



ECOFAHRE (ECOsystem Functional Attributes High Resolution Estimator) service

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This project has received funding from the *European Union's Horizon 2020 research and innovation programme* under grant agreement No 641762

Measuring Primary Productivity

Gross PP= carbon fixed by plants

Requested in all Protected Areas of Ecopotential

Quite difficult to have precise measure even as ground truth,

But good times series do exist (i.e. Fluxnet)

SRS estimator is product of $PAR \cdot greenFAPAR \cdot LUE$

$greenFAPAR \rightarrow$ Structural indices (NDVI, EVI, MSAVI,...)

$LUE \rightarrow PRI$

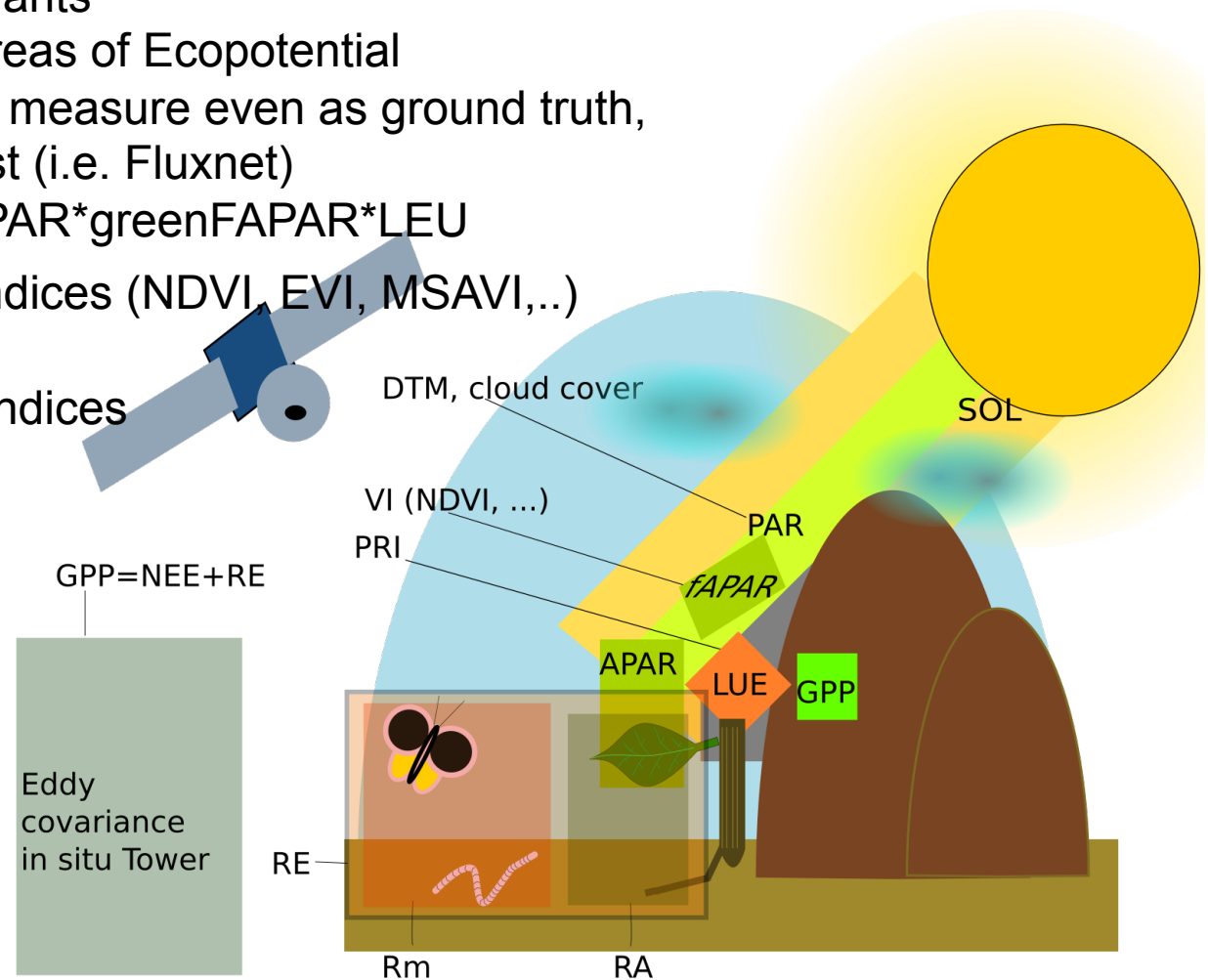
$FAPAR \cdot LUE = ?$ Chlorophyll indices

Rossini et al. 2012.

Biogeosciences;9:2565–2584.

Nestola et al. 2018

Sci. Total Environ. 2018;612:1030–1041.



Estimators of FAPAR:

Building interpolation and expectation

- Higher spatial resolution is needed where landscape is not so uniform to fit in 300m squares (Mountains area, Mediterranean areas, Karst, ...)
- High spatial resolution entails low temporal frequency. (see MODIS vs Landsat5-8 and Sentinel2 frequencies)
- Lower frequency makes estimation more prone to clouds cover and generate sparse times series.
- Raw data statistics are undependable given that missing data are clustered and not random respect to seasonality
- Seasonality estimation method that require equally spaced date become not applicable (i.e. R pkgs as **greenbrown**, **Bfast**).
- Two options:
 - If missing data not excessive -> interpolators
 - If missing data are high -> explicit seasonal models over multi-year data



Time series for GPP proxy

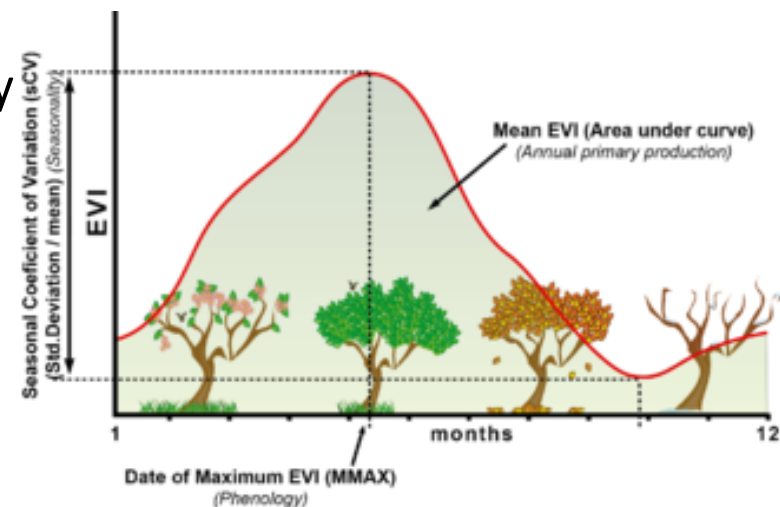
Question by the Ecologist (Domingo Alcaraz Segura):
Can Ecosystem Functional Types (EFT) predict bird biodiversity distribution in Peneda Geres?

- Bird observations in situ (2010) were provided by Adrián Regos Sanz.
- **Peneda Geres (PG):** 66 Landsat (5,7) images (2005-2010)

The area is highly cloudy: in 2006 only 3 images have less 70% cloud cover, in period 2005-2010 about 11 images per year pass the threshold

EFT is an ecological space defined by 3 seasonality features of GPP:

- Mean value
- Yearly Coefficient of variation (stand. Dev. divided mean)
- Day of the Year of maximum values



Goal to Build a simple but flexible model to extract Time series dynamics

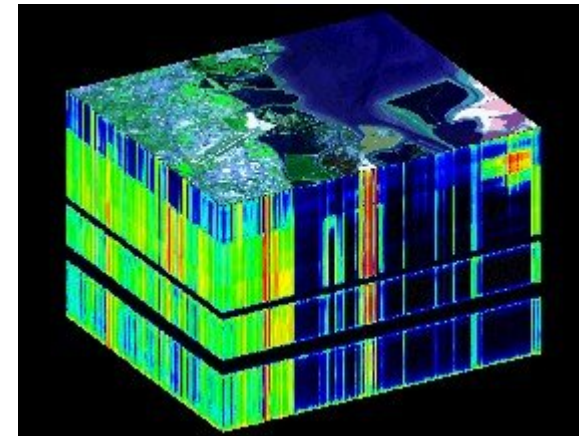
- Typically observation pixel was covered by a small path with no vegetation while surrounding pixel could have different cover in the same surrounding.
- Seasonality with annual, semester, quadrimester components plus change component: or linear trend or yearly anomalies.
- The mode of fit: linear, robust and weighted (proportional to error expectation given signal intensity)

$$VI_t = \alpha + \alpha_y + \sum_{s \in 1,2,3} \gamma_s \sin \left(\frac{2\pi st}{f_{year}} + \delta_t \right)$$

s= seasonality component

t= time

f_{year}=a year in unit of time



With trigonometric transformation model becomes linear respect to t

A multi-layer ENVI or GeoTiff files

Mod_mean

Mod_CV

Mod_pos

raw_mean

raw_CV

raw_pos

anomal SD

year1

...

year n

liu test p-value

liu test value

harmonic model p-value

harmonic model rsq

Time series summary:EFT
+ stability indicator

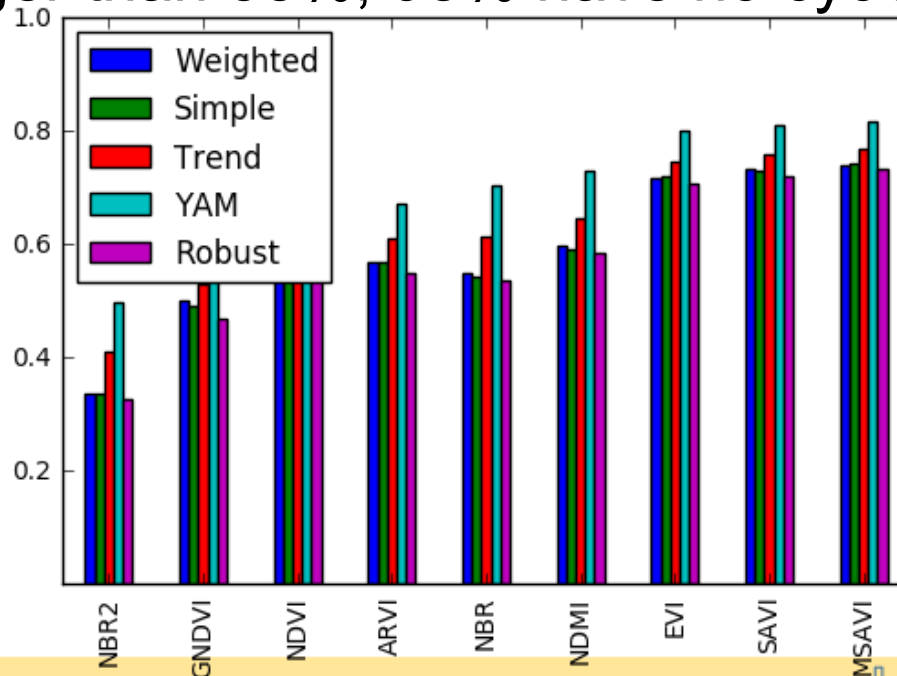
Single Year
Anomalies/deviation

Quality Evaluation

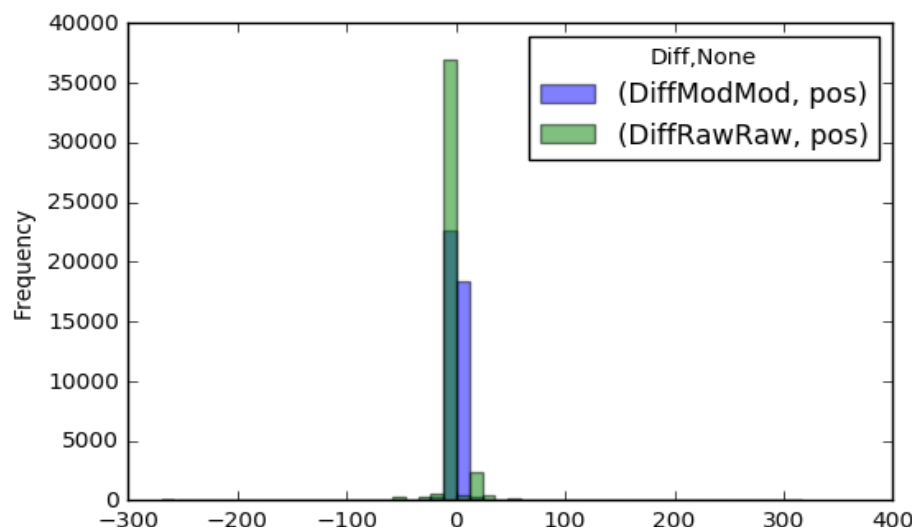
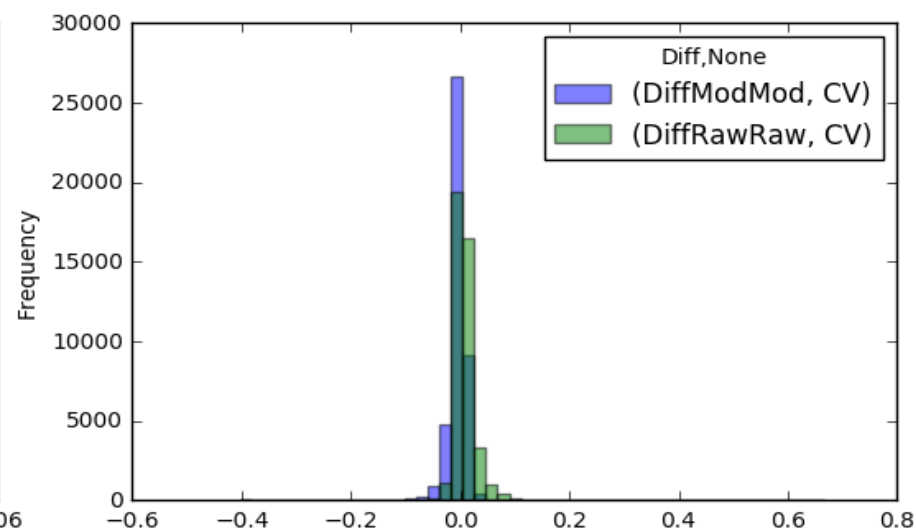
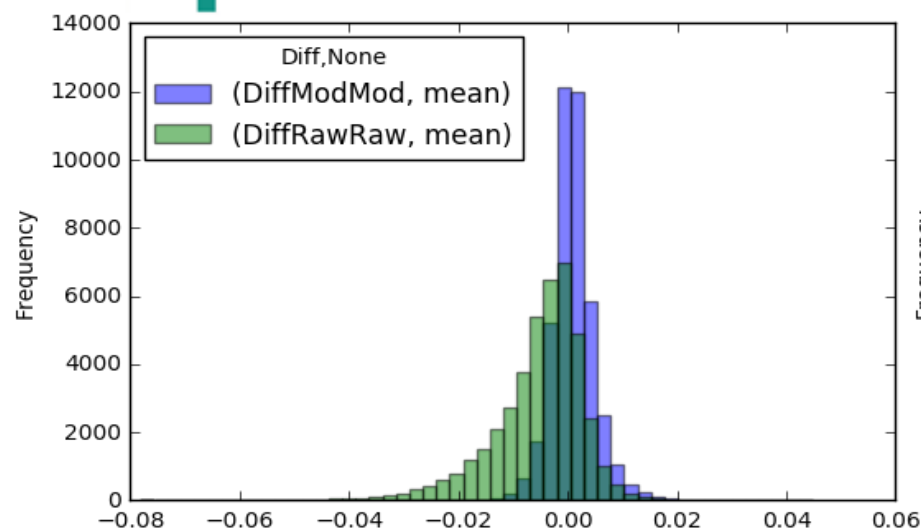


Good fit for 3 harmonics model

- The model with seasonality by year, semester and quadrimester fit quite well data in the pixels around observations.
- MSAVI was found the best indicator. Coupled with best model (YAM) 3% pixels over 0.01 p-value, 90% have R^2 larger than 58%, 98% have no cyclical residuals ($p > 0.01$)



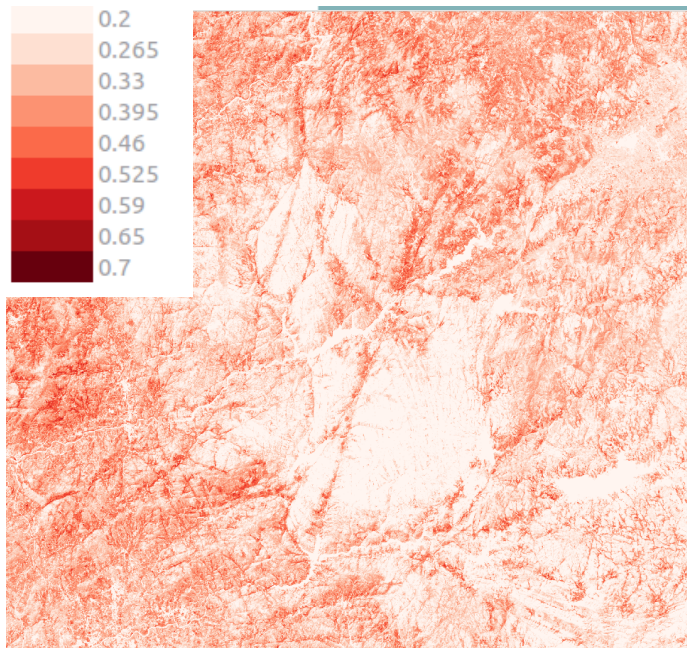
- Weighting by expected error due to signal intensity was useful for NDVI and few others
- Error estimated by partial derivative of indicator over 2 signal channels
- Adding Trend line or different annual mean increase fit



For the 423 pixels cloud free, we applied on each 100 random cloud patterns from the rest of the data and calculate 3 EFT dimensions from raw data or from model.

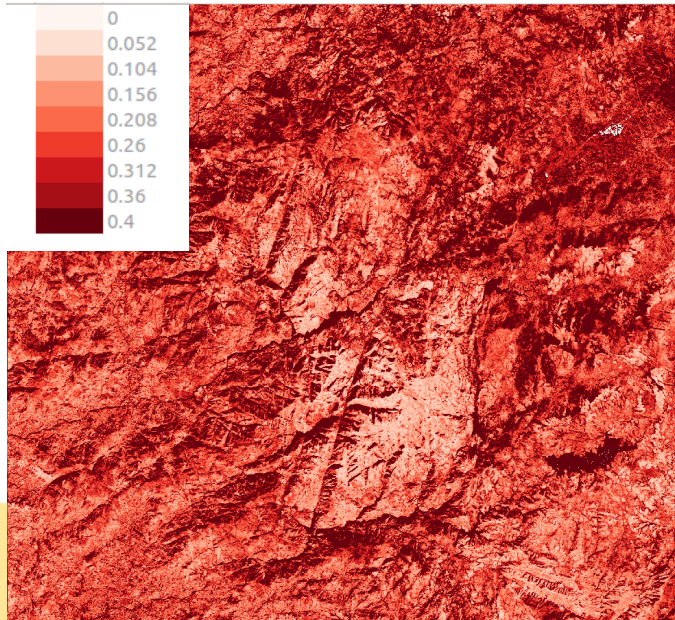
We plot difference within each approach between perturbed and full series.

Model gives Mean and CV less perturbed by clouds, while Model max position have more small perturbation, while raw data have low frequency larger jump.



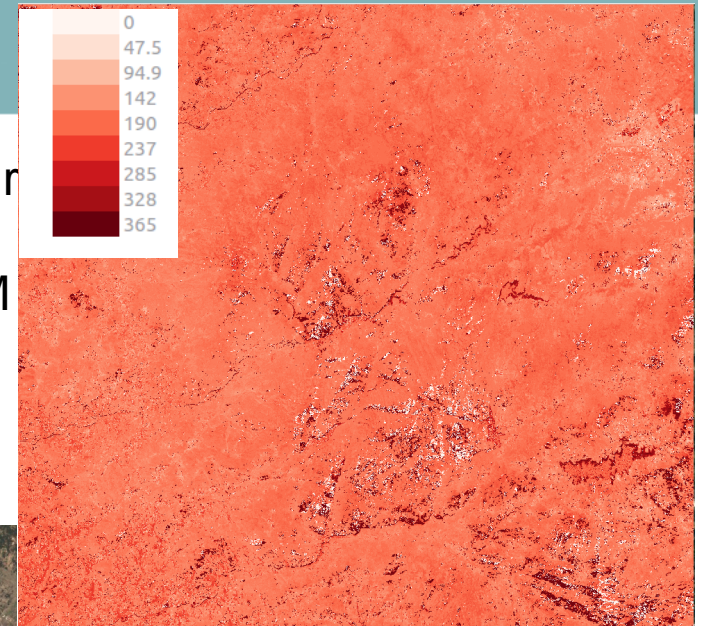
Yearly Mean

Yearly Coeff. of Variation



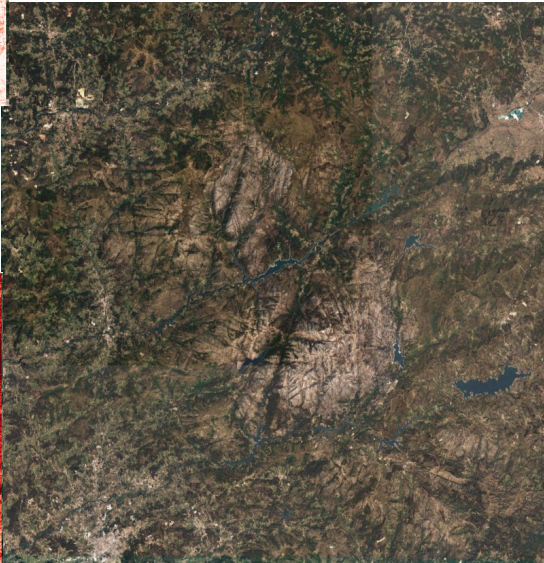
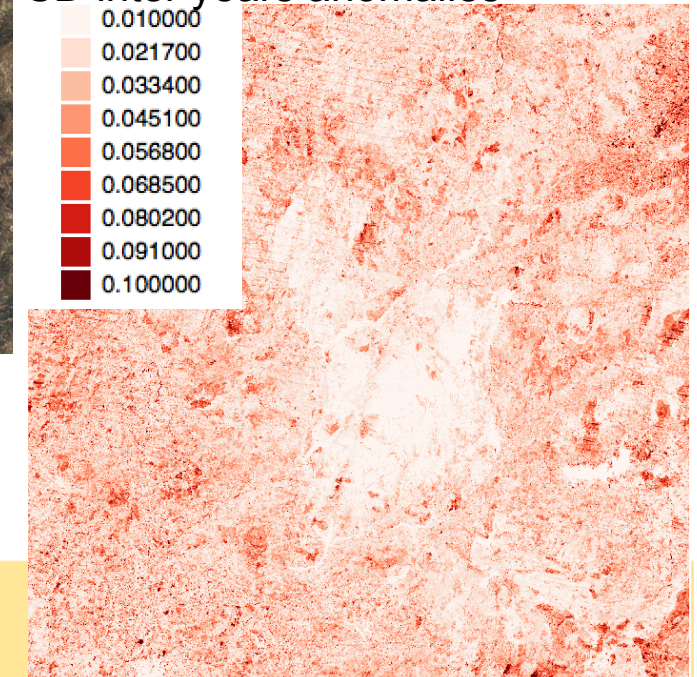
Relatively fast calculation

- Stationary model 1 hour
- YAM Model 2 hours
- for 8 CPUs and 32 RAM
- for 6 millions pixel over 66 views



Seasonal Pick

SD inter years anomalies



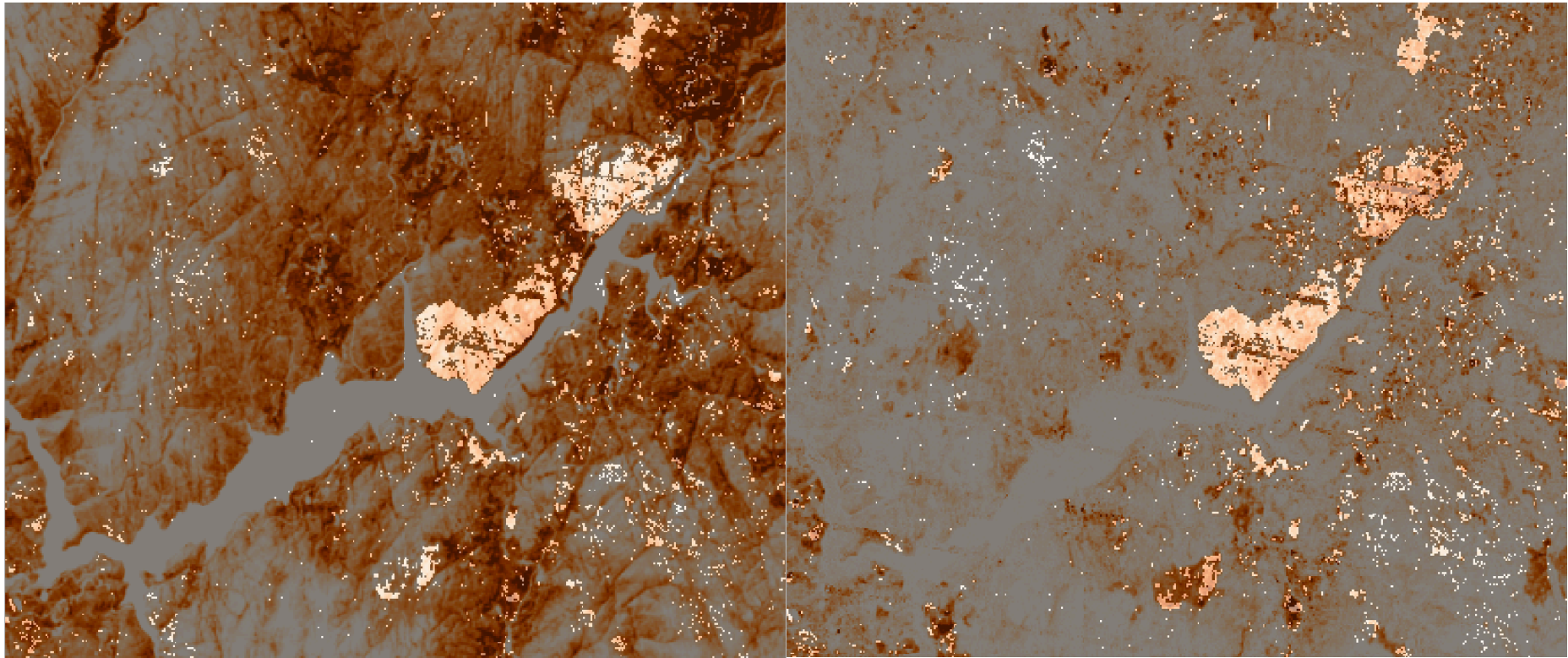
Google 2018
TrueEarth 15m
From Landsat7

Overlay with residual Power Spectrum

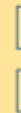
P-value < 0.01 for Liu test on Power Spectrum

Significant PS_{res} vs Mean VI

Significant PS_{res} vs SD inter years anomalies



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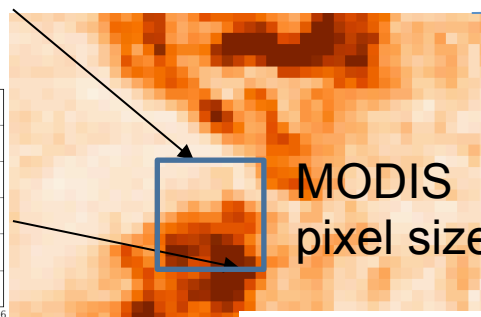
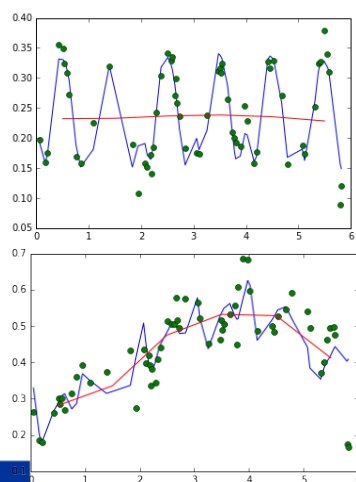




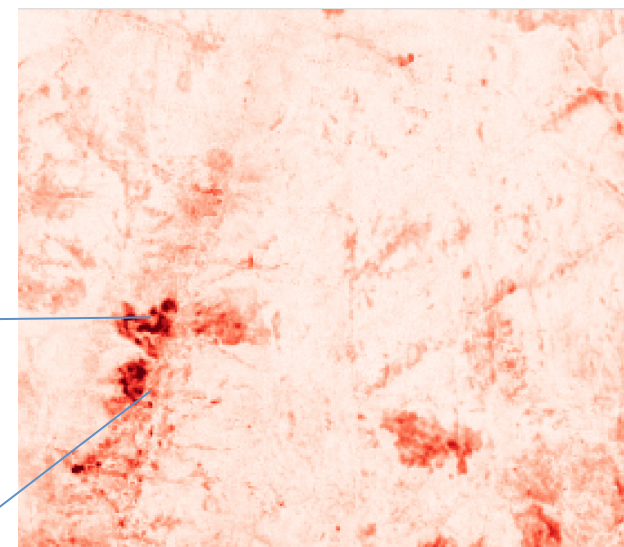
Landsat/Sentinel versus Modis



Often MODIS 16 days mosaic is preferred to avoid to deal with clouds but lower of resolution can be very limiting



MODIS
pixel size



inter-years Stand. Dev.



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Future service porting

Python script +
pyspectral,
pyshape,numpy

Docker

Defintion Input/Ouput/
Need of CPU/RAM

Defintion Input/Ouput/
Need of CPU/RAM

 ECOPotential VLab GUI

RECAS BARI


ITALIA

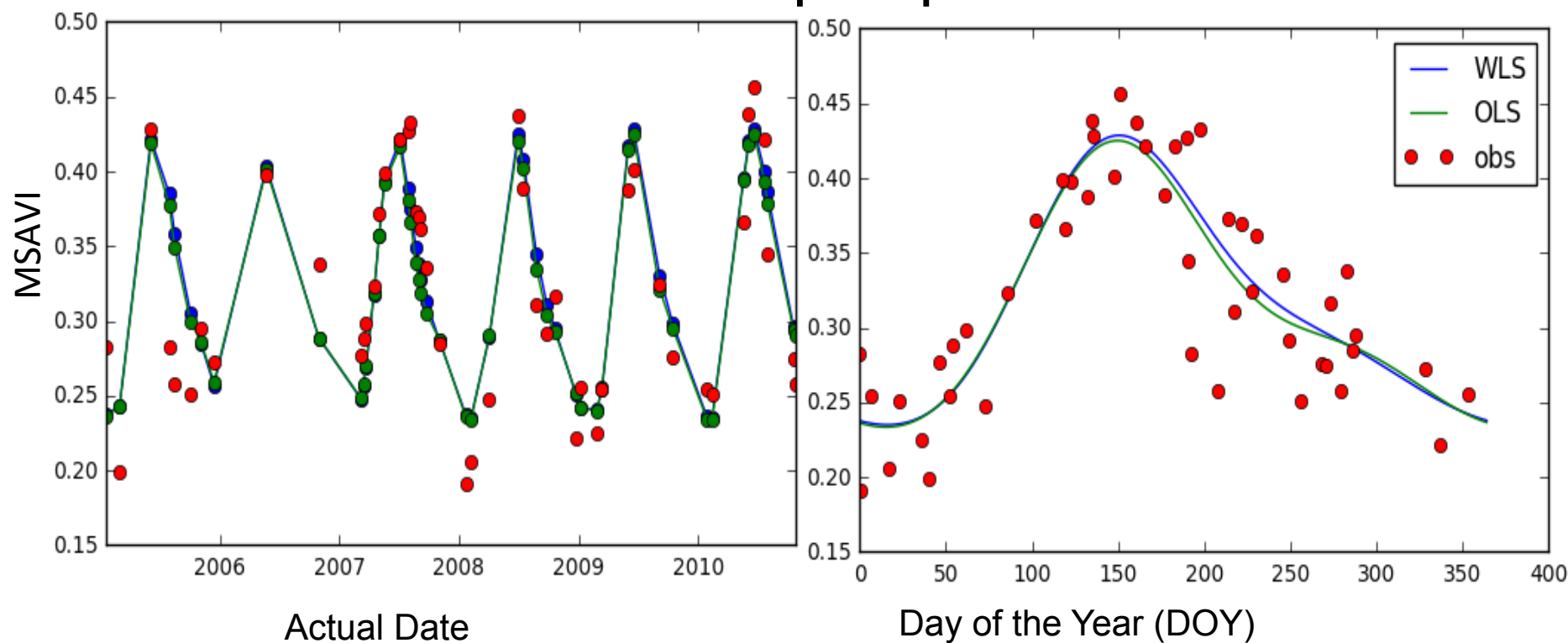




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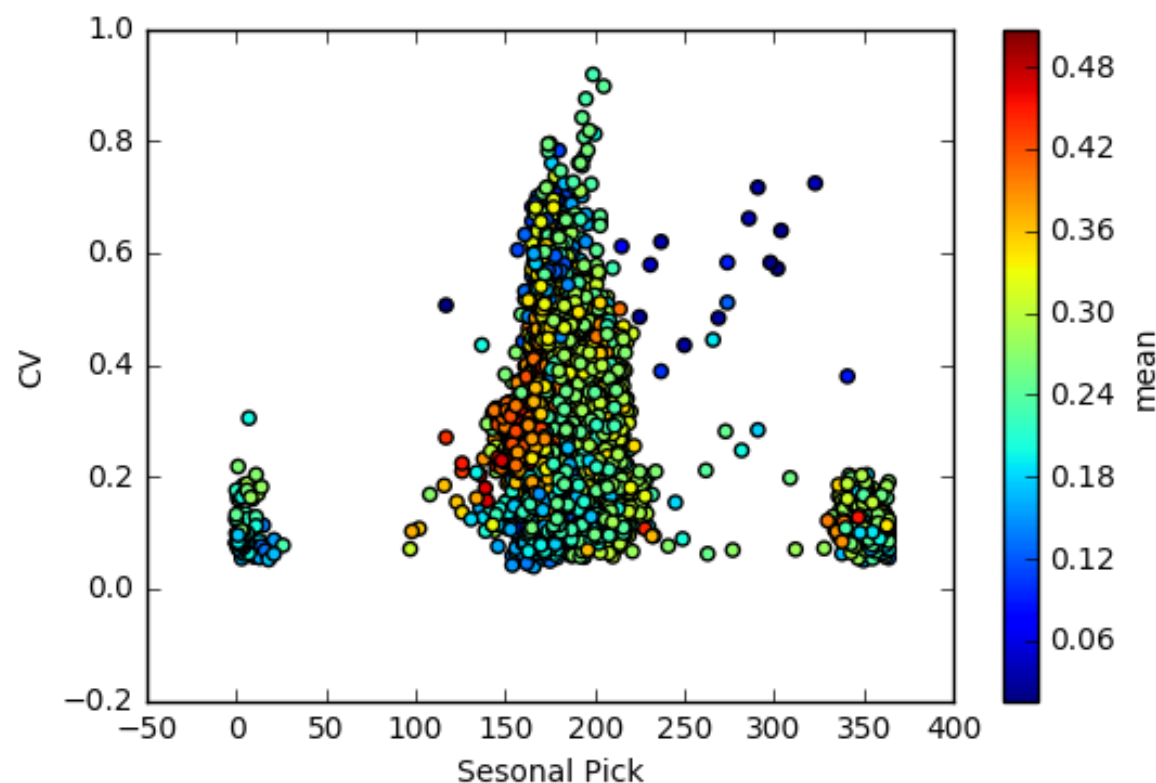
Fit of the model

Full set of 6 years MSAVI times series values of an exemplar pixel



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EFT space

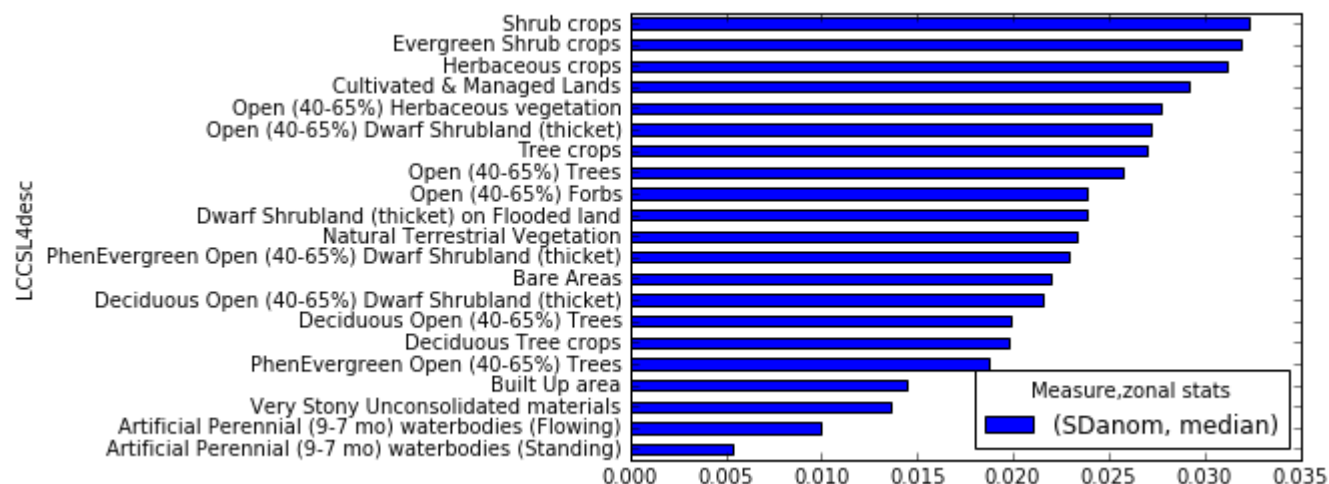


Pixel 4984 around the 385 observation points

Few points peaks in winter, even with good mean values.
Several points with peak in spring have secondary peak in winter (november-december even january)
Could be grassland under shrubs and tree between rocks
Unclustered dark blue points are bare rocks with scant vegetation

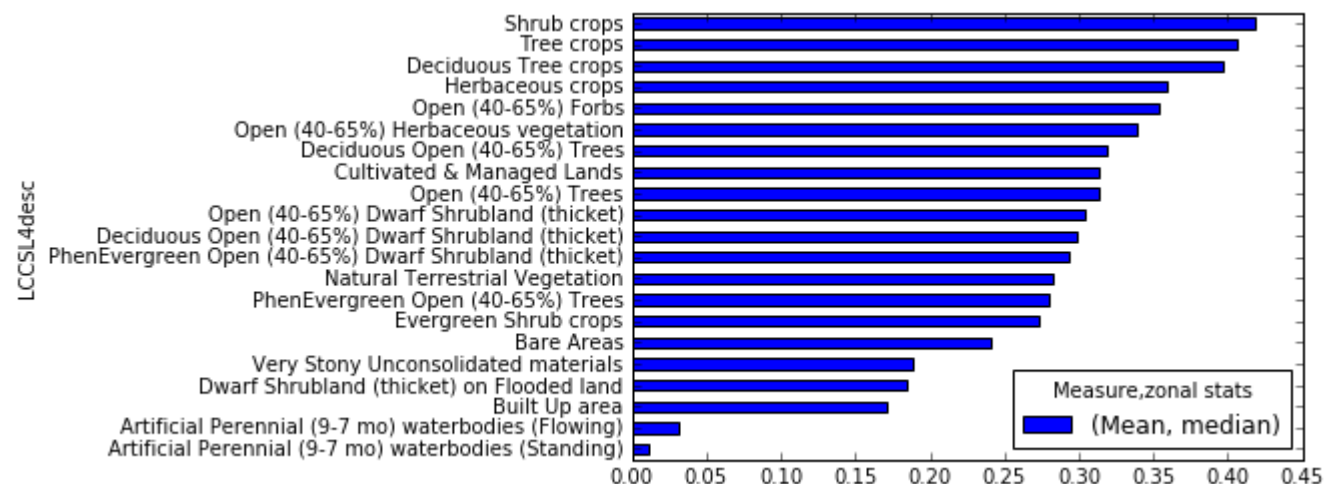


Ecological Validation: by LandCover (EODESM)



Crops have higher
Standard Deviation of
yearly anomalies
Consistent with
change of practices
across year

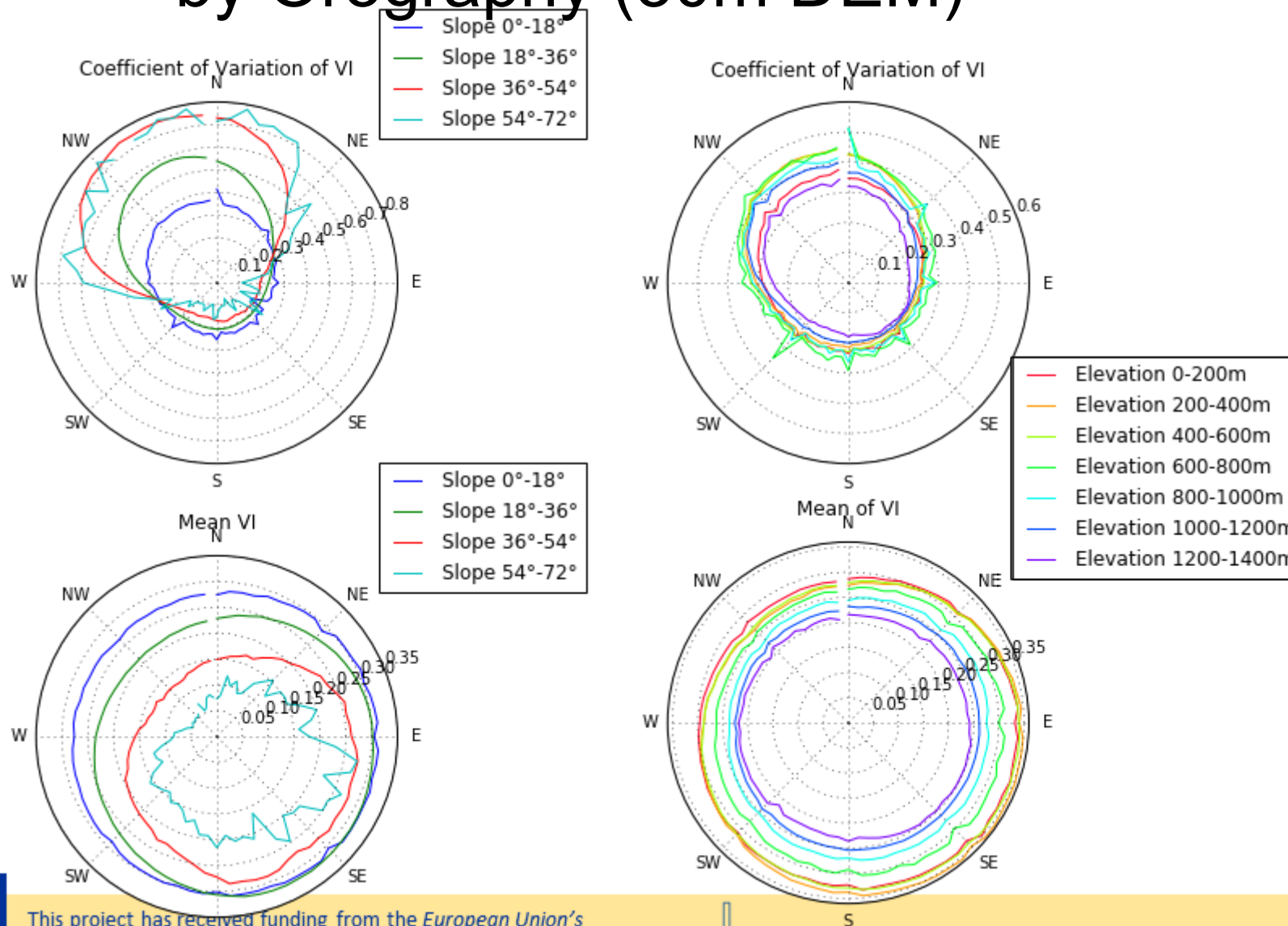
Crops have higher
Mean, followed by
deciduous, thicket and
then evergreen.



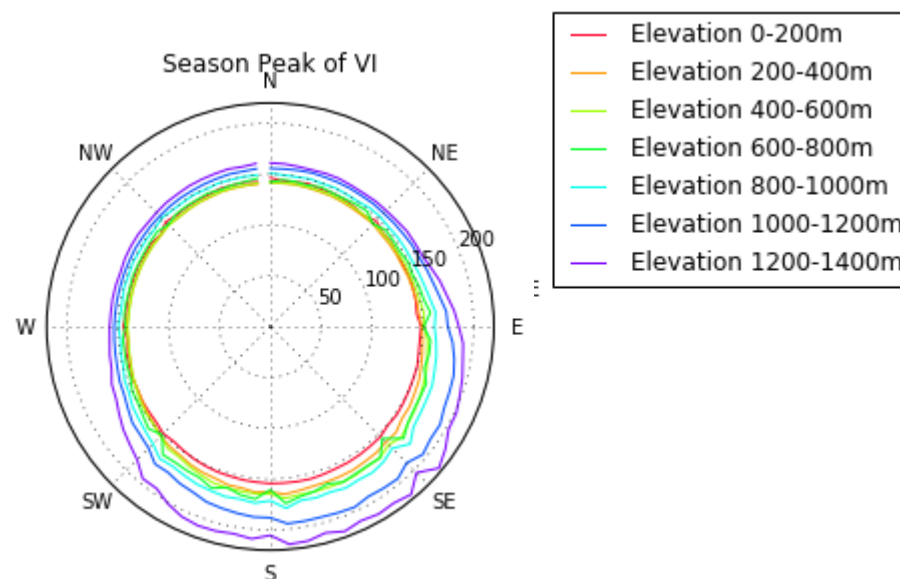
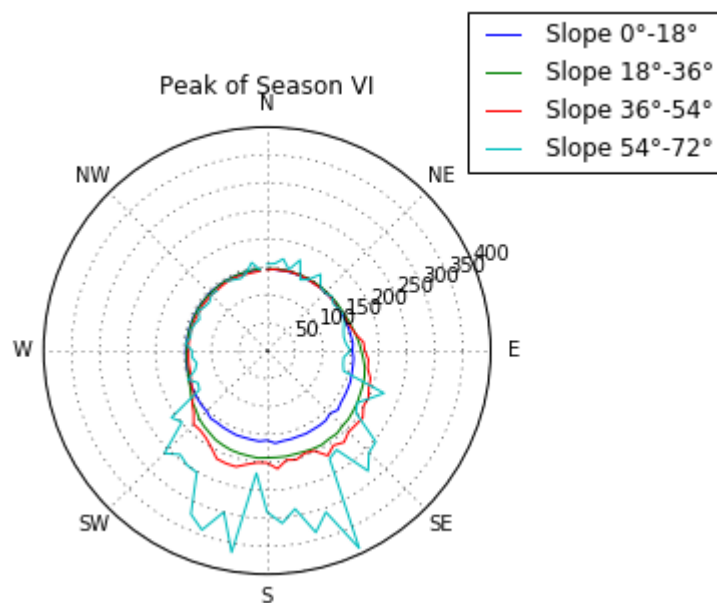
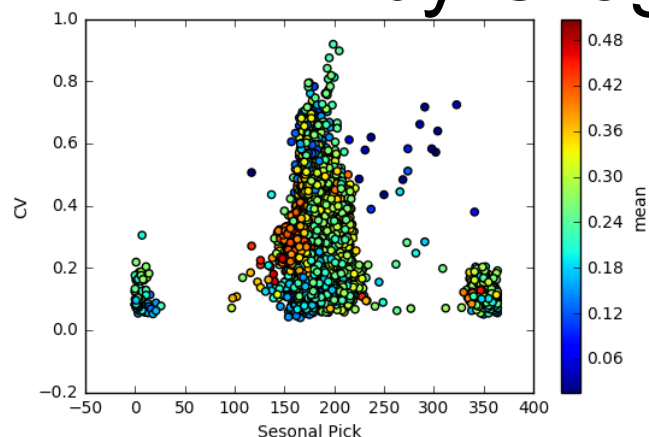
intra-year Coeff. Variation



Ecological Validation: by Orography (30m DEM)



by Orography (30m DEM)



Thanks for your attention



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