

# Mapping forest intactness / degradation: the map analysis of pilot sites in Andasibe, Ranomafana and Manombo

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# **Why to measure forest intactness / degradation?**

- The forest biodiversity is sensitive to human influence and depends on the level of the forest transformation
- So, the intactness of forest is important for decision-making on conservation priorities
- Forest transformation/degradation map is required for better understanding the transformation reasons and making decisions for more sustainable landuse

# How to measure the level of forest intactness / degradation?

- Such a measuring is a technically challenging task as the “intactness” is not directly visible in satellite images and other spatial datasets
- The most of existing maps do not take the degradation level too much into account – mapping primarily forest cover changes or general, climate-dependent forest types

# Assumptions

1. Forest degradation influences the forest canopy structure
2. More degraded forests usually have more simple canopy structure - while more intact forests have more complex canopy structure formed by trees of diverse sizes (*at least so for humid evergreen tropical forests, also proven for a number of types of boreal and temperate forests of Eurasia*)
3. This structure reflected in satellite images - texture characteristics and a spectral response

# Assumptions

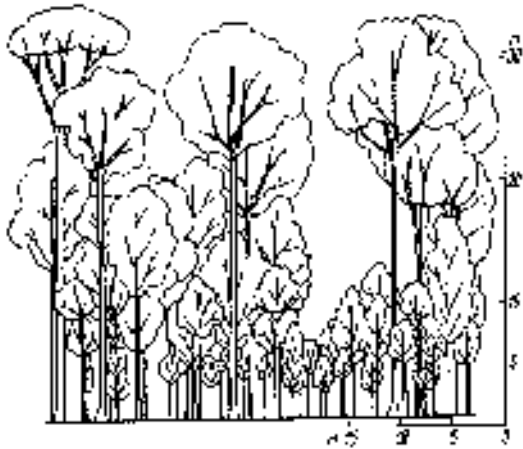
- Intact / old-growth forests usually have the more than 1 layer of closed canopy (Multi-layer - ML)
- Degraded / secondary forests have a single layer of closed canopy (Single-layer - SL)
- Intact forests may have a simple canopy structure (single layer) only in specific habitats or landscape positions (SL "on top of ridges")

# Simple forest canopy structure classification

A. Multi-layer (ML)

B. Single layer with big trees (SL BT)

C. Single layer (SL)



**A**



**B**



**C**

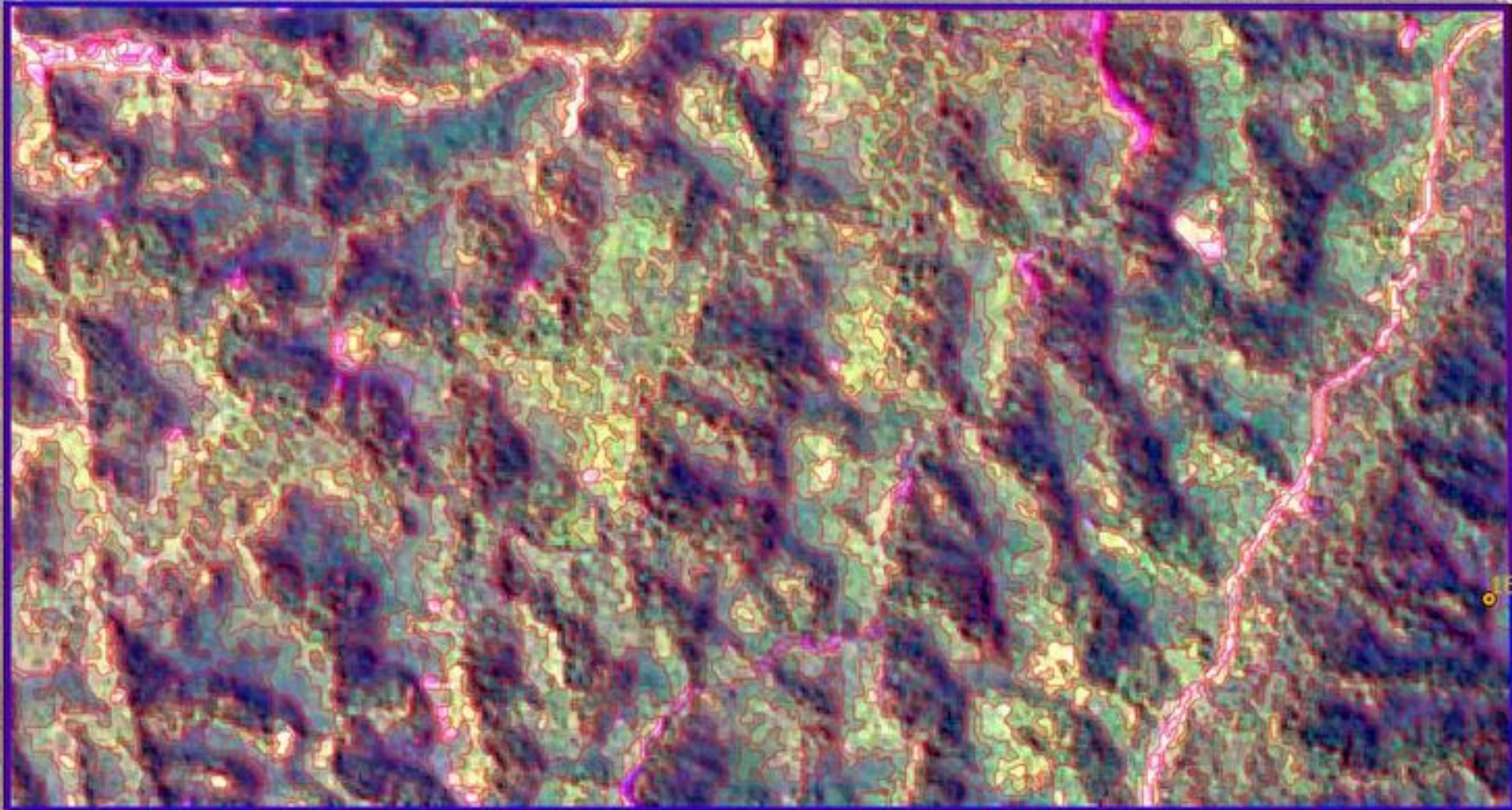
# How to measure it?

## The idea

- Using SPOT-5 (also SPOT-6/7 in the future) panchromatic channel (detailed enough to detect single trees crowns and canopy irregularities)
- Mapping tree crown shadows marking irregularities in the canopy (a kind of “reversed” single trees crown mapping method)
- Calculating density of shadows and classifying forest stands polygons on this base

# Algorithm details

Segmentation by SPOT spectral channels  
(spatial resolution – 10 m; min. area – 50 pixels)



Координаты:

226468,7921119

Масштаб

1:16 793

Отрисовка

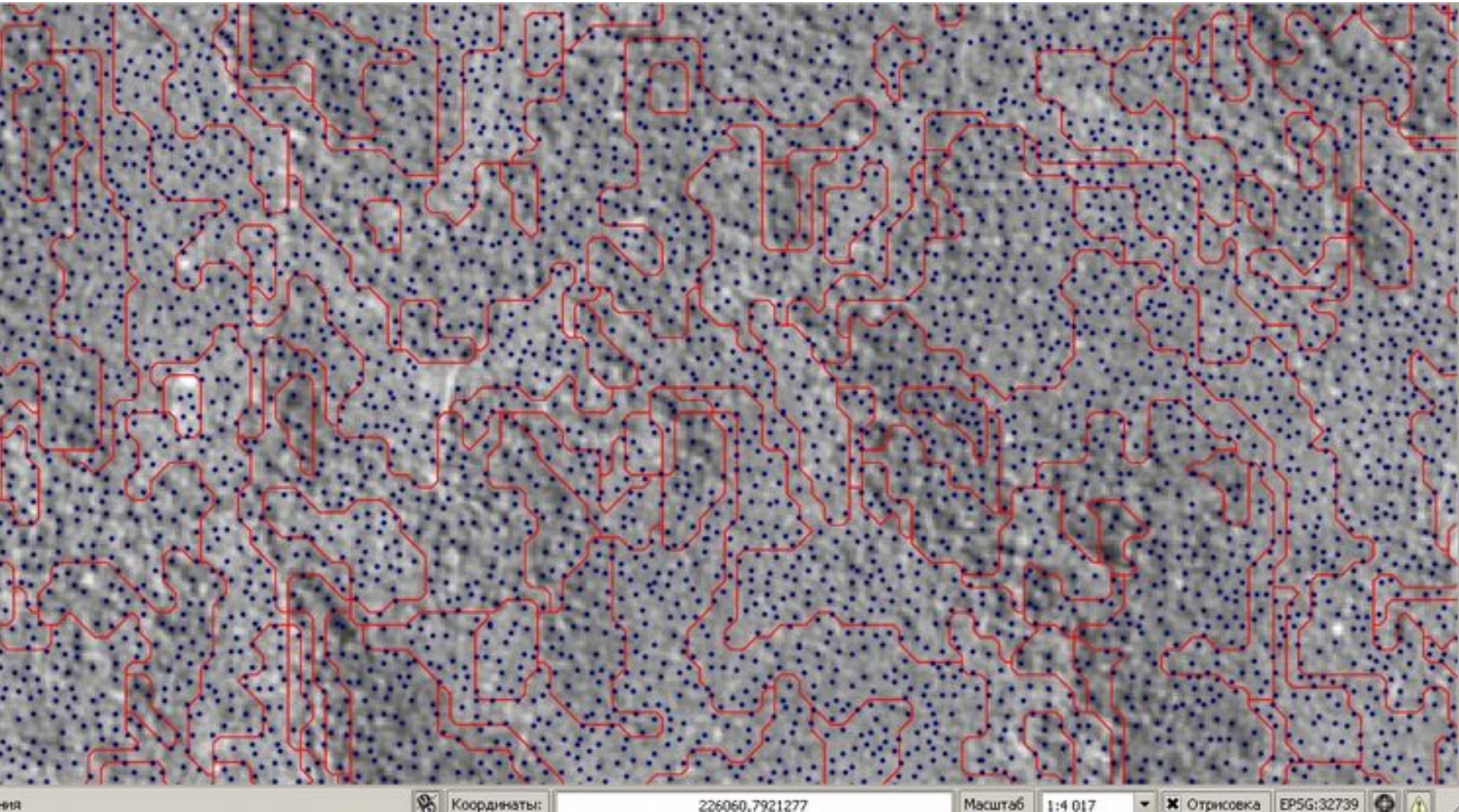
EPSG:32739





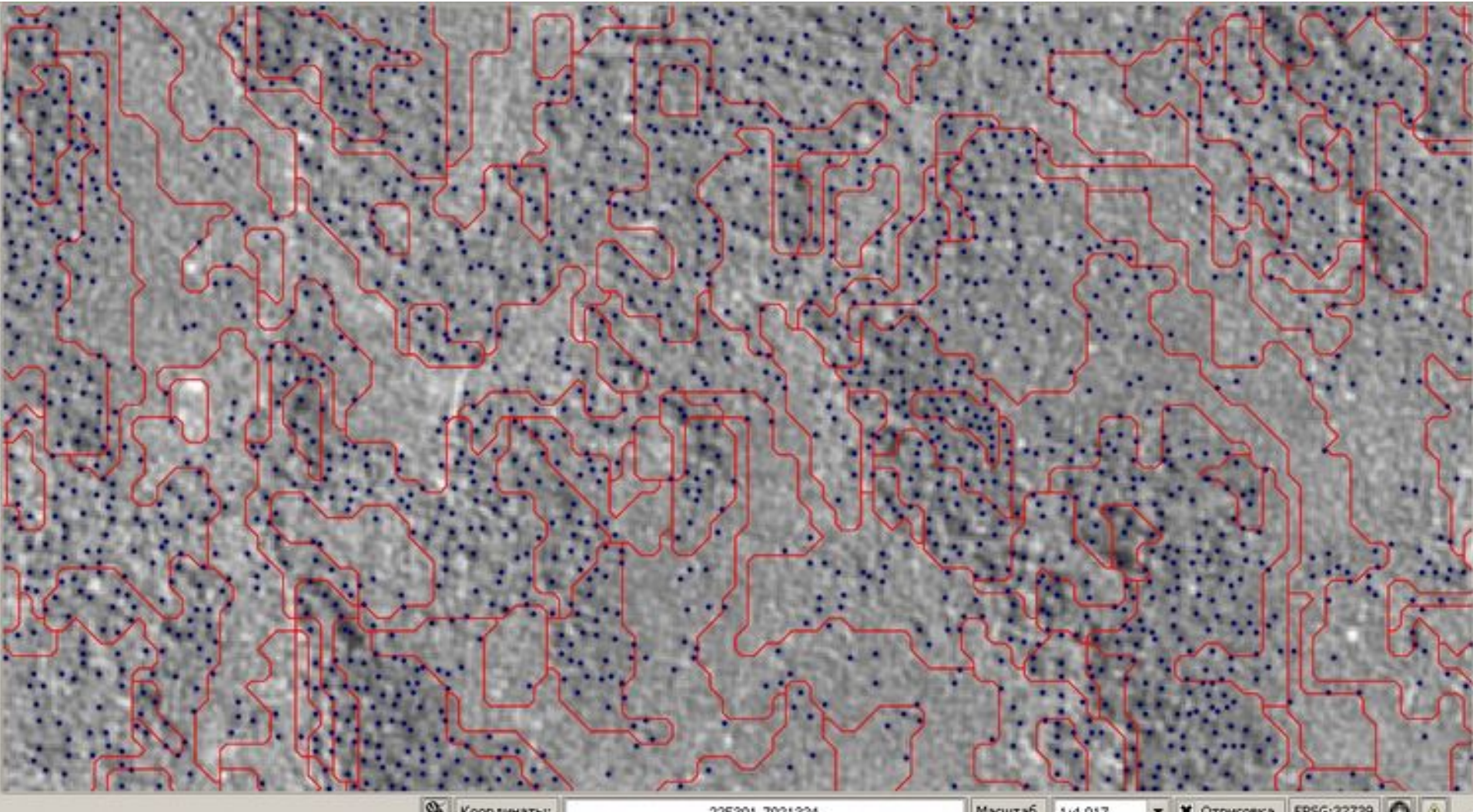
# Algorithm details

Calculating local minimum reflections pixels in SPOT panchromatic channel (resolution - 2.5 m; window - 5x5 pixels)



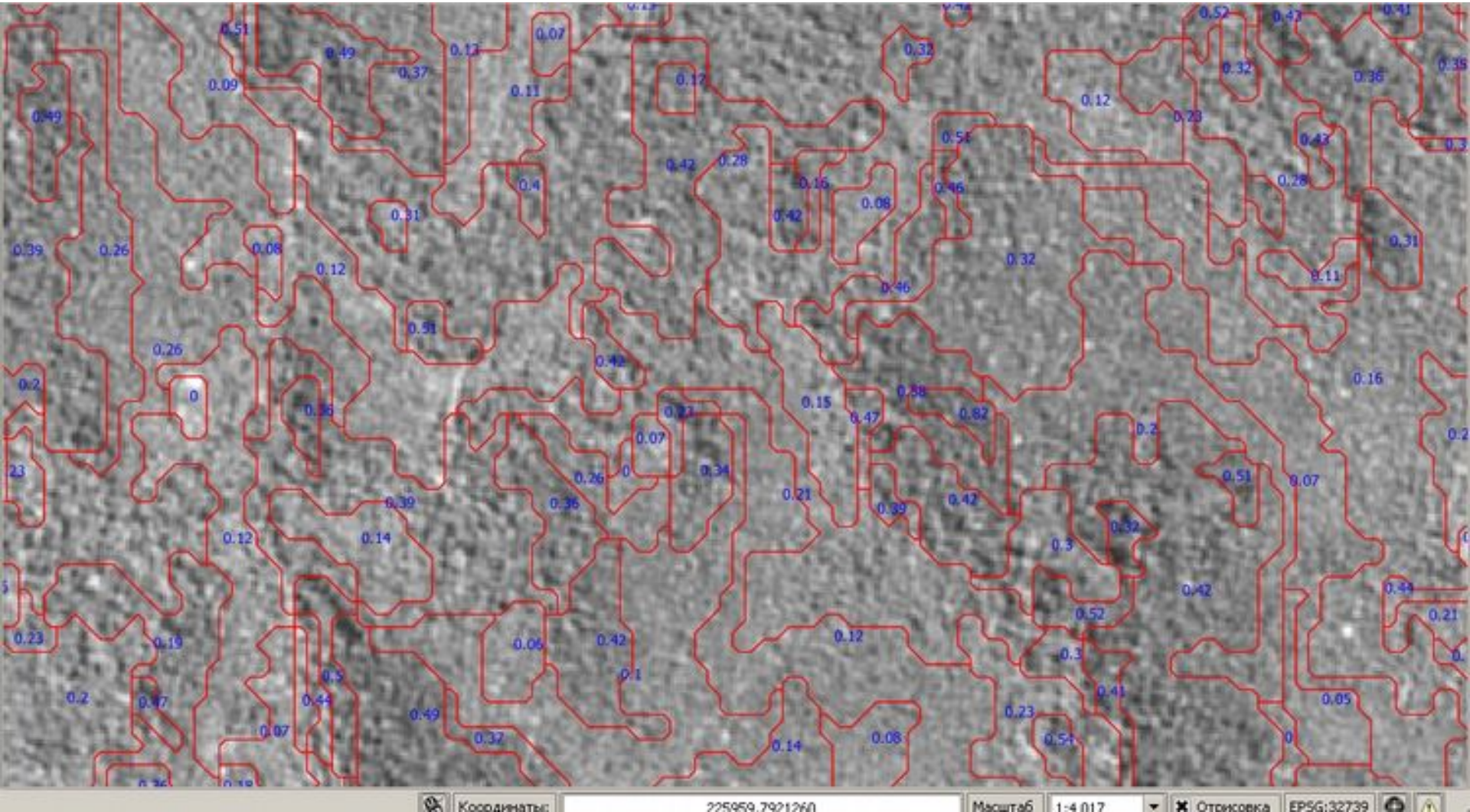
# Algorithm details

Selecting canopy shadows of different size - local minimum pixels  
with the reflection below 60-80 DN



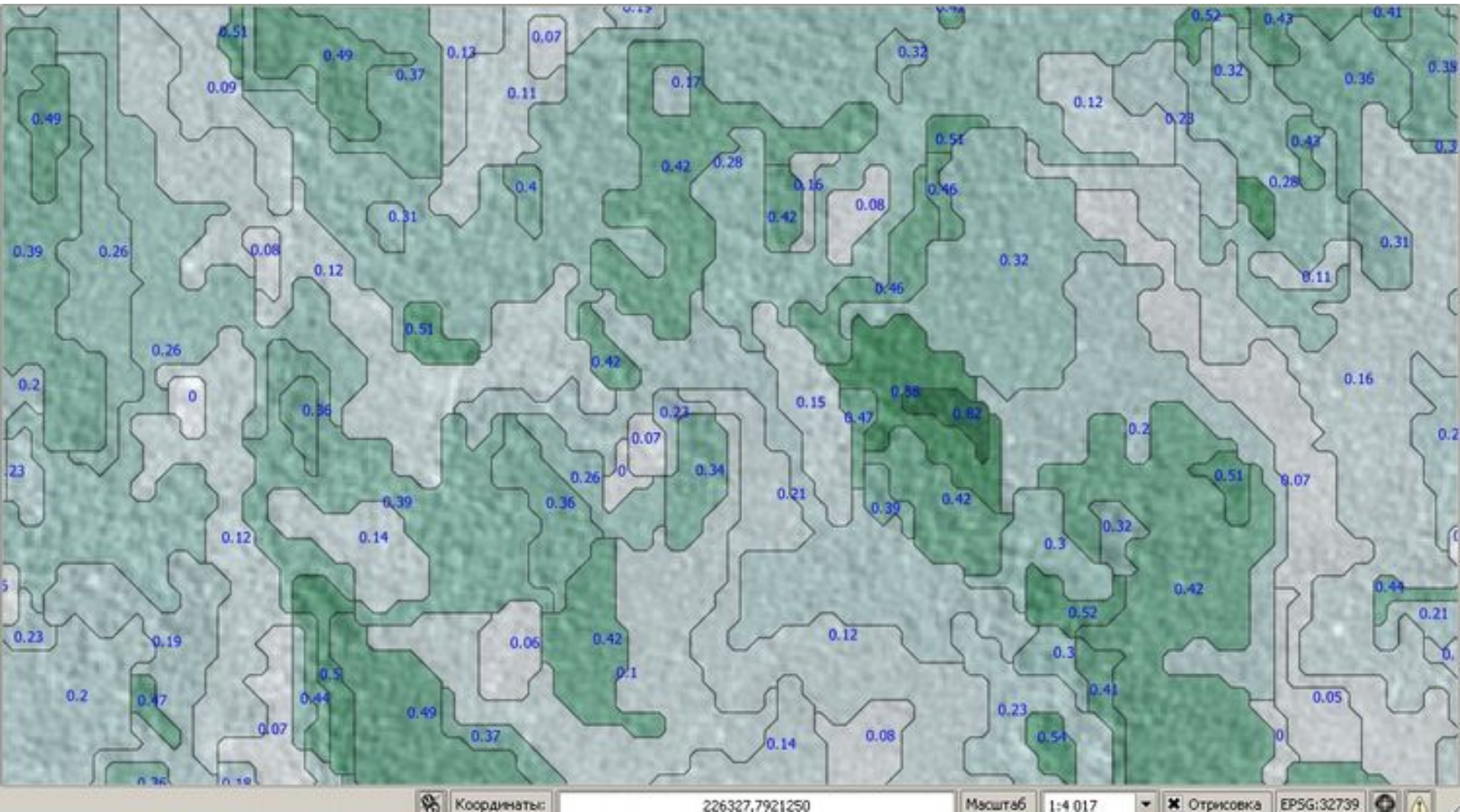
# Algorithm details

Calculate density of shadow – counting the pixels for each polygon/area, (shadow pixels number / area of a polygons \* 100)



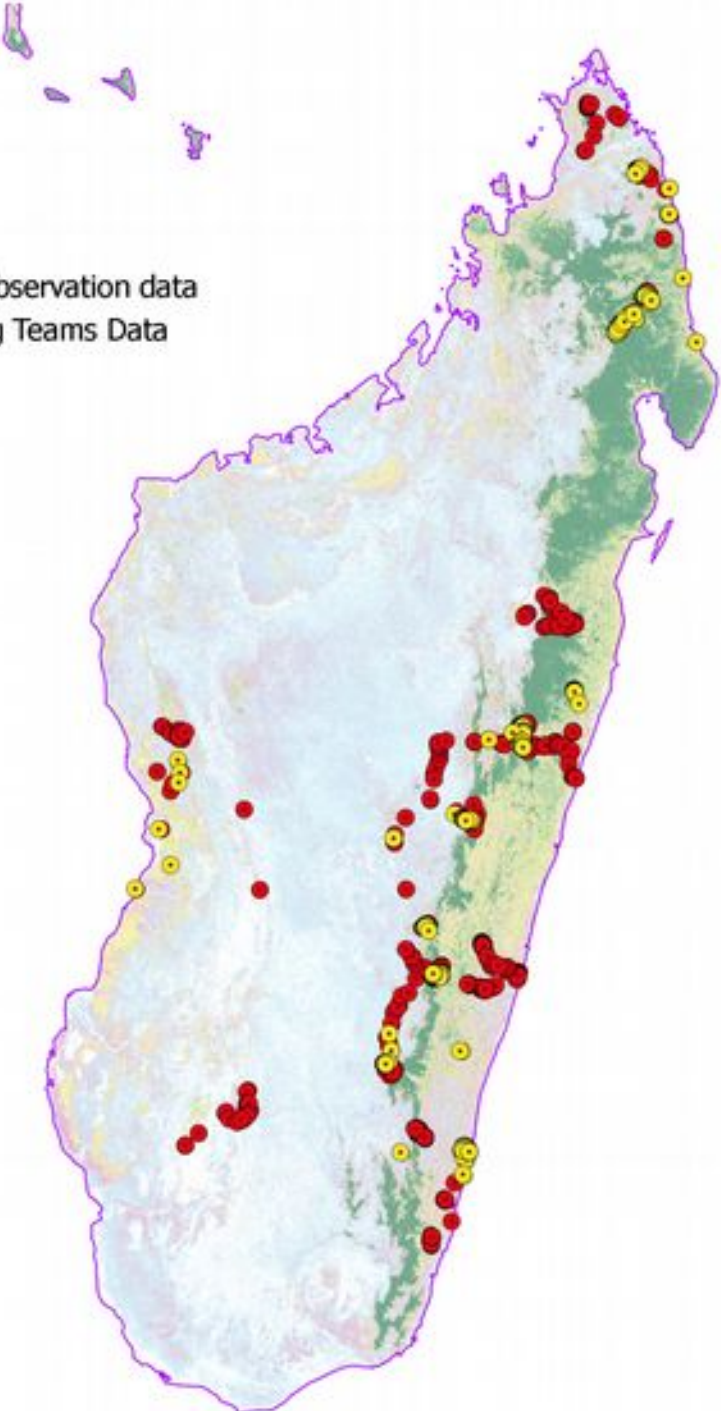
# Algorithm details

Maps of forest structure complexity based on density of shadows



# The classification based on the canopy complexity measurement

- Shadows density below 0.1 – **Non-forests**
- Shadows density 0.1-0.2 – **Single layer (SL) forests**
- Shadows density 0.2-0.3 – **Single layer forests with big trees (SL BT)**
- Shadows density over 0.3 – **Multi-layer (ML) forests**

- 
- Fields observation data
  - Mapping Teams Data

Field surveys of various forests in eastern Madagascar by Malagasy colleagues from local associations and by joint Malagasy-FANCI-TW teams

*The field observations proved that the canopy complexity alone does not reflect the whole diversity of human-made and natural disturbances.*

**Both, Malagasy and international experts, concluded that canopy coverage is another important indicator.**





Multi-layer forest  
with closed canopy,  
Mantadia National  
Park





Multi-layer forests with canopy gaps,  
Andringitra National Park



Multi-layer forest with large canopy gaps,  
Andringitra National Park

# **Extending the classification -**

## **taking canopy coverage into account**

**(percentages are indicative only and require field measurements for verification -**

**the coverage has been visually identified with high-resolution images)**

- High coverage canopy (over 70% coverage ??)
- Medium coverage canopy (40-70% ??)
- Low coverage canopy (20-40% ??)
- Very low coverage canopy (below 20% ?? - non-forest)

# Forest degradation classes scheme

Canopy coverage				
<b>High</b>	<b>Bush lands &amp; woodlands</b>	<b>SL closed</b>	<b>-- (not found yet)</b>	<b>ML closed</b>
<b>Medium</b>	<b>Transition from grasslands to bush lands</b>	<b>SL sparse</b>	<b>SL with big trees</b>	<b>ML with gaps</b>
<b>Low</b>				<b>ML with large gaps</b>
<b>Very low</b>	<b>Grasslands &amp; bare ground</b>	<b>--</b>	<b>--</b>	<b>--</b>
	<b>Non-forest</b>	<b>Single layer</b>	<b>SL with big trees</b>	<b>Multilayer</b>
	<b>Canopy structure complexity</b>			

# What real forests are in these classes?

Canopy coverage	Non-forest	Single layer	SL with big trees	Multilayer
<b>High</b>	<p><b>Bush lands</b>  <b>Invasive species thickets</b>  <b>Native pioneer species thickets</b></p>	<p><b>Secondary forests with native species</b>  <b>Closed eucalyptus &amp; pine plantations</b></p>	--	<b>Closed intact forests on slopes</b>
<b>Medium</b>	<p><b>Early stages of forest restoration</b>  <b>Mosaic of fields, grazing areas and introduced species</b></p>	<p><b>Secondary forests with serious recent disturbance</b></p>	<b>Intact sparse forests on tops of ridges</b>	<p><b>Intact forest in lower slopes &amp; river valleys</b>  <b>Some disturbed forests</b></p>
<b>Low</b>	<p><b>Ravenala in mixture with other trees &amp; bushes</b></p>	<p><b>Intact sparse forests at high altitude, usually on top of ridges</b></p>	<b>Slightly disturbed forests on slopes and valleys</b>	<p><b>Intact forests in valleys / affected by cyclones</b>  <b>Disturbed with zebu grazing / logging</b></p>
<b>Very low</b>	<p><b>Natural rocks</b>  <b>After tavy areas</b>  <b>Degraded lands</b></p>	--	--	--

# Other characteristics also should be taken into account - like the altitude and the location in the relief

Sparse SL

```
graph LR; A[Sparse SL] --- B[...are natural in tops of ridges at high altitude]; A --- C[...indicate a high level of human transformation in valleys and lower slopes]
```

...are natural in tops of ridges at high altitude

...indicate a high level of human transformation in valleys and lower slopes

# **SPOT spectral channels could also help separating native trees forests from introduced tree species planted, as well as various forest types**

SL closed

```
graph LR; A[SL closed] --- B[SL forests by native species]; A --- C[Eucalyptus plantations]; A --- D[Pine plantations]; E[SL with big trees] --- F["Mountain forests (Andasibe, Ranomafana)"]; E --- G["Low-land forests (Manombo)"]; E --- H[Littoral forests];
```

SL forests by native species

Eucalyptus plantations

Pine plantations

SL with big trees

Mountain forests (Andasibe, Ranomafana)

Low-land forests (Manombo)

Littoral forests

# The final classification scheme

Canopy coverage	Non-forest	Single layer	SL with big trees	Multilayer
<b>High</b>	<p>4.1a. Savoka &amp; Savoka with single trees</p> <p>4.1b. Pure bamboo thickets - ??</p> <p>4.1c. Pure ravenala thickets - ??</p> <p>4.1d. Filippia thickets - ??</p>	<p>3.1a. SL closed - mountain forests</p> <p>3.1b. SL closed - lowland forests</p> <p>3.1c. SL closed - littoral forests</p> <p>3.1d. - Eucalyptus plantations</p> <p>3.1e. - Pine plantations</p>	-- (not found yet)	<b>1.1. ML closed</b>
<b>Medium</b>	<p>4.2. Mosaic of ramarasana, crops, savoka &amp; woodlands</p>	<p>3.2a. SL sparse - high altitude forests</p> <p>3.2b. SL sparse - slopes &amp; valleys</p>	<p>2.1a. SL with big trees - top of ridges forests</p>	<b>1.2. ML with gaps</b>
<b>Low</b>			<p>2.1b. SL with big trees - lowland forests</p> <p>2.1c. SL with big trees - littoral forests</p>	<b>1.3. ML with large gaps</b>
<b>Very low</b>	<p>4.3a. Bare ground</p> <p>4.3b. Ramarasana</p> <p>4.3c. Roranga</p>	--	--	--



# The final list of classes

Class No	Class Name	Canopy complexity	Canopy density	Spectral features 4-1-3 channels	Location in the landscape	Real ecosystems included
1.1	ML closed	> 0.3	high	Dark-green	Slope	Intact humid forest
1.2	ML with gaps	> 0.3	medium	Dark-green to bright-yellow-green	Valley, Lower slope	Intact humid forest
1.3	ML with large gaps	> 0.3	low	Bright-yellow-green	Valley	Humid forest with cyclone dynamic or slightly selectively logged
2.1a	SL with BT on tops	0.2-0.3	med.-low	Blue-green to grey-green	Top, upper slope	Intact forest on top of the ridge, could be selectively logged

# The final list of classes (continued)

Class No	Class Name	Canopy complexity	Canopy density	Spectral features 4-1-3 channels	Location in the landscape	Real ecosystems included
2.1b	SL with BT lowland	0.2-0.3	med.-low	Bright-light-green	Lower slope, valley	Most intact forest in lowlands
2.1c	SL with BT littoral	0.2-0.3	med.-low	Blue-green	Flat, valley	Most intact forest in lowlands
3.1a	SL closed mountain	0.1-0.2	high	Blue-green to grey	all	Heavy selectively logged or secondary forest after "tavy" in mountain region
3.1b	SL closed lowland	0.1-0.2	high	Bright-green	all	Secondary forest in lowlands with Ravenala

# The final list of classes (continued)

Class No	Class Name	Canopy complexity	Canopy density	Spectral features 4-1-3 channels	Location in the landscape	Real ecosystems included
3.1c	SL closed littoral	0.1-0.2	high	Blue-green	Flat, valley	Secondary forest
3.1d	Eucalyptus closed	0.1-0.2	high	Acid-green	all	Plantation
3.1e	Pine closed	0.1-0.2	high	Green to red-grey	Slope, top	Plantation
3.1f	Eucalyptus, Pine mixed with native	0.2-0.3	high	Dark-green to grey	all	Old plantations or forest on border with native
3.1g	Fruits plantation, gardens near villages, Ravenala in lowlands??	0.1-0.2	Medium, low	Bright yellow-green	flat	Plantation near settlements, Ravenala forests??

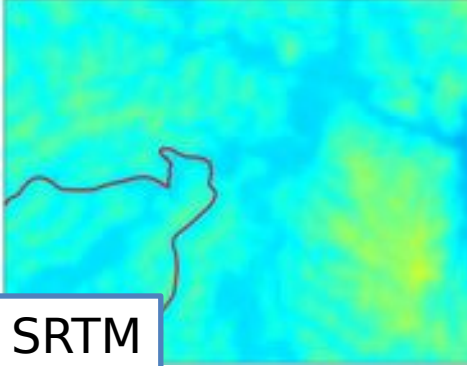

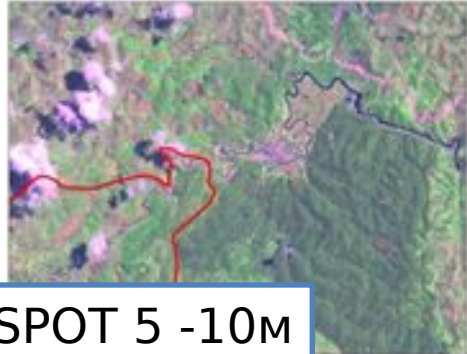
# The final list of classes (continued)

Class No	Class Name	Canopy complexity	Canopy density	Spectral features	Location in the landscape	Real ecosystems included
3.2a	SL sparse high altitude	0.1-0.2	med.-low	Grey - green with purple colors	tops, high altitude	Intact or cyclone affected forests on high altitude tops of ridges
3.2b	SL sparse on slopes/valleys	0.1-0.2	med.-low	Bright-yellow with bright green	slopes, valleys	Selectively logged or secondary valley forests
4.1a	Savoka	< 0.1	high	Bright yellow	all	Shrubland after disturbances
4.3a	Bare ground, fields	< 0.1	very low	Bright red to white	Slope, top	Tavy, rocks, crops
4.3b	Ramarasana	< 0.1	very low	Blue-white to bright light green	all	grasslands, shrubs

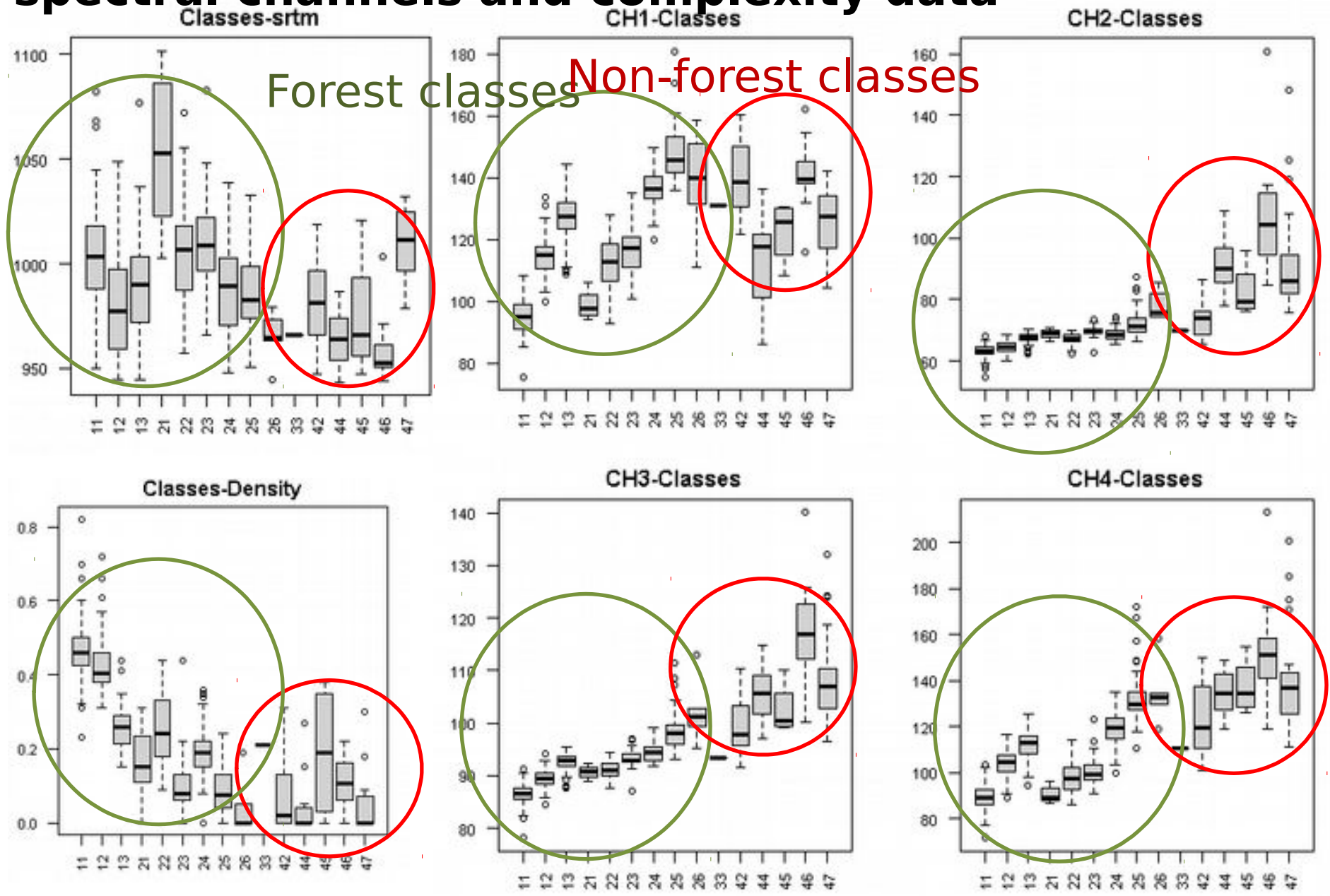
# The final list of classes (continued)

Class No	Class Name	Canopy complexity	Canopy density	Spectral features	Location in the landscape	Real ecosystems included
4.3c	Roranga	< 0.1	very low	Dark red	all	long-term grassland
4.1b	Bamboo thickets	< 0.1	high	Not selected yet	-	-
4.1c	Ravenala thickets	< 0.1	high	Not selected yet	-	-
4.1d	Filippia thickets	< 0.1	high	Not selected yet	-	-
4.2	Mosaic of crops, ramarasana, savoka	< 0.1	med.-low	Grey to red	all	

# Employing the Random Forests algorithm for classifying forest stands by all their parameters measured by DEM and SPOT images (using GRASS; R-randomForest; QGIS)

<b>STEP 1</b>	Segmentation of SPOT images by spectral channels, 10m resolution (GRASS GIS module i.segment with the following parameters: min area - 10 pixels, similarity threshold = 0.3 for spectral channels).	 SRTM
<b>STEP 2</b>	Adding main statistical parameters from spectral image channels and DEM data to each polygon: mean, standard deviation, minimum, maximum, range to each polygon; as well as canopy complexity data.	 SPOT 5 -2.5M
<b>STEP 3</b>	Creating educational set of data, using high-resolution image and field observation data as needed.	
<b>STEP 4</b>	Creating model using the advanced decision trees algorithm - R:randomForest. Estimate model of classification, data statistics for each class, inner model quality and errors.	 SPOT 5 -10M
<b>STEP 5</b>	Applying model to whole set of data and export result map (QGIS).	

# Analyzing all data together: importance of DEM, spectral channels and complexity data



# Example of model quality (ANDASIBE)

```
randomForest(formula = as.factor(test$CLASSID) ~ ., data = test
              Type of random forest: classification
              Number of trees: 10000
              No. of variables tried at each split: 10
```

OOB estimate of error rate: 29.02%

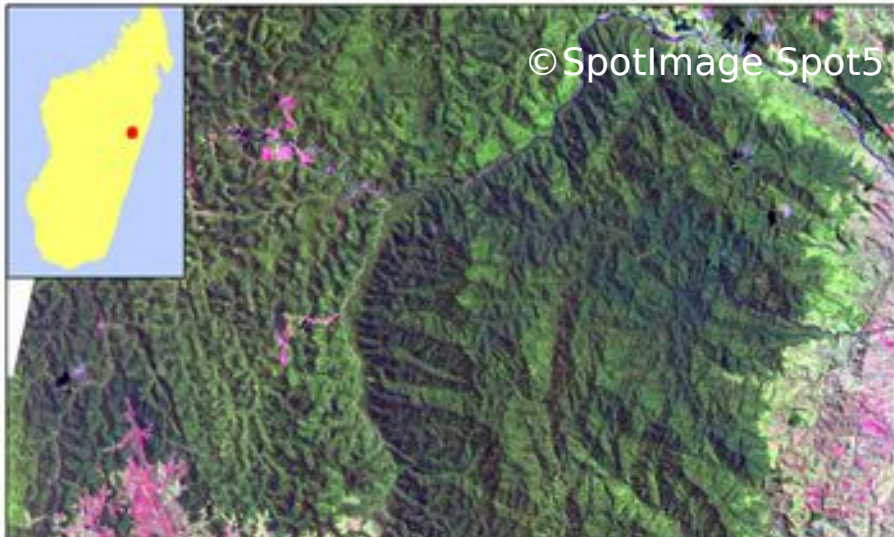
Confusion matrix:

	11	12	13	21	22	23	24	25	26	33	42	44	45	46	47	class.error
11	73	7	0	0	4	0	0	0	0	0	0	0	0	0	0	0.13095238
12	5	73	4	0	2	0	0	0	0	0	0	0	0	0	0	0.13095238
13	0	7	46	0	7	2	14	0	0	0	0	0	0	0	0	0.39473684
21	0	0	0	3	4	1	0	0	0	0	0	0	0	0	0	0.62500000
22	3	5	7	0	47	8	0	0	0	0	0	0	0	0	0	0.32857143
23	1	0	1	0	7	35	2	0	0	0	0	0	0	0	0	0.23913043
24	0	0	13	0	0	1	50	13	0	0	0	0	0	0	0	0.35064935
25	0	0	0	0	0	0	11	35	1	0	2	0	0	1	0	0.30000000
26	0	0	0	0	0	1	0	3	0	0	1	1	0	0	0	1.00000000
33	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	1.00000000
42	0	0	2	0	0	1	7	8	0	0	1	0	0	0	0	0.94736842
44	0	0	0	0	0	0	0	0	0	0	0	11	0	0	1	0.08333333
45	0	1	0	0	0	0	1	0	0	0	0	2	0	0	0	1.00000000
46	0	0	0	0	0	0	0	0	0	0	0	0	0	13	1	0.07142857
47	0	0	0	0	0	1	0	1	0	0	0	0	0	0	19	0.09523810

> |



# RESULTS: Mantadia

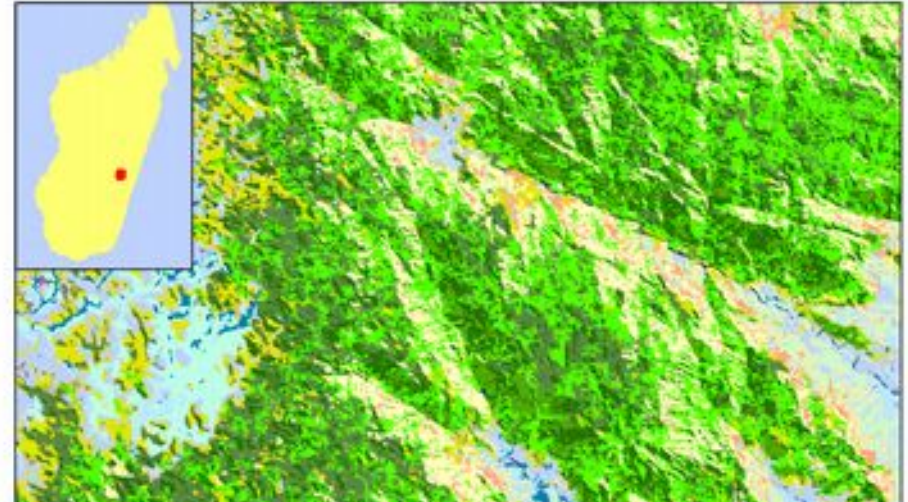
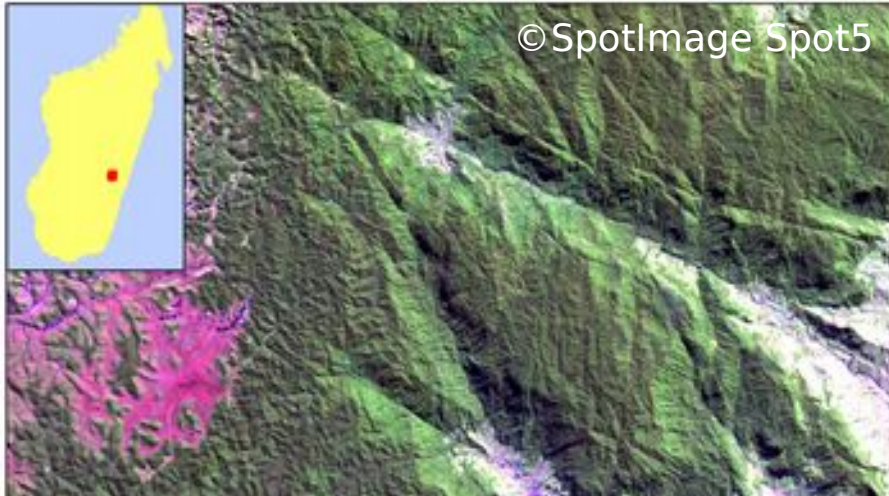


- 1.1 ML closed
- 1.2 ML with gaps
- 1.3 ML with large gaps
- 2.1a SL with BT on tops
- 2.1b SL with BT lowland
- 2.1c SL with BT littoral
- 3.1a SL closed mountain
- 3.1b SL closed lowland
- 3.1c SL closed littoral
- 3.1d Eucalyptus closed
- 3.1e Pine closed
- 3.1f Eucalyptus, Pine mixed with native
- 3.1g Ravenala??
- 3.2a SL spare high altitude
- 3.1j Fruits plantation, gardens near villages, mix Ravenala
- 4.1a Savoka
- 4.2 Mosaic of crops, ramarasana, savoka
- 4.3a Bare ground, fields, settlements, roads
- 4.3b Ramarasana
- 4.3c Roranga
- 5.1 Water
- 5.2 Rice fields

0 km

0 km

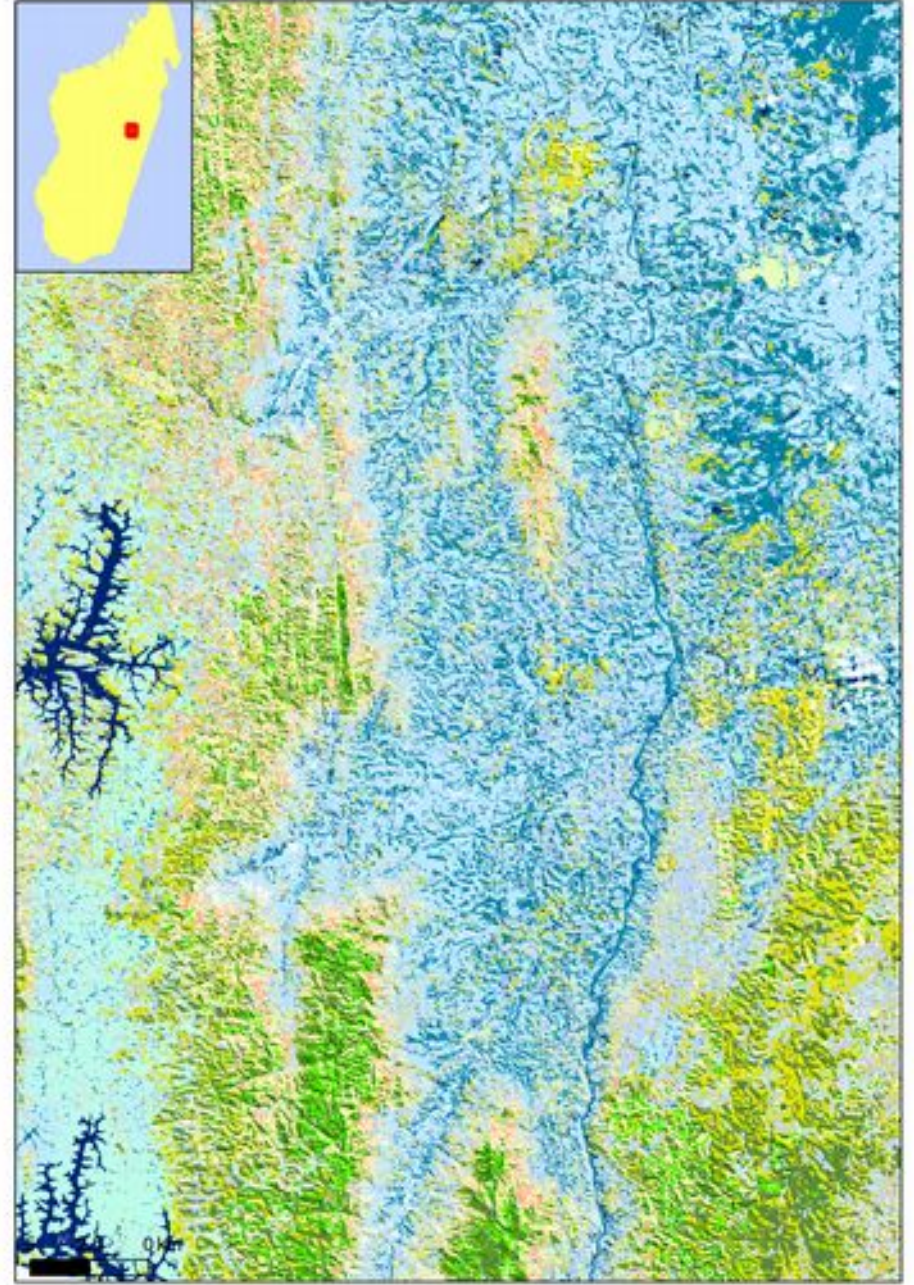
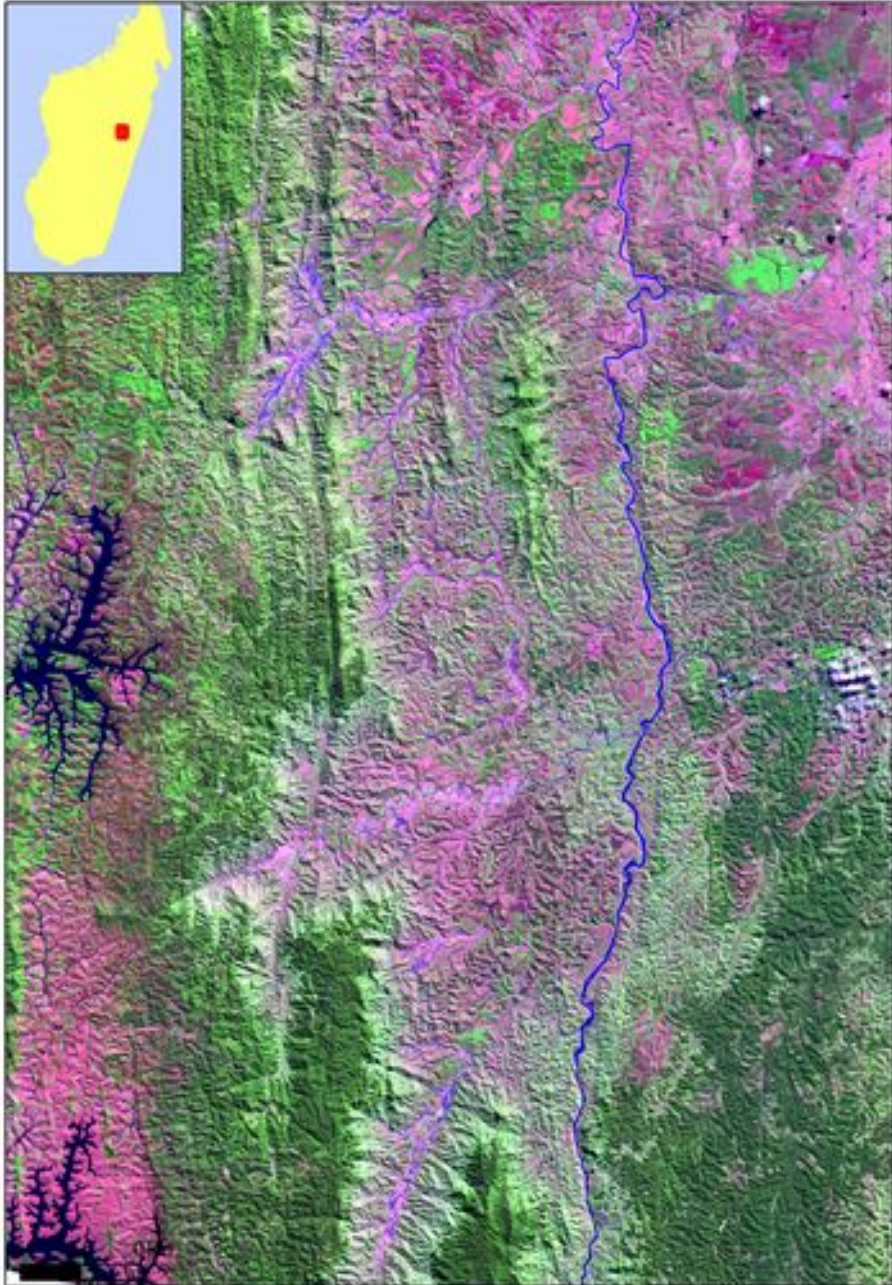
# RESULTS: Ranomafana



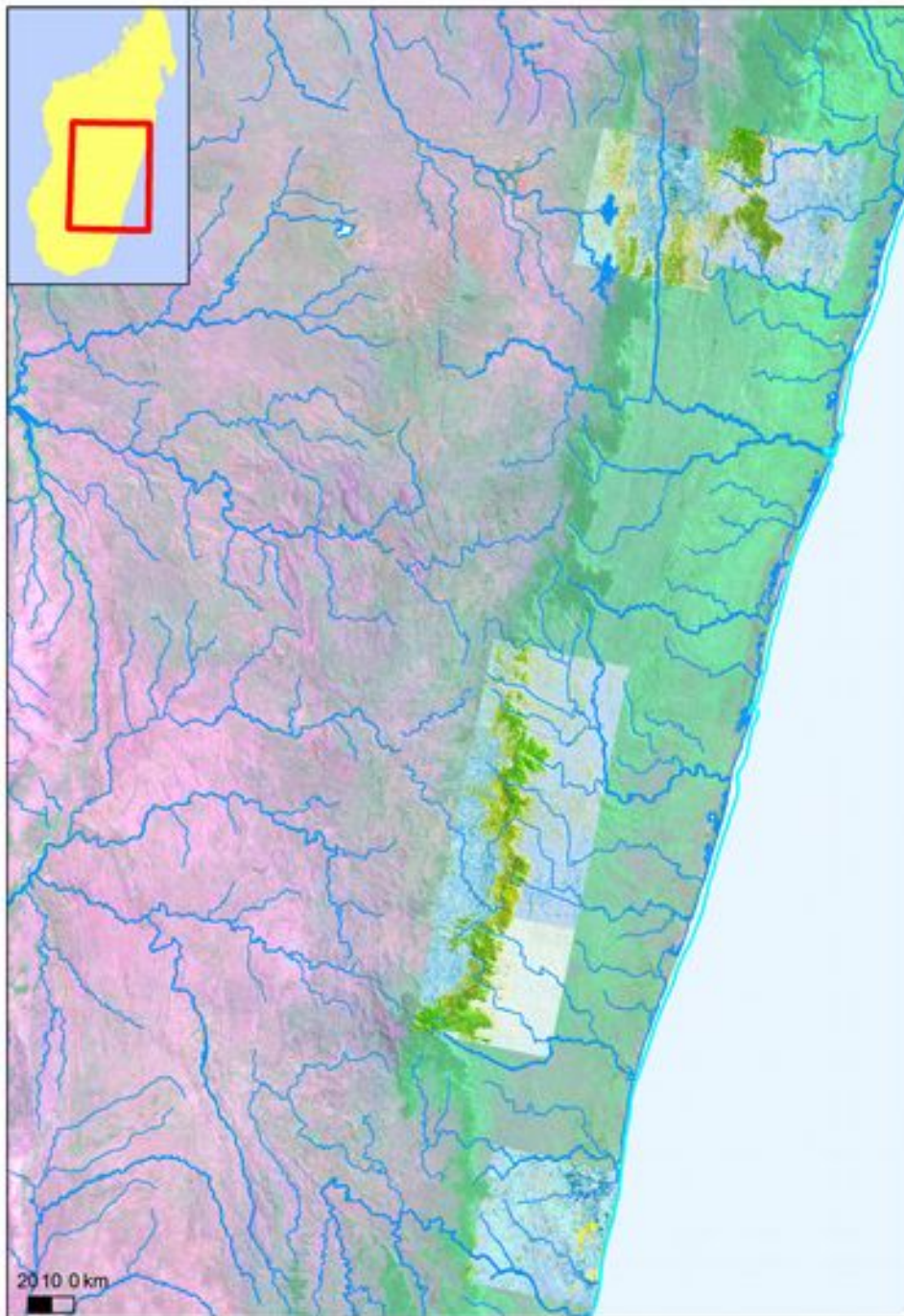
0 km

0 km

# RESULTS: Andasibe-West



# RESULTS: Maps for pilot areas



- 1.1 ML closed
- 1.2 ML with gaps
- 1.3 ML with large gaps
- 2.1a SL with BT on tops
- 2.1b SL with BT lowland
- 2.1c SL with BT littoral
- 3.1a SL closed mountain
- 3.1b SL closed lowland
- 3.1c SL closed littoral
- 3.1d Eucalyptus closed
- 3.1e Pine closed
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- 4.1a Savoka
- 4.2 Mosaic of crops, ramarasana, savoka
- 4.3a Bare ground, fields, settlements, roads
- 4.3b Ramarasana
- 4.3c Roranga
- 5.1 Water
- 5.2 Rice fields

# Further plans

- Completing the forest intactness / transformation map for the whole moist forests of Madagascar
- Field verification and adjusting the classes accordingly
- Expanding for semi-dry and dry forests
- Developing the forest degradation monitoring system based on the maps and measuring methods (by local people)
- Cooperation with the Global Forest Watch (initiative of the World Resources Institute, DC, USA) starting the project in Madagascar next year ([www.globalforestwatch.org](http://www.globalforestwatch.org))



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