

Ausplots

In this vignette, we explore show how to fit our point process model to the TERN Ausplots dataset. We begin by installing the `ppjsdm` package which implements the saturated pairwise interaction Gibbs point process. We also load the `rgdal` library for its coordinate systems implementation.

```
need_ppjsdm <- !("ppjsdm" %in% installed.packages()[, "Package"])
if (need_ppjsdm) {
  library(devtools)
  devtools::install_github("iflnt1/ppjsdm", upgrade = "never", quiet = TRUE)
}

suppressMessages(library(ppjsdm))
suppressMessages(library(rgdal))
```

Dataset load

The dataset is loaded by a single call to an included utility function, see the code block below.

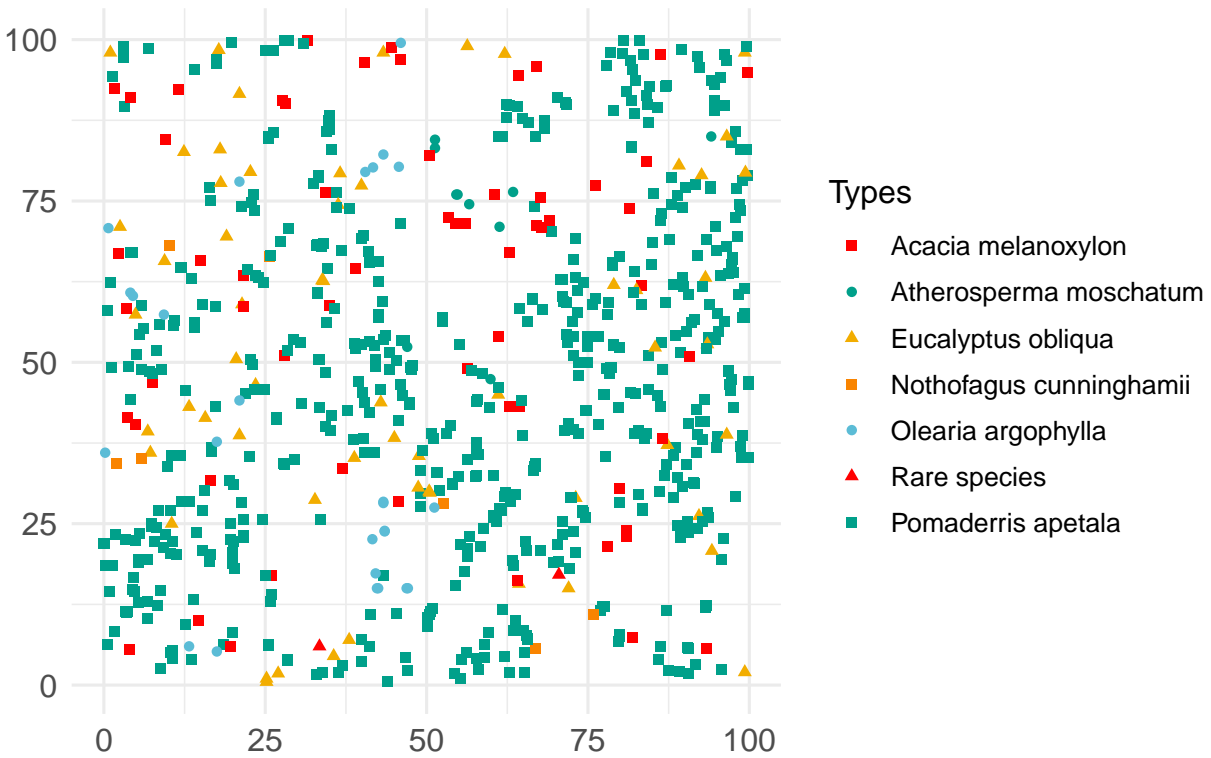
```
source("R/ausplots.R")
load(ausplots())
```

The loaded data is in the following form. First, we include the plot by plot data in the `configurations` and `windows` objects. These are lists of `ppjsdm` configurations and windows, respectively. Each entry corresponds to a forest plot, with names shown below.

```
print(names(configurations))
#> [1] "Frankland"      "Collins"        "Clare"          "Sutton"
#> [5] "Giants"         "Warren"         "Dawson"         "Carey"
#> [9] "Dombakup"       "Bird"           "Flowerdale"     "Dip"
#> [13] "Weld"           "ZigZag"         "NorthStyx"      "Newline"
#> [17] "WaratahMix"     "WogWay"         "Goodenia"       "Candelo"
#> [21] "ANU101"         "Ada Tree"       "Weeaproinah"    "ANU363"
#> [25] "ANU589"         "Turtons"        "Lardner"        "HardyCreek"
#> [29] "MinesRd"        "Tinebank"       "Lorne"          "BirdTree"
#> [33] "A-Tree"         "BlackBull"      "Bruzner"        "Osullivans"
#> [37] "Herberton"      "Lamb Range"     "Baldy"          "Koombooloomba"
#> [41] "BlackRiver"     "BondTier"       "Supersite"      "Mackenzie"
#> [45] "MtMaurice"      "BenRidge"       "MtField"        "Caveside"
```

The objects can be accessed as follows.

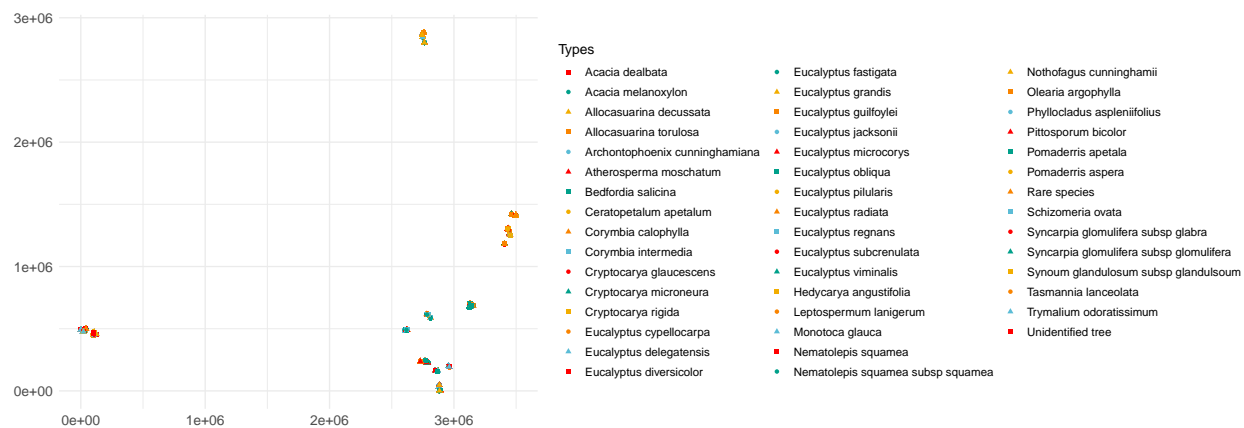
```
plot(configurations$Dip)
```



```
print(windows$Dip)
#> $x_range
#> [1] 0 100
#>
#> $y_range
#> [1] 0 100
#>
#> attr("class")
#> [1] "Rectangle_window"
```

We also include the full configuration and corresponding window in the respective `configuration` and `window` objects.

```
plot(configuration)
```



```
str(window)
#> List of 2
#> $ x_ranges:List of 48
#> ..$ : num [1:2] 107165 107265
#> ..$ : num [1:2] 31550 31650
#> ..$ : num [1:2] 100859 100959
#> ..$ : num [1:2] 41301 41401
#> ..$ : num [1:2] 122043 122143
#> ..$ : num [1:2] 16550 16650
#> ..$ : num [1:2] 98717 98817
#> ..$ : num [1:2] 0 100
#> ..$ : num [1:2] 20778 20878
#> ..$ : num [1:2] 2882620 2882720
#> ..$ : num [1:2] 2791146 2791246
#> ..$ : num [1:2] 2777590 2777690
#> ..$ : num [1:2] 2890793 2890893
#> ..$ : num [1:2] 2891016 2891116
#> ..$ : num [1:2] 2879678 2879778
#> ..$ : num [1:2] 3129024 3129124
#> ..$ : num [1:2] 3123531 3123631
#> ..$ : num [1:2] 3123651 3123751
#> ..$ : num [1:2] 3153811 3153911
#> ..$ : num [1:2] 3142958 3143058
#> ..$ : num [1:2] 2780598 2780698
#> ..$ : num [1:2] 2811941 2812041
#> ..$ : num [1:2] 2604852 2604952
#> ..$ : num [1:2] 2790421 2790521
```

```

#> ..$ : num [1:2] 2791483 2791583
#> ..$ : num [1:2] 2624631 2624731
#> ..$ : num [1:2] 2617921 2618021
#> ..$ : num [1:2] 2783294 2783394
#> ..$ : num [1:2] 3439025 3439125
#> ..$ : num [1:2] 3438409 3438509
#> ..$ : num [1:2] 3445158 3445258
#> ..$ : num [1:2] 3450652 3450752
#> ..$ : num [1:2] 3432031 3432131
#> ..$ : num [1:2] 3463563 3463663
#> ..$ : num [1:2] 3498325 3498425
#> ..$ : num [1:2] 3406828 3406928
#> ..$ : num [1:2] 2748620 2748720
#> ..$ : num [1:2] 2758576 2758676
#> ..$ : num [1:2] 2743571 2743671
#> ..$ : num [1:2] 2761661 2761761
#> ..$ : num [1:2] 2767227 2767327
#> ..$ : num [1:2] 2730033 2730133
#> ..$ : num [1:2] 2883450 2883550
#> ..$ : num [1:2] 2849880 2849980
#> ..$ : num [1:2] 2956721 2956821
#> ..$ : num [1:2] 2962046 2962146
#> ..$ : num [1:2] 2882923 2883023
#> ..$ : num [1:2] 2870138 2870238
#> $ y_ranges:List of 48
#> ..$ : num [1:2] 471578 471678
#> ..$ : num [1:2] 486985 487085
#> ..$ : num [1:2] 447526 447626
#> ..$ : num [1:2] 497895 497995
#> ..$ : num [1:2] 456521 456621
#> ..$ : num [1:2] 476941 477041
#> ..$ : num [1:2] 465526 465626
#> ..$ : num [1:2] 491927 492027
#> ..$ : num [1:2] 474351 474451
#> ..$ : num [1:2] 1347 1447
#> ..$ : num [1:2] 227413 227513
#> ..$ : num [1:2] 228326 228426
#> ..$ : num [1:2] 6710 6810
#> ..$ : num [1:2] 0 100
#> ..$ : num [1:2] 32199 32299
#> ..$ : num [1:2] 701232 701332
#> ..$ : num [1:2] 673185 673285
#> ..$ : num [1:2] 674915 675015
#> ..$ : num [1:2] 684507 684607
#> ..$ : num [1:2] 689317 689417
#> ..$ : num [1:2] 617358 617458
#> ..$ : num [1:2] 587373 587473
#> ..$ : num [1:2] 489015 489115
#> ..$ : num [1:2] 610632 610732
#> ..$ : num [1:2] 611099 611199
#> ..$ : num [1:2] 490186 490286
#> ..$ : num [1:2] 491115 491215
#> ..$ : num [1:2] 613134 613234

```

```

#> ..$ : num [1:2] 1298191 1298291
#> ..$ : num [1:2] 1306328 1306428
#> ..$ : num [1:2] 1263211 1263311
#> ..$ : num [1:2] 1252380 1252480
#> ..$ : num [1:2] 1302835 1302935
#> ..$ : num [1:2] 1422023 1422123
#> ..$ : num [1:2] 1411009 1411109
#> ..$ : num [1:2] 1181245 1181345
#> ..$ : num [1:2] 2845934 2846034
#> ..$ : num [1:2] 2879783 2879883
#> ..$ : num [1:2] 2862077 2862177
#> ..$ : num [1:2] 2798972 2799072
#> ..$ : num [1:2] 242735 242835
#> ..$ : num [1:2] 236421 236521
#> ..$ : num [1:2] 627 727
#> ..$ : num [1:2] 163197 163297
#> ..$ : num [1:2] 198694 198794
#> ..$ : num [1:2] 192436 192536
#> ..$ : num [1:2] 46485 46585
#> ..$ : num [1:2] 158910 159010
#> - attr(*, "class")= chr "Rectangle_window_union"

```

Example fit on full dataset

```

load(ausplots(to_consider = 5)) # Consider only 5 plots so that fit is not excessively slow
ntypes <- nlevels(configuration$types)
tm <- Sys.time()
fit_complete <- gibbsm(configuration,
  window = window,
  model = "square_exponential", # Short-range interaction
  medium_range_model = "tanh", # Medium-range interaction
  short_range = matrix(10, ntypes, ntypes), # Matrix of short-range interaction di.
  medium_range = matrix(200, ntypes, ntypes), # Matrix of medium-range interaction di.
  long_range = matrix(1000, ntypes, ntypes), # Matrix of long-range interaction di.
  saturation = 10, # Saturation parameter
  fitting_package = "glmnet", # Fitting package
  which_lambda = "smallest", # Which lambda to choose if regularization
  min_dummy = 1e5, # Force at least 1e5 dummy points per species
  max_dummy = 1e5, # Force at maximum 1e5 dummy points per species
  dummy_distribution = "binomial") # Distribution of dummy points
print(Sys.time() - tm)
#> Time difference of 23.66021 secs
print(fit_complete$coefficients$alpha)
#>
#> Allocasuarina decussata Eucalyptus diversicolor
#> Allocasuarina decussata 0.22412375 -0.017794693
#> Eucalyptus diversicolor -0.01779469 0.011321723
#> Eucalyptus guilfoylei 0.06875874 -0.006676091
#> Eucalyptus jacksonii -0.03300270 -0.157695880
#> Rare species -0.07829415 -0.009741903
#>
#> Eucalyptus guilfoylei Eucalyptus jacksonii Rare species
#> Allocasuarina decussata 0.068758741 -0.03300270 -0.078294153
#> Eucalyptus diversicolor -0.006676091 -0.15769588 -0.009741903

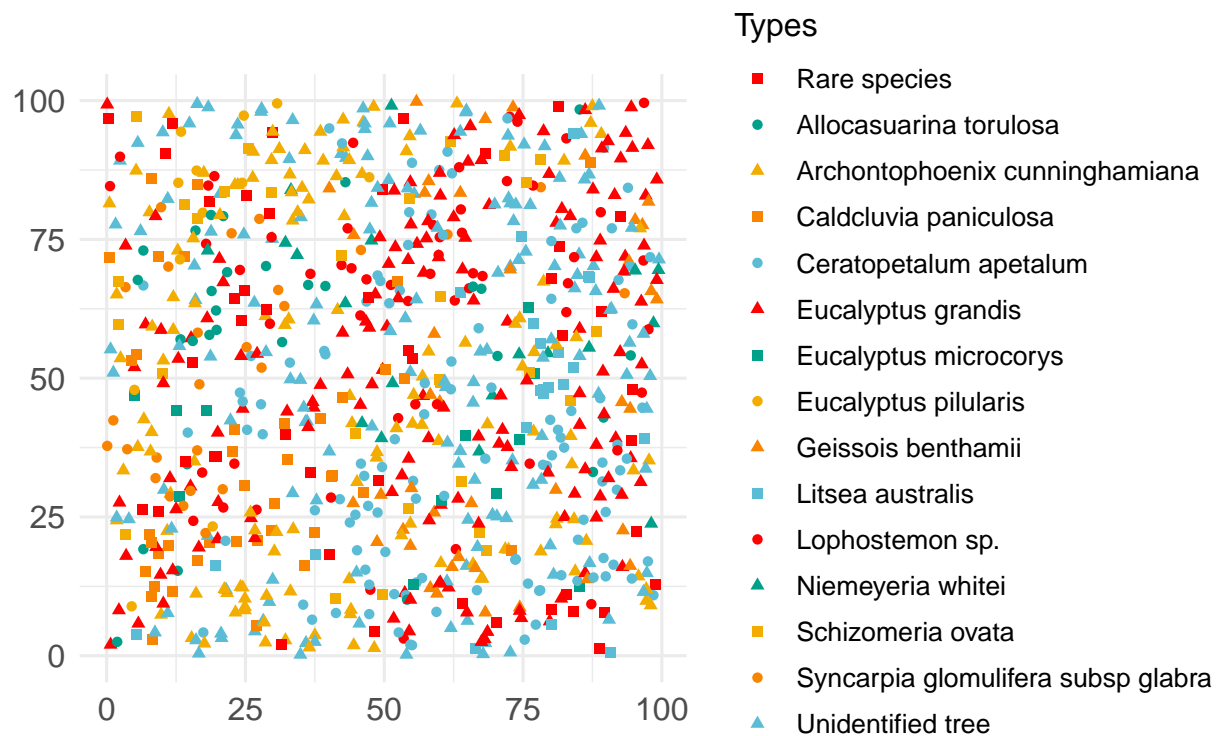
```

```
#> Eucalyptus guilfoylei      0.192412760      0.02928277 -0.101711087
#> Eucalyptus jacksonii      0.029282766      0.27836175 -0.002288320
#> Rare species              -0.101711087      -0.00228832  0.420965697
```

More in-depth exploration of a single plot

We explore here a single plot which has the second most number of species and third most number of individuals.

```
load(ausplots(plot_minimum_abundance = 10, overall_minimum_abundance = 1))
Bruxner <- configurations$Bruxner
Bruxner_window <- windows$Bruxner
plot(Bruxner)
```



And let's fit the model.

```
ntypes <- nlevels(Bruxner$types)
tm <- Sys.time()
fit <- gibbsm(Bruxner,
  window = Bruxner_window,
  model = "square_exponential", # Short-range interaction
  medium_range_model = "tanh", # Medium-range interaction
  short_range = matrix(5, ntypes, ntypes), # Matrix of short-range interaction distances
  medium_range = matrix(20, ntypes, ntypes), # Matrix of medium-range interaction distances
  long_range = matrix(40, ntypes, ntypes), # Matrix of long-range interaction distances
  saturation = 10, # Saturation parameter
```

```

fitting_package = "glmnet", # Fitting package
min_dummy = 1e4, # Force at least 1e5 dummy points per species
max_dummy = 1e4, # Force at maximum 1e5 dummy points per species
dummy_distribution = "stratified") # Distribution of dummy points
print(Sys.time() - tm)
#> Time difference of 21.70018 secs
summ <- summary(fit)
print(summ)
#>               coefficients              se      CI95_lo      CI95_hi Ztest
#> beta0_1      -8.572313e+00 5.60850291 -1.956478e+01  2.42015105
#> beta0_2      -1.011139e+01 5.63502212 -2.115583e+01  0.93305376
#> beta0_3      -5.278210e+00 3.37618397 -1.189541e+01  1.33898863
#> beta0_4      -3.976493e+00 2.11604215 -8.123859e+00  0.17087356
#> beta0_5      -9.143888e+00 6.61353949 -2.210619e+01  3.81841133
#> beta0_6      -6.206804e-01 2.37608116 -5.277714e+00  4.03635311
#> beta0_7      -1.049393e+01 4.91034519 -2.011803e+01 -0.86982894      *
#> beta0_8      -4.905219e+00 6.12661678 -1.691317e+01  7.10272973
#> beta0_9      -9.214283e+00 3.76862375 -1.660065e+01 -1.82791576      *
#> beta0_10     -1.159017e+01 4.84082351 -2.107801e+01 -2.10232656      *
#> beta0_11     -7.598318e+00 2.61957862 -1.273260e+01 -2.46403777      **
#> beta0_12     -8.039097e+00 4.66236245 -1.717716e+01  1.09896566
#> beta0_13     -9.525965e+00 6.15545793 -2.159044e+01  2.53851095
#> beta0_14     -7.308584e+00 5.45665650 -1.800343e+01  3.38626601
#> beta0_15     -3.918843e+00 3.49476201 -1.076845e+01  2.93076434
#> alpha_1_1     -9.436439e-02 0.29334110 -6.693024e-01  0.48057359
#> alpha_1_2      6.874193e-02 0.26977572 -4.600088e-01  0.59749262
#> alpha_1_3      1.051674e-02 0.21457967 -4.100517e-01  0.43108517
#> alpha_1_4     -2.364734e-01 0.31223948 -8.484515e-01  0.37550475
#> alpha_1_5     -2.935726e-02 0.11555908 -2.558489e-01  0.19713438
#> alpha_1_6     -1.704416e-01 0.11009827 -3.862302e-01  0.04534710
#> alpha_1_7      5.752740e-01 0.57164408 -5.451278e-01  1.69567579
#> alpha_1_8      5.355308e-01 0.60030931 -6.410538e-01  1.71211546
#> alpha_1_9      8.414219e-03 0.24181505 -4.655346e-01  0.48236300
#> alpha_1_10     6.122957e-02 0.25411988 -4.368362e-01  0.55929539
#> alpha_1_11    -7.040205e-02 0.19135276 -4.454466e-01  0.30464248
#> alpha_1_12    -4.419005e-01 0.52011613 -1.461309e+00  0.57750838
#> alpha_1_13     3.975007e-02 0.31856337 -5.846227e-01  0.66412281
#> alpha_1_14     4.365841e-02 0.23290903 -4.128349e-01  0.50015171
#> alpha_1_15     1.555760e-02 0.11742604 -2.145932e-01  0.24570841
#> alpha_2_2     -5.558255e-01 0.47501604 -1.486840e+00  0.37518881
#> alpha_2_3      9.783605e-02 0.18033618 -2.556164e-01  0.45128847
#> alpha_2_4      2.562088e-02 0.27114655 -5.058166e-01  0.55705835
#> alpha_2_5     -3.216732e-01 0.28942573 -8.889372e-01  0.24559075
#> alpha_2_6      3.264728e-01 0.15868381  1.545828e-02  0.63748738      *
#> alpha_2_7     -4.551175e-01 0.92768517 -2.273347e+00  1.36311203
#> alpha_2_8      9.041109e-01 0.89570797 -8.514444e-01  2.65966631
#> alpha_2_9      1.859257e-01 0.46551494 -7.264668e-01  1.09831826
#> alpha_2_10    -3.895386e-01 0.55382955 -1.475025e+00  0.69594735
#> alpha_2_11     2.130961e-01 0.28853720 -3.524264e-01  0.77861865
#> alpha_2_12     1.207746e-01 0.53457360 -9.269704e-01  1.16851964
#> alpha_2_13    -1.780746e-02 0.46021298 -9.198083e-01  0.88419341
#> alpha_2_14     1.499522e-01 0.39220509 -6.187557e-01  0.91866003
#> alpha_2_15    -1.388818e-01 0.18569286 -5.028331e-01  0.22506947

```



```

#> alpha_3_3      7.468924e-04 0.07984846 -1.557532e-01 0.15724699
#> alpha_3_4     -4.689609e-02 0.10054856 -2.439676e-01 0.15017546
#> alpha_3_5      3.752703e-03 0.06114647 -1.160922e-01 0.12359758
#> alpha_3_6     -1.916781e-01 0.06347700 -3.160908e-01 -0.06726550 **
#> alpha_3_7     -1.647562e-01 0.30033898 -7.534098e-01 0.42389734
#> alpha_3_8     -2.113622e-01 0.28428867 -7.685577e-01 0.34583338
#> alpha_3_9      2.390065e-03 0.13969548 -2.714080e-01 0.27618817
#> alpha_3_10    -1.328460e-02 0.13134732 -2.707206e-01 0.24415141
#> alpha_3_11    -1.811716e-01 0.11135736 -3.994280e-01 0.03708486
#> alpha_3_12     1.857497e-01 0.20160746 -2.093936e-01 0.58089308
#> alpha_3_13     1.044913e-01 0.16217653 -2.133688e-01 0.42235150
#> alpha_3_14     1.866098e-02 0.16941600 -3.133883e-01 0.35071024
#> alpha_3_15    -3.655958e-02 0.06373835 -1.614844e-01 0.08836529
#> alpha_4_4     -3.398202e-01 0.25503426 -8.396782e-01 0.16003774
#> alpha_4_5     -2.236493e-01 0.14737804 -5.125050e-01 0.06520633
#> alpha_4_6      2.125645e-01 0.10816603  5.629556e-04 0.42456602 *
#> alpha_4_7     -4.404213e-01 0.65073948 -1.715847e+00 0.83500466
#> alpha_4_8      5.667659e-01 0.44092822 -2.974376e-01 1.43096929
#> alpha_4_9     -4.919119e-02 0.31928661 -6.749815e-01 0.57659908
#> alpha_4_10    -1.061774e-02 0.47955019 -9.505188e-01 0.92928335
#> alpha_4_11     1.608577e-01 0.23781389 -3.052489e-01 0.62696437
#> alpha_4_12    -6.663662e-01 0.74150710 -2.119693e+00 0.78696097
#> alpha_4_13     8.333981e-02 0.32915704 -5.617961e-01 0.72847575
#> alpha_4_14    -2.623403e-01 0.26370794 -7.791984e-01 0.25451776
#> alpha_4_15    -1.507864e-01 0.11454640 -3.752932e-01 0.07372044
#> alpha_5_5      5.069051e-02 0.07190027 -9.023144e-02 0.19161246
#> alpha_5_6      7.754164e-02 0.05039628 -2.123325e-02 0.17631654
#> alpha_5_7      1.077878e-01 0.24906694 -3.803744e-01 0.59595001
#> alpha_5_8     -3.821312e-01 0.89566088 -2.137594e+00 1.37333188
#> alpha_5_9      8.755584e-02 0.10272305 -1.137776e-01 0.28888932
#> alpha_5_10    -2.152548e-01 0.15284729 -5.148300e-01 0.08432034
#> alpha_5_11    -1.268472e-03 0.10552055 -2.080849e-01 0.20554800
#> alpha_5_12    -5.417548e-01 0.29732052 -1.124492e+00 0.04098266
#> alpha_5_13    -1.771400e-02 0.16956396 -3.500533e-01 0.31462525
#> alpha_5_14    -1.372883e-01 0.28186392 -6.897314e-01 0.41515487
#> alpha_5_15    -1.904298e-01 0.06977882 -3.271937e-01 -0.05366579 **
#> alpha_6_6     -5.550041e-02 0.07541750 -2.033160e-01 0.09231517
#> alpha_6_7      4.303055e-01 0.27097143 -1.007887e-01 0.96139976
#> alpha_6_8     -2.425137e-01 0.40073595 -1.027942e+00 0.54291431
#> alpha_6_9      7.339394e-02 0.10695490 -1.362338e-01 0.28302170
#> alpha_6_10     6.892043e-02 0.13236856 -1.905172e-01 0.32835804
#> alpha_6_11    -4.606155e-02 0.07738033 -1.977242e-01 0.10560112
#> alpha_6_12    -4.076560e-02 0.21452094 -4.612189e-01 0.37968772
#> alpha_6_13    -1.977828e-01 0.15361117 -4.988552e-01 0.10328957
#> alpha_6_14     2.926585e-01 0.19683642 -9.313375e-02 0.67845083
#> alpha_6_15    -4.071684e-02 0.06032642 -1.589545e-01 0.07752078
#> alpha_7_7     -5.808706e+00 1.78090922 -9.299224e+00 -2.31818812 **
#> alpha_7_8      1.902746e+00 1.20748487 -4.638813e-01 4.26937238
#> alpha_7_9     -2.874211e-01 0.51235747 -1.291623e+00 0.71678109
#> alpha_7_10     5.939663e-01 0.51084806 -4.072775e-01 1.59521011
#> alpha_7_11    -5.467864e-01 0.60353588 -1.729695e+00 0.63612220
#> alpha_7_12    -5.838990e-01 1.24969348 -3.033253e+00 1.86545521
#> alpha_7_13    -9.472964e-01 1.28339254 -3.462700e+00 1.56810672

```



```

#> alpha_7_14 -8.099983e-02 0.59958676 -1.256168e+00 1.09416863
#> alpha_7_15 -5.720071e-01 0.29543315 -1.151045e+00 0.00703127
#> alpha_8_8 -2.310647e+00 1.17157074 -4.606884e+00 -0.01441097 *
#> alpha_8_9 -2.847111e-01 1.34986361 -2.930395e+00 2.36097301
#> alpha_8_10 6.704532e-01 0.76684612 -8.325376e-01 2.17344399
#> alpha_8_11 3.081658e-01 0.48624850 -6.448638e-01 1.26119534
#> alpha_8_12 -6.751277e-01 1.42860042 -3.475133e+00 2.12487770
#> alpha_8_13 4.580234e-01 0.70593418 -9.255821e-01 1.84162901
#> alpha_8_14 1.208779e-01 0.53598608 -9.296355e-01 1.17139130
#> alpha_8_15 2.852003e-01 0.27797214 -2.596150e-01 0.83001573
#> alpha_9_9 -3.734926e-02 0.26344006 -5.536823e-01 0.47898376
#> alpha_9_10 -4.971358e-01 0.47507264 -1.428261e+00 0.43398945
#> alpha_9_11 5.596648e-03 0.24060179 -4.659742e-01 0.47716750
#> alpha_9_12 6.014135e-02 0.39075563 -7.057256e-01 0.82600831
#> alpha_9_13 4.183365e-02 0.43870263 -8.180077e-01 0.90167500
#> alpha_9_14 -9.064435e-01 0.64000423 -2.160829e+00 0.34794175
#> alpha_9_15 -6.821440e-02 0.11455969 -2.927473e-01 0.15631846
#> alpha_10_10 2.308658e-02 0.22402930 -4.160028e-01 0.46217593
#> alpha_10_11 -6.554927e-02 0.24554507 -5.468088e-01 0.41571024
#> alpha_10_12 1.075382e-01 0.60894020 -1.085963e+00 1.30103903
#> alpha_10_13 1.530879e-01 0.40630425 -6.432538e-01 0.94942958
#> alpha_10_14 -1.388868e-01 0.91182016 -1.926021e+00 1.64824793
#> alpha_10_15 6.954155e-02 0.11867746 -1.630620e-01 0.30214511
#> alpha_11_11 -1.708340e-01 0.18974793 -5.427331e-01 0.20106509
#> alpha_11_12 -1.209194e-01 0.34632274 -7.996995e-01 0.55786065
#> alpha_11_13 2.051978e-01 0.20727034 -2.010446e-01 0.61144019
#> alpha_11_14 6.034082e-01 0.28305801 4.862472e-02 1.15819174 *
#> alpha_11_15 -1.604833e-01 0.09531759 -3.473023e-01 0.02633576
#> alpha_12_12 -1.281819e+00 1.11457558 -3.466347e+00 0.90270923
#> alpha_12_13 6.243618e-01 0.57908237 -5.106188e-01 1.75934237
#> alpha_12_14 1.777764e-01 0.61562509 -1.028827e+00 1.38437939
#> alpha_12_15 -2.518254e-01 0.22580067 -6.943866e-01 0.19073580
#> alpha_13_13 -6.302059e-01 0.64649431 -1.897311e+00 0.63689961
#> alpha_13_14 -6.235840e-02 0.61136524 -1.260612e+00 1.13589545
#> alpha_13_15 4.807311e-02 0.18782725 -3.200615e-01 0.41620777
#> alpha_14_14 -4.634982e-01 0.38062294 -1.209505e+00 0.28250909
#> alpha_14_15 -3.932984e-03 0.17747856 -3.517846e-01 0.34391860
#> alpha_15_15 -1.239916e-01 0.08984055 -3.000758e-01 0.05209263
#> gamma_1_1 -2.996597e-01 0.56363434 -1.404363e+00 0.80504337
#> gamma_1_2 6.296289e-03 0.15862967 -3.046121e-01 0.31720472
#> gamma_1_3 3.116316e-01 0.42125097 -5.140052e-01 1.13726829
#> gamma_1_4 -6.192550e-02 0.10363496 -2.650463e-01 0.14119530
#> gamma_1_5 -3.997557e-02 0.17932239 -3.914410e-01 0.31148986
#> gamma_1_6 -1.155231e-01 0.16098017 -4.310384e-01 0.19999224
#> gamma_1_7 8.221621e-02 0.26320381 -4.336538e-01 0.59808620
#> gamma_1_8 -1.741335e-01 0.25123486 -6.665447e-01 0.31827782
#> gamma_1_9 1.296378e-01 0.20128938 -2.648821e-01 0.52415778
#> gamma_1_10 -4.546046e-02 0.13878939 -3.174827e-01 0.22656174
#> gamma_1_11 -8.081449e-02 0.15024539 -3.752900e-01 0.21366106
#> gamma_1_12 -1.567440e-01 0.18703052 -5.233171e-01 0.20982912
#> gamma_1_13 7.335734e-02 0.24075356 -3.985110e-01 0.54522564
#> gamma_1_14 -4.446449e-03 0.15808569 -3.142887e-01 0.30539582
#> gamma_1_15 2.386713e-01 0.23658844 -2.250335e-01 0.70237613

```

```

#> gamma_2_2 -3.600605e-01 0.28831924 -9.251558e-01 0.20503480
#> gamma_2_3 3.161401e-02 0.16001424 -2.820081e-01 0.34523616
#> gamma_2_4 8.966073e-04 0.12129363 -2.368345e-01 0.23862776
#> gamma_2_5 -9.323325e-03 0.12178719 -2.480218e-01 0.22937519
#> gamma_2_6 2.411476e-02 0.12419087 -2.192949e-01 0.26752439
#> gamma_2_7 1.744744e-01 0.25526333 -3.258325e-01 0.67478137
#> gamma_2_8 3.395589e-01 0.39255359 -4.298320e-01 1.10894981
#> gamma_2_9 -3.031392e-02 0.16621466 -3.560887e-01 0.29546084
#> gamma_2_10 -3.810438e-01 0.23633955 -8.442608e-01 0.08217320
#> gamma_2_11 1.321920e-01 0.17514462 -2.110851e-01 0.47546919
#> gamma_2_12 1.946769e-01 0.24739634 -2.902110e-01 0.67956483
#> gamma_2_13 -4.129657e-03 0.18421182 -3.651782e-01 0.35691888
#> gamma_2_14 7.703537e-02 0.23241004 -3.784799e-01 0.53255068
#> gamma_2_15 7.440190e-02 0.11484440 -1.506890e-01 0.29949279
#> gamma_3_3 -8.346556e-02 0.34775507 -7.650530e-01 0.59812186
#> gamma_3_4 -9.450373e-02 0.09373359 -2.782182e-01 0.08921072
#> gamma_3_5 4.742935e-02 0.19766245 -3.399819e-01 0.43484064
#> gamma_3_6 -3.444620e-02 0.18626784 -3.995245e-01 0.33063206
#> gamma_3_7 -2.030289e-01 0.12887309 -4.556155e-01 0.04955772
#> gamma_3_8 -1.600616e-01 0.12765224 -4.102554e-01 0.09013222
#> gamma_3_9 6.425304e-02 0.12033686 -1.716029e-01 0.30010896
#> gamma_3_10 1.352581e-01 0.10745070 -7.534136e-02 0.34585766
#> gamma_3_11 -7.510739e-02 0.10942623 -2.895789e-01 0.13936408
#> gamma_3_12 -1.748925e-01 0.15267063 -4.741215e-01 0.12433640
#> gamma_3_13 -3.646624e-02 0.14758436 -3.257263e-01 0.25279380
#> gamma_3_14 2.186390e-01 0.24096996 -2.536534e-01 0.69093147
#> gamma_3_15 5.239273e-02 0.32878251 -5.920092e-01 0.69679462
#> gamma_4_4 1.011918e-01 0.11870648 -1.314687e-01 0.33385222
#> gamma_4_5 -1.451361e-02 0.07336810 -1.583124e-01 0.12928522
#> gamma_4_6 -5.969541e-02 0.06940022 -1.957173e-01 0.07632651
#> gamma_4_7 5.152251e-01 0.16129624 1.990903e-01 0.83135991 **
#> gamma_4_8 -1.249475e-01 0.13346962 -3.865432e-01 0.13664812
#> gamma_4_9 -6.156803e-02 0.10560843 -2.685567e-01 0.14542069
#> gamma_4_10 -1.098820e-01 0.11153769 -3.284918e-01 0.10872787
#> gamma_4_11 -8.188266e-02 0.10471907 -2.871283e-01 0.12336294
#> gamma_4_12 7.882878e-02 0.15127224 -2.176594e-01 0.37531692
#> gamma_4_13 1.233036e-01 0.18804456 -2.452569e-01 0.49186418
#> gamma_4_14 5.742657e-02 0.13119139 -1.997038e-01 0.31455697
#> gamma_4_15 4.793424e-02 0.06769426 -8.474407e-02 0.18061256
#> gamma_5_5 6.450380e-01 0.70683075 -7.403249e-01 2.03040077
#> gamma_5_6 -1.817057e-01 0.15367197 -4.828973e-01 0.11948581
#> gamma_5_7 1.092784e-01 0.09910465 -8.496311e-02 0.30351998
#> gamma_5_8 1.492017e-02 0.16062502 -2.998991e-01 0.32973943
#> gamma_5_9 6.367975e-02 0.15072700 -2.317397e-01 0.35909924
#> gamma_5_10 -8.310234e-02 0.10311030 -2.851948e-01 0.11899013
#> gamma_5_11 6.704443e-02 0.11796889 -1.641704e-01 0.29825921
#> gamma_5_12 5.381685e-02 0.15012691 -2.404265e-01 0.34806019
#> gamma_5_13 1.112957e-01 0.18337880 -2.481201e-01 0.47071155
#> gamma_5_14 4.816857e-02 0.11153775 -1.704414e-01 0.26677854
#> gamma_5_15 -1.433647e-01 0.15707506 -4.512262e-01 0.16449676
#> gamma_6_6 -1.450508e-01 0.21784156 -5.720124e-01 0.28191079
#> gamma_6_7 7.515534e-02 0.12355289 -1.670039e-01 0.31731455
#> gamma_6_8 3.507727e-02 0.12623554 -2.123398e-01 0.28249438

```

```

#> gamma_6_9      6.101380e-02 0.15469743 -2.421876e-01 0.36421519
#> gamma_6_10     1.086436e-01 0.10636469 -9.982734e-02 0.31711458
#> gamma_6_11    -2.277038e-02 0.10662465 -2.317509e-01 0.18621010
#> gamma_6_12     1.537057e-01 0.12232947 -8.605563e-02 0.39346708
#> gamma_6_13    -9.598774e-02 0.14285828 -3.759848e-01 0.18400933
#> gamma_6_14     5.675339e-02 0.11629541 -1.711814e-01 0.28468820
#> gamma_6_15    -3.549532e-02 0.23774711 -5.014711e-01 0.43048044
#> gamma_7_7     -3.364001e-01 0.50364161 -1.323520e+00 0.65071932
#> gamma_7_8     -9.022205e-02 0.43206422 -9.370524e-01 0.75660826
#> gamma_7_9     -1.243546e-01 0.21559803 -5.469190e-01 0.29820978
#> gamma_7_10     3.783407e-03 0.24593835 -4.782469e-01 0.48581371
#> gamma_7_11    -1.287614e-03 0.18485977 -3.636061e-01 0.36103088
#> gamma_7_12     5.326955e-01 0.31620332 -8.705166e-02 1.15244258
#> gamma_7_13    -2.711137e-02 0.28785167 -5.912903e-01 0.53706753
#> gamma_7_14    -4.819917e-01 0.37924628 -1.225301e+00 0.26131730
#> gamma_7_15    -5.770691e-02 0.10426142 -2.620555e-01 0.14664171
#> gamma_8_8     -2.966371e-01 0.65752840 -1.585369e+00 0.99209492
#> gamma_8_9     -4.417835e-02 0.30479812 -6.415717e-01 0.55321498
#> gamma_8_10    -3.318545e-01 0.26092818 -8.432643e-01 0.17955535
#> gamma_8_11     4.196803e-02 0.19293085 -3.361695e-01 0.42010556
#> gamma_8_12     9.614438e-02 0.32076644 -5.325463e-01 0.72483504
#> gamma_8_13    -2.083417e-01 0.46448720 -1.118720e+00 0.70203650
#> gamma_8_14     3.746527e-01 0.28747768 -1.887932e-01 0.93809863
#> gamma_8_15    -1.539061e-02 0.13088517 -2.719208e-01 0.24113961
#> gamma_9_9     -9.422115e-02 0.23273958 -5.503823e-01 0.36194004
#> gamma_9_10     3.916448e-01 0.25555077 -1.092255e-01 0.89251510
#> gamma_9_11     3.292883e-02 0.15162312 -2.642470e-01 0.33010468
#> gamma_9_12    -3.130620e-01 0.26647494 -8.353433e-01 0.20921932
#> gamma_9_13    -2.449407e-01 0.22841578 -6.926274e-01 0.20274596
#> gamma_9_14    -1.194107e-01 0.19649968 -5.045430e-01 0.26572156
#> gamma_9_15     1.310447e-01 0.13259421 -1.288352e-01 0.39092462
#> gamma_10_10   -1.159583e-01 0.17976744 -4.682960e-01 0.23637945
#> gamma_10_11    1.357327e-02 0.13682125 -2.545915e-01 0.28173799
#> gamma_10_12    3.885007e-02 0.20695256 -3.667695e-01 0.44446964
#> gamma_10_13   -1.032359e-01 0.17145526 -4.392820e-01 0.23281023
#> gamma_10_14    1.422180e-01 0.20783190 -2.651251e-01 0.54956100
#> gamma_10_15    5.006730e-02 0.10894250 -1.634561e-01 0.26359068
#> gamma_11_11    6.865860e-02 0.22419746 -3.707604e-01 0.50807756
#> gamma_11_12    1.821288e-01 0.25141378 -3.106332e-01 0.67489072
#> gamma_11_13    1.847389e-01 0.31427844 -4.312355e-01 0.80071334
#> gamma_11_14   -8.195300e-02 0.16933646 -4.138464e-01 0.24994036
#> gamma_11_15    6.087269e-02 0.15272807 -2.384688e-01 0.36021421
#> gamma_12_12   -9.161921e-02 0.47683564 -1.026200e+00 0.84296146
#> gamma_12_13    5.147053e-01 0.31719487 -1.069852e-01 1.13639587
#> gamma_12_14   -3.157237e-01 0.27109904 -8.470681e-01 0.21562065
#> gamma_12_15   -8.945589e-02 0.12767461 -3.396935e-01 0.16078175
#> gamma_13_13   -2.054746e-01 0.54239544 -1.268550e+00 0.85760090
#> gamma_13_14    4.162329e-03 0.23597353 -4.583373e-01 0.46666194
#> gamma_13_15    7.459013e-02 0.17127066 -2.610942e-01 0.41027446
#> gamma_14_14   -1.522956e-01 0.26016617 -6.622119e-01 0.35762071
#> gamma_14_15   -1.316585e-01 0.11205285 -3.512780e-01 0.08796110
#> gamma_15_15   -1.072822e-01 0.52525201 -1.136757e+00 0.92219285
#>                                     Pval      Zval se_numerical_proportion

```

```

#> beta0_1      0.126401008 -1.528449356      0.001711542
#> beta0_2      0.072752094 -1.794382779      0.002617281
#> beta0_3      0.117966593 -1.563365742      0.005158860
#> beta0_4      0.060215484 -1.879212493      0.005557154
#> beta0_5      0.166787170 -1.382601236      0.004478648
#> beta0_6      0.793922705 -0.261220195      0.005833772
#> beta0_7      0.032589363 -2.137106100      0.005878321
#> beta0_8      0.423339704 -0.800640661      0.004226274
#> beta0_9      0.014485241 -2.444999341      0.003186653
#> beta0_10     0.016654162 -2.394255084      0.002866091
#> beta0_11     0.003724636 -2.900587697      0.003781300
#> beta0_12     0.084662010 -1.724253941      0.003662024
#> beta0_13     0.121727312 -1.547563969      0.002319187
#> beta0_14     0.180444157 -1.339388728      0.002761004
#> beta0_15     0.262139890 -1.121347696      0.005190619
#> alpha_1_1    0.747688860 -0.321688277      0.006072114
#> alpha_1_2    0.798868751  0.254811425      0.007451957
#> alpha_1_3    0.960910633  0.049010871      0.003260125
#> alpha_1_4    0.448842480 -0.757346198      0.003891151
#> alpha_1_5    0.799460445 -0.254045450      0.005971854
#> alpha_1_6    0.121601686 -1.548085611      0.006313722
#> alpha_1_7    0.314247282  1.006349905      0.005237178
#> alpha_1_8    0.372343878  0.892091523      0.003976795
#> alpha_1_9    0.972242335  0.034796095      0.004742083
#> alpha_1_10   0.809595741  0.240947585      0.005455600
#> alpha_1_11   0.712934670 -0.367917608      0.004746843
#> alpha_1_12   0.395536986 -0.849618926      0.003861638
#> alpha_1_13   0.900698390  0.124779156      0.004392019
#> alpha_1_14   0.851309139  0.187448321      0.005986721
#> alpha_1_15   0.894597924  0.132488493      0.005988700
#> alpha_2_2    0.241952897 -1.170119464      0.006164206
#> alpha_2_3    0.587460088  0.542520357      0.005586556
#> alpha_2_4    0.924719211  0.094490900      0.005445160
#> alpha_2_5    0.266388043 -1.111418987      0.004236471
#> alpha_2_6    0.039649724  2.057379622      0.007764365
#> alpha_2_7    0.623713090 -0.490594765      0.005429582
#> alpha_2_8    0.312791771  1.009381367      0.003837778
#> alpha_2_9    0.689599950  0.399398024      0.004009410
#> alpha_2_10   0.481834718 -0.703354719      0.004136708
#> alpha_2_11   0.460186681  0.738539488      0.004806850
#> alpha_2_12   0.821258161  0.225927048      0.005312672
#> alpha_2_13   0.969134400 -0.038693946      0.003961491
#> alpha_2_14   0.702215847  0.382331022      0.005354777
#> alpha_2_15   0.454513485 -0.747911592      0.005073501
#> alpha_3_3    0.992536798  0.009353873      0.008349537
#> alpha_3_4    0.640927461 -0.466402446      0.006059293
#> alpha_3_5    0.951062659  0.061372367      0.006880009
#> alpha_3_6    0.002530694 -3.019647048      0.006534901
#> alpha_3_7    0.583302198 -0.548567640      0.006602223
#> alpha_3_8    0.457192763 -0.743477295      0.006164919
#> alpha_3_9    0.986349571  0.017109111      0.005278199
#> alpha_3_10   0.919438503 -0.101141036      0.006149348
#> alpha_3_11   0.103750198 -1.626938322      0.005454938

```

#> alpha_3_12	0.356871137	0.921343461	0.005903160
#> alpha_3_13	0.519376874	0.644306233	0.005812117
#> alpha_3_14	0.912291335	0.110148840	0.005335535
#> alpha_3_15	0.566246353	-0.573588416	0.006216512
#> alpha_4_4	0.182712586	-1.332449316	0.008043838
#> alpha_4_5	0.129135101	-1.517521374	0.005470282
#> alpha_4_6	0.049394734	1.965168535	0.007228304
#> alpha_4_7	0.498532084	-0.676801220	0.005442286
#> alpha_4_8	0.198655132	1.285392581	0.007610854
#> alpha_4_9	0.877557752	-0.154065929	0.004221212
#> alpha_4_10	0.982335448	-0.022141042	0.006745471
#> alpha_4_11	0.498785637	0.676401702	0.005026856
#> alpha_4_12	0.368831298	-0.898664675	0.004878670
#> alpha_4_13	0.800120126	0.253191641	0.004755000
#> alpha_4_14	0.319826823	-0.994813820	0.006187356
#> alpha_4_15	0.188047132	-1.316378212	0.007060450
#> alpha_5_5	0.480803179	0.705011339	0.008071088
#> alpha_5_6	0.123892649	1.538638195	0.007961546
#> alpha_5_7	0.665184524	0.432766347	0.006604528
#> alpha_5_8	0.669636323	-0.426647187	0.004222099
#> alpha_5_9	0.394020639	0.852348601	0.005999343
#> alpha_5_10	0.159042258	-1.408299991	0.006463333
#> alpha_5_11	0.990408786	-0.012021094	0.005796103
#> alpha_5_12	0.068436177	-1.822123975	0.005037194
#> alpha_5_13	0.916797997	-0.104467956	0.005733343
#> alpha_5_14	0.626206706	-0.487072850	0.005063857
#> alpha_5_15	0.006351742	-2.729048211	0.006665119
#> alpha_6_6	0.461786102	-0.735908963	0.007741665
#> alpha_6_7	0.112283938	1.588010620	0.006852737
#> alpha_6_8	0.545065460	-0.605170883	0.005498325
#> alpha_6_9	0.492578221	0.686213921	0.006370259
#> alpha_6_10	0.602596167	0.520670731	0.006793455
#> alpha_6_11	0.551668563	-0.595261685	0.007274567
#> alpha_6_12	0.849284945	-0.190030864	0.005759377
#> alpha_6_13	0.197900999	-1.287554751	0.005819428
#> alpha_6_14	0.137064751	1.486810939	0.005447244
#> alpha_6_15	0.499712576	-0.674942062	0.006733326
#> alpha_7_7	0.001107650	-3.261651959	0.007496128
#> alpha_7_8	0.115073645	1.575792443	0.005457090
#> alpha_7_9	0.574812775	-0.560977648	0.005168506
#> alpha_7_10	0.244948637	1.162706418	0.006064892
#> alpha_7_11	0.364950865	-0.905971636	0.004678264
#> alpha_7_12	0.640332627	-0.467233781	0.005484035
#> alpha_7_13	0.460442131	-0.738119013	0.003446385
#> alpha_7_14	0.892538539	-0.135092754	0.006599493
#> alpha_7_15	0.052847604	-1.936164118	0.005478060
#> alpha_8_8	0.048579416	-1.972264538	0.005178892
#> alpha_8_9	0.832950952	-0.210918392	0.002782891
#> alpha_8_10	0.381955145	0.874299549	0.006086939
#> alpha_8_11	0.526236196	0.633761938	0.005269070
#> alpha_8_12	0.636513010	-0.472579782	0.004971058
#> alpha_8_13	0.516455443	0.648818895	0.004837584
#> alpha_8_14	0.821571421	0.225524303	0.005064251


```

#> alpha_8_15 0.304890007 1.026003346 0.005659471
#> alpha_9_9 0.887257580 -0.141775193 0.005720042
#> alpha_9_10 0.295357154 -1.046441688 0.004938970
#> alpha_9_11 0.981442049 0.023261040 0.004789085
#> alpha_9_12 0.877680391 0.153910391 0.005696146
#> alpha_9_13 0.924030759 0.095357643 0.003814970
#> alpha_9_14 0.156685172 -1.416308595 0.004095905
#> alpha_9_15 0.551543648 -0.595448599 0.005988768
#> alpha_10_10 0.917922012 0.103051608 0.008430751
#> alpha_10_11 0.789504495 -0.266954108 0.004933617
#> alpha_10_12 0.859823442 0.176598921 0.005377933
#> alpha_10_13 0.706336075 0.376781385 0.004541701
#> alpha_10_14 0.878936017 -0.152318142 0.004906676
#> alpha_10_15 0.557894985 0.585971028 0.006572904
#> alpha_11_11 0.367949506 -0.900320893 0.005438980
#> alpha_11_12 0.726974833 -0.349152489 0.004696854
#> alpha_11_13 0.322173770 0.990000714 0.005886903
#> alpha_11_14 0.033027605 2.131747557 0.005234892
#> alpha_11_15 0.092245623 -1.683669170 0.005553761
#> alpha_12_12 0.250122864 -1.150051005 0.003819417
#> alpha_12_13 0.280948231 1.078191665 0.004268351
#> alpha_12_14 0.772754514 0.288773760 0.005067540
#> alpha_12_15 0.264741057 -1.115255247 0.005046260
#> alpha_13_13 0.329656950 -0.974805095 0.004074124
#> alpha_13_14 0.918757787 -0.101998600 0.003748735
#> alpha_13_15 0.797994680 0.255943221 0.004923473
#> alpha_14_14 0.223324398 -1.217735773 0.004991197
#> alpha_14_15 0.982320060 -0.022160333 0.005793393
#> alpha_15_15 0.167546727 -1.380129659 0.006705790
#> gamma_1_1 0.594964187 -0.531656122 0.001764391
#> gamma_1_2 0.968338881 0.039691747 0.003720663
#> gamma_1_3 0.459435628 0.739776487 0.001566337
#> gamma_1_4 0.550150345 -0.597534852 0.004018794
#> gamma_1_5 0.823593351 -0.222925678 0.003069025
#> gamma_1_6 0.472989670 -0.717623165 0.003070082
#> gamma_1_7 0.754761554 0.312367096 0.003248041
#> gamma_1_8 0.488240346 -0.693110281 0.003072784
#> gamma_1_9 0.519551358 0.644037129 0.003201475
#> gamma_1_10 0.743251926 -0.327550008 0.004251382
#> gamma_1_11 0.590657599 -0.537883328 0.003165678
#> gamma_1_12 0.401993510 -0.838066227 0.003430735
#> gamma_1_13 0.760595499 0.304698885 0.003058283
#> gamma_1_14 0.977560997 -0.028126828 0.003609597
#> gamma_1_15 0.313068761 1.008803753 0.001812729
#> gamma_2_2 0.211728773 -1.248825862 0.003100587
#> gamma_2_3 0.843381512 0.197569995 0.002787192
#> gamma_2_4 0.994102060 0.007392039 0.003893899
#> gamma_2_5 0.938978172 -0.076554229 0.003689647
#> gamma_2_6 0.846038869 0.194174985 0.003793636
#> gamma_2_7 0.494286151 0.683507598 0.003547581
#> gamma_2_8 0.387038726 0.865000115 0.003148519
#> gamma_2_9 0.855285992 -0.182378125 0.003041322
#> gamma_2_10 0.106902606 -1.612272725 0.003080615

```

```

#> gamma_2_11 0.450393373 0.754759376 0.004014067
#> gamma_2_12 0.431338687 0.786902938 0.003204049
#> gamma_2_13 0.982114539 -0.022417979 0.003196896
#> gamma_2_14 0.740294657 0.331463168 0.002894308
#> gamma_2_15 0.517082226 0.647849608 0.003418918
#> gamma_3_3 0.810320574 -0.240012490 0.005286306
#> gamma_3_4 0.313350621 -1.008216329 0.003844242
#> gamma_3_5 0.810368046 0.239951254 0.004222768
#> gamma_3_6 0.853285261 -0.184928316 0.004404235
#> gamma_3_7 0.115160148 -1.575417326 0.004704440
#> gamma_3_8 0.209882838 -1.253887668 0.004787215
#> gamma_3_9 0.593380889 0.533943118 0.003238925
#> gamma_3_10 0.208105250 1.258792610 0.003611441
#> gamma_3_11 0.492476868 -0.686374679 0.004101316
#> gamma_3_12 0.251979488 -1.145554608 0.003512964
#> gamma_3_13 0.804840587 -0.247087397 0.003070835
#> gamma_3_14 0.364232875 0.907328940 0.002020144
#> gamma_3_15 0.873390165 0.159353764 0.005010148
#> gamma_4_4 0.393962333 0.852453688 0.005292816
#> gamma_4_5 0.843186610 -0.197819089 0.004314955
#> gamma_4_6 0.389699874 -0.860161772 0.004733868
#> gamma_4_7 0.001401809 3.194278415 0.004045583
#> gamma_4_8 0.349196185 -0.936149567 0.004954183
#> gamma_4_9 0.559904048 -0.582984035 0.003578575
#> gamma_4_10 0.324547623 -0.985155647 0.003615220
#> gamma_4_11 0.434257502 -0.781926956 0.004112890
#> gamma_4_12 0.602293332 0.521105425 0.003988483
#> gamma_4_13 0.512007554 0.655714940 0.002898287
#> gamma_4_14 0.661581112 0.437731252 0.004278166
#> gamma_4_15 0.478883766 0.708099023 0.004352475
#> gamma_5_5 0.361464709 0.912577658 0.004656902
#> gamma_5_6 0.237036757 -1.182425886 0.005667047
#> gamma_5_7 0.270176161 1.102656967 0.004338408
#> gamma_5_8 0.925992368 0.092888216 0.004088704
#> gamma_5_9 0.672671768 0.422484012 0.003650899
#> gamma_5_10 0.420268366 -0.805955747 0.003959638
#> gamma_5_11 0.569815693 0.568322958 0.003322285
#> gamma_5_12 0.719987337 0.358475718 0.003056547
#> gamma_5_13 0.543905975 0.606917031 0.002407769
#> gamma_5_14 0.665843961 0.431858910 0.003891474
#> gamma_5_15 0.361392645 -0.912714635 0.005039221
#> gamma_6_6 0.505503995 -0.665854673 0.005765262
#> gamma_6_7 0.542998645 0.608284732 0.003915020
#> gamma_6_8 0.781110940 0.277871581 0.004554181
#> gamma_6_9 0.693280313 0.394407357 0.003181269
#> gamma_6_10 0.307052814 1.021425658 0.004103759
#> gamma_6_11 0.830892985 -0.213556423 0.004360827
#> gamma_6_12 0.208938464 1.256489738 0.004042431
#> gamma_6_13 0.501641715 -0.671908867 0.003524949
#> gamma_6_14 0.625542359 0.488010563 0.003842639
#> gamma_6_15 0.881317987 -0.149298642 0.005836910
#> gamma_7_7 0.504174778 -0.667935480 0.004557112
#> gamma_7_8 0.834591653 -0.208816291 0.004156609

```



```

#> gamma_7_9      0.564081950 -0.576789077      0.003555972
#> gamma_7_10     0.987726179  0.015383560      0.003788324
#> gamma_7_11     0.994442494 -0.006965358      0.003661240
#> gamma_7_12     0.092053959  1.684661187      0.003525673
#> gamma_7_13     0.924962024 -0.094185221      0.002995428
#> gamma_7_14     0.203757046 -1.270920181      0.002882694
#> gamma_7_15     0.579932788 -0.553482898      0.005038848
#> gamma_8_8      0.651888984 -0.451139536      0.003508227
#> gamma_8_9      0.884755886 -0.144942988      0.002801680
#> gamma_8_10     0.203435970 -1.271823126      0.006531205
#> gamma_8_11     0.827796207  0.217528875      0.003445787
#> gamma_8_12     0.764380612  0.299733279      0.003556634
#> gamma_8_13     0.653762584 -0.448541303      0.002467977
#> gamma_8_14     0.192492449  1.303241141      0.003970979
#> gamma_8_15     0.906393605 -0.117588642      0.003772638
#> gamma_9_9      0.685598722 -0.404835106      0.003153426
#> gamma_9_10     0.125386339  1.532551743      0.003398967
#> gamma_9_11     0.828071552  0.217175533      0.003415901
#> gamma_9_12     0.240063921 -1.174827037      0.002840561
#> gamma_9_13     0.283564661 -1.072345982      0.002728219
#> gamma_9_14     0.543393613 -0.607689221      0.002899909
#> gamma_9_15     0.322998833  0.988314119      0.003353265
#> gamma_10_10    0.518897414 -0.645045942      0.004285504
#> gamma_10_11    0.920975988  0.099204391      0.004021225
#> gamma_10_12    0.851092609  0.187724518      0.003511297
#> gamma_10_13    0.547097157 -0.602115651      0.003763362
#> gamma_10_14    0.493790044  0.684293194      0.003384572
#> gamma_10_15    0.645821005  0.459575421      0.003738558
#> gamma_11_11    0.759420655  0.306241660      0.003602731
#> gamma_11_12    0.468808913  0.724418390      0.002852170
#> gamma_11_13    0.556653607  0.587819272      0.002557872
#> gamma_11_14    0.628410359 -0.483965493      0.003195236
#> gamma_11_15    0.690210741  0.398569090      0.003485597
#> gamma_12_12    0.847632523 -0.192140025      0.002740570
#> gamma_12_13    0.104658121  1.622678634      0.003192457
#> gamma_12_14    0.244178312 -1.164606498      0.003029746
#> gamma_12_15    0.483518180 -0.700655266      0.003643999
#> gamma_13_13    0.704815539 -0.378828073      0.002027282
#> gamma_13_14    0.985926873  0.017638964      0.002791689
#> gamma_13_15    0.663192071  0.435510291      0.002628797
#> gamma_14_14    0.558293425 -0.585378228      0.003508762
#> gamma_14_15    0.240007737 -1.174967454      0.003667130
#> gamma_15_15    0.838158943 -0.204248973      0.004792967

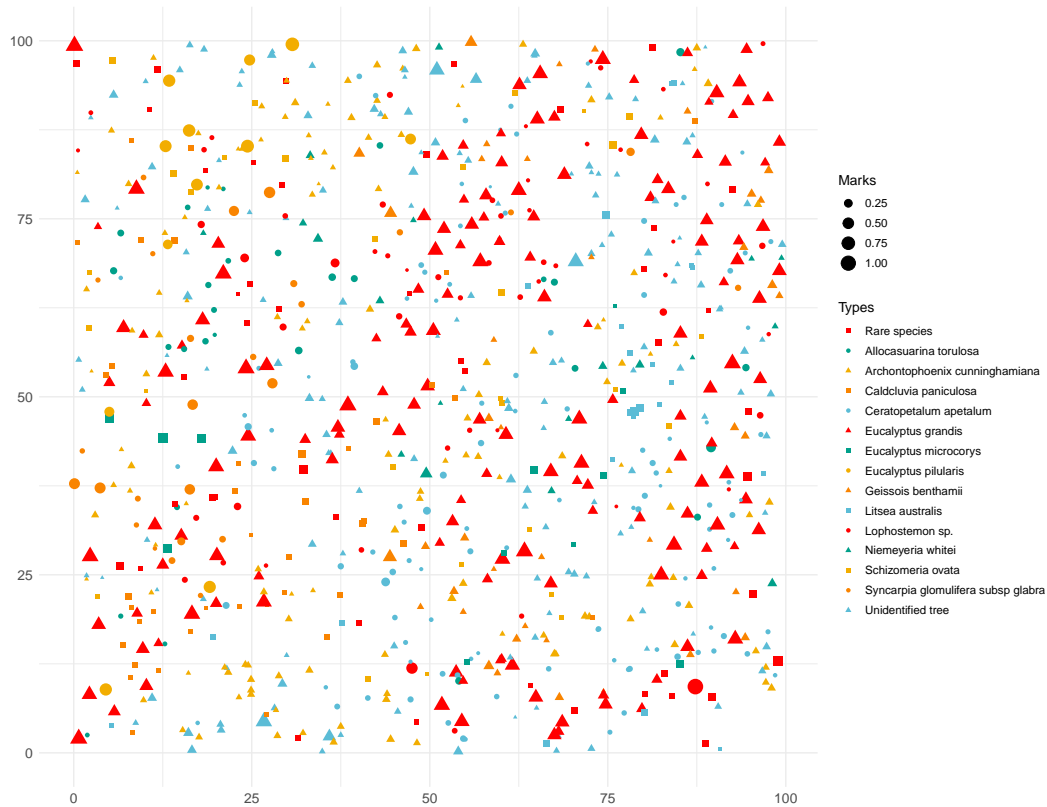
```

The model is also able to account for the trees' diameters, see code below. In this case, the distances matrices are measured as multiples of the trees' dbhs. We do not model any medium-range interactions to also illustrate how that would work.

```

load(ausplots(use_marks = TRUE, plot_minimum_abundance = 10, overall_minimum_abundance = 1))
Bruxner <- configurations$Bruxner
Bruxner_window <- windows$Bruxner
plot(Bruxner)

```



```

ntypes <- nlevels(Bruxner$types)
tm <- Sys.time()
fit <- gibbsm(Bruxner,
  window = Bruxner_window,
  model = "square_exponential", # Short-range interaction
  short_range = matrix(50, ntypes, ntypes), # Matrix of short-range interaction ratios
  saturation = 10, # Saturation parameter
  fitting_package = "glmnet", # Fitting package
  min_dummy = 1e4, # Force at least 1e5 dummy points per species
  max_dummy = 1e4, # Force at maximum 1e5 dummy points per species
  dummy_distribution = "stratified") # Distribution of dummy points
print(Sys.time() - tm)
#> Time difference of 7.901089 secs
summ <- summary(fit)
print(summ)
#>
#> coefficients      se      CI95_lo      CI95_hi Ztest
#> beta0_1      0.157136228 0.92272133 -1.651364346  1.965636802
#> beta0_2     -2.665935639 1.29059337 -5.195452155 -0.136419123 *
#> beta0_3      0.862245936 0.40563799  0.067210094  1.657281779 *
#> beta0_4      0.147714991 0.62907072 -1.085240960  1.380670942
#> beta0_5     -0.151265280 0.43284225 -0.999620500  0.697089940
#> beta0_6     -5.070307863 0.90851344 -6.850961480 -3.289654246 ***
#> beta0_7     -2.510552428 2.72619204 -7.853790644  2.832685787
#> beta0_8     -4.732996302 3.46863483 -11.531395636  2.065403032
#> beta0_9     -2.679426982 0.77475658 -4.197921984 -1.160931979 ***
#> beta0_10    -1.476182872 1.10811023 -3.648039021  0.695673278
#> beta0_11    -0.986378478 0.85513259 -2.662407550  0.689650595

```

#> beta0_12	-2.141432750	1.31200020	-4.712905891	0.430040390	
#> beta0_13	-1.970434943	2.36603223	-6.607772895	2.666903008	
#> beta0_14	-5.155353652	1.87796175	-8.836091042	-1.474616262	**
#> beta0_15	0.024252321	0.46622540	-0.889532680	0.938037322	
#> alpha_1_1	-0.185555795	0.13767744	-0.455398610	0.084287019	
#> alpha_1_2	-0.047599287	0.10352409	-0.250502779	0.155304204	
#> alpha_1_3	-0.212972999	0.05480726	-0.320393251	-0.105552747	***
#> alpha_1_4	-0.129061306	0.08266817	-0.291087943	0.032965331	
#> alpha_1_5	-0.004290146	0.06752582	-0.136638321	0.128058029	
#> alpha_1_6	-0.102320644	0.06012706	-0.220167514	0.015526227	
#> alpha_1_7	-0.121536660	0.28110683	-0.672495928	0.429422607	
#> alpha_1_8	0.068692041	0.15255344	-0.230307212	0.367691294	
#> alpha_1_9	0.069865133	0.10483800	-0.135613567	0.275343834	
#> alpha_1_10	0.163422388	0.13379228	-0.098805653	0.425650429	
#> alpha_1_11	-0.039596356	0.09155601	-0.219042841	0.139850129	
#> alpha_1_12	-0.131152910	0.14502364	-0.415394021	0.153088201	
#> alpha_1_13	-0.321656021	0.20045958	-0.714549570	0.071237529	
#> alpha_1_14	0.139899867	0.13544700	-0.125571366	0.405371100	
#> alpha_1_15	-0.044127705	0.05570128	-0.153300215	0.065044805	
#> alpha_2_2	0.085404262	0.10300805	-0.116487797	0.287296320	
#> alpha_2_3	-0.082565710	0.06531942	-0.210589418	0.045457998	
#> alpha_2_4	-0.238184127	0.09942214	-0.433047941	-0.043320314	*
#> alpha_2_5	-0.085802485	0.08341034	-0.249283749	0.077678779	
#> alpha_2_6	0.020983515	0.08359975	-0.142868976	0.184836006	
#> alpha_2_7	-0.133485380	0.25469961	-0.632687447	0.365716687	
#> alpha_2_8	0.087924740	0.20712464	-0.318032088	0.493881567	
#> alpha_2_9	-0.092563640	0.18186803	-0.449018436	0.263891156	
#> alpha_2_10	0.099823517	0.12537504	-0.145907046	0.345554080	
#> alpha_2_11	-0.057229699	0.10668899	-0.266336276	0.151876879	
#> alpha_2_12	0.053879394	0.15390064	-0.247760317	0.355519105	
#> alpha_2_13	-0.029480279	0.23371700	-0.487557191	0.428596633	
#> alpha_2_14	0.101366872	0.12346649	-0.140623008	0.343356752	
#> alpha_2_15	-0.118339955	0.06642186	-0.248524408	0.011844499	
#> alpha_3_3	-0.041359117	0.03305918	-0.106153917	0.023435682	
#> alpha_3_4	-0.167408845	0.03817572	-0.242231887	-0.092585804	***
#> alpha_3_5	-0.076833506	0.03415922	-0.143784352	-0.009882661	*
#> alpha_3_6	-0.093184297	0.03188510	-0.155677937	-0.030690657	**
#> alpha_3_7	-0.016563249	0.12221040	-0.256091236	0.222964738	
#> alpha_3_8	0.038354655	0.09813263	-0.153981768	0.230691079	
#> alpha_3_9	-0.030016990	0.05210163	-0.132134304	0.072100323	
#> alpha_3_10	-0.029605132	0.06530410	-0.157598818	0.098388554	
#> alpha_3_11	-0.160401897	0.05793005	-0.273942715	-0.046861079	**
#> alpha_3_12	0.021207364	0.06480471	-0.105807540	0.148222268	
#> alpha_3_13	-0.091128137	0.08532900	-0.258369909	0.076113634	
#> alpha_3_14	-0.064008530	0.07238638	-0.205883231	0.077866171	
#> alpha_3_15	-0.079303888	0.02646284	-0.131170109	-0.027437667	**
#> alpha_4_4	0.088127276	0.04886427	-0.007644927	0.183899478	
#> alpha_4_5	-0.047792768	0.04060971	-0.127386340	0.031800805	
#> alpha_4_6	-0.027202890	0.03519722	-0.096188170	0.041782390	
#> alpha_4_7	-0.126546126	0.11938654	-0.360539444	0.107447192	
#> alpha_4_8	-0.009100681	0.10346108	-0.211880664	0.193679302	
#> alpha_4_9	-0.233376096	0.11806082	-0.464771057	-0.001981135	*
#> alpha_4_10	-0.216735813	0.21505388	-0.638233674	0.204762049	

#> alpha_4_11	-0.070968241	0.06934747	-0.206886784	0.064950302	
#> alpha_4_12	-0.019688361	0.10313177	-0.221822912	0.182446191	
#> alpha_4_13	-0.097131870	0.14030693	-0.372128407	0.177864666	
#> alpha_4_14	-0.036836901	0.06919386	-0.172454377	0.098780575	
#> alpha_4_15	-0.136592479	0.04106779	-0.217083859	-0.056101099	***
#> alpha_5_5	-0.067773440	0.04780591	-0.161471301	0.025924422	
#> alpha_5_6	0.024775033	0.04042133	-0.054449320	0.103999386	
#> alpha_5_7	0.154634049	0.19142066	-0.220543558	0.529811656	
#> alpha_5_8	-0.169863955	0.11159741	-0.388590858	0.048862948	
#> alpha_5_9	-0.037852606	0.05631879	-0.148235404	0.072530193	
#> alpha_5_10	-0.256450268	0.11477287	-0.481400957	-0.031499579	*
#> alpha_5_11	0.044440407	0.06470374	-0.082376603	0.171257416	
#> alpha_5_12	-0.195429664	0.09178549	-0.375325927	-0.015533401	*
#> alpha_5_13	-0.194133498	0.12797008	-0.444950253	0.056683257	
#> alpha_5_14	-0.233955644	0.12111469	-0.471336069	0.003424782	
#> alpha_5_15	-0.121051580	0.03583183	-0.191280679	-0.050822481	***
#> alpha_6_6	0.245826387	0.11538995	0.019666247	0.471986528	*
#> alpha_6_7	-0.087667982	0.14629743	-0.374405672	0.199069708	
#> alpha_6_8	-0.018325407	0.18049750	-0.372093999	0.335443184	
#> alpha_6_9	0.051251026	0.06245610	-0.071160687	0.173662738	
#> alpha_6_10	0.012817439	0.07923648	-0.142483209	0.168118087	
#> alpha_6_11	-0.056016766	0.06695647	-0.187249035	0.075215503	
#> alpha_6_12	-0.056548594	0.07885644	-0.211104370	0.098007183	
#> alpha_6_13	-0.020446996	0.13227577	-0.279702737	0.238808745	
#> alpha_6_14	0.093764356	0.11185039	-0.125458385	0.312987097	
#> alpha_6_15	-0.013633173	0.04608449	-0.103957115	0.076690769	
#> alpha_7_7	-0.933975195	1.58088660	-4.032455999	2.164505610	
#> alpha_7_8	-0.613848805	0.59291932	-1.775949320	0.548251710	
#> alpha_7_9	-0.068290156	0.20049489	-0.461252912	0.324672601	
#> alpha_7_10	0.186200396	0.27597934	-0.354709167	0.727109960	
#> alpha_7_11	-0.444733656	0.33378199	-1.098934332	0.209467019	
#> alpha_7_12	0.163656344	0.26630750	-0.358296768	0.685609456	
#> alpha_7_13	0.520219122	0.38611406	-0.236550522	1.276988765	
#> alpha_7_14	0.697233793	0.61803044	-0.514083620	1.908551205	
#> alpha_7_15	-0.034801459	0.14309790	-0.315268192	0.245665274	
#> alpha_8_8	-0.376405841	0.65045416	-1.651272562	0.898460879	
#> alpha_8_9	-0.189018604	0.15992470	-0.502465258	0.124428050	
#> alpha_8_10	-0.369073061	0.26321981	-0.884974416	0.146828294	
#> alpha_8_11	-0.052102180	0.13268528	-0.312160559	0.207956199	
#> alpha_8_12	-0.059947249	0.18565769	-0.423829628	0.303935129	
#> alpha_8_13	0.296196443	0.33357624	-0.357600976	0.949993862	
#> alpha_8_14	0.185370023	0.31879027	-0.439447428	0.810187473	
#> alpha_8_15	0.037040075	0.10208485	-0.163042545	0.237122695	
#> alpha_9_9	0.002941054	0.10190421	-0.196787520	0.202669627	
#> alpha_9_10	-0.699600697	0.24486552	-1.179528306	-0.219673087	**
#> alpha_9_11	-0.015953205	0.09651140	-0.205112069	0.173205660	
#> alpha_9_12	0.131788108	0.12318031	-0.109640859	0.373217074	
#> alpha_9_13	0.178908369	0.16298819	-0.140542607	0.498359345	
#> alpha_9_14	-0.220382795	0.22732388	-0.665929409	0.225163819	
#> alpha_9_15	-0.049498592	0.05986475	-0.166831350	0.067834166	
#> alpha_10_10	0.024141508	0.11957544	-0.210222051	0.258505066	
#> alpha_10_11	0.038359418	0.11516479	-0.187359418	0.264078253	
#> alpha_10_12	0.003746273	0.13170748	-0.254395644	0.261888191	

```

#> alpha_10_13 0.104436534 0.21064990 -0.308429677 0.517302745
#> alpha_10_14 -0.410534242 0.27293840 -0.945483668 0.124415184
#> alpha_10_15 -0.010756329 0.06511745 -0.138384181 0.116871523
#> alpha_11_11 -0.104170251 0.10392323 -0.307856034 0.099515531
#> alpha_11_12 0.091039340 0.11547303 -0.135283637 0.317362317
#> alpha_11_13 0.197094439 0.14160748 -0.080451122 0.474639999
#> alpha_11_14 0.211126636 0.15155067 -0.085907221 0.508160492
#> alpha_11_15 -0.107406867 0.04933271 -0.204097204 -0.010716529 *
#> alpha_12_12 0.241256377 0.20630162 -0.163087366 0.645600120
#> alpha_12_13 -0.109361361 0.22110574 -0.542720656 0.323997935
#> alpha_12_14 -0.171447204 0.18809136 -0.540099491 0.197205084
#> alpha_12_15 -0.098848571 0.07011838 -0.236278071 0.038580929
#> alpha_13_13 -0.635629490 0.54115792 -1.696279528 0.425020548
#> alpha_13_14 -0.334154255 0.27548565 -0.874096198 0.205787688
#> alpha_13_15 -0.055891056 0.10774500 -0.267067377 0.155285266
#> alpha_14_14 -0.104176404 0.22154951 -0.538405470 0.330052662
#> alpha_14_15 -0.077921113 0.08813787 -0.250668164 0.094825939
#> alpha_15_15 -0.062647079 0.03918641 -0.139451030 0.014156872
#>
#> Pval Zval se_numerical_proportion
#> beta0_1 8.647770e-01 0.17029652 0.18608016
#> beta0_2 3.885997e-02 -2.06566662 0.08185909
#> beta0_3 3.353209e-02 2.12565383 0.27814890
#> beta0_4 8.143526e-01 0.23481460 0.23280487
#> beta0_5 7.267367e-01 -0.34946977 0.24061727
#> beta0_6 2.392996e-08 -5.58088373 0.07489315
#> beta0_7 3.571022e-01 -0.92090080 0.05482403
#> beta0_8 1.724063e-01 -1.36451271 0.04885190
#> beta0_9 5.433710e-04 -3.45841137 0.11821619
#> beta0_10 1.828068e-01 -1.33216247 0.17313382
#> beta0_11 2.487134e-01 -1.15348017 0.11183835
#> beta0_12 1.026396e-01 -1.63218935 0.08335727
#> beta0_13 4.049567e-01 -0.83280140 0.07409845
#> beta0_14 6.047667e-03 -2.74518566 0.05642211
#> beta0_15 9.585140e-01 0.05201845 0.22683002
#> alpha_1_1 1.777364e-01 -1.34775749 0.14682044
#> alpha_1_2 6.456673e-01 -0.45978947 0.12368718
#> alpha_1_3 1.019708e-04 -3.88585392 0.19435334
#> alpha_1_4 1.184773e-01 -1.56119708 0.15101283
#> alpha_1_5 9.493418e-01 -0.06353342 0.15786321
#> alpha_1_6 8.880405e-02 -1.70174037 0.12986675
#> alpha_1_7 6.654867e-01 -0.43235043 0.07182476
#> alpha_1_8 6.525072e-01 0.45028182 0.14719884
#> alpha_1_9 5.051488e-01 0.66641041 0.11358468
#> alpha_1_10 2.219106e-01 1.22146355 0.12275975
#> alpha_1_11 6.653909e-01 -0.43248231 0.12453286
#> alpha_1_12 3.658070e-01 -0.90435539 0.10881914
#> alpha_1_13 1.085834e-01 -1.60459294 0.12162118
#> alpha_1_14 3.016622e-01 1.03287538 0.09472011
#> alpha_1_15 4.282321e-01 -0.79222061 0.17782649
#> alpha_2_2 4.070462e-01 0.82910283 0.12720721
#> alpha_2_3 2.062192e-01 -1.26403008 0.14667811
#> alpha_2_4 1.658934e-02 -2.39568499 0.13546281
#> alpha_2_5 3.036304e-01 -1.02867923 0.12263250

```



```

#> alpha_2_6      8.018143e-01  0.25099974      0.07339592
#> alpha_2_7      6.002163e-01 -0.52408945      0.07356391
#> alpha_2_8      6.712000e-01  0.42450160      0.05744384
#> alpha_2_9      6.107799e-01 -0.50896047      0.07847583
#> alpha_2_10     4.259162e-01  0.79619929      0.11066291
#> alpha_2_11     5.916710e-01 -0.53641617      0.08703512
#> alpha_2_12     7.262696e-01  0.35009207      0.09099939
#> alpha_2_13     8.996238e-01 -0.12613664      0.07867154
#> alpha_2_14     4.116422e-01  0.82100713      0.07573087
#> alpha_2_15     7.480768e-02 -1.78164169      0.13525651
#> alpha_3_3      2.109115e-01 -1.25106306      0.30304897
#> alpha_3_4      1.158700e-05 -4.38521745      0.23286645
#> alpha_3_5      2.449497e-02 -2.24927563      0.18423046
#> alpha_3_6      3.472300e-03 -2.92250326      0.17245458
#> alpha_3_7      8.921924e-01 -0.13553060      0.11970326
#> alpha_3_8      6.959118e-01  0.39084507      0.14737336
#> alpha_3_9      5.645315e-01 -0.57612385      0.14921901
#> alpha_3_10     6.503020e-01 -0.45334262      0.17543052
#> alpha_3_11     5.624777e-03 -2.76888917      0.13879179
#> alpha_3_12     7.434786e-01  0.32725033      0.14577145
#> alpha_3_13     2.855376e-01 -1.06796206      0.14573269
#> alpha_3_14     3.765548e-01 -0.88426205      0.14574231
#> alpha_3_15     2.728284e-03 -2.99680143      0.25330512
#> alpha_4_4      7.130789e-02  1.80351168      0.26166250
#> alpha_4_5      2.392433e-01 -1.17688025      0.21264233
#> alpha_4_6      4.395990e-01 -0.77287046      0.13026238
#> alpha_4_7      2.891583e-01 -1.05996979      0.11577063
#> alpha_4_8      9.299066e-01 -0.08796237      0.11299087
#> alpha_4_9      4.807051e-02 -1.97674461      0.10852599
#> alpha_4_10     3.135404e-01 -1.00782098      0.11521622
#> alpha_4_11     3.061321e-01 -1.02337175      0.13728569
#> alpha_4_12     8.486001e-01 -0.19090491      0.09123360
#> alpha_4_13     4.887607e-01 -0.69228133      0.11495885
#> alpha_4_14     5.944681e-01 -0.53237239      0.13010725
#> alpha_4_15     8.809404e-04 -3.32602497      0.21400986
#> alpha_5_5      1.562845e-01 -1.41767911      0.19928534
#> alpha_5_6      5.399294e-01  0.61291976      0.16753688
#> alpha_5_7      4.191924e-01  0.80782318      0.06952670
#> alpha_5_8      1.279806e-01 -1.52211378      0.12105574
#> alpha_5_9      5.015116e-01 -0.67211327      0.15060960
#> alpha_5_10     2.545575e-02 -2.23441542      0.13224177
#> alpha_5_11     4.921905e-01  0.68682897      0.12009015
#> alpha_5_12     3.323773e-02 -2.12919989      0.12853095
#> alpha_5_13     1.292610e-01 -1.51702252      0.10296340
#> alpha_5_14     5.339817e-02 -1.93168680      0.09168301
#> alpha_5_15     7.292877e-04 -3.37832525      0.17853645
#> alpha_6_6      3.313886e-02  2.13039691      0.07281293
#> alpha_6_7      5.490096e-01 -0.59924486      0.05676140
#> alpha_6_8      9.191320e-01 -0.10152721      0.05818043
#> alpha_6_9      4.118783e-01  0.82059275      0.09994003
#> alpha_6_10     8.714934e-01  0.16176184      0.09652831
#> alpha_6_11     4.028092e-01 -0.83661469      0.08799619
#> alpha_6_12     4.733074e-01 -0.71710815      0.07357682

```

```

#> alpha_6_13 8.771536e-01 -0.15457855 0.06492921
#> alpha_6_14 4.018614e-01 0.83830154 0.05989060
#> alpha_6_15 7.673599e-01 -0.29582996 0.16223481
#> alpha_7_7 5.546598e-01 -0.59079202 0.03143524
#> alpha_7_8 3.005293e-01 -1.03529904 0.04455315
#> alpha_7_9 7.333987e-01 -0.34060797 0.08602599
#> alpha_7_10 4.998730e-01 0.67468963 0.06441851
#> alpha_7_11 1.827263e-01 -1.33240760 0.06529219
#> alpha_7_12 5.388592e-01 0.61453899 0.06752867
#> alpha_7_13 1.778773e-01 1.34731982 0.06897916
#> alpha_7_14 2.592547e-01 1.12815444 0.03703433
#> alpha_7_15 8.078502e-01 -0.24320035 0.09833597
#> alpha_8_8 5.628040e-01 -0.57868158 0.04863551
#> alpha_8_9 2.372364e-01 -1.18192251 0.08311883
#> alpha_8_10 1.608711e-01 -1.40214772 0.07570109
#> alpha_8_11 6.945596e-01 -0.39267489 0.10273293
#> alpha_8_12 7.467776e-01 -0.32289129 0.07104881
#> alpha_8_13 3.745718e-01 0.88794226 0.06295955
#> alpha_8_14 5.609173e-01 0.58147955 0.04546399
#> alpha_8_15 7.167273e-01 0.36283618 0.14917886
#> alpha_9_9 9.769755e-01 0.02886096 0.12349144
#> alpha_9_10 4.275564e-03 -2.85708124 0.09408476
#> alpha_9_11 8.687089e-01 -0.16529866 0.10158831
#> alpha_9_12 2.846735e-01 1.06987968 0.10491989
#> alpha_9_13 2.723456e-01 1.09767691 0.11736371
#> alpha_9_14 3.323127e-01 -0.96946611 0.06605941
#> alpha_9_15 4.083276e-01 -0.82684034 0.13761318
#> alpha_10_10 8.400000e-01 0.20189353 0.15921305
#> alpha_10_11 7.390717e-01 0.33308287 0.10847115
#> alpha_10_12 9.773081e-01 0.02844389 0.10274453
#> alpha_10_13 6.200479e-01 0.49578251 0.08766147
#> alpha_10_14 1.325485e-01 -1.50412785 0.06667602
#> alpha_10_15 8.687995e-01 -0.16518352 0.15425654
#> alpha_11_11 3.161616e-01 -1.00237699 0.10459023
#> alpha_11_12 4.304607e-01 0.78840350 0.09210261
#> alpha_11_13 1.639720e-01 1.39183635 0.10592574
#> alpha_11_14 1.635868e-01 1.39310921 0.07086845
#> alpha_11_15 2.946612e-02 -2.17719366 0.14161068
#> alpha_12_12 2.422283e-01 1.16943521 0.09169449
#> alpha_12_13 6.208746e-01 -0.49461112 0.08886403
#> alpha_12_14 3.620266e-01 -0.91151027 0.06863998
#> alpha_12_15 1.586170e-01 -1.40973836 0.14004279
#> alpha_13_13 2.401656e-01 -1.17457301 0.07340572
#> alpha_13_14 2.251435e-01 -1.21296431 0.06656048
#> alpha_13_15 6.039459e-01 -0.51873456 0.11556974
#> alpha_14_14 6.381998e-01 -0.47021726 0.06427866
#> alpha_14_15 3.766519e-01 -0.88408209 0.11823706
#> alpha_15_15 1.098886e-01 -1.59869405 0.23995342

```