
Geospatial Visual Analytics: Interactive Maps and Multiple Coordinated Views



Fraunhofer Institut
Intelligente Analyse- und
Informationssysteme

Gennady Andrienko & Natalia Andrienko

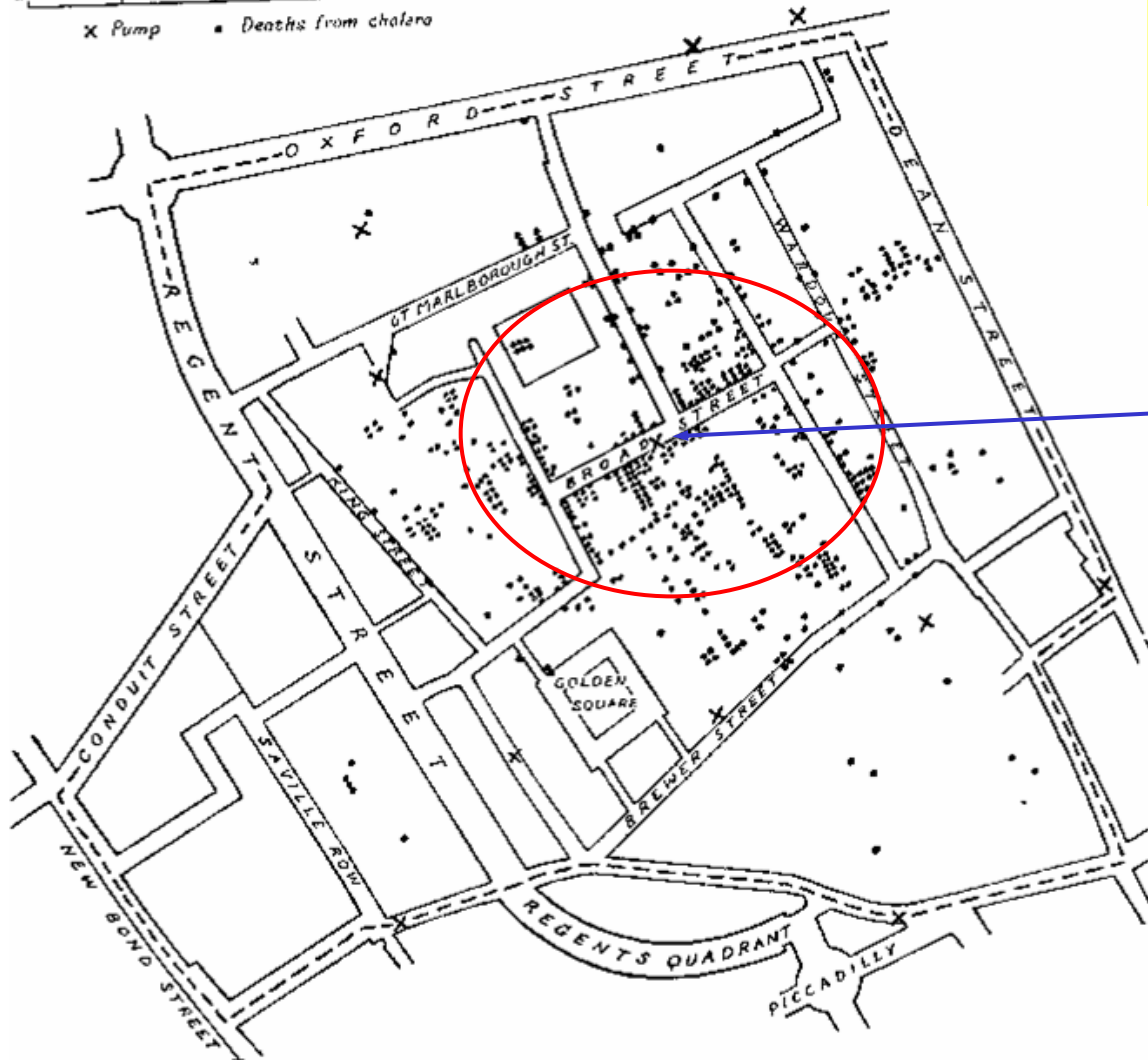
<http://geoanalytics.net>

Maps: not only for orientation!

- People live in geographical space. Most of people's decisions and actions depend on
 - where the things are;
 - how are their locations related.
- Maps allow people to perceive the space beyond the directly observable extent.
- A map serves as a model of reality and helps to detect patterns existing in the reality

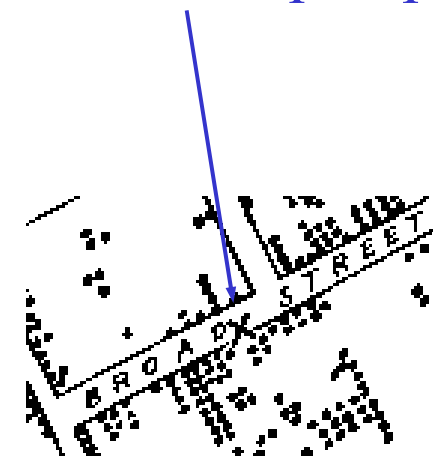
Example: Dr. John Snow's discovery

50 0 50 100 150 200
Yards
X Pump • Deaths from cholera



Map of locations of deaths from cholera
London, September 1854

infected water pump



Interactive maps

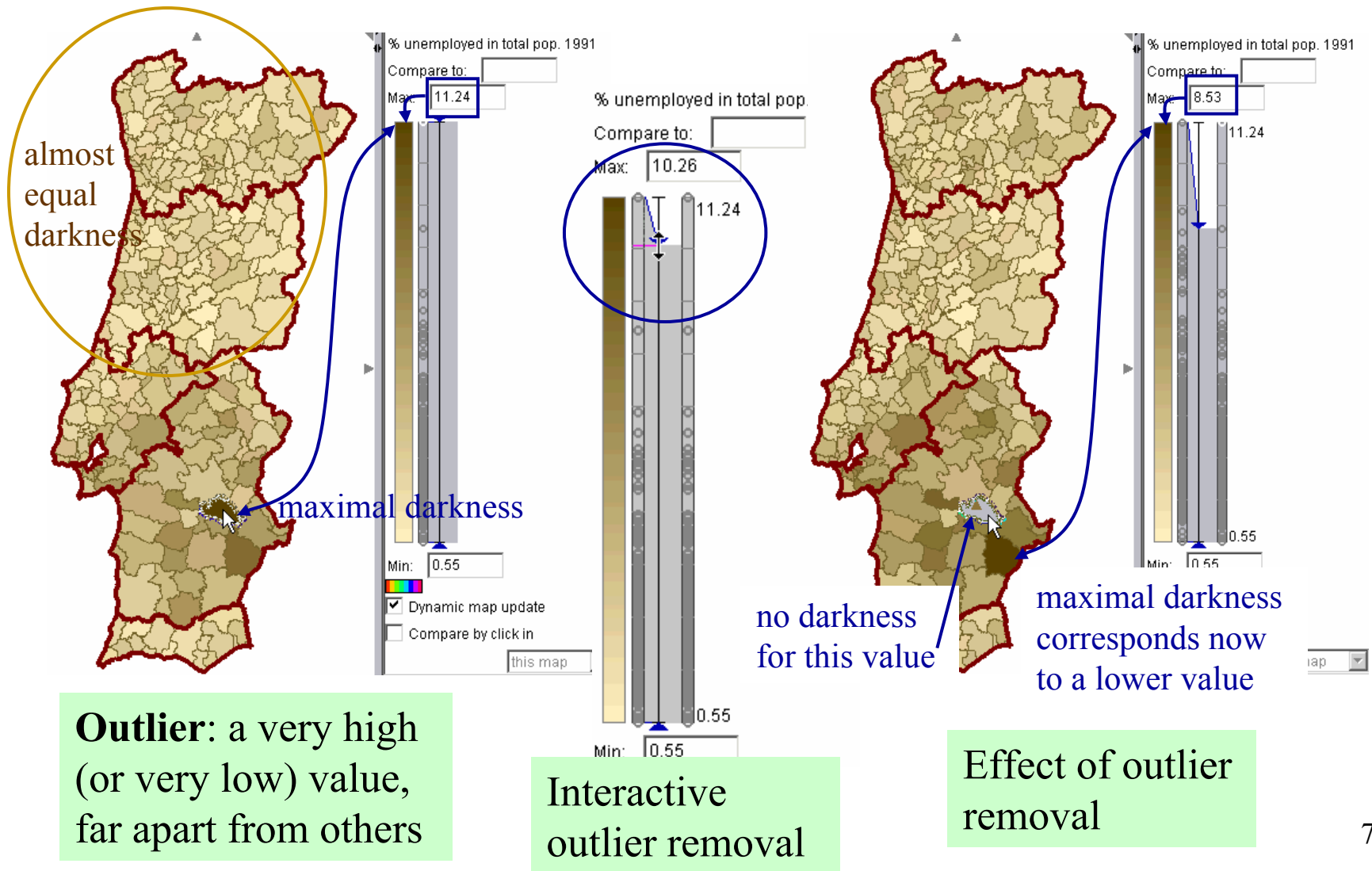
- Interactive maps can change in response to user's actions
- Many interactive maps are available on the Web, e.g. street maps, tourist maps, election maps, ...
- Interaction techniques are used to
 - compensate for the display deficiencies, e.g. limited size (zoom and pan, showing additional information related to mouse position, ...)
 - increase the display expressiveness
 - enable more sophisticated analyses

Typical interactive operations

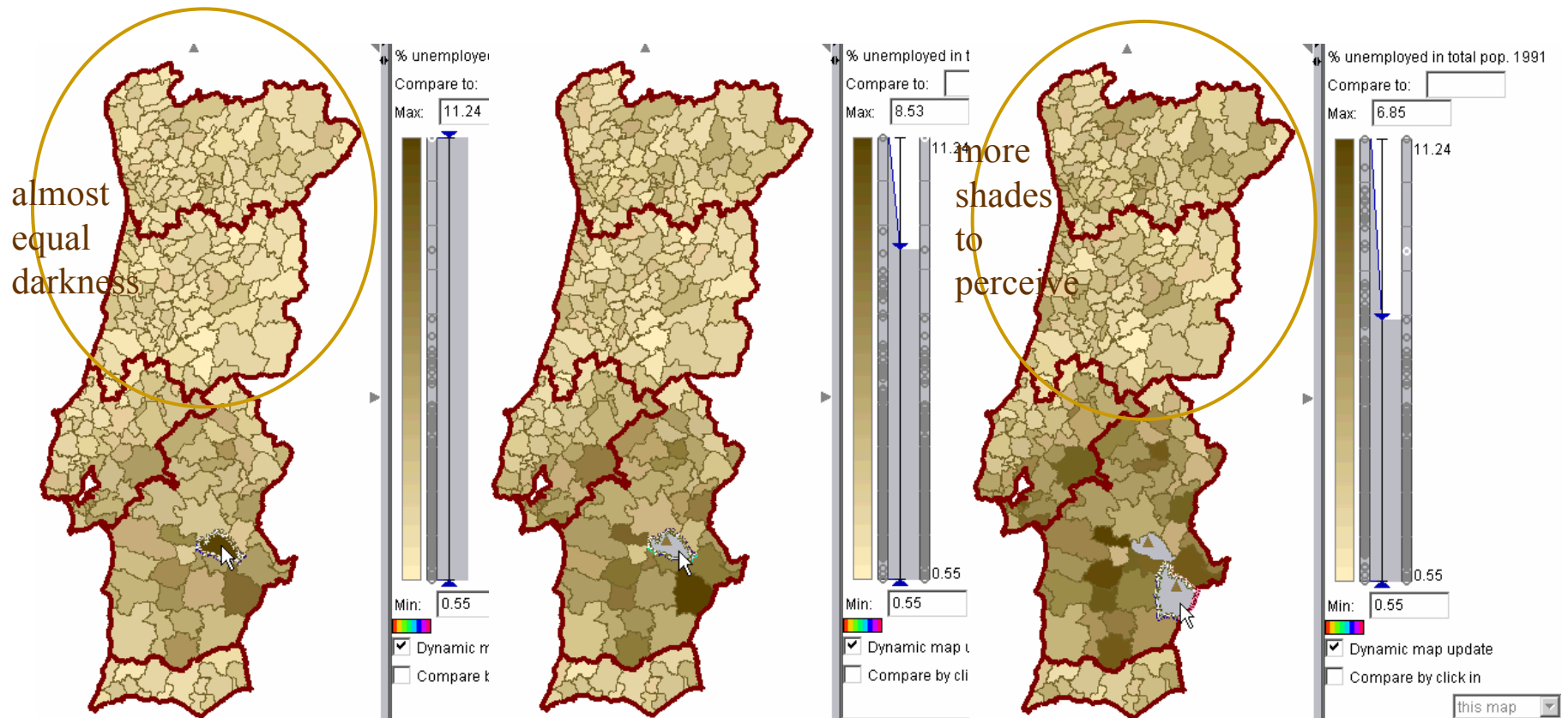
- Select information layers, e.g. on a tourist map: accommodation, museums, restaurants, nightlife
- Select time moments or intervals in displays of time-related information, e.g. election year
- Change the spatial scale, e.g. states or counties
- Change the theme, e.g. president elections or governor elections, absolute values or differences in comparison to the previous time
- Choose the visualization method, e.g. area painting or proportional symbols

Examples of analytical interactions

Removing Outliers (1)



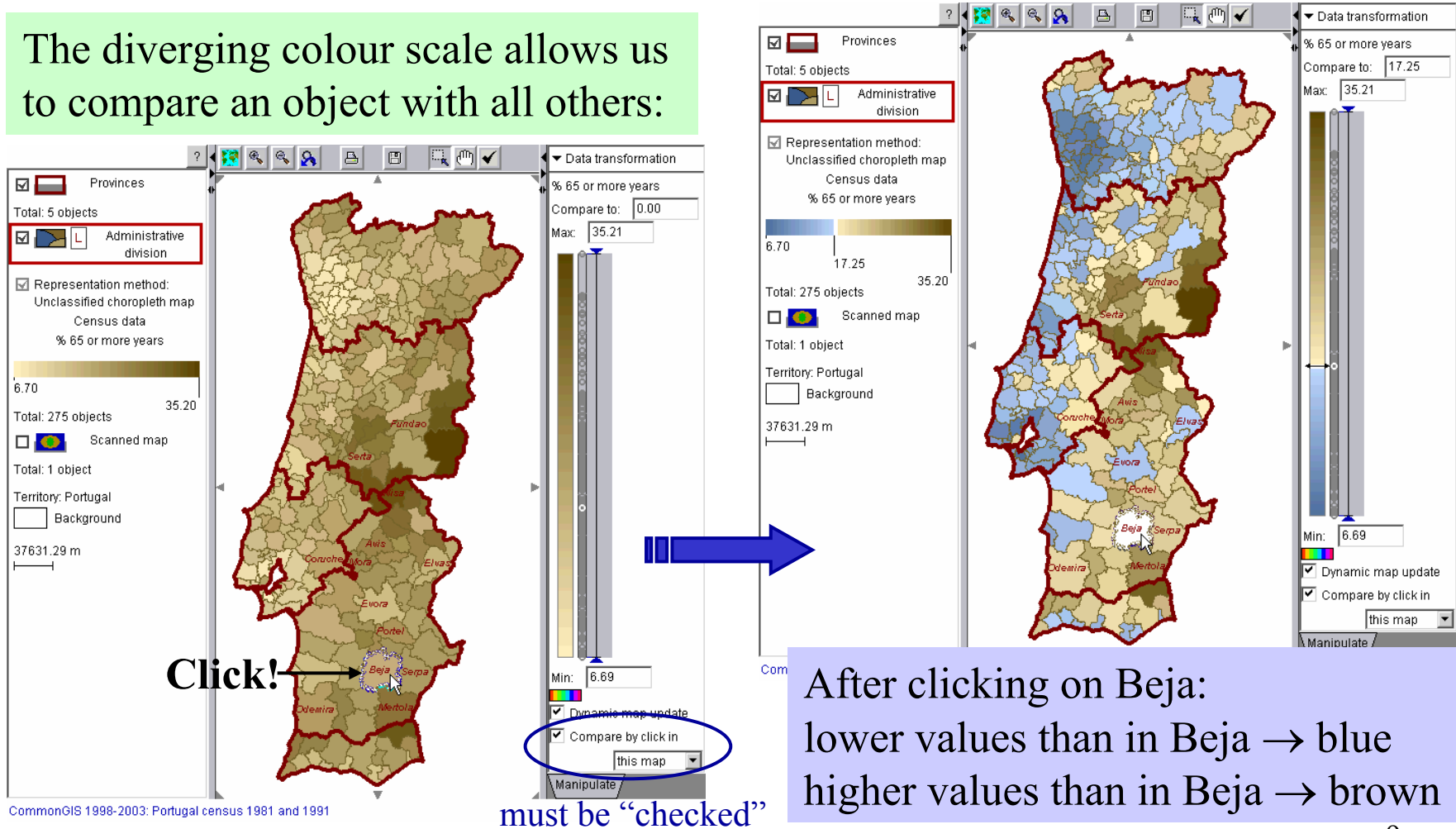
Removing Outliers (2)



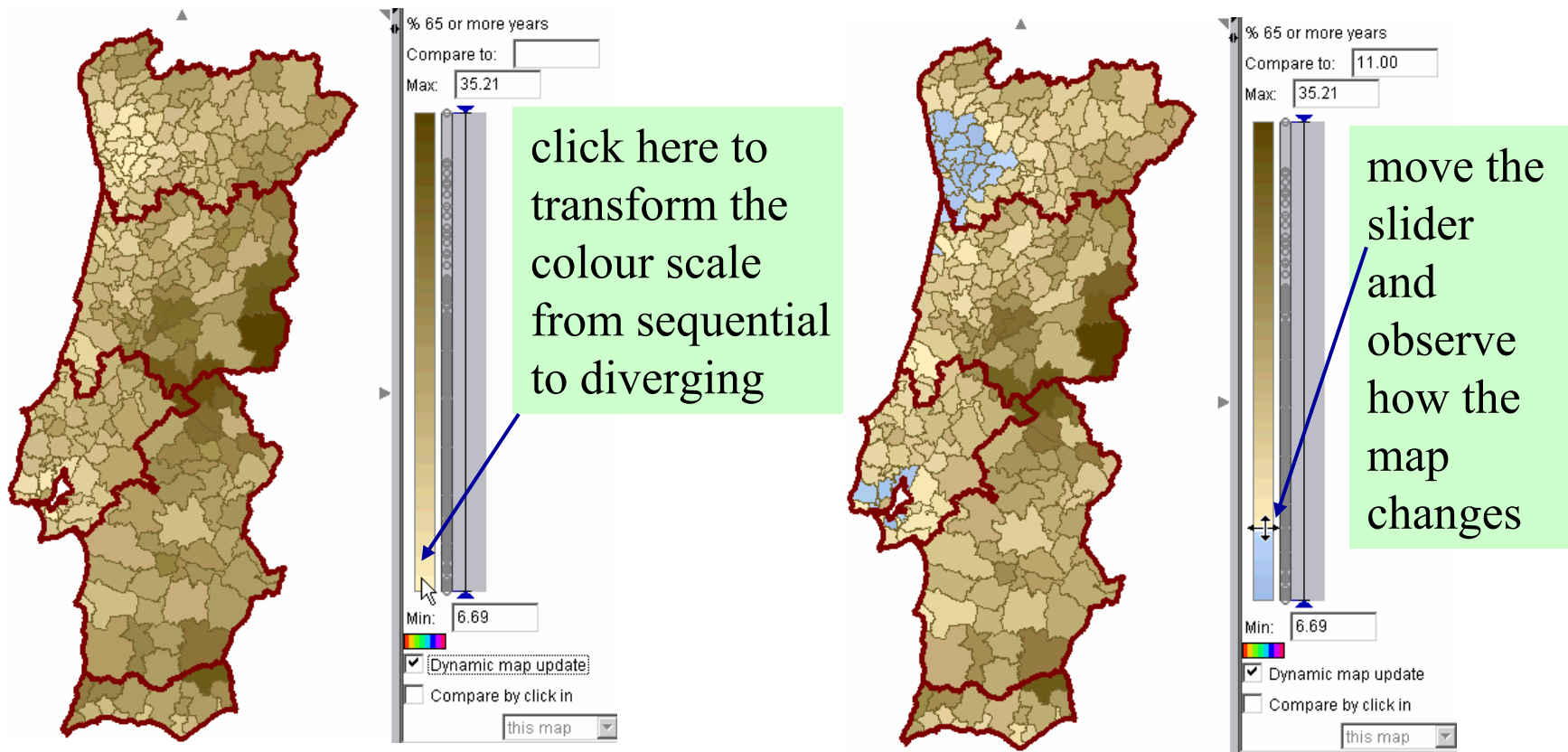
After the removal of two outliers, the differences are better seen

Object Comparison

The diverging colour scale allows us to compare an object with all others:

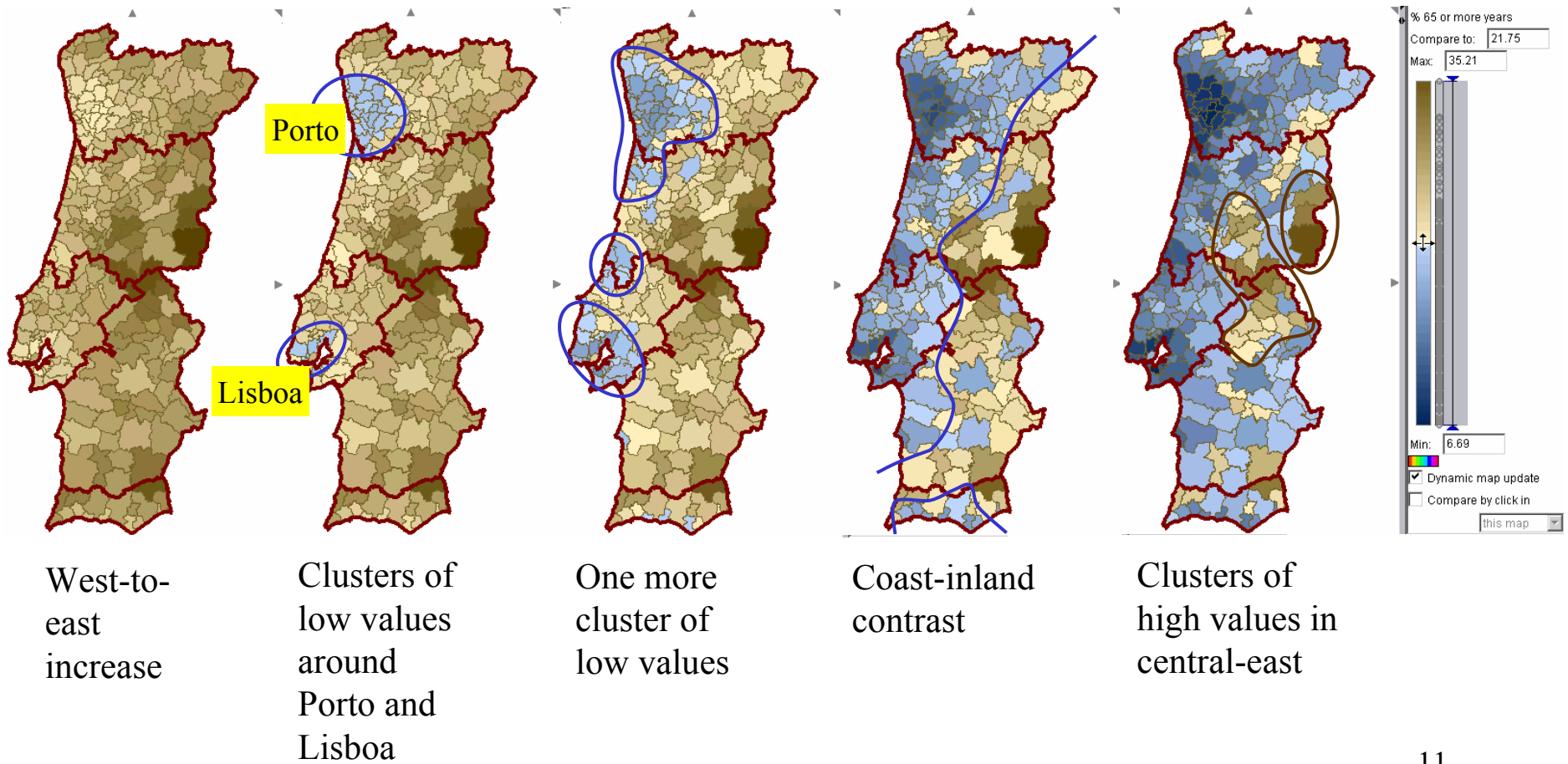


Pattern Investigation (1)

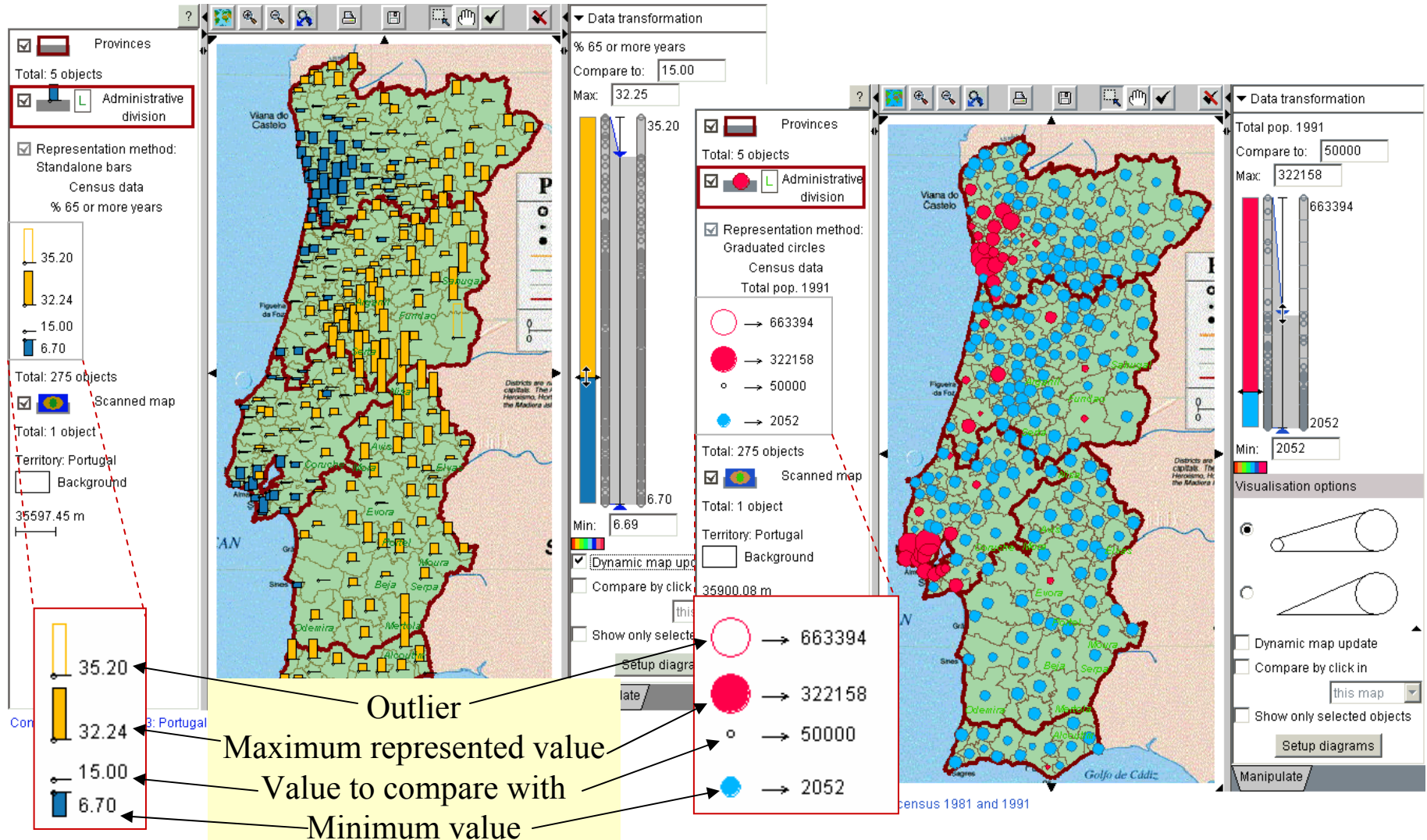


Pattern Investigation (2)

By moving the slider, we see more patterns and gain more understanding of value distribution



Focusing and Visual Comparison on Other Map Types






Piechart Map

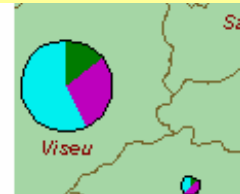
Applicable to several attributes that together give some meaningful whole

“Pie” size is proportional to the total (sum of the attribute values)

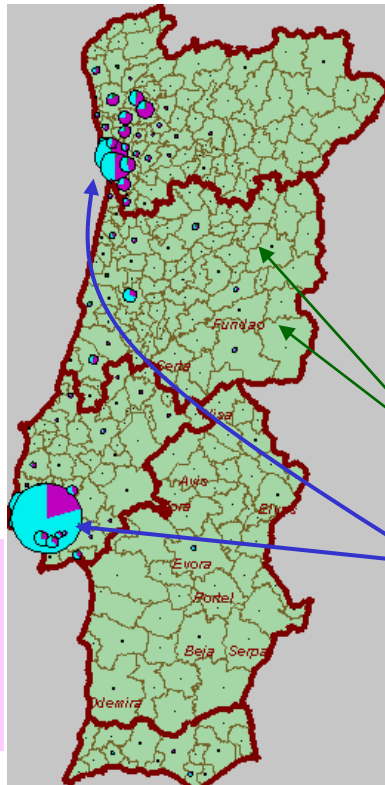
Representation method: Pies

Census data

-  total employed in agriculture 1991
-  total employed in industry 1991
-  total employed in services 1991



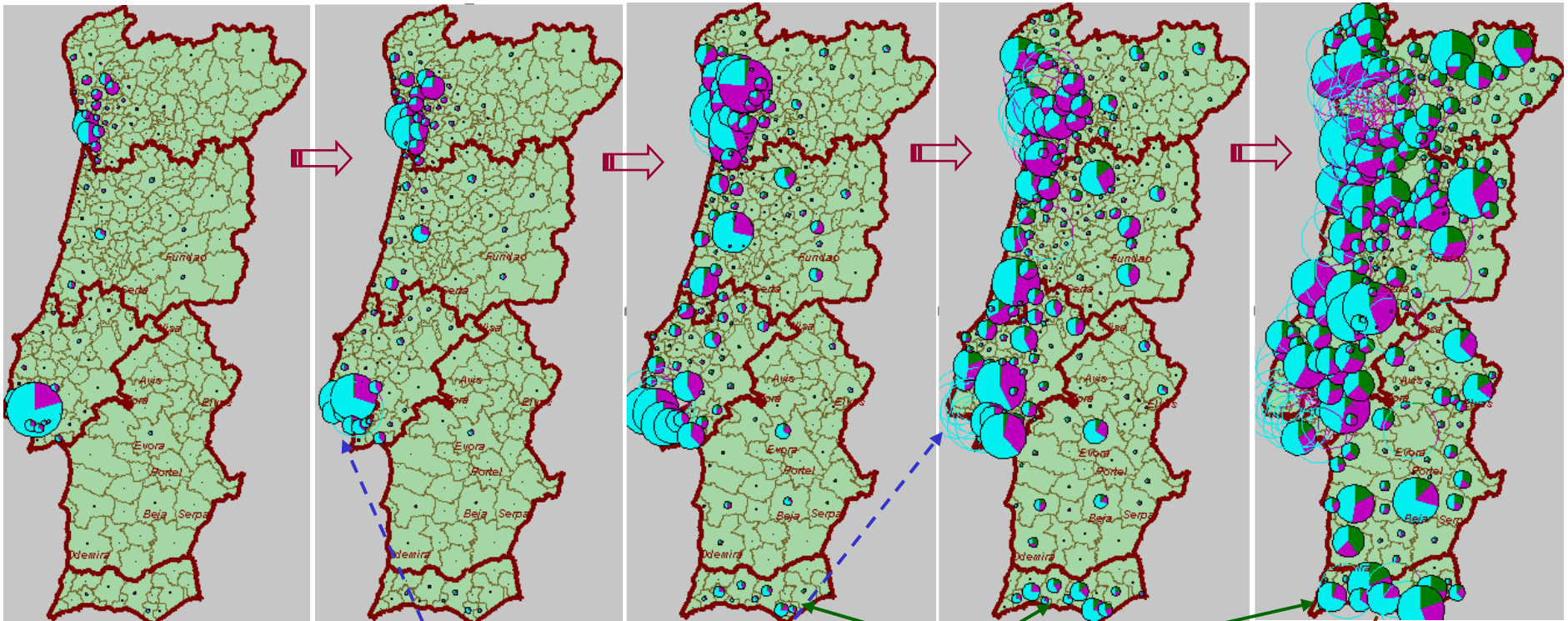
The division into slices shows proportion of each attribute in the total



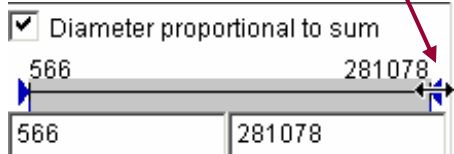
However, the map often looks like this:

Here the population is very small in comparison to the large cities. Therefore, the pies are too small to be seen

Piechart Map: Focusing

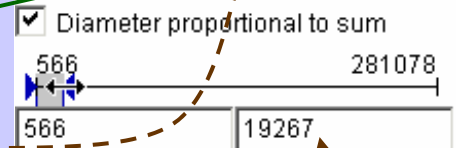


Move this delimiter to the left



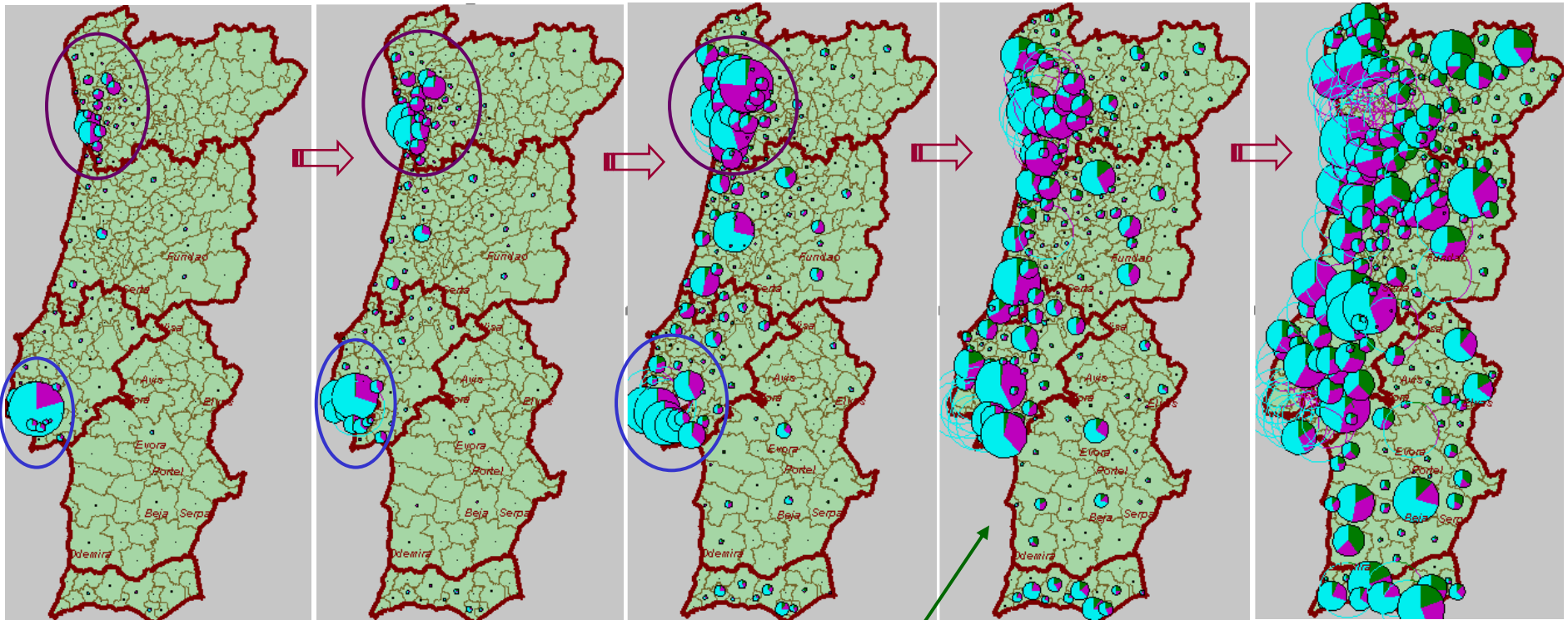
The largest pies are gradually removed (replaced by hollow circles)

The remaining pies become larger



Now the maximum pie size corresponds to this value

Focusing and Data Investigation



In districts with much population people work in industry (magenta) and services (cyan).
Northwest: more industry
Centre-west: more services

At this stage, the agricultural part (green) becomes visible

In districts with little population considerable proportion of people works in agriculture, but services still prevail

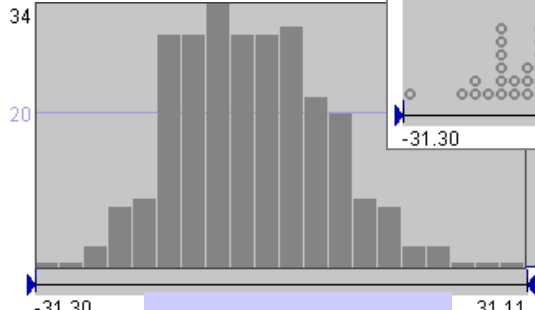
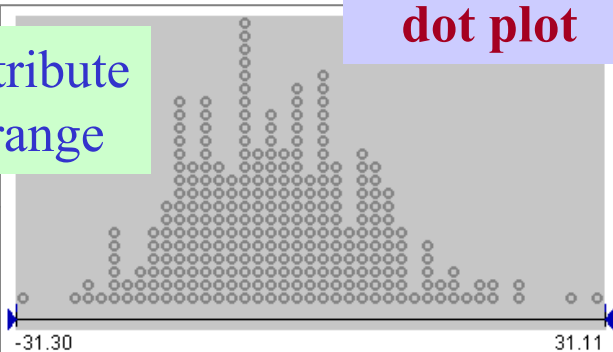
Why to Use Multiple Views?

Dot plot



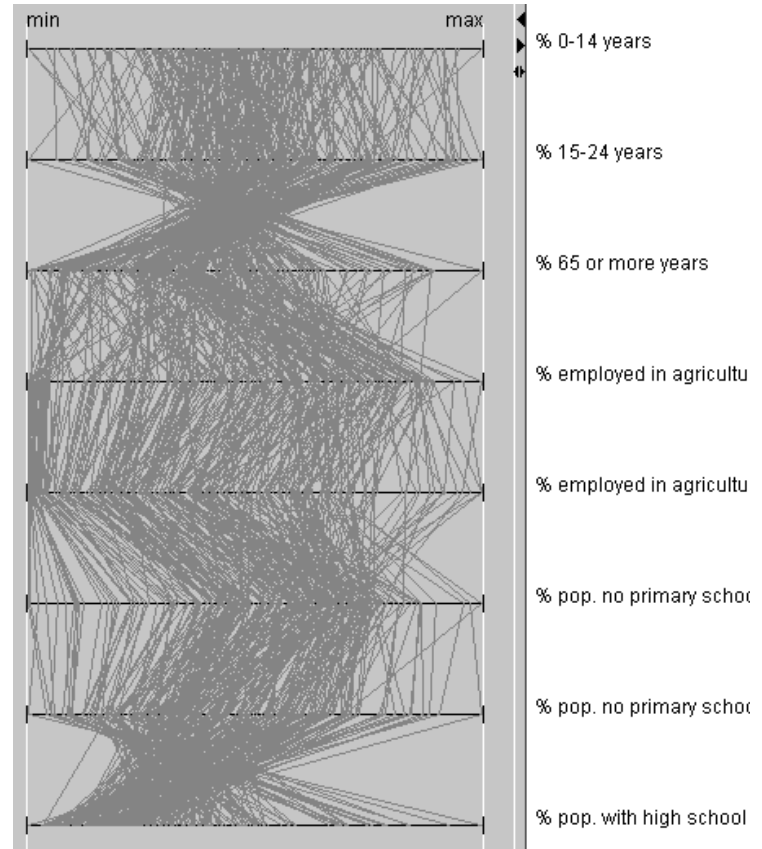
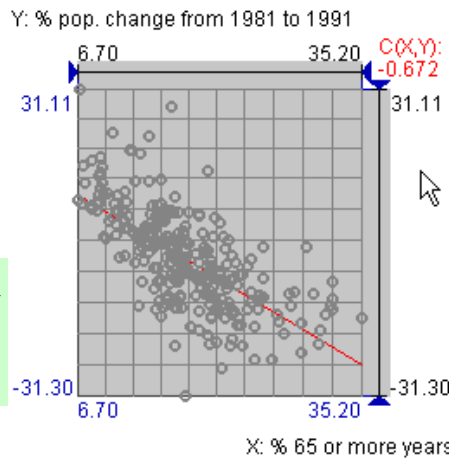
Distribution of attribute values within a range

Stacked dot plot



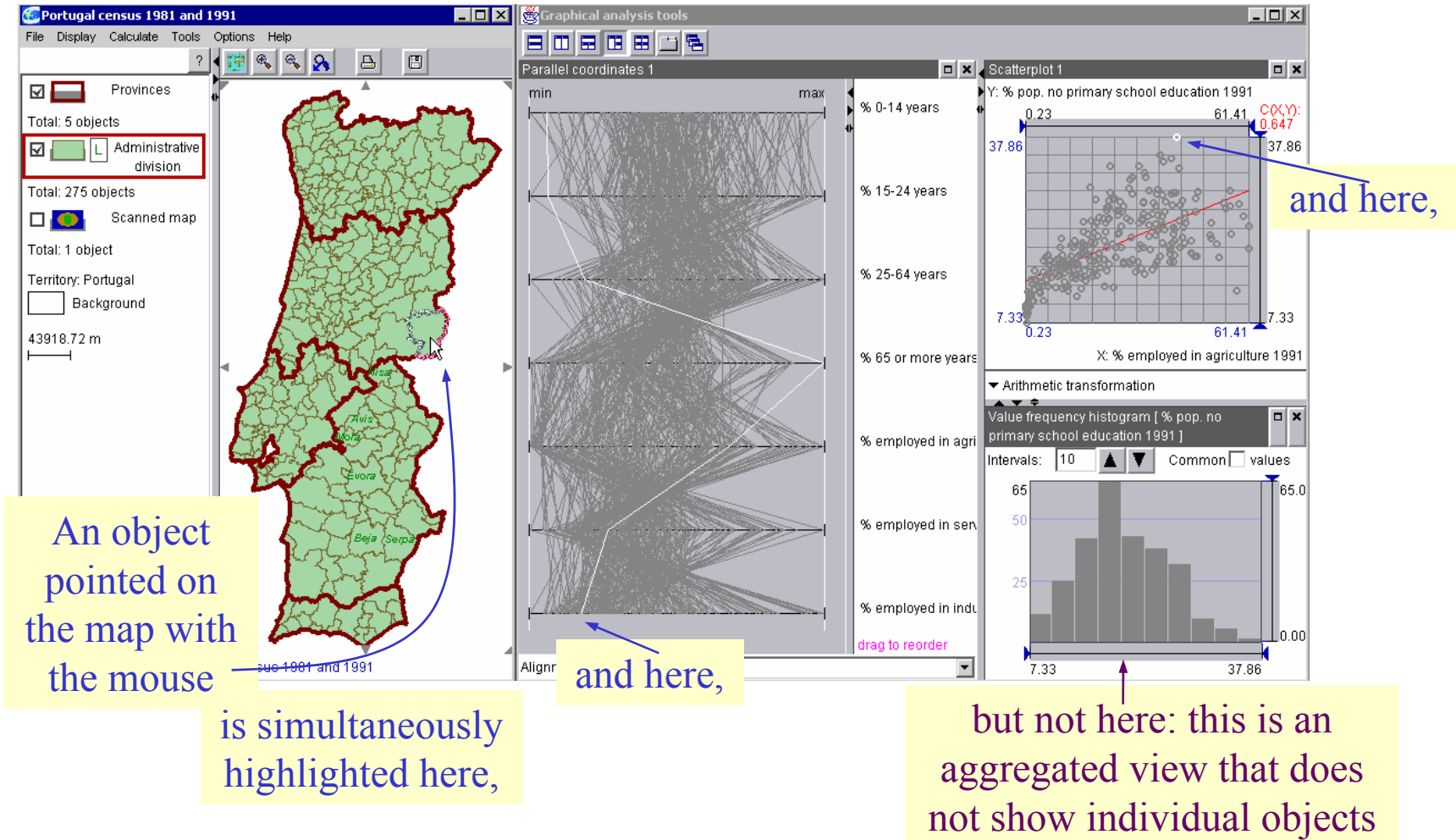
Frequency histogram

Scatter plot: shows how two attributes are related



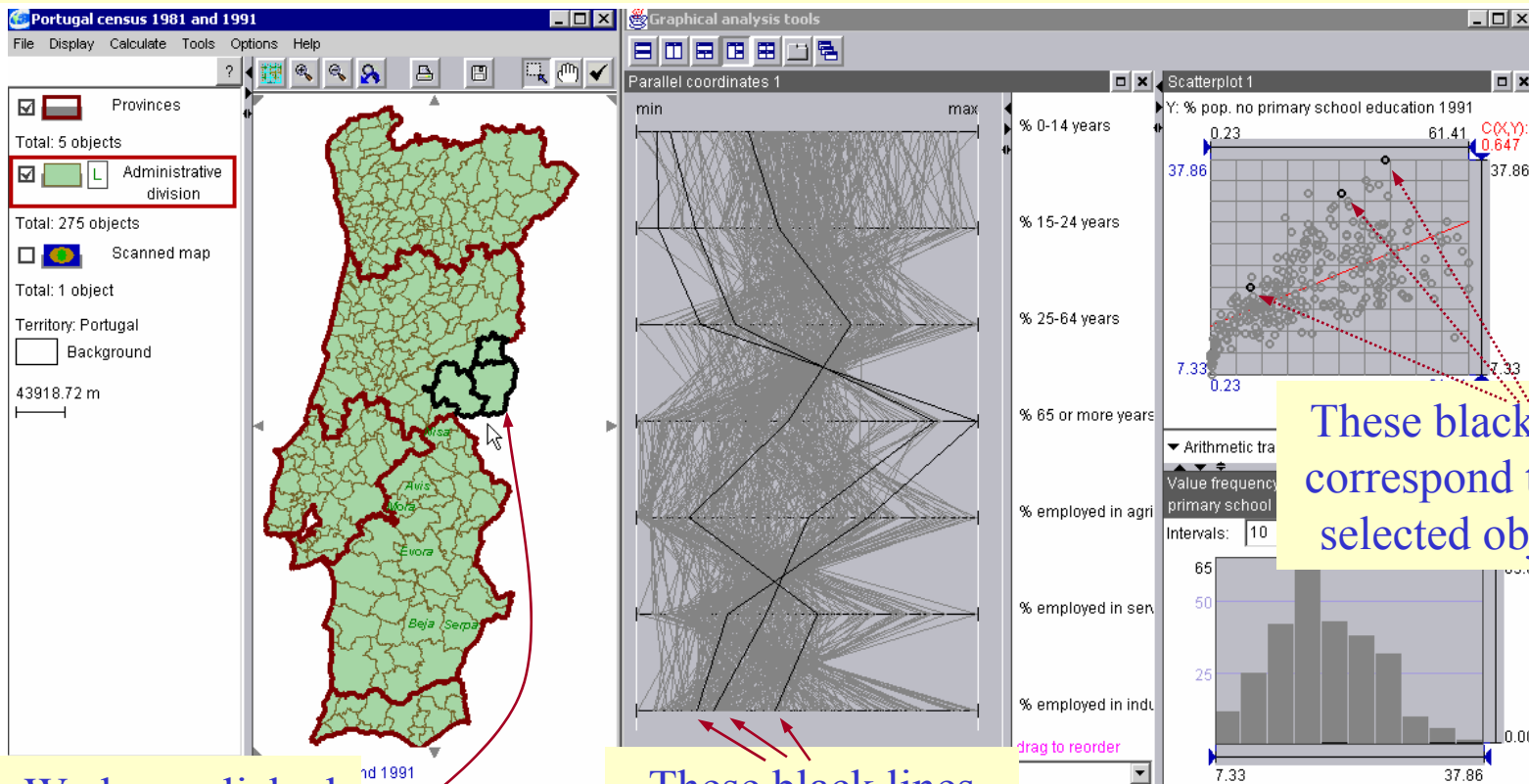
Parallel coordinates: object characteristics profiles; relationships between attributes (look at line slopes)

Display Linking by Highlighting



Display Linking by Selection

Selection (durable highlighting) does not disappear after the mouse is moved away. One or more objects may be selected e.g. by mouse-clicking on them.

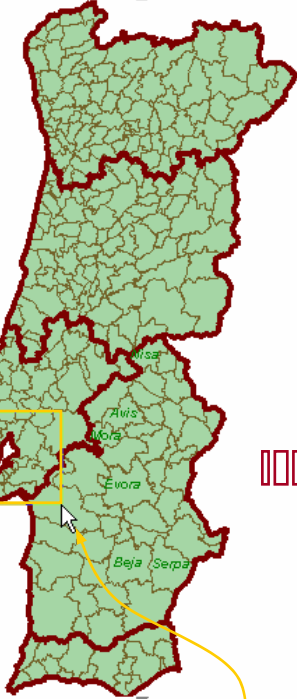


We have clicked on each of these 3 objects

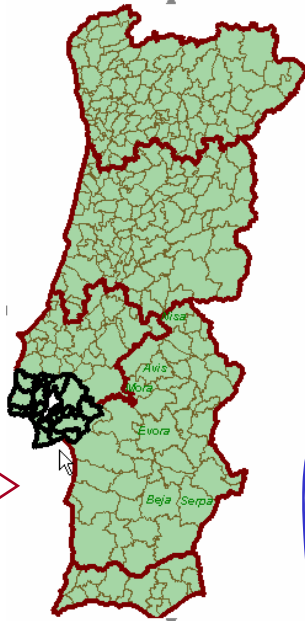
These black lines correspond to the selected objects

Using Display Linking (1)

Let us examine characteristics of districts in this area

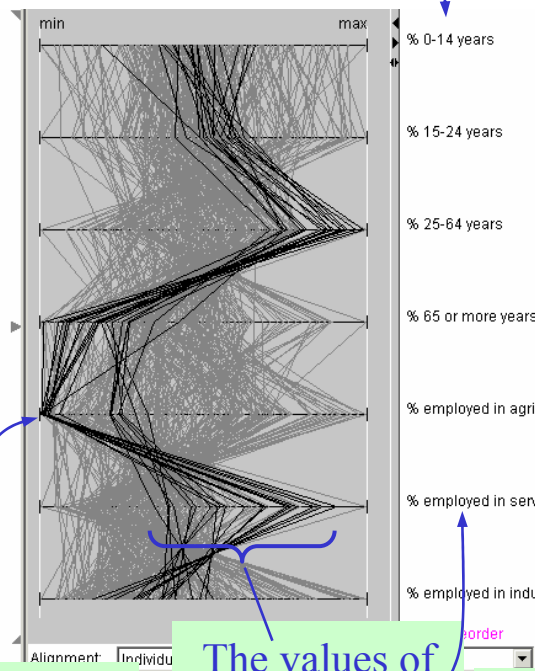


Enclose the area in a frame



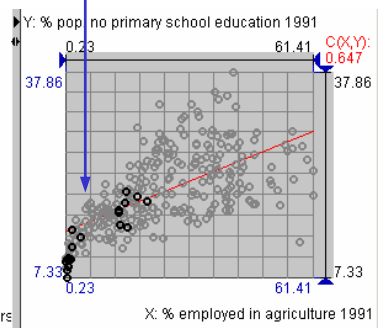
The values of this attribute are split in two groups with a gap between

The characteristics in terms of the upper 4 attributes are rather coherent

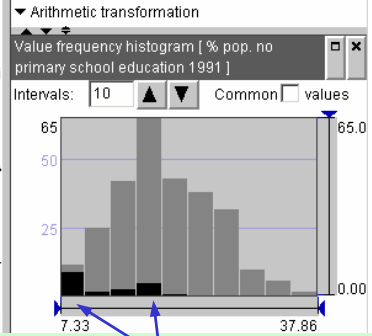


The values of this attribute greatly vary

Two distinct clusters in the value space of these two attributes

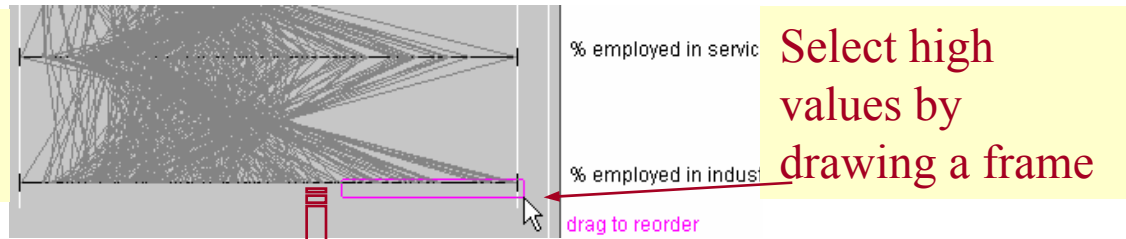


The districts fit in the left half of the histogram, mostly in bars 1 and 4



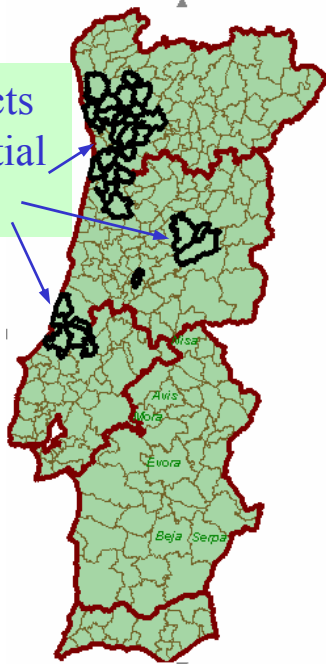
Using Display Linking (2)

Let us look at the districts with high % employed in industry:

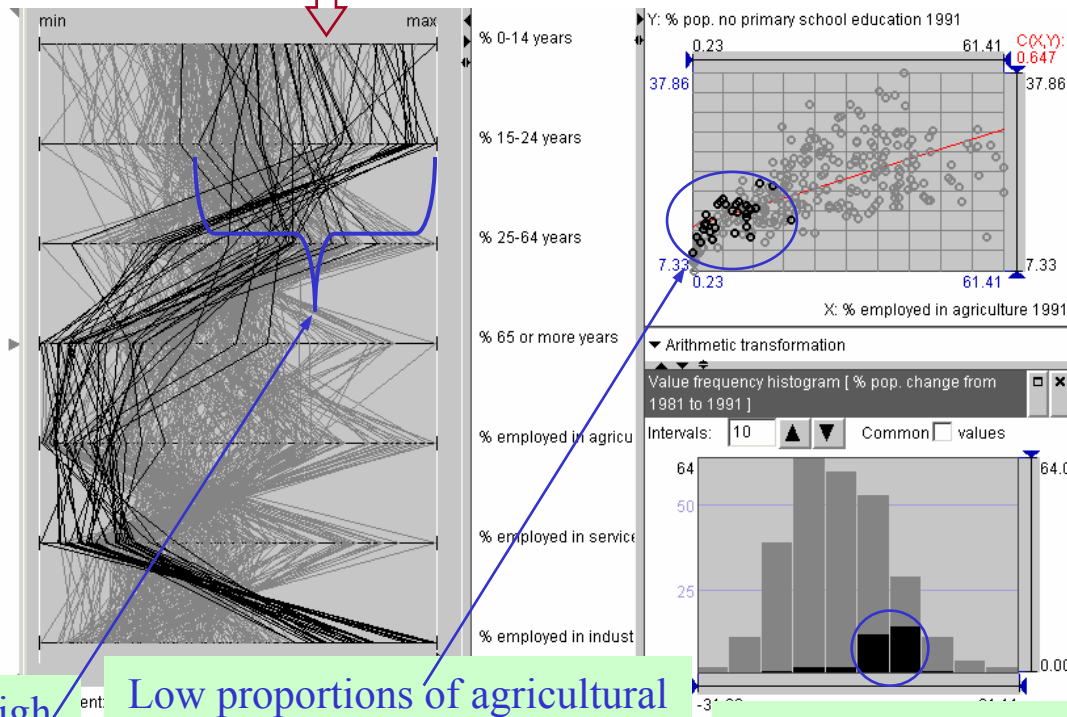


Select high values by drawing a frame

The districts form 3 spatial clusters



The districts have average or high proportions of children and young



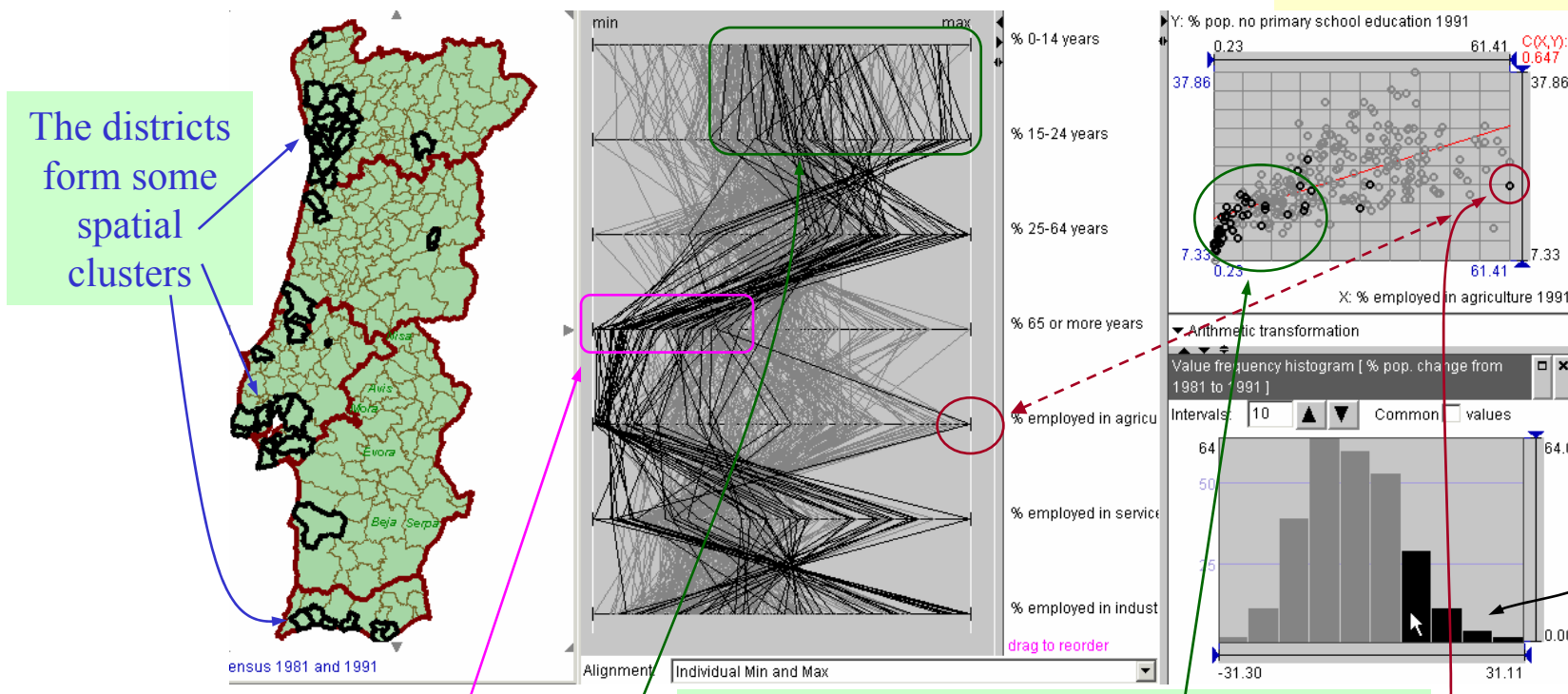
Low proportions of agricultural workers and people without primary school education

Population change: mostly between -0.1% and 12.4%

Using Display Linking (3)

Let us look at the districts with the highest population growth:

Click on the rightmost bars in the histogram



Dynamic Query

Dynamic query allows us to set constraints on attribute values

Limits the maximum value

The maximum limit can be also explicitly given

The screenshot shows a software interface titled "Dynamic Query for Census data". It features three rows of data filters, each with a slider and numerical input fields. The first row is for "% 0-14 years" with a current value of 11.13 and a maximum limit of 20.00. The second row is for "% 25-64 years" with a current value of 40.25 and a maximum limit of 56.00. The third row is for "% pop. change from 1981 to 1991" with a current value of -31.3 and a maximum limit of 31.12. To the right of the sliders, there are three horizontal bar charts showing the percentage of data points that satisfy the current constraints: 64.4% (177 from 275) for the first row, 100.0% (275 from 275) for the second, and 35.6% (98 from 275) for the third. Below the sliders, there are checkboxes for "Filter out missing values" (unchecked), "Clear all filters", "Display statistics" (checked), and "Dynamic update" (unchecked). An "Add" button is also visible. At the bottom, a status bar indicates "Query results -> Qualitative attribute".

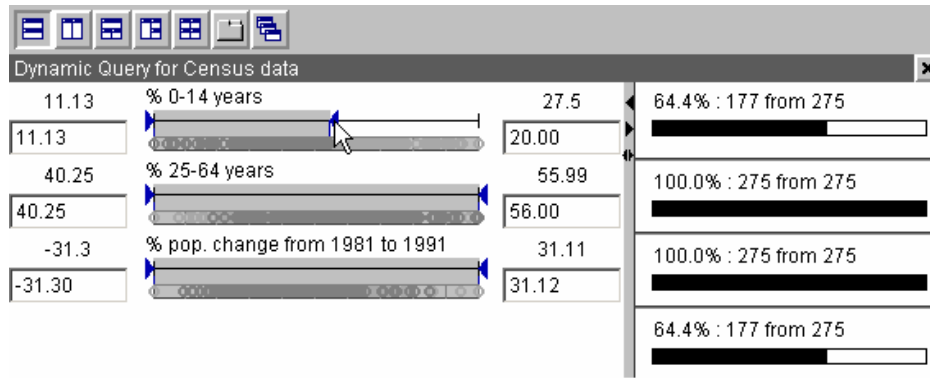
Attribute	Current Value	Maximum Limit	Statistics
% 0-14 years	11.13	20.00	64.4% : 177 from 275
% 25-64 years	40.25	56.00	100.0% : 275 from 275
% pop. change from 1981 to 1991	-31.3	31.12	35.6% : 98 from 275

The minimum limit can be also explicitly given

Limits the minimum value

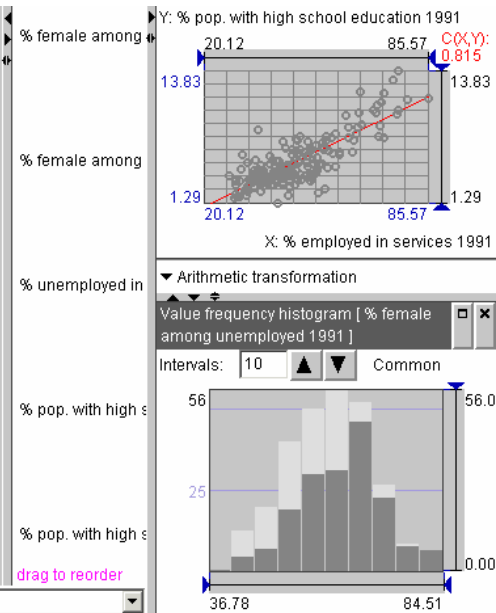
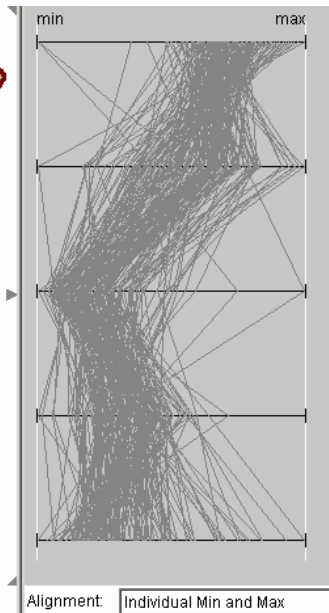
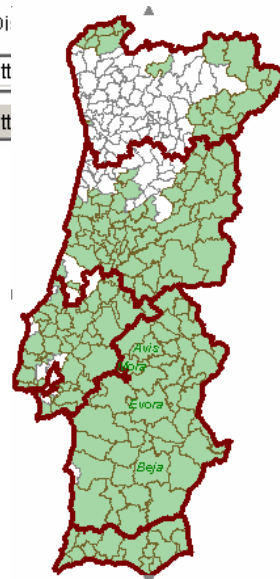
Statistics of constraint satisfaction

Dynamic Query in Action (1)



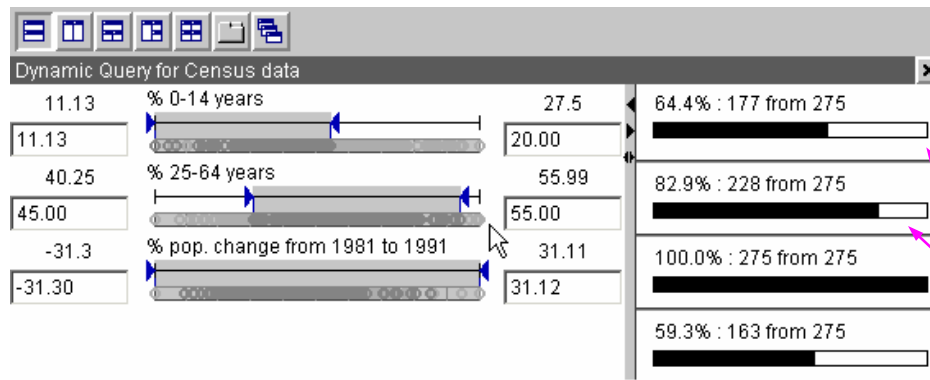
Query condition: % 0-14 years must be below 20

Filter out missing values Clear all filters Display
 Add attributes Remove att
 Query results -> Qualitative att



Query result: the objects that do not satisfy the condition has been removed from all displays

Dynamic Query in Action (2)

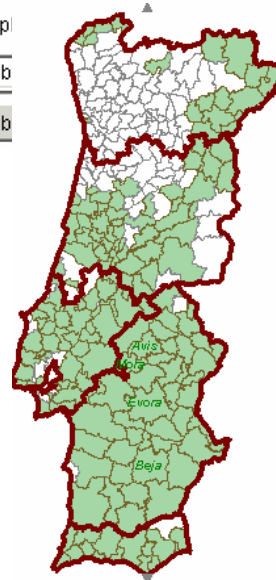


A second query condition added: % 25-64 years must be between 45 and 65

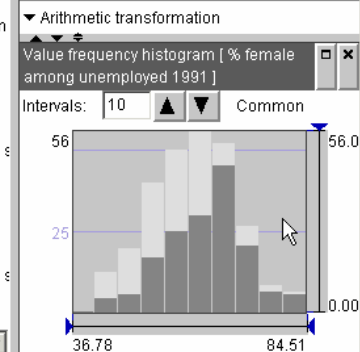
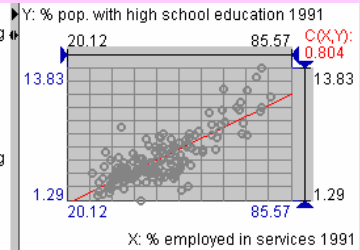
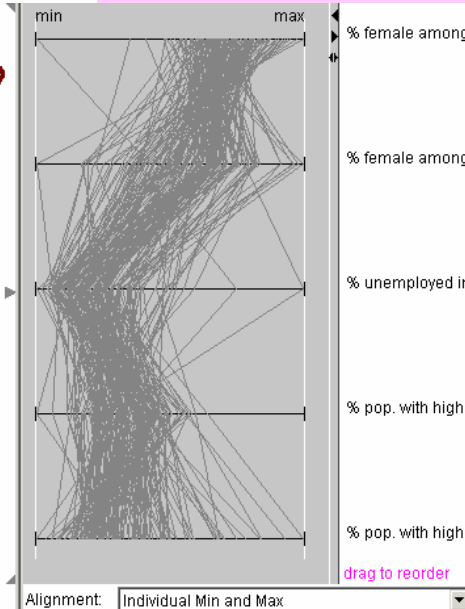
177 objects (64%) satisfy the 1st condition
 228 objects (83%) satisfy the 2nd condition
 163 objects (59%) satisfy both conditions

Filter out missing values Display

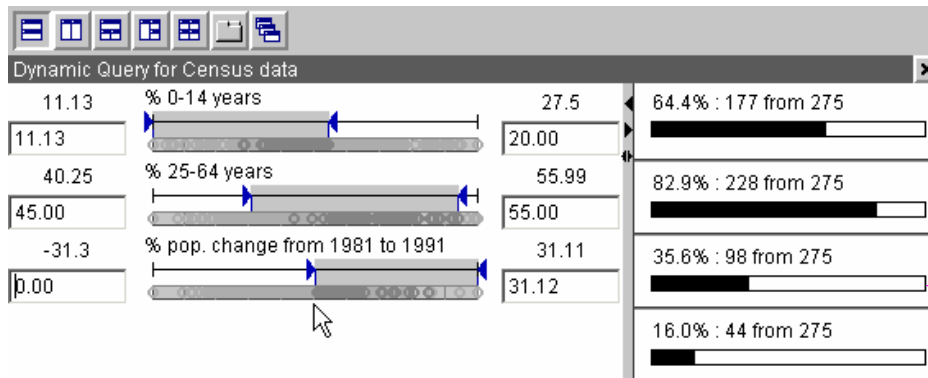
Query result changed: the objects that do not satisfy both conditions has been removed from all displays



1 and 1991



Dynamic Query in Action (3)

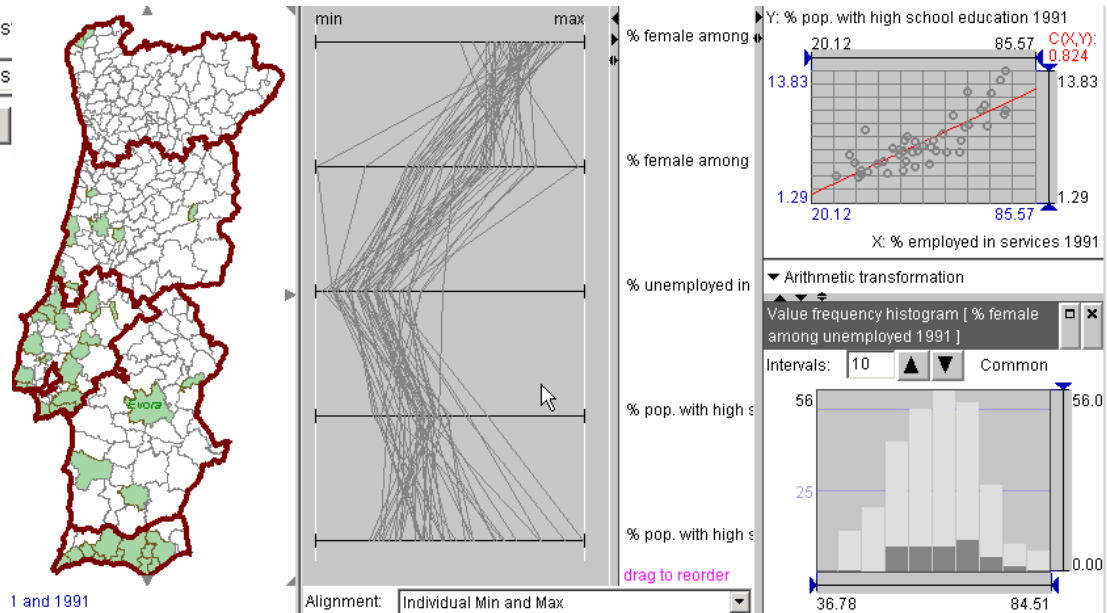


One more query condition added: % pop. change from 1981 to 1991 must be positive

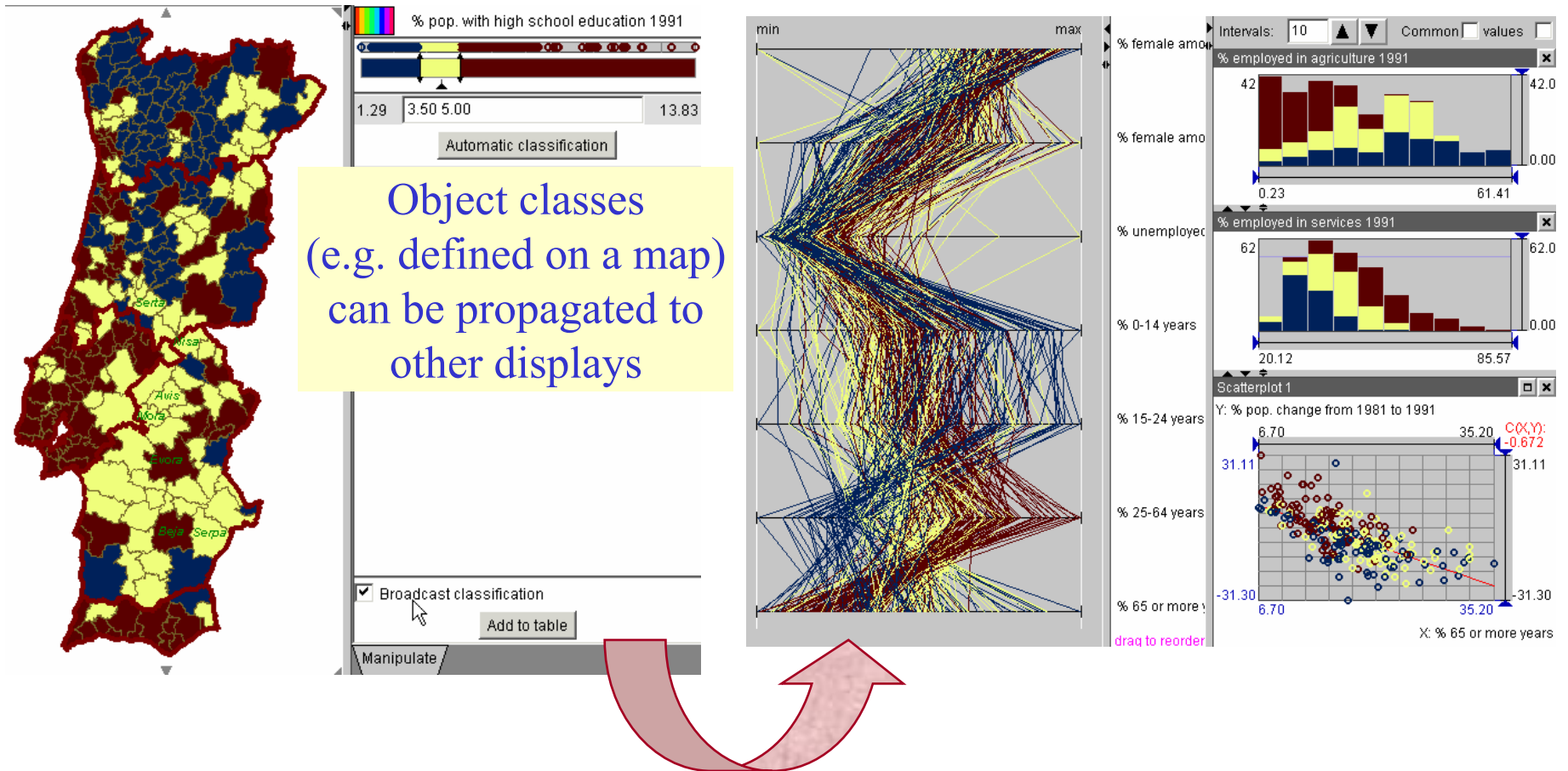
...
 98 objects (36%) satisfy the 3rd condition
 44 objects (16%) satisfy all 3 conditions

Filter out missing values Display s

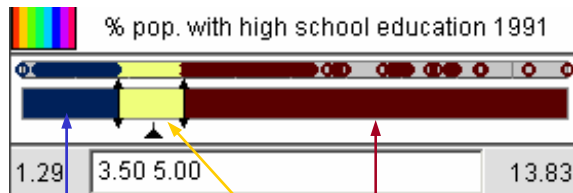
Now the objects that do not satisfy all 3 conditions has been removed from all displays



Propagation of Object Classes



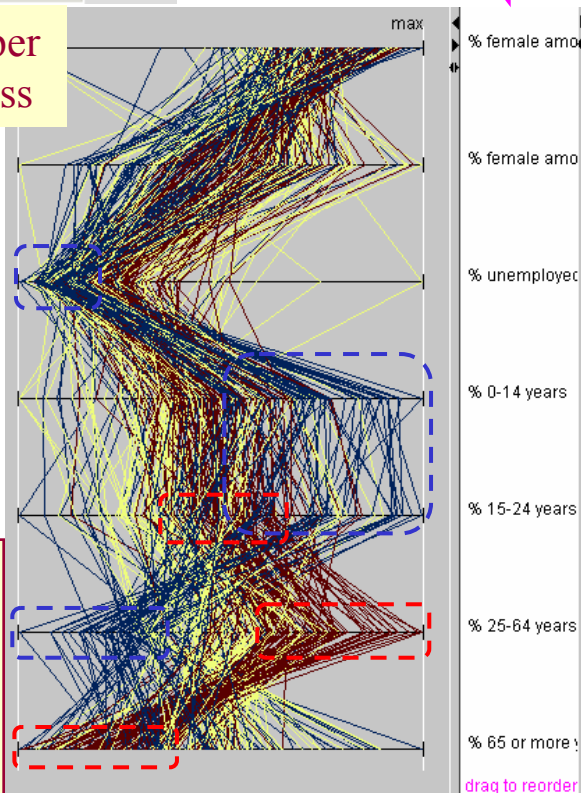
Propagation of Object Classes: Use Example



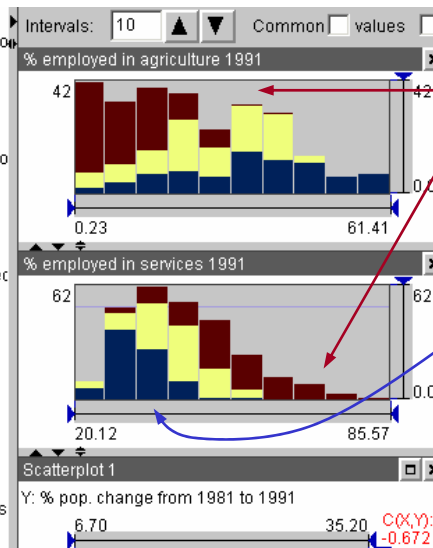
lower class middle class upper class

Lower class prevails among districts with low % unemployed, average or high % 0-14 years and % 15-24 years, and low % 25-64 years

Upper class prevails where % 25-64 years is high and % 65 or more years is low. It occupies mostly the middle part of the axis % 15-24 years.



Characteristics of the middle class are highly variant



Upper class co-occurs with low % employed in agriculture and average to high % employed in services

Lower class co-occurs with low % employed in services

In districts with high % employed in agriculture the proportion of people with high school education is low (mostly below 3.5%). For % employed in services we see the opposite relationship

Table View and Table Lens (1)

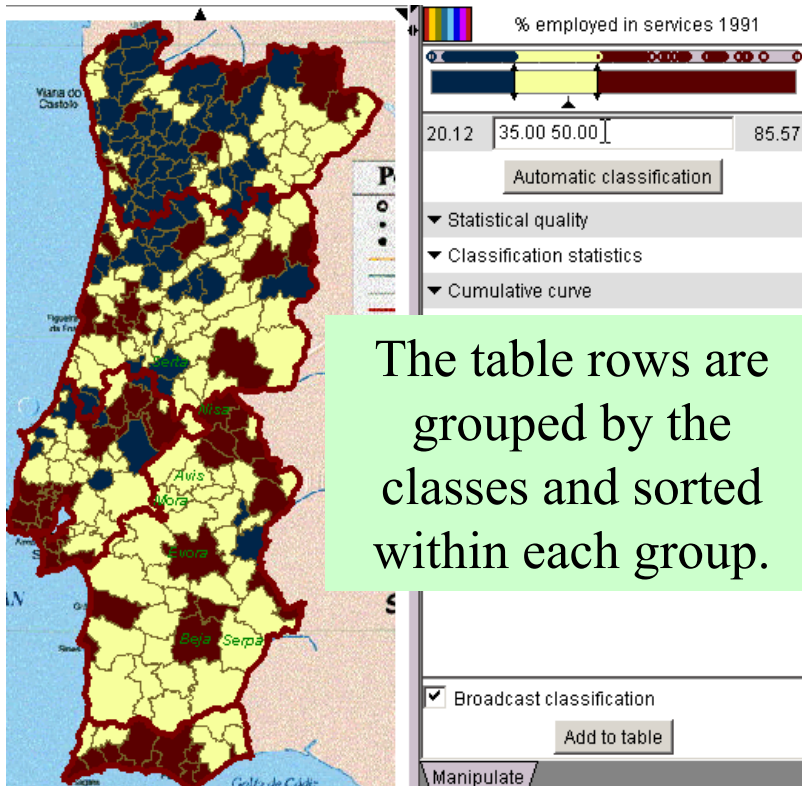
Click for sorting

Table cell shading shows the relative position of the values between the minimum and maximum values of the respective attributes

<input type="checkbox"/> identifiers	Pop. density 1981	Pop. density 1991	% pop. no primary school education 1981	% pop. no primary school education 1991	% pop. with primary school education 1981	% pop. with primary school education 1991	% pop. with high school education 1981	% pop. with high school education 1991
Lisboa	9636.423	7912.43	37.26	8.51	39.49	25.45	7.675	11.11
Porto	7858.089	7260.49	37.32	8.83	39.97	26.22	8.756	9.84
Amadora	6895.481	7454.641	40.41	9.68	38.66	25.18	9.941	10.80
Oeiras	3257.592	3301.527	37.89	7.33	32.80	18.69	10.444	13.83
Barreiro	2796.012	2723.485	40.64	10.01	39.09	28.16	10.089	9.85
Matosinhos	2190.979	2434.703	42.45	11.01	40.12	29.08	9.857	7.78
Almada	2110.581	2169.072	40.58	10.26	38.49	25.99	8.813	10.66
Sao Joao da Madeira	2027.62	2275.216	41.12	10.21	39.62	28.59	9.658	7.68
Espinho	1513.025	1631.933	44.68	11.37	35.82	27.50	10.919	7.56
Cascais	1457.75	1579.276	39.37	8.92	34.97	21.13	9.718	12.95
Loures	1419.716	1654.349	40.84	10.29	39.32	27.12	9.950	10.09
Vila Nova de Gaia	1324.968	1455.128	43.66	11.61	39.18	29.86	10.352	7.07
Gondomar	981.172	1074.426	43.20	12.31	39.93	29.72	10.493	6.93
Maia	975.854	1112.915	44.45	11.71	39.08	30.47	10.406	7.07
Moita	966.594	1181.663	46.27	14.50	37.64	26.61	9.123	7.71
Seixal	952.844	1249.3	41.18	10.15	38.33	24.60	10.375	11.15
Valongo	880.038	1016.194	42.80	11.90	39.94	30.70	11.492	6.40
Entroncamento	874.161	1038.394	38.51	9.10	40.18	26.73	7.952	11.22

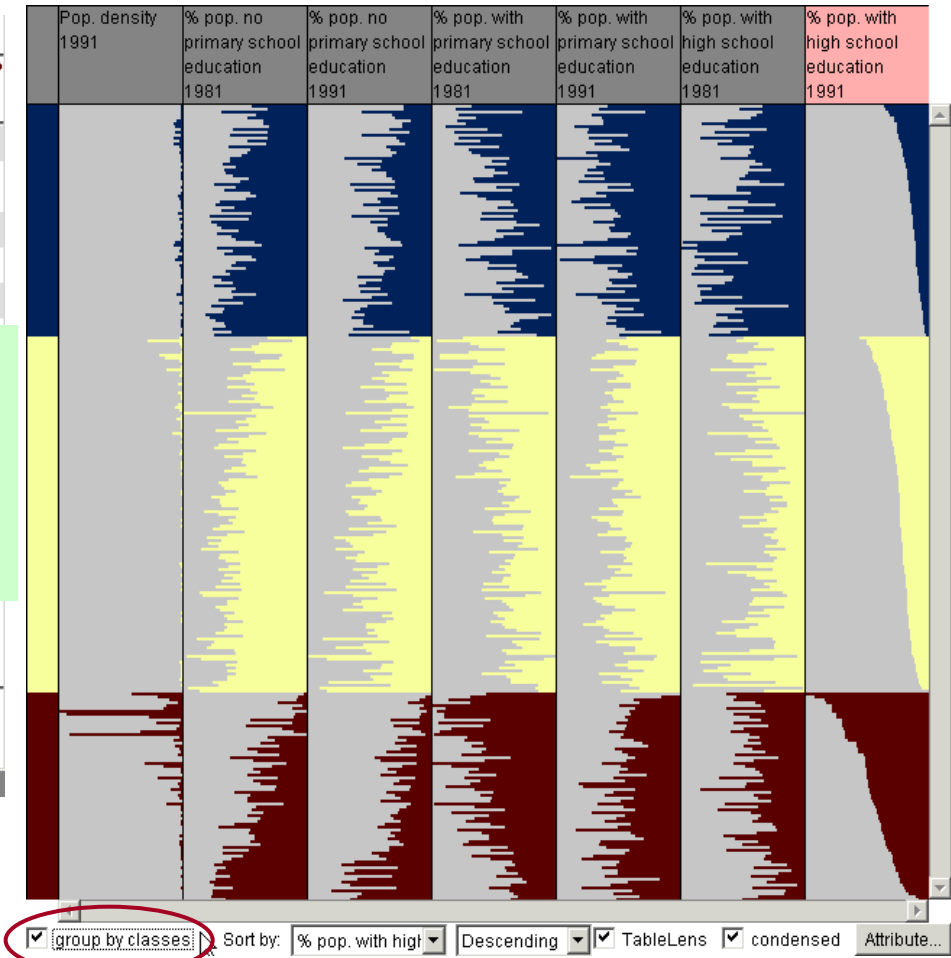
Sort by: Pop. density 1981 Descending TableLens condensed Attribute...

Class Propagation to Table View (1)



The table rows are grouped by the classes and sorted within each group.

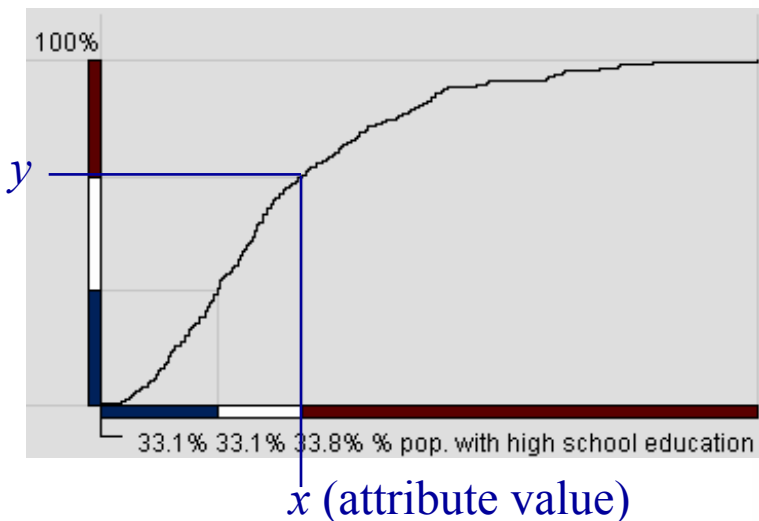
These linked views show us, for example, that the general educational level tends to be higher in districts with high proportion of people employed in services



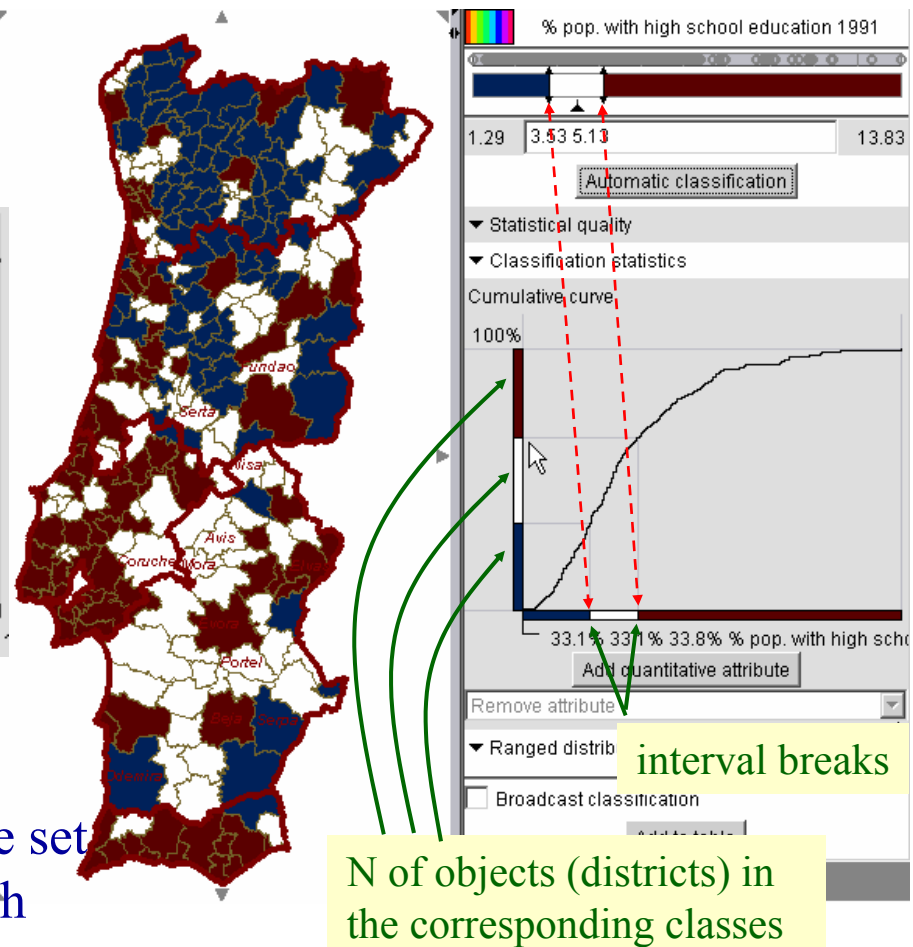
Dynamic Classification: Additional Analytical Facilities

Cumulative Frequency Curve

How it is built:



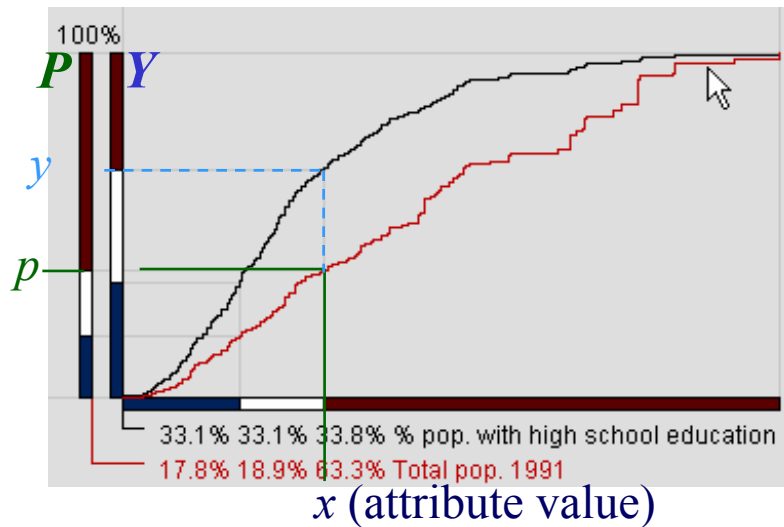
X -axis: attribute's value range
 Y -axis: object number or % of the whole set
 y is the number of objects (districts) with values less than or equal to x



Cumulative Curve: an Extension

Cumulative Population Curve

How it is built:



X -axis: attribute's value range

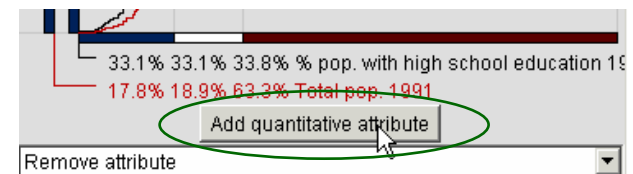
Y -axis: object number or % of the whole set

P -axis: population number or % of the whole country's population

p is the **aggregate population** of districts with values less than or equal to x

What we can learn about the distribution of the population over the classes:

% pop. with high school education (classes)	N of districts	Aggregate population (% of country's total)
up to 3.53	91 (33.1%)	17.8%
over 3.53 up to 5.13	91 (33.1%)	18.9%
over 5.13	93 (33.8%)	63.3%

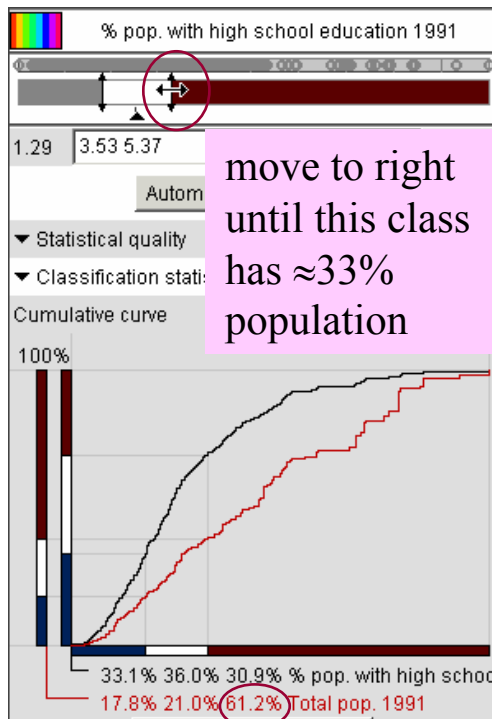


...and any other quantitative (summable) attribute can be analogously considered

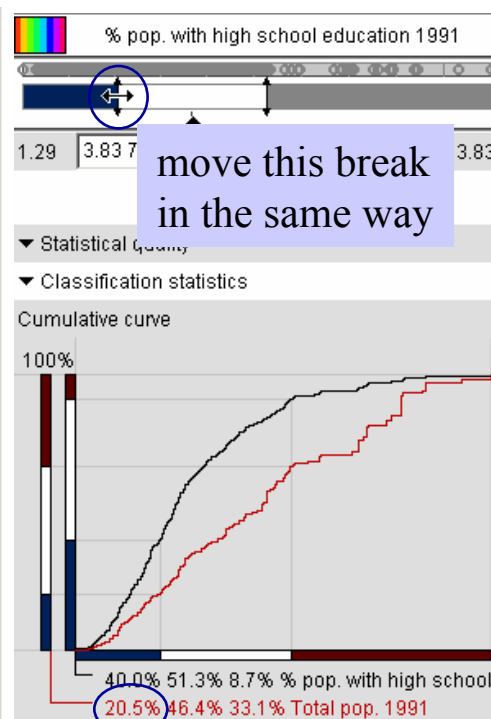
Using Cumulative Curves (1)

Let us move the breaks so that the classes have approx. equal population

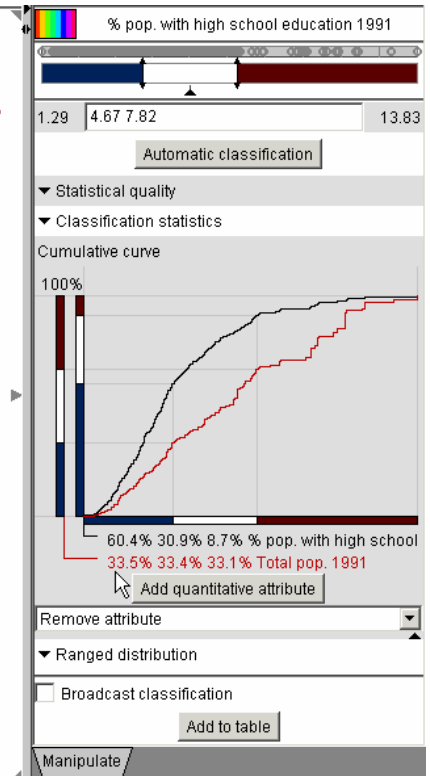
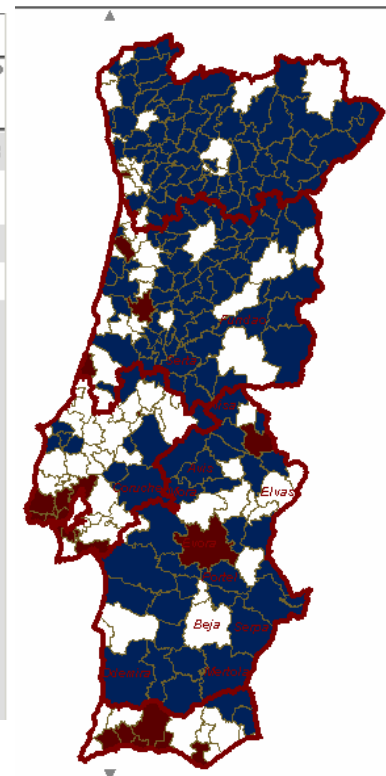
And here is the result:



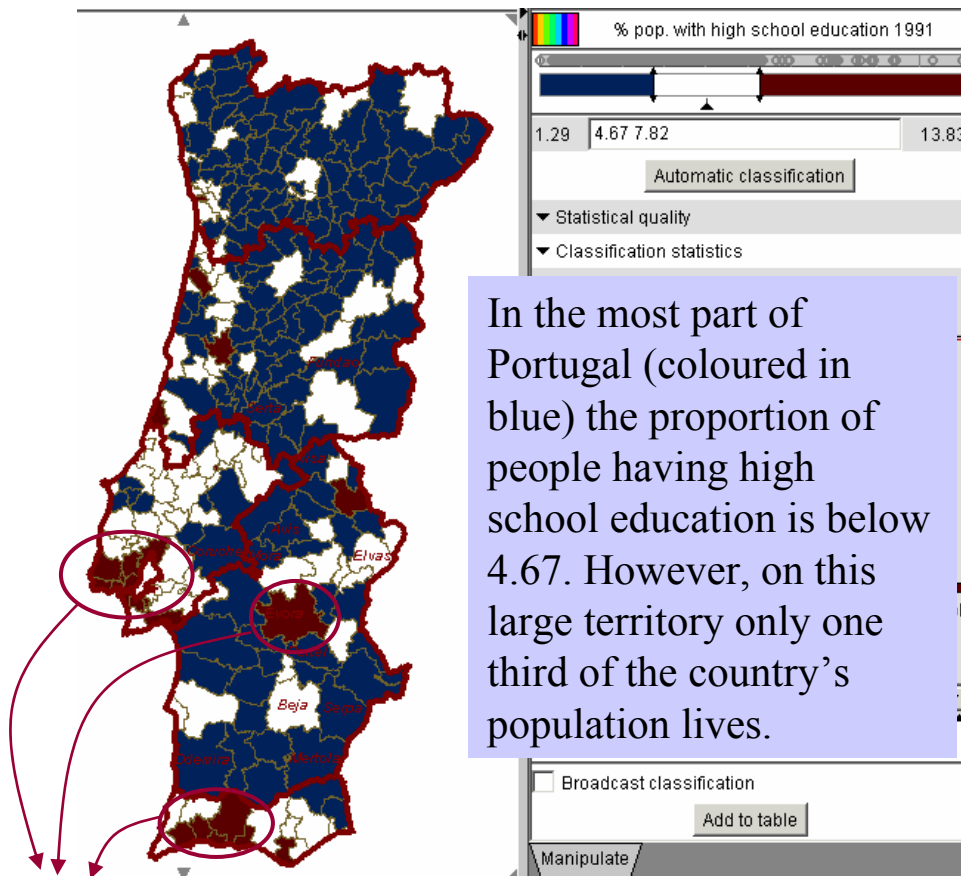
Look here!



Look here!



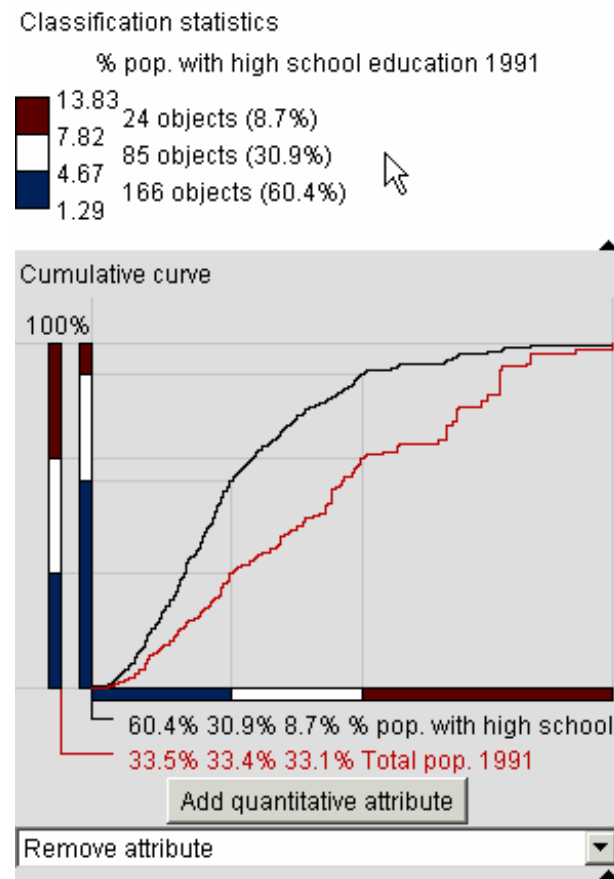
Using Cumulative Curves (2)



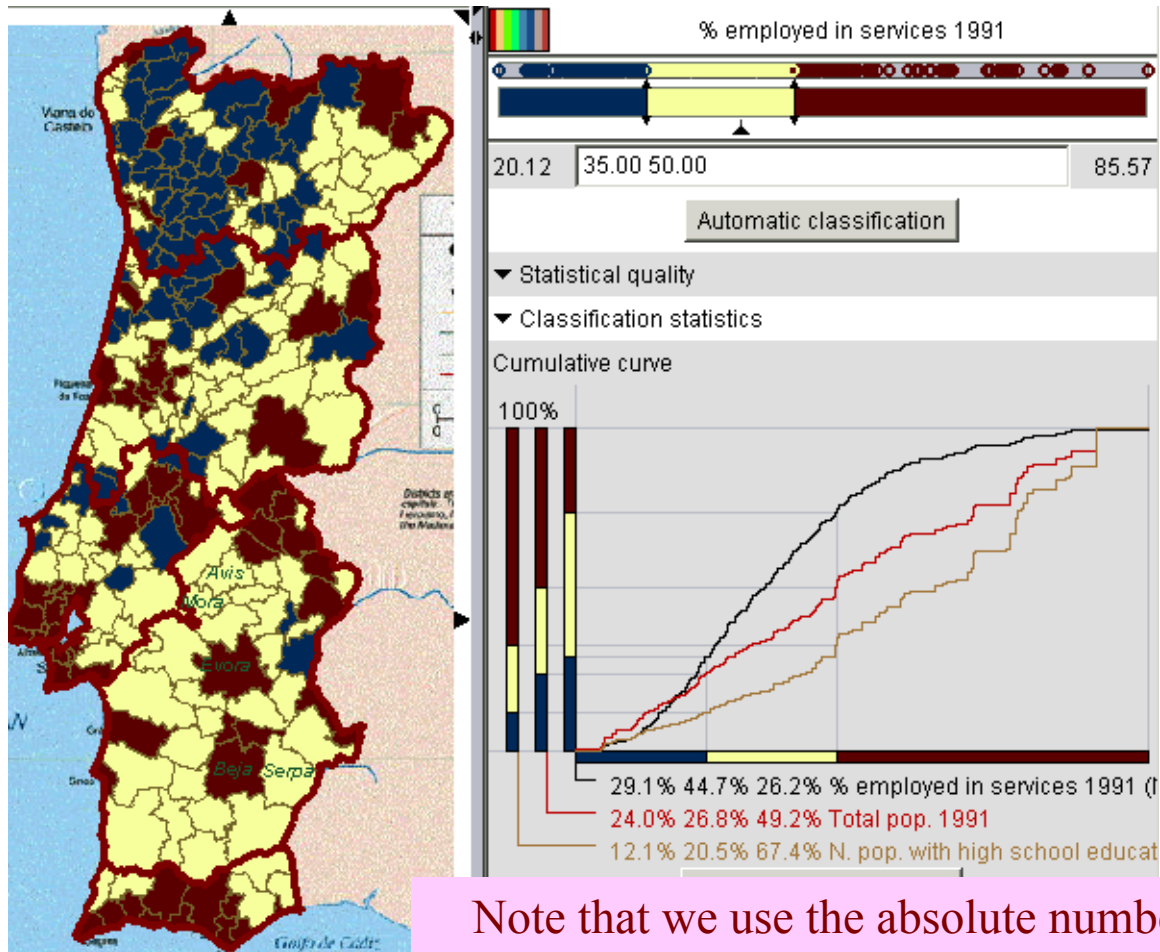
In the most part of Portugal (coloured in blue) the proportion of people having high school education is below 4.67. However, on this large territory only one third of the country's population lives.

In these areas over 7.82% people have high school education. Here lives 33.1% of the total country's population.

Some statistics about the result:



Some More Discoveries with Cumulative Curves



Cumulative curves can also tell us about the relationship between employment in services and educational level.

In 26.2% districts of Portugal 50% or more working people are employed in services. In these districts, almost a half (49.2%) of the total country's population lives and 67.4% of all people having high school education.

Note that we use the absolute number of people with high school education rather than the proportion.

Summary

This lection was supposed to

- introduce the concept of analytical interactive maps
- stress the importance of exploring various aspects of data using multiple views
- demonstrate some types of non-cartographic displays useful in analysis of geodata
- demonstrate various techniques of display linking
- show how to use this in data analysis

See also

- Natalia and Gennady Andrienko
Exploratory Analysis of Spatial and Temporal Data
A Systematic Approach
Springer-Verlag, December 2005

section 4.8, pp.428-449

