Example: Pre-Computed Kernel Matrices with SVM Optimization via KeBABS

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December 21, 2017

The results below are generated from an R script.

```
## to run this file as a whole and produce a PDF report, enter the following:
## > install.packages("knitr") ## if not already installed
## > library(knitr)
## > stitch("KeBABS_MWE.R")
library(kebabs)
## if the package is not installed, enter the following:
## > source("https://bioconductor.org/biocLite.R")
## > biocLite("kebabs")
## load data
data(iris)
## transform into binary -1/+1 classification problem
iris$Species <- factor(ifelse(iris$Species == "setosa", +1, -1))</pre>
train <- sort(sample(1:nrow(iris), 0.6 * nrow(iris)))</pre>
test <- (1:nrow(iris))[-train]</pre>
## compute simple kernel matrix using linear kernel
Kmat <- tcrossprod(as.matrix(iris[train, 1:4]))</pre>
## normalize kernel matrix
selfSim <- sqrt(diag(Kmat))</pre>
Kmat <- sweep(Kmat, 1, selfSim, FUN="/") # scale rows</pre>
Kmat <- sweep(Kmat, 2, selfSim, FUN="/") # scale columns</pre>
Kmat <- as(Kmat, "KernelMatrix")</pre>
## train SVM
model <- kebabs:::svmd.default(Kmat, iris$Species[train], cost=1)</pre>
## compute "kernel matrix" of test vs. support vectors
## (model$index contains indices of support vectors)
KmatTest <- tcrossprod(as.matrix(iris[test, 1:4]),</pre>
                        as.matrix(iris[train[model$index], 1:4]))
selfSimTest <- sqrt(apply(as.matrix(iris[test, 1:4]), 1,</pre>
                            function(x) sum(x^2)))
```

^{*}This report is automatically generated with the R package knitr (version 1.17).

```
KmatTest <- sweep(KmatTest, 1, selfSimTest, FUN="/") # scale rows</pre>
KmatTest <- sweep(KmatTest, 2, selfSim[model$index], FUN="/") # scale columns</pre>
KmatTest <- as(KmatTest, "KernelMatrix")</pre>
## make predictions for test samples
## (model$coefs ... alpha_i * y_i for support vectors,
## model$rho
               ... −b,
## model$levels ... labels used by SVM,
## model$label ... assignment of labels)
yTest <- factor(model$levels[ifelse(KmatTest %*% model$coefs - model$rho >= 0,
                                    model$label[1], model$label[2])])
## compute confusion table
table(y=iris$Species[test], g=yTest)
##
## y -1 1
   -1 42 0
##
## 1 0 18
```

The R session information (including the OS info, R version and all packages used):

```
sessionInfo()
## R version 3.4.3 (2017-11-30)
## Platform: x86_64-pc-linux-gnu (64-bit)
## Running under: Ubuntu 17.10
## Matrix products: default
## BLAS: /usr/lib/x86 64-linux-gnu/blas/libblas.so.3.7.1
## LAPACK: /usr/lib/x86_64-linux-gnu/lapack/liblapack.so.3.7.1
## locale:
## [1] LC CTYPE=en US.UTF-8
                               LC NUMERIC=C
                                                          LC TIME=en US.UTF-8
## [4] LC_COLLATE=en_US.UTF-8
                               LC_MONETARY=en_US.UTF-8
                                                         LC_MESSAGES=en_US.UTF-8
                              LC NAME=C
## [7] LC PAPER=en US.UTF-8
                                                          LC ADDRESS=C
## [10] LC_TELEPHONE=C
                               LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C
## attached base packages:
                                                               datasets methods
## [1] stats4
               parallel stats graphics grDevices utils
## [9] base
##
## other attached packages:
## [1] kebabs_1.12.0
                         kernlab_0.9-25 Biostrings_2.46.0 XVector_0.18.0
## [5] IRanges_2.12.0
                         S4Vectors_0.16.0
                                           BiocGenerics_0.24.0 knitr_1.17
## loaded via a namespace (and not attached):
## [1] Rcpp_0.12.13 lattice_0.20-35 class_7.3-14
                                                      grid_3.4.3
                                                                      magrittr_1.5
## [6] evaluate 0.10.1 e1071 1.6-8 highr 0.6
                                                      stringi 1.1.6 zlibbioc 1.24.0
                                                   stringr_1.2.0 LiblineaR_2.10-8
## [11] Matrix_1.2-11
                       apcluster_1.4.4 tools_3.4.3
## [16] compiler_3.4.3
Sys.time()
## [1] "2017-12-21 09:58:42 CET"
```