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Uncertainty of Copernicus Sentinel-2 AOT, WV and SR retrieval with Sen2Cor



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Sen2Cor is a Level-2A (L2A) processor whose main purpose is to correct mono-temporal Copernicus Sentinel-2 (S2) mission Level-1C (L1C) products from the effects of the atmosphere in order to deliver radiometrically corrected Bottom-of-Atmosphere (BOA) data. Knowledge of uncertainty of products is one major key to foster interoperability through time and with other datasets.

Sen2Cor [1]: ❖ Atmospheric correction processor tailored to Copernicus Sentinel-2 data, extension to Landsat-8 data processing realized (see poster "Sen2Cor Version 3.0 Processor ..." on Thursday).

- ❖ Is used for global L2A-processing by Sentinel-2 ground segment (PDGS) Can be obtained for user processing from http://step.esa.int/main/third-party-plugins-2/sen2cor/
- This study: Sen2Cor 2.8 with CAMS-fallback (see poster "Sen2Cor version 2.10 ..." on Thursday)

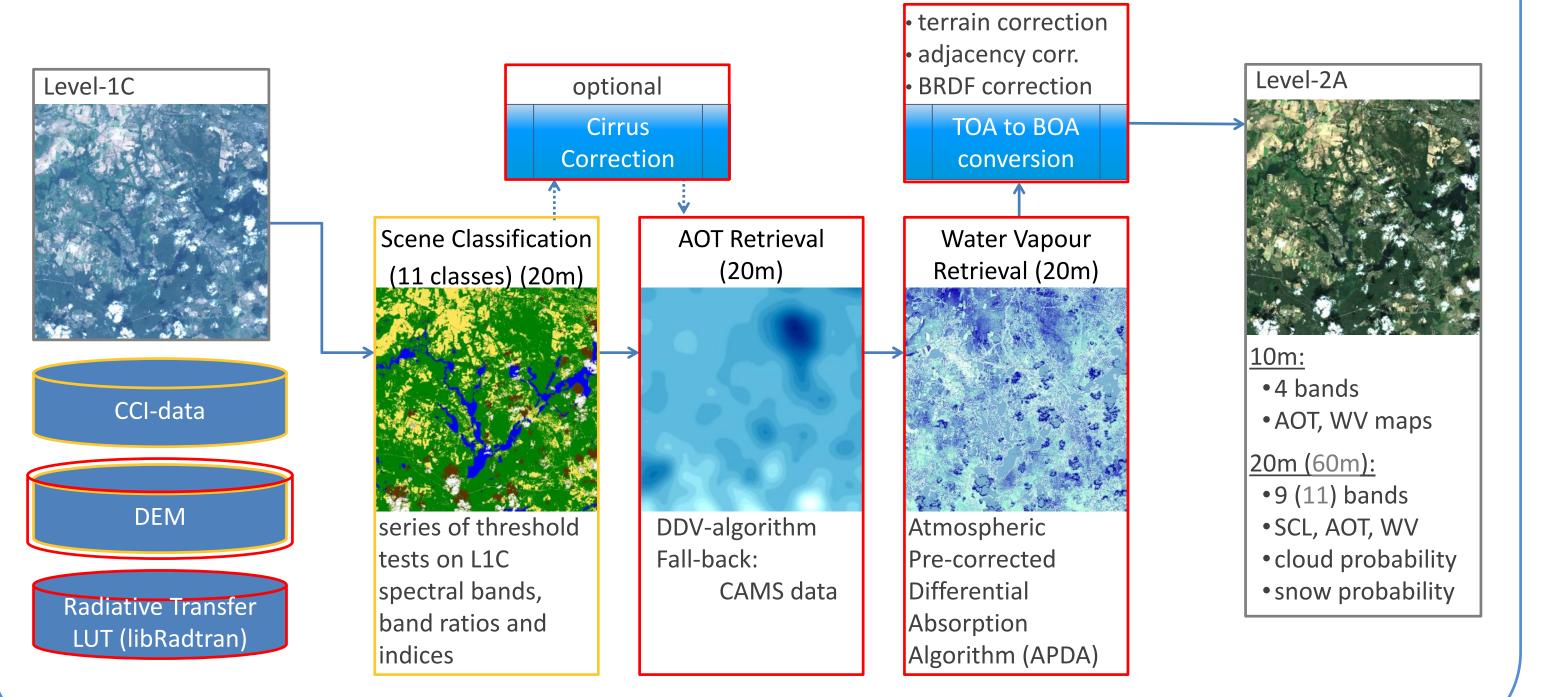


Figure 1: Sen2Cor processing chain

Data and test sites

- ❖ S2 L1C-products of year 2020 downloaded from SciHub
- Sen2Cor user processing (SUMMER_RURAL_PlanetDEM90_terrainON_OzoneFromMetadata_cirrusFALSE)
- ❖ Site selection: AERONET data available (level ≥ 1.5) within ±15 min to overpass

		Table	1: Number	UI LEST SILE	s per regio	//			
climate zone	N-America	S- America	Europe	Africa	Asia	Australia	Antarctica	No. of sites	No. of Tiles
Polar	2		5		1			8	224
Boreal	3		16		3			22	758
Midlatitude N	6		10	1	4			21	745
Subtropical N	3			2	4			9	290
Tropical		3		4	3	1		11	189
Subtropical S		2		1		1		4	117
Midlatitude S		1		1		2		4	60
Austral		1						1	14
number of sites	14	7	31	9	15	4	0	80	2397
percentage of sites	18%	9%	39%	11%	19%	5%	0%		
⅓ area +⅔ access	17.5%	4.7%	52.8%	7.5%	13.5%	3.9%	3.5%		
data access	17.3%	0.4%	75.5%	0.1%	3.9%	2.8%	0.0%		Ti-
area fraction	18%	13%	7%	22%	33%	6%	10%		

Table 1. Number of test sites per region

Analysis procedure

AOT & WV:

- Spectral interpolation of AOT to 550nm: → Reference: $AOT_{550} = a0 \cdot 0.55^{a1} + a2$ Temporal average of AERONET data ±15 min of satellite overpass time
- → Retrieval: Spatial average of AOT₅₅₀ and WV from Sentinel-2 data over 9x9 km² subset around sunphotometer **location** (mask: vegetated and non-vegetated)

Surface reflectance SR (hemispherical-directional reflectance factor):

→ Pixel-by-pixel comparison of Sen2Cor retrieval with reference within 9x9 km² subset around sunphotometer location

$X = \{ \rho_{\lambda} ; AOT_{550} ; WV \}$
$\Delta X = X_{SEN2COR} - X_{REFERENCE}$
$u_{sys} = \sqrt{\frac{1}{(n-1)} \cdot \sum_{i=1}^{n} \Delta X_i}$
u_{random}
$= \sqrt{\frac{1}{(n-1)} \cdot \sum_{i=1}^{n} \left(\Delta X_i - u_{sys}\right)^2}$
$u_{total} = \sqrt{u_{sys}^2 + u_{random}^2}$

Uncertainty of AOT retrieval AOT550 (20m): Climate zone Pola Table 2: Percentage of products with AOT retrieved within uncertainty $RMSD_{CAMS} = 0.21$ $RMSD_{CAMS} = 0.33$ $RMSD_{CAMS} = 0.07$ goal: $U_{AOT550} \le 0.1*AOT550_{ref} + 0.03$ **CAMS DDV** climate zone 0.4 0.6 0.8 1.0 1.2 1.4 0.4 0.6 0.8 1.0 1.2 0.4 0.6 0.8 1.0 1.2 **Boreal** (Temperate) AOT550 (20m); Climate zone Tropical AOT550 (20m); Climate zone Subtropical S AOT550 (20m); Climate zone Midlatitude S AOT550 (20m): Climate zone Austral Sen2Cor 2.08 user product Sen2Cor 2.08 user product Midlatitude N $\widehat{\epsilon}_{1.2} \mid RMS_{DDDV} = 0.50$ \widehat{E} 1.2 - RMS_{DDDV} = 0.07 **Subtropical N** $RMSD_{CAMS} = 0.10$ $RMSD_{CAMS} = 0.02$ $|RMSD_{CAMS}| = 0.36$ **Tropical** Subtropical S Midlatitude S 17% Austral Figure 2: Correlation plots of AOT@550nm (20m) retrieval over reference from AERONET

Uncertainty of WV retrieval Table 3: Percentage of products with WV retrieved within uncertainty goal: $U_{WV} \le 0.1*WV_{ref} + 0.2 \text{ g/cm}^2$ climate zone **Boreal** (Temperate) WV (20m); Climate zone Midlatitude_S Sen2Cor 2.08 user product WV (20m); Climate zone Tropical Sen2Cor 2.08 user product WV (20m); Climate zone Subtropical_S WV (20m); Climate zone Austral Sen2Cor 2.08 user product Midlatitude N Cloudy (ge 5.0% clouds) Cloudy (ge 5.0% clouds **Subtropical N** RMSD = 0.21 g/cm^2 86% within specs Tropical **Subtropical S** Midlatitude S Figure 3: Correlation plots of WV (20m) retrieval over reference from AERONET

Uncertainty of SR retrieval due to aerosol retrieval

→ Reference: Sen2Cor output processed with fixed AOT as input which is set equal to the value provided by AERONET

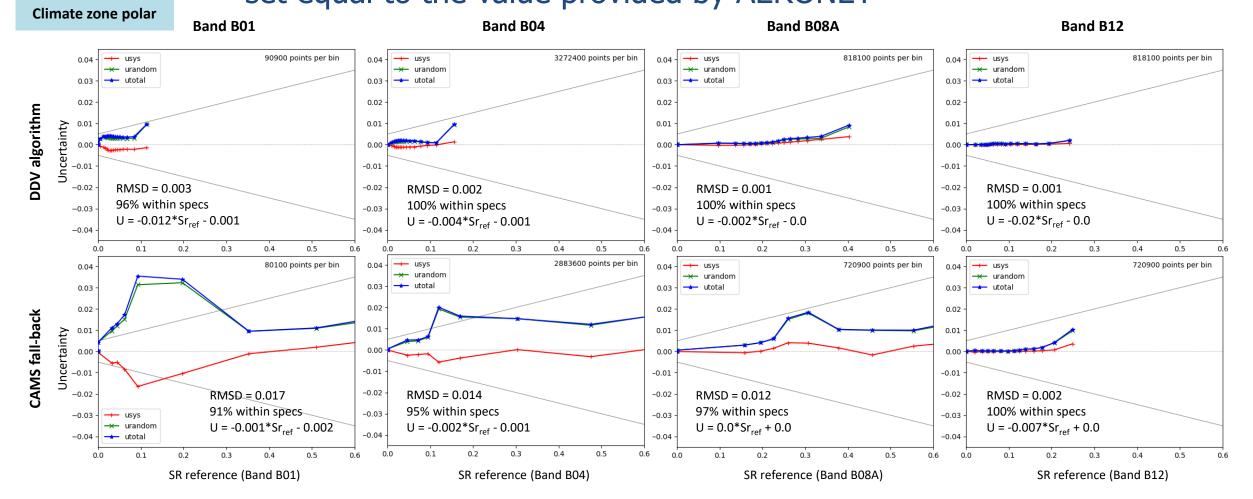


Figure 4: Uncertainty of SR retrieval due to aerosol amount for several Sentinel-2 bands and processing with DDV -algorithm and CAMS fall back, climate zone polar

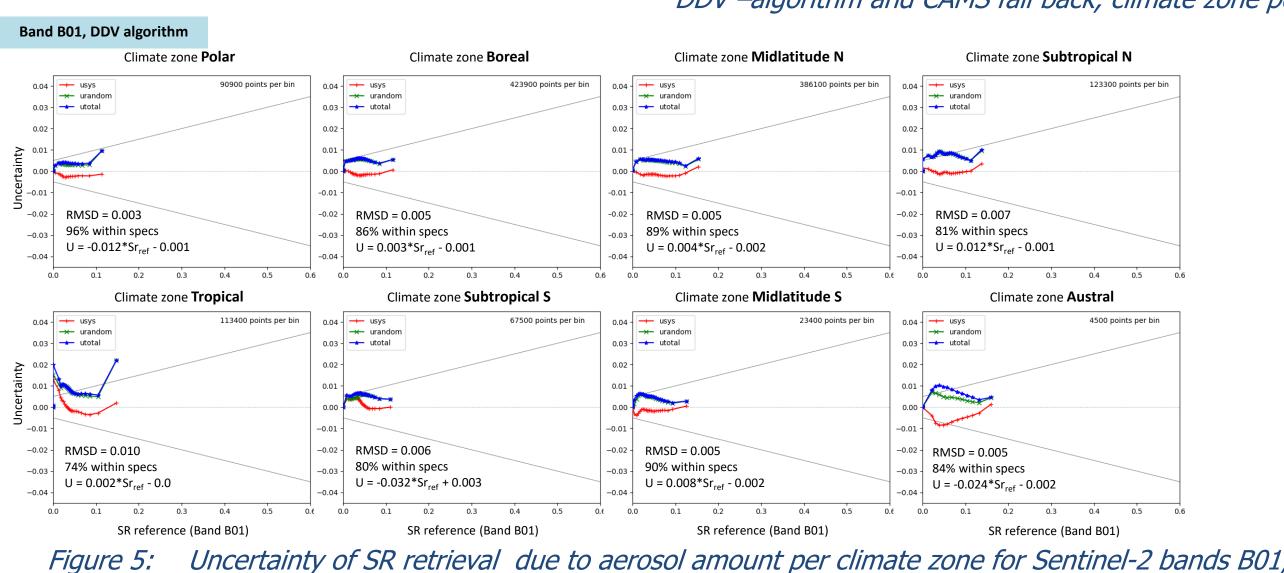
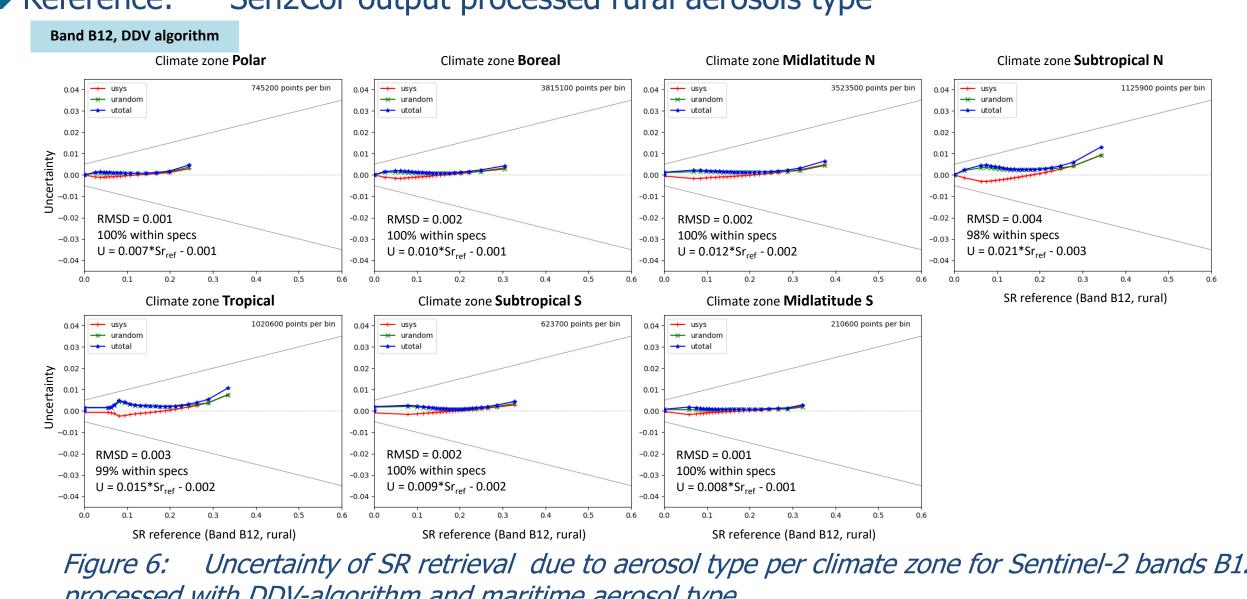


Figure 5: Uncertainty of SR retrieval due to aerosol amount per climate zone for Sentinel-2 bands B01, processed with DDV-algorithm

Uncertainty of SR retrieval due to aerosol type

Sen2Cor output processed rural aerosols type



Uncertainty of SR retrieval due to aerosol type per climate zone for Sentinel-2 bands B12, processed with DDV-algorithm and maritime aerosol type

Outcome and credits

- ❖ Uncertainty of SR retrieval with Sen2Cor DDV-algorithm due to aerosol retrieval is mostly within uncertainty goal of SR in spite of worse AOT retrieval performance.
- ❖ DDV-algorithm gives better results than CAMS fall-back, but it is not compared on the same products.
- ❖ Aerosol amount has larger influence on blue bands, aerosol type on SWIR bands.
- Uncertainty due to AOT retrieval is larger than uncertainty due to aerosol type.

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