The species chromatogram, a new graphical method to represent, characterise and compare the ecological niches of different species

Application with R

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In this document, we describe how to use the R functions available on Github in order to reproduce a part of our results. Only three main functions are used: chromato_env16.R, opti_eury_niche2.R and opti_eury_niche2.R. The following packages have to be installed: abind, colorRamps, ggplot2 and reshape2. Noted that the same procedure is applicable with Matlab.

Function chromato env16.R

The function <code>chromato_env16.R</code> estimates and displays the chromatogram of a given species. This function takes six arguments in the following order :

```
chromato_env16(z,y,alpha,m,k,order_smth)
```

With z a matrix with n samples by p environmental variables (i.e. the value of each environmental variable in each sample), y a vector with the abundance of a species in the n samples, alpha an integer corresponding to the number of category along each environmental variable, m an integer corresponding to the lowest number of samples needed in a category in order to have an estimation of the mean abundance, k an integer corresponding to the percentage of samples with the highest abundance values to use to estimate the mean abundance in a given category and order_smth an integer corresponding the order of the simple moving average applied along each niche dimension.

 $chromato_env16.R$ used the functions nanmean4.R, which estimates the mean of the k% of the samples with the highest abundance and moymob1.R which applies the moving average.

Example with CPR data:

Read the code of the function chromato_env16.R:

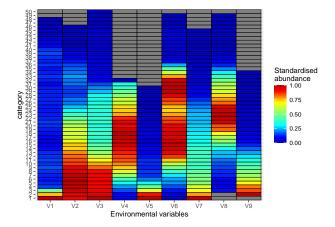
```
source("chromato_env16.R")
```

Load the files cpr_env.csv which contained the 90,732 CPR samples by 10 environmental variables (i.e. bathymetry, nitrate, phosphate, silicate, MLD, temperature, PAR, salinity, chhlorophyll-a and euphotic depth) and data_phyto.csv which contained the abundance of 45 diatoms species in each sample (90,732 samples by 45 species). (The abundance of *Paralia sulcata*, *Skeletonema costatum*, *Rhizosolenia styliformis* and *R. bergonii* are stored in the column number 1, 2, 5 and 28 respectively):

```
cpr_env<-read.csv("cpr_env.csv",header = FALSE,sep = ",",dec = ".",na='NaN')
data_phyto<-read.csv("data_phyto.csv",header = FALSE,sep = ",",dec = ".")</pre>
```

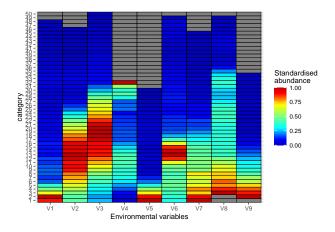
Then apply the function ${\tt chromato_env16.R}$ for ${\it Paralia sulcata}$:

y_psulcata<-chromato_env16(cpr_env[,c(1:8,10)],data_phyto[,1],50,20,5,2)</pre>



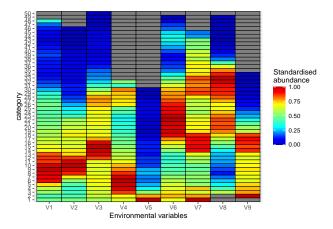
 $Skeletonema\ costatum:$

y_scosta<-chromato_env16(cpr_env[,c(1:8,10)],data_phyto[,2],50,20,5,2)</pre>



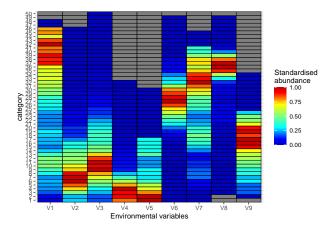
 $Rhizo solenia\ styli form is:$

y_rstyli<-chromato_env16(cpr_env[,c(1:8,10)],data_phyto[,5],50,20,5,2)</pre>



and $Rhizosolenia\ bergonii$:

y_rbergonii<-chromato_env16(cpr_env[,c(1:8,10)],data_phyto[,28],50,20,5,2)</pre>



Function opti_eury_niche2.R

The function opti_eury_niche2.R estimates the niche optimums and breadths of each species along each niche dimension, i.e. each environmental variable. The mean niche breadth is also estimated. This function takes six arguments in the following order:

```
opti_eury_niche2(sp_chr,T,z,y,k)
```

With sp_chr a three dimensional matrices with the species chromatograms (alpha category by p environmental variables by species), T the threshold of minimal abundance in a category for the niche breadth estimation, z a matrix with n samples by p environmental variables (i.e. the value of each environmental variable in each sample), y a matrix with the abundance of the species in the n samples and k the percentage of samples with the highest abundance used for the mean abundance estimation.

Example with CPR data:

Read the code of the function opti_eury_niche2.R:

```
source("opti_eury_niche2.R")
```

The function abind can be used to combine the four species chromatograms along a third dimension:

```
library(abind)
test_phyto<-abind(y_psulcata,y_scosta,y_rstyli,y_rbergonii,along=3)</pre>
```

The function opti_eury_niche2.R can then be applied:

```
opti_eury_niche2(test_phyto,0.05,cpr_env[,c(1:8,10)],data_phyto[,c(1,2,5,28)],5)
```

The degree of euryoecy (i.e. niche breadth) of each species along each dimension are stored in deg_eury , a table with in line the p environmental variables (here nine, i.e. 1=bathymetry, 2=nitrate, 3=phosphate, 4=silicate, 5=MLD, 6=temperature, 7=PAR, 8=salinity and 9=euphotic depth) and in column the species (here four, i.e. 1= $Paralia\ sulcata$, 2= $Skeletonema\ costatum$, 3= $Rhizosolenia\ styliformis\ and\ 4=R.\ bergonii$):

```
## [,1] [,2] [,3] [,4]
## [1,] 87.50000 72.91667 100.00000 95.83333
## [2,] 84.78261 76.08696 84.78261 52.17391
## [3,] 68.00000 78.00000 90.00000 56.00000
## [4,] 96.87500 96.87500 100.00000 43.75000
## [5,] 60.00000 66.66667 90.00000 56.66667
## [6,] 81.63265 97.95918 97.95918 40.81633
```

```
## [7,] 66.66667 57.77778 100.00000 82.22222
## [8,] 74.46809 89.36170 80.85106 42.55319
## [9,] 51.51515 48.48485 78.78788 66.66667
```

Mean degree of euryoecy of each species is stored in mean_deg_eury:

```
## [1] 74.60446 76.01431 91.37564 59.63137
```

Niche optimums for each species (i.e. four) along each niche dimension (i.e. nine) are stored in opti_val:

```
##
                 [,1]
                              [,2]
                                           [,3]
                                                        [,4]
    [1,] 43.71342275 164.3214263 1024.7535885 4924.597523
##
    [2,]
          1.85316914
                        4.2368076
                                      3.2344707
                                                   1.857350
    [3,]
          0.00387912
                        0.3957169
                                     0.2935805
                                                   0.172401
##
##
    [4,] 5.57933491
                        9.8454771
                                     1.9849569
                                                   1.383753
   [5,] 18.26105085
##
                       18.3356583
                                    17.8111185
                                                  43.180671
##
    [6,] 16.45252437
                        6.3075089
                                    11.6712827
                                                  14.658172
##
    [7,] 0.49425302
                        0.4489858
                                     0.3879702
                                                  25.029722
##
    [8,] 33.17704454
                                                  35.576847
                       29.4797783
                                    35.0331347
    [9,] 10.44985542
                        9.5844252
                                    10.5505980
                                                  51.686962
```

Function combina_niche3.R

The function combina_niche3.R estimates the index of niche overlapping (D) among species niche. This function takes two arguments in the following order:

```
combina_niche3(sp_chr,T)
```

With sp_chr a three dimensional matrix with the species chromatograms (alpha category by p environmental variables by species) and T the threshold of minimal abundance in a category for the niche breadth estimation.

combina_niche3.R used the functions niche_difer_sp.R and niche_difer2.R.

Example with CPR data:

Read the code of the function combina_niche3.R and apply the function on the previous three-dimensional matrix test_phyto:

```
source("combina_niche3.R")
combi_dim_phyto<-combina_niche3(test_phyto,0.05)</pre>
```

The mean degree of niche overlapping is stored in results1 (renamed here as combi_dim_phyto). The first column displays the number of dimensions considered simultaneously, columns 2 to 10 display the combinations of dimensions (i.e. 1=bathymetry, 2=nitrate, 3=phosphate, 4=silicate, 5=MLD, 6=temperature, 7=PAR, 8=salinity and 9=euphotic depth). The last column displays index D associated with the combination of environmental dimensions. D=0 when species niches are fully different and D=100 when species niches are identical; the higher the number of dimensions, the lower the value of index D. Only the combinations of environmental variables that minimise values of index D are displayed:

```
##
          [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8] [,9] [,10]
                                                                          [,11]
##
    [1,]
              1
                   6
                        NA
                              NA
                                    NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                  NA 66.66667
    [2,]
                    6
                         7
##
              2
                              NA
                                    NA
                                                NA
                                                     NA
                                                           NA
                                                                  NA 47.74995
                                          NA
                         7
    [3,]
              3
                    6
                               8
                                    NA
                                          NA
                                                NA
                                                           NA
                                                                  NA 36.26314
##
                                                     NA
                    6
                         7
    [4,]
              4
                               8
                                     9
                                          NA
                                                NA
##
                                                     NA
                                                           NA
                                                                  NA 28.26879
    [5,]
##
              5
                   5
                         6
                               7
                                     8
                                           9
                                                NA
                                                     NA
                                                           NA
                                                                  NA 22.83315
##
    [6,]
              6
                   3
                         5
                               6
                                     7
                                           8
                                                 9
                                                     NA
                                                           NA
                                                                  NA 18.95416
              7
                    3
                         4
                               5
                                     6
                                           7
                                                 8
                                                       9
##
    [7,]
                                                           NA
                                                                  NA 16.06675
                         3
                                     5
                                           6
                                                 7
                                                       8
##
    [8,]
              8
                    1
                               4
                                                            9
                                                                  NA 13.90961
                         2
                                           5
                                                 6
                                                       7
##
    [9,]
                    1
                                                            8
                                                                    9 12.49415
```