

New approaches to land cover mapping and change monitoring in the era of satellite observations

(Selected examples)

Olga N. Krankina
Oregon State University

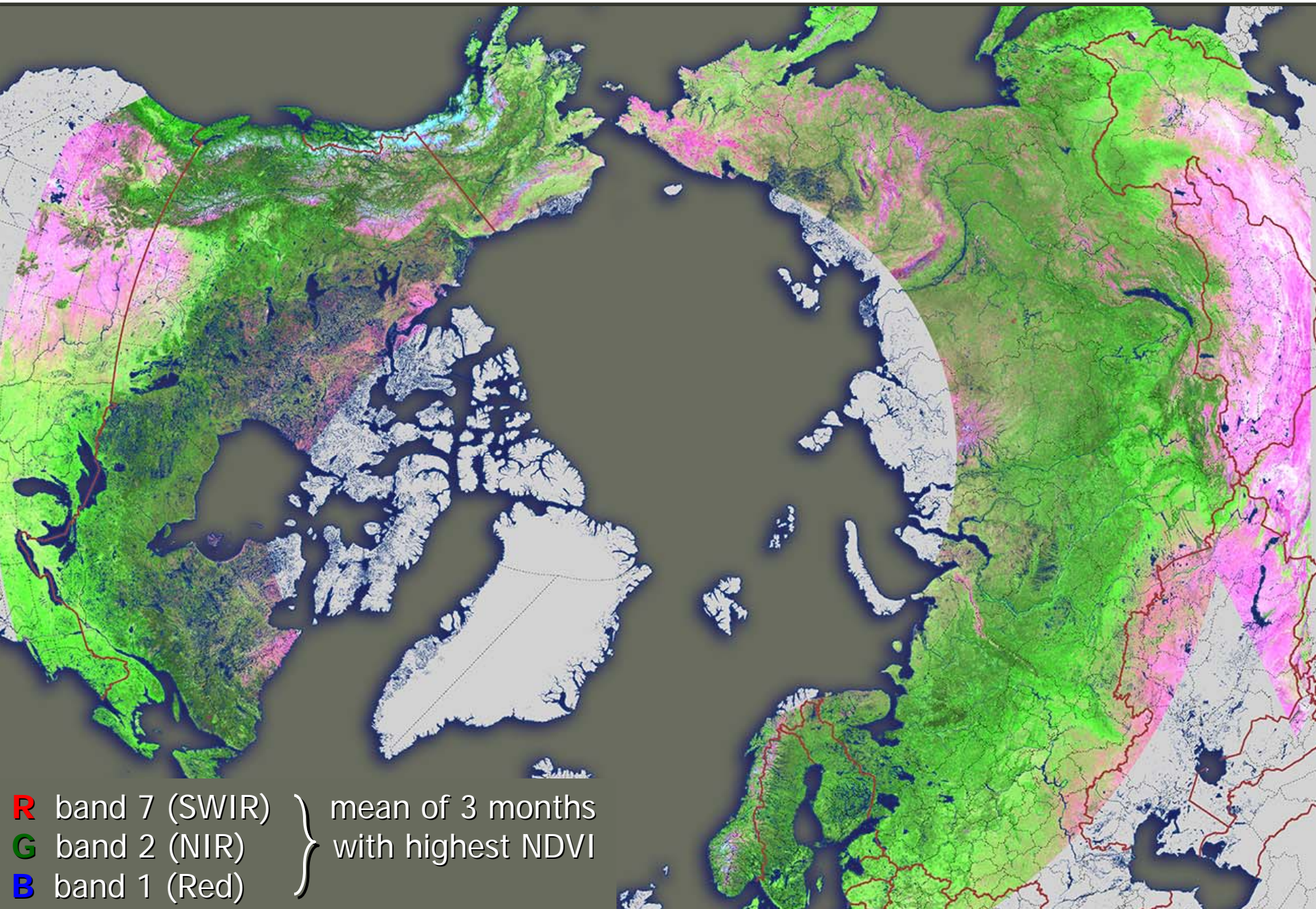
Outline

- Why new approaches are needed
- Land cover classification
 - Map legends: problems and solutions
 - LCCS overview and example
 - Exercise
- Map accuracy
- Land Cover Change
 - Land cover and land use
 - Disturbance
- Take home messages

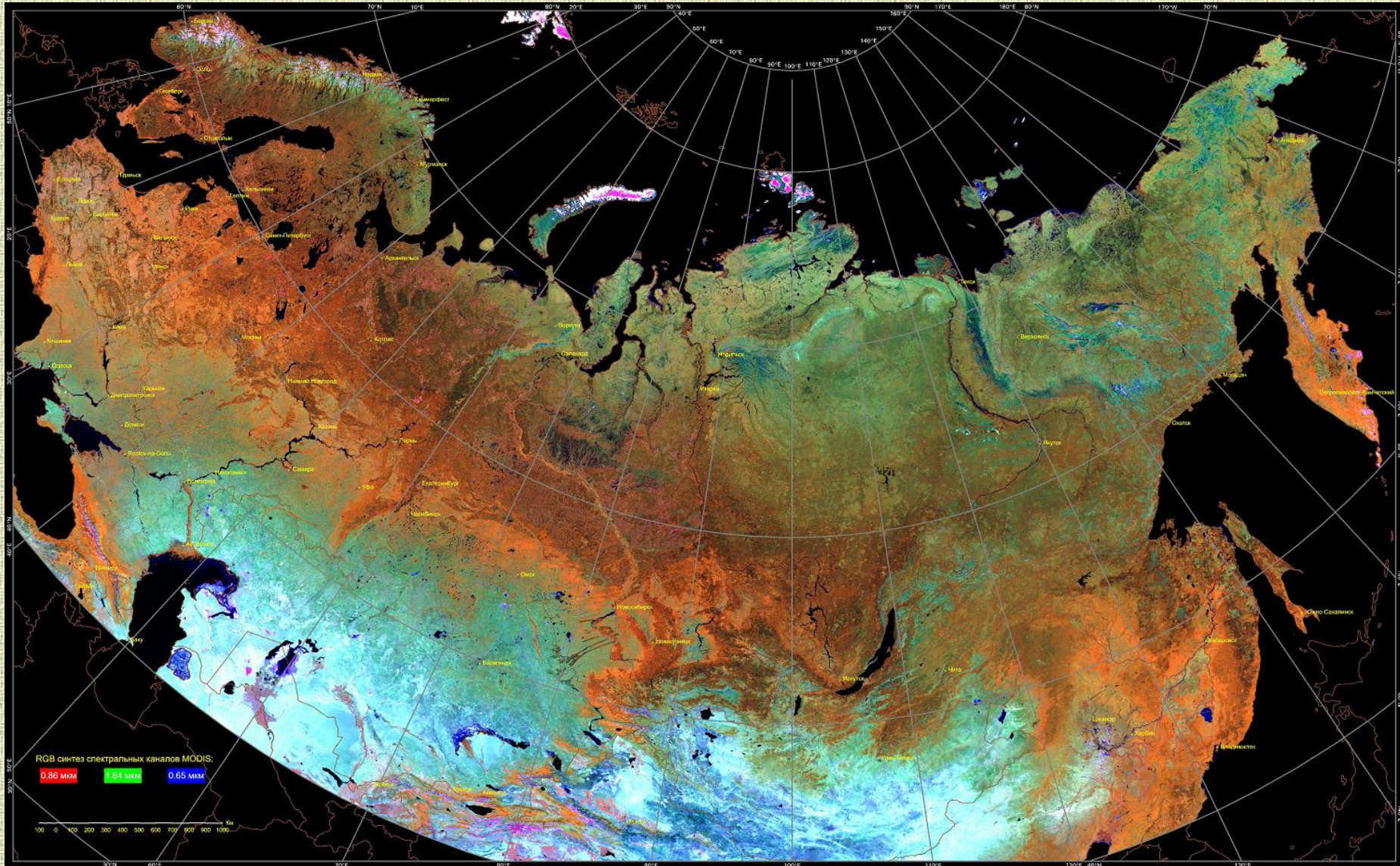
Take home messages

- Satellite Observations present new opportunities
 - Extracting information from data is a challenge
 - Grand challenge for the new generation of map-makers
- Remote sensing is the new frontier in geography
 - And the Wild West ...

Example of annual MODIS metrics



Cloud-free summer MODIS composite over Northern Eurasia

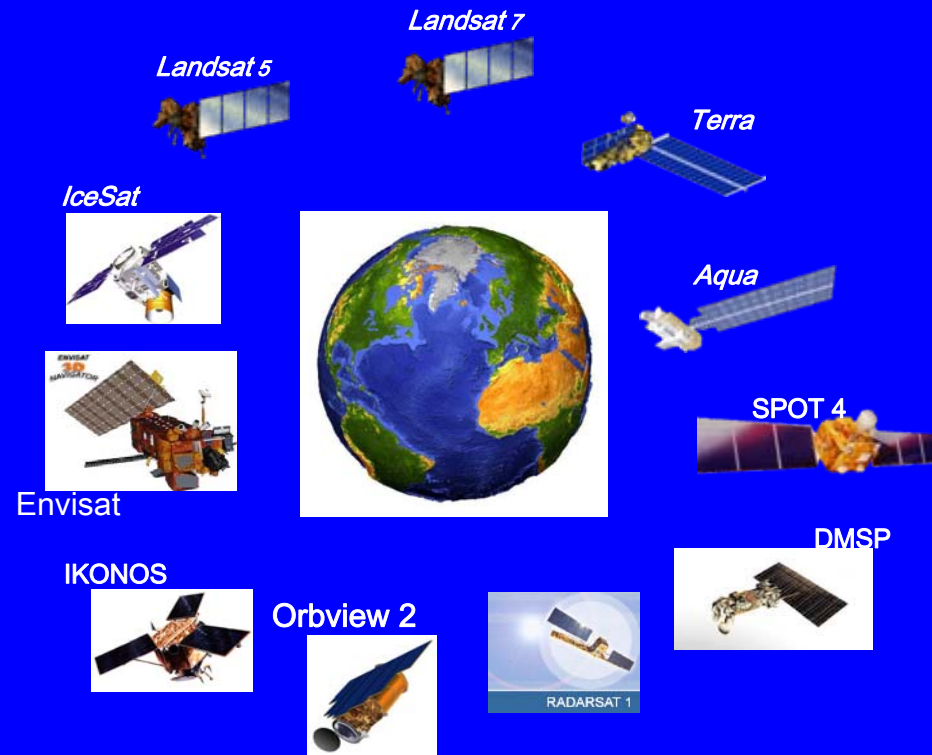


Spatial resolution – 250 м; June-August 2005

Earth Observation Systems

- Optical & IR

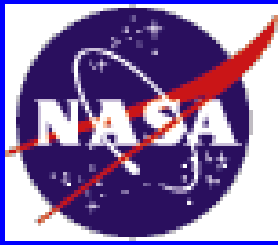
- Coarse resolution 1-2 km: AVHRR, SeaWiFS, OLS, ATSR, Vegetation, Geostationary, etc.
- Moderate resolution 0.2-1 km: MODIS, MISR, MERIS, etc.
- High resolution 5-30m: Landsat, ASTER, ALI, SPOT, CBRS, IRS, etc
- Fine resolution 1-4 m: IKONOS, Quickbird, etc
- Active: Lidars



- Microwave

- Passive: DMSP/SSMI, AMSU
- Active: Radars

Land-Cover/Land-Use Change Program

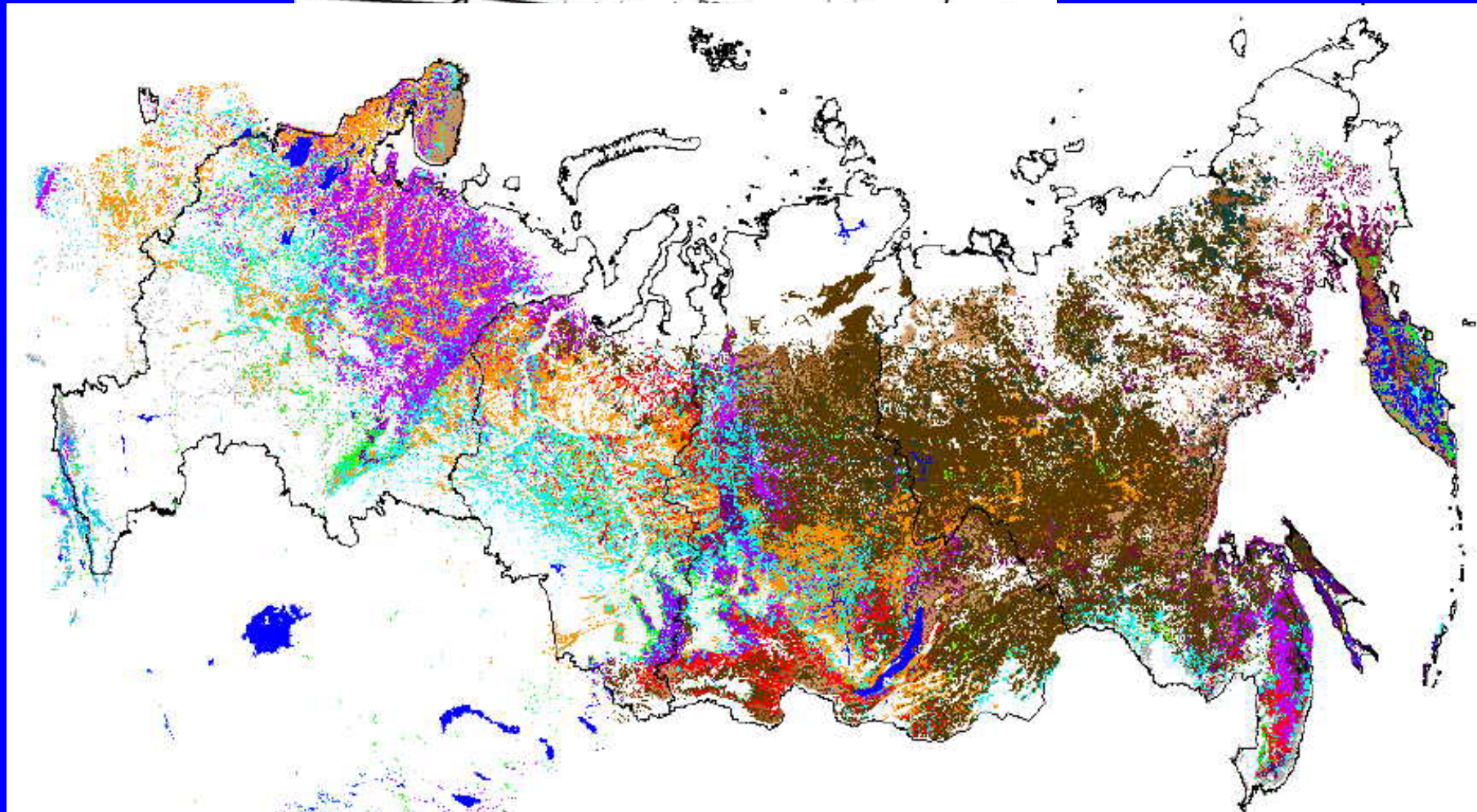
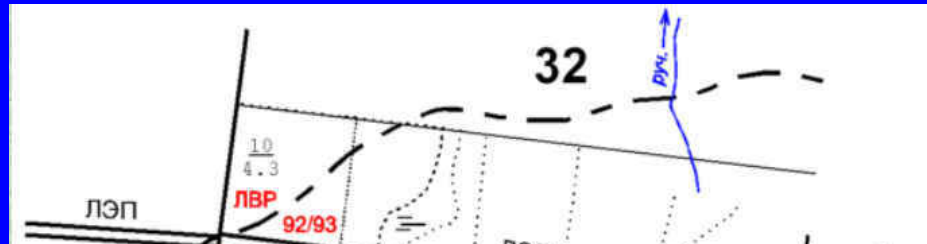


- LCLUC is an interdisciplinary scientific theme within NASA's Earth Science program. The ultimate vision of this program is *to develop the capability for periodic global inventories of land use and land cover from space, to develop the scientific understanding and models necessary to simulate the processes taking place, and to evaluate the consequences of observed and predicted changes*
- <http://lcluc.hq.nasa.gov/>

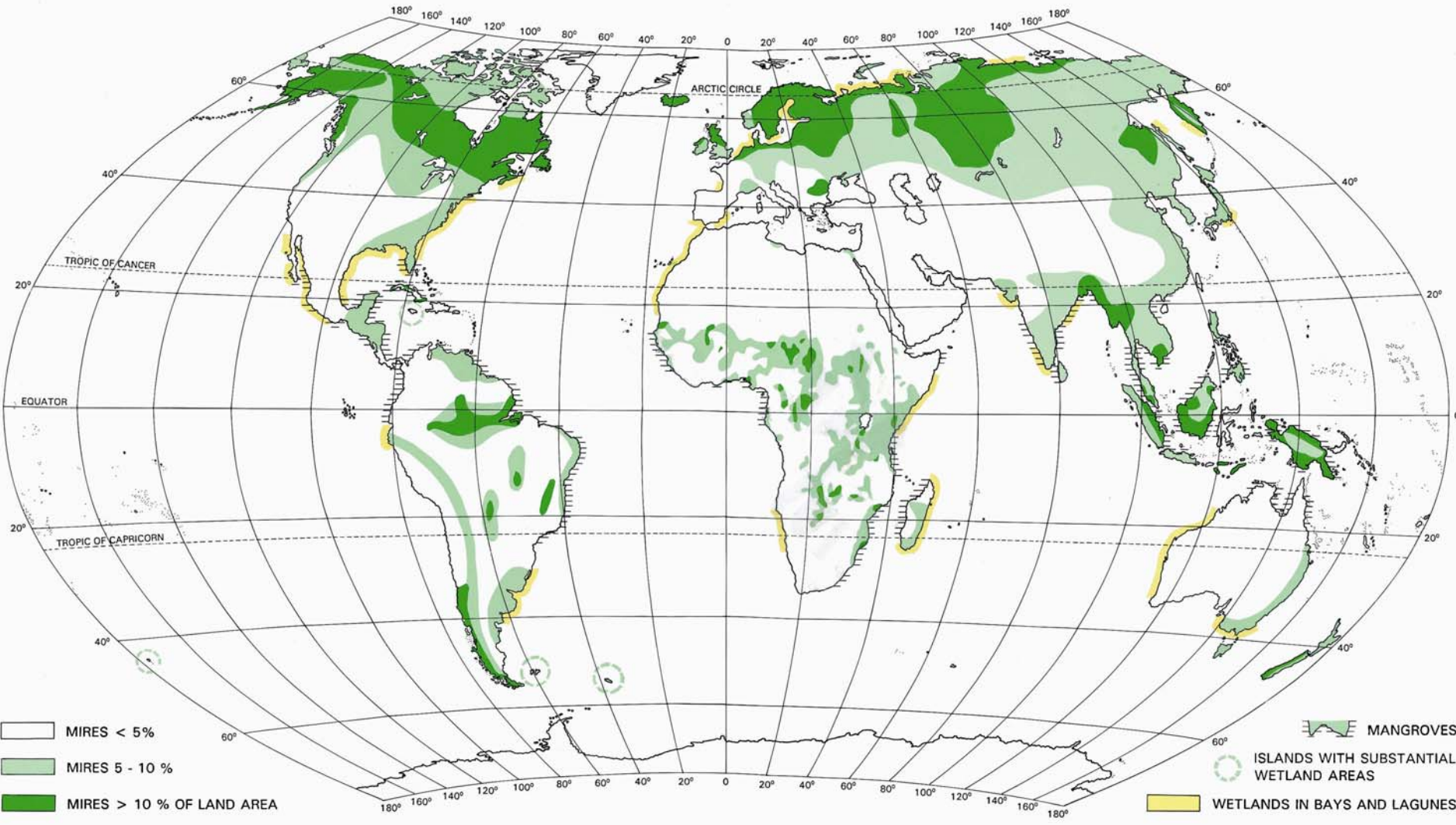




Stand-level forest inventory data



DISTRIBUTION OF MIRES



Global Forest Resources Assessment 2005

Progress towards sustainable forest management



Information collected from 229 countries

**Forests cover
30% of the total land area**

**Total forest area ~4 billion
hectares or 0.62 ha per capita**

**Countries with largest forest
area (*million ha*)**

Russian Federation 809

Brazil 478

Canada 310

United States 303

China 197

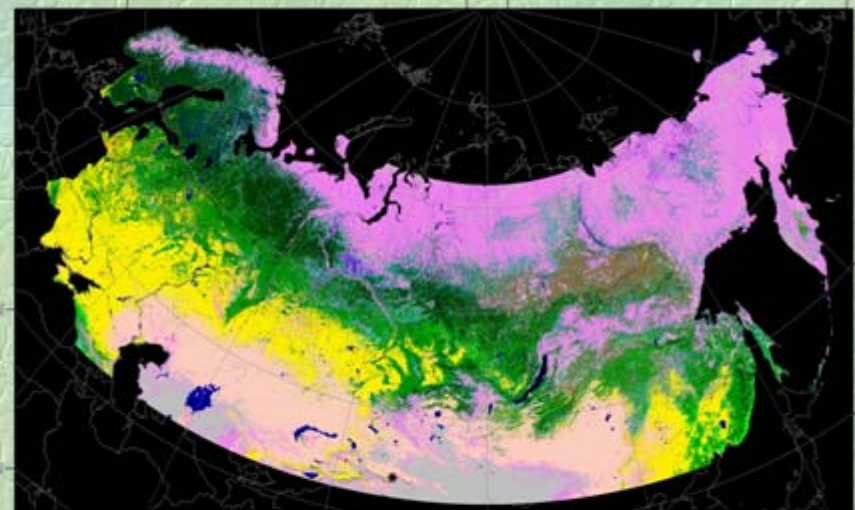
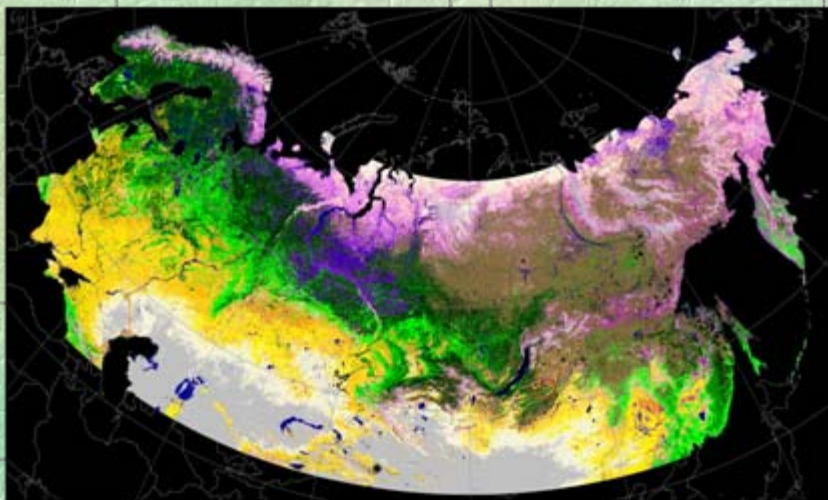
Remote Sensing

- Globally consistent source of data from which globally consistent characterization of land cover can be derived
- Data are
 - Quantitative
 - Multidimensional
 - E.g., a set of spectral bands measures at the point in space and time
 - Repeated
 - Spatially referenced
 - Known and consistent spatial resolution
 - Easily available
 - Variables measured are not those needed to classify land cover
- Methods are evolving rapidly
- Results have their specific shortcomings and limitations
 - The extraction of thematic results is neither quick nor easy

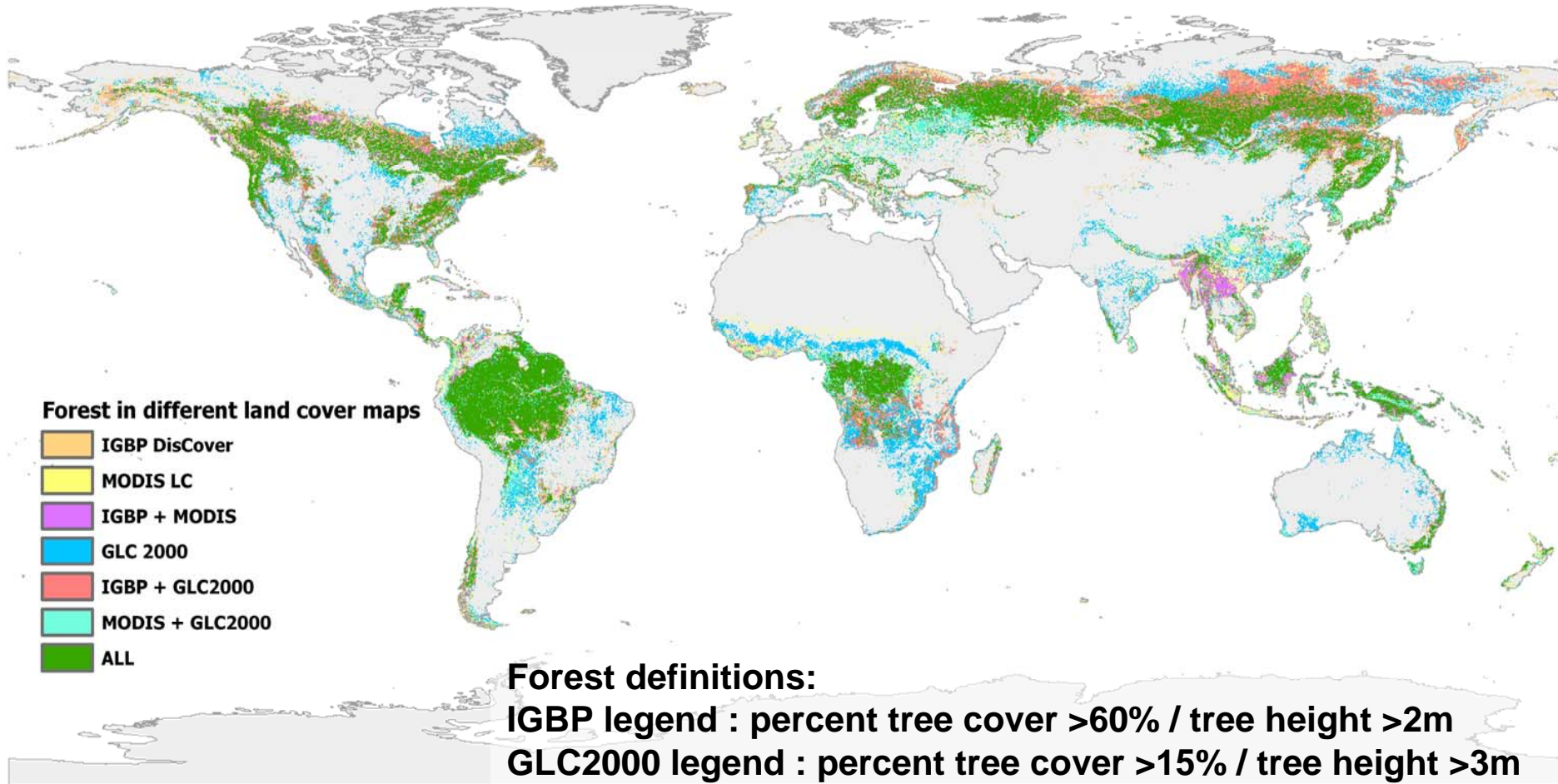
Land Cover of Northern Eurasia

GLC2000

MODIS-IGBP 2001

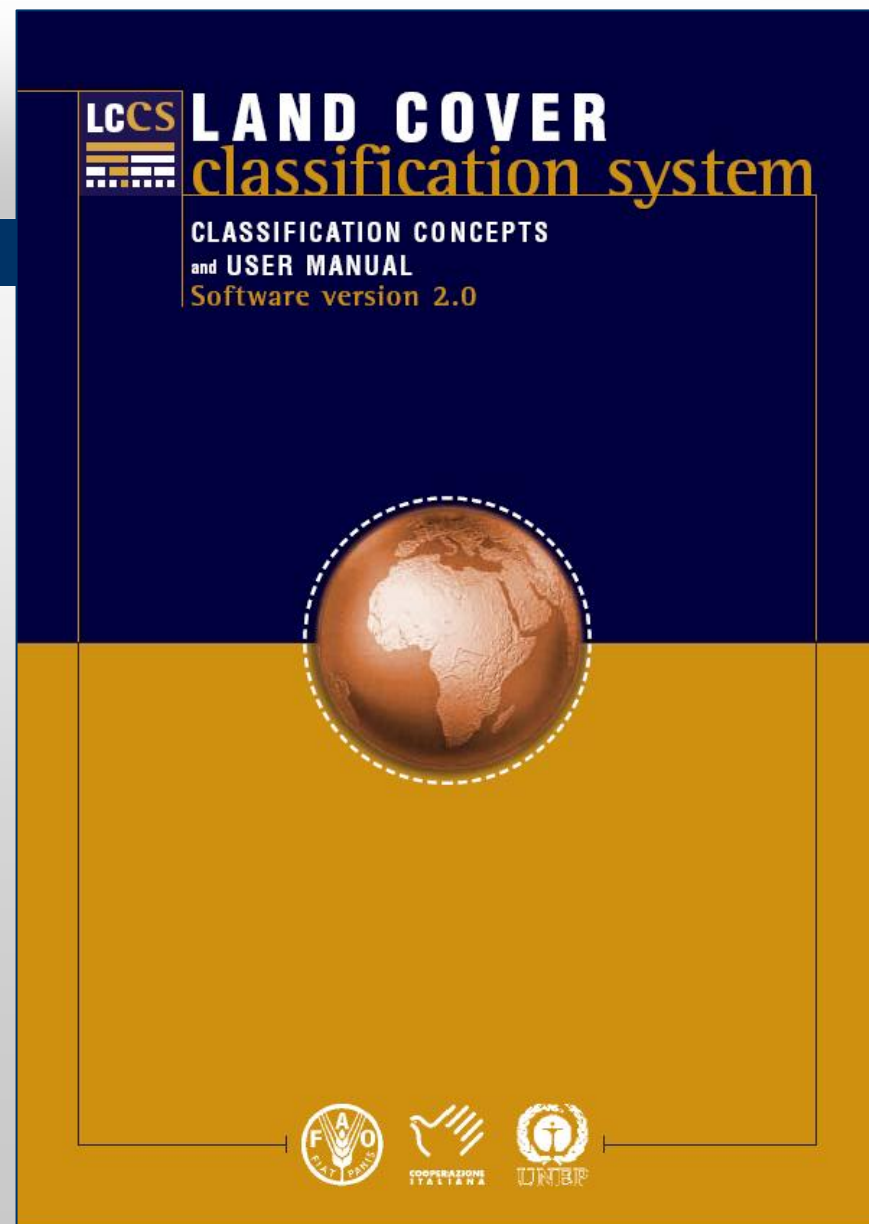


Forest areas in global land cover maps



LCCS to ISO TC211

- LCCS is now of an evolving standard of ISO TC 211 –
- already an FAO/UNEP standard
- Translated into Spanish, Arabic and Russian is available




Definition

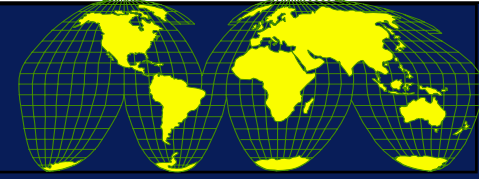
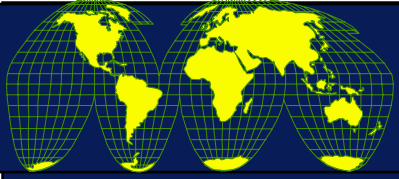
Land cover is the observed (bio)physical cover on the earth's surface.

It includes vegetation and man-made features as well as bare rock, bare soil and **inland** water surfaces.



- 
- LCCS is a new language to describe in a standardized way the different land cover features
 - Launch of the first civilian Earth observation satellite ERTS-1 in 1972 has started a new era for Land Cover Classification as it provided a globally consistent source of data
 - Many Land Cover classifications based on remotely sensed data were developed by peoples with no background in vegetation classification
 - Legacy maps are limited to specific disciplines, projects or geographic area
 -





**Negative
Historical trend**



**Each discipline producing its own
land cover data base**



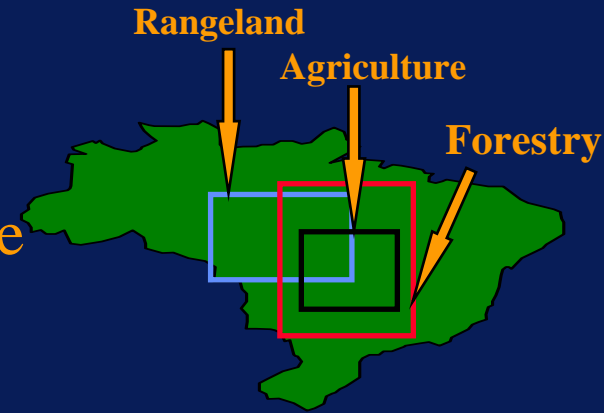
Derived consequences

- the same geographic area mapped several times

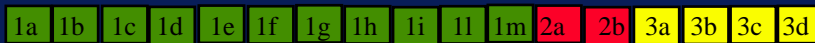
(at different scales, for different purposes, in different times, with different type of data, with different accuracy.)

- the legends too discipline specific

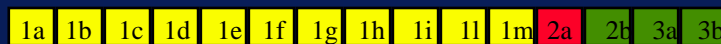
(good detail for the some specific theme poor for others)



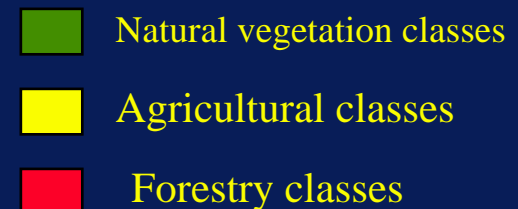
Rangeland map



Agriculture map



Forestry map



THE OBJECTIVE

To produce a world-wide reference system for land cover classification

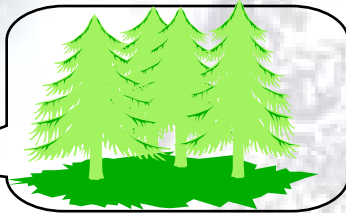
- *high level of flexibility (ability to describe land cover features all over the world at any scale or level of detail)*
- *an absolute level of standardization of the class definition*
- *hierarchy of classes for unambiguous aggregation*

THE BASIC CONCEPT

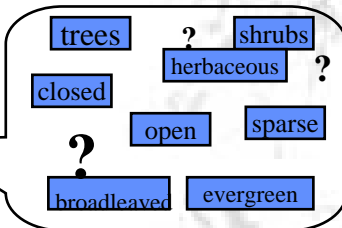
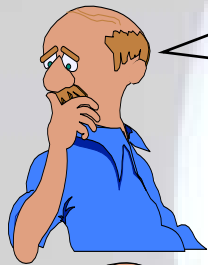
In LCCS a class is defined by a combination of *diagnostic attributes of land cover* called *classifiers*

No pre-defined list of classes exists. The user creates classes -one by one- by converting the user's idea of the class, into a meaningful sequence of classifiers.

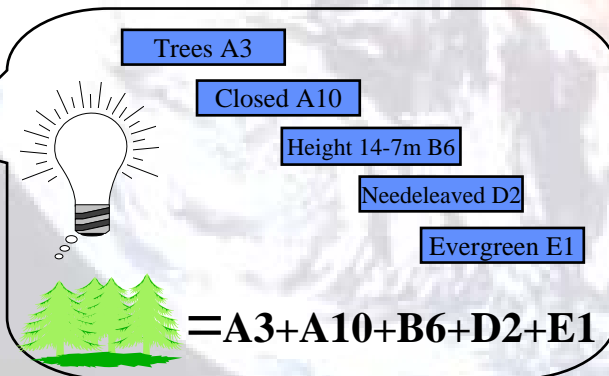
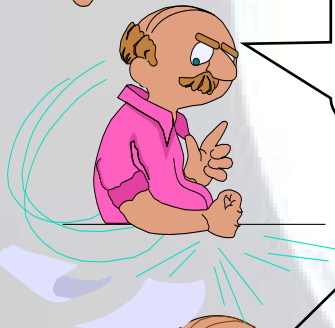
How to create Land Cover classes in LCCS :



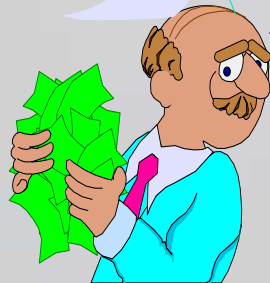
Basic concept of a land cover class
(the idea)



Use of LCCS method
(the language)

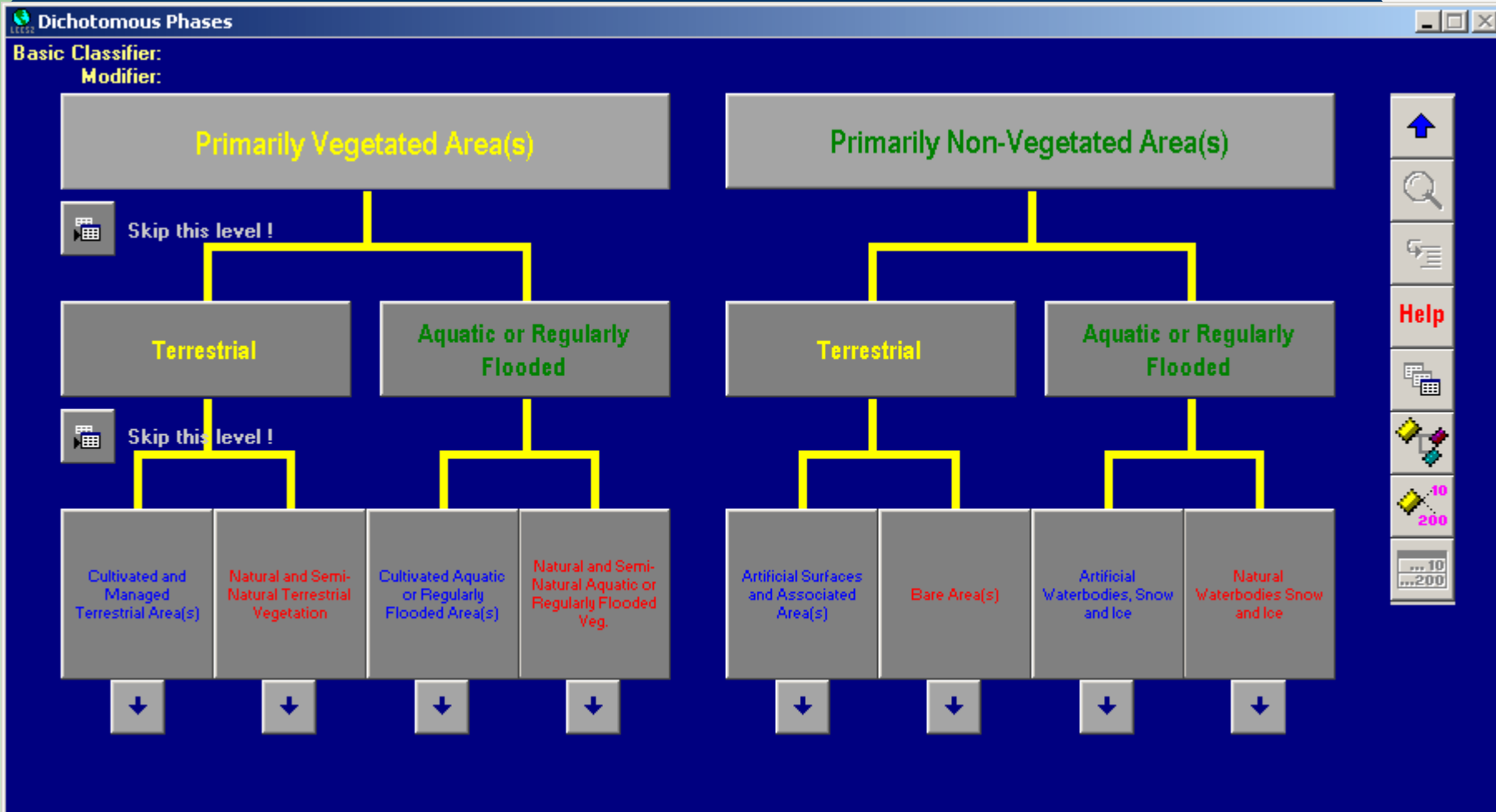


Elaboration of the concept
in the codified LCCS language
(the concept expression)



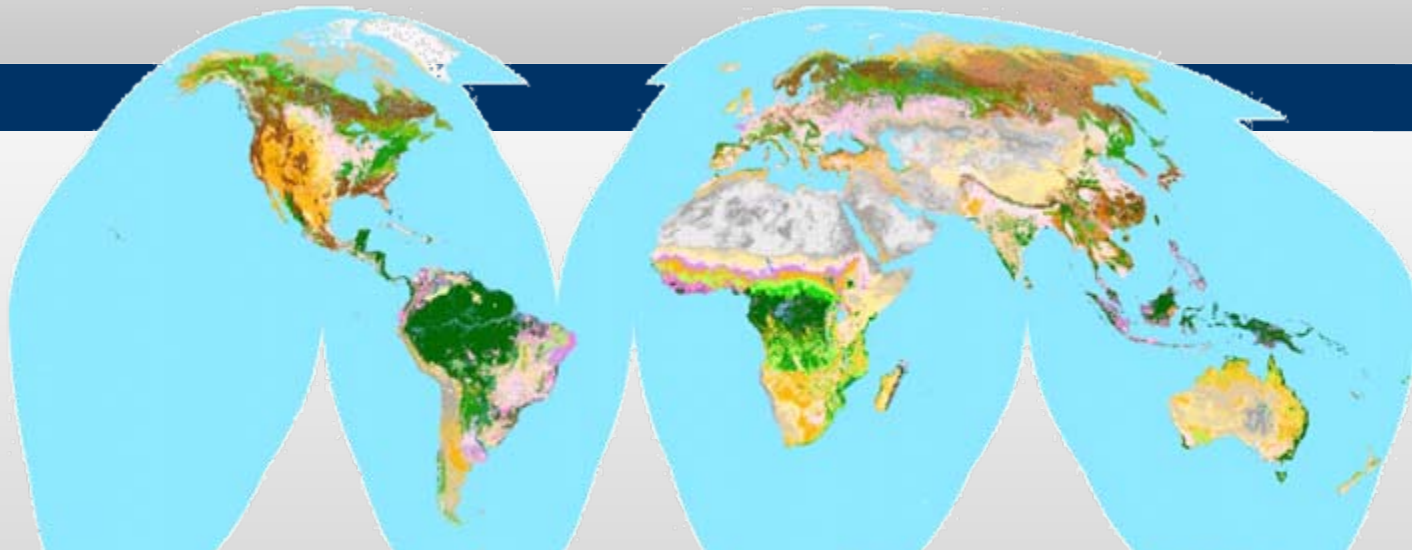


Development of LCCS v 2.0



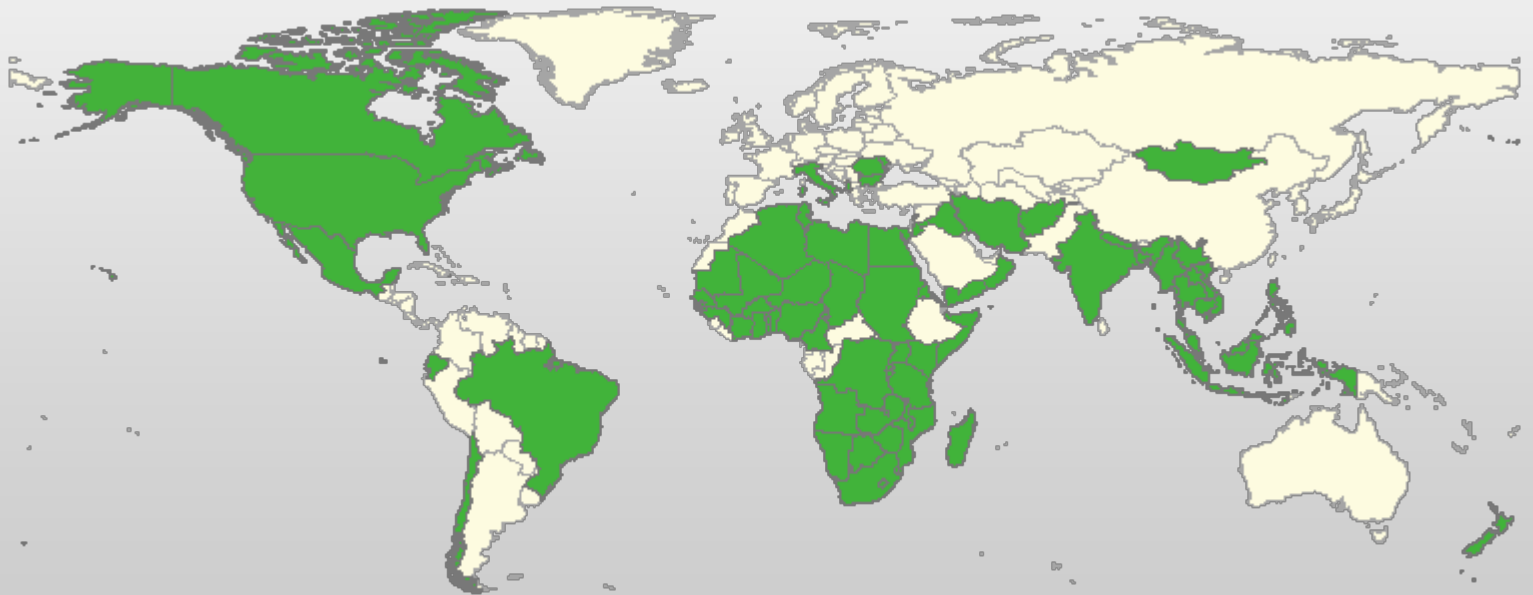
LCCS Operational Context – where is it being used?

Global Land Cover 2000 Database – JRC/EU; FAO/UNEP



Forest	Agriculture	Wetlands
Tree Cover, broadleaved evergreen	Cultivated and managed areas	Tree Cover, regularly flooded, fresh and brackish water
Tree Cover, broadleaved deciduous, closed	Mosaic: Cropland / Tree cover / Other natural vegetation	Tree cover, regularly flooded, saline water
Tree Cover, broadleaved deciduous, open	Mosaic: Cropland / Shrub or Grass Cover	Regularly flooded Shrub and/or Herbaceous cover
Tree Cover, needle-leaved evergreen	Deserts	Grasslands and Shrublands
Tree Cover, needle-leaved deciduous	Bare, sandy	Shrub Cover, closed-open, evergreen
Tree Cover, mixed leaf type	Bare, gravel	Shrub Cover, closed-open, deciduous
Mosaic: Tree cover / Other natural vegetation	Bare, rocky	Herbaceous Cover, closed-open
Tree Cover, burnt	Other	Sparse Herbaceous or sparse Shrub cover
Snow and Ice	Water bodies	Urban
Snow and Ice	No data	Artificial surfaces

LCCS Application - Countries



NELDA Land Cover Legend

Baseline Legend¹

Possible Additional Distinctions

Tree Dominated

Needleleaved

Closed²
Evergreen
Open³

Closed
Deciduous
Open

Broadleaved

Closed
Evergreen
Open

Closed
Deciduous
Open

Mixed

Closed
Open

Cover Detail

Mortality (yes/no, if yes what %)

Species

Wetland (yes/no)

Understory Characteristics (Shrubs or Herbaceous > 15%)

Managed Plantation (Tree Farm/Orchard)

Presence of Build up > 15%

¹ The assumption is to use high resolution imagery (20 – 50 meters) and minimum mapping unit 1 – 2 hectares

² Closed (> 65) %

³ Open (65-15)%

NELDA Land Cover Legend

Baseline Legend

Possible Additional Distinctions

Herbaceous Dominated

Closed

Open

Species (grasses, lichens, mosses, etc)

Mortality (yes/no)

Wetland (yes/no)

Tundra (yes/no)

Pasture (yes/no)

Cultivated Lands

Trees or shrubs < 15 % and >5% Present/not Present

Presence of Build up > 15%

Bare Land and Sparse Vegetation

Bare (Vegetation < 5%)

Sparse Vegetated (Vegetation <> 15% and >< 15%)

Presence of Build up > 15% (yes/no)

Permanent Snow and Ice

Water

Overview

St. Petersburg

Carpathians

Komi

Chita

Priangare

Kazakhstan

Amur

Vasyugan

Sikhote-Alin

Mongolia

Yoshkar Ola

Global Land Cover

To identify specific needs and possibilities for improved mapping of land cover across boreal and temperate Northern Eurasia, we compared the performance of recent land-cover products derived from different sensors: MODIS ([MODIS IGBP Land Cover Collection 4 and 5](#)), SPOT VEGETATION ([GLC-2000](#)) and MERIS ([GLOBCOVER](#)).



What are the differences and similarities between global datasets?

We examined the level of agreement among these data sets across the entire region. On a qualitative level, the assessment of general patterns indicates the highest degree of disagreement in transitional zones at the northern and southern fringes of boreal forest, in mountainous regions, and in areas of extensive wetlands, agricultural development, and urban land use. The quantitative analysis measured the level of disagreement between land-cover classes aggregated according to dominant life form type of vegetation (trees, shrubs, herbaceous, bare land, and permanent snow/ice).

What is the accuracy of global maps at NELDA test sites?

Validation of global datasets was performed with higher resolution, Landsat-based land cover maps from [NELDA test sites](#). Fractional land cover was calculated for coarse resolution pixel and used to construct fractional error matrices. Most errors were associated with "mixed" coarse-resolution pixels (i.e. those having nearly equal percentage of multiple class types), while errors in "pure" (single class) pixels were low. In addition to actual differences in land-cover classifications, other sources of discrepancy among these land cover products include class definitions, map projections, and spatial resolution.

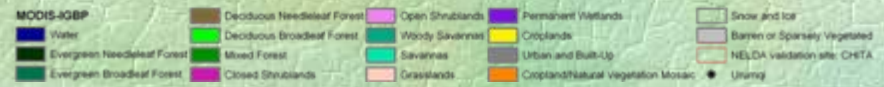
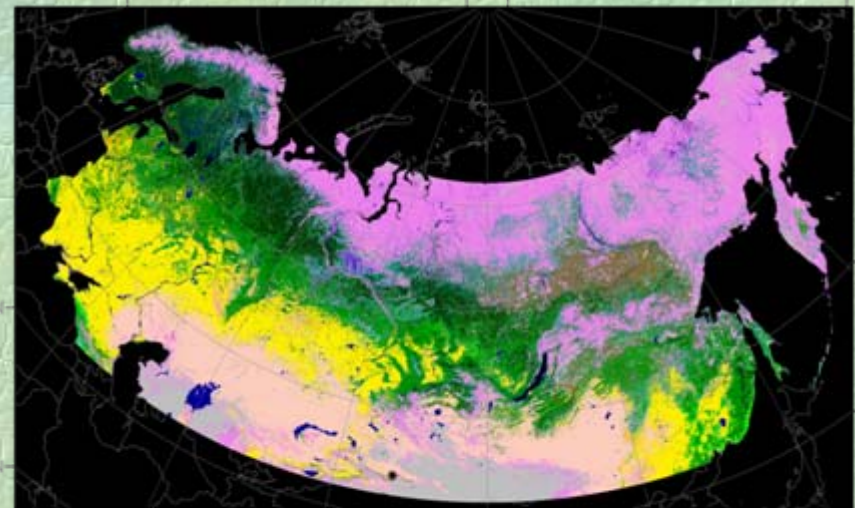
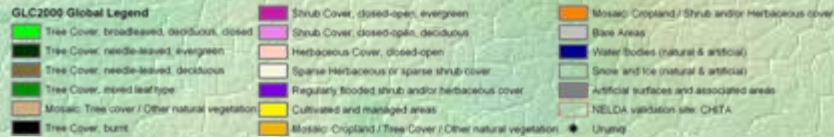
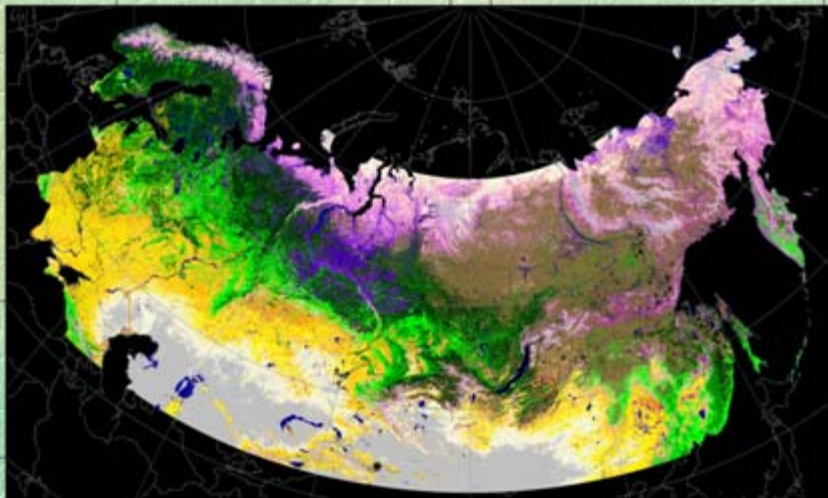
Dominant Live Form Types

Differences in class definitions and legends between maps are a major difficulty for comparing global land cover data sets. We converted each legend to a standard classification on the basis of the dominant live form types (LFT): tree, shrub, herbaceous and barren/sparse vegetation and water. Classes representing mixtures of vegetation types were labeled as 'mosaic'. Select a site on the left menu to compare LFT maps derived from global land cover datasets with Landsat-based reference maps.

Land Cover of Northern Eurasia

GLC2000

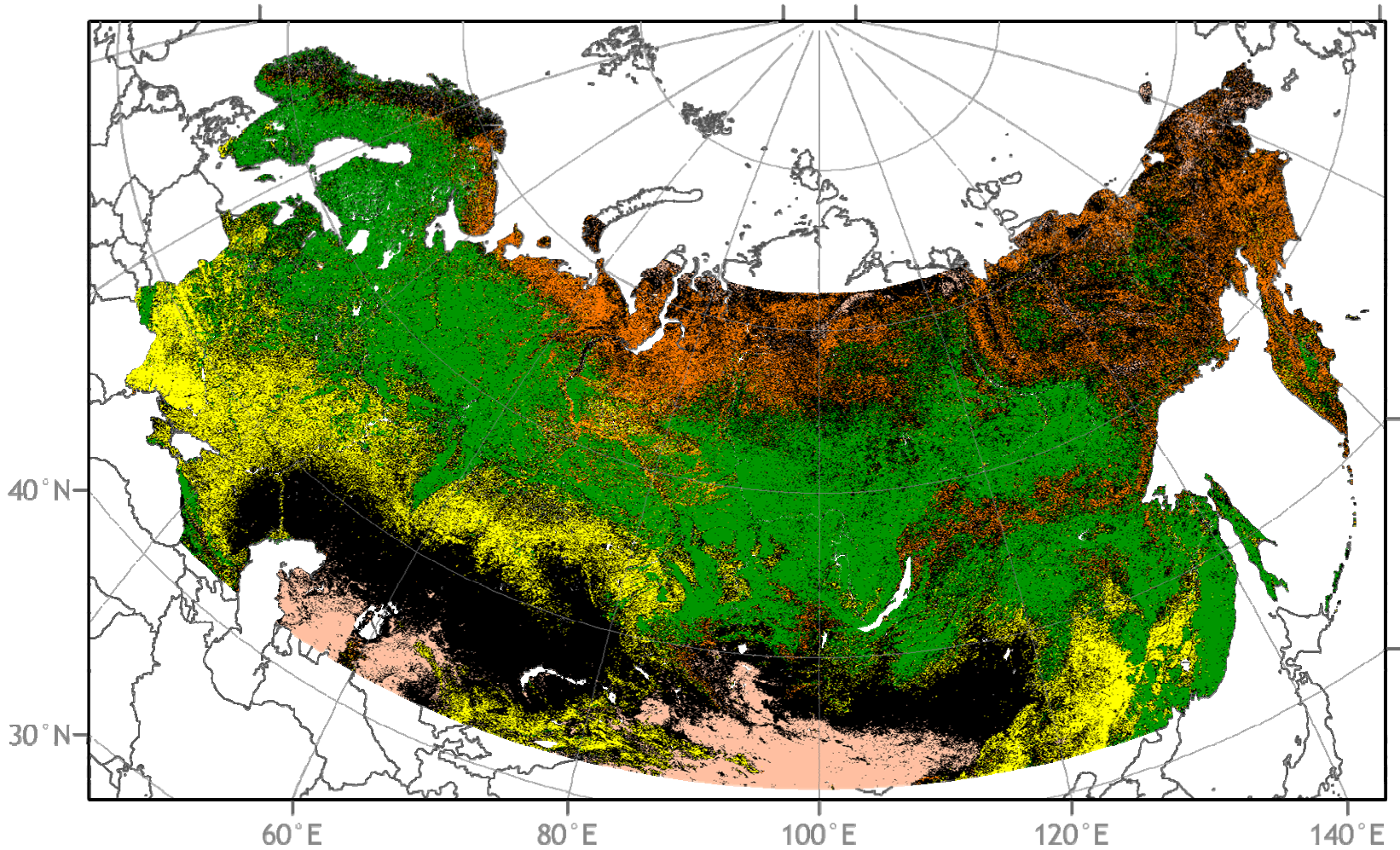
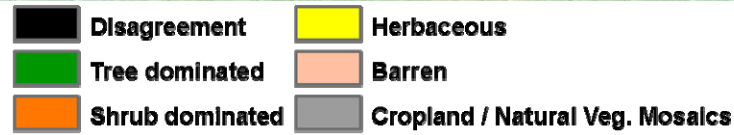
MODIS-IGBP 2001



Similarity matrix for the legends

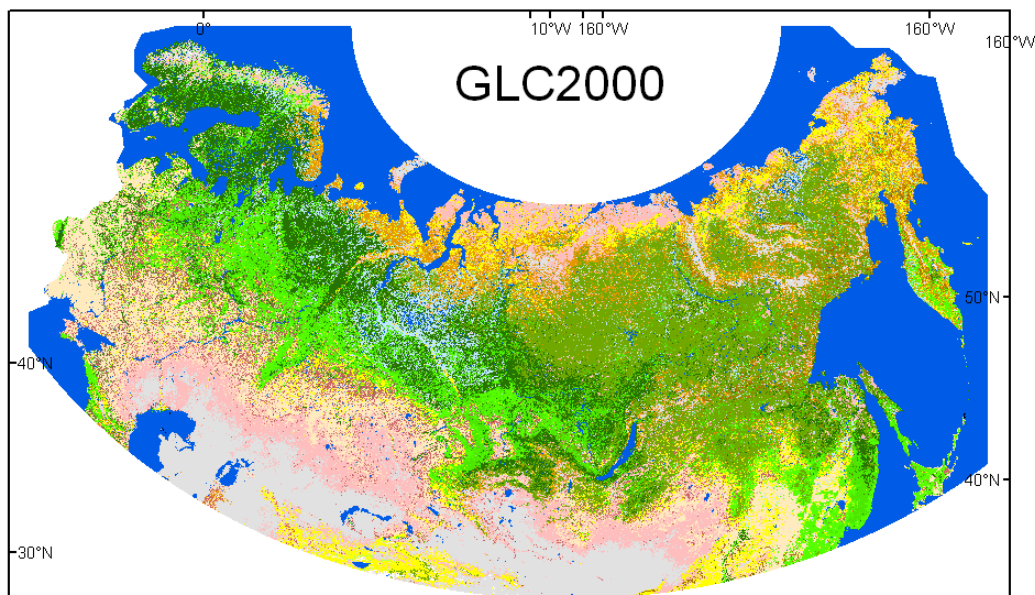
GLC-2000.LCCS (rows) MODIS.PFT (columns)		1	2	3	4	5	6	7	8	9	10	11	0
		Needleleaf evergreen tree	Broadleaf evergreen tree	Needleleaf deciduous tree	Broadleaf deciduous tree	Shrub	Grass	Cereal crop	Broadleaf crop	Urban and built-up	Snow and ice	Barren or sparsely vegetated	Water
1	Tree Cover, broadleaved, evergreen	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
2	Tree Cover, broadleaved, deciduous, closed	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
3	Tree Cover, broadleaved, deciduous, open	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
4	Tree Cover, needle-leaved, evergreen	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
5	Tree Cover, needle-leaved, deciduous	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
6	Tree Cover, mixed leaf type	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
7	Tree Cover, regularly flooded, fresh water	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
8	Tree Cover, regularly flooded, saline water	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
9	Mosaic: Tree cover / Other natural vegetation	T	T	T	T	S	H	th	th	tb	tb	tb	lw
10	Tree Cover, burnt	T	T	T	T	ts	th	th	th	tb	tb	tb	lw
11	Shrub Cover, closed-open, evergreen	ts	ts	ts	ts	S	sh	sh	sh	sb	sb	sb	lw
12	Shrub Cover, closed-open, deciduous	ts	ts	ts	ts	S	sh	sh	sh	sb	sb	sb	lw
13	Herbaceous Cover, closed-open	th	th	th	th	sh	H	H	H	hb	hb	hb	lw
14	Sparse Herbaceous or sparse shrub cover	tb	tb	tb	tb	sb	hb	hb	hb	B	B	B	lw
15	Regularly flooded shrub and/or herbaceous cover	ts	ts	ts	ts	S	H	H	H	hb	hb	hb	lw
16	Cultivated and managed areas	th	th	th	th	sh	H	H	H	hb	hb	hb	lw
17	Mosaic: Cropland / Tree Cover / Other natural vegetation	T	T	T	T	S	H	H	H	hb	hb	hb	lw

Agreement in dominant vegetation cover (54%)



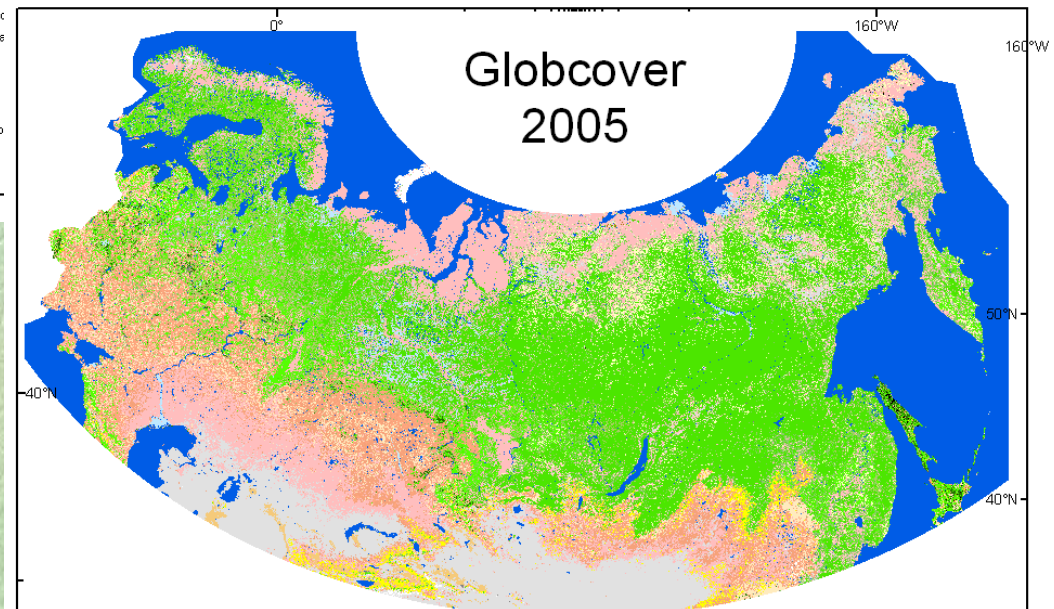
Agreement matrix for GLC-2000 and MODIS.PFT dominant vegetation types excluding water, 1000 km²

GLC-2000	MODIS.PFT					Agreement
	Tree	Shrub	Herbaceous	Barren		
Tree	2,395	1,697	351	7	4,450	54%
Shrub	200	1,922	105	31	2,258	85%
Herbaceous	24	698	160	34	916	17%
Barren	12	973	64	183	1,232	15%
	2,630	5,290	680	255	8,855	
Agreement	91%	36%	23%	72%		<u>53%</u>



GLC2000

- | | | |
|---|---|------------------------------|
| Tree Cover, broadleaved, evergreen | Mosaic: Tree Cover / Other natural vegetation | Mosaic: Cropland / Tree C |
| Tree Cover, broadleaved, deciduous, closed | Tree Cover, burnt | Mosaic: Cropland / Shrub s |
| Tree Cover, broadleaved, deciduous, open | Shrub Cover, closed-open, evergreen | Bare Areas |
| Tree Cover, needle-leaved, evergreen | Shrub Cover, closed-open, deciduous | Water Bodies |
| Tree Cover, needle-leaved, deciduous | Herbaceous Cover, closed-open | Snow and Ice |
| Tree Cover, mixed leaf type | Sparse herbaceous or sparse shrub cover | Artificial surfaces and asso |
| Tree Cover, regularly flooded, fresh water | Regularly flooded shrub and/or herbaceous cover | No data |
| Tree Cover, regularly flooded, saline water | Cultivated and managed areas | |

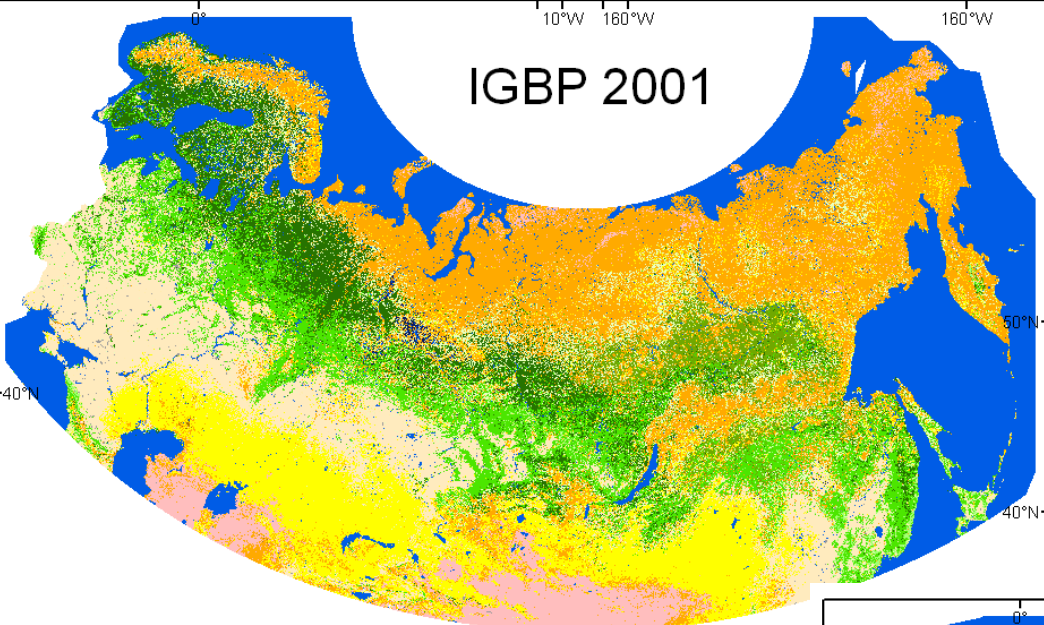


Globcover 2005

- | | | |
|--|---|--|
| Croplands (Irrigated) | Forest Cover, needleleaved, closed | Sparse vegetation |
| Croplands (Rainfed) | Forest Cover, needleleaved or deciduous, open | Regularly flooded herbaceous or woody vegetation |
| Mosaic: Cropland / herbaceous, shrubland, forest | Forest Cover, mixed type | Artificial surfaces and associated areas |
| Mosaic: Herbaceous, shrubland, forest / Cropland | Mosaic: Forest or Shrubland / herbaceous | Bare Areas |
| Forest Cover, evergreen or semi-deciduous, closed-open | Mosaic: Herbaceous / forest or shrubland | Water Bodies |
| Forest Cover, broadleaved, deciduous, closed | Shrubland Cover, closed-open | Snow and Ice |
| Forest Cover, broadleaved, deciduous, open | Herbaceous Cover, closed-open | No data |

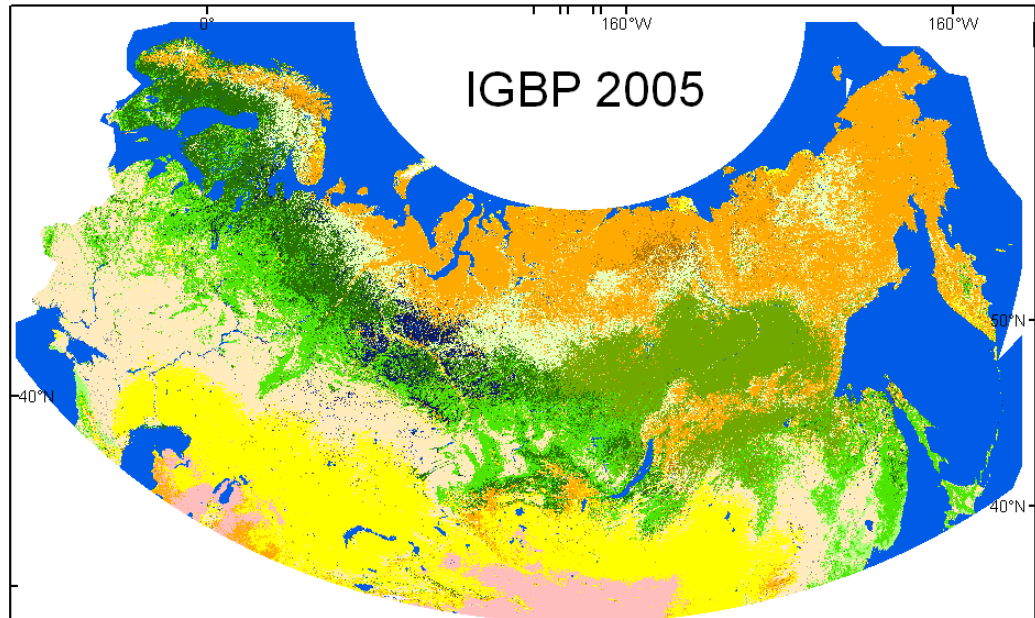


IGBP 2001



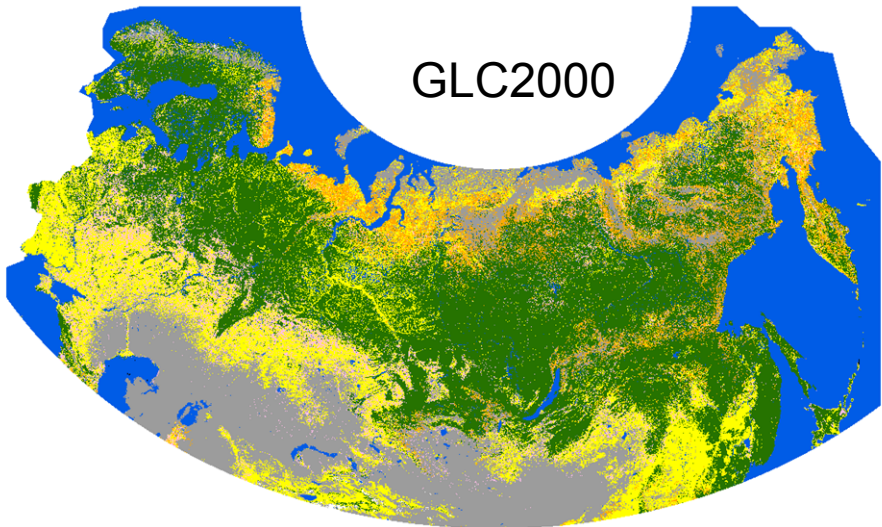
- | | | |
|-------------------------------------|-----------------------|--------------------|
| Forest Cover, needleleaf, evergreen | Shrubland Cover, open | Urban and Built-Up |
| Forest Cover, broadleaf, evergreen | Savanna, Woody | Cropland/Natural |
| Forest Cover, needleleaf, deciduous | Savanna | Snow and Ice |
| Forest Cover, broadleaf, deciduous | Herbaceous Cover | Barren or Sparsely |
| Forest Cover, mixed | Permanent Wetlands | Water Bodies |
| Shrubland Cover, closed | Croplands | |

IGBP 2005

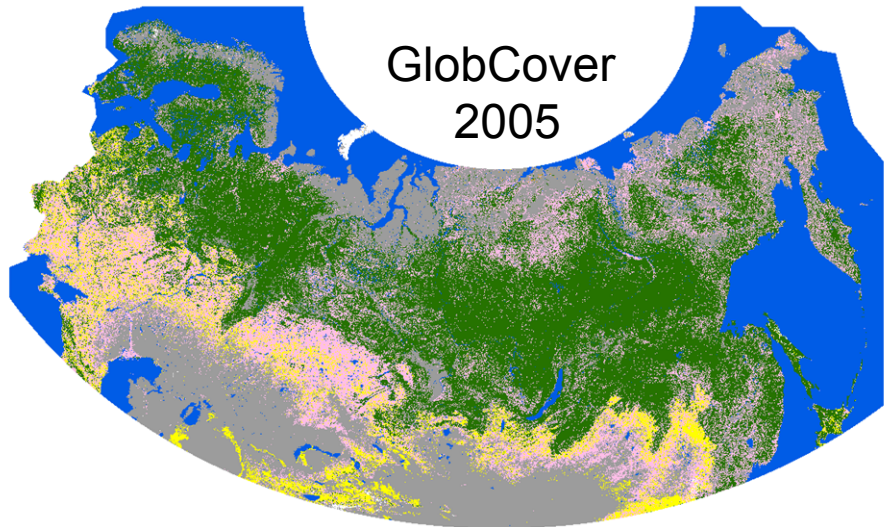


- | | | |
|-------------------------------------|-------------------------|------------------------------------|
| Water Bodies | Shrubland Cover, closed | Croplands |
| Forest Cover, needleleaf, evergreen | Shrubland Cover, open | Urban and Built-Up |
| Forest Cover, broadleaf, evergreen | Savanna, Woody | Cropland/Natural Vegetation Mosaic |
| Forest Cover, needleleaf, deciduous | Savanna | Snow and Ice |
| Forest Cover, broadleaf, deciduous | Herbaceous Cover | Barren or Sparsely Vegetated |
| Forest Cover, mixed | Permanent Wetlands | |

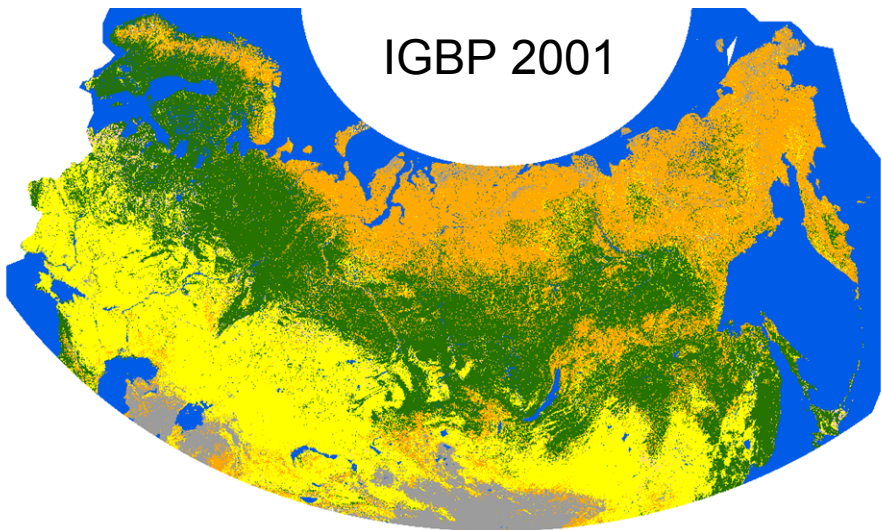
GLC2000



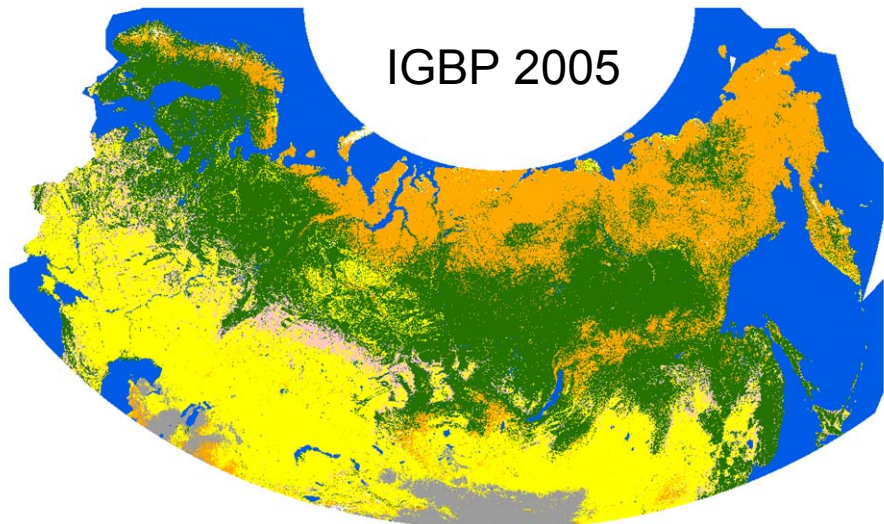
GlobCover
2005



IGBP 2001



IGBP 2005



Tree



Shrub



Herbaceous



Mosaic



Bare



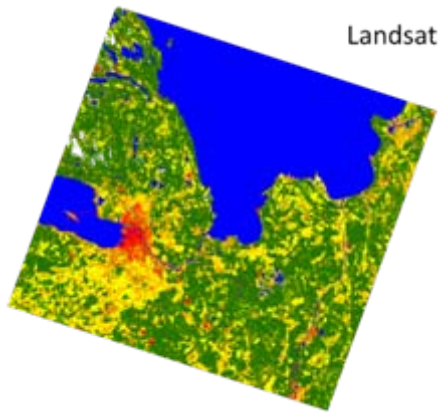
Ice



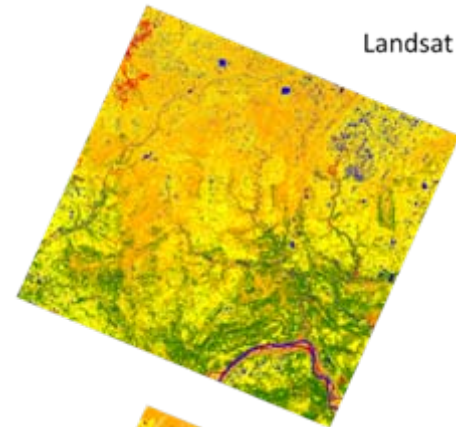
Water

St. Petersburg

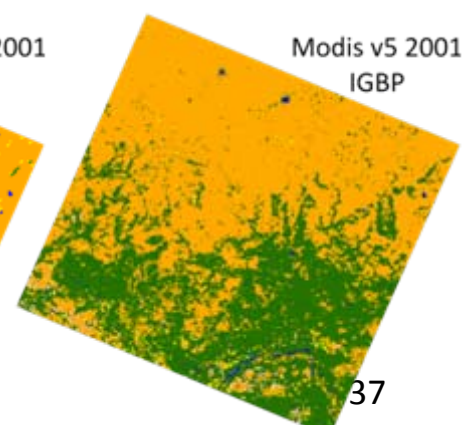
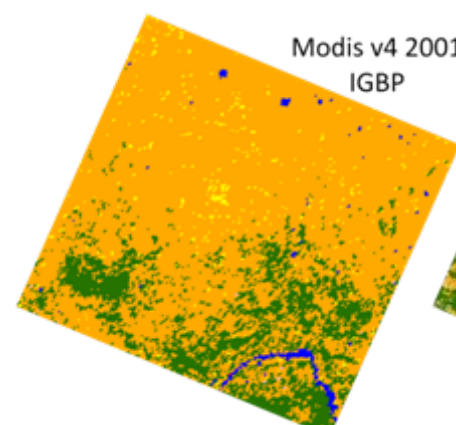
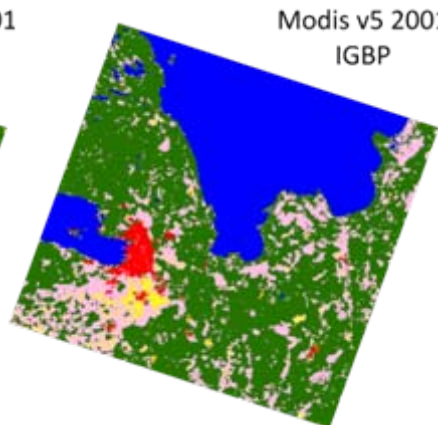
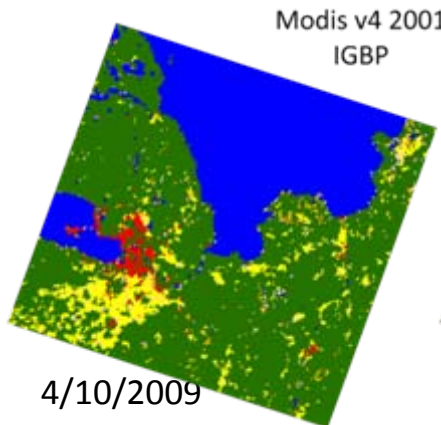
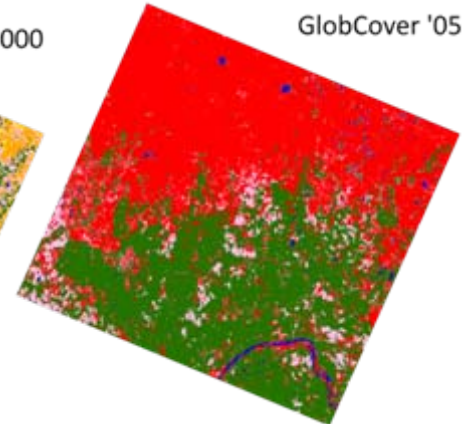
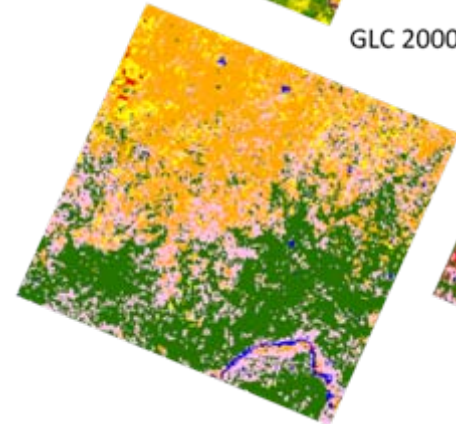
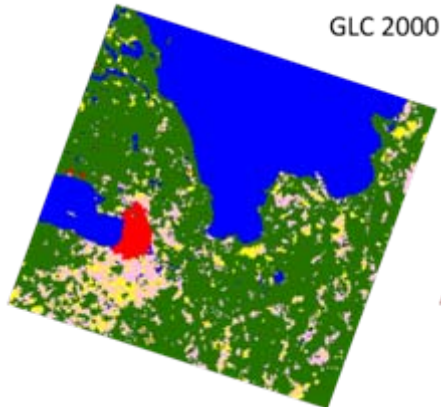
Komi



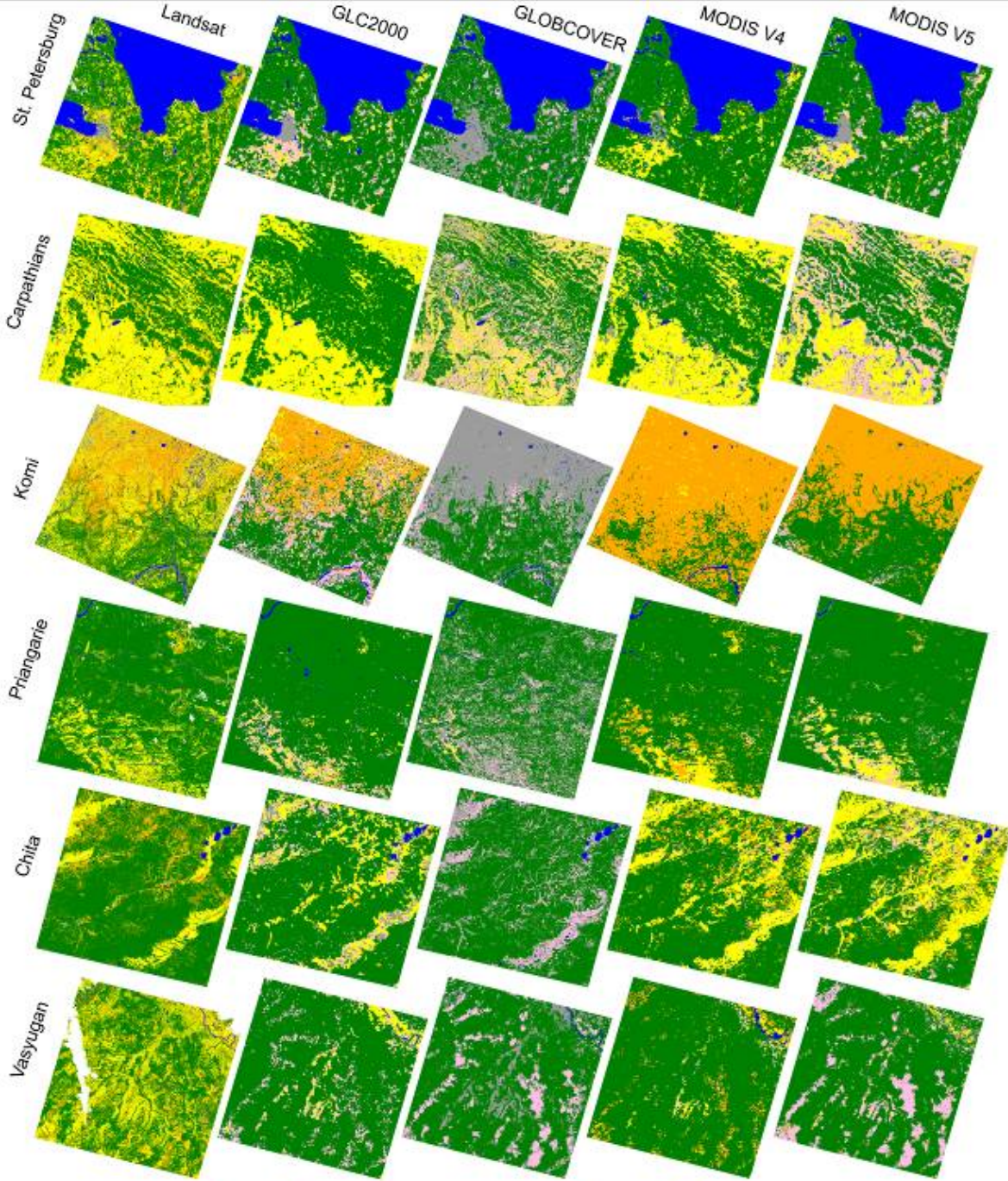
- Tree
- Shrub
- Herbaceous
- Mosaic
- Bare
- Cloud
- Water



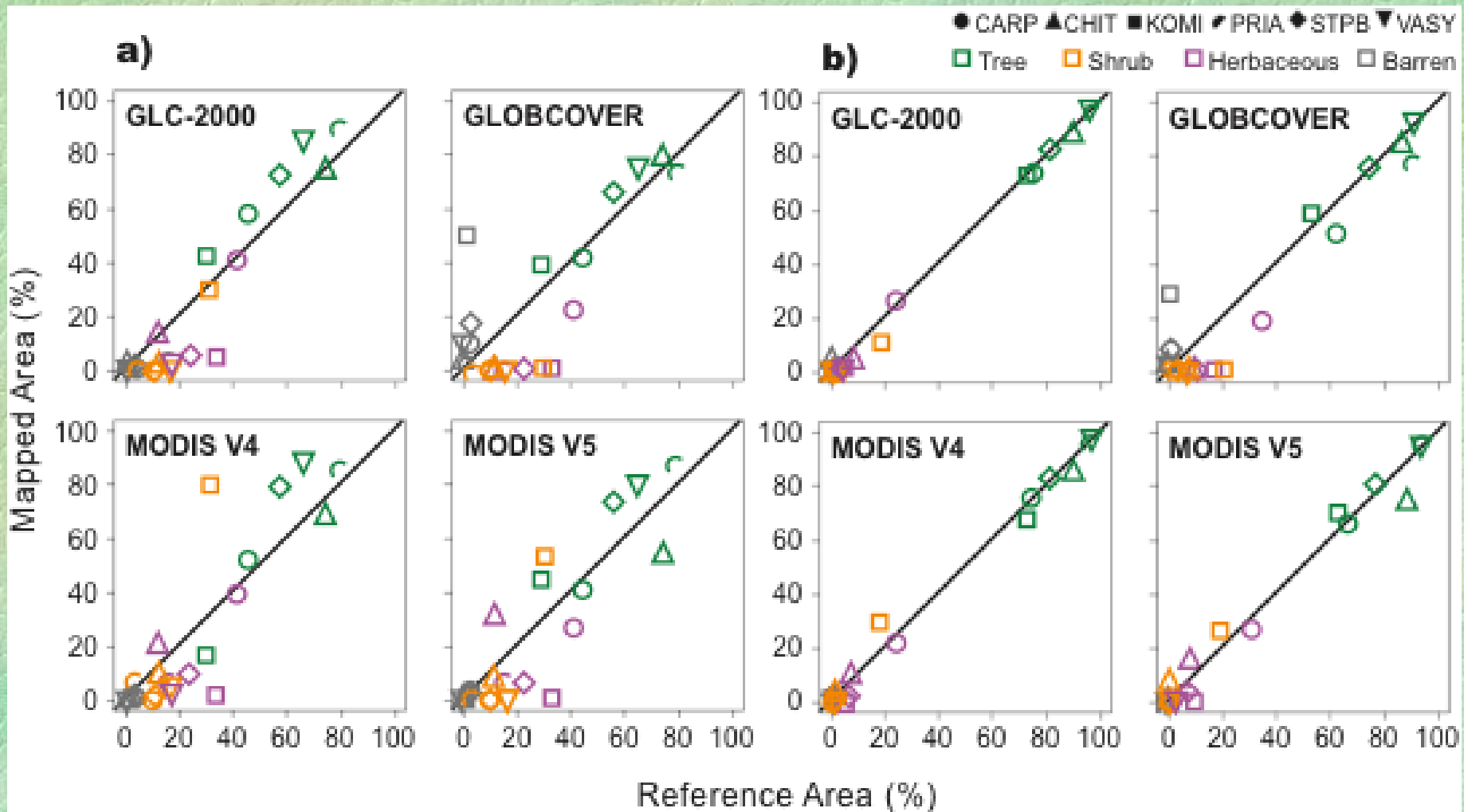
- Tree
- Shrub
- Herbaceous
- Mosaic
- Bare
- Cloud
- Water

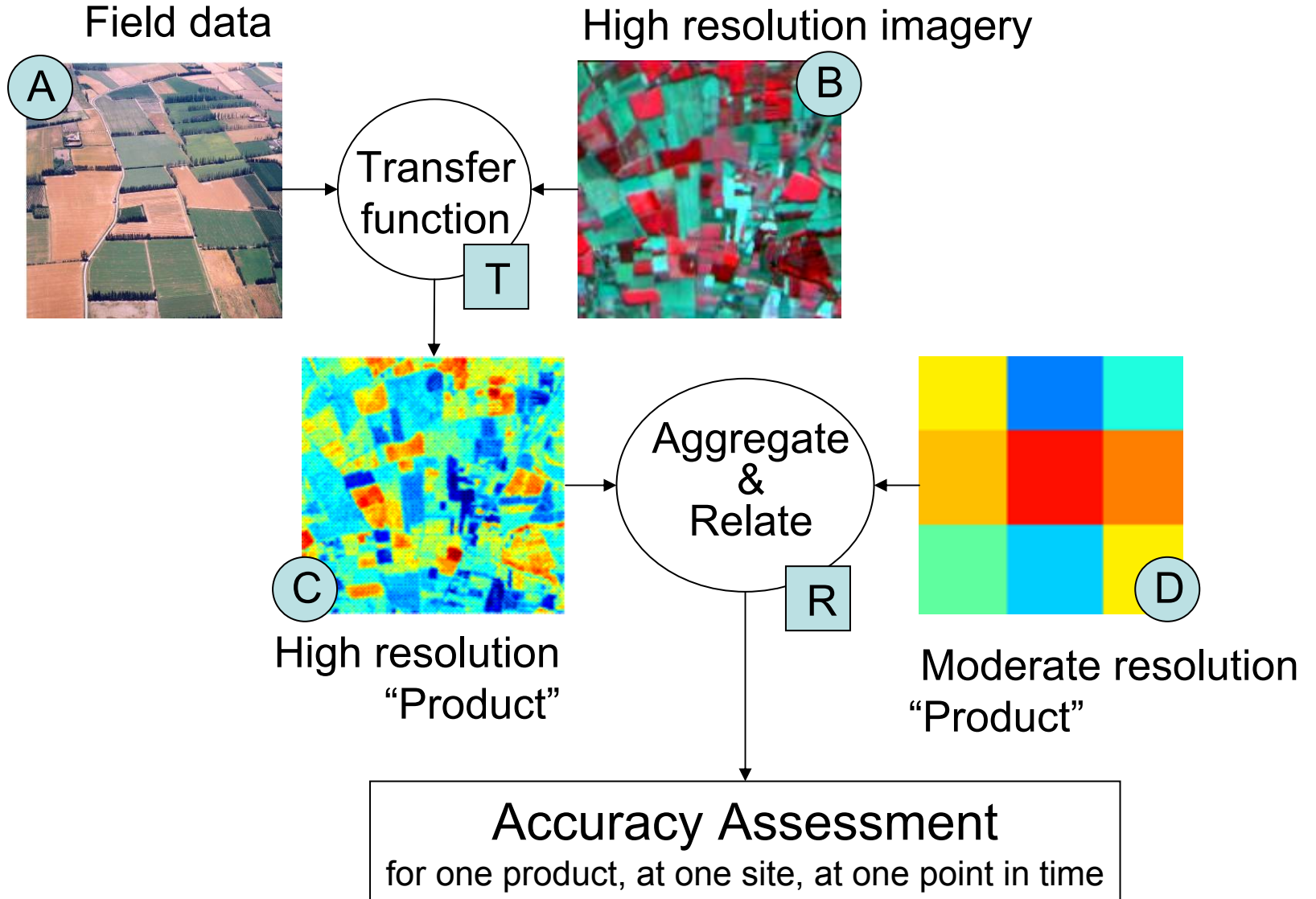


4/10/2009



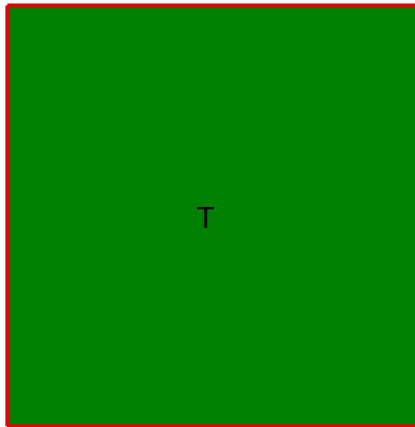
■ Trees
 ■ Shrubs
 ■ Herbaceous
 ■ Barren
 ■ Mosaic
 ■ Water



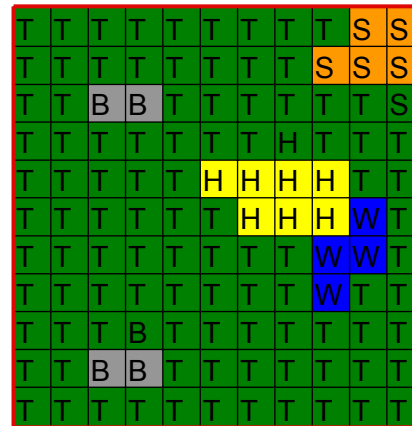


Confusion matrix: pixel-based

Coarse map



Reference map



Map	Reference				
	T	S	H	B	W
T	98	6	8	5	4
S					
H					
B					
W					

98x T
6x S
8x H
5x B
4x W

NB: Maximum achievable agreement < 100%

Agreement matrix for St. Petersburg site, km²

GLC-2000	NELDA land cover (km ²)					Commission
	Trees	Shrubs	Herbaceous	Barren	Water	
Trees	11,264	1,103	2,635	177	298	4,213
Shrubs	1	2	2	1	0	5
Herbaceous	324	444	926	97	32	1,499
Barren	39	44	96	239	25	404
Mosaics	535	671	1,349	133	33	2,186
Water	167	33	87	47	940	1,107
Omission	1,066	1,194	2,460	517	1,030	

Agreement = 73.2%, Kappa = 50.5%

Accuracy Assessment Protocol for a Land cover map (Example from NELDA Project)

Randomly generated points

- 2x2 clusters of Landsat pixels of a single class at least 250 m apart

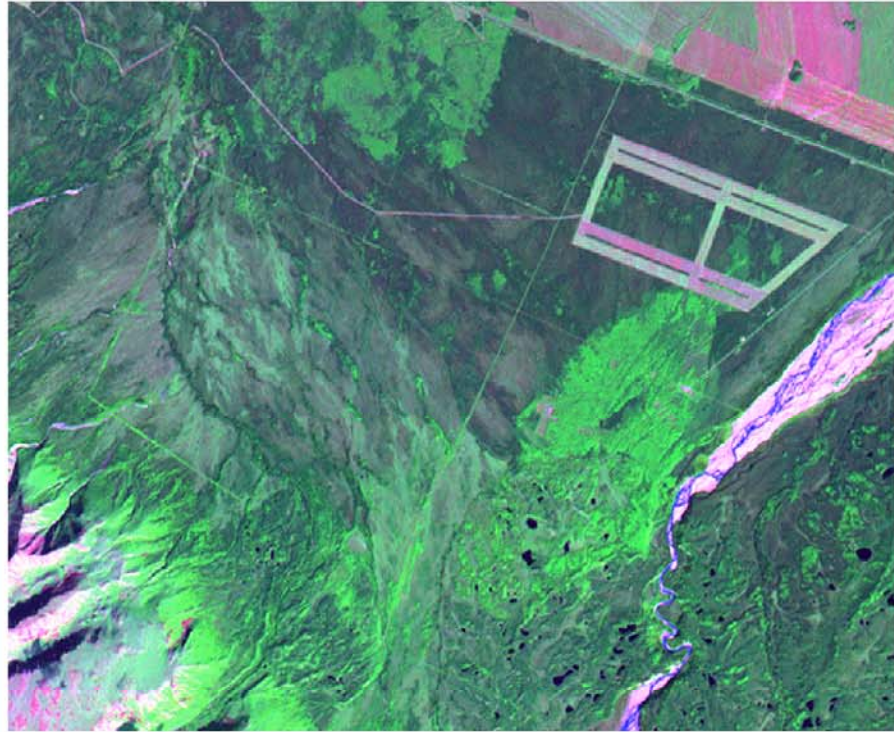
Minimum required number of points is 300 per site

- Distributed in proportion to area of classes
- Min 30 points per class

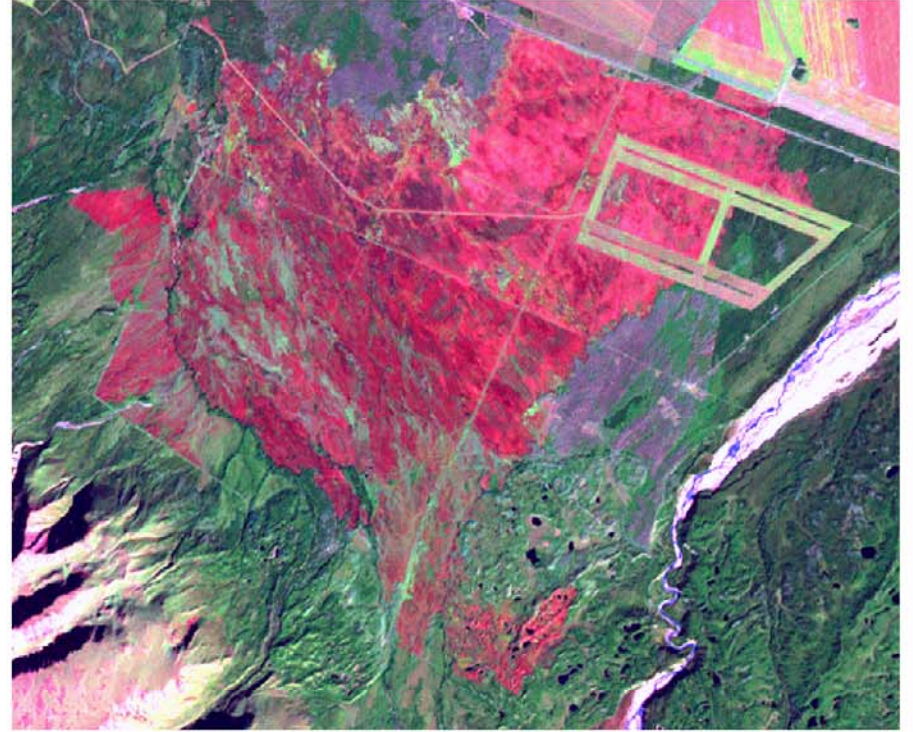
Accuracy assessment is essential

**A map without accuracy assessment
is an untested hypothesis**

Pre-Burn Image, 30 August 1992



Post-Burn Image, 16 September 1995

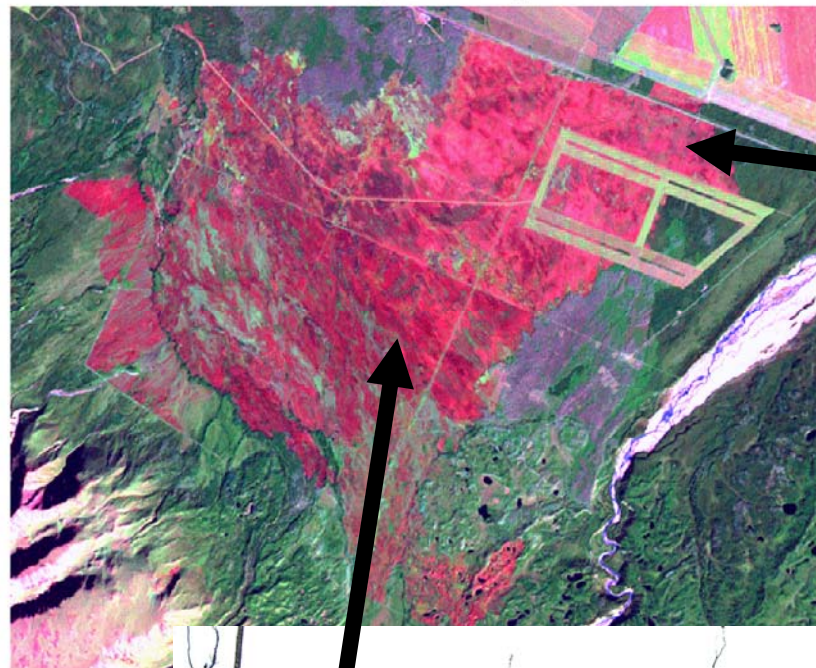


Scale 1:175,000



Kilometers

Post-Burn Image, 16 September 1995

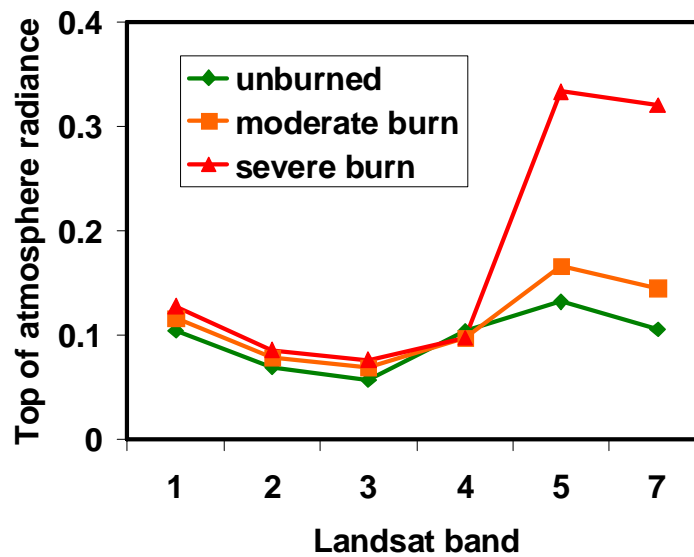


severe

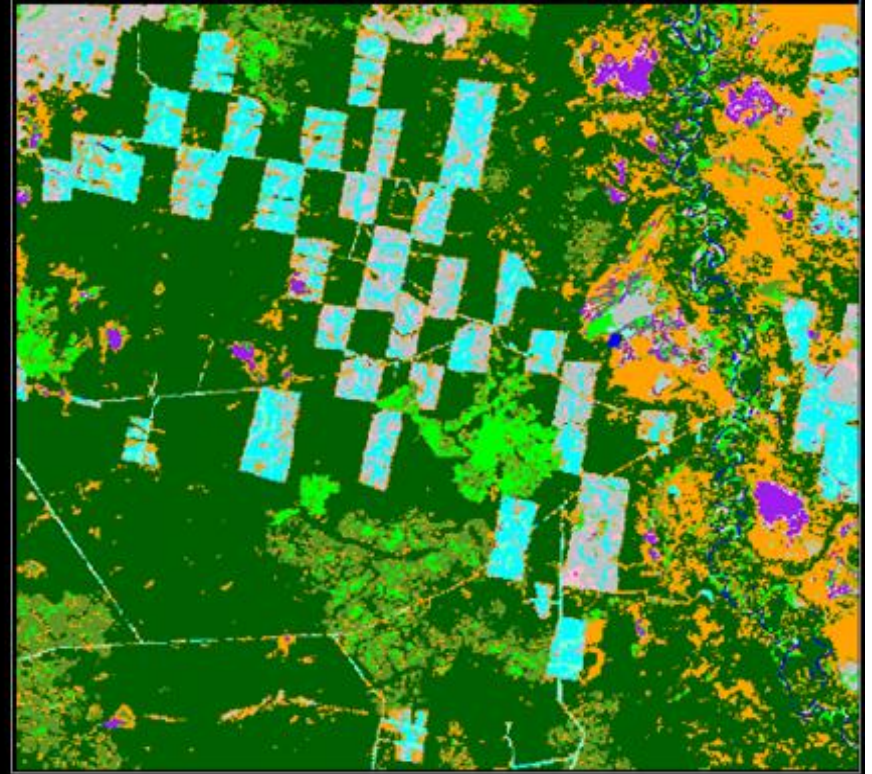
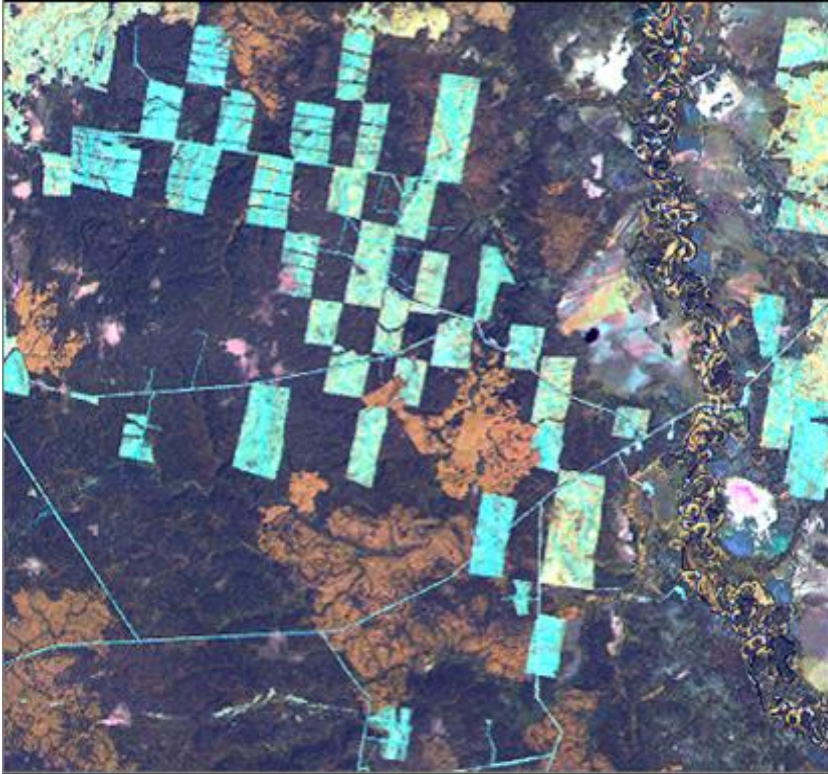


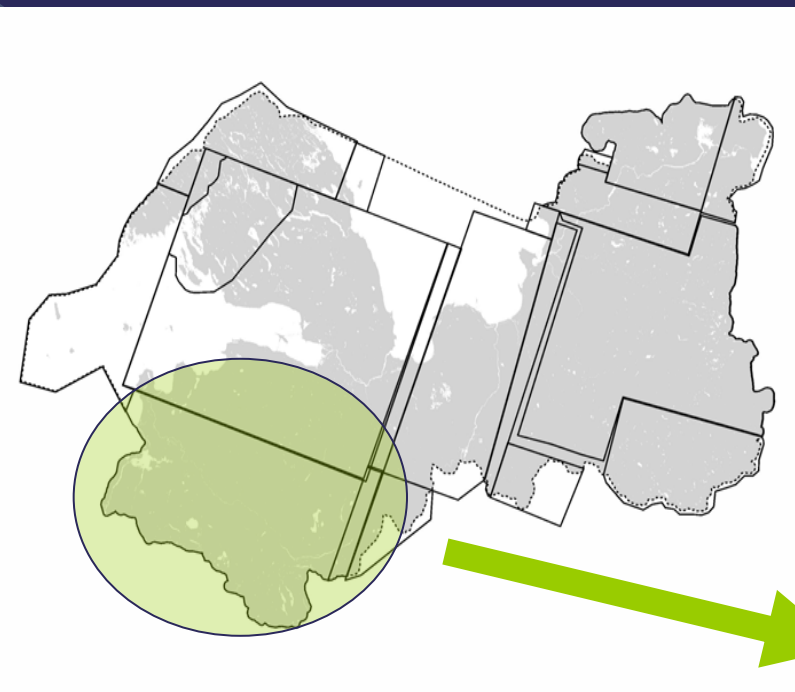
moderate

Landsat radiance values for burned black spruce stand



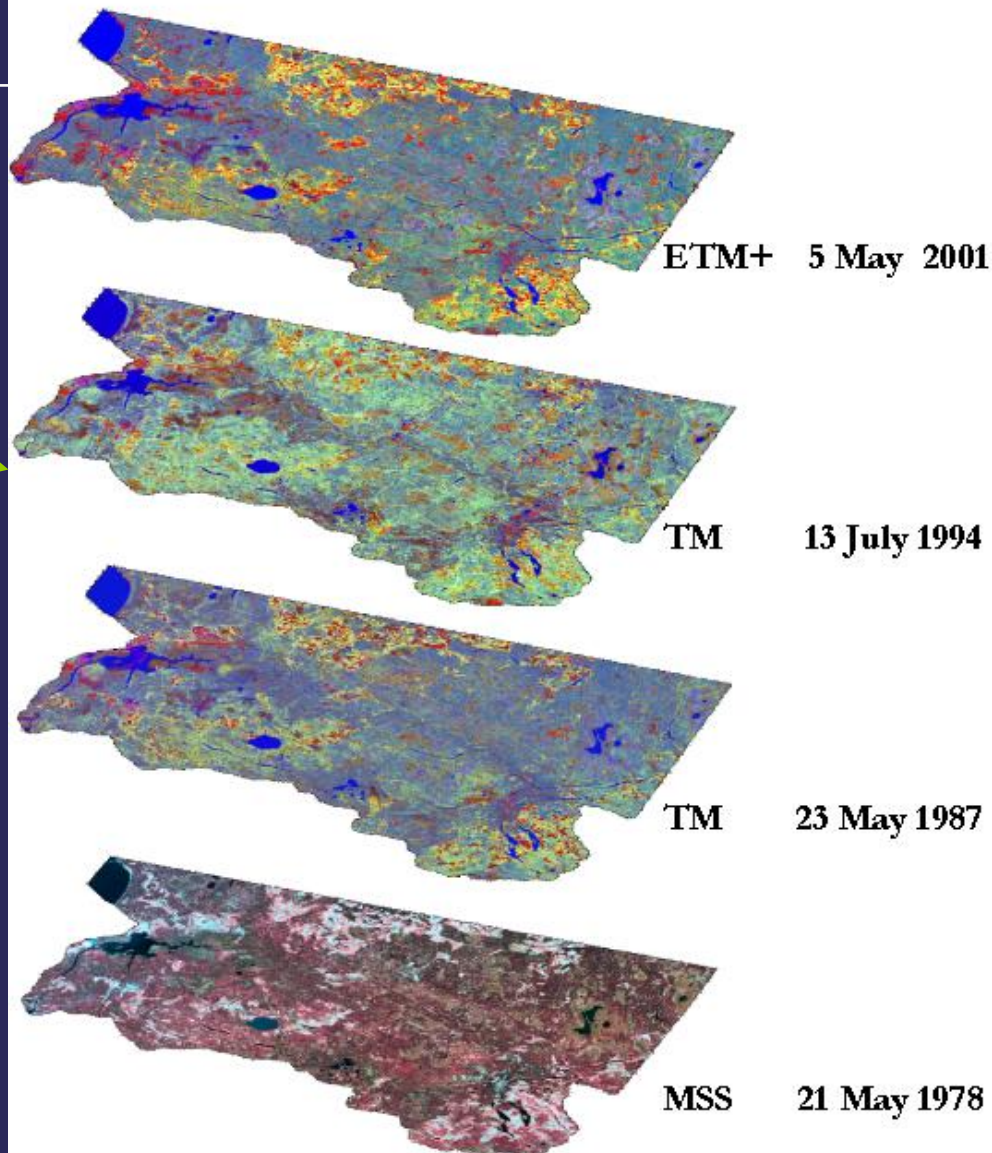
Timber harvest



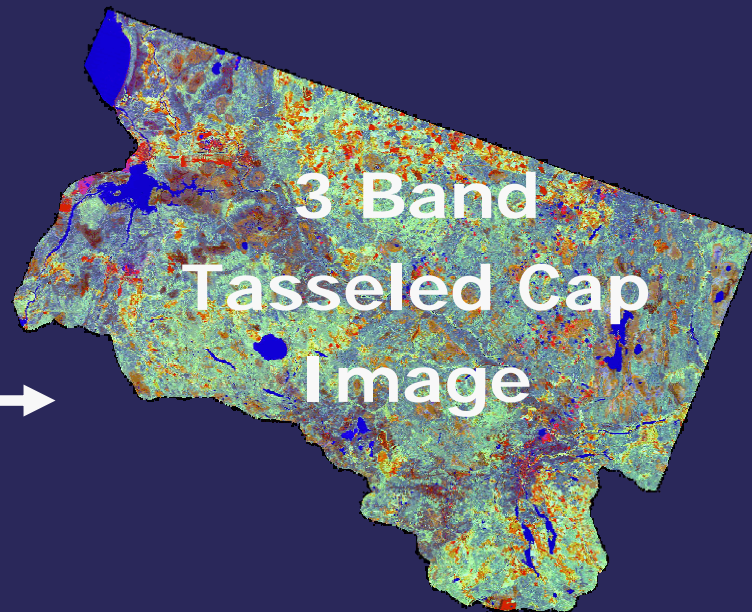


Стопка из 3-4
разновременных
СНИМКОВ

Landsat imagery (path 185 row 19)
used in change detection

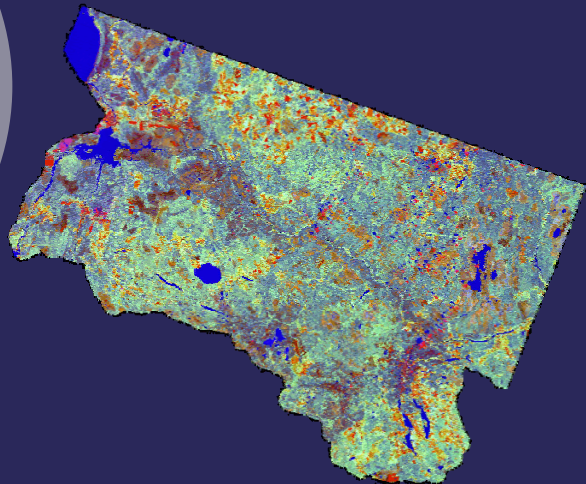


Преобразование многоканального снимка в 3-х канальный



Tasseled cap (TC) indices of brightness, greenness and wetness (яркость, зеленость, влажность)

Индекс нарушенности лесного покрова



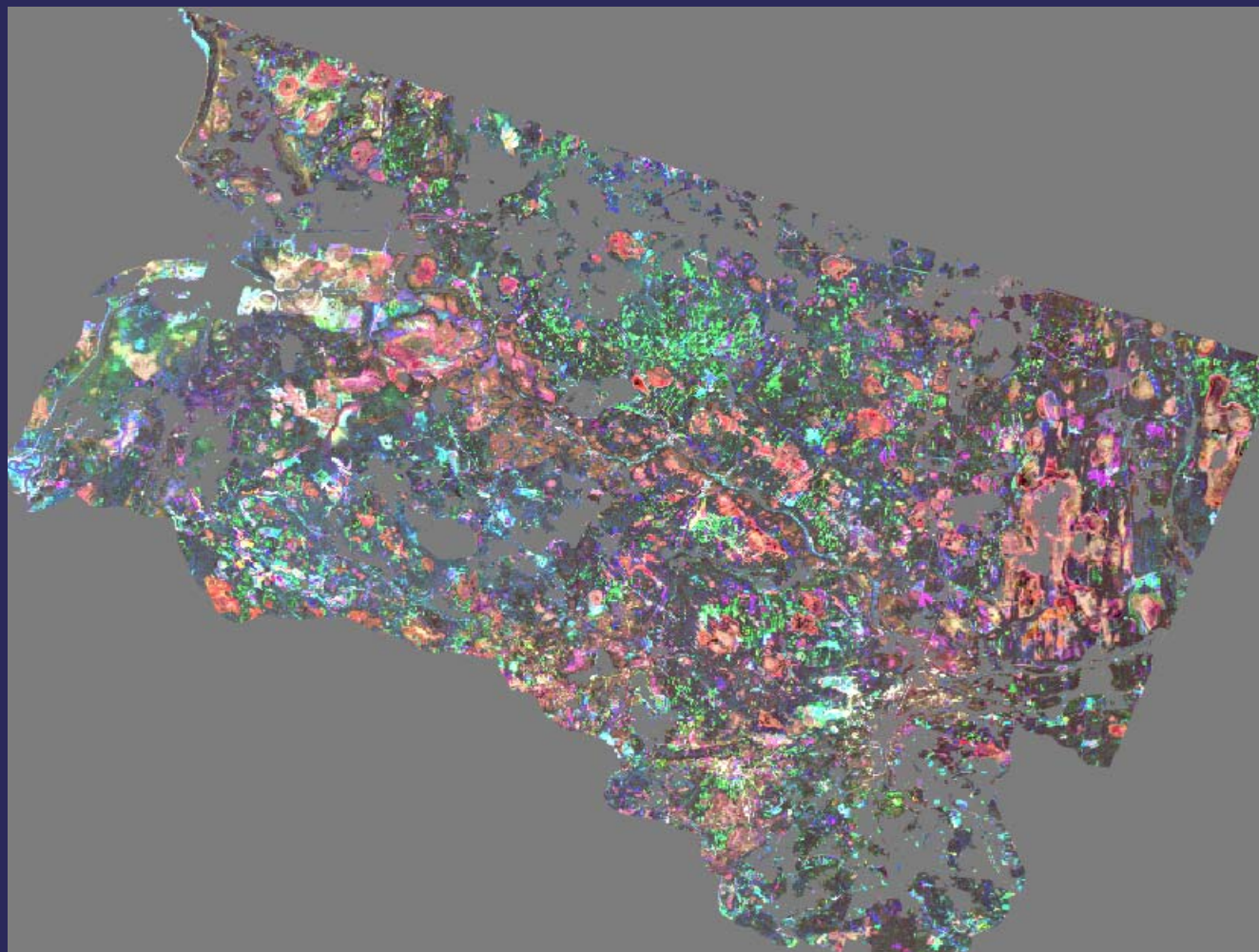
**3 Band
Tasseled Cap
Image**



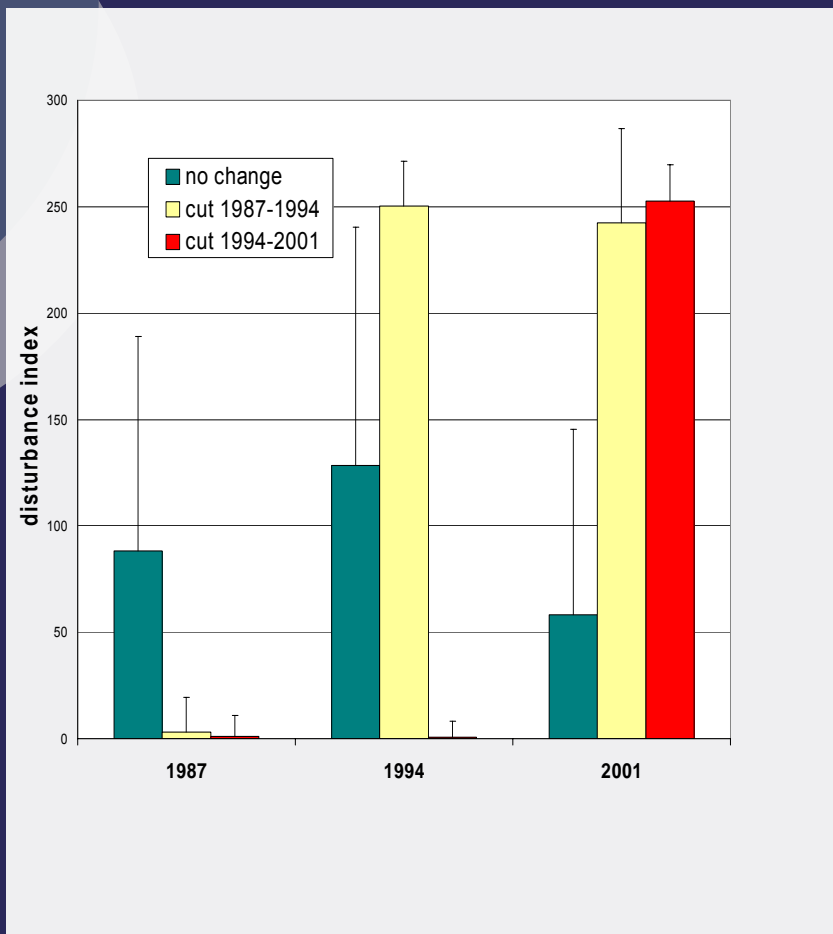
$$\text{Disturbance Index} = \text{Brightness} - (\text{Greenness} + \text{Wetness})$$

На участках с недавно нарушенным лесным покровом высокое значение индекса яркости, а значения индексов зелени и влажности - низкие.

Единый слой нарушенности лесного покрова за период 1975-2001

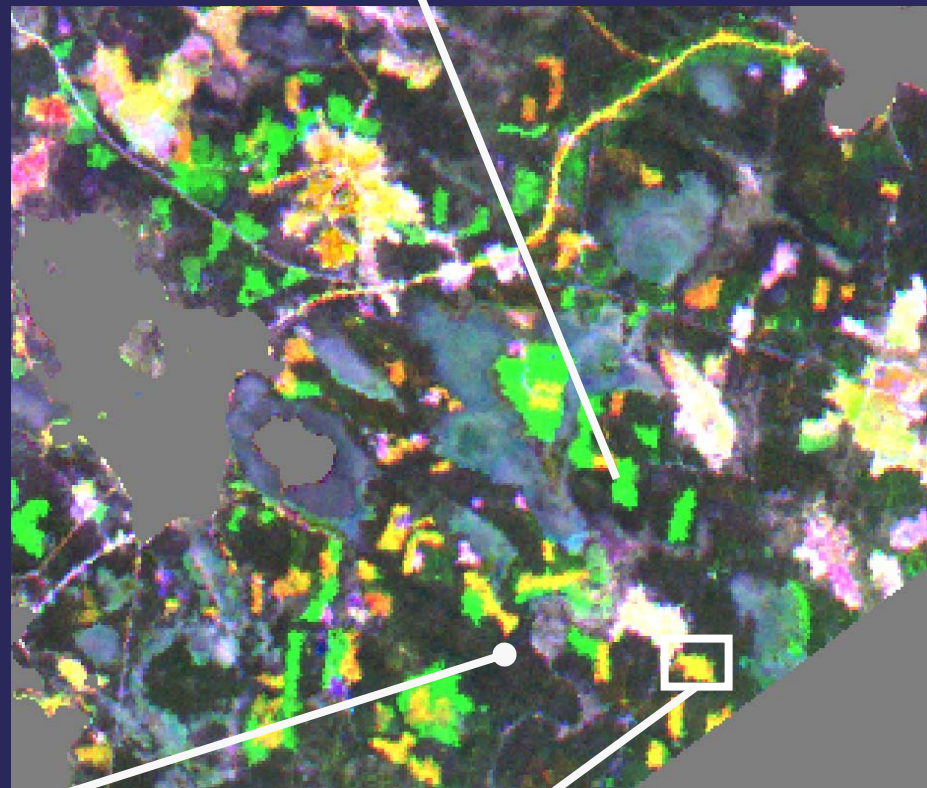


Выделение ненарушенных участков и классификация нарушенных по временным интервалам

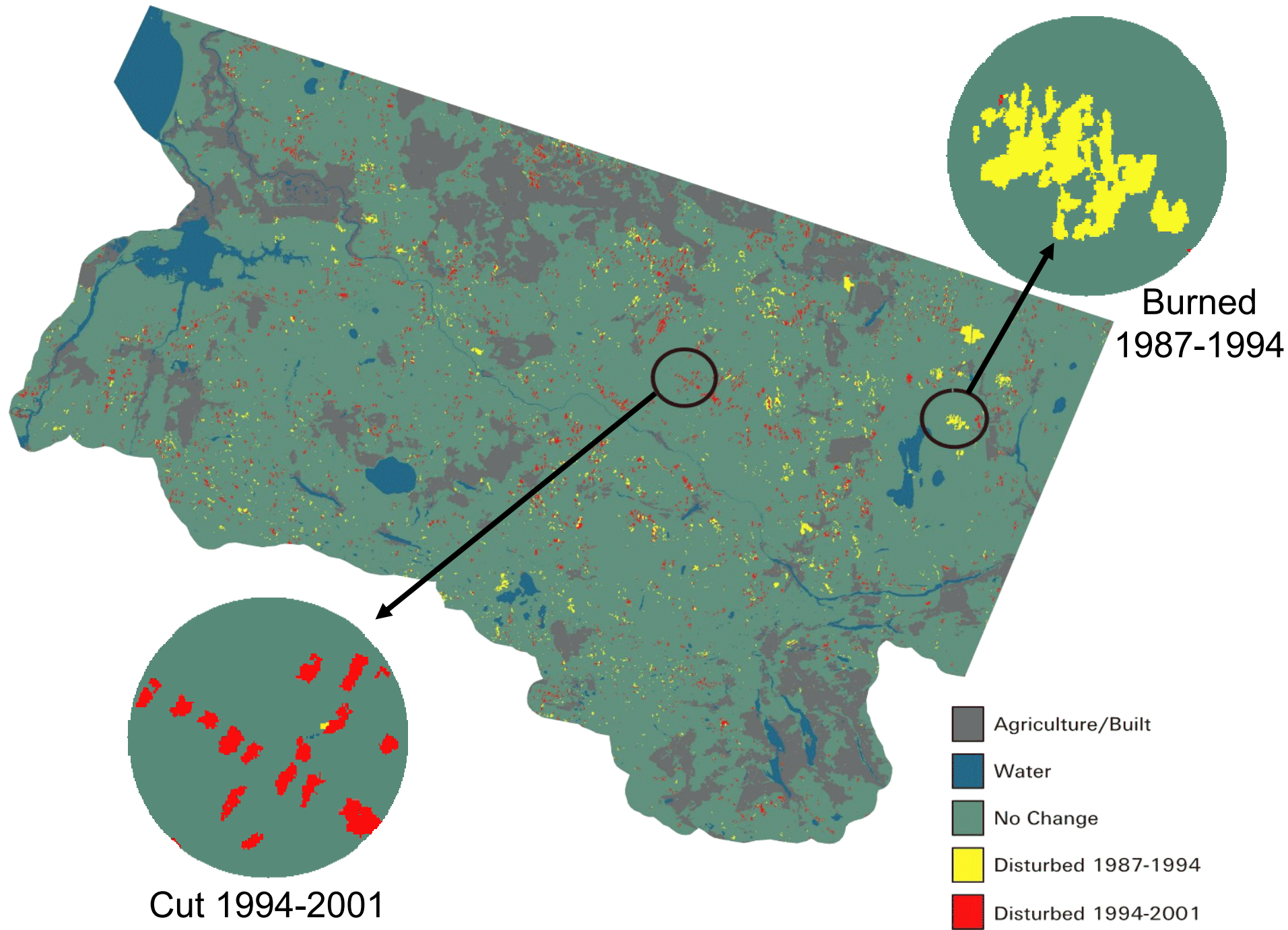


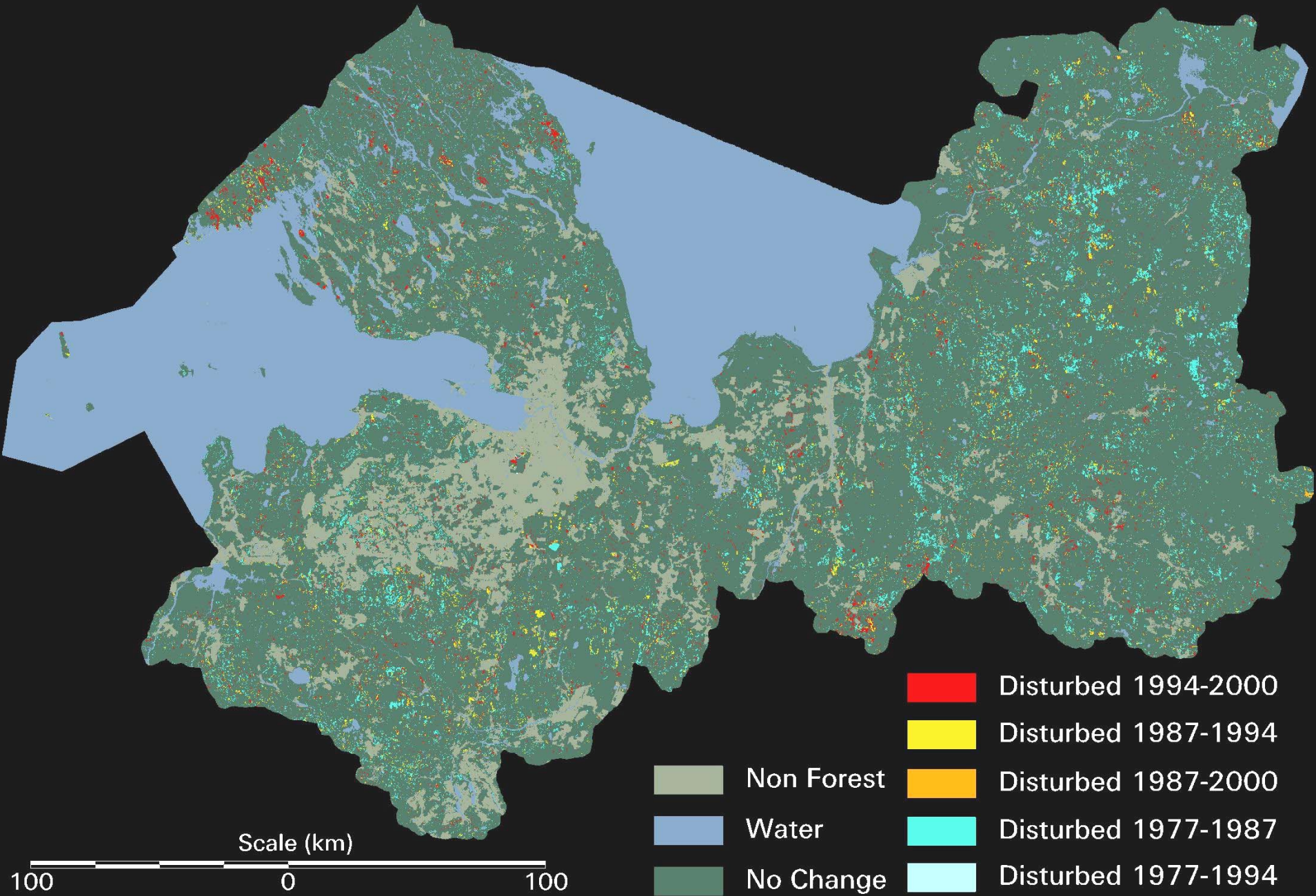
Undisturbed

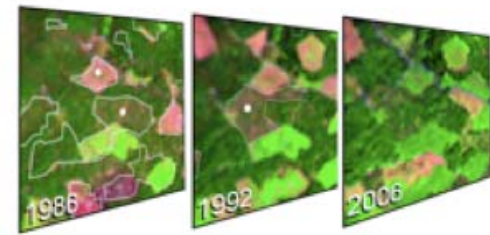
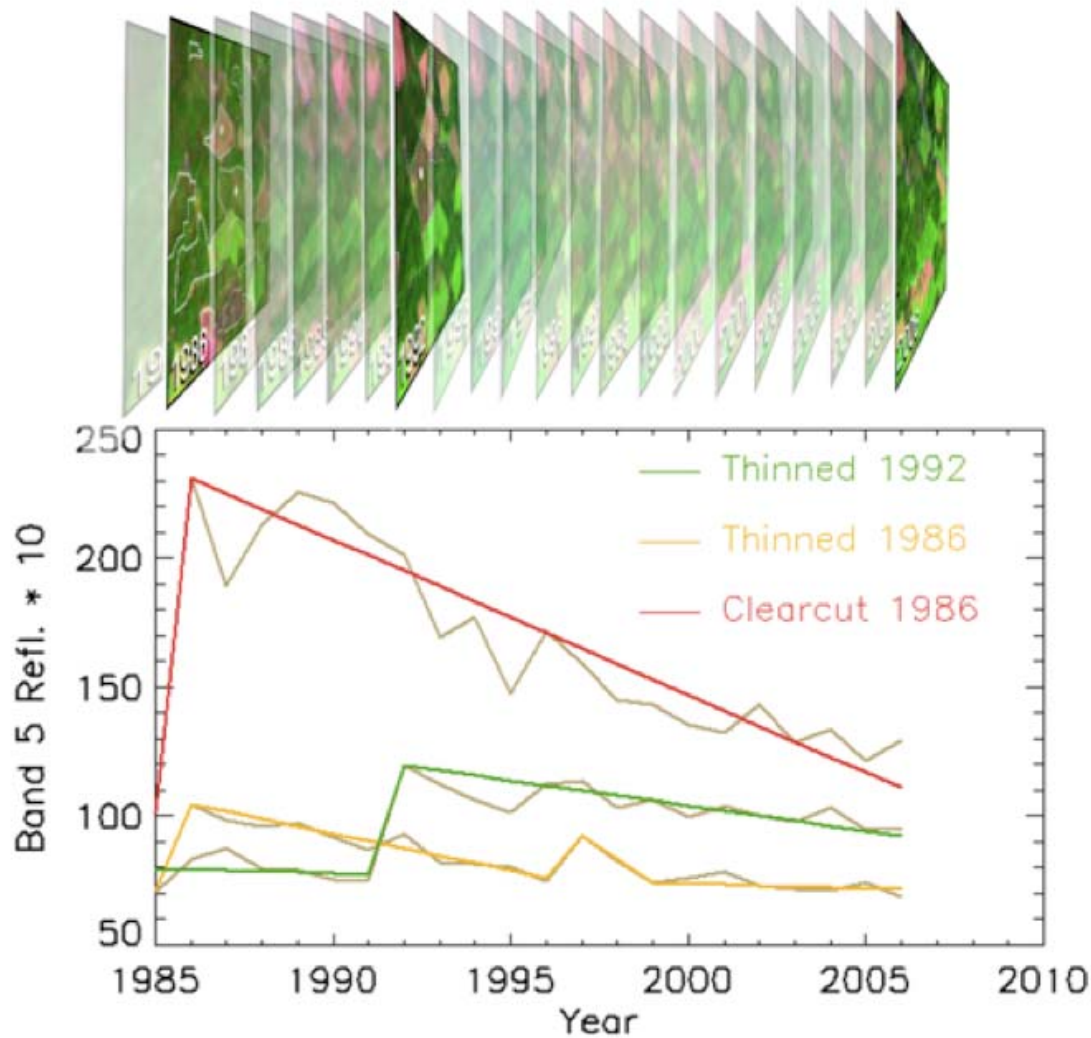
Cut 1994-2001



Cut 1987-1994



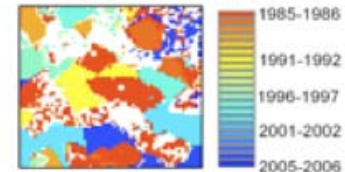




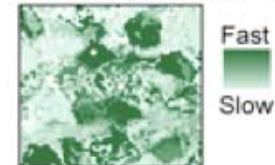
Disturbance intensity



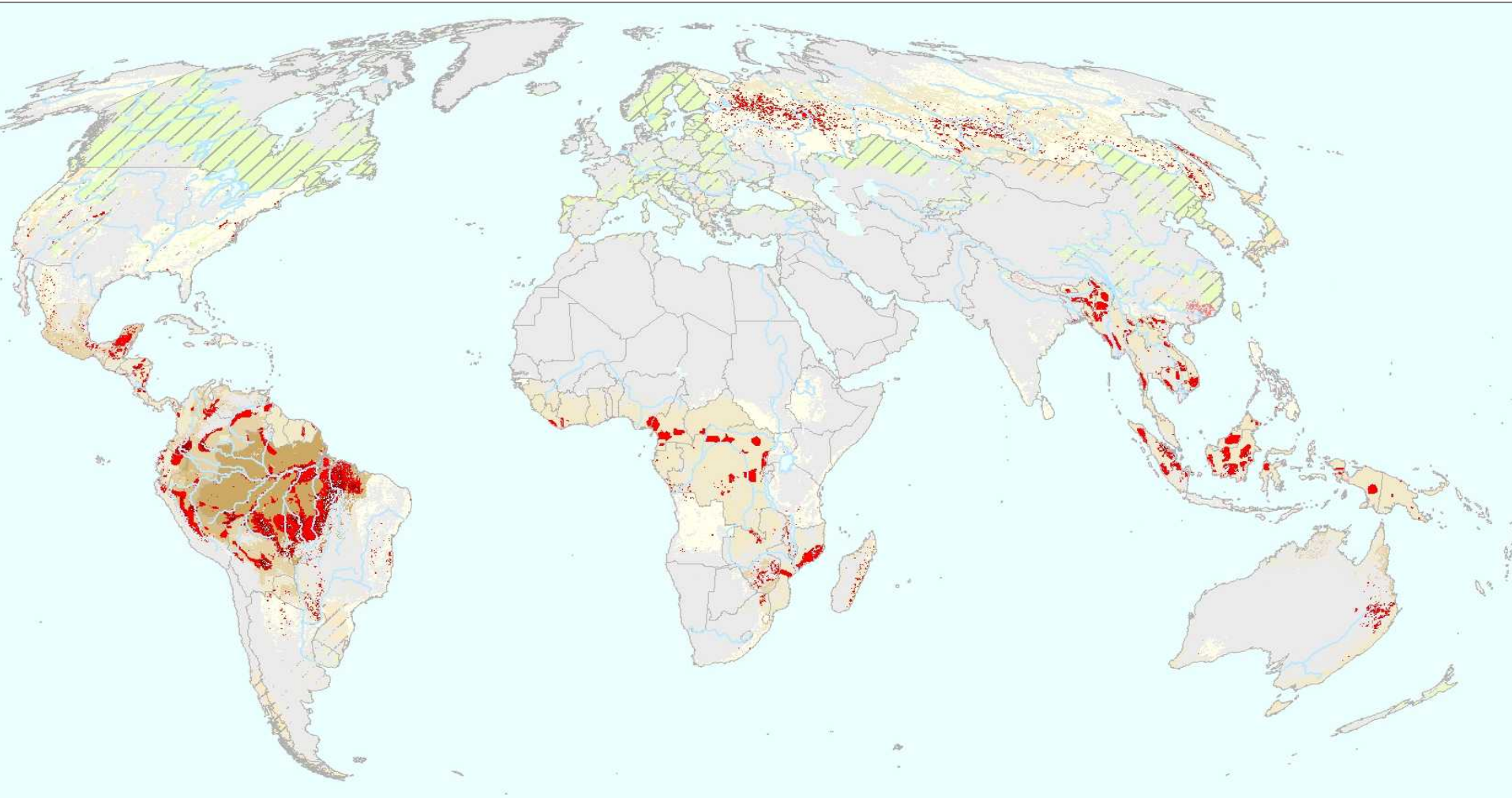
Disturbance interval



Revegetation rate

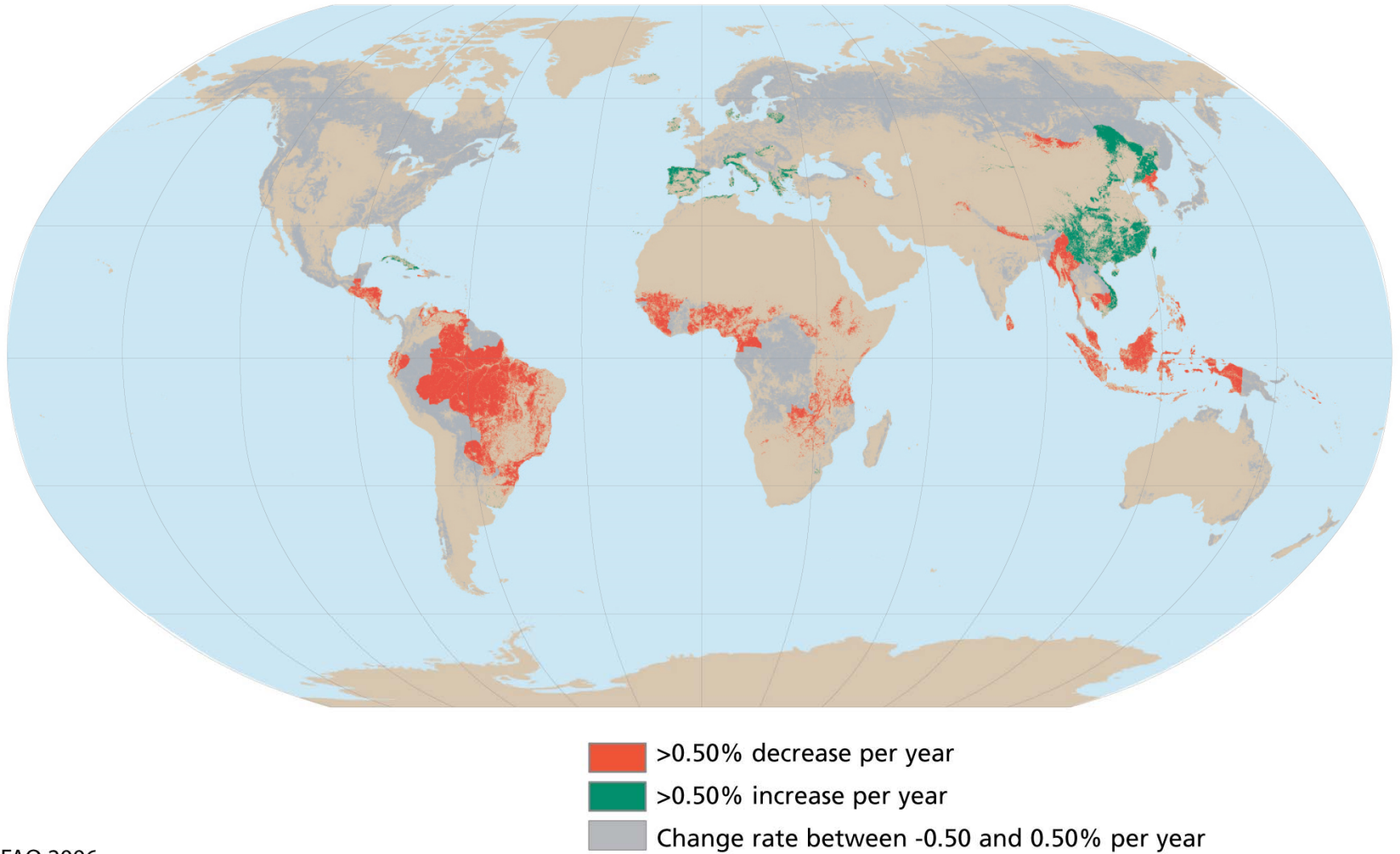


LandTrendr algorithms segment time-series of yearly Landsat TM data to characterize both long-term trends and abrupt events (disturbances).
Source: Robert Kennedy et al. 2007

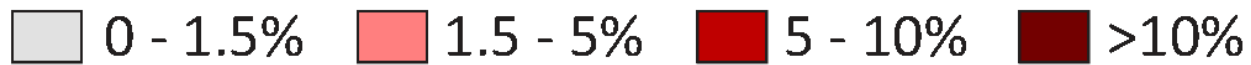
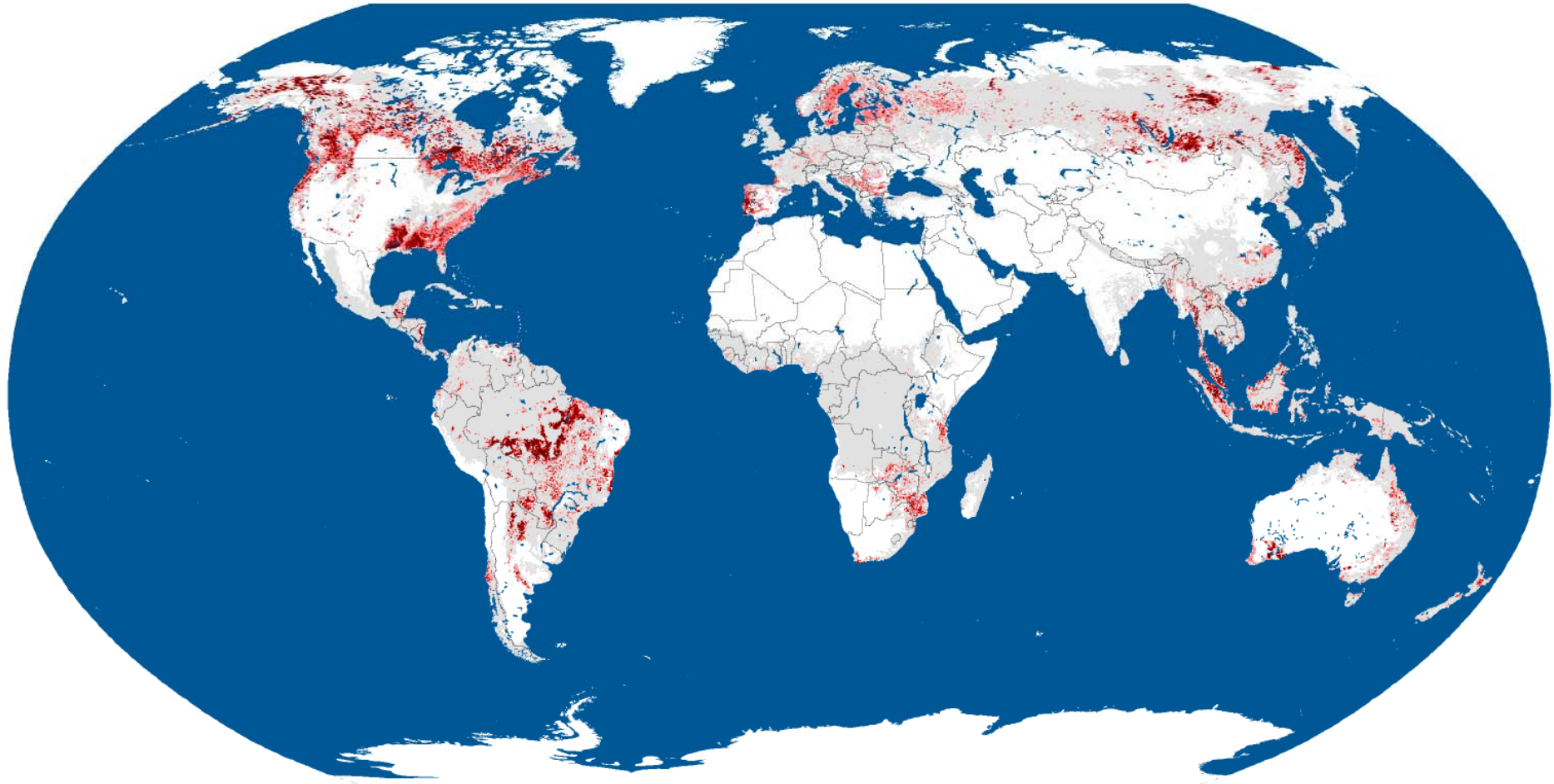


E. Lepers, E. F. Lambin, A. C. Janetos, R. DeFries, F. Achard, N. Ramankutty and R. J. Scholes, 2005. A Synthesis of Rapid Land-Cover Change Information for the 1981-2000 period. *BioScience* 2(55): 115-124.

Countries with large net changes in forest area 2000–2005



Percent forest cover loss, 2000 to 2005



Take home messages

- Satellite Observations present new opportunities
 - Extracting information from data is a challenge
 - Grand challenge for the new generation of map-makers
- Remote sensing is the new frontier in geography
 - And the Wild West ...
- We know less about LC than we tend to think
 - Improved knowledge is critical

Thank you! Спасибо!

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- Garik Gutman, NASA

