

# Navigation in the Ecological Space

## 1 – Assessing Diversity and Species Composition

Miguel Alvarez & Ildikó Orbán

# About this Workshop

## Timeslots

26<sup>th</sup> – 27<sup>th</sup> January 2024

- 09:00 – 12:00 Morning Session
- 13:30 – 16:30 Afternoon Session

10 – 15 min break

## Trainers



Miguel Alvarez

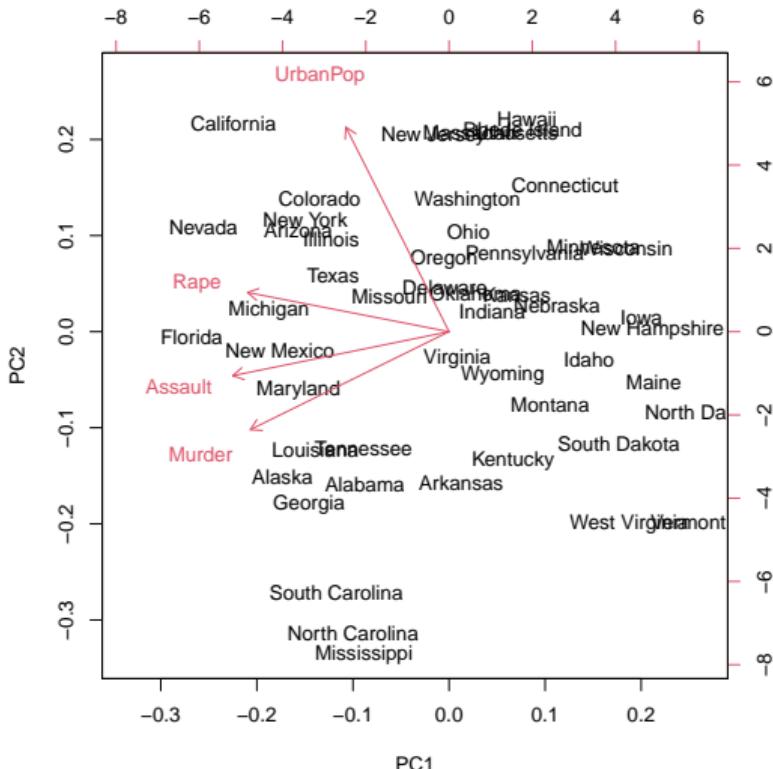


Ildikó Orbán

## About this Workshop

## Content

- Data Structure
  - Diversity
  - Unconstrained Ordination
    - Linear
    - Unimodal
    - Distance-Based
  - Dissimilarity/Distance



# About this Workshop

## Disclaimer

- Licenced by Creative Commons 4.0 [CC BY-SA](#)
- It may contain a pinch of AI



# About this Workshop



## Why R?

- Freeware
- Scripting Language
  - Flexibility
  - Reproducibility

<https://cran.r-project.org/>

# About this Workshop

## Navigation in the Ecological Space

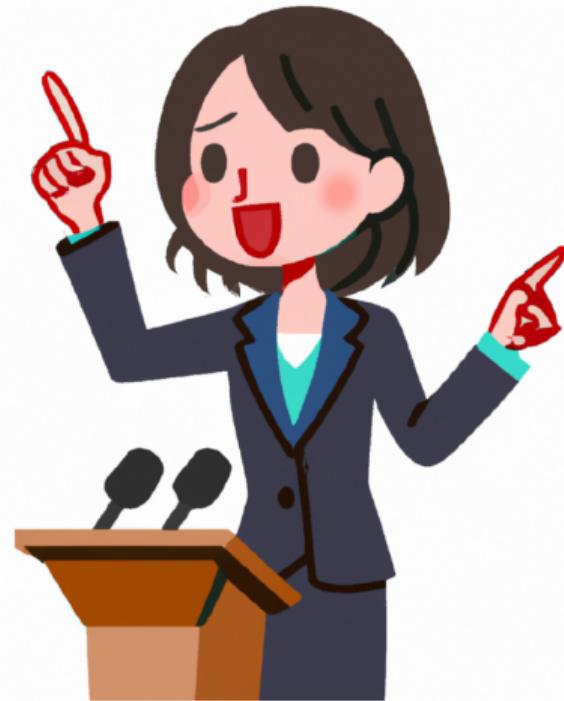
<https://kamapu.gitlab.io/multivar/>



### Welcome to our Workshop!

Plant species composition as a response to environmental factors and anthropogenic disturbance is a central principle in vegetation science and biogeography. Assessing vegetation species composition as a response to environmental factors is not trivial, as most common modelling approaches are restricted to a single response variable and not multiple responses. Multivariate statistics, including indirect (unconstrained) and direct (constrained) ordination analysis, are tools to address this problem.

# Introduce yourself



# Expectations

Write in the Padlet Board

# Data Structure

## Back from the field

- Digitizing
- Data Cleaning
- Harmonizing Taxonomy
- Structuring Data
  - Relational Databases



# Data Structure

## Matrix served to the readers

## ... served to the statistical software

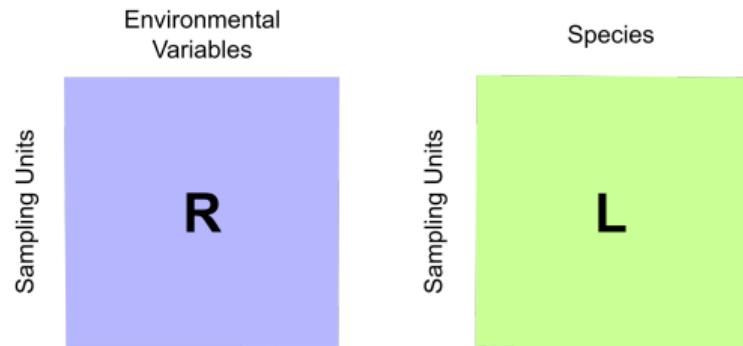
Table 2. *Tessaria absinthioides-Baccharidetum marginalis* Oberd. 1960

Riverbank composition: R/r = rocks (> 50 cm Ø); G/g = gravel (< 50 cm Ø);  
indicate abundant, lowercase scarce; (x) = xenophytic plant

Altitude (m asl)	160	225	1110	1055	505
Area (m <sup>2</sup> )	80	180	100	250	200
Slope (°)	0	0	0	10	0
Cover E <sub>i</sub> (%)	100	85	100	60	70
High shrub layer (m)	5–8	3–8	1–3	1–2	1–2.5
Riverbank composition	gsL	gS	rGS	rGS	rGS
Latitude	34° 03'	34° 22'	35° 02'	35° 02'	35° 42'
N. species	11	10	14	9	13
N. relevé	1	2	3	4	5
<i>Baccharidetea / Salicetea species</i>					
<i>Baccharis salicifolia</i>	1	3	3	3	4
<i>Otholobium glandulosum</i>	2	1	.	.	3
<i>Cortaderia gr. selliana</i>	.	r	1	+	1
<i>Salix humboldtiana</i>	4	4	.	.	.
<i>Tessaria absinthioides</i>	.	3	4	3	+
<i>Equisetum bogotense</i>	.	.	2	.	1
<i>Discaria trinervis</i>	.	.	3	.	.
<i>Buddleja globosa</i>	.	.	+	.	.
<i>Escallonia myrtoides</i>	.	.	+	.	.
<i>Myrsinaria lanceolata</i>	.	.	.	.	.

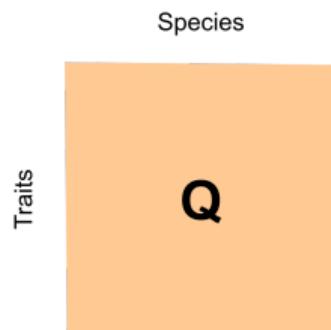
	Heliindi	Panisuba	Phraaust	Ricicomm	Pycrpoly
213	0.5	50	80	0.5	0.0
214	0.0	30	90	0.0	0.0
215	0.0	20	90	0.1	10.0
219	0.0	0	0	0.0	0.0
220	0.0	0	0	0.0	0.0
221	0.0	0	0	0.0	0.0
222	50.0	0	0	0.0	0.5
223	25.0	0	0	0.0	15.0
234	0.0	0	60	0.0	0.0
235	0.0	0	70	0.0	0.0
236	0.0	0	70	0.0	0.0
237	0.0	0	80	0.0	0.0
238	0.0	0	80	0.0	0.0
245	0.0	0	0	0.0	0.0
246	0.0	0	0	0.0	0.0
247	0.0	0	0	0.0	0.0
249	0.0	0	0	0.0	0.0
250	0.0	0	0	0.0	0.0
251	0.0	0	0	0.0	0.0
255	5.0	0	0	0.0	0.5

# Data Structure



- **R** environmental table (header)
- **Q** species-trait table (vegetation matrix)
- **L** species composition table (species attributes)

Dolédec et al. (1996) *Environmental and Ecological Statistics*



# Data Structure

## Vegetation matrix

cross table

wide table

	Heliindi	Panisuba	Phraaust	Ricicomm	Pycrpoly
213	0.5	50	80	0.5	0.0
214	0.0	30	90	0.0	0.0
215	0.0	20	90	0.1	10.0
219	0.0	0	0	0.0	0.0
220	0.0	0	0	0.0	0.0
221	0.0	0	0	0.0	0.0
222	50.0	0	0	0.0	0.5
223	25.0	0	0	0.0	15.0
234	0.0	0	60	0.0	0.0
235	0.0	0	70	0.0	0.0
236	0.0	0	70	0.0	0.0
237	0.0	0	80	0.0	0.0
238	0.0	0	80	0.0	0.0
245	0.0	0	0	0.0	0.0
246	0.0	0	0	0.0	0.0
247	0.0	0	0	0.0	0.0
249	0.0	0	0	0.0	0.0
250	0.0	0	0	0.0	0.0

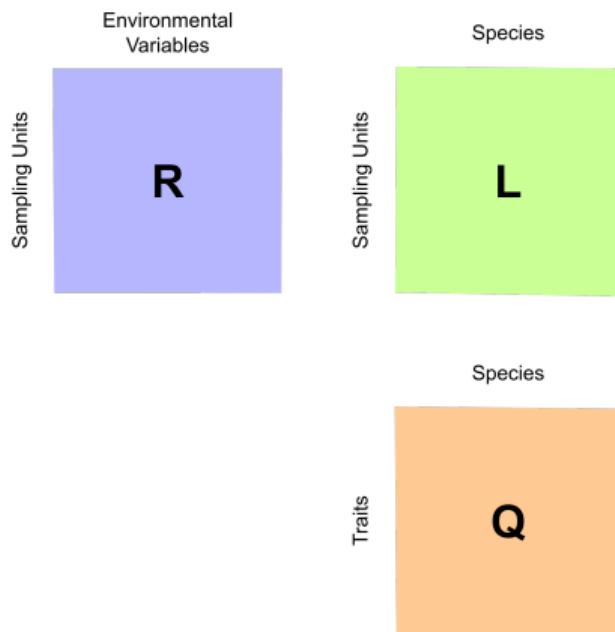
## Database list

column-oriented table

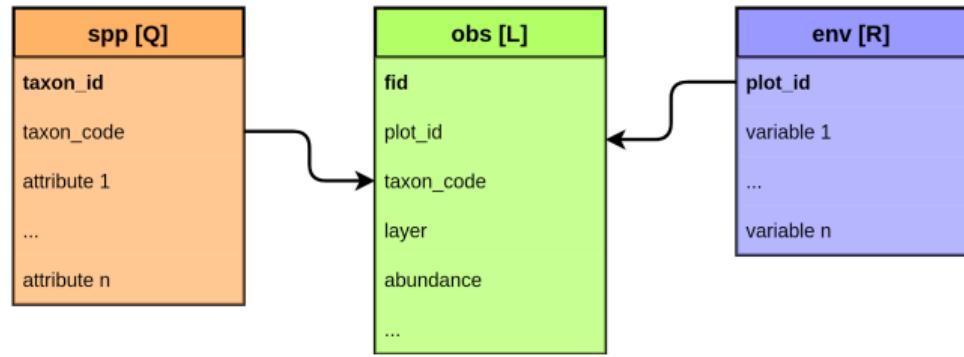
long table

	taxon_code	taxon_id	plot_id	cover_perc	cover_class
53	Ricicomm	473	213	0.5	1
112	Heliindi	305	213	0.5	1
689	Phraaust	51996	213	80.0	5
2780	Panisuba	50146	213	50.0	3
690	Phraaust	51996	214	90.0	5
2781	Panisuba	50146	214	30.0	3
54	Ricicomm	473	215	0.1	1
249	Pycrpoly	50067	215	10.0	2
691	Phraaust	51996	215	90.0	5
2644	Sphabull	525	215	0.5	1
2782	Panisuba	50146	215	20.0	2
1755	Cypepapy	206	219	60.0	4
2676	Cyclinte	50074	219	40.0	3
2703	Lepiowar	50075	219	50.0	3
398	Leerhexa	356	220	0.5	1
822	Typhdomi	50105	220	10.0	2
1756	Cypepapy	206	220	10.0	2
2260	Melascan	379	220	0.5	1

# Data Structure



## Relational database schema



- Efficient storage
  - Efficient data assessment?
- Little redundancy
- Consistency

# Data Structure

## Before Assessing

- Merge taxa to species
- Filter unknown species
- Reclassify abundance
  - In databases, harmonize abundance

# **Experience with reshaping**

Write in the Padlet Board

## Diversity Metrics

- Species Richness
- Shannon Index
- Evenness

## Species Attributes

- Taxonomy
- Functional Traits
- Indicator values

# **Use of taxonomic attributes**

Write in the Padlet Board

# Ordination Analysis

- Reduce dimensions (detect redundancy)
- Explorative assessment

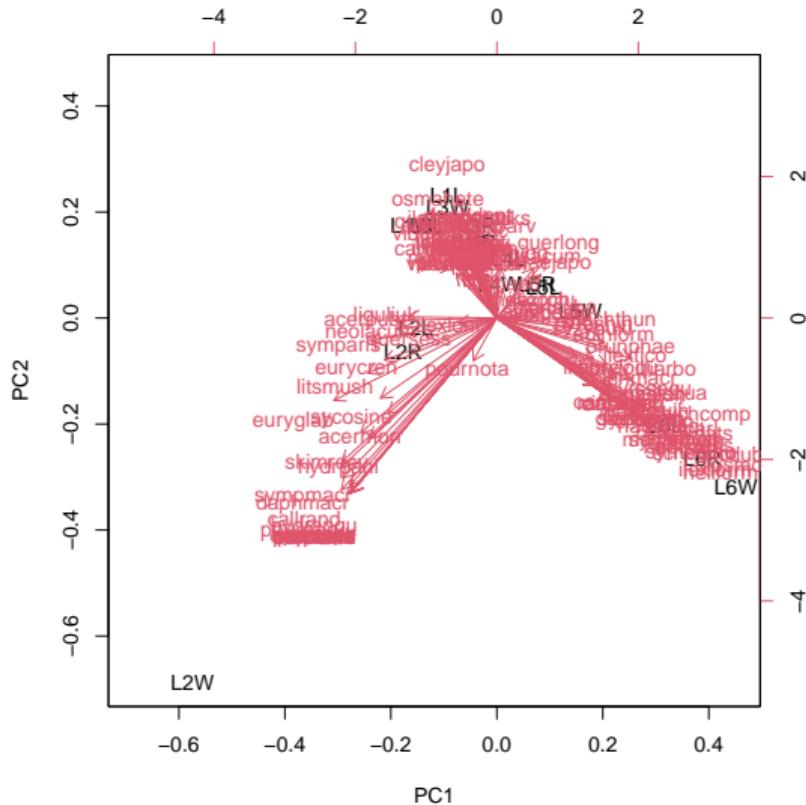


# Ordination Analysis

	Indirect / Unconstrained Ordination	Direct / Constrained / Canonical Ordination
Linear Response	Principal Component Analysis (PCA)	Redundance Analysis (RDA)
Unimodal Response	Correspondence Analysis (CA) Detrended Correspondence Analysis (DCA)	Canonical Correspondence Analysis (CCA)
Distance-Based	Principal Coordinates Analysis (PCOA) Non-Metric Multidimensional Scaling (NMDS)	Canonical Analysis on Principal Coordinates (CAP) Distance-Based Redundance Analysis (DBRDA)

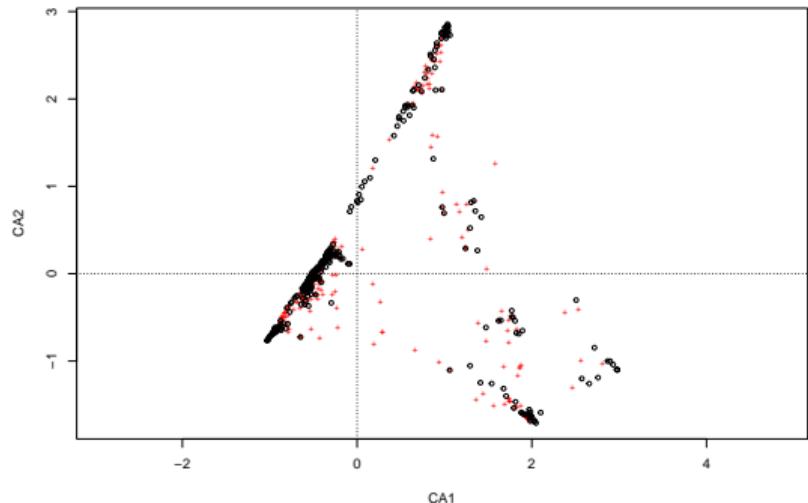
# Principal Component Analysis (PCA)

```
pca_ord <- prcomp(lalashan$cross, scale. = TRUE)  
biplot(pca_ord)
```



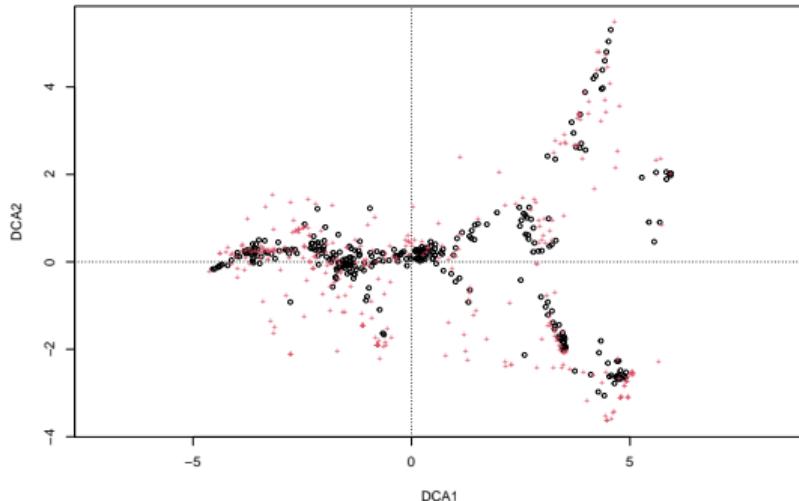
# Correspondence Analysis (CA)

```
ca_ord <- cca(wetlands$cross)  
ordiplot(ca_ord)
```



# Detrended Correspondence Analysis (DCA)

```
dca_ord <- decorana(wetlands$cross)  
ordiplot(dca_ord)
```

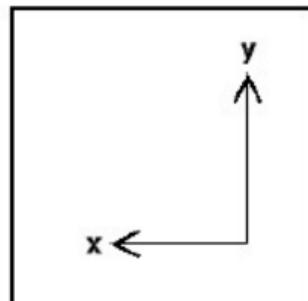
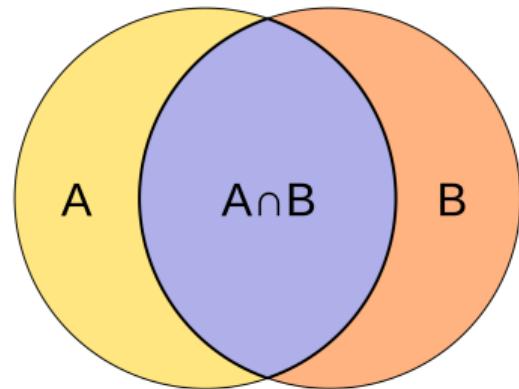


## Data Pre-Processing

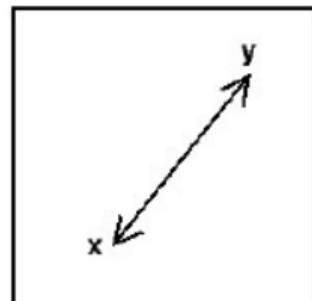
- Filter rare species
- Reclassify cover values
- Transformations
  - Standardize
  - Log-Transforms etc.

# (Dis-)similarity and Distance Metrics

- Jaccard/Soerensen
- Bray-Curtis
- Euclidean Distance
- Manhattan Distance



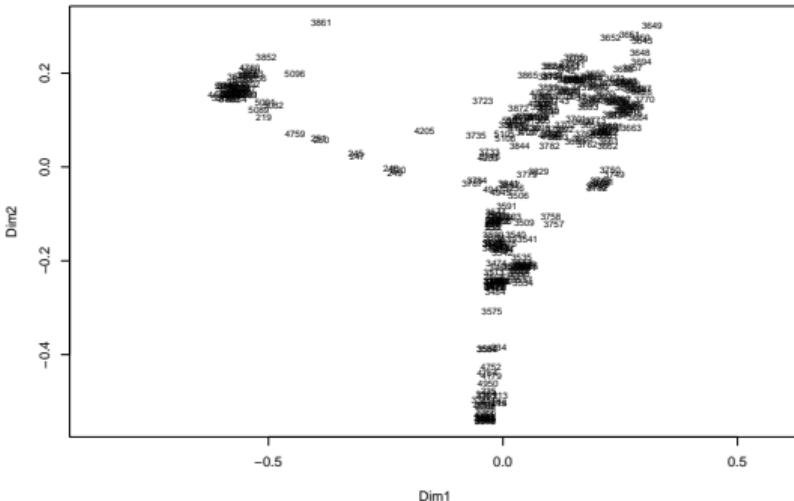
**Manhattan**



**Euclidean**

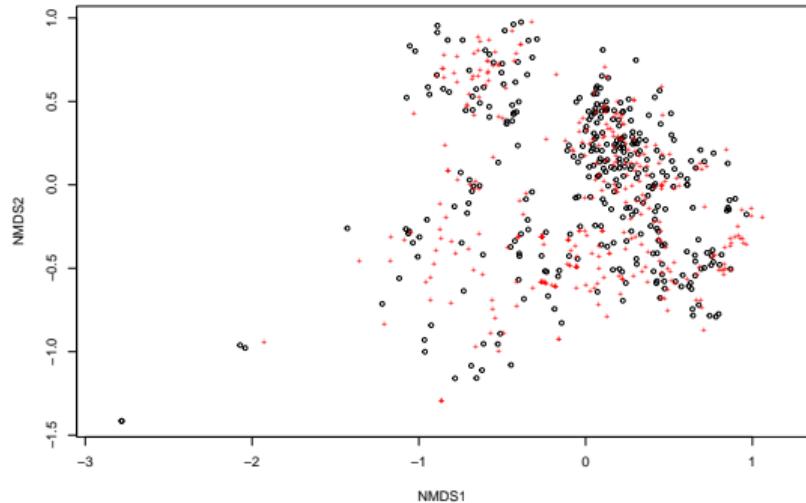
# Principal Coordinates Analysis (PCoA)

```
pcoa_ord <- wcmdscale(vegdist(wetlands$cross,  
    method = "bray"), eig = TRUE)  
plot(pcoa_ord)
```



# Non-Metric Multidimensional Scaling (NMDS)

```
nmds_ord <- metaMDS(comm = wetlands$cross,  
                      distance = "bray")  
plot(nmds_ord)
```



::: {.columns} ::: {.column width="60%"}

# Objects and Attributes

Write in the Padlet Board

:: :: {.column width="40%"}

# taxlist and vegetable

taxlist

## Introduction

`taxlist` is a package designed to handle and assess taxonomic lists in R, providing an object class and functions in S4 language. The homonymous object class `taxlist` was originally designed as a module for taxa recorded in vegetation-plot observations (see [vegtable](#)), but became an independent object with the ability of contain not only lists of species but also synonymy, hierarchical taxonomy, and functional traits (attributes of taxa).

The main aim of the package is to keep consistency in taxonomic lists (a set of rules are checked by the function `isValidObject()`), to enable the re-arrangement of such data, and to statistically assess functional traits and other attributes, for instance taxonomy itself (function `tax2traits()` set taxonomic information as trait).

While this package only includes a function for the import of taxonomic lists from [TurboGeo](#), almost any data source can be structured as `taxlist` object, so far the information is imported into data frames in an R session and the consistency rules are respected (validity).

The use of `taxlist` is recommended for people cleaning raw data before importing it to relational databases, either in the context of taxonomic work or biodiversity assessments. The other way around, people having relational databases or clean and structured taxonomic lists may use `taxlist` as recipient of this information in R sessions in order to carry out further statistical assessments. Finally, the function `print_name()` makes `taxlist` suitable for its implementation in interactive documents using `rearkdown` and `knitr` (e.g. reports, manuscripts and check-lists).

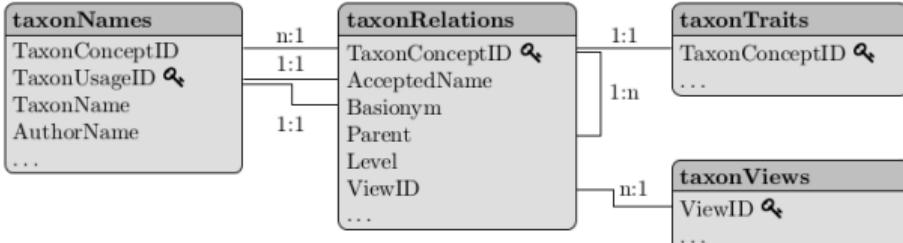
The structure of `taxlist` objects is inspired on the structure of data handled by [TurboGeo](#) and relational databases.



Figure: Relational model for `taxlist` objects (see Alvarez & Luebert 2018).

## Installing taxlist

This package is available from the Comprehensive R Archive Network (CRAN) and can be directly installed within an R-session:



Alvarez & Luebert (2018) *Biodiversity Data Journal*

<https://docs.ropensci.org/taxlist/>

# taxlist and vegetable

vegetable



The aim of `vegetable` is to provide a way for handling databases stored in `Turboleg`. This package incorporates many concepts and some functions included in the package `vegdata` but defining an homonymous s4 class containing all elements of a database in just one object. The package `vegetable` also contains several methods for this object class.

Species lists in `vegetable` objects are handled by the package `taxlist`, thus I will recommend to take a look on it.

This package has been developed as a tool handling data stored in `GWEA-Dataveg`. Further development is running in the context of the project `GlobE-wetlands`.

An important source of inspiration for `vegetable` have been the enthusiastic discussions during several versions of the [Meetings on Vegetation Databases](#).

## Updating to the last version of vegetable

The very first step is to install the package `devtools` and dependencies. Then you just need to execute following commands in your R-session:

```
library(devtools)
install_github("kamapu/vegetable")
```

## Some examples

The current version of `vegetable` includes an example data, which corresponds to a subset from `GWEA-Dataveg`. This data set contains plot observations done in Kenya imported from 5 sources.

```
library(vegetable)
#> Loading required package: taxlist
#>
#> Attaching package: 'taxlist'
#> The following objects are masked from 'package:base':
#>
#>   levels, print
#>
#> Attaching package: 'vegetable'
#> The following object is masked from 'package:base':
#>
#>   transform
data(Kenya_veg)
```

Links  
[View on CRAN](#)  
[Browse source code](#)  
[Report a bug](#)

License  
GPL (>= 2)

Citation  
[Citing vegetable](#)

Developers  
Miguel Alvarez  
Author, maintainer

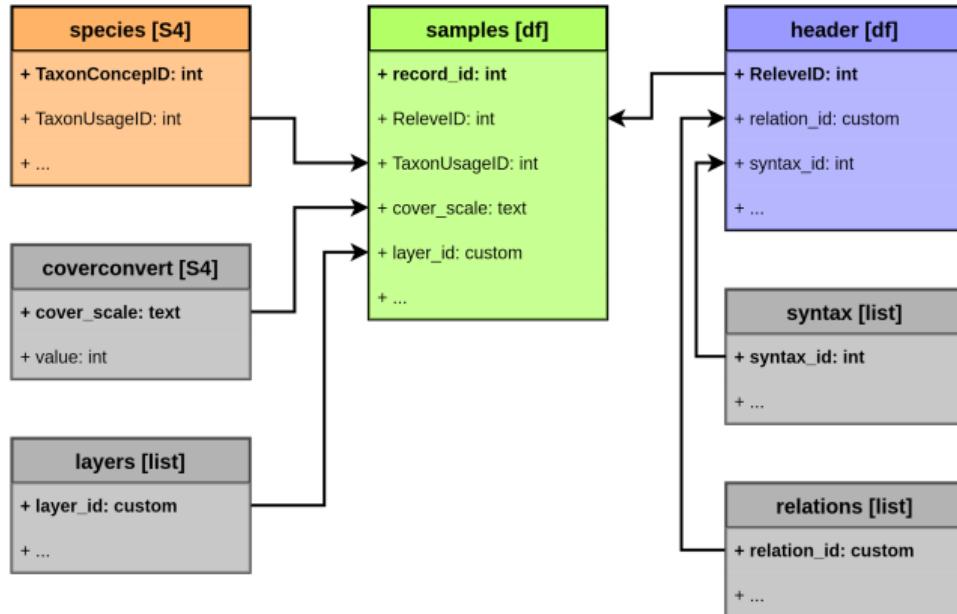
Dev status  


- Encapsulation of data processing
- Portability
- Repeatability
- Collaborative data assessment

<http://kamapu.github.io/vegetable/>

<https://kamapu.github.io/posts/vegetable-press-2/>

# taxlist and vegetable



# Retrospective

# Thank You!



GreenGaDe