



**Remote Sensing of  
Regenerating Vegetation**

LBA-ECO

October, 2006

# Plan for today's meeting

1. Brief look at what's been done
2. Resolve definitional issues
3. Identify gaps in research (geographical coverage, approaches, questions that remain unanswered)
4. Construct a plan of future work

# Synthesis Products

- a) Comprehensive review paper
  - Modeled on D. Lu's RS of Biomass paper
- b) Methodologically consistent multi-site estimates of extent and persistence of regenerating vegetation
  - Modeled on D. Zarin et al. biomass accumulation paper

# Regenerating vegetation

- geographical extent
- rate of change
  - rate of agriculture abandonment
  - persistence

There are several studies that provide these types of estimates, BUT can we do it in a across sites in a methodologically consistent way?

# Remote sensing of regenerating vegetation: Sample of studies

- Mausel et al. 1993
- Li et al 1994
- Moran et al. 1994
- Skole et al. 1994
- Foody and Curran, 1994
- Sant'Anna et al. 1995
- Alves and Skole, 1996
- Steininger, 1996
- Bohlman et al. 1998
- Kimes et al. 1999a
- Kimes et al. 1999b
- Steininger, 2000
- Nelson et al. 2000
- Salas PhD chapter 2000
- Lucas et al. 2000
- Lucas et al. 2002a
- Lucas et al. 2002b
- Roberts et al. 2002
- Alves et al. 2003
- Vieira et al. 2003
- Batistella et al. 2003
- Foody et al. 2003 (transferability of refl. biomass models)
- Lu et al. 2003
- Lu et al. 2004
- Perz and Skole, 2004
- Steininger 2004
- Hirsch et al. 2004
- Arroyo-Mora et al. 2005
- Freitas et al. 2005
- Ferraz et al. 2005
- Morton et al. 2006
- Broadbent et al. 2006 (selective logging recovery)
- Carreiras et al. 2006

# Sample of studies

- Provide explicit **definition** of regenerating vegetation: 52% (17 of 33)
  - Common Definition: Secondary vegetation are those areas that have been abandoned and that have become re-vegetated after all or a significant portion of the original forest has been removed.
- Three basic types of studies:
  - Single date information extraction (19)
  - Time series of land cover transitions (7)
  - Regional mapping (3)

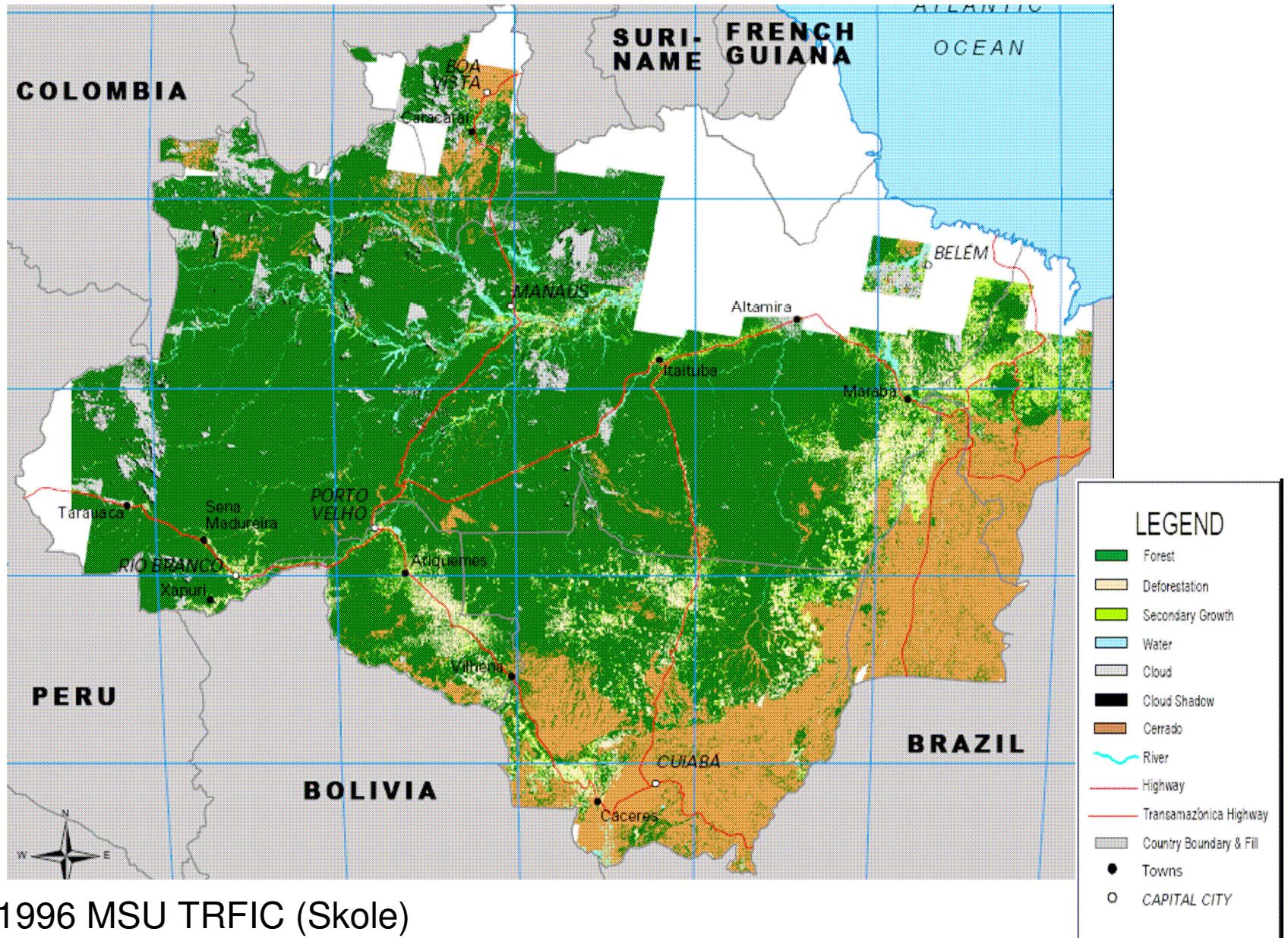
# Sample of studies: Information extracted

- **Single Date Characterization** of regenerating vegetation:
  - Continuous Structure, such as biomass (7 of 19)
  - Discrete Stage, usually three stages (9 of 19)
  - Age (4 of 19)
  - Species or Regeneration Pathway (2 of 19)
- **Time series** of images
  - Land cover transitions (6 of 7)
  - Persistence of regenerating vegetation (2 of 7)
  - Patterns (e.g. proximity to highways) (4 of 7)

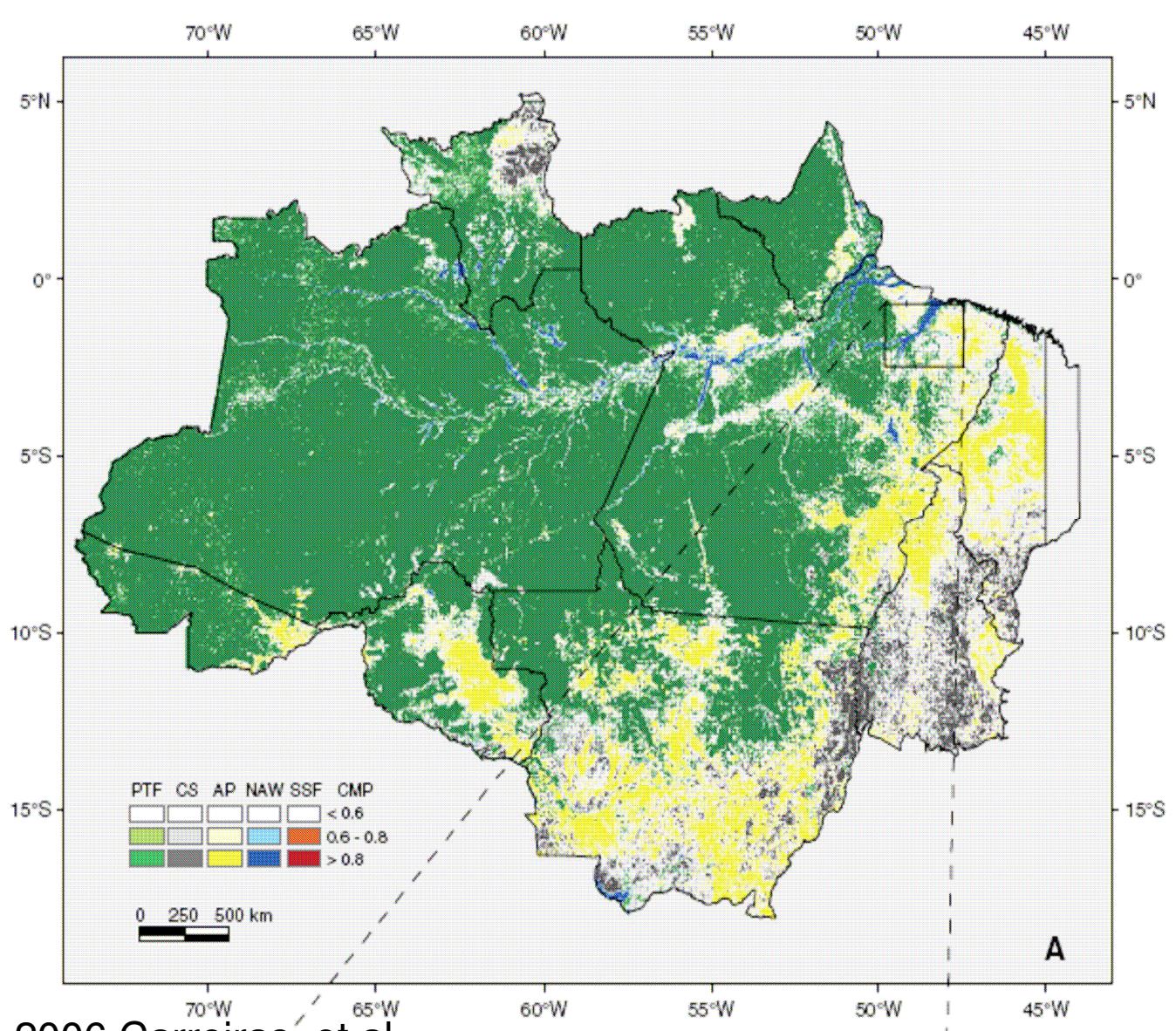
# Sample of Studies: Extent and Persistence

- Basin wide estimates (~150,000 km<sup>2</sup>?)
  - Lucas et al., (2000): 35.8% of cleared lands prior to 1992
    - Combines AVHRR analysis with INPE estimates of cleared lands
  - Fearnside (1996): 47%
- Regional variability
  - The amount of cleared land in second growth varies considerably
  - Moran et al. (1994): Western Altimira, 46% (1985), 82% (1991)
  - Skole et al. (1994): Rondonia, 30%
  - Roberts et al., (2002): Rondonia, 22%
  - Ballester et al. (2003): Jiparana Basin, ~ 11%
- Persistence
  - Rarely quantified, but probably varies regionally
  - Skole et al., (1994): Second growth rarely persists 7 years in Rondonia.

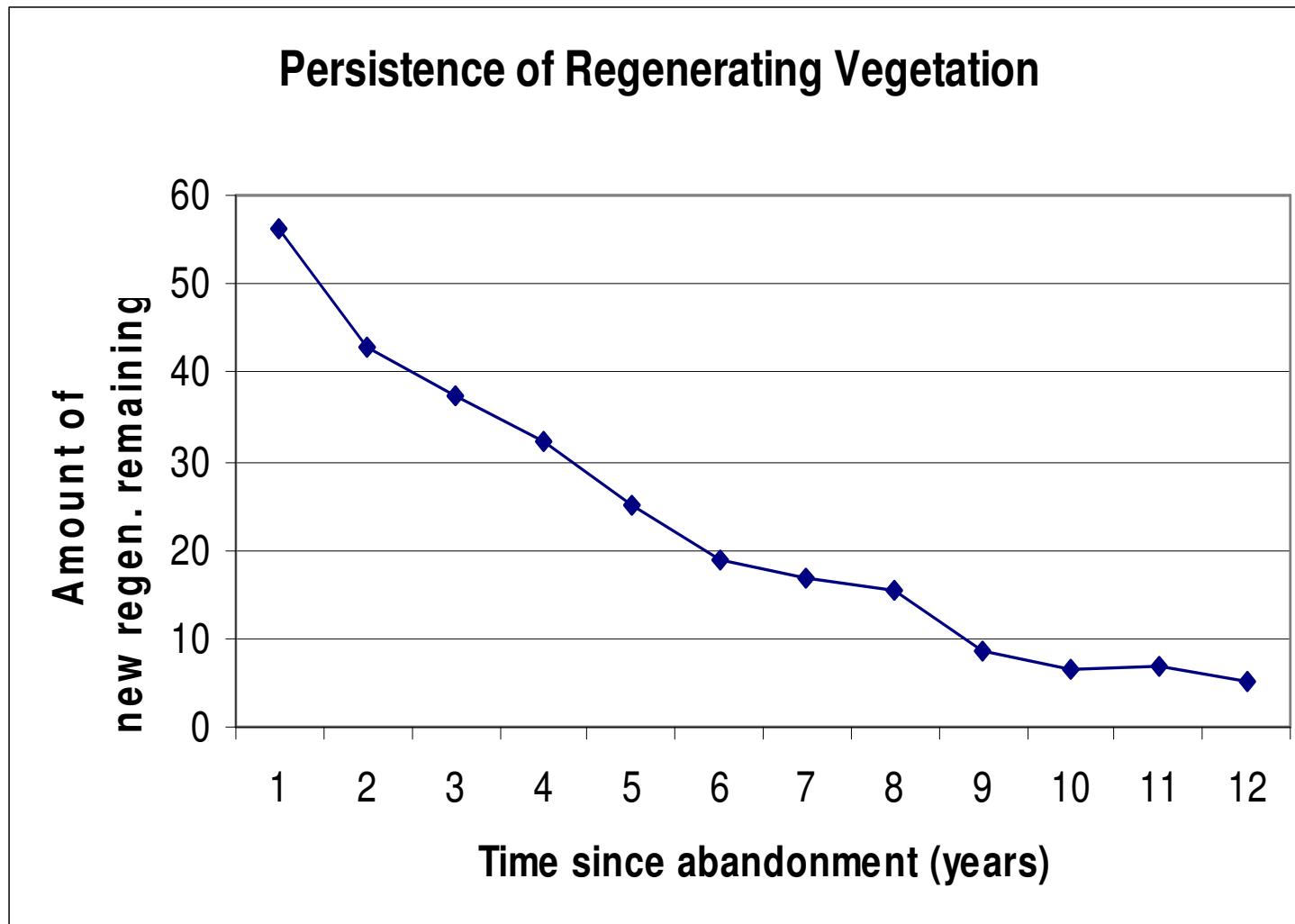
# Extent of regenerating vegetation



# Extent of regenerating vegetation



From 2006 Carreiras, et al.



From W.A.Salas, PhD Thesis. Averaged from three sites in Amazonia.

# Preliminary survey results

Survey Category	Respondent #	1	2	3	4	5	6	7	Total
<b>RS Pre-Processing</b>									
Atmospheric Correction									
Atmospheric Correction			✓	✓	✓	✓	✓	✓	5 of 7
Radiometric Normalization				✓	✓		✓	✓	4 of 7
<b>RS Areal Measures</b>									
SG Extent	✓	✓		✓	✓	✓	✓	✓	6 of 7
Ratio SG/Cleared Lands	✓	✓		✓	✓	✓	✓	✓	6 of 7
<b>RS Biophysical Properties</b>									
LAI					✓				1 of 7
APAR									0 of 7
F <sub>c</sub> (fractional cover)			✓	✓		✓	✓	✓	4 of 7
Biomass			✓	✓	✓			✓	4 of 7
Height			✓	✓			✓		3 of 7
Other								Age	N/A
<b>RS Temporal Measures</b>									
SG Age	✓	✓	✓	✓	✓	✓	✓	✓	All
SG Successional State	✓	✓	✓	✓	✓				5 of 7
SG Persistence		✓		✓			✓		3 of 7
<b>Field Surveys/Interviews</b>									
Time since initial disturbance	✓	✓	✓	✓	✓	✓	✓	✓	All
Cropping/pasture history	✓	✓	✓	✓	✓				5 of 7
Frequency of disturbance			✓	✓	✓	✓	✓		4 of 7
Burn History	✓		✓	✓	✓	✓	✓		5 of 7
<b>SG Field Data</b>									
Age	✓	✓	✓	✓	✓			✓	6 of 7
Stand Size	✓	✓	✓	✓	✓				5 of 7
Stand Shape	✓		✓	✓	✓				4 of 7
DBH	✓	✓	✓	✓	✓			✓	6 of 7
Tree Height	✓	✓	✓	✓	✓			✓	6 of 7
Tree Density			✓	✓	✓			✓	4 of 7
Species composition	✓	✓	✓	✓	✓			✓	6 of 7
Biogeochemical measures				✓					1 of 7

## Respondent Key:

#1. Ane Alencar & Ima Vieira

IPAM

#2. Diogenes Alves

Instituto Nacional De Pesquisas Espaciais

#3. Eduardo Brondizio

Indiana University

#4. S. Hagen & W. Salas

University of New Hampshire, Applied

#5. Richard Lucas

Geosolutions, LLC

#6. Dar Roberts

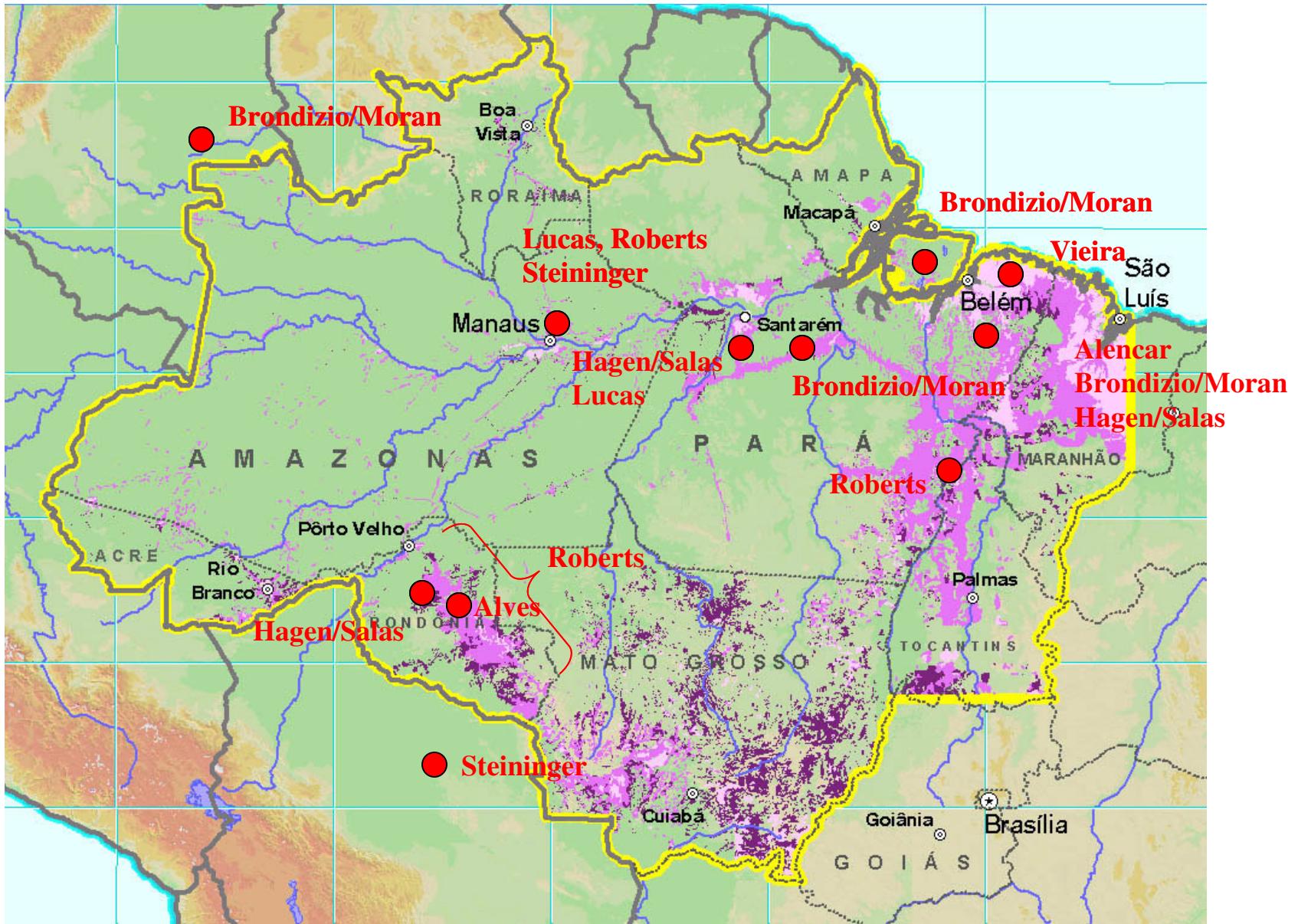
University of Wales, Aberystwth

#7. Marc Steininger

UC Santa Barbara

Conservation International

# Study Locations



# What is missing?

- Site level estimates of **persistence** (fluxes):
  - regenerating vegetation
  - pasture/agriculture
- Since gaps in annual time series of Landsat are common, estimation of **regeneration stage** is useful. Can we find a method that is **transferable** in space & time?
- Updated map of regenerating forest **extent** (pool).

# Proposal

1. Consolidate image data from participating groups (3-10 geographic locations; time series)
  - a) Geo-registered
  - b) Radiometrically calibrated
  - c) Atmospherically corrected (?)
2. Classify imagery
  - a) Apply consistent methodology (mixture modeling or maximum likelihood)
  - b) Include successional stages (?)
3. Identify persistence (rates of change) in stands of regenerating vegetation

# Points of Discussion

- Definition of regenerating vegetation
- Successional stages
- Persistence (Time series of Landsat)
- Pasture/Regenerating confusion
- Regenerating/Mature confusion
- Common methodology
  - Mixture modeling vs. maximum likelihood
- Scaling up to Basin/Legal Amazon
  - Landsat (Asner) vs. MODIS (Carreira)

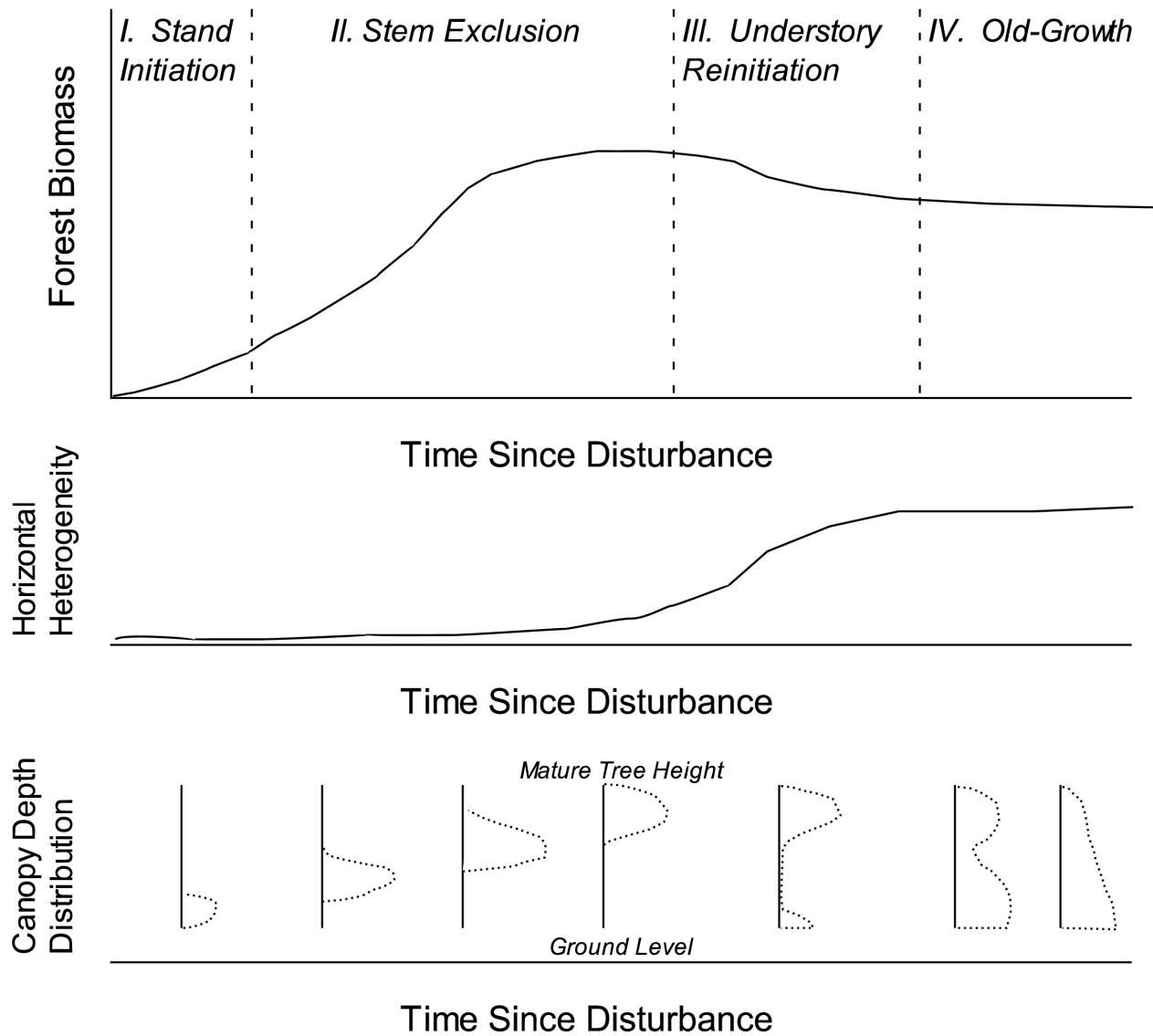
# Definition of Regenerating Vegetation

- Swidden agriculture?
- Dirty pasture?
- Structurally complex regenerating forest?

# Successional stages

- Two, three, or four stages?
- Spectral or structural information?

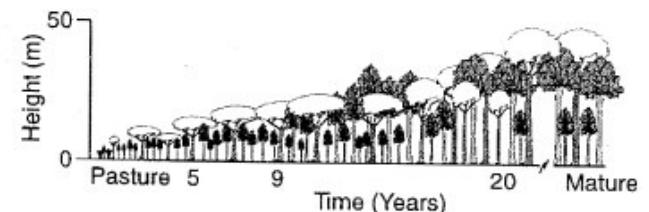
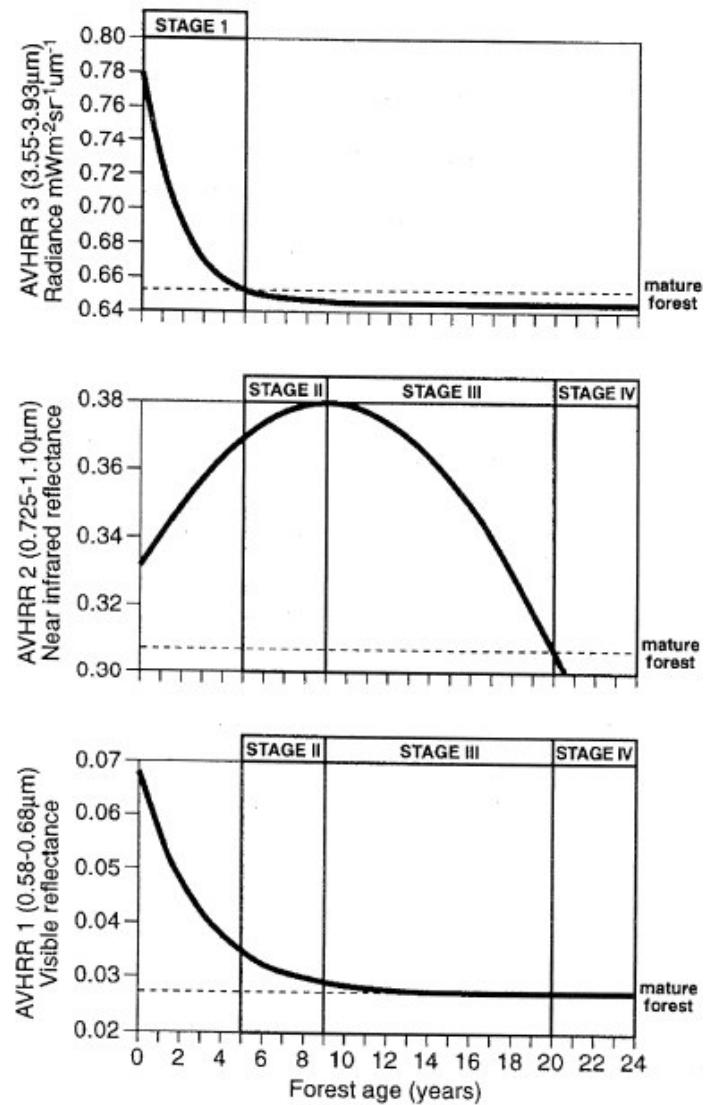
# Successional Stages



Conceptual diagram relating biomass recovery (Bormann and Likens 1979) to forest structural stages (Oliver 1981) following disturbance.

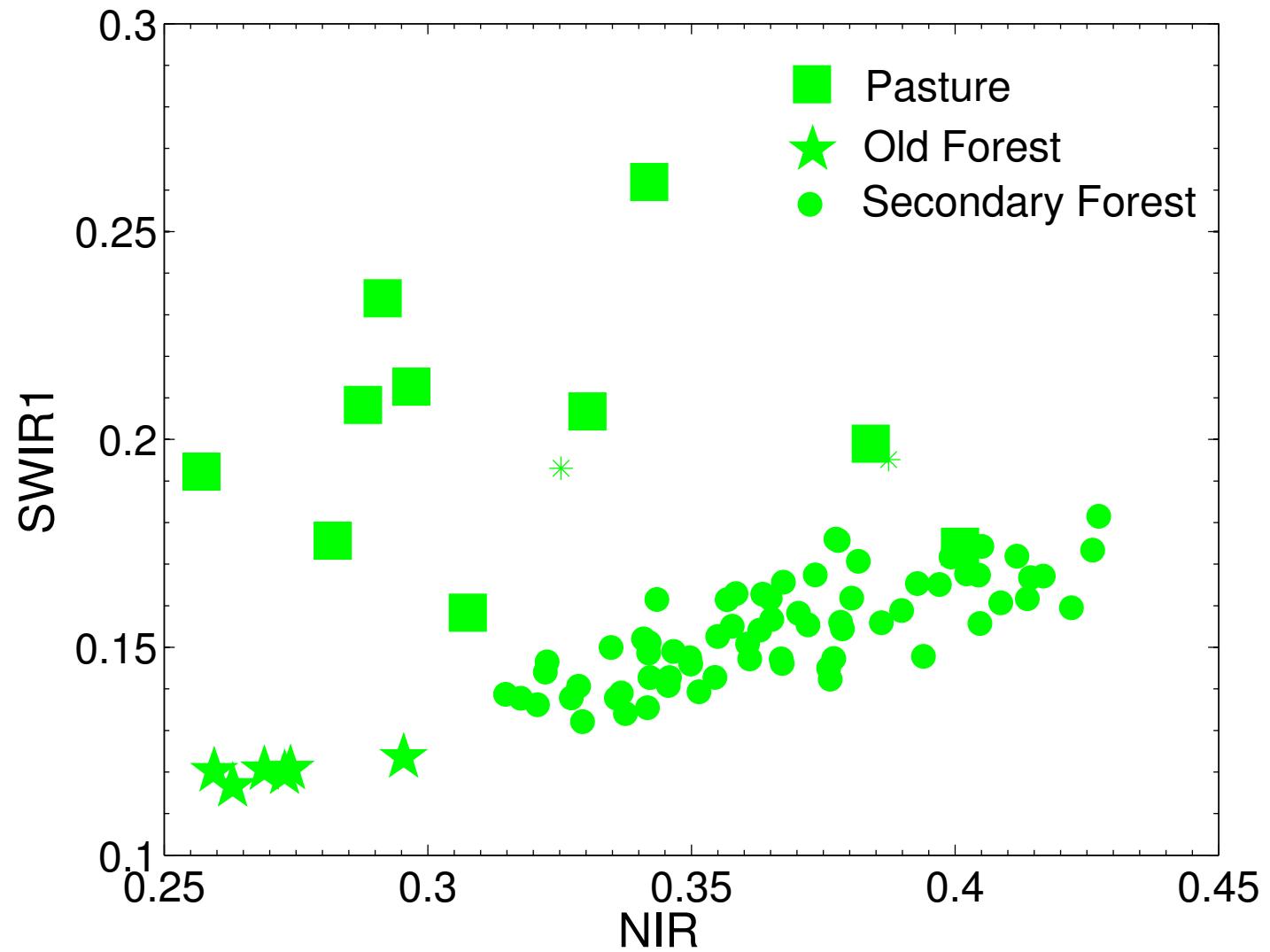
# Successional Stages

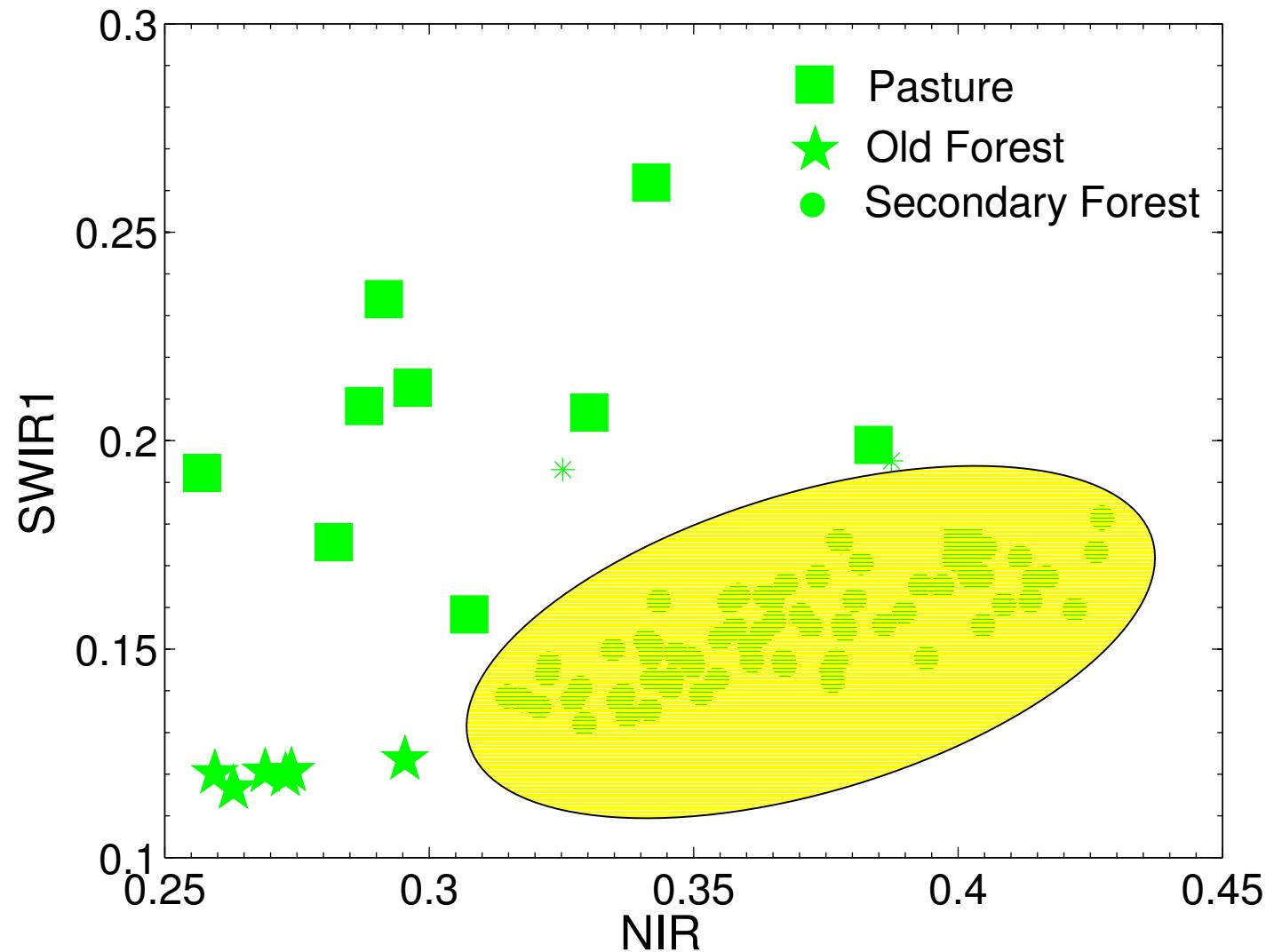
	Visible Reflectance	NIR Reflectance	MIR Reflectance
Pasture/crop areas*	High	Variable, < SS1	High (dry soils)
SS1	Moderate	High	Moderate
SS2	Moderate, higher green/red ratio	Moderate	Low-Moderate
SS3	Low, with higher green/red than SS1, SS2	Low	Low
Mature Forest	Low	Lowest	Lowest

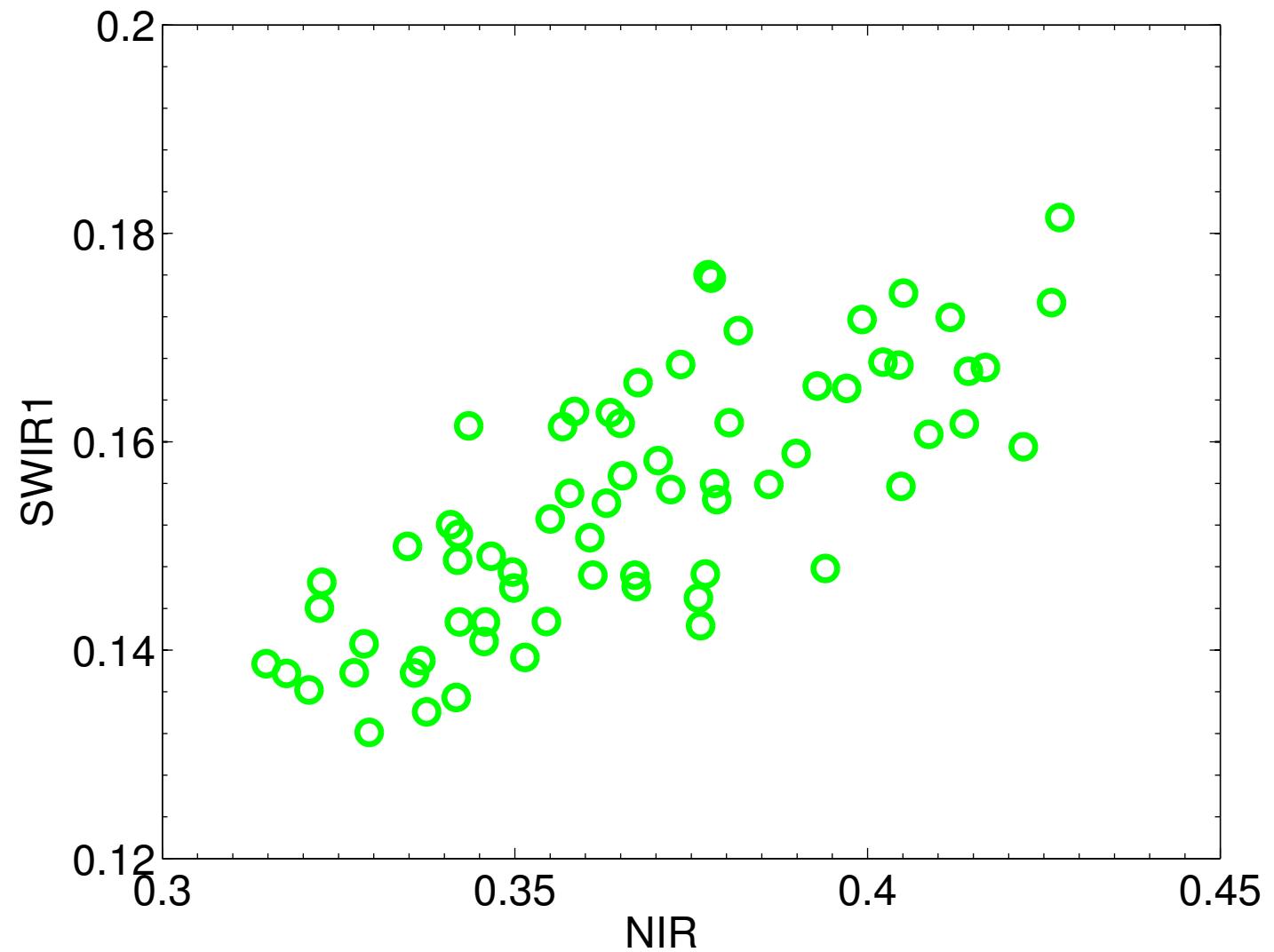


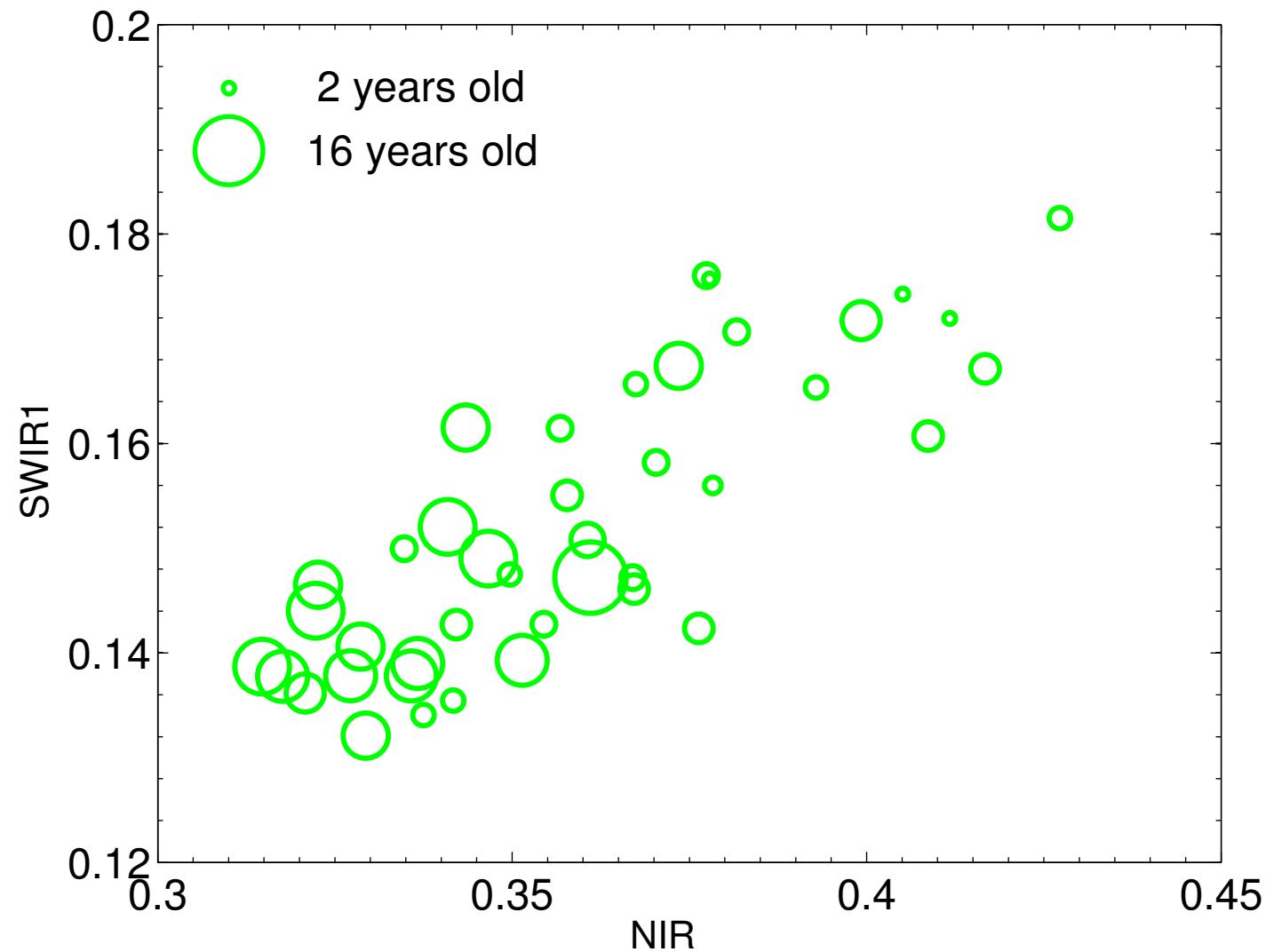
# Model transferability

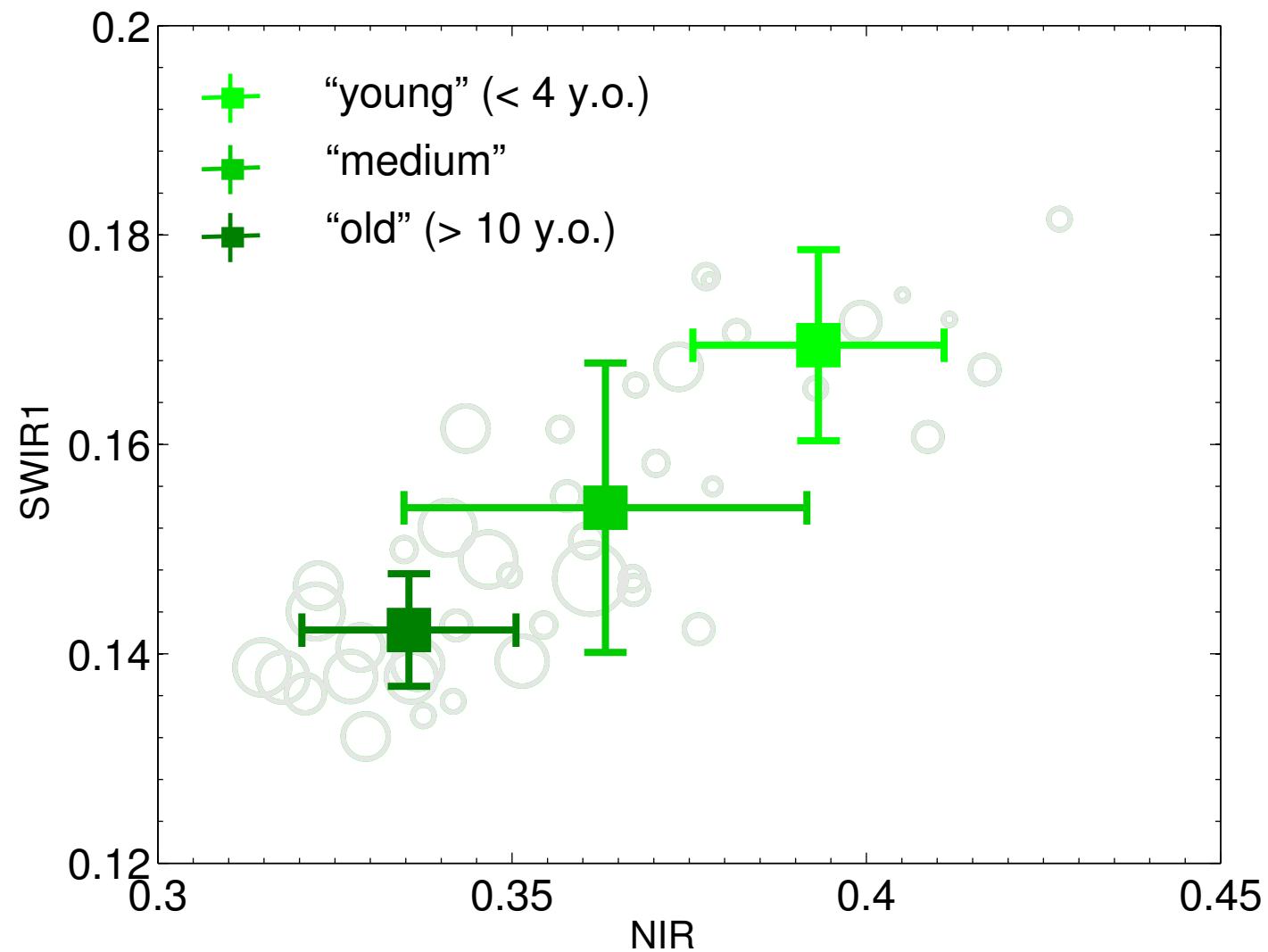
- If we are to have a cross-site study, we need:
  - consistency in definitions and methods
  - methods that are less sensitive to atm. correction, seasonality, etc.



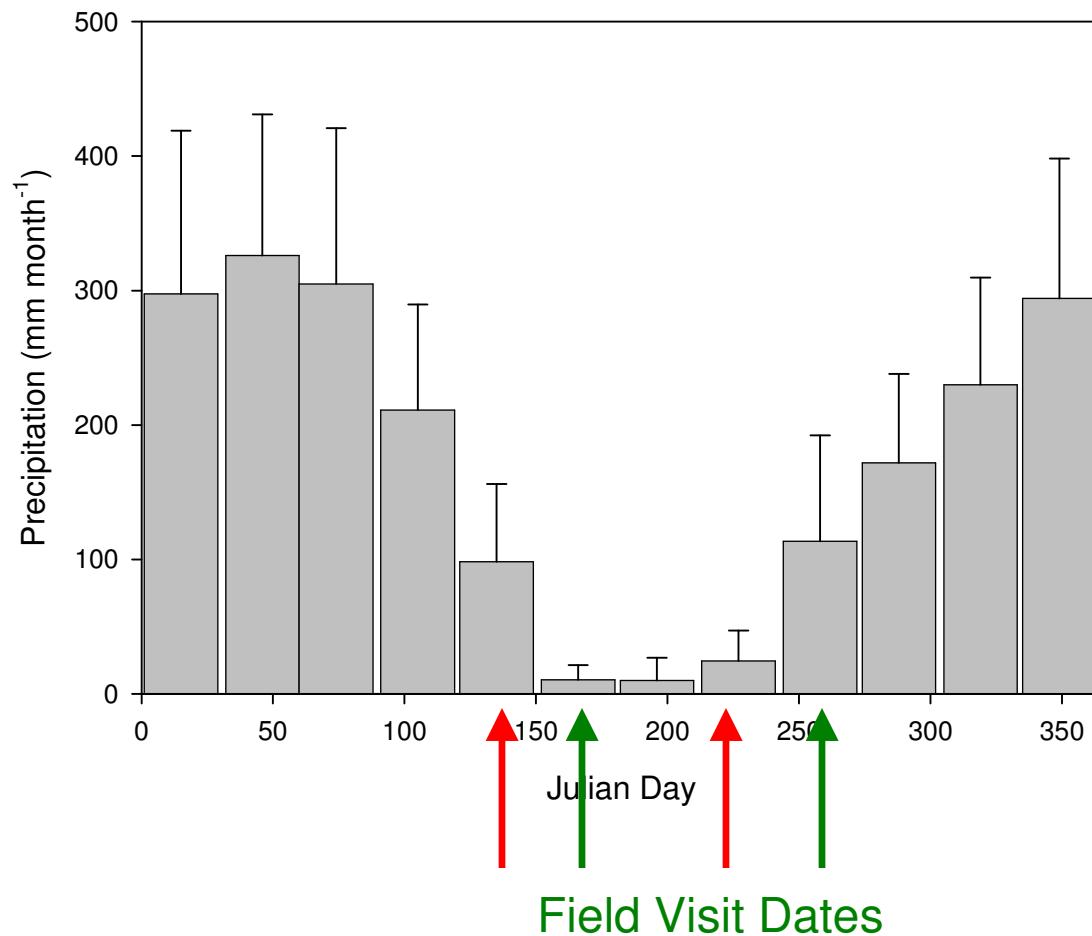


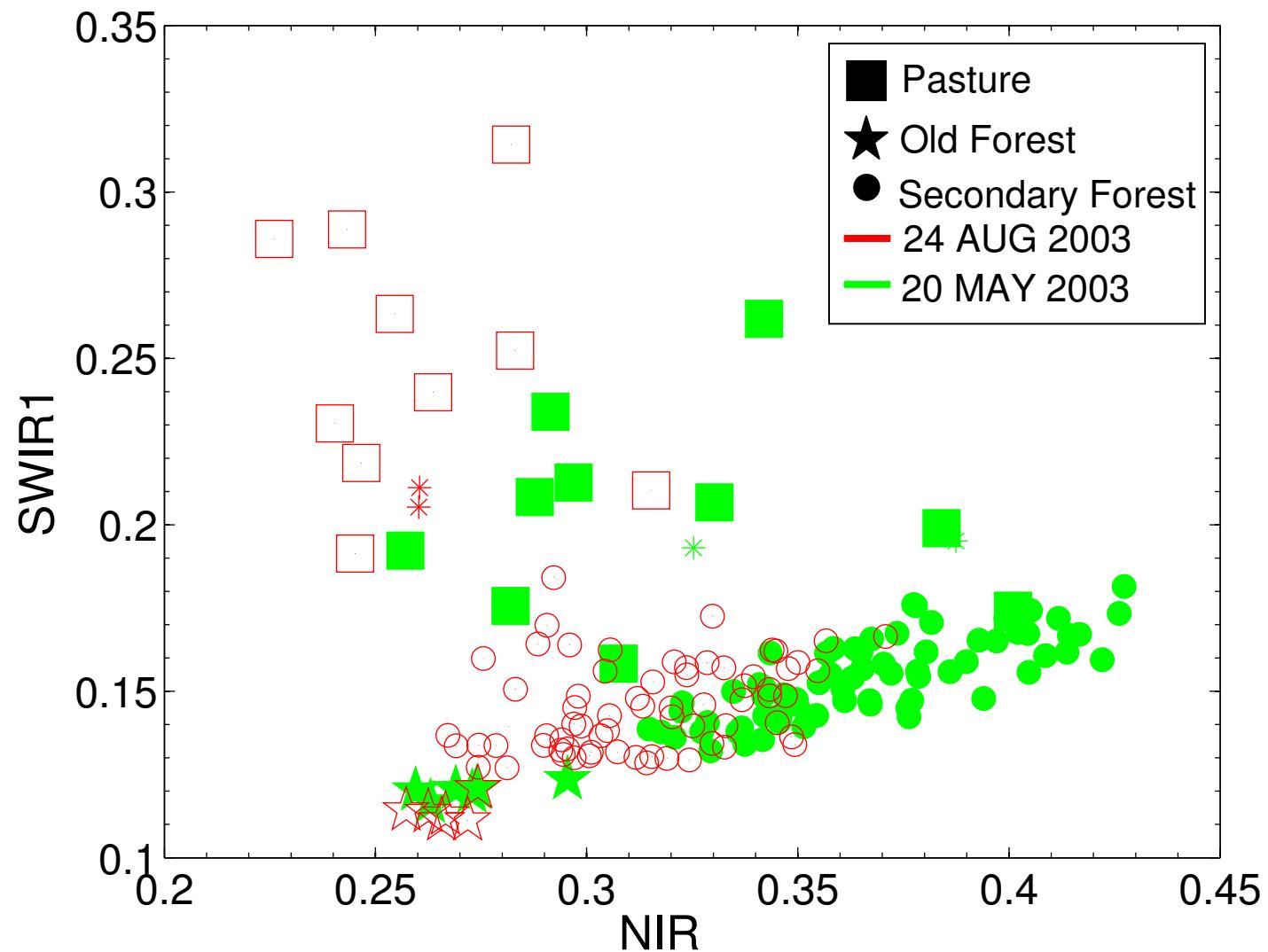


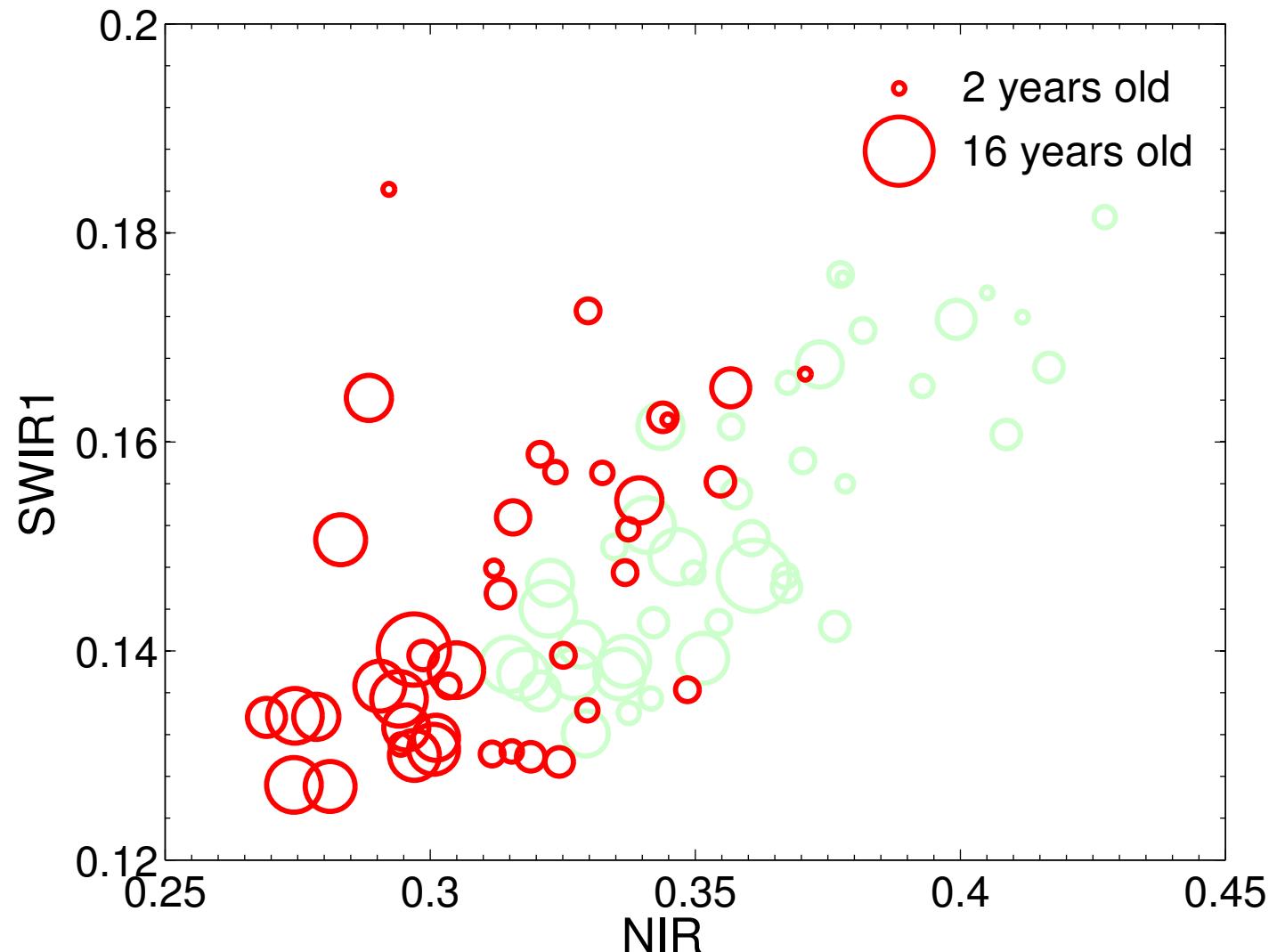


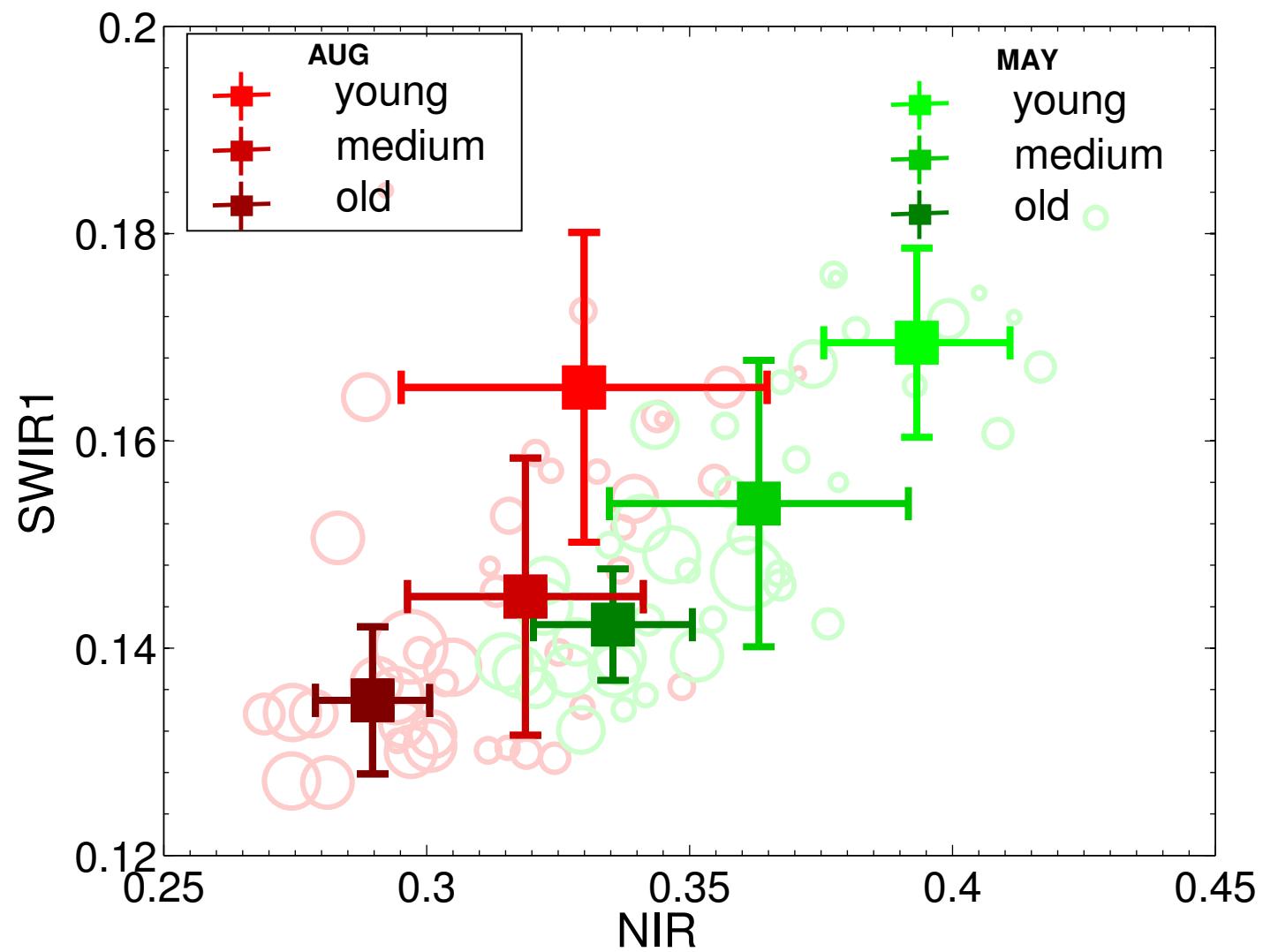


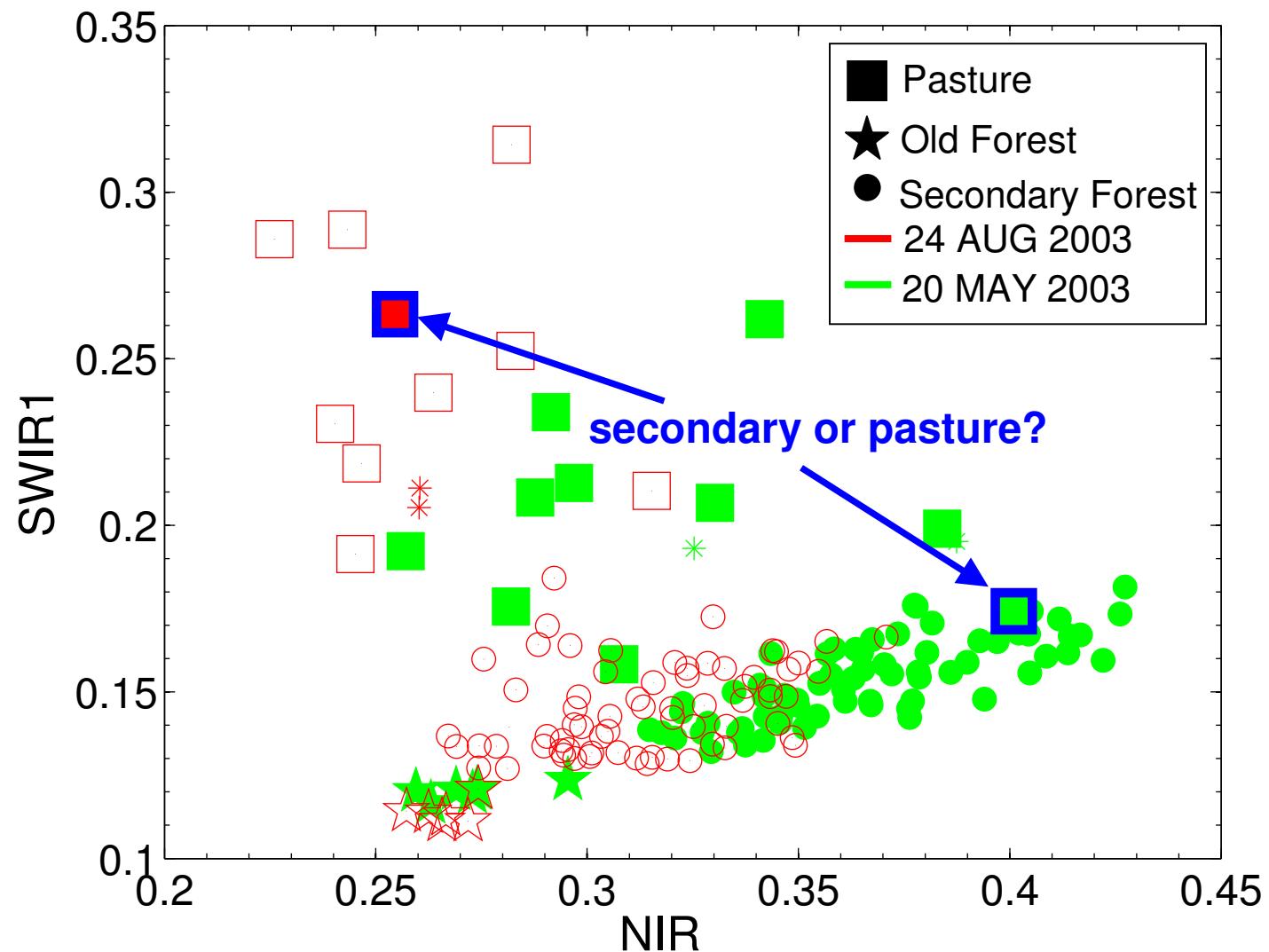
Ariquemes, Rondonia  
(-9.95, -63.05)

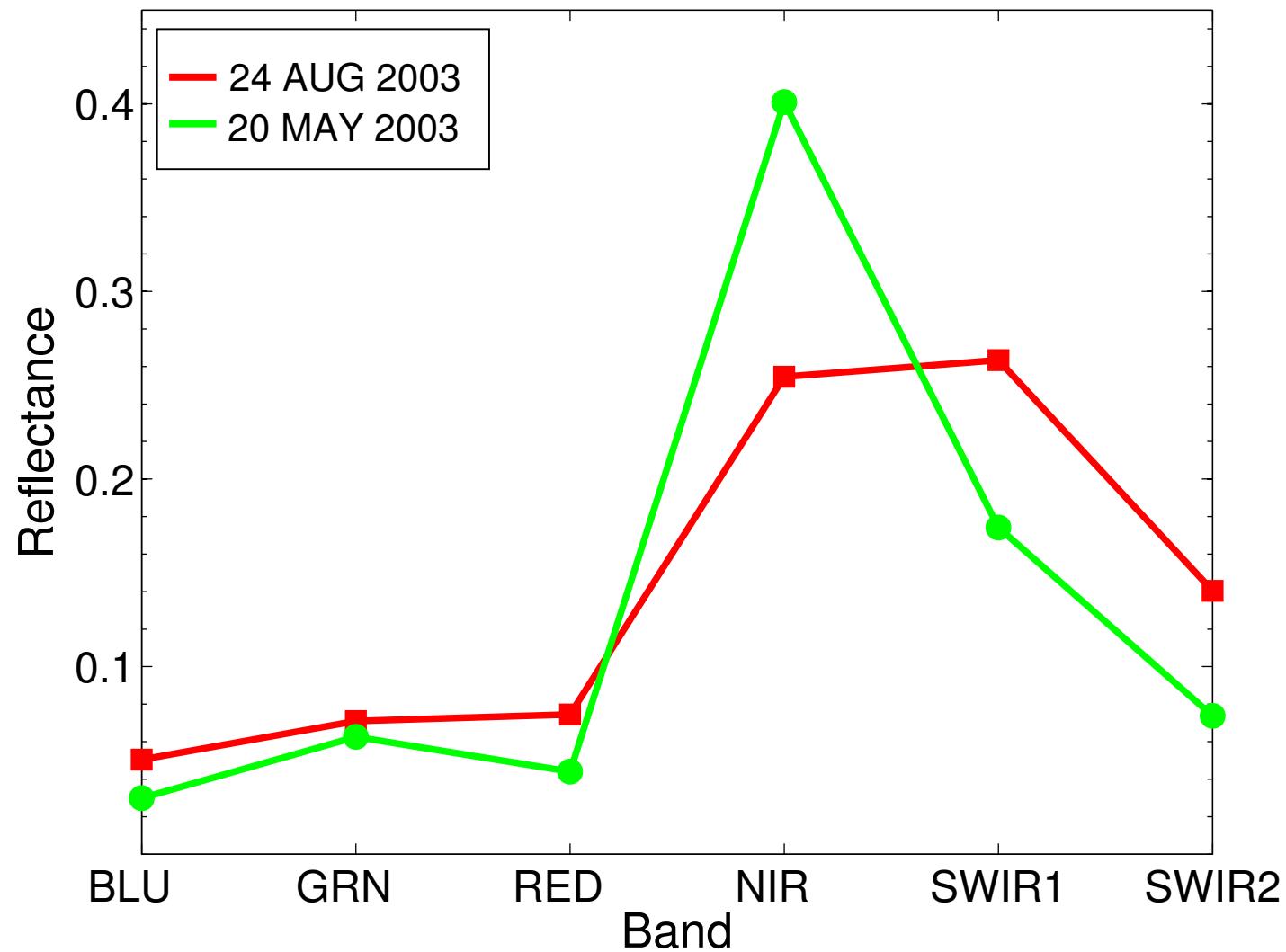


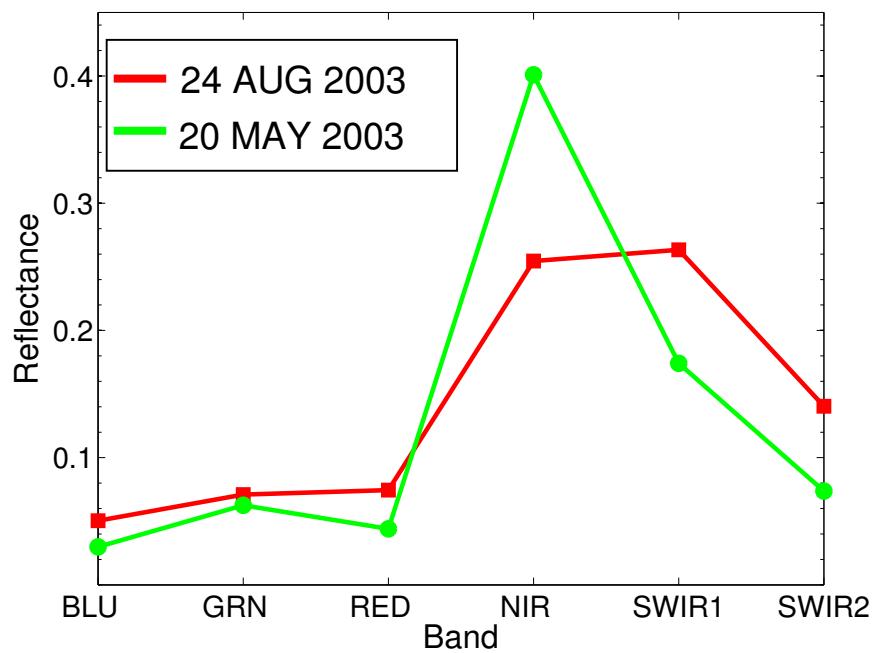
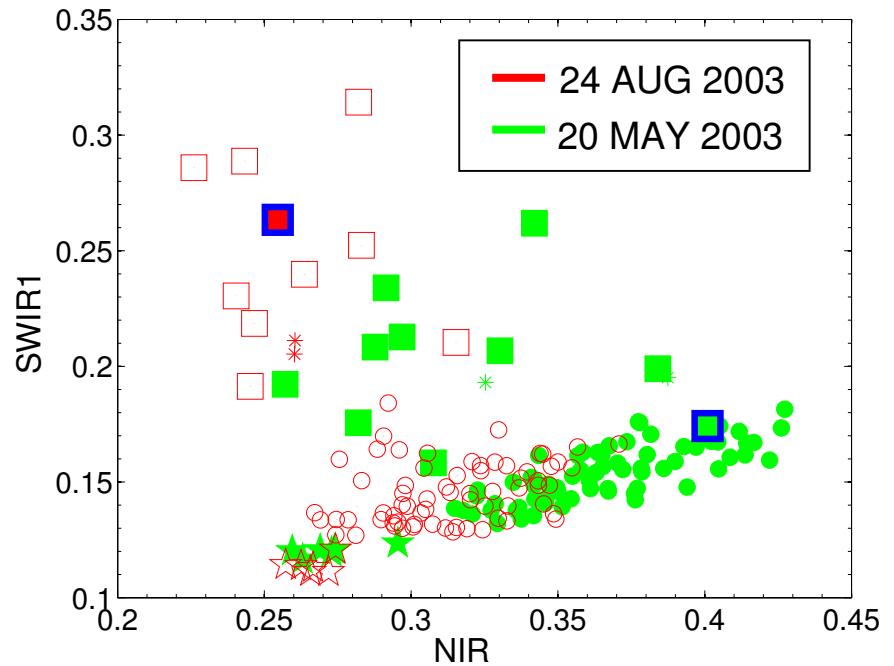




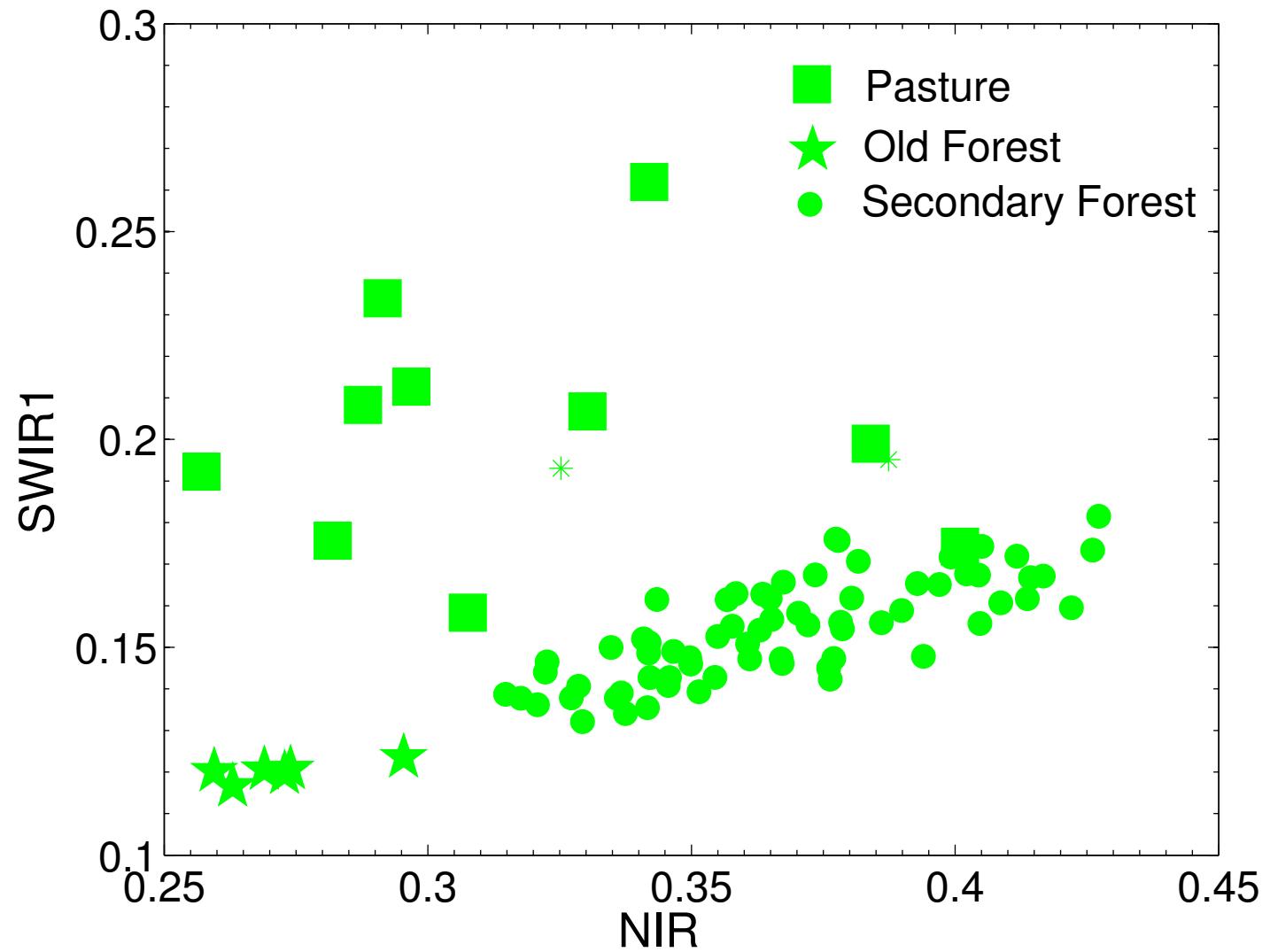


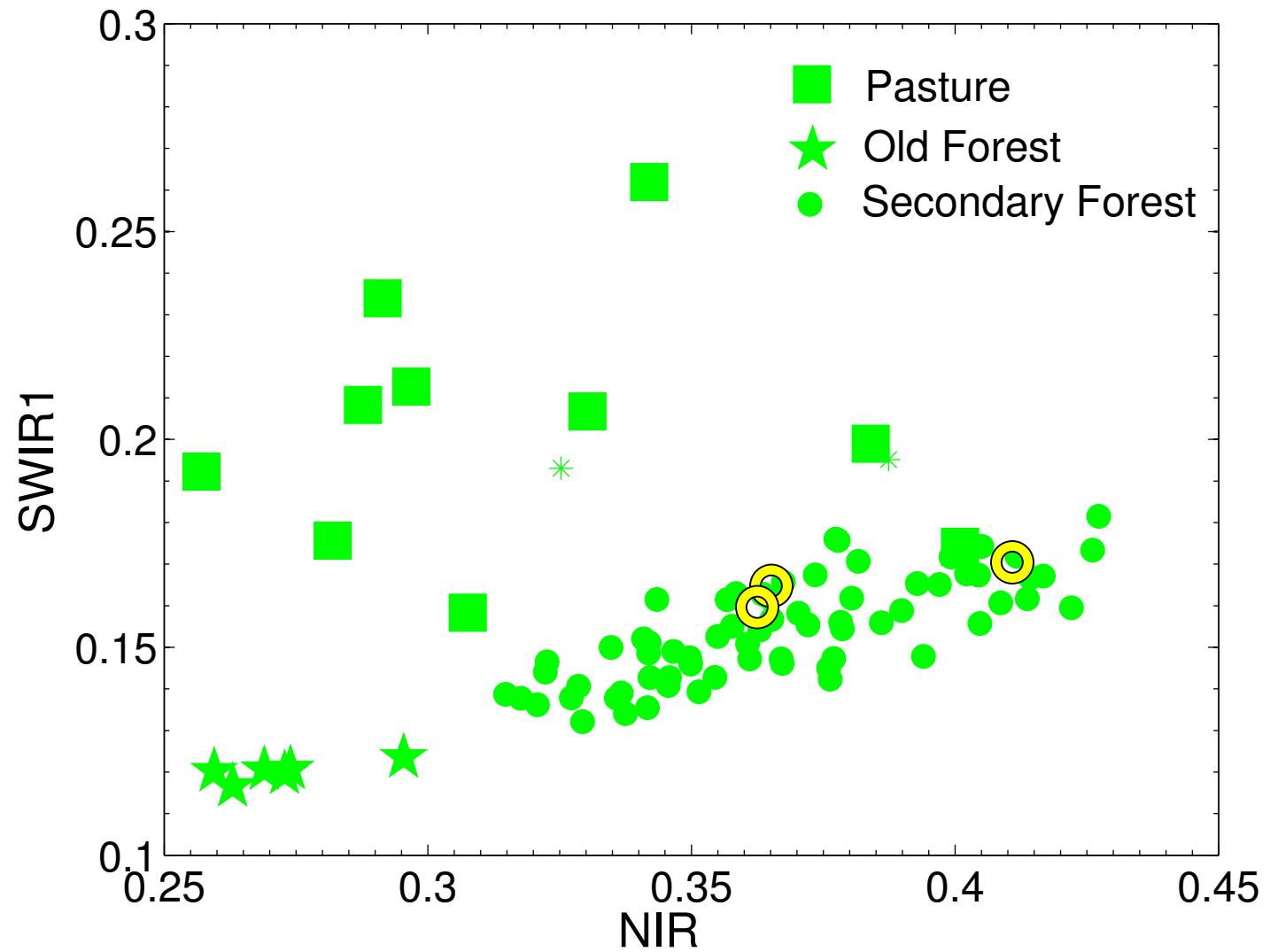


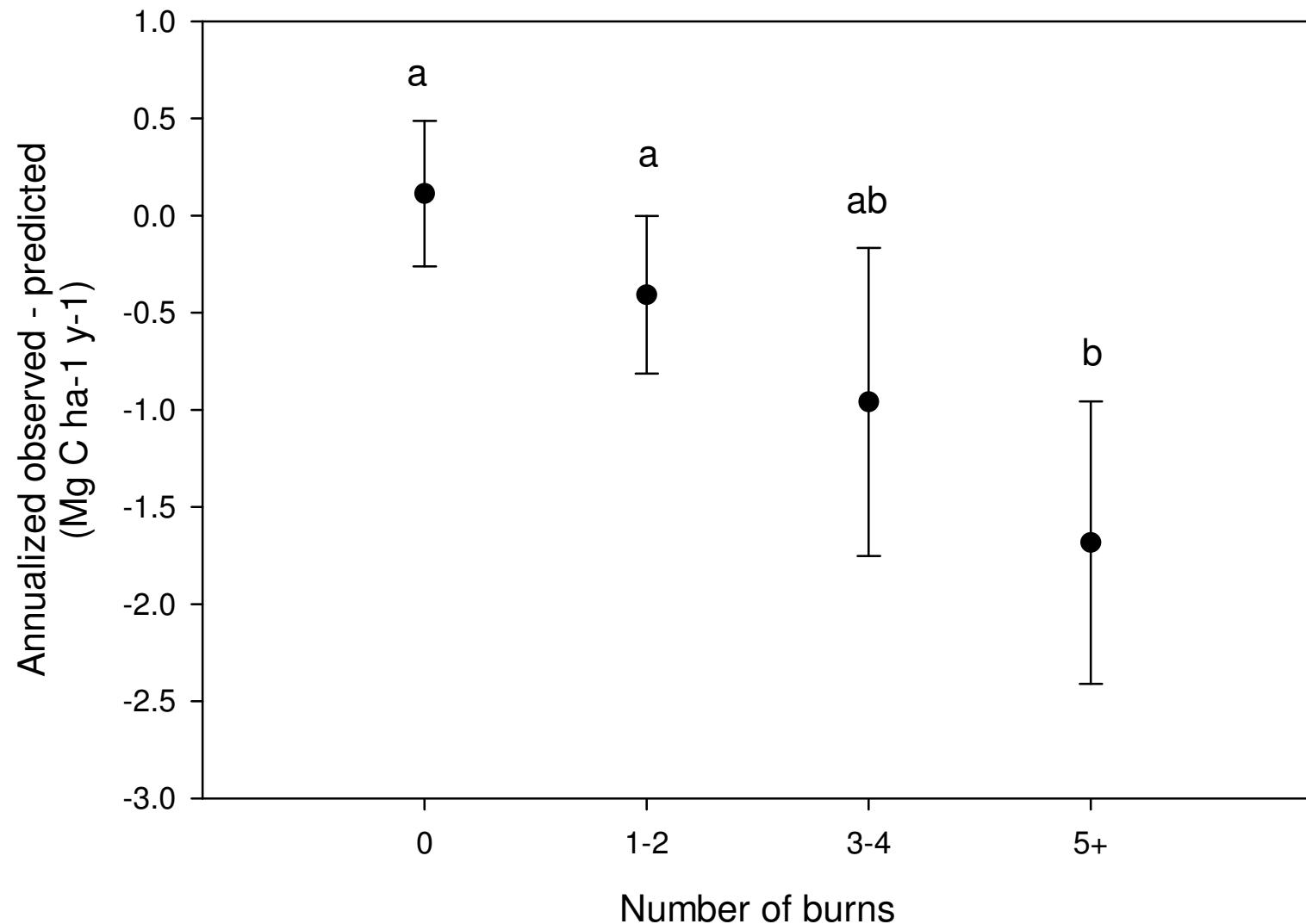




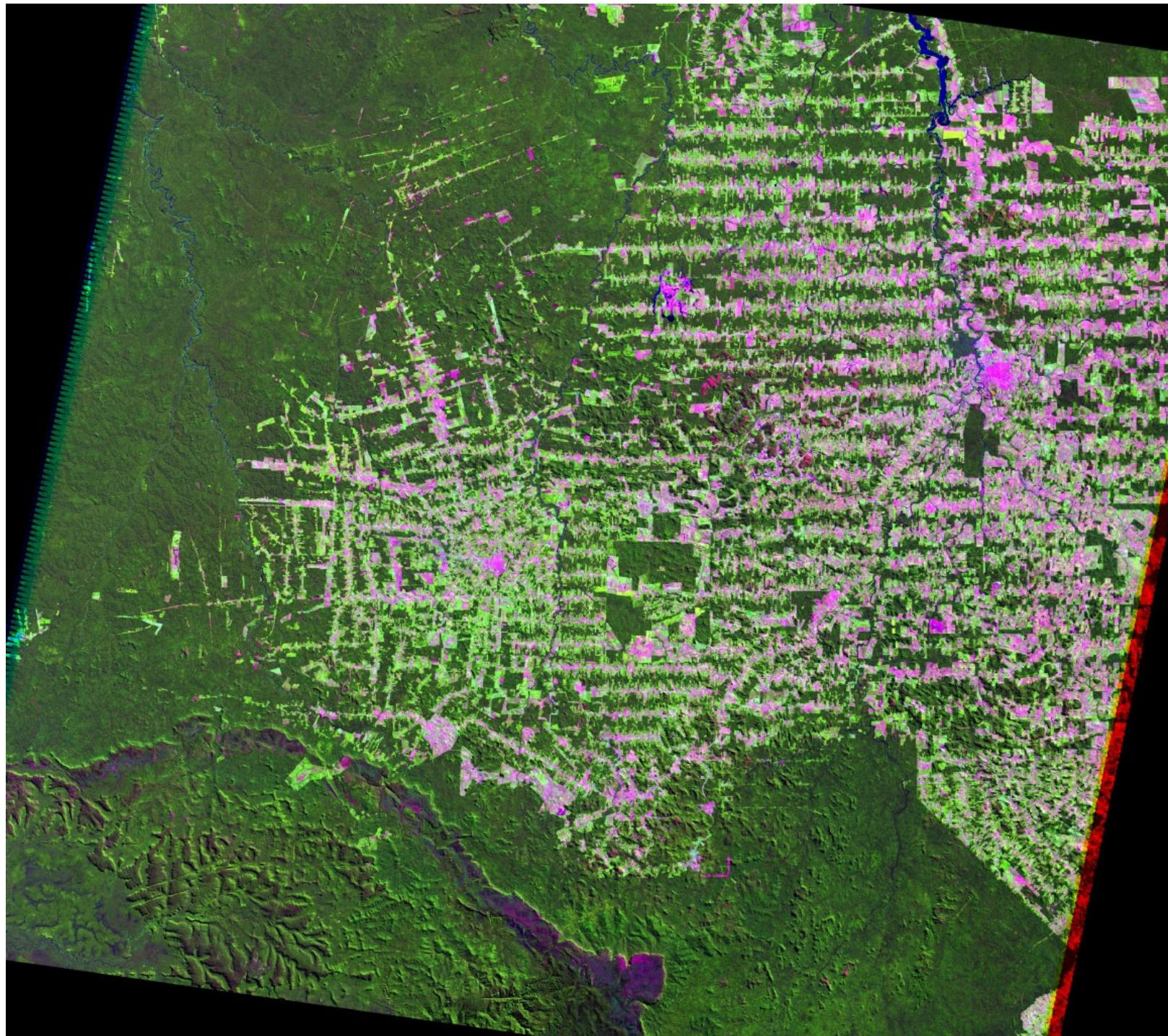


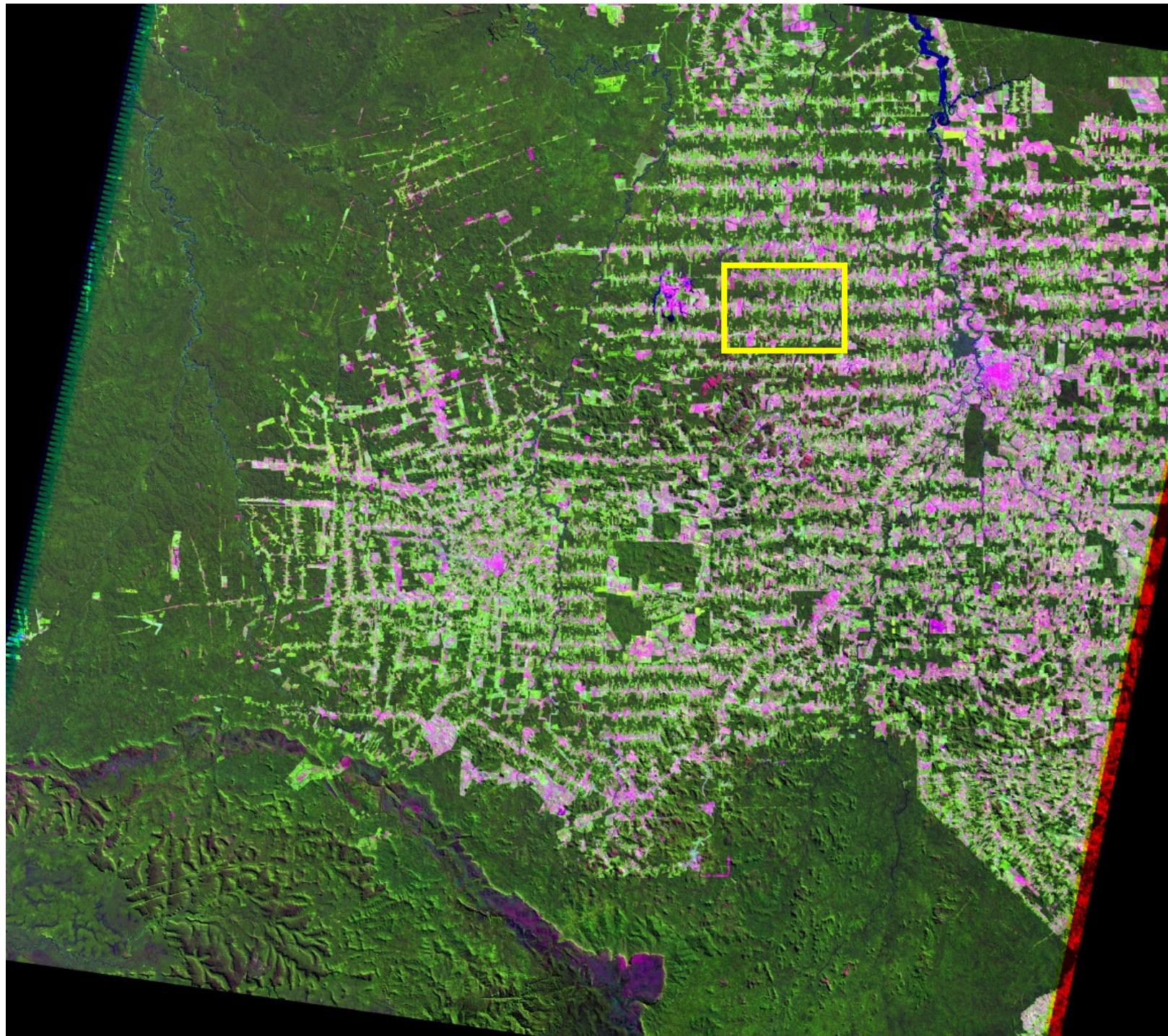


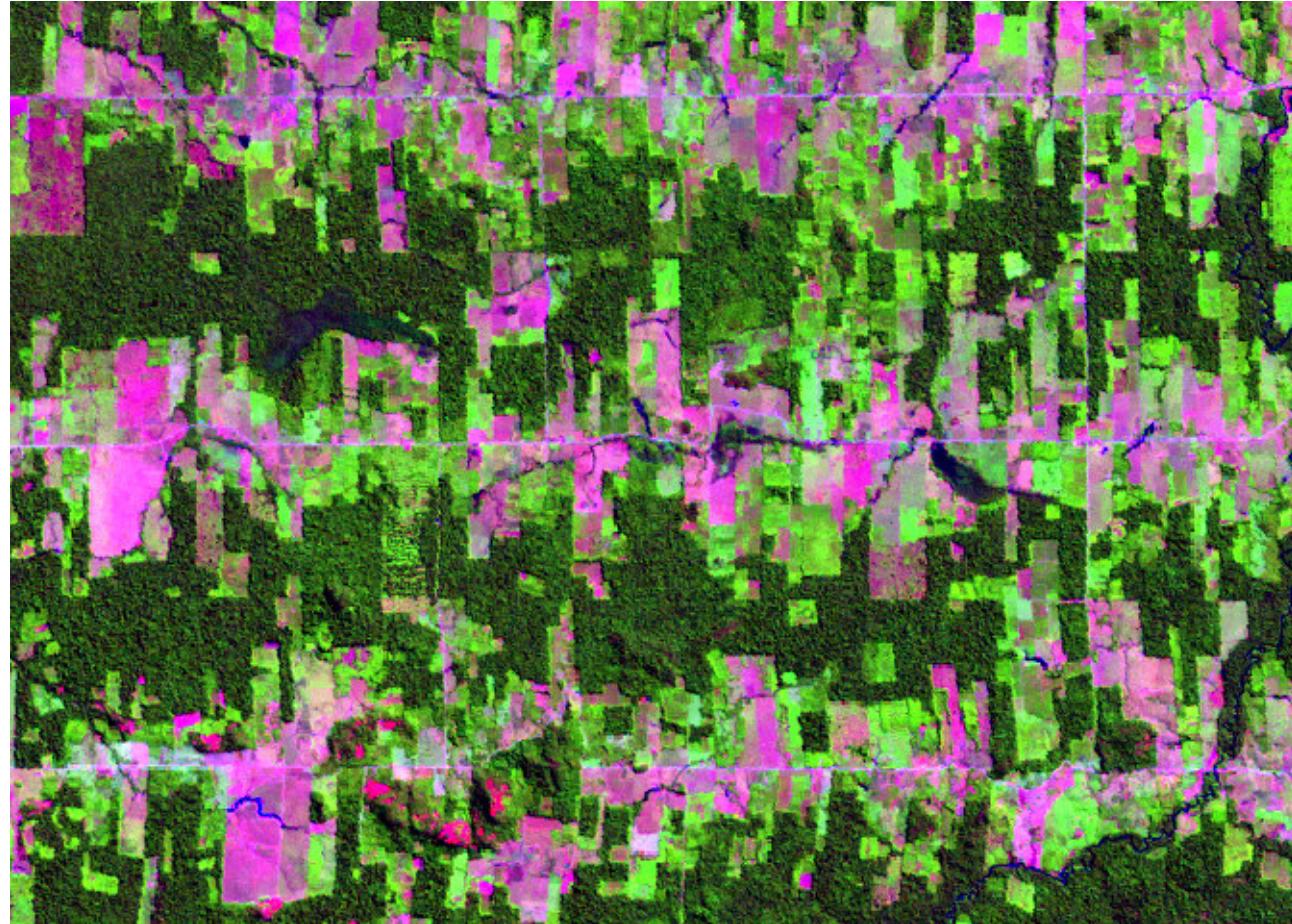




**In sites that have burned repeatedly, the observed rates of secondary forest regrowth fall below expectations based on a previously validated empirical model that predicts growth from climate and soil properties. From Zarin et al. Front. Ecol.& Environ. 2005. 3:365-369**



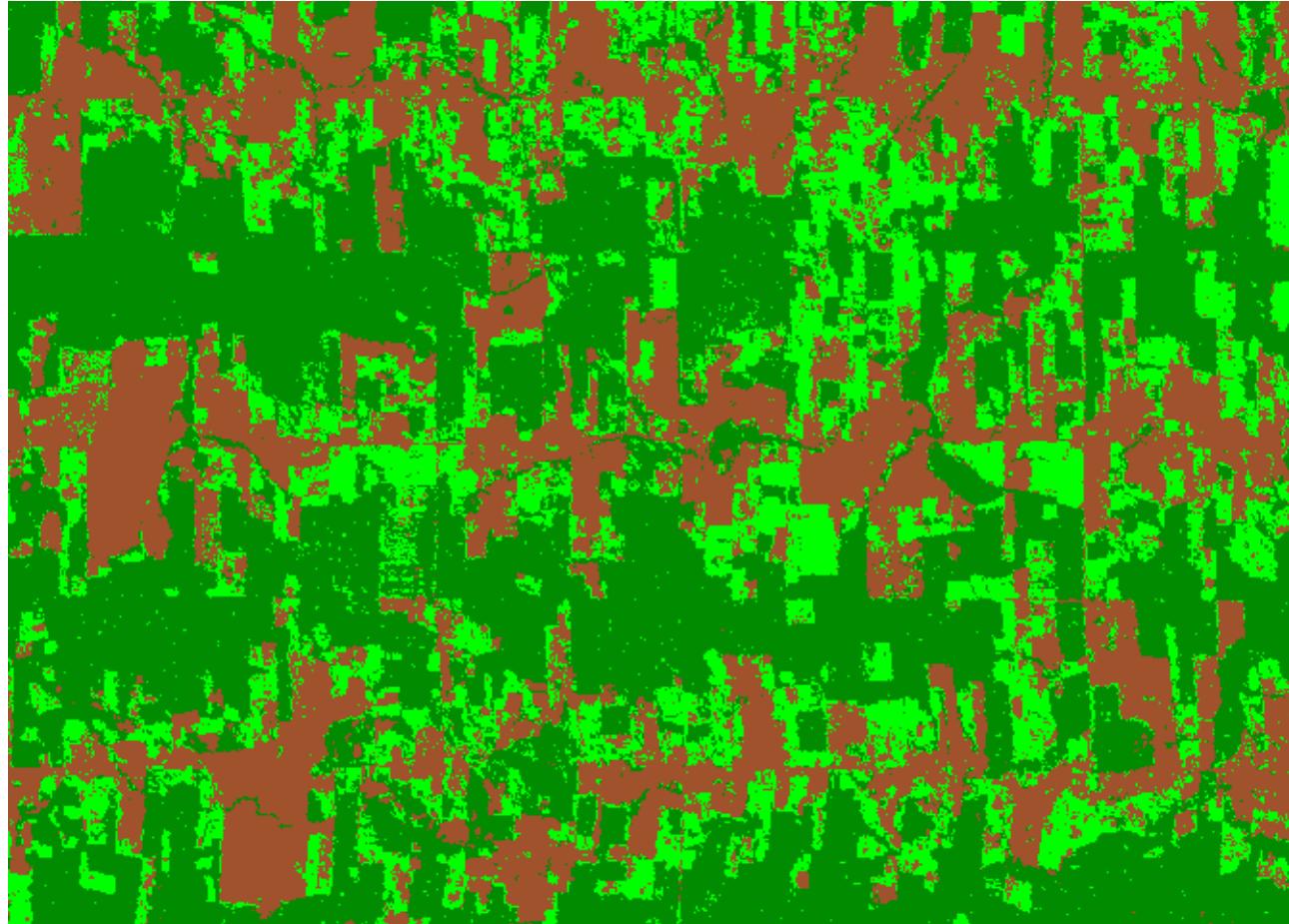




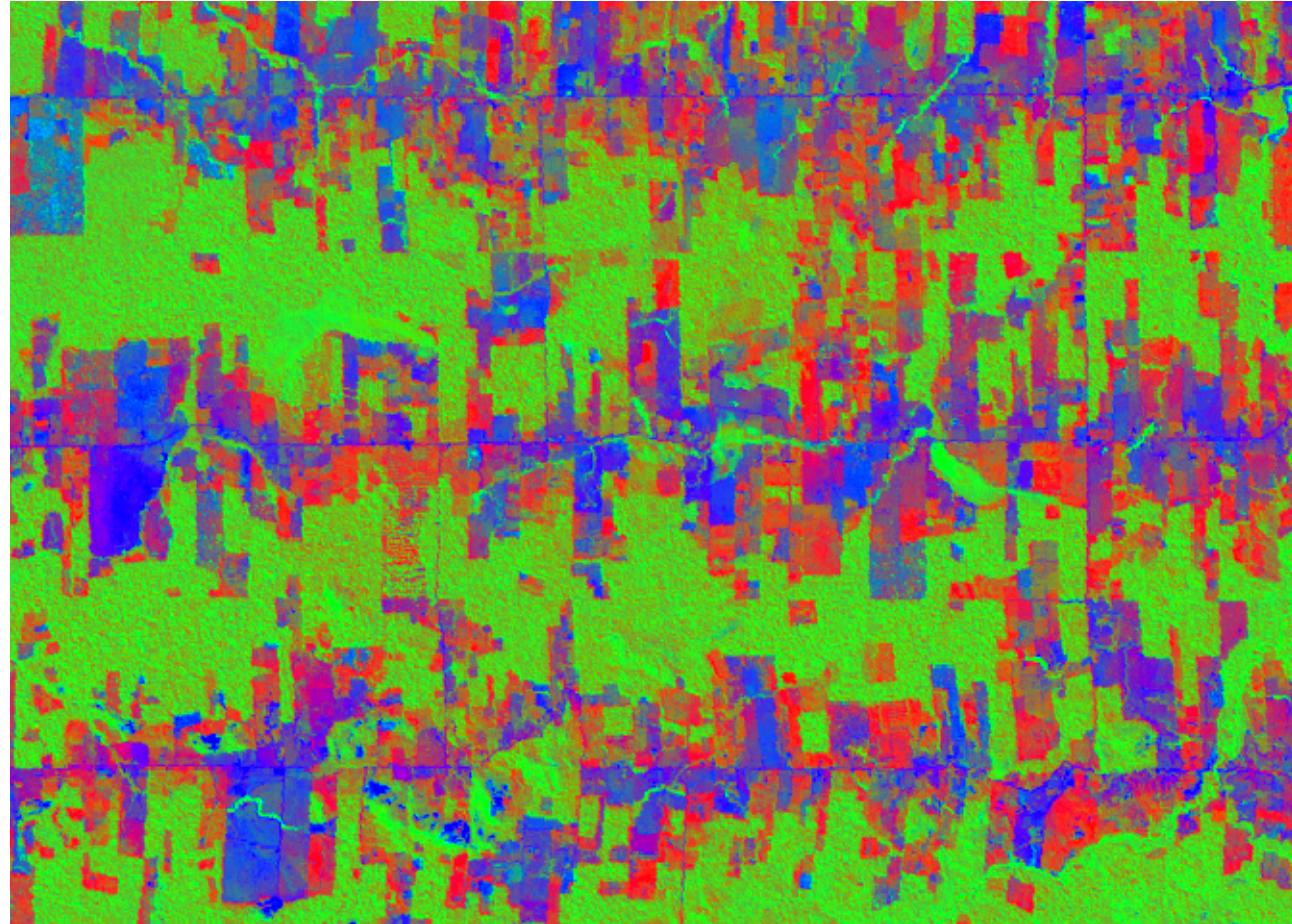
**R-SWIR1**

**G-NIR**

**B-RED**



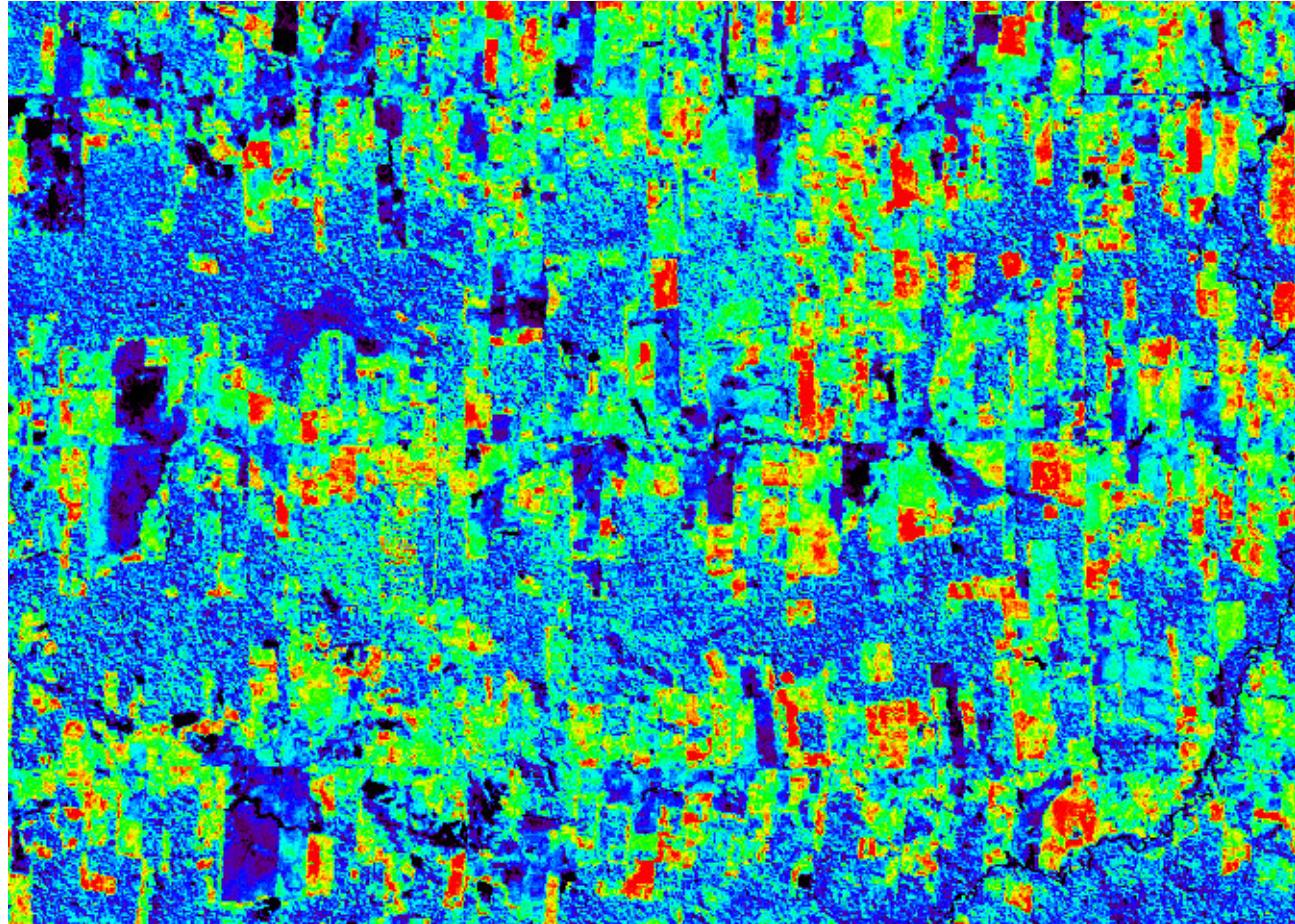
**Land cover classification**



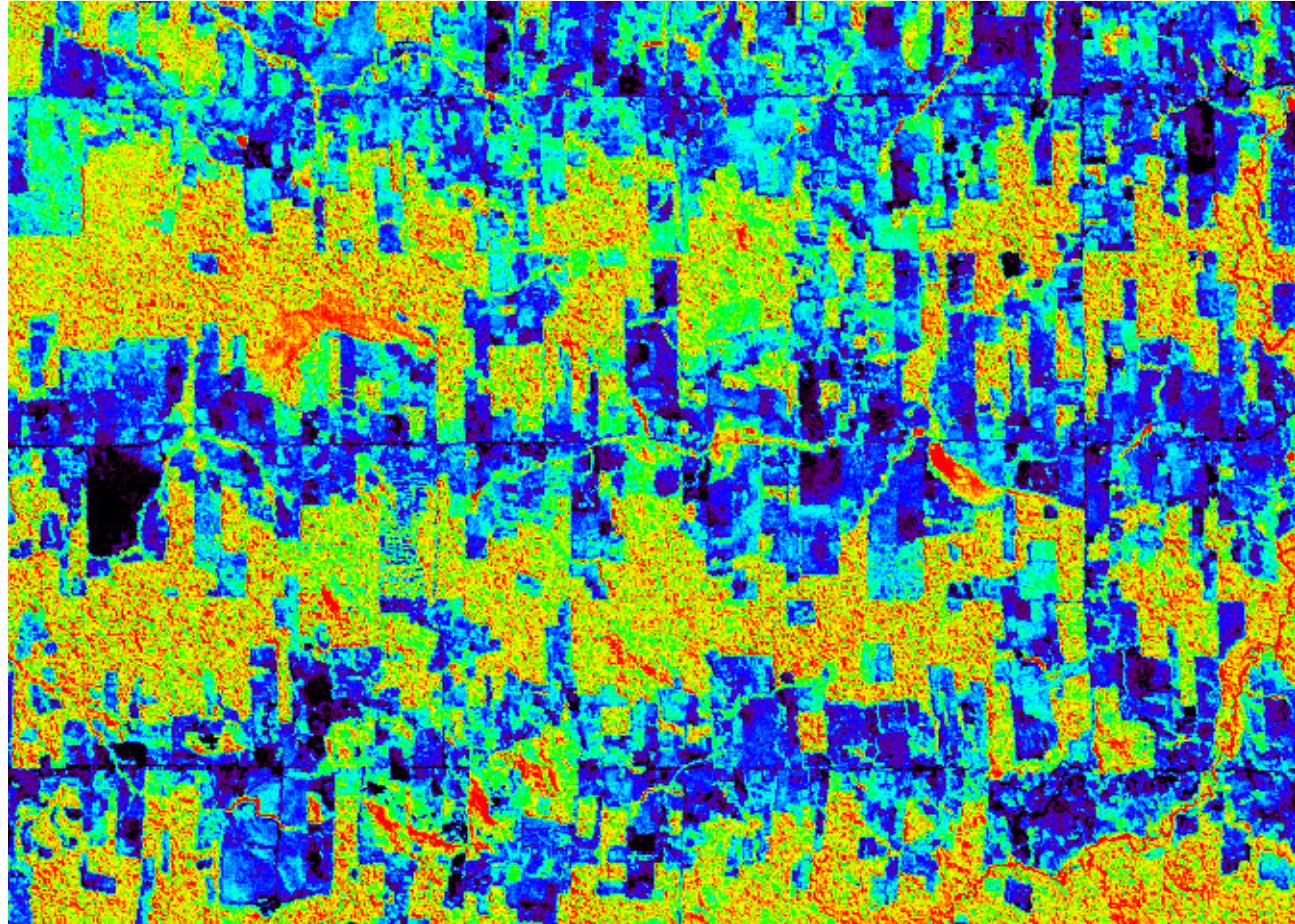
**R-Green Veg.**

**G-Shade**

**B-Soil**



**Fraction of Green Vegetation**



**Fraction of Shade**

# Resources and Limitations

- Resources
  - processed Landsat scenes from >10 locations
  - ground truth data (class validation, structure)
  - knowledge base
- Limitations
  - limited time
  - limited funds