### Visualising Relationships between Multi-Species Measures of Biodiversity and the Environment

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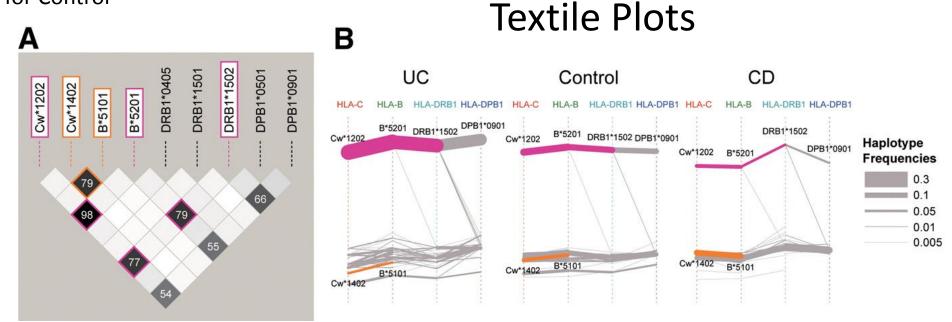
# Outline

- Data Visualisation
- What is Textile Plot?
- GBR data
- Exploratory analysis through Textile Plot
- Grouping taxa through Textile Plot

# The aim of data visualisation

- Illustrate current status
  - Plant status
  - Network status
- Illustrate result
- Explore original data
  - High dimensional
  - Large data (records)
  - View the data as it is
  - Mixed data types
    - Numeric, Logical or Categorical
  - Help understanding of data

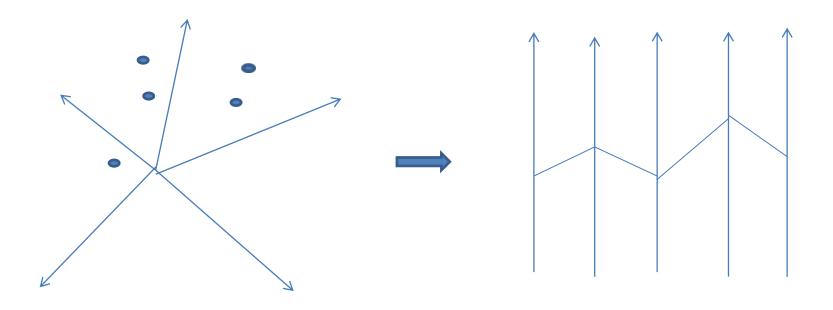
LD triangular display with squared correlation coeffients for Control



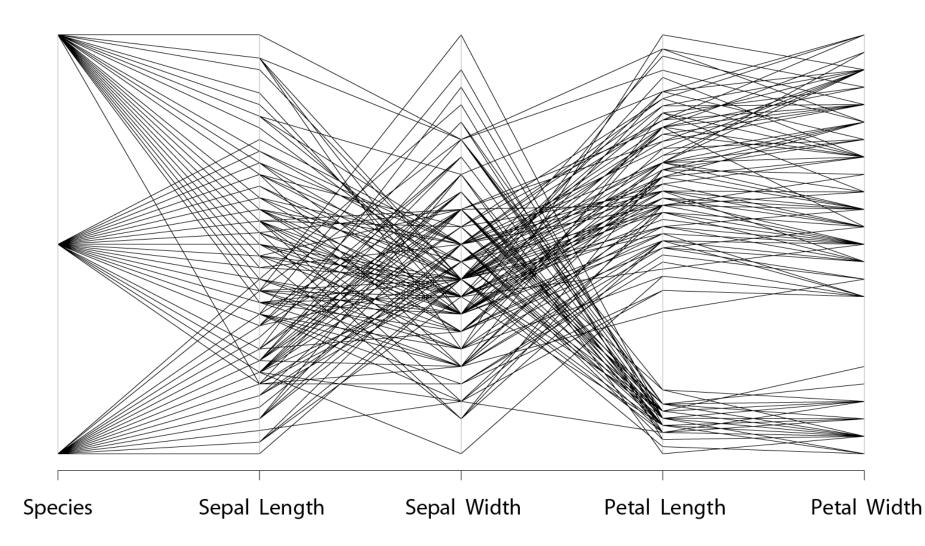
Categorical 4 Variables: HLA-C, HLA-B, HLA-DRB1, HLA-DPB1

Easier to grasp whole picture of data More details if necessary

#### Parallel Coordinate Plot







### Parallel Coordinate Plot

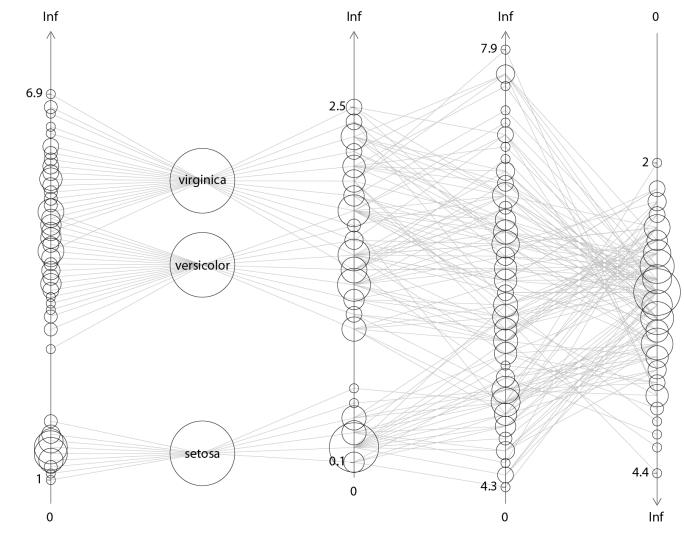
- ✓ High dimensional
- ✓ Large data (records)
- $\checkmark$  View the data as it is
- Mixed data types
  - Numeric, Logical or Categorical

Proper choice of coordinates

Help understanding of data

Proper choice of scale and location for each axis

Edsall, 2002, Unwin et al., 2003, Tory et al., 2004,



species peral with sepal Length



Iris Flower

PetalLength

### Horizontalisation Criterion

 Choose location and scale of each axis so that connected lines become as horizontal as possible

$$\mathbf{y}_j = \alpha_j \mathbf{1} + \beta_j \mathbf{x}_j$$
: coordinates on each axis  $j = 1, 2, ..., p$ 

$$\sum_{j=1}^{p} \|\mathbf{y}_{j} - \boldsymbol{\xi}\|^{2} \xrightarrow[\alpha_{j},\beta_{j},j=1,...,p,\boldsymbol{\xi}]{\min}$$

n

Kumasaka and Shibata, High-dimensional data visualisation: The textile plot. 2007, Computational Statistics and Data Analysis

$$\sum_{j=1}^{p} \|\mathbf{y}_{j} - \boldsymbol{\xi}\|^{2} = \sum_{i=1}^{n} \left( \sum_{j=1}^{p} (y_{ij} - \boldsymbol{\xi}_{i})^{2} \right) \to \min$$

 $\xi_i$ : horizotal level of the *i* th record

$$\sum_{j=1}^{p} (y_{ij} - \xi_i)^2$$
: squared deviance of the *i* th record

from the horizontal level  $\xi_i$ 

### Mixed Data Type Case

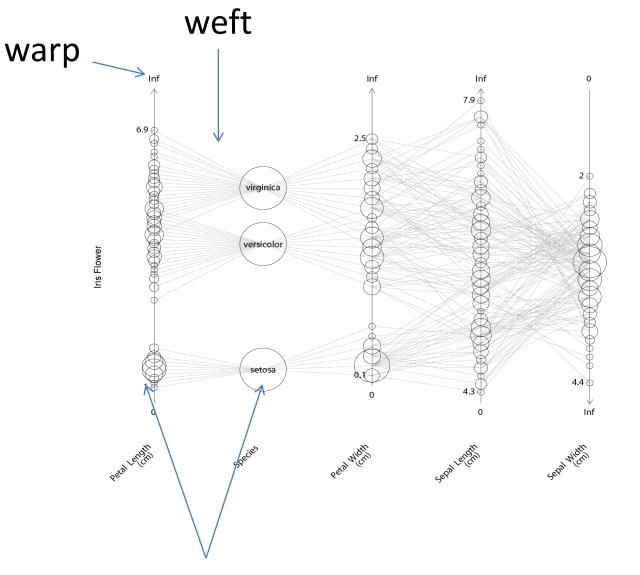
If  $\mathbf{x}_{j}$  is categorical, apply a contrast to get a data matrix  $X_{j}$ 

 $\mathbf{y}_{j} = \alpha_{j}\mathbf{1} + \boldsymbol{\beta}_{j}X_{j}$ : coordinates on the *j* th axis

Horizontalisation criterion  

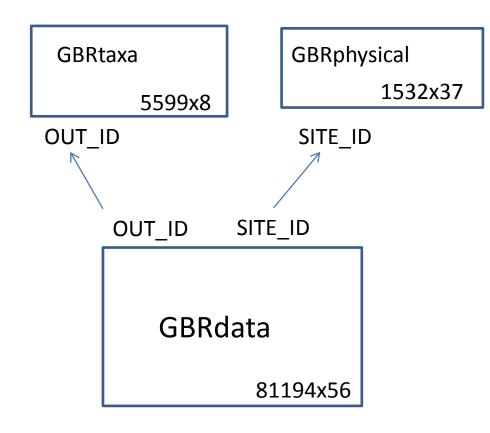
$$\sum_{j=1}^{p} \|\mathbf{y}_{j} - \boldsymbol{\xi}\|^{2} \xrightarrow[\alpha_{j}, \beta_{j}, j=1,..., p, \boldsymbol{\xi}]{\min}$$
determines *a* proper location of  
the levels of each category.

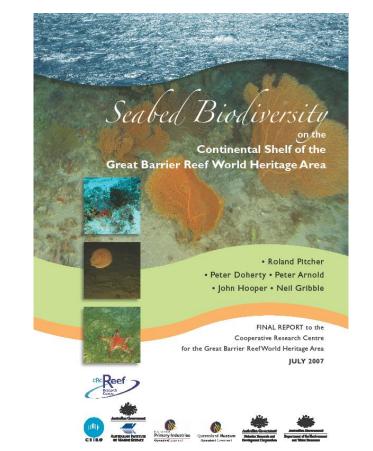
Independent of the choice of contrast



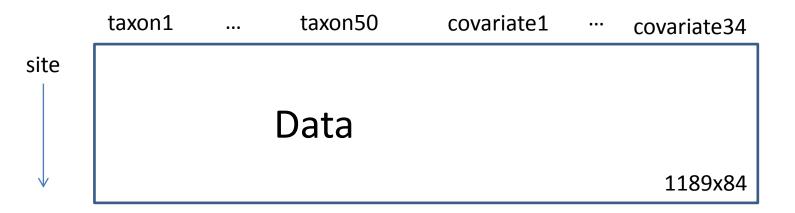
Proportional to the multiplicity of the value

### GBR data





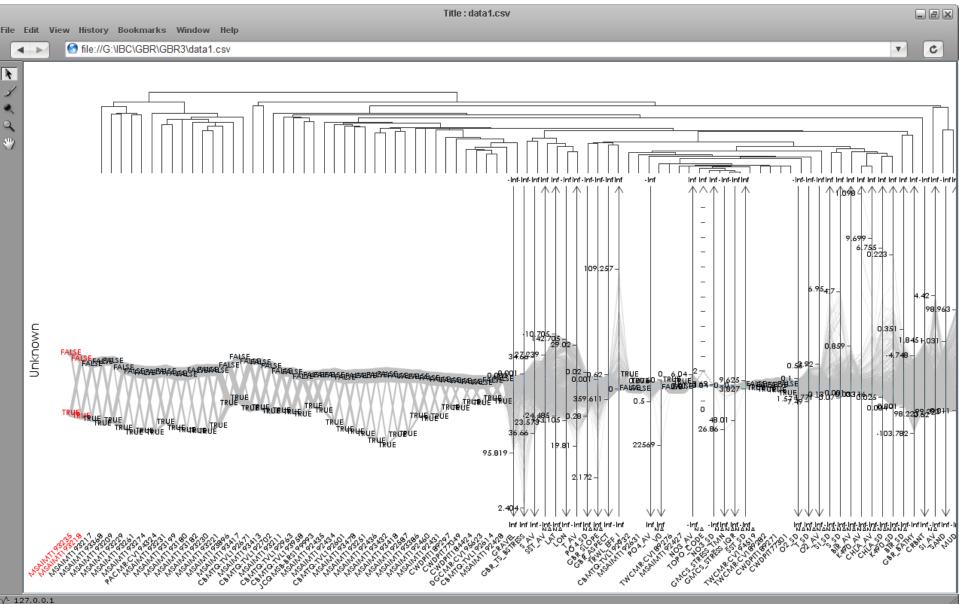
#### Most frequent 50 taxa



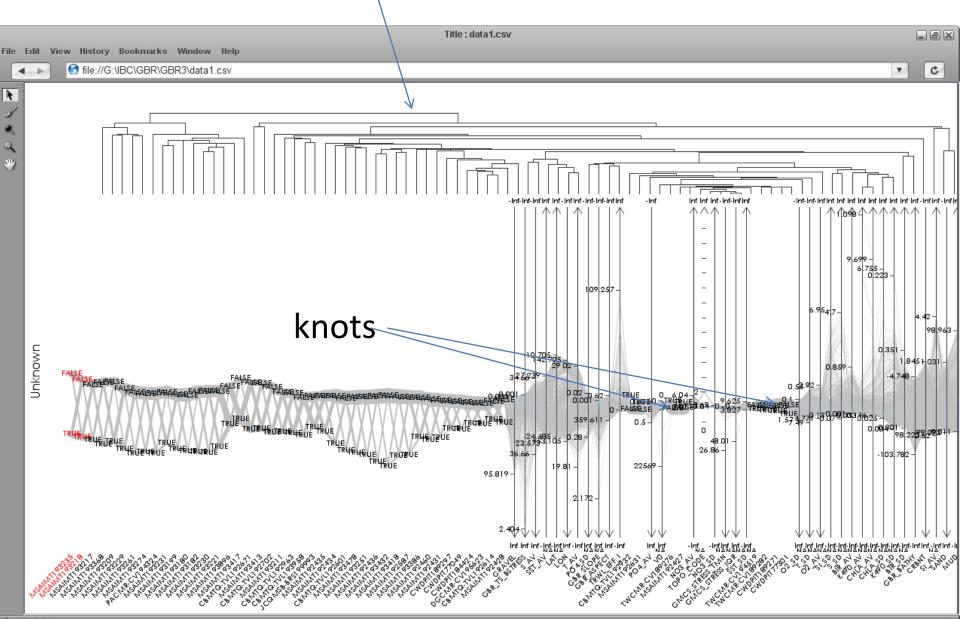
taxon1 ... taxon50 : logical covariate1 ... covariate34: numeric

Piers K. Dunstan, Scott D. Foster and Ross Darnell, Model based group of species across environmental gradients Ecological Modelling, 2010

#### Textile Plot (34 covariates and 50 taxa)



#### Hierarchical Clustering of Axes (Variables)



√- 127.0.0.1

## Order of axes and knots

- Order of axes
  - Order appeared in the data table
  - Variance of each axis
  - Clustering of axes
    - Distance of two axes=Sum of squares of slopes
    - Ordered single end-linkage clustering algorithm(Hurley, 2004)
- Variables with Knots
  - Orthogonal to other variables

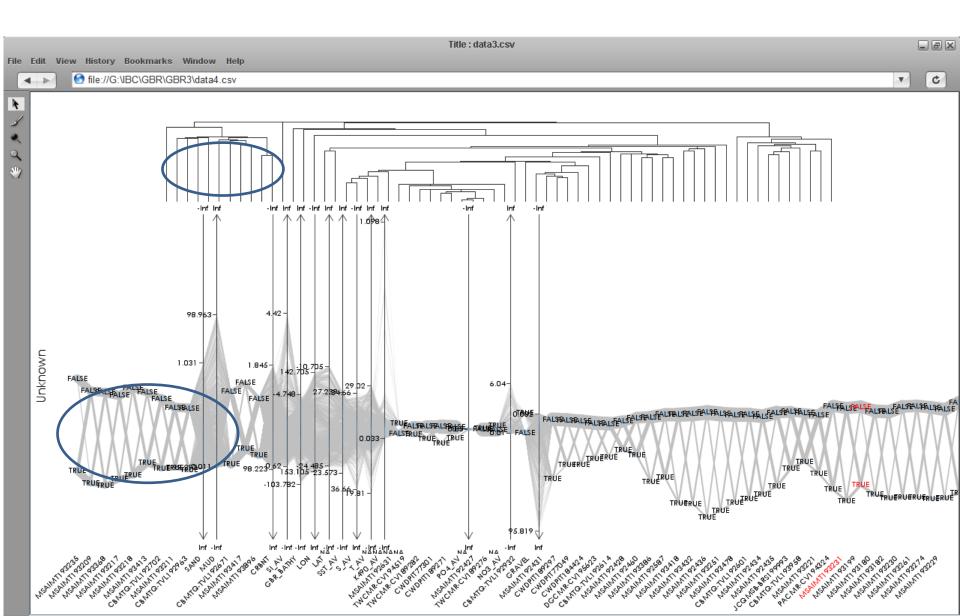
### Covariates Orthogonal to Existence of Taxa

# Standard deviations and other covvariates (20 covariates)

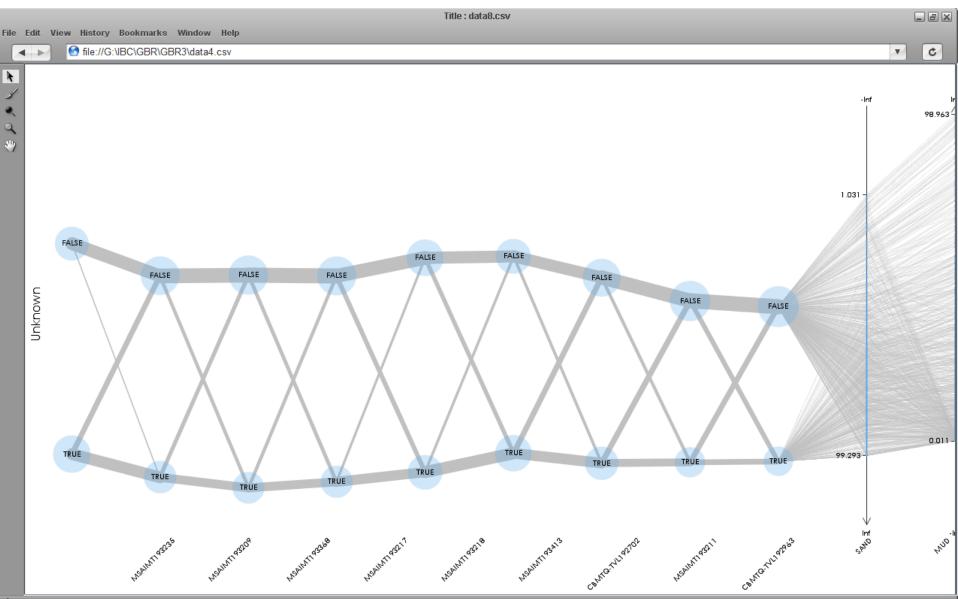
Delete

[1] "GBR\_ASPECT" "GBR\_SLOPE" "GBR\_TS\_BSTRESS" "GMCS\_STRESS\_TMN"
[5] "GMCS\_STRESS\_IQR" "NO3\_SD" "PO4\_SD" "O2\_AV"
[9] "O2\_SD" "S\_SD" "T\_SD" "SI\_SD"
[13] "CHLA\_AV" "CHLA\_SD" "K490\_SD" "SST\_SD"
[17] "BIR\_AV" "BIR\_SD" "TRWL\_EFF\_I" "TOPO\_CODE"

#### 14 Covariates

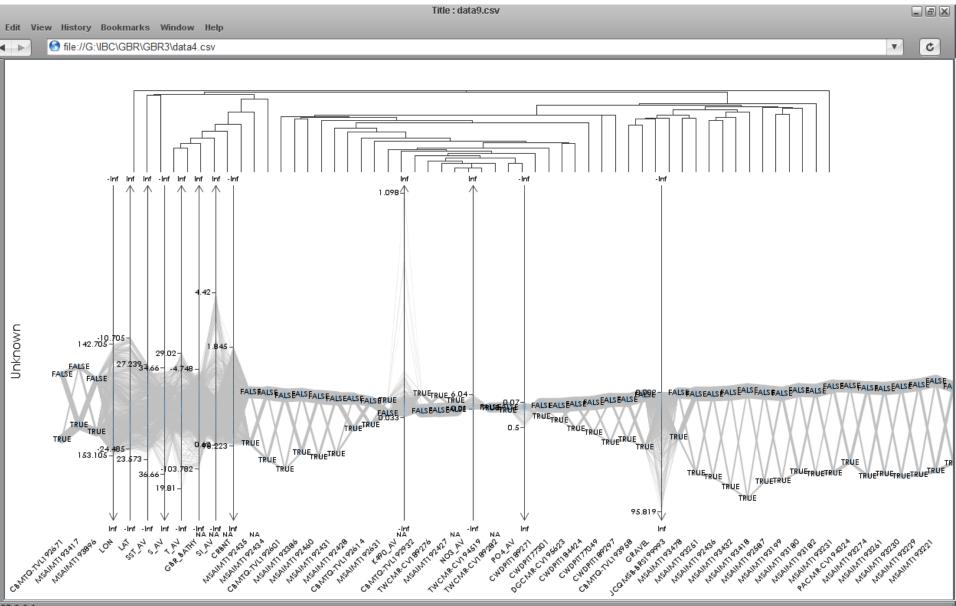


### Group1: Sand appetite 9 Taxa



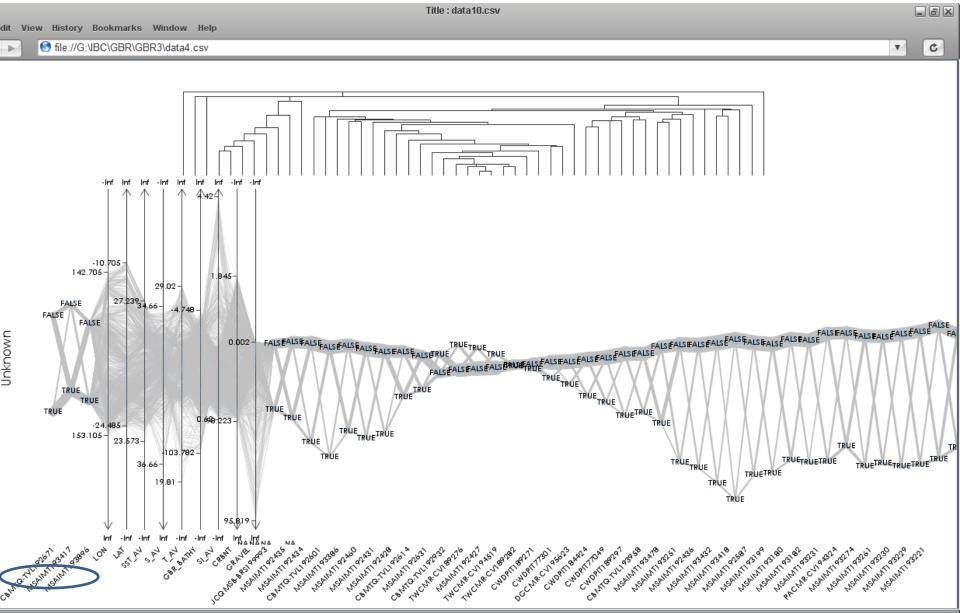
√ 127.0.0.1

#### Remaining 41 Taxa: Knots: NO3\_AV, PO4\_AV and K490\_AV



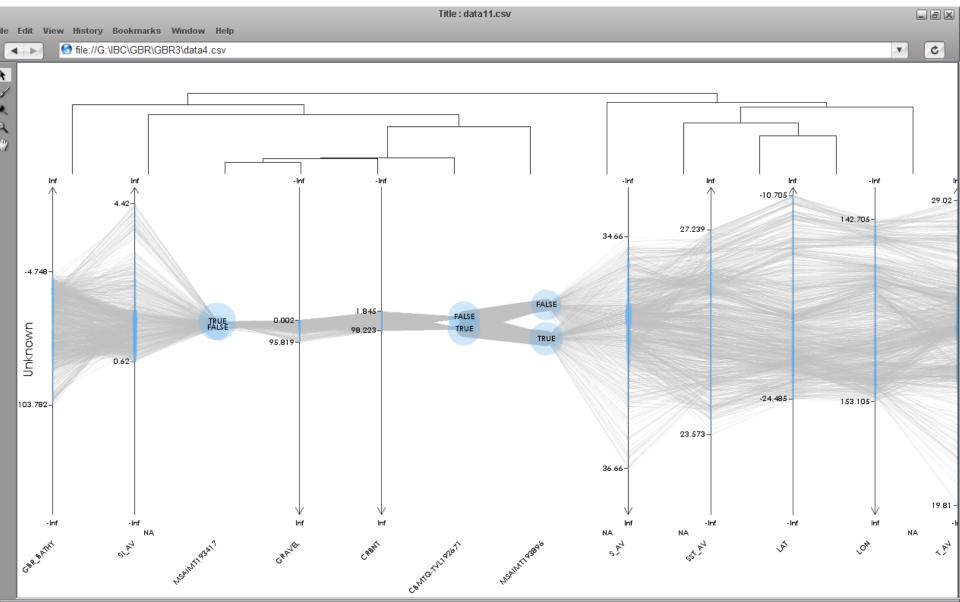
127.0.0.1

### After 3 covariates removed



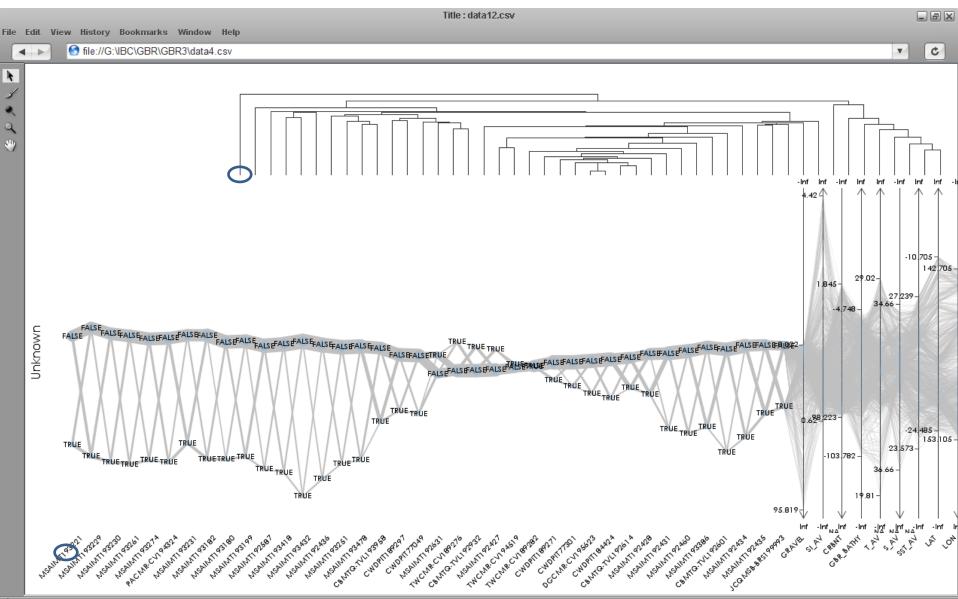
.0.0.1

### Group2: Most frequent 3 taxa

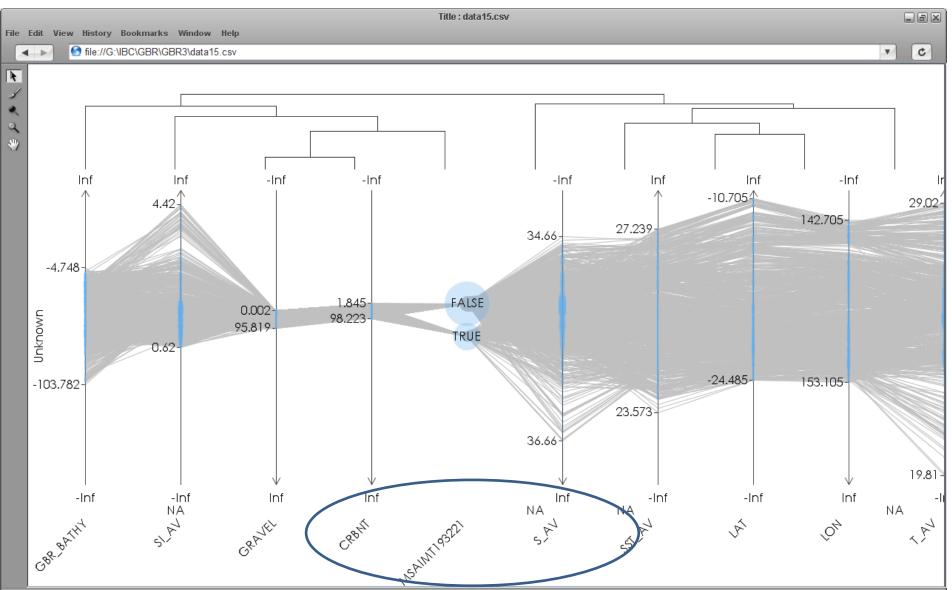


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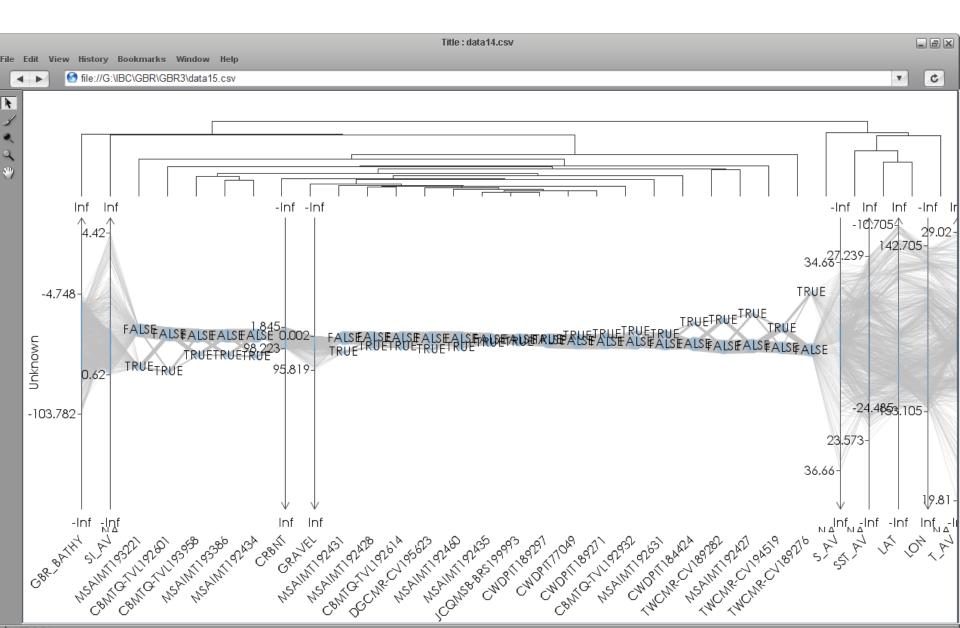
### Remaining 38 taxa



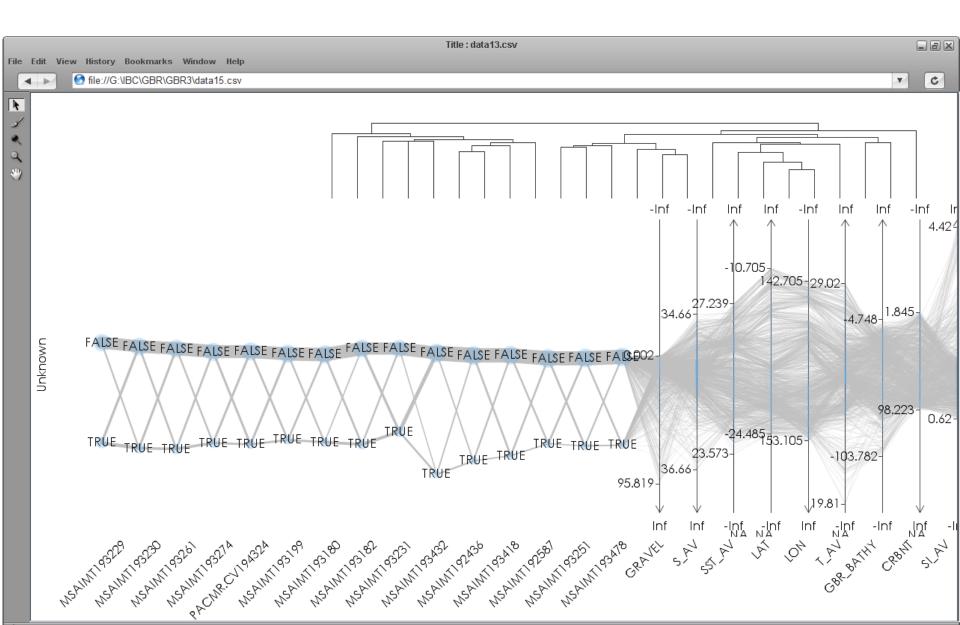
#### Group3: Unique taxon



#### Group4:22 taxa

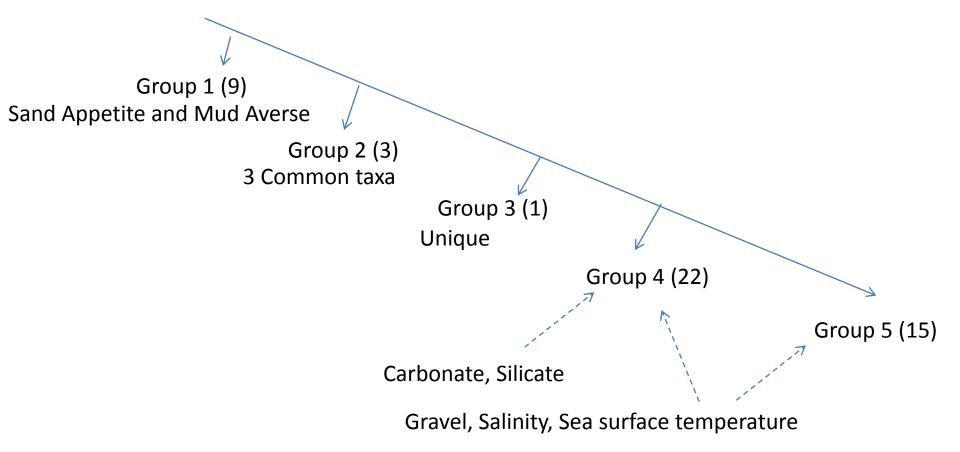


#### Group5: 15 taxa



### Grouping taxa through TextilePlot

- Knot covariates removed step by step
- Examine Hierarchical Cluster Tree of Axes (Variables)



#### **Textile Plot Home Page**

#### http://www.stat.math.keio.ac.jp/TextilePlot/index.html

#### Textile Plot Public Alpha The world's first data browser. Now on Windows+Mac+Linux.

Textile Plot is the first versatile data browser in the world. With its simple, familiar interface, Textile Plot improves to interpret given data with various attributes being displayed as well as missing value information.

Download Now

#### What's Textile Plot?

The tectle pot (Kumasaka and Shibata 2007 In press) is a parallelcoordinate plot In which the ontering, locations and scales of the axes are similareously chosen so that the connecting lines, each of which represents a case, are aligned as horizontally as possible. Pibls of this type can accommodate numerical data se well as ordered or unordered categorical data, or a mixture of these different data types. The leadle pible data set, with various attributes of the total byte ndata set, with various attributes of the data byte ndata set, with various attributes of the data byte ndata set, with various attributes of the data byte ndata set, with a sing value information. Knots and parallel wefts within the testile piot also ad in the visual interpretation of the data. Several practicul examples are presented which illustrate the potential usefulness of the testile piot as an ald to the visualitation of multivariate data

#### **Design Principle**

As Clearant states in the elements of graphing data ', a graphical method is successful only if the decoding process from the giken graphic by the viewer is effective. Thus, our aim in designing the textile pict was not only to graphically represent the data points themselves but also to assist the user in their interpretation of the data. With this aim in mind, twould appear reasonable to display any other information that might be helpful to the user in the textile plot together with the data. Also the ordering of the axes needs to be carefully determined.

#### How to Use

Appearance of Textile Pick is very similar to ordinary web provver. Use it and learn how to use it. The difference is that the target object is not at HTML file but related within is described by XML along with DanD DTD. We call the XML document DanD (Data and Description) instance. You can specify any instance at the URL field, you can see the whole picture of the data in the DanDD instance. An easiest way to create a DandD instance at the URL field, you can see the whole picture of the data in the DanDD instance. An easiest way to create a DandD instance from a CSV the is to instail CSV2DAD (EKC, AR) you may thind any other softwares related to DandD Instance in DandD Project Home Page. You need an internet connection since Textile Pixt is a client software of the DandD Server-Chient System. You need to Instail a DandD Server on your local computer is no intermet connection is available.

#### Visual Operation

User can explore data or Textile Plot through various interactions like zooming, highlighting and so on. Visual instructions given by user aria text in Textile Plot according to a reference model proposed in Kumasaka and sinibata (2006 in Japanese). The reference model to design an lossile indivorment for working with data through the textile plot consists of a sequence of four ogleds, the data, the parallel coordinate the visual analogue and the textile plot objects. A data object is transformed into a parallel coordinate uplot object is a set of coordinate vectors. The visual analogue is an abstract representation of the textile plot produced. The textile plot object is a textile plot but constructed without any restriction in the real world the size of falsippriving or the resolution. User can view this object through various interfaces like zooming or resizing, Visual instructions given by user are, therefore, sent to one of the objects according to its worn starke.

#### Publication

Kurrasaka N. et al. (2008) High-dimensional data visualisation: The textile plot. Computational Statistics & Data Analysis, 52(7):3616-44

#### Talks

Kumasaka N. (2012) A Haplotype Visualisation of Multi-Allelic Genetic Markers. IBC2012 Kobe, invited Session 9: Data Visualization: Optimization and Applications

Shibata R. (2012) Visaulising Relationships between Multi-Species Measures of Biodiversity and the Environment, IBC2012 Kobe, Invited Session 9: Data Visualization: Optimization and Applications 合大口