\rho}_{\lambda,ref} = a + b \cdot \bar{\rho}_{\lambda,tar}$
- Multi-linear regression models
  - $\bar{\rho}_{\lambda,(red,nir),ref} = \beta_1 \bar{\rho}_{red,tar} + \beta_2 \bar{\rho}_{nir,tar} + \beta_3 NDVI + \beta_3 NDVI^2 + \epsilon$
  - $\bar{\rho}_{\lambda,(g,red,nir),ref} = \beta_1 \bar{\rho}_{(g,red),tar} + \beta_2 \bar{\rho}_{nir,tar} + \beta_3 \left( \bar{\rho}_{(g,red),tar} \cdot \bar{\rho}_{nir,tar} \right) + \beta_4 \left( \bar{\rho}_{(g,red),tar} \right)^2 + \beta_5 \left( \bar{\rho}_{(nir),tar} \right)^2 + \epsilon$
- Quadratic model of the relative difference in function of the NDVI
  - $SBAF = \frac{\overline{\rho}_{\lambda,ref}}{\overline{\rho}_{\lambda,tar}} = a + b \cdot NDVI + c \cdot NDVI^2$
  - $abs.diff = a + b \cdot NDVI + c \cdot NDVI^2$
  - $rel.diff = a + b \cdot NDVI + c \cdot NDVI^2$
- Exponential function of the SBAF, AD, RD in function of the NDVI
- $SBAF = a \cdot e^{b \cdot NDVI} + c \cdot e^{d \cdot NDVI}$
- $AD = a \cdot e^{b \cdot NDVI} + c \cdot e^{d \cdot NDVI}$
- $RD = a \cdot e^{b \cdot NDVI} + c \cdot e^{d \cdot NDVI}$



Spectral correction functions derivation

- Generate simulations of vegetation and mixtures with different background

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- 4. Estimate correction functions per band
- 5. Validate the correction functions





Spectral correction functions derivation

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   → Coupled Soil-Leaf-Canopy (SLC) RTM
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- 5. Validate the correction functions

Final spectral correction functions

### S2A – Landat8

Corresponding Band	Input	Function	Order	Remark
B3	SBAF	NDVIpoly	2	
B4	SBAF	NDVIpoly	3	
B8	-	-	-	No correction possible
B8A	-	-	-	Original bands sufficiently similar
B11	AD	NDVI2exp	-	
B12	refl	Qmultilin	-	

### S2A – Deimos1

Corresponding Band	Input	Function	Order	Remark
B3	SBAF	NDVIpoly	2	
B4	SBAF	NDVIpoly	3	
B8	-	-	-	Original bands sufficiently similar
B8A	SBAF	NDVI2exp	-	Correction not very effective: optional

S2A – Proba-V

Corresponding Band	Input	Function	Order	Remark
B4	SBAF	NDVIpoly	2	
B8	SBAF	NDVI2exp	-	Small improvement
B8A	-	-	-	No correction possible
B11	AD	NDVIpoly	2	



What's the impact of all the harmonisation measures ?





## VALIDATION OVER BELAIR SITES

1. Validation with in-situ data









## **VALIDATION OVER BELAIR SITES**

- 1. Validation with in-situ data
- 2. Matchups between sensors





## **VALIDATION OVER BELAIR SITES**

- 1. Validation with in-situ data
- 2. Matchups between sensors
- 3. Time series analyses





## CONCLUSIONS

- Largest gain of improvement in consistency by applying the same atmospheric correction.
  - Strength of iCOR: can be applied on various sensors !



- Inter-calibration and SRFs are also important aspects of inter-sensor consistency, but for the considered sensors in Belharmony, only a minor improvement could be seen. Reason for this are that the absolute radiometric calibration of the sensors are close to each other and the spectral bands are defined very similarly.
- BRDF, geometric co-registration not considered in Belharmony



# Thank you!



