

# National scale mapping of land cover and change using Landsat data

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# Large area land cover extent and change mapping

- AVHRR to MODIS to Landsat - Apply lessons learned from coarse spatial resolution sensors to Landsat
  - Per pixel processing, including quality assessment of clouds, haze, shadow, water
  - Top of atmosphere reflectance and radiometric normalization, including BRDF/view angle
  - Employ decision tree algorithms for QA models and cover extent and change quantification
- Incorporate MODIS for normalization and temporal disaggregation of change dynamics
- Future is WELD for Landsat time-series inputs

# Landsat is unique among medium resolution sensors

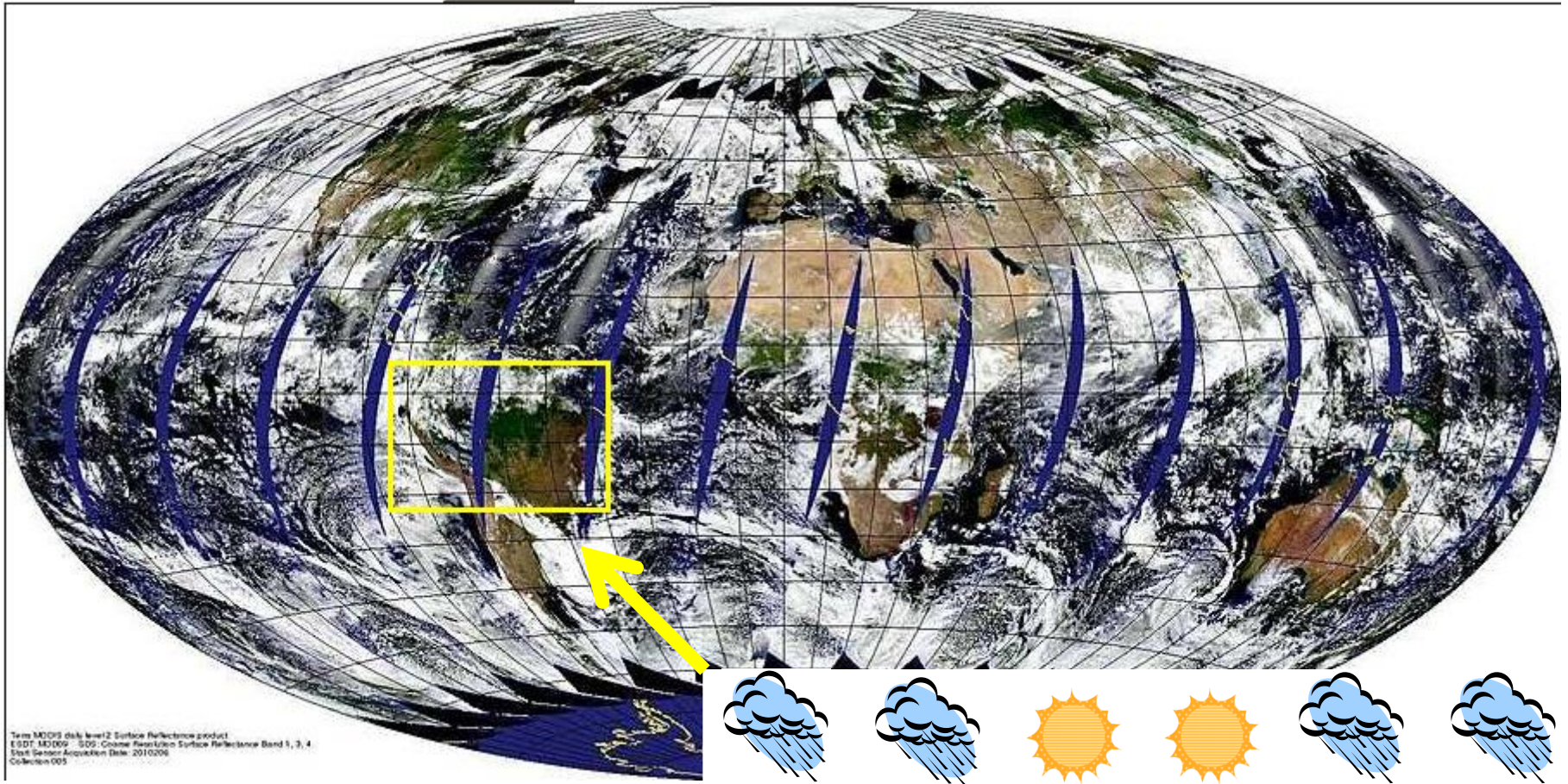
- Systematic global acquisition strategy
- No cost
- Easy access
- Minimal pre-processing required

# 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

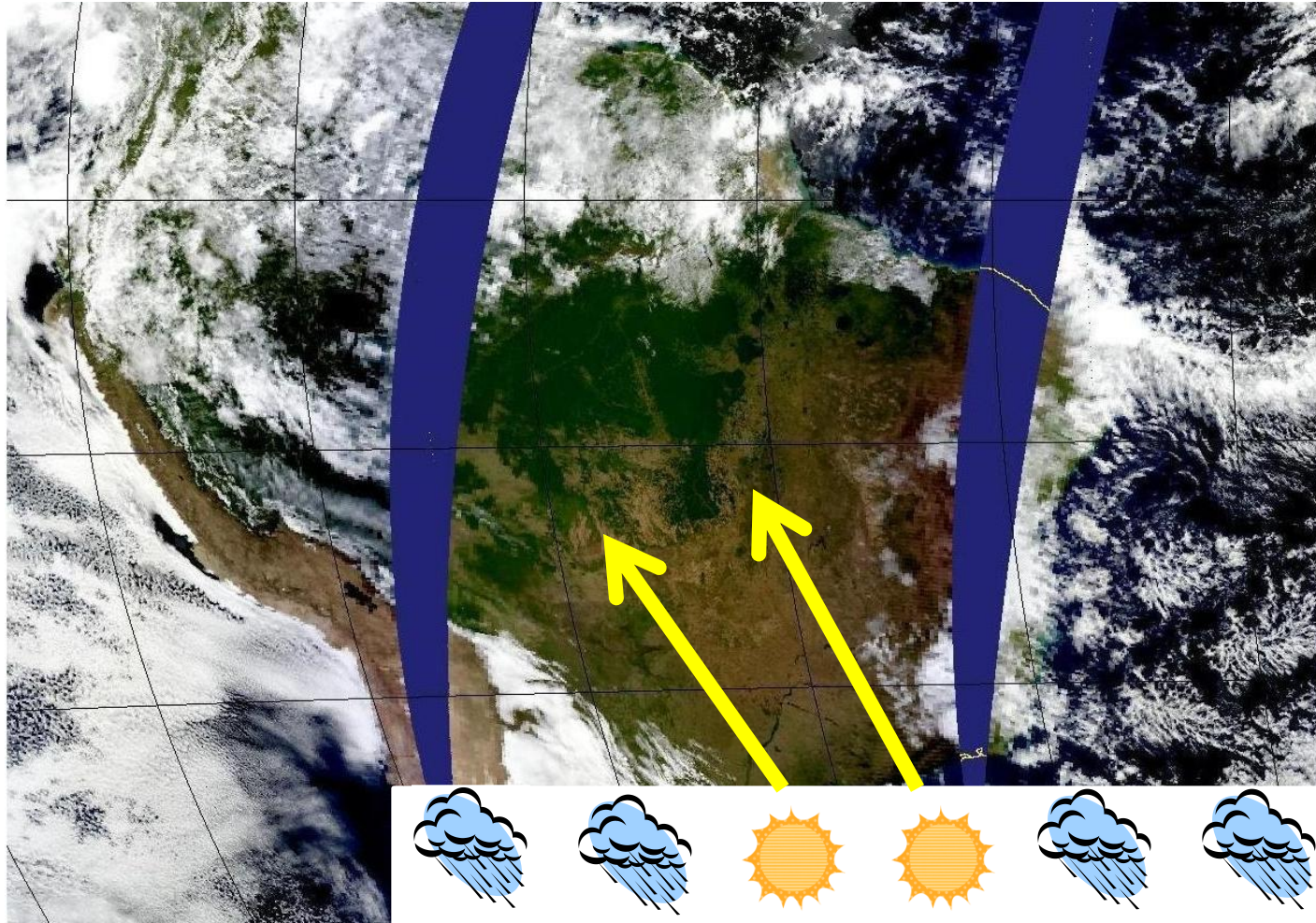


# Humid tropical cloud cover for one day of MODIS data



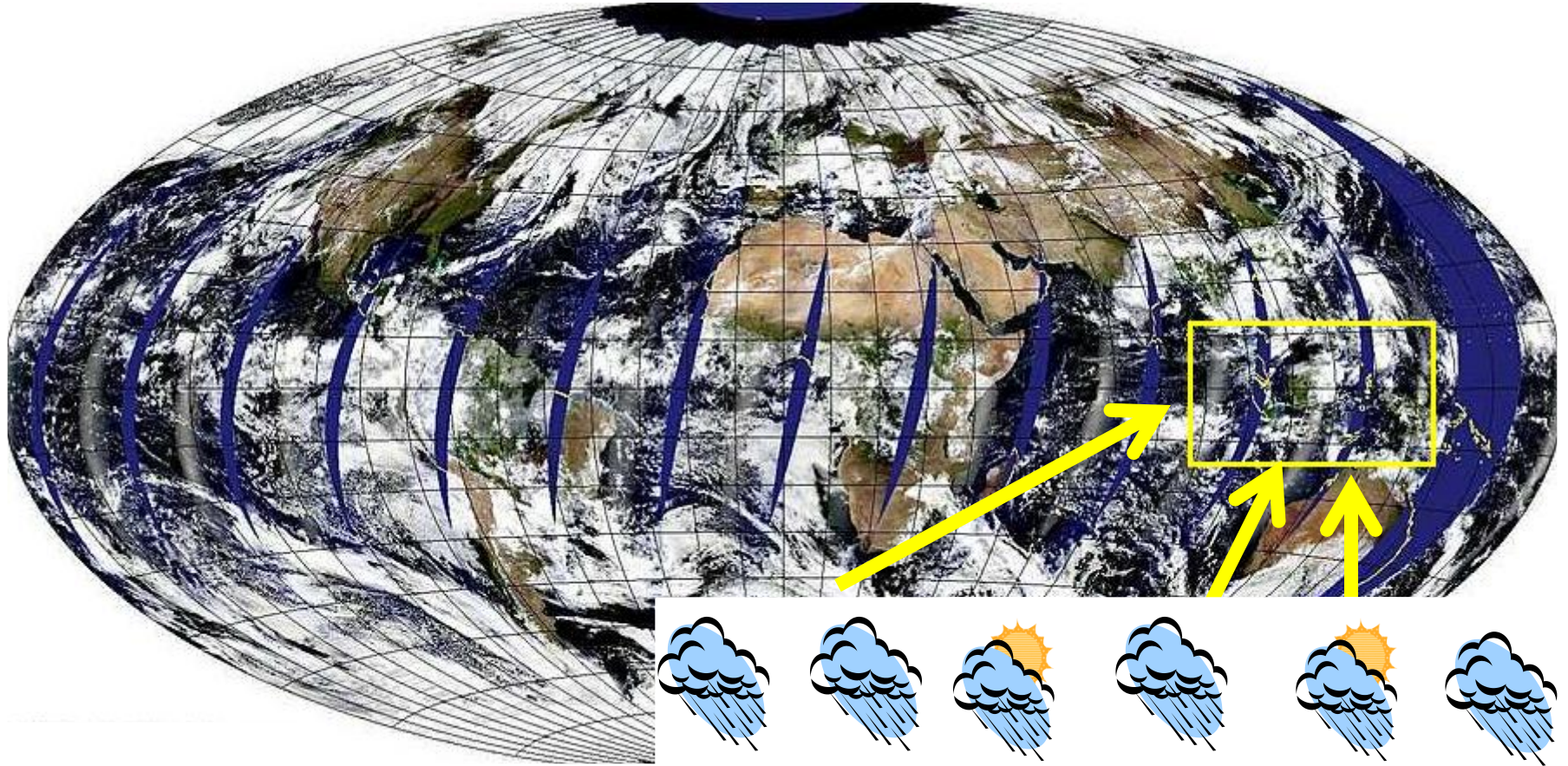


# Seasonally cloud-free window over the southern Amazon

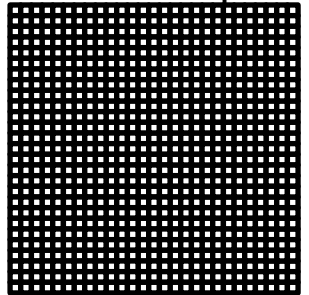




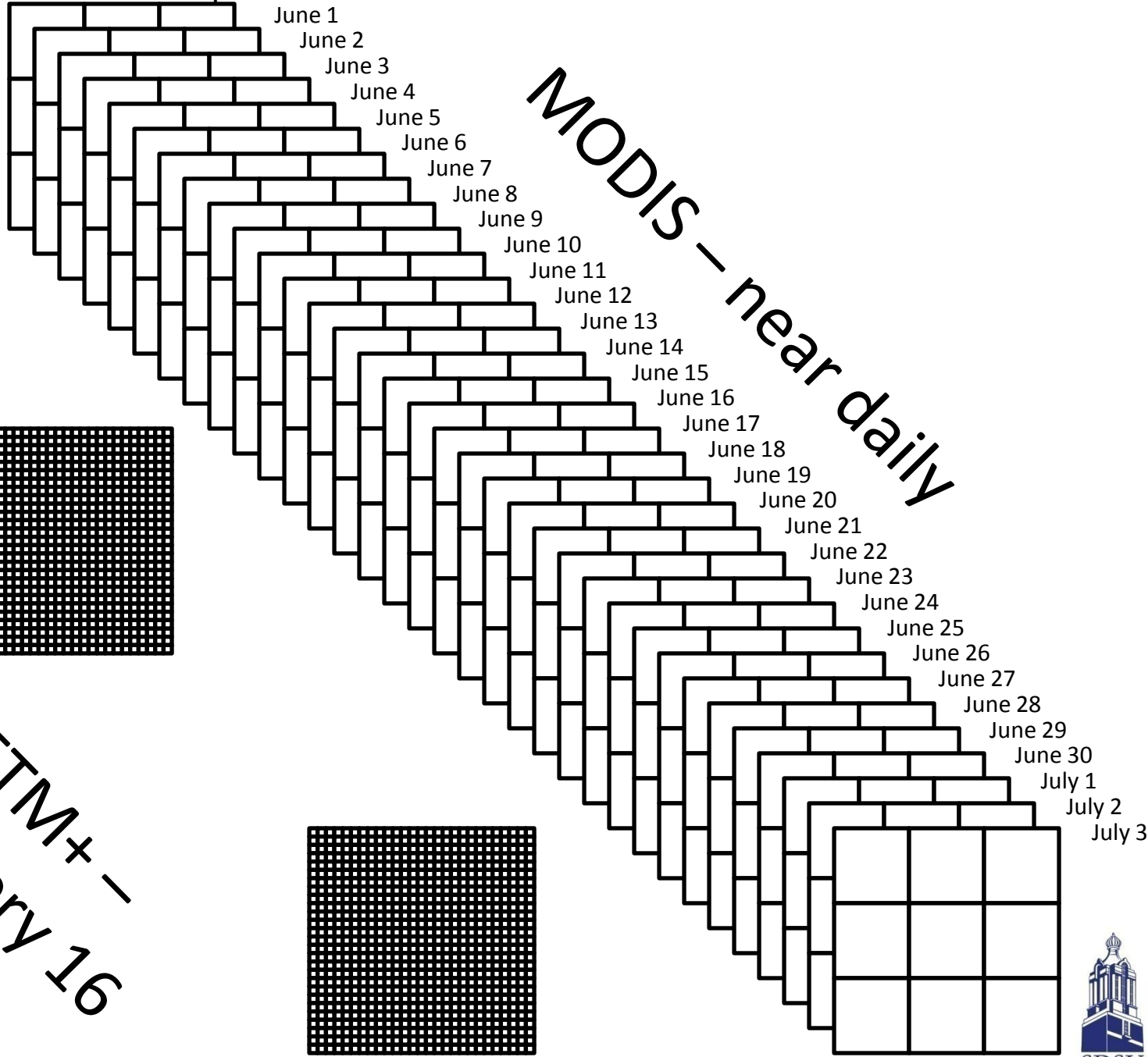
Conversely, Indonesia is persistently cloudy



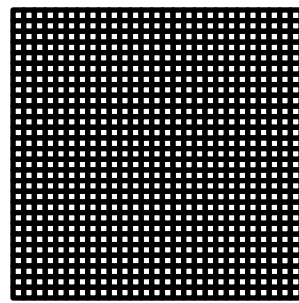
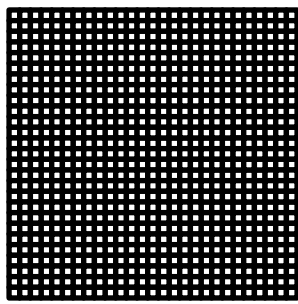
30m x 30m pixels



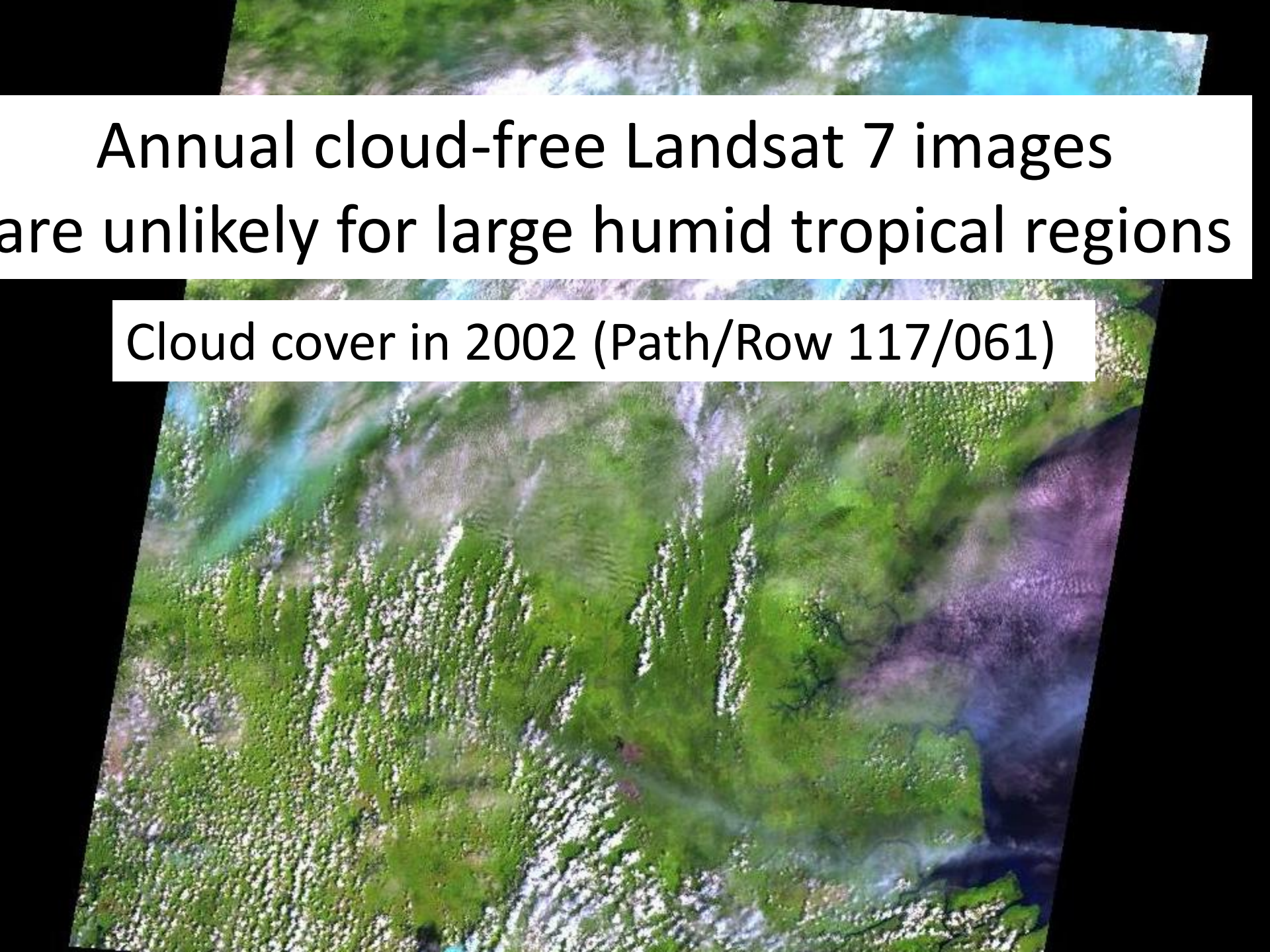
250m x 250m pixels



Landsat ETM+ -  
potentially every 16  
days



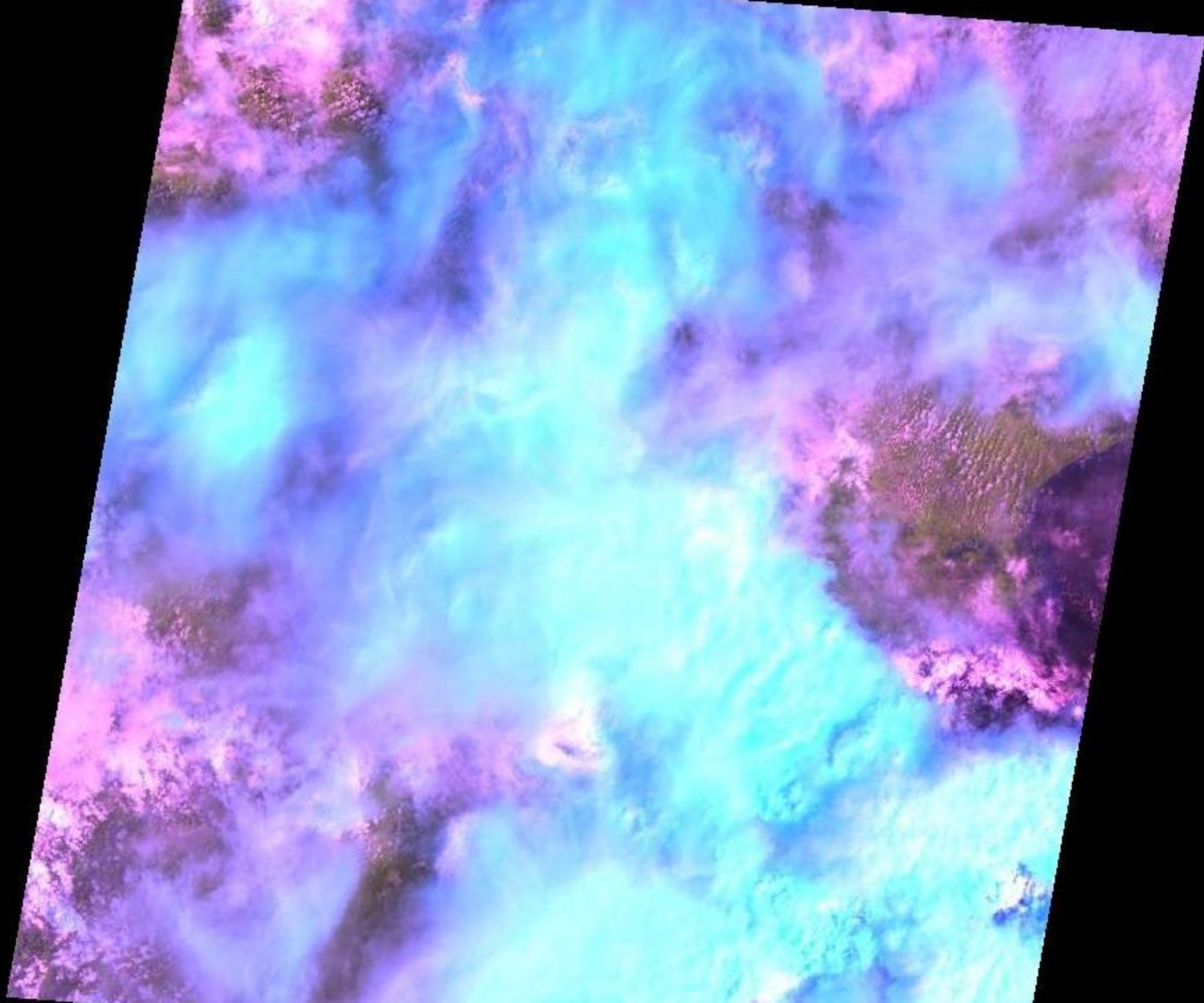


An aerial photograph of a lush tropical forest. A river flows through the center, with a waterfall visible on the right side. The forest is dense and green, with some areas appearing lighter green, possibly due to cloud cover or different vegetation types. The image is tilted slightly to the right.

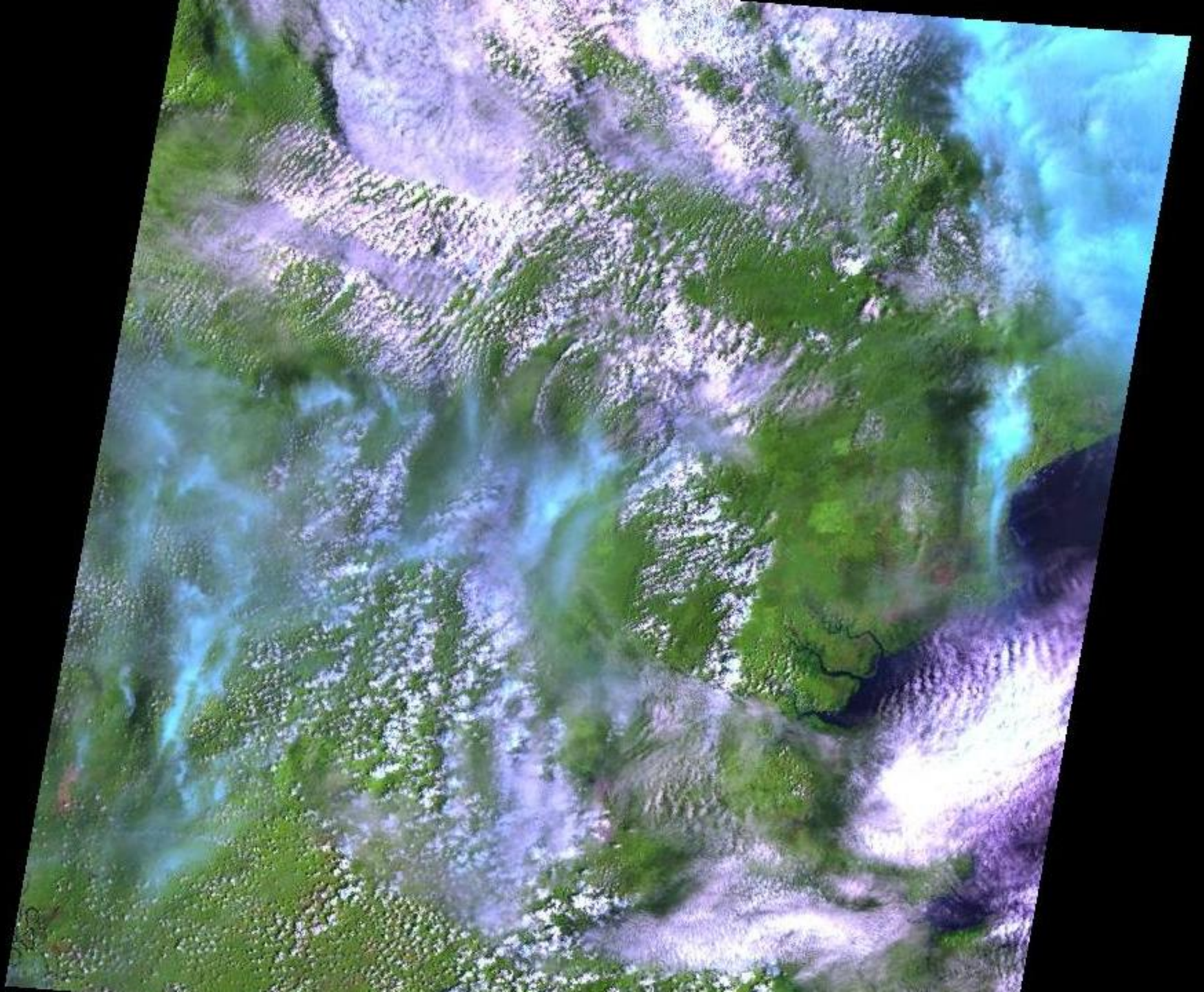
Annual cloud-free Landsat 7 images  
are unlikely for large humid tropical regions

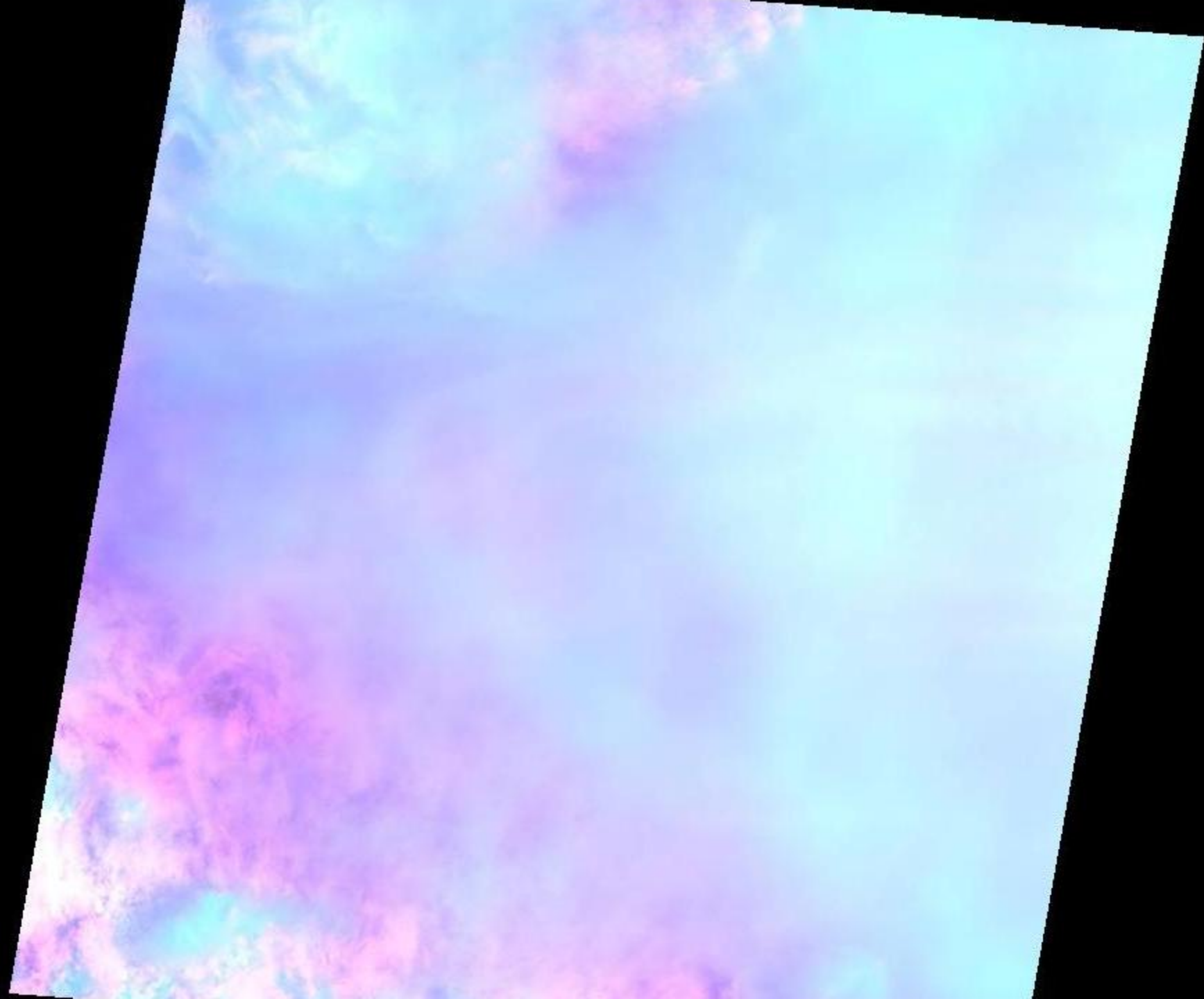
Cloud cover in 2002 (Path/Row 117/061)



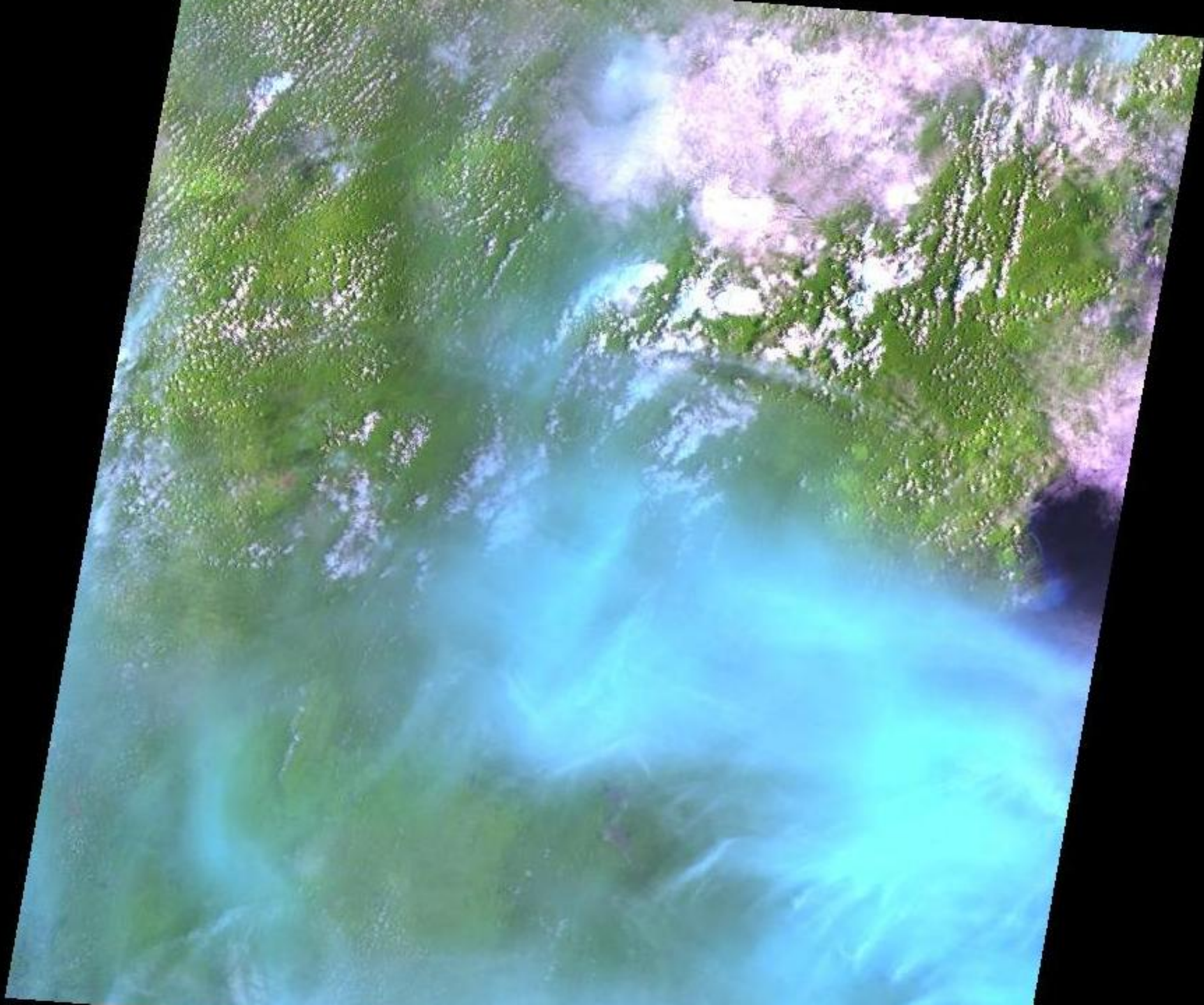




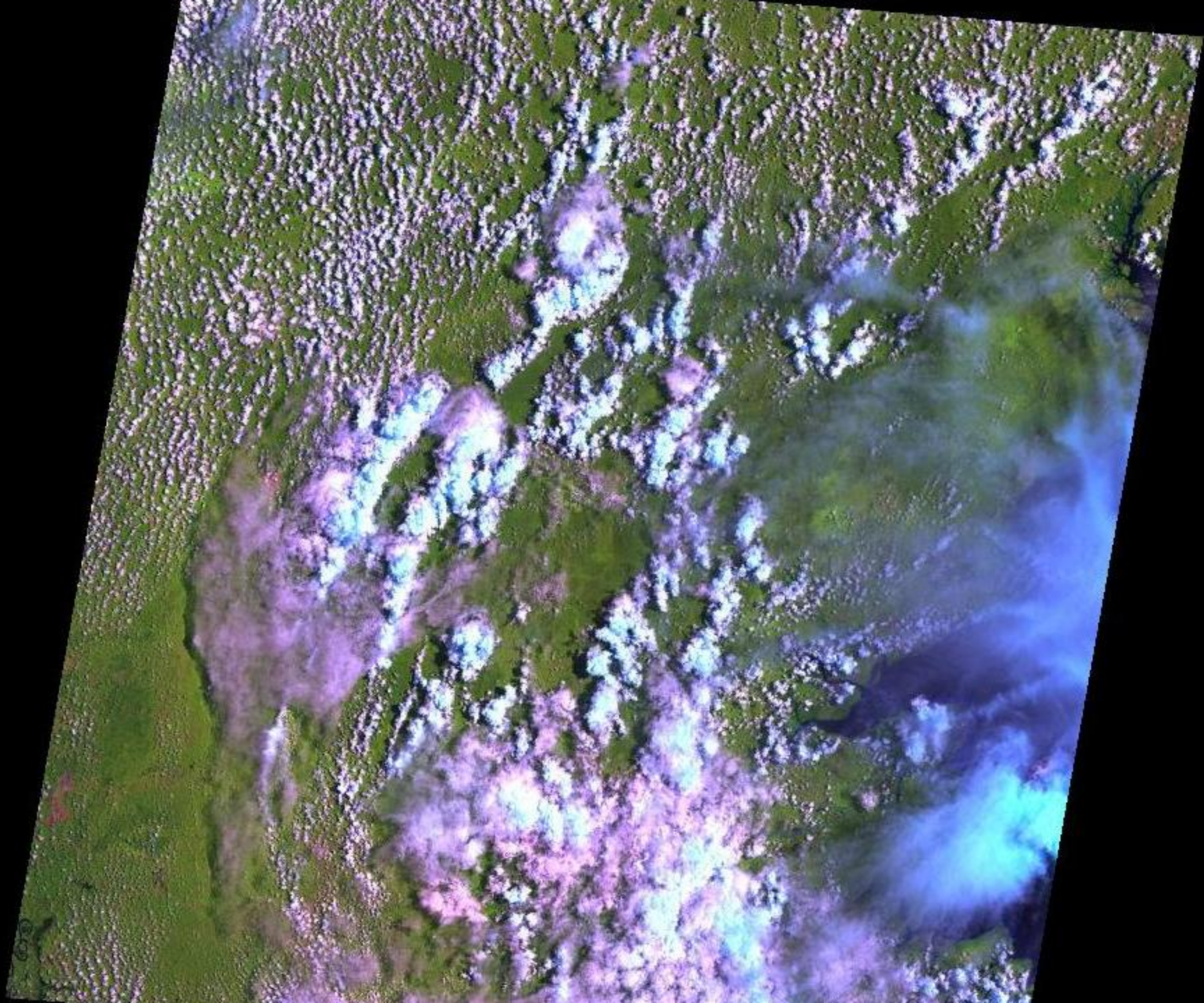




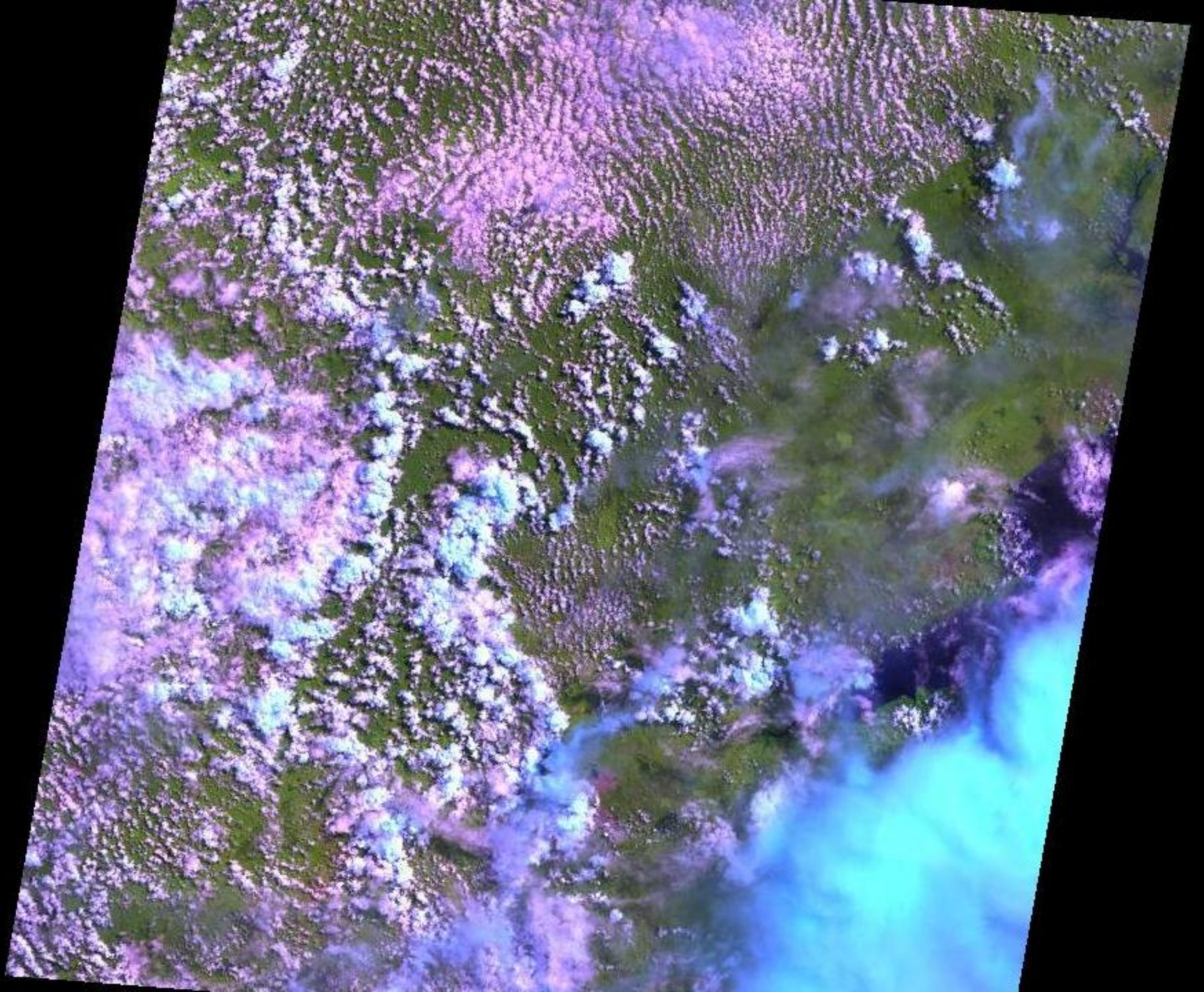




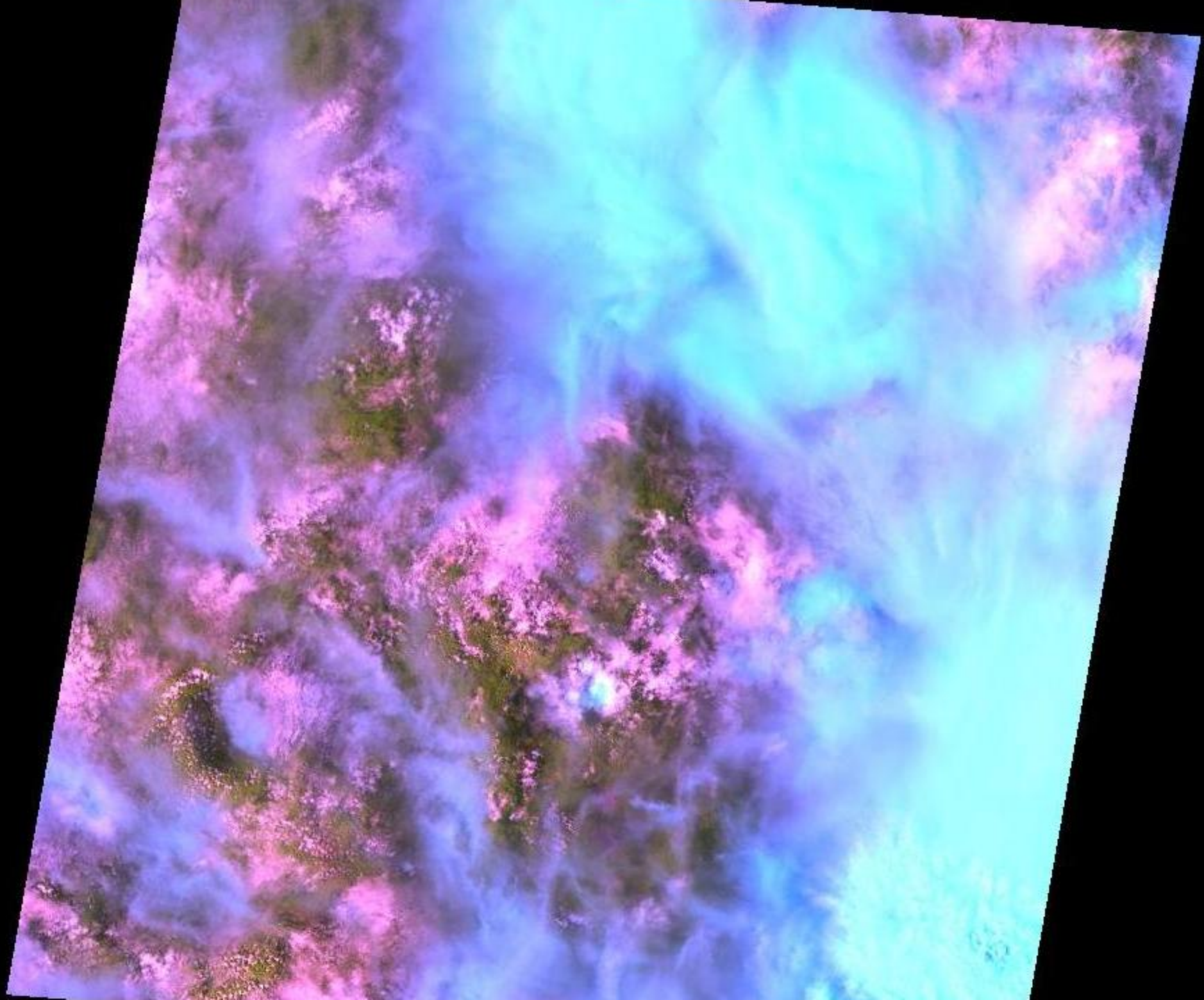




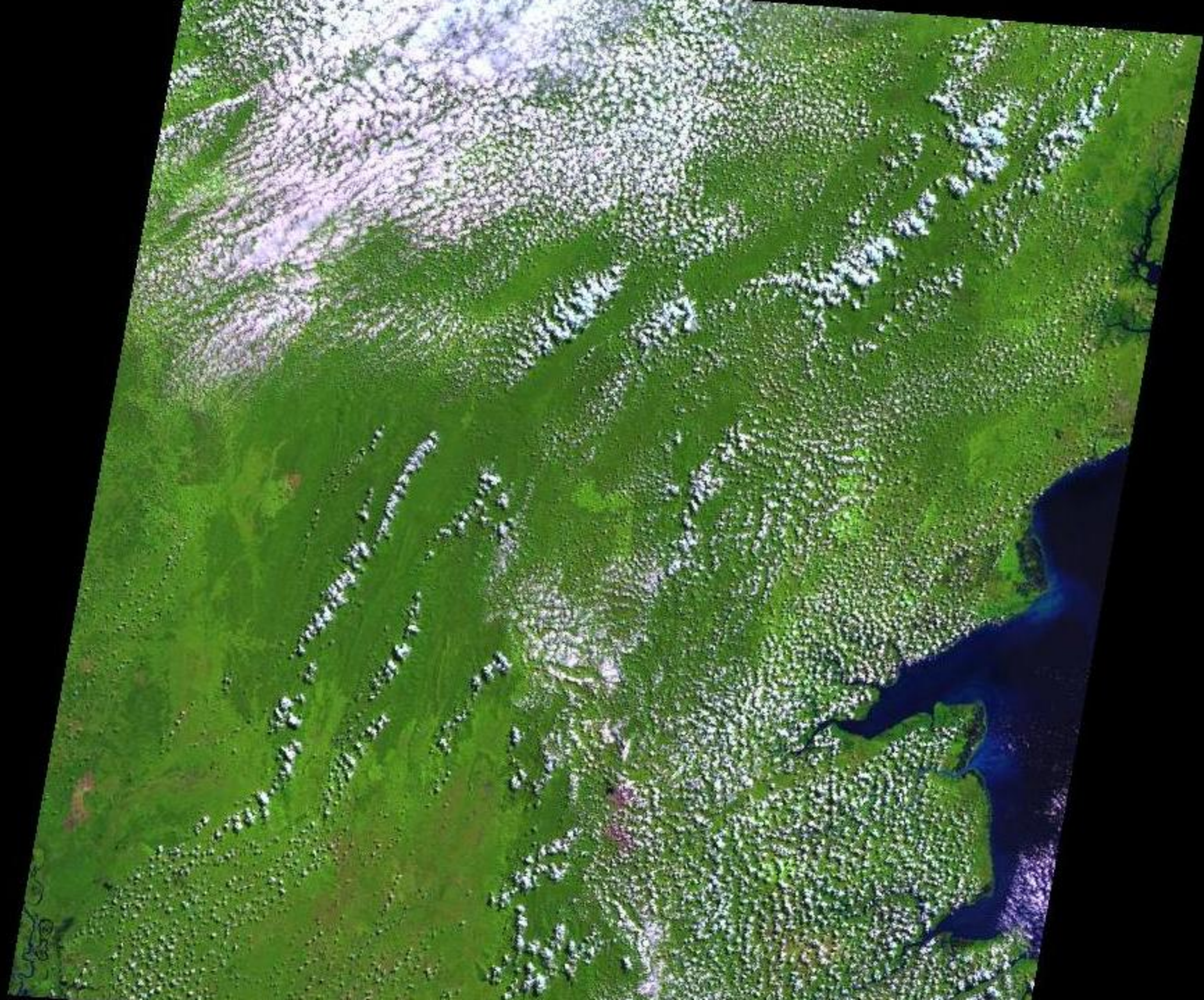




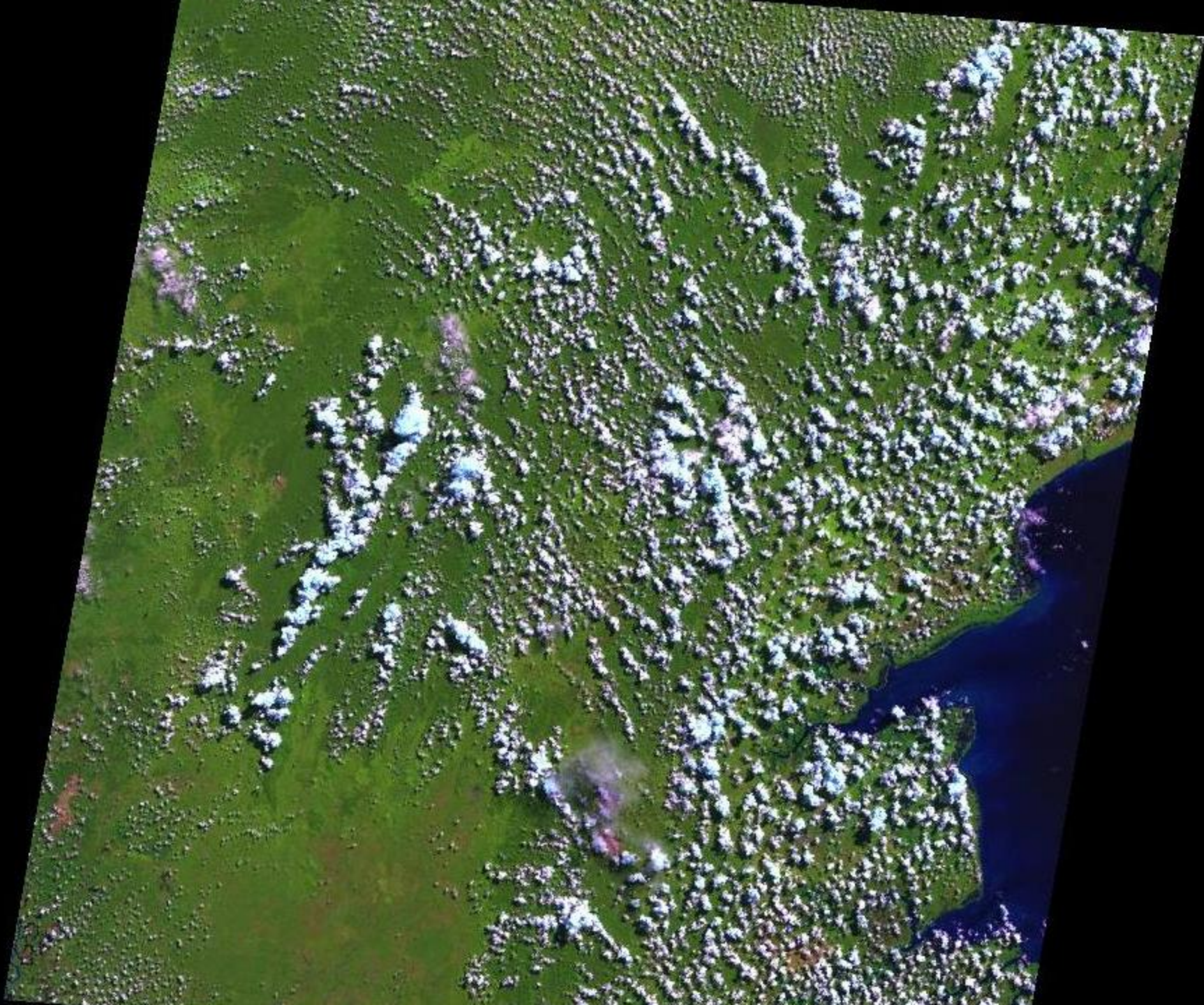




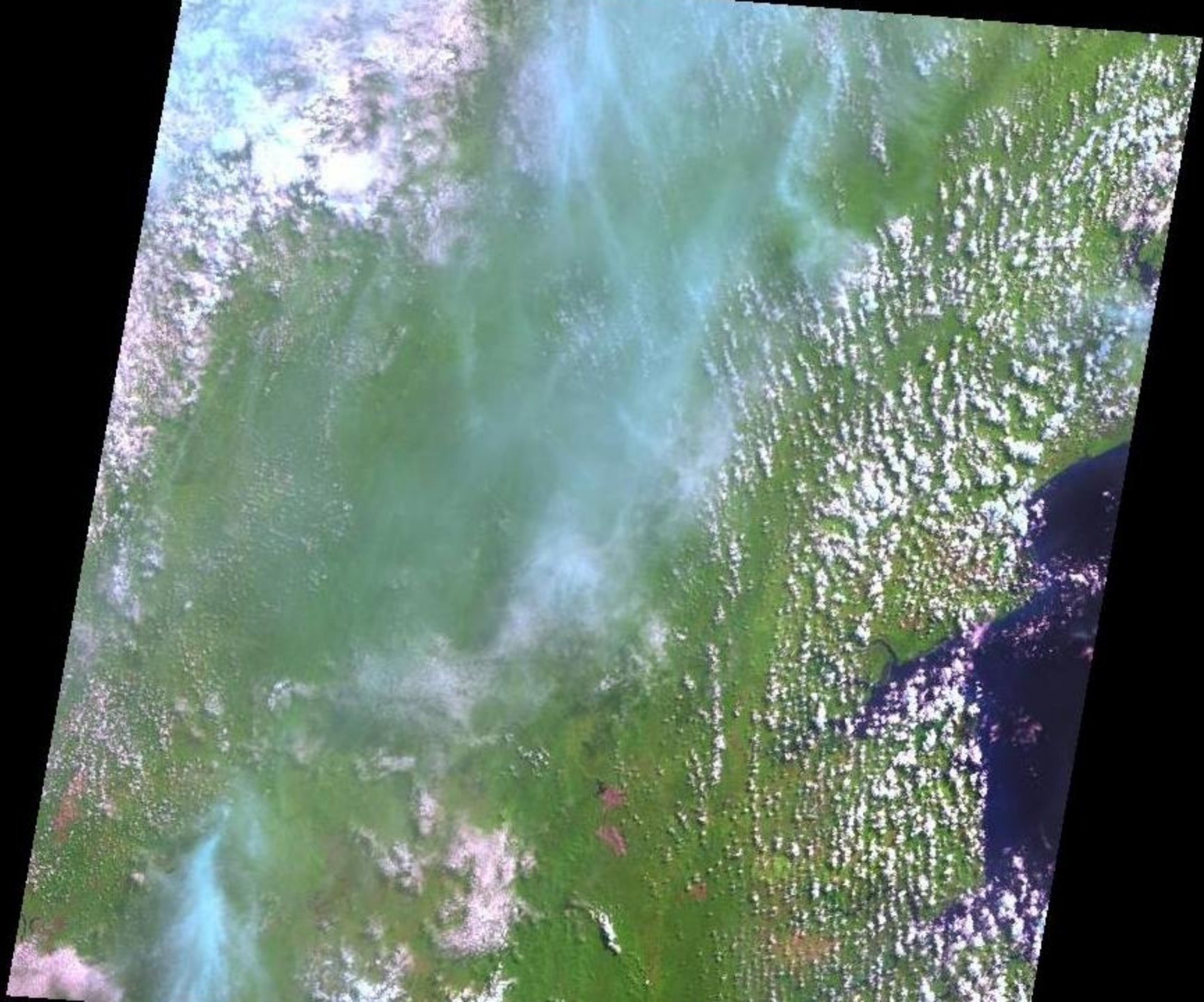




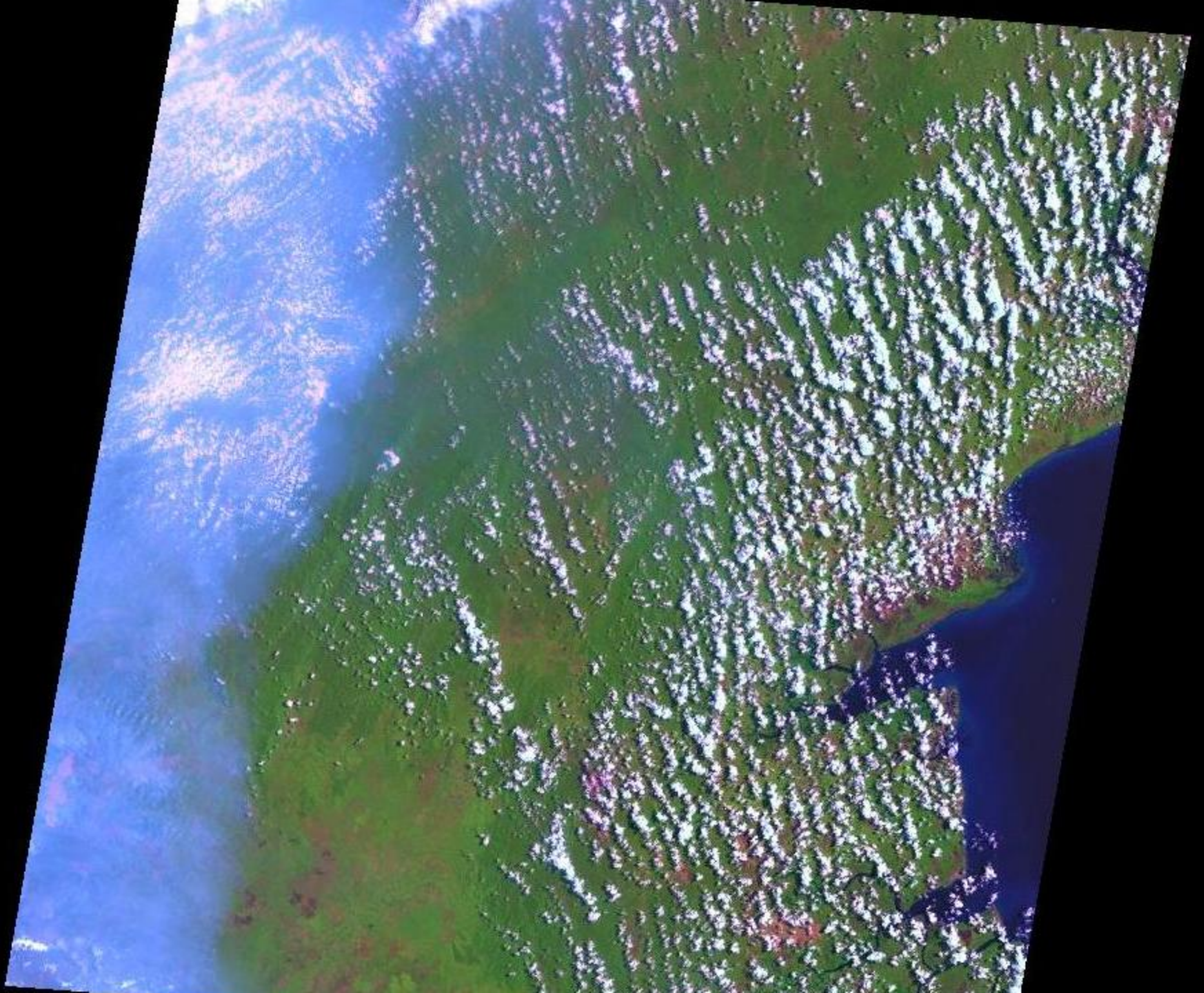








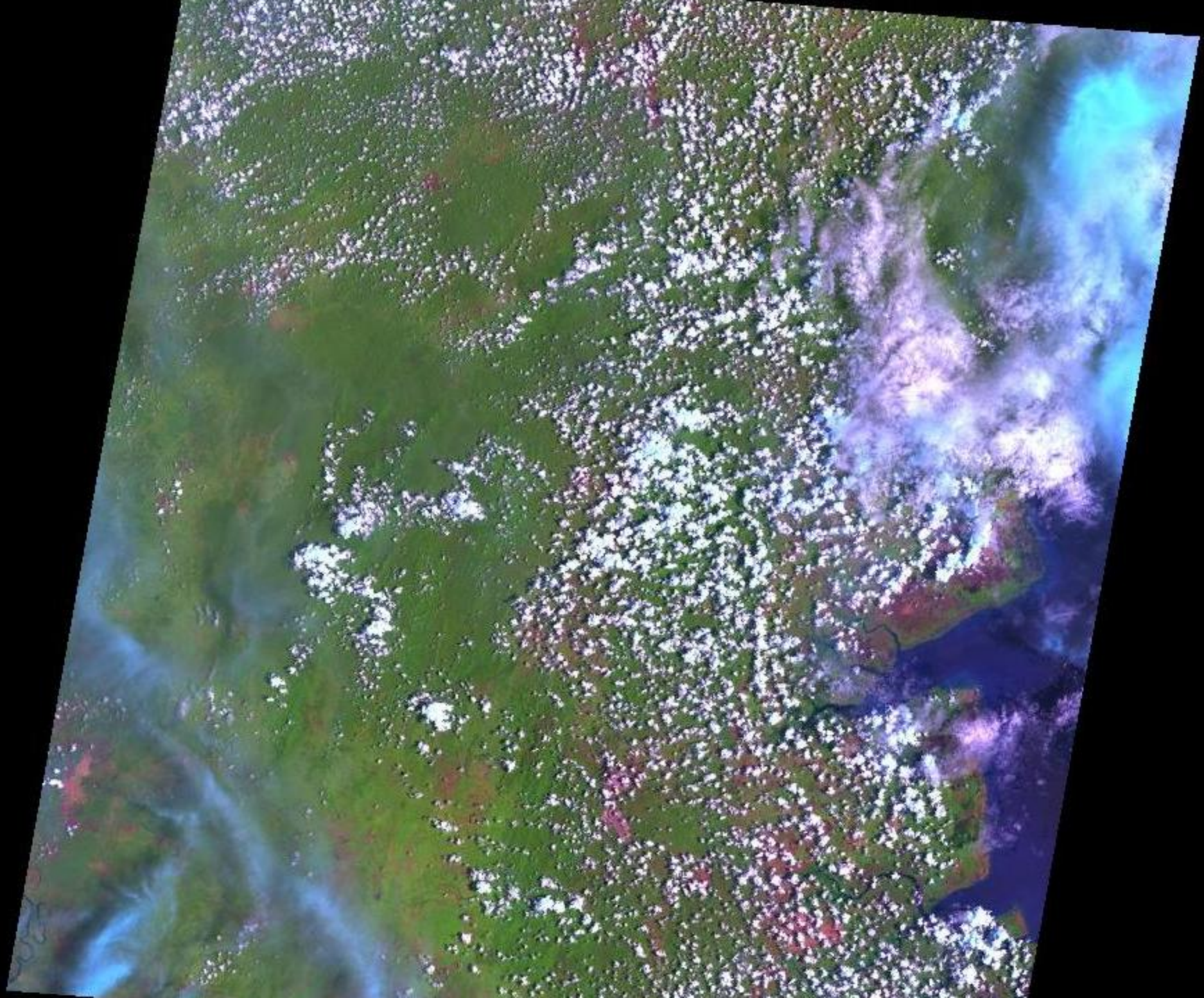




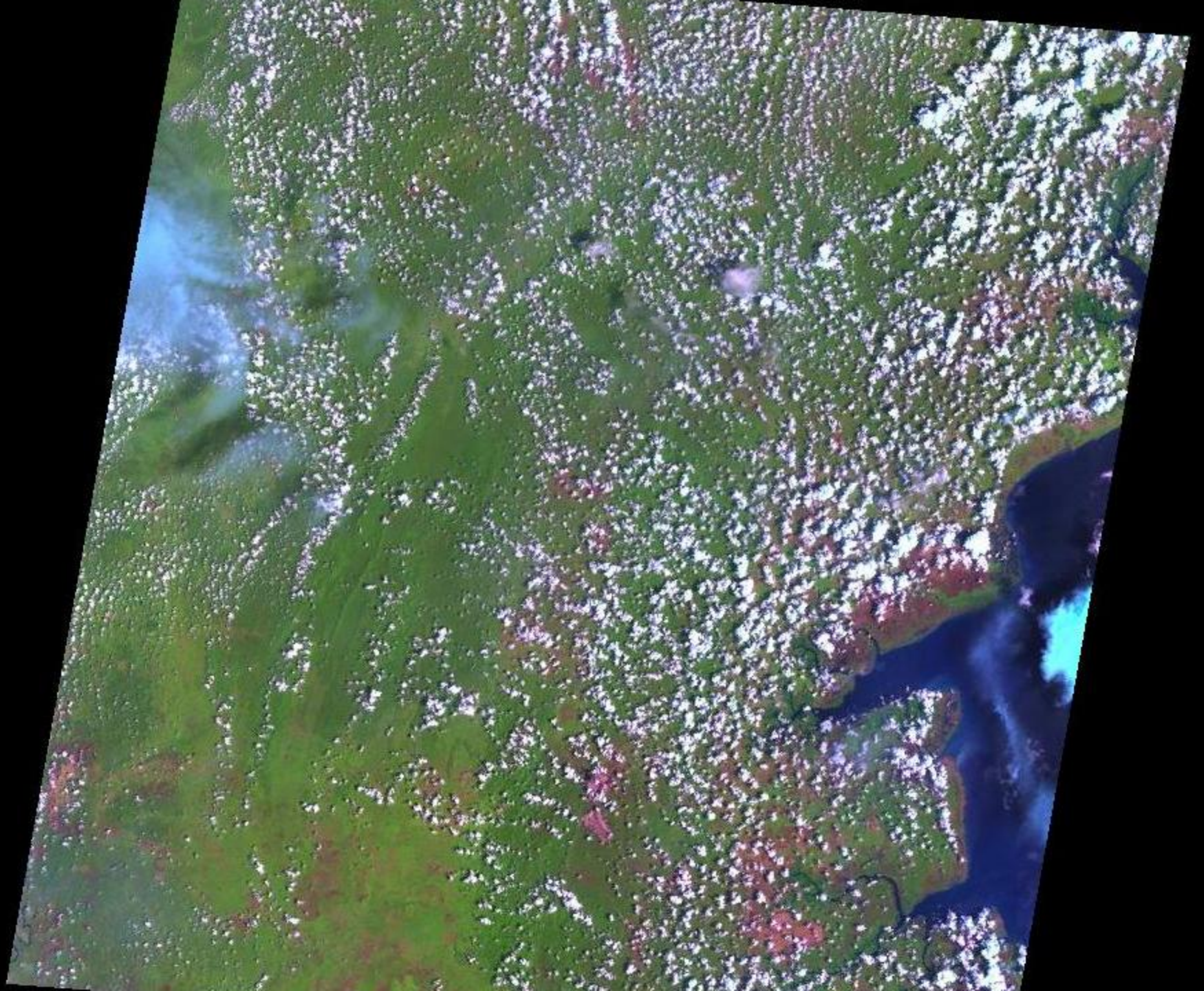




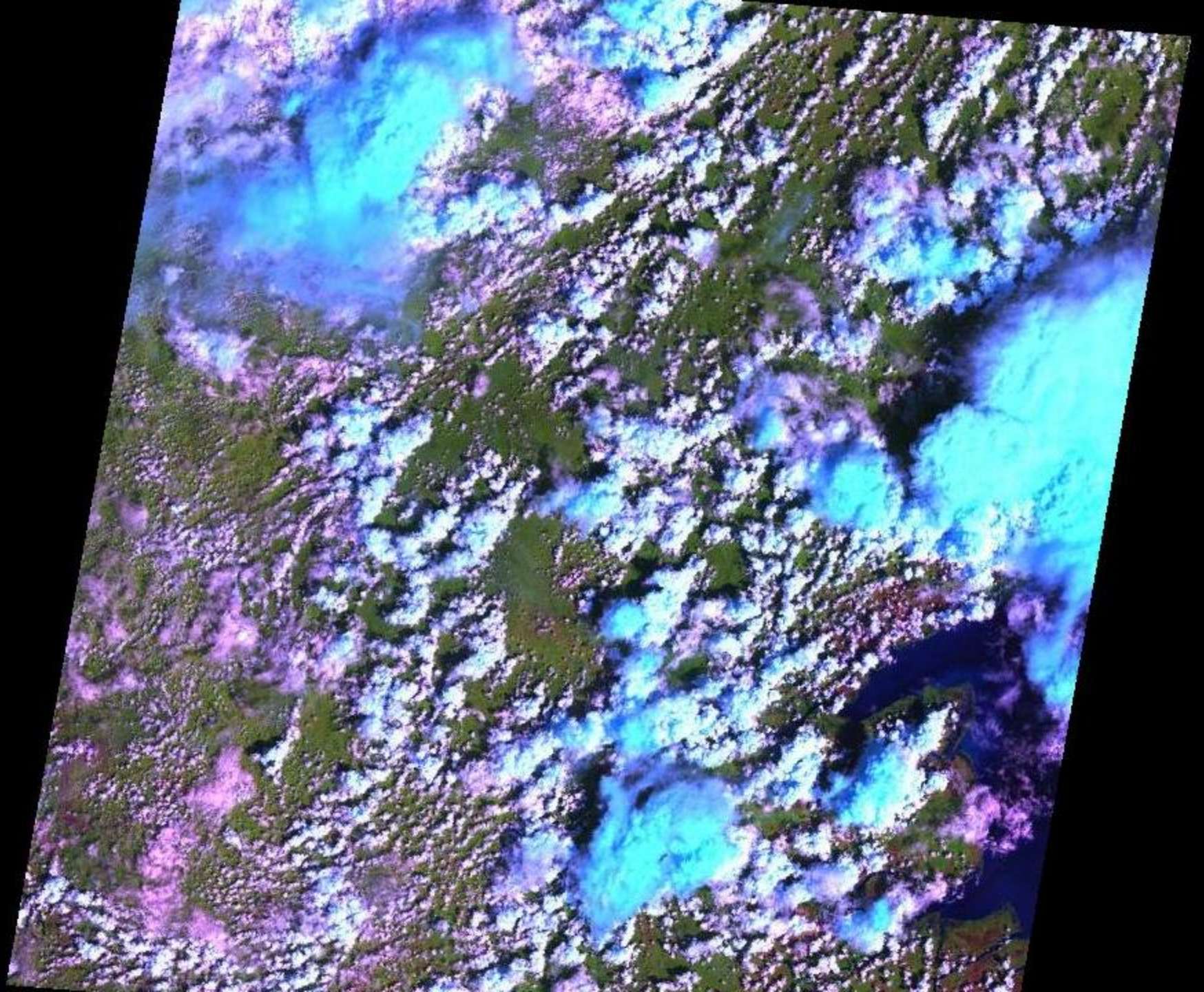




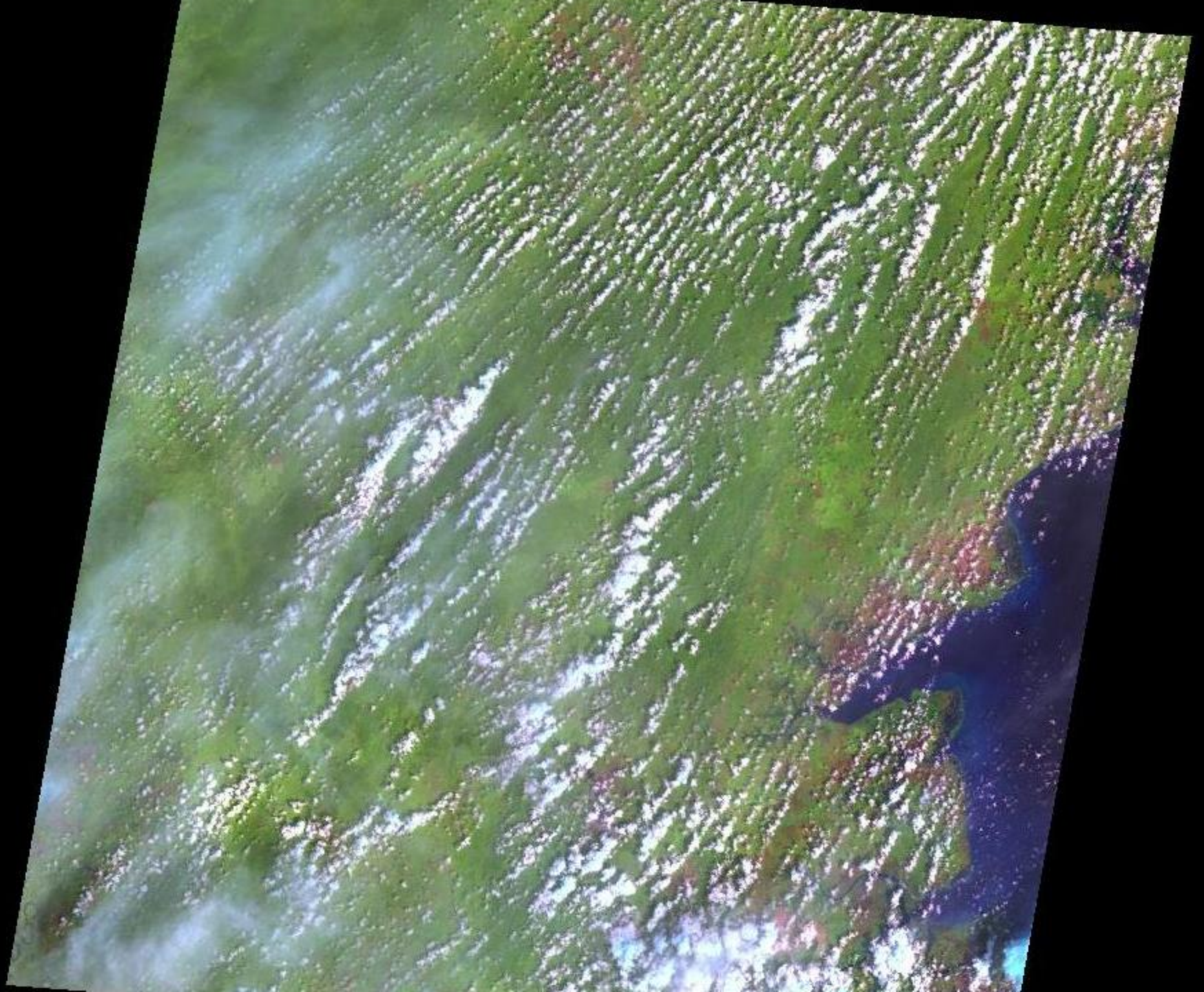




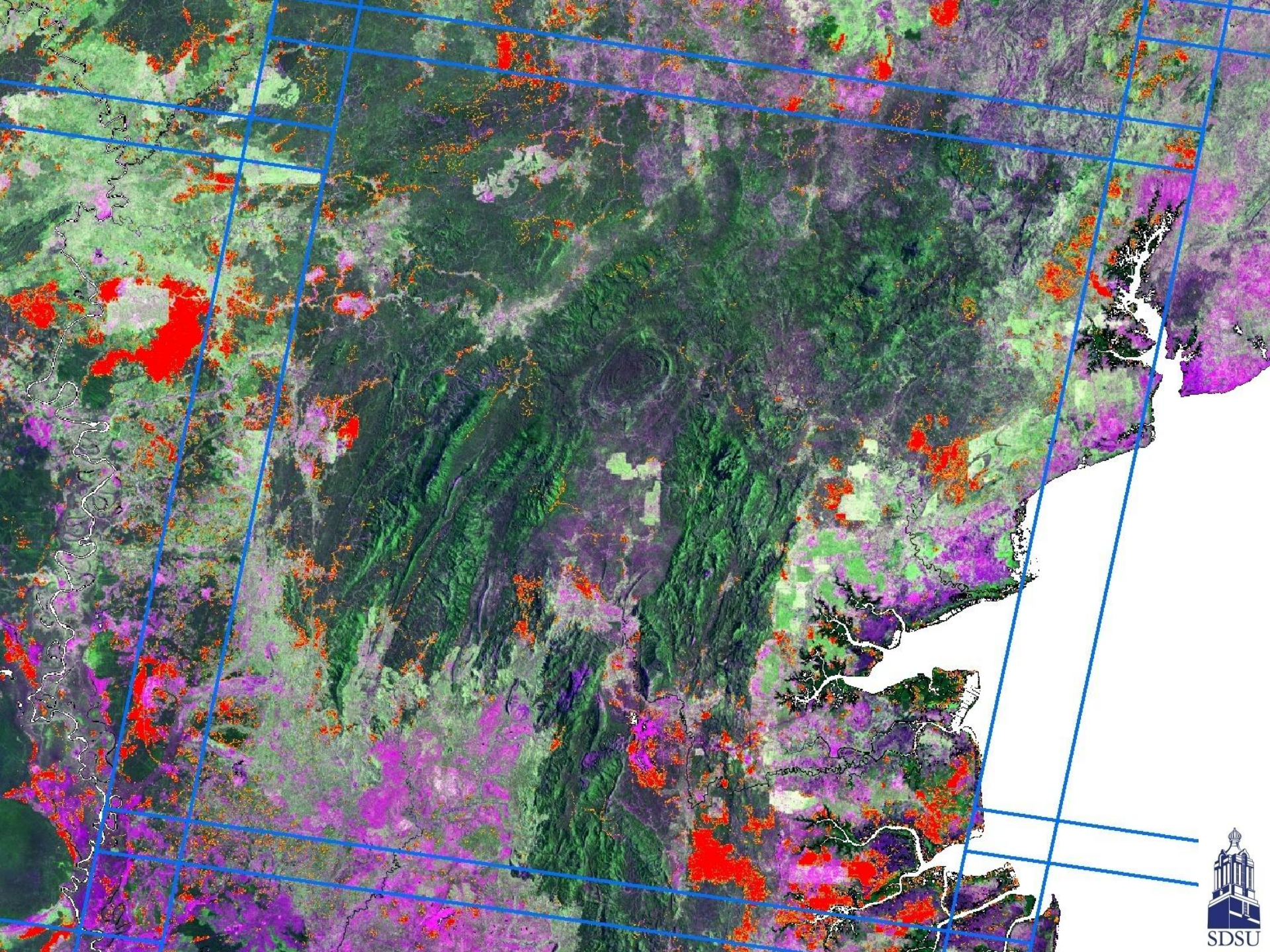










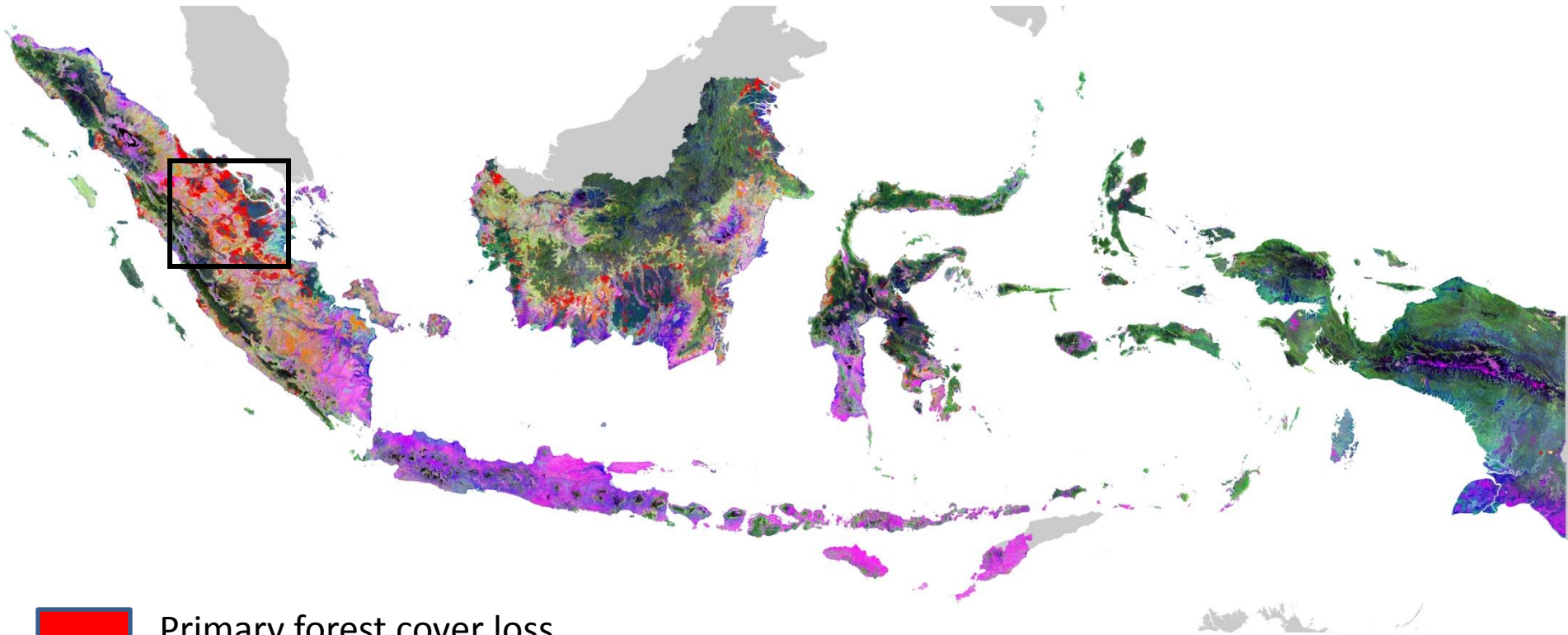


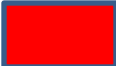





# Forest cover loss in Indonesia, 2000 to 2010

15,692 Landsat Enhanced Thematic Mapper Plus images from 1999 to 2010




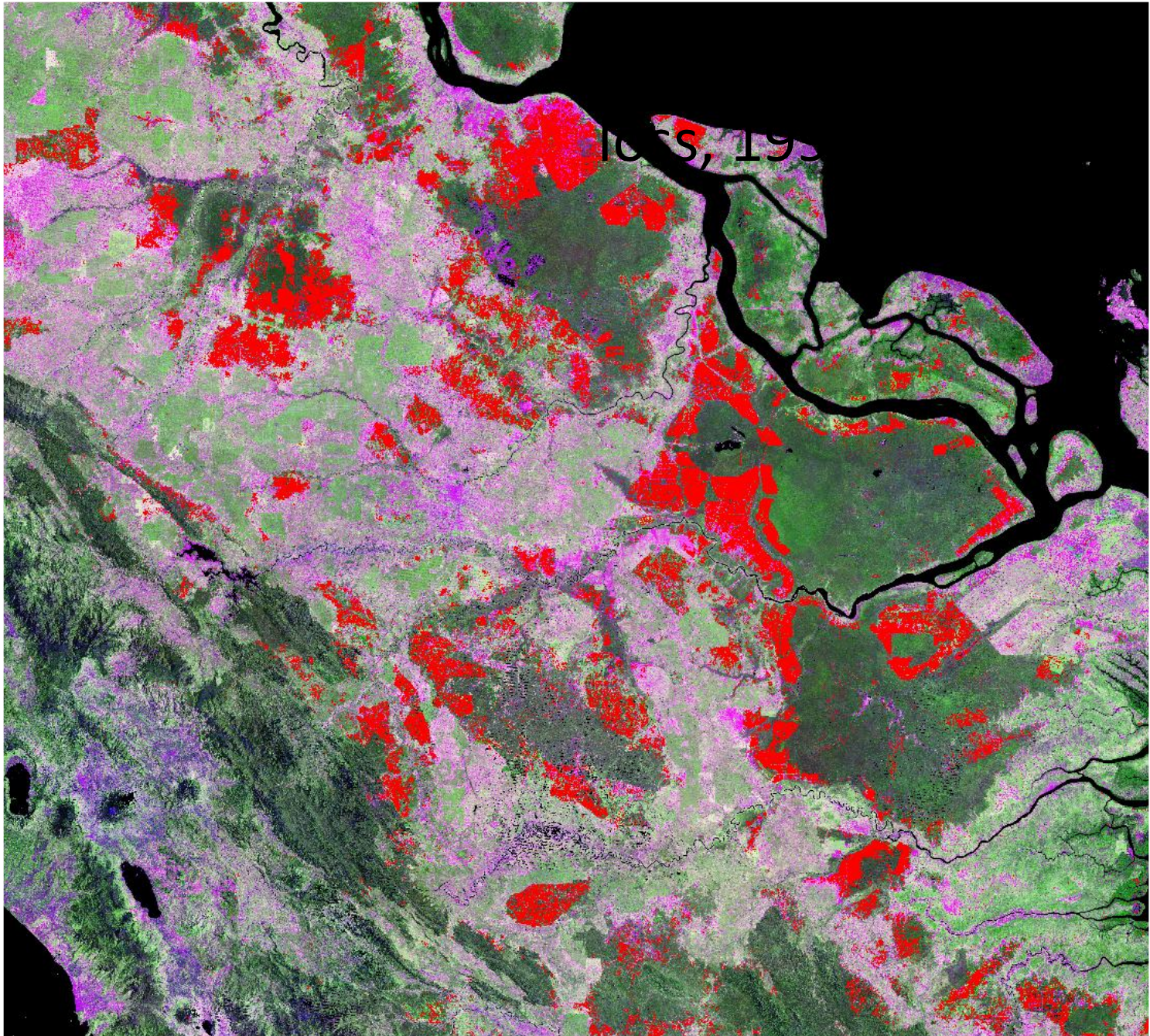
-  Primary forest cover loss
-  Other forest cover loss

Nearly 1 million hectares per year, almost half in primary forests




Total  
forest  
cover  
loss

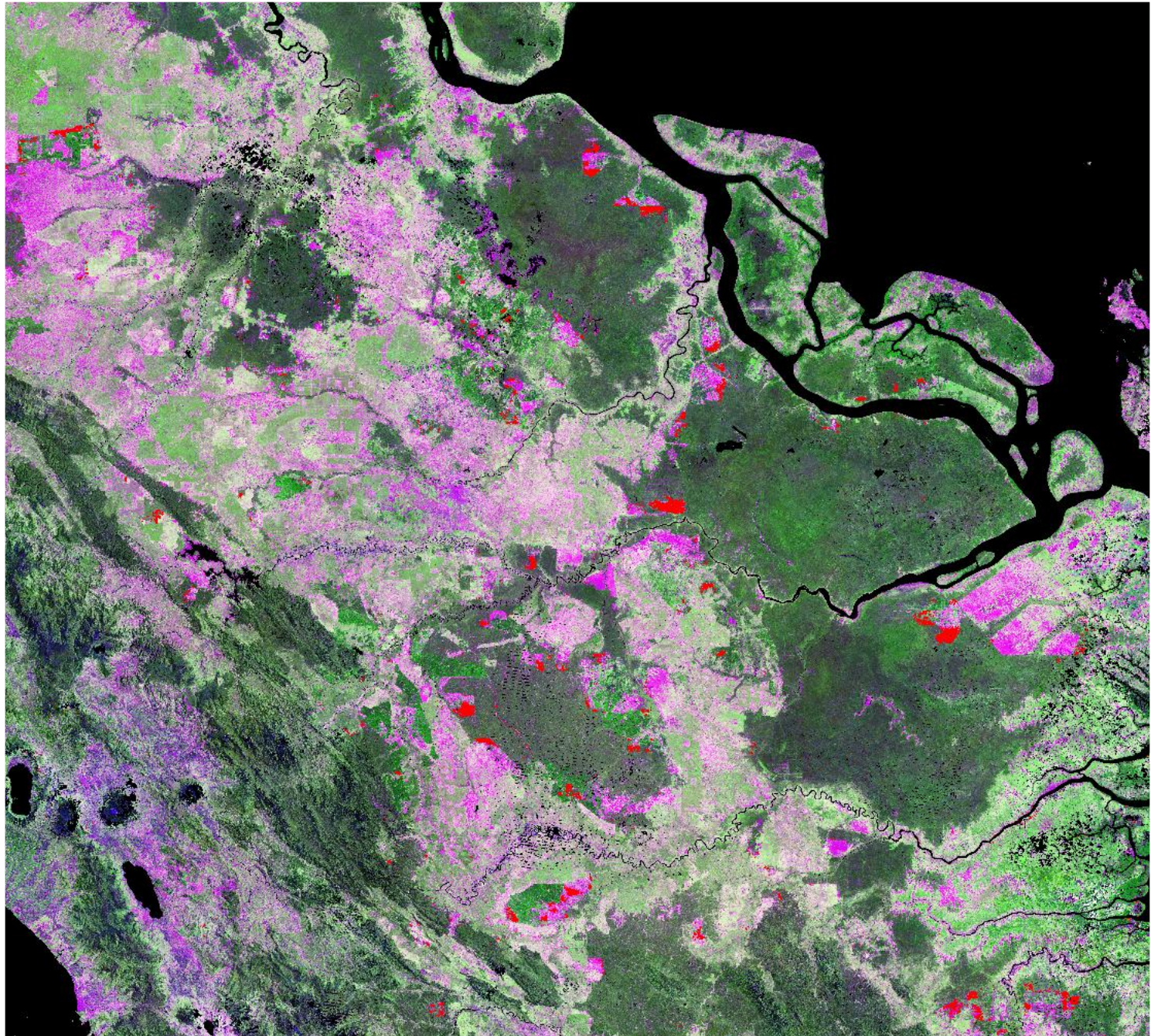
 00-08





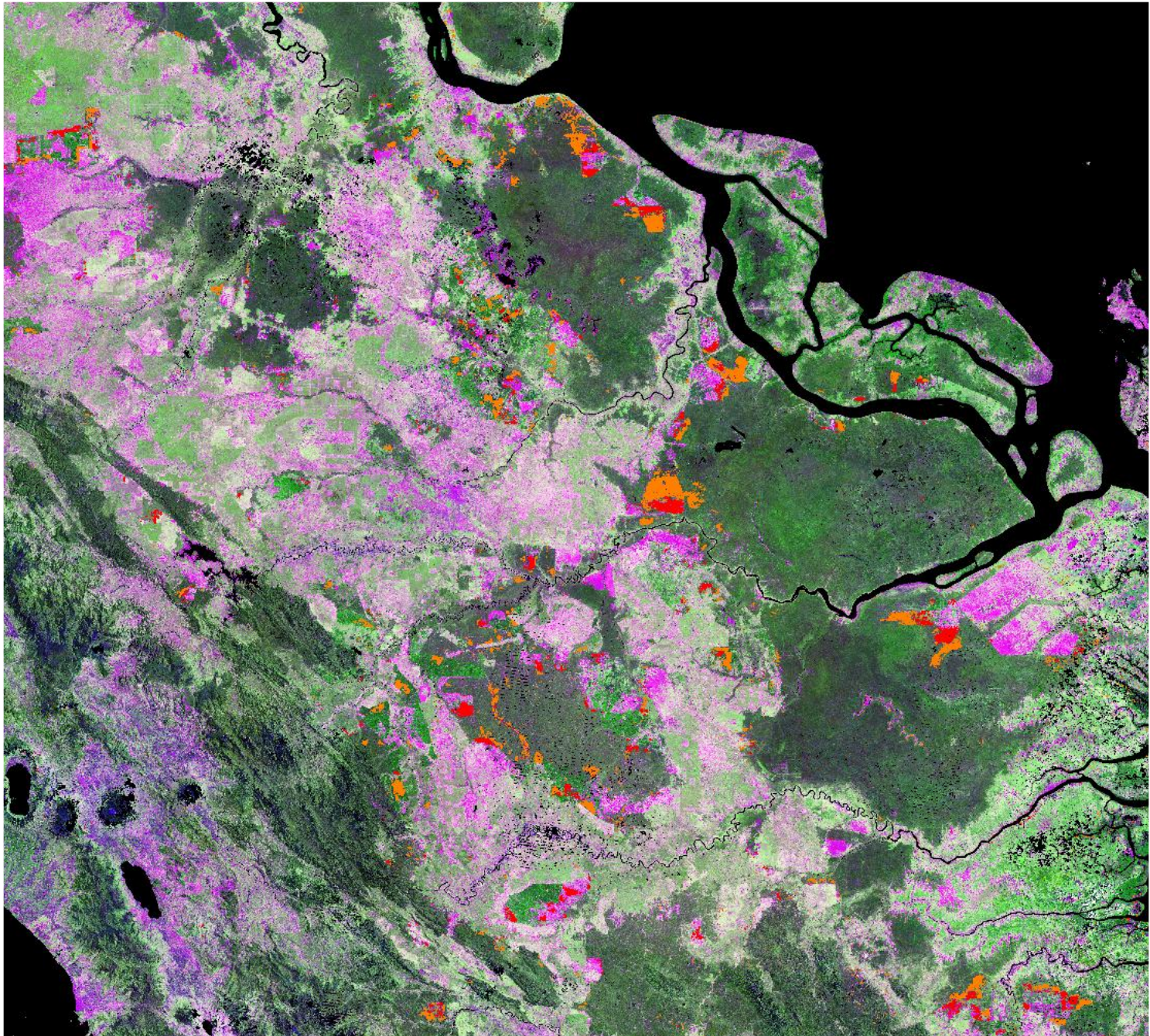
Annual  
forest  
cover  
loss

 00-01



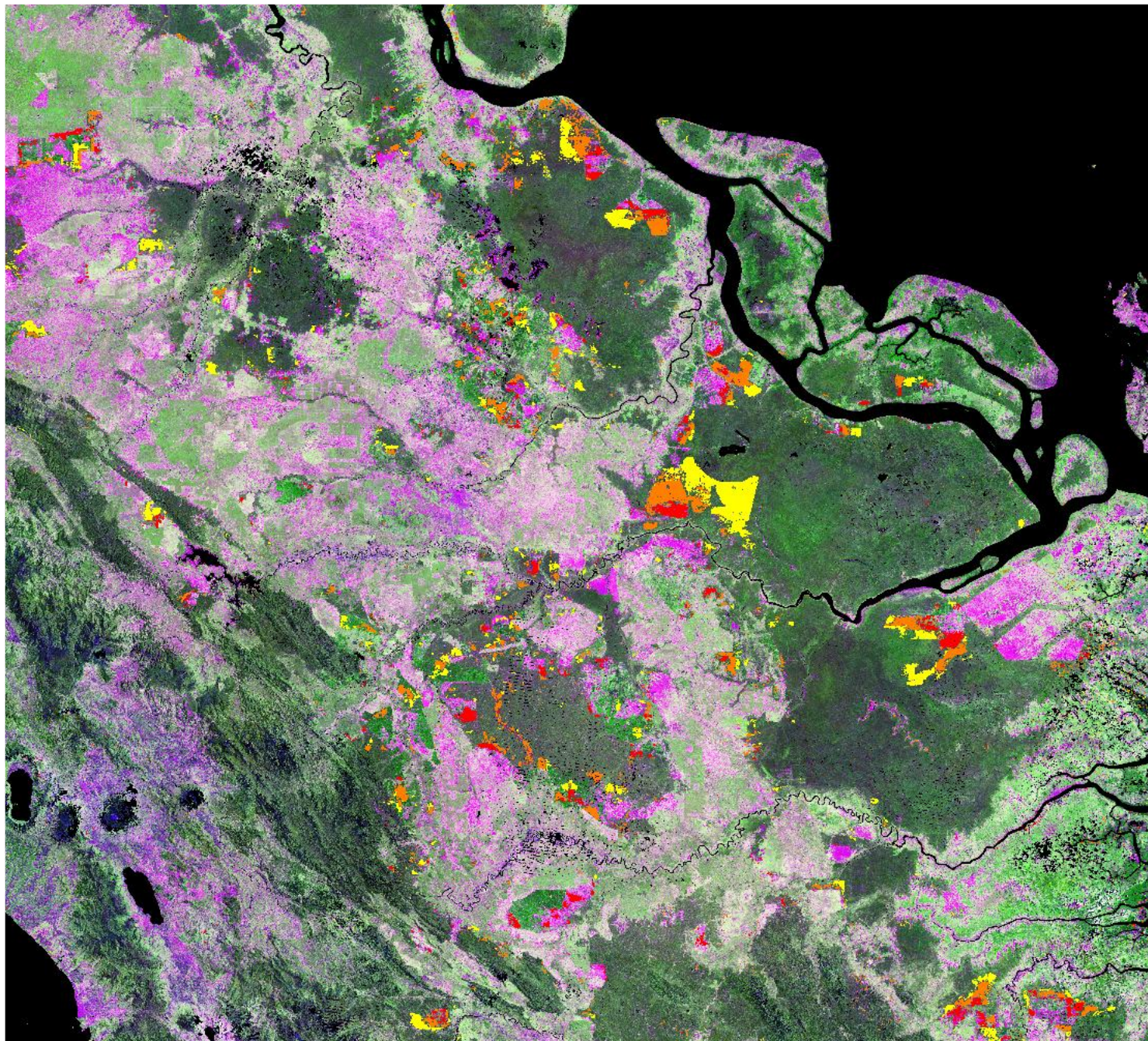


Annual  
forest  
cover  
loss



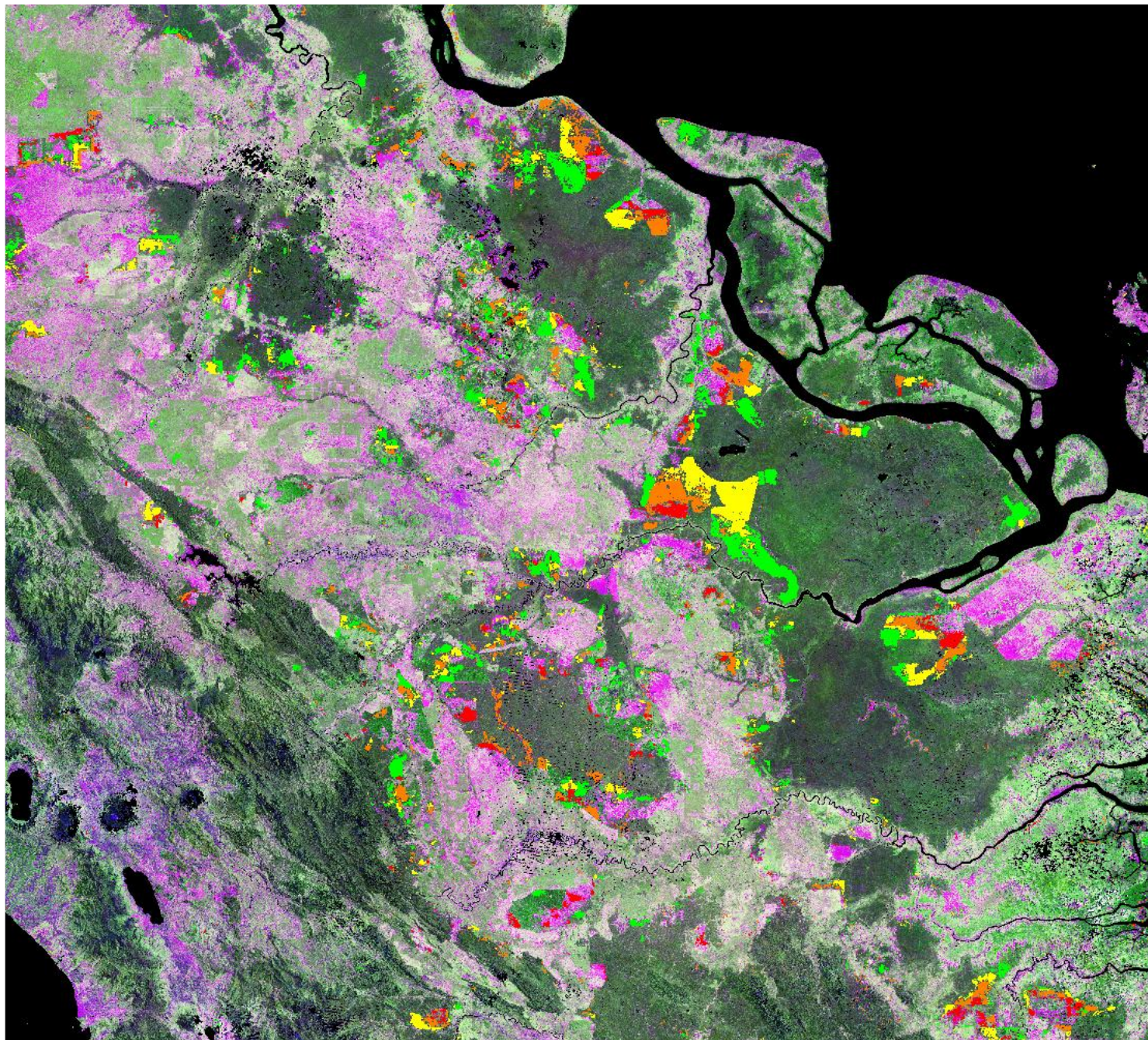
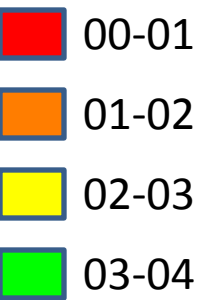


Annual  
forest  
cover  
loss



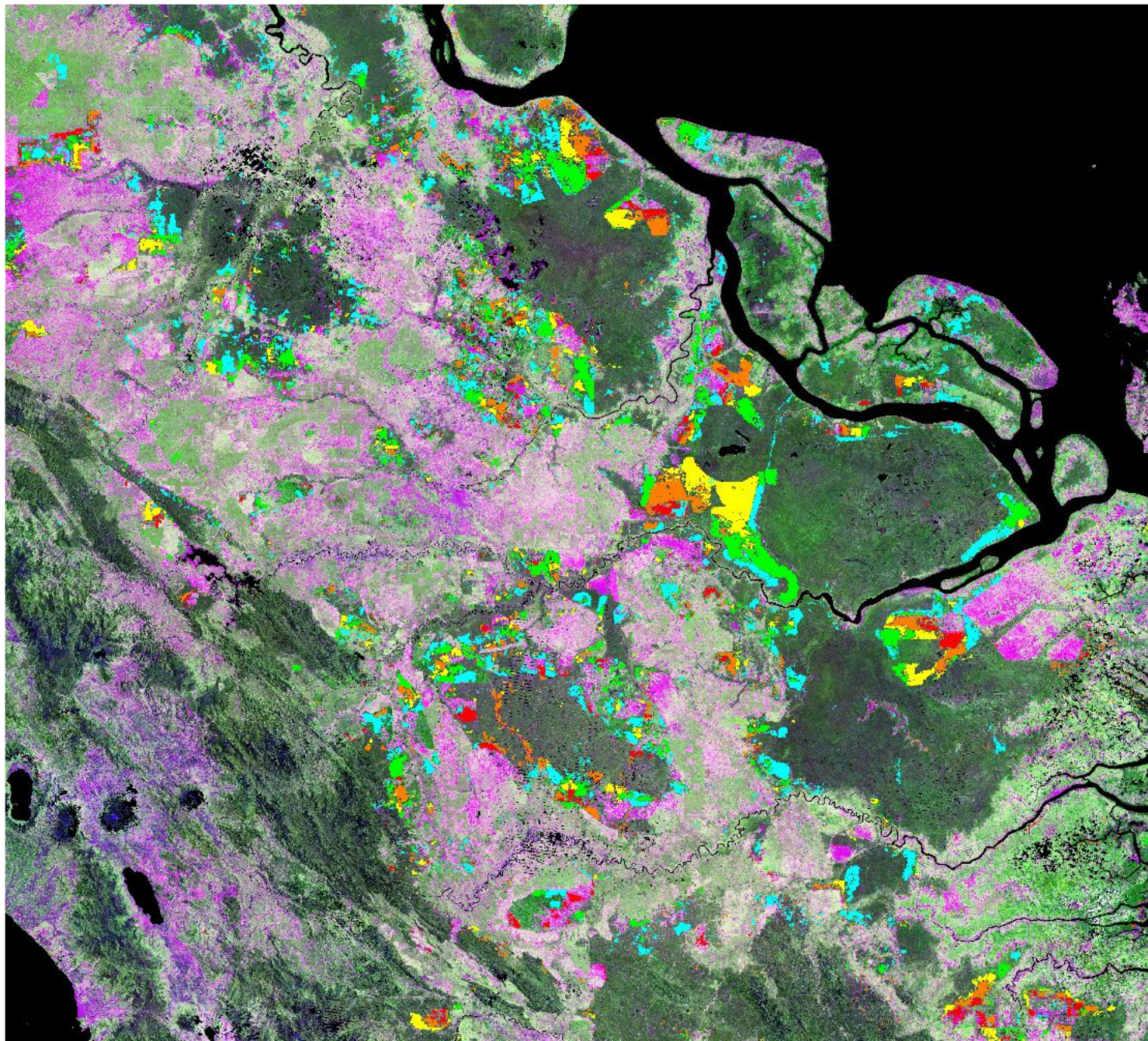


Annual  
forest  
cover  
loss



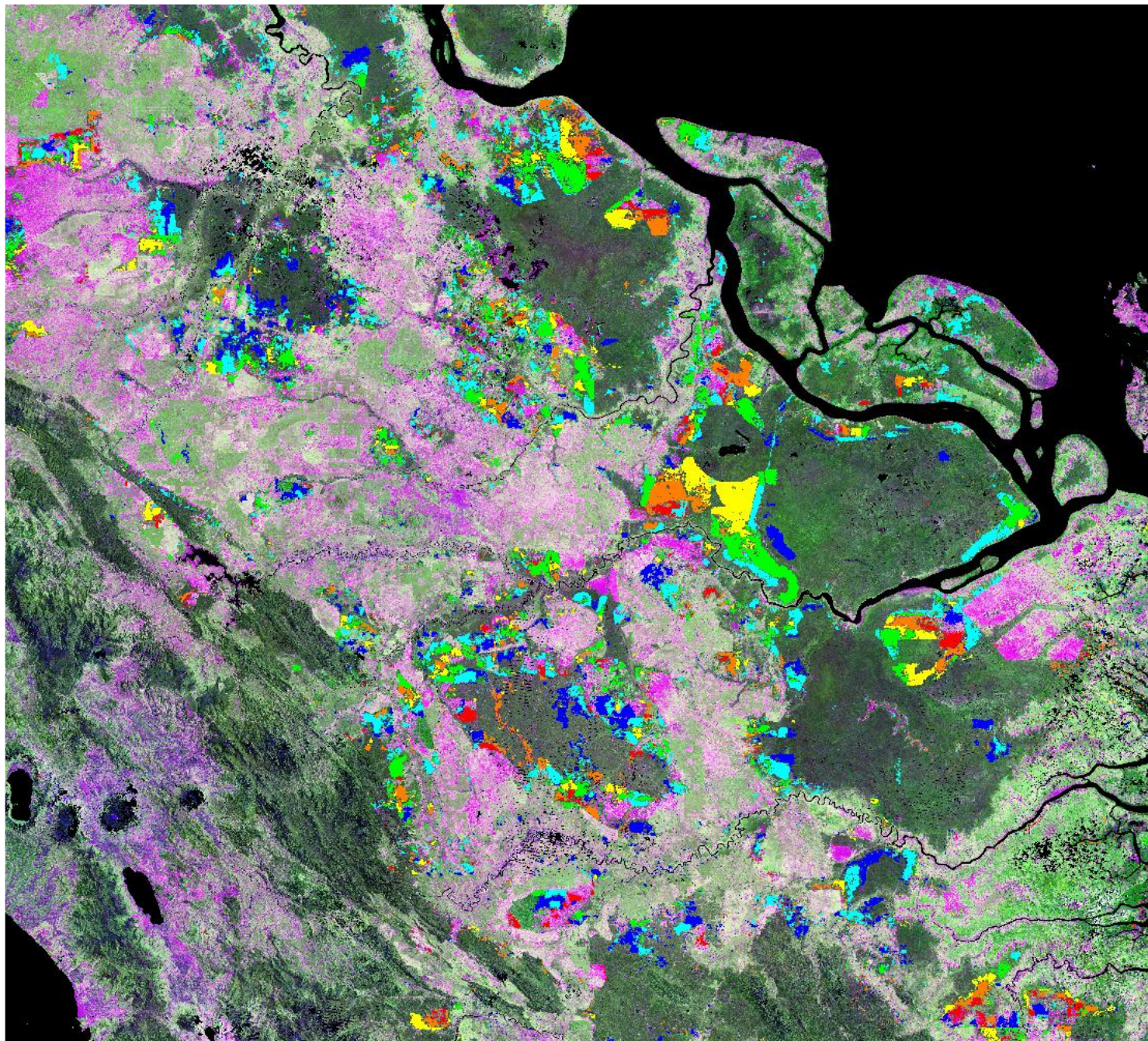
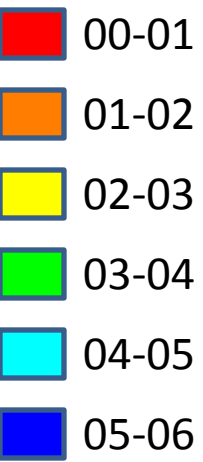


Annual  
forest  
cover  
loss



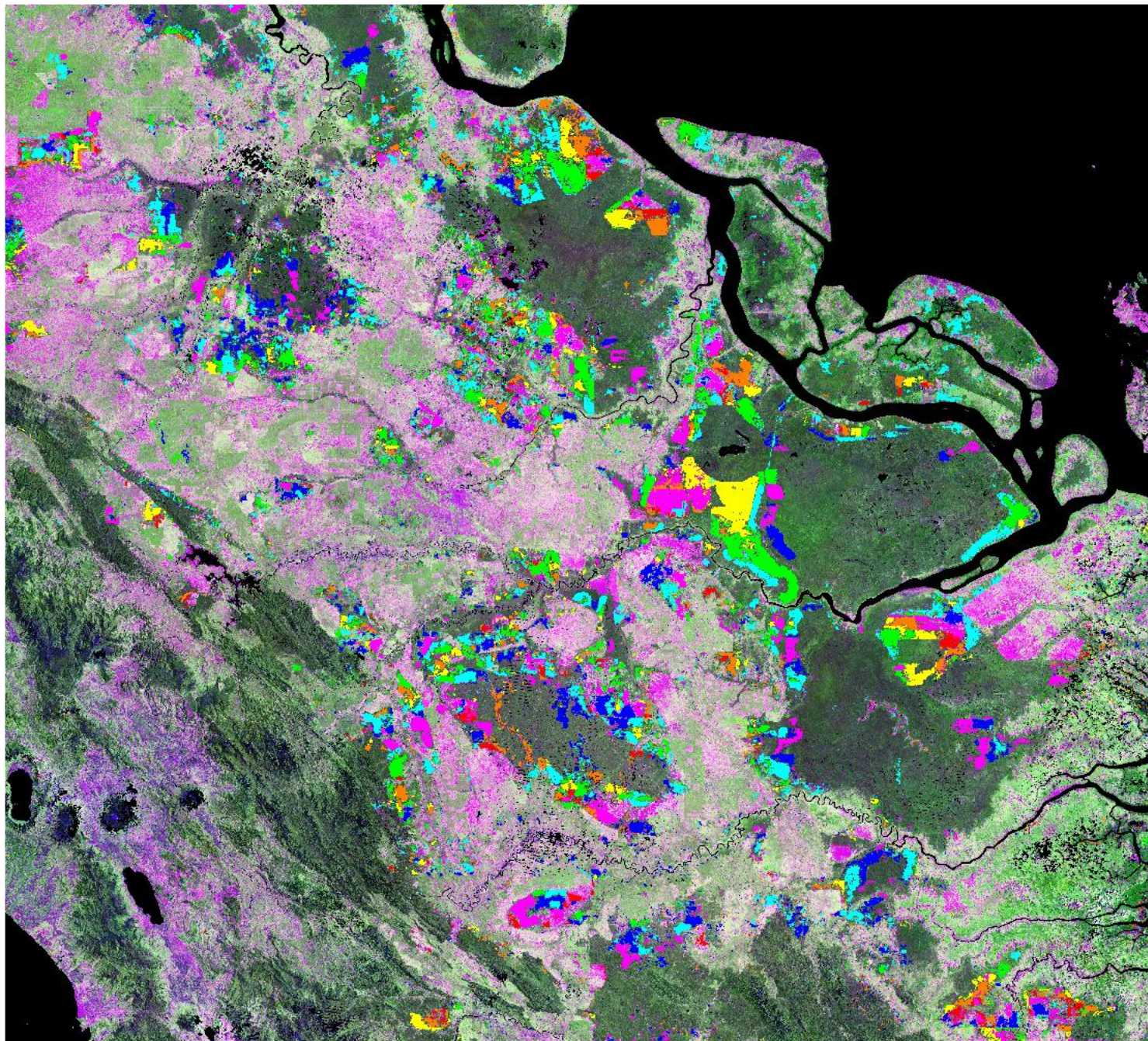


Annual  
forest  
cover  
loss



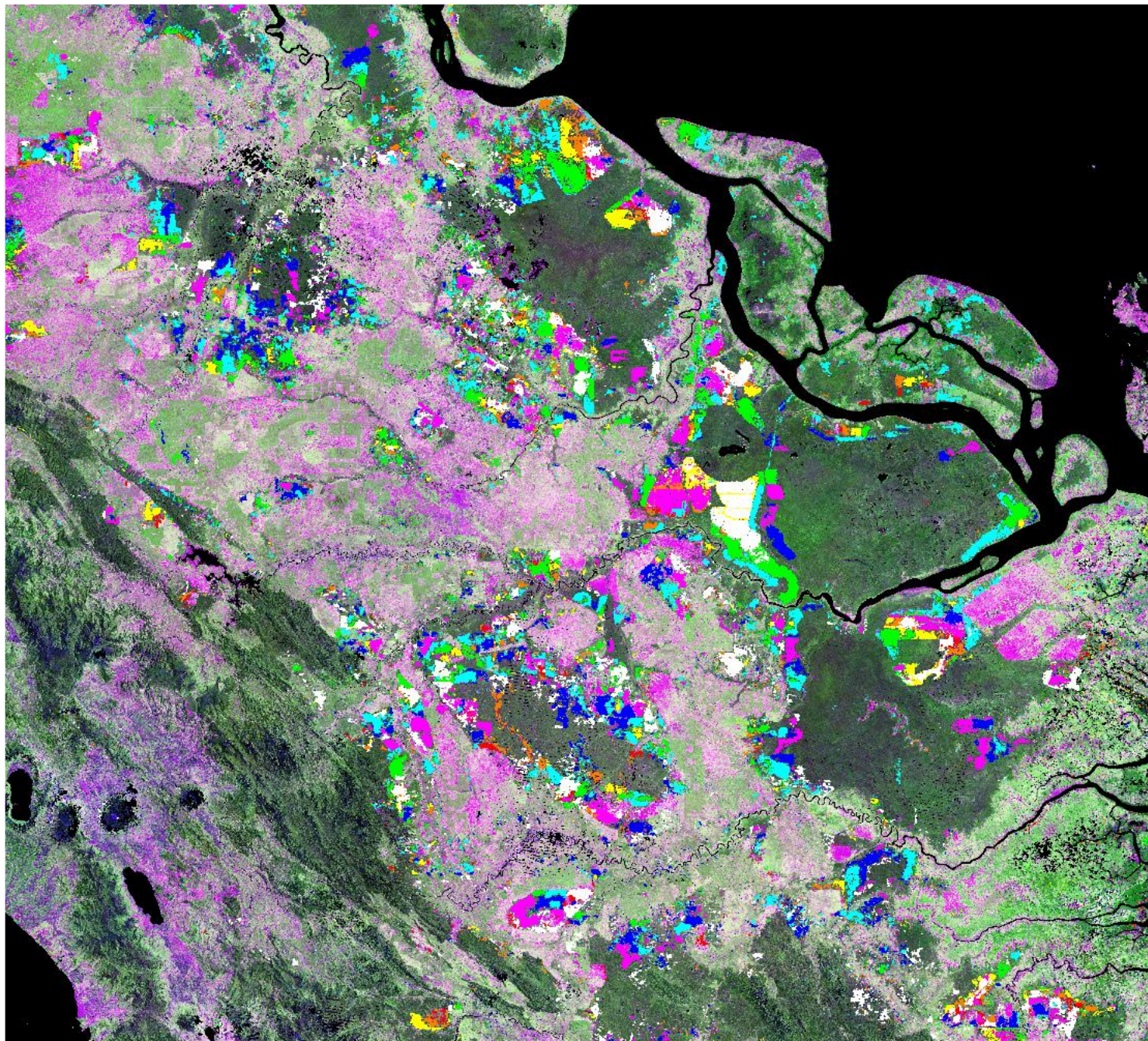


Annual  
forest  
cover  
loss



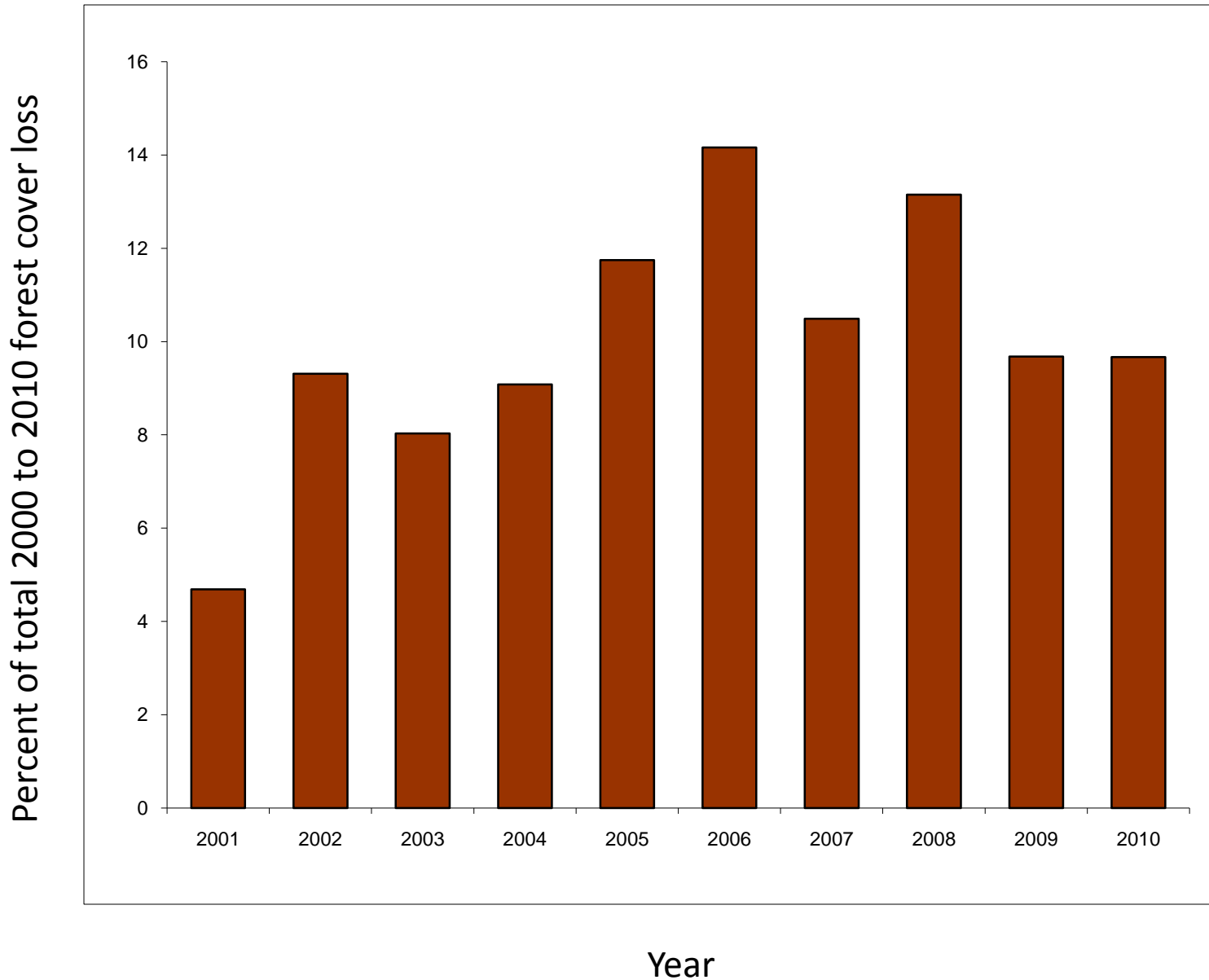


Annual  
forest  
cover  
loss



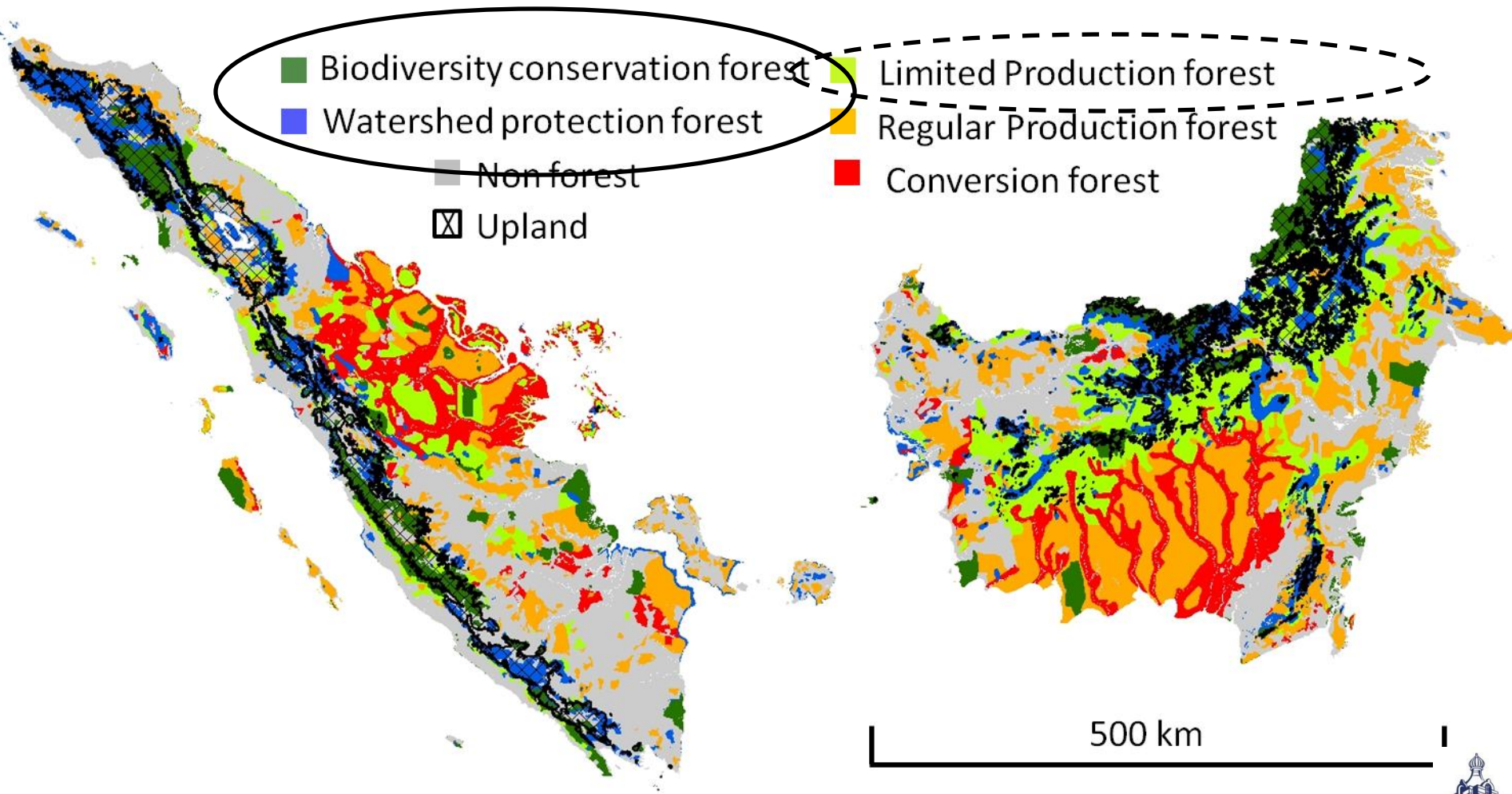


# Trend in forest cover loss





# Forest land use zones

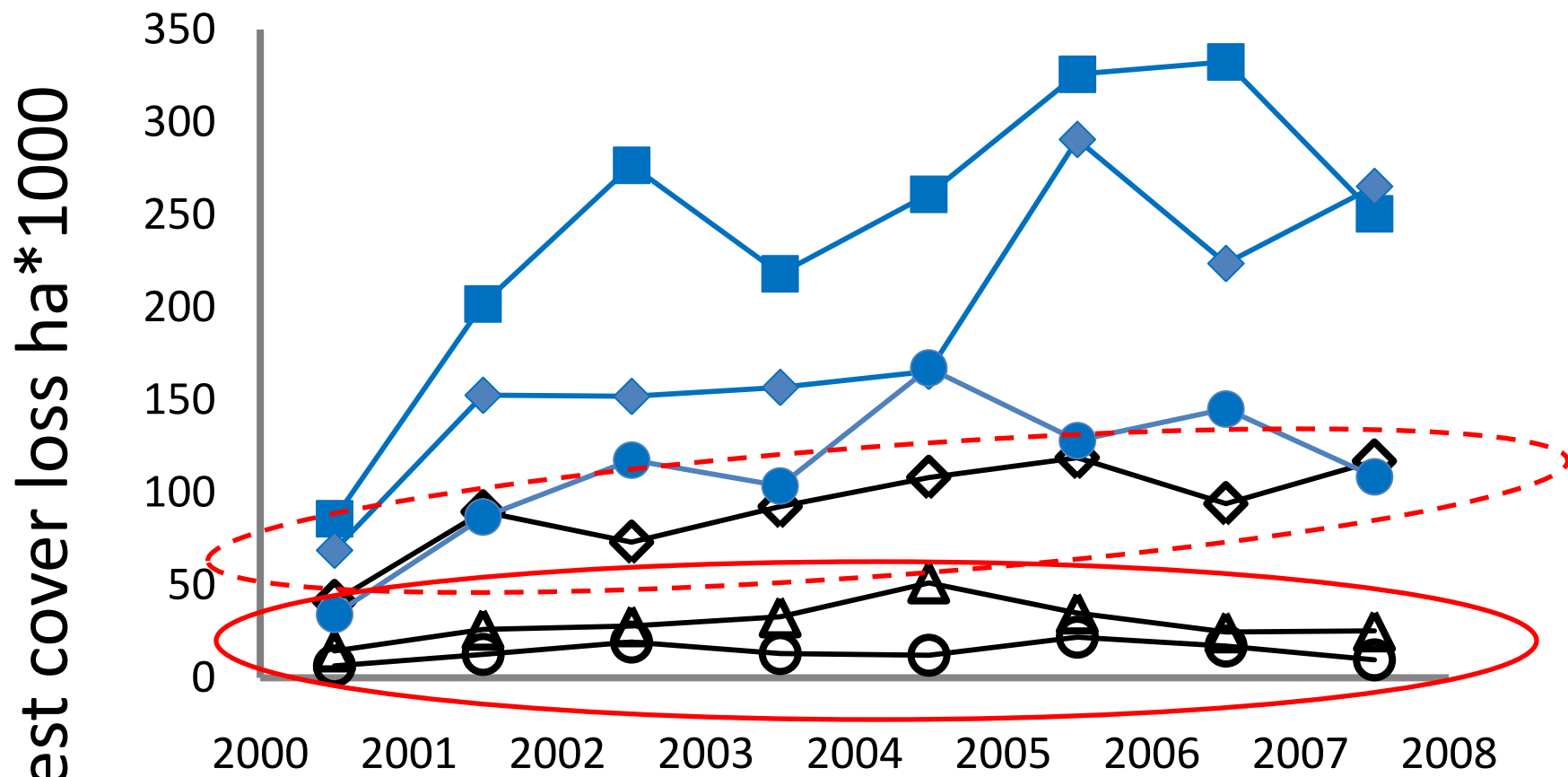


Indonesian Ministry of Forestry (2000)



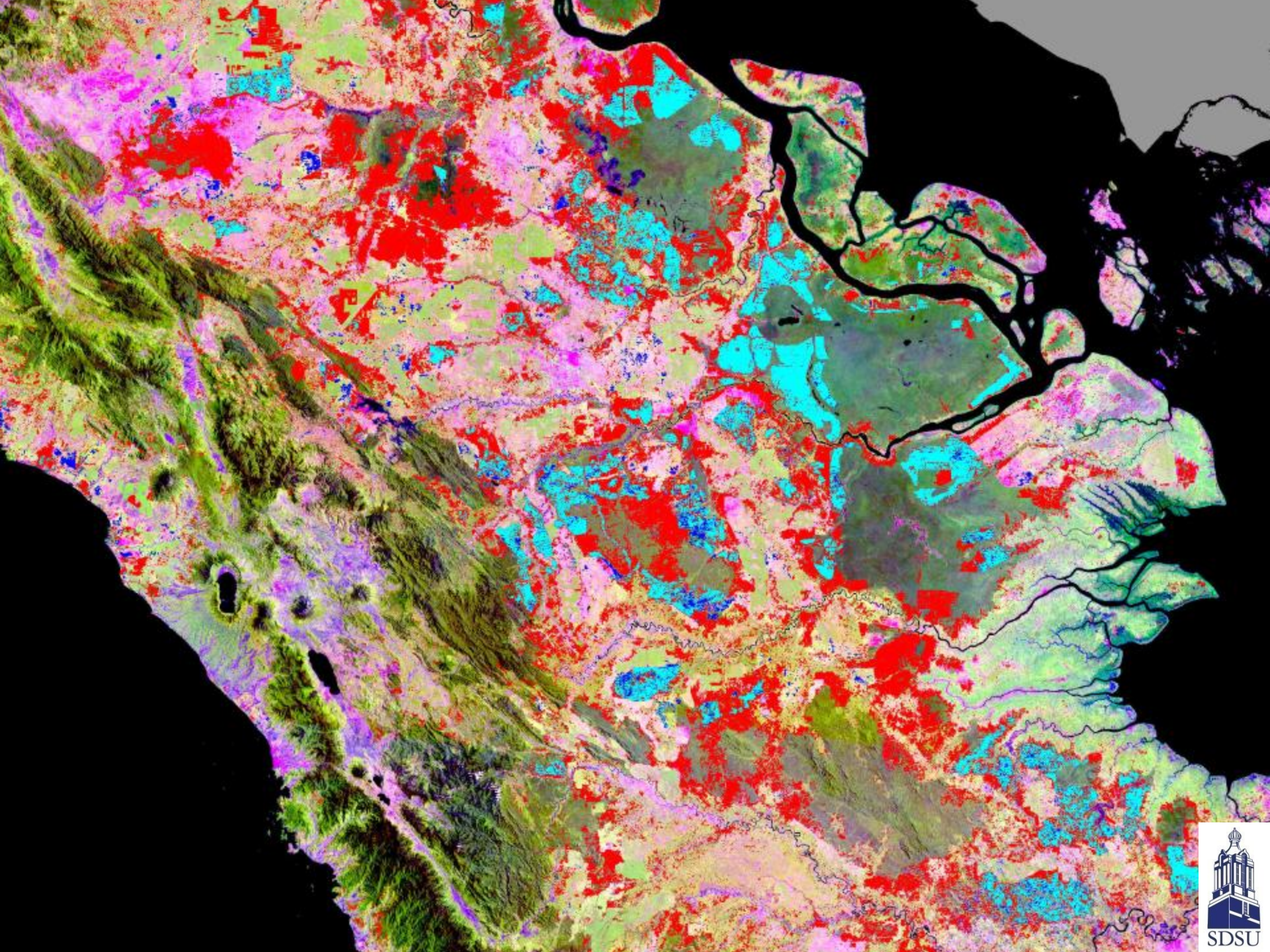


# Forest cover loss trends per forest land use zone



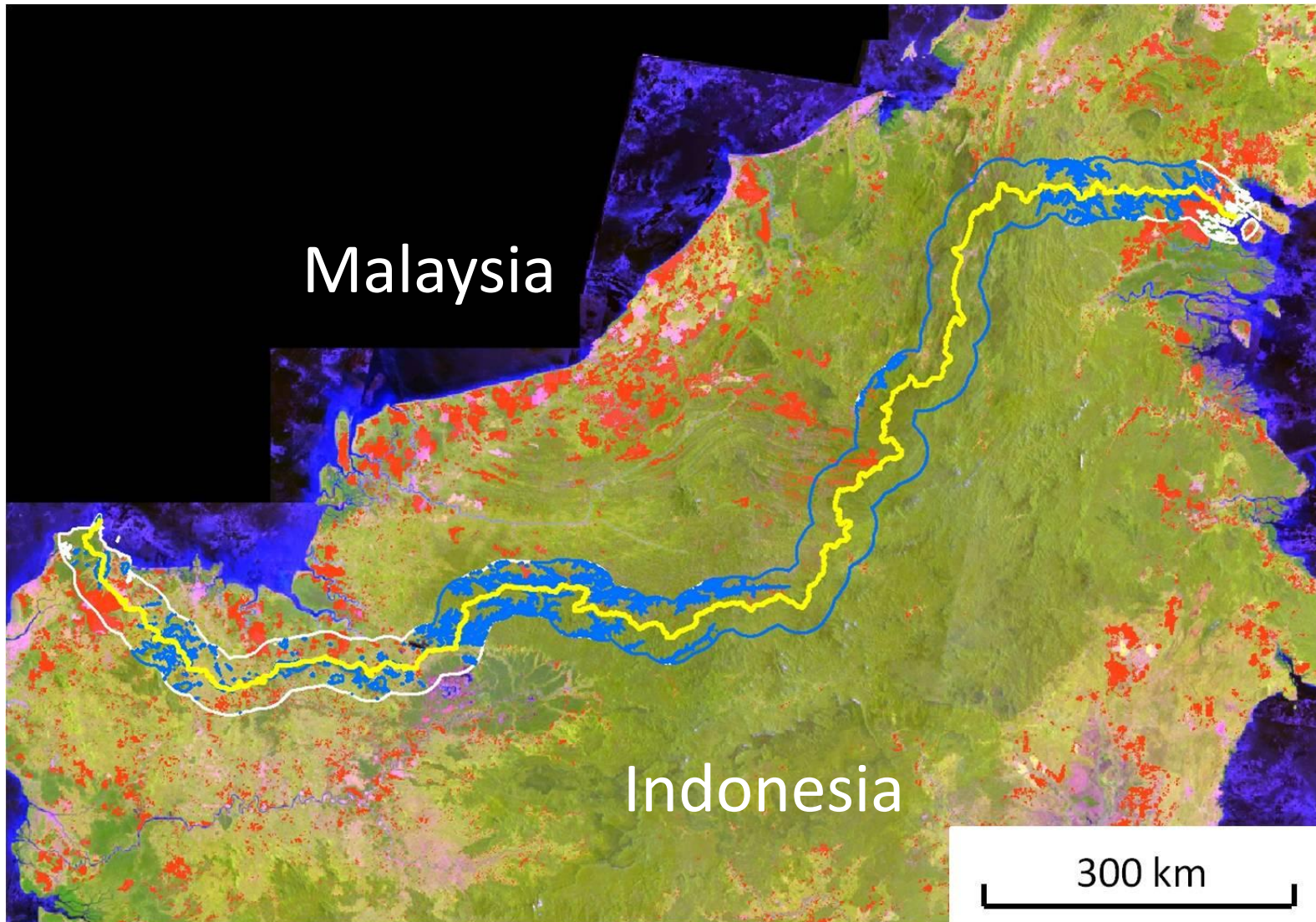
- production
- conservation
- ▲ protection
- ◆ limited production
- ◆ no forest
- conversion





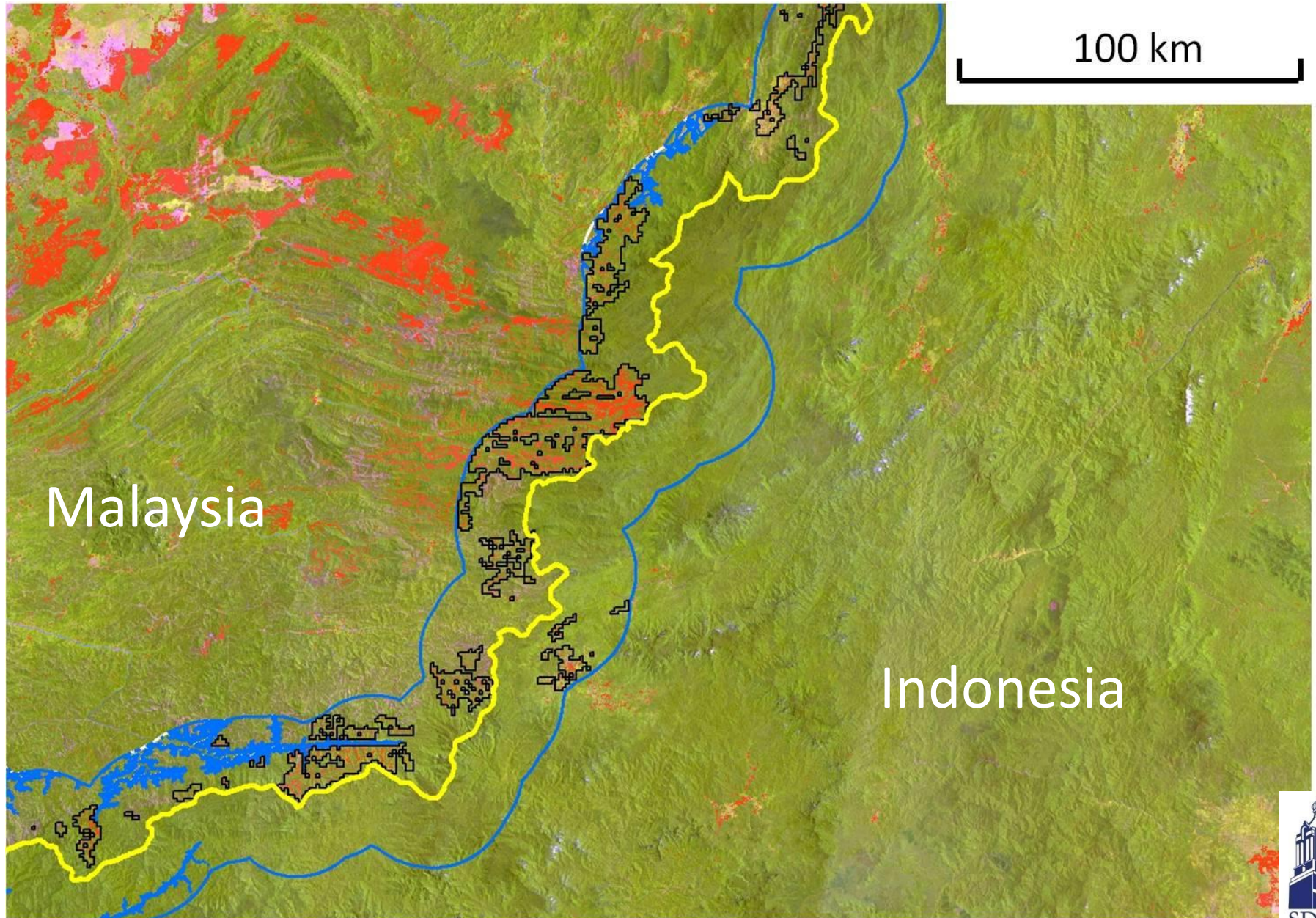


# Trans-boundary effects



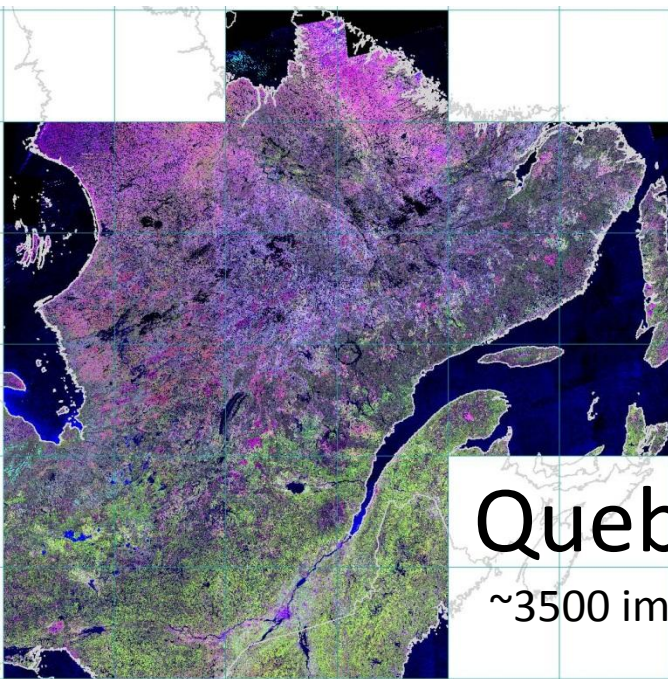


# Trans-boundary effects



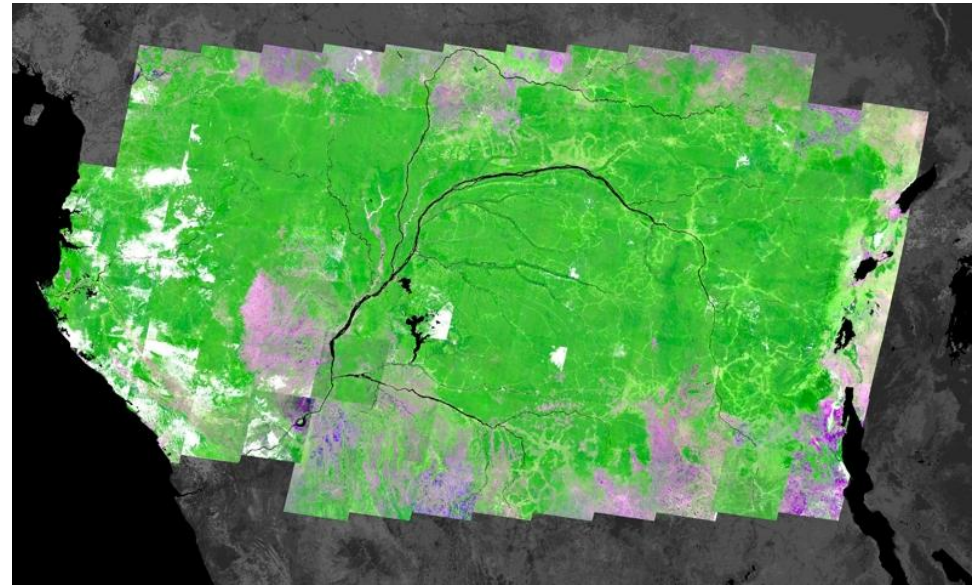


# Mining the Landsat archive



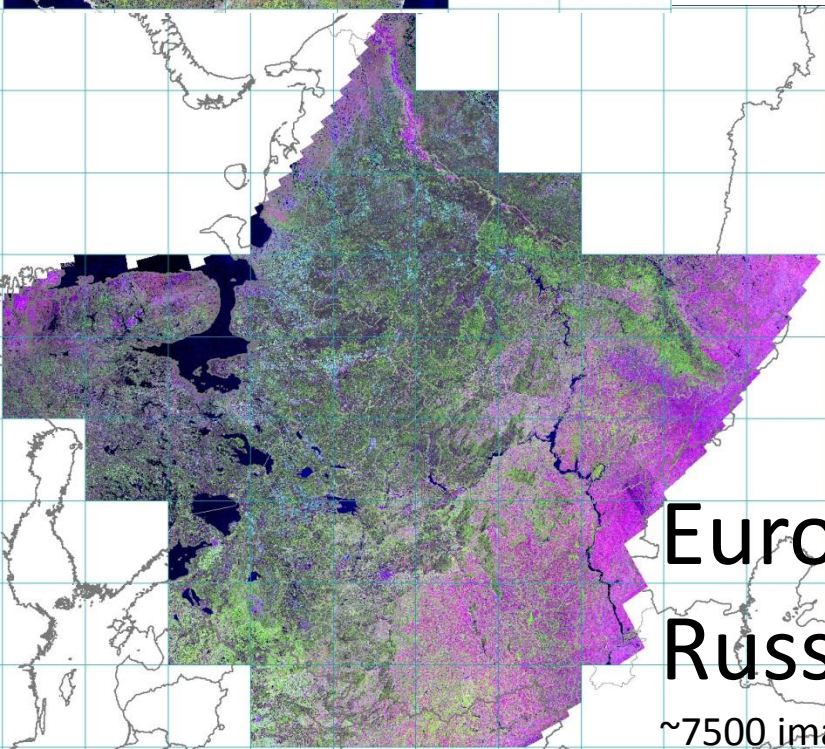
Quebec

~3500 images



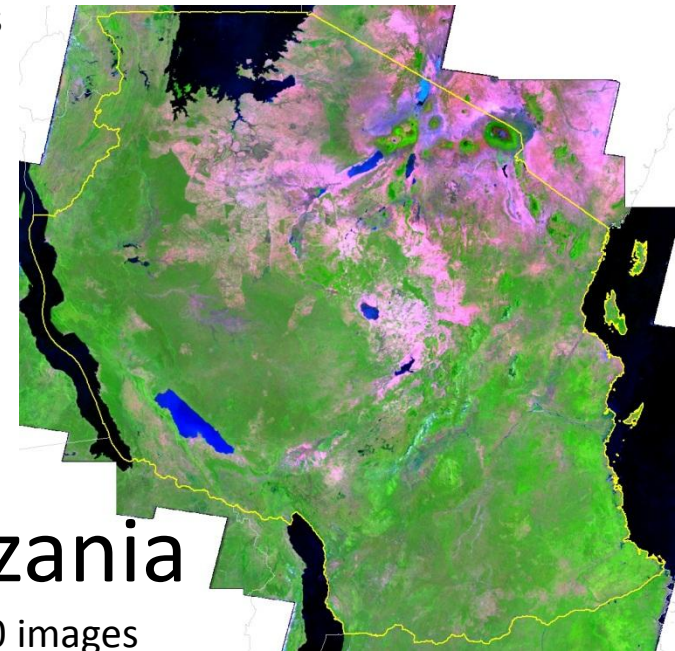
Congo Basin

~8000 images



European  
Russia

~7500 images



Tanzania

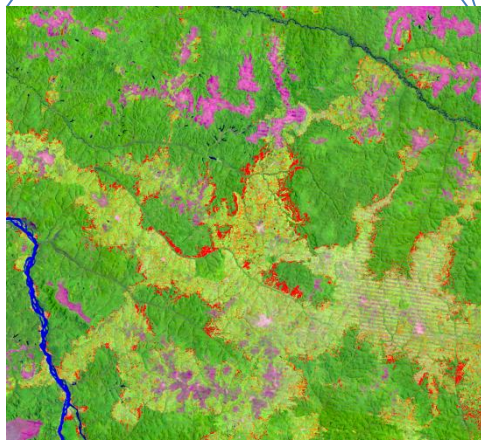
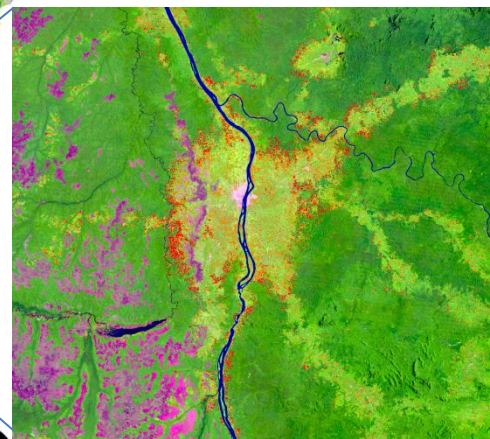
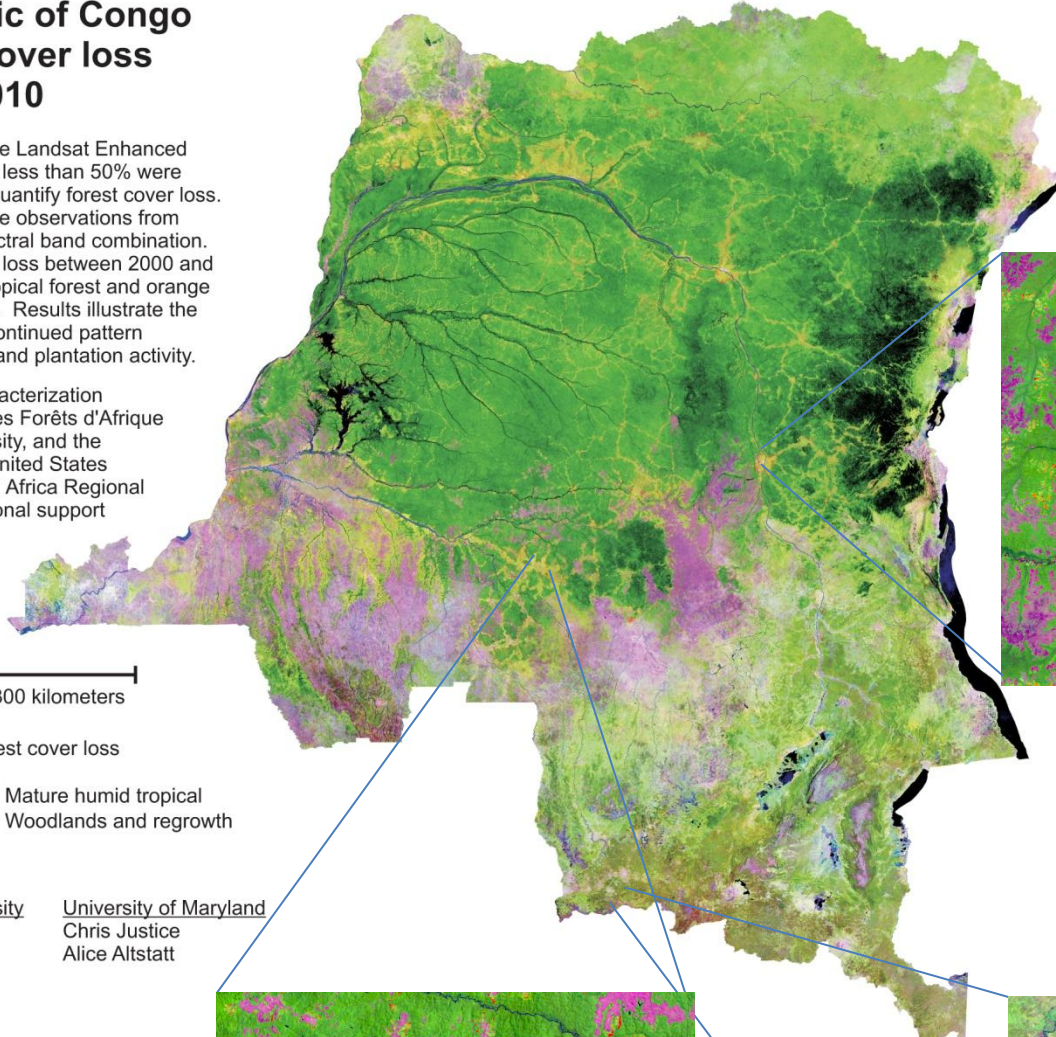
~1000 images



# The Democratic Republic of Congo from space - Forest cover loss from 2000 to 2010

All images from the USGS EROS archive for the Landsat Enhanced Thematic Mapper Plus sensor with cloud cover less than 50% were automatically processed and characterized to quantify forest cover loss. The image composite was made from cloud-free observations from 2005 to 2010 and is displayed with a 5-4-3 spectral band combination. Areas in red and orange represent forest cover loss between 2000 and 2010, where red is clearing of mature humid tropical forest and orange clearing of woodlands and secondary regrowth. Results illustrate the spatial distribution of forest cover loss, with a continued pattern of agricultural clearing, mining, hunting camps and plantation activity.

Application of the Landsat processing and characterization was performed by the Observatoire Satellital des Forêts d'Afrique Centrale (OSFAC), South Dakota State University, and the University of Maryland, and supported by the United States Agency for International Development's Central Africa Regional Program for the Environment (CARPE). Additional support was provided by the United States National Aeronautics and Space Administration and the United States Geological Survey.



300 kilometers

Forest cover loss  
■ Mature humid tropical  
■ Woodlands and regrowth



OSFAC  
 Landing Mane  
 Patrick Amani  
 Eddy Bongwele

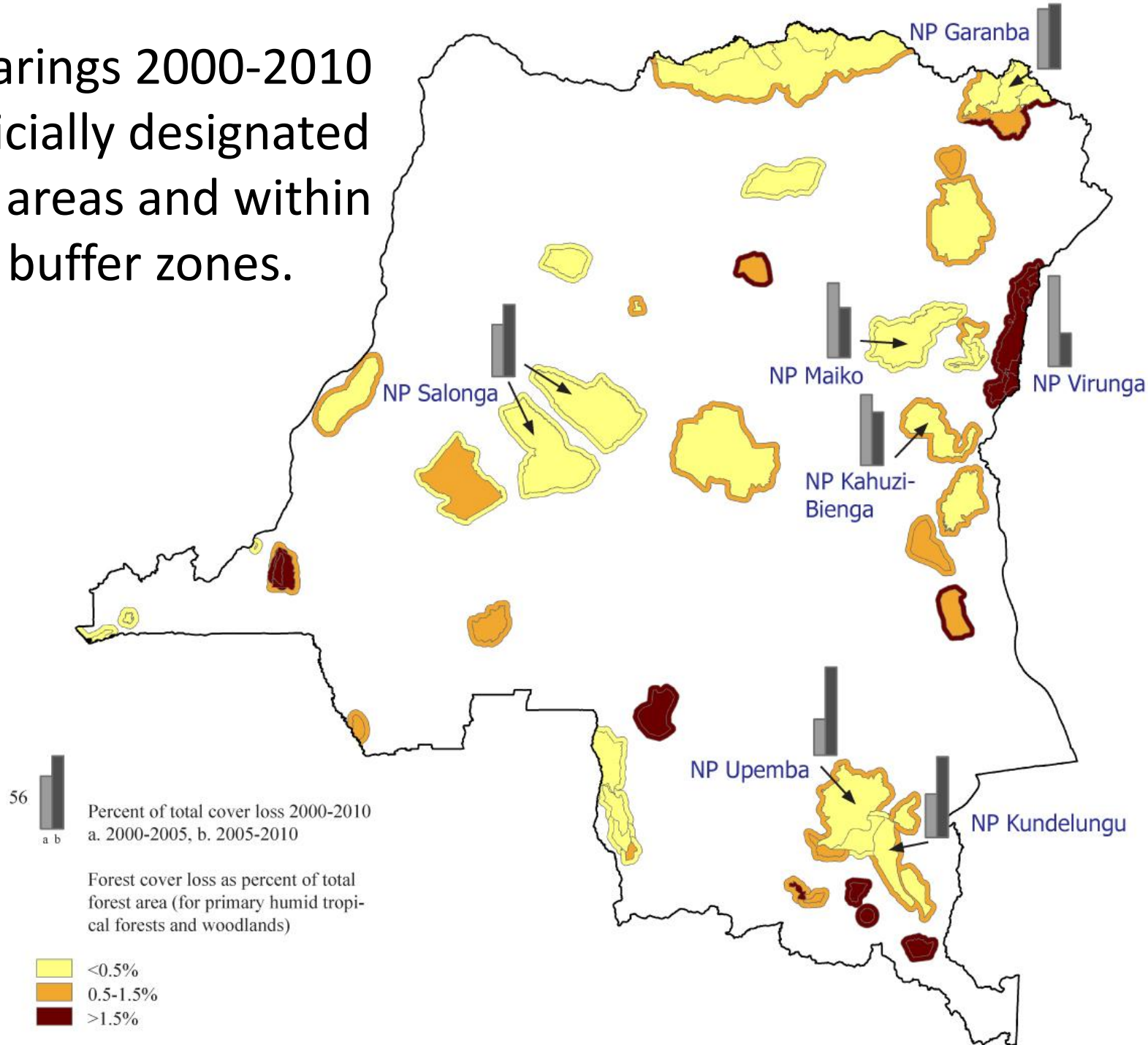
South Dakota State University  
 Matthew Hansen  
 Peter Potapov  
 Mark Broich  
 Bernard Adusei

University of Maryland  
 Chris Justice  
 Alice Altstatt



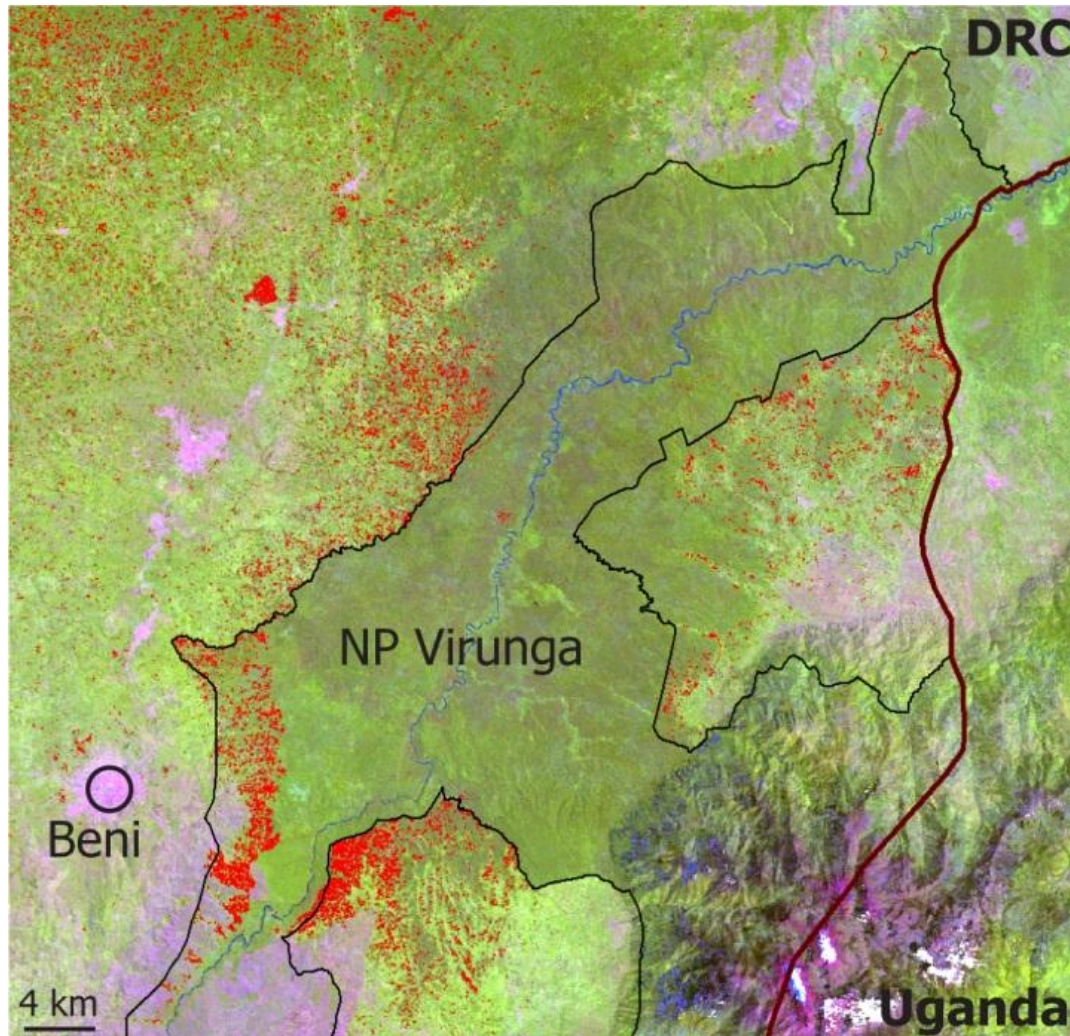


# Forest clearings 2000-2010 within officially designated protected areas and within 10-km buffer zones.





# Virunga National Park







Percent tree crown cover for Mexico





March to June





July to October





November to February





Percent tree crown cover for Mexico

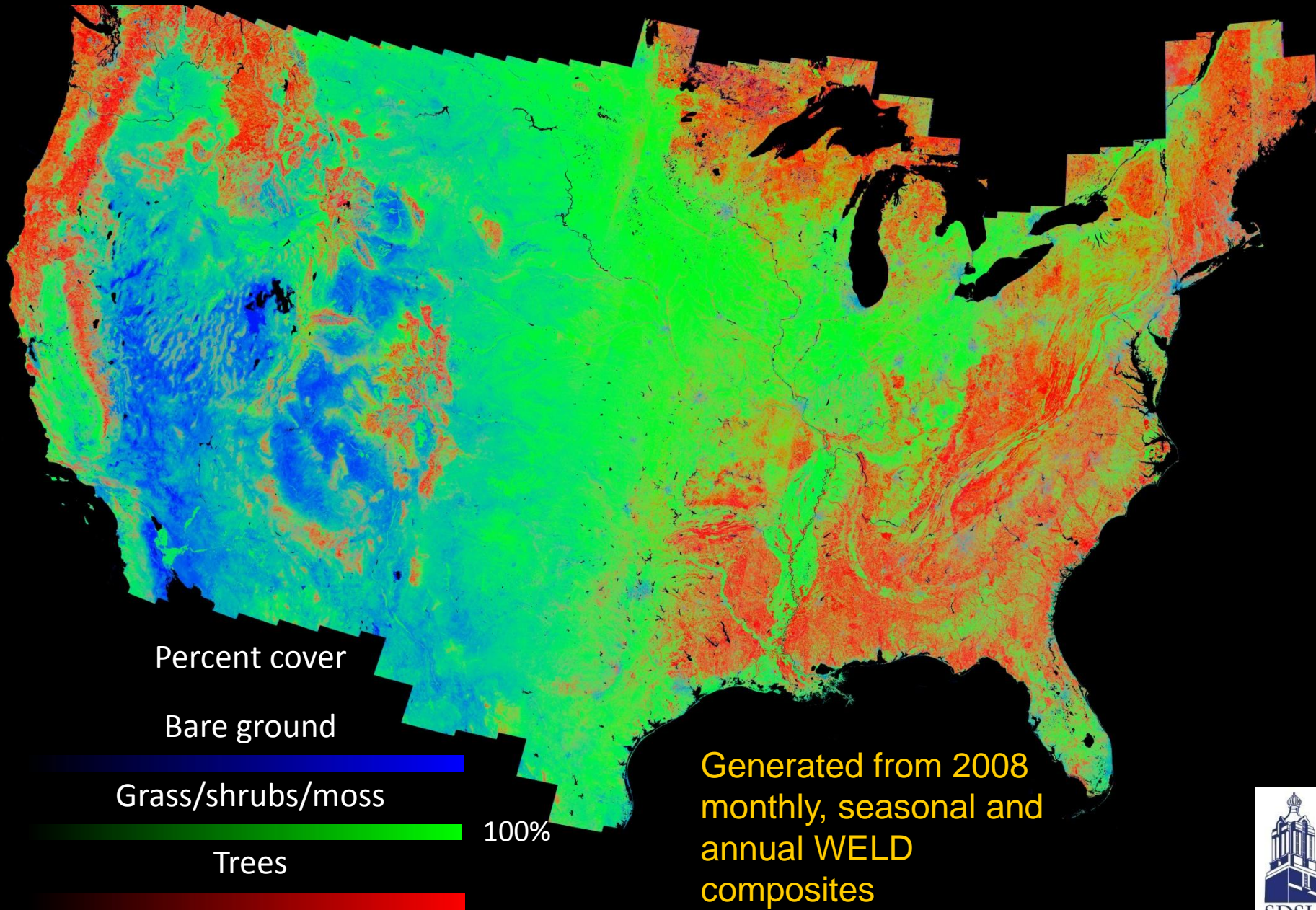


# WELD Land Cover

- Vegetation Continuous Field approach
  - 30 meter sub-pixel fractional cover estimates
  - Produced annually
    - Maximum percent tree cover
    - Maximum percent vegetation (excluding tree cover)
    - Minimum percent bare ground
    - Minimum surface water extent
    - Minimum snow/ice extent (nested within bare ground)
  - Test products include weekly bare ground, water, snow/ice

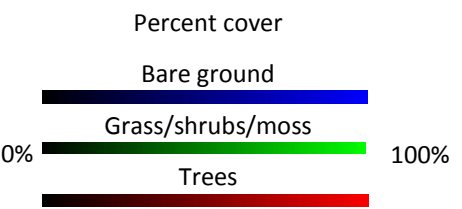
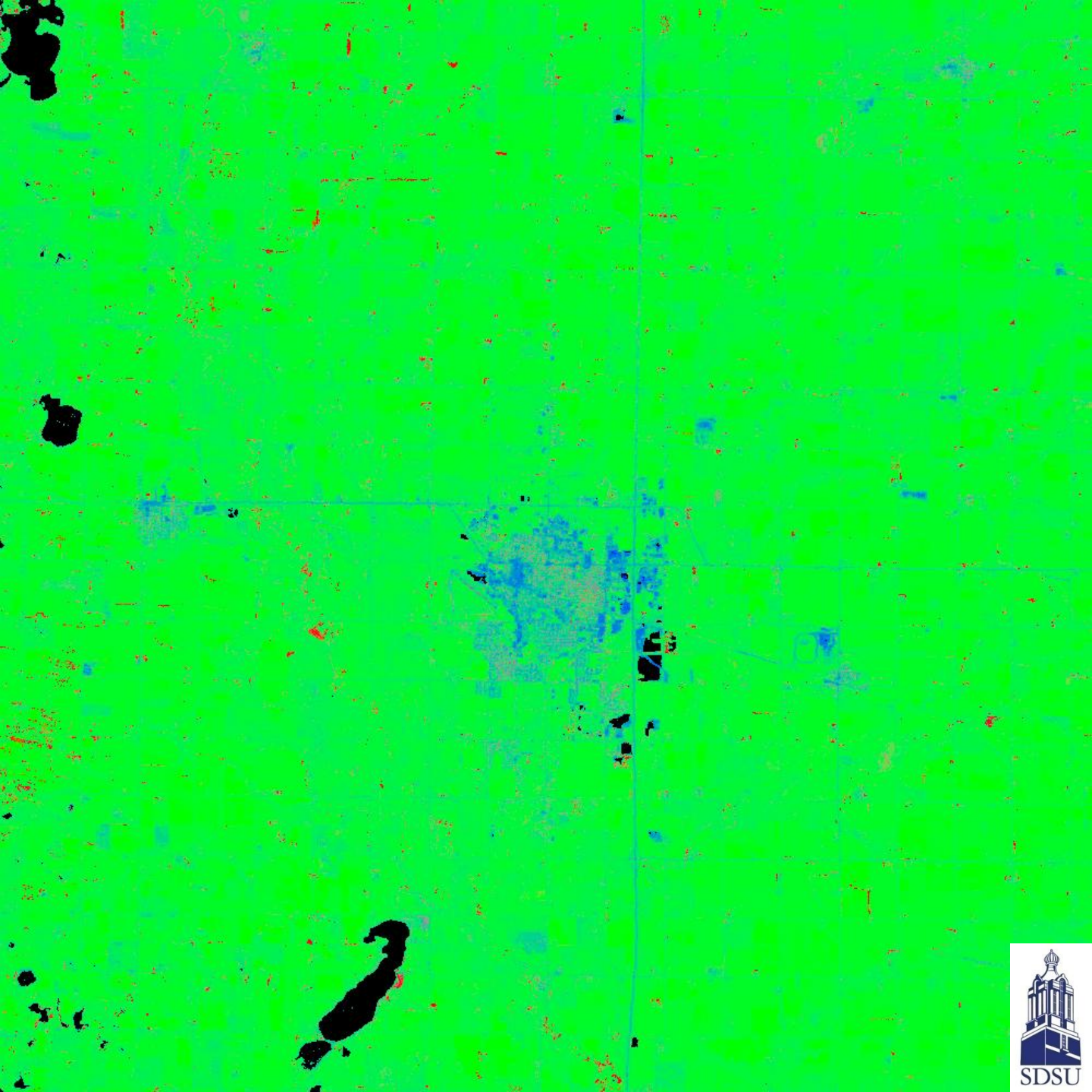


# CONUS 30m Vegetation Continuous Fields (%)



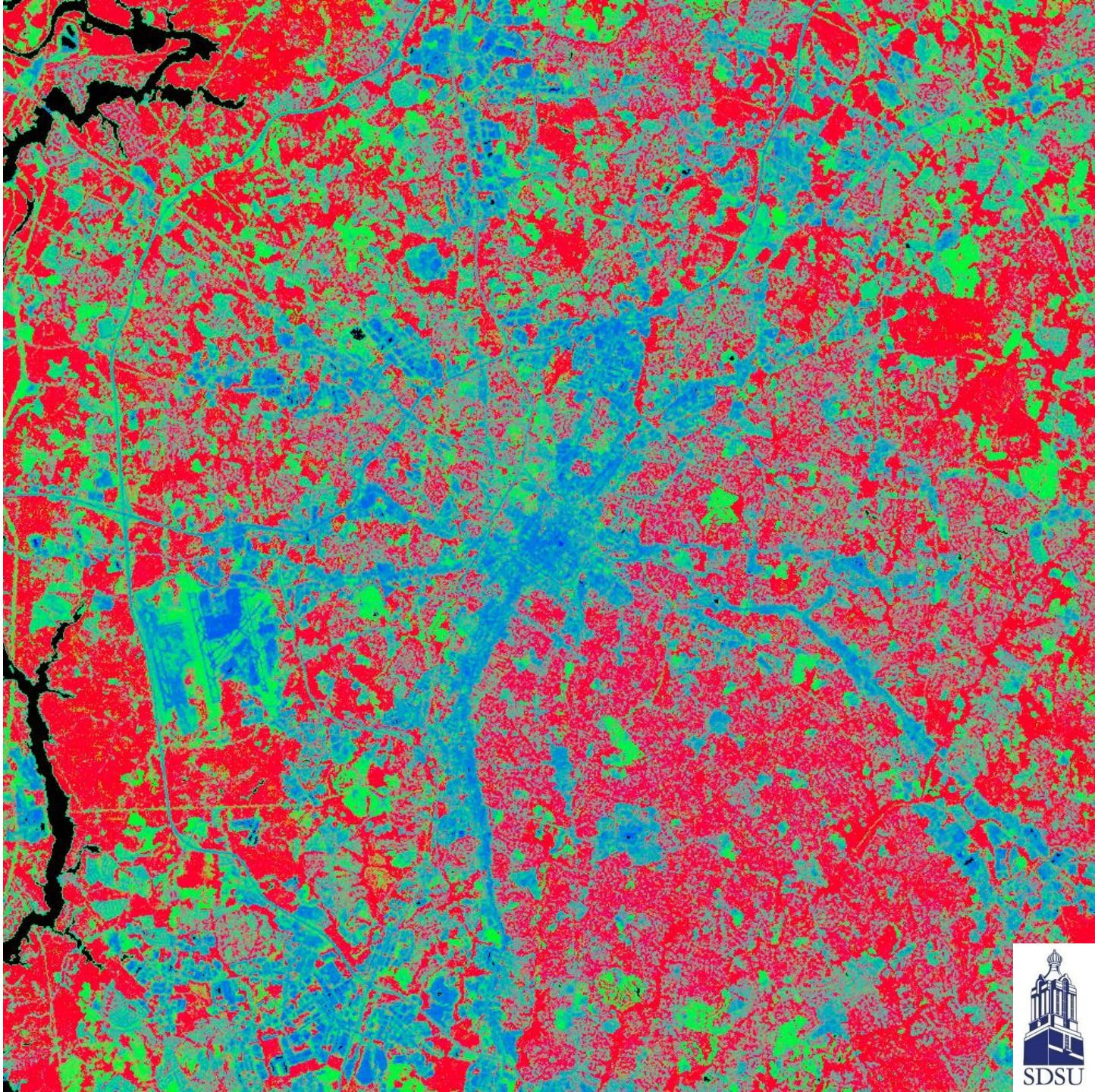


# Brookings, SD





# Charlotte, NC



Percent cover

Bare ground

Grass/shrubs/moss

Trees

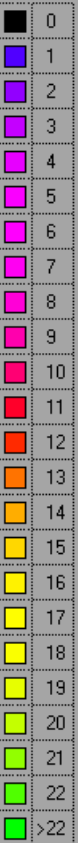
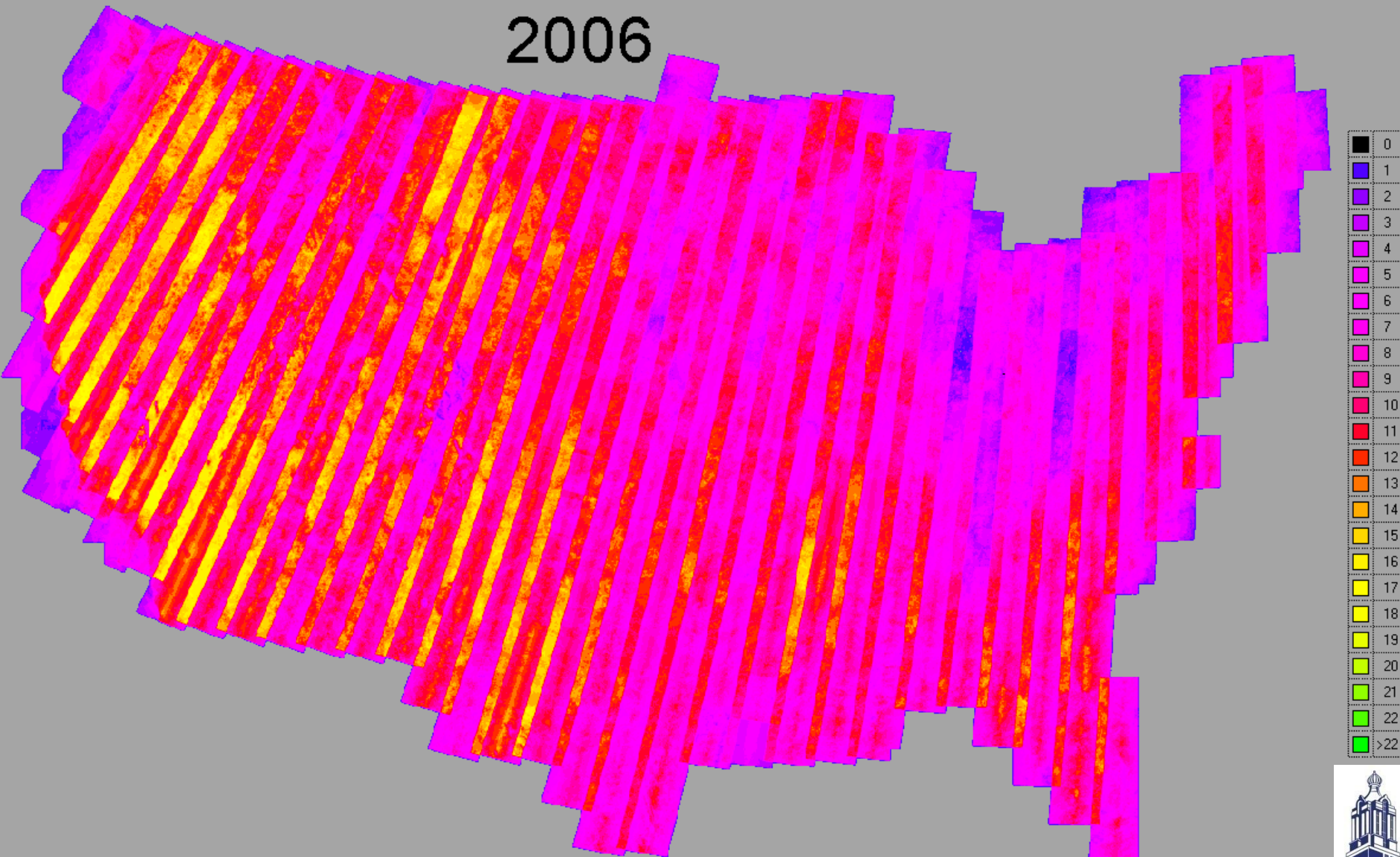
0%





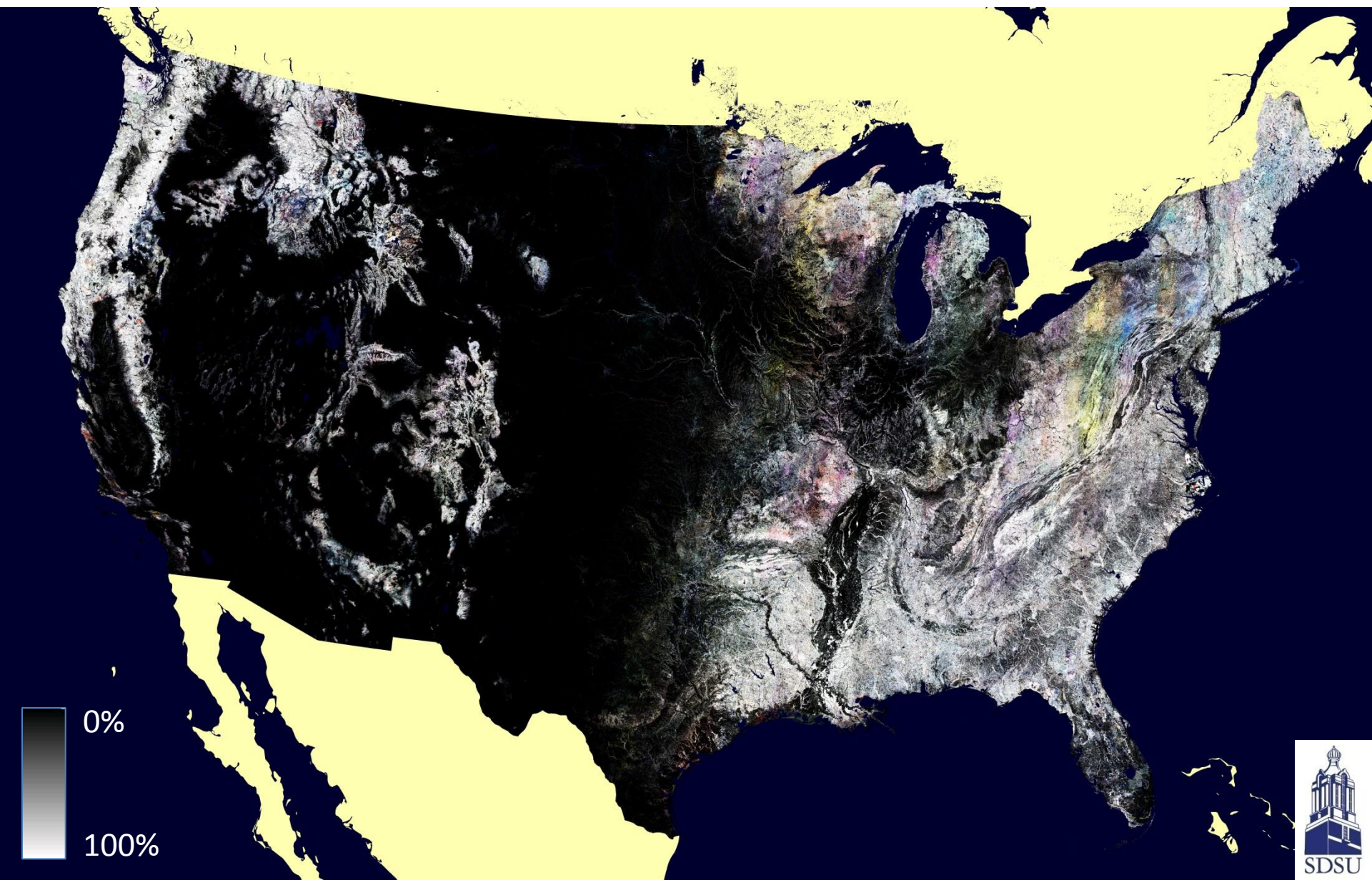
# Growing season high quality observation counts

2006



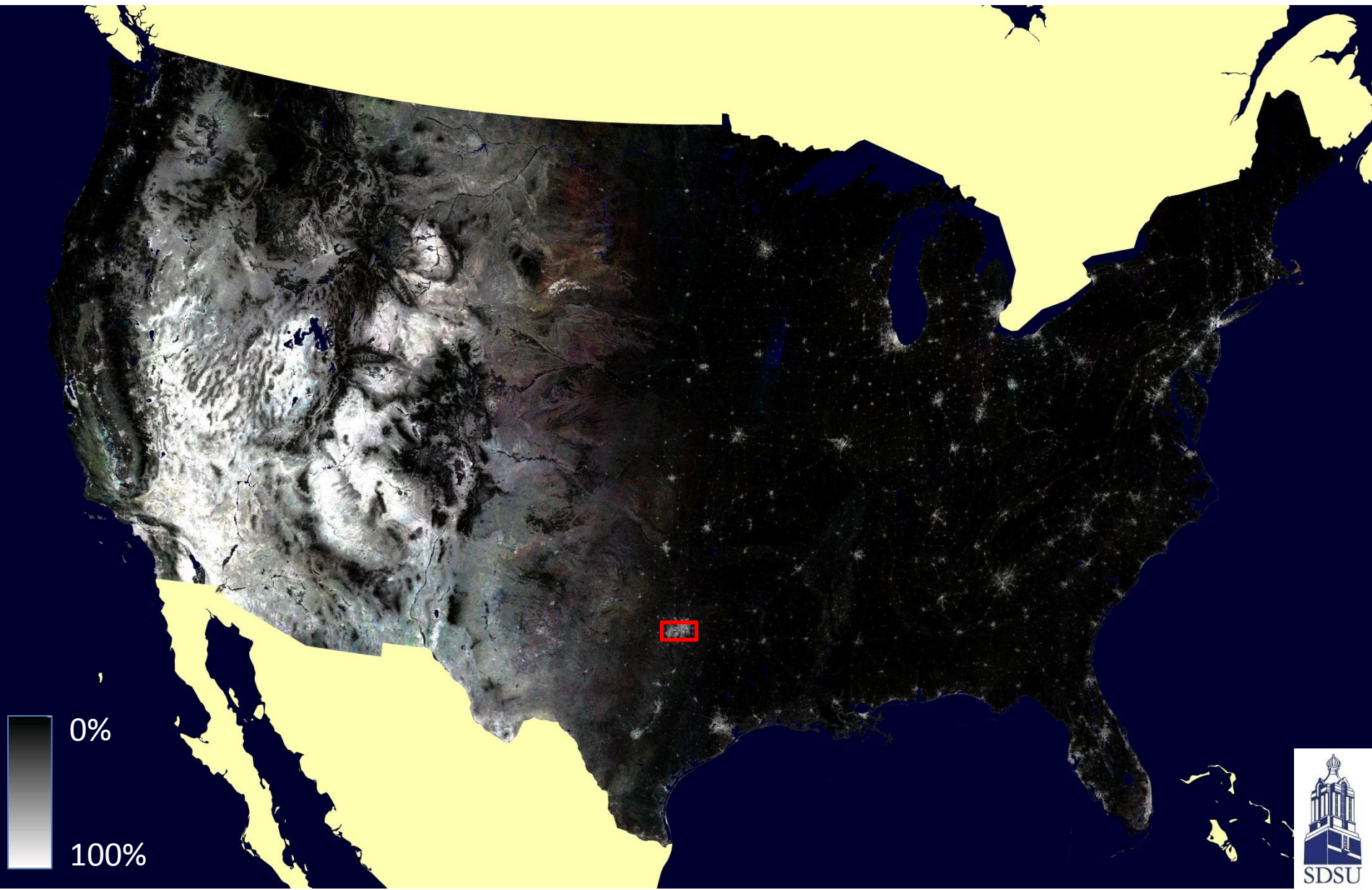


# Five years of percent tree cover



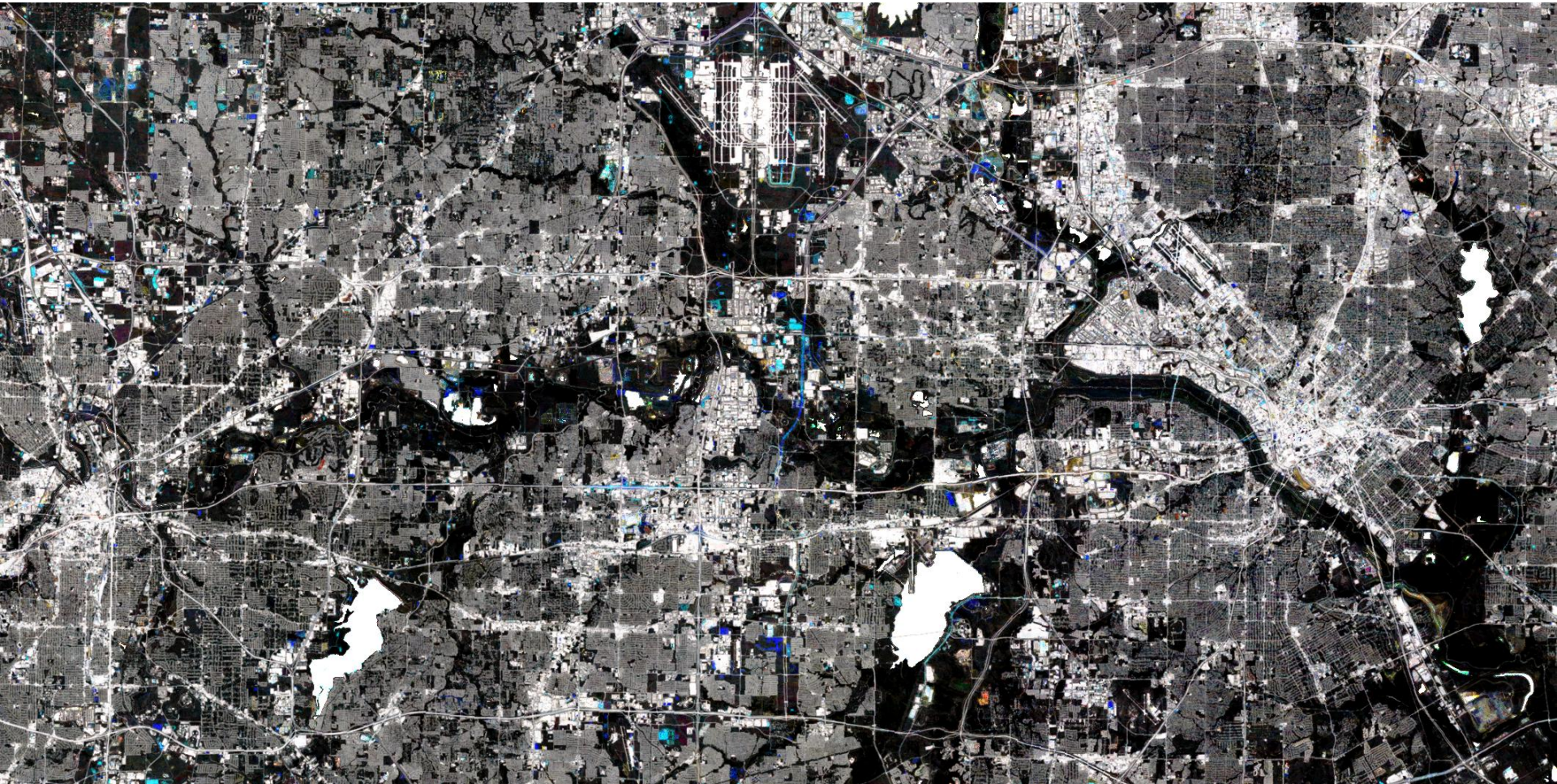


# Five years of percent bare ground





# Dallas – Fort Worth



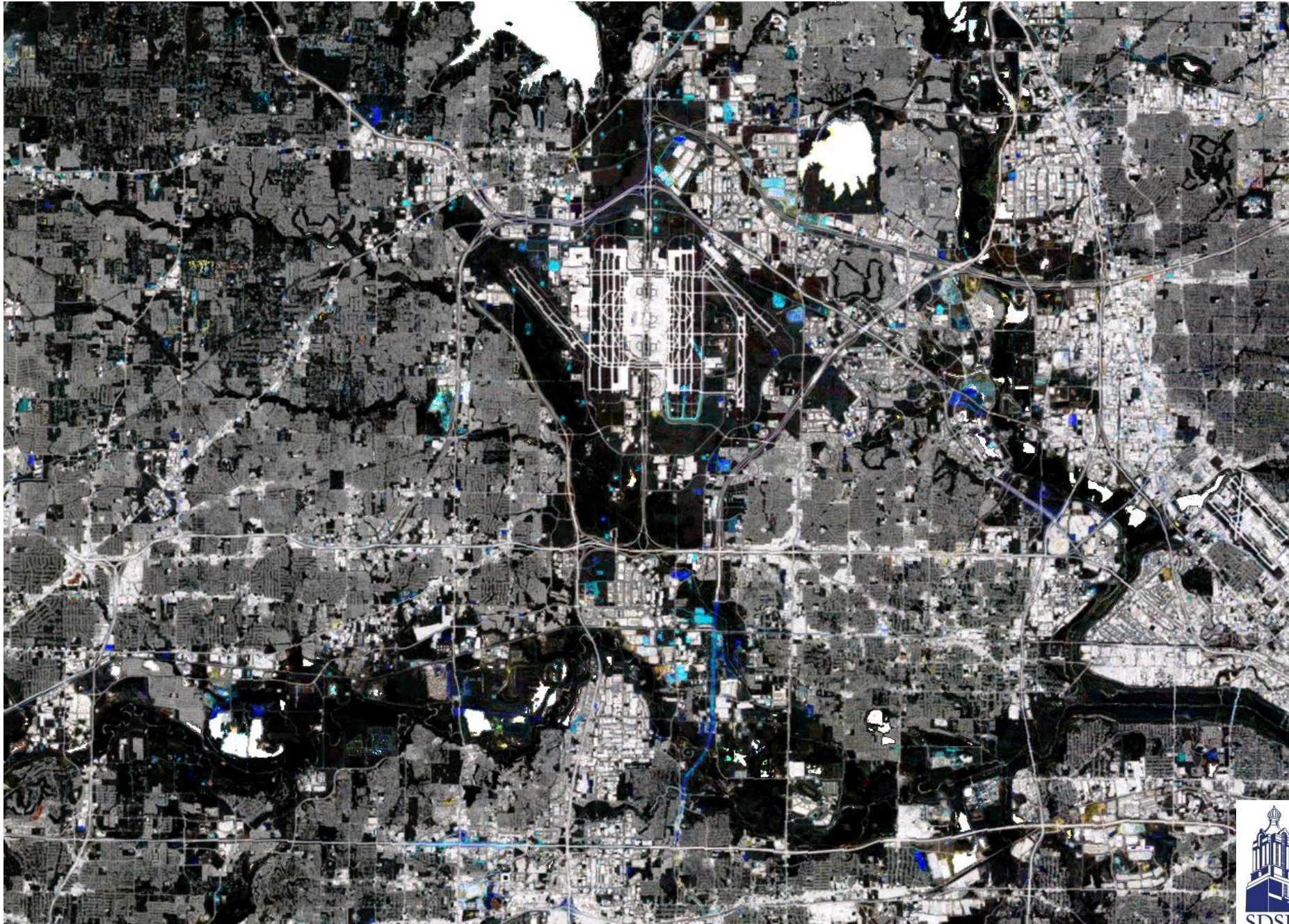
grey-scale = no change

blue/cyan = increase in bare ground,

red/yellow = decrease in bare ground

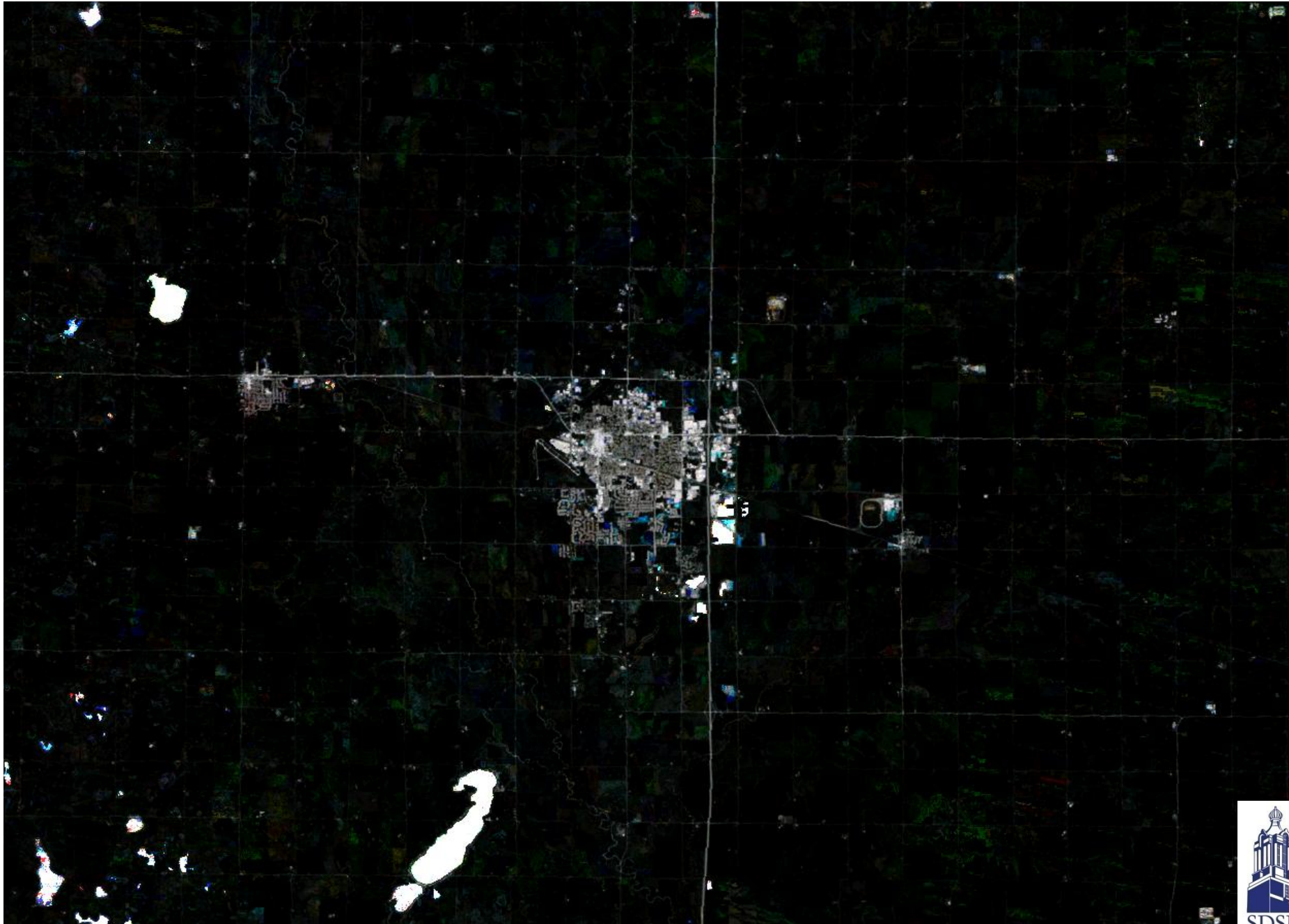


# Dallas – Fort Worth (bare ground)





# Brookings (bare ground)





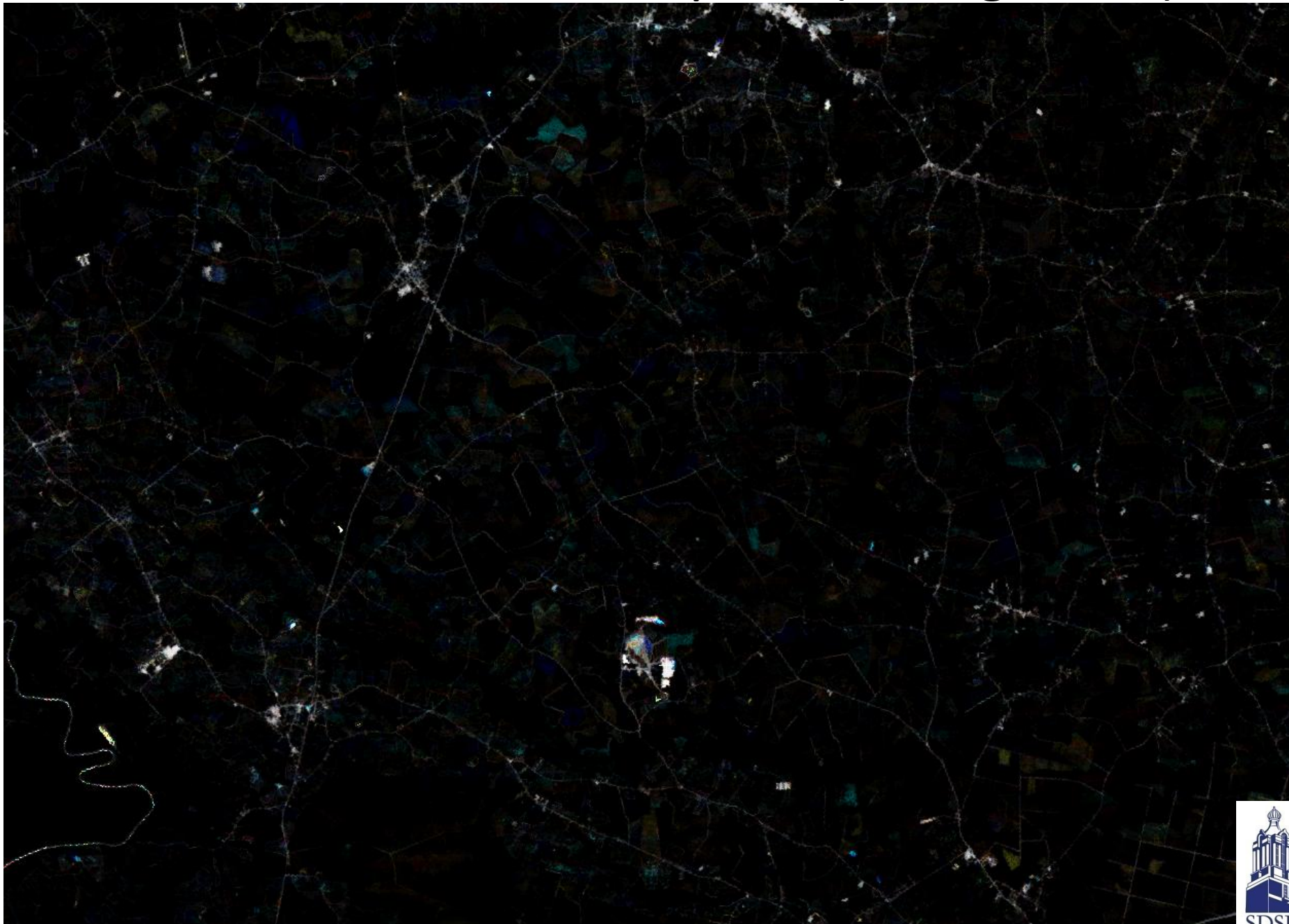
# North Carolina coastal plain (tree cover)



grey-scale = no change, blue/cyan = increase in tree cover, red/yellow = decrease in tree cover



# North Carolina coastal plain (bare ground)



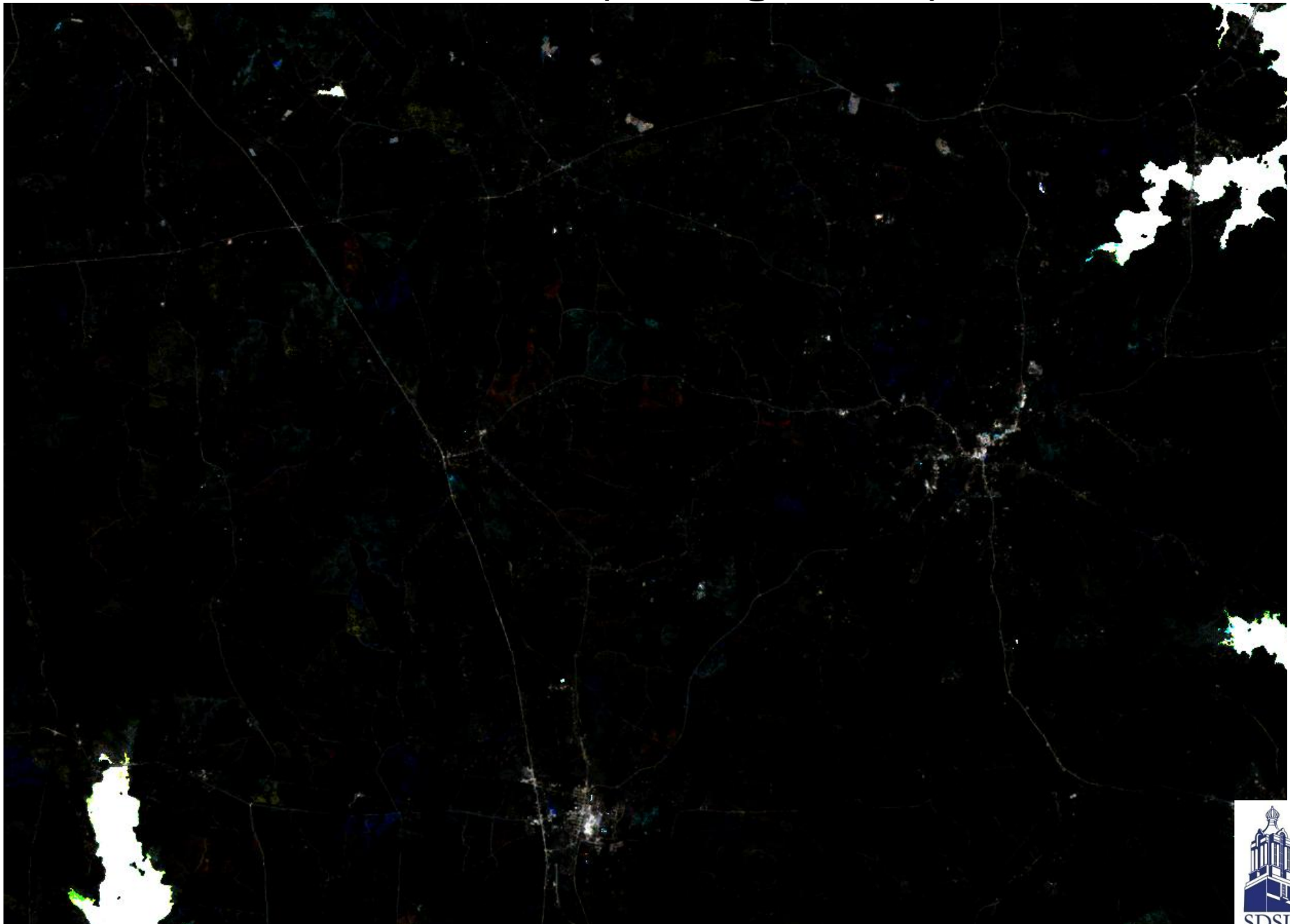


# Louisiana (tree cover)



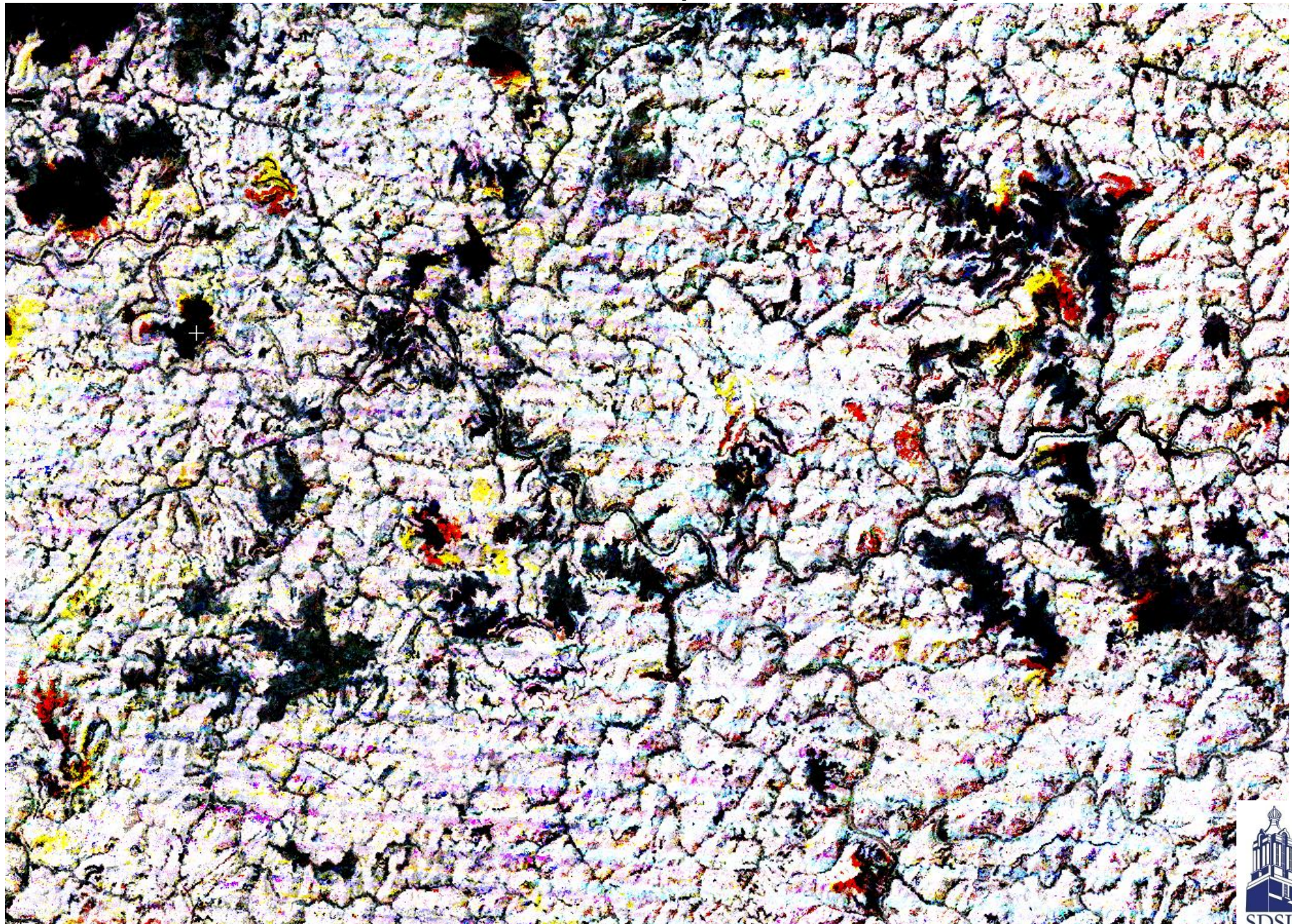


# Louisiana (bare ground)



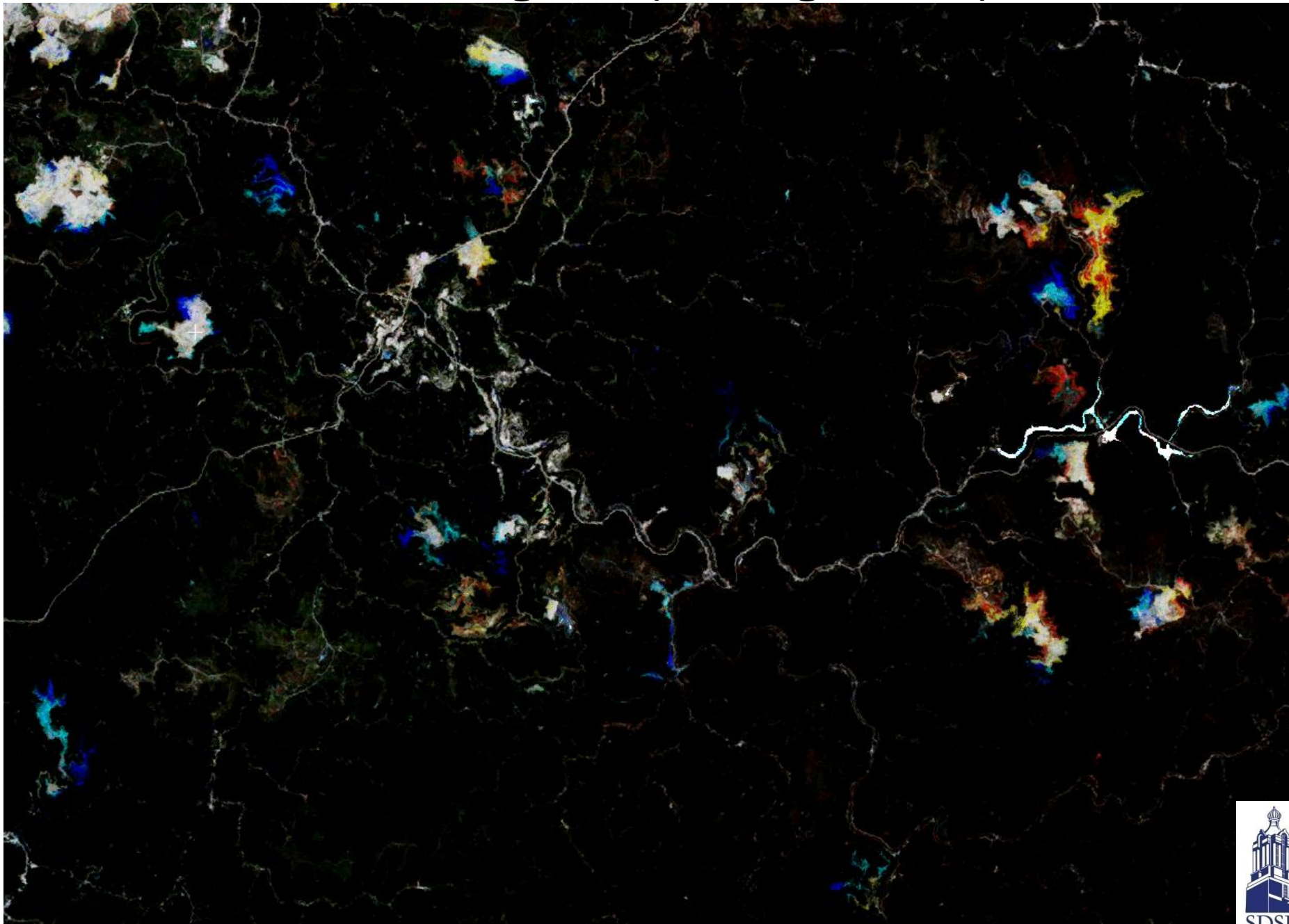


# West Virginia (tree cover)





# West Virginia (bare ground)



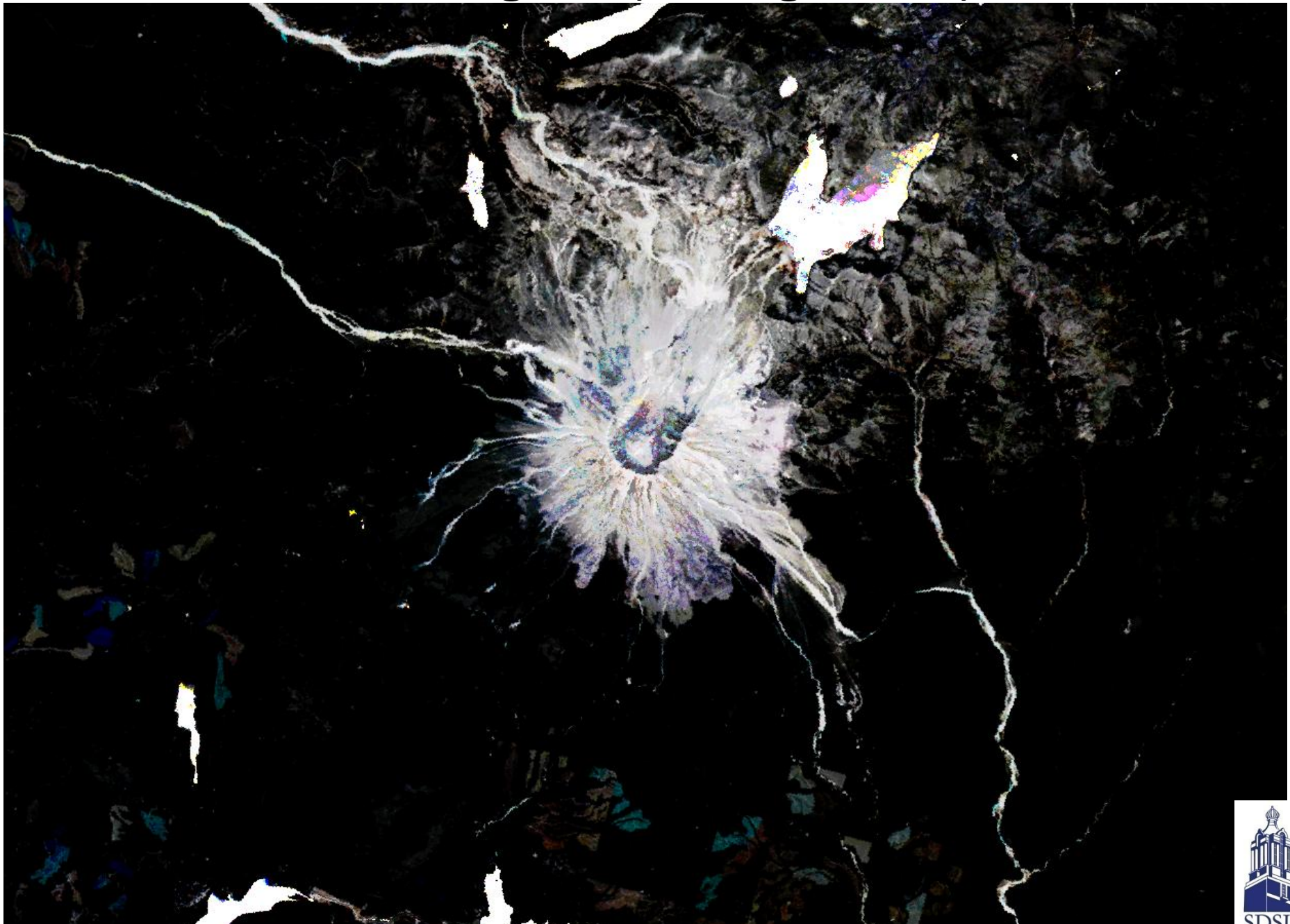


# Washington (tree cover)



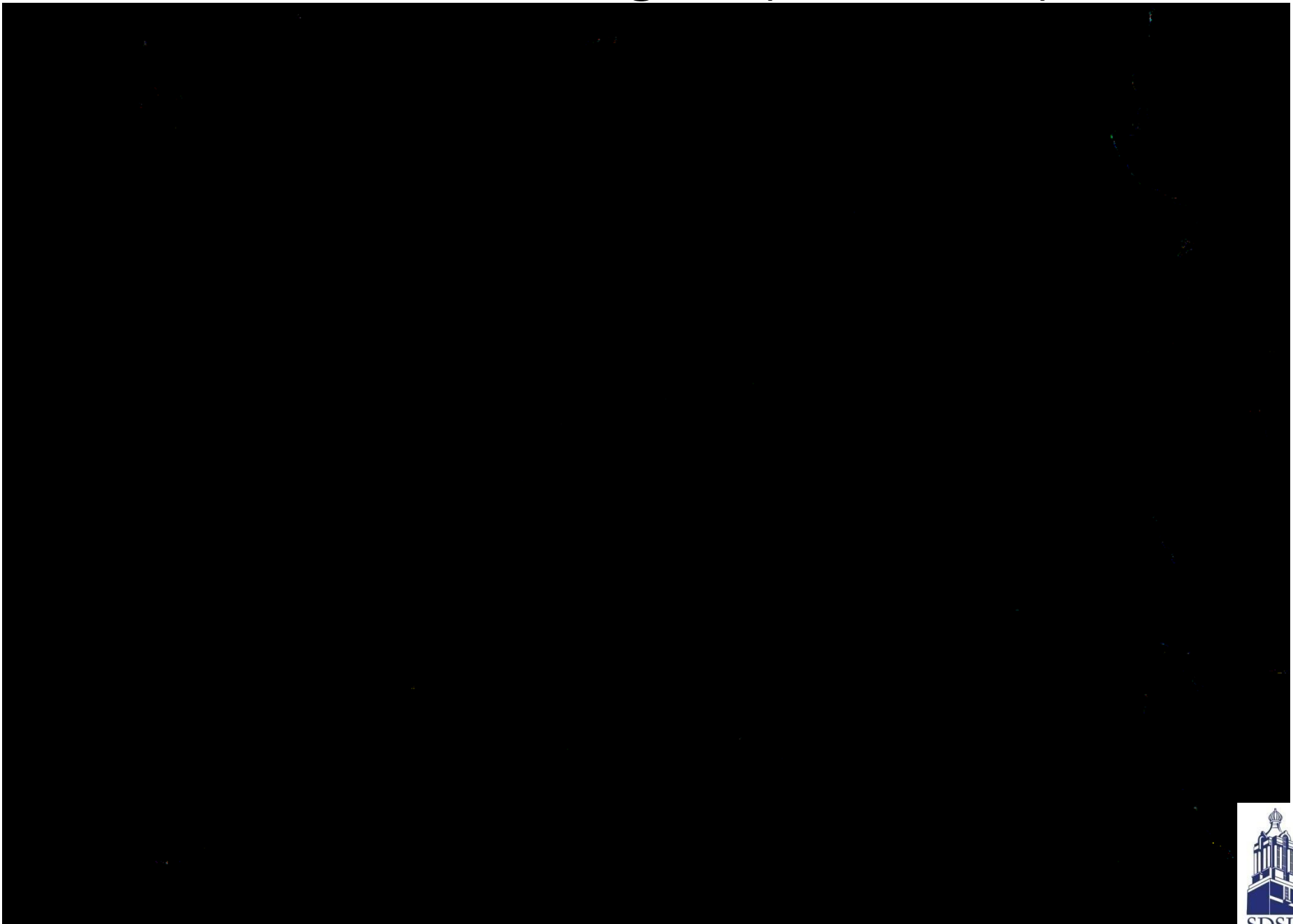


# Washington (bare ground)





# Eastern Washington (tree cover)





# Eastern Washington (bare ground)





# Las Vegas (tree cover)





# Las Vegas (bare ground)





# Factors affecting Landsat processing that differ from heritage MODIS methods

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



# Characterizing land cover with Landsat

- Landsat's infrequent and inconsistent acquisition rate makes annual updates of land cover difficult for many parts of the world
- The U.S. represents our most data-rich case
- Certain land cover themes, such as cropland/crop type, will not be reliably characterized for many regions
- For developing countries needing to monitor forest cover, the open archive is a boon
  - However, high-performance computing is needed as single image-based methods will not work for many regions



# Some references

- Broich, M., Hansen, M., Stolle, F., Potapov, P., Margono, B.A. and Adusei, B., 2011, Remotely sensed forest cover loss shows high spatial and temporal variation across Sumatra and Kalimantan, Indonesia 2000-2008, *Environmental Research Letters*, 6 (1), doi:10.1088/1748-9326/6/1/014010.
- Broich, M., Hansen, M.C., Potapov, P., Adusei, B., Lindquist, E., Stehman, S.V., 2011, Time-series analysis of multi-resolution optical imagery for quantifying forest cover loss in Sumatra and Kalimantan, Indonesia, *International Journal of Applied Earth Observation and Geoinformation*, 13, 277-291.
- Hansen, M.C., Egorov, A., Roy, D.P., Potapov, P., Ju, J., Turubanova, S., Kommareddy, I., and Loveland, T.R., 2011, Continuous fields of land cover for the conterminous United States using Landsat data: first results from the Web-Enabled Landsat Data (WELD) project, *Remote Sensing Letters*, 2, 279-288.
- Potapov, P., Turubanova S., Hansen M.C., 2011, Regional-scale boreal forest cover and change mapping using Landsat data composites for European Russia, *Remote Sensing of Environment*, 115, 548-561.