

New Perspectives on Predicting Ecosystem Phenological Metrics based on Sentinel-2 satellite data

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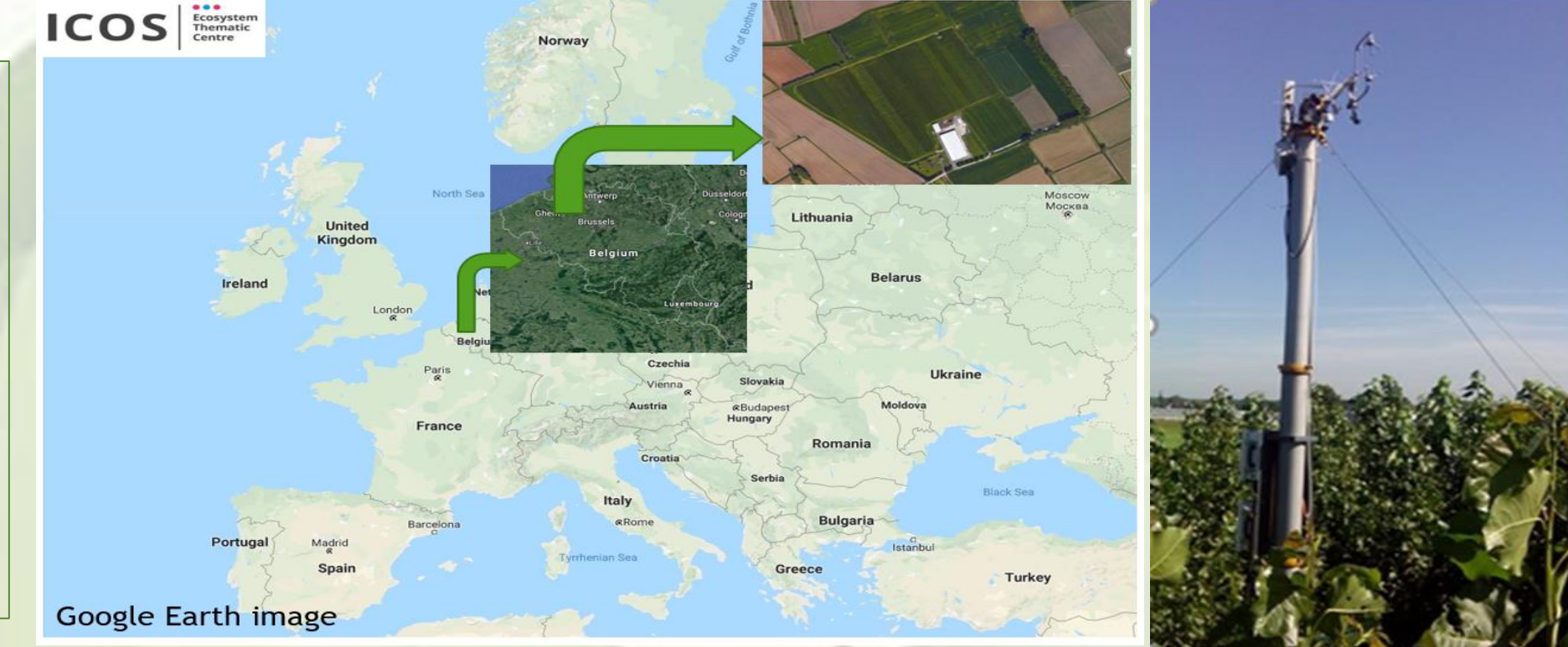
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Aims

- To improve estimation of Start and End of Season (SOS/EOS) of a Poplar plantation in Belgium.
- To test several structural and chlorophyll sensitive Vegetation Indices (Vis) derived from Sentinel-2 (e.g. Modified Terrestrial Difference Vegetation Index (MTCI) & Normalized Difference Vegetation Index (NDVI)).
- To compare different Remote Sensing indices from Sentinel-2 (e.g. Pigment Specific Simple Ratio (PSSR) & Green Normalized Difference Vegetation Index (GNDVI)).

Fluxnet site

Flux measurements in this study were performed at a bioenergy plantation established in Belgium in 2010.



Data & Methods

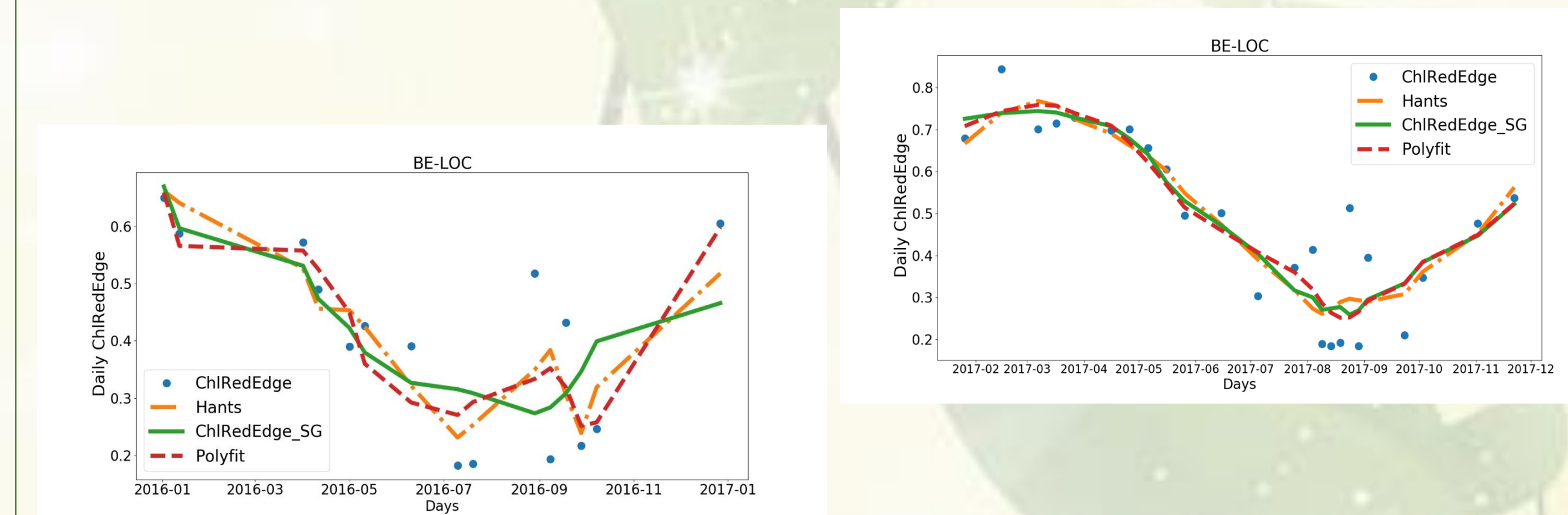
| Vegetation Indices | Spectral bands & Calculation |
|--------------------|---|
| NDVI | $(B08-B04)/(B08+B04)$ |
| MTCI | $(B06-B05)/(B05-B04)$ |
| CHL-RED-EDGE | $(B07/B05)^{-1}$ |
| EVI | $2.5 \cdot (B08 - B04) / ((B08 + 6 \cdot B04 - 7.5 \cdot B02) + 1)$ |
| GNDVI | $(B08-B03)/(B08+B03)$ |
| MCARI | $((B05-B03)-0.2 \cdot (B05-B03)) \cdot (B05/B04)$ |
| PSSR | $B08/B04$ |

B2: 490nm, B3: 560nm, B4:665nm, B5:705nm, B6:740 nm, B8:842nm

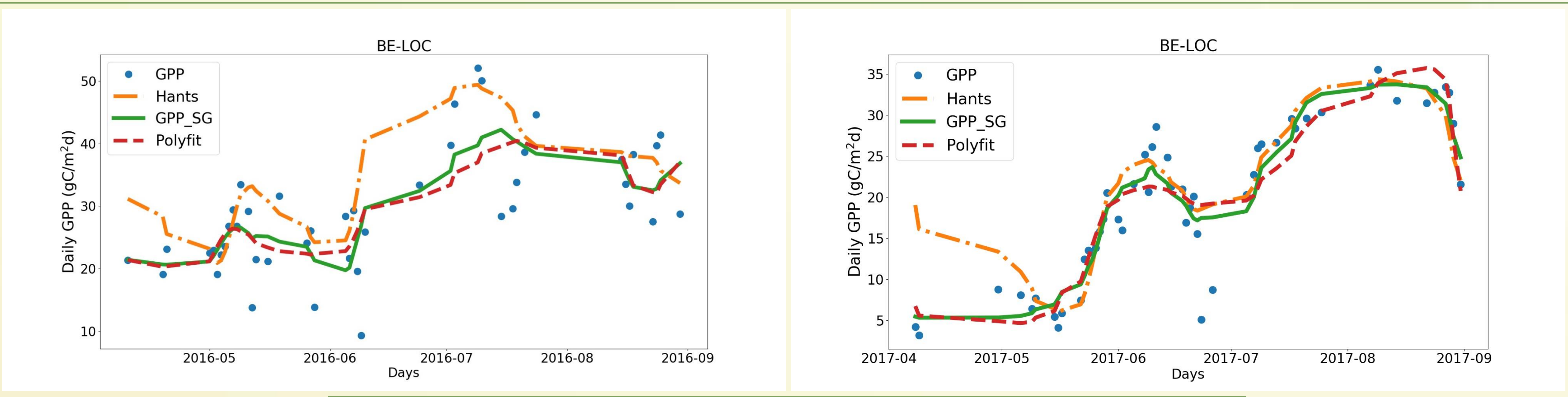
- Experimental site data
- Flux data: Gross Primary Production (GPP), Leaf Area Index (LAI)
- Phenological extraction methods (Smoothing algorithm functions)
 - Savitzky-Golay filtering method (Savgol)
 - Harmonic Analysis of time series method (Hants)
 - Polynomial function (Polyfit method)
- Estimating the Start and End of the Season
- Estimating the Start and End of the Season by comparing the VIs derived by Satellite data with First derivative method
- Evaluate the result
- Defining which VIs are ideal proxies for vegetation phenology

Vegetation Indices* Result3*

The spectral bands of Sentinel-2 offer the opportunity to calculate VI related to pigment content such as MTCI.



GPP 2016 & 2017 *Result1*

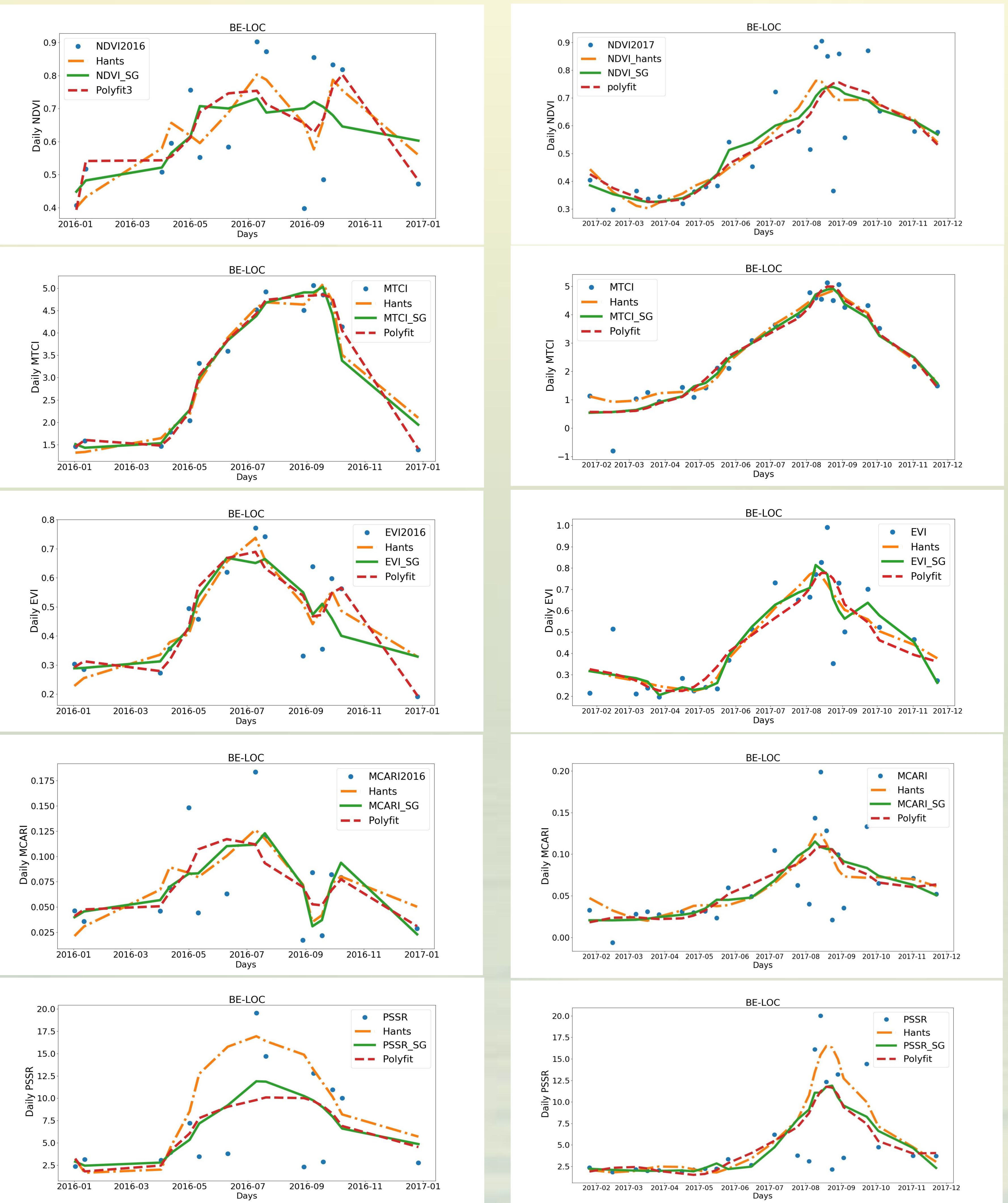


Each line represents smoothing method (Savitzky Golay, Hants, and Polyfit method).

| | Start of Season | End of Season | Length of Season |
|---------------------|-----------------|---------------|------------------|
| GPP 2016 | 124 | 223 | 99 |
| GPP 2017 | 142 | 241 | 99 |
| SVGI 2016 | 02/05/16 | 15/08/16 | 105 |
| SVGI 2017 | 26/05/17 | 29/08/17 | 95 |
| Hants 2016 | 06/05/16 | 25/08/16 | 111 |
| Hants 2017 | 23/05/17 | 29/08/17 | 98 |
| Polyfit 2016 | 02/05/16 | 16/08/16 | 106 |
| Polyfit 2017 | 16/05/17 | 29/08/17 | 105 |

The length of the season for GPP 2016 & 2017 are the same. But. The season starts earlier and finishes later than 2017.

Vegetation Indices *Result2*



Even though, the Start of the Season from all remote sensing Indices is between April and May, the End of the Season is on October 8 for three smoothing methods and for all the indices in 2016. The only remote sensing indices that have different days for Starting the Season are "GNDVI"&"Chl-Red_Edge". These indices show an earlier day, for all smoothing methods.

| Vegetation Indices 2016 | Start of Season 2016 | End of Season 2016 | Length of Season 2016 | Vegetation Indices 2017 | Start of Season 2017 | End of Season 2017 | Length of Season 2017 |
|-------------------------|----------------------|--------------------|-----------------------|-------------------------|----------------------|--------------------|-----------------------|
| NDVI | 119 | 223 | 104 | NDVI | 139 | 306 | 167 |
| MTCI | 119 | 223 | 104 | MTCI | 116 | 306 | 190 |
| EVI | 119 | 223 | 104 | EVI | 136 | 293 | 157 |
| MCARI | 122 | 223 | 101 | MCARI | 79 | 269 | 190 |
| PSSR | 95 | 223 | 128 | PSSR | 139 | 293 | 153 |
| Chl-Red-Edge | 129 | 223 | 94 | Chl-Red-Edge | 26 | 186 | 160 |
| GNDVI | 9 | 223 | 214 | GNDVI | 126 | 306 | 180 |

Table above shows the Start and End of the Season for the average of all phenological extractions methods. The last column indicates the average of the Length of the season for all three methods in 2016 and 2017.

Conclusion

- Sentinel-2 data for Belgium in 2016 provided not enough cloud-free data to track phenological changes well. This year was exceptionally cloudy.
- Some smoothing algorithm functions fit better at the beginning of the season with the pattern of the data, some better at the end of the season.
- Finding the ideal proxy for GPP and improving the phenological changes is challenging.

Recommendation

- Along with Sentinel-2, having data from different satellite products may help to have a better estimation.
- The more data sites we have, the better the analysis will be.
- During cloudy periods, remote Sensing products like high resolution satellite is not reliable to track phenological changes.
- Each phenological extraction method represents a different pattern. With applying more methods a more accurate result will be estimated.

Acknowledgements

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