



## Validation and Intercomparison of Global Leaf Area Index Satellite Products

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Jaime Nickeson, INNOVIM, Greenbelt, MD, USA

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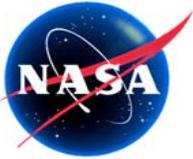
Ranga Myneni, Boston University, USA

Greg Ederer, NASA's GSFC



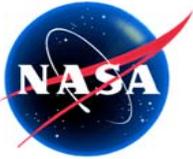
*Garrigues et al., JGR, 2008*

*Weiss et al., RSE, 2007*



## Outlines

- 1) Background
- 2) Direct validation and intercomparison methods
- 3) Intercomparison of 4 global LAI products : CYCLOPES  
v3.1, ECOCLIMAP, GLOBCARBON V1 and MODIS C4
- 4) Conclusions
- 5) Prospectives: potential of new earth observation systems



## *Background (1/2)*

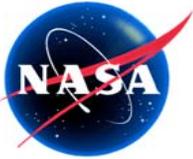
### *Leaf Area Index Product*

- ✓ **Leaf Area Index:** Key surface characteristic for land surface models (cf. GCOS)
  
- ✓ **Definition:** half the total developed area of green leaves per unit ground horizontal surface area (Chen and Black, 1992)
  
- ✓ **Multiplicity of LAI satellite products :**
  - MODIS (C4, C5)
  - CYCLOPES (SPOT/VEGETATION)
  - GLOBCARBON (VEGETATION, ATSR)
  - CCRS (SPOT/VEGETATION)
  - MSG/SEVIRI



## *Background (2/2)*

- ✓ **Rationale:** Understanding the **uncertainty** of a given **LAI product** and **differences between products** is **critical for their proper use** (cf. QA4EO)
  
- ✓ **LPV initiative** (Morisette et al., 2006)
  - **Benefit of LPV infrastructure** to share data, methods, and results
  - **Coordinated international effort:**
    - USA: Boston University, Oregon State University, the USDA Forest Service, and the EPA
    - Canada: CCRS and University of Alberta
    - Europe: ESA; INRA, Medias-France; the University of Milan-Bicocca, University of Helsinki; DLR; EOLAB and others.



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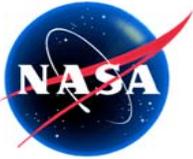
4) Conclusions

5) Prospectives: potential of new earth observation systems

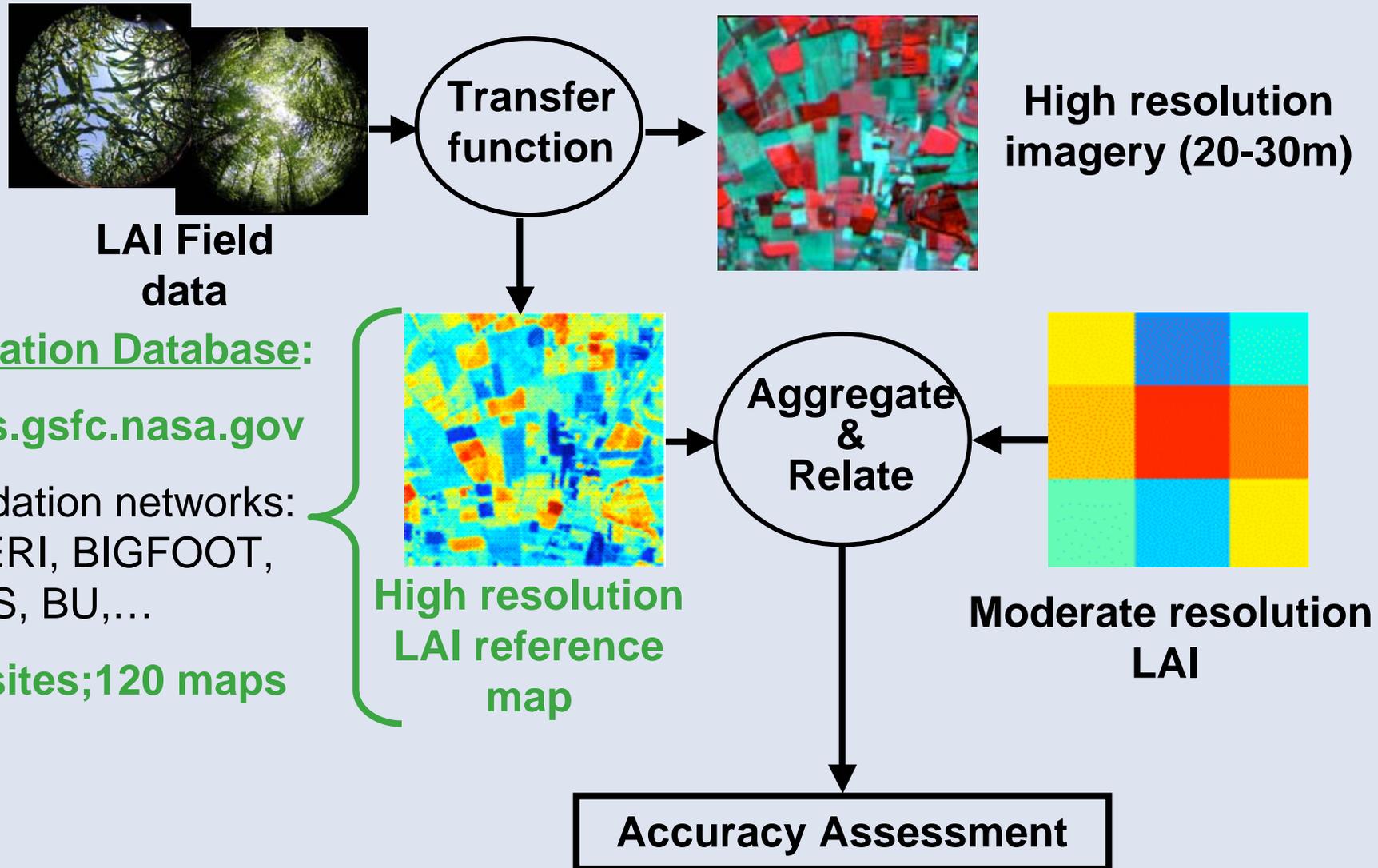


## *Methodological framework: Two approaches*

1. **Direct validation**: quantify **the absolute uncertainty** of a given (LAI) product through **comparison with *in situ* measurements**
2. **Product intercomparison** (i.e. indirect validation): assess the **spatial and temporal consistency** between products

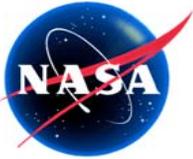


## Direct Validation approach



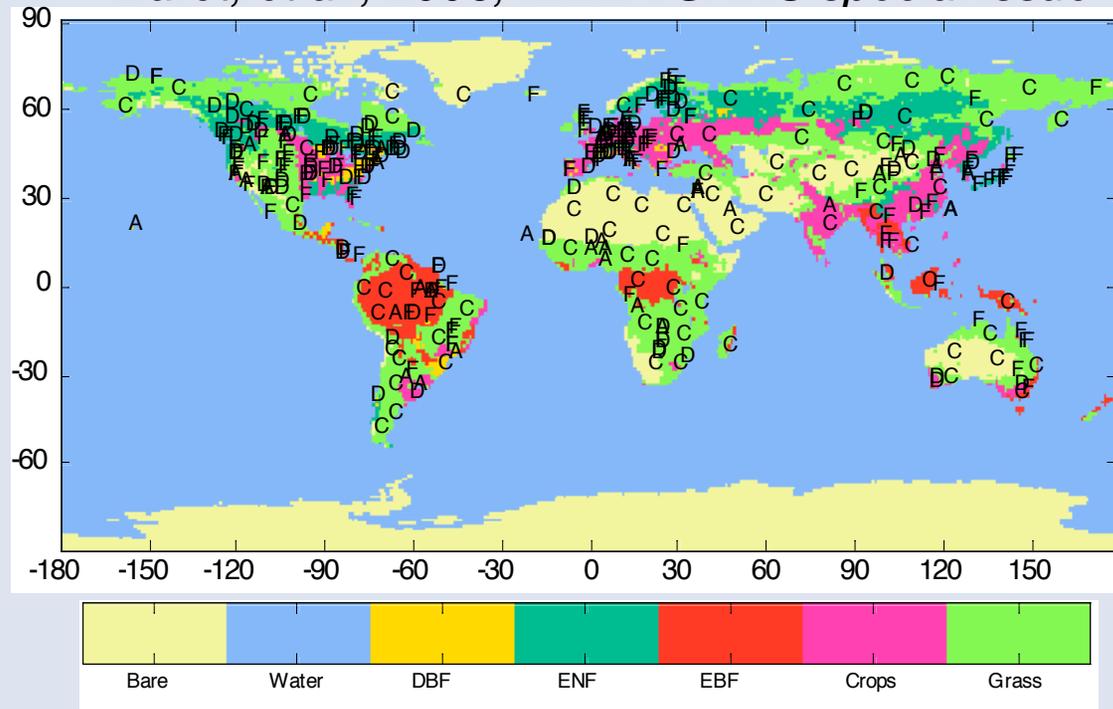
### Validation Database:

- [lpvs.gsfc.nasa.gov](http://lpvs.gsfc.nasa.gov)
- validation networks: VALERI, BIGFOOT, CCRS, BU,...
- 80 sites; 120 maps

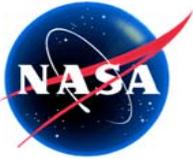


## Intercomparison approach The BELMANIP Global Network of Sites

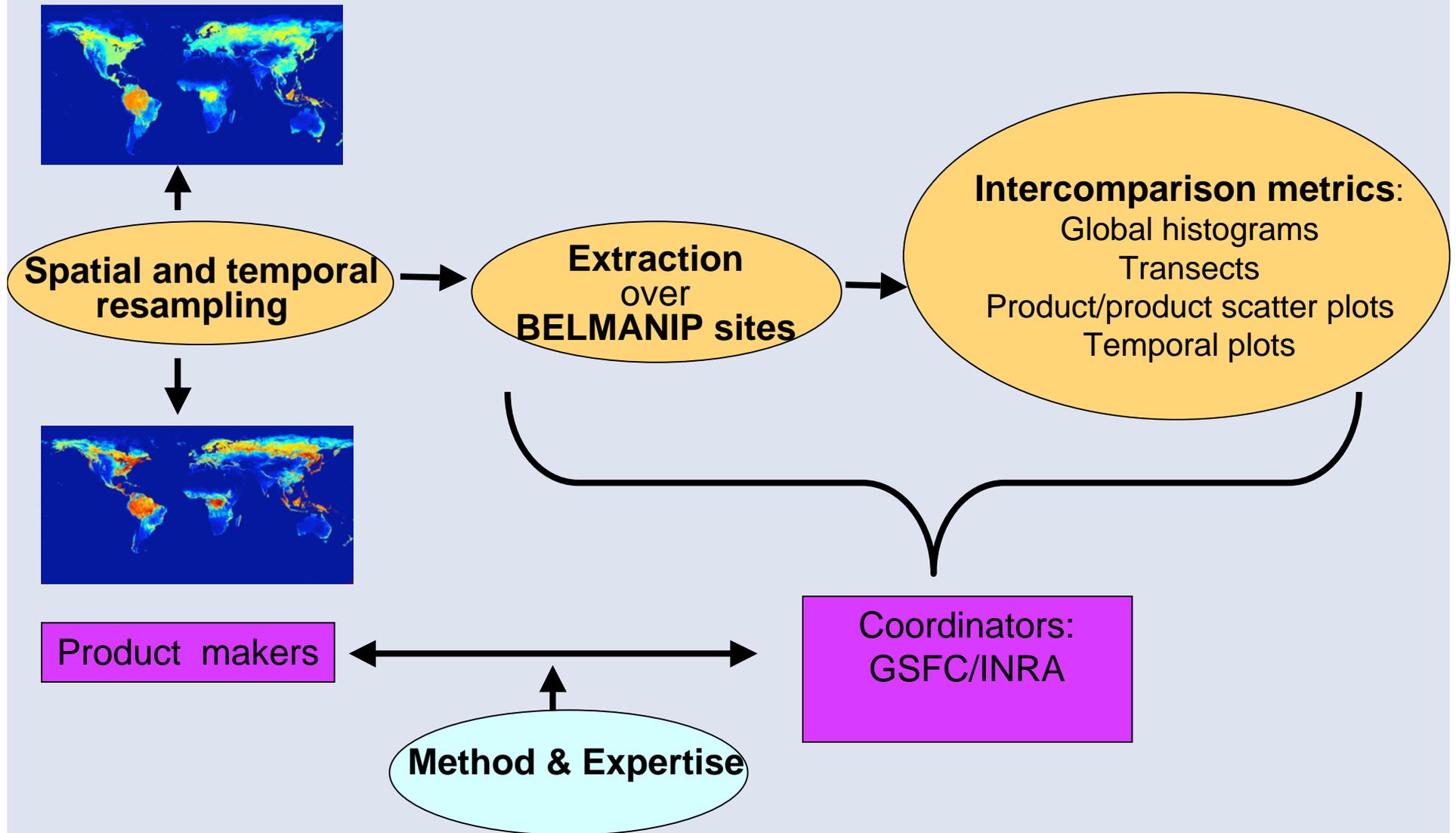
Baret, et al., 2006, IEEE TGARS special issue

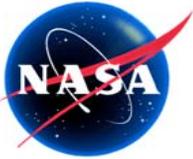


- ✓ Designed to represent the global variability of land surface types
- ✓ BELMANIP-2: 420 sites selected from GLC-2000 global land cover map



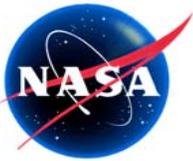
## LAI intercomparison framework





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- 4) Conclusions and Prospectives: potential of new earth observation systems

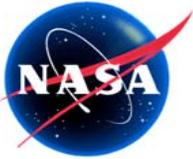


## Investigated Products

Product	Sampling	Algorithm	Shoot clumping	Canopy clumping	Landscape clumping	Smoothing
<b>CYCLOPES (V3.1)</b> <i>Baret et al., 2007</i>	1/11.2° 10 days	Neural Network, RTM 1D	No	No	Yes	No
<b>ECOCLIMAP</b> <i>Masson et al., 2003</i>	1/120° 1 month	Empirical (based on NDVI variation)	Yes	Yes	No	No
<b>GLOBCARBON (V1)</b> <i>Deng, 2006</i>	1/11.2° 1 month	Model derived VI-LAI relationship	Yes	Yes	No	Yes
<b>MODIS (C4)</b> <i>Knyazikhin et al., 1998; Myneni et al., 2002</i>	1 km 8 days	<u>Main</u> : LUT, RTM 3D; <u>Backup</u> : LAI-NDVI empirical relationship	Yes	Yes	Partly	No



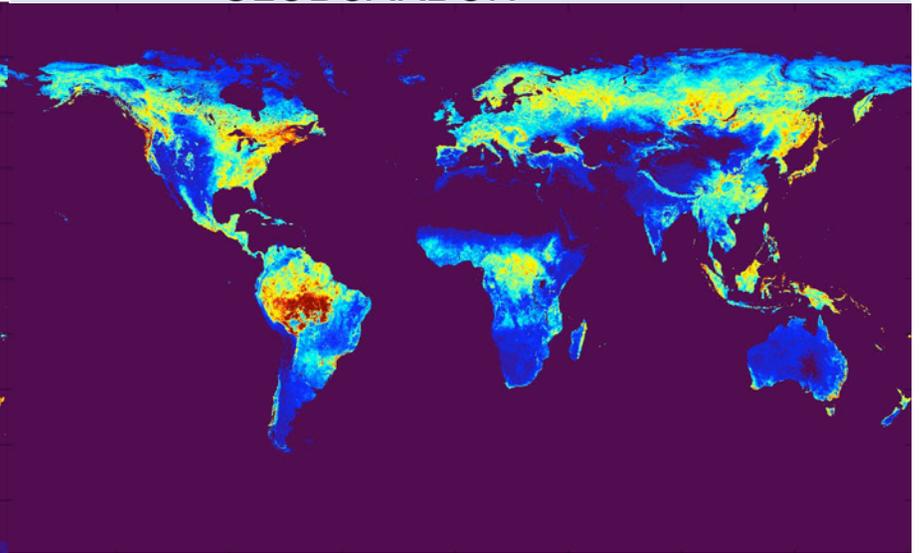
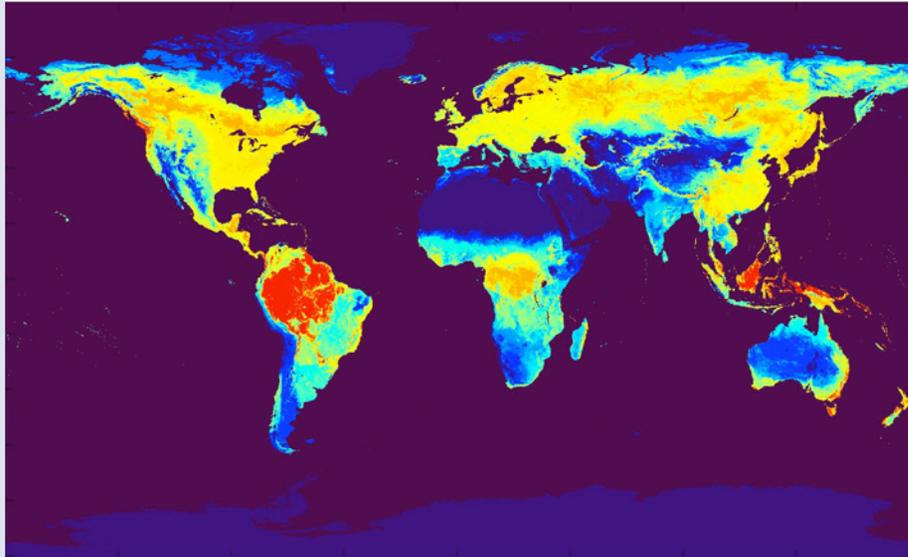
**Intercomparison: at 1/11.2° and a monthly time step  
Period: 2001-2003**



# Global maps (Aug 2002)

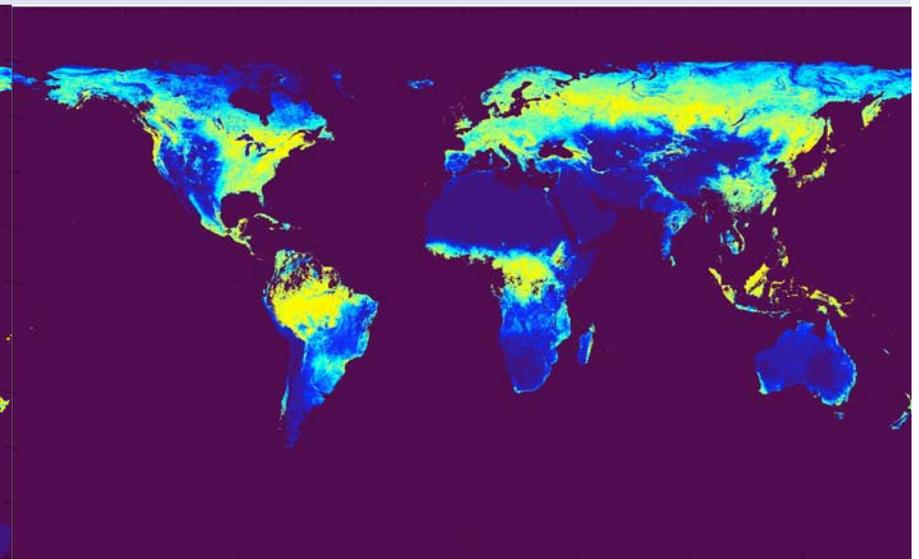
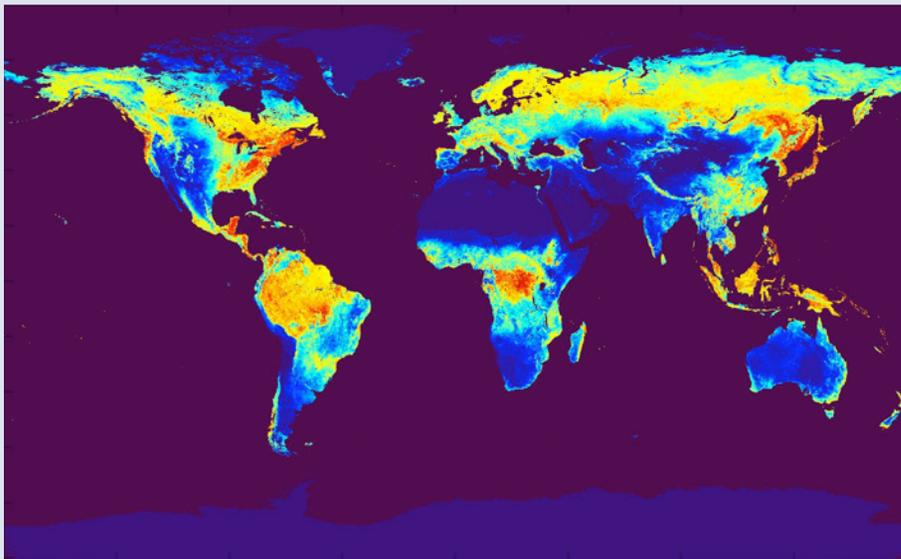
ECOCLIMAP

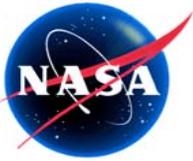
GLOBCARBON



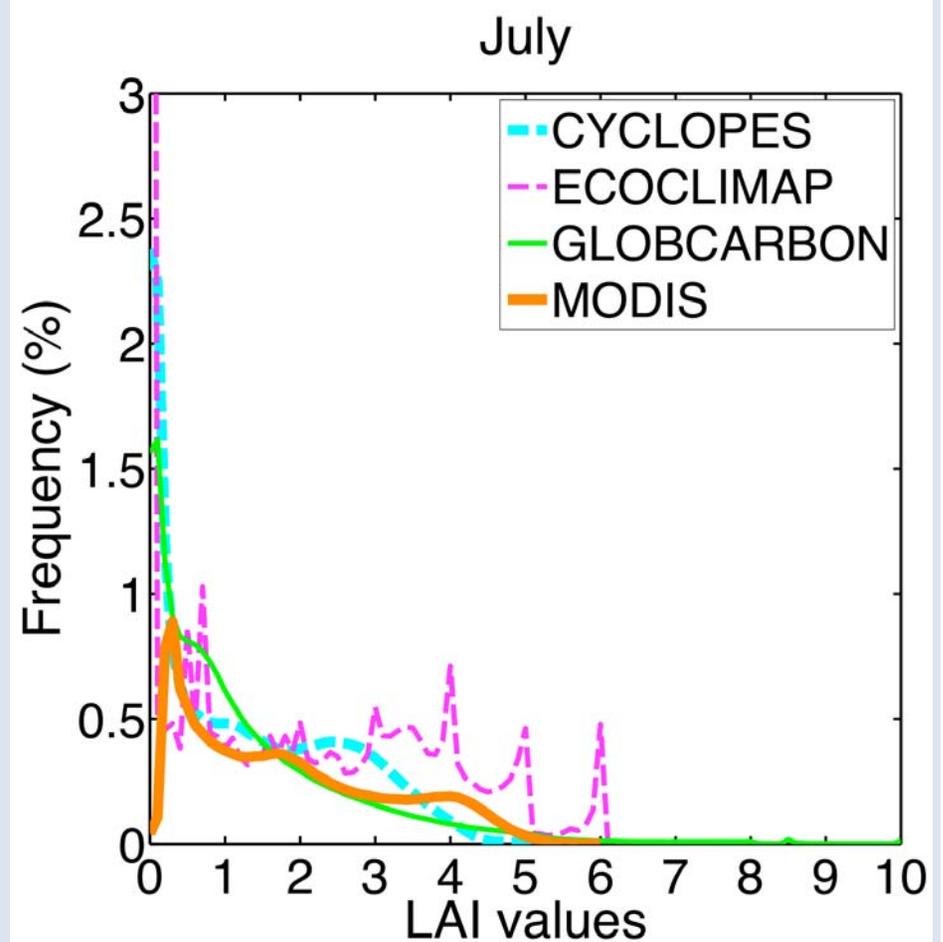
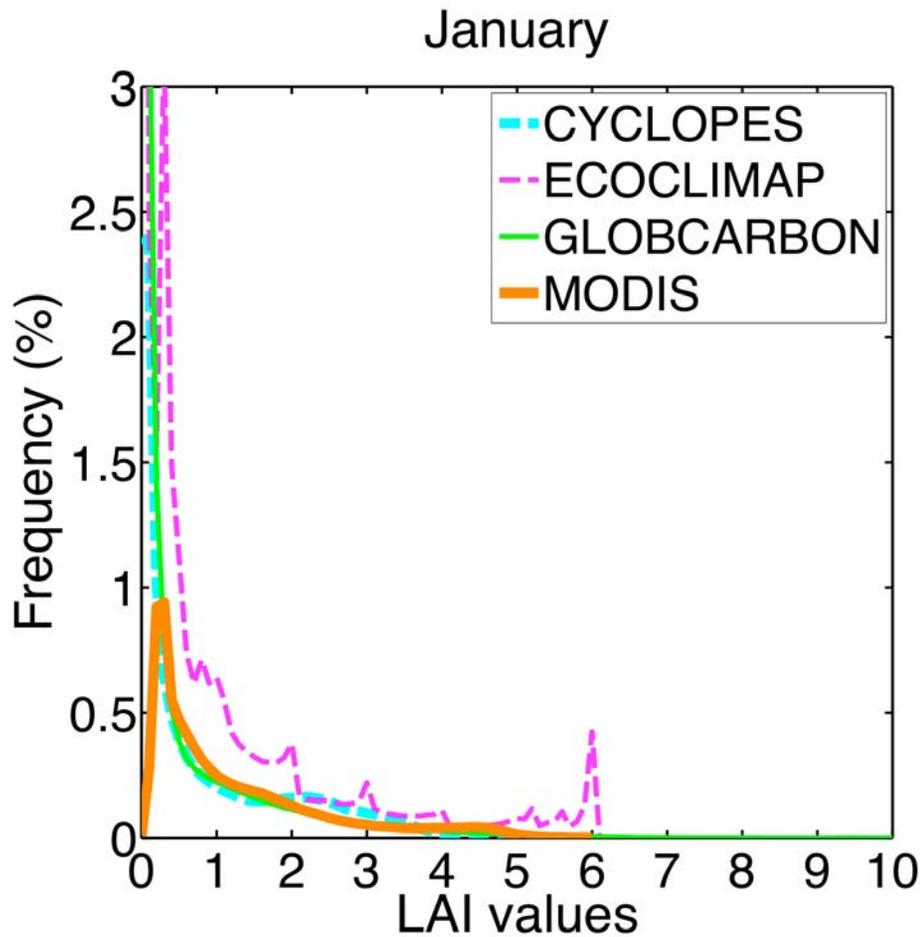
MODIS

CYCLOPES

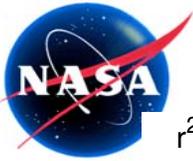




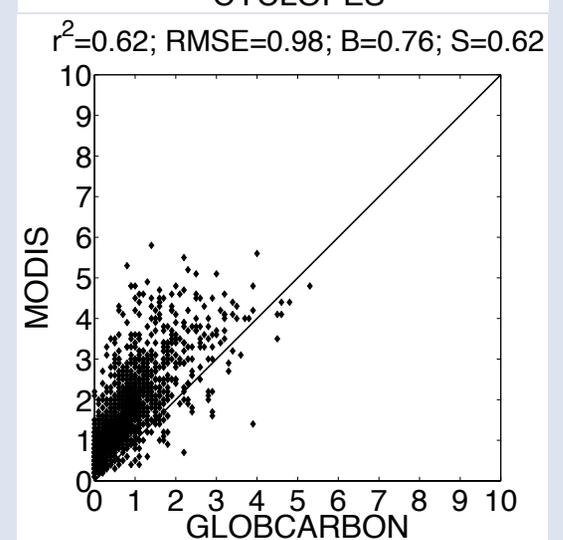
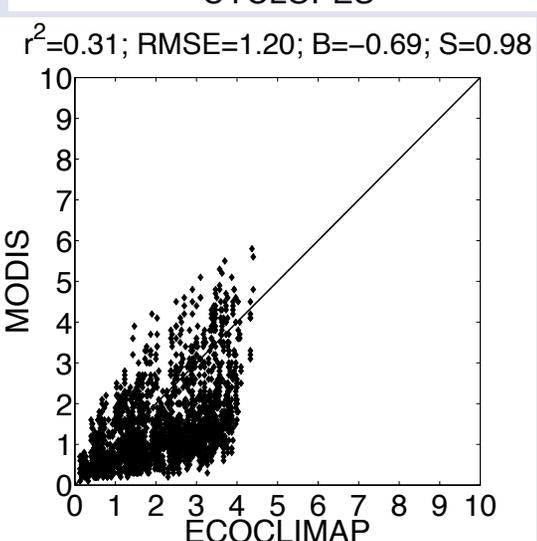
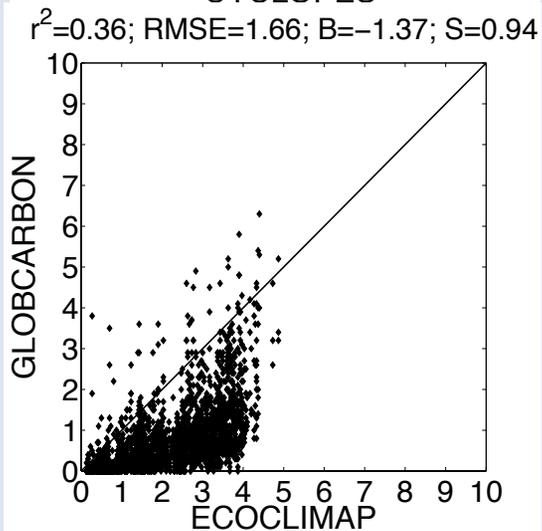
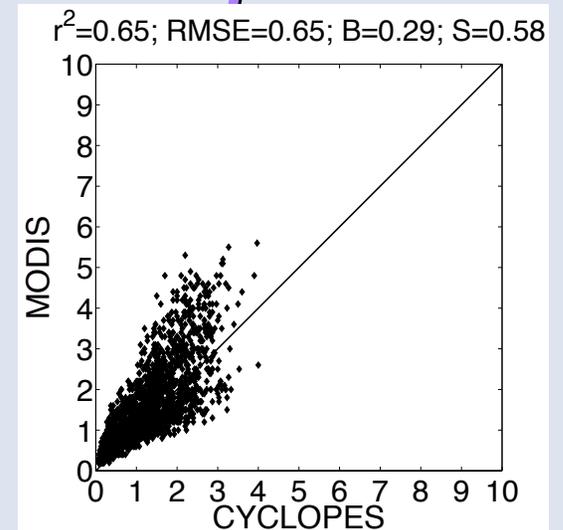
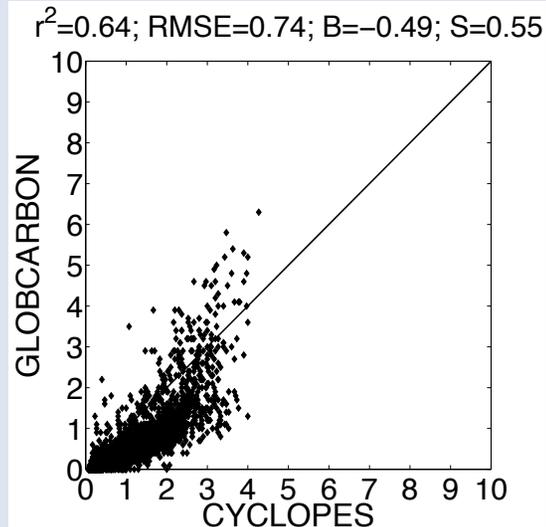
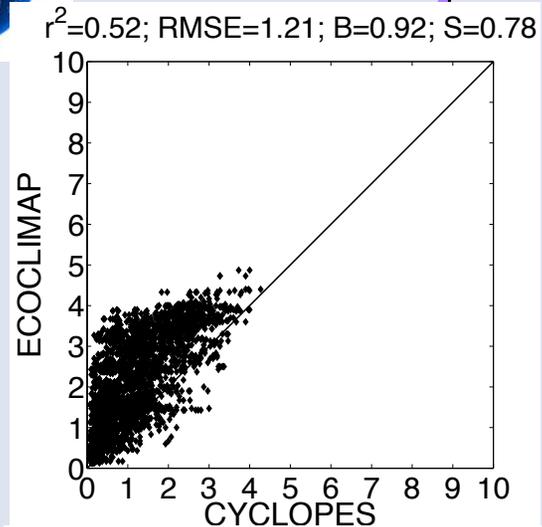
## Global LAI value distributions



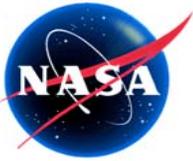
- Important differences between the LAI value distributions in July
- Erratic and unrealistic LAI distribution for ECOCLIMAP
- Too low frequency of low LAI values for MODIS
- Early saturation for CYCLOPES (max LAI~ 4)



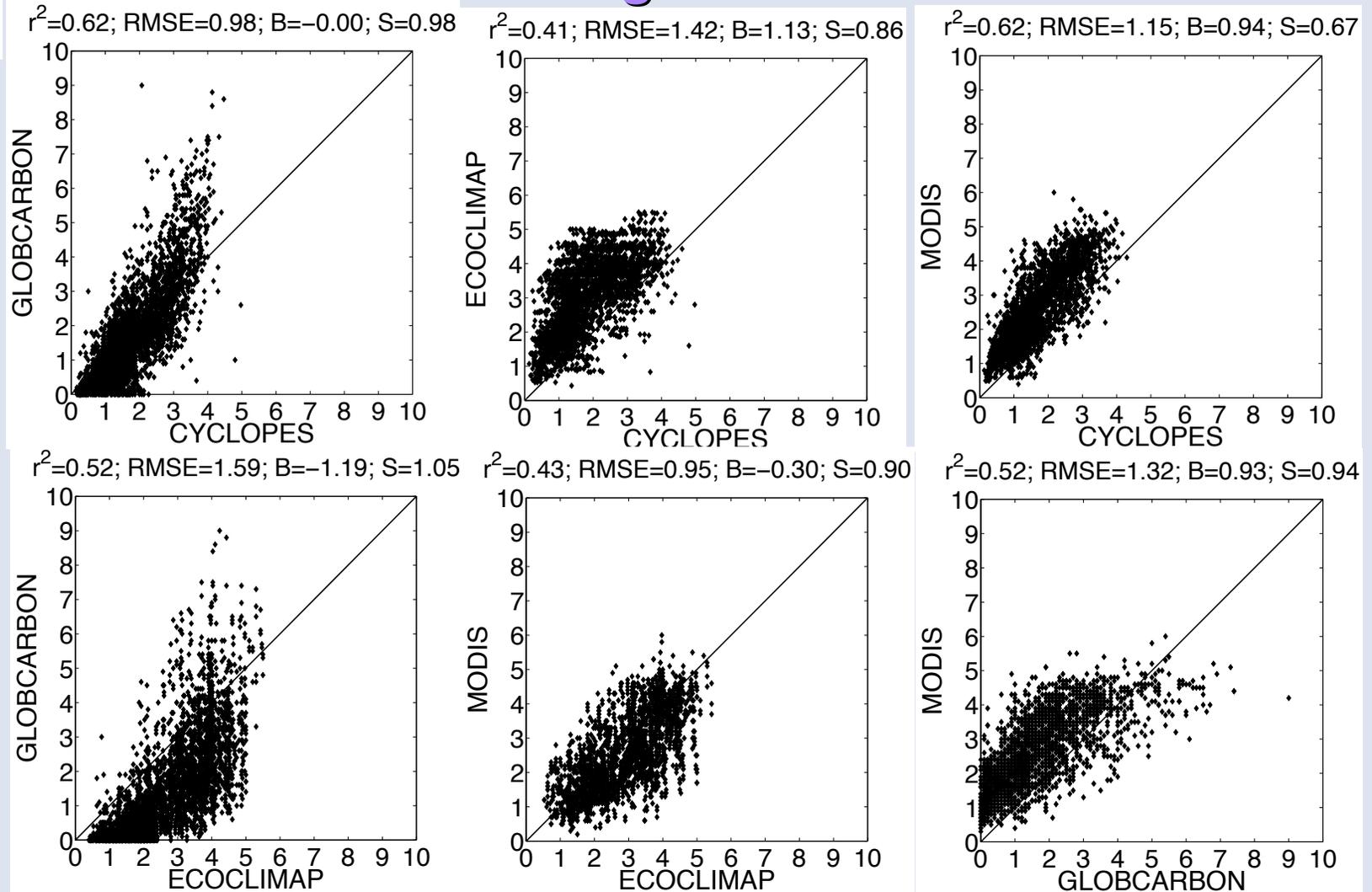
## Scatterplots over the BELMANIP crop sites



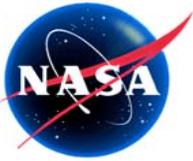
- ✓ **General overestimation of ECOCLIMAP for all vegetation types**
- ✓ **MODIS > CYCLOPES > GLOBCARBON**: canopy modelling differences or/and surface reflectance bias between MODIS and CYCLOPES (Verger et al., 2008)



## Scatterplots over Evergreen Needleleaf Forest sites

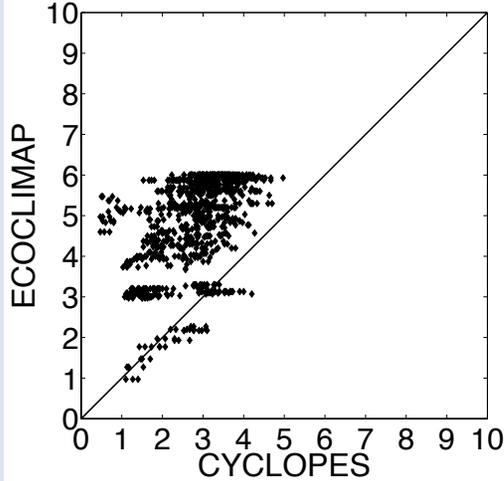


- ✓ **Large discrepancies over forests**, due to differences in canopy structure modelling
- ✓ **Over forests, MODIS provides much larger LAI than the other products**
- ✓ **Too low values for CYCLOPES** (maximum of 4)
- ✓ For all products, **unrealistic LAI<1 for closed canopy ENF**

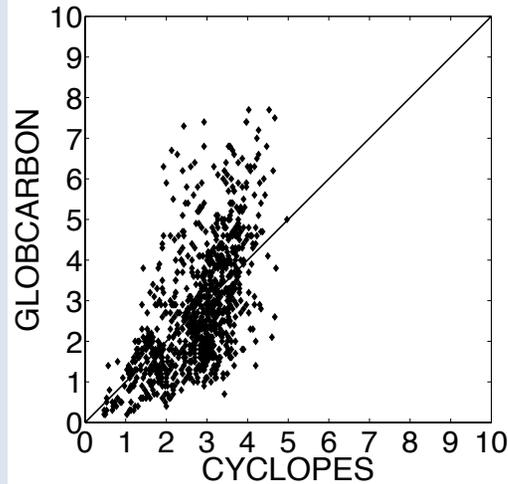


# Scatterplots over the evergreen broadleaf forest

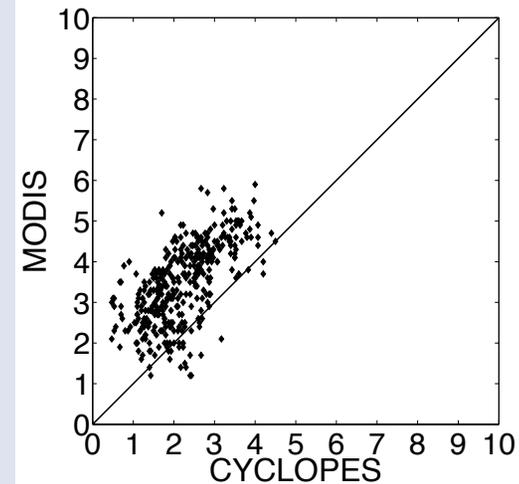
$r^2=0.21$ ; RMSE=2.30; B=2.04; S=1.05



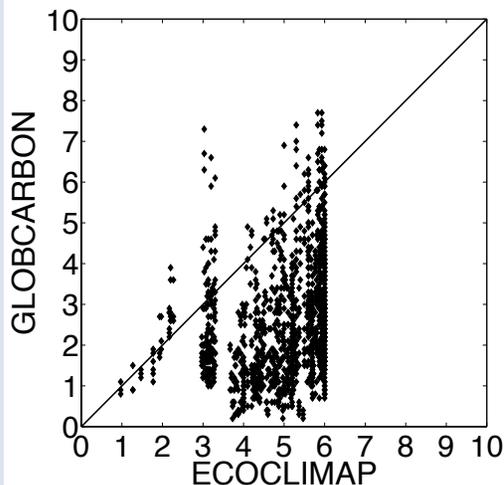
$r^2=0.36$ ; RMSE=1.22; B=0.03; S=1.22



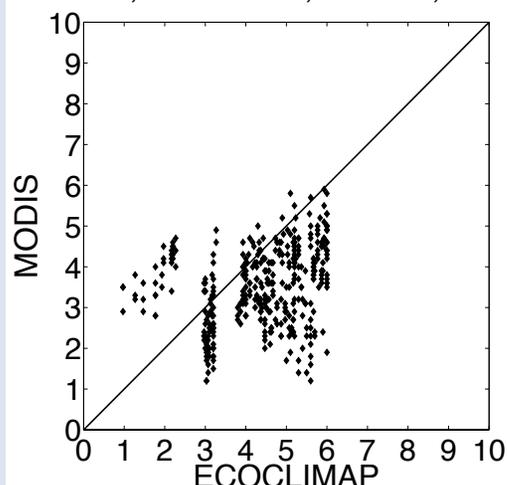
$r^2=0.41$ ; RMSE=1.48; B=1.26; S=0.78



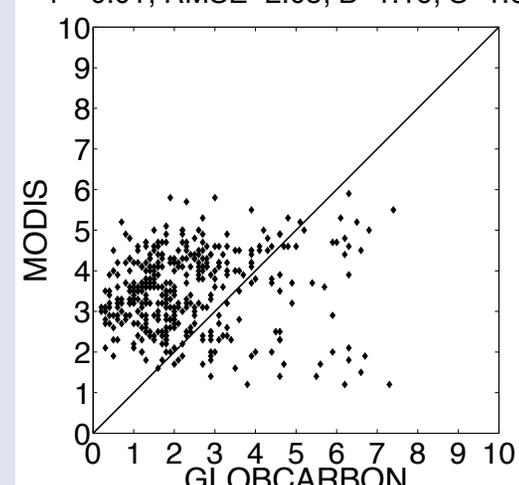
$r^2=0.08$ ; RMSE=2.80; B=-2.34; S=1.53



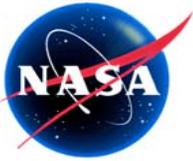
$r^2=0.09$ ; RMSE=1.56; B=-0.87; S=1.30



$r^2=0.01$ ; RMSE=2.05; B=1.16; S=1.68



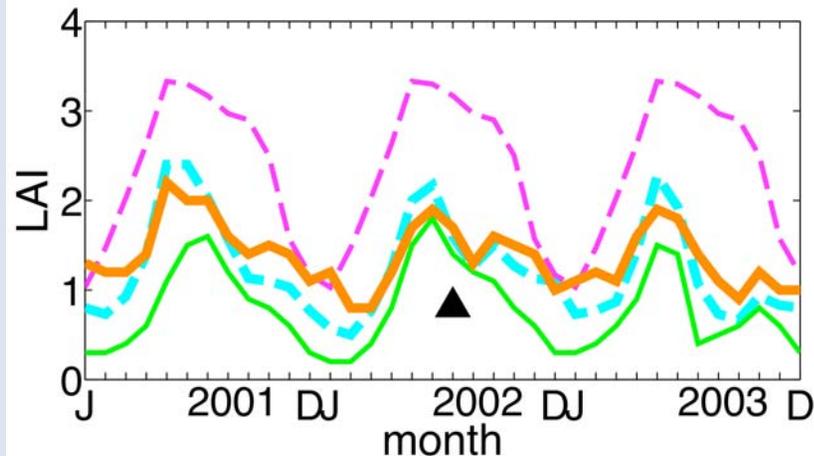
**Large inconsistencies between all the products** (saturation of the radiometric signal, residual atmospheric and cloud contamination, uncertainty in canopy structure models)



## Temporal consistency (1/2)

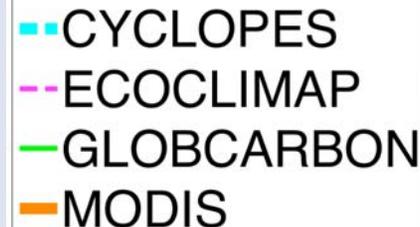
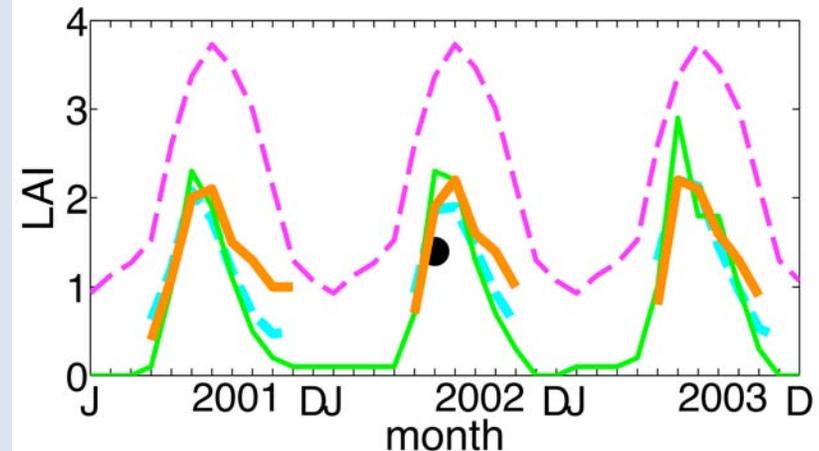
### Grassland

Larzac, France, Lat=43.94, Lon=3.12



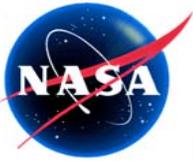
### Cropland

Walnut Creek, USA, Lat=41.96, Lon=-111.61



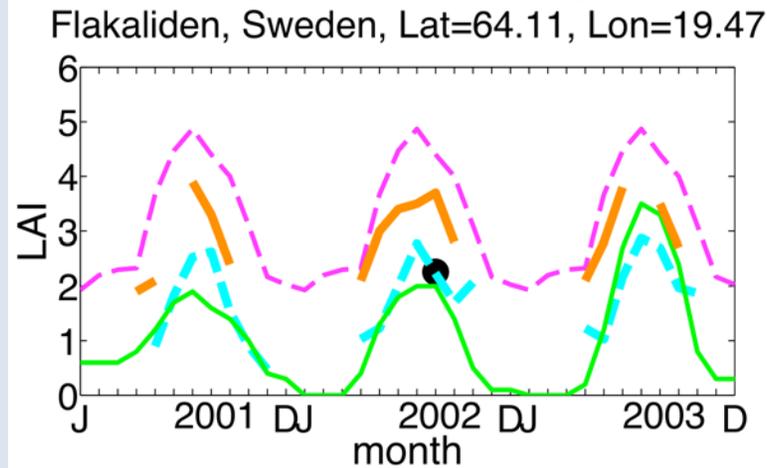
▪ Ground data

- ✓ **Consistent and realistic temporal profiles** over croplands and grasslands
- ✓ **All the products capture interannual variations**, except ECOCLIMAP
- ✓ **Best agreement is achieved by MODIS and CYCLOPES**

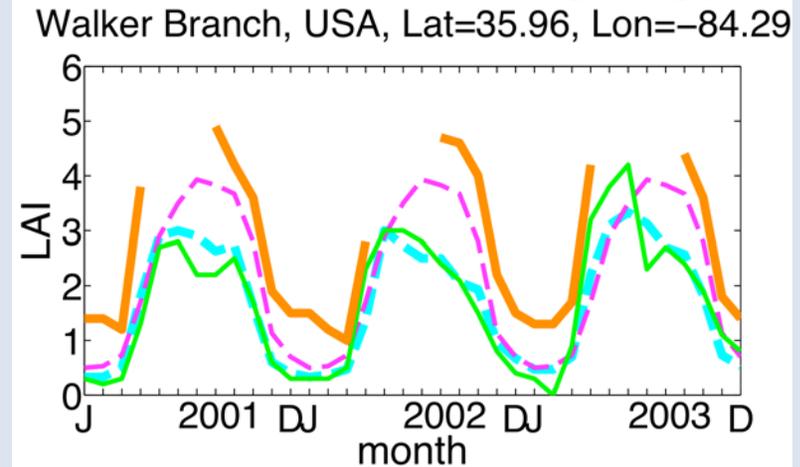


## Temporal consistency (2/2)

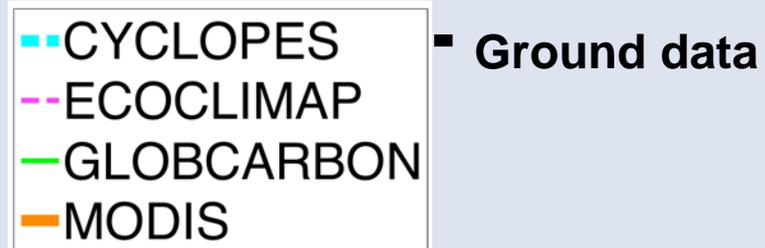
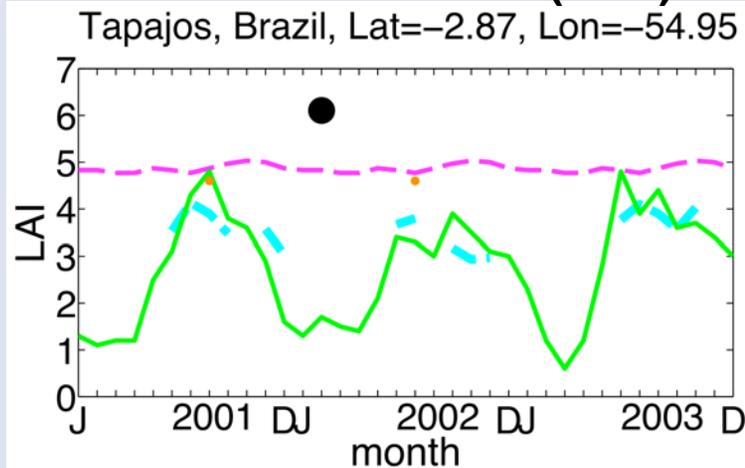
### Ever. Needle. For (ENF)



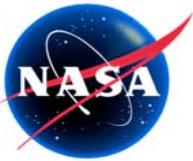
### Decid. Broad. For (DBF)



### Ever. Broad. For (EBF)



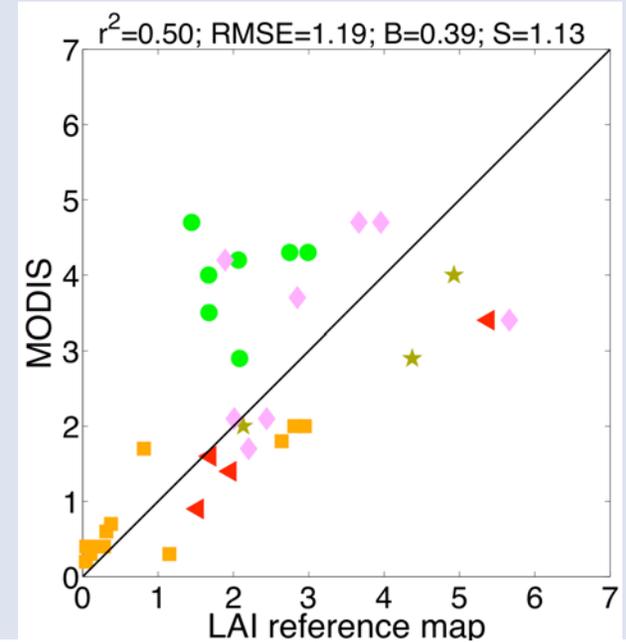
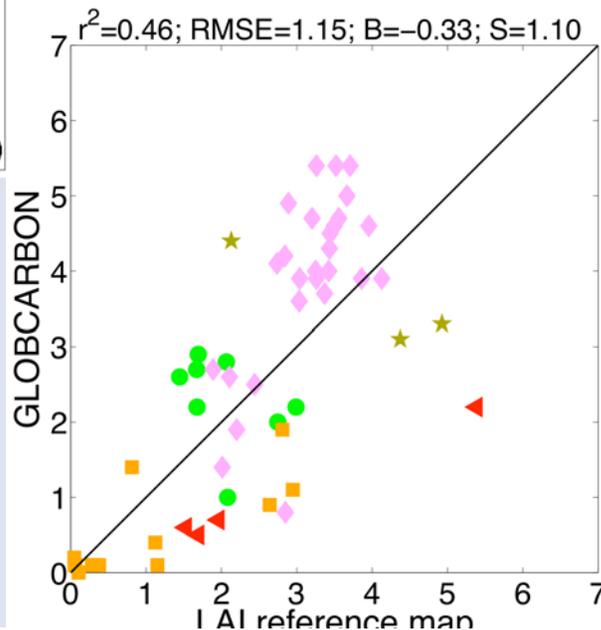
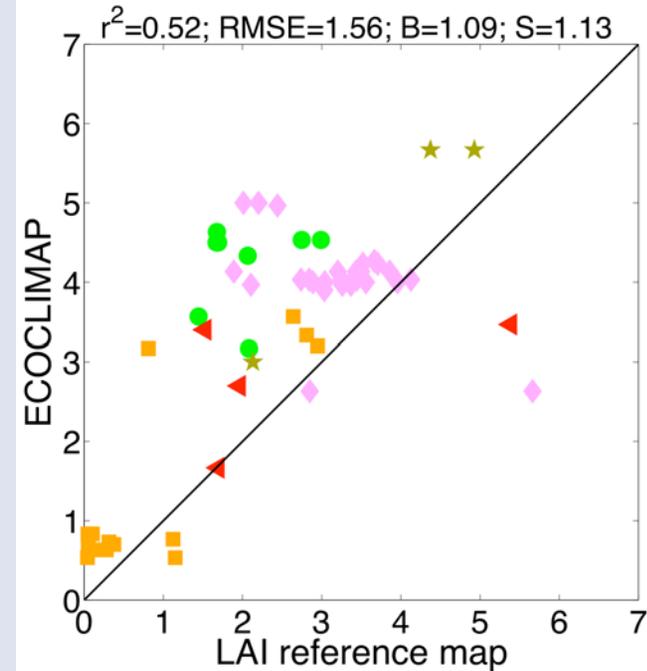
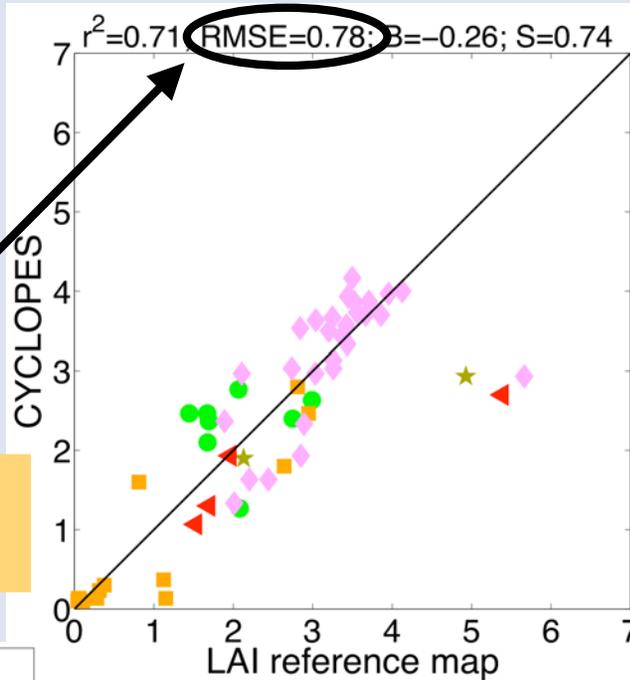
- ✓ **Poor temporal continuity of CYCLOPES and MODIS over Northern Latitude sites**
- ✓ **Over DBF: overestimation of MODIS in winter and failure in summer**
- ✓ **Large temporal inconsistencies and poor temporal continuity over EBF**



# Direct validation: Product versus LAI reference Maps

Best agreement for CYCLOPES

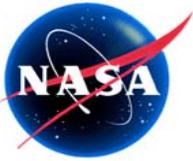
- ENF
- ★ EBF
- ▲ Crop
- Grass
- ◆ Mixed Forest (DBF+ENF)





## Summary of the product performances

Criteria	CYCLOPES	ECOCLIMAP	GLOBCARBON	MODIS
Global distribution	+	-	+	+
Spatial consistency	+	-	-	+
Spatiotemporal continuity (no gaps)	-	+	+	-
Temporal consistency	+	-	-	+
High LAI	-	+	+	+
Low LAI	+	+	+	-
Comparison to in-situ data	+	-	-	-



## *Conclusions & Pending issues*

### ➤ **Validation data:**

- need to **improve measurement accuracy**
- need to **quantify their uncertainty**
- need to better characterize the **seasonal and global variability of LAI**

### ➤ **Current work:**

- exercise **refined** at **3km spatial sampling**
- including **new version of products** (MODIS Collection 5)

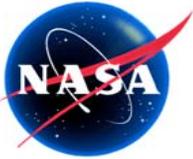
### ➤ **Typical methodological framework for other products** (cf. OLIVE system)

### ➤ **A critical exercise:**

- part of the cal/val process as defined by WGCV and QA4EO
- required for a **consistent integration of multiple satellite products** in climatic data records

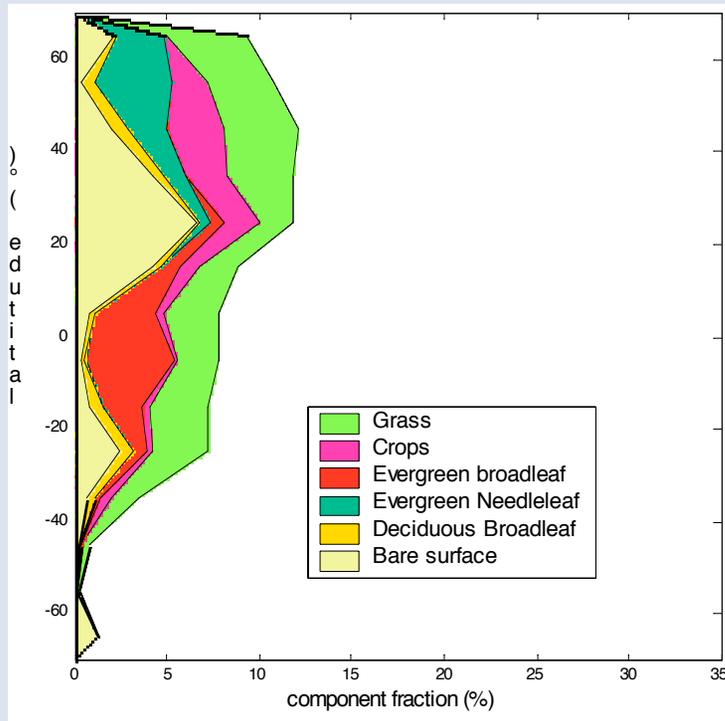
### ➤ **Need to be properly updated and supported by space agencies**

# ADDITIONAL SLIDES

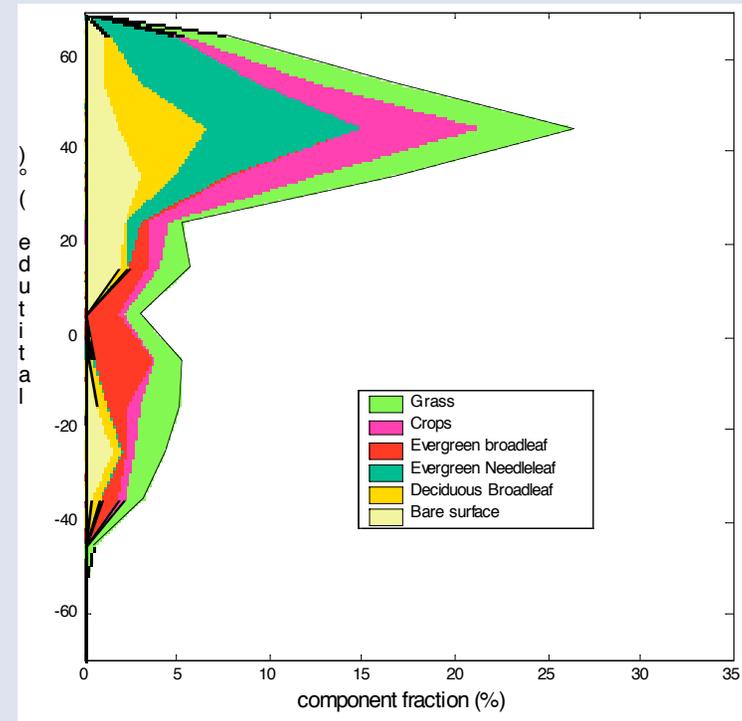


## Approach (2/5) The BELMANIP Global Network of sites

ECOCLIMAP global classification (Masson et al, 2003)



Global surface type distribution



BELMANIP surface type distribution

(Baret et al., 2006)

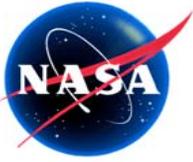


76 sites were added to FLUXNET, AERONET and Direct Validation sites to better sample latitude, longitude and surface types (grass, bare surface, evergreen broadleaf forest)

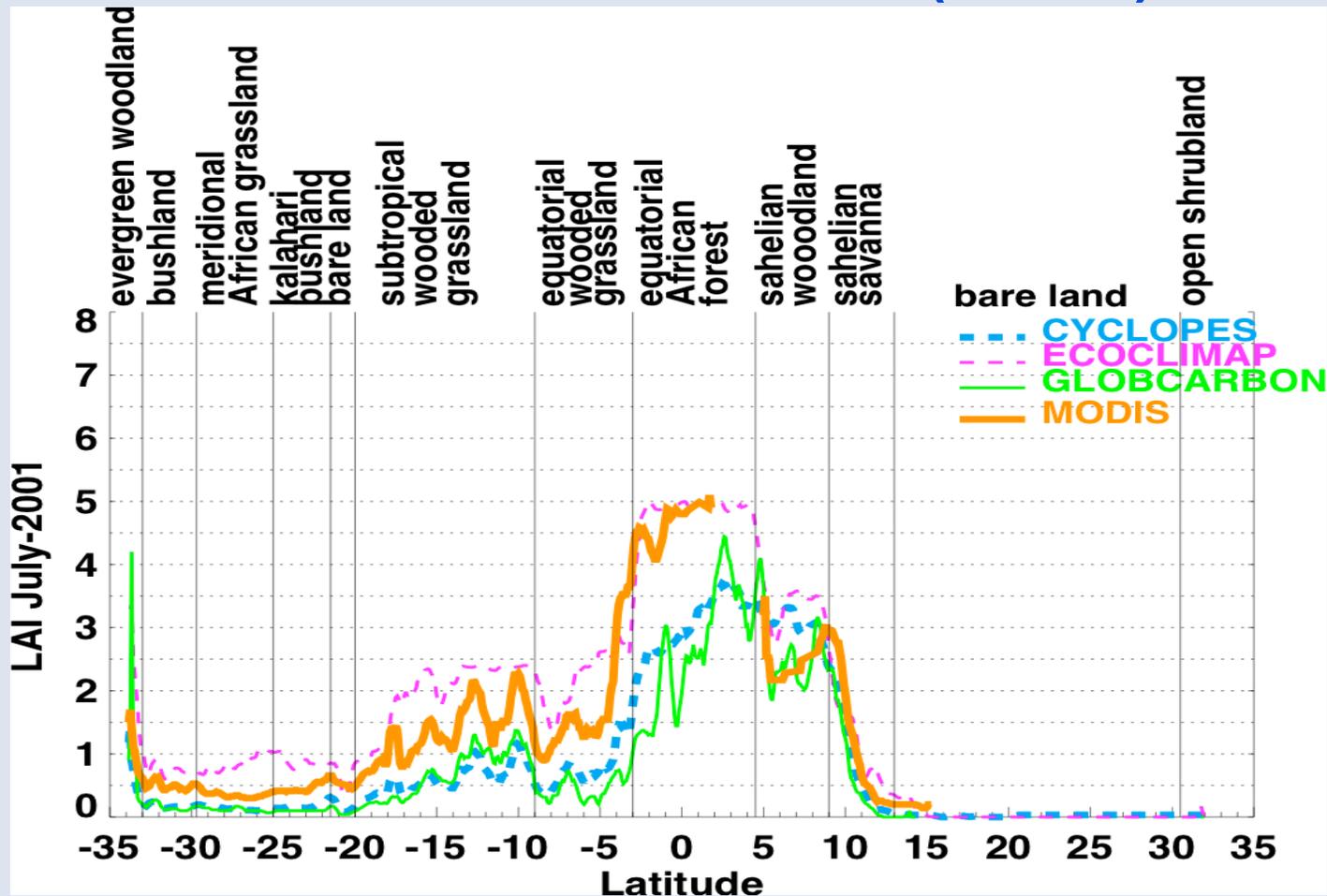


## Approach (4/5) LAI reference Map Database

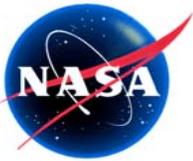
- Direct validation conducted at BELMANIP sites at LAI reference maps have been generated
  - Using the LPV infrastructure to bring together LAI maps from several projects and groups:
    - North America: BIGFOOT, Boston University, EPA, CCRS, University of Alberta, USDA (SMEX02), NACP , CEOS/LPV ...
    - Europe: VALERI (INRA, France), CARBOEUROPE (Milan University, Italy), BIOTA/GLOWA-AFRICAN projects (DLR), MSG validation sites (Valencia University, Spain),
    - Others : ?
- ➔ 40 sites and 80 LAI HR maps available so far.



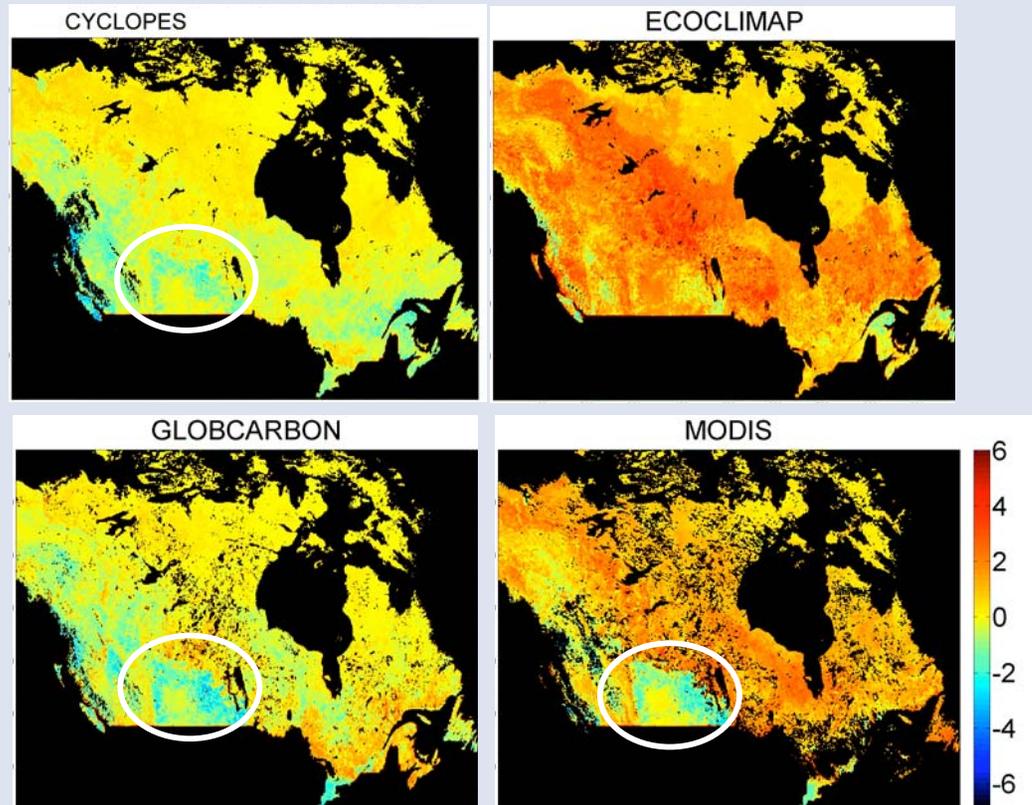
## Transect over Africa (25° est)



- **Best spatial continuity** for ECOCLIMAP and GLOBCARBON
- **Two groups of products:**
  - GLOBCARBON and CYCLOPES : good agreement over grassland
  - ECOCLIMAP and MODIS: higher and more realistic values over Equatorial forest



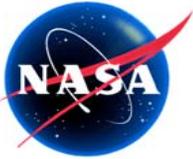
## Regional consistency Comparison with CCRS map over Canada



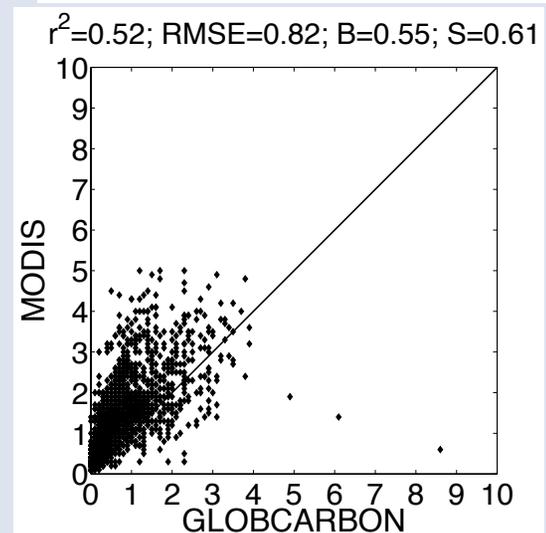
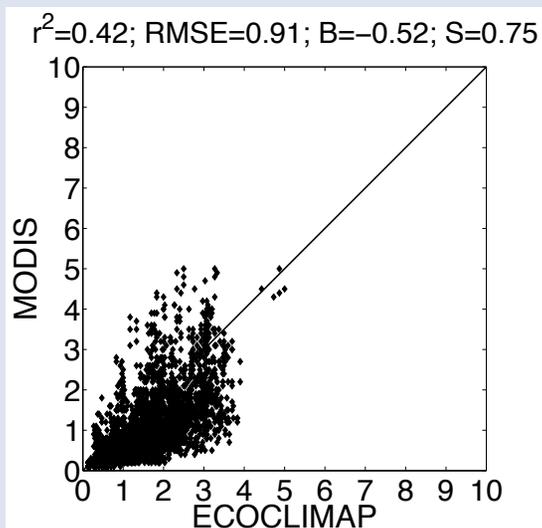
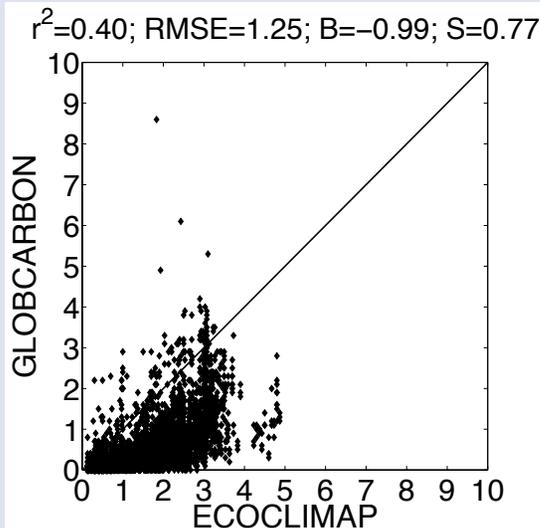
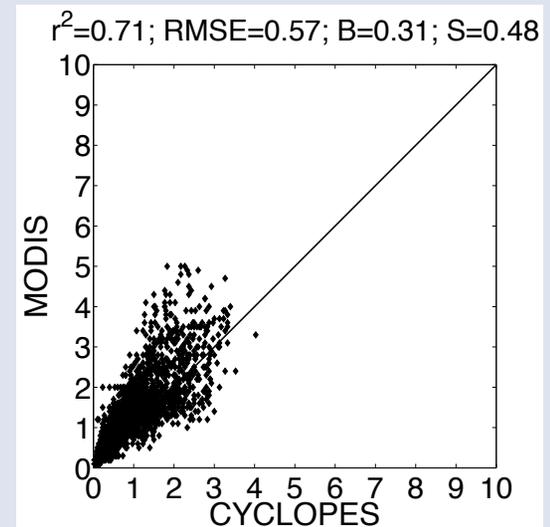
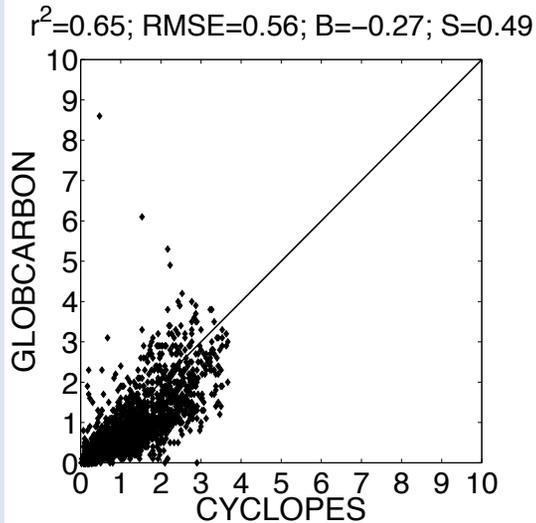
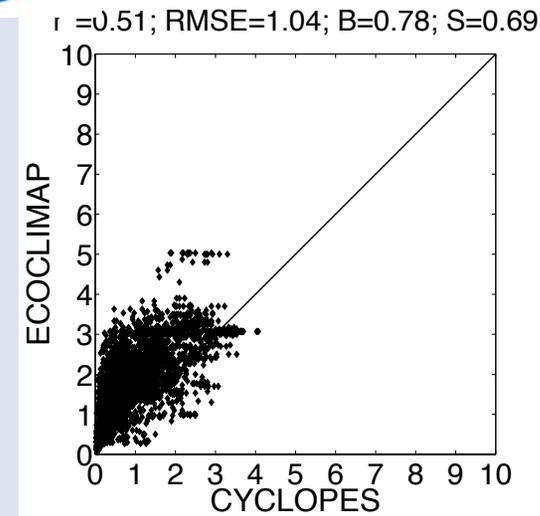
CCRS product considered as a regional reference over Canada

- 1km, 10-days resolution
- VI-LAI empirical relationships
- Shoot & canopy clumping

Global products have difficulties to capture specific spatial patterns that are better depicted by regional algorithms



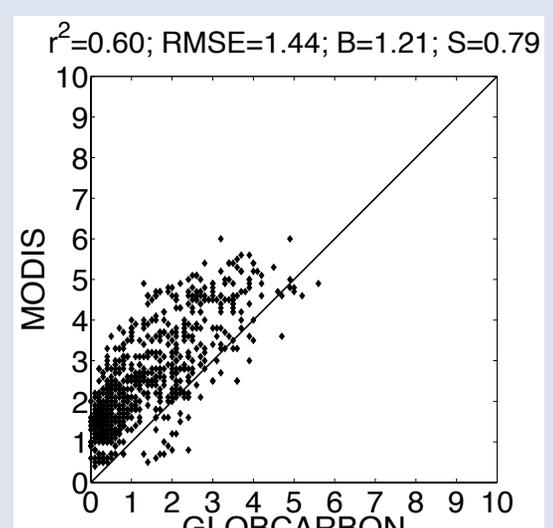
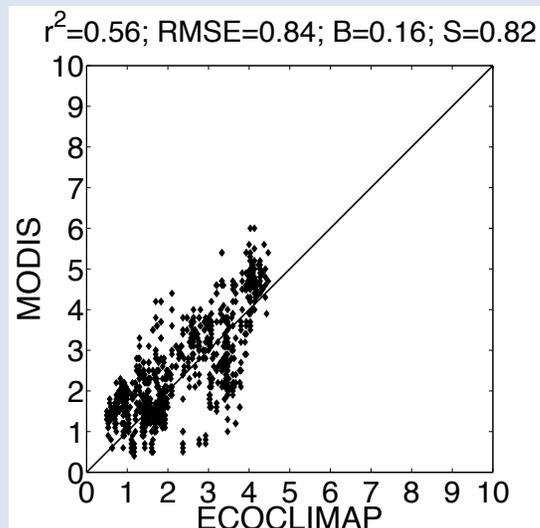
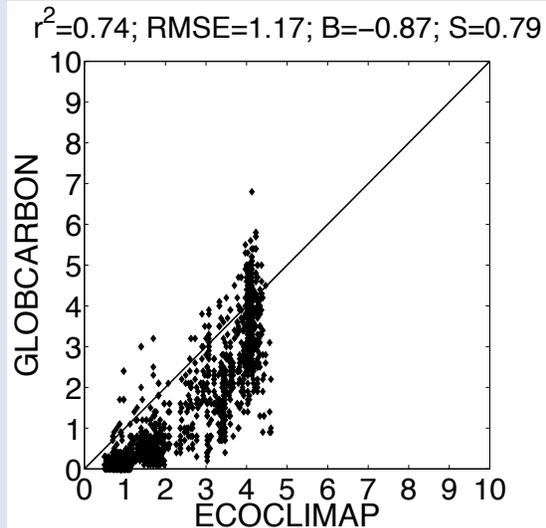
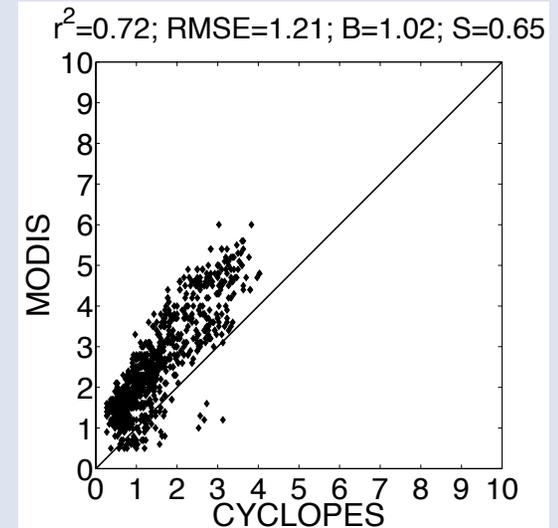
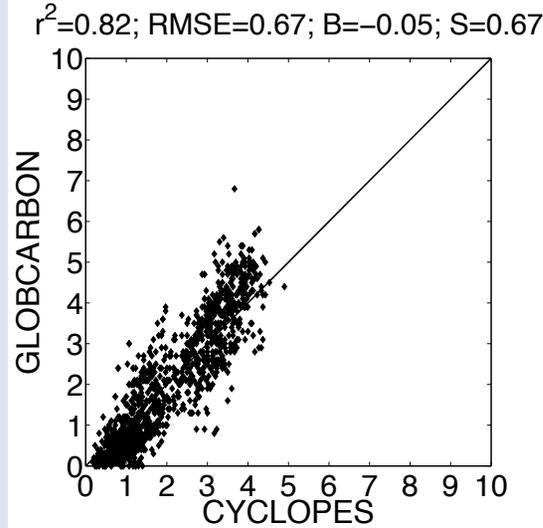
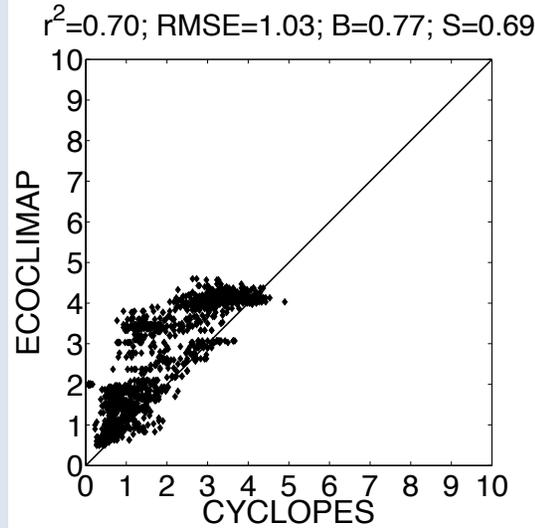
## Scatter plot over the BELMANIP sites-Grasslands



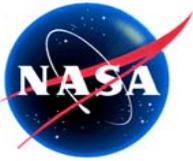
- large bias between ECOCLIMAP and others for all land covers
- Good agreement between CYCLOPES, MODIS and GLOBCARBON
- MODIS > CYCLOPES > GLOBCARBON



## Scatter plot over the BELMANIP sites-DBF



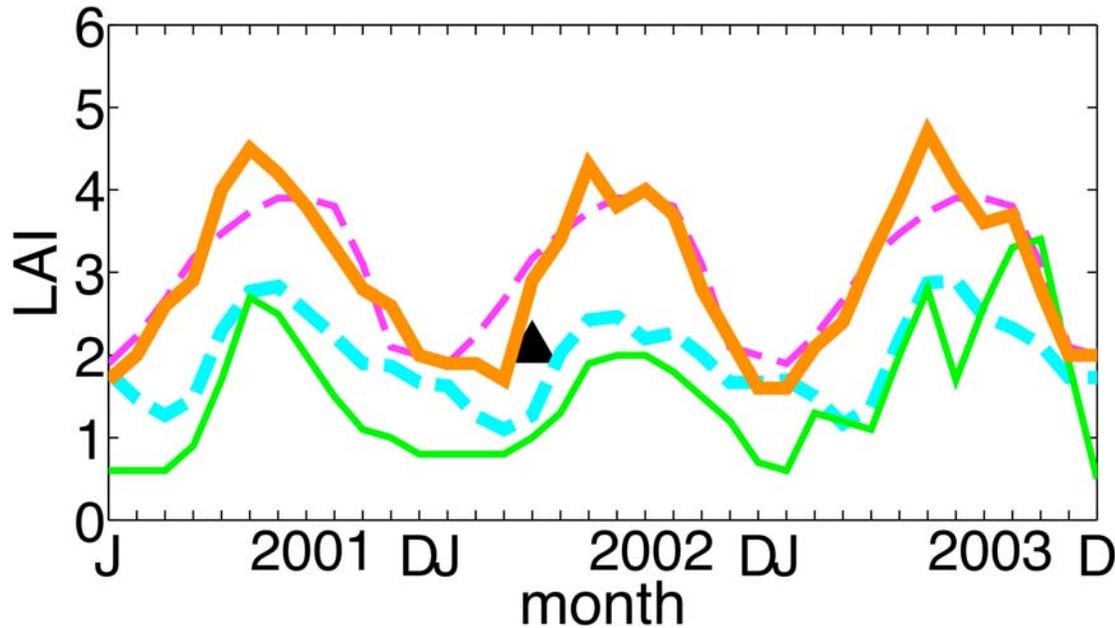
-Good agreement between GLOBCARBON and CYCLOPES



## Temporal consistency

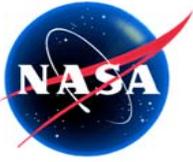
Ever. Needle. For

Nezer, France, Lat=44.57, Lon=-1.05



- CYCLOPES
- ECOCLIMAP
- GLOBCARBON
- MODIS

■ Ground data



## Summary or product performances

Criteria	CYCLOPES	ECOCLIMAP	GLOBCARBON	MODIS
<b>LAI distribution</b>	Max too low over EF	Too much round values	Max too high at 10km resolution	Too few low values
<b>Continuity</b>	Gaps	<b>No gaps</b>	Gaps in spite of gap filling process	Gaps
<b>Spatial consistency</b>	<b>OK</b>	No intra-class variations	Shaky profiles	<b>OK</b>
<b>Temporal consistency</b>	Good seasonal trends Good inter-annual variability	Good seasonal trend No inter-annual variability	Good seasonal trend Spurious variations over forests	Too high values in winter and over sparse vegetation Good inter-annual variability
<b>Comparison to in-situ data</b>	Closest to HR maps	Largest differences with HR maps		Overestimation over forests