

# Landscape heterogeneity around flux measurement stations investigated through Sentinel-2 and PROBA-V satellite imagery

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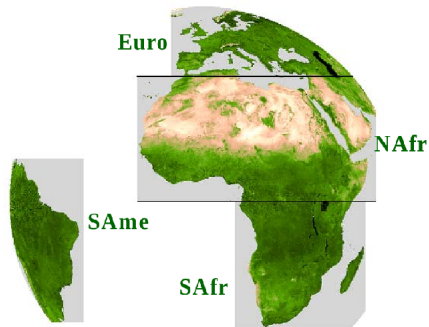
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**SPIE.** REMOTE SENSING

Berlin, 11-13 September 2018

# LSA-SAF ET products



LSA-SAF coverage

- Half-hourly ET
- Daily ET

For more information and data access:

<http://lsa-saf.eumetsat.int/>

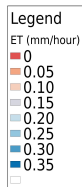
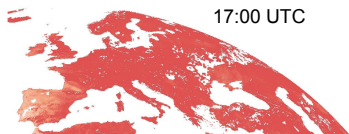
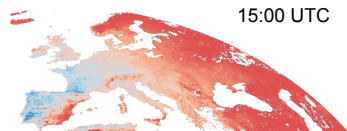
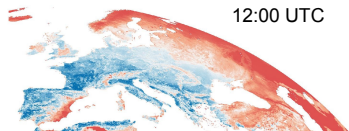
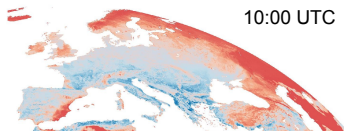
The EUMETSAT  
Network of  
Satellite Application  
Facilities

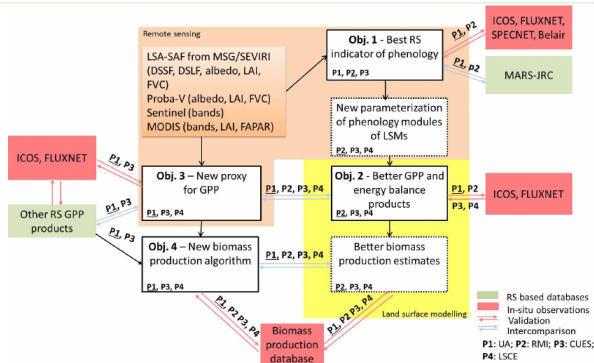
 **LSA SAF**  
Land Surface Analysis

 **EUMETSAT**

# LSA-SAF ET products (3)

ET Europe March 12, 2014





**Obj. 1** - Test new RS products (Sentinel; PROBA-V): focus on “functional phenology indicators”.

**Obj. 2** - New product from Obj. #1 → reparameterize phenology modules of Land surface models → better estimates of GPP, evapotranspiration, energy balance.

**Obj. 3** - New product from Obj. #1 → new GPP product: e.g.  $GPP = f(\text{new RS product})$ ; or  $GPP = f(\text{new RS product}) * PAR$ ; or  $GPP = f(\text{new RS product}) * PAR * \epsilon$ ; or new approaches.

**Obj. 4** - Alternative NPP model:  $NPP = \text{new GPP} * \text{NPP/GPP ratio}$ . New GPP from obj. 2 or 3 (or even NDVI-based GPP);  $NPP/GPP = \text{function}(\text{management \& site fertility})$ .



# Why is it important?

- Important to know what are EC towers measuring
- Affects measurements in general
- Representativeness
- Energy balance closure

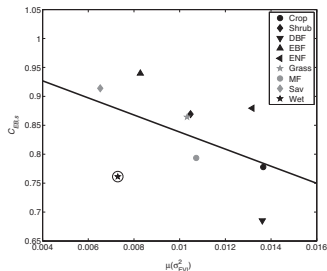


Fig. 7. Energy balance closure for FLUXNET eddy covariance research sites ( $C_{EB,s}$ ) as a function of the variance of the MODIS enhanced vegetation index (EVI) for the  $20 \times 20$  km region surrounding each eddy covariance tower and averaged per ecosystem type. The solid line is the best-fit relationship after removing wetland ecosystem types and is defined as  $C_{EB,s} = -14.76\mu(\sigma_{EVI}^2) + 0.99$ . Excluding wetland

(Stoy *et al*, Agriculture and Forest Meteorology (2013))

Studied variable: NDVI

Main assumptions:

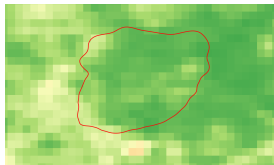
- NDVI: relevant determinant of fluxes
- Homogeneous areas exhibit lower NDVI variability
- Heterogeneous areas exhibit low spatial autocorrelation

# Proba-V and S2: opportunity

## Proba-V



Spatial resolution: 100 m  
Frequency: 5 days

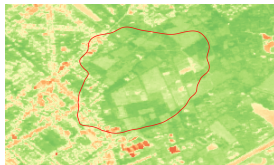


NDVI (Proba-V) - 2016-06-06  
(PROBA-V Mission Exploitation Platform: <https://proba-v-mep.esa.int>)

## Sentinel-2



Spatial resolution: 20 m  
Frequency: 5 days (Equator, 2 satellites)



NDVI (S2) - 2016-06-07

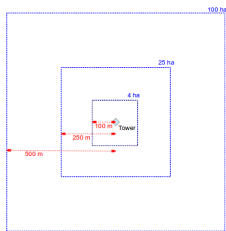


Real color view

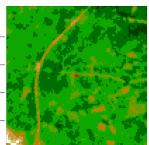
## General

- to investigate the heterogeneity of the landscape at different points in time and over different spatial extents around EC measurement sites on the basis of multivariate NDVI derived from Proba-V and S2 observations
- The overall purpose: to better characterize EC sites used in val/cal models

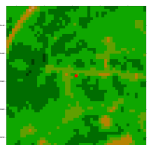
# Spatial extent of analysis



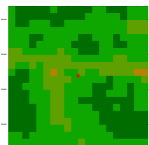
a



b (100 ha)



c (25 ha)



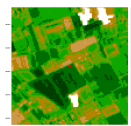
d (4 ha)

- Central tendency and dispersion statistics
- Mean Spatial Heterogeneity Index (SHI):

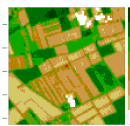
$$SHI_{ij} = \sum_{a=-1}^1 \sum_{b=-1}^1 |NDVI(i, j) - NDVI(i + a, j + b)| \quad (1)$$

$$MeanSHI = \frac{1}{m \cdot n} \sum_{i=1}^{m-1} \sum_{j=1}^{n-1} SHI_{ij} \quad (2)$$

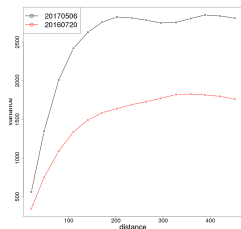
- fitting semi-variogram



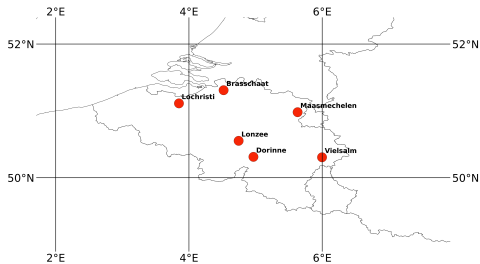
2016-07-20



2017-05-06



# Study sites



**ICOS** |  National Network Belgium

# Study sites (2)

Brasschaat



Lochristi



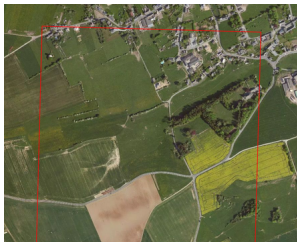
Lonzee



Maasmechelen



Dorinne



Vielsalm





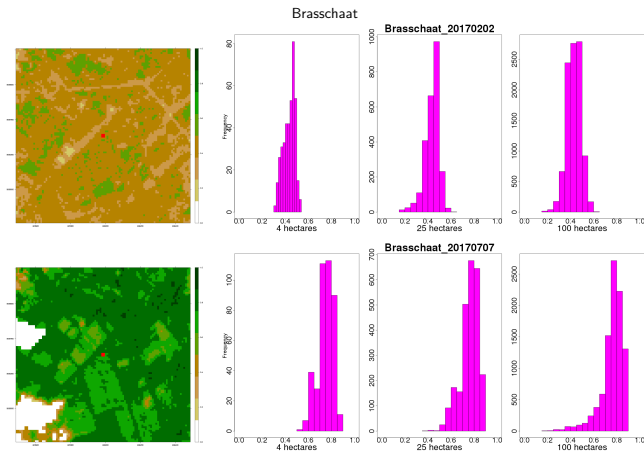


Figure: Histograms for winter and summer NDVI images at Brasschaat and Lonzee

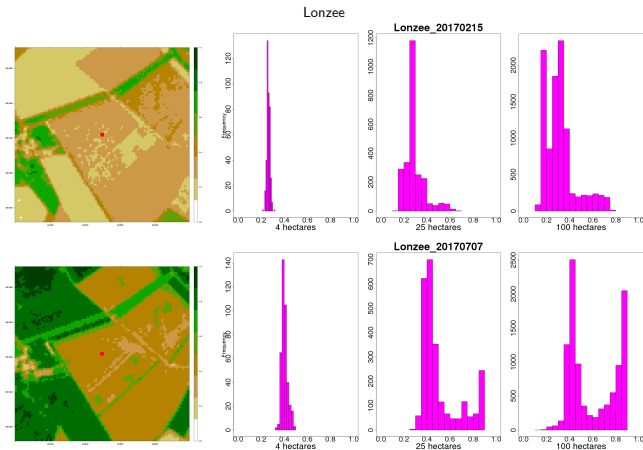
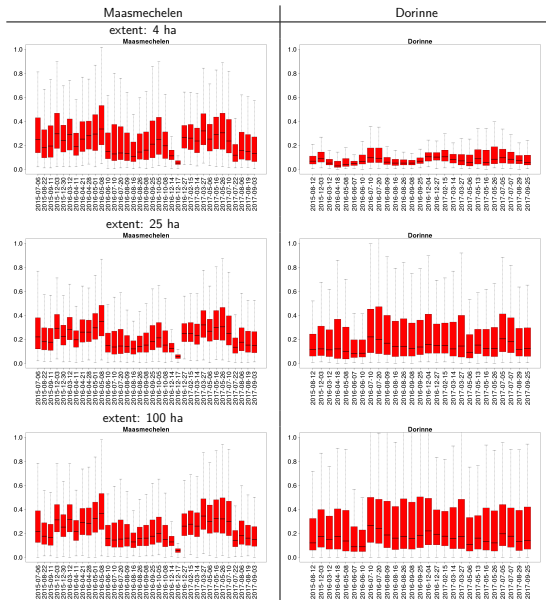


Figure: Histograms for winter and summer NDVI images at Brasschaat and Lonzee

# Results (SHI)



## Maasmechelen

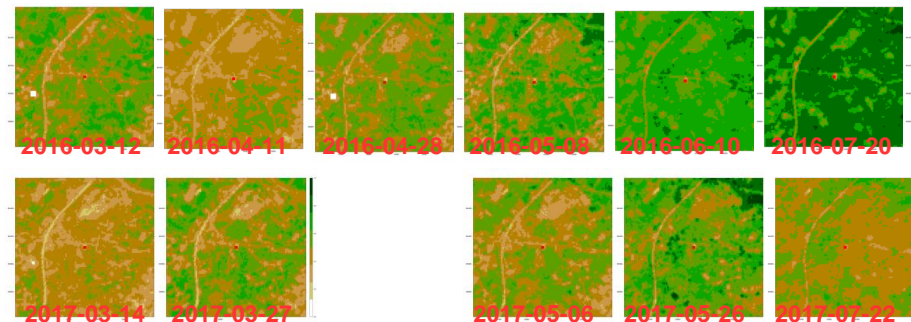


Figure: NDVI images for different dates in 2016 and 2017 across an area of 100 hectares around the Maasmechelen EC measurement site

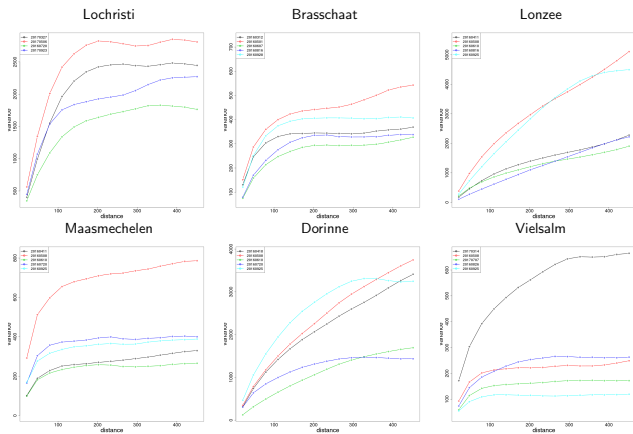
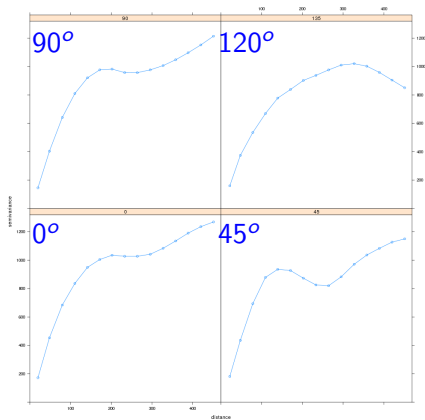


Figure: variograms for different sites over the NDVI images of the study sites

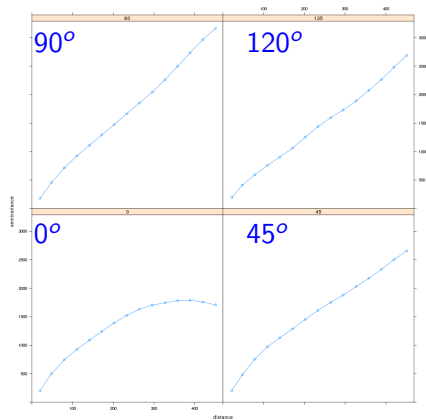
# Directional variograms

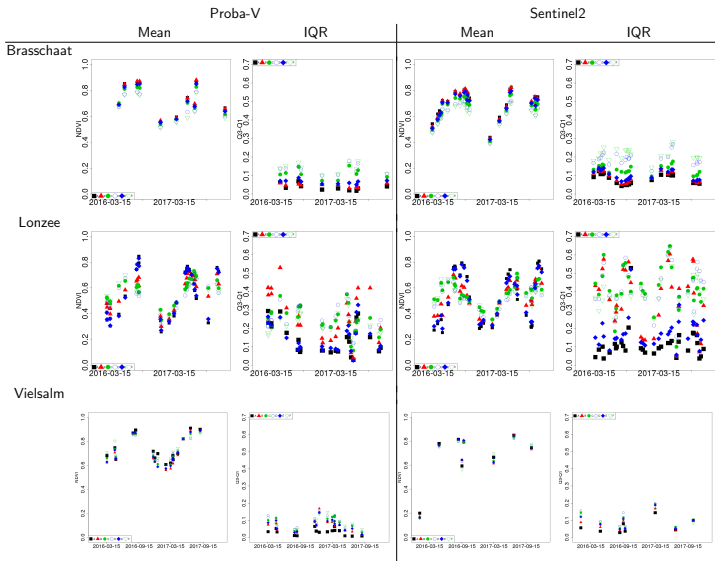
Lonzeo

2017-02-15



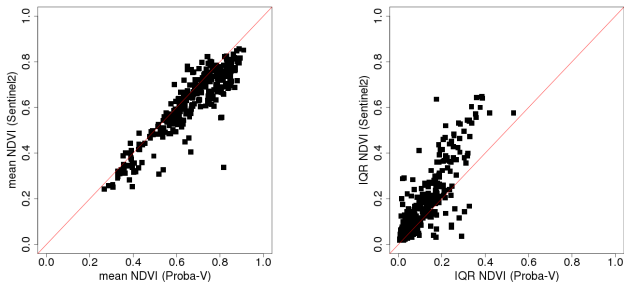
2017-07-07





A=25 ha; B=100 ha; C=400 ha; D=1600 ha; E=Footprint climatology; F=MSG

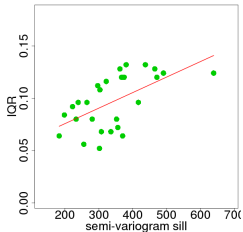




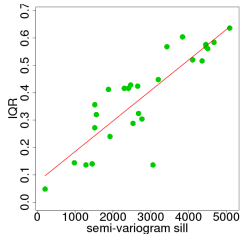
**Figure:** Scatterplot of NDVI mean and Interquartile Range (IQR) as derived from Proba-V and Sentinel2



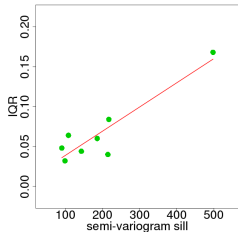
# Semi-variogram Sill versus IQR



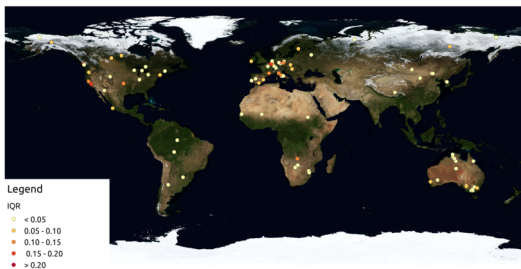
Brasschaat



Lonzee



Vielsalm



EC sites classification based on Mean NDVI IQR derived from Proba-V NDVI (100 m resolution)

# Conclusions

- S2 and Proba-V NDVI: valuable resource to investigate spatial heterogeneity in the vicinity of flux measurement stations
- S2 and Proba-V can be used synergetically at global or continental scale
- First order statistics: insight on NDVI variability across a certain area. No spatial structure.
- SHI: overview of time varying heterogeneity assessed when comparing adjacent neighbours only
- Semi-variograms: a more versatile tool. Different lag-distances and orientations can be considered
- Different approaches complement each other

The next step:

- Investigate the impact of NDVI spatio-temporal variability in measured/modelled fluxes

# Acknowledgements

The ECOPROPHET consortium



<http://ecoprophet.meteo.be>

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