



M. Hansen, P. Potapov, M. Broich, S. Stehman, S. Turubanova,  
B. Adusei, B. Arunarwati, E. Lindquist and S.Goetz

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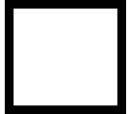
# Producing Composite Imagery and Forest Cover and Change Characterizations

South Dakota State University  
Geographic Information Science Center of Excellence

1994 - 111km

1998 - 8 km

2000 - 1 km



2002 - 0.5 km



2006 - 0.25 km



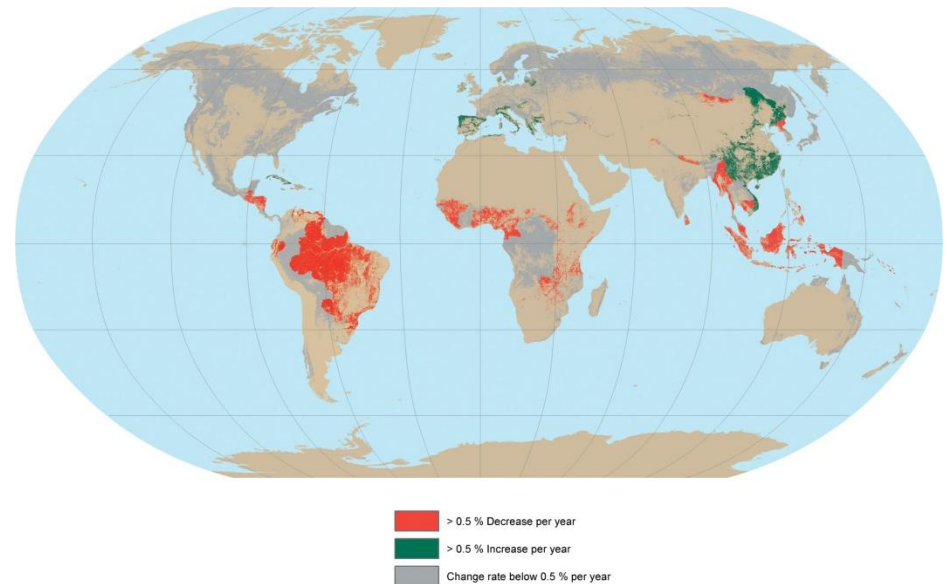
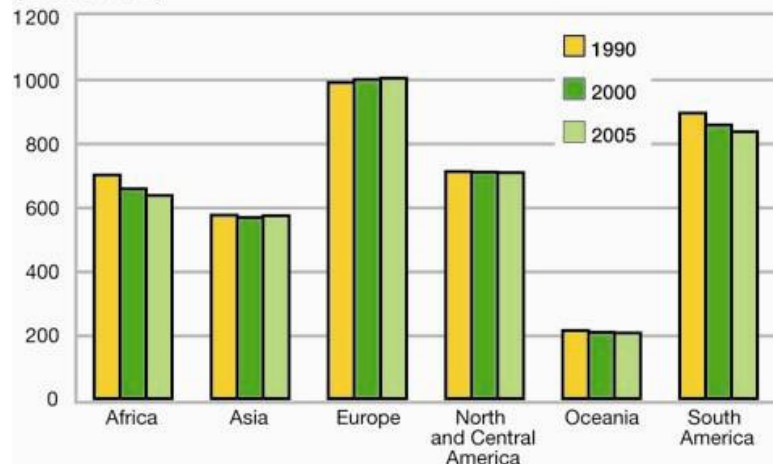
2010 - 0.03 km



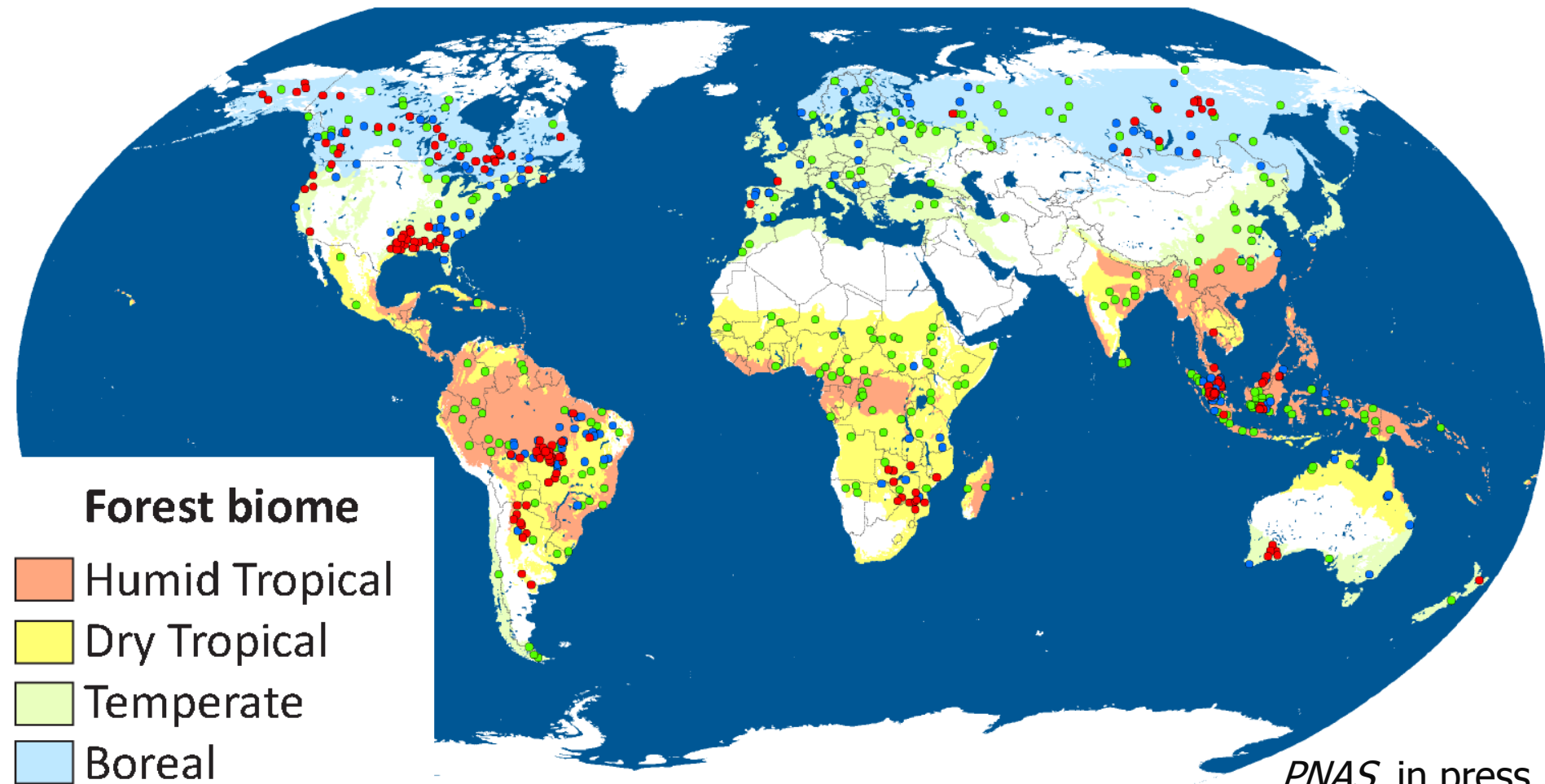
# 2005 United Nations Food and Agriculture Organization Forest Resource Assessment Report

- Africa and South America feature largest forest losses
- Overall rate of forest loss continues to decrease

**Trends in forest area by region, 1990–2005**  
(million ha)



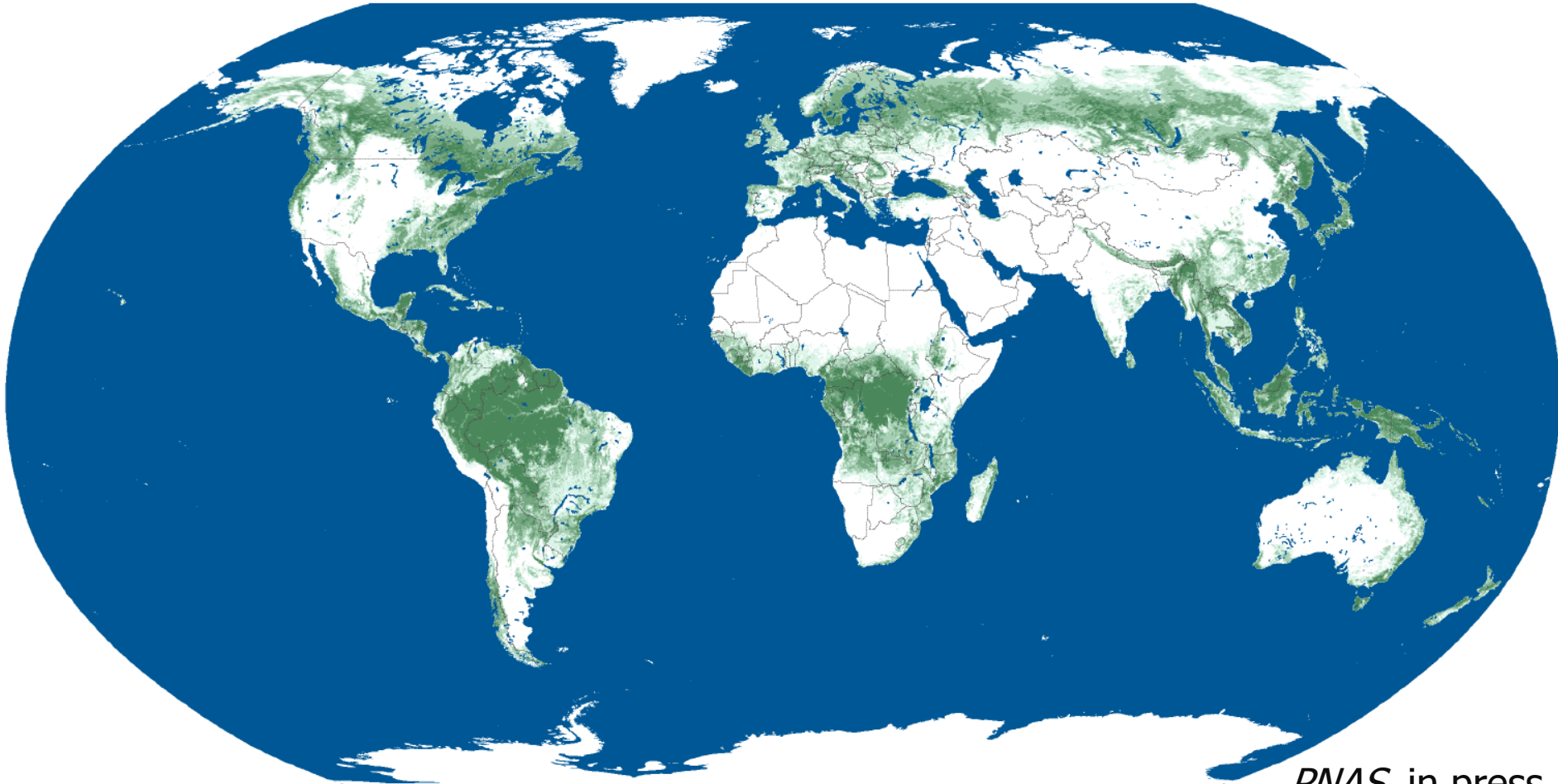
# MODIS-stratified Landsat samples



**Sample blocks within change strata:** ● Low ● Medium ● High change



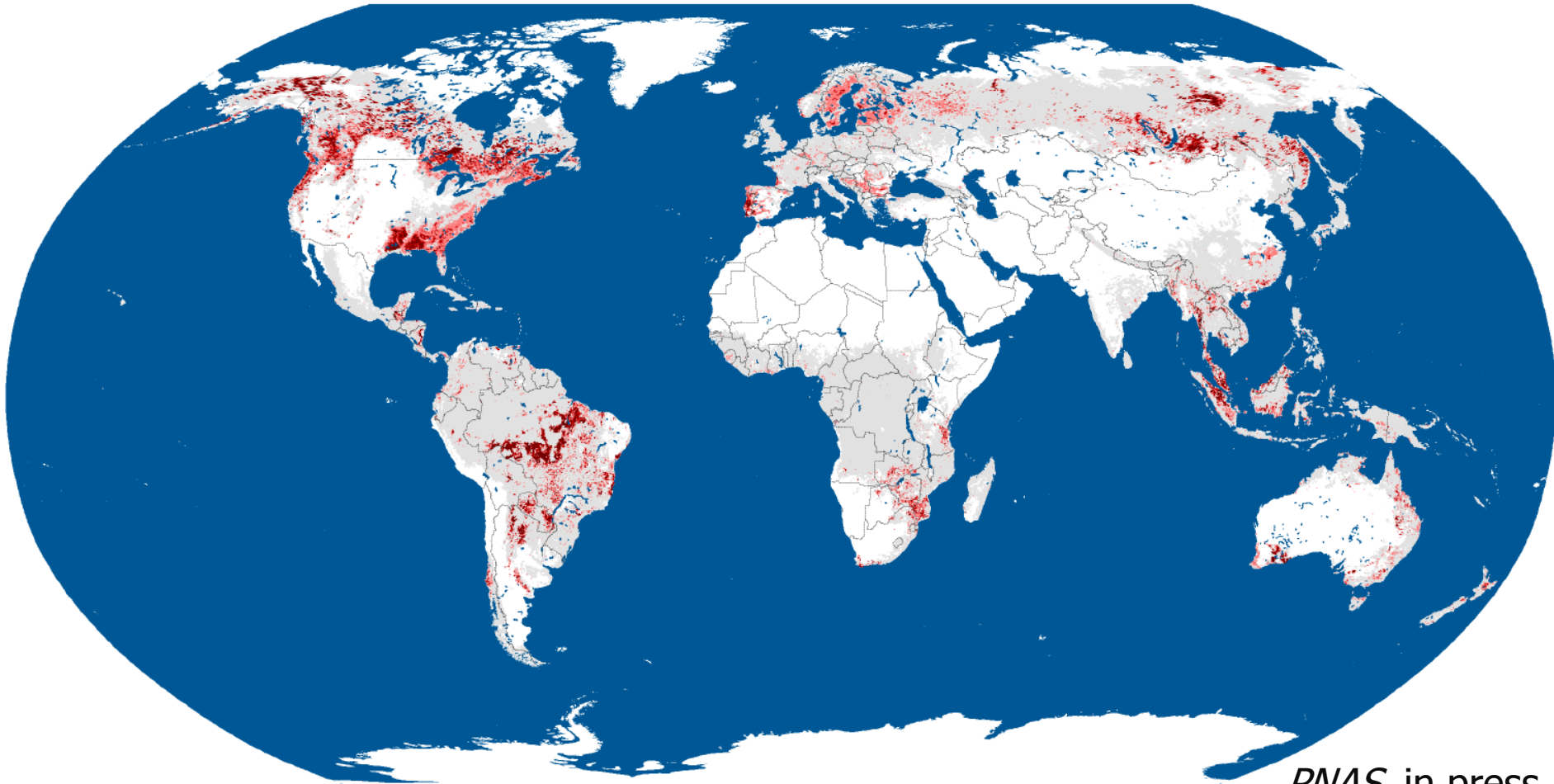
# Percent forest cover, 2000



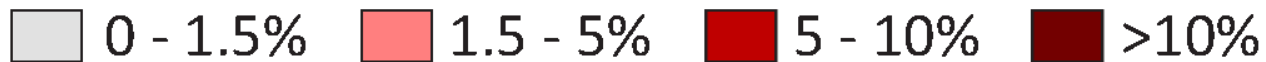
*PNAS, in press*



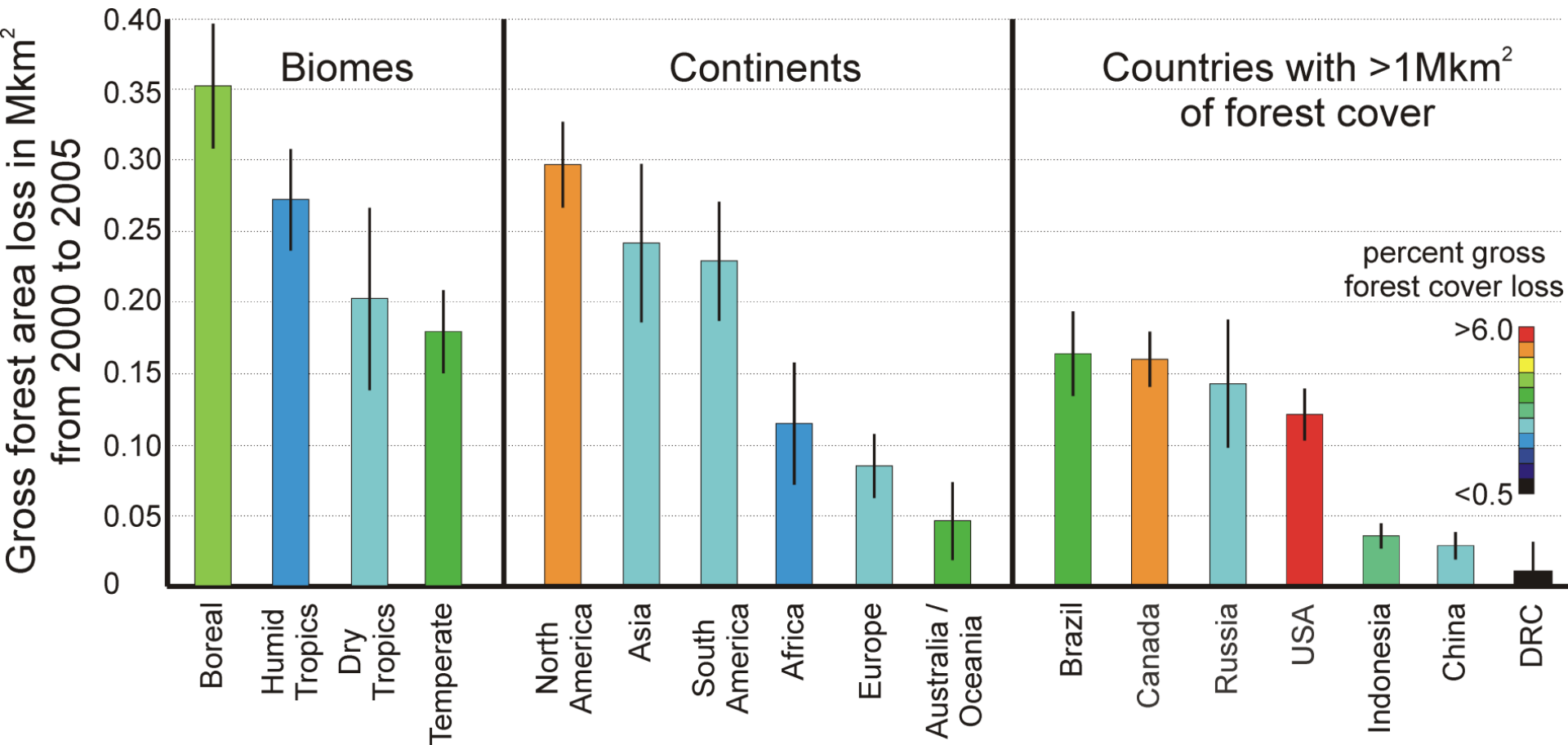
# Percent gross forest cover loss, 2000 to 2005



*PNAS, in press*



# Global gross forest cover loss, 2000 to 2005



*PNAS*, in press

# Data requirements for global forest monitoring

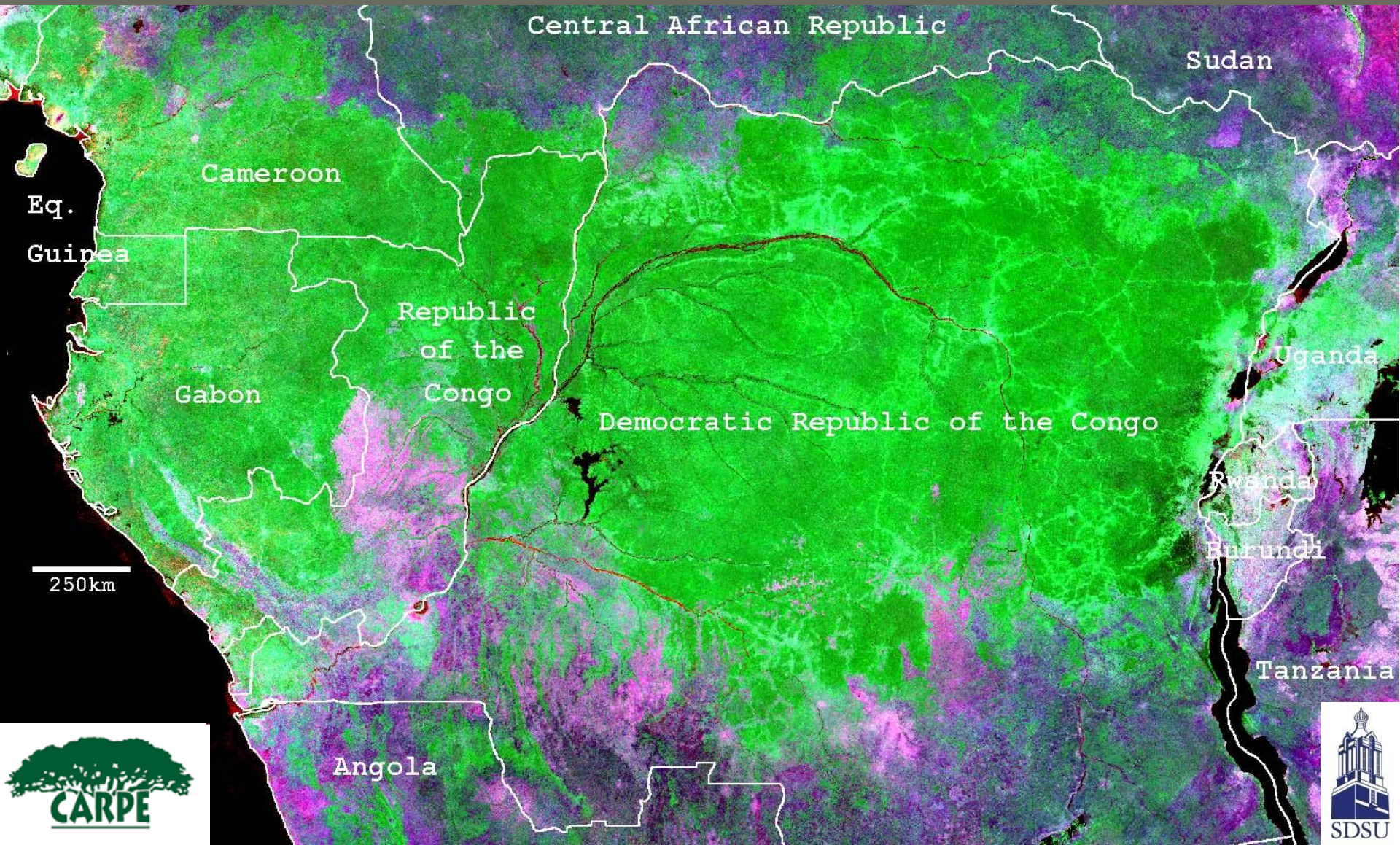
- Systematic global acquisitions
- No/low cost
- Easy access
- Minimal pre-processing required

# Monitoring at national scales in the humid tropics – different situations

- Brazil
  - Large-scale change, most of which is located in seasonally cloud-free region, deforestation
- Indonesia
  - Large-scale change, occurring in persistently cloud-affected region, much topography, active forestry
- Democratic Republic of Congo
  - Fine-scale change, occurring in persistently cloud-affected region

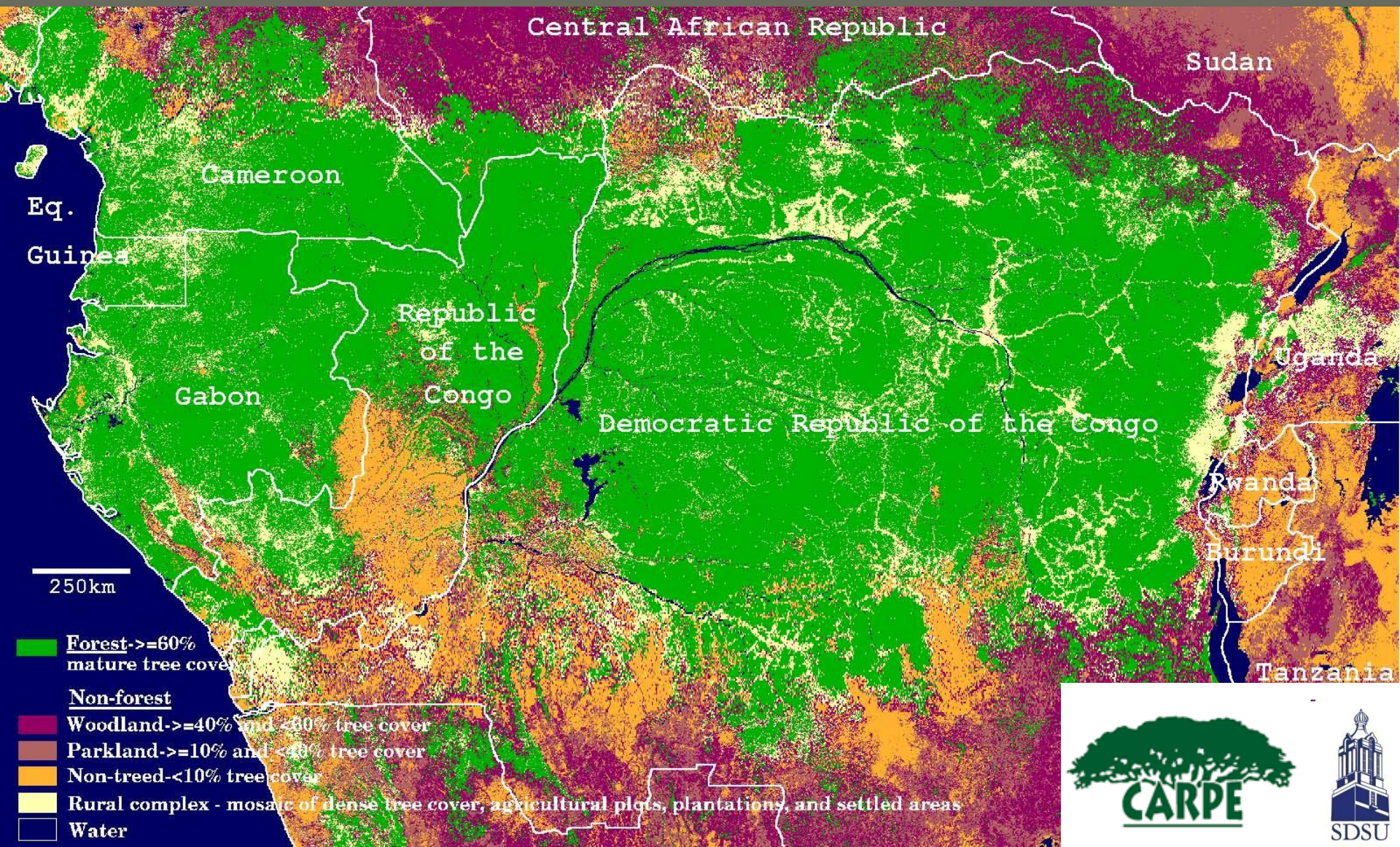


# MODIS time integrated metrics



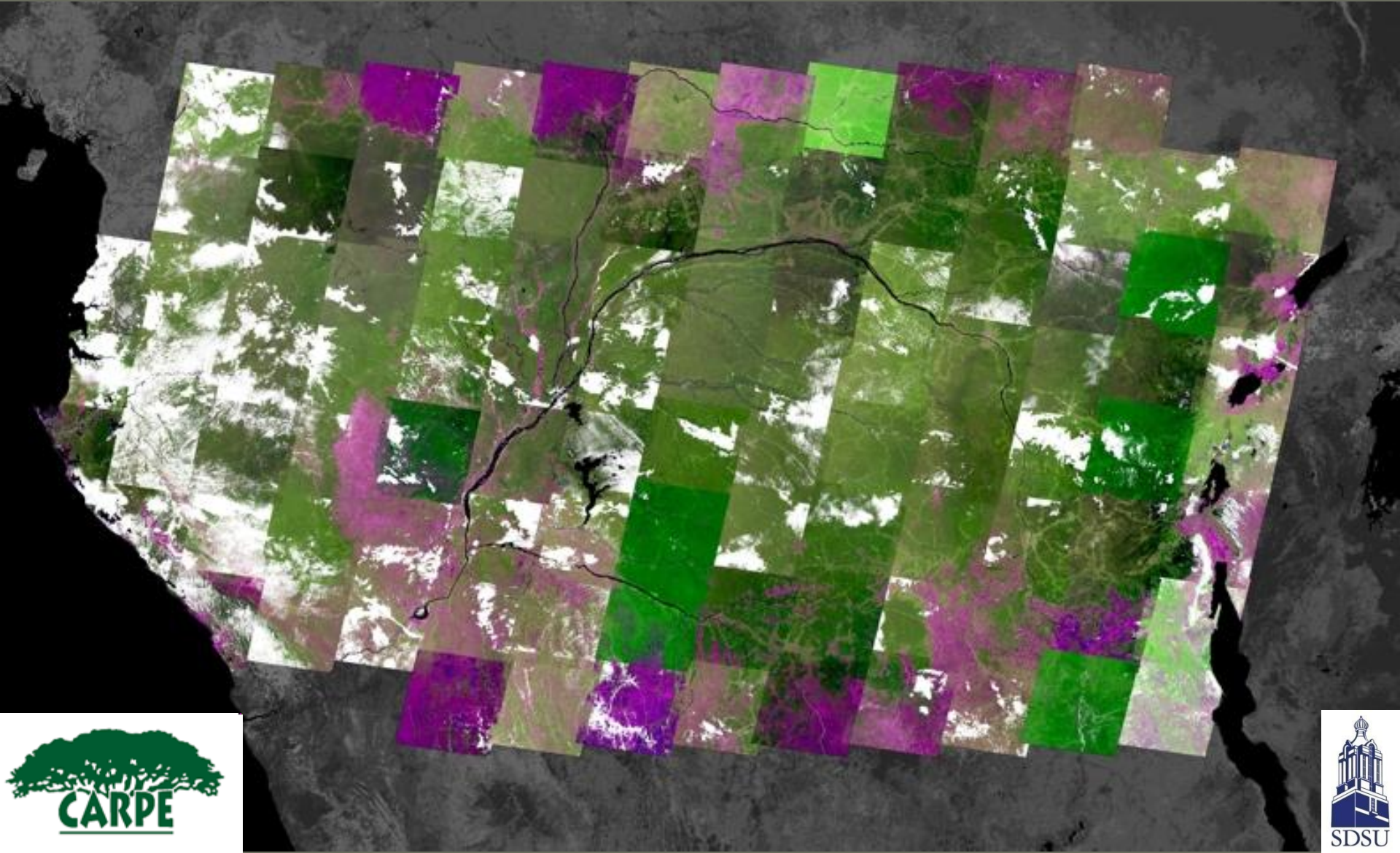


# MODIS forest cover maps as inputs for automated mapping at finer scales in Central Africa



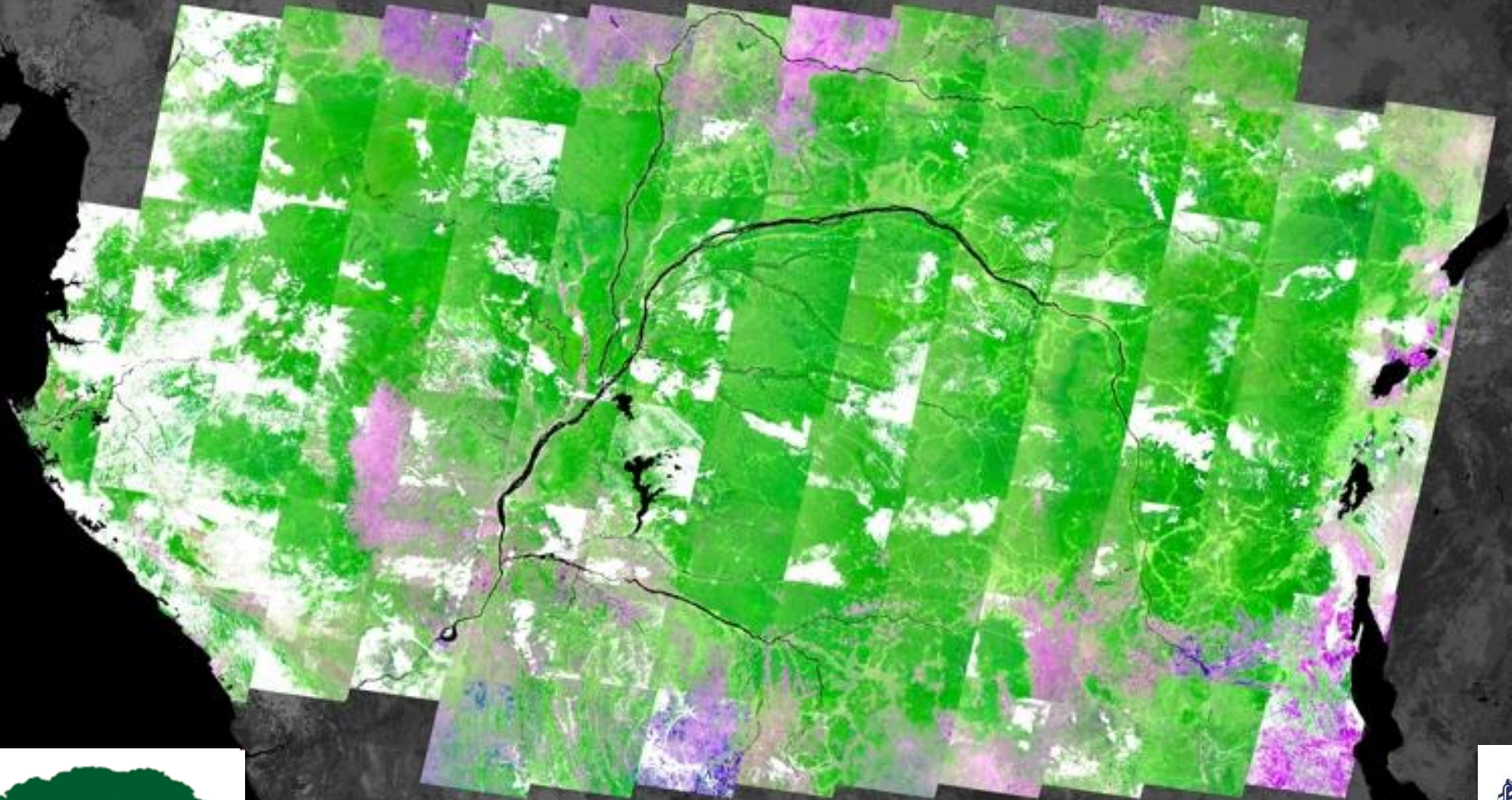


# 2000 Global Land Survey



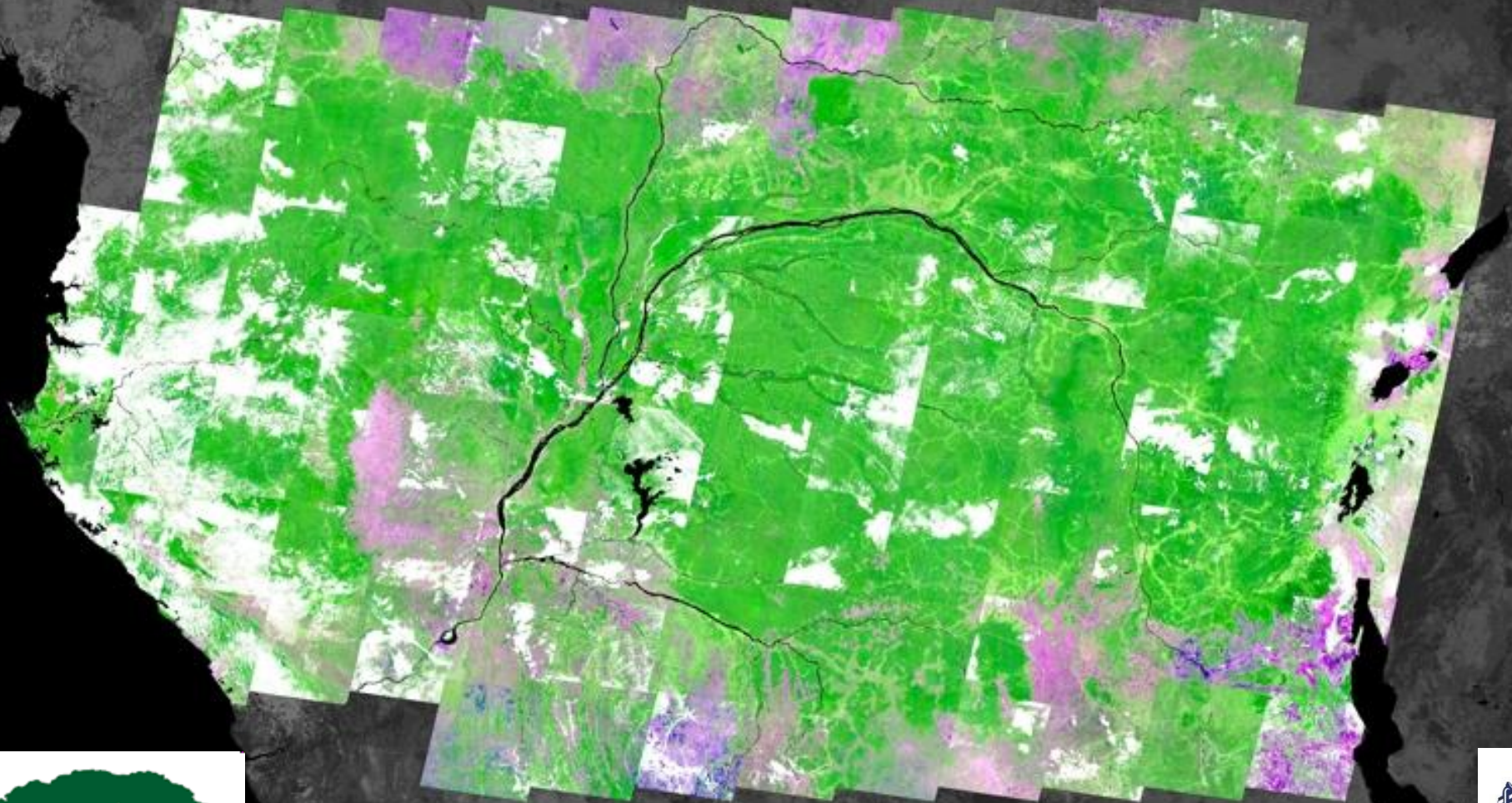


# Bias-adjusted



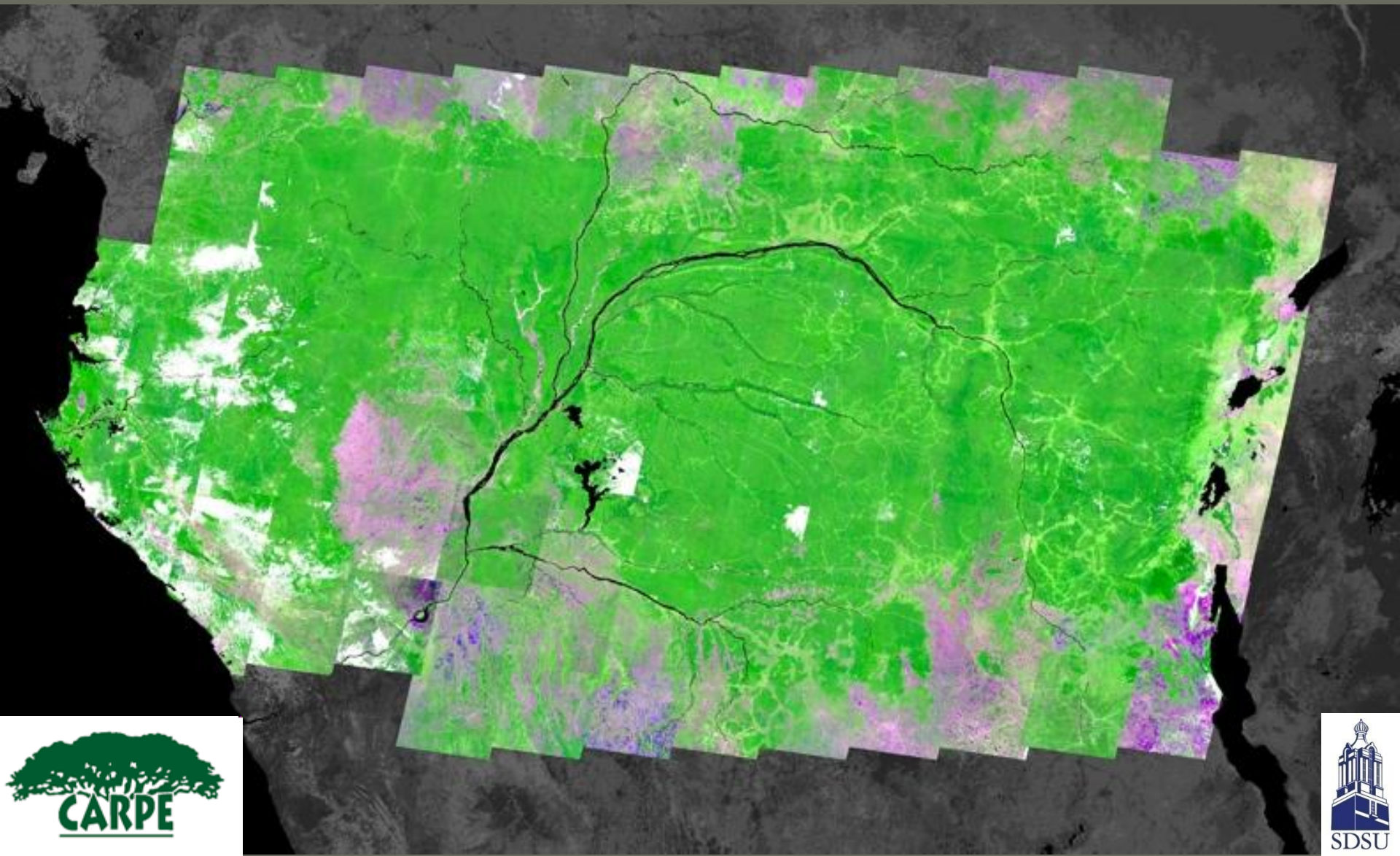


# Anisotropy adjusted



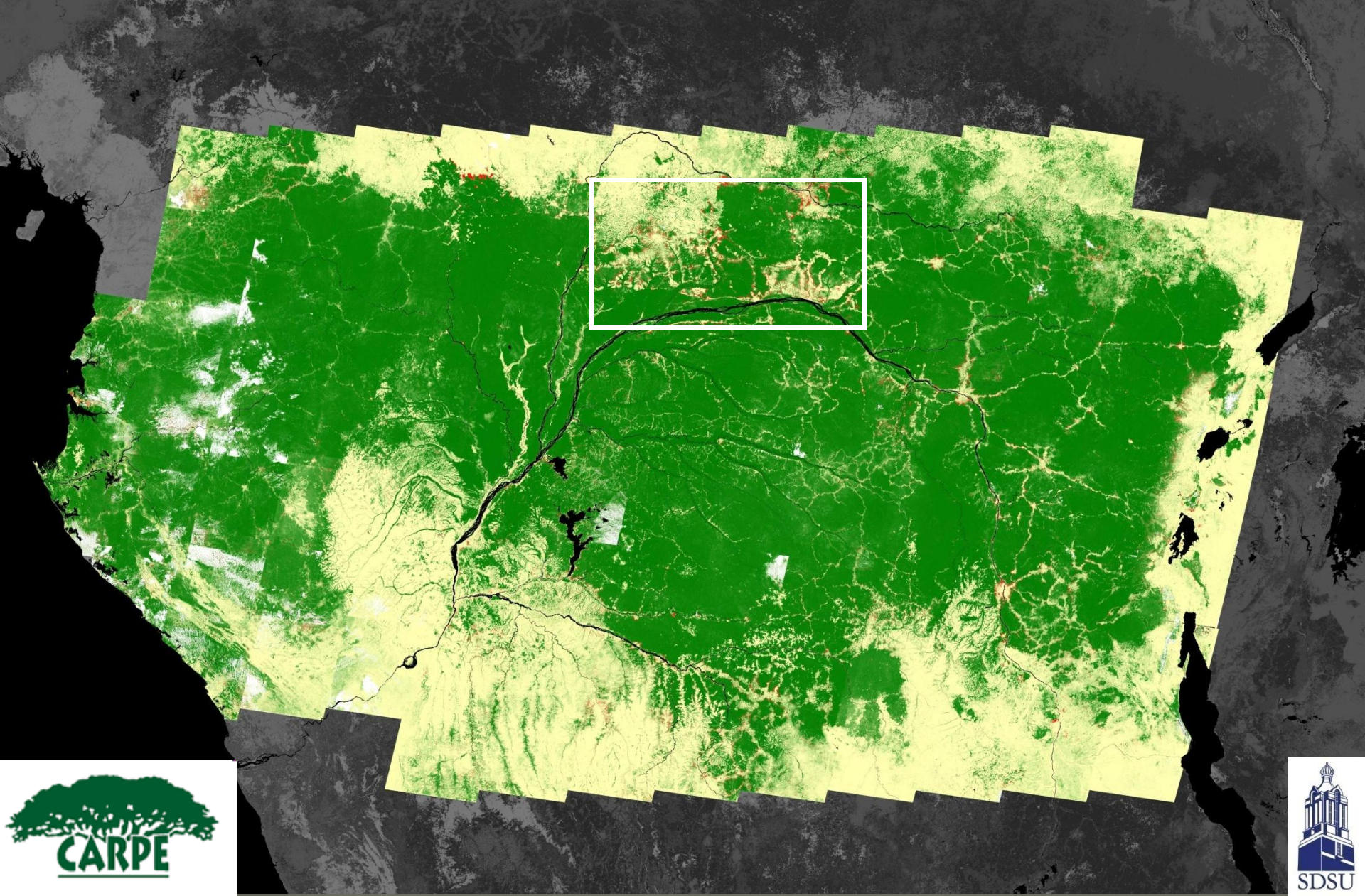


# Image composite (3-5 images per path/row) and epoch



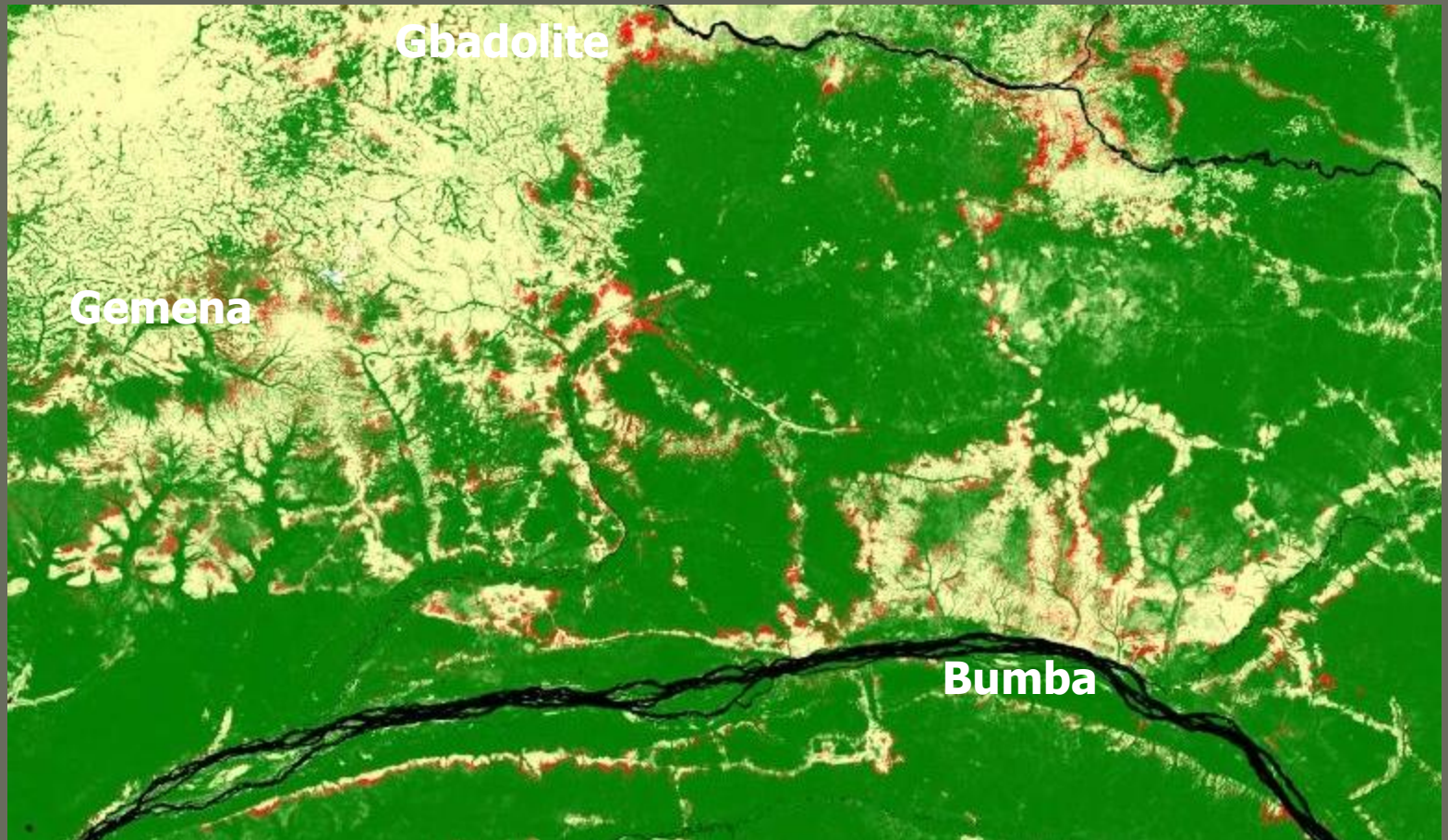


# Landsat forest cover and change





# Landsat forest cover and change



# Forest cover loss 1990-2005

## Cameroon

forest area loss = 2,002.9 km<sup>2</sup>  
percentage = 1.01%

## Central African Republic

forest area loss = 2,860.8 km<sup>2</sup>  
percentage = 4.91%

## Equatorial Guinea

forest area loss = 273.6 km<sup>2</sup>  
percentage = 1.14%

## Gabon

forest area loss = 2,317.6 km<sup>2</sup>  
percentage = 1.00%

## Republic of Congo

forest area loss = 1,723.0 km<sup>2</sup>  
percentage = 0.82%

## Congo Basin

forest area = 1,796,708.6 km<sup>2</sup>  
forest area loss = 38,767.9 km<sup>2</sup>  
percentage = 2.16%

## Democratic Republic of the Congo

forest area loss = 25,589.9 km<sup>2</sup>  
percentage = 2.66%





2000-2

1272 images

2003-5

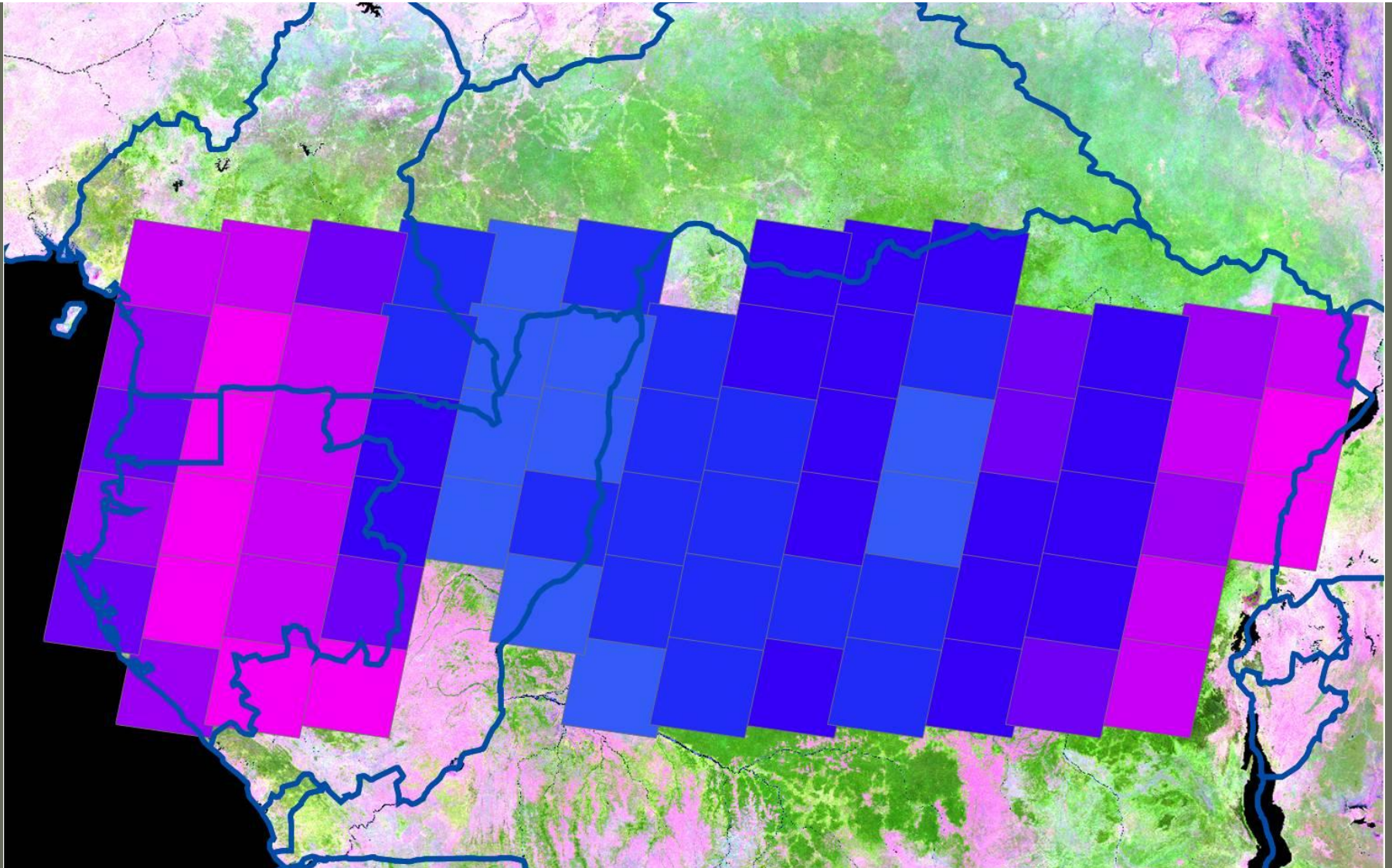
1258 images

2006-8

1200 images



# Number of images in the USGS/EROS archive

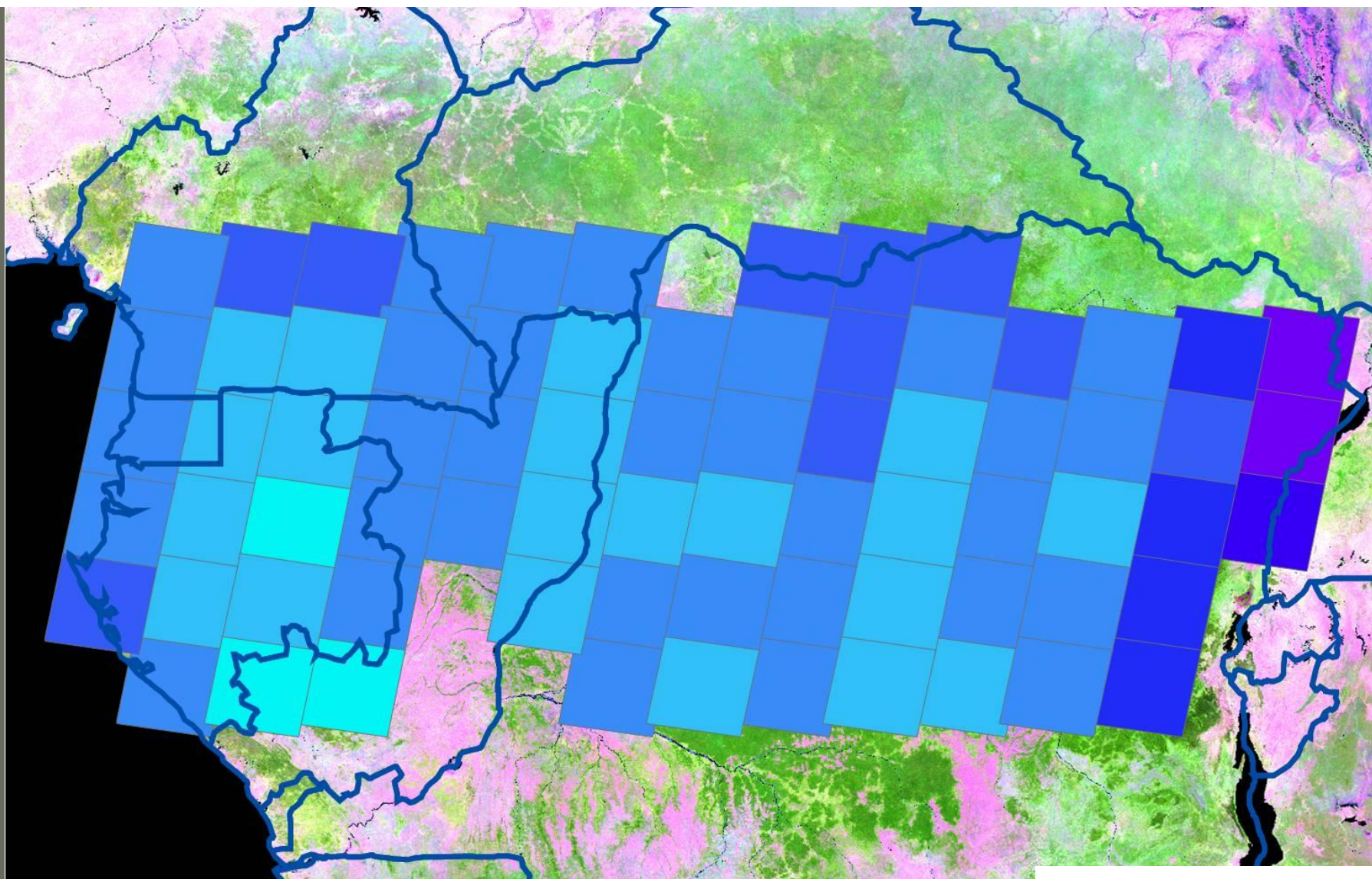


# of images: 10 – 55 – 110





# Number of images with < 50 ACCA cloud cover

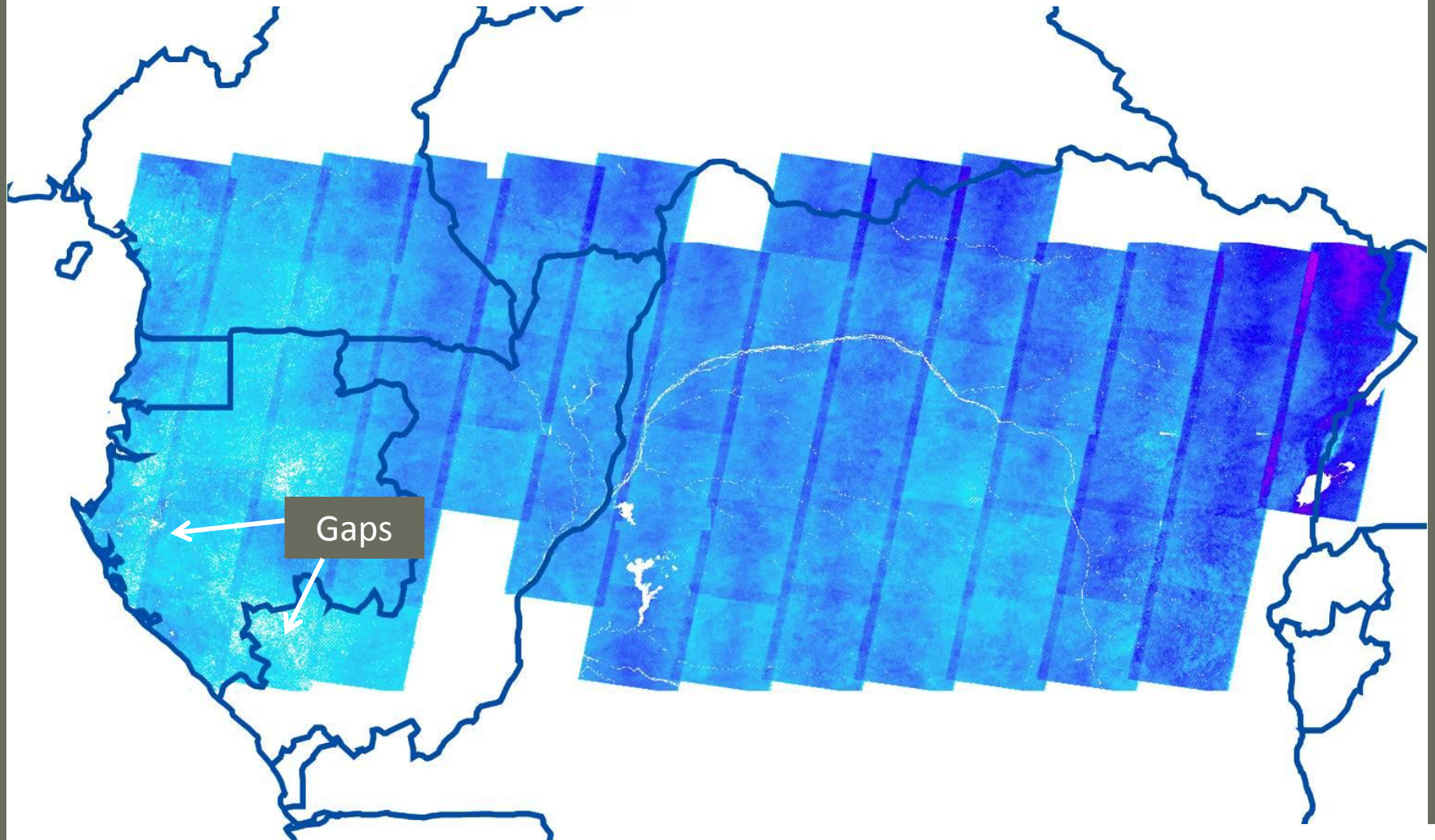


# of images: 10 – 55 – 110





# Number of good observations per pixel for 2003-2005 composite



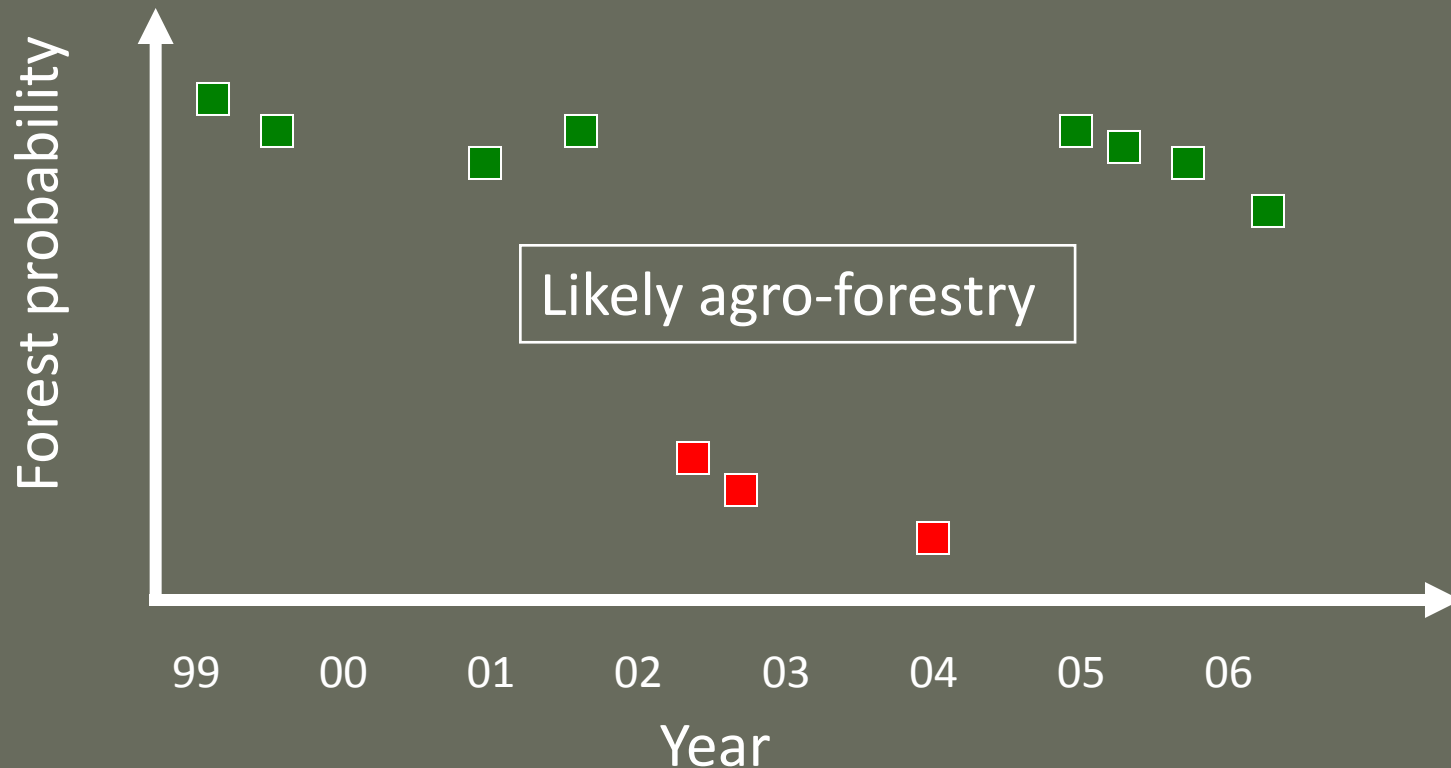
# of images: 1 – 20 – 40



# Different approaches

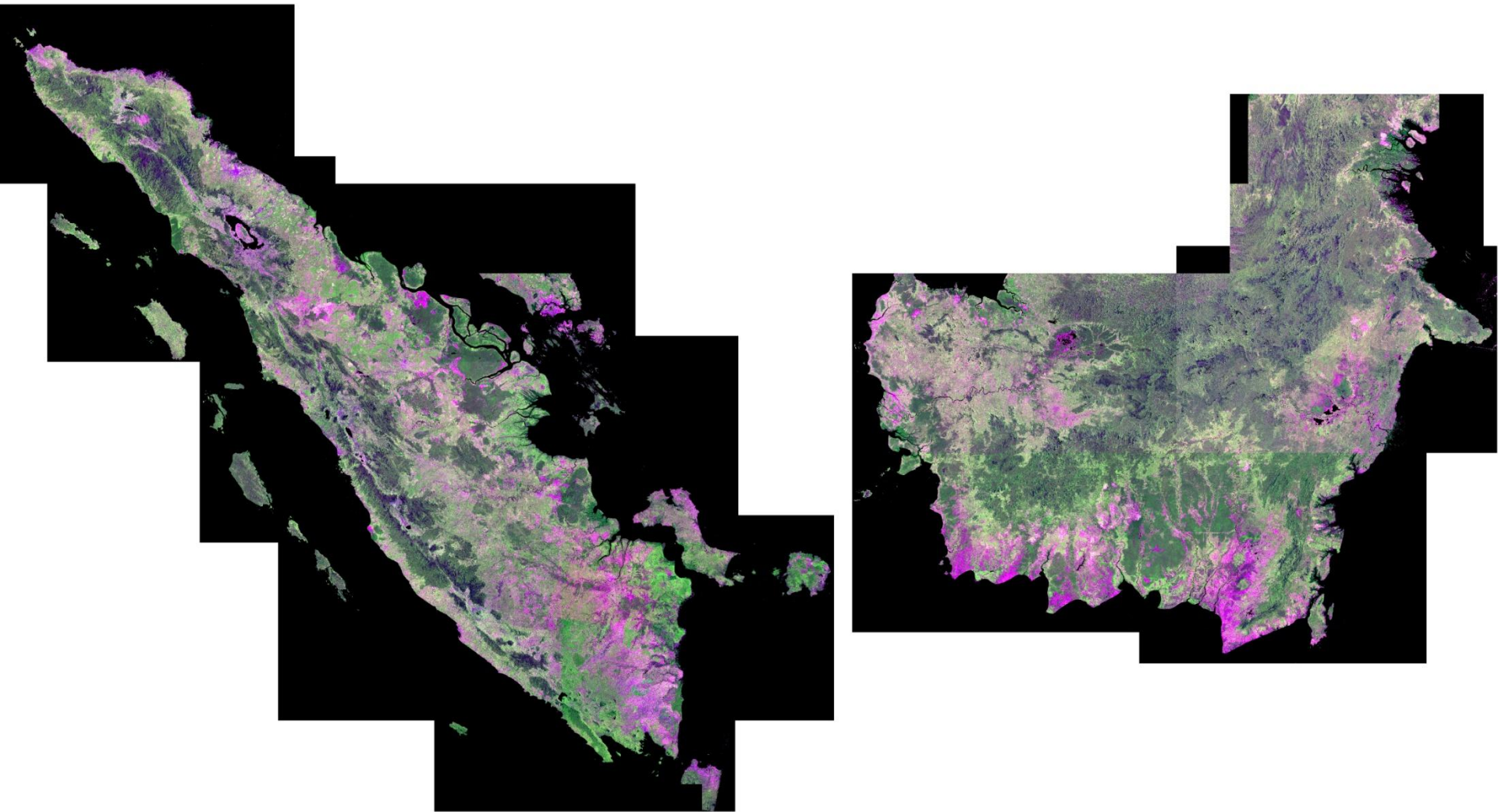
- 1) Epochal composites
  - Combine best observations over a given interval to create cloud-free image
  - Cloud-free composites require such a long compositing period that change occurs within the composite interval
- 2) Time-series characterizations
  - Map each good pixel and create time-series of forest cover estimates in metric space
  - No image composite needed
  - Unequal numbers of cover estimates over the regions (scene overlaps, SLC-off gaps)

# Per-pixel time series analysis using all good observations



Interpretation: ■ = forest      ■ = no-forest

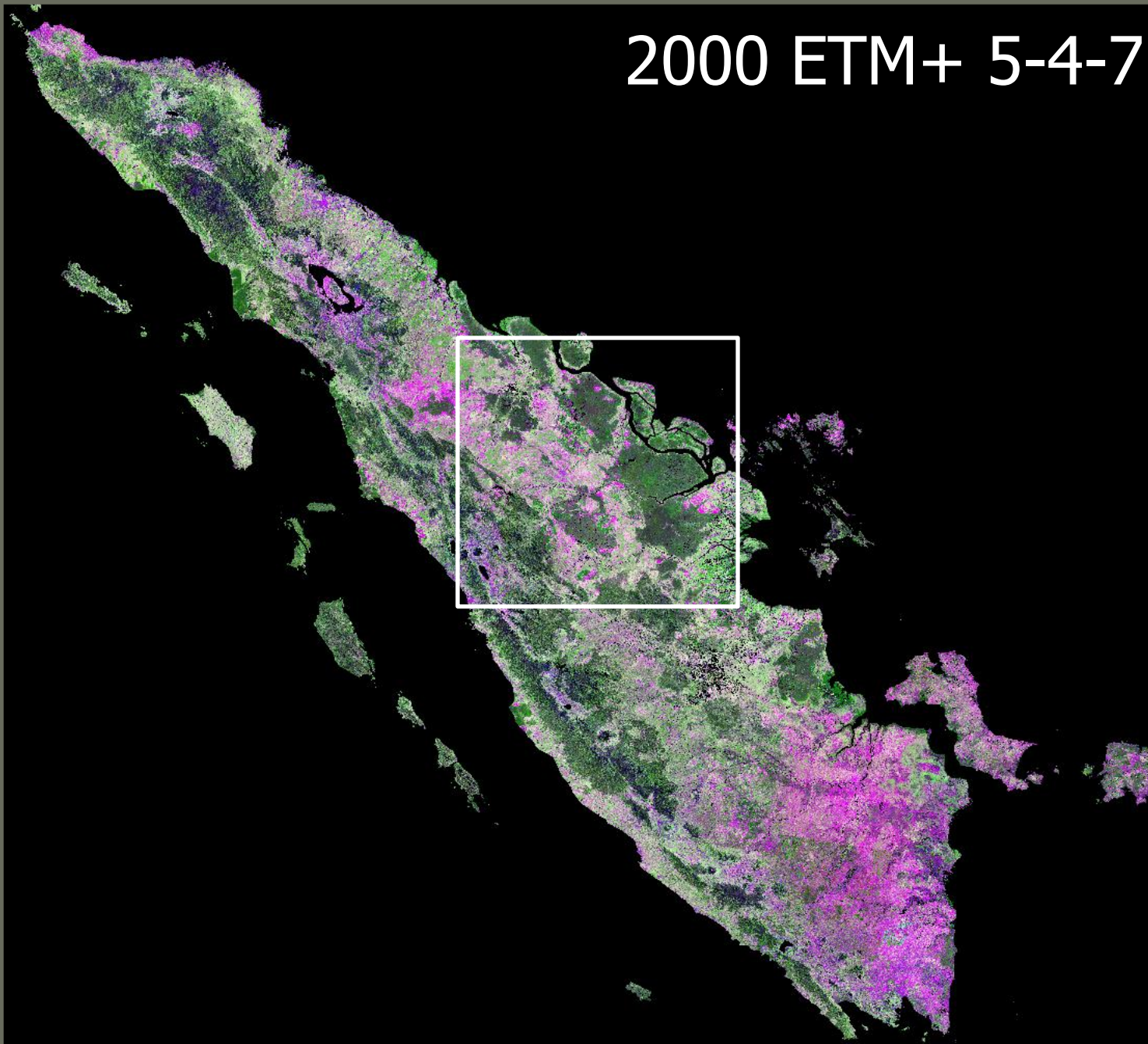
# Indonesia, 1999 to 2009



6,189 images

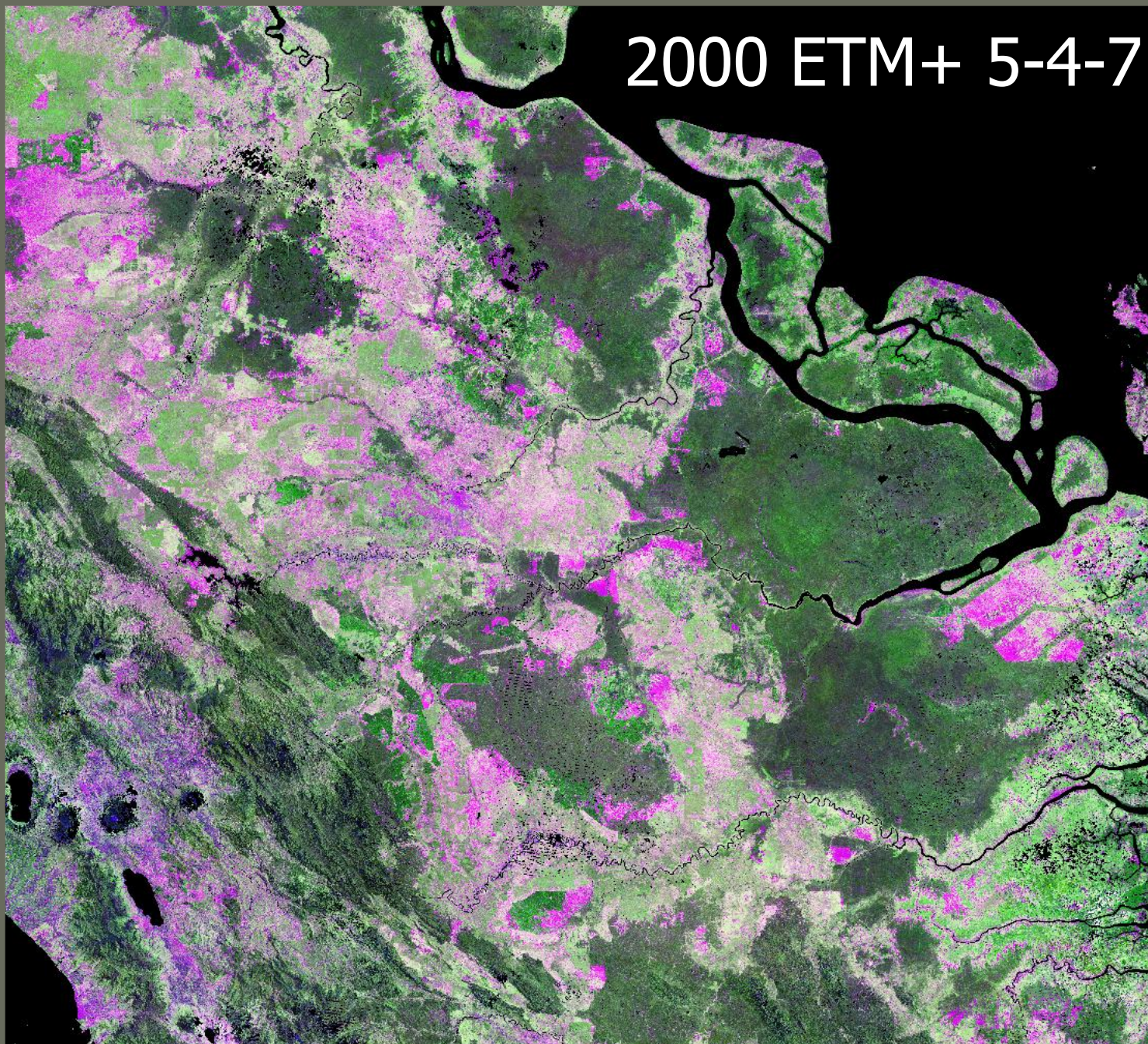


2000 ETM+ 5-4-7

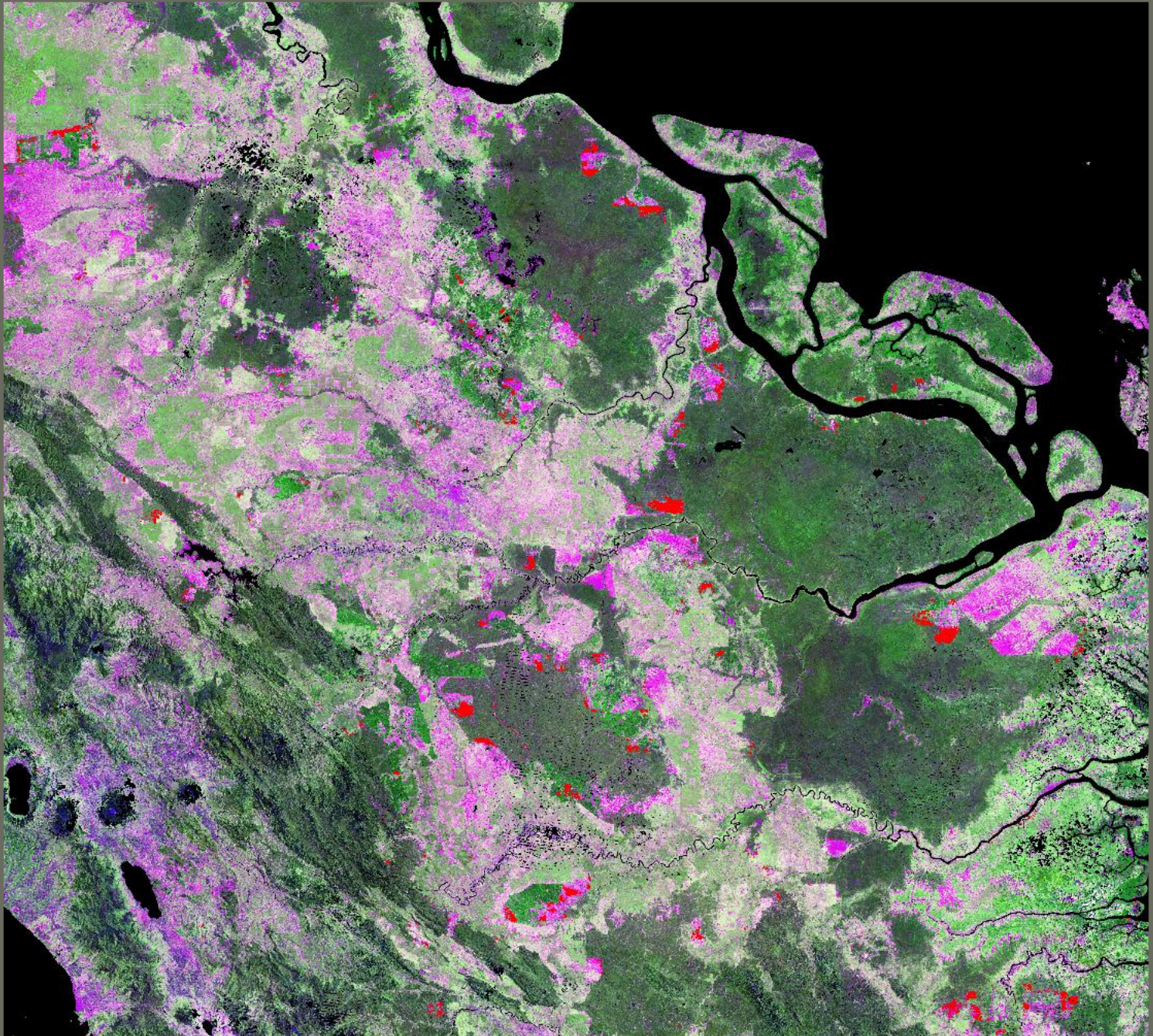




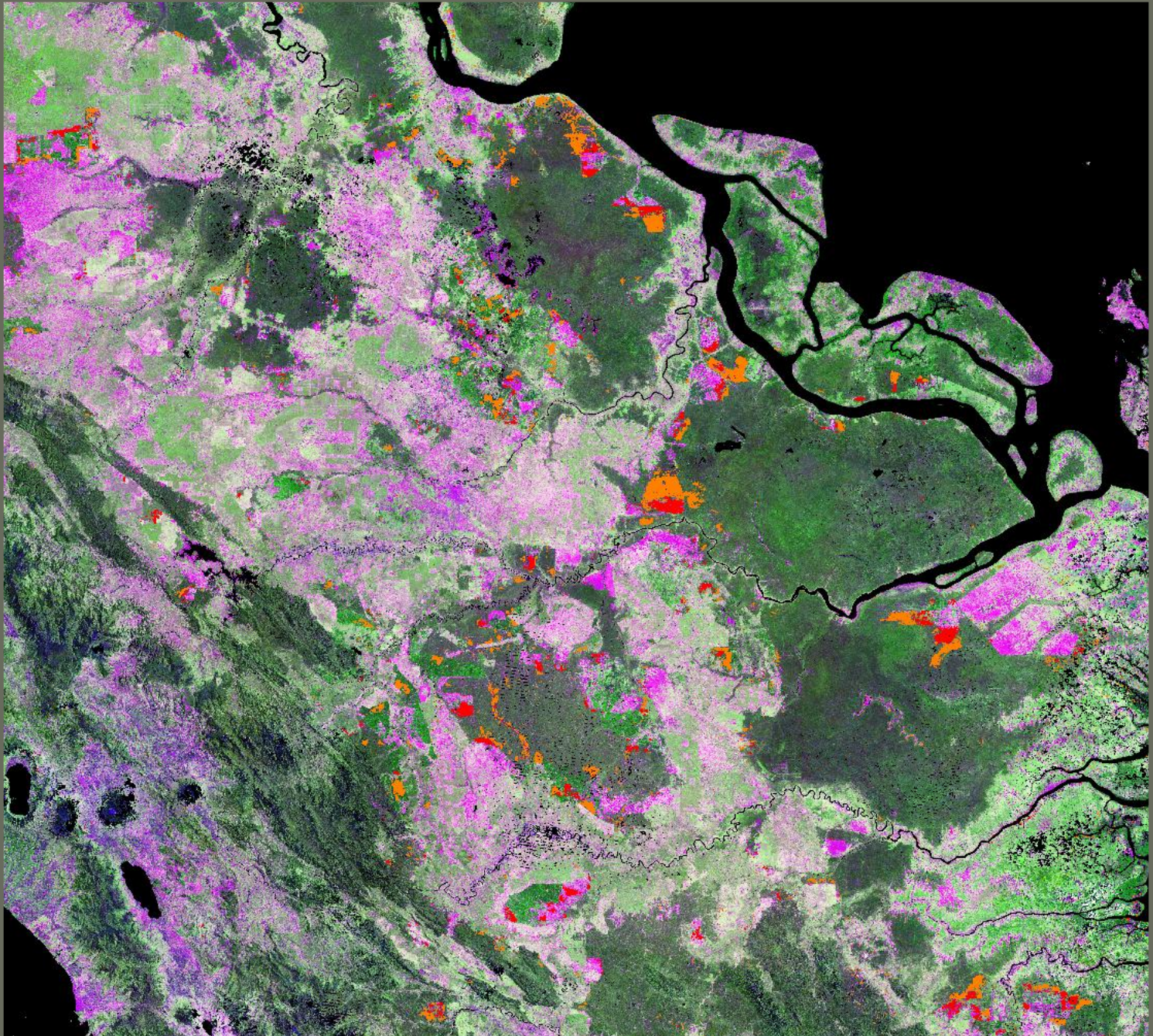
2000 ETM+ 5-4-7



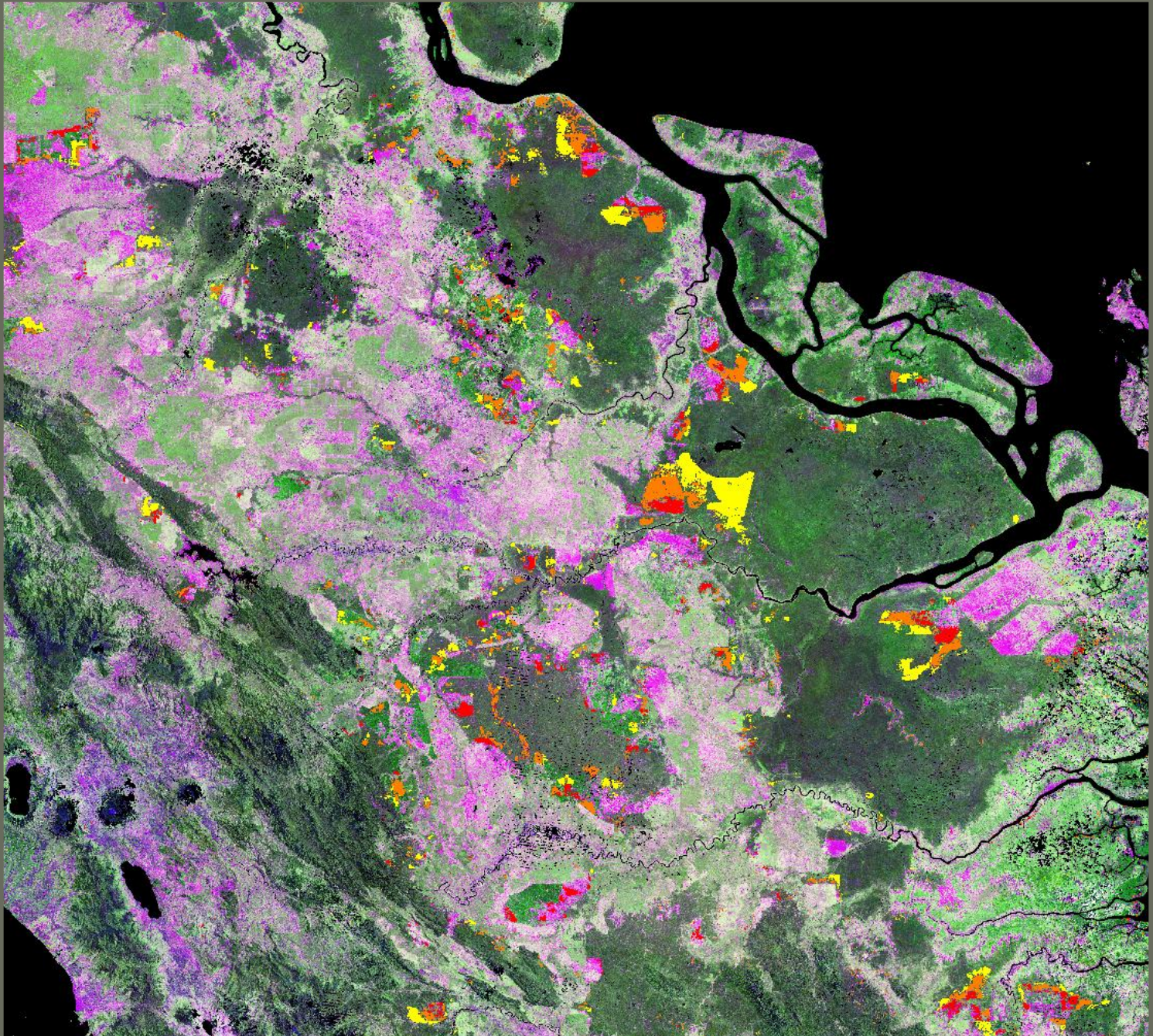




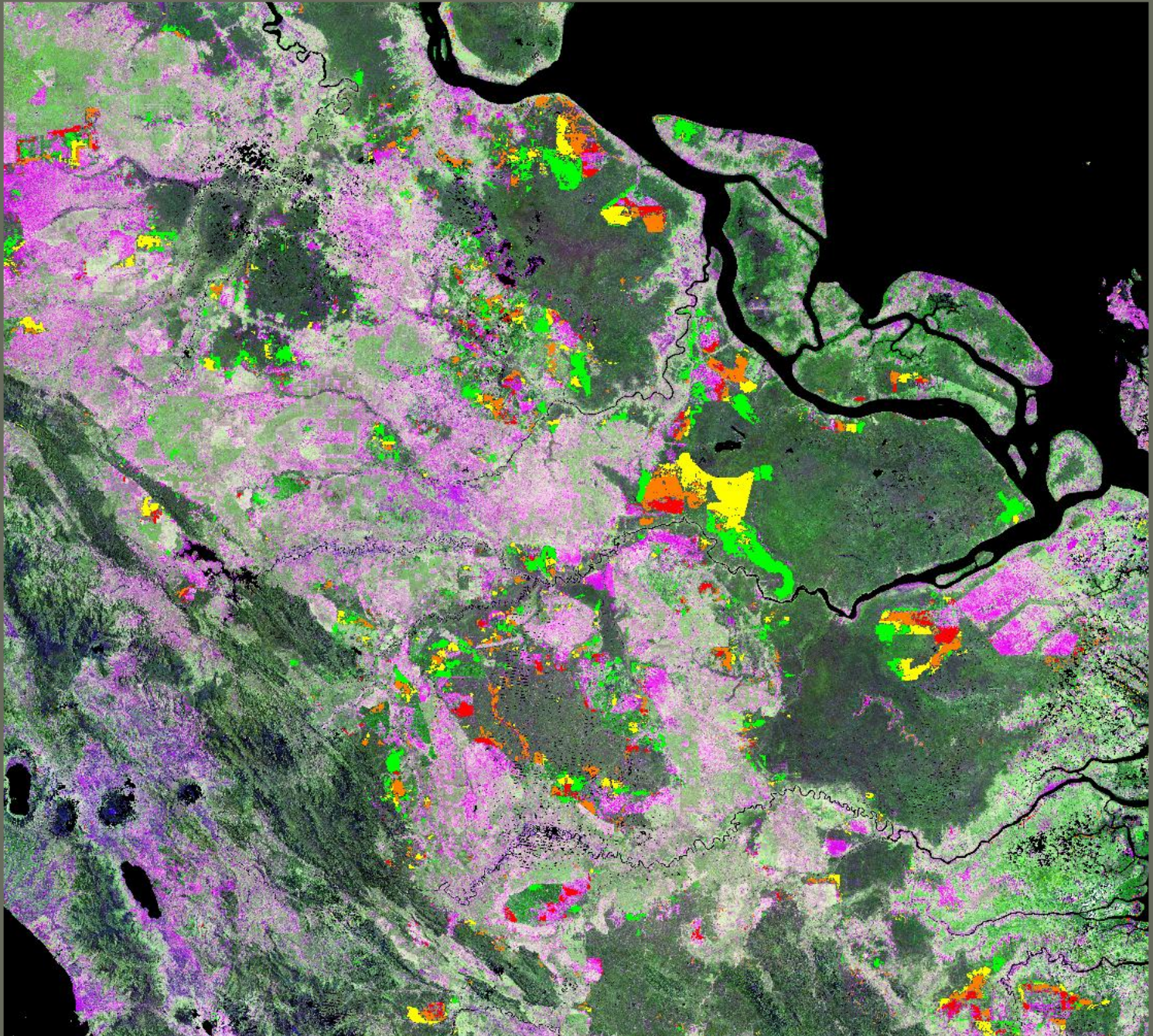




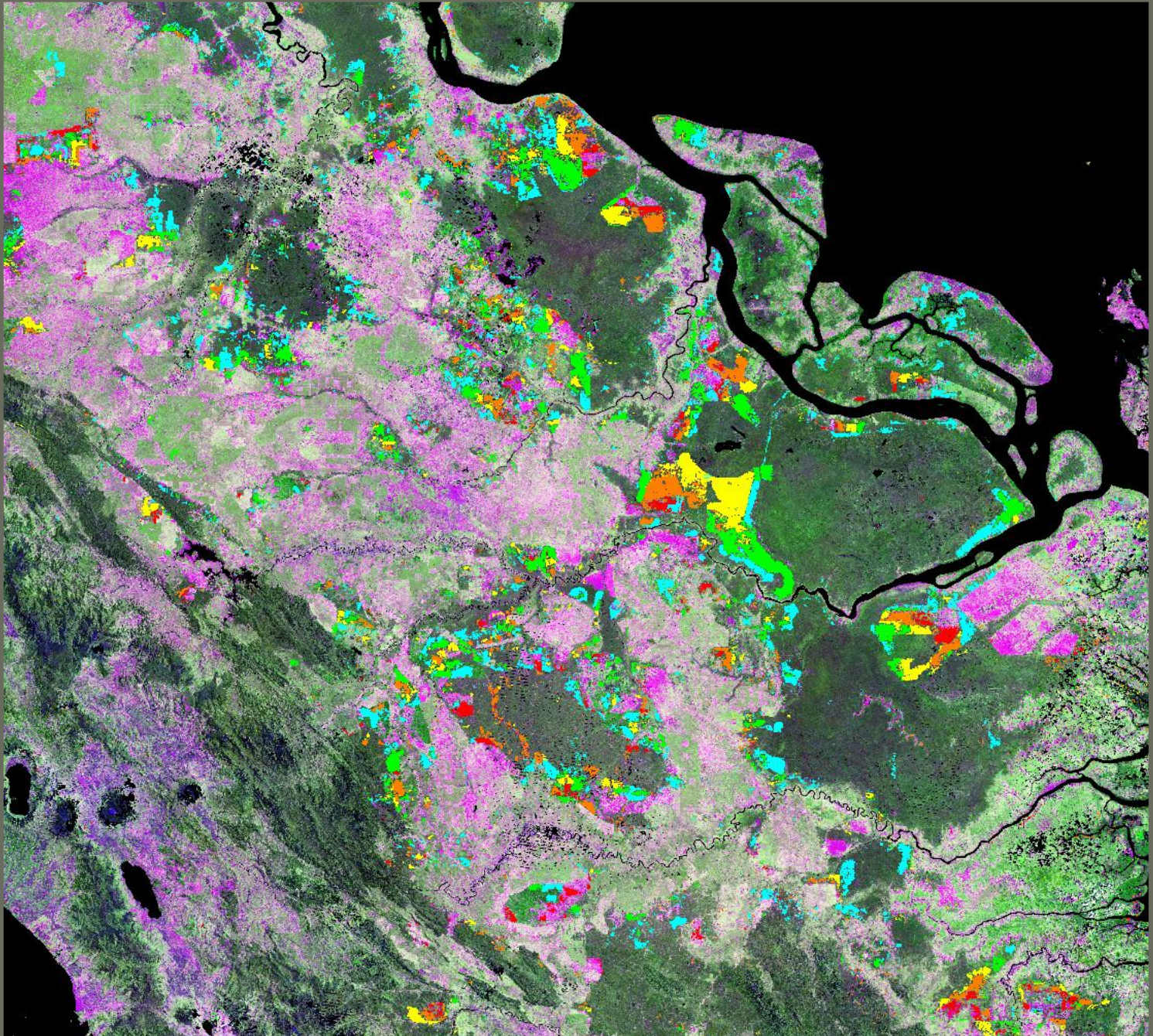




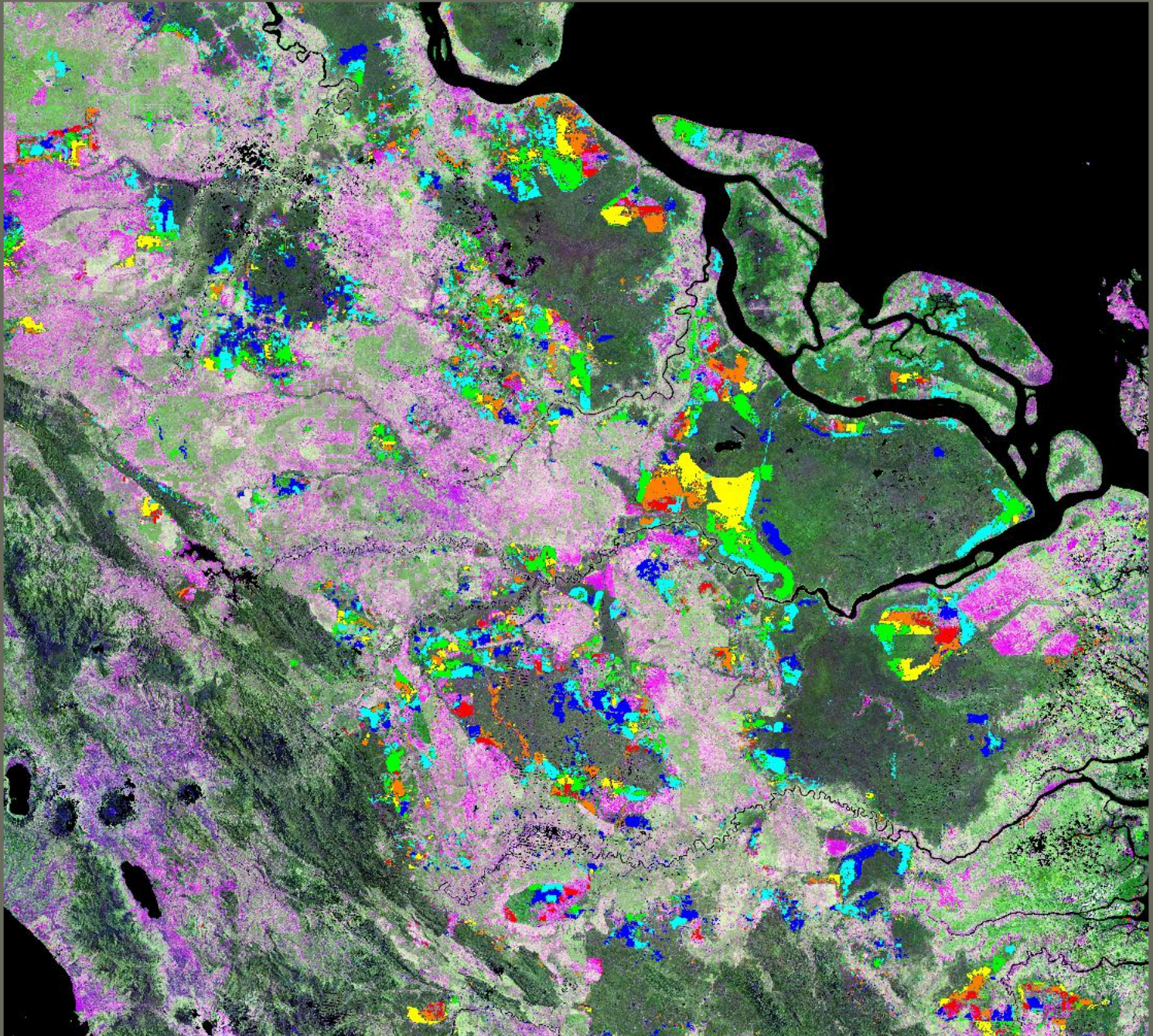




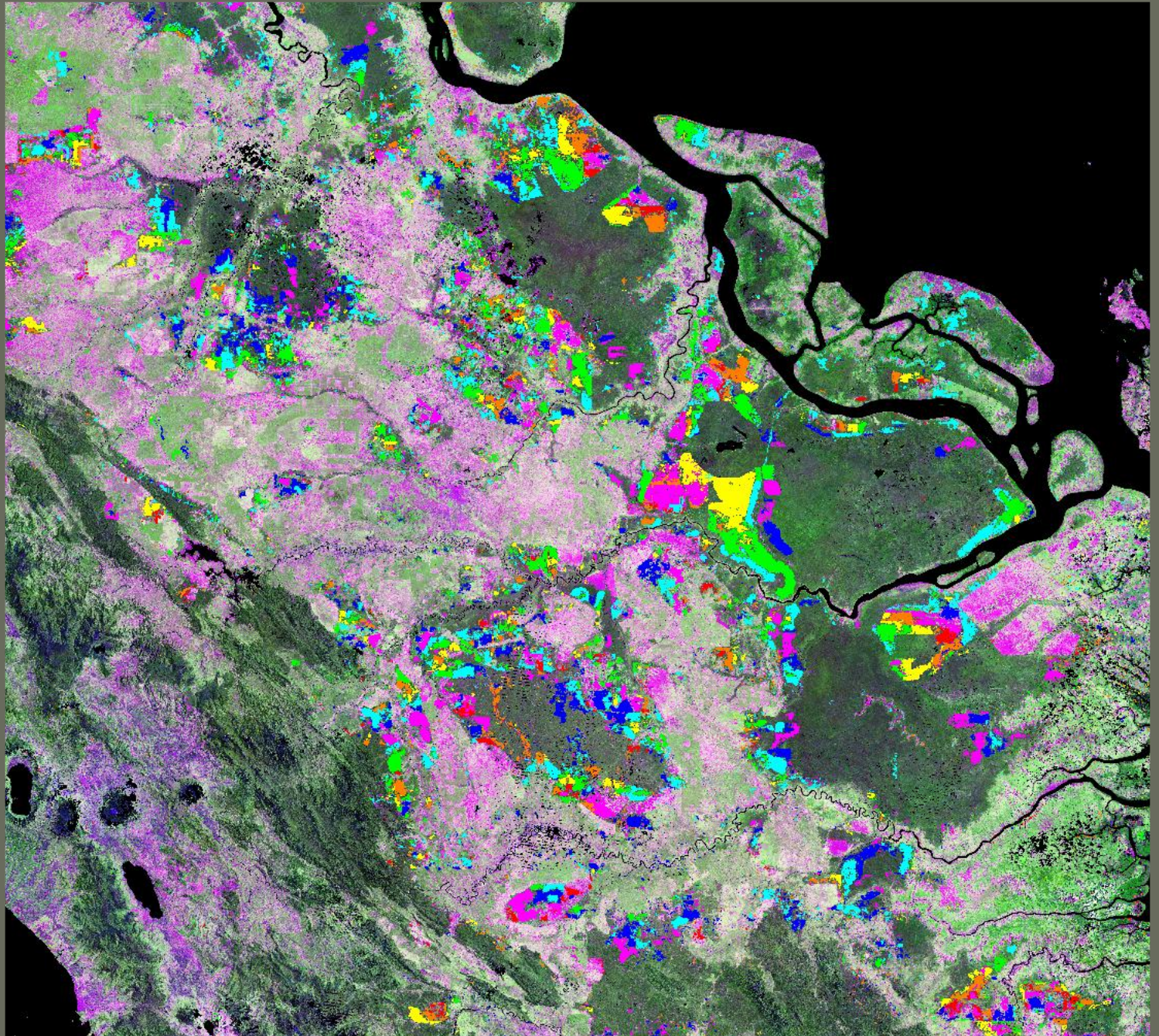






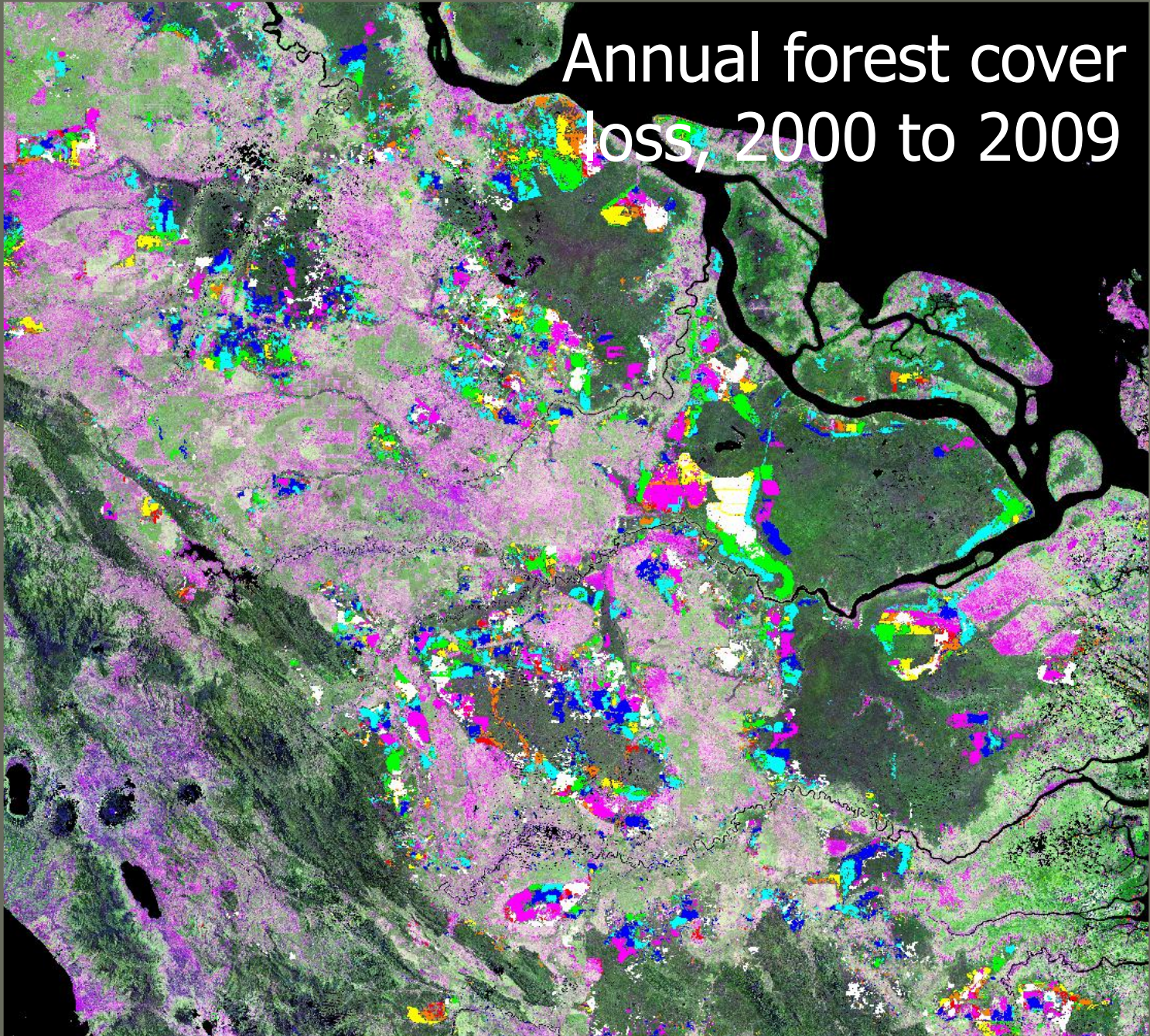






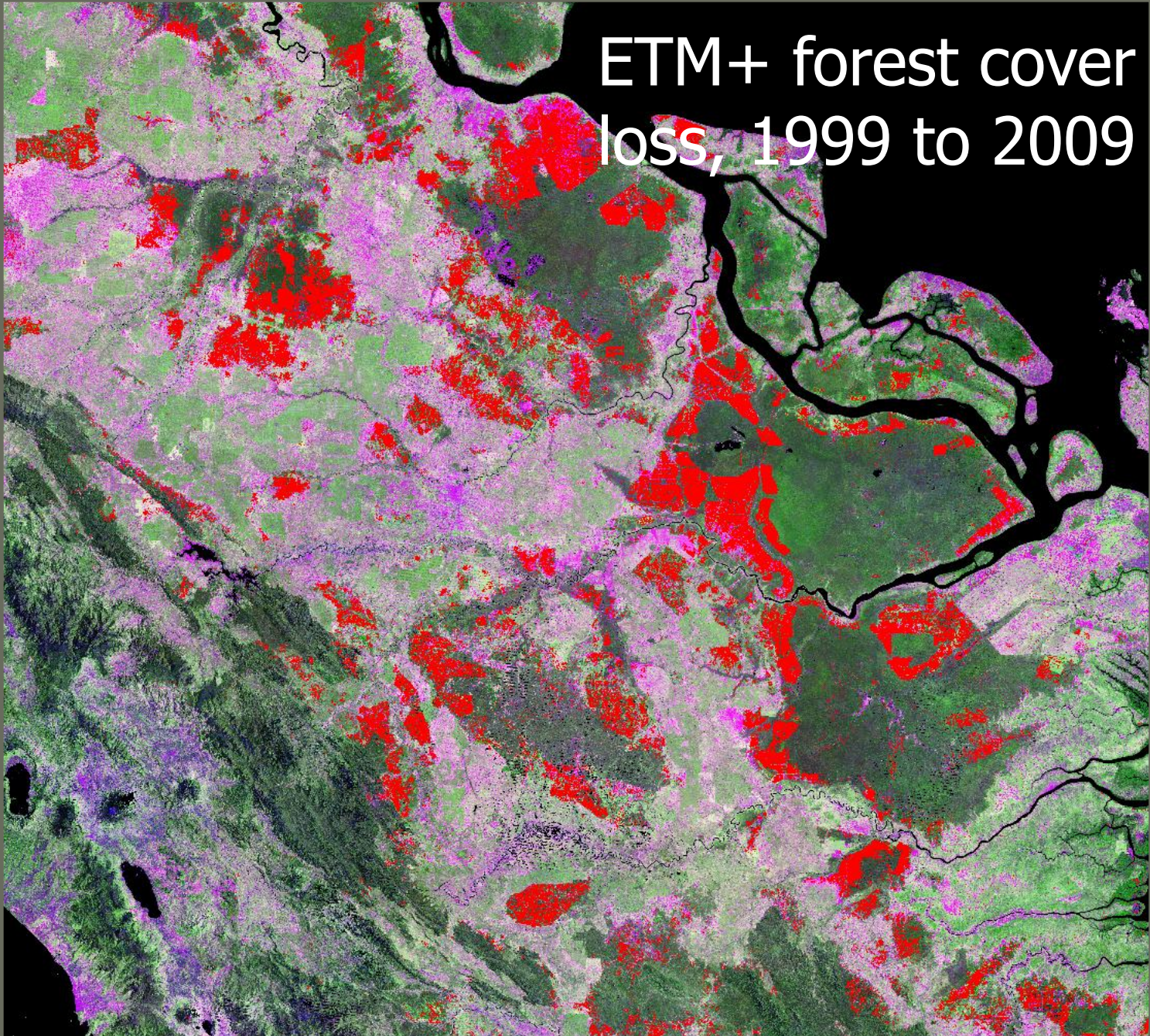


# Annual forest cover loss, 2000 to 2009



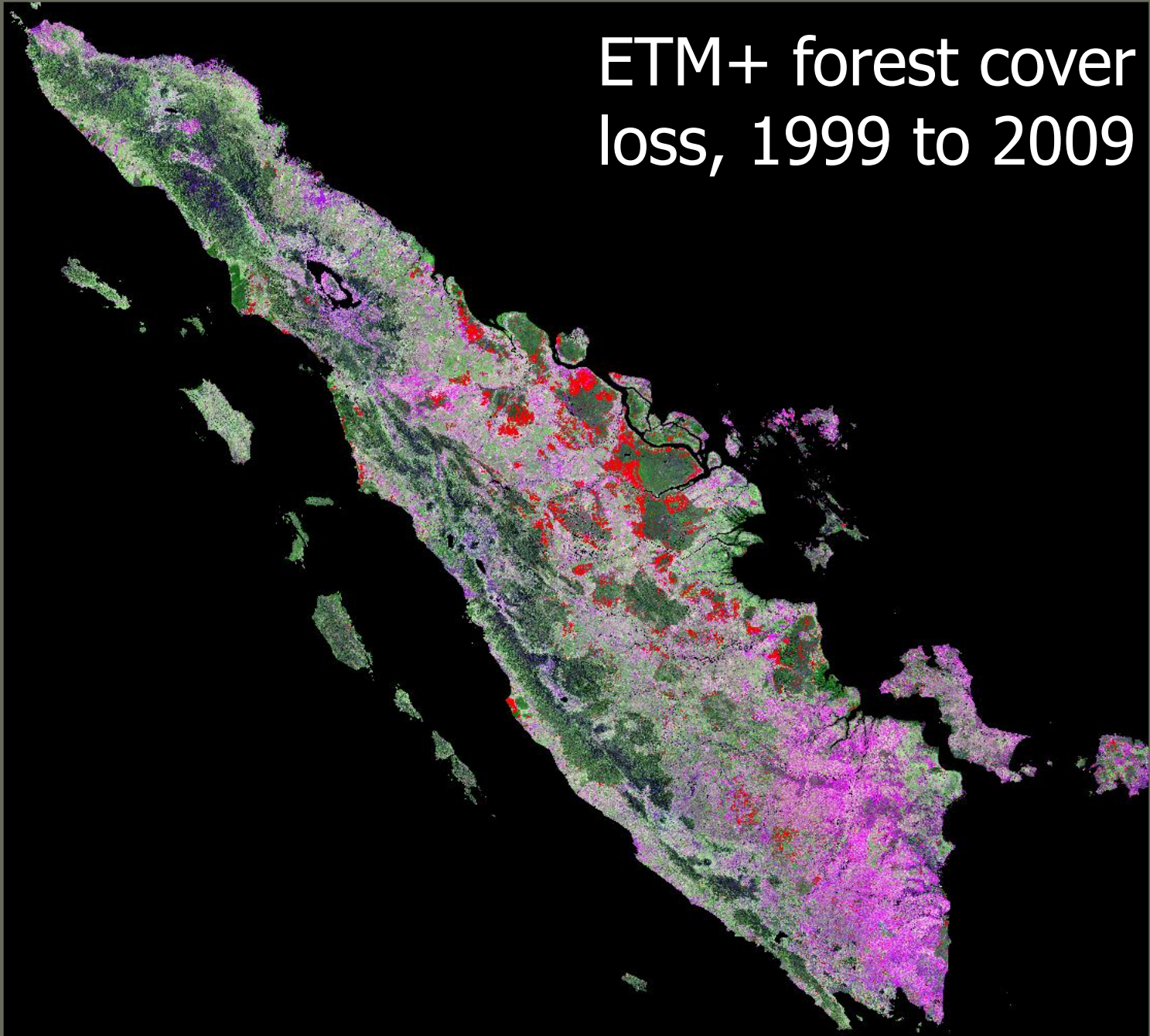


# ETM+ forest cover loss, 1999 to 2009





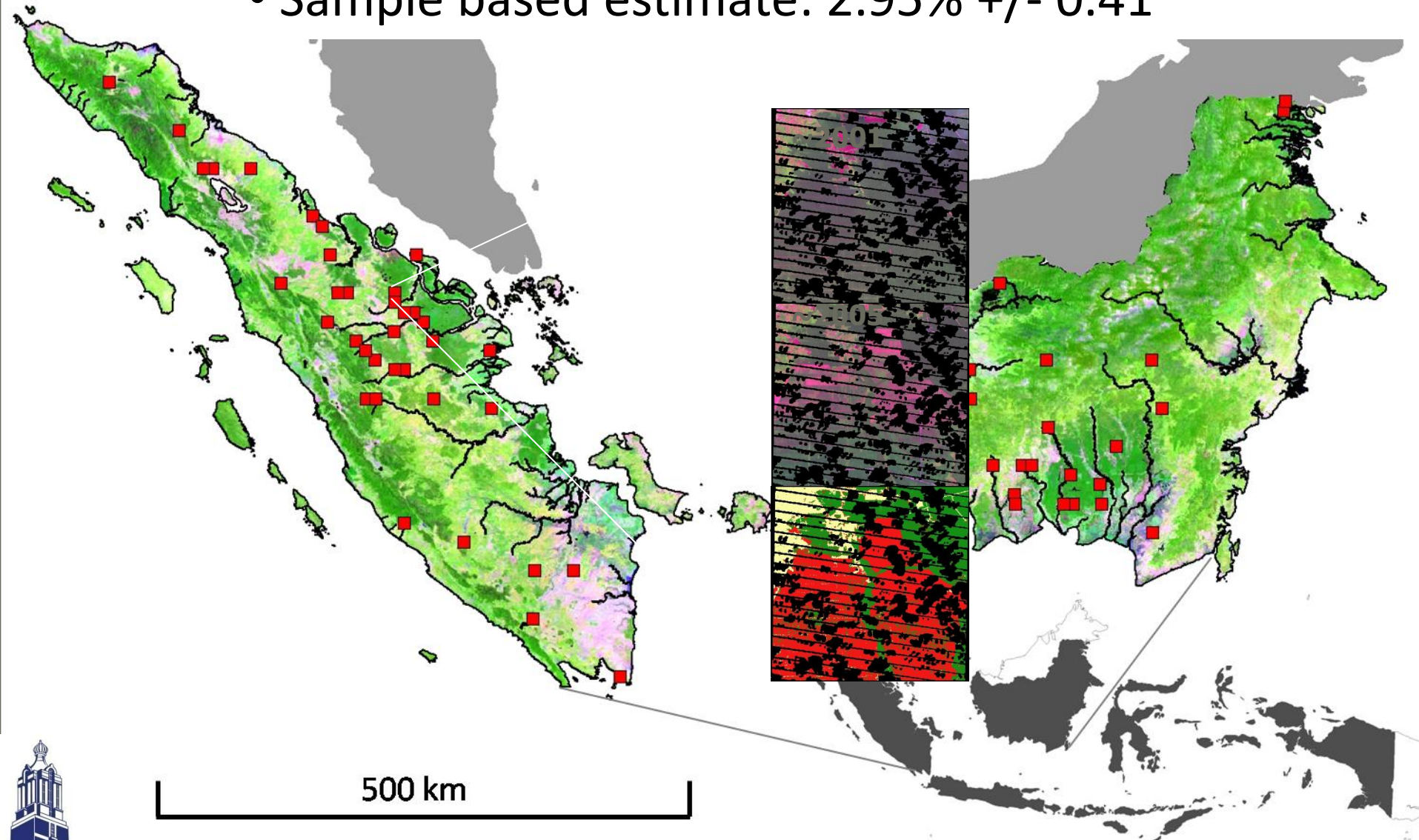
# ETM+ forest cover loss, 1999 to 2009





# Validation data of forest cover loss 2000-2005

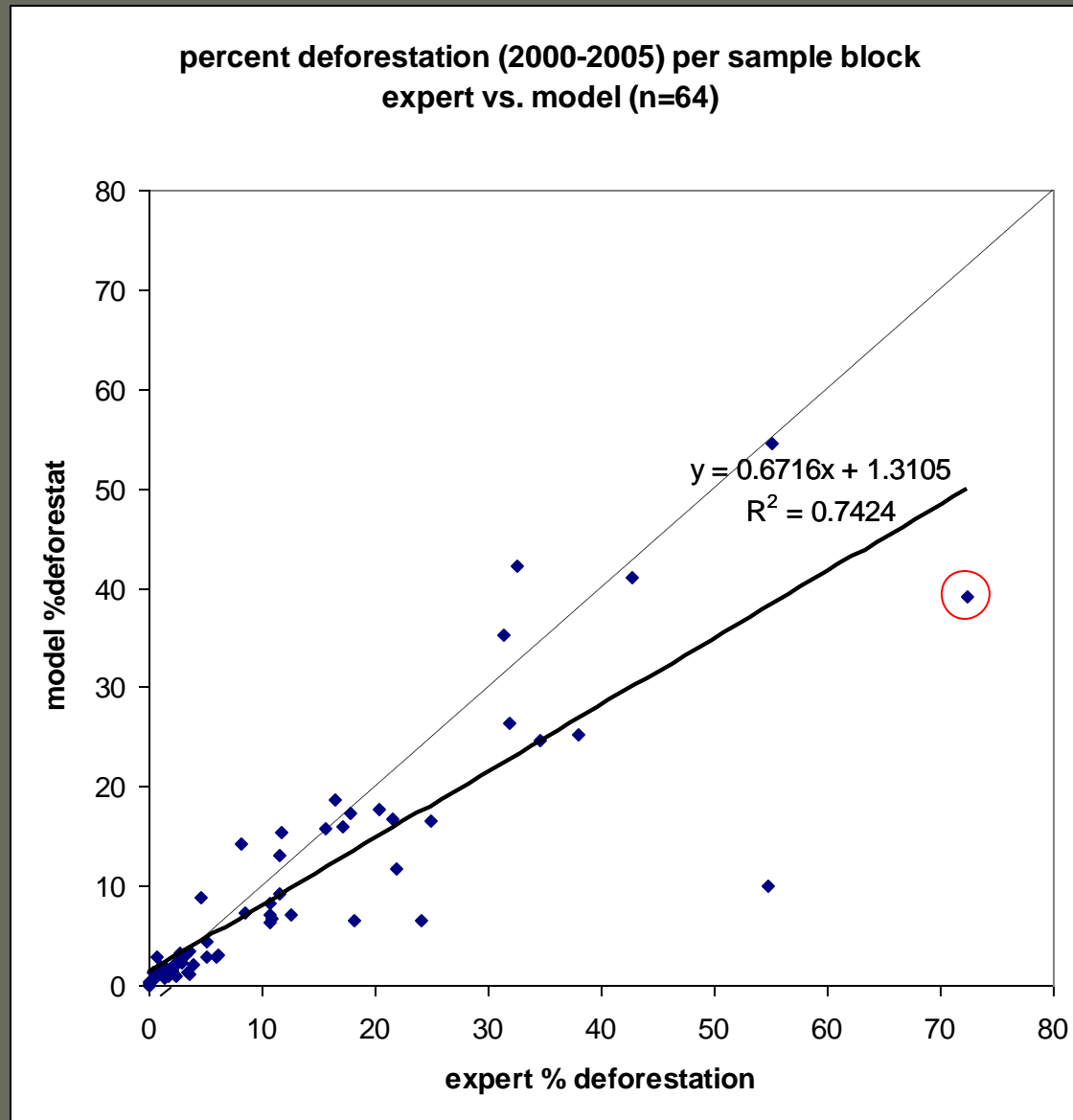
- Expert interpreted sample blocks (n = 64)
- Sample based estimate: 2.95% +/- 0.41





# Comparison of model (map) results with expert- interpreted sample blocks I

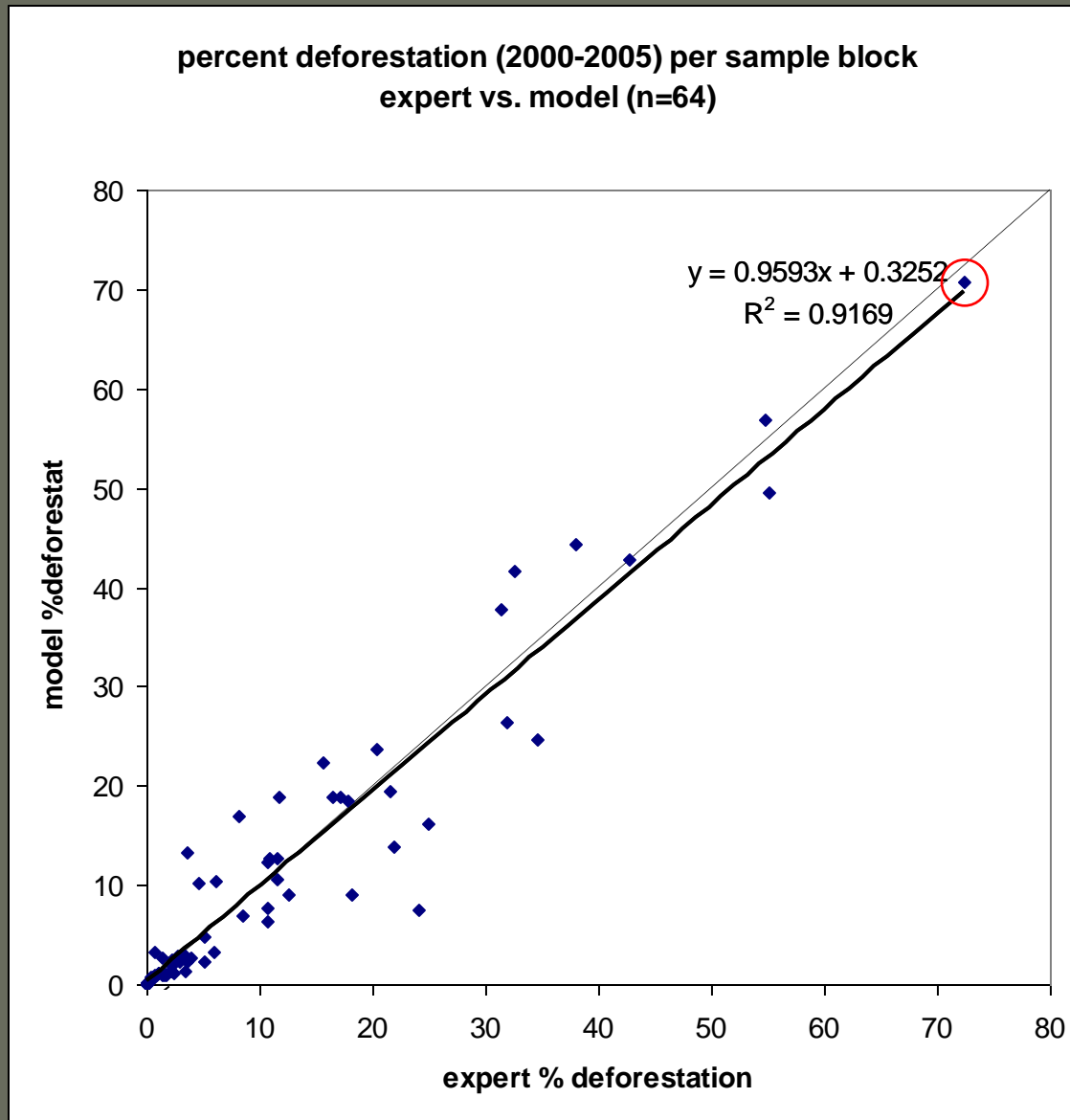
Model based on differencing the time 1 / time 2 characterizations





# Comparison of model (map) results with expert- interpreted sample blocks II

Model based on full time series analysis per pixel

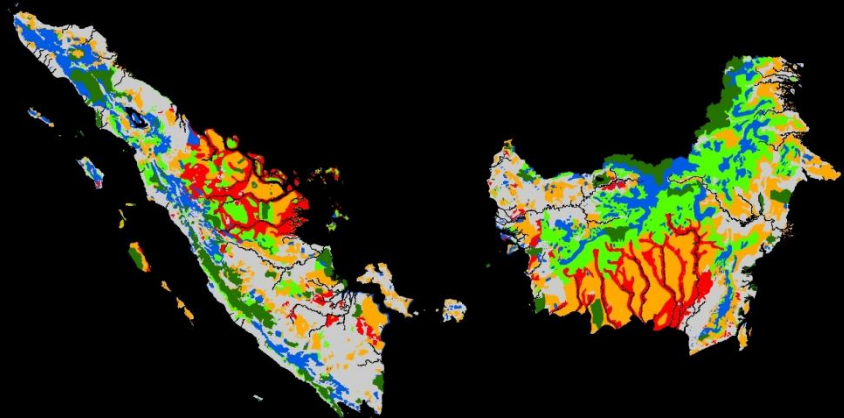




# Forest cover loss and land use

## Percent of mapped deforestation per land use zone

- 69% in zones designated for forest land use
- 52% in zones designated for **production or limited production** and 17% occurred in **conversion zones**
- 24% in zones not designated for forest land use
- 2.35% in **conservation zones** and 5.12% in **protected zones**  
=> 2,132 km<sup>2</sup> of illegal cutting



Total mapped forest cover loss 2000-05:  
2.86% or 28,546 km<sup>2</sup>

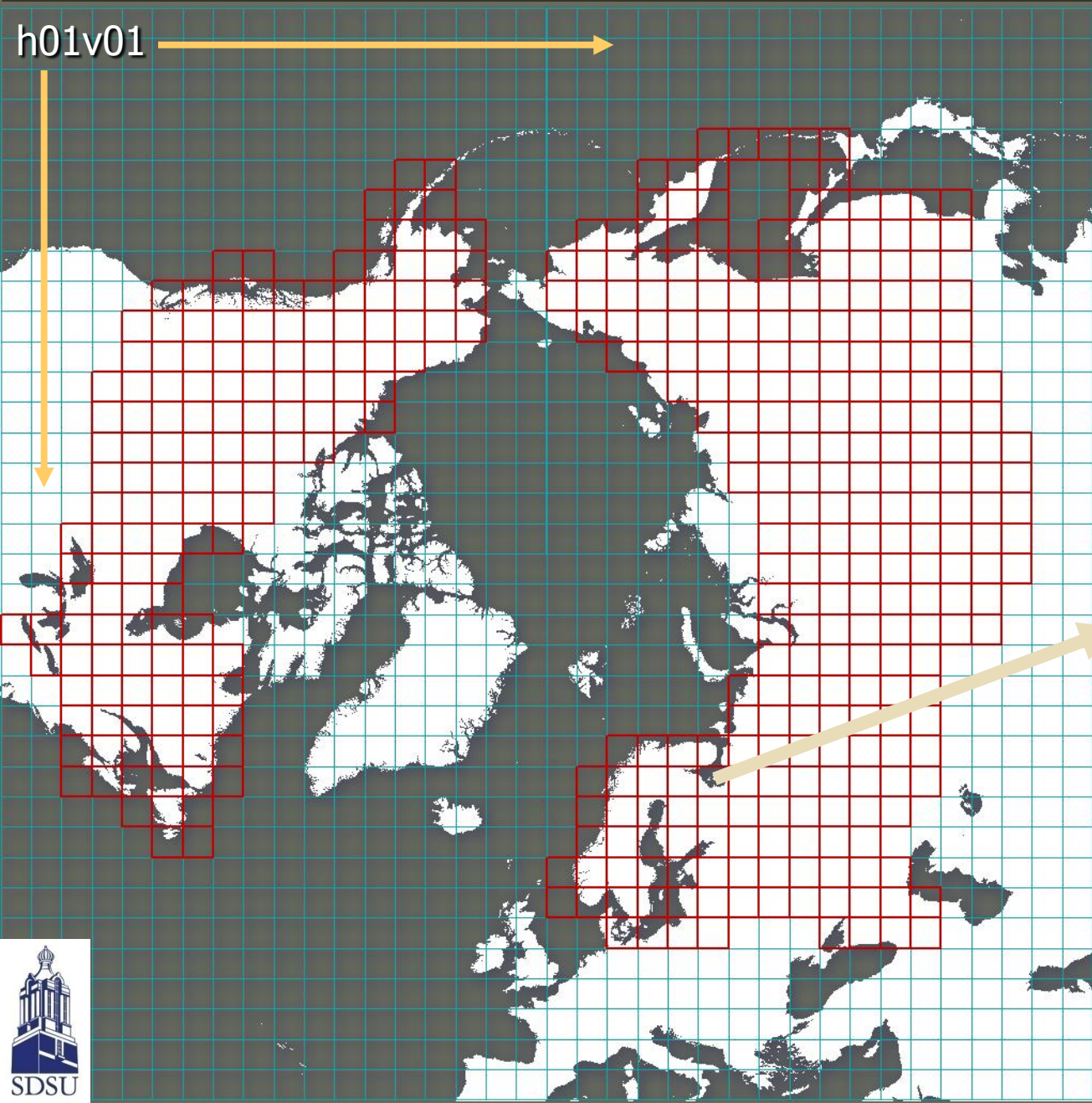


# Landsat boreal forest cover monitoring

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# Tiling system



Lambert Azimuthal  
Equal Area projection  
centered at the North  
Pole

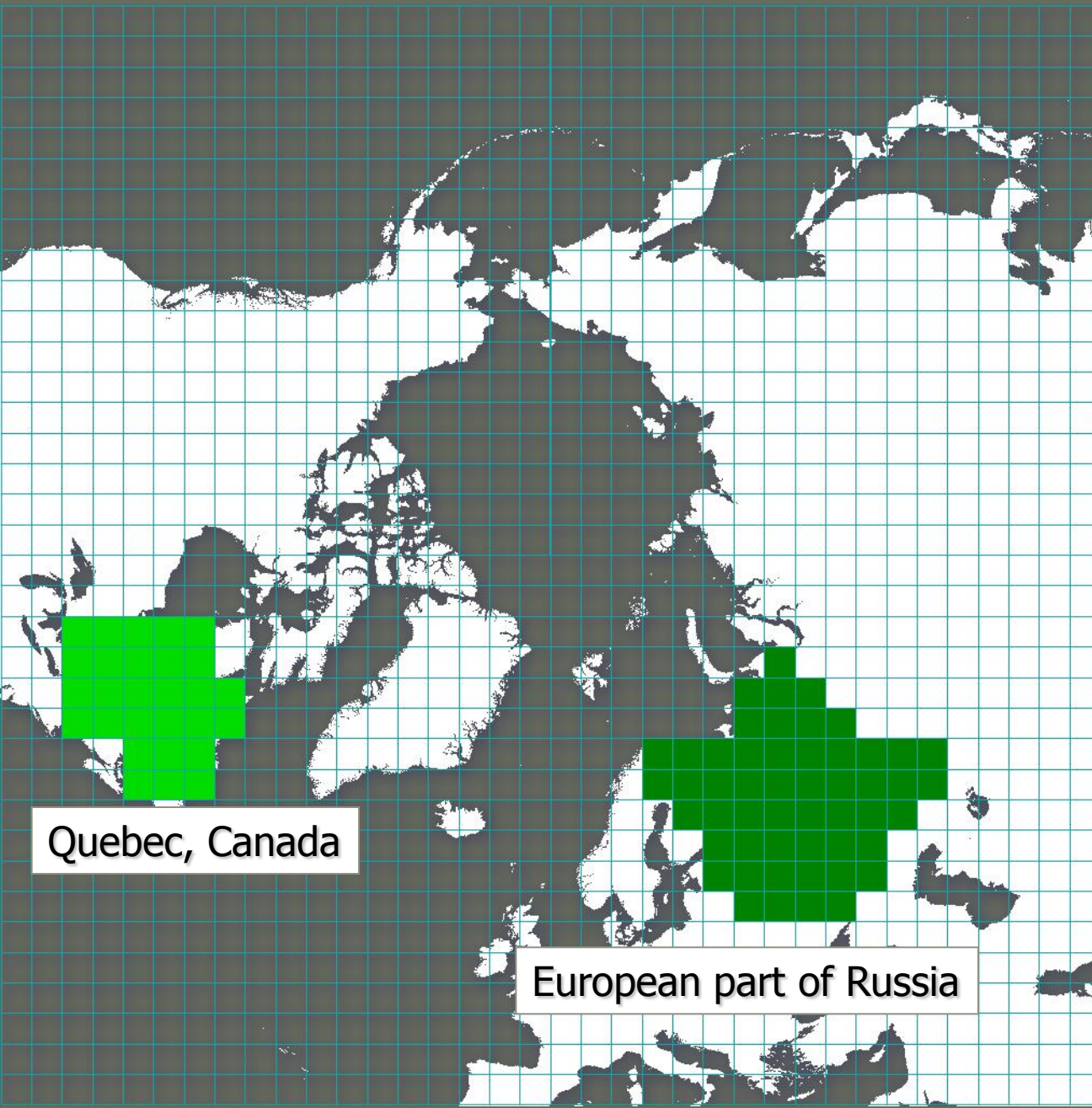


300,000 m

5000 pixels at 60m  
spatial resolution



# Tiling system



Quebec, Canada

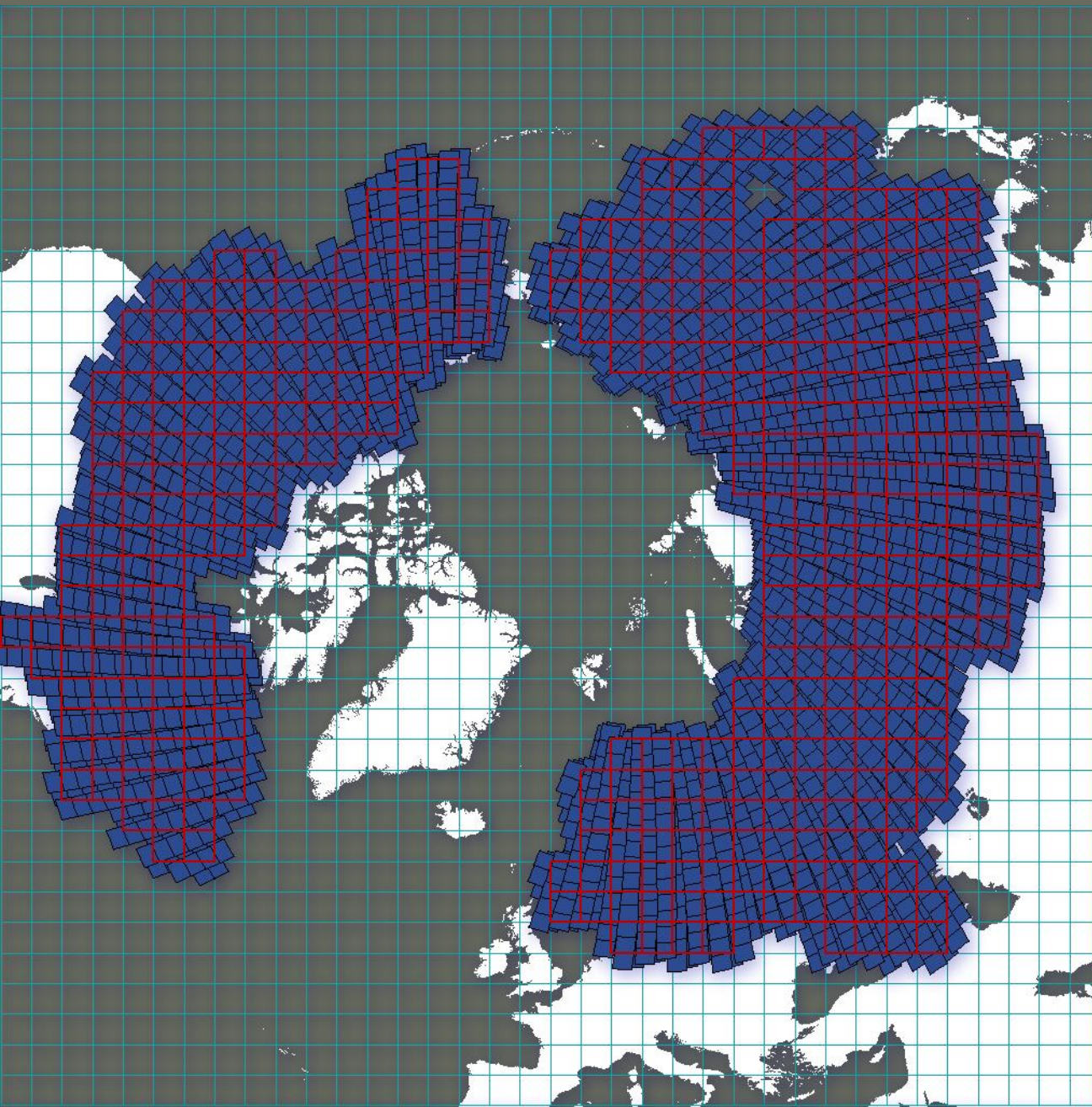
European part of Russia

## Test areas

1. Quebec, Canada  
28 tiles
2. European part of  
Russia  
52 tiles



# Image selection



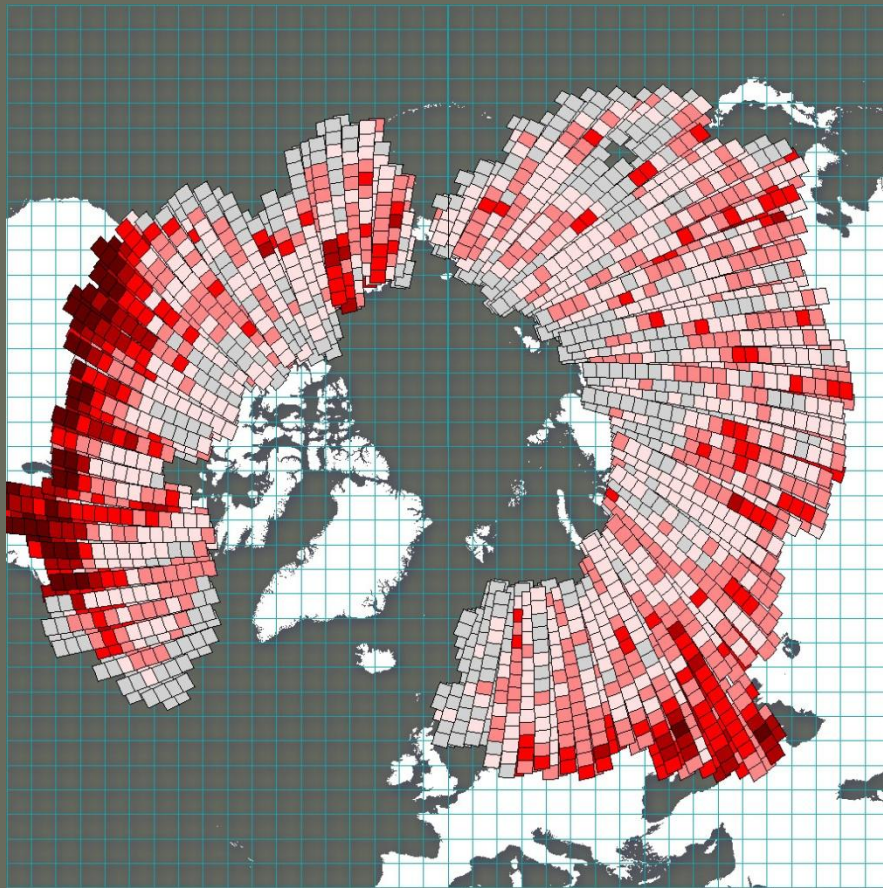
All selected WRS2  
path/row (3154)



# Image selection

## Landsat image selection criteria

- Date
  - Circa 2000 composite



Available Landsat images for year 2000  
(within growing season, with cloud cover below 50%)

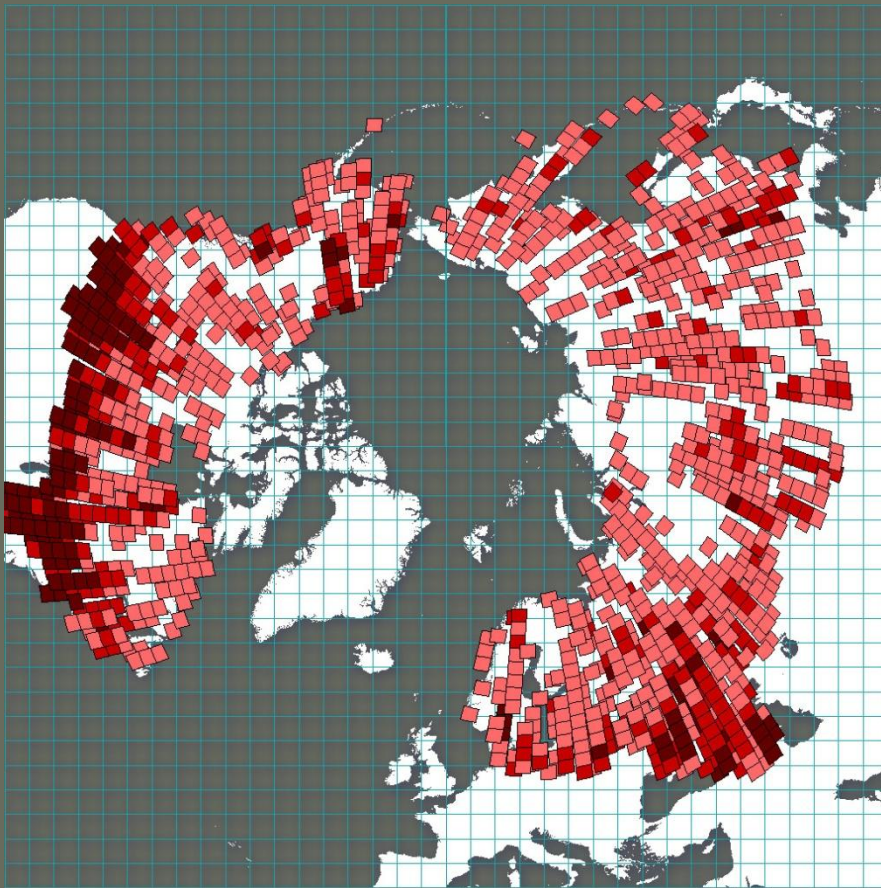
	Images per path/row	Percent of all path/row
Light Gray	0	23
Light Pink	1	38
Medium Pink	2	26
Red	3	8
Dark Red	4	3
Very Dark Red	5 and more	2



# Image selection

## Landsat image selection criteria

- Date
  - Circa 2000 composite



Available Landsat images for year 2000  
(within growing season, with cloud cover below 50%)

	Images per path/row	Percent of all path/row
	0	23
	1	38
	2	26
	3	8
	4	3
	5 and more	2

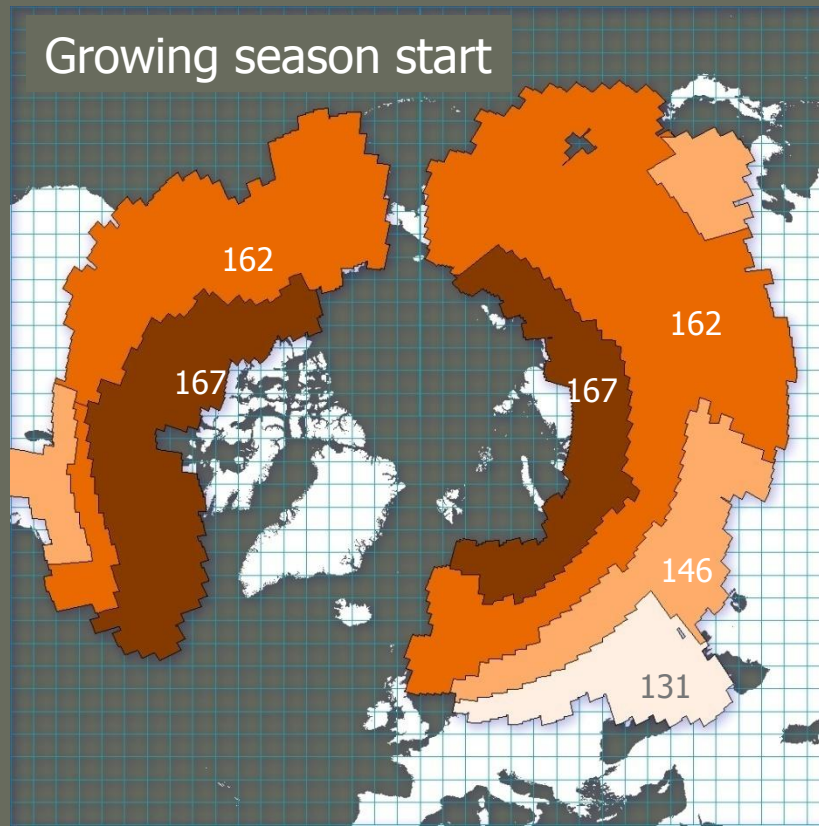


# Image selection

## Landsat image selection criteria

- Dates

- Circa 2000 composite: 1999-2002 slc-on data
- Circa 2005 composite: 2003-2007 slc-off data
- Within growing season





# Image selection

## Landsat image selection criteria

- Dates
  - Circa 2000 composite: 1999-2002 slc-on data
  - Circa 2005 composite: 2003-2007 slc-off data
  - Within growing season
- Cloud cover
  - Less than 50% ACCA cloud cover
  - OR, less than 50% cloud cover for any of the scene quarter

### Image inputs

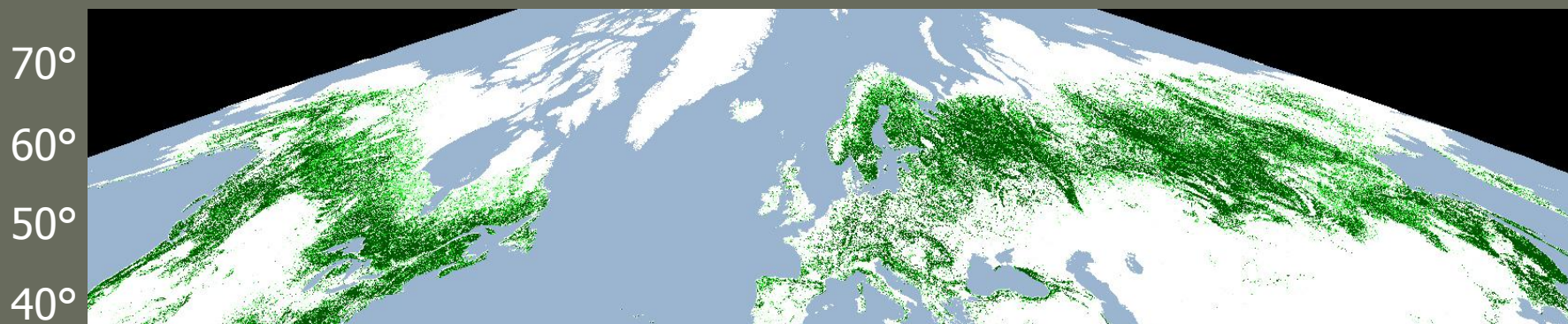
	European Russia	Quebec, Canada
1999-2002	2969	1505
2003-2007	4623	1951

# MODIS processing



Landsat-based training

Classified Landsat scenes



Forest cover

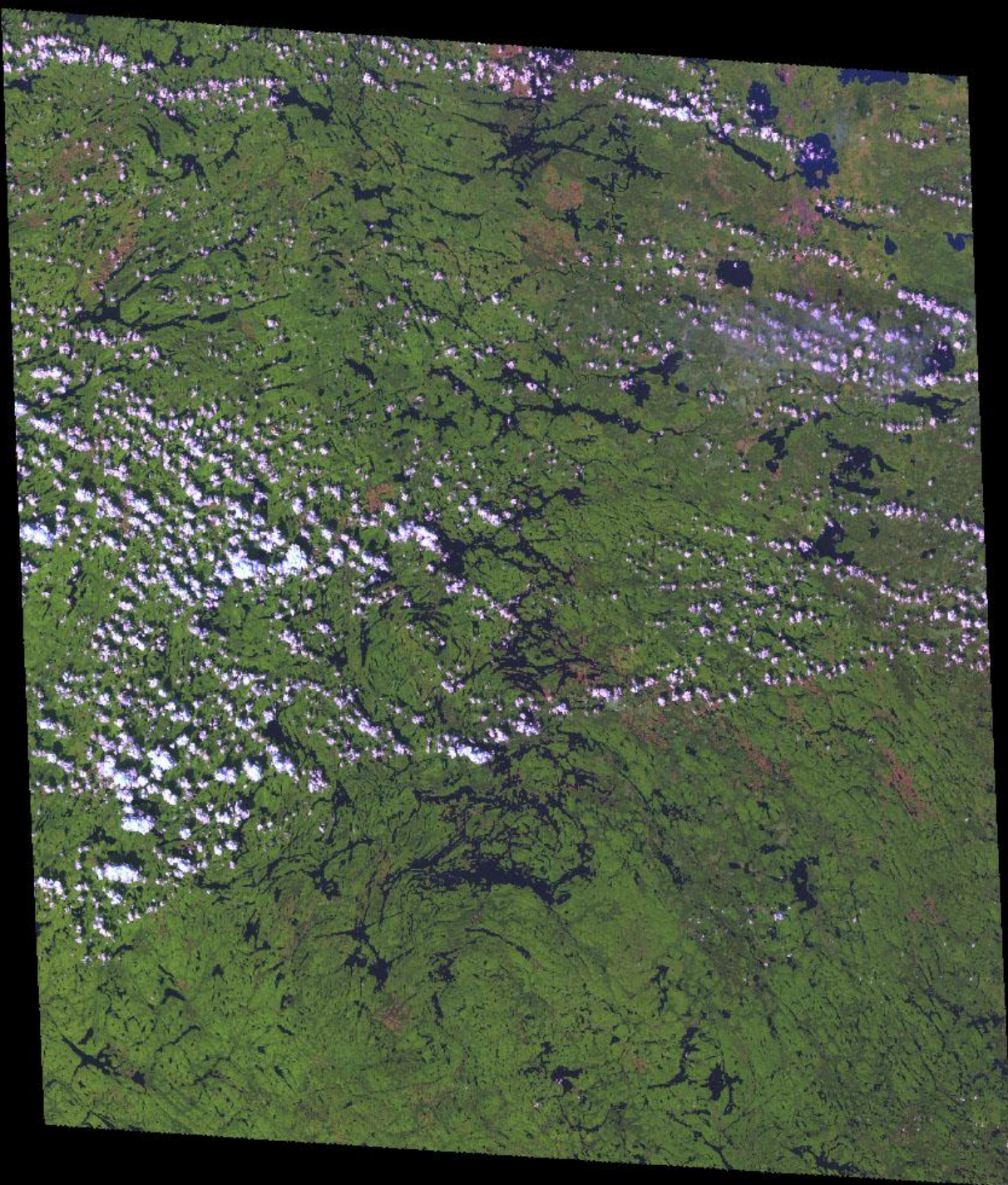
0% 100%



Coniferous forest mask

Coniferous forests

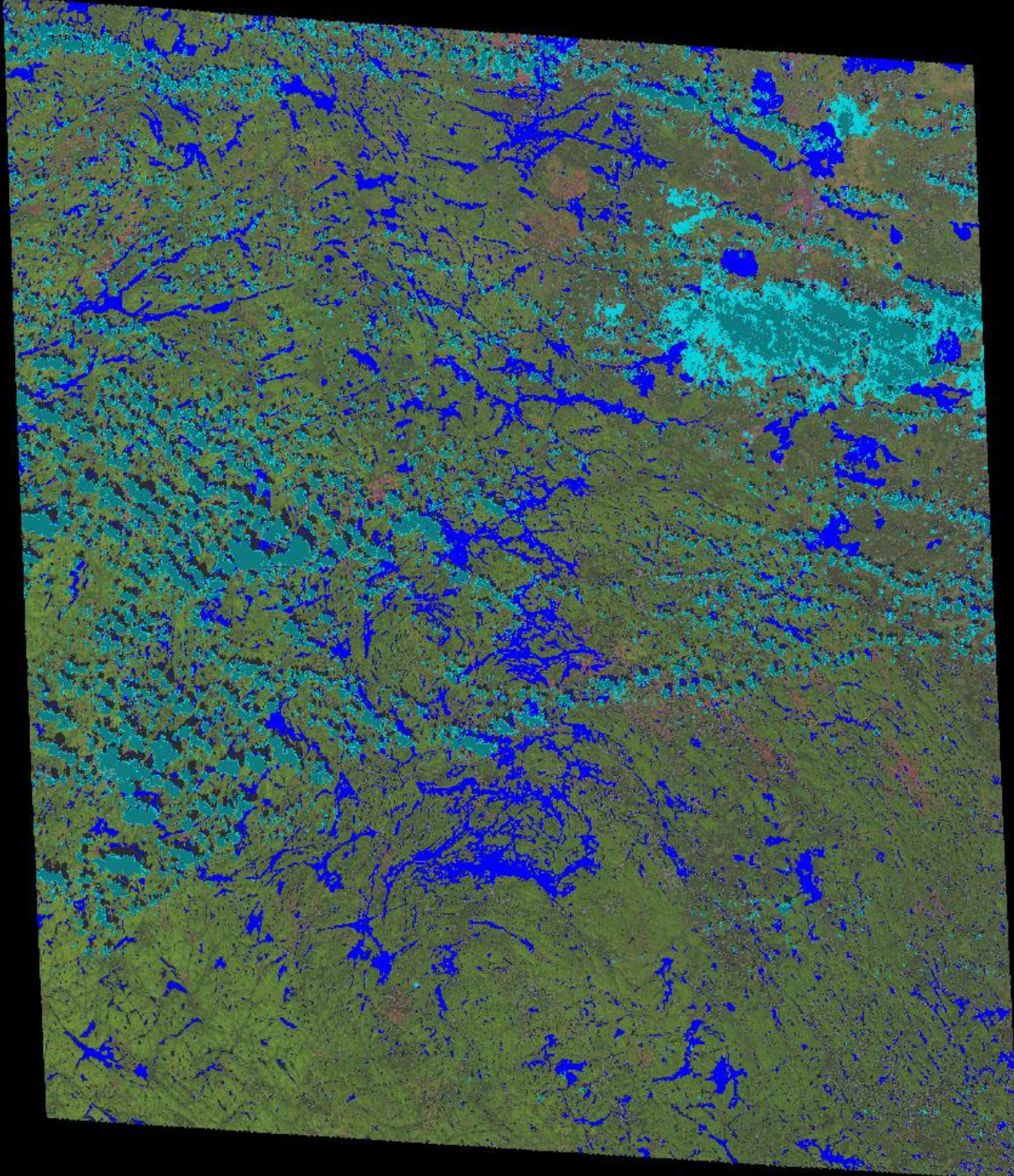




Source imagery  
Quebec (P17R27)

1999/08/27  
2000/06/26  
2000/07/12  
2000/08/13  
2001/06/13  
2001/07/31





## Quality assessment flags

### Cloud likelihood

- 50-90%
- >90%

### Shadow likelihood

- 50-90%
- >90%

### Water likelihood

- >50%

1999/08/27

2000/06/26

2000/07/12

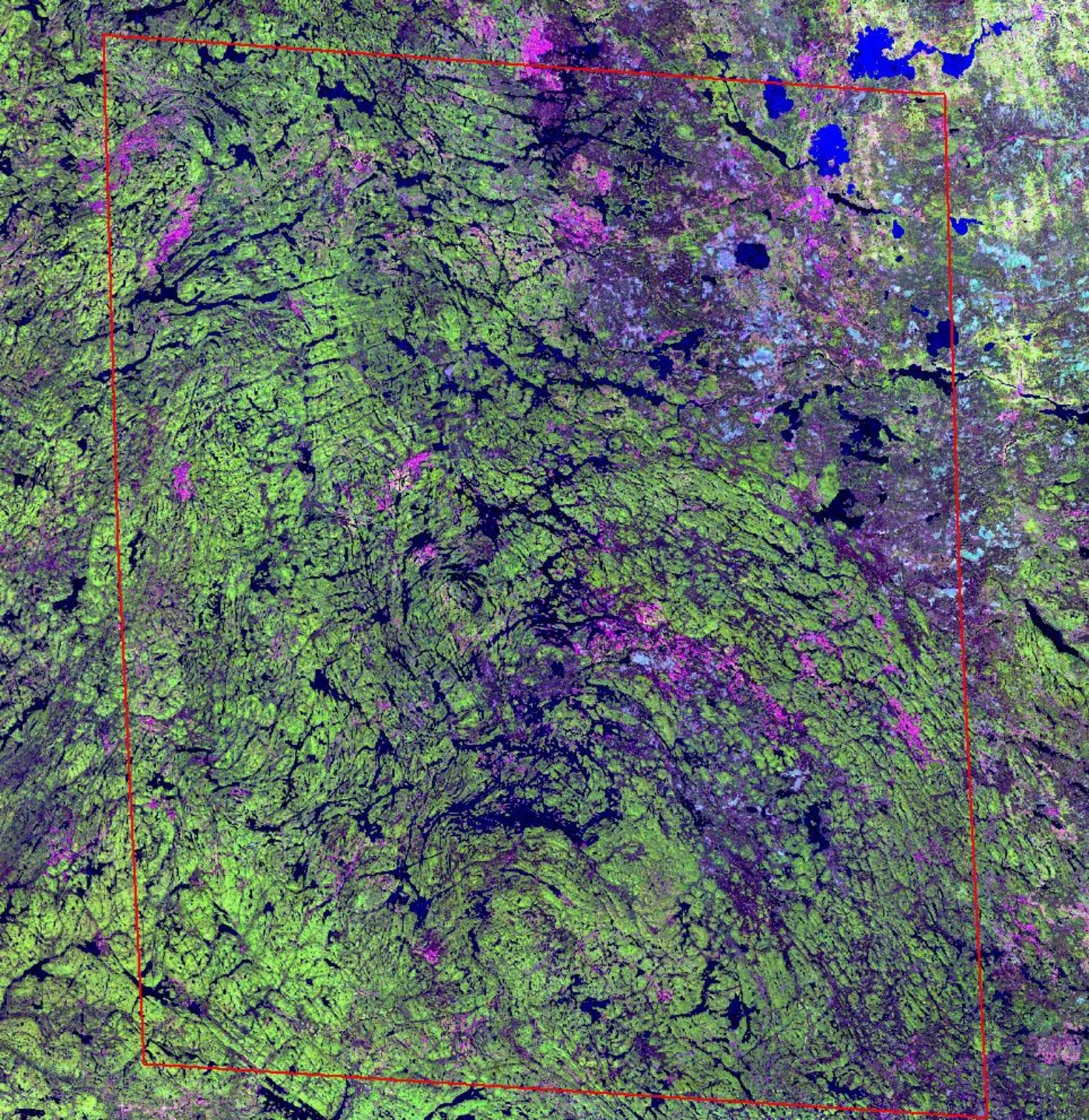
2000/08/13

2001/06/13

2001/07/31

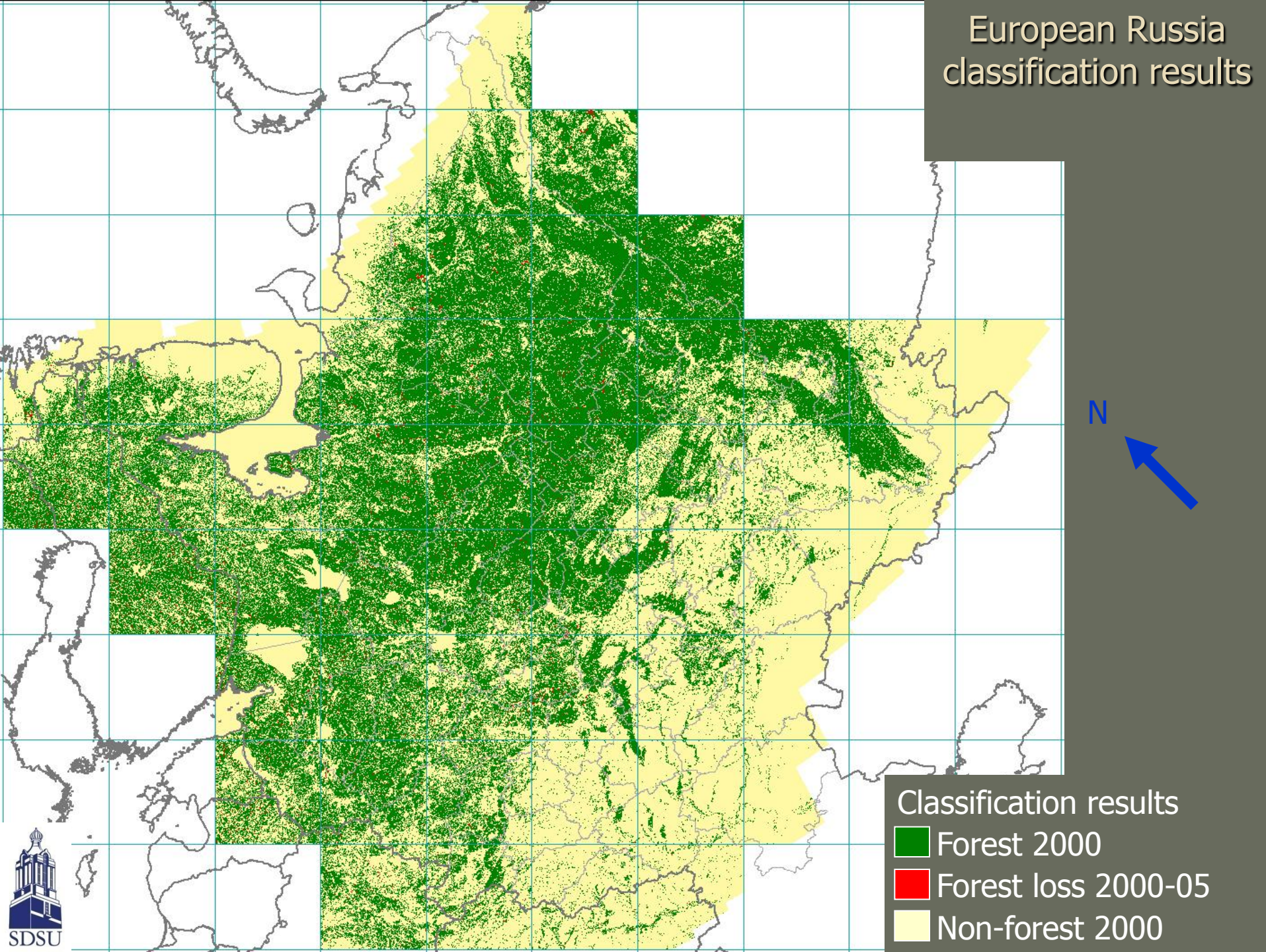


Composite image  
for circa year 2000



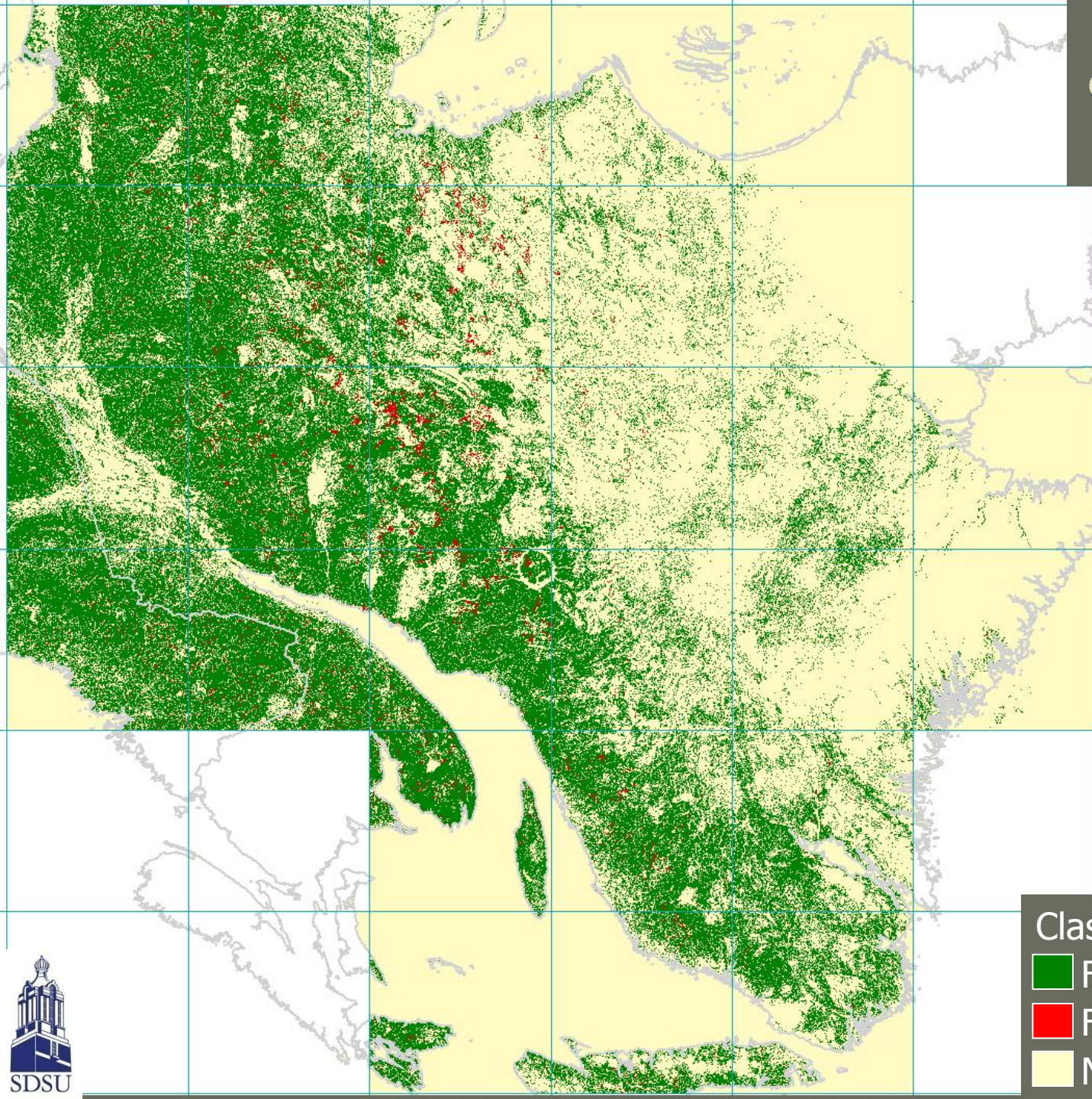


# European Russia classification results





# Quebec, Canada classification results



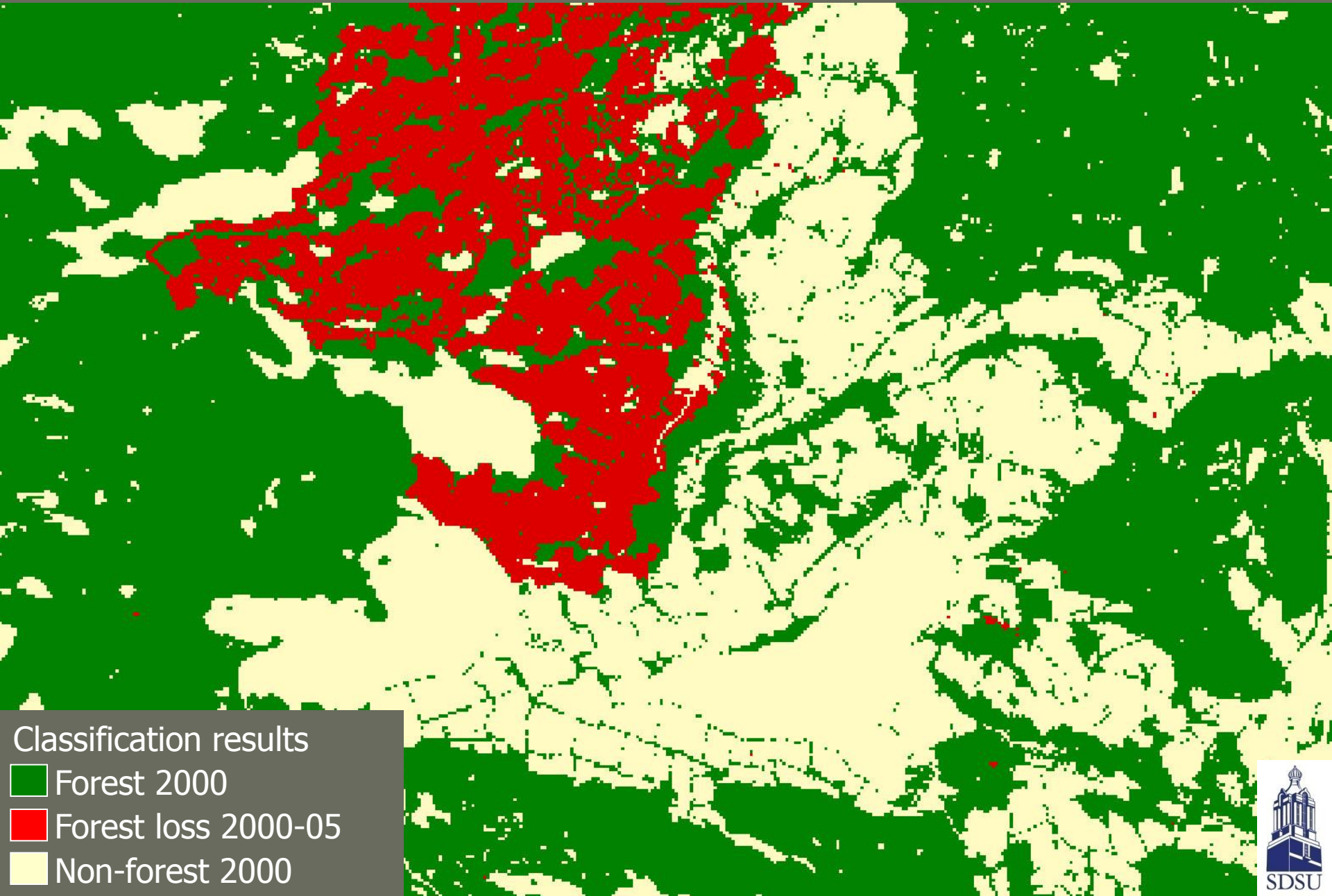
## Classification results

-  Forest 2000
-  Forest loss 2000-05
-  Non-forest 2000



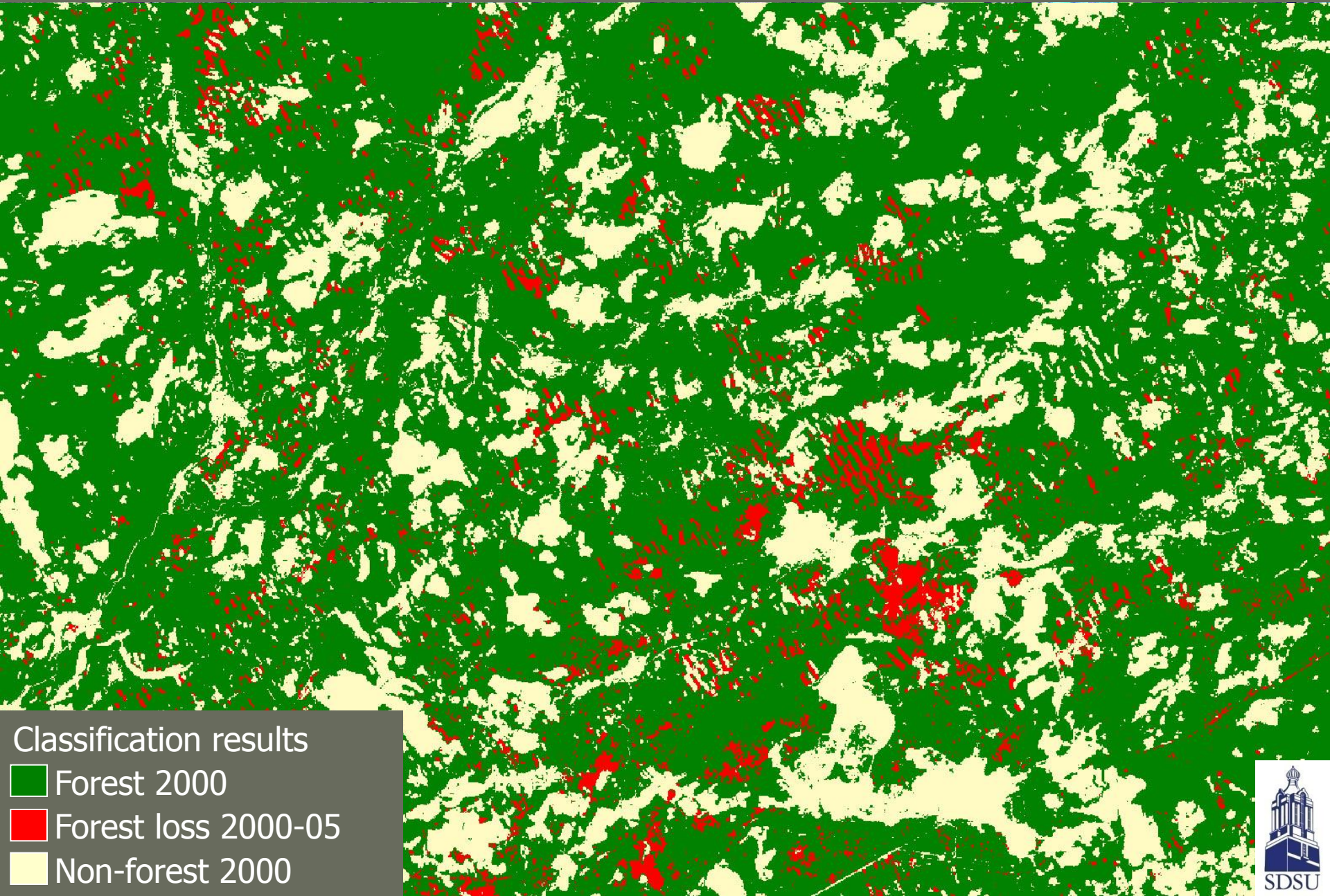


# Quebec, Canada: Classification examples





# European Russia: Classification examples





# European Russia

**Selected 42  
administrative regions**

St. Petersburg

Moscow



# European Russia

## Forest cover (% of regions' area)



Total forest cover:

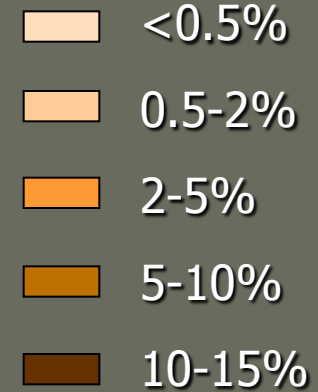
Landsat derived:  
150,228 thousand ha

Russian Forest Service:  
148,852 thousand ha



# European Russia

## Gross forest cover loss (% of total)



Total gross forest  
cover loss:

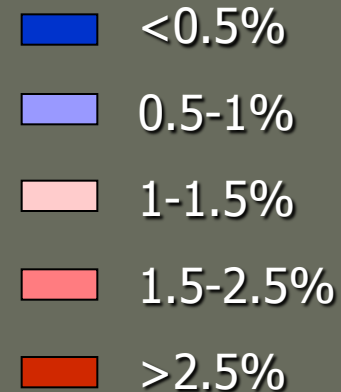
2,210 thousand ha

1.5% of year 2000  
forest cover



# European Russia

## Forest cover loss 2000-2005 as percent of forest cover for year 2000



St. Petersburg

Vladimir

Moscow

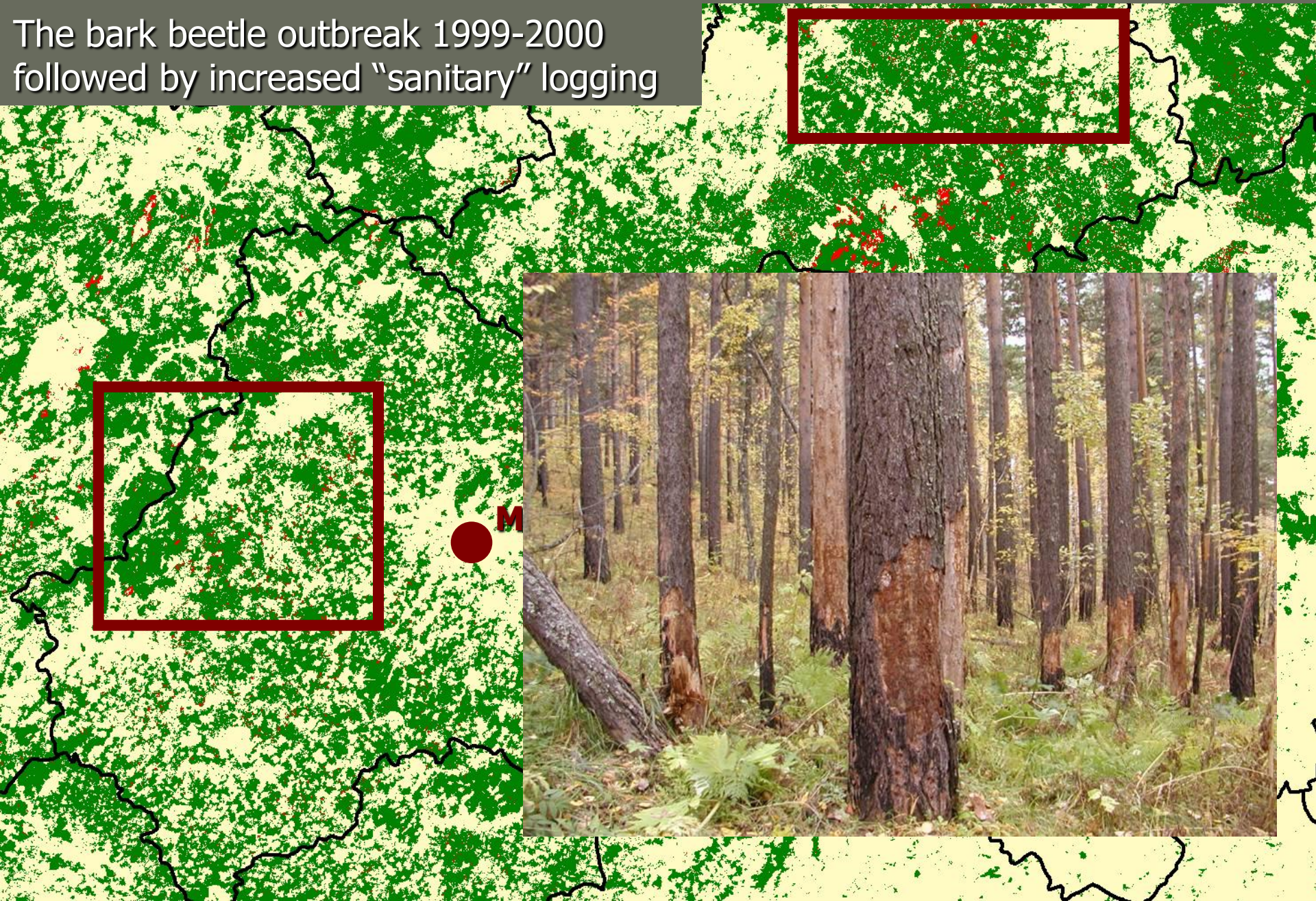
Regions with the highest  
forest cover loss:

Vladimir (3.7%)  
St. Petersburg (3.5%)  
Moscow (3.1%)



# European Russia

The bark beetle outbreak 1999-2000 followed by increased "sanitary" logging





# European Russia

Extensive forest and peat bog fires (fall 2002)

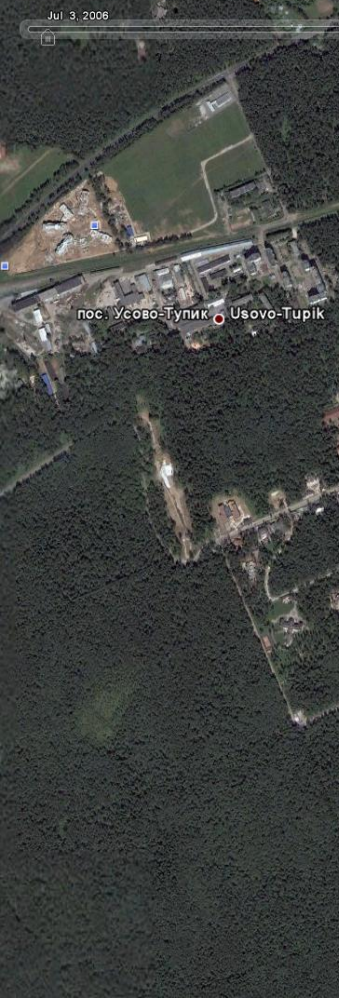


MODIS image 07/30/2002  
[www.ssec.wisc.edu](http://www.ssec.wisc.edu)



# European Russia

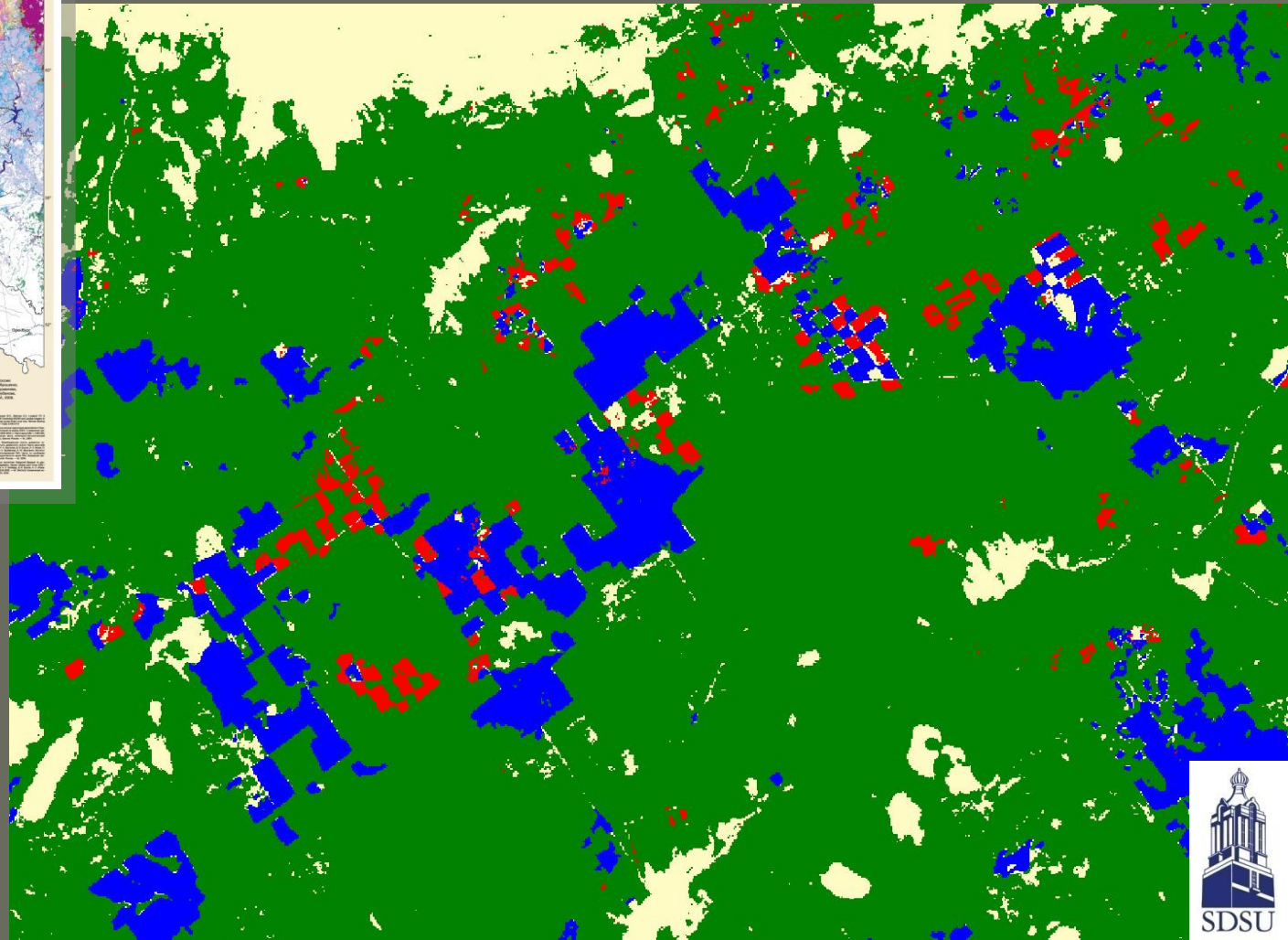
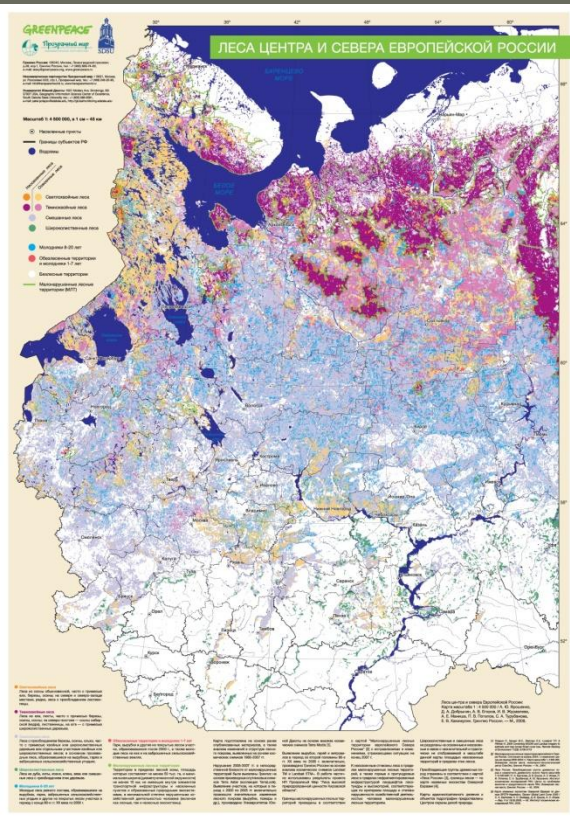
Moscow suburbs expansion (partly illegal construction on forest lands)





# European Russia

Yaroshenko et al. (2008)  
European Russia's Forests (poster map and GIS dataset).  
*Moscow, Greenpeace.*



Forest 2005

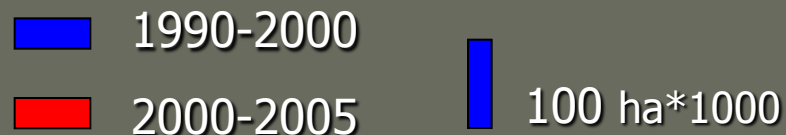
Gross forest loss  
1990-2000

Gross forest loss  
2000-2005



# European Russia

## Annual gross forest cover loss, thousand ha

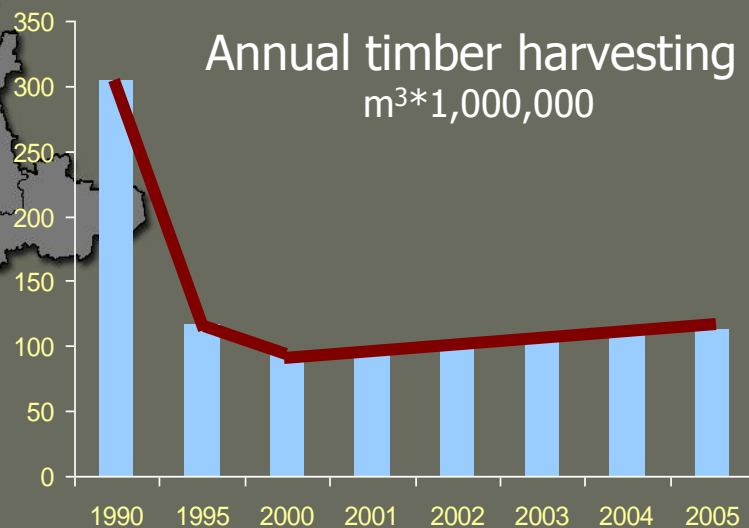


Total annual gross forest cover loss:

1990-2000: 530 ha\*1000

2000-2005: 406 ha\*1000

## Annual timber harvesting m<sup>3</sup>\*1,000,000



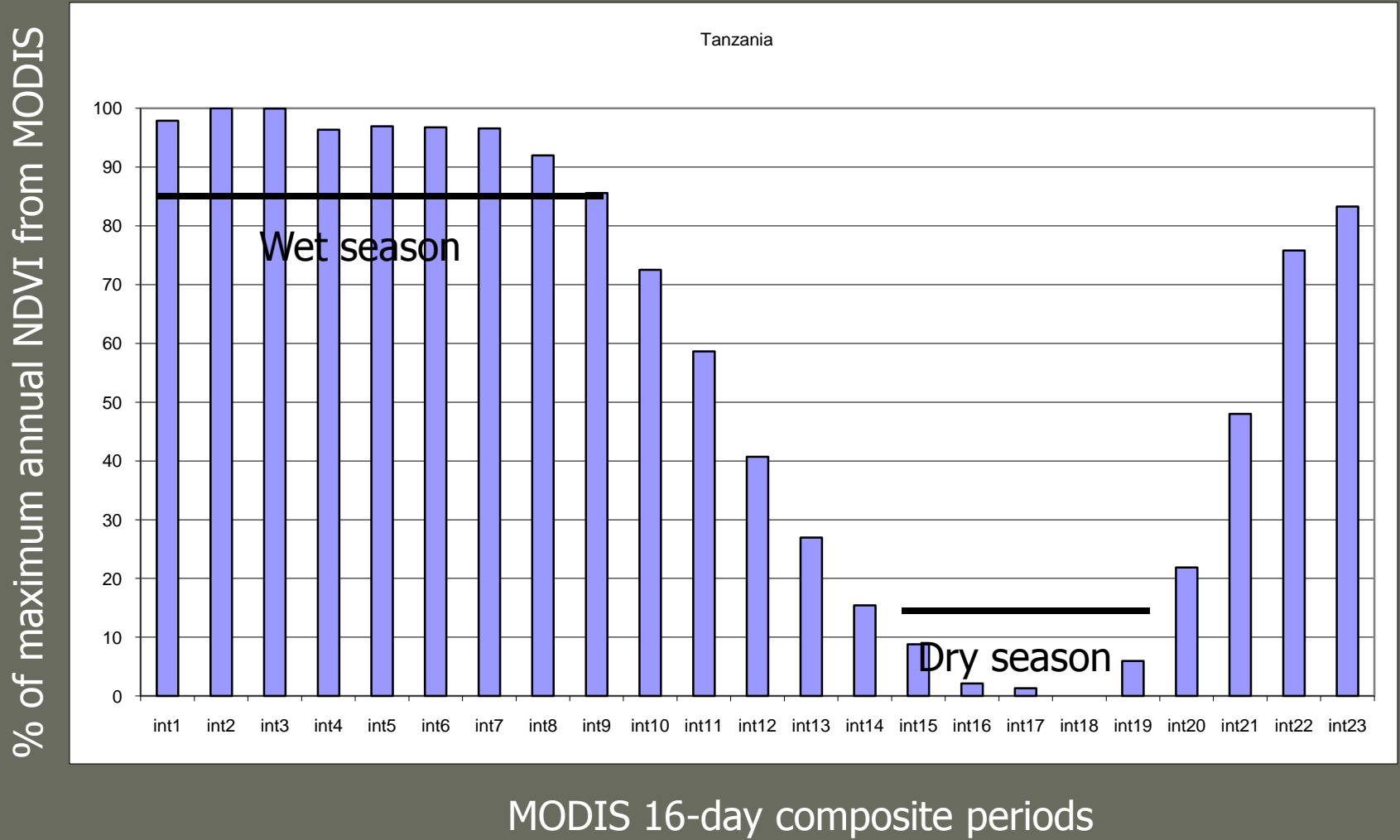


# Landsat dry tropical forest cover monitoring example

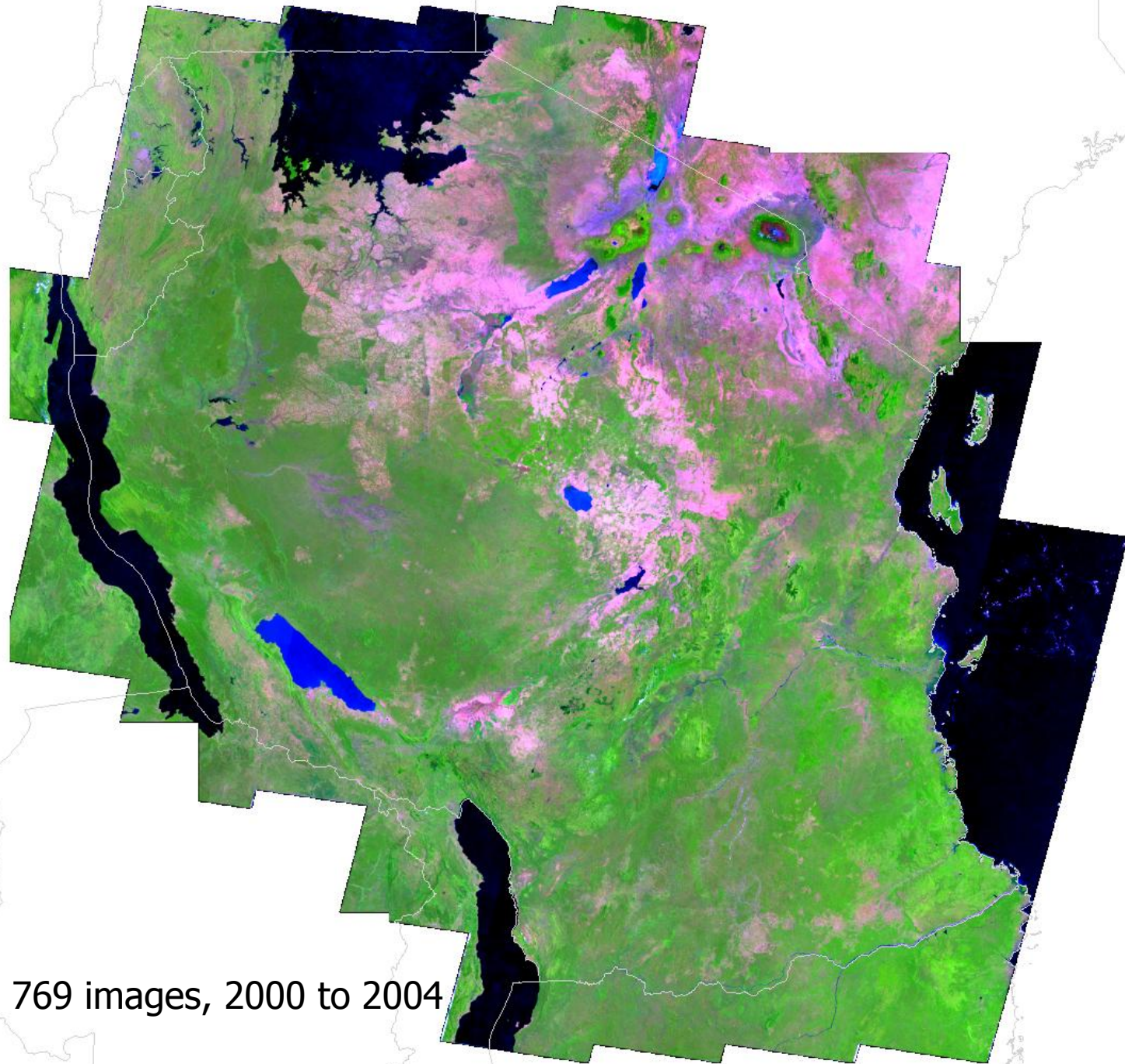
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# Dry tropical biome – Tanzania test case

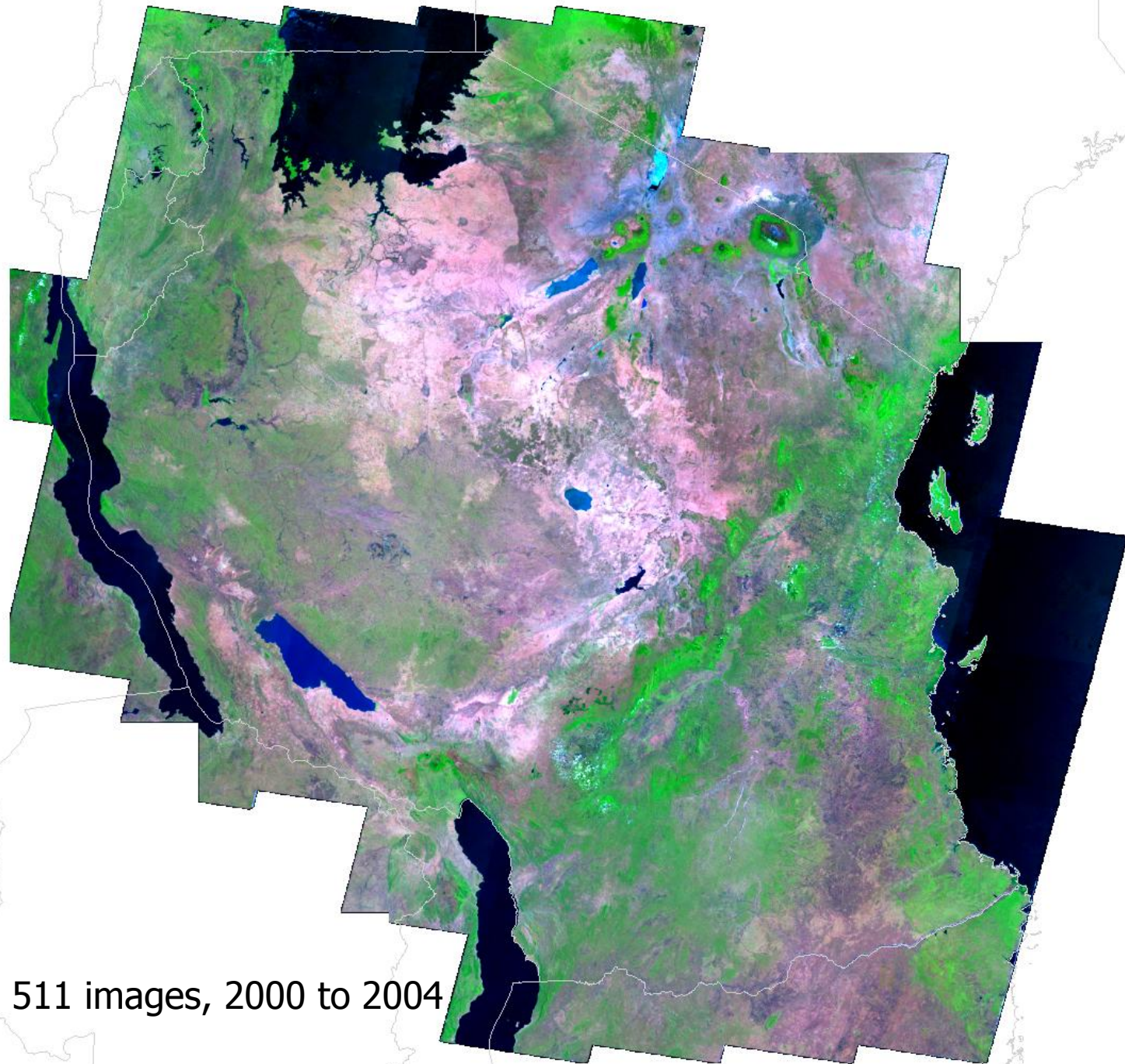






769 images, 2000 to 2004





511 images, 2000 to 2004



# Factors affecting Landsat processing for forest monitoring

- Acquisition strategy
- Observation frequency (scene overlap/SLC-off)
- Observation quality (clouds/haze/shadow)
- Phenology



# Conclusions

- Our methods for generic and automated forest change monitoring for large areas are quickly maturing
- A goal is to provide consistent results over large areas that retain local relevance
- We rely on 1) systematic global acquisitions and the provision of data at 2) no cost and with 3) easy access
- Current work is aimed at creating a standard approach applicable at the global scale
- Approach validated using existing reference datasets
- Monitoring results are and will be available
  - [carpe.umd.edu](http://carpe.umd.edu)
  - [globalmonitoring.sdstate.edu/projects/boreal](http://globalmonitoring.sdstate.edu/projects/boreal)
  - Indonesia and Quebec to come...