

# The EC-JRC's agriculture monitoring: European and global systems

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Joint Research Centre, European Commission



# Principles of crop monitoring systems

1. Alert warning on crop development	2. Qualitative analysis of crop development	3. Quantitative forecast of crop yield
<p>Detection of <b>major issues</b> concerning possible crop abiotic stress <b>with high reliability in near-real time.</b></p>	<p>Able to <b>rank the current season with high reliability</b> in the actual <u>quartile distribution</u></p>	<p>Yield forecasts with <b>significantly better accuracy than the average inter-annual variability</b>, both at national and sub-national levels.</p>
<p>Detection of <b>major issues</b> concerning possible crop abiotic stress <b>with medium reliability in near-real time.</b></p>	<p>Able to rank the current season with <b>medium reliability</b> in the actual <u>quartile distribution.</u></p>	<p>Yield forecasts with <b>significantly better accuracy than the average inter-annual variability at national level</b></p>
<p>Detection of <b>extreme events that will produce severe damages on crop yield/development</b> with <b>high reliability.</b></p>	<p>Able to place the current season with <b>high reliability below or above the actual average season.</b></p>	<p>Able to estimate the inter-annual changes of crop yields, with accuracy <b>comparable to the average inter-annual variability at national level.</b></p>
<p>Detection of only <b>extreme events that would produce severe damages on crop yield/development</b> with <b>medium reliability.</b></p>	<p>Able to place the current season with <b>medium reliability below or above the average season.</b></p>	<p>Forecasts able to provide <b>indications about major changes</b> in crop yields.</p>

Technical complexity – team skills – costs

# EC-JRC-D.5 agriculture monitoring systems

## 1. Alert warning on crop development

Detection of **major issues** concerning possible crop abiotic stress **with high reliability in near-real time.**

## 3. Quantitative forecast of crop yield

Yield forecasts with **significantly better accuracy than the average inter-annual variability at national level**

## ASAP (Anomaly hot Spots of Agricultural Production)

Early warning systems of global food production problems with focus on countries with high risk of food insecurities

## MCYFS (MARS Crop Yield Forecast System)

Yield forecasts at national level for the most relevant crops in EU28 + neighbors

E. Analysis team  
Data inspection – data visualization – data analysis – information generation

A. Meteorological  
data infrastructure

B. Remote sensing  
data infrastructure

Information extraction over space and time

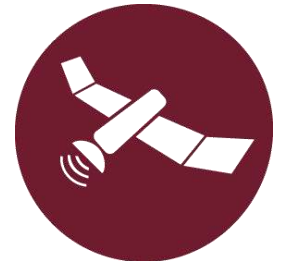
Convergence of analysis  
E. Analysis team

Agricultural and economic information for the on-going  
campaign  
National/international organizations/stakeholders

Qualitative  
reporting

## ASAP (warning system)

- **Identify Hot Spots for crops and rangeland**
- **80 priority countries**
- **Monthly analysis by crop experts**
- **Key input to GEOGLAM Early Warning Monitor**



# ASAP – Data

## Automatic warning classification system, every 10 - days

MODIS  
ECMWF

Detect active crop season based on satellite imagery



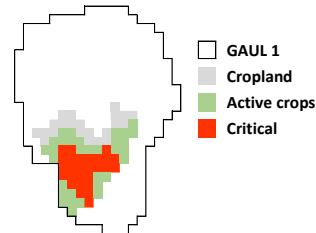
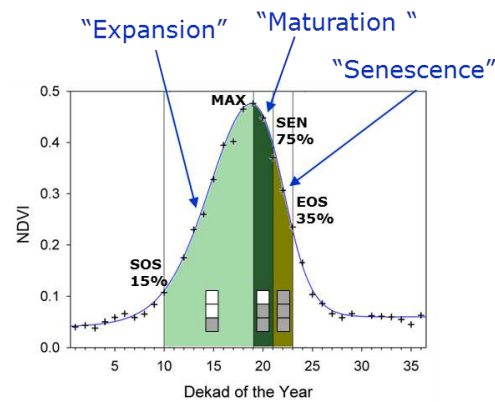
Flag areas where precipitation or biomass deficit is observed



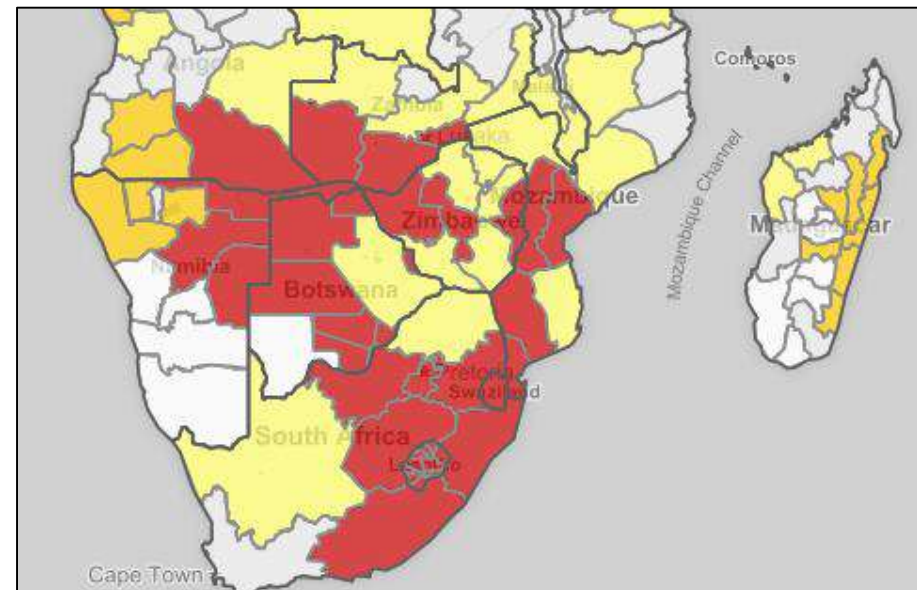
Determine area affected at sub-national admin. level



Classify type of warning



Level	Indicators concerned
1	Poor precipitation
2	Poor biomass
3	Poor biomass & prec.
4	Poor biomass @ end of seas.



# The warning Explorer



## ASAP - ANOMALY HOTSPOTS OF AGRICULTURAL PRODUCTION

European Commission > EU science HUB > ASAP Warning Explorer

### Warning Explorer

MAP STATS

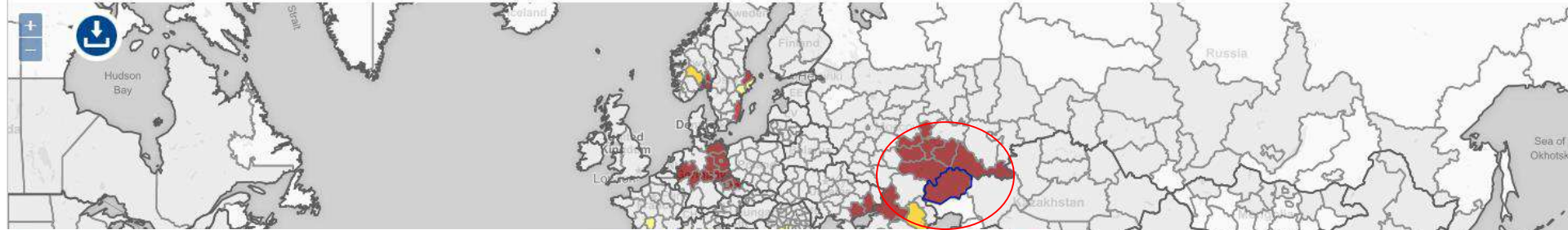
CROP RANGELAND

OPACITY

Show exceptionally favourable

Date 21-30/09/2018 (D30)

Layer Select an indicator



Legend - HotSpots



Hotspot countries in the last assessment

Legend - Warnings

- No warning
- Level 1
- Level 2
- Level 3
- Level 4

### Warning Explorer

MAP STATS

CROP RANGELAND

OPACITY

Show exceptionally favourable

Date 01-10/10/2018 (D31)

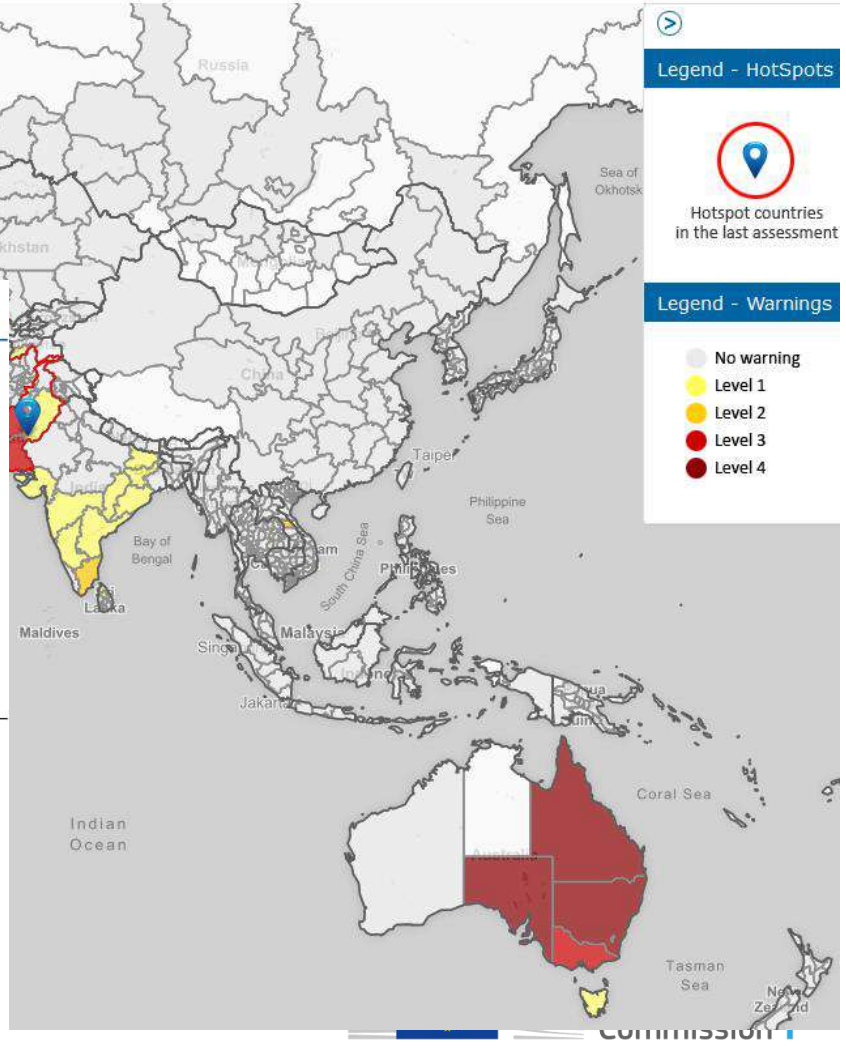
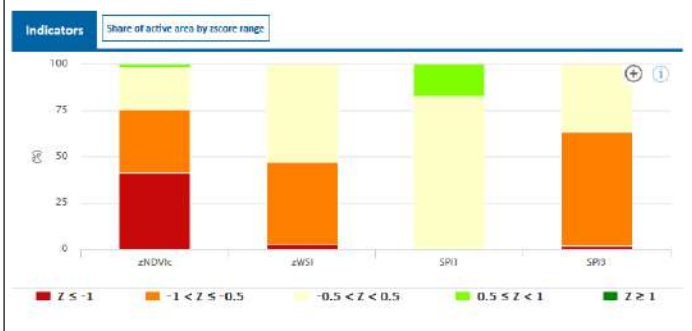
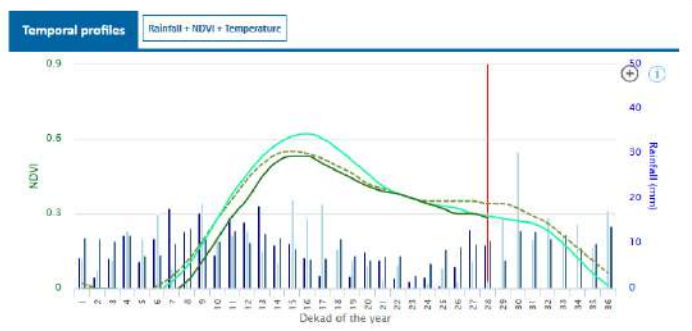
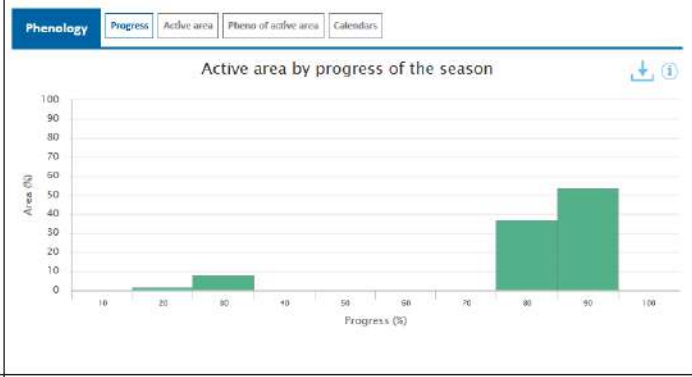
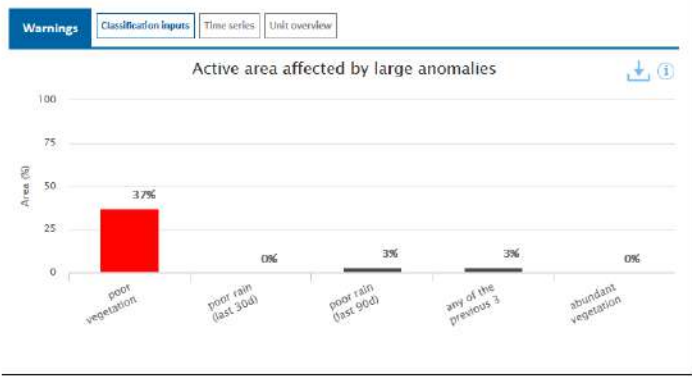
Layer Select an indicator

Map Select a background

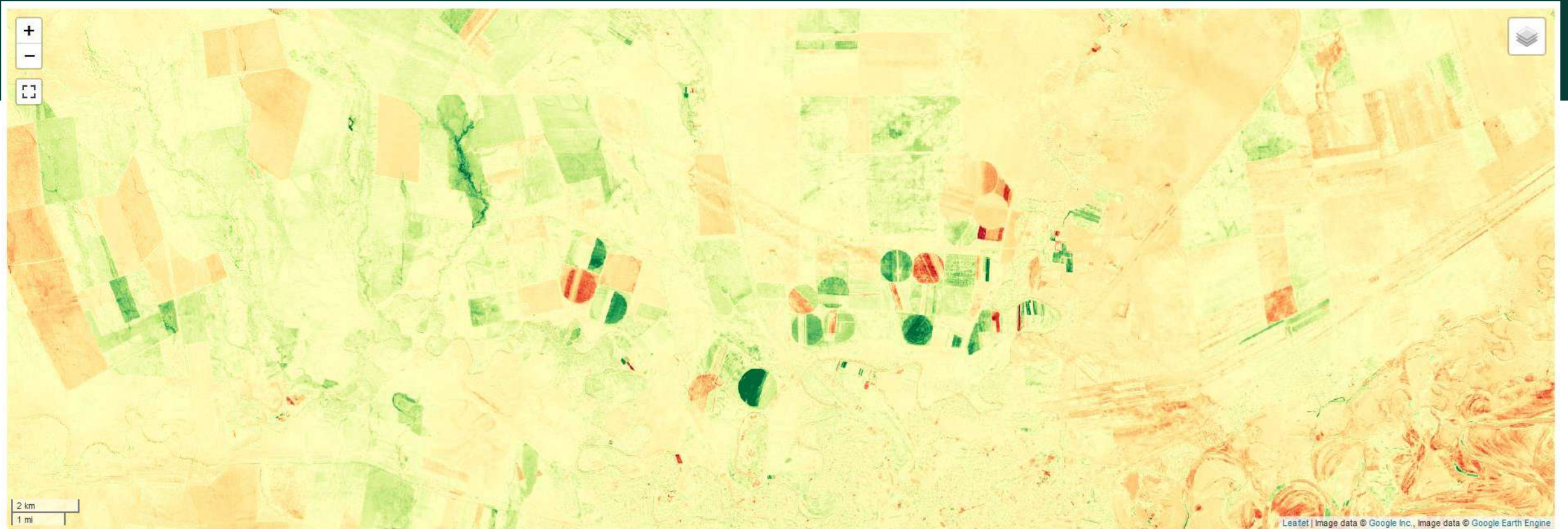
KZ - Zapadno K. ! WARNING LEVEL 4

Explore Stats

High Resolution Data



# ASAP high resolution viewer



GAUL 1 district: **Zapadno-kazachstanskaya** (Kazakhstan)

Analysis end:  Period (days):  Max. cloud %age:

## NDVI anomaly (2018 vs 2017)

- Retrieves high resolution imagery (Sentinel 1,2 and Landsat) for the selected GAUL1 level for any period and comparison year, different band combinations, crop mask overlay
- Challenge: TOC, cloud filtering and time series compositing for enhanced quality of the maps

# ASAP – Expert analysis

Hotspot analysis at country level, monthly

Analyse warnings and auxiliary information and assign hotspot status at national level

Publish hotspots on the home page and write a short narrative

- *Warning Explorer maps and graphs*

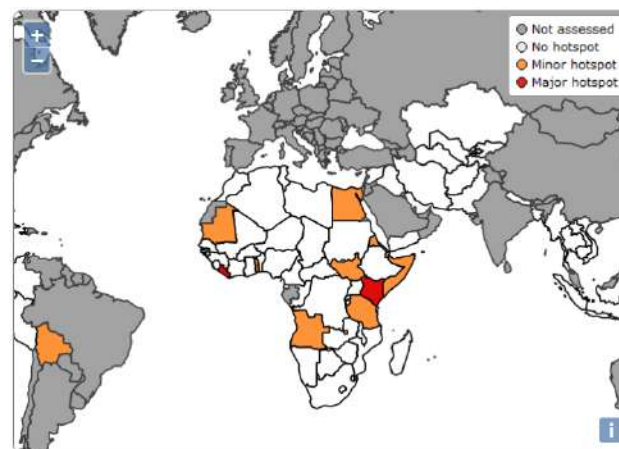
- *High resolution analysis*



- *European Media Monitor (EMM)*



- *Other sources*





# ASAP

## **TIME SERIES ANALYSIS - ANOMALY ANALYSIS**

### **BASED ON:**

- **Ancillary data among which tailored land use masks**
- **ECMWF ERA interim + HiRes**
- **MODIS 1KM NDVI – 10 day composite – filtering – no BRDF – 18 years**
- **SENTINEL 2 TOA – 2 years**

**E. Analysis team**  
Data inspection – data visualization – data analysis – information generation

**A. Meteorological data infrastructure**

**C. Crop growth modelling platform**

**B. Remote sensing data infrastructure**

**D. Statistical database and toolbox**

Information extraction over space and time

Convergence of analysis  
**E. Analysis team**

Range of plausible  
crop yield forecasts

Agricultural and economic information for the on-going campaign  
National/international organizations/stakeholders

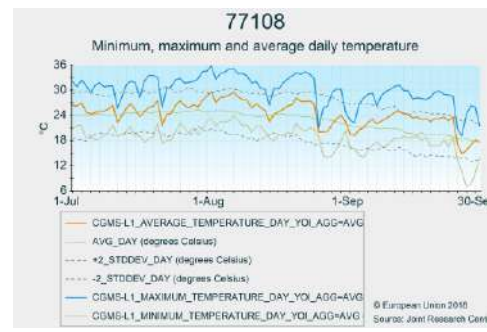
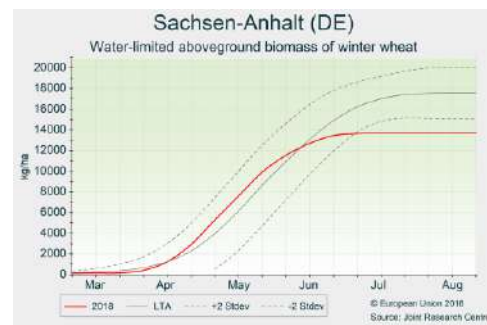
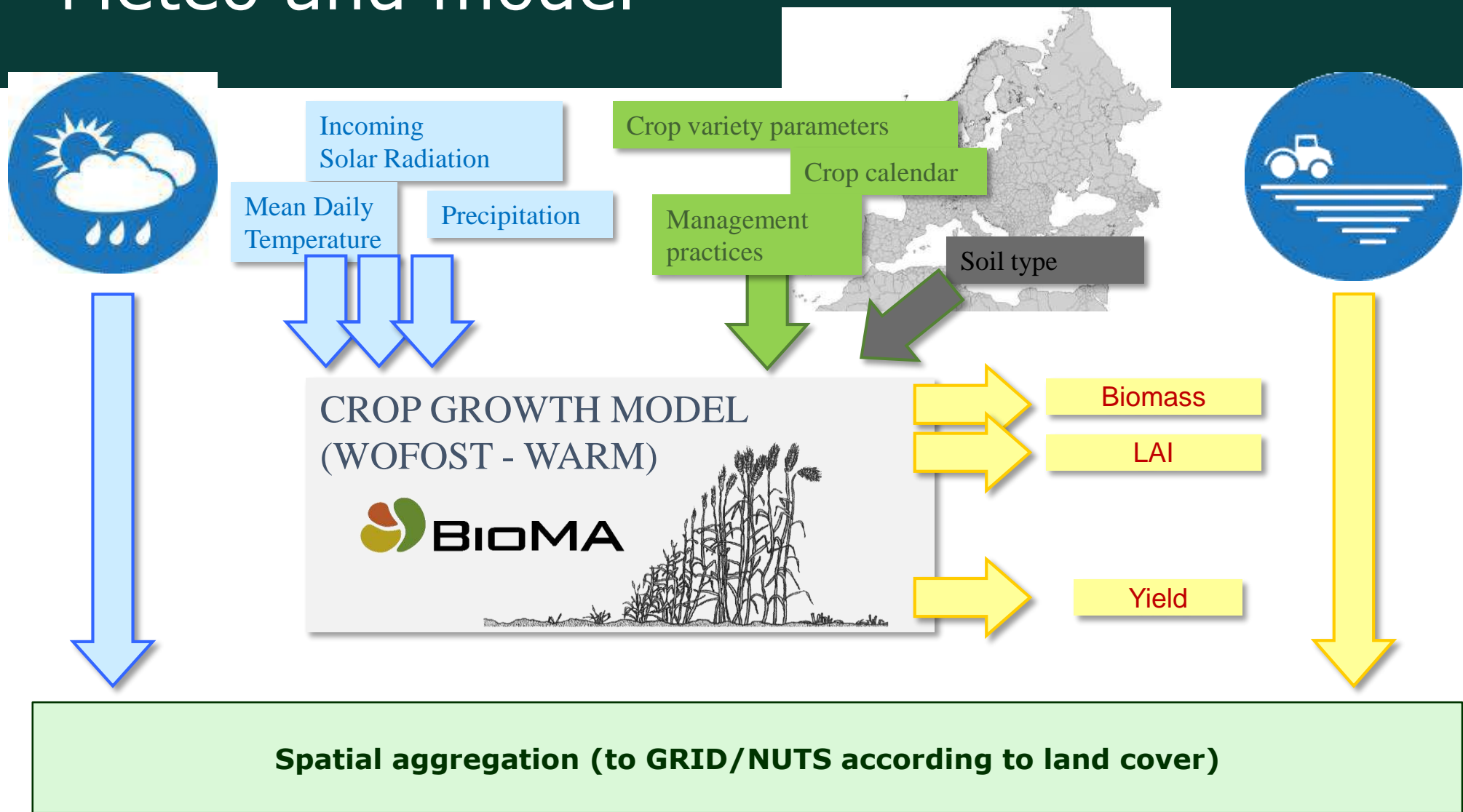
Quantitative & qualitative reporting on crop growth and yield

# MCYFS (quant. system)

- **Yield forecasts for 15 crops**
- **38 countries**
- **Monthly analysis by crop experts – bulletins**
- **Ad-hoc analysis for rice and pastures**
- **Input GEOGLAM - AMIS**



# Meteo and model



# Remote Sensing

- **Non crop specific analysis**
  - **Arable land monitoring**
  - **Pasture / grassland monitoring**
- **Independent analysis for crops and pastures – qualitative**
  - **Independent source of measured biomass activity**
  - **Convergence of results**
- **Independent analysis for crops – quantitative**
  - **Crop yield forecasts based on RS derived vegetation state parameters only**
- **Improvements meteorological infrastructure – quantitative**
  - **Snow cover**
  - **Radiation / MSG / station co-efficients**

# Remote Sensing products

Metop 1km back-up chain

Copernicus biophysical p.

Basic req.

Atmospheric correction  
Geo-referencing  
10-day compositing

Input

Vegetation Index (NDVI)  
Copernicus biophysical p. (fAPAR, LAI)

Temporal Gap-filling / Smoothing

RUM algorithm (Regional Unmixed Mean, from Genovesse, 2001)

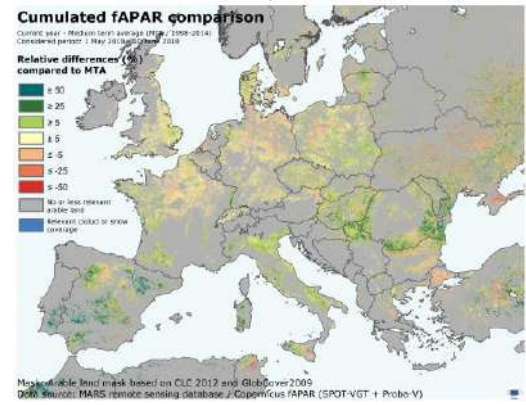
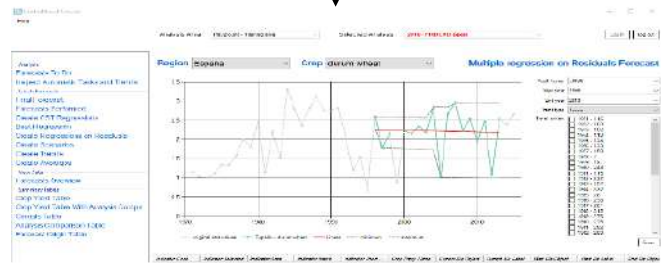
Spatial aggregation (land cover)

Yield predictor

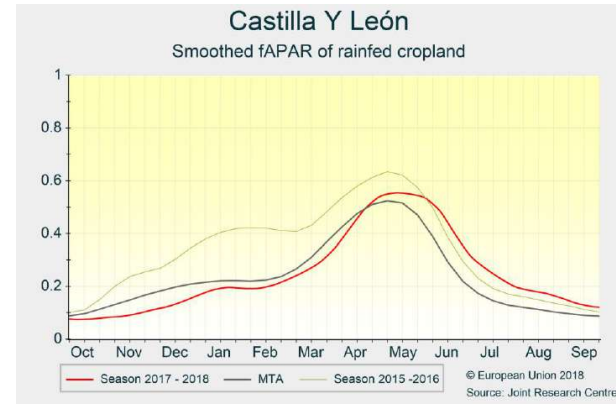
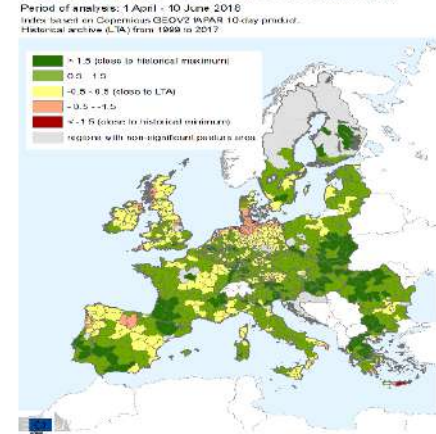
Anomaly maps

Pasture productivity index

Admin. units time-series



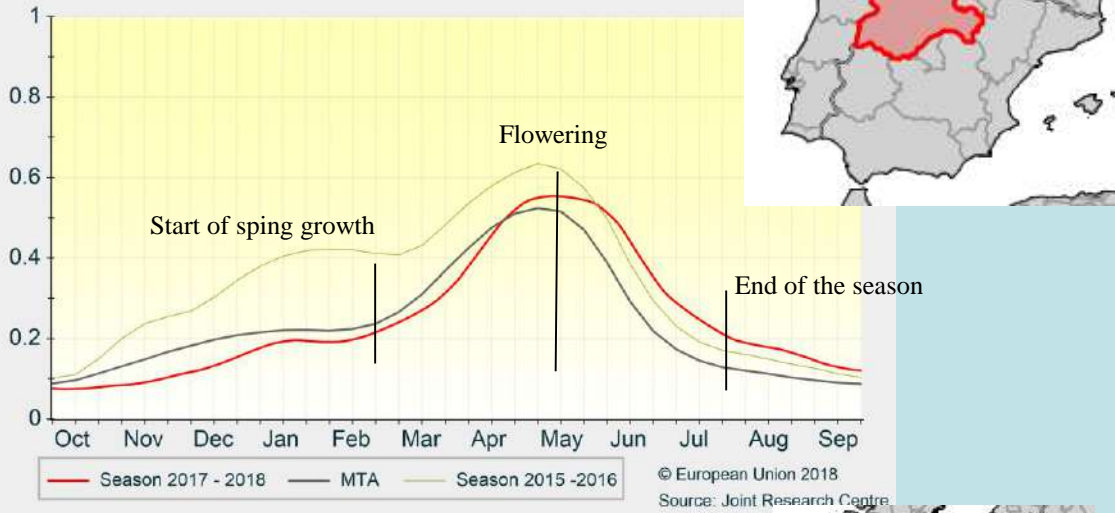
Relative index of pasture productivity



# Qualitative information - examples

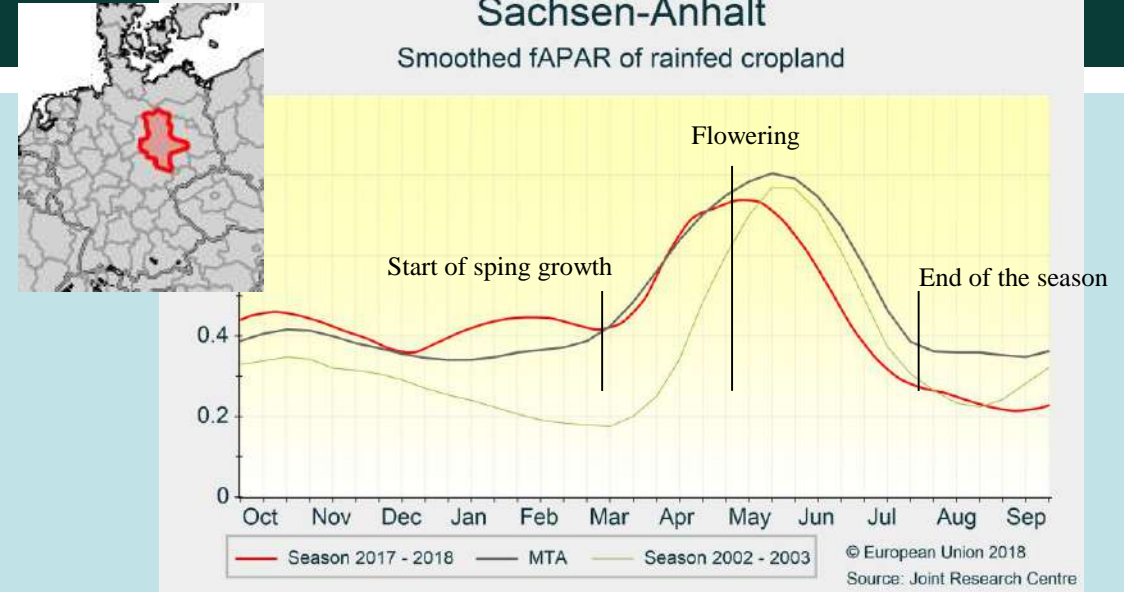
## Castilla Y León

Smoothed fAPAR of rainfed cropland



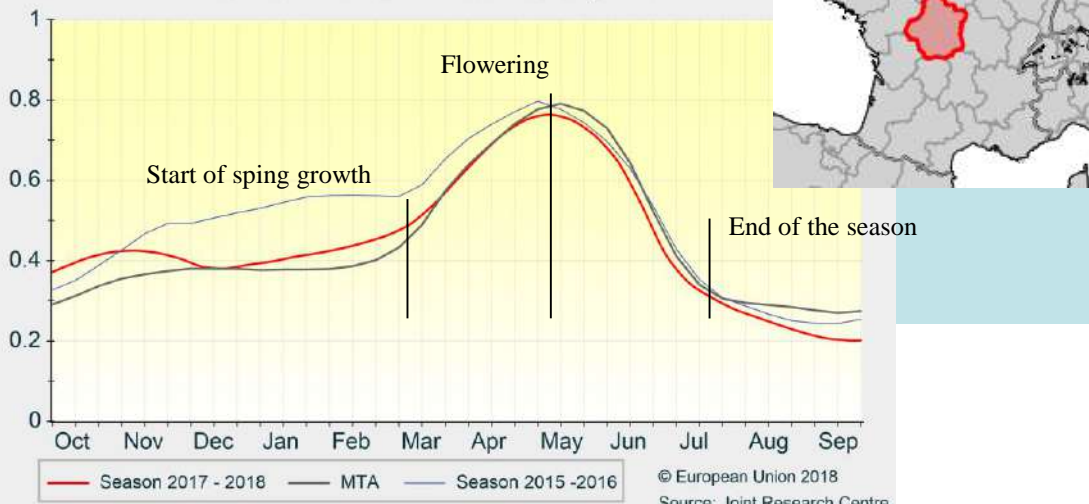
## Sachsen-Anhalt

Smoothed fAPAR of rainfed cropland



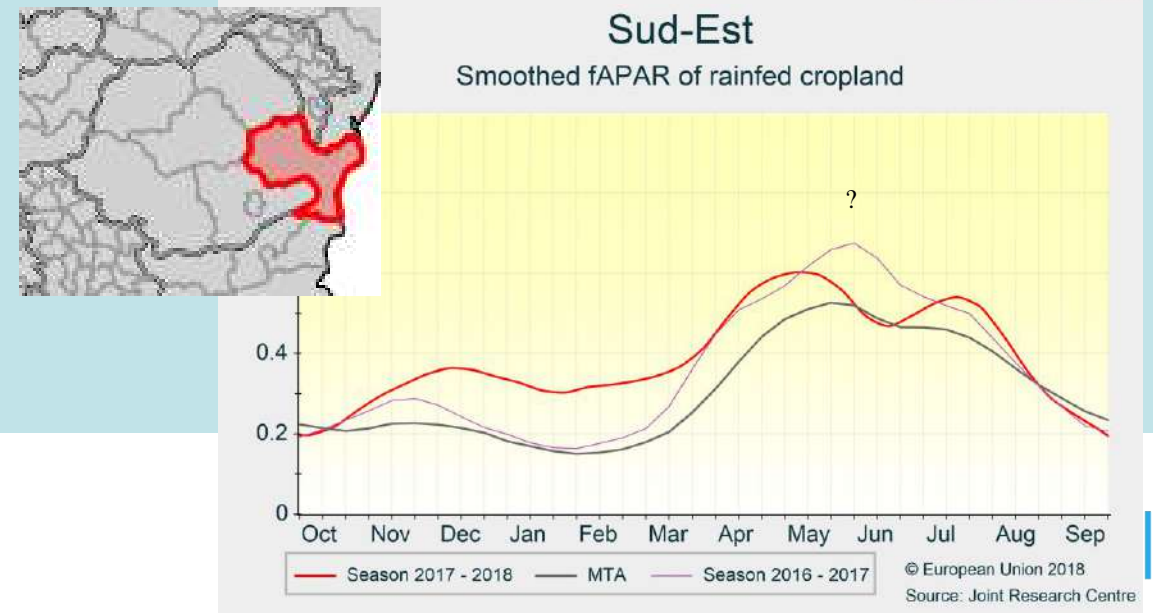
## Centre

Smoothed fAPAR of rainfed cropland



## Sud-Est

Smoothed fAPAR of rainfed cropland



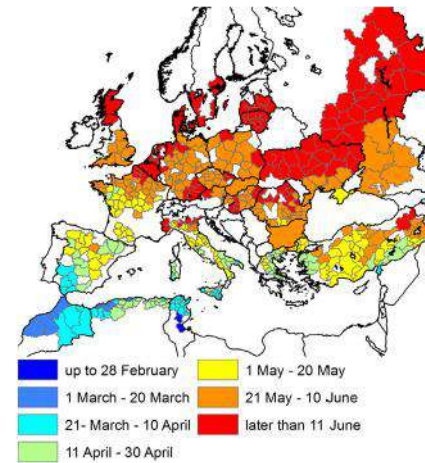
# Quantitative analysis

16

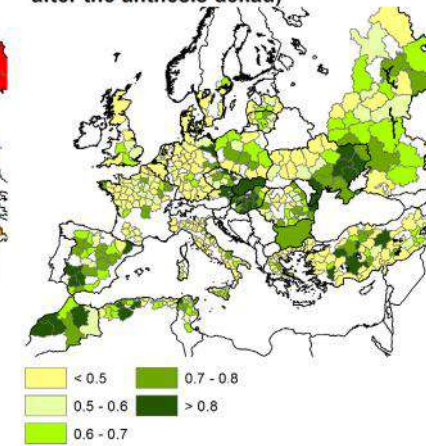
R. López-Lozano et al. / Agricultural and Forest Meteorology 206 (2015) 12–32

## Wheat

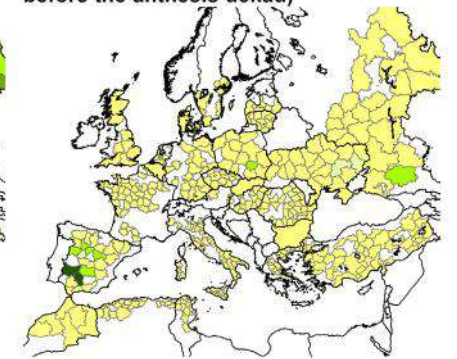
a) anthesis dekad



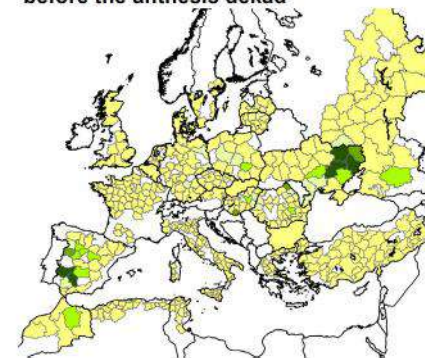
b) optimal regression  $R^2$  along the analysis period (until 2 months after the anthesis dekad)



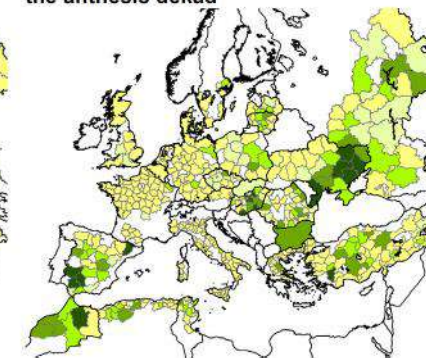
c) best regression  $R^2$  at the start of the analysis period (2 months before the anthesis dekad)



d) best regression  $R^2$  until 1 month before the anthesis dekad



e) best regression  $R^2$  until the anthesis dekad



f) best regression  $R^2$  until 1 month after the anthesis dekad

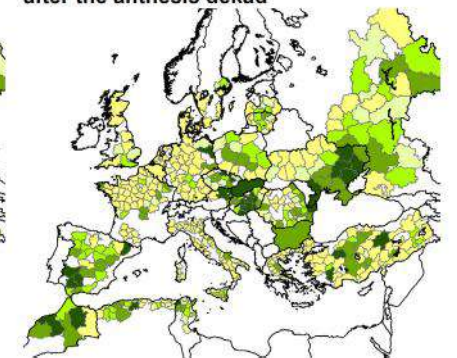
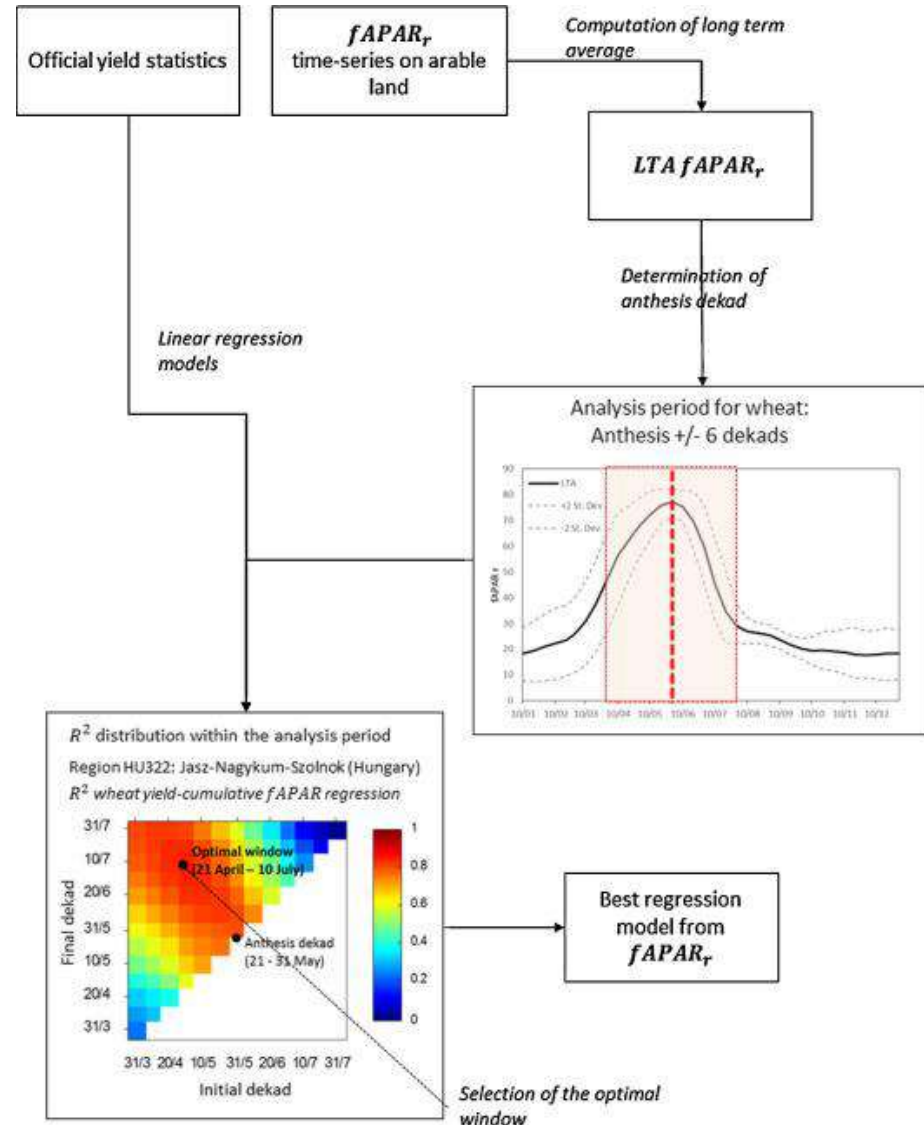


Fig. 3. (a) Dekad of anthesis computed from  $fAPAR_r$  LTA (Section 2.4.1); and (b)–(f), coefficient of determination  $R^2$  of the best regression models (Section 2.4.2) between cumulated  $fAPAR_r$  and official wheat yields at administrative unit level on different moments of the analysis period.



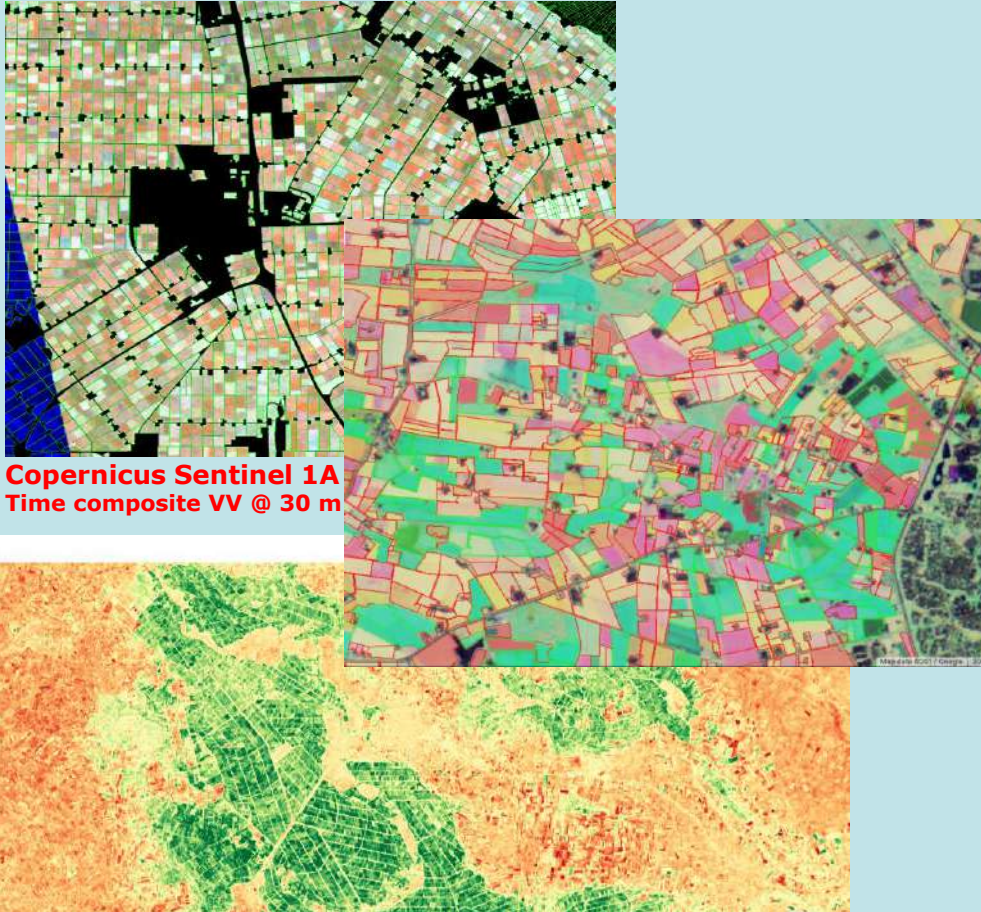
# MCYFS

## **TIME SERIES ANALYSIS - ANOMALY ANALYSIS - YIELD FORECASTING:**

- Ancillary data among which land use masks
- Meteo stations network
- Crop model
- **REMOTE SENSING DATA:**
  - 1km time series (Copernicus biophysical products) – 10days NRT filtering/smoothing - BRDF correction
  - 1km backup time series based on NDVI MetOP (A + B) – 10days NRT – filtering/smoothing – no BRDF



# Data requirements



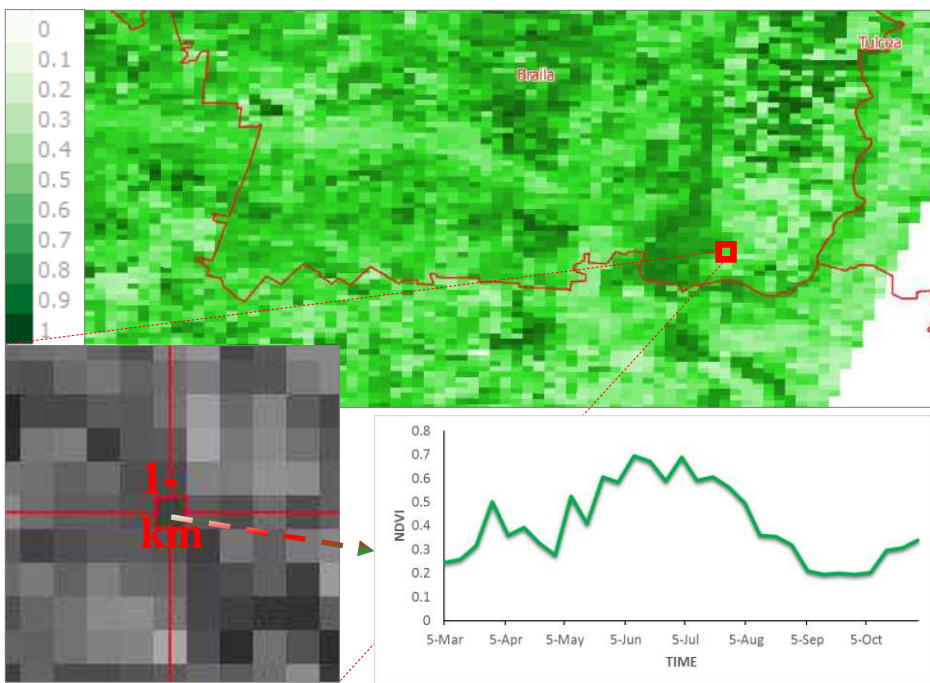
Large increase in the last 5 years of high resolution optical and SAR data with enormous potential for agricultural monitoring

BUT ALSO NEED FOR:

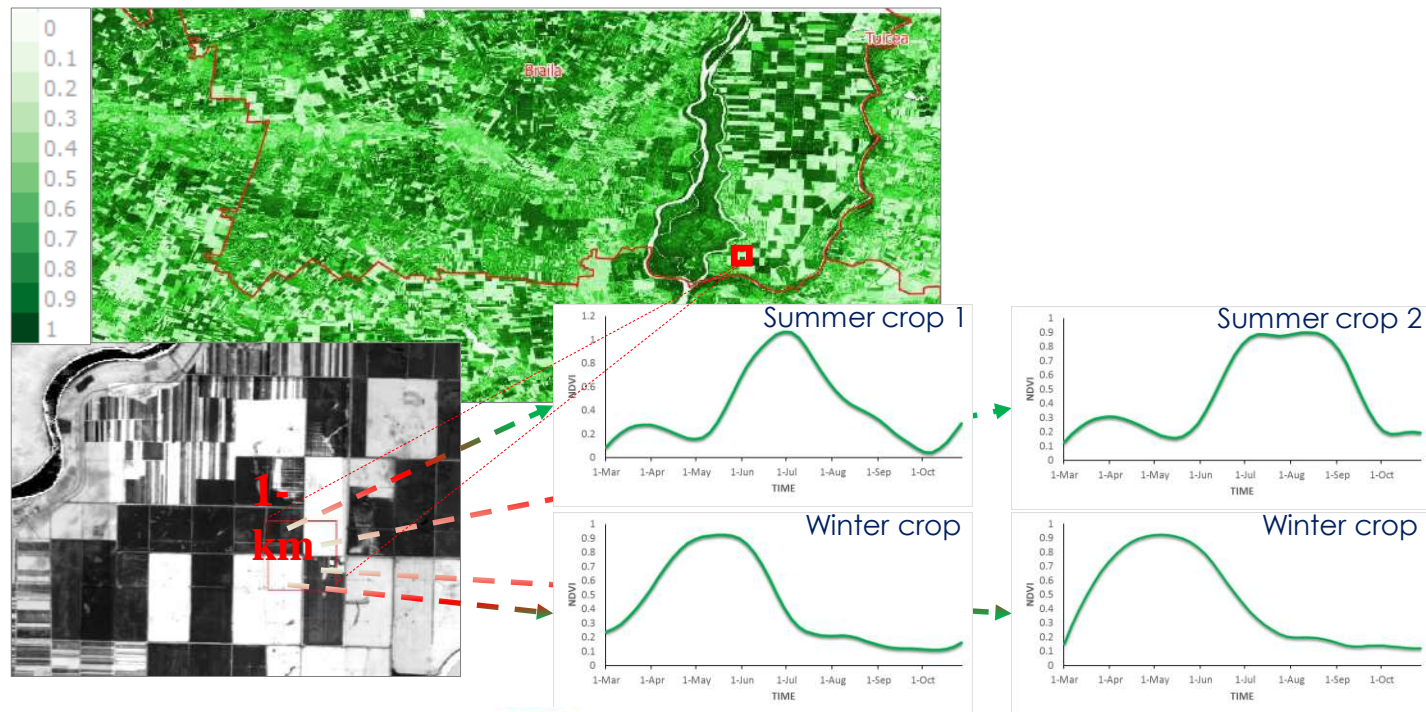
- 1.) big data analysis approach and infrastructure
- 2.) quality as low/medium resolution (atm.correction, reflectances, compositing, BRDF...)
- 3.) Long time series (continuity of main missions and inter-calibration with new ones, data fusion...)
- 4.) data validation/ against other satellite sources and ground control points

# 1. PROVIDE CROP SPECIFIC OBSERVATIONS

- High spatial resolution data permits to overcome Low Resolution (LR) limitations in providing crop specific information.
- This represents a big step in improving different components of our system, permitting to reach crop-specific monitoring at regional level.

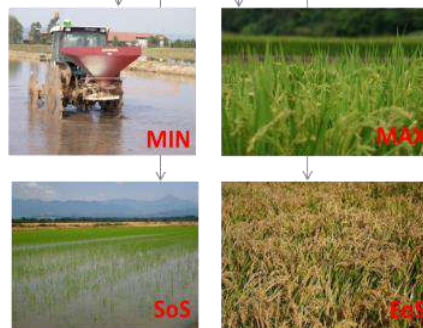
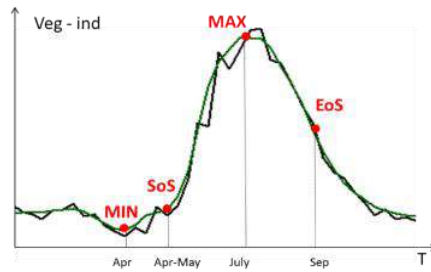


(Lat. 44 48' 21.29" Lon. 27 58' 57.59")



# 2. IMPROVE OF MODEL'S ACCURACY

- High temporal and crop-specific indicators (e.g. NDVI, fAPAR, LAI) from Sentinel 2 would contribute to improve the crop modelling component of the MCYFS by:
  - i. Assimilating them into the models (e.g. forcing, parameter optimization) in order to improve the reliability of crop growth models.
  - ii. Spatializing model parameters in order to set up regional based model calibrations.

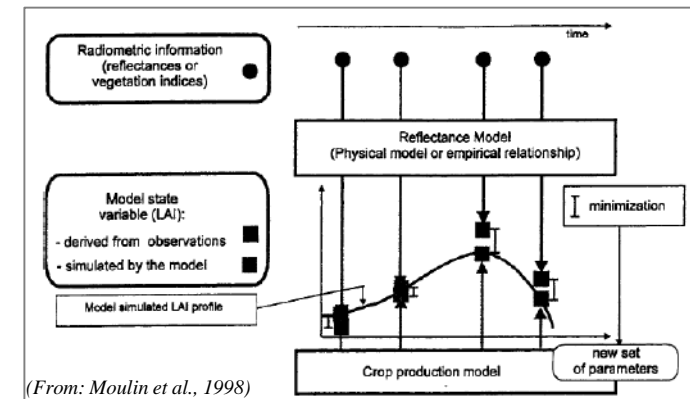


(From: Manfron et al., 2012)

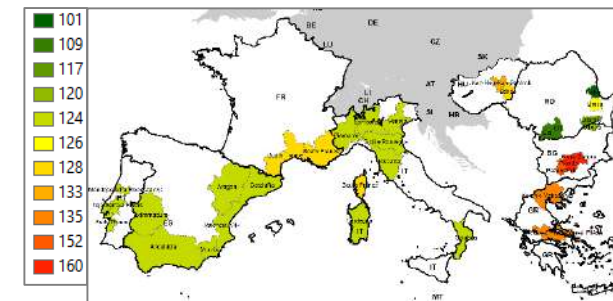
Crop model forcing



Param. spatialization



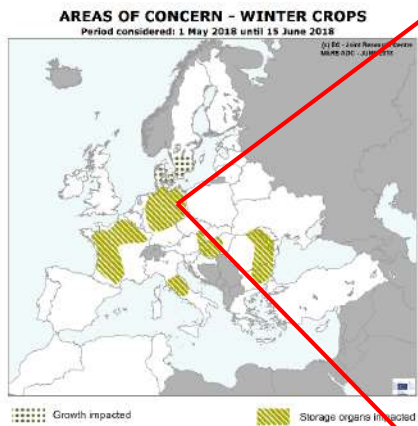
(From: Moulin et al., 1998)



# 3. MONITORING of EXTREME EVENTS

- **ASAP / MCYFS can benefit of high resolution satellite images during the analyses of specific areas of concern, to provide a better assessment of the damage intensity but also to derive insights on the affected areas.**

Area Of Concern



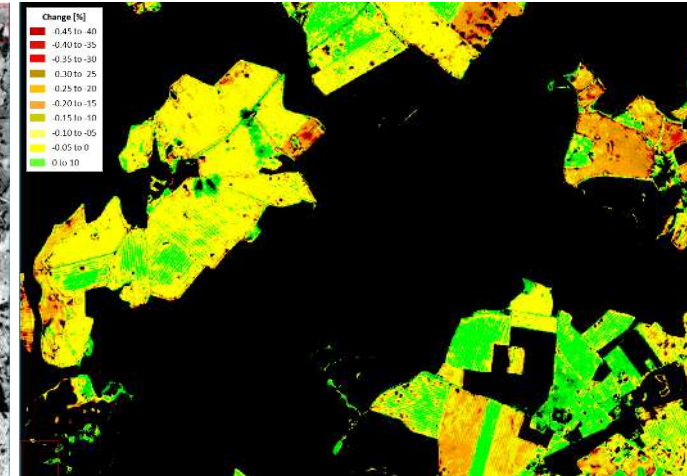
2017 Vegetation index



2018 Vegetation index



HR Vegetation index changes



(Cammin, Germany. Lat. 53 59' 23.13" Lon. 12 21' 25.48")

# Expected future improvements

- Crop specific observations (area and yield)
- Improve reliability of the crop models
  - Calibration
  - Estimation of crop specific parameters to run the model
  - Simulate correctly responses of the crop to abiotic stresses
- Monitoring with higher precision impact of extreme events
- and we will continue to rely on low resolution data as well.....

# Thank you

<https://ec.europa.eu/jrc/en/mars>



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