

## Simulation of Sentinel-2 time series with SPOT (Take5) experiments

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Multitemp, Annecy, July 2015

## First Sentinel-2A image



# Sentinel-2 : a revolution for vegetation monitoring by satellite

## Main Sentinel-2 image features

- ▶ High **resolution** : 10m-20m
- ▶ Large **coverage** : all lands, 290 km swath
- ▶ Frequent **revisit** with constant view angles: 5 days with 2 satellites
- ▶ 13 **spectral** bands including SWIR

## Other revolutionary aspects

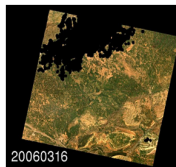
- ▶ Mission duration : 15 years (with follow-on satellites)
- ▶ Systematic acquisitions with high repetitivity
  - The user can rely on data availability once a month
  - => operational use (ex : Annual Land Cover)
- ▶ Free and open data
- ▶ Constant viewing angles :=> minimized directional effects
  - high quality time series

# "Ready to use" Products

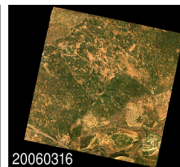
- ▶ Level 1C product :
  - Ortho-rectified images in TOA reflectance
- ▶ Level 2A Product :
  - As Level 1C, but surface reflectance
  - Cloud and Cloud shadows mask
  - Snow and Water masks
- ▶ Level 3A Product :
  - Synthesis of surface reflectance of cloudfree pixels over 1 month
- ▶ ESA will produce Level 1C, provide a toolbox for L2A
- ▶ An operational production of L2A is being discussed



Level 1C:



Level 2A:



Level 3A:

# Sentinel-2 : A revolution for methods

## Time

- ▶ SPOT, RapidEye : 1 to 4 images per year
- ▶ Sentinel-2 : 1 to 2 images per month

## Surface

- ▶ SPOT, R-E : 60\*60 km. Landscape and climate are homogeneous
- ▶ Sentinel-2 : 300\*300 km<sup>2</sup>: Landscape and climate are heterogeneous

## Clouds

- ▶ SPOT, R-E : use only almost cloud free images and detect clouds manually
- ▶ Sentinel-2 : all images are cloudy

## Use

- ▶ SPOT, R-E : Very supervised processing of an image, once in a while
- ▶ Sentinel-2: Automatic processing of large regions

# Need for Sentinel-2 simulated data sets

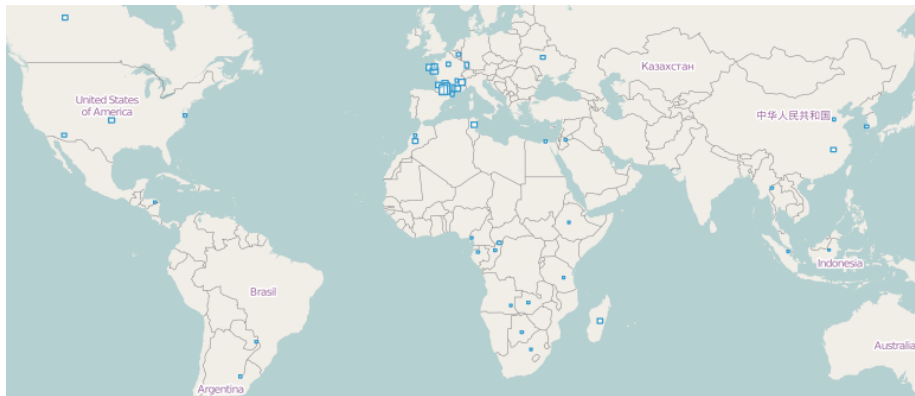
## Available simulation data sets in 2012

- ▶ Aerial acquisitions
  - High **resolution**, all S-2 **spectral** bands but no **revisit** and small **coverage**
- ▶ Other satellites
  - Formosat-2 : **revisit** and **resolution**
  - Landsat 5,7,8 : **coverage** and **spectral** bands
  - SPOT, R-E, DMC, **resolution coverage** and **revisit** but with changing angles

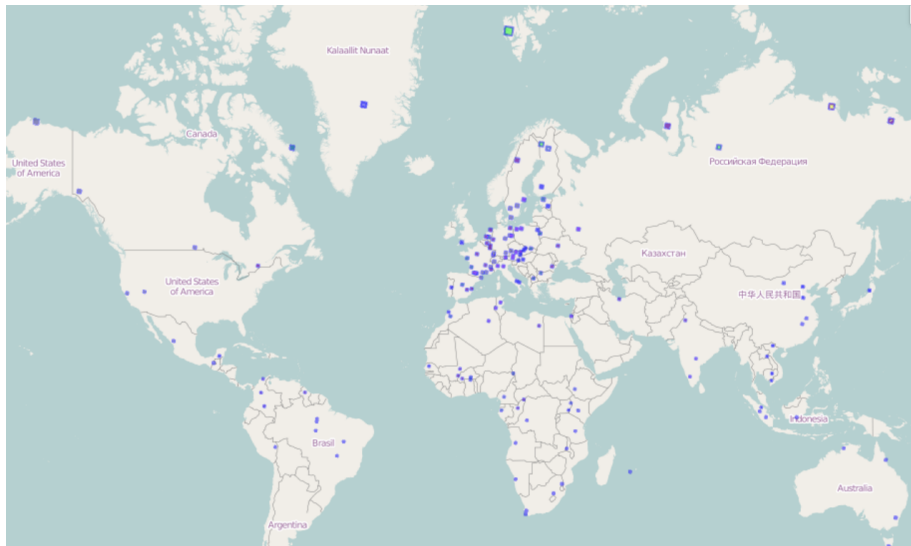
## SPOT (Take5) experiments

- ▶ Idea : change SPOT (4,5) orbit to simulate Sentinel-2 time series
- ▶ SPOT4 : February to June 2013, 45 sites, funded by CNES
- ▶ SPOT5 : April to August 2015, 150 sites, co-funded by ESA and CNES
- ▶ Features:
  - **revisit** : every 5 days, 28 acquisitions/site in 5 months
  - **resolution** : 20m
  - **coverage** : large sites 60\*60 km<sup>2</sup>, 120\*120, 300\*200
  - **spectral** : Only 4 bands, but with a SWIR band

## SPOT (Take5) sites, SPOT4 : 45, SPOT5, 150



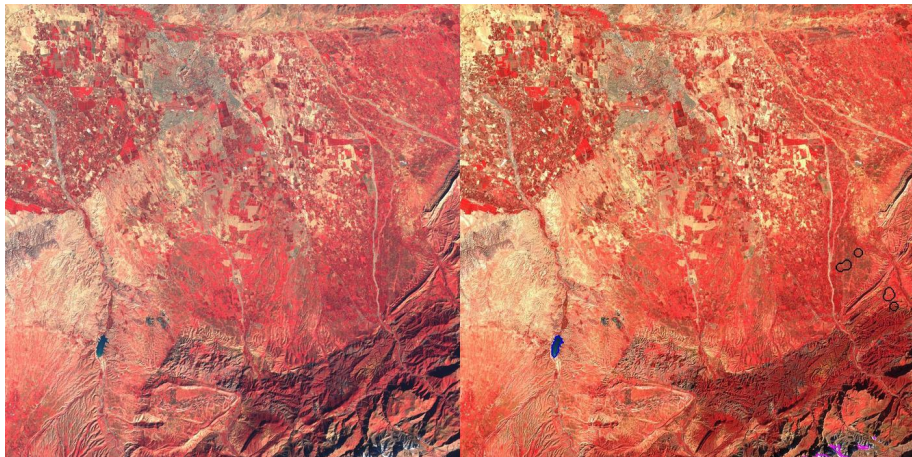
# SPOT (Take5) sites, SPOT4 : 45, SPOT5, 150





# Simulated Sentinel-2 time series from Take5 data

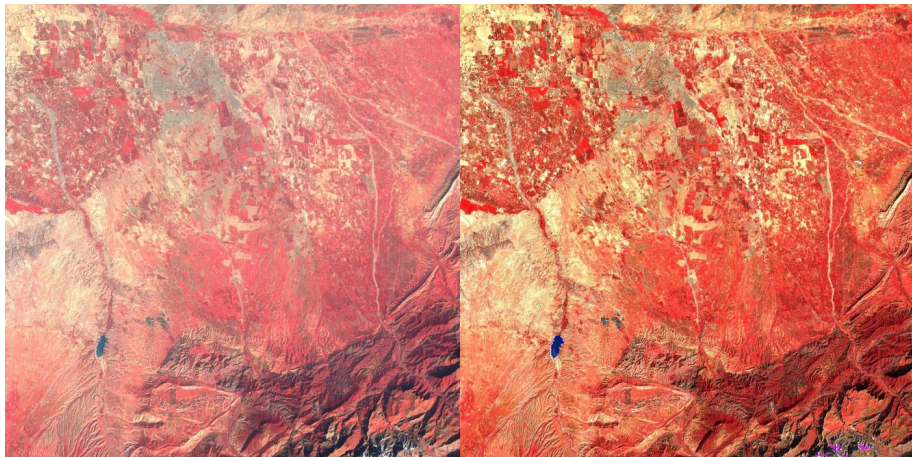
- ▶ Example over Morocco, February and March



TOA Reflectance (L1C) => Surface Reflectance (L2A)

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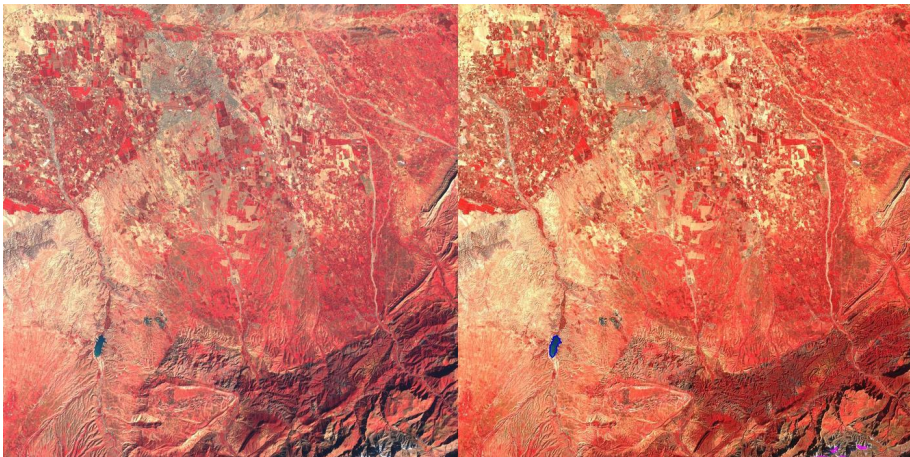
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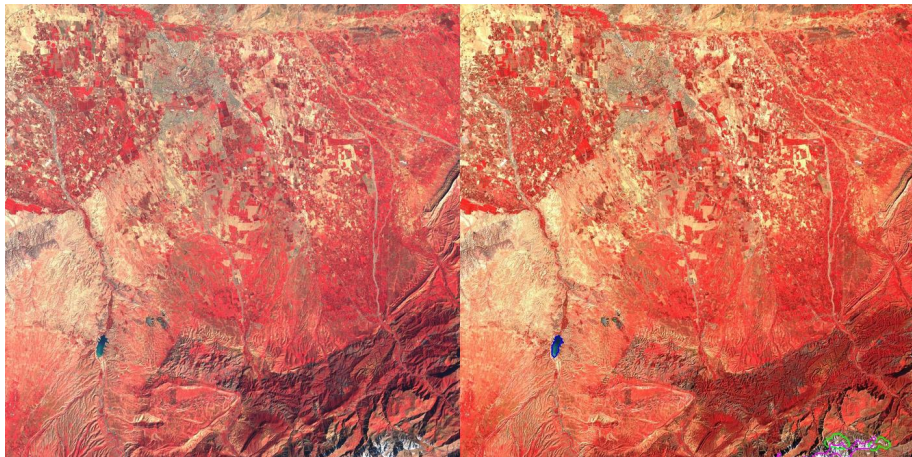
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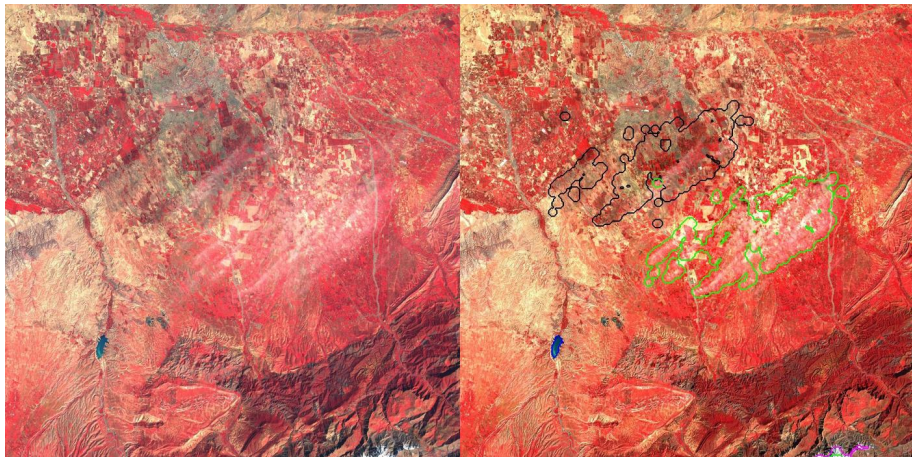
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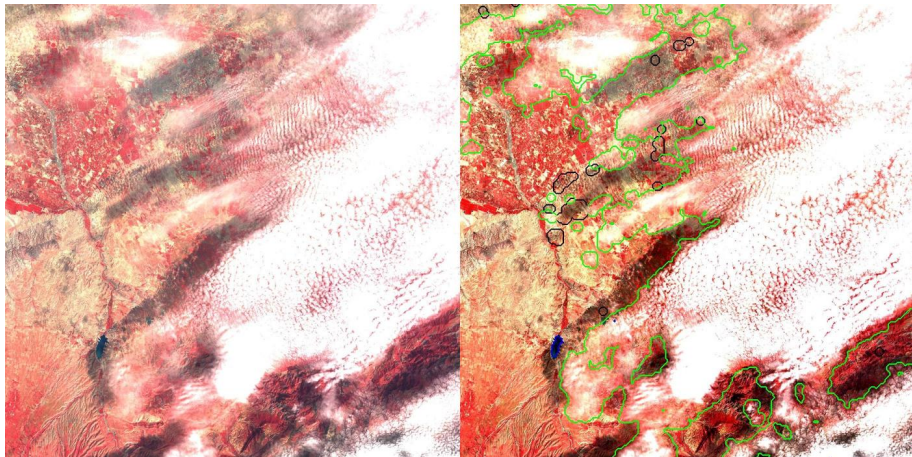
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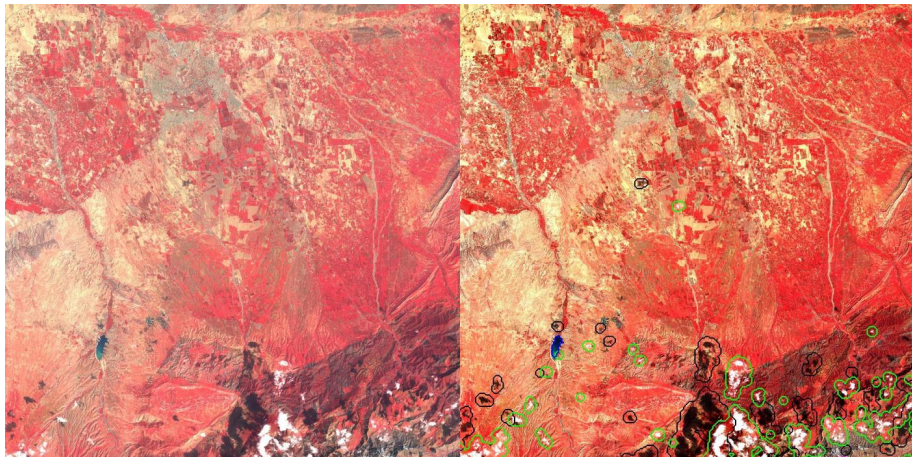
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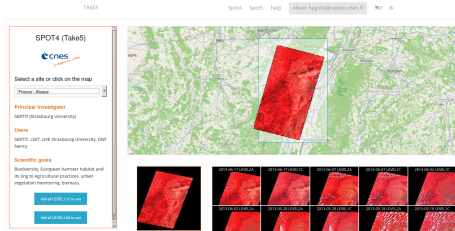
# Processing and Data Access

## Data Production

- ▶ L1C and L2A Images are produced at the French Land Data Center THEIA
- ▶ L2A are produced with MACCS method developed at CESBIO
  - MACCS : Multisensor Atmospheric Correction and Cloud Screening
  - Applicable to Formosat-2, Take5, LANDSAT (5,7,8), Venµs and Sentinel-
- ▶ MACCS operational version (CNES) now implemented at THEIA

## Free Data download

- ▶ from THEIA web site : <https://spot-take5.org/>





## MACCS S2 Cloud Mask method

### Clouds are bright

- ▶ Threshold on blue reflectance (rather high)
- ▶ Confusion with brights surfaces, bare soils, buildings

### Clouds are high

- ▶ Threshold on 1.38  $\mu\text{m}$  spectral band (LANDSAT 8, Sentinel-2A)
- ▶ Confusions with mountains for low clouds

### Clouds move : multi-temporal method

- ▶ Threshold on variation between successive images in the blue
- ▶ Cloud must be whiter than previous cloud free image
- ▶ Correlation with previous images

### Clouds are not snow

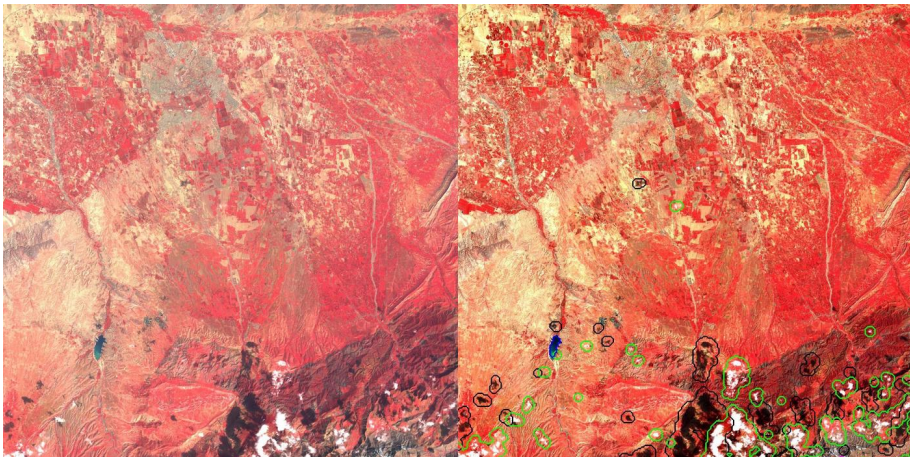
- ▶ Threshold on snow index ( green-SWIR bands) and on red band

### Clouds have fuzzy edges

- ▶ Dilation of Cloud Mask

## Level2A : surface reflectances + cloud mask

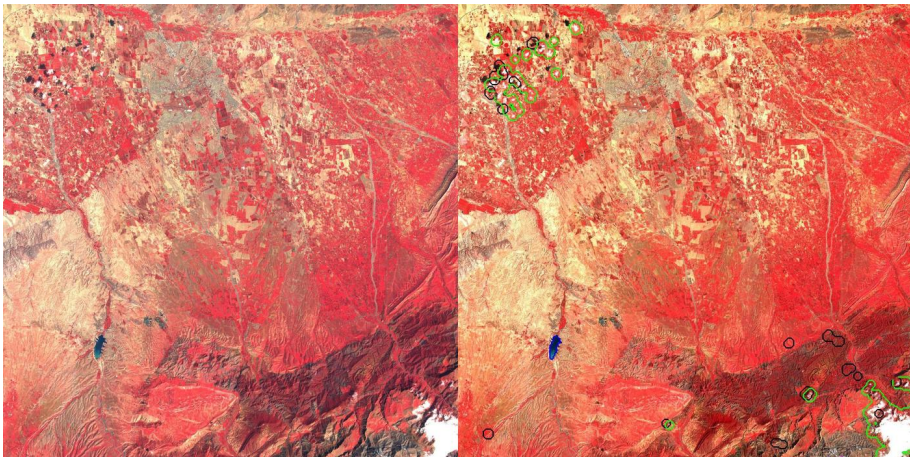
- ▶ Multi-temporal detection of clouds



TOA Reflectance (L1C) => Surface Reflectance (L2A)

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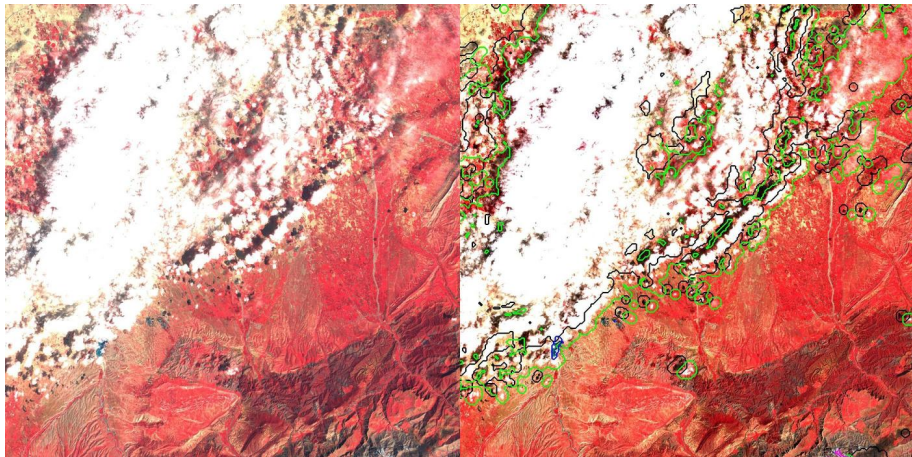
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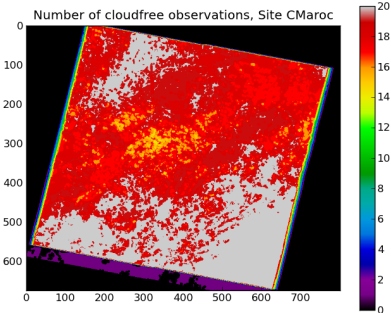
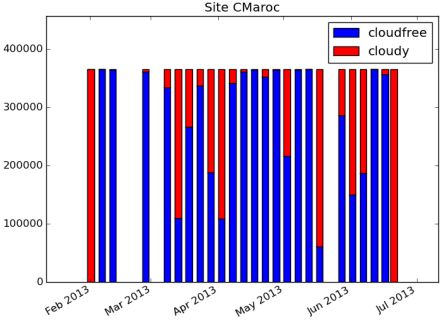
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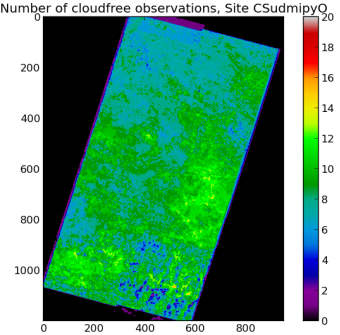
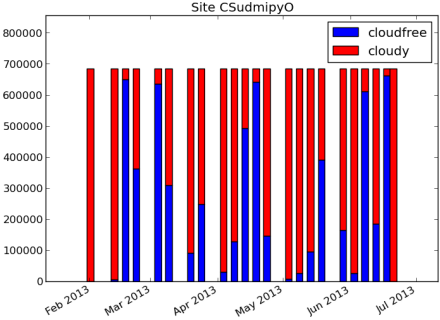
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# Cloud Free Observations



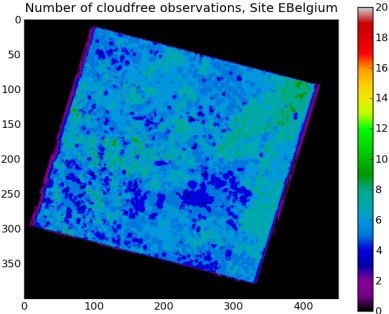
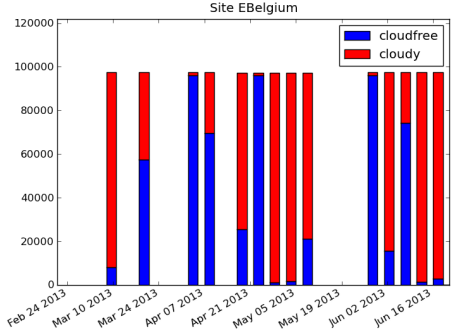
Morocco Tensift

# Cloud Free Observations



France Midi-Pyrénées

# Cloud Free Observations



Belgium

# Atmospheric correction

## MACCS atmospheric correction

- ▶ MACCS takes into account :
  - Absorption
  - Scattering by molecules and aerosols
  - Aerosol parameters are estimated
  - Adjacency effects
  - Illumination effects due to topography

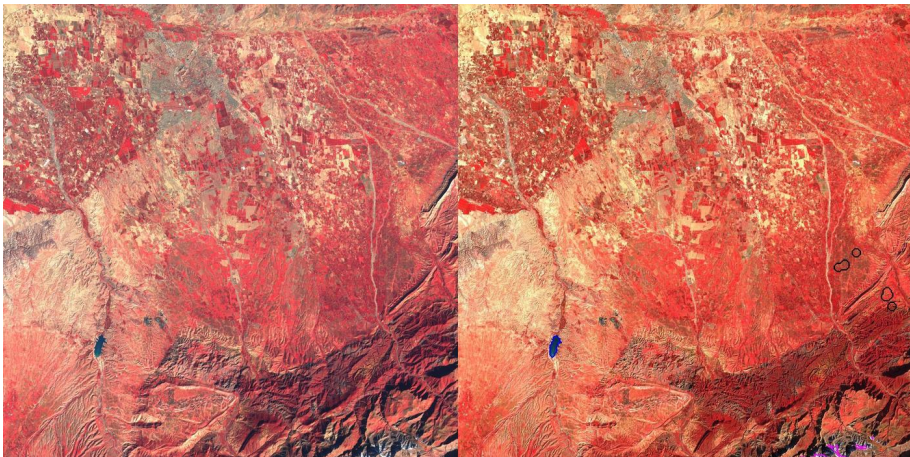
## Aerosol estimation method within MACCS

- ▶ Classical methods rely on multi-spectral relations above vegetation
- ▶ MACCS also uses a multi-temporal method to estimate aerosol content
  - two successive L2A images should be similar (at 200 m resolution)
  - thanks to constant viewing angles
- ▶ No blue band in SPOT satellites => Only multi-temporal in Take5
- ▶ the aerosol model is constant per site



# Multi-temporal detection of aerosols

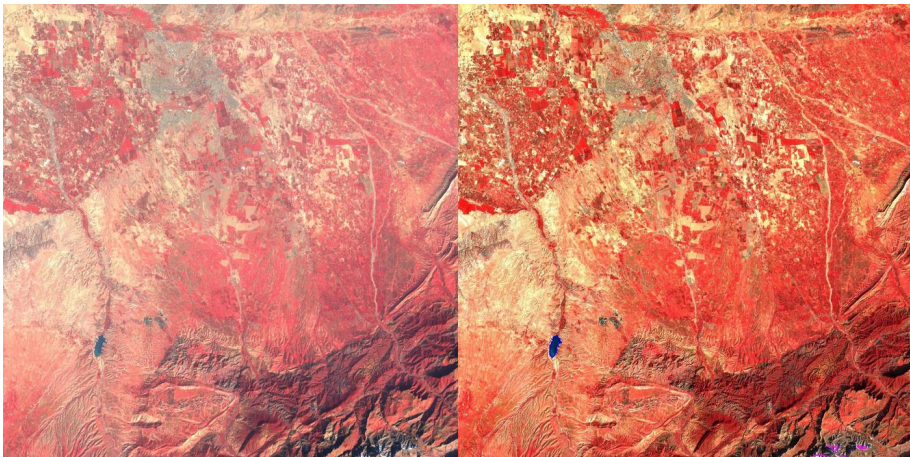
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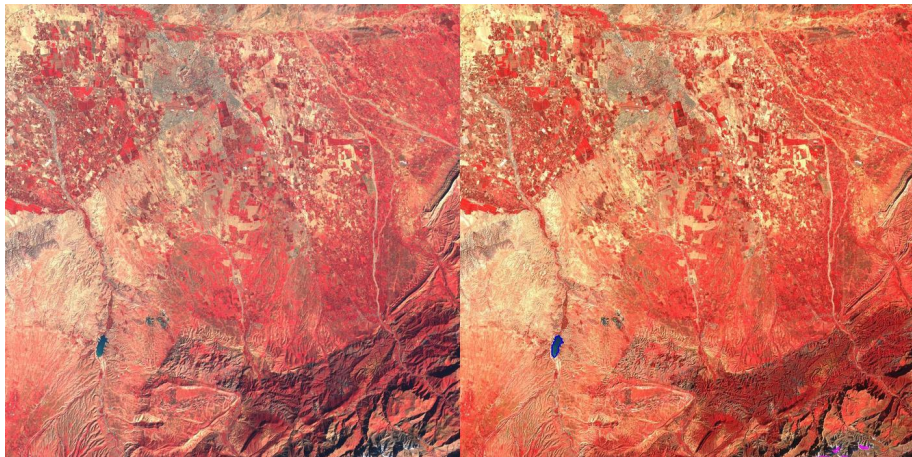
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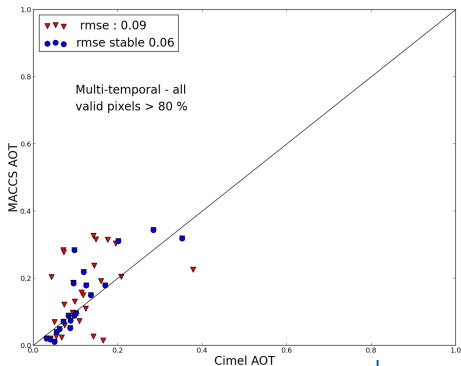


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# Performances for SPOT4 (Take5)

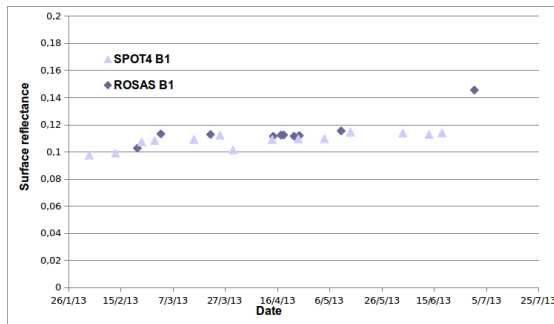
## Aerosol Validation

- ▶ Aerosol validation sites with a cimel nearby
  - Europe : Arcachon, Carpentras, Seysse, Le Fauga, Palaiseau, Paris, Kyiv
  - Africa : Saada, Ouarzazate (Morocco), Ben salem (Tunisia)
  - USA : Wallops, Cart Site
  - Asia : Gwangjiu, Korea
- ▶ same aerosol model for all sites



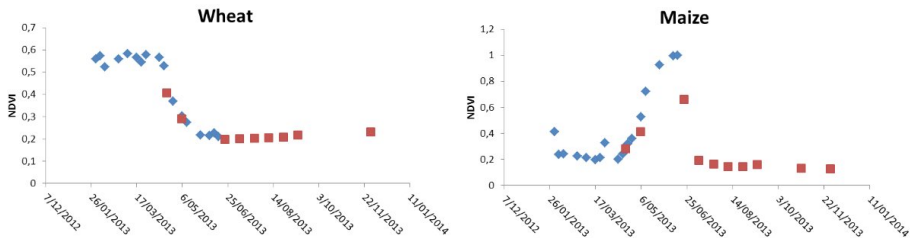
## Surface Reflectance validation using La Crau Rosas station

- ▶ CNES maintains an operational station for absolute calibration at La Crau, France
  - A CIMEL instrument characterises the surface reflectance and the atmosphere
  - Every 90 minutes
  - Operationally used for satellite “vicarious calibration”
  - May be used for the validation of surface reflectances



# Simulated Sentinel-2 time series from Take5 data

- ▶ Smoothness of reflectance profiles (Morocco)



Blue Take5, Red Landsat8

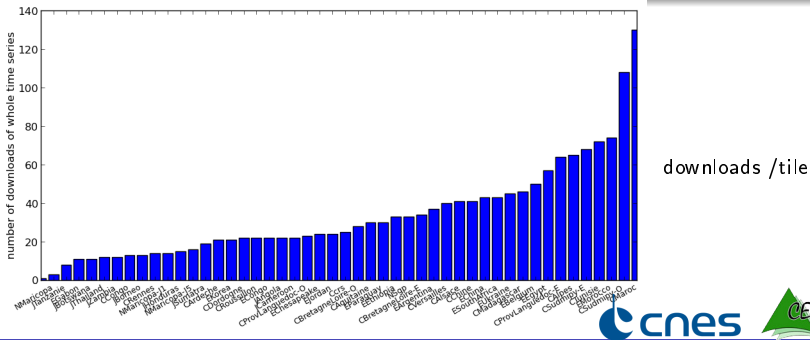
# Data usage

## SPOT4 (Take5) statistics at end of June 2015

- ▶ 3960 downloads among which 1680 full time series (37/site)
- ▶ 77% of downloads are Level 2A.
- ▶ 700 different email addresses, at least 30 countries
  - Fr,It,De,Ma,Usa,Be,Ca,Mg,Tu,Es,Za,Eg,Ru,Dk,Si
  - Cn,Br,No,Ar,At,Se,bf,Uk,Pl,Cz,Pt,Cn,Dz,Ro,Rs

## SPOT5 (Take5) statistics at end of June 2015

- ▶ Service opened on July the 2nd, already more than 100 users



## Application examples



- ▶ SPOT5(Take5) series near Valencia, Spain (where paella grows)
  - Bare soil in April
  - Rice watered beginning of May
  - Full development, end of June
- ▶ Applications
  - Identify the crop => Land cover
  - Estimate the sowing date => crop modelling
  - Monitor crop growth => yield
  - Works in conjunction with Sentinel-1



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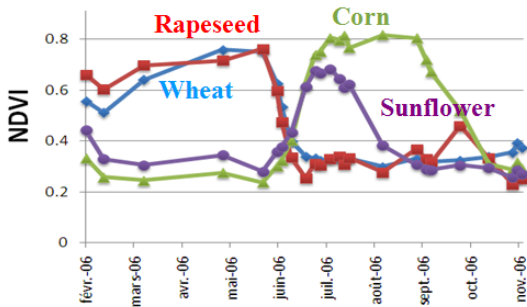


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# Use of time series for land cover

## Idea

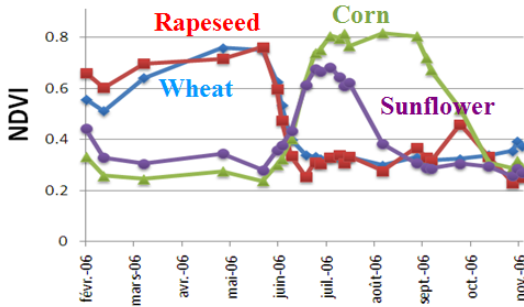
- ▶ Vegetation types may be separated thanks to time series



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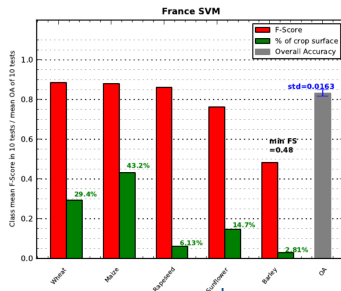
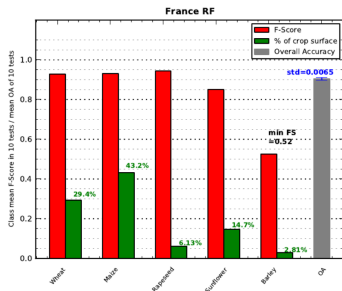
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# Use of time series for Land Cover

## ESA's Sentinel-2 Agri project

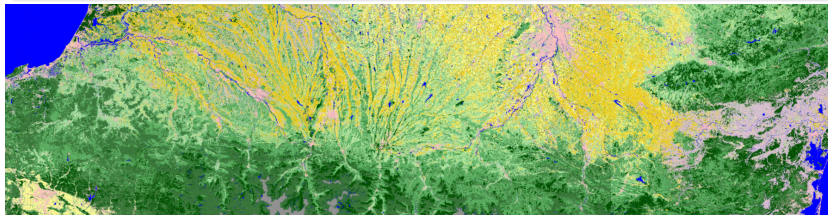
- ▶ Consortium : UC Louvain, CESBIO, CS (France, Romania)
- ▶ 4 products : Composites, Crop Mask, Crop Type map, LAI
  - 9 SPOT4 (Take5) sites processed in the first phase
  - 3 full countries to be processed with Sentinel-2 in 2016
  - Explained in Inglada et al 2015, remote sensing, submitted
- ▶ The crop type product is a land cover map specialised for agriculture
- ▶ Production system will be open source, based on Orfeo Tool Box



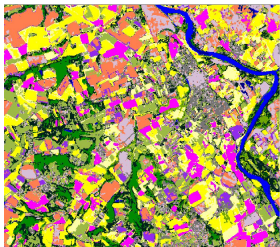
# Use of time series for Land Cover

## THEIA's project for France Annual Land Cover Map

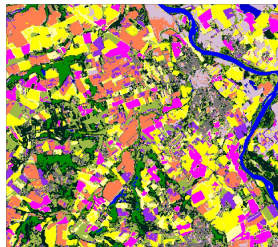
- ▶ THEIA land data center will produce annual land cover maps
  - based on Sentinel-2 data
- ▶ Based on CESBIO methods also used for Sentinel-2 agri
- ▶ 20-25 classes, natural vegetation and agriculture (main crops)
- ▶ Issued at end of each year, start end of 2016



## Multi-Temporal classification



West Track



East Track

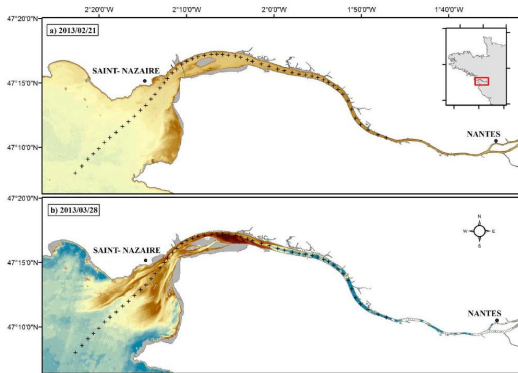
### Comparison of lan cover maps from overlapping SPOT Take5 sites

- ▶ 90% of pixels have the same class in both images

# Coastal water monitoring

## water colour

- ▶ Universities of Bordeaux and Nantes (P.Gernez, V.Lafon)
- ▶ Monitoring of suspended matter within estuaries (Gironde, Loire)
- ▶ High turbidity => Oxygen loss
- ▶ Avoid releasing mud from water treatment plants when water is very turbid
- ▶ Users happy with Level 2A quality, although optimized for land surfaces
- ▶ Gernez et al, 2015 MDPI remote sensing

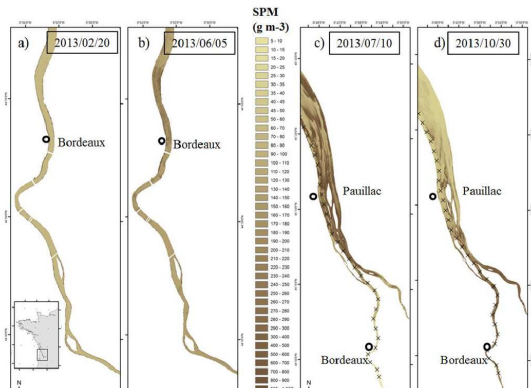




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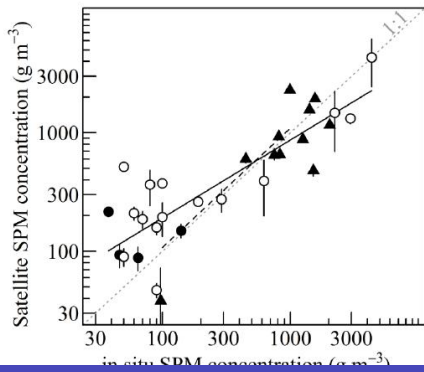
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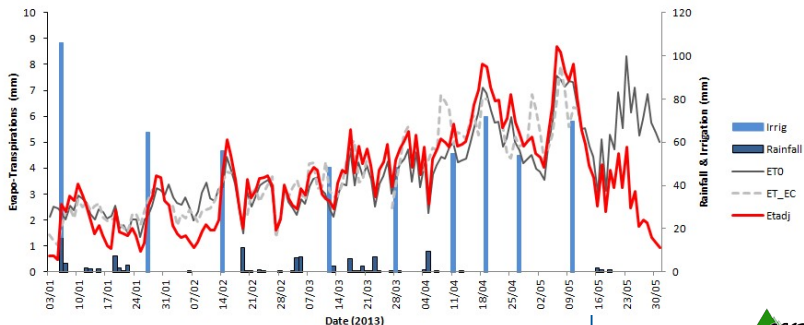
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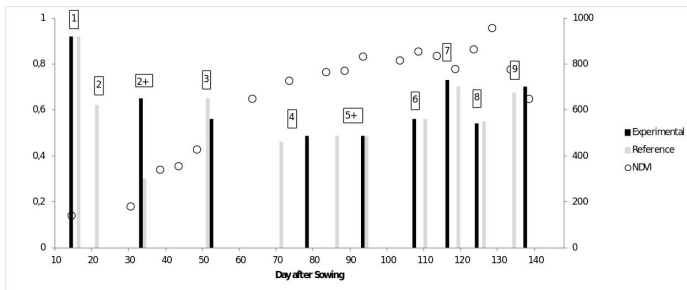
# Irrigation scheduling in real time in Morocco

## Expérimentation

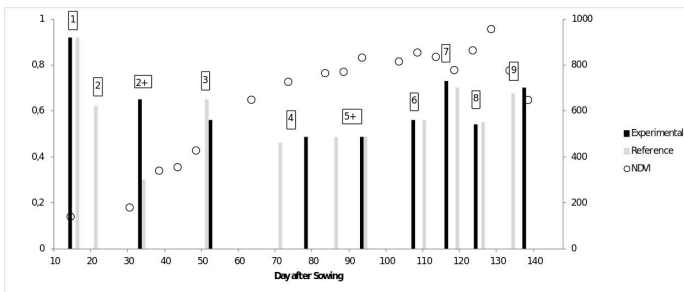
- ▶ One wheat plot is watered according to recommendations from SAMIR model,
- ▶ One reference plot is watered upon farmers decision
- ▶ SAMIR is an evapo transpiration model, uses Weather data as input
- ▶ Vegetation development is also ingested, taken from SPOT (Take5) data



# Irrigation scheduling in real time in Morocco



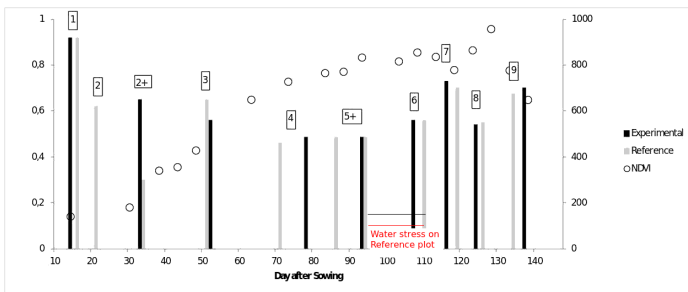
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## Résultats

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  - Farmer 1 - 0 Satellite

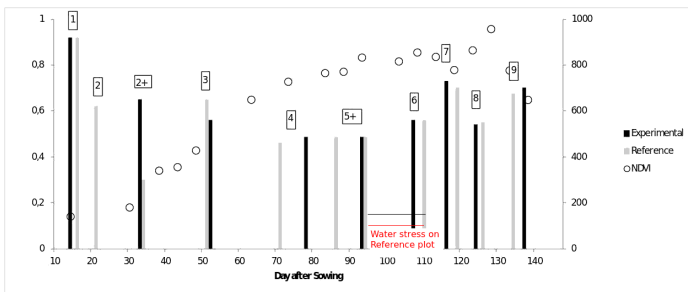
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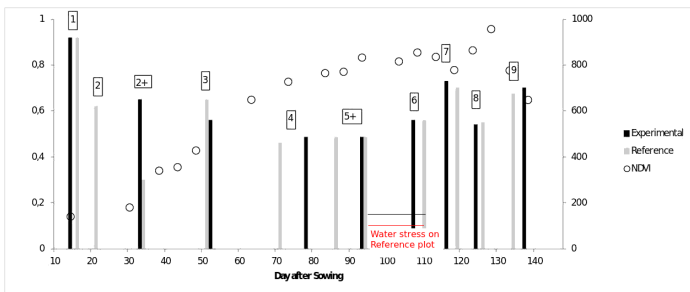
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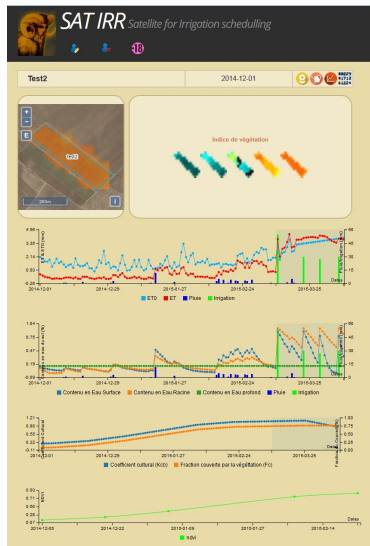
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- ▶ Operational irrigation scheduling in semi-arid landscape seems possible Sentinel-2
- ▶ Le Page et al, A Life-Size and Near Real-Time Test of Irrigation Scheduling with a Sentinel-2 Like Time Series (SPOT4-Take5) in Morocco, MDPI remote sensing,



# Irrigation

- ▶ Michel Le Page, CESBIO/IRD, Université Cadi Ayyad Marrakech
- ▶ Prototype service for helping farmers decide irrigation: SATIRR
  - <http://osr-cesbio.ups-tlse.fr/Satirr>
  - Experiment in 2013 with SPOT4 (Take5), Le Page et al 2014, remote sensing
  - Use of LANDSAT L2A (in 2015) to monitor vegetation cover (NDVI)
  - Use of the closest weather station (with rain gauge)
  - Integration of weather forecast (not to water if rain forecasted on the next day)
  - Estimation of the amount of water to provide
- ▶ Operational test with Sentinel-2 in 2016



# Conclusions

## Take5 : A successful experiment

- ▶ Download data from <https://spot-take5.org>
- ▶ Everything worked well in a short time frame: satellite, processors
- ▶ Large number of users shows how Sentinel-2 data are awaited.
- ▶ Very large diversity of operational applications expected for Sentinel-2
- ▶ Level 2A Multi-temporal methods are operational even without a blue band
  - The French Land Data Center (THEIA) will produce Sentinel-2 L2A data over 5 M km<sup>2</sup>, using MACCS
  - Already used to produce LANDSAT 8 L2A data
  - Extension to the whole world is discussed with ESA

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## Where to see more SPOT (Take5) results

- ▶ A general audience film, search "Take5 movie CESBIO"
- ▶ A special issue at MDPI remote sensing (first papers released soon)
- ▶ A special event at Living Planet Symposium, Prague, May 2016
- ▶ A "Multitemp" blog <http://www.cesbio.ups-tlse.fr/multitemp/>

