



# Satellite observations of Amazon phenology in response to climate, landscape, and anthropogenic forcings

Alfredo R. Huete, Dept. Soil, Water & Environ. Science, Univ. of Arizona

Kamel Didan, University of Arizona, USA

Youngwook Kim, University of Arizona, USA

Piyachat Ratana, Khon Kaen University, Khon Kaen, Thailand

Yosio Shimabukuro, INPE, Brazil

Scott Saleska, University of Arizona, USA

*SBSR Conference, Florianopolis April 21-26, 2007*

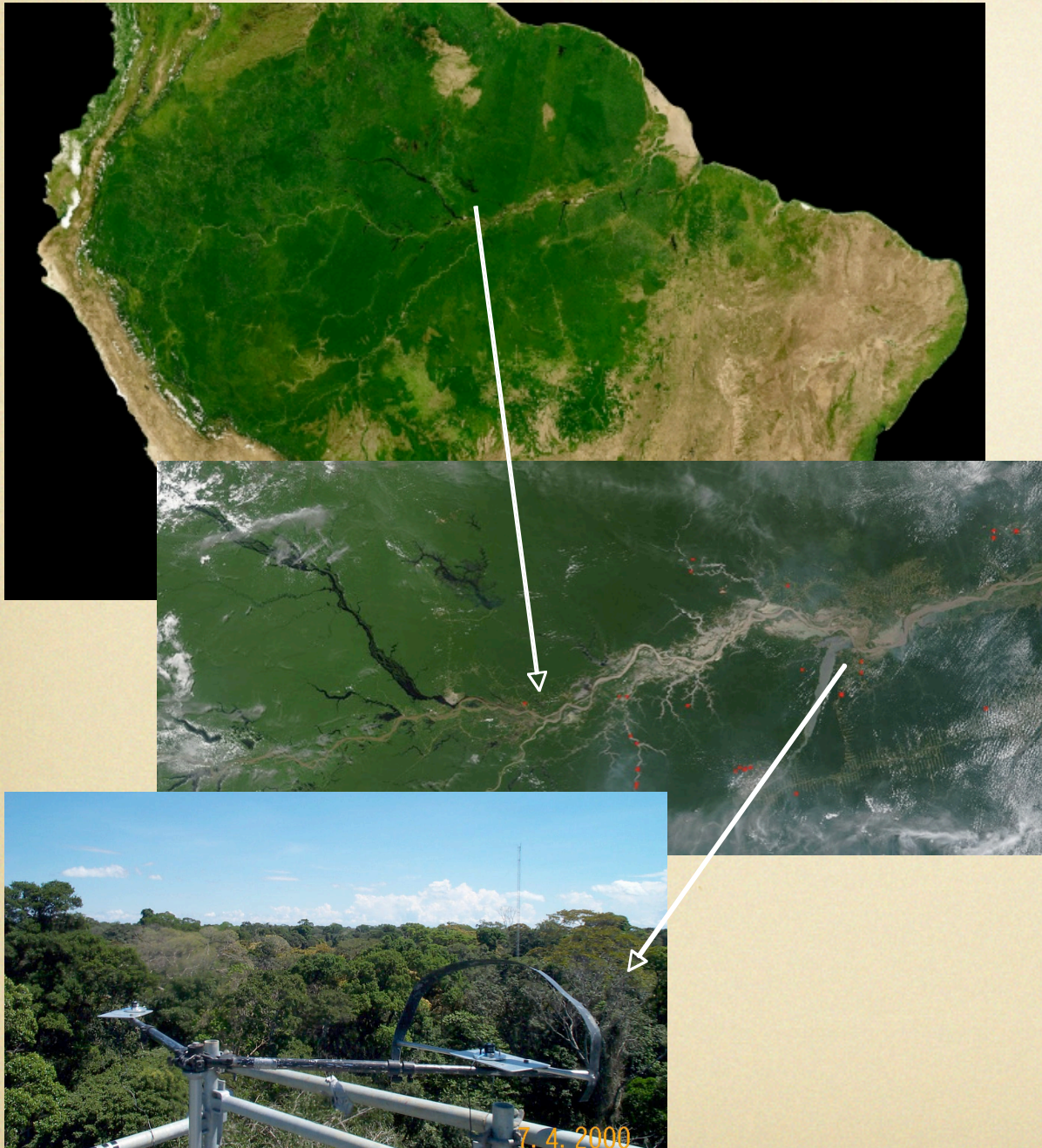


# Introduction

- The rainforests of the Amazon basin form the largest contiguous, intact tropical forest on Earth, a vast storehouse of carbon that could influence the trajectory of global climate change.
  - Tropical forest ecosystems also have social, cultural and economic significance as sources of important renewable and non-renewable resources.
- 
- The functional behavior of tropical forest ecosystems are not well understood,
  - Present-day metabolism and carbon balance of Amazonia remains poorly characterized due to complex environmental controls (moisture, sunlight) and associated biologic responses.



Knowledge of the temporal dynamics and spatial heterogeneities of tropical forest ecosystems at multiple scales is necessary to understand vegetation behavior and in understanding how plants might adapt to global change.





# Phenology

- At the landscape level, many climate and growth models characterize tropical evergreen rainforests as having no seasonal variation in biophysical plant properties such as greenness, leaf area index, FAPAR, and albedo
- Coarse resolution, multi-temporal satellite measurements, such as the NOAA-AVHRR time series data, are widely used for large scale vegetation monitoring and vegetation -climate studies, however, such data have also treated the phenology of tropical evergreen forests as flat or seasonally constant.
- Finer resolution satellite data (e.g. Landsat) offer more accurate monitoring and discrimination of tropical forests and disturbance events, such as deforestation and fire. However, it is difficult to obtain cloud-free images at the frequencies needed to define accurate phenology trends.



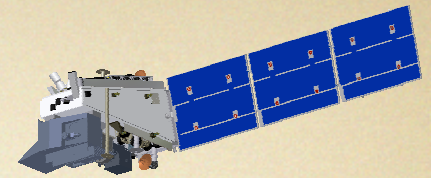
# Uncertainties

- Satellites can provide consistent measures of vegetation activity with spatial- and temporal- detail at the global scale, which can be linked to ecosystem health, productivity and carbon fluxes,
- There remains large uncertainties in estimating GPP at the canopy level associated with
  - Seasonal dynamics
  - Spatial variation due to climate, soils, and land use (disturbance, management,... )
- Uncertainties associated with coarse scale meteorology, remote sensing variables (LAI, FPAR, VI), and canopy biophysical attributes (land cover type, biome-specific, disturbance history)





# Objectives



- Assess spatial and temporal variability in vegetation activity in tropical forest ecosystems
- Assess the influences of light, moisture, and human activity in tropical forests
  - Changes in phenological metrics depict a canopies' integrated response to environmental change,
- Test for phenologic consistencies of satellite data with flux tower data in highly impacted/disturbed tropical forests in Asia



# Mechanisms controlling phenology

- However, plot-level & flux tower local-scale studies have observed consistent seasonal changes in tropical forest canopy characteristics, including synchronized flushing and exchange of new leaves, periods of decreased foliage density, leaf aging, senescence, and litterfall in response to common environmental factors, such as rainfall, temperature, and photoperiod (Wright and Schaik, 1994; Reich et al., 2004; Saleska et al., 2005)
- Leaf and flower production in many rainforests, including central Amazônia have been reported to closely coincide with dry season peaks in incident photosynthetic active radiation (PAR) [Wright & van Schaik 1994].

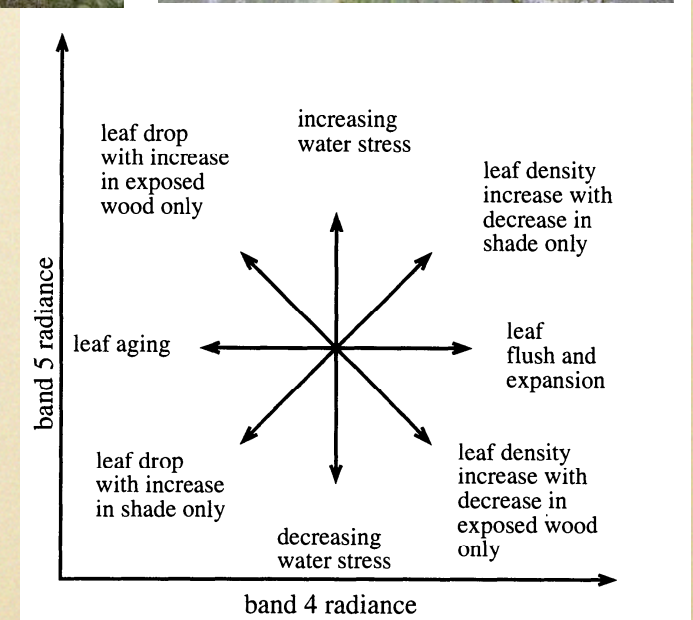


Leaf flushing with  
sunlight at Tapajós,  
July 2002 (photo by  
Tomoaki Miura)



# Phenologic-optical Changes in Tropical Forests

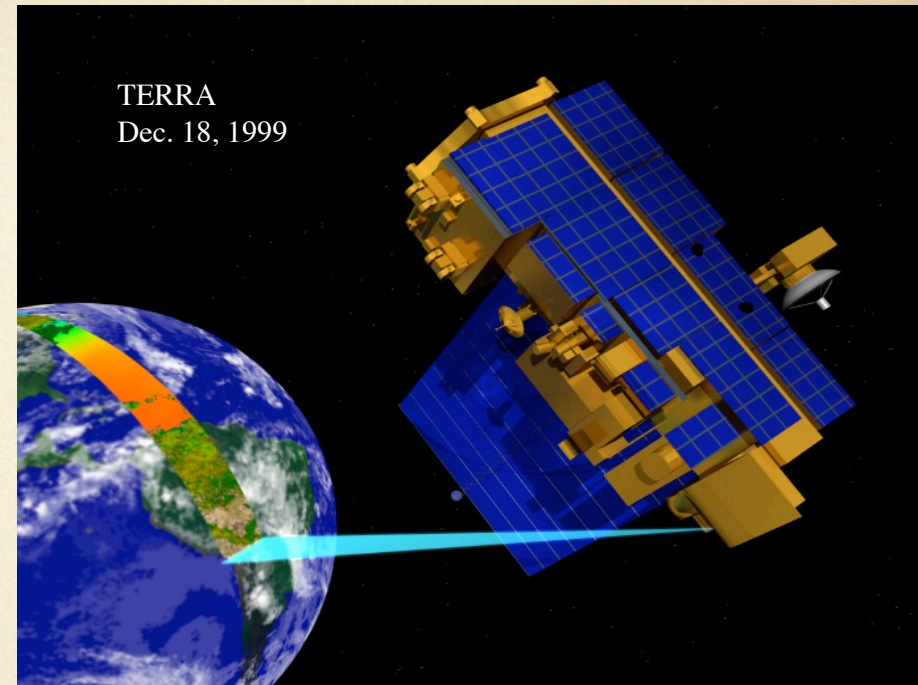
- Leaf aging
- Epiphylls
- Litterfall
- Leaf flushing & expansion
- Leaf density, exposed wood & soil
- Canopy shade, light & gaps
- Leaf water stress
- Upper and lower leaves



*Bohlman et al., Biotropica*  
30 (1998)



Recent satellite observations are providing new opportunities to map and better understand spatial patterns of landscape phenology and productivity as a function of environmental controls and land use activities.



**Terra- MODIS data**

We investigated the phenology of Amazon ecosystems across over a range of climate (precipitation, light) and land use conditions encompassing open and dense moist rainforests, seasonally dry forests, ecotone forests, regenerating forests, and converted pasture/ agriculture with satellite observations from fine resolution EO-1 Hyperion and moderate resolution MODIS



# Terra- MODIS Vegetation Index Product (MOD13Q1, A2)

## Enhanced Vegetation Index

$$EVI = G \times \frac{\rho_{nir} - \rho_{red}}{\rho_{nir} + C_1 \times \rho_{red} - C_2 \times \rho_{blue} + L}$$

- Based on 1st-order Beer's law application of radiative transfer in canopy
- Extends sensitivity in high biomass canopies and removes soil optical influences

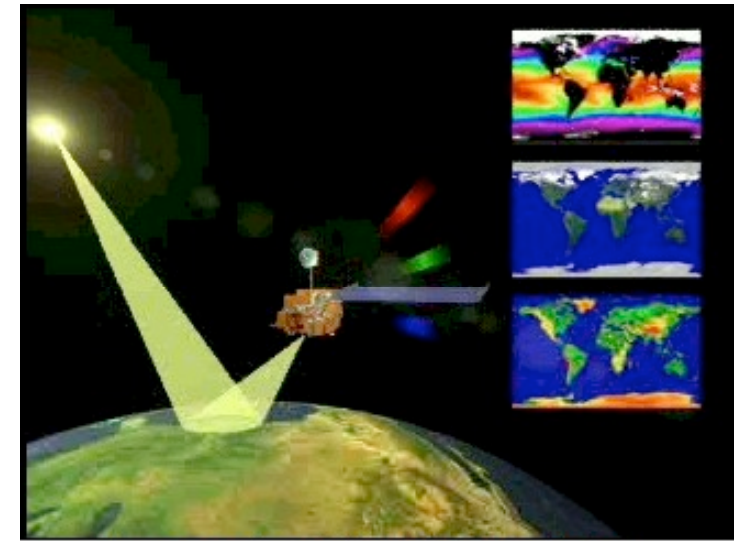
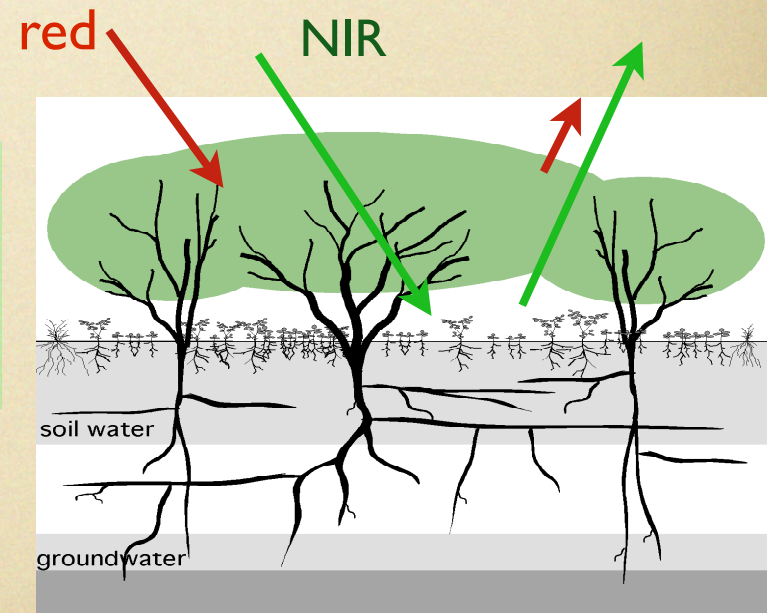


Image courtesy of the NASA Terra Project

The derivation of thematic data from Earth observing satellites.



Travis Huxman



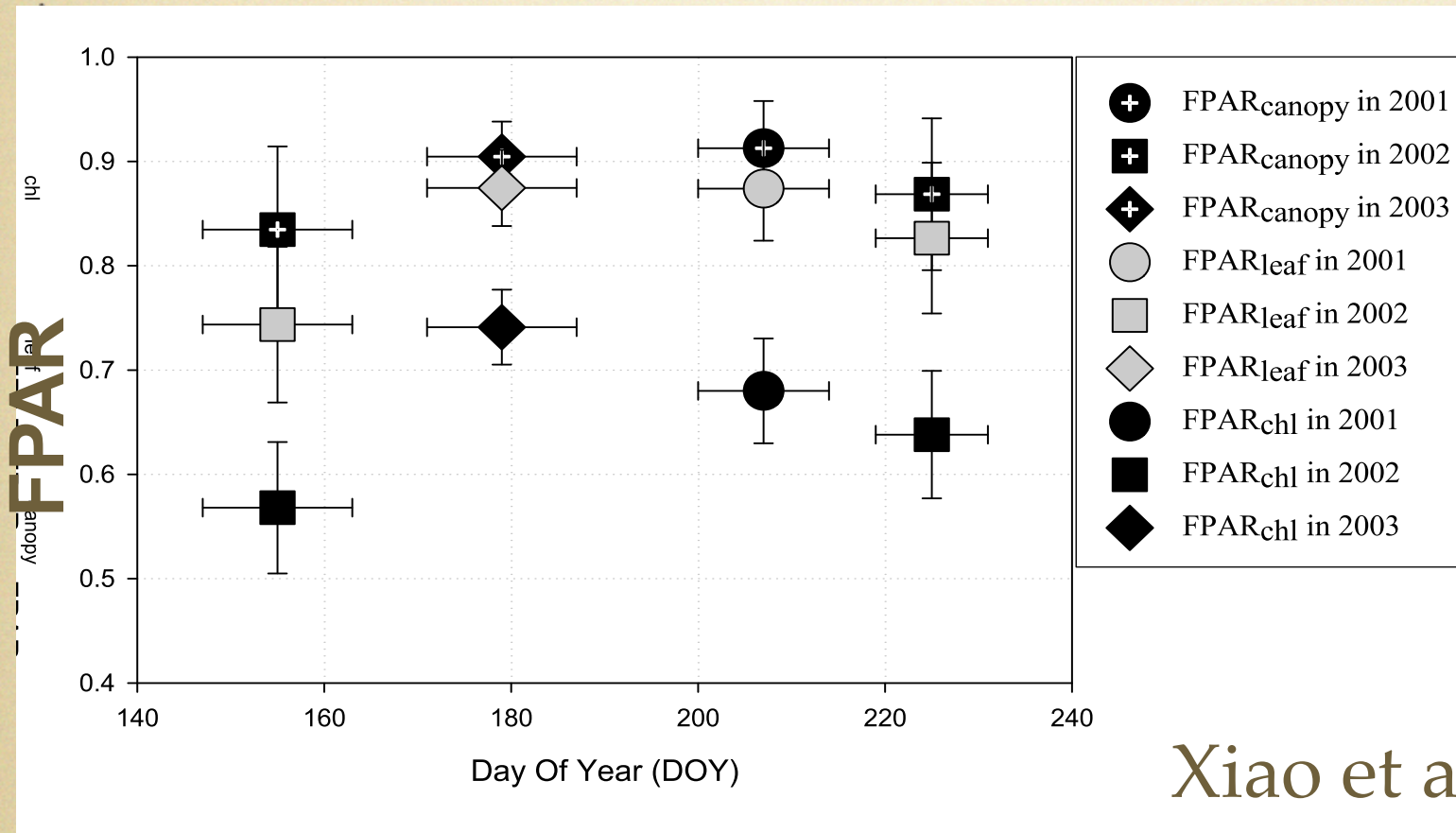
# Conversion of VI to FPAR?

- Most common method to derive FPAR is through NDVI relationships
- Only PAR absorbed by chlorophyll is responsible for photosynthesis:
  - $\text{FPAR}_{\text{canopy}} = \text{FPAR}_{\text{chl}} + \text{FPAR}_{\text{NPV}}$
- Comparisons of  $\text{FPAR}_{\text{chl}}$  and  $\text{FPAR}_{\text{canopy}}$  would help define to what degree the PEM models are consistent with light absorption process of photosynthesis at the chlorophyll level.



# FPAR<sub>canopy</sub>, FPAR<sub>leaf</sub>, and FPAR<sub>chl</sub>

## deciduous broadleaf forest (Harvard Forest)



Xiao et al. 2005, 2005

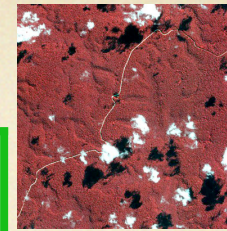
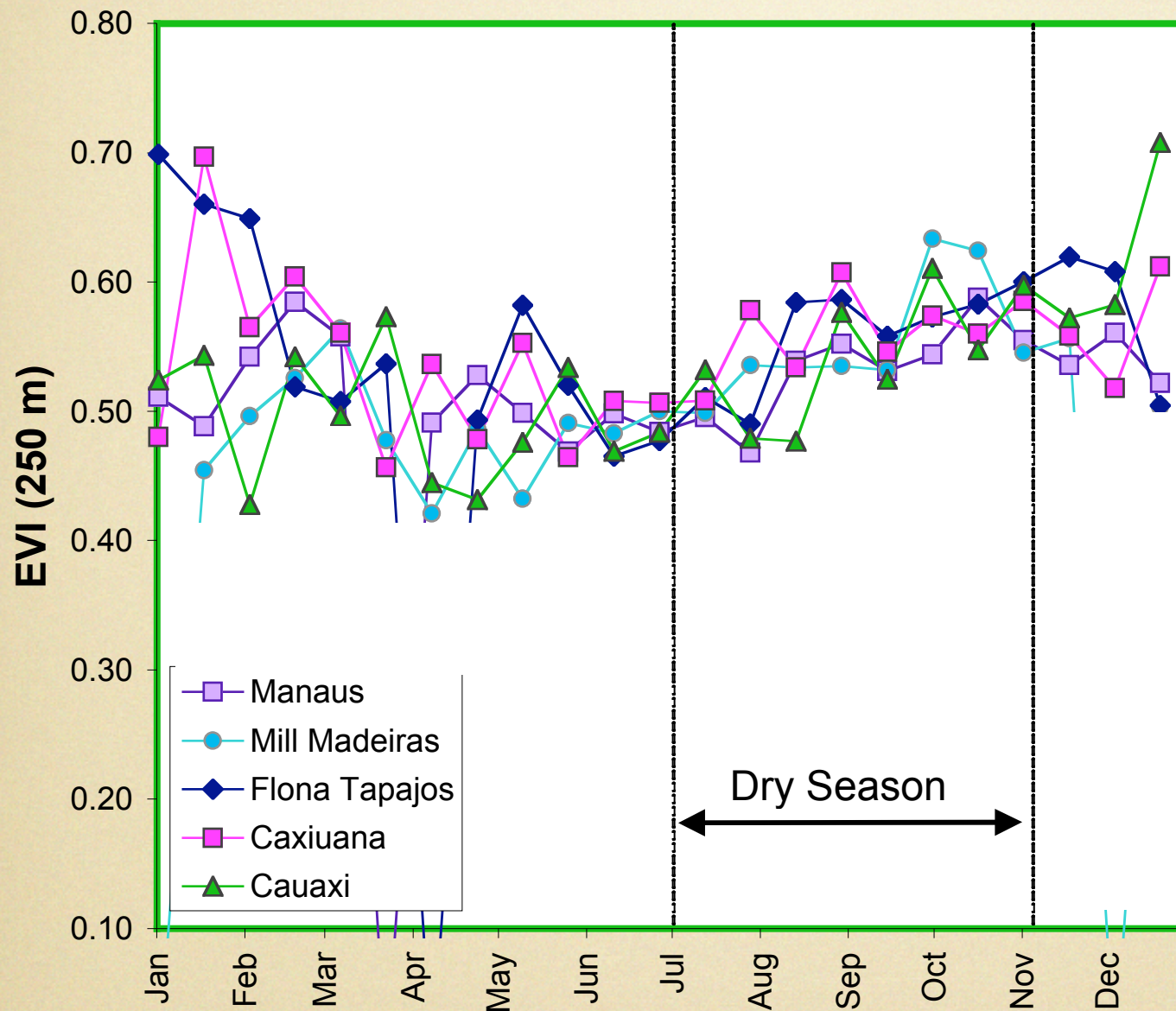
$$\text{FPAR}_{\text{leaf}} = f(\text{NDVI})$$

$$\text{FPAR}_{\text{chl}} = f(\text{EVI})$$

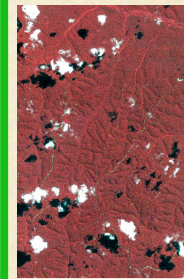
Zhang et al., 2005, using a radiative transfer model (PROSAIL2) & daily MODIS data



# Site Results



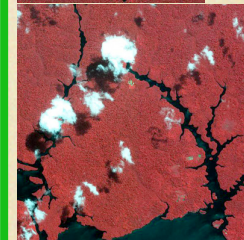
Manaus



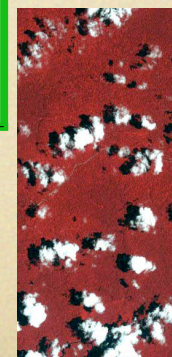
Mill Madeiras



Flona Tapajos



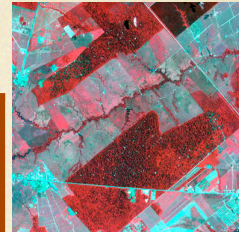
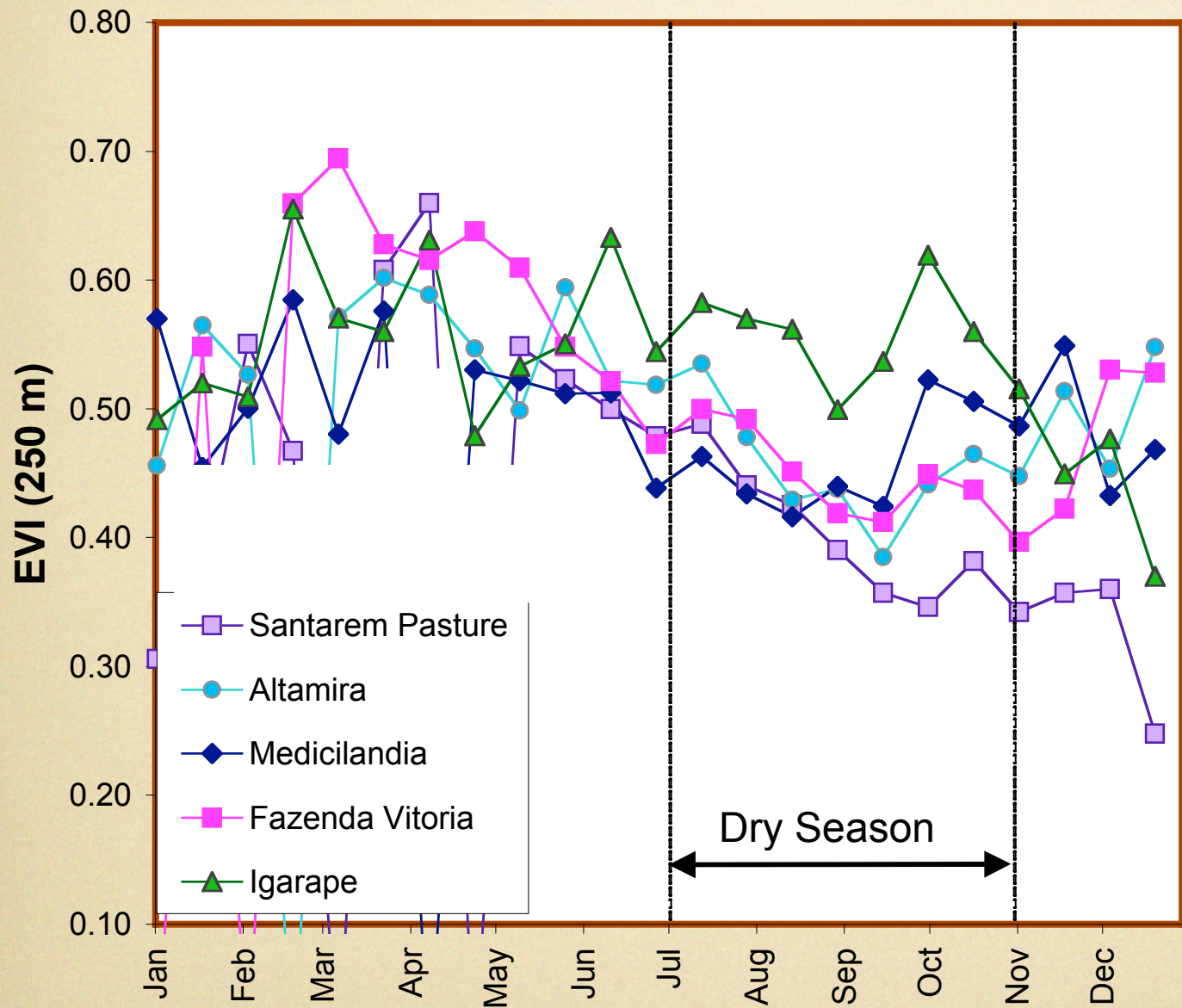
Caxiuana



Cauaxi



# Pastures



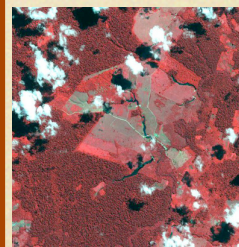
Faz. Vitoria



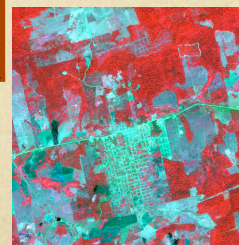
Igarape



Altamira

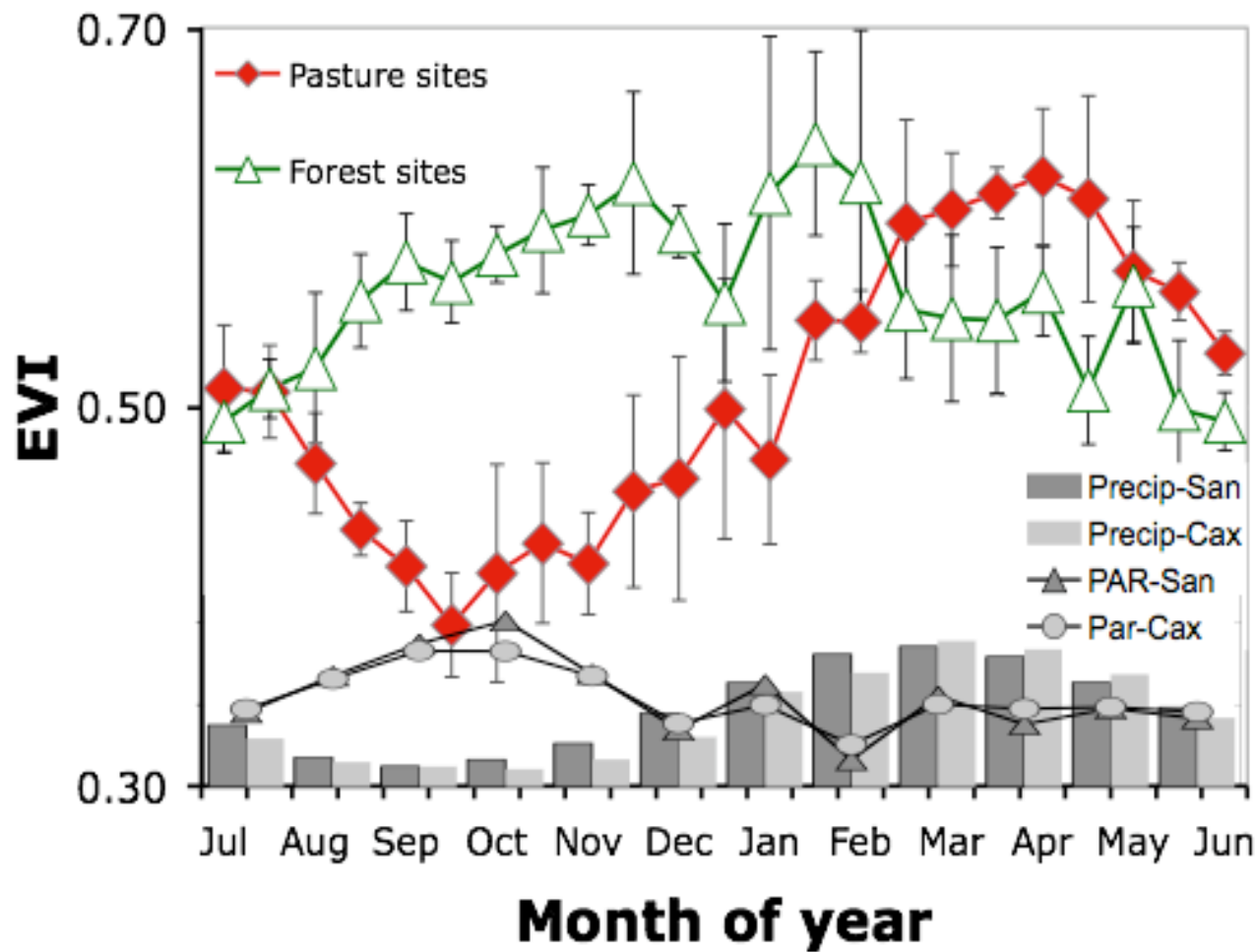


Santarem  
Pasture

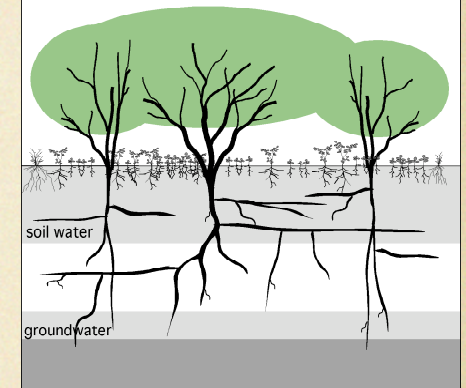


Medicilandia

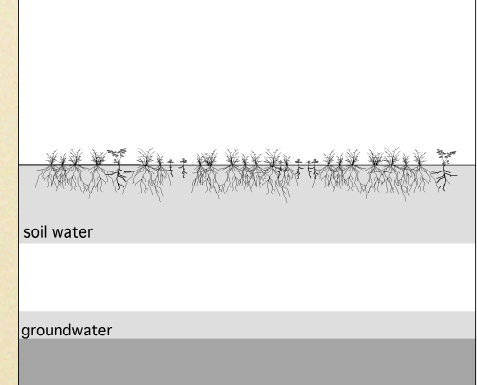




Phase III

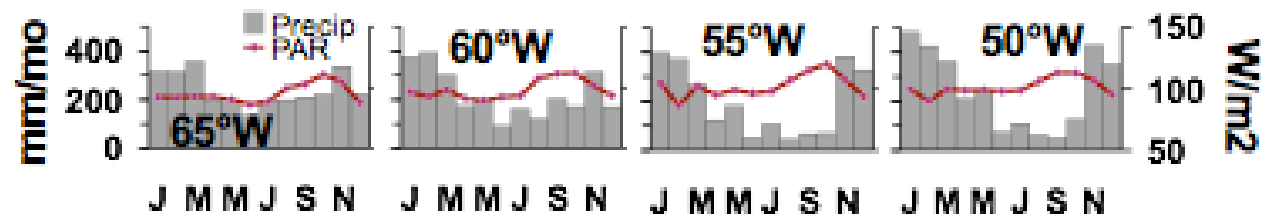


Phase I

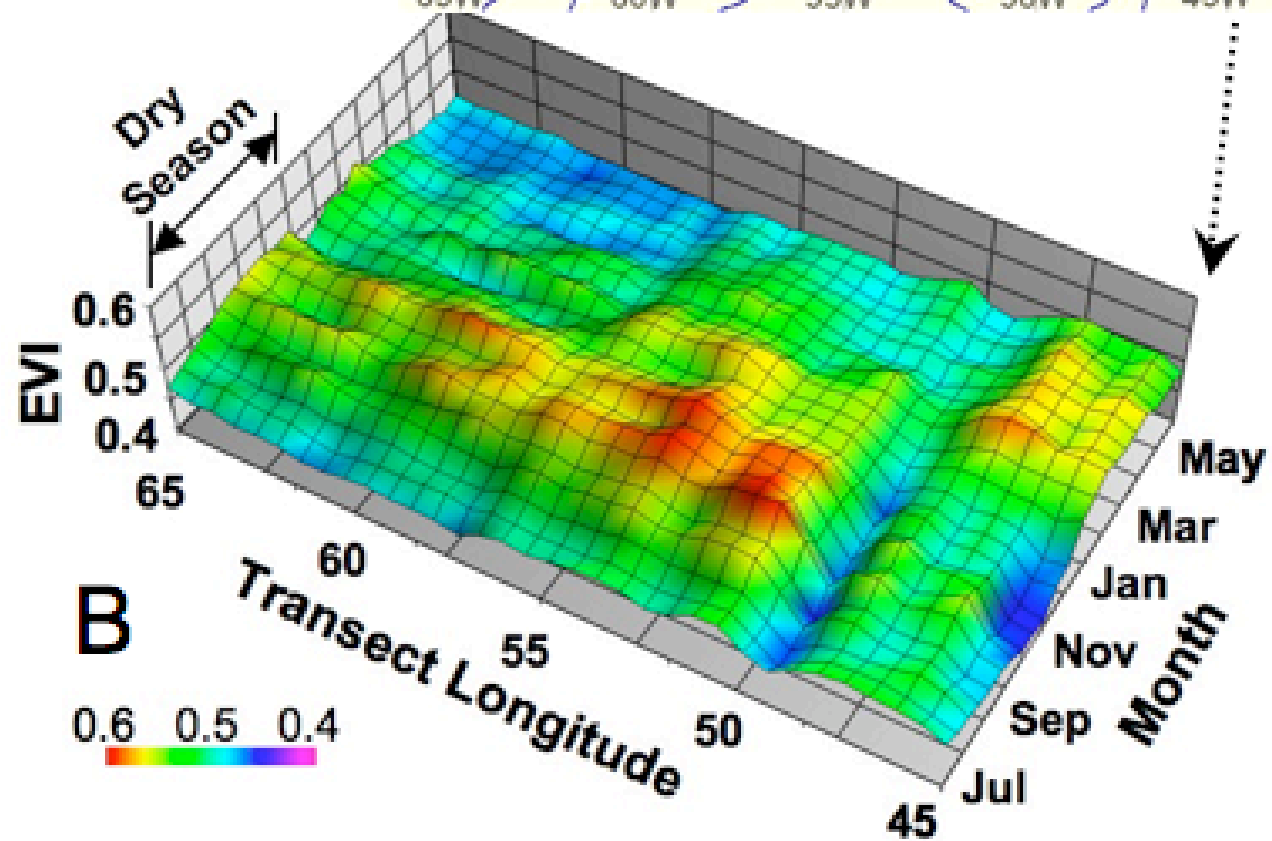


Amazon Basin: Sunny dry season 'green-up' is reversed in disturbed areas (shallower rooting systems)





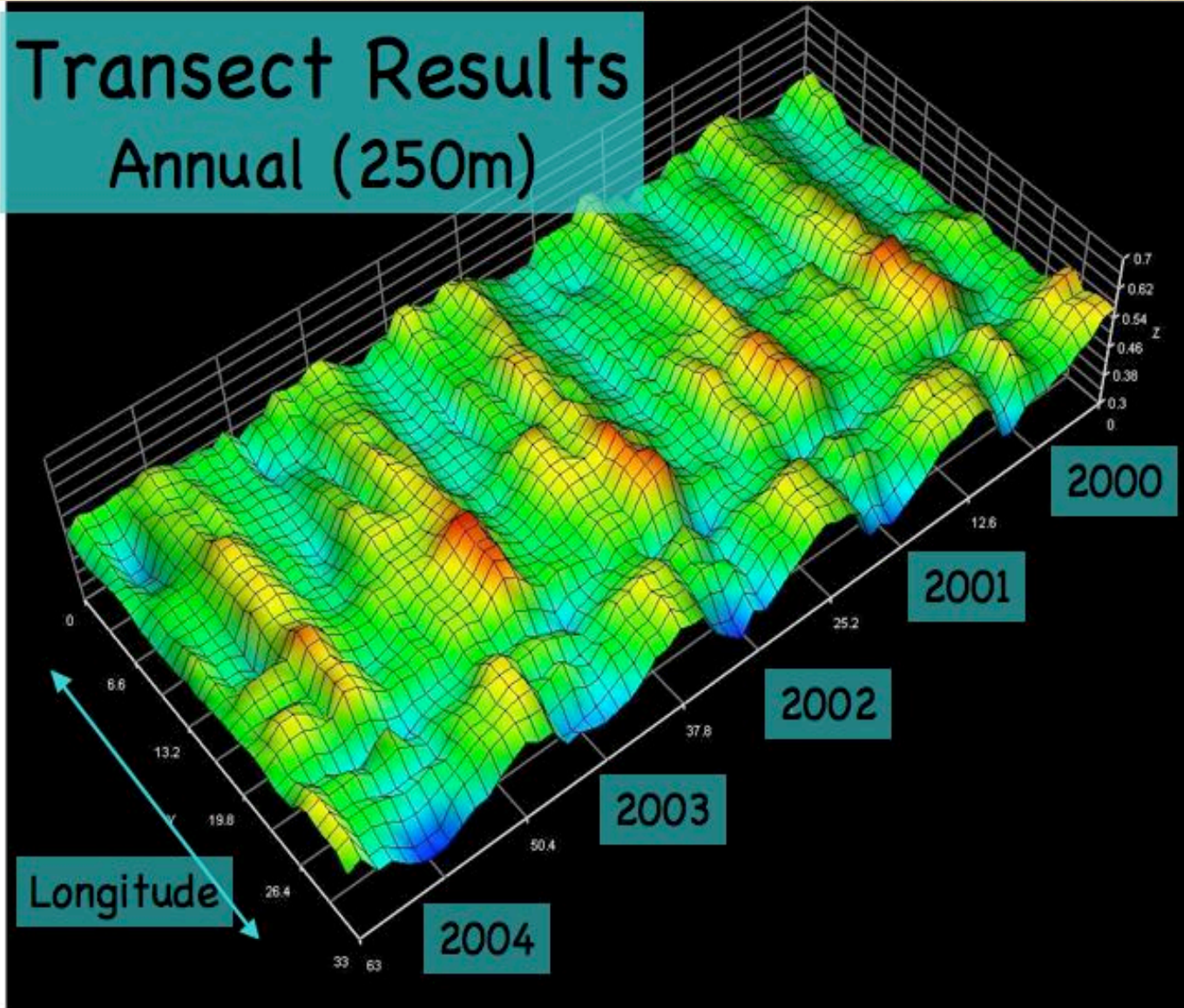
**A**





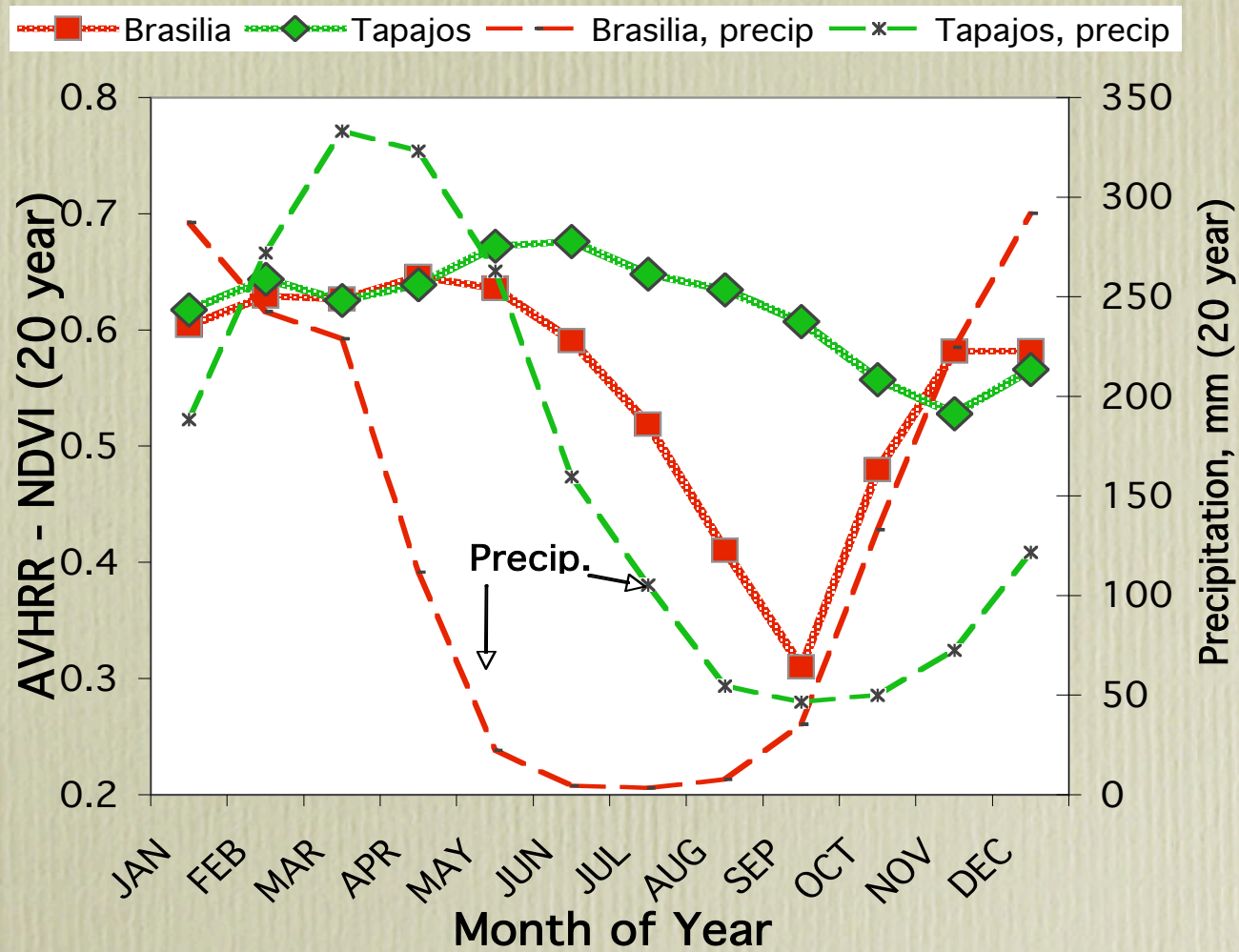
MODIS shows  
tropical  
rainforests as  
having significant  
seasonal  
variation in  
vegetation  
dynamics.

## Transect Results Annual (250m)





# NOAA- Advanced Very High Resolution Radiometer (AVHRR) in the Amazon



Barbosa, H.

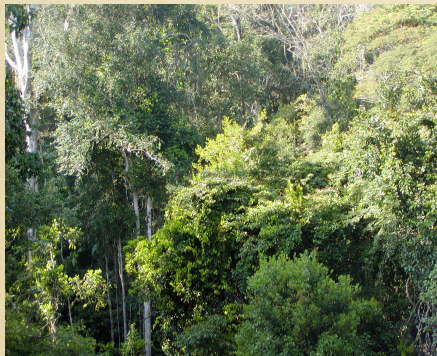
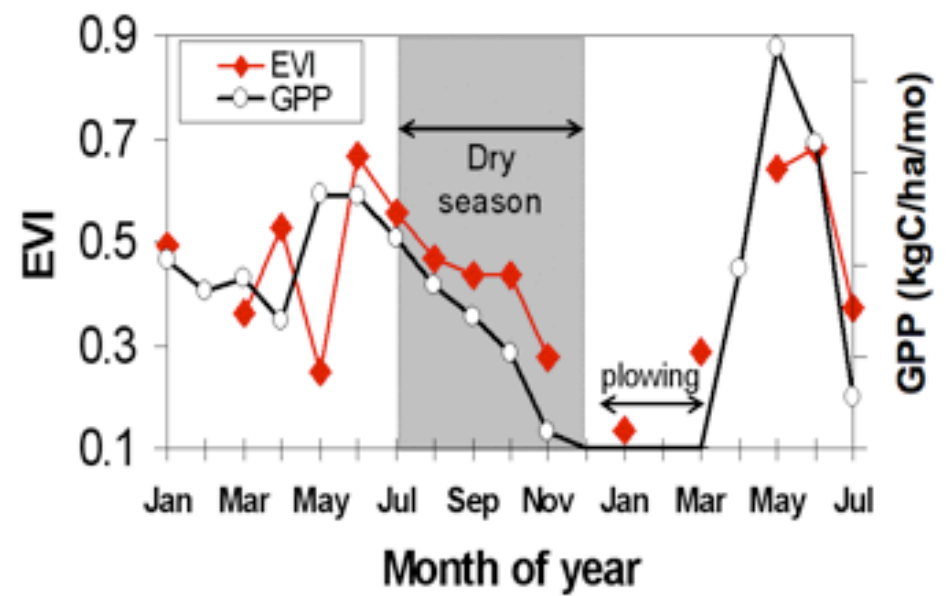
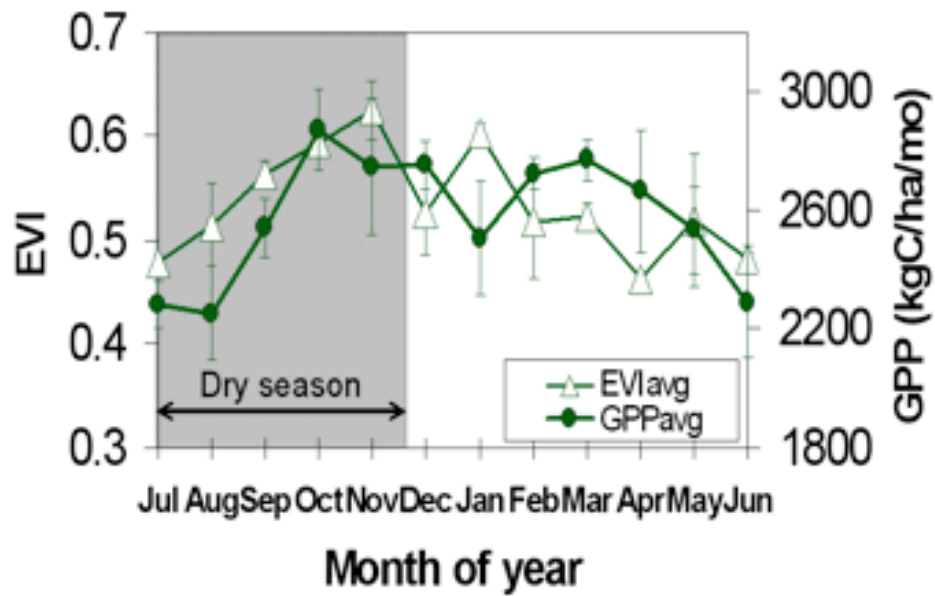


# Coupling of satellite data with in-situ networks (eddy-covariance flux towers)

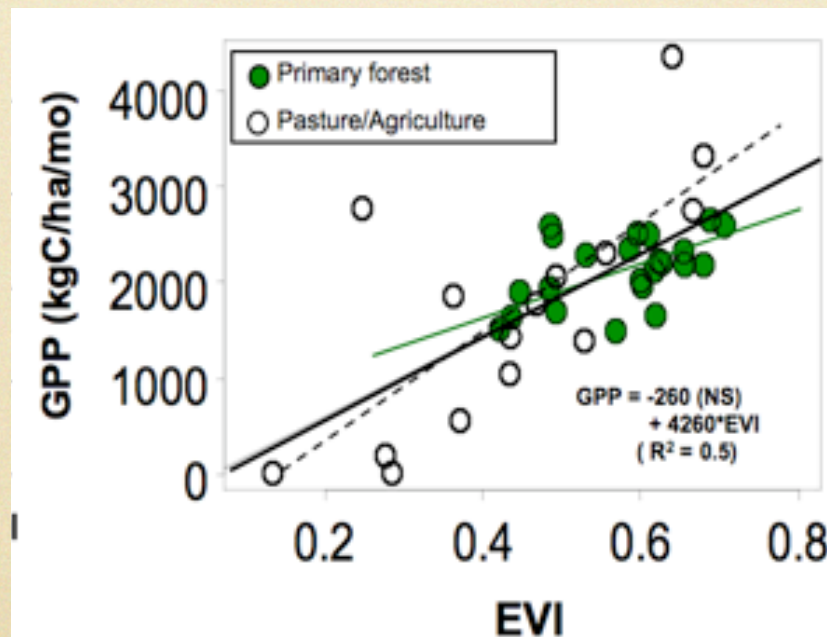
- **“Integration of in situ, airborne and space-based observations within the various societal benefit areas will be encouraged, as will the establishment of global, efficient, and representative networks of in situ observation to support process studies, satellite data validation....,” (GEOSS)**
- Continuous measurements of flux ( $\text{CO}_2$ ,  $\text{H}_2\text{O}$ , heat and momentum) data are powerfully suited for vegetation dynamics and for deriving relationships between carbon fluxes and key driving variables.
- Can test model/remote-sensing estimates of carbon-exchange and seasonality.





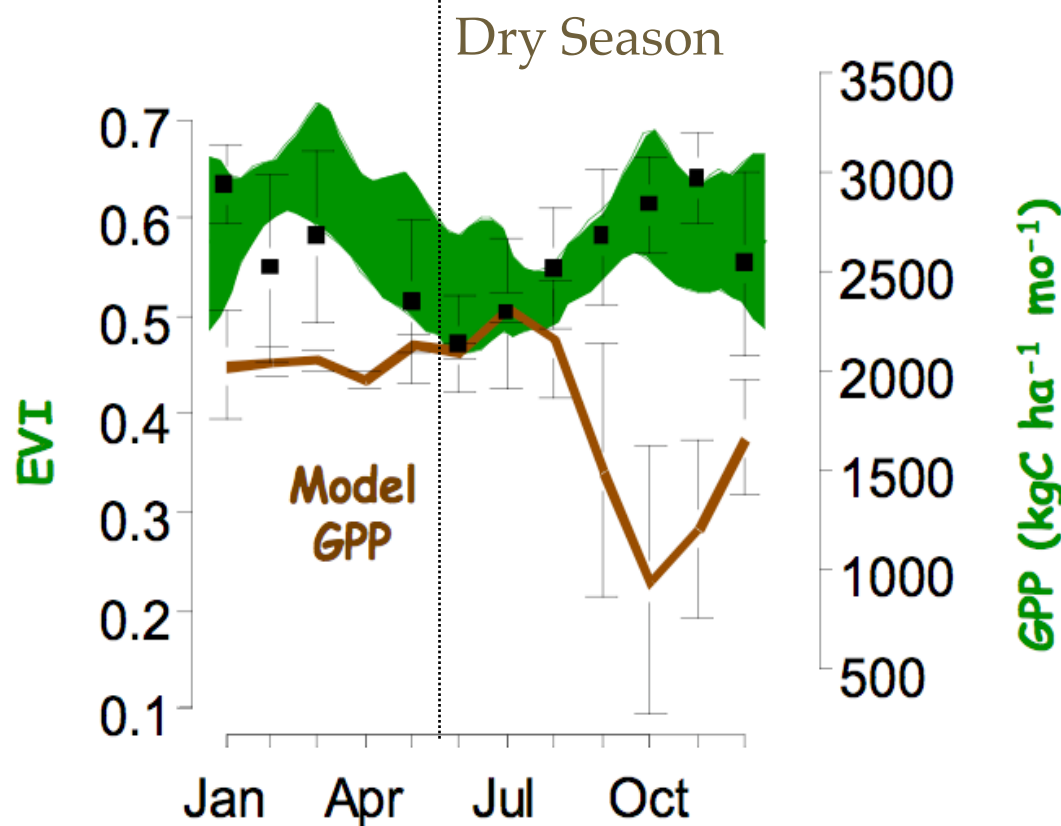


Tapajos Forest





# Rainforest GPP & EVI with modeled GPP (IBIS)



Local tower flux measurements of gross primary productivity (GPP) and regional satellite observations from the MODIS show seasonal patterns in canopy photosynthesis, or GPP that follow the availability of sunlight, contradicting many ecosystem models that show dry season declines in photosynthesis due to water limitations.

A consistency between independent satellite EVI and tower-derived GPP observations lends confidence to both findings.

## Tapajós National Forest

GPP from Lucy Hutyra  
(Harvard Univ)



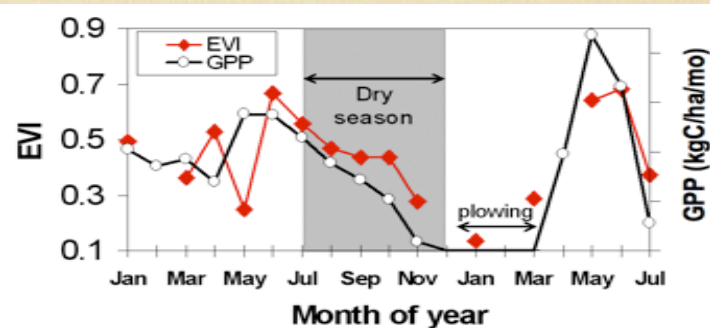
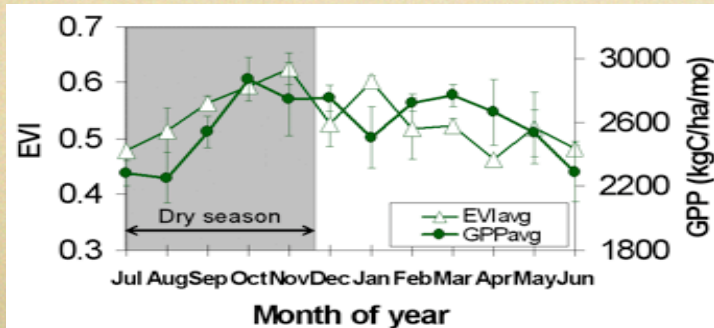
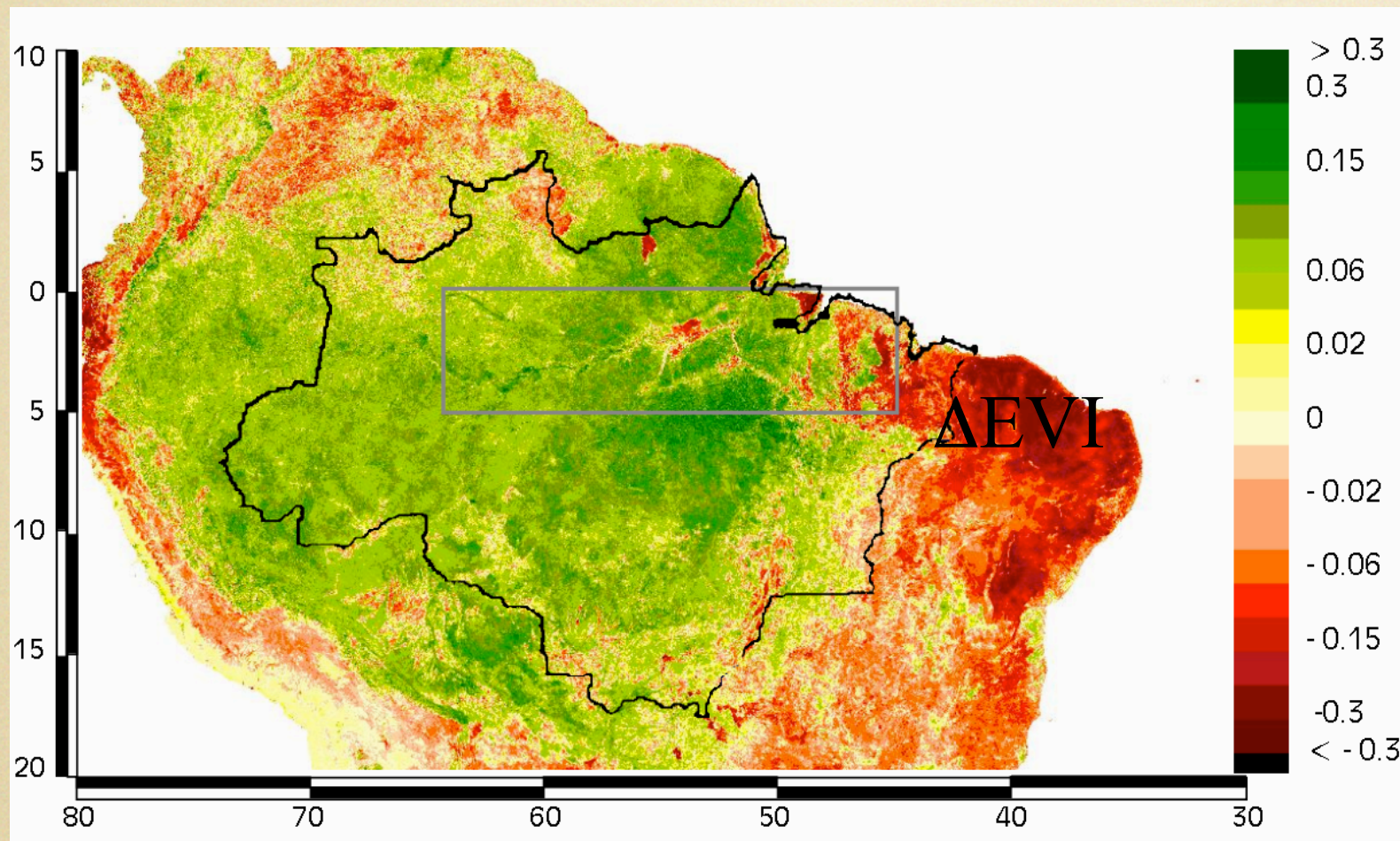
# This raises a question about model predictions

- The same model constructs affect both short-term (seasonal) and long-term variations of C and water exchange,
- but the performance of models at short time-scales (where they can now be tested with data) is problematic, hence affecting confidence in reliability of their long-term predictions?



# Basin-wide greening in dry season

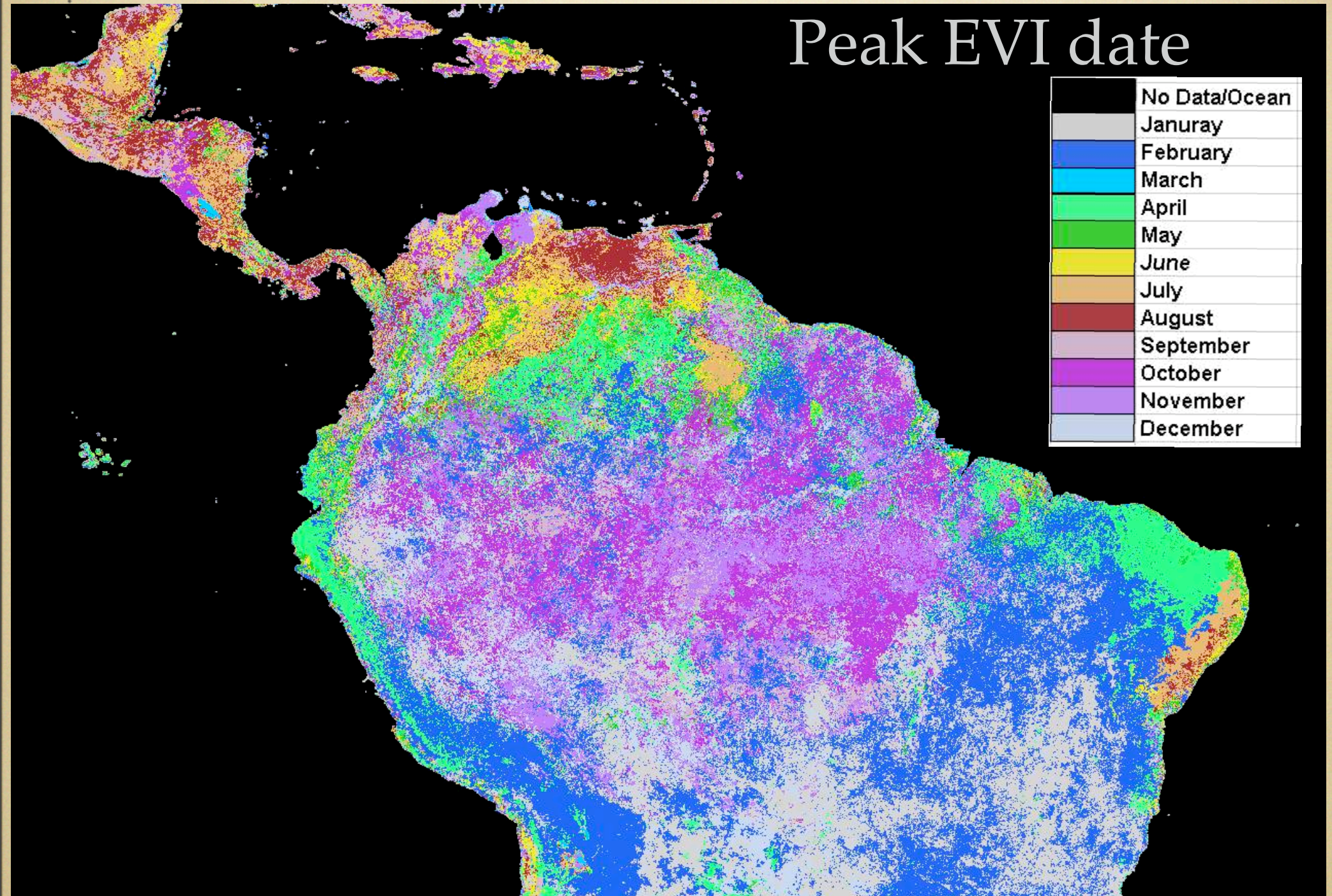
October EVI (dry season) minus June EVI (wet season)





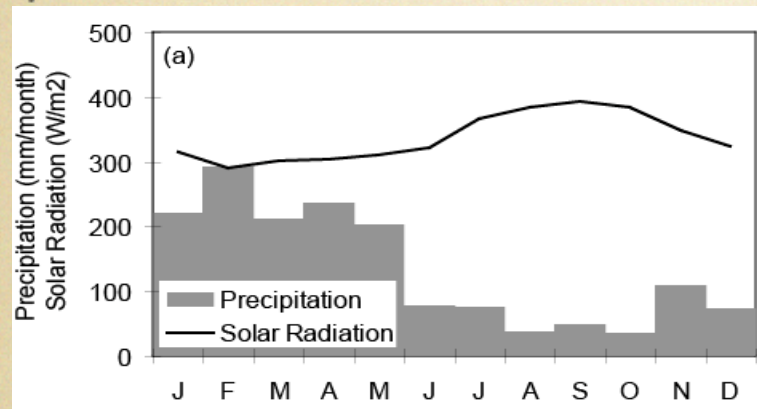
# Peak EVI date

	No Data/Ocean
	January
	February
	March
	April
	May
	June
	July
	August
	September
	October
	November
	December

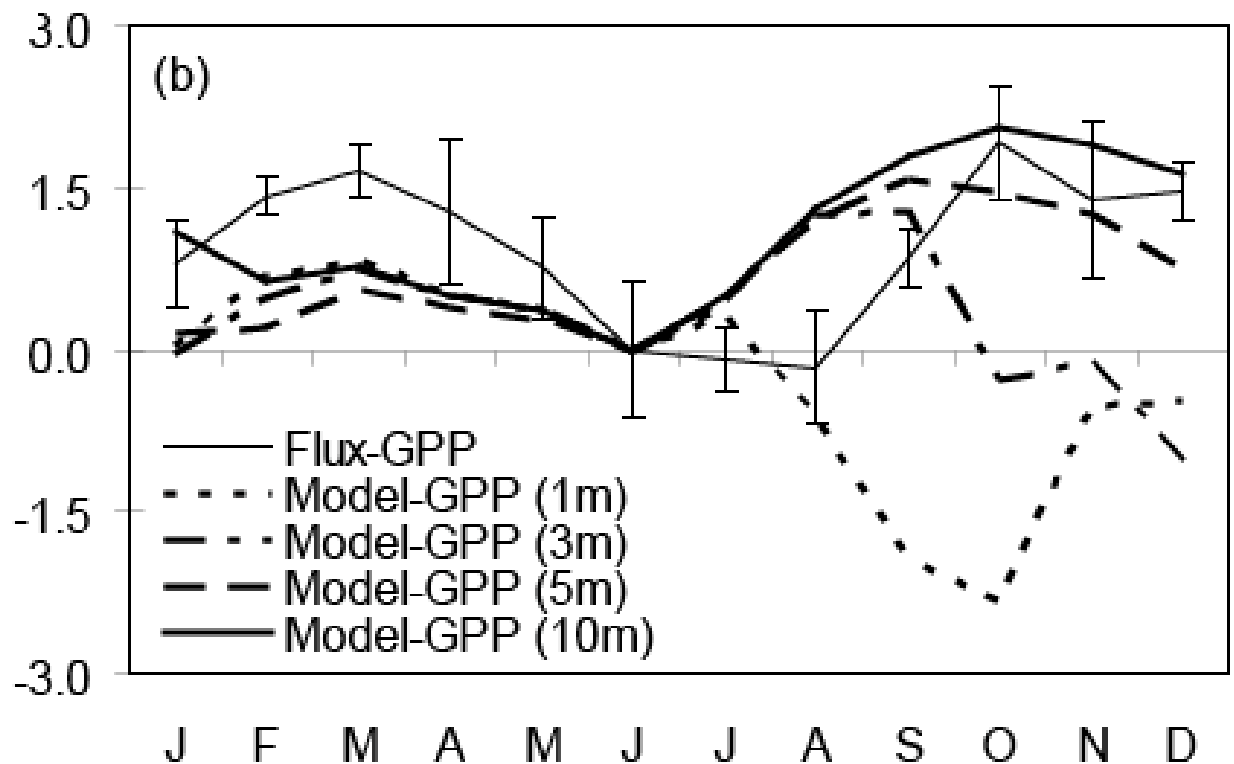




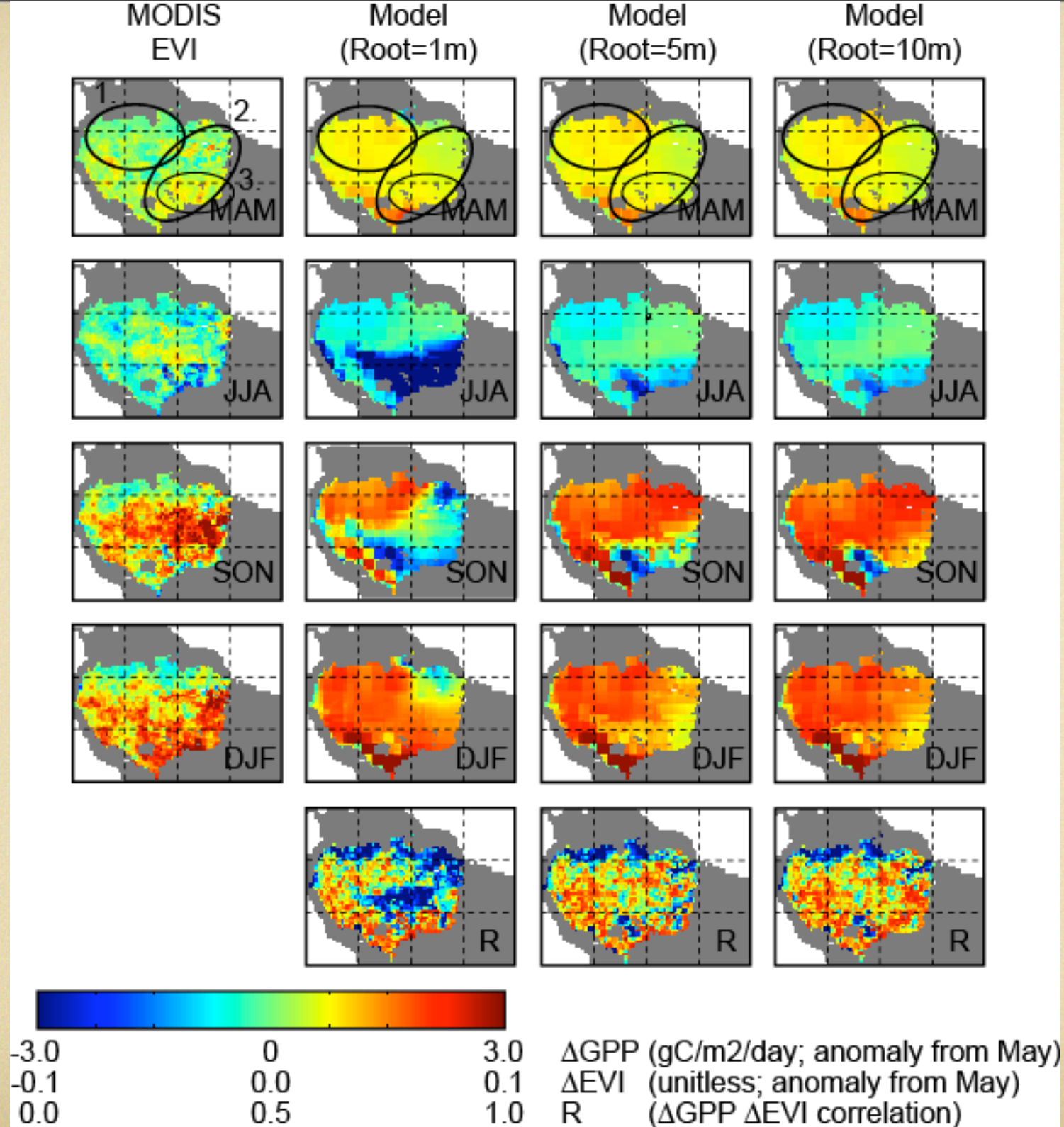
This offers new approaches to constrain rooting depth in terrestrial ecosystem models over the Amazon using MODIS EVI satellite data and Biome-BGC terrestrial ecosystem model.



GPP Difference (gC/m<sup>2</sup>/day)

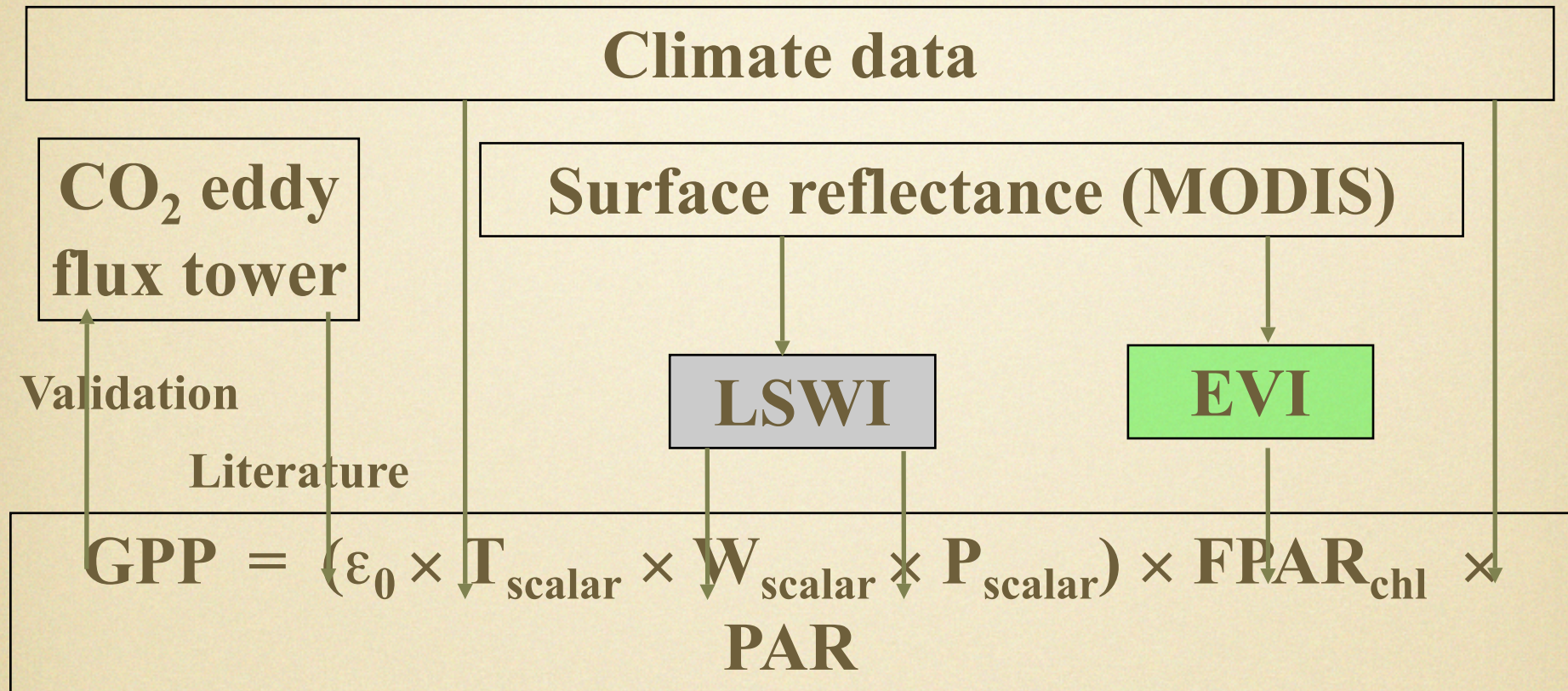








# Satellite-based Vegetation Photosynthesis Model (VPM)

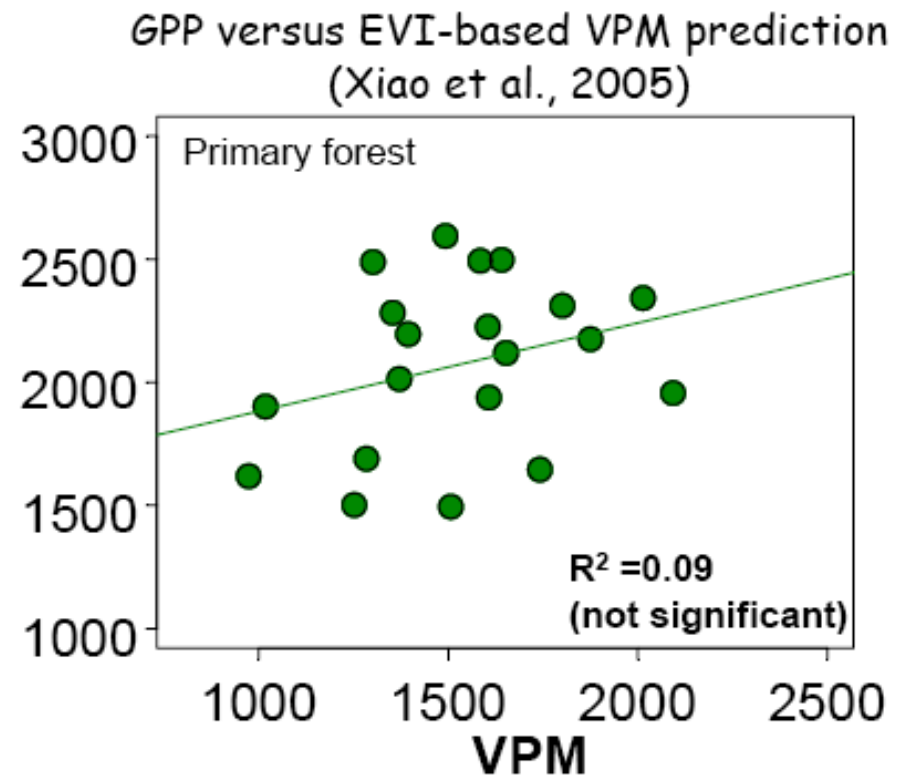
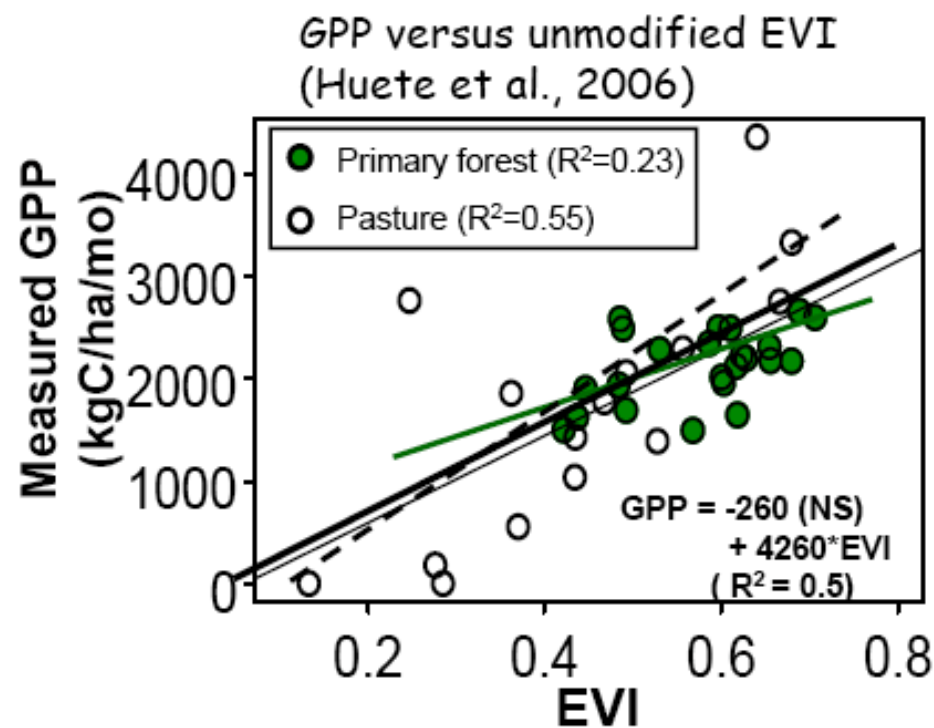


## Input data for simulation of the VPM model

Air temperature, PAR, Vegetation indices (EVI, LSWI), Maximum light use efficiency ( $\epsilon_0$ )



# Extrapolating tower-derived GPP Carbon fluxes with MODIS remote sensing: unmodified EVI vs. VPM model



Vegetation-Photosynthesis Model (VPM):  
adjusts EVI (photosynthetic infrastructure)  
by environmental fluctuations:

$$GPP = \varepsilon \cdot T_{scale} \cdot W_{scale} \cdot EVI \cdot PAR$$

Temp scaling      Water scaling      Sunlight

VPM works well in temperate forests (Xiao et al, 2004)

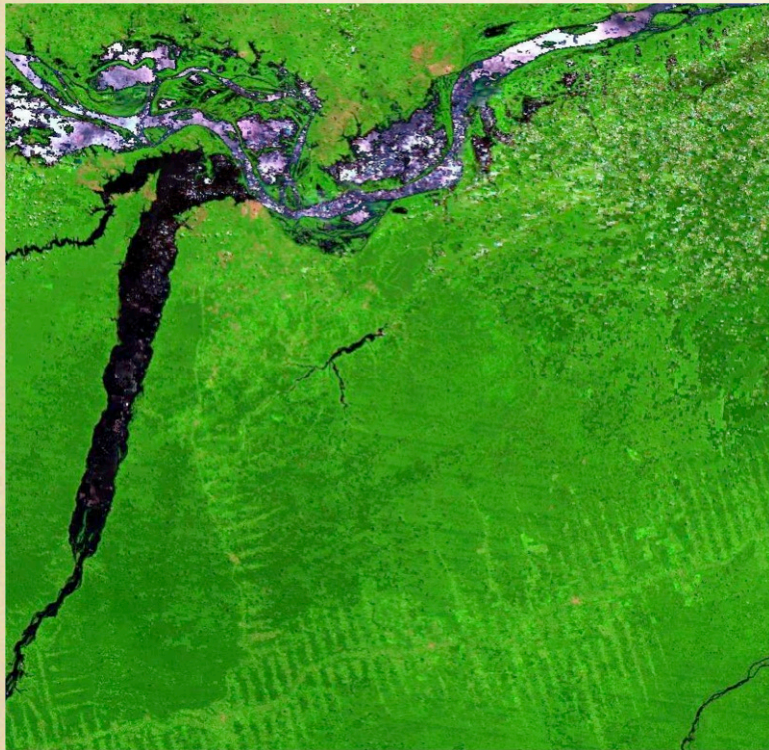
Unmodified EVI works better than VPM in tropical forests

Saleska

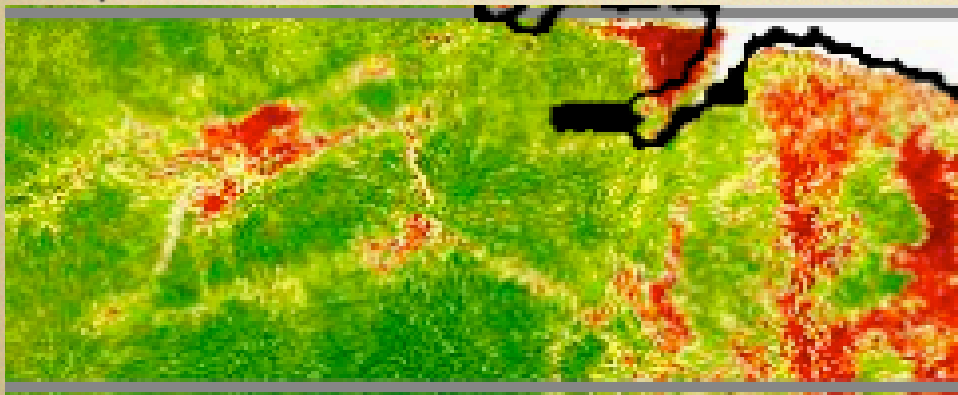
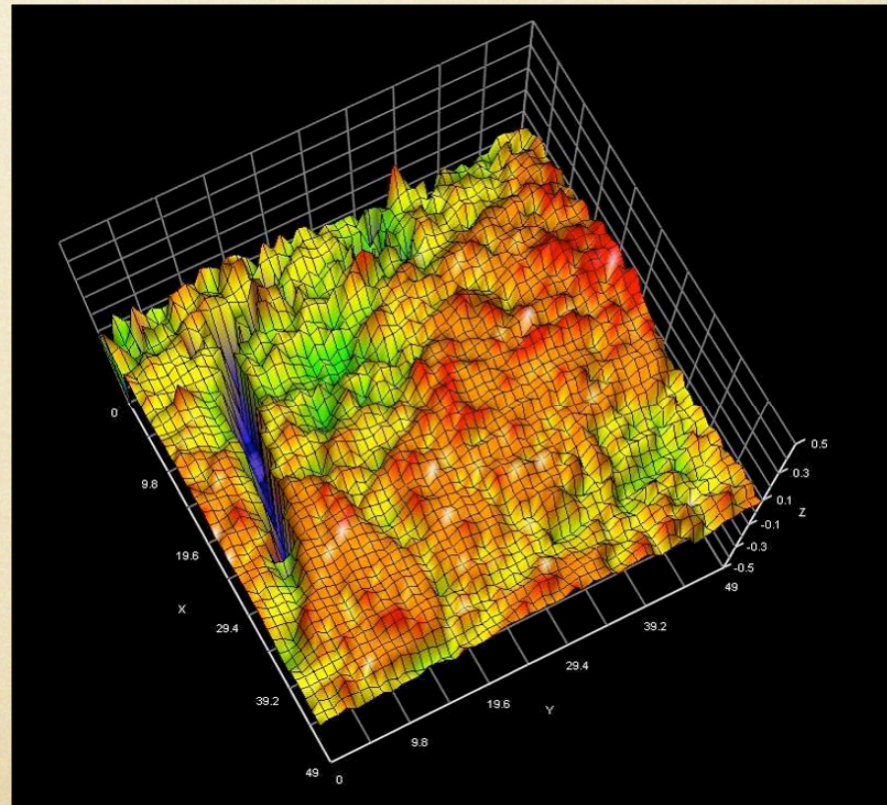


# Disturbance at Tapajós

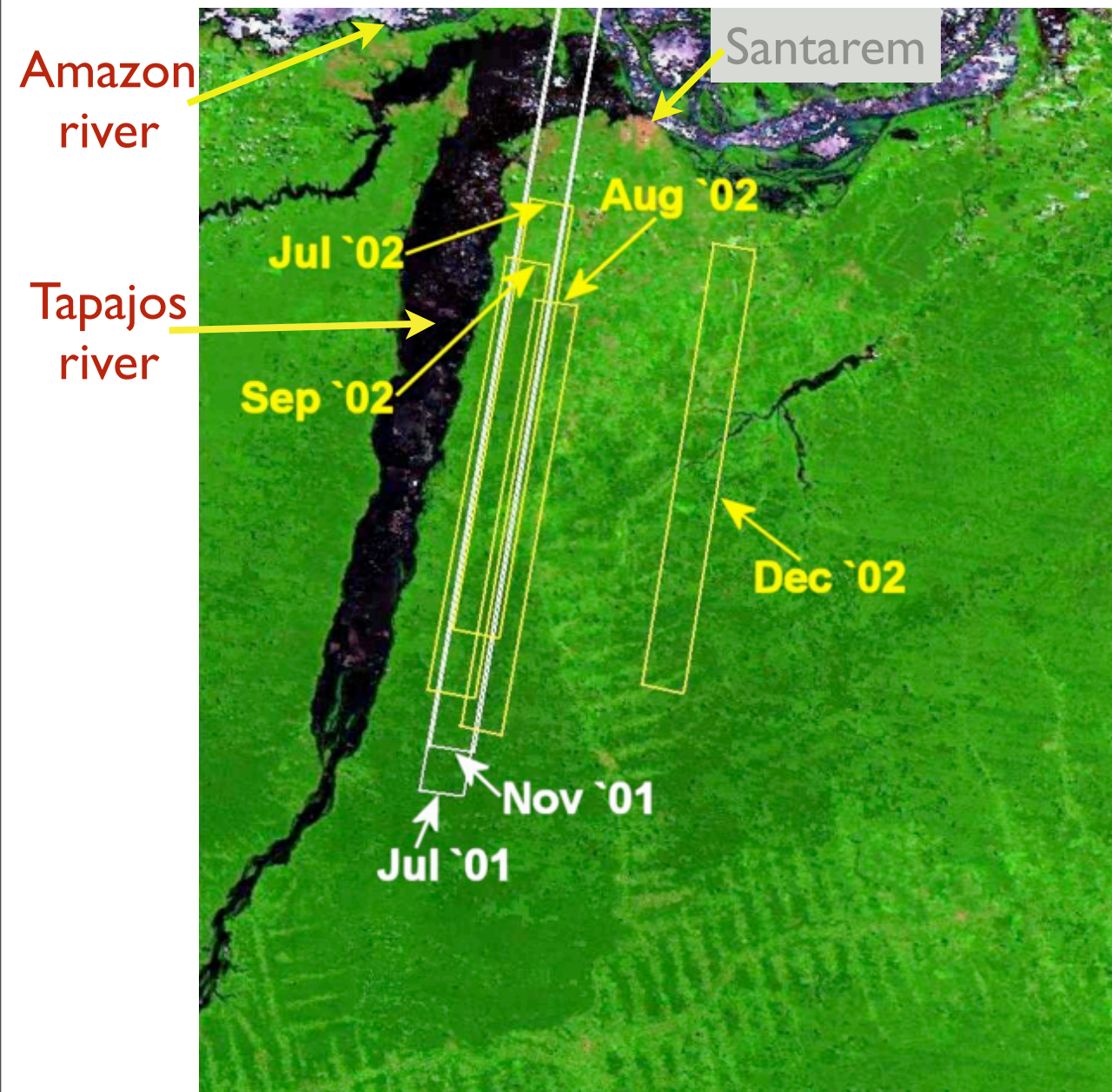
## $EVI_{\text{dry-wet}}$ (October - June)



Red colors depict where 'greening' occurs in the dry season with 'yellows' indicating 'drying'



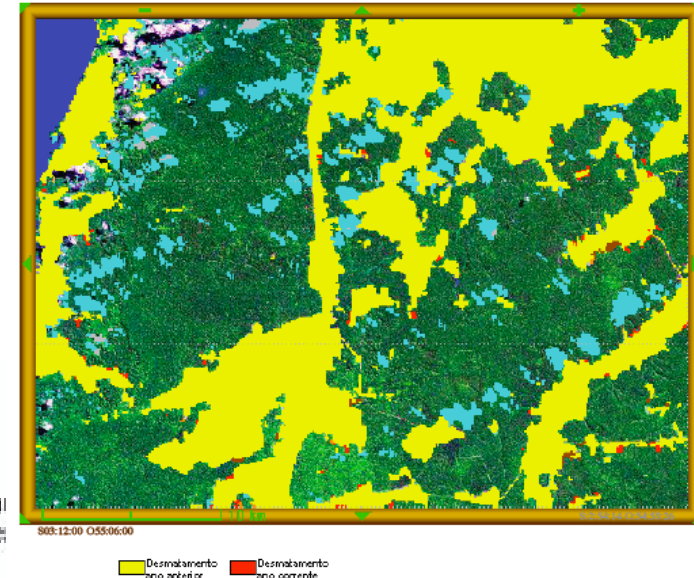
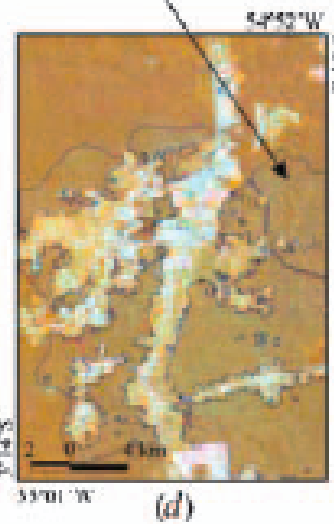
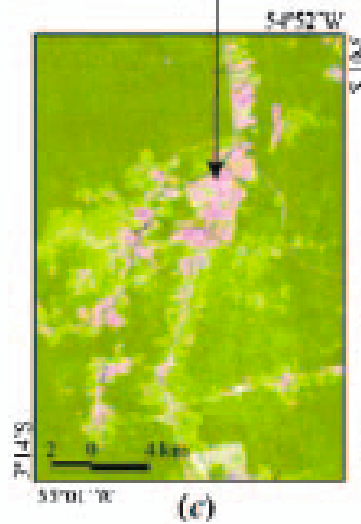
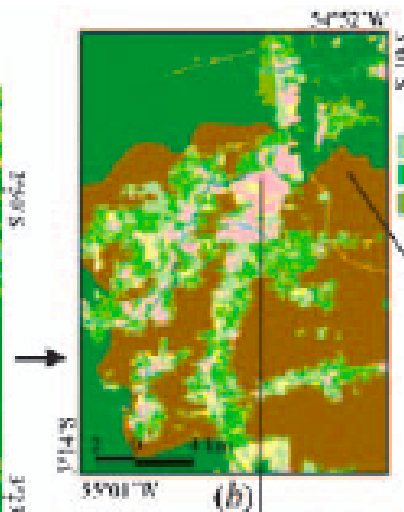
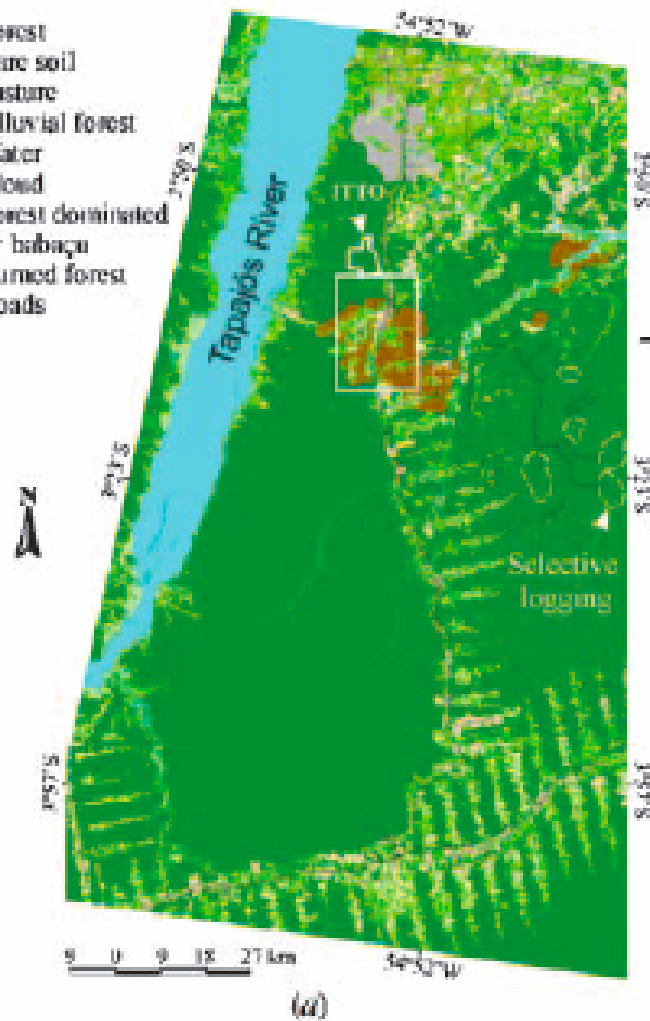




Location of 6 EO-1 Hyperion scene acquisitions within the Floresta Nacional do Tapajós and surrounding areas, south of Santarém in the state of Pará, Brazil; each Hyperion each image is 11km wide.

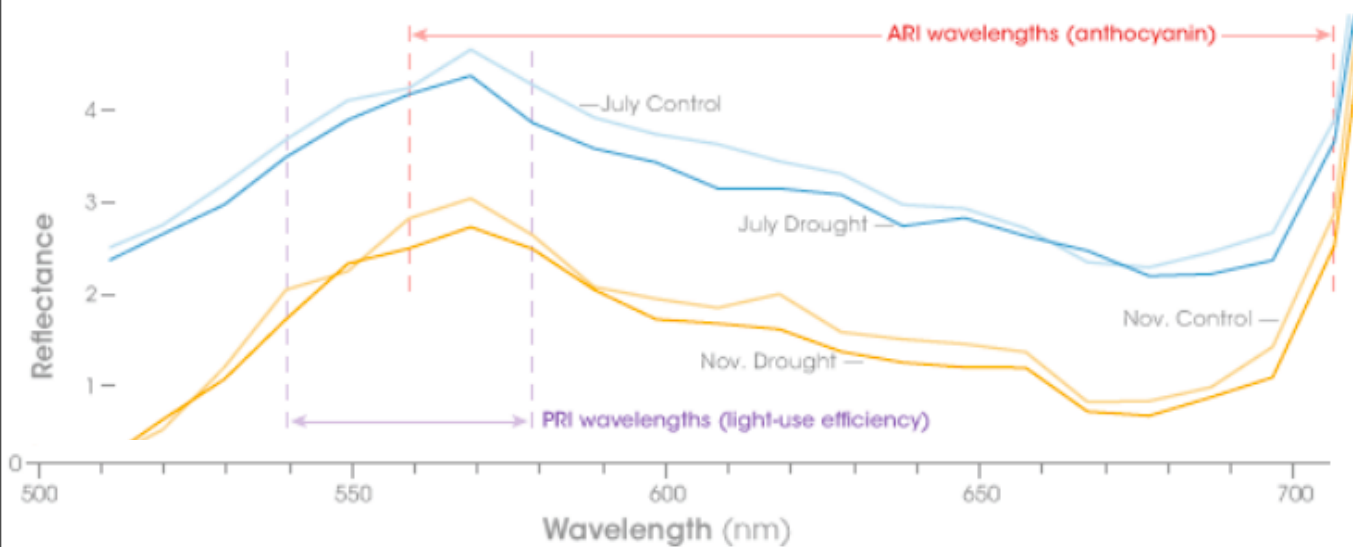
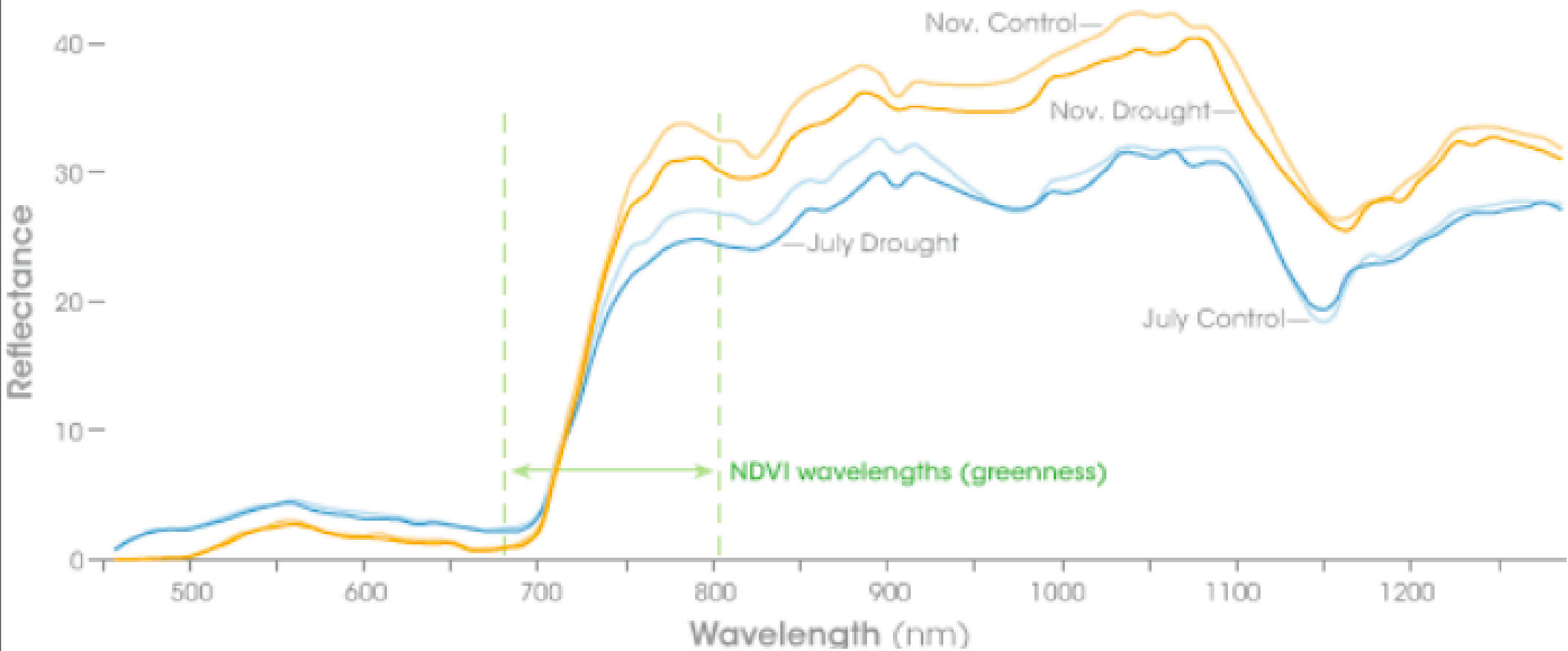


- Forest
- Bare soil
- Pasture
- Alluvial forest
- Water
- Cloud
- Forest dominated by babacu
- Burned forest
- Roads



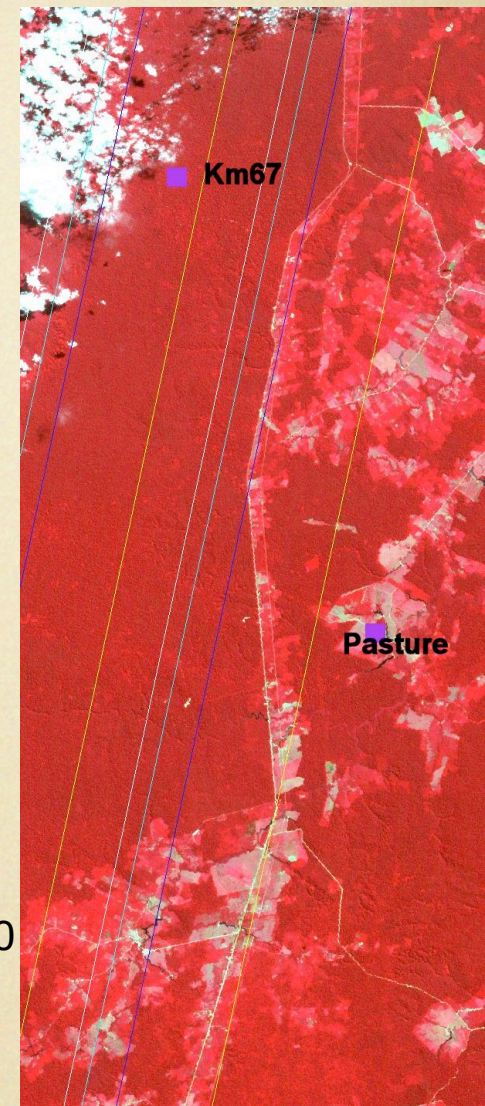
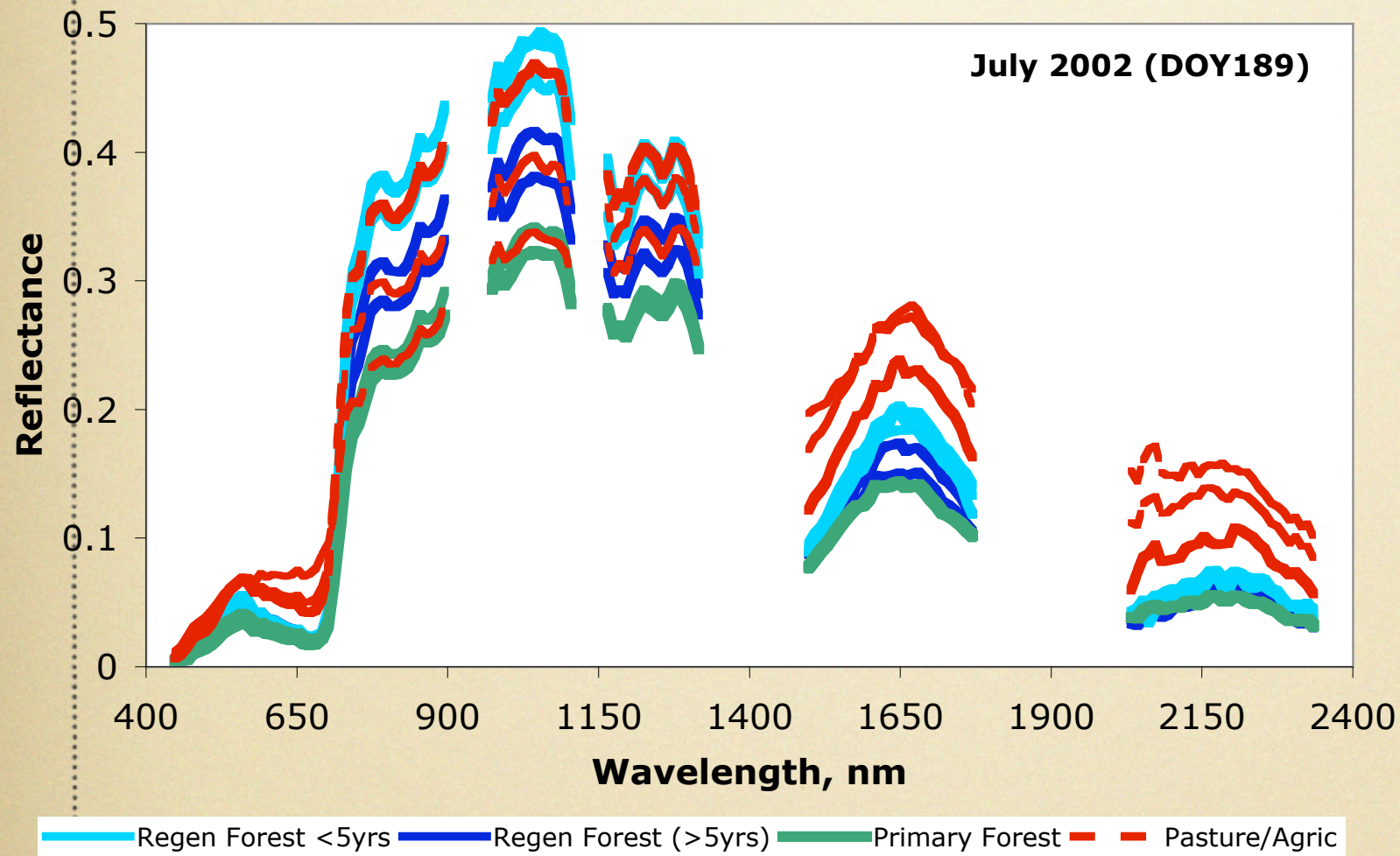
PRODES





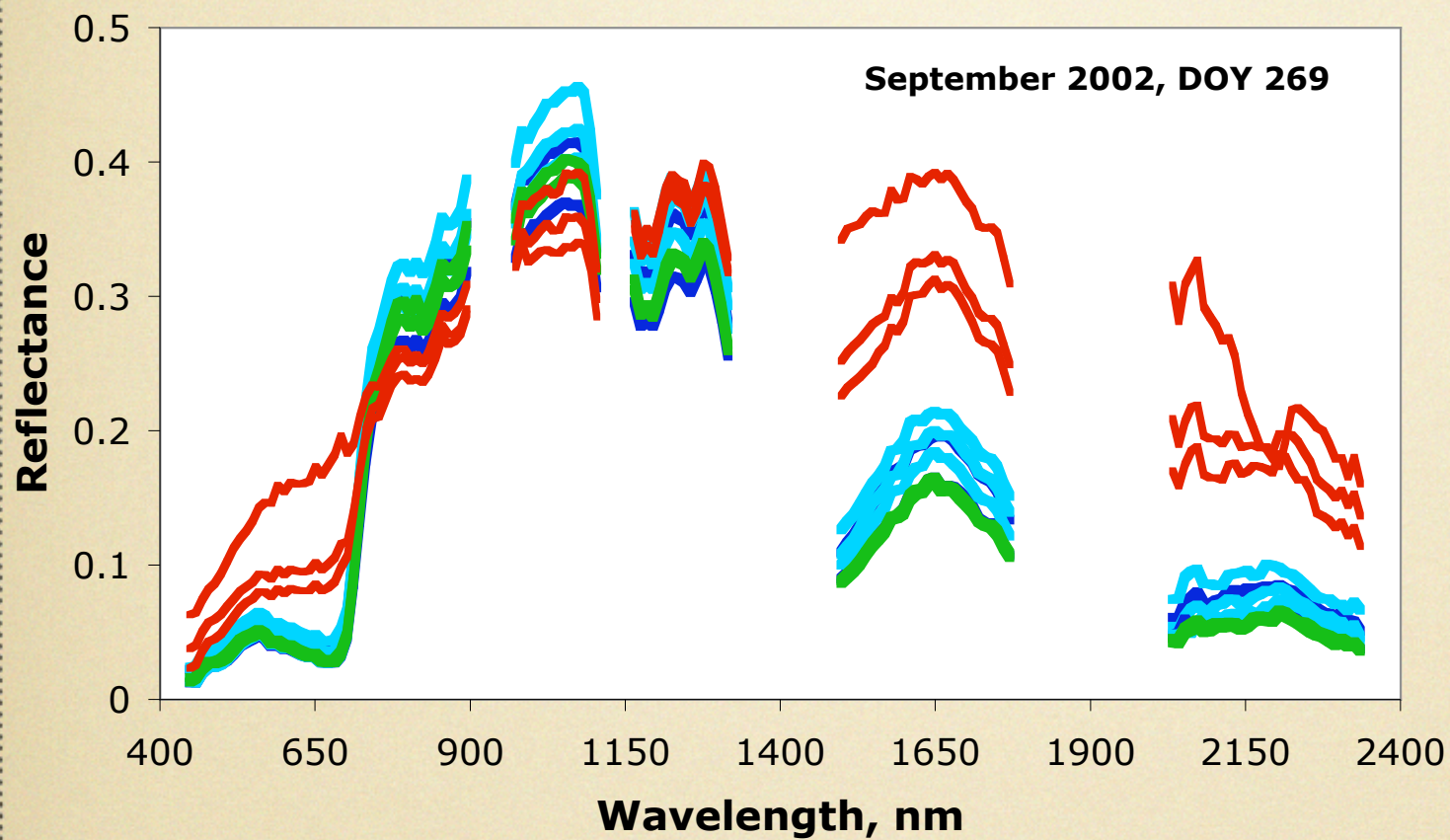
Hyperion data,  
Asner



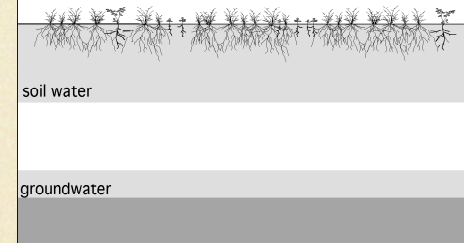


July 2002





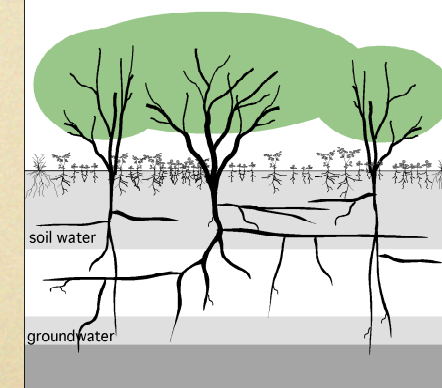
Phase I



Phase II

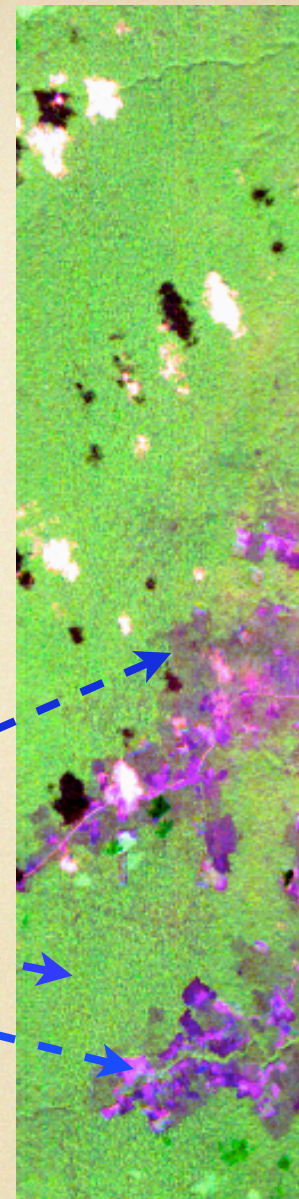
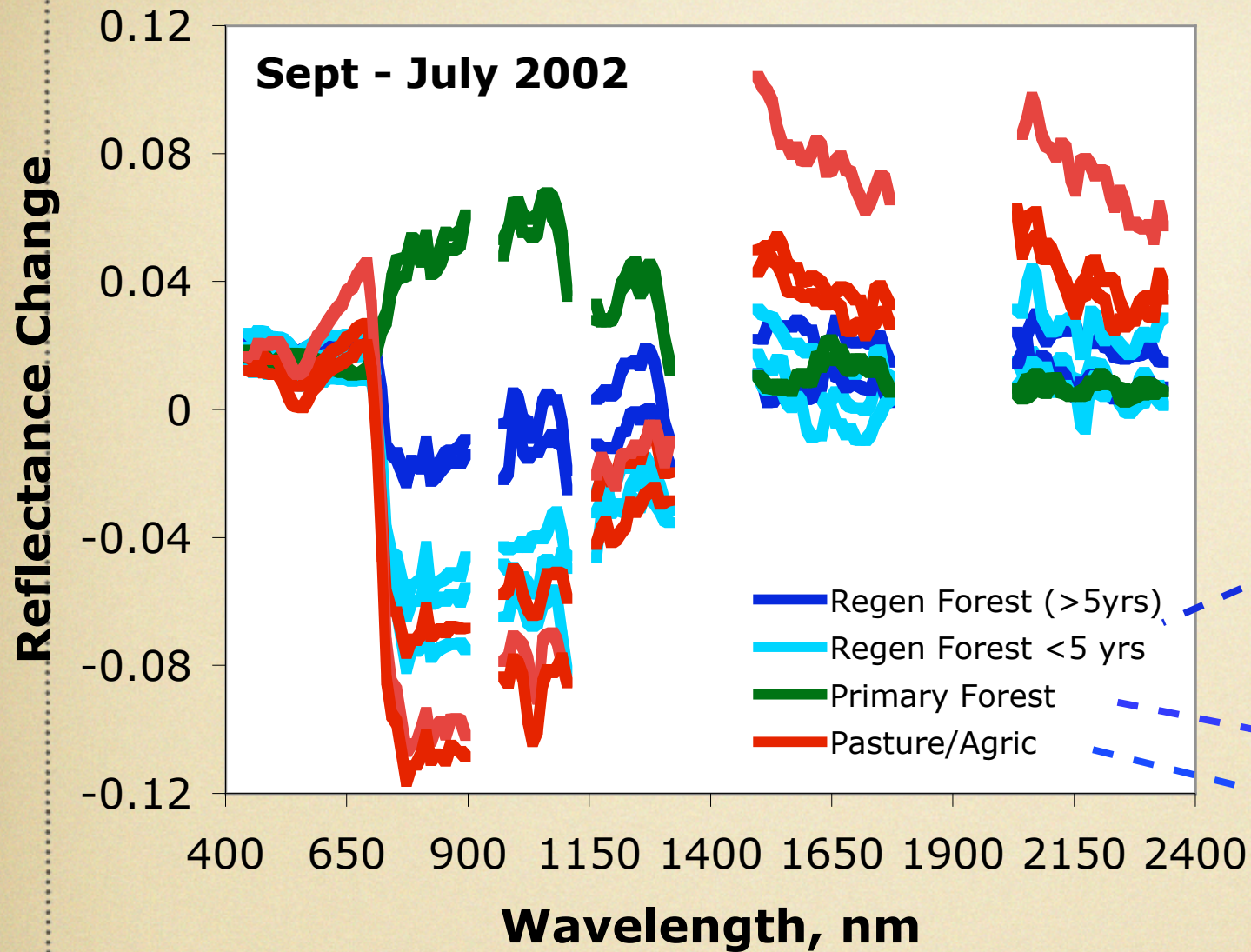


Phase III





# Reflectance Difference

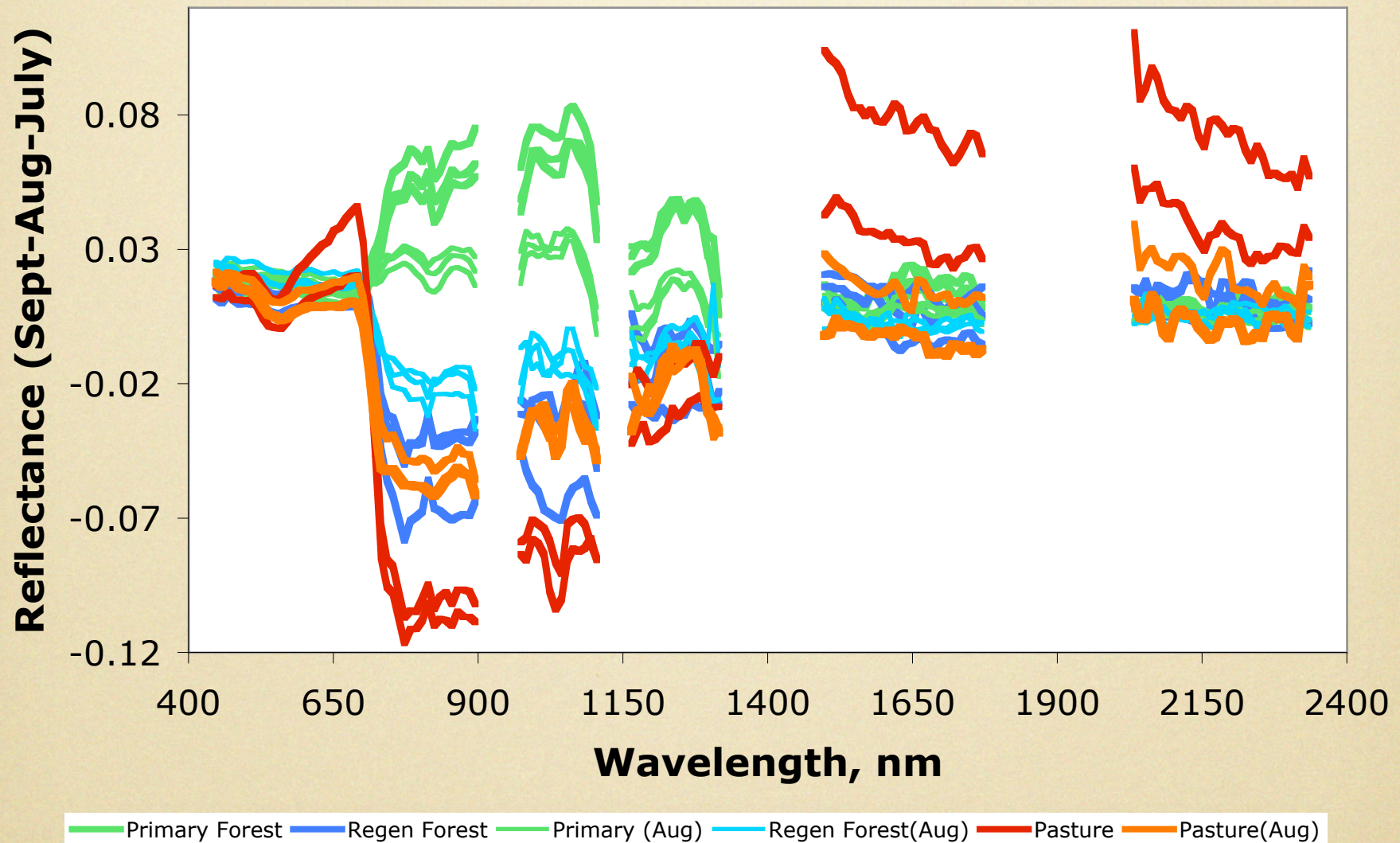


Red (640nm), NIR (854nm), SWIR (2133 nm) composite 'reflectance change' image with green denoting positive NIR change; pink and brown colors are negative NIR and positive red & SWIR changes.

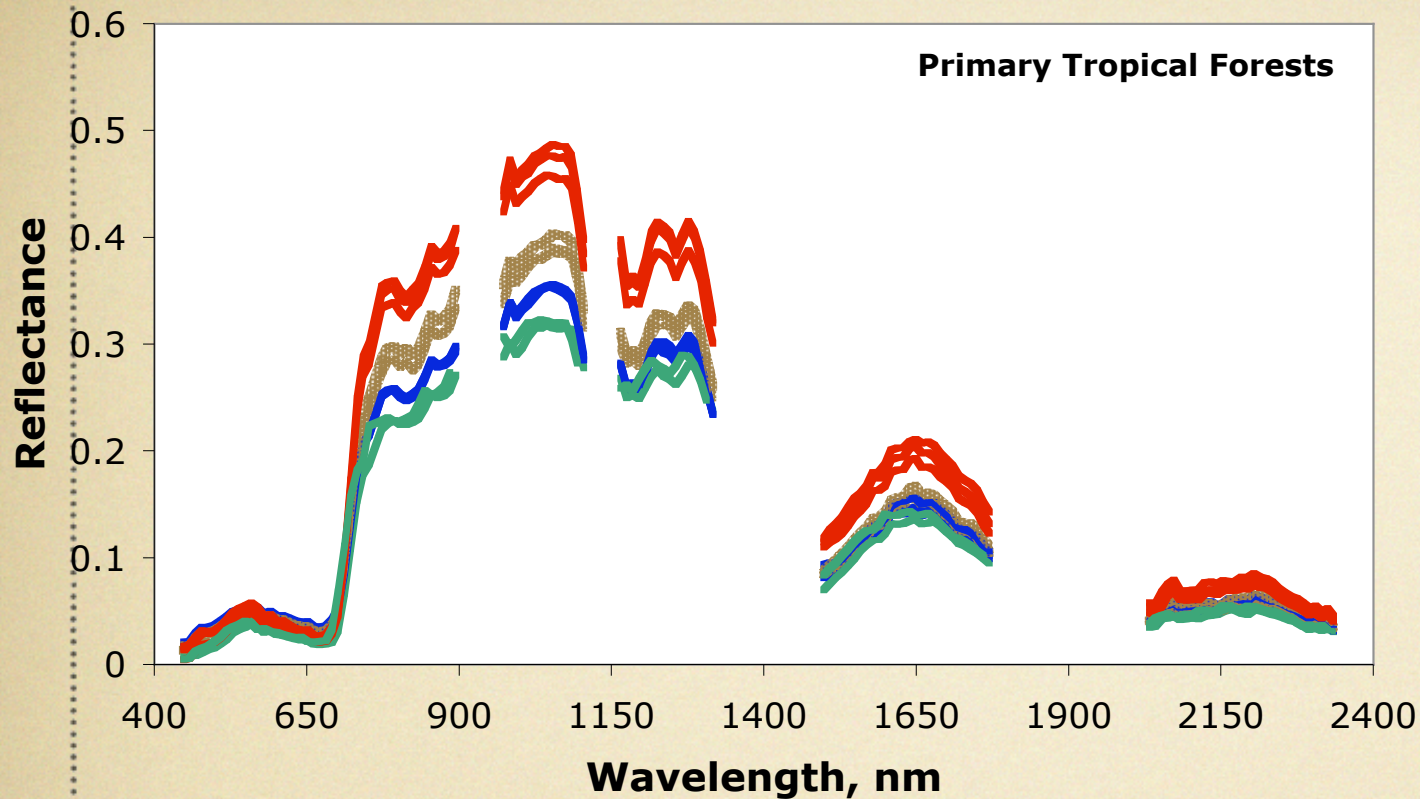


# Reflectance Differences (Jul-Aug-Sep)

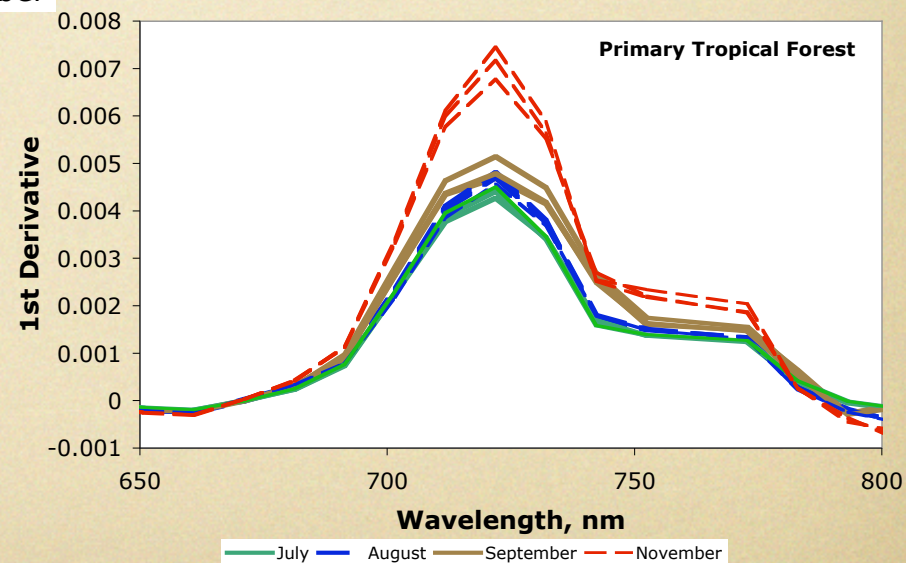
Primary/Regenerating Forests/Pasture



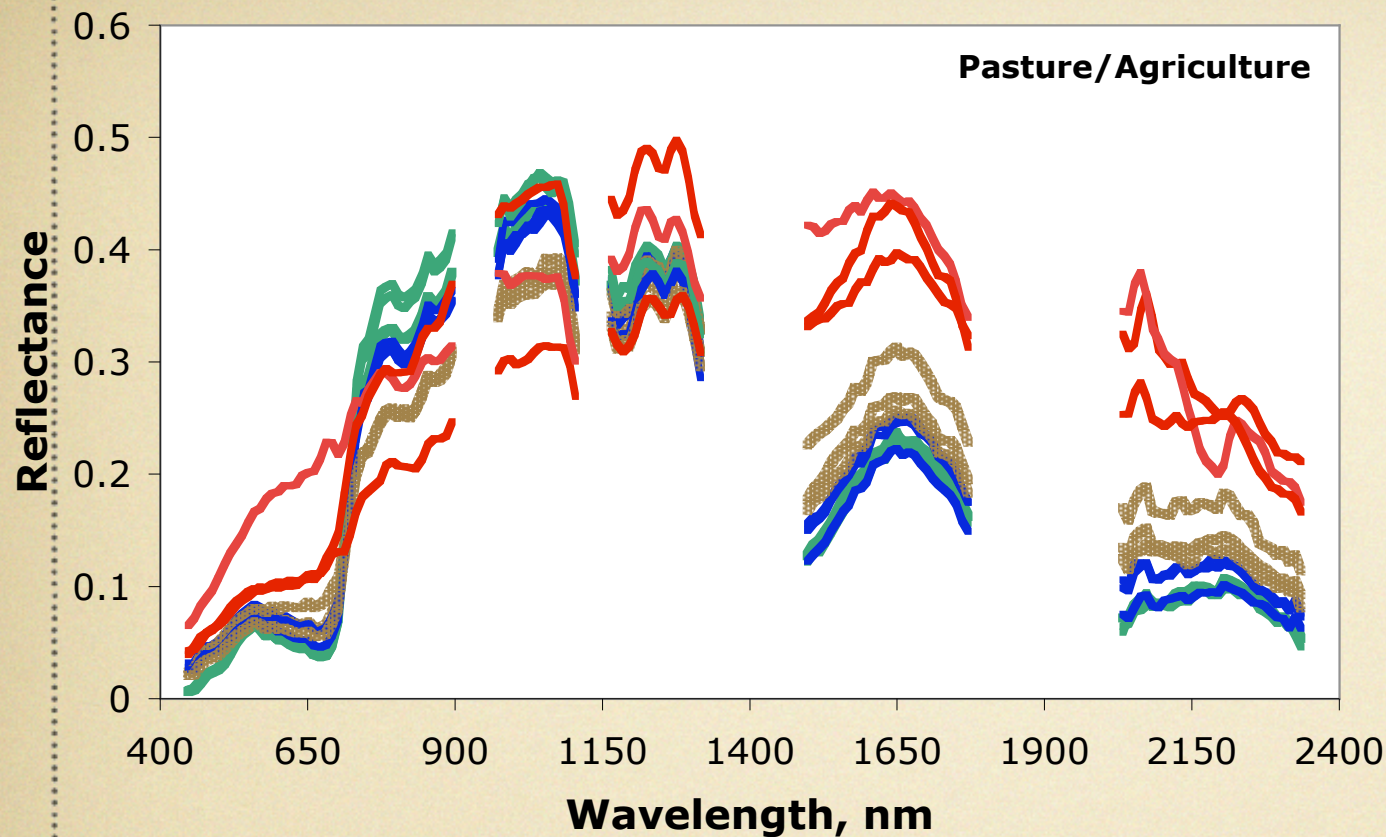




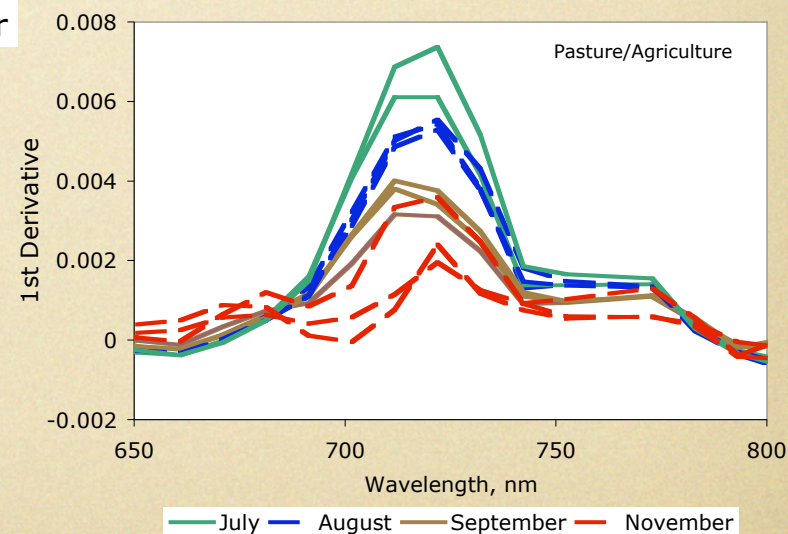
Hyperion-measured  
seasonal sequence  
of primary forests



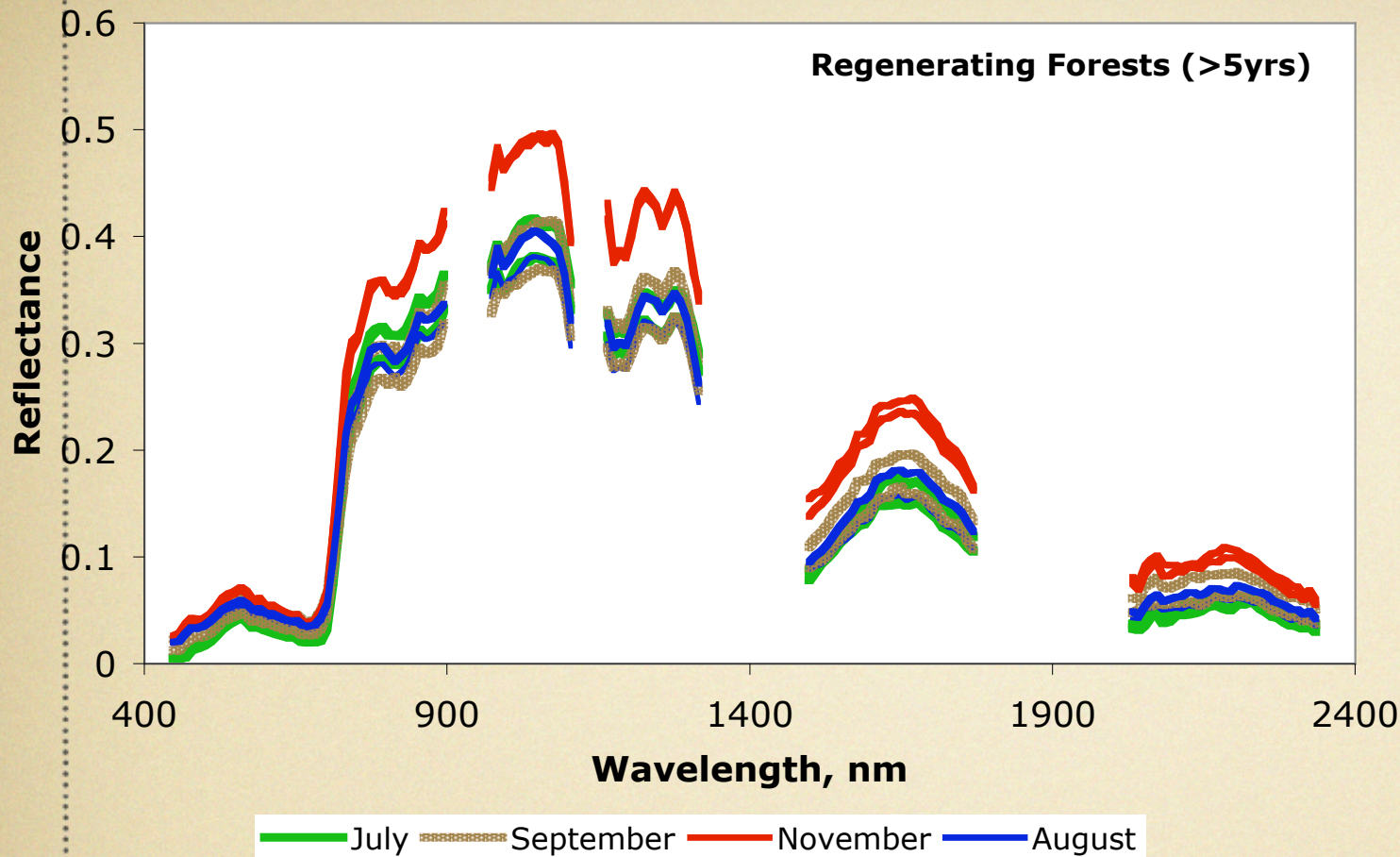




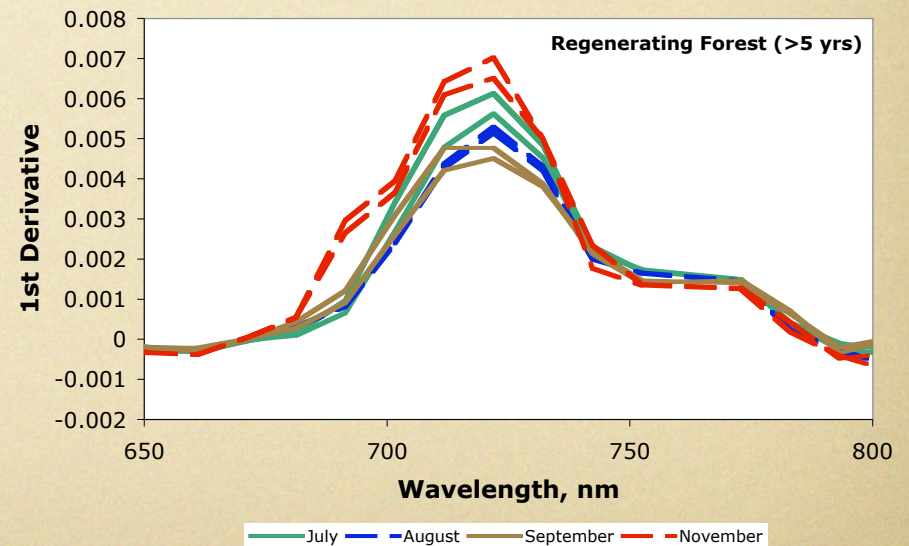
Hyperion-measured  
seasonal sequence  
of pasture/  
agriculture



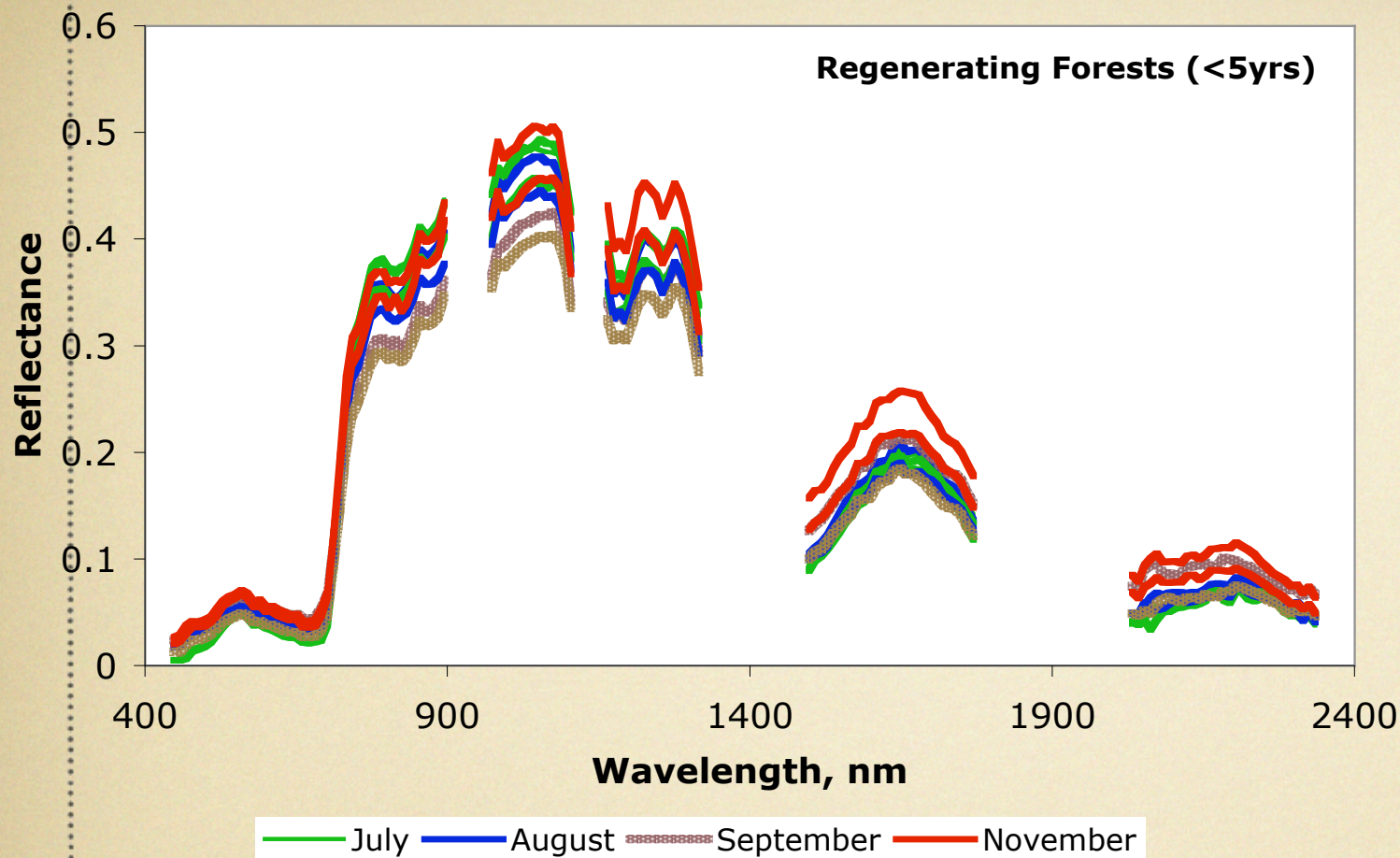




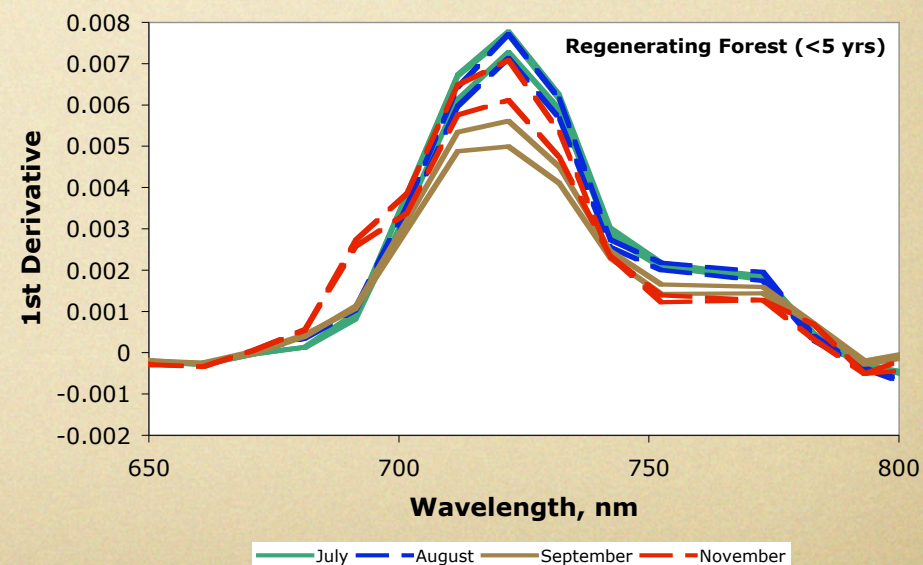
Hyperion-measured  
seasonal sequence  
of regenerating  
forests (>5 yrs)





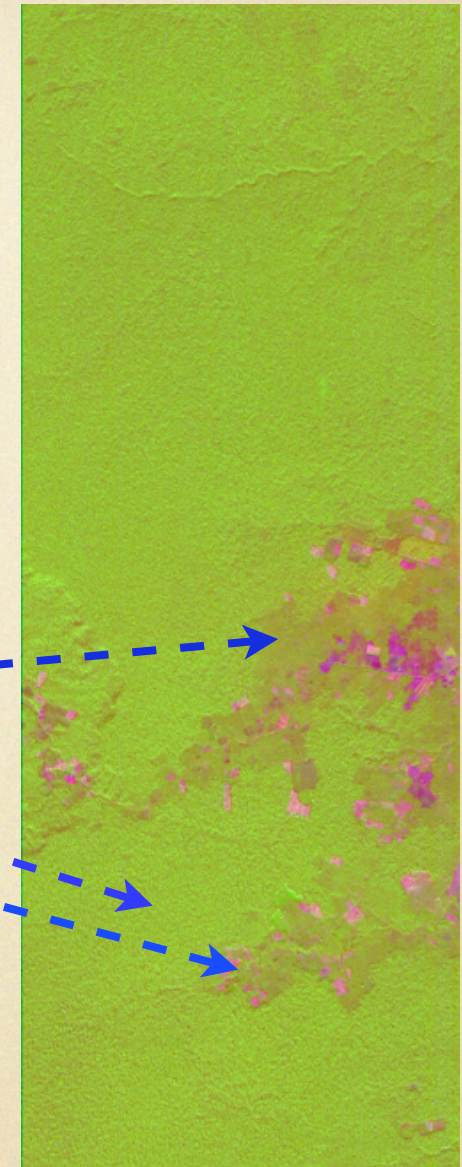
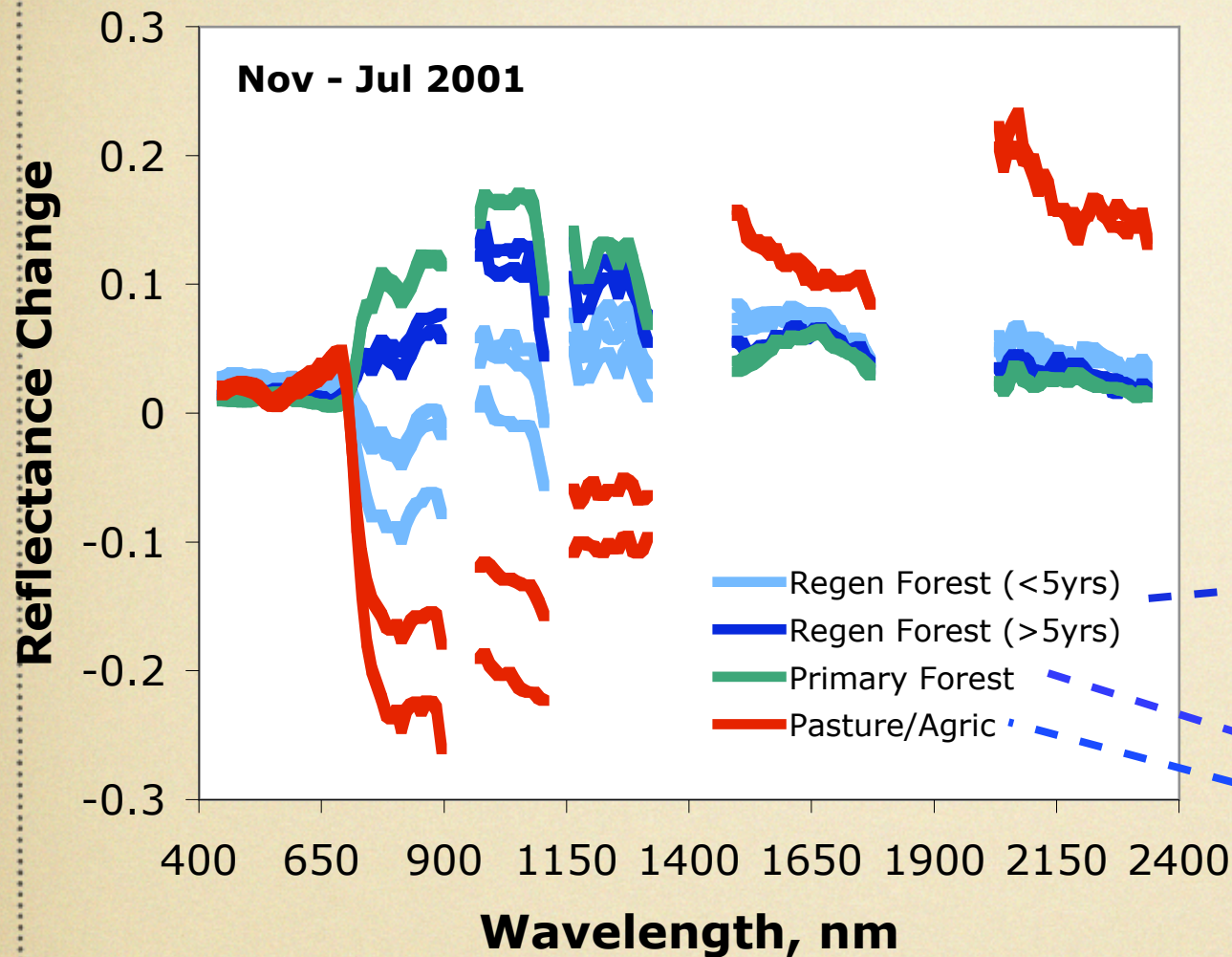


Hyperion-measured  
seasonal sequence  
of regenerating  
forests (<5 yrs)





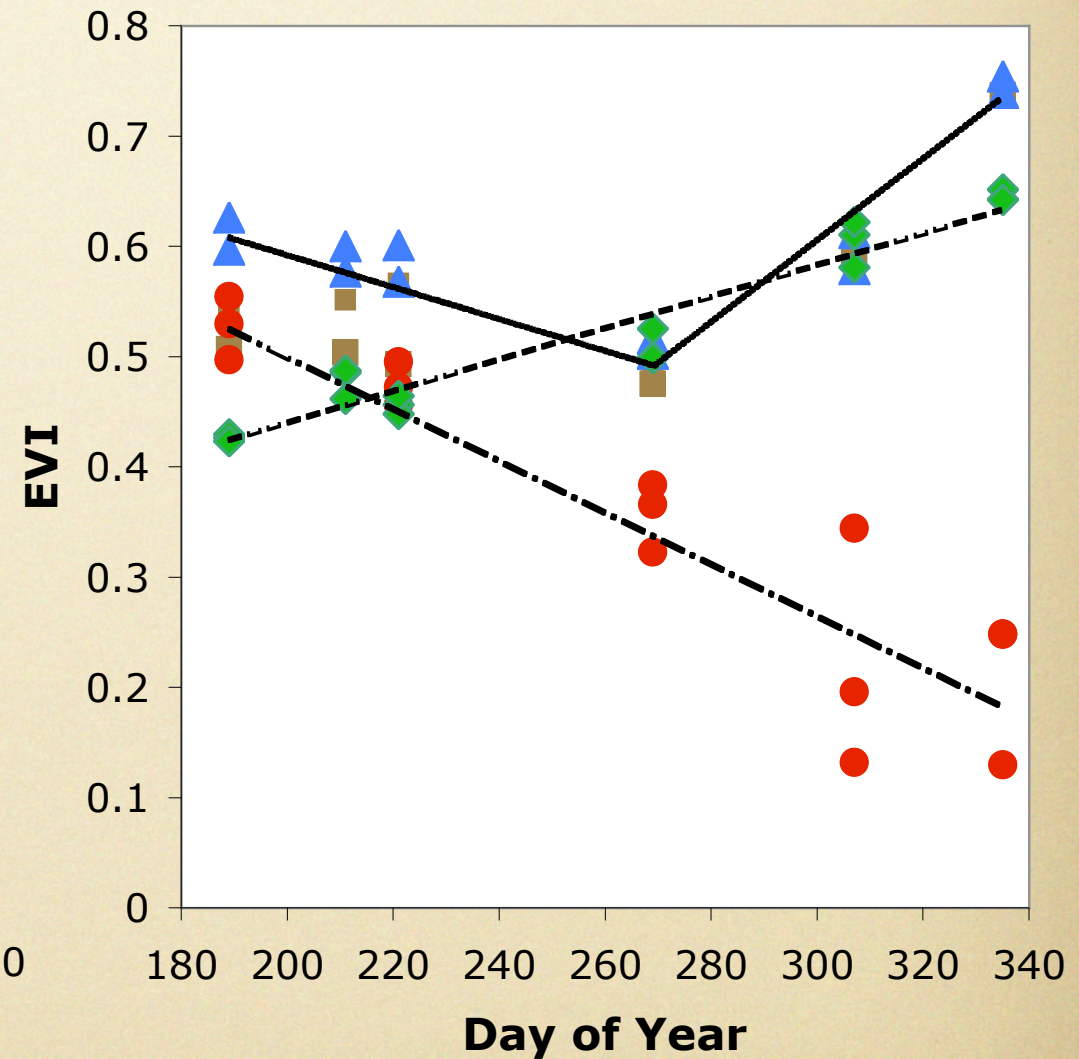
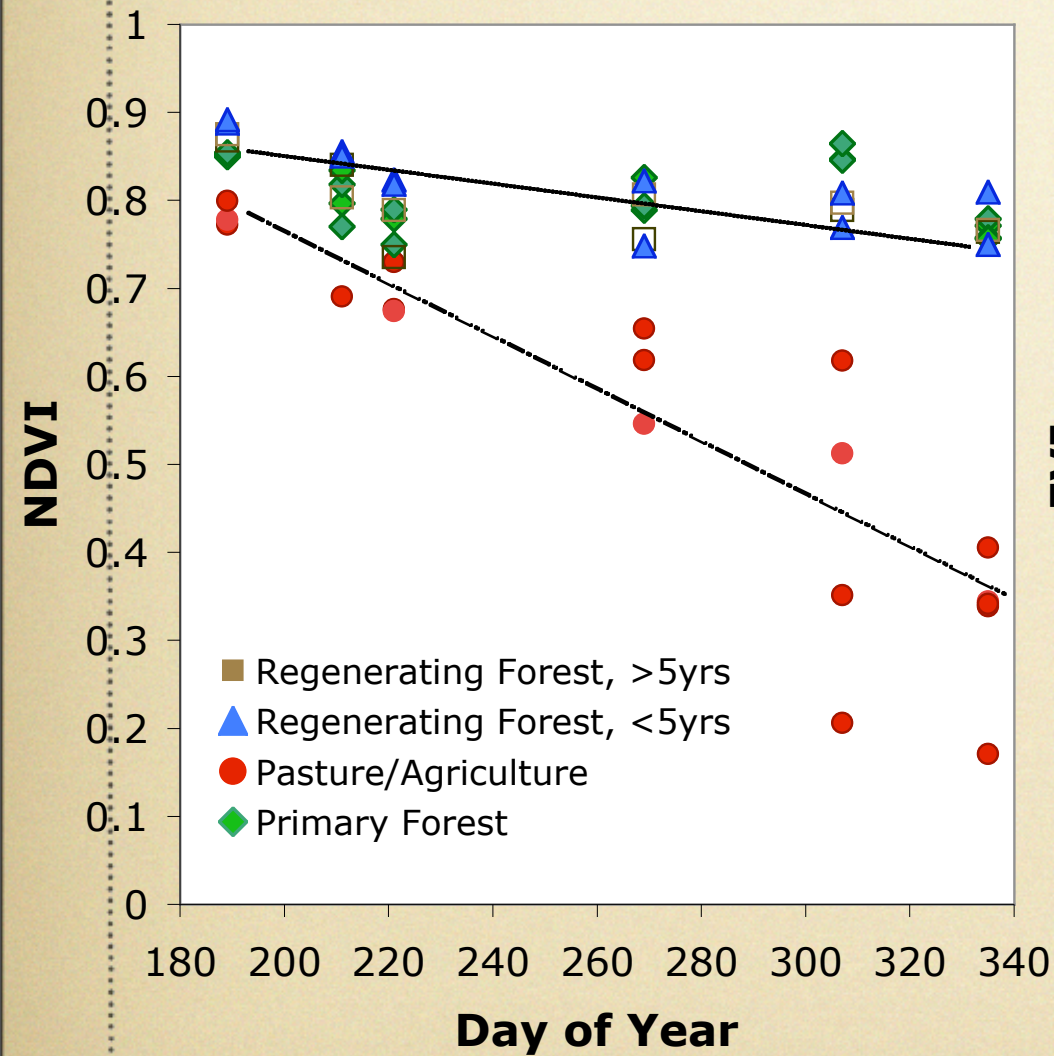
# 2001 Reflectance Difference



Red (640nm), NIR (854nm), SWIR (2133 nm) composite 'reflectance change' image with green denoting positive NIR change; pink and brown colors are negative NIR and positive red & SWIR changes.

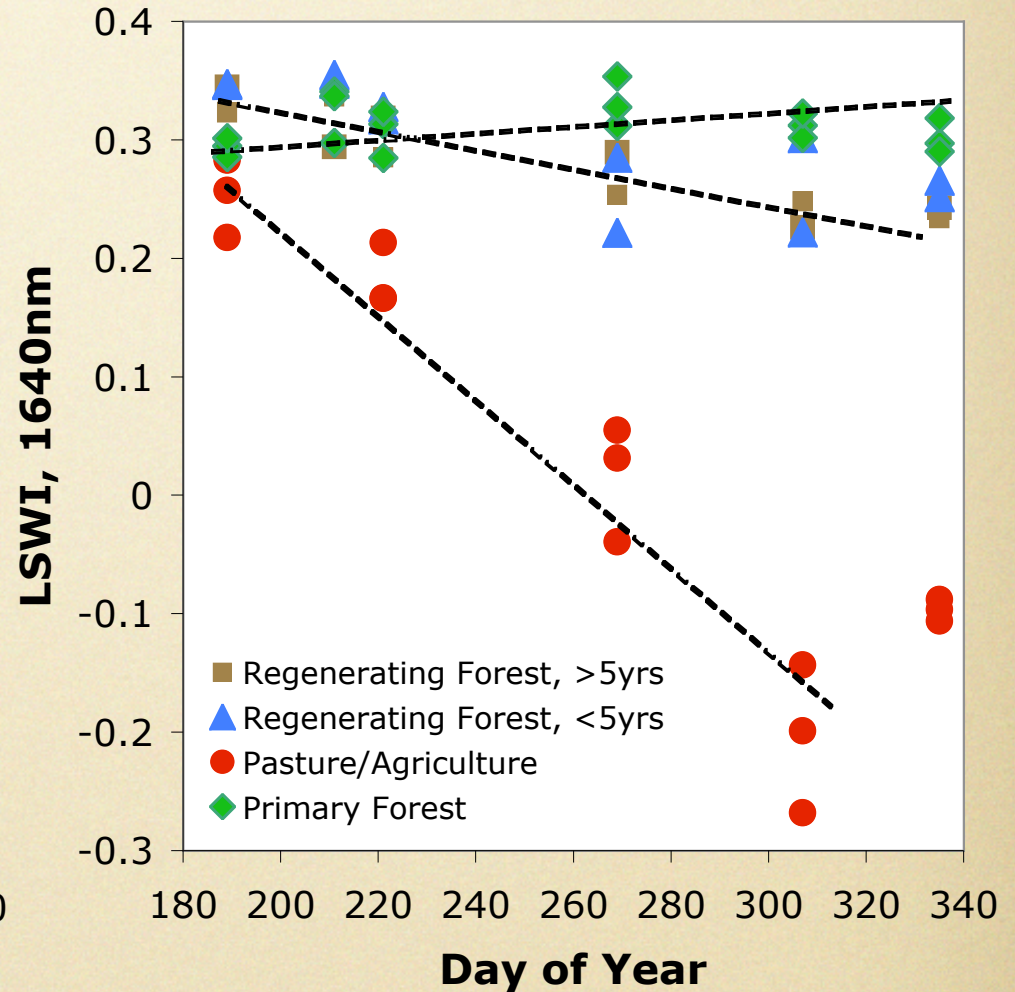
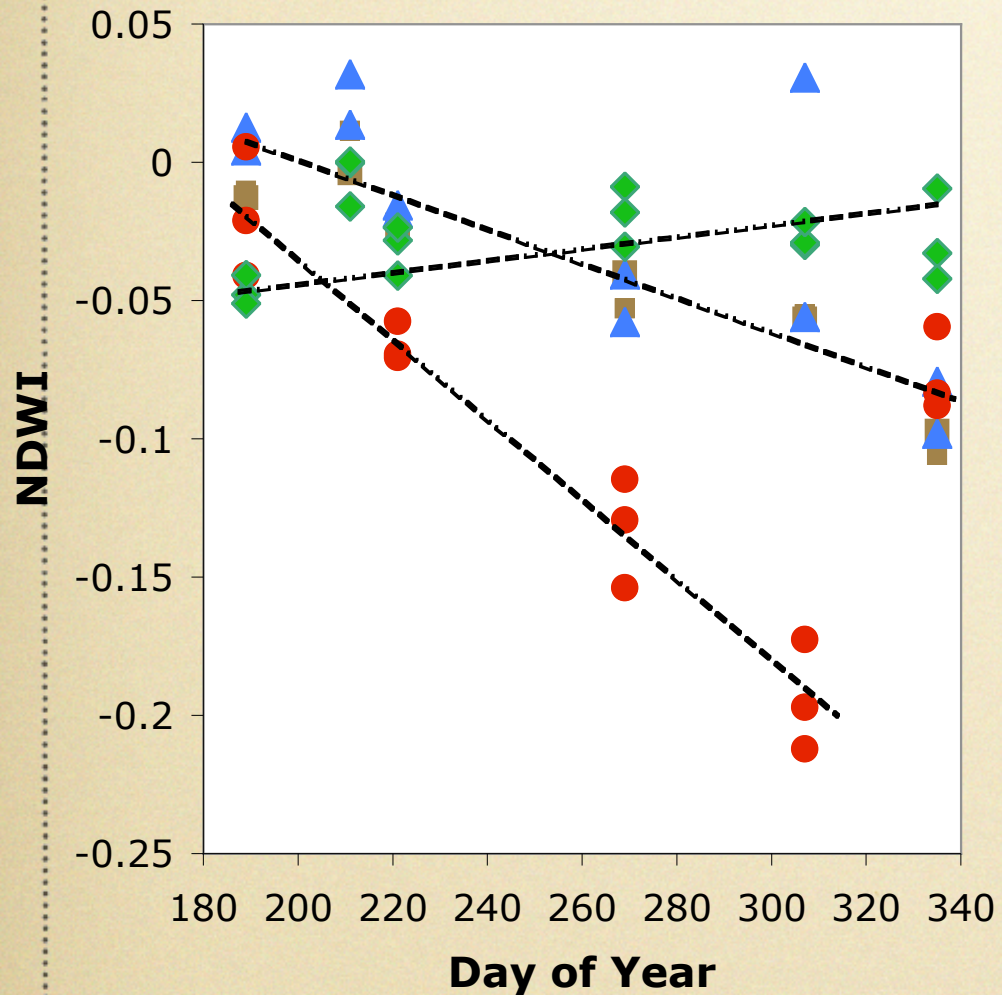


# Dry season phenology profiles depicted by NDVI and EVI



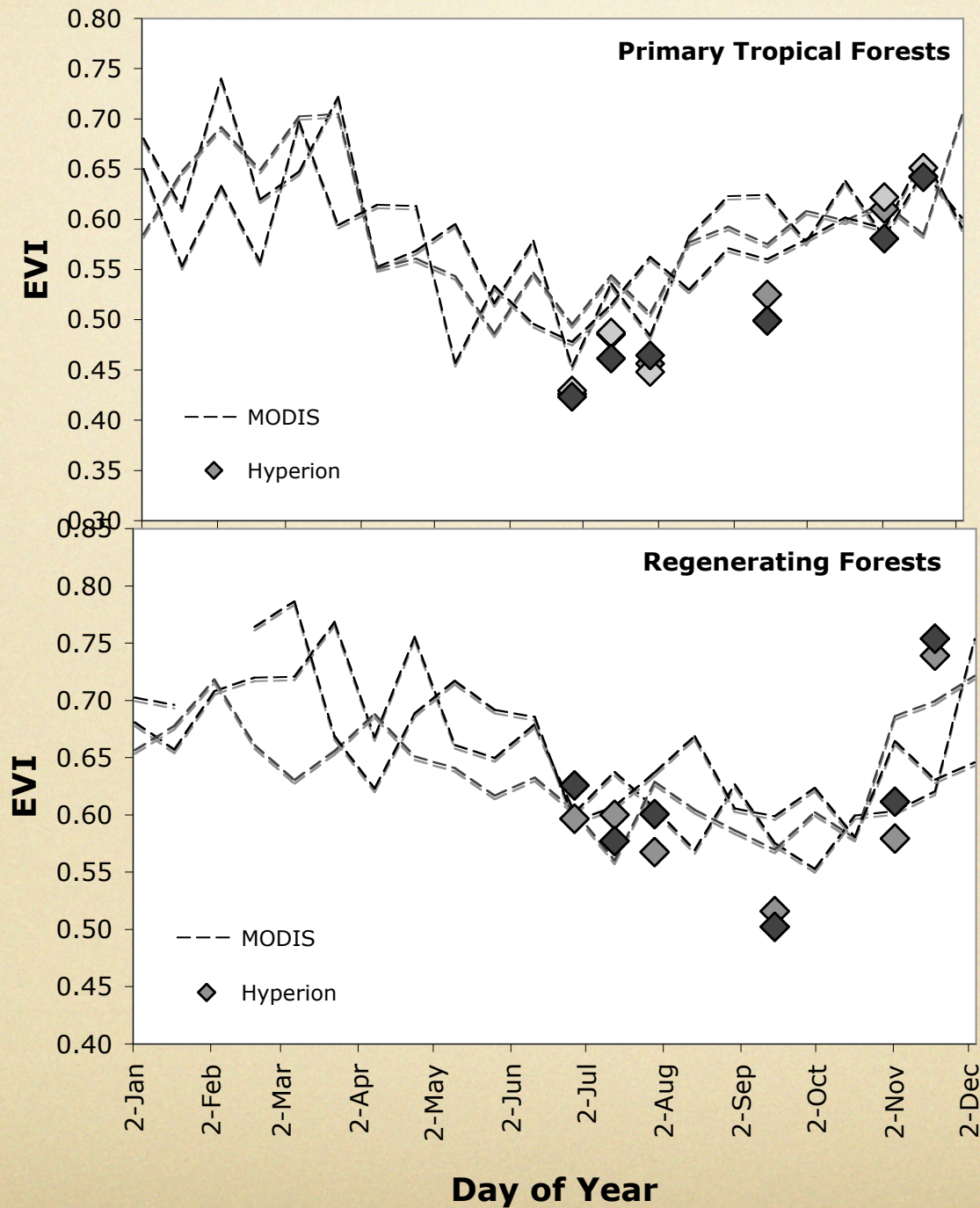


# Dry season phenology profiles depicted by NDWI and LSWI



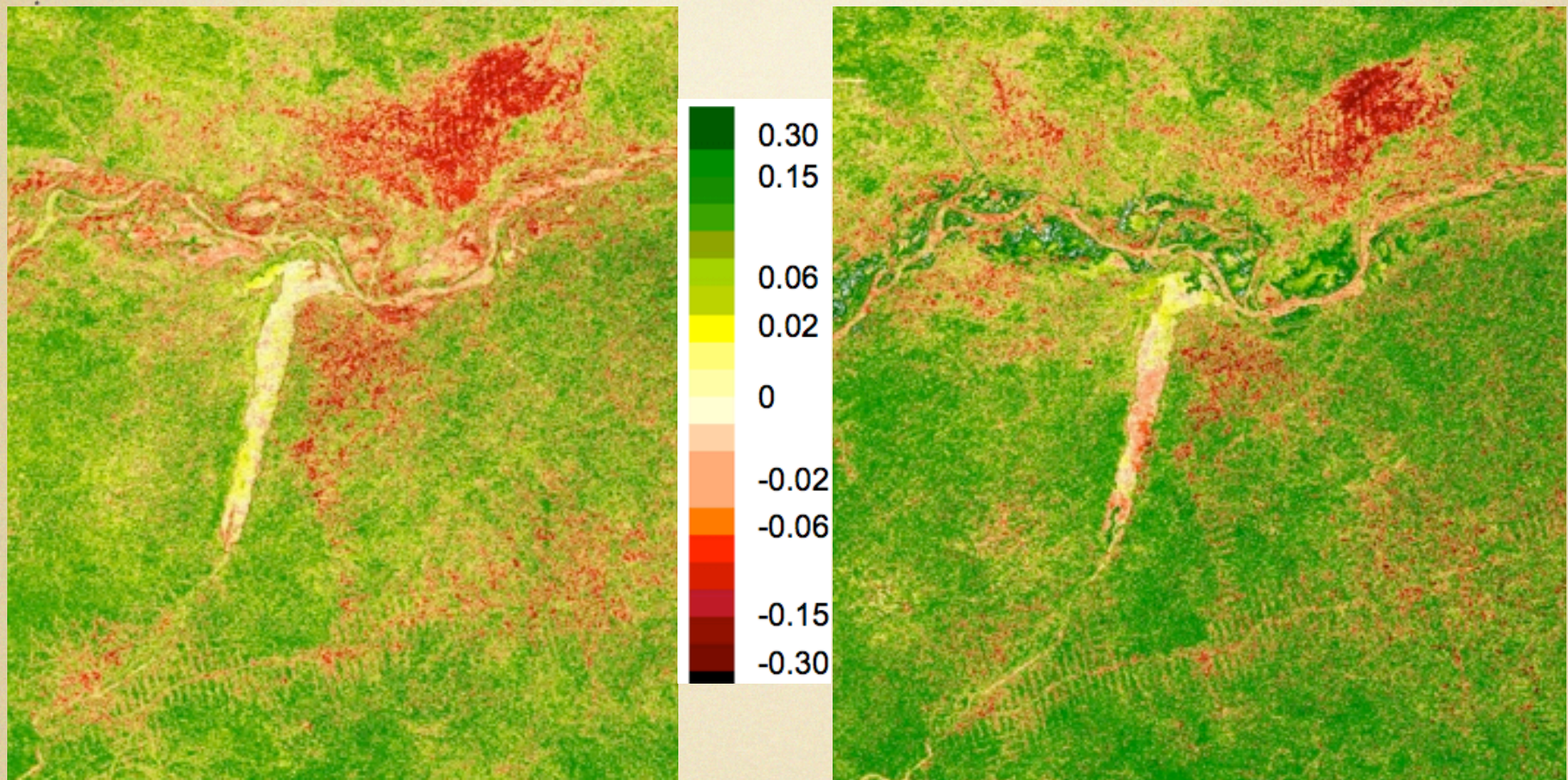


# Hyperion dry season phenology profiles plotted with annual MODIS 250m EVI observations





# MODIS 250m EVI difference image



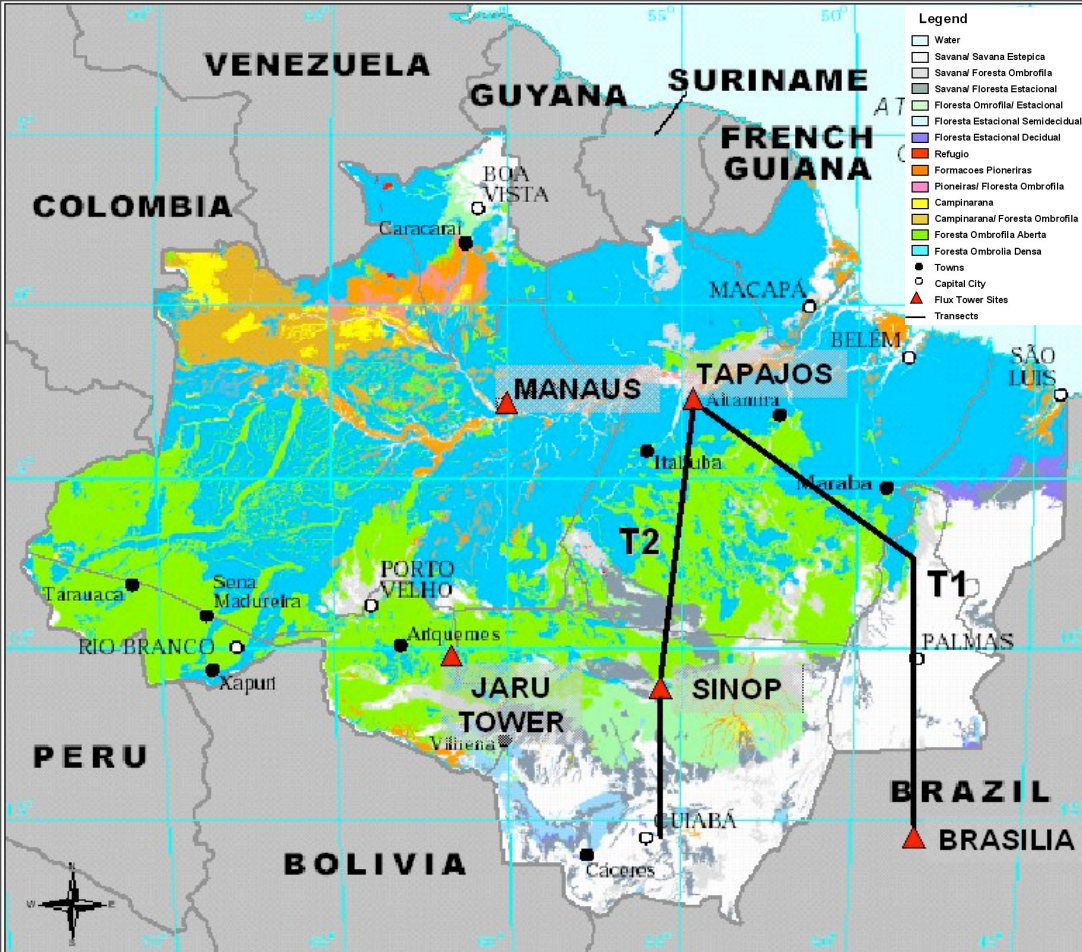
Sept - Jul

Nov - Jul

Red colors indicate negative EVI trends and green colors depict positive EVI trends in the dry season.



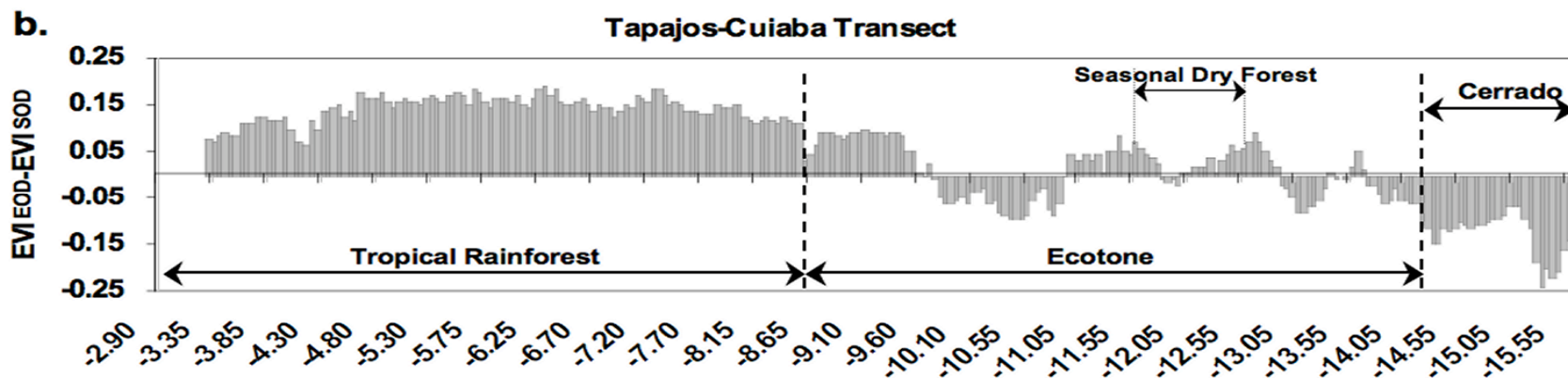
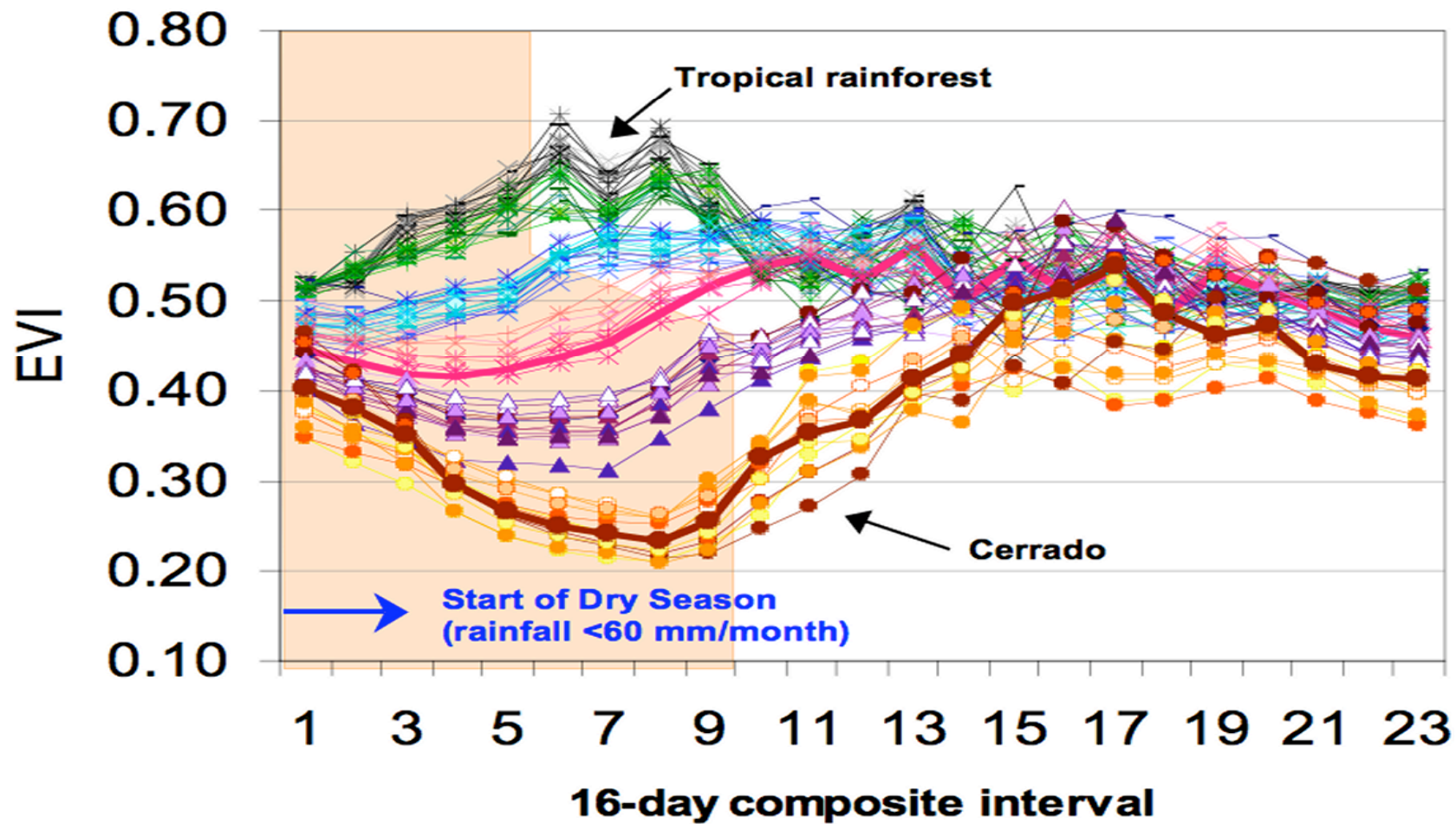
# Ecotone Rainforests (Transitional)



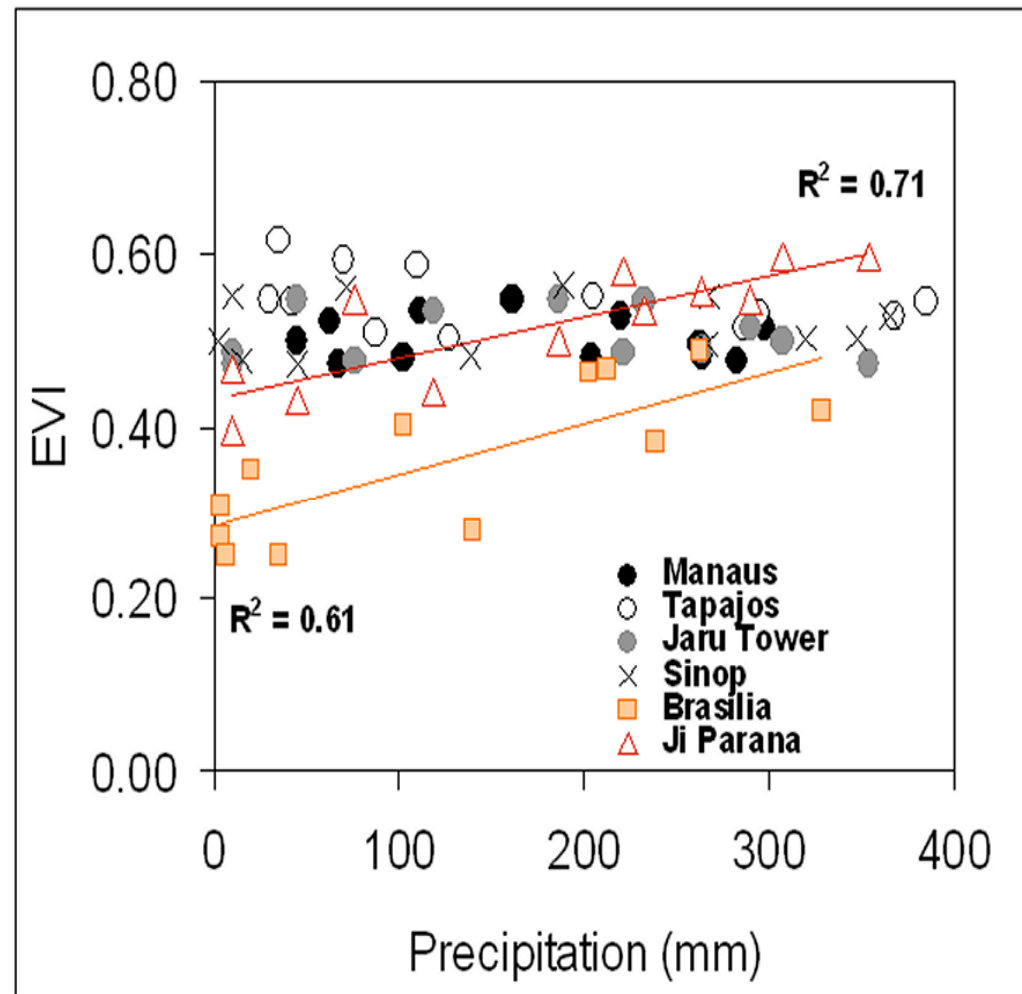
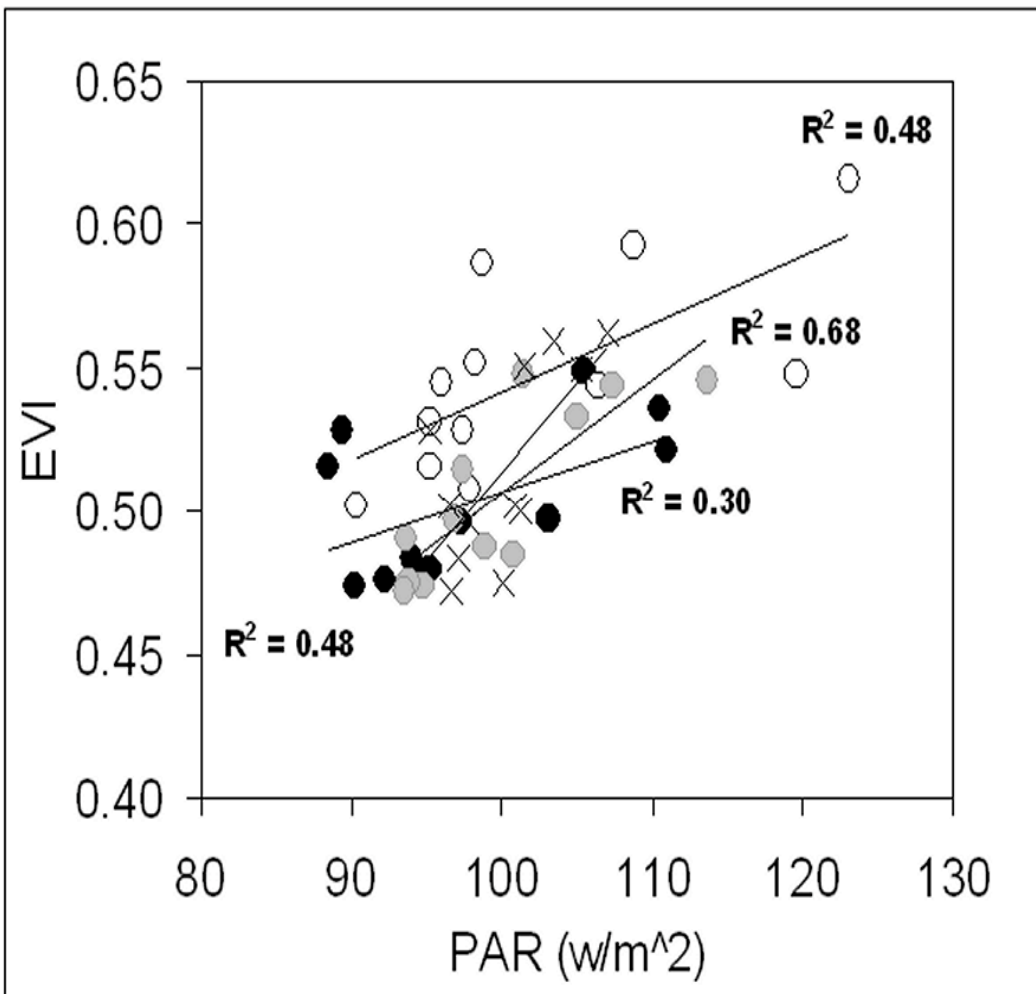
- Both light and moisture controls on ecosystem metabolism and productivity



# Tapajos - Cuiaba Transect

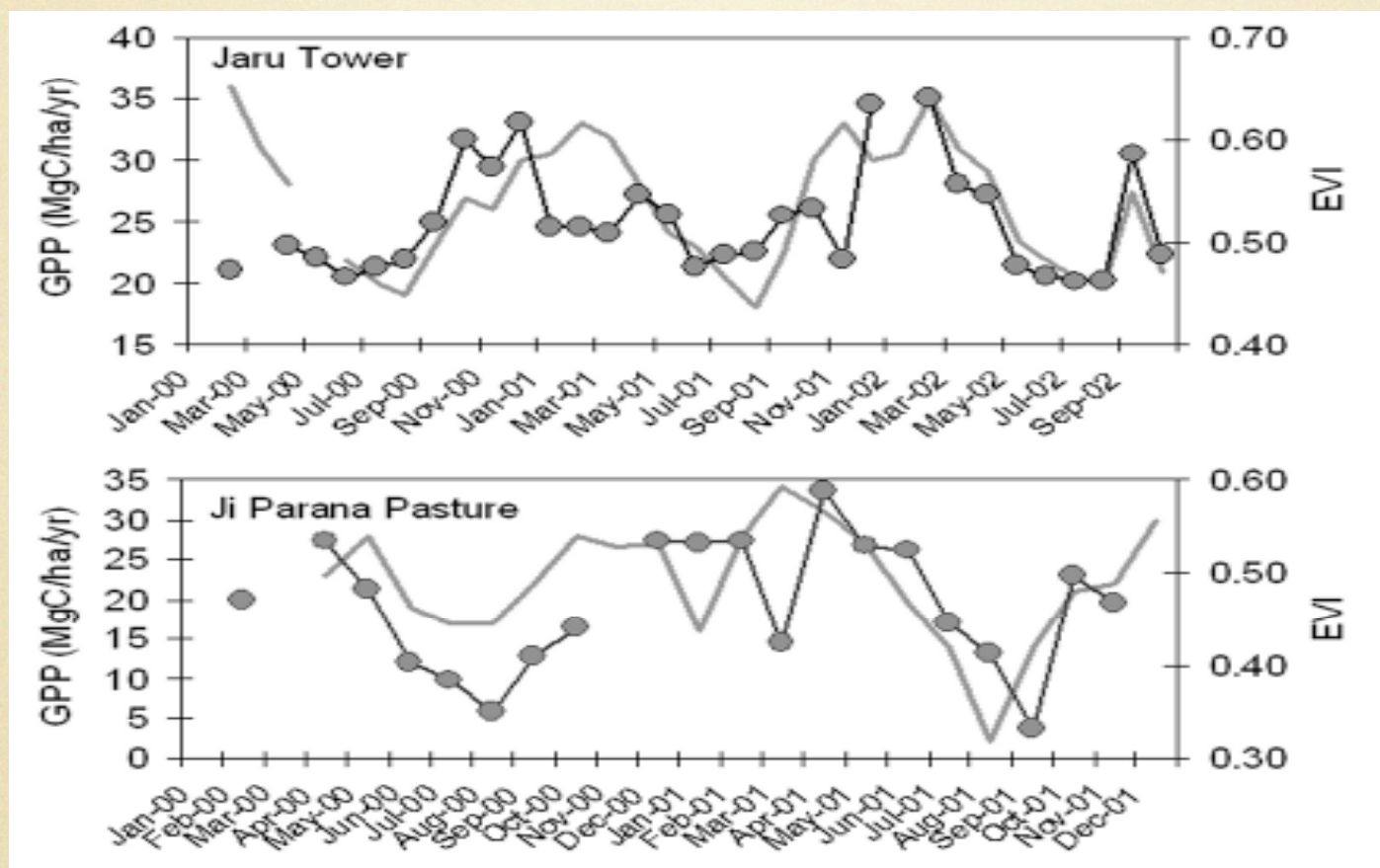








# Consistency with Flux Tower Data





# Conclusions

- Satellite phenological observations and tower flux measurements represent important site-specific and community-level responses to environmental variation and change.
- The Hyperion data provided information of land cover characteristics that helped explain the coarser temporal patterns observed with MODIS.
- We found gradients of moisture and light controls across the ecotone as well as distinct phenology shifts associated with disturbance and land use history.
- Flux tower measurements were consistent with the satellite data providing opportunities for aggregation and scaling of the in-situ with satellite measurements.



# Conclusions

- At regional scales, a complex mosaic of vegetation function and phenology was found as a result of forest structural variations; soil properties, land use activities, conversion and human interactions; variations in climate; and associated ecological conditions.
- Both climatic and human drivers may alter the balance of moisture and sunlight controls on tropical forest phenology and productivity.

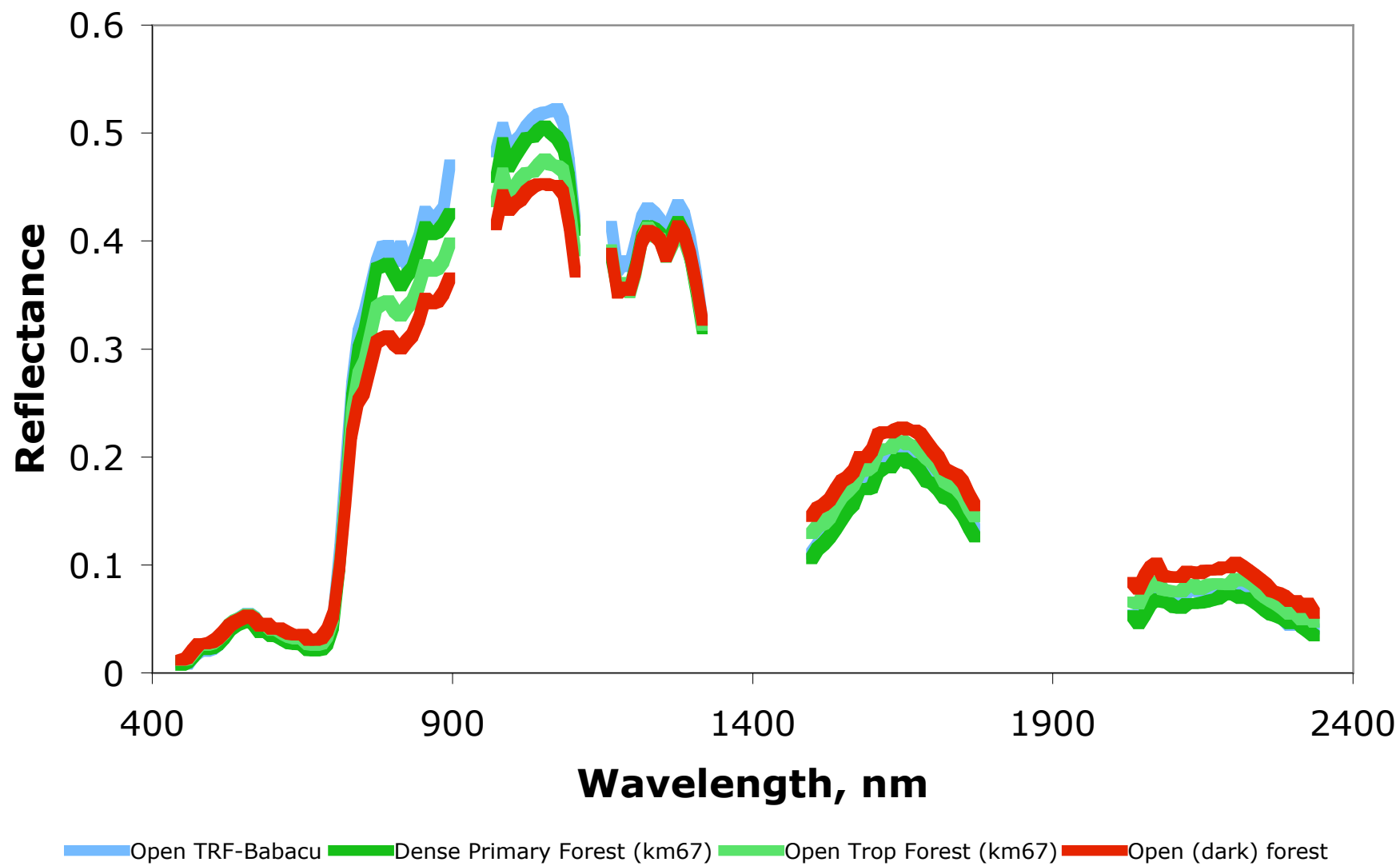




Thank You

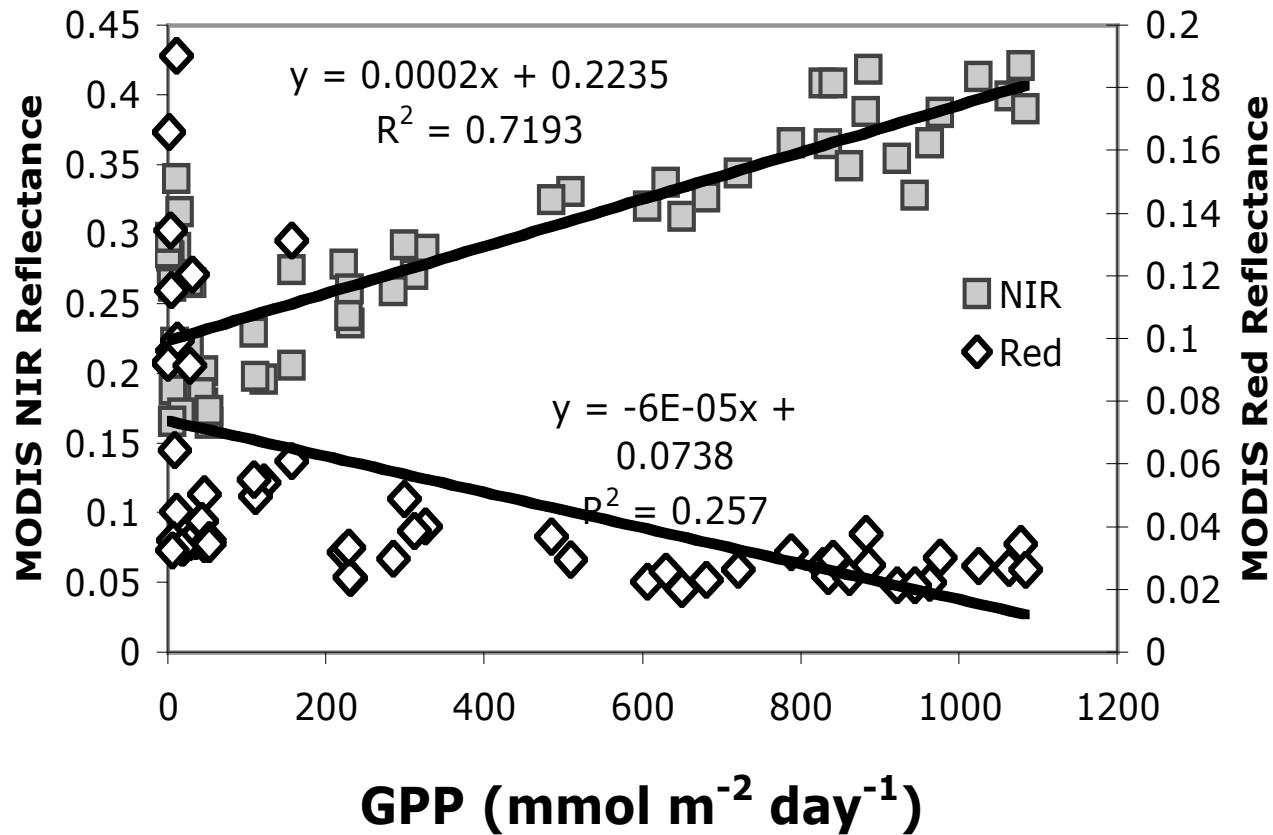


### DOY 307 Yosio sites





## Harvard Forest



- i. the near-infrared reflectance would be a near-linear indicator of APAR and a near-linear indicator of  $P_e$  and  $1/r_e$  under stress-free conditions,

*Sellers 1987,1992*



# Conclusions

- Our results indicate the Amazon behaves distinctly different from several common models and intuition about it suggests,
- We found extensive basin-wide flushes of new leaf growth in the sunny dry season, suggesting that sunlight may exert more influence than rainfall on rainforest phenology and productivity,
- This pattern is opposite that encountered for pastures and disturbed forests which are greener during the wet season and become moisture stressed in the dry season due to their shallower rooting depths.



- The transitional/ drier, southern Amazon forests had weaker or no 'greening' signal in the dry season and may directly have lower photosynthetic capacity due to reduced water availability,
- Both climatic and human drivers, as well as ecological conditions (soils, topography, nutrients) may alter the balance of moisture, sunlight, and biologic controls on rainforest phenology and productivity,
- Enhanced dry season greening disappeared in disturbed & drier areas which may also be the case for Amazon rainforests during drier El Niño events