



Analysis of inter-annual variations  
of the vegetation phenological state  
from AVHRR time series.  
Comparison with modelling results

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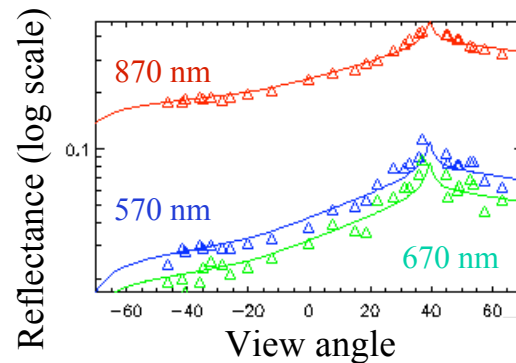
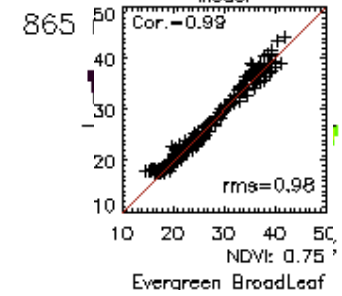
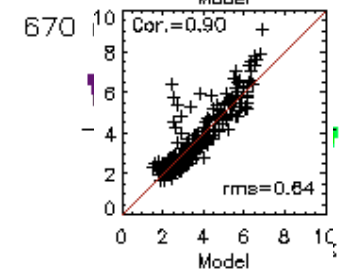
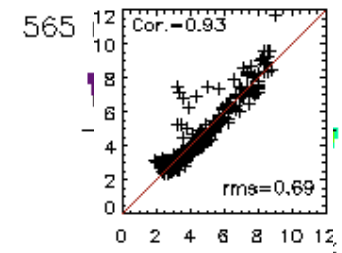
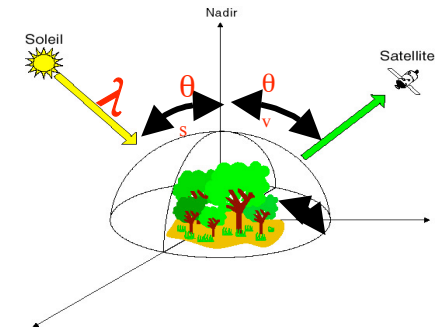
# Reflectance directional signatures

Reflectance of natural targets varies with the observing geometry

We have used measurements from the POLDER satellite to study the magnitude and variability of the angular signatures

BRDFs can be accurately reproduced by a simple analytical model of the form

$$R(\theta_s, \theta_v, \varphi) = k_0 + k_1 F_1(\theta_s, \theta_v, \varphi) + k_2 F_2(\theta_s, \theta_v, \varphi)$$





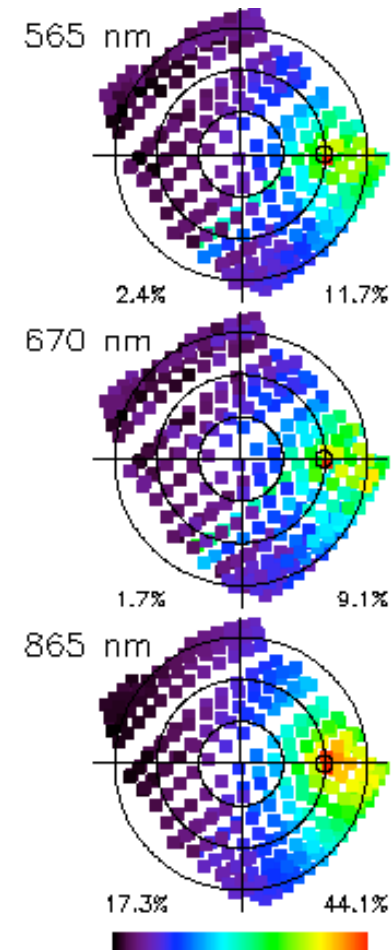
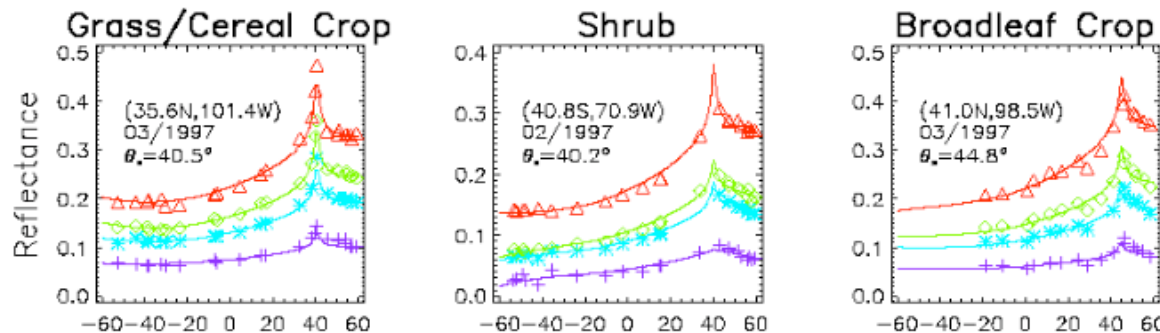
# Modeling per biome

The Bidirectional Signature is

$$BS(\theta_s, \theta_v, \varphi) = 1 + \frac{k_1}{k_0} F_1(\theta_s, \theta_v, \varphi) + \frac{k_2}{k_0} F_2(\theta_s, \theta_v, \varphi)$$

Within a given biome, the variability of the directional signature is rather small

We defined "typical" directional signature (i.e.  $k_1/k_0$  and  $k_2/k_0$ ) for each biome.





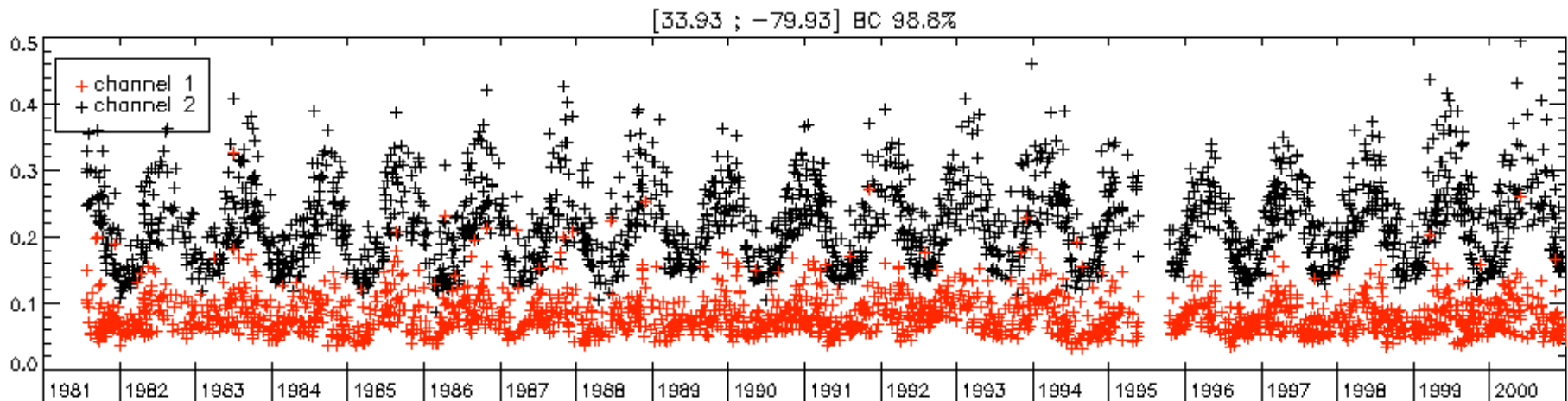
# AVHRR time series

Use Pathfinder AVHRR Land (PAL) time series

Period 1981-1999, daily, 8 km resolution. Geocoded and calibrated data, corrected for molecular scattering and ozone absorption

Focus on channel 1 (visible) and 2 (near IR). Other channels for cloud detection

Pre-processing : Cloud detection, correction for water vapor absorption.



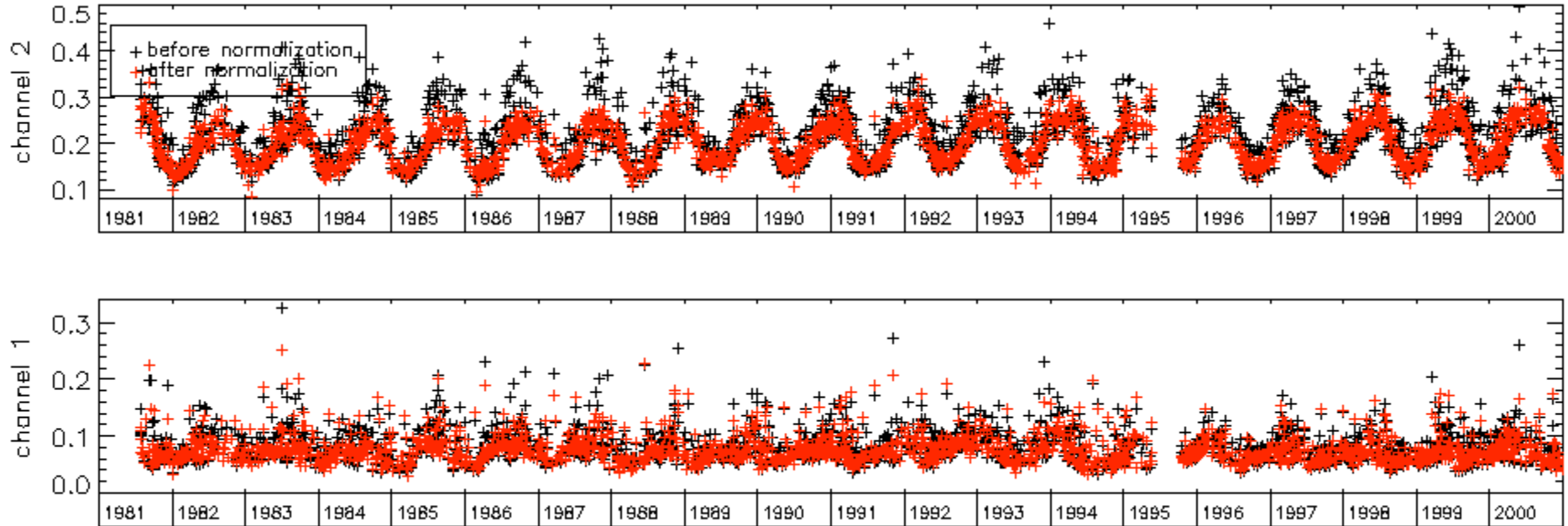


# Correction for directional effects

Puts the reflectance measurements in a standard observation geometry  
Makes use of the directional signatures derived from POLDER observations  
(sun at  $40^\circ$ , satellite at nadir)

$$R_{cor}(\theta_0, 0, 0) = R_{mes}(\theta_s, \theta_v, \varphi) \frac{BS(\theta_0, 0, 0)}{BS(\theta_s, \theta_v, \varphi)}$$

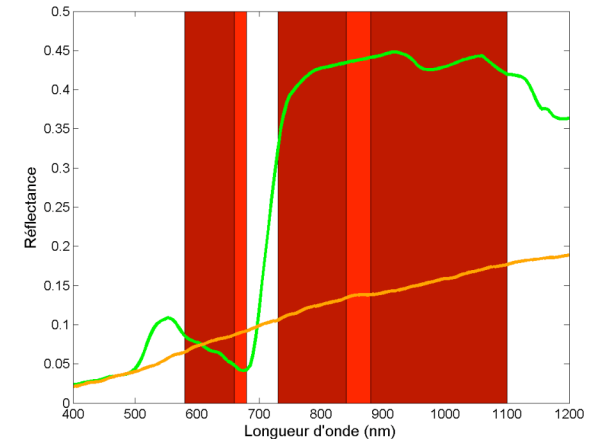
The normalized time series show much less high-frequency variability than the original measurements:





# NDVI or DVI ?

$$DVI = R_{NearIR} - R_{vis} \quad NDVI = \frac{R_{NearIR} - R_{vis}}{R_{NearIR} + R_{vis}}$$



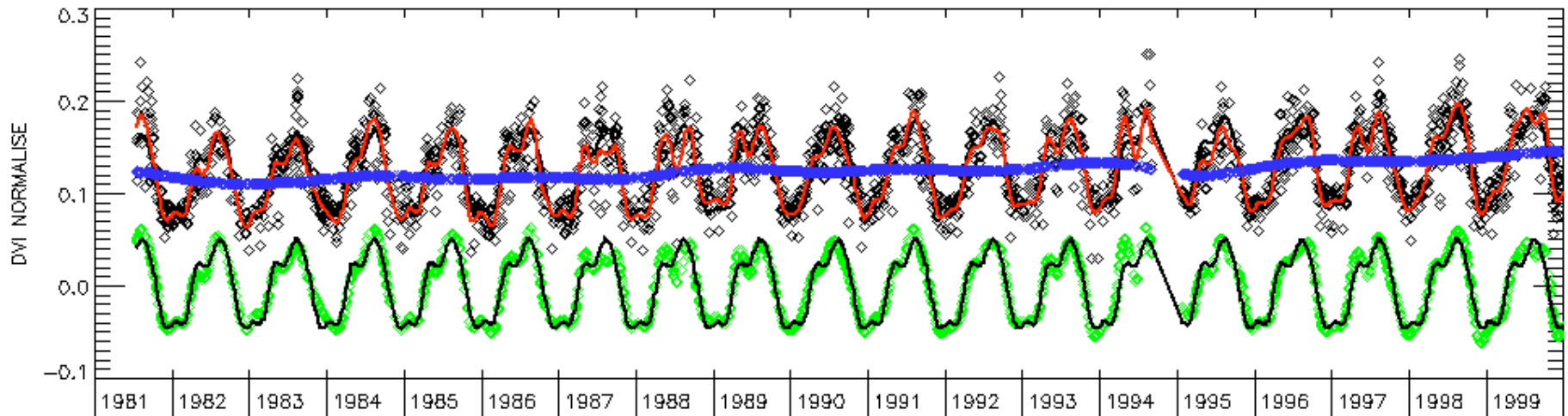
The near-IR channel contains most of the information on the vegetation dynamic

Visible channel is the most affected by atmospheric effects

NDVI corrects partially for directional effects, which is one reason for its wide use

The DVI appears less affected by atmospheric effects.

When an explicit directional correction is available, it appears better than the NDVI (significantly larger signal to noise on the time series)



Measured DVI, Trend, Seasonal Cycle, Smoothed Seasonal Cycle, Smooth curve

Analysis of various frequencies in the data provides the trend, the seasonal cycle and a smooth curve

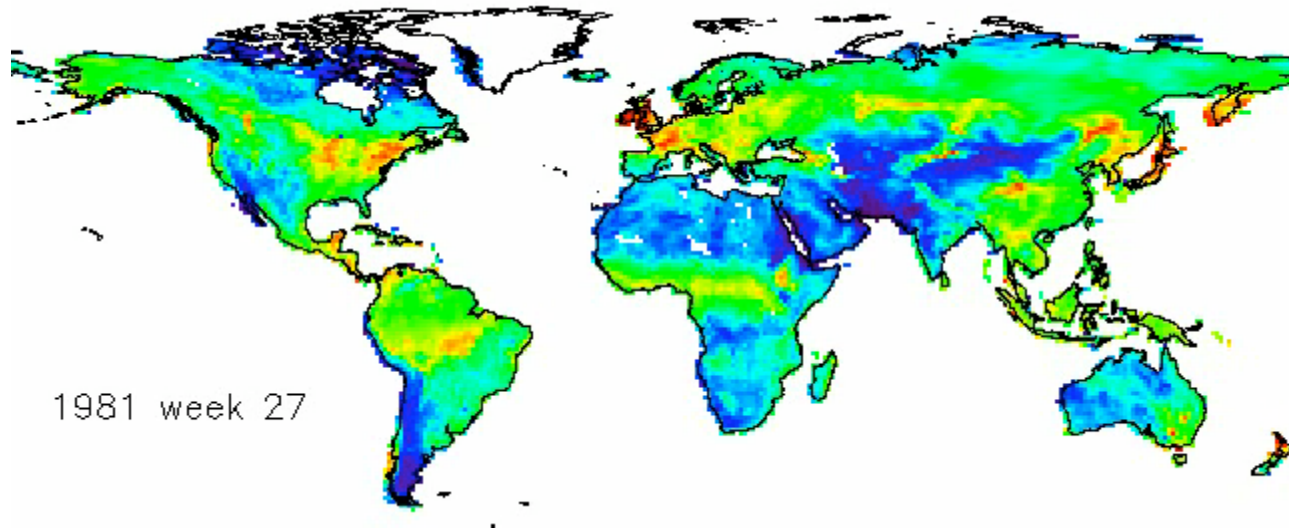
The RMS difference between the measured DVI and the smooth curve is a quantification of the **noise**.

The **signal** is the amplitude of the seasonal cycle, or the trend, or the inter-annual variations of the smooth curve





# 19 years of vegetation dynamic



The data processing provides a global view of vegetation dynamic for 19 years

Suitable to analyze inter-annual variations in relation with meteorology or climate forcings

In the following, we focus on the **onset of vegetation** growth although many other applications are possible





# Vegetation onset

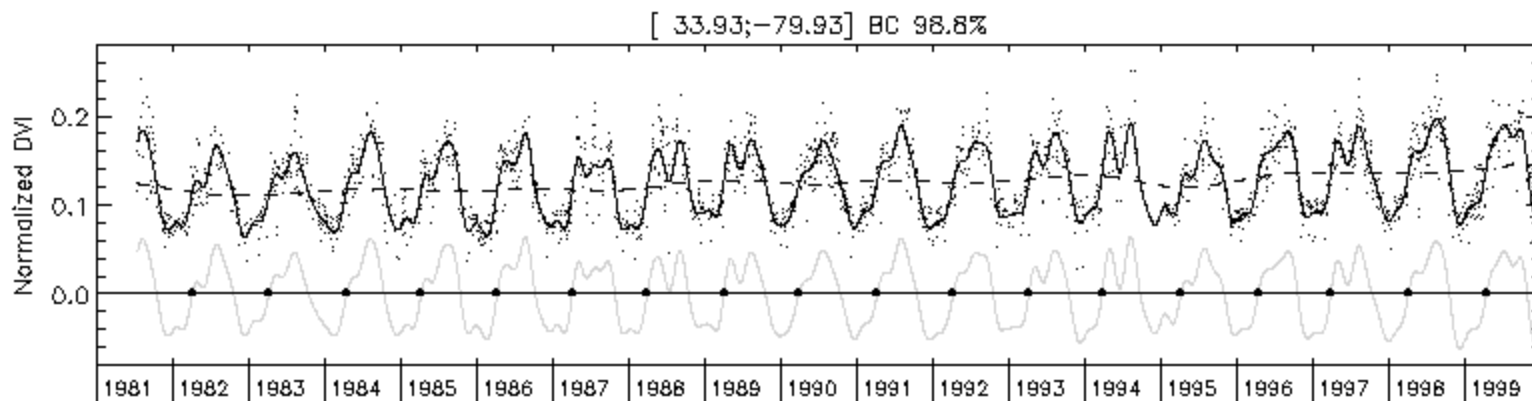
Most vegetated areas show a strong annual cycle of vegetation growth

The dynamic is controlled by temperature, water availability or both.

For a given region, the total Carbon uptake is strongly linked to the date of vegetation onset (earlier → more uptake)

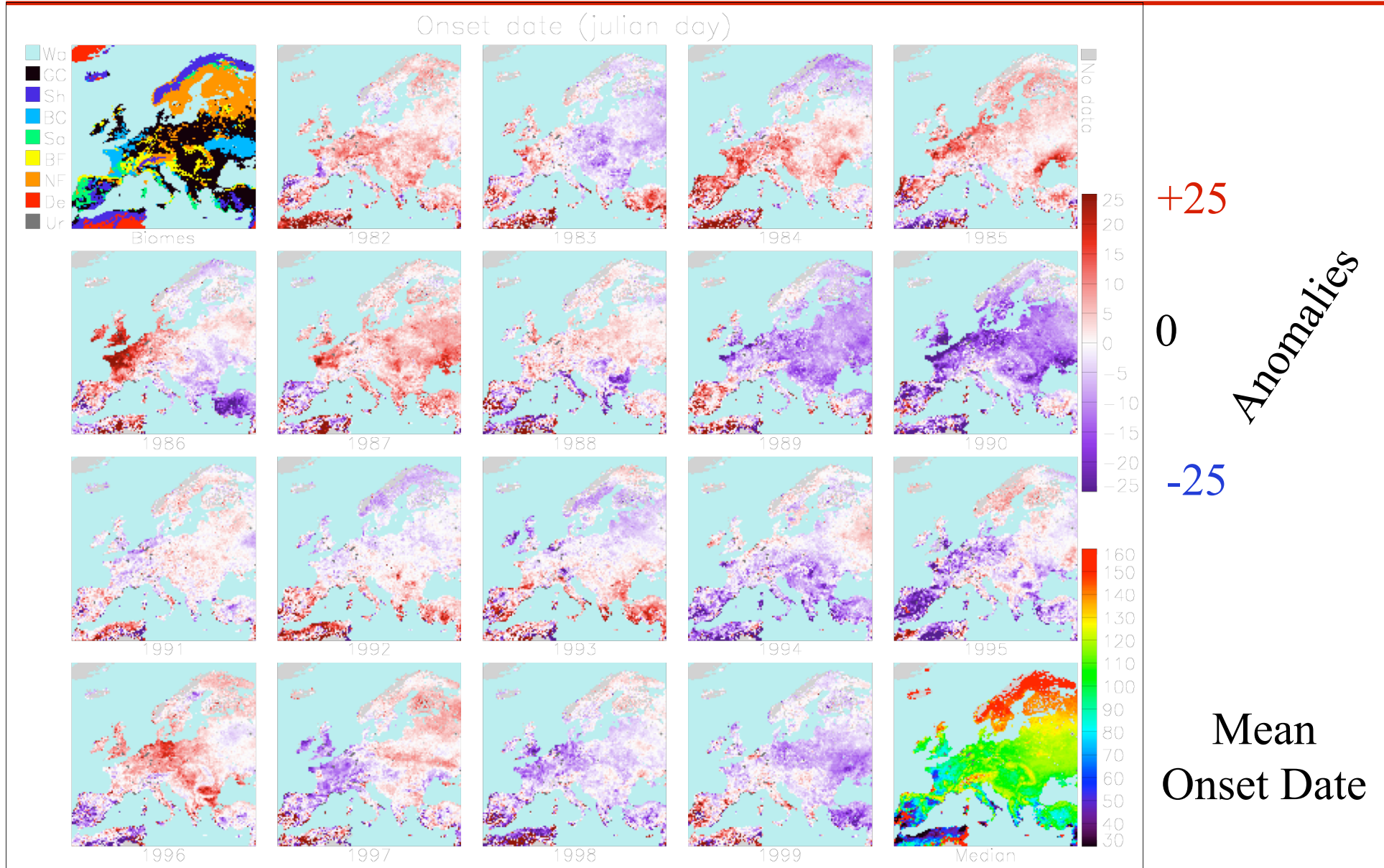
From our DVI time series, we estimate the vegetation onset as the date when the *smooth curve* crosses the *trend* upward.

A small fraction of sites have a seasonal cycle not suitable for such procedure (double crosses)





# Results over Europe





# Validation of onset date estimate

Maps of onset date anomalies show **coherent patterns** at the 500-1000 km scale, consistent with meteorological forcing

Since all pixels are processed independently, it is a strong indication that there is **some information in the satellite product**

**Further validation** requires comparison with in-situ observations. Difficult task because of

- In-situ data availability
- Spatial heterogeneity
- Mix of various vegetations with different phenologies

We have found **three valid databases for the comparison**

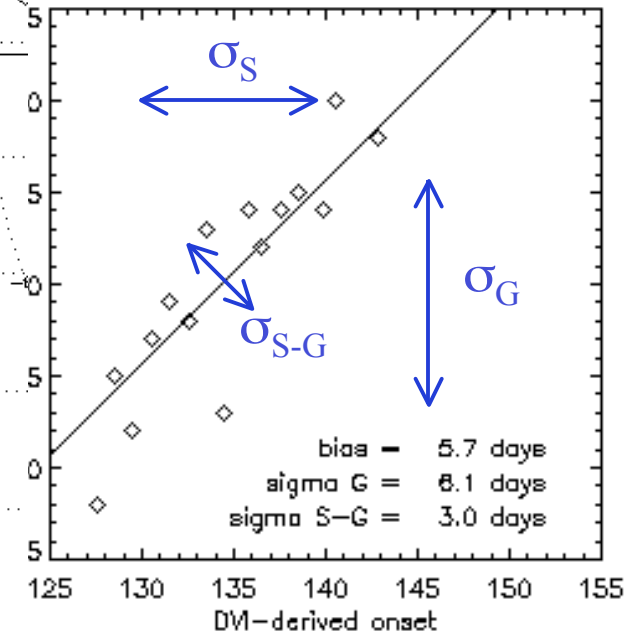
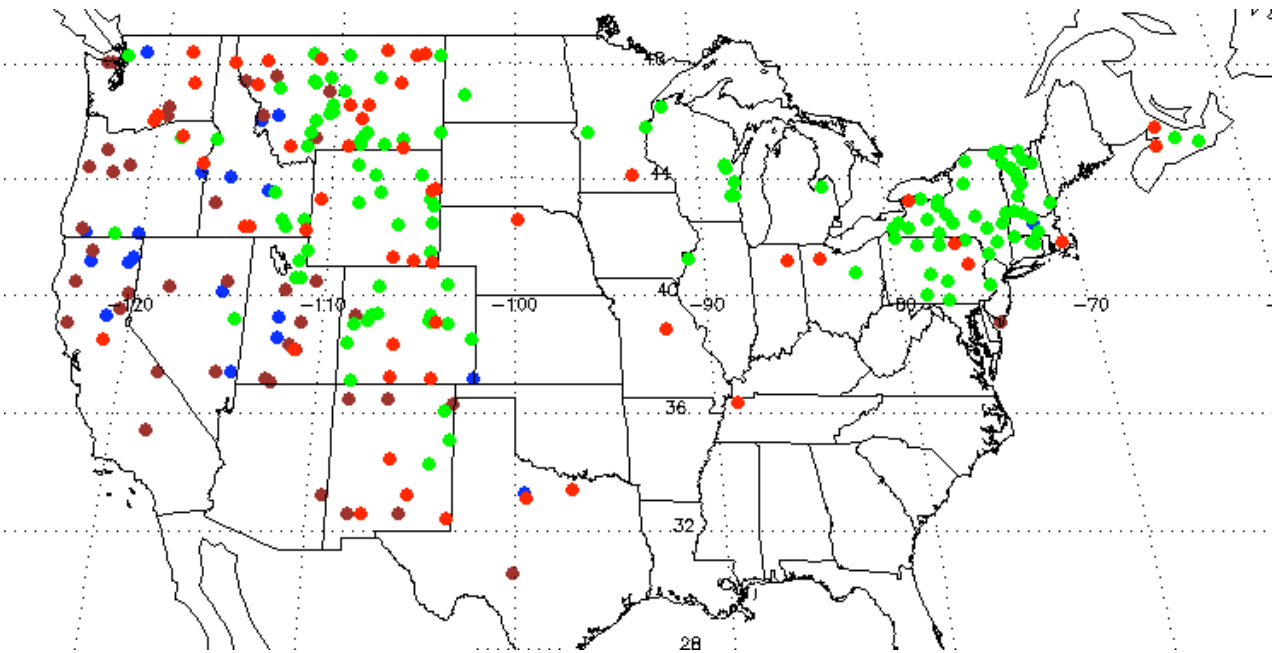
- Lilac phenology at many sites over the United-States
- Onset dates of various trees at a few sites in Switzerland
- Phenology of various trees at a few sites in Siberia



# Results over United-States

Schwartz, M.D. & Caprio, J.M.  
North American Lilac database

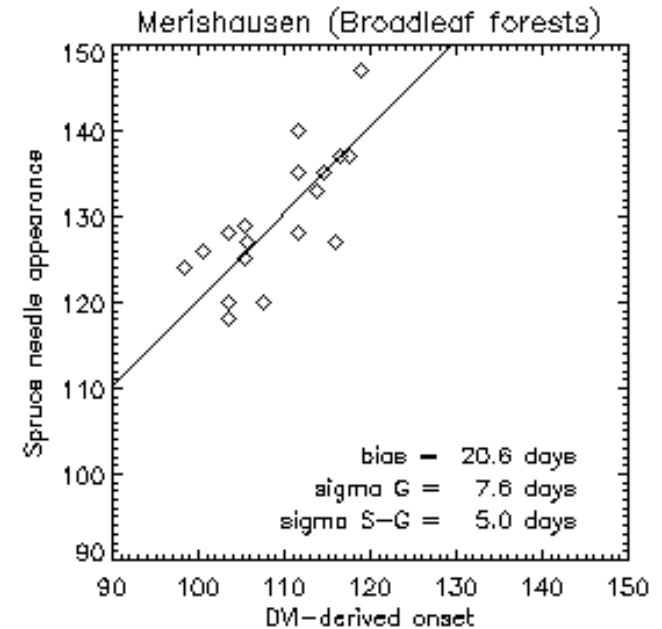
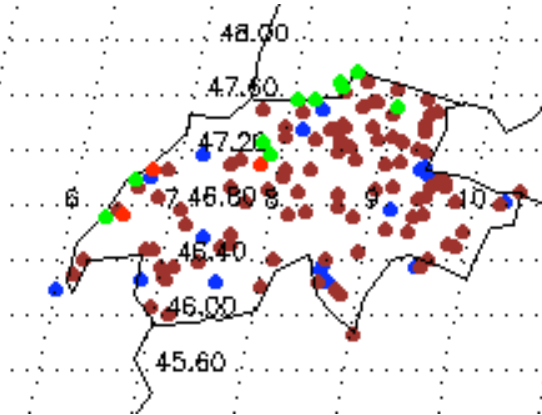
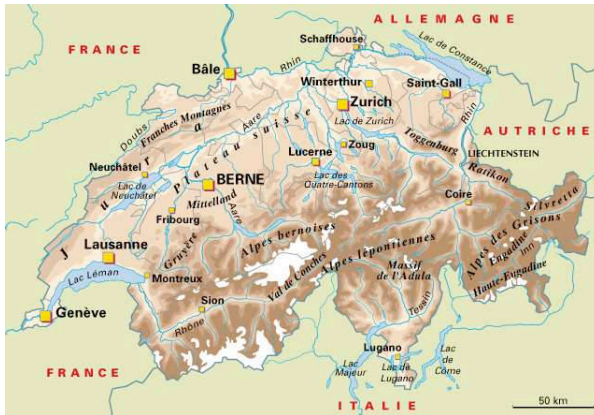
Norfolk, Connecticut



no threshold :  $\sigma_{S-G} < \sigma_G$        $\sigma_{S-G} > \sigma_G$

SNR threshold:  $\sigma_{S-G} < \sigma_G$        $\sigma_{S-G} > \sigma_G$

High correlation between in-situ and satellite derived onset dates.



Using quality thresholds, only green stations are selected :

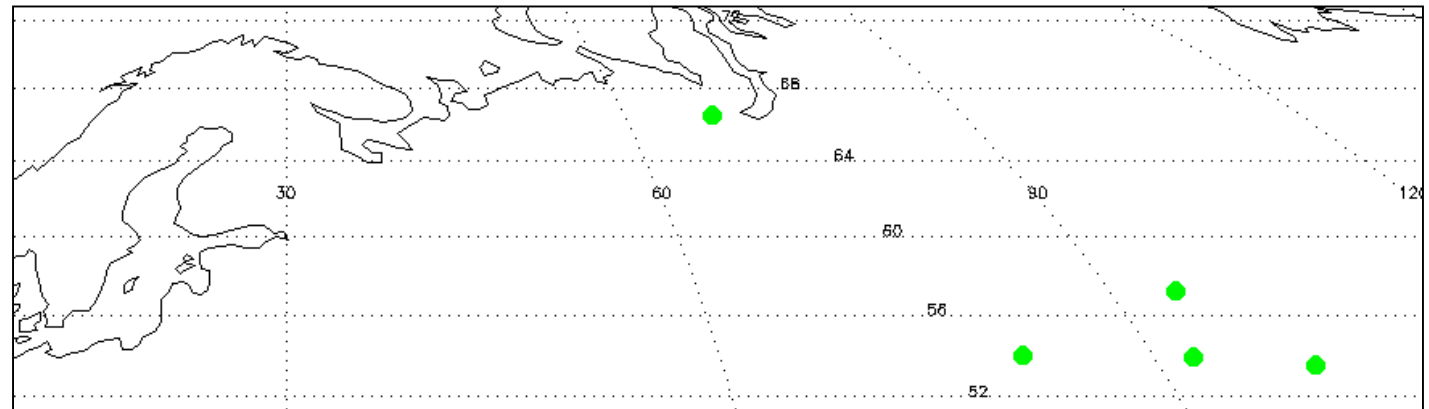
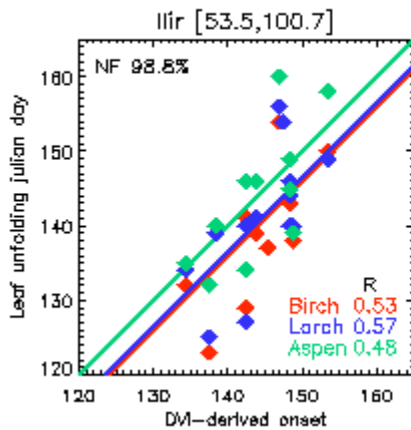
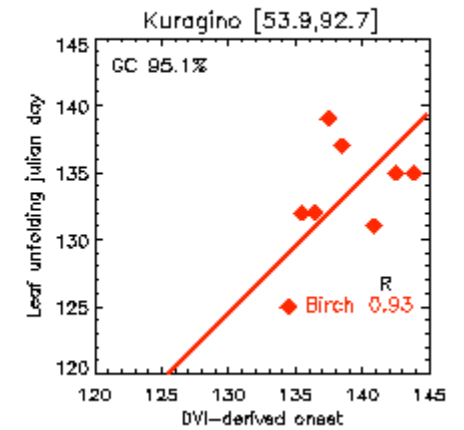
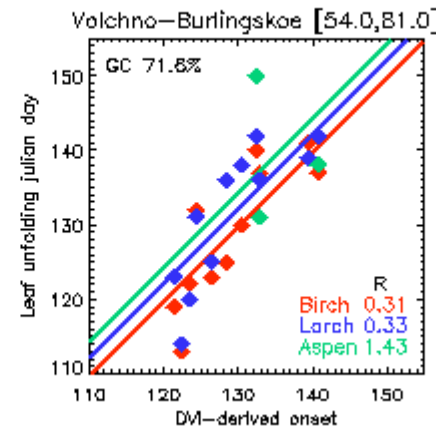
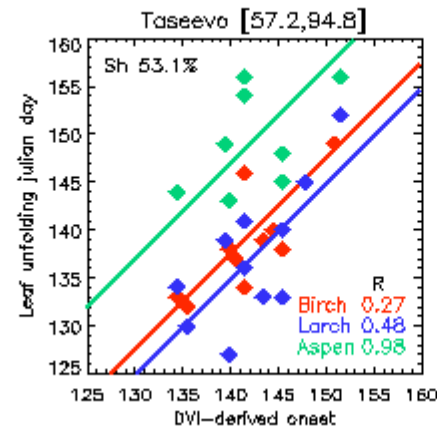
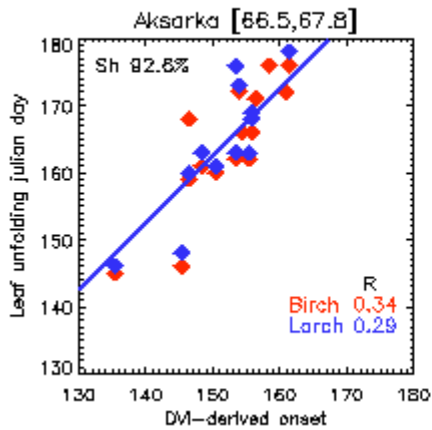
- more than 75% of them with a good correlation
- all are located in the Swiss plain, none in the Alps

Poor correlation between in-situ and satellite derived onset dates.  
 Further analysis show a large variability of in-situ observations.  
 Interpreted as the result of large height variations within short distances  
 (very heterogeneous pixels)





# Results over Siberia



High correlation between in-situ and satellite derived onset dates.



## Conclusions on validation

The satellite products contains some information on the onset date (not just noise)

It is based on a spatial average over  $\approx 10 \times 10 \text{ km}^2$  so that a quantitative evaluation against in-situ observation is not possible

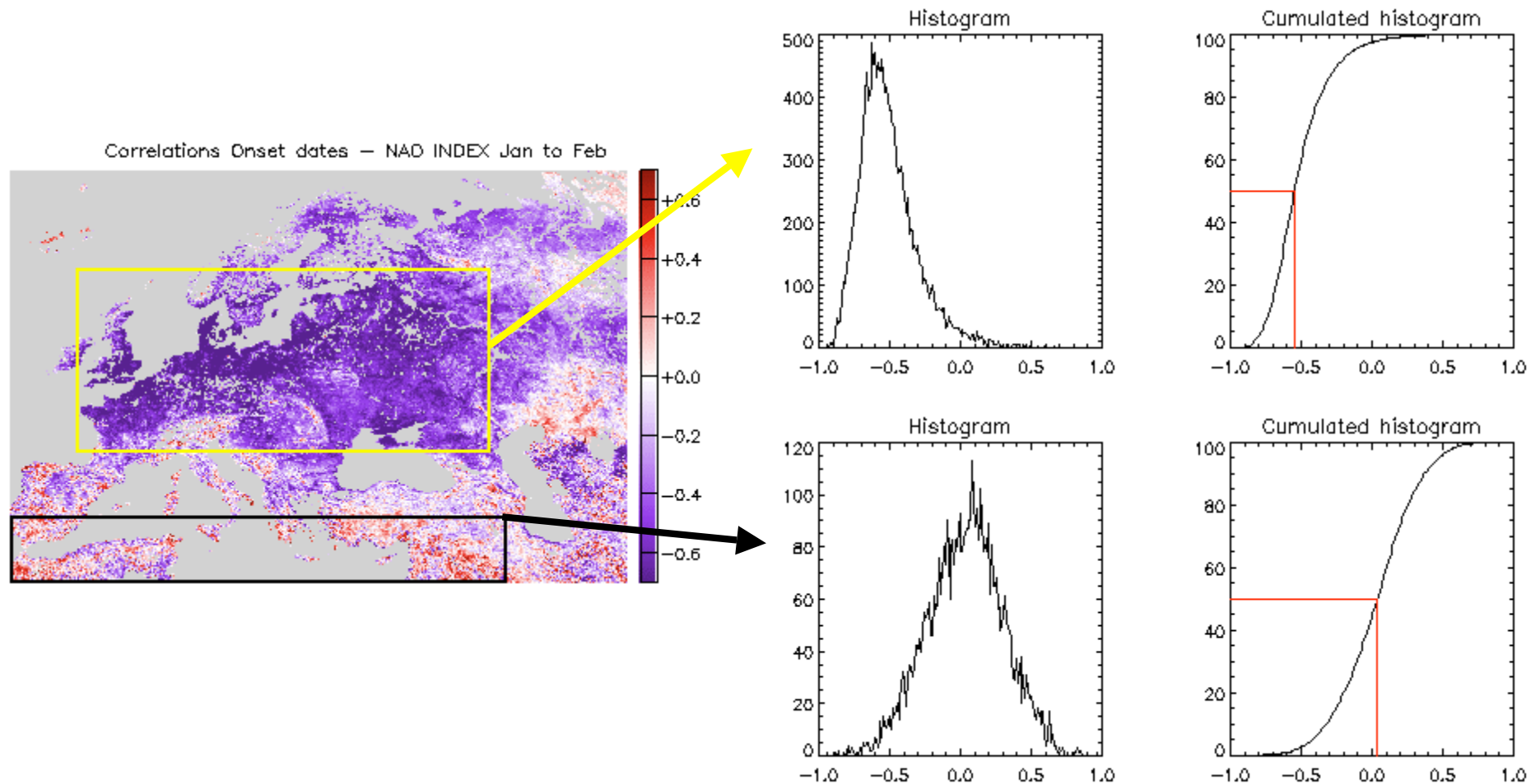
Several sites, in homogenous areas, show an excellent correlation. The standard deviation of the difference between the in-situ and the satellite derived date is **a few days** (depending on location and vegetation type)





# Correlation with NAO over Europe

NAO is the difference of surface pressure between Iceland and Azores.  
It controls the flow from the Atlantic to Western Europe  
There is a strong correlation of winter NAO with Onset Date





# The Orchidée vegetation model

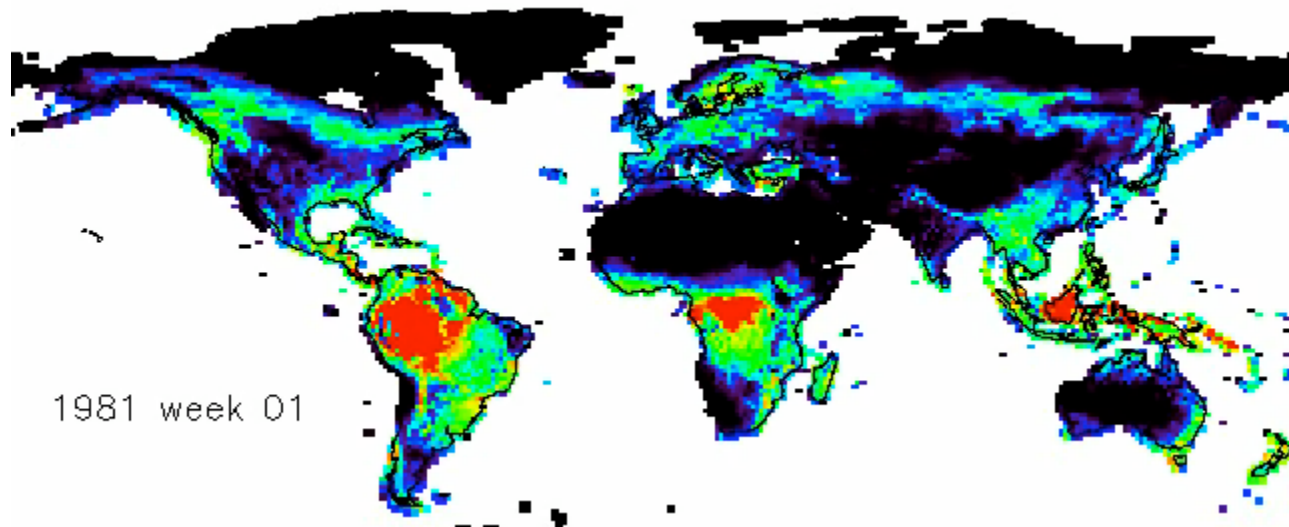
The model computes the development of vegetation and the fluxes of energy and mass from the meteorological forcing (temperature, precipitation, radiation)

12 Plant Functional Types (PFT)

Developped at IPSL. <http://orchidee.ipsl.jussieu.fr>

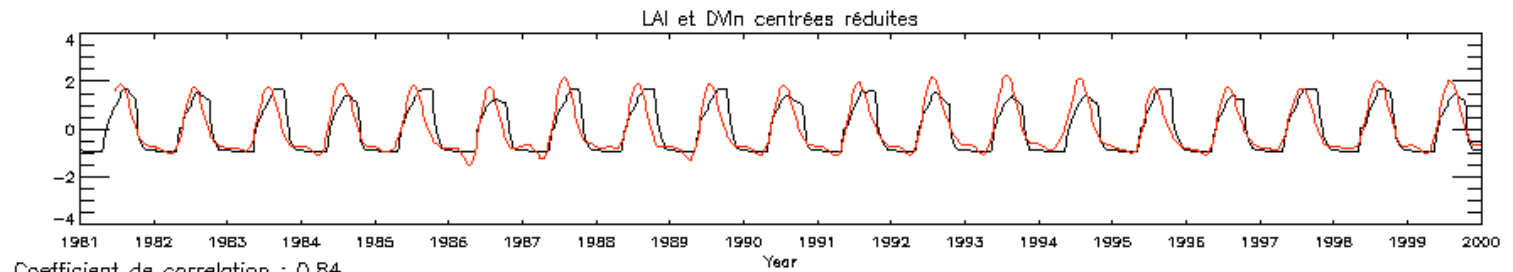
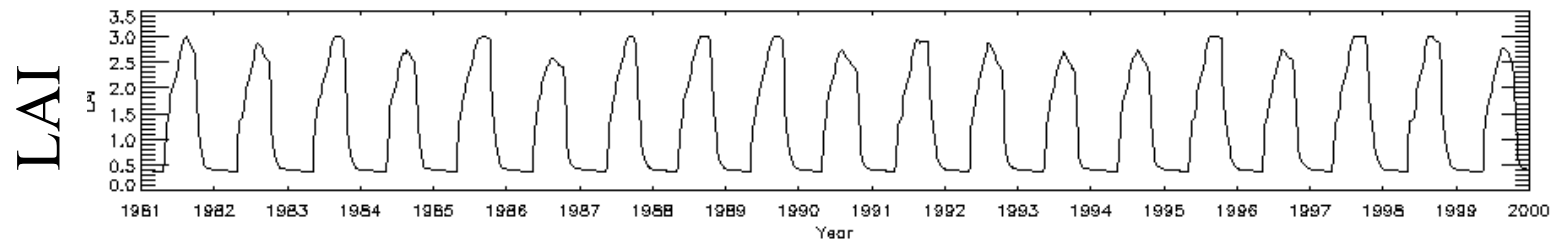
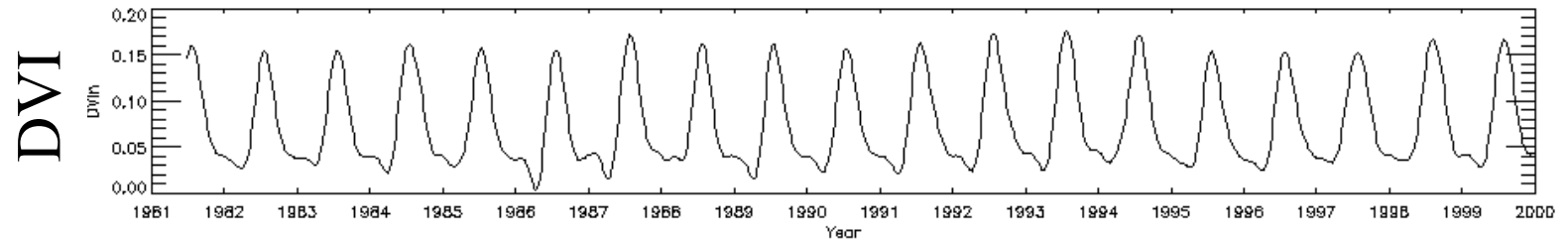
We use the LAI as a proxy of the vegetation dynamic

The onset date is selected as the date when the LAI crosses upward the annual mean

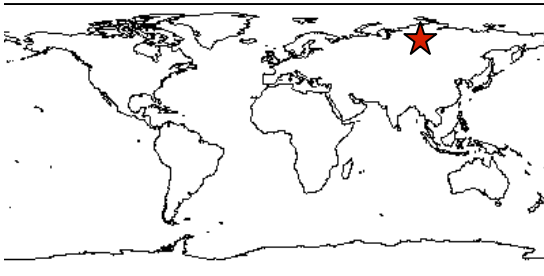




# DVI and LAI annual cycles (1/4)



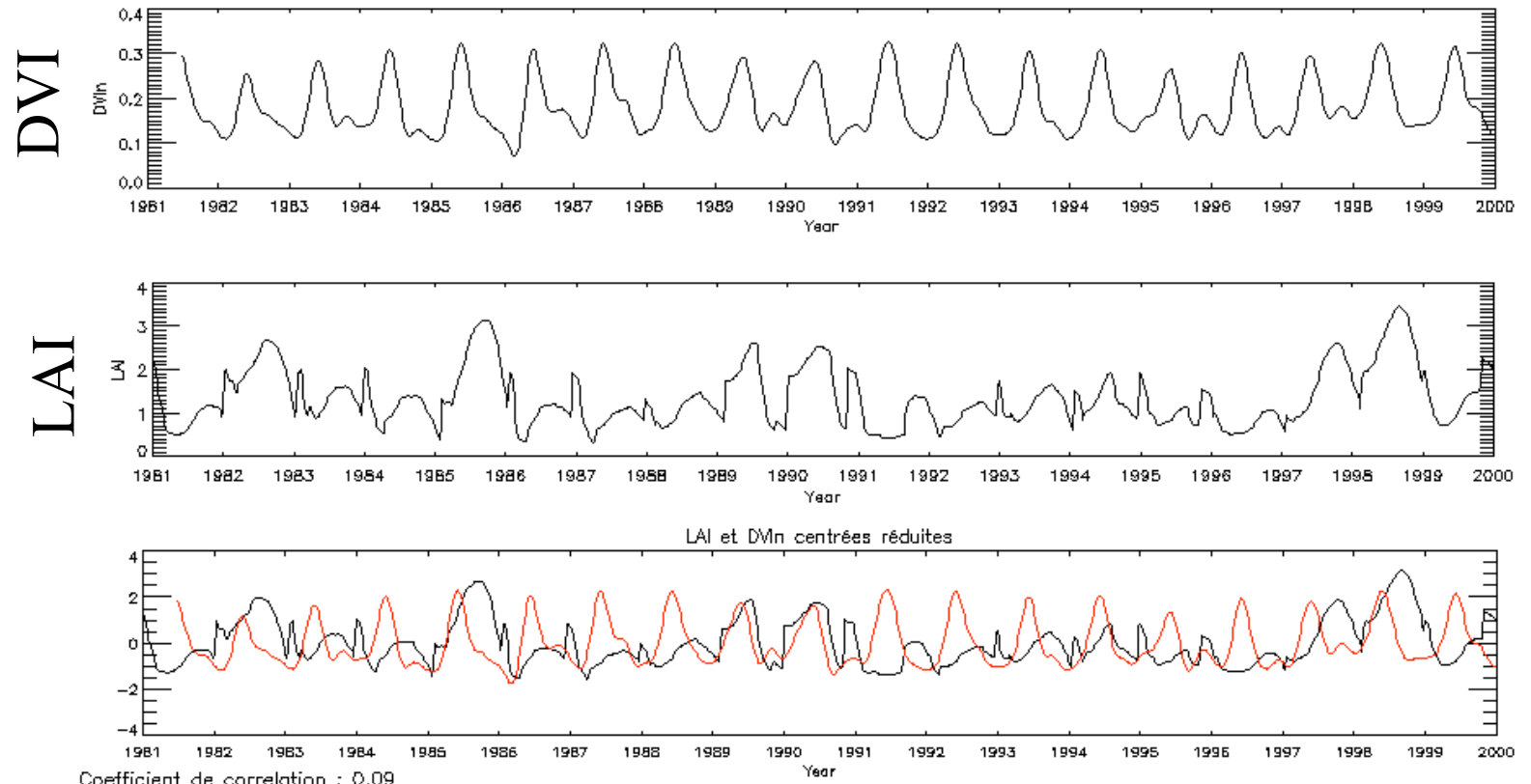
Coefficient de corrélation : 0.84



Good coherence of model and satellite time series over Siberia



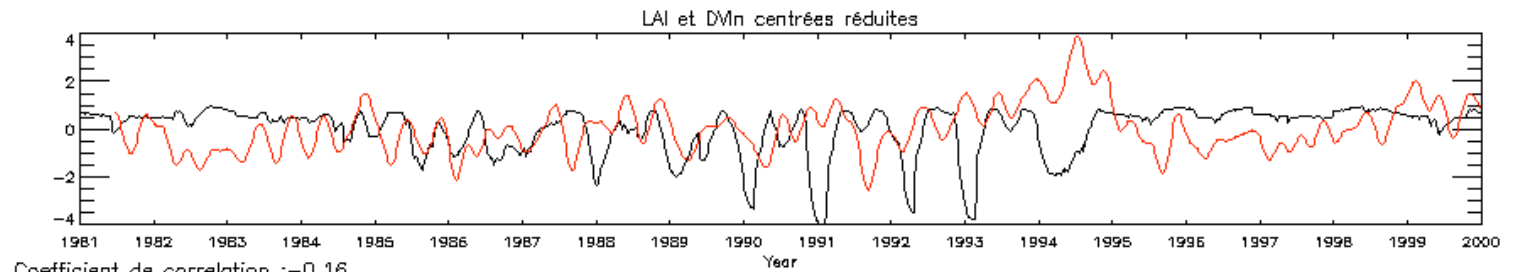
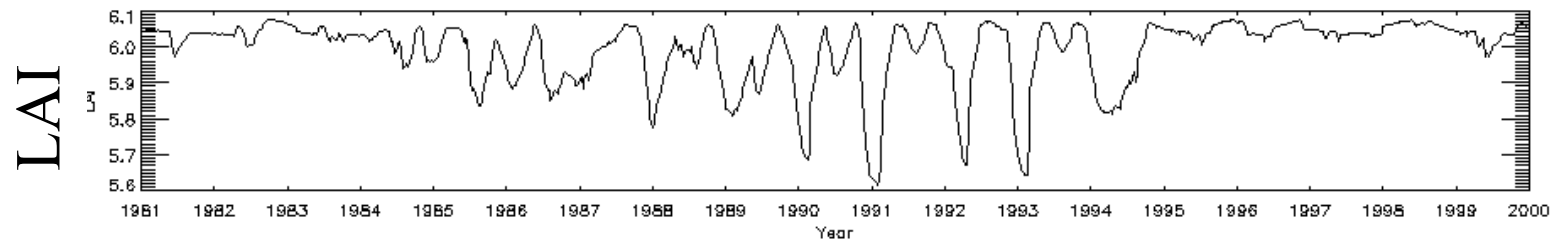
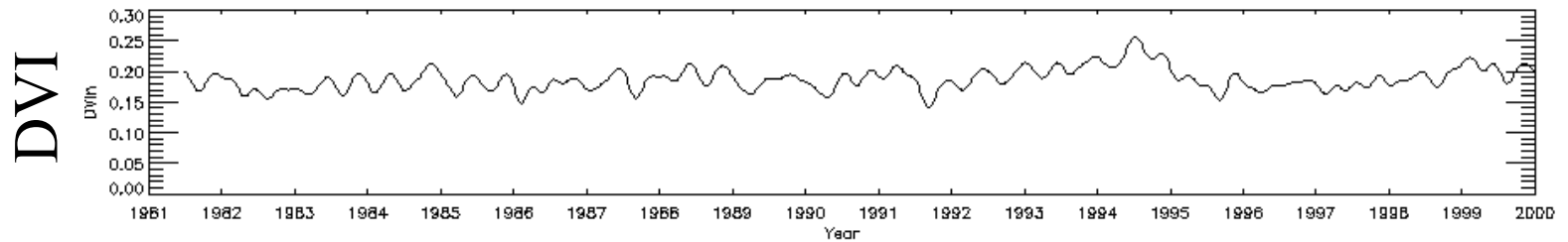
# DVI and LAI annual cycles (2/4)



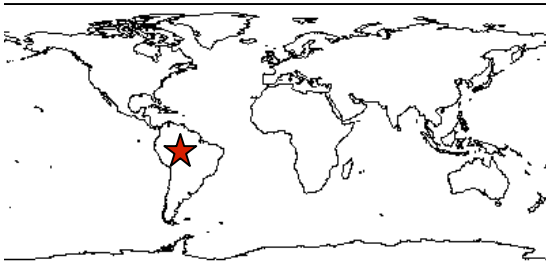
Not that good over UK...



# DVI and LAI annual cycles (3/4)



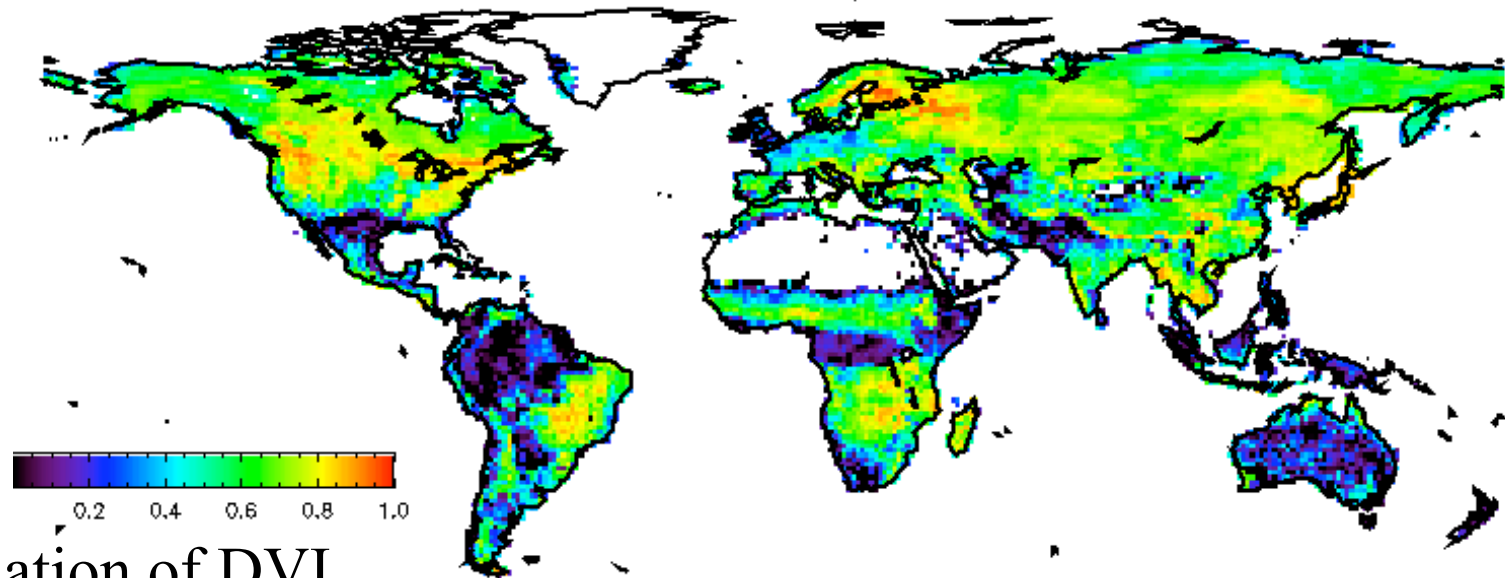
Coefficient de corrélation :  $-0.16$



Very poor correlation over Amazonia...  
But almost no annual cycle



# DVI and LAI annual cycles (4/4)



Correlation of DVI  
and LAI time series

Poor correlation in areas with limited annual cycle (evergreen forests)  
Best over temperate forests



# Onset dates based on LAI

We use the same procedure to extract the onset from the LAI time series

A bias may be expected

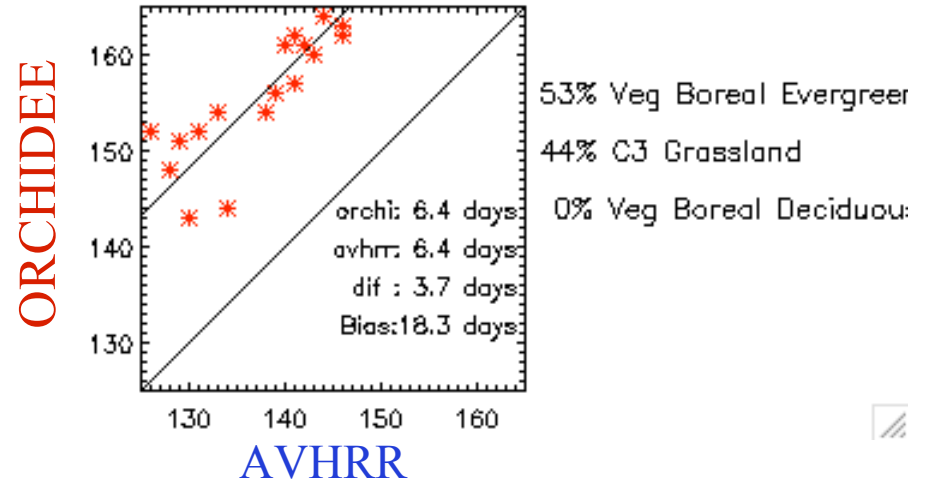
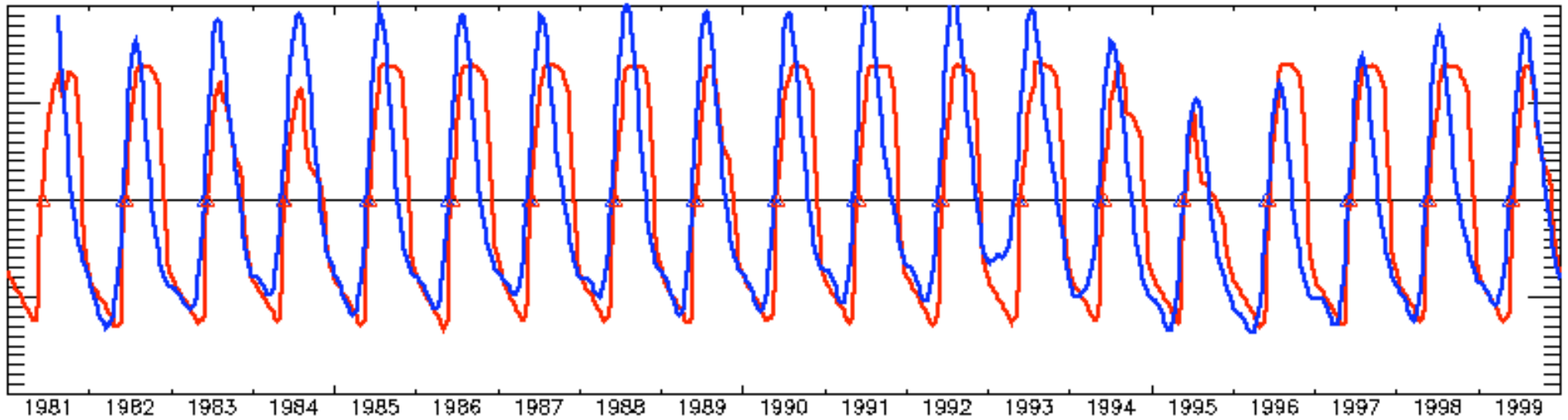
Is there a proper consistency between the onset derived from the model  
and that observed from satellite ?





# A few examples (1/4)

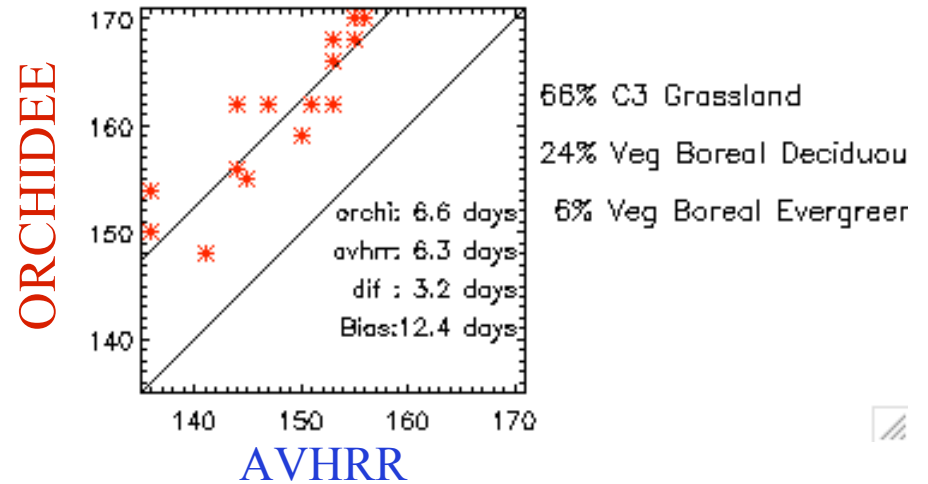
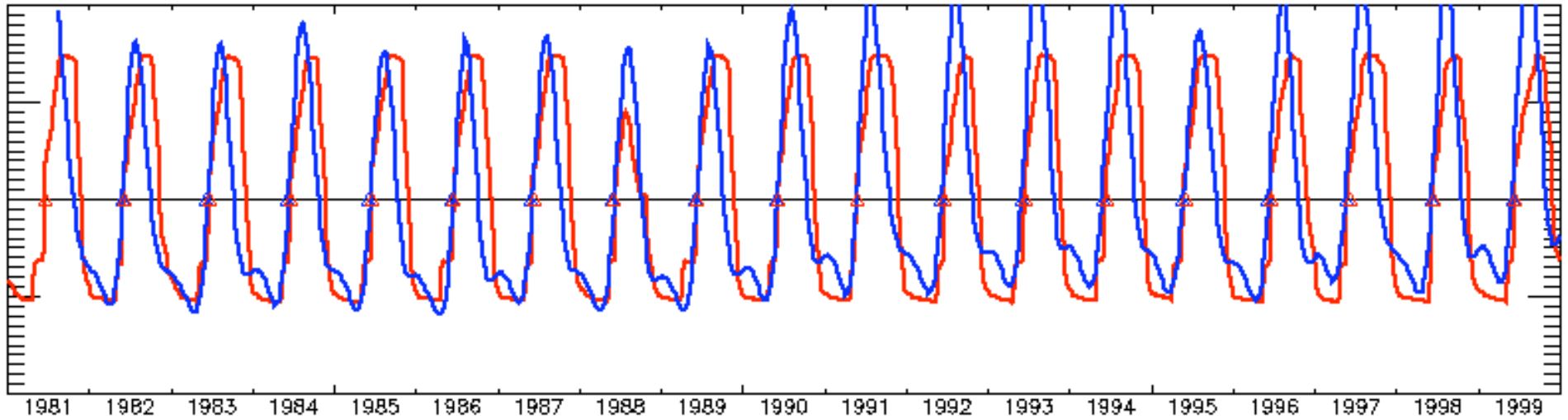
AVHRR ORCHIDEE





# A few examples (2/4)

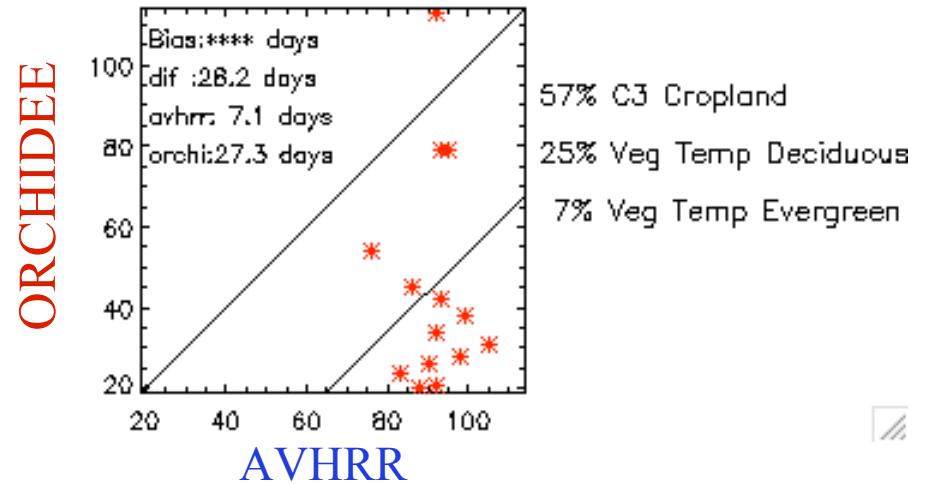
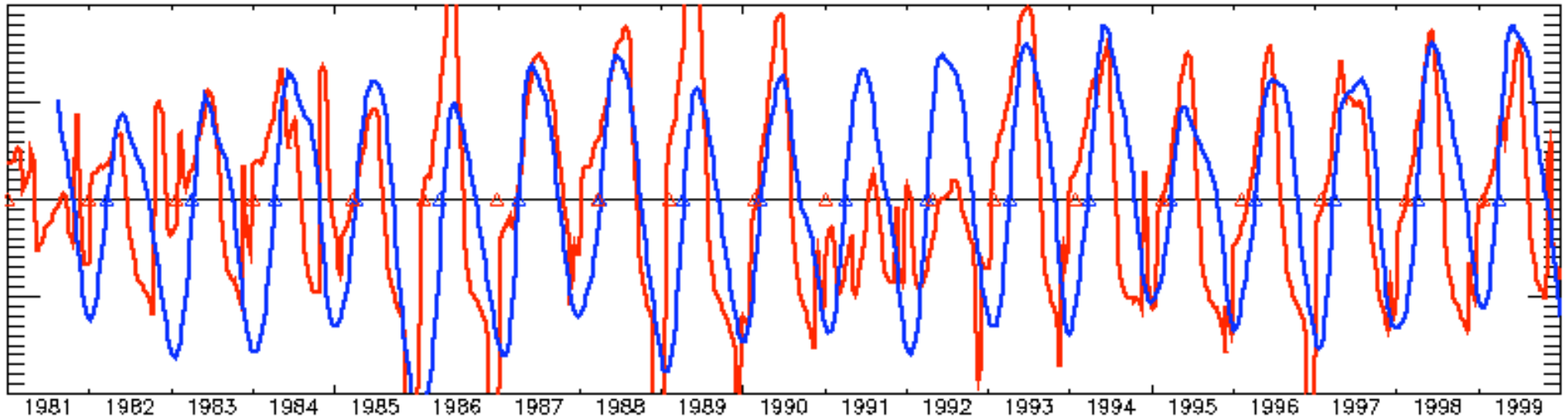
AVHRR ORCHIDEE





# A few examples (3/4)

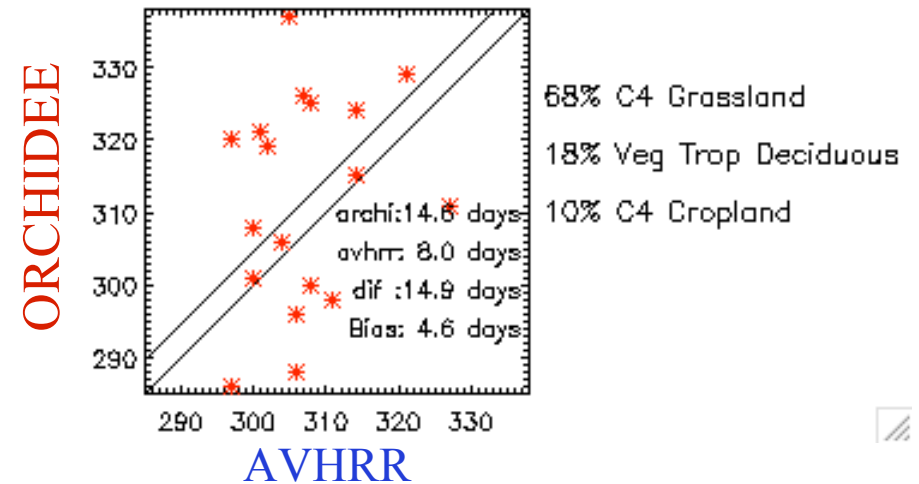
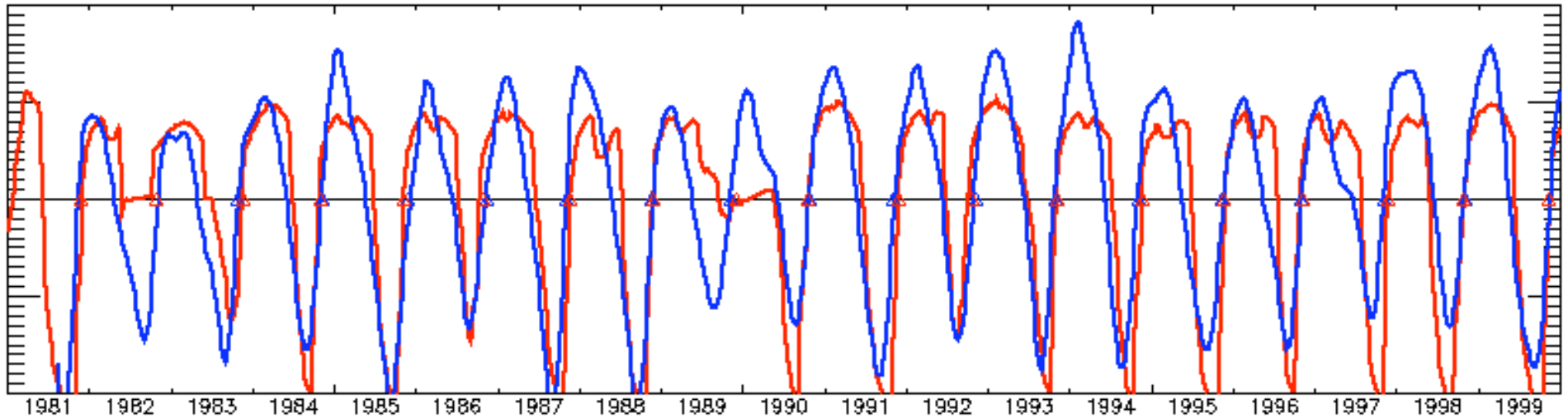
AVHRR ORCHIDEE





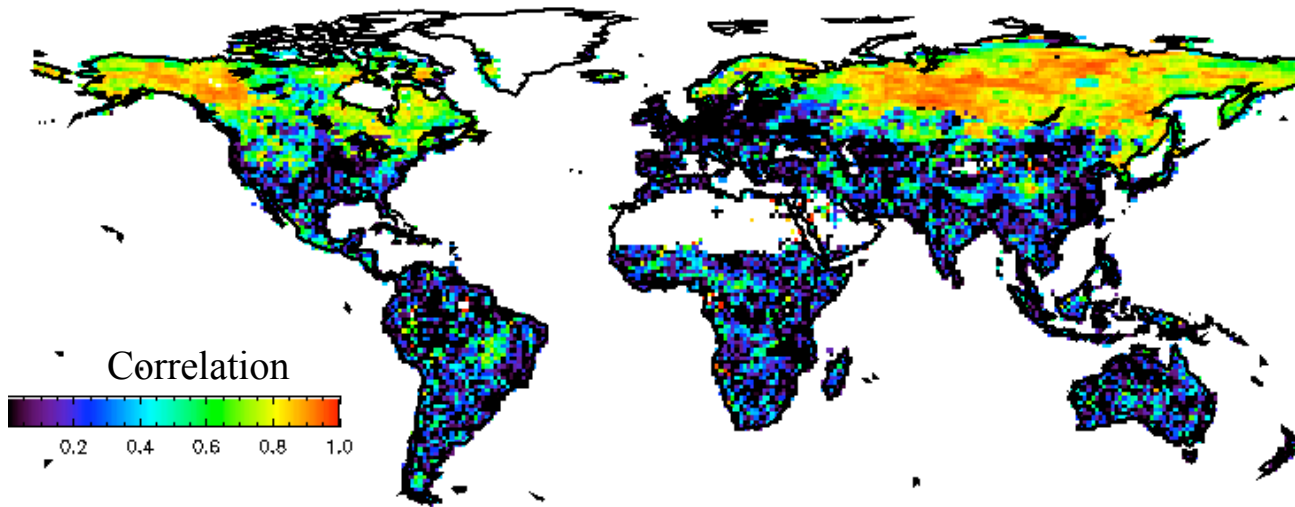
# A few examples (4/4)

AVHRR ORCHIDEE

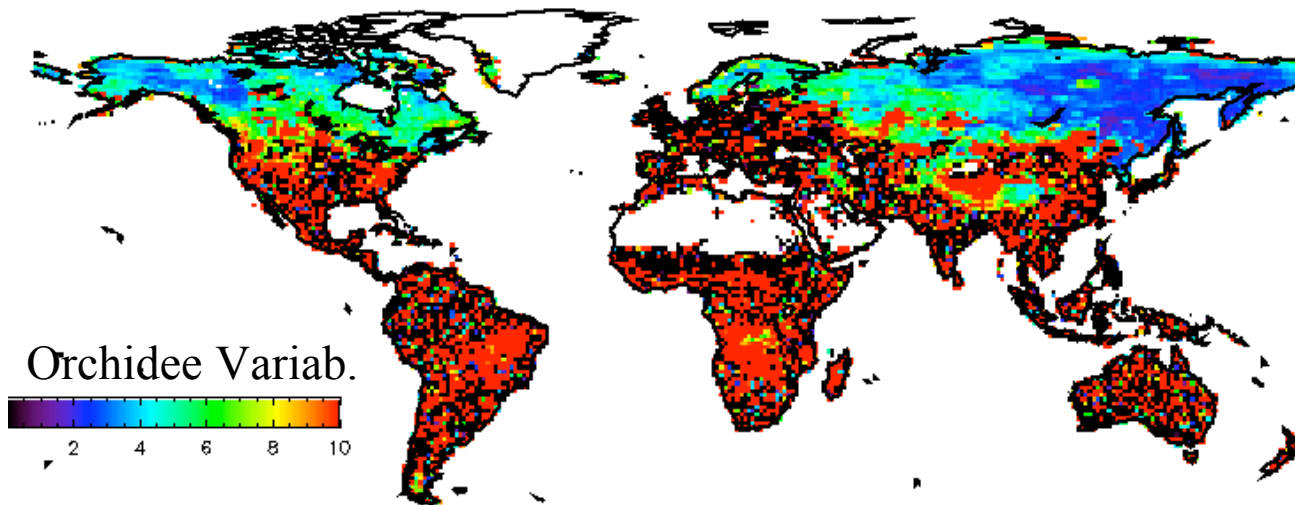




# Sat-Model Global Correlation

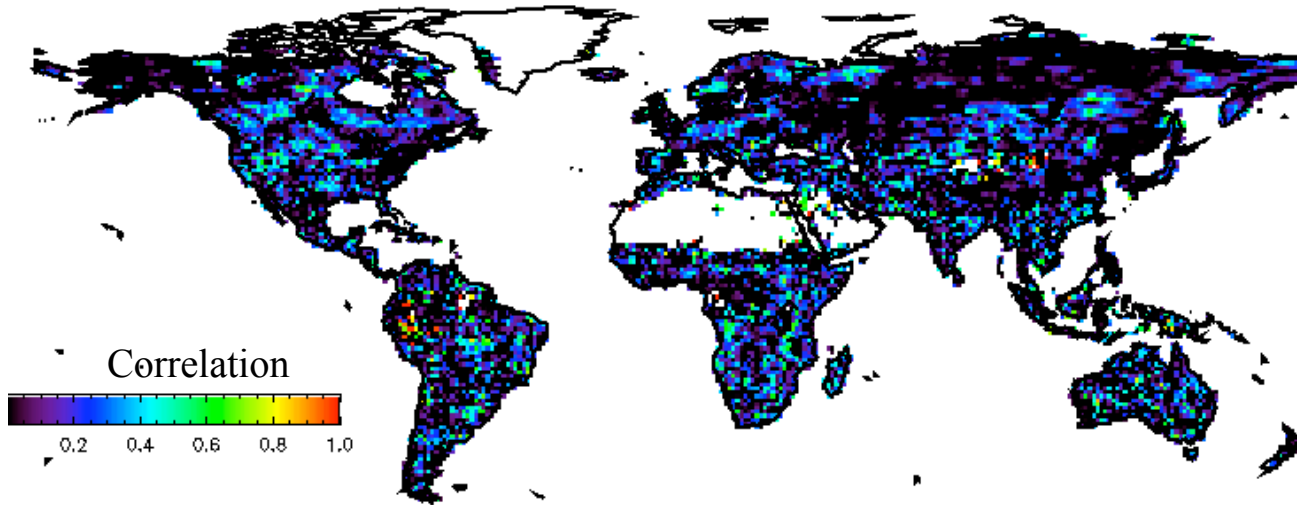


Excellent agreement in high latitude regions. Rather poor everywhere else

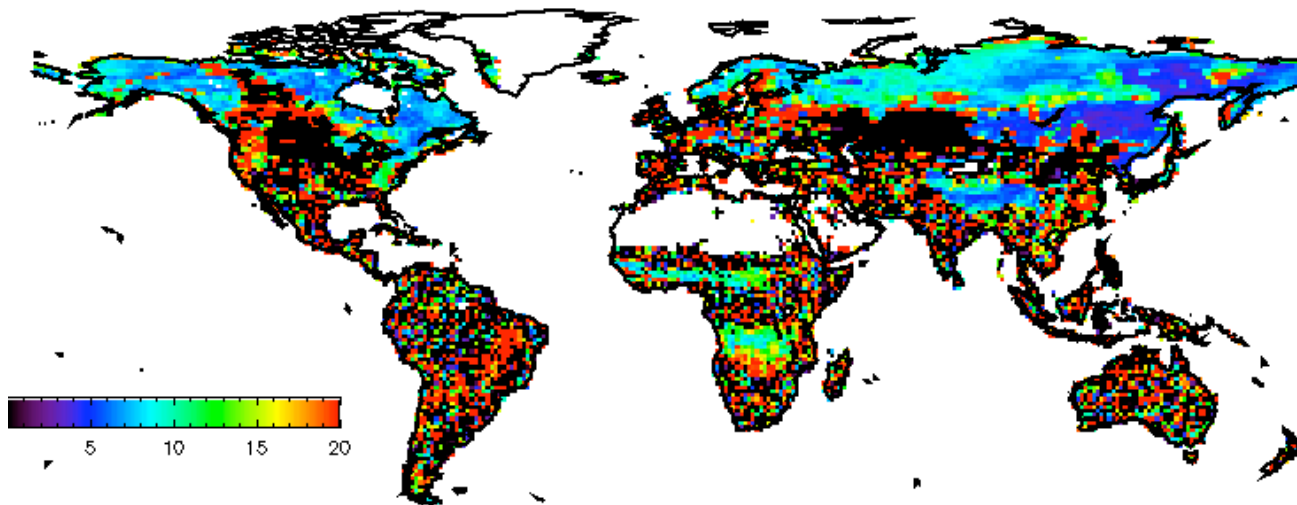




# Phénologie : dates de sénescence



No agreement  
on senescence





# Conclusions

We suggest a method for the **correction of directional effects** in low-resolution Earth reflectance measurements

The application of the method to AVHRR time series provides **higher signal to noise** observations

These time series are used to **extract the onset of vegetation** growth which is one proxy of the forcing of climate on photosynthesis

Good **coherence with in situ observations** over homogeneous areas

**Surprisingly high correlation with NAO** over Northern and Eastern Europe

The Orchidee vegetation model show the same patterns of onset date anomalies in Boreal regions, but not over the rest of the World.

We have evidence **several deficiencies in the Orchidee** time series.