

# GIS-BASED DETECTION AND QUANTIFICATION OF PATCH-BOUNDARY PATTERNS FOR IDENTIFYING LANDSCAPE MOSAICS

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**Abstract.** The study of boundaries between patches allows us to understand the complexity of landscape interactions, especially those involved in the anthropic use of natural resources, which is a common source of environmental problems when harnessing landscape services. The study of the relationships between those two elements makes it possible to identify distinct homogeneous environmental areas in which the same ecological interactions occur. These areas are the mosaics that make up a landscape. This paper presents a GIS-based procedure to identify and quantify the boundaries of land use/cover patches and to record those data in matrices of patches by boundaries. These matrices, by means of a multivariate analysis, allow us to recognize landscape mosaics. This semi-automated procedure contributes to making the concept of landscape mosaics operative and enabling its application to landscape management. To exemplify its possibilities, we tested three alternatives for quantifying boundary measures: presence/absence, frequency and length. They each describe interactions with different details and provide different nuances in interpretations of landscape organization. In the study case, the frequency data provided a more easily understandable interpretation of the mosaic identification and characterization of landscape heterogeneity because these data are less conditioned by the spatial distribution, size or length of rare boundaries. Irrespective of the boundary measure used, a large central mosaic is always identified, highlighting the influence of landscape homogeneity and fragmentation on mosaic identification and the robustness of the tested procedure.

**Keywords:** *landscape ecology, landscape evaluation, landscape model, land use and cover, spatial analysis*

## Introduction

Landscape ecology provides a suitable set of concepts and knowledge for studying the ecological functioning of landscape pattern and its relationship with human society (Wiens et al., 2007; Kirchoff et al., 2013; Bastian et al., 2015). Landscape pattern is the central topic in landscape ecology, as it is both consequence and cause of

ecological functioning (Forman and Godron, 1981; Turner, 1989) on which the supply of environmental services is based (MEA, 2005; TEEB, 2010). The study of landscape pattern, being directly related to functioning, is therefore crucial in ecosystem services conservation planning and management (Forman, 1990; De Groot et al., 2010; Frank et al., 2012; Maes et al., 2013; Martín de Agar et al., 2016).

Landscape pattern is usually studied as spatial distributions of patches and boundaries (Forman and Godron, 1981; Urban et al., 1987). The relationships between the two allow us to understand and interpret the ecological functioning of landscapes (Turner, 1989; Forman, 1990; Cantwell and Forman, 1993; Cadenasso et al., 2003; Roldán et al., 2003; Hersperger, 2006). Landscape spatial heterogeneity based on the joint spatial pattern of these elements is referred to as landscape mosaics (Forman, 1995; Roldán et al., 2003; Hersperger, 2006). This is a central issue in ecology and has special scientific relevance because it permits understandings of how patches and boundaries interact with each other to define zones with similar ecological interactions. These zones are the basis of ecological planning and service assessments (Martín de Agar et al., 2016).

Mosaics are defined as sets of patches with a similar pattern of boundaries (Roldán et al., 2003). Accordingly, a landscape comprises different mosaics (Roldán et al., 2006; De Pablo et al., 2012), on which patches have homogeneous ecological functioning, and the boundaries denote places where this functioning change, including the type, direction and magnitude of interactions taking place among the former (Margalef, 1979; Wiens et al., 1985; Gosz, 1991; Wiens, 2002; Cadenasso et al., 2003; Peters et al., 2006). Such mosaic-based studies of landscape integrate information provided by patches, boundaries and the relationships between them (Roldán et al., 2003; Peters et al., 2006). The usefulness of this approach has been demonstrated from both academic (Roldán et al., 2006; De Pablo et al., 2010) and applied perspectives (Hardt et al., 2013; Bertolo et al., 2015; Martín de Agar et al., 2016). Studies have been undertaken on the complexity of interactions between natural resources and anthropic uses in the Atlantic Forest in São Paulo, Brazil (Hardt et al., 2013; Bertolo et al., 2015), and in a traditional mountainous agrarian, livestock and forestry cultural landscape in Madrid, Spain (Roldán et al., 2006; De Pablo et al., 2010; Martín de Agar et al., 2016). Numerous techniques have been developed to identify boundaries from spatial data (Jacquez et al., 2000, 2008; Fagan et al., 2003; Fortin and Dale, 2005; Banerjee et al., 2015). At present, many landscape studies, especially those with applied objectives, are based on land cover or land use maps. On those maps, it is easy to recognize the boundaries from the edges between patches (Rescia et al., 1997; Metzger and Müller, 1996; Roldán et al., 2003). However, to identify and map a mosaic as a set of patches with similar boundaries, additional techniques are needed to determine the spatial interactions between the two. It is also necessary to build a matrix of patches by boundaries in order to collect the spatial relationships between both, on which mosaics recognition is based.

The goal of this paper is to develop a Geographical Information System (GIS) procedure for identifying and recording boundaries of individual landscape patches and for building matrices of patches  $\times$  boundaries. This paper details this GIS procedure coupled to the multivariate analysis needed to identify and map landscape mosaics that synthesize the spatial heterogeneity. A case study in an Atlantic Forest area is used to illustrate the results obtained in each procedure stage. The procedure is based on that of Roldán et al. (2003) that worked with a non-automated technique and was applied by

Hardt et al. (2013) to landscape management. The novelty of this paper is the semi-automatic recording of boundary measures (presence/absence, frequencies and lengths) for each patch obtained from raster or vector land use/cover maps.

It is primarily a technical issue, but the developed tool provides a basis for facilitating the use of current techniques for mosaic recognition in landscape studies. It is an innovative application of a remote sensing methodology to tackle a common Brazilian environmental problem: the increase in tropical forest interaction complexity with anthropic uses. This understanding aids, for example, in the conservation, planning and management of natural resources in regions that face complex environmental issues.

Although the procedure described above has already been applied in some studies (Hardt et al., 2013; Bertolo et al., 2015; Martín de Agar et al., 2016), this is the first time that the unpublished developed procedure is presented step by step for easy application to other landscapes, thus allowing the landscape mosaic identification technique to be well known by scientists, planners and managers involved in nature conservancy.

## Materials and methods

### *The case study*

The methodological procedure was originally developed for a case study in an Atlantic Forest landscape in Serra do Japi, State of São Paulo, Brazil (*Appendix A*). The mountainous area is covered by a semi-deciduous forest, Red-Yellow Latosols (Oxisols) predominate, and the climate is seasonal, with a hot and rainy season and a dry and cold season (Morelato, 1992).

### *Methodological procedure*

The procedure developed for identifying and mapping boundaries and mosaics consists of three stages that are described in detail in the next subsections.

#### *Stage 1 – Identifying boundaries*

Boundaries were recognized using ArcGIS on a land use/cover map created by photointerpretation of orthophotos from 2005 (scale 1:25,000). The procedure consists of identifying the common edges between adjoining patches. Different pairs of adjacent land use/cover identify the differing boundaries, which are each stored in separate layers. Using the land use/cover layers in a polygon vector format as inputs, the layers of the patch edges are generated by just dilating the polygons of land use/cover (*Fig. 1-I; Tables 1A-I and B-I*).

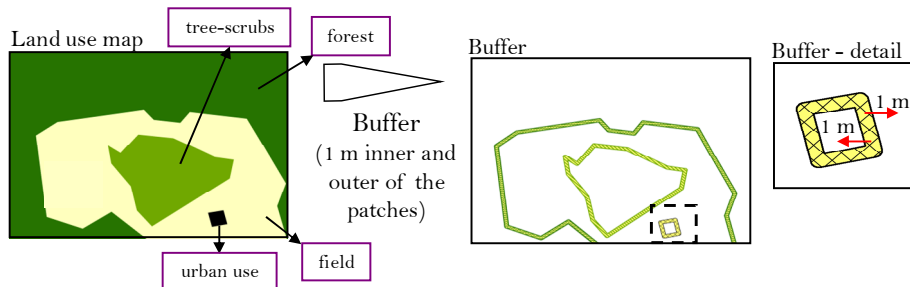
There are two alternatives depending on whether these layers will be stored in raster or vector format. For the former, the layers of the edges are converted to raster format and are then reclassified as prime numbers (*Fig. 1-II; Table 1A-II*). Subsequently, all possible pairs of layers that represent the different land uses/covers are multiplied (*Fig. 1-III; Table 1A-III*). Because these are codified as prime numbers, the result of each multiplication is unique, and each multiplication represents a single type of boundary among the existing uses in the study area. All layers obtained by multiplication are then added to generate a raster layer with all boundaries.

To draw a boundary map in vector format, the boundary layers of all possible pairs of land uses/covers, as obtained in *Table 1B-II*, are directly overlaid. The denomination of the boundaries is then included, and the data are merged into a single file (*Table 1B-III*).

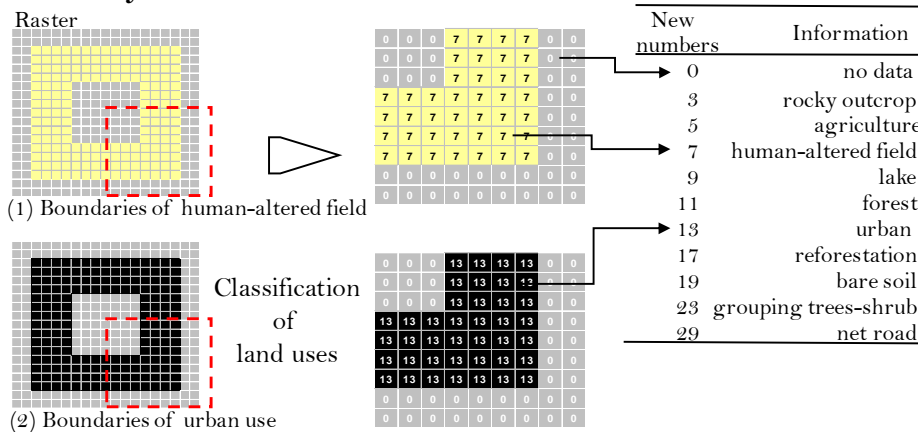
### Stage 2 – Drawing up patches × boundaries matrices

In this stage, the types of boundaries for each patch of land use/cover are identified and organized in a matrix using the same procedure for both raster and vector formats. Boundary type is recorded as i) presence-absence, which represents whether a boundary type is or is not present, ii) frequency, which is the number of segments of a boundary type and iii) length, which is the sum of the segment lengths of a boundary type.

#### I. Buffer Wizard



#### II. Reclassify



#### III. Raster calculator

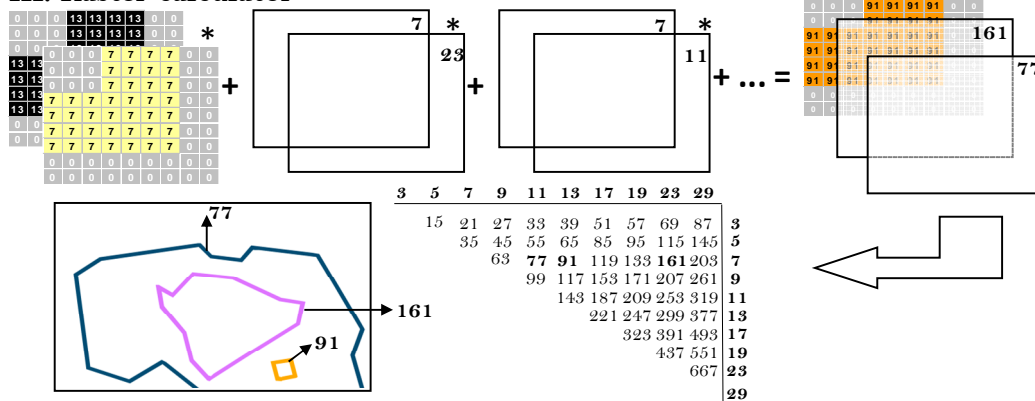


Figure 1. Boundary detection for land use/cover layers in raster format

**Table 1.** Stage i) Identification and characterization of boundaries using ArcGis® 10.3

A) For boundary mapping in raster format																	
Action	Commands																
I. Create layers of patch edges for each land use/ <b>cover</b> type using polygon internal and external dilation (Fig. 1.I Buffer Wizard). This action allows adjacent patches to be superposed in the next step.	⇒ in ArcMap: Customize > Commands > Categories: Tools > Commands: <b>Buffer wizard</b> [select a “use type layer” > Next > Distance units are: meters > At a specific distance: 1 meters > Next > Dissolve barriers between buffers: No > Create buffer so they are inside and outside the polygon(s) > In a new layer, specify output shapefile > Finish] ⇒ Repeat this procedure for all use types <sup>1</sup>																
II. Identification of edge types between patches using codes classify of layers into prime numbers (Fig. 1.II Reclassify). <sup>2</sup>	⇒ in ArcToolbox: Spatial Analyst Tools > Reclass > <b>Reclassify</b> [select a “buffer output” as Input raster > Reclass field: select Value > Classify > New values: input the new number and 0 to NoData > Name the Output raster > OK] ⇒ Repeat this procedure for all use types <sup>1</sup>																
III. Multiplication of pairs of layers reclassified by superposition and the sum of all the resulting layers (Fig. 1.III Raster Calculator). The calculation allows the type of boundary between patches to be described because the multiplication of prime numbers always results in unique combinations.	⇒ in ArcToolbox: Spatial Analyst Tools Map Algebra > <b>Raster Calculator</b> [create an expression like this ([layer_use1] * [layer_use2]) + ([layer_use1] * [layer_use3]) +...+ ([layer_use n-1] * [layer_use n]) > Name output raster as “boundary map” > Evaluate] ⇒ Exclude the combinations that are different from expected																
B) For boundary mapping in vector format																	
Action	Commands																
I. Same as for the raster technique (Fig. 1.I).	Same as for the raster technique																
II. Superposition of all pairs of boundary layers between land use/ <b>cover</b> patches generated in the previous stage for the identification of boundaries.  Ex. of land use/ <b>cover</b> combinations:	⇒ in ArcToolbox: Analysis Tools > Overlay > <b>Intersect</b> [Input features: add 2 types of “buffer output” > Name the output feature class > OK] ⇒ Repeat this tool for all combinations of buffer layers <sup>1</sup>																
<table border="1"> <thead> <tr> <th>uses</th> <th>urban</th> <th>field</th> <th>forest</th> </tr> </thead> <tbody> <tr> <td><b>urban</b></td> <td>-</td> <td>urb-fie</td> <td>urb-for</td> </tr> <tr> <td><b>field</b></td> <td>-</td> <td>-</td> <td>fie-for</td> </tr> <tr> <td><b>forest</b></td> <td>-</td> <td>-</td> <td>-</td> </tr> </tbody> </table>	uses	urban	field	forest	<b>urban</b>	-	urb-fie	urb-for	<b>field</b>	-	-	fie-for	<b>forest</b>	-	-	-	
uses	urban	field	forest														
<b>urban</b>	-	urb-fie	urb-for														
<b>field</b>	-	-	fie-for														
<b>forest</b>	-	-	-														
III. Denomination of boundary types for each resulting layer in the previous step to merge them in a single file.	⇒ in ArcMap: Open Attribute Table of a “buffer intersect output” > Table Options > <b>Add Field</b> [Name the new field as “boundary” > Type: text] > Editor > Start Editing > <b>Attribute table</b> [include the boundary type in the new field > Explode Multi-part feature > Save edits] ⇒ Repeat this procedure for all boundary types <sup>1</sup> ⇒ In ArcToolbox: Data Management Tools > General > <b>Merge</b> [Input as Dataset all “buffer intersect output” > name the output dataset as “boundary map” > Field map: keep the new field only > OK]																

<sup>1</sup>Batch automation or the “Line Window” command can be used to speed up the repetition process

<sup>2</sup>It precedes the conversion of original vector buffer layers into raster format

The proceeding starts by including in each layer the fields in which the boundary presence-absence, frequency or length will be registered (*Table 2-I*). The new file must be superposed with the land use/cover map, and the boundaries can be identified (*Table 2-II*). Attention should be given to deleting any superposition that exceeds a two-by-two combination.

In the next step, the matrix of patches  $\times$  boundaries is reorganized (*Table 2-III*) to calculate the presence-absence, frequency or length of all the boundaries of each patch (*Table 2-IV*).

### Stage 3 – Identifying and mapping mosaics

This stage begins by using the multivariate analysis of the patches  $\times$  boundaries matrix to identify the landscape mosaics. The matrix is exported to statistical software such as SPSS (*Table 3-I*) and submitted to multivariate ordination and clustering analyses (*Table 3-II*) based on the method developed by Roldán et al. (2003, 2006).

**Table 2.** Stage ii) Development of patch  $\times$  boundary matrices using ArcGis® 10.3

Action	Commands																									
I. Preparation of boundary layers for subsequent boundary measure registration.	<p><math>\Rightarrow</math> in ArcMap: Open Attribute Table of “<i>boundary map</i>” &gt; Table Options &gt; <b>Add Field</b> [Name the new field &gt; Type: long integer] &gt; Editor &gt; Start Editing &gt; <b>Attribute table</b> [</p> <p>a) For the presence/absence frequency: attribute value (1) for the new field created as “<i>count</i>”;</p> <p>b) For the length: right click on the new field created as “<i>length</i>” &lt; Field Calculator &gt; “<i>length</i>” = [Area]/2 &gt; Save edits]</p>																									
<p>II. Superposition of the land use/cover map with the boundary map for the identification of the boundary types <math>\times</math> land use/cover patch.</p> <p>Example of a table created in this stage:</p> <table border="1"> <thead> <tr> <th>ID</th> <th>use</th> <th>boundary</th> <th>join count</th> <th>length</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>urban</td> <td>URB-FIE</td> <td>1</td> <td>10</td> </tr> <tr> <td>1</td> <td>urban</td> <td>URB-FOR</td> <td>1</td> <td>22</td> </tr> <tr> <td>1</td> <td>urban</td> <td>URB-LAK</td> <td>1</td> <td>9</td> </tr> <tr> <td>n</td> <td>...</td> <td></td> <td></td> <td></td> </tr> </tbody> </table>	ID	use	boundary	join count	length	1	urban	URB-FIE	1	10	1	urban	URB-FOR	1	22	1	urban	URB-LAK	1	9	n	...				<p><math>\Rightarrow</math> in ArcToolbox: Analysis Tools &gt; Overlay &gt; <b>Spatial Join</b> [Target features: “<i>use map</i>” &gt; Join features: “<i>boundary map</i>” &gt; Name the output feature class &gt; Join operation: join one to many &gt; Field map of join features: “<i>use map</i>” (ID, use type); “<i>boundary map</i>” (boundary, count, length) &gt; OK]</p> <p><math>\Rightarrow</math> In ArcMap - correction of superposition errors: Start Editing &gt; Selection &gt; <b>Select by Attributes</b> [Layer: “<i>spatial join output</i>” &gt; Method: Create a new selection &gt; “use type” = “<i>use1</i>” &gt; Ok] &gt; Selection &gt; <b>Select by Attributes</b> [Layer: “<i>spatial join output</i>” &gt; Method: Remove from current selection &gt; (“<i>boundary</i>” = “<i>boundary1</i>” OR “<i>boundary</i>” = “<i>boundary2</i>” ... “<i>boundary</i>” = all combinations types for “<i>use1</i>”)] &gt; Press Delete</p> <p><math>\Rightarrow</math> Repeat this correction for all use types*</p>
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<p>III. Reorganization of the boundaries table by land use/cover patches.</p> <p>Example of tables created in this step:</p> <p>a) For the presence/absence and frequency</p> <table border="1"> <thead> <tr> <th>ID</th> <th>use</th> <th>boundary</th> <th>join count</th> <th>URB-FIE</th> <th>URB-FOR</th> <th>URB-LAK</th> <th>...</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>urban</td> <td>URB-FIE</td> <td>1</td> <td>1</td> <td>0</td> <td>0</td> <td></td> </tr> <tr> <td>1</td> <td>urban</td> <td>URB-FOR</td> <td>1</td> <td>0</td> <td>1</td> <td>0</td> <td></td> </tr> <tr> <td>1</td> <td>urban</td> <td>URB-LAK</td> <td>1</td> <td>0</td> <td>0</td> <td>1</td> <td></td> </tr> <tr> <td>n</td> <td>...</td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> </tr> </tbody> </table> <p>b) For the length</p> <table border="1"> <thead> <tr> <th>ID</th> <th>use</th> <th>boundary</th> <th>length</th> <th>URB-FIE</th> <th>URB-FOR</th> <th>URB-LAK</th> <th>...</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>urban</td> <td>URB-FIE</td> <td>10</td> <td>10</td> <td>0</td> <td>0</td> <td></td> </tr> <tr> <td>1</td> <td>urban</td> <td>URB-FOR</td> <td>22</td> <td>0</td> <td>22</td> <td>0</td> <td></td> </tr> <tr> <td>1</td> <td>urban</td> <td>URB-LAK</td> <td>9</td> <td>0</td> <td>0</td> <td>9</td> <td></td> </tr> <tr> <td>n</td> <td>...</td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> </tr> </tbody> </table>	ID	use	boundary	join count	URB-FIE	URB-FOR	URB-LAK	...	1	urban	URB-FIE	1	1	0	0		1	urban	URB-FOR	1	0	1	0		1	urban	URB-LAK	1	0	0	1		n	...							ID	use	boundary	length	URB-FIE	URB-FOR	URB-LAK	...	1	urban	URB-FIE	10	10	0	0		1	urban	URB-FOR	22	0	22	0		1	urban	URB-LAK	9	0	0	9		n	...							<p>⇒ in ArcToolbox: Data Management Tools &gt; Table &gt; <b>Pivot Table</b> [Input table: "<i>spatial join output</i>" &gt; Input fields: all attribute fields &gt; Pivot field: "<i>boundary</i>" &gt; Value field:</p> <p>a) For the presence/absence and frequency: select the "<i>count</i>" field;</p> <p>b) For the length: select the "<i>length</i>" field</p> <p>&gt; Name the output table &gt; OK]</p>
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<p>IV. Summary of boundary attributes by patch ID.</p> <p>Examples of patch × boundary matrices:</p> <p>a) For presence/absence</p> <table border="1"> <thead> <tr> <th>ID</th> <th>use</th> <th>MAX<sub>URB-FIE</sub></th> <th>MAX<sub>URB-FOR</sub></th> <th>...</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>urban</td> <td>1</td> <td>1</td> <td></td> </tr> <tr> <td>2</td> <td>field</td> <td>1</td> <td>0</td> <td></td> </tr> <tr> <td>3</td> <td>forest</td> <td>0</td> <td>1</td> <td></td> </tr> <tr> <td>n</td> <td>...</td> <td></td> <td></td> <td></td> </tr> </tbody> </table> <p>b) For frequency</p> <table border="1"> <thead> <tr> <th>ID</th> <th>use</th> <th>SUM<sub>URB-FIE</sub></th> <th>SUM<sub>URB-FOR</sub></th> <th>...</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>urban</td> <td>5</td> <td>3</td> <td></td> </tr> <tr> <td>2</td> <td>field</td> <td>1</td> <td>0</td> <td></td> </tr> <tr> <td>3</td> <td>forest</td> <td>0</td> <td>11</td> <td></td> </tr> <tr> <td>n</td> <td>...</td> <td></td> <td></td> <td></td> </tr> </tbody> </table> <p>c) For length</p> <table border="1"> <thead> <tr> <th>ID</th> <th>use</th> <th>SUM<sub>URB-FIE</sub></th> <th>SUM<sub>URB-FOR</sub></th> <th>...</th> </tr> </thead> <tbody> <tr> <td>1</td> <td>urban</td> <td>10</td> <td>22</td> <td></td> </tr> <tr> <td>2</td> <td>field</td> <td>18</td> <td>0</td> <td></td> </tr> <tr> <td>3</td> <td>forest</td> <td>0</td> <td>4</td> <td></td> </tr> <tr> <td>n</td> <td>...</td> <td></td> <td></td> <td></td> </tr> </tbody> </table>	ID	use	MAX <sub>URB-FIE</sub>	MAX <sub>URB-FOR</sub>	...	1	urban	1	1		2	field	1	0		3	forest	0	1		n	...				ID	use	SUM <sub>URB-FIE</sub>	SUM <sub>URB-FOR</sub>	...	1	urban	5	3		2	field	1	0		3	forest	0	11		n	...				ID	use	SUM <sub>URB-FIE</sub>	SUM <sub>URB-FOR</sub>	...	1	urban	10	22		2	field	18	0		3	forest	0	4		n	...				<p>⇒ in ArcToolbox: Analysis tools &gt; Statistics &gt; <b>Summary Statistics</b> [Input table: select a "<i>pivot table output</i>" &gt; Name the output table &gt; Statistics field(s): include all boundary types) &gt; Statistic type:</p> <p>a) For presence/absence: MAX - for value field (1) &gt; Case field: ID</p> <p>b) For frequency: SUM - for value field (1) &gt; Case field: ID</p> <p>c) For length: SUM - for value field "<i>length</i>" &gt; Case field: ID</p> <p>&gt; OK]</p>					
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Patches with similar coordinates on the ordination axes have similar boundary pattern and consequently may be regarded as belonging to the same mosaic. To better identify these groups, patches are also clustered according to their coordinates on the ordination axes (Roldán et al., 2003). Each of the identified clusters corresponds to a mosaic. The mosaic to which each patch corresponds is recorded in a table. The table is

incorporated into ArcGis® to map the mosaics (*Table 3-III*). This step is performed by joining the table with the land use/cover map in accordance with the patch number register (ID). This allows the mosaics to be mapped, as presented in Hardt et al. (2013).

**Table 3.** Stage iii) Identification and mapping of landscape mosaics

Action	Commands
I. Export the table of patches × boundaries from ArcGIS® to statistical software.	⇒ in any Statistical software: Open the *.dbf corresponding to the <i>output table</i> obtained in the last step of stage ii). For example, SPSS software opens directly the *.dbf file generated by ArcGis® 10.3.
II. Mosaics identification: a) DCA analysis of the patches × boundaries table; b) Cluster analysis of the patches according to their scores on the DCA axes.	⇒ in the statistical software selected: Start from one of the boundary measures recorded in the <i>output table</i> and subject the selection (patches selected boundary measure) to the DCA and cluster analysis. See Roldán et al. (2003, 2006) for details. The final step is to build a table of patches × cluster number. This <i>new table</i> contains the number of the cluster or mosaic corresponding to each patch.
III. Mosaic mapping in ArcGIS® by joining the land use/cover map with the cluster table created in the last step, followed by a new representation of the patches using cluster numbers that identify the mosaics.	⇒ in ArcMap: Insert the <i>new table</i> of patches × cluster number > <b>Add Data</b> [ " <i>new table</i> " > Add > Save] > mosaic mapping by right clicking on the <i>land use/cover map</i> > Joins and Relates > <b>Join</b> [Join attributes from a table > Field layer join based on: " <i>ID</i> " > Table to join: " <i>new table</i> " > Field table join on: " <i>ID</i> " > OK] > attribute the mosaic's symbology by right clicking on the <i>land use/cover map</i> > Properties > <b>Symbology</b> [Categories > Value Field: " <i>cluster number</i> " > Add all values > OK].

The instructions shown in *Tables 1* and *2* refer to ArcGis®, but the sequence of operations may also be implemented in another GIS using the tools corresponding to each of the operations described in detail.

### Example of the methodological procedure

The validity of the method for the three types of boundary measures was tested for a case study in Serra do Japi (São Paulo, Brazil) by comparing the mosaics' complexity results with the local reality aided by the statistical analysis described below. This study case used part of a database developed to describe the utility of landscape mosaics for decision making for Atlantic Forest conservation. Additional details of this analysis can be found in Hardt et al. (2013).

The land use/cover map (*Appendix A*) shows the spatial distribution of 3,979 patches corresponding to ten land uses/covers (*Appendix B*) that have 30,057 boundaries of 37 distinct types. Three matrices of patches × boundaries were calculated using of presence/absence, frequency or length boundary data for each patch.



Each matrix was subjected to a Detrended Correspondence Analysis (DCA; Hill, 1981) using PC-Ord<sup>®</sup> 4.0 software. The scattergrams of the boundaries and patches according to axes 1-2 and 2-3 of the three DCA are shown in *Fig. 2*. The patches were then clustered according to their coordinates on the first three axes of the DCA using a free trial version of XlStat<sup>®</sup>. The clustering was performed by applying Ward's method as the amalgamation algorithm and Euclidean distance as the measure of similarity (*Fig. 3*).

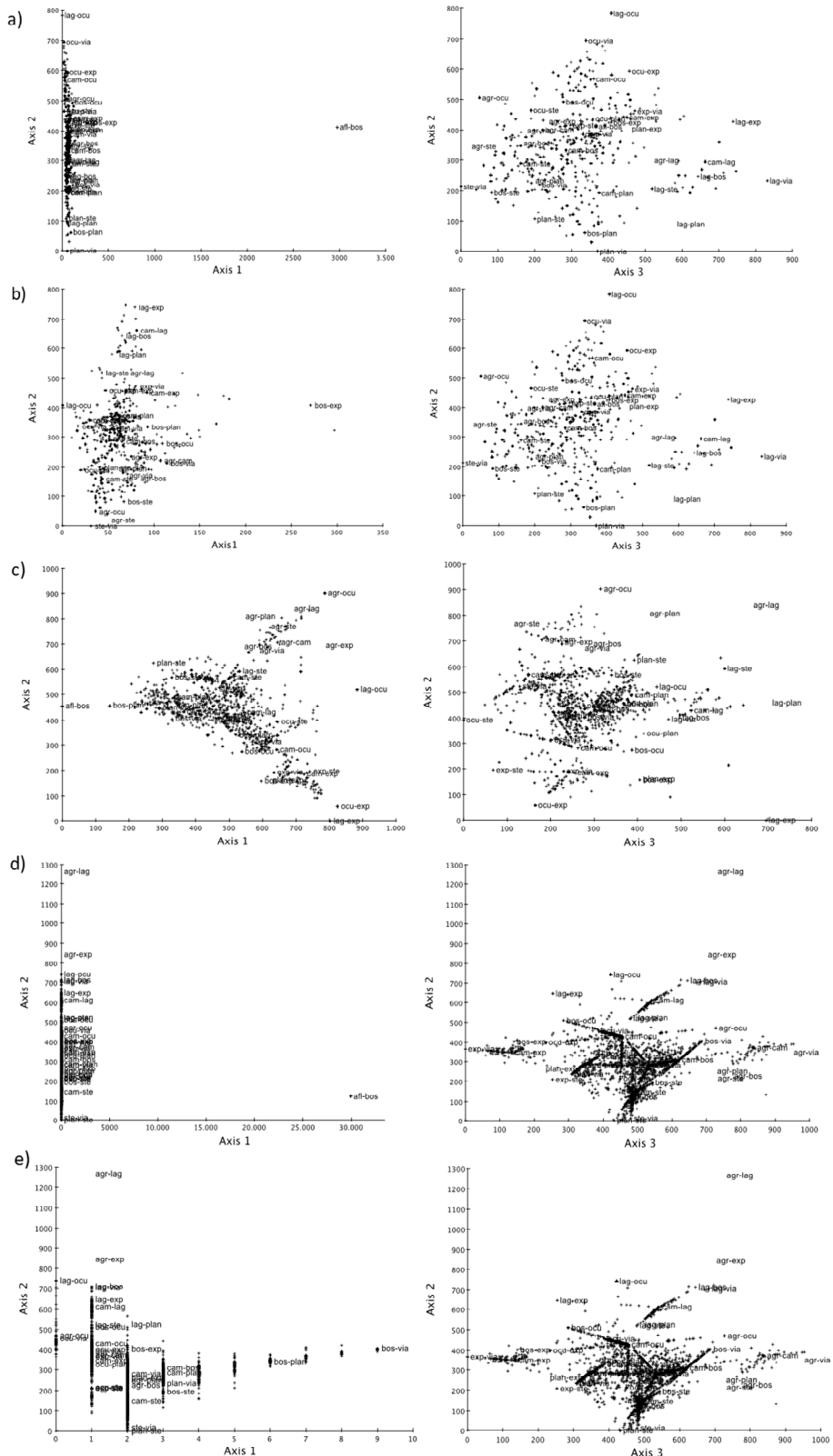
The group similarity cut-off level in the dendrograms was standardized at 95%. The clusters were characterized according to their boundaries by means of Chi-square analyses for the presence/absence data and Student's t-test for the frequency and length data. Finally, the patch clusters were incorporated into the ArcGis<sup>®</sup> database for mapping the mosaics. Thus, three landscape mosaic maps of the Serra do Japi were drawn (*Fig. 3*).

The distribution of boundaries and patches in the ordination scattergrams indicates that boundary frequency is the boundary measure that most clearly displays the boundary distribution variability in the sets of patches (*Fig. 2c*). For the presence/absence (*Fig. 2a*) and length (*Fig. 2d*) data, the distribution of these two elements was strongly conditioned by a single type of boundary (between outcrop – AFL – and forest – BOS – represented by the AFL-BOS code) with a small number of occurrences in the landscape. This makes the scattering of data in the space defined by the first ordination axis more compact (*Figs. 2a* and *d*), with many of the patches having very similar coordinates. This hinders the interpretation of the variability of boundaries and the recognition of groups of patches, on which the identification of the mosaics is based (Roldán et al., 2003, 2006). It does not occur when frequencies are studied because the frequencies of this boundary do not greatly limit the dispersion of data (*Fig. 2c*).

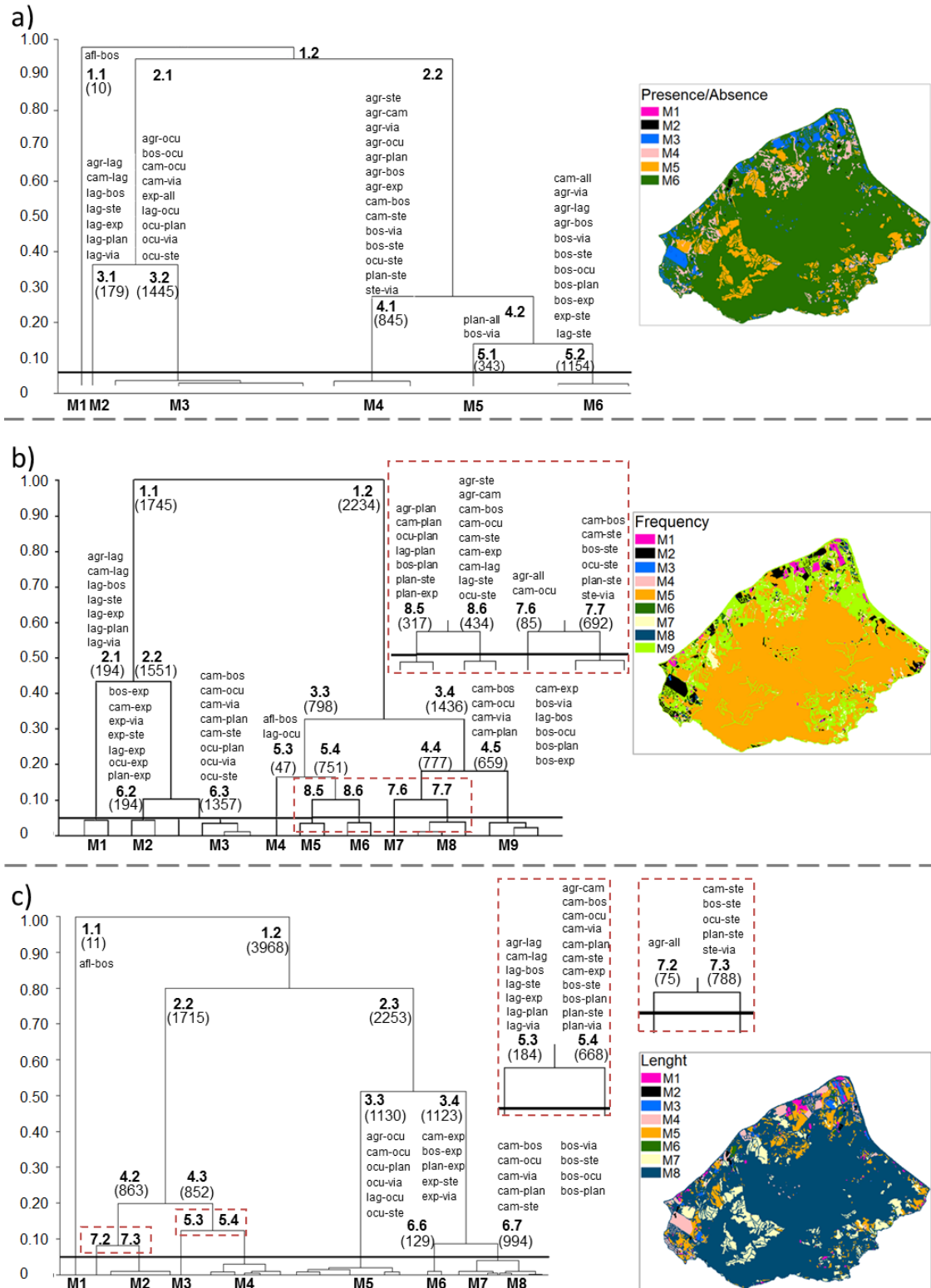
To corroborate this result, new scattergrams were drawn by removing the patches with higher coordinates on axis 1, that is, those with positions that were highly dependent on the AFL-BOS boundary. A wider distribution of patches and boundaries was obtained for the presence/absence data (*Fig. 2b*), but most of them continued to have very close coordinates.

The scattergram of the length matrix (*Fig. 2e*) shows sets of patches arranged in rows. This indicates that these sets responded to variations in the lengths of one or a few boundaries, which is related to the particular structure of the study area, in which there are large forest patches that are located at high altitudes and are surrounded by small fragments of other anthropic uses (*Appendix A*). Therefore, the forest patches have more variable perimeter lengths than other land uses/covers. This increases the possibility that forest patches will have boundaries with varied lengths, from very short to very long.

Boundaries that characterize the selected clusters, i.e., the identified mosaics, are also included in the dendrograms obtained from patch clustering (*Fig. 3*). Both the presence/absence (*Fig. 3a*) and length (*Fig. 3c*) data produced dendrograms with a cluster that remained undivided from the first division. In these cases, this cluster is characterized by the AFL-BOS boundary. The dendrogram obtained from the frequency data (*Fig. 3b*) had a better organized set and sub-set structure because no clusters remained undivided from the first division. These results agree with those obtained from the ordination scattergrams because the boundary frequency data provided a more easily understandable interpretation and did not uniquely depend on the spatial distribution or length of just one boundary.



**Figure 2.** Results of the DCA ordination of patch  $\times$  boundary matrices. Scattergrams for axes 1 and 2 and axes 2 and 3 of a) the presence/absence matrix, b) the presence/absence matrix without outliers, c) the frequency matrix, d) the length matrix, and e) the length matrix without outliers. Patches are represented by crosses, and boundaries are represented by abbreviations of the land use/cover codes, which are presented in Appendix B



**Figure 3.** Clustering results of patches in mosaics (I) and the corresponding mosaic map (II) obtained from data on boundary presence/absence (a), frequency (b) and length (c)

A large central mosaic and a more heterogeneous peripheral landscape is identified in all the mosaic maps, irrespective of the boundary measure used (Fig. 3). These

results agree with that reported by Hardt et al. (2013) on the landscape spatial structure in the same study area. This indicates that the differences in the results obtained using the three boundary measures depend on the different landscape details highlighted by each measure.

In summary, in this example, boundary frequency is the boundary measure that most clearly allows us to identify mosaic-patch sets with a similar boundary pattern (Figs. 2c and 3b). The frequency distribution of boundaries did not seem to be highly conditioned by the low frequencies of some of them, which were present only in some patches, as seemed to be case for the presence/absence measure. In addition, the sizes of the patches were less important for the frequency measure because that variable had a lower variation rank than the length measure.

## Discussion

Building matrices of patches  $\times$  boundaries has been the constraining factor in landscape mosaic mapping. Methodological procedures like the one described, which is the only one known by the authors, allows these matrices to be easily drawn up, thus contributing to operationalizing the concept of landscape mosaics and making its application in landscape management possible (Hardt et al., 2013; Bertolo et al., 2015; Martín de Agar et al., 2016). The procedure has also the advantage of using standard GIS and statistical software.

The procedure developed permits input land use/cover maps in both raster and vector formats to be used. It works practically without limitation to large datasets, depending only on the software used and on the available memory and system cache of the user's computer. The implementation of this concept has previously been limited by the difficulty when working with large territories, which probably explains the small number of studies on the complexity of landscape interactions based on mosaics (Cantwell and Forman, 1993; Roldán-Martín et al., 2003, 2006; Hersperger, 2006) and their use in environmental planning and management (Hardt et al., 2013; Bertolo et al., 2013).

Each boundary measure provides a particular interpretation of landscape organization, and researchers must therefore evaluate the measures that best meet their objectives. In the example, the mosaics identified using boundary presence/absence was not the most revealing of the landscape variability. The qualitative aspect seems to be a large constraint, as the occurrence of a low presence boundary conditioned the results by impeding the easy observation of other patterns.

In our example, when mosaics are characterized by boundary length, the information provided was apparently influenced in both qualitative aspects as related to very low frequency boundaries (Fig. 2d) and patch size (Fig. 2e). This is the case of large forest patches having boundaries of all lengths. They condition the patch arrangement "in lines" (Fig. 2e), depending mainly on the differences in the lengths of the boundaries and less on their natures. The large forest patches conditioned the dispersion of the others in the DCA, primarily because of they may have boundaries of different lengths, which condition the identification of mosaics.

Boundary identification is closely related to the degree of landscape fragmentation and connectivity (Metzger and Muller, 1996; Rescia et al., 1997; Collinge and Forman, 1998; Trani and Giles, 1999; Zeng and Ben Wu, 2005). However, when a landscape becomes more fragmented, the boundary frequencies tends to provide information about

the fragmentation pattern that cannot be derived from length (Zeng and Ben Wu, 2005). Boundary frequency enable reporting stages prior to the rupture of the landscape based on the identification of patch perforations (Forman, 1995). Because of that ability, mosaics identified by frequency boundaries are apparently important in assessing the history of fragmentation pressures, understanding rupture dynamics over time and even indicating probable future scenarios (Hardt et al., 2013).

In our example, the relative similarities among the three mosaic maps (*Fig. 3*) could have been due to landscape homogeneity (Corbacho et al., 2000) explained by the small fragmentation in the central area and the large fragmentation in the peripheral areas.

Measures of boundaries such as frequency and length respond to spatial pattern in landscape heterogeneity (Metzger and Muller, 1996) and are particularly sensitive to environmental changes (Fortin et al., 2000). In that sense, mosaic landscape organization models should reflect depth spatial heterogeneity in such a way that they clearly show patterns of ecological interactions and landscape complexity (Lovett et al., 2005; Roldán-Martín et al., 2006; Hardt et al., 2013).

There are other models that describe the influences of spatial pattern on ecological processes and their changes over time, including the well-known patch-corridor-matrix model (Forman, 1995). However, that model is limited in its ability to detect landscape spatial heterogeneity, which can lead to errors in decision-making for landscape management (Hardt et al., 2013)

The described method has many possible practical outputs that could assist decision making in landscape management, for example, comparisons between mosaics built from historical maps, which record landscape changes, highlight driving forces and change vectors. These affect land cover/use and boundaries. New mosaics can appear as the result of changes in boundaries as well as land cover/uses, as reported by Hardt et al. (2013). For that reason, this analysis permits future scenarios to be proposed for nature conservation that have different degrees of human interference, keeping in mind that in landscapes with less complex spatial interactions and mosaics with simpler boundary structures, management is easier. Mosaics can also be used to identify priority areas for conservation according to the types and complexities of neighborhood spatial relationships, including the definition of appropriate management actions in accordance with them.

Due to their capabilities, mosaics can be used as units of landscape organization (Wiens, 1999; Hersperger, 2006) to identify territories that differ in structure, function, and forest conservation status (Hardt et al., 2013). In this way, mosaics can be a key tool to identify action zones for environmental planning and management, where planners and decision makers need to analyze the consequences on ecosystem service provision, especially in regions that face complex environmental issues and where natural resources share space with anthropic uses.

## Conclusions

The methodological procedure contributes to making the concept of landscape mosaics more operative and applicable for environmental planners.

The procedure works with any size area, with large data sets and in automated processes. However, the usefulness of the different boundary measures should be assessed in accordance with landscape characteristics and study purpose.

The case study highlights the influence of landscape homogeneity and fragmentation on the similarities among mosaics that are obtained by different boundary attributes. It also differentiated boundary frequency as the attribute that can be used to more easily identify and interpret mosaics due to its capacity to interpret the dynamics of landscape rupture patterns.

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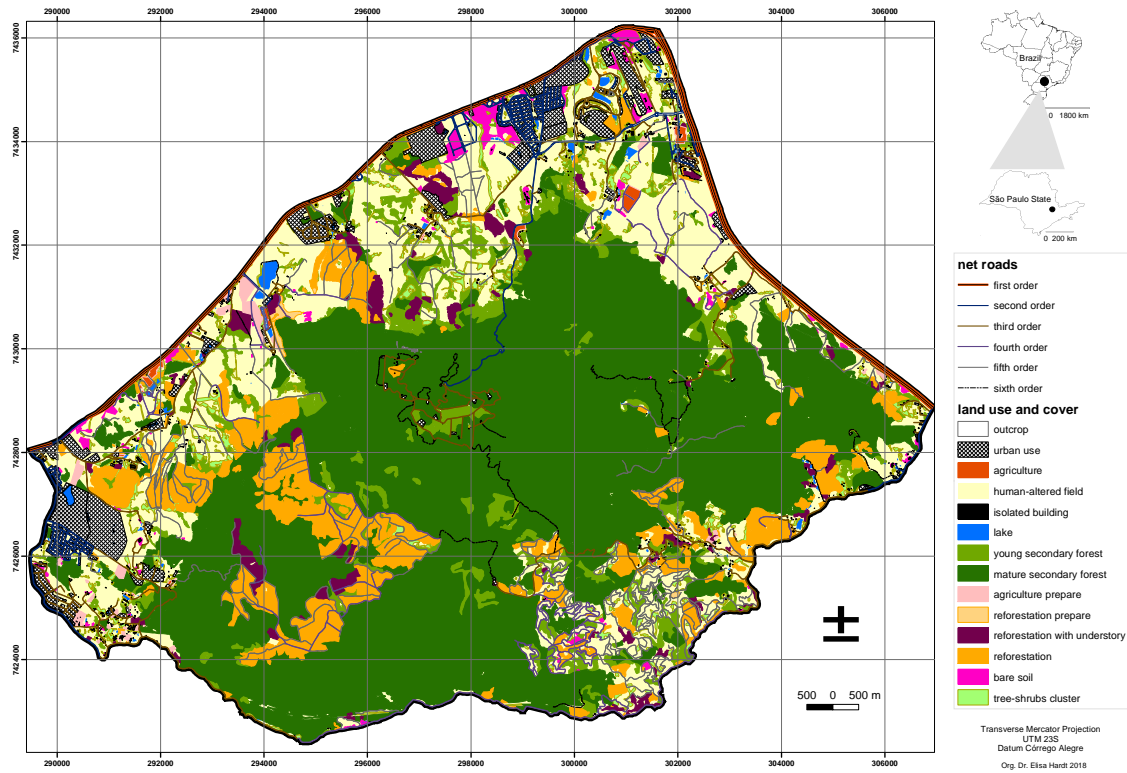
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## APPENDIX

**Appendix A.** Land use/cover map of Serra do Japi, Brazil. Created in ArcGIS® by visual interpretation of aerial orthophotos from 2005. Land uses/covers are described in Appendix B



**Appendix B.** Description and codes of the land use/cover categories identified in Serra do Japi, Brazil

<b>Category</b>	<b>Code</b>	<b>Criterion of classification</b>
Rocky outcrop	AFL	Natural open habitat with low vegetation cover
Agriculture	AGR	Annual or perennial croplands
Human-altered field	CAM	Pasturelands, abandoned areas (old areas of agriculture and silviculture), yards, lawns, and wasteland or unused lands
Bare soil	EXP	Rural or urban areas without vegetation
Forest	BOS	Semi-deciduous seasonal forests
Lake	LAG	Natural lakes and reservoirs
Net road	VIA	Trails, tracks and roads
Reforestation	PLAN	Plantations of <i>Eucalyptus</i> spp., <i>Pinus</i> spp. or <i>Araucaria</i> spp.
Grouping of trees/shrub	STE	Patches and corridors of trees and shrubs, natural or human-modified, without forest structure
Urban	OCU	Urban nuclei and isolated residential, commercial or industrial buildings