Boruta

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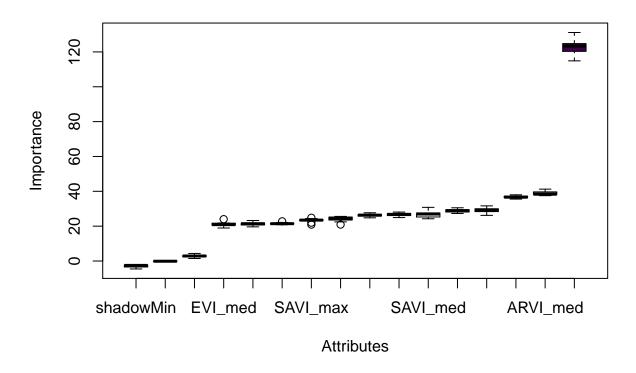
R Markdown

\$ SAVI_max

```
#install.packages("Boruta")
library(Boruta)
## Warning: package 'Boruta' was built under R version 4.0.5
library(RColorBrewer)
## Warning: package 'RColorBrewer' was built under R version 4.0.3
# 2021 data
data_sampling = read.csv("SRER21_dataset_v1.csv", header = T)
data_sampling = na.omit(data_sampling)
data_sampling$Veg_class = as.factor(data_sampling$Veg_class)
str(data_sampling)
## 'data.frame':
                   6805 obs. of 19 variables:
## $ ï..OID_
                : int
                       2 3 4 5 6 7 8 9 10 11 ...
                 : int 2 3 4 5 6 7 8 9 10 11 ...
## $ Id
## $ gridcode
              : int 2 3 4 5 6 7 8 9 10 11 ...
## $ Shape_Length: num 20.4 8.2 55.8 15.2 27.2 ...
## $ Shape_Area : num 2.38 1.32 24.43 1.88 9.29 ...
## $ CH mean
                : num 1 1 0.92 1 0.143 ...
## $ ARVI_mean : num 0.2739 0.5302 0.478 0.3429 0.0444 ...
## $ ARVI med : num 0.2739 0.5302 0.501 0.3429 -0.0089 ...
## $ ARVI_max
                : num 0.274 0.53 0.617 0.343 0.266 ...
## $ EVI mean
                : num 0.323 0.461 0.381 0.347 0.182 ...
## $ EVI med
                : num 0.323 0.461 0.385 0.347 0.147 ...
## $ EVI max
                : num 0.323 0.461 0.447 0.347 0.316 ...
## $ NDVI_mean : num
                       0.428 0.612 0.576 0.469 0.224 ...
## $ NDVI_med : num 0.428 0.612 0.597 0.469 0.179 ...
## $ NDVI_max : num 0.428 0.612 0.674 0.469 0.412 ...
## $ SAVI_mean : num 0.312 0.416 0.36 0.324 0.178 ...
## $ SAVI_med
                 : num 0.312 0.416 0.364 0.324 0.147 ...
```

: num 0.312 0.416 0.414 0.324 0.299 ...

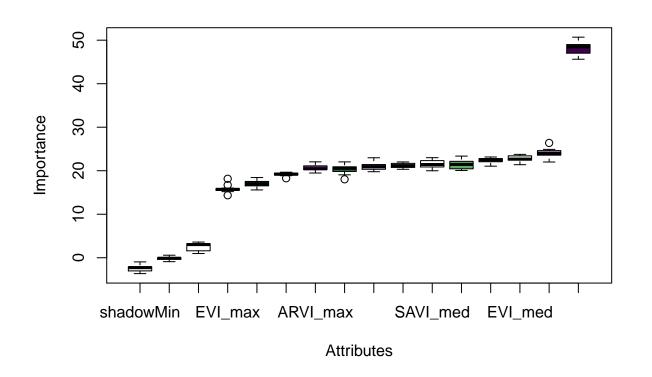
```
## $ Veg_class : Factor w/ 2 levels "non-woody", "woody": 2 2 2 2 1 2 2 1 2 2 ...
## - attr(*, "na.action")= 'omit' Named int [1:962] 21 22 37 55 66 71 78 79 90 91 ...
## ..- attr(*, "names")= chr [1:962] "21" "22" "37" "55" ...
table(data_sampling$Veg_class)
##
## non-woody
                woody
       2230
                  4575
# set seed and run the Boruta algorithm
set.seed(200)
traindata = subset(data_sampling, select = -c(ï..OID_,Id,gridcode,Shape_Length,Shape_Area))
boruta.test <- Boruta(Veg_class~., data = traindata, doTrace = 2)</pre>
## 1. run of importance source...
  2. run of importance source...
## 3. run of importance source...
  4. run of importance source...
  5. run of importance source...
  6. run of importance source...
## 7. run of importance source...
## 8. run of importance source...
## 9. run of importance source...
  10. run of importance source...
## 11. run of importance source...
## After 11 iterations, +29 secs:
   confirmed 13 attributes: ARVI_max, ARVI_mean, ARVI_med, CH_mean, EVI_max and 8 more;
  no more attributes left.
print(boruta.test) # print final output of Boruta
## Boruta performed 11 iterations in 29.38833 secs.
## 13 attributes confirmed important: ARVI_max, ARVI_mean, ARVI_med,
## CH_mean, EVI_max and 8 more;
## No attributes deemed unimportant.
```



```
attStats(boruta.test) # table
##
               meanImp medianImp
                                     minImp
                                               maxImp normHits decision
## CH mean
             122.96926 123.32399 114.86973 131.13801
                                                              1 Confirmed
                        36.62767
## ARVI_mean
             36.80034
                                   35.53964
                                             37.99233
                                                              1 Confirmed
## ARVI med
              38.91326
                         38.34335
                                   37.50898
                                             41.24633
                                                              1 Confirmed
## ARVI_max
              26.59549
                        26.78405
                                   24.92877
                                             28.09224
                                                              1 Confirmed
## EVI_mean
              24.14288
                         24.43542
                                   20.90736
                                             25.60534
                                                              1 Confirmed
                                             24.02037
## EVI_med
                        20.88274
                                   18.94872
                                                              1 Confirmed
              21.12333
## EVI max
              21.35716
                        21.41091
                                   19.61141
                                             23.24885
                                                              1 Confirmed
## NDVI_mean
              26.26490
                        26.31163
                                   24.78469
                                             27.68538
                                                              1 Confirmed
## NDVI med
              28.84034
                                   27.28709
                                                              1 Confirmed
                        28.86728
                                             30.54341
## NDVI_max
              21.52566
                        21.43104
                                   20.83191
                                             22.78843
                                                              1 Confirmed
## SAVI_mean
                         29.26053
                                   26.19459
                                                              1 Confirmed
              29.14574
                                             31.65369
## SAVI_med
              26.84346
                         26.97480
                                   24.24477
                                             30.80097
                                                              1 Confirmed
                                                              1 Confirmed
## SAVI_max
              23.29228
                        23.47327
                                   20.88388
                                             24.83504
getConfirmedFormula(boruta.test)
## Veg_class ~ CH_mean + ARVI_mean + ARVI_med + ARVI_max + EVI_mean +
       EVI_med + EVI_max + NDVI_mean + NDVI_med + NDVI_max + SAVI_mean +
##
       SAVI_med + SAVI_max
## <environment: 0x000000020523268>
```

```
# 2017 data
data_sampling17 = read.csv("SRER_2017_training_bi.csv", header = T)
data_sampling17 = na.omit(data_sampling17)
data_sampling17$Veg_class = as.factor(data_sampling17$Veg_class)
str(data_sampling17)
## 'data.frame': 4339 obs. of 19 variables:
                : int 1 2 3 4 5 6 7 8 9 10 ...
## $ OID
## $ Id
                : int 2 3 5 6 7 8 9 10 11 12 ...
## $ gridcode
              : int 2 3 5 6 7 8 9 10 11 12 ...
## $ Shape_Length: num 41.6 31.4 33.4 32.2 28.8 ...
## $ Shape_Area : num 17.41 5.05 4.84 14.2 10.73 ...
## $ CH_mean
                : num 0.1907 0.045 0.01 0.0117 0.0138 ...
## $ ARVI max : num 0.6091 0.3878 0.0388 0.1898 0.3227 ...
## $ ARVI_mean : num 0.34418 0.2453 0.00404 0.03342 0.08032 ...
## $ ARVI_med : num 0.3794 0.2749 0.0268 0.019 0.0615 ...
## $ EVI_max
                : num 0.443 0.332 0.151 0.199 0.248 ...
## $ EVI_mean : num 0.292 0.253 0.132 0.142 0.159 ...
## $ EVI_med
                : num 0.291 0.244 0.135 0.138 0.142 ...
## $ NDVI_max
                : num 0.666 0.526 0.208 0.341 0.457 ...
## $ NDVI mean : num 0.477 0.407 0.182 0.207 0.247 ...
## $ NDVI_med : num 0.508 0.434 0.205 0.197 0.228 ...
## $ SAVI_max
                : num 0.407 0.329 0.15 0.197 0.249 ...
## $ SAVI_mean : num 0.286 0.255 0.132 0.142 0.159 ...
## $ SAVI med : num 0.288 0.248 0.135 0.139 0.143 ...
## $ Veg_class : Factor w/ 2 levels "non-woody", "woody": 2 1 1 1 1 2 1 1 2 2 ...
table(data_sampling17$Veg_class)
##
## non-woody
                woody
##
       2088
                 2251
# set seed and run the Boruta algorithm
set.seed(200)
traindata17 = subset(data_sampling17, select = -c(OID_,Id,gridcode,Shape_Length,Shape_Area))
boruta.test17 <- Boruta(Veg_class~., data = traindata17, doTrace = 2)
## 1. run of importance source...
## 2. run of importance source...
## 3. run of importance source...
## 4. run of importance source...
## 5. run of importance source...
```

```
6. run of importance source...
    7. run of importance source...
    8. run of importance source...
##
    9. run of importance source...
    10. run of importance source...
##
    11. run of importance source...
##
## After 11 iterations, +24 secs:
    confirmed 13 attributes: ARVI_max, ARVI_mean, ARVI_med, CH_mean, EVI_max and 8 more;
    no more attributes left.
print(boruta.test17) # print final output of Boruta
## Boruta performed 11 iterations in 23.67566 secs.
## 13 attributes confirmed important: ARVI_max, ARVI_mean, ARVI_med,
## CH_mean, EVI_max and 8 more;
  No attributes deemed unimportant.
plot(boruta.test17, col = brewer.pal(11, "PRGn")) # box plot
```



attStats(boruta.test17) # table

```
##
             meanImp medianImp
                              minImp maxImp normHits decision
            48.17478 48.46436 45.62041 50.69171
## CH_mean
                                                     1 Confirmed
## ARVI_max 20.61580 20.44995 19.47104 22.04327
                                                     1 Confirmed
## ARVI mean 24.09615 23.96154 22.00115 26.39015
                                                     1 Confirmed
## ARVI_med 21.00214 20.94443 19.77373 22.97900
                                                     1 Confirmed
## EVI_max
            1 Confirmed
## EVI_mean 21.21644 21.18202 20.33218 22.01612
                                                     1 Confirmed
## EVI_med
            22.73651 22.65984 21.38691 23.75615
                                                     1 Confirmed
## NDVI_max 19.16496 19.18637 18.26038 19.65658
                                                     1 Confirmed
                                                     1 Confirmed
## NDVI mean 21.43923 21.44484 20.05836 23.36056
## NDVI_med 20.28855 20.54305 18.02811 22.02879
                                                     1 Confirmed
## SAVI_max 17.06834 17.00413 15.58676 18.43359
                                                     1 Confirmed
## SAVI_mean 22.35667 22.48347 21.04472 23.15362
                                                     1 Confirmed
## SAVI_med 21.50312 21.42756 19.99077 22.99684
                                                     1 Confirmed
```

getConfirmedFormula(boruta.test17) # model

```
## Veg_class ~ CH_mean + ARVI_max + ARVI_mean + ARVI_med + EVI_max +
## EVI_mean + EVI_med + NDVI_max + NDVI_mean + NDVI_med + SAVI_max +
## SAVI_mean + SAVI_med
## <environment: 0x00000000201332c8>
```