# **R Reference Card for Data Mining**

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The latest version is available at http://www.RDataMining.com. Click the link also for document *R* and Data Mining: Examples and Case Studies. The package names are in parentheses.

## **Association Rules & Frequent Itemsets**

## **APRIORI Algorithm**

a level-wise, breadth-first algorithm which counts transactions to find frequent itemsets

apriori() mine associations with APRIORI algorithm (arules)

## **ECLAT Algorithm**

employs equivalence classes, depth-first search and set intersection instead of counting

eclat () mine frequent itemsets with the Eclat algorithm (arules)

## **Packages**

arules mine frequent itemsets, maximal frequent itemsets, closed frequent itemsets and association rules. It includes two algorithms, Apriori and Eclat.

arules Viz visualizing association rules

## **Sequential Patterns**

### **Functions**

**cspade ()** mining frequent sequential patterns with the cSPADE algorithm (arulesSequences)

**seqefsub()** searching for frequent subsequences (*TraMineR*)

### **Packages**

arulesSequences add-on for arules to handle and mine frequent sequences TraMineR mining, describing and visualizing sequences of states or events

## **Classification & Prediction**

#### **Decision Trees**

ctree () conditional inference trees, recursive partitioning for continuous, censored, ordered, nominal and multivariate response variables in a conditional inference framework (party)

rpart () recursive partitioning and regression trees (rpart)

**mob ()** model-based recursive partitioning, yielding a tree with fitted models associated with each terminal node (*party*)

#### **Random Forest**

cforest () random forest and bagging ensemble (party)

randomForest() random forest(randomForest)

## **Packages**

rpart recursive partitioning and regression trees

party recursive partitioning

randomForest classification and regression based on a forest of trees using random inputs

rpartOrdinal ordinal classification trees, deriving a classification tree when the response to be predicted is ordinal

rpart.plot plots rpart models with an enhanced version of plot.rpart in the rpart package

## Regression

## **Functions**

lm() linear regression

glm() generalized linear regression

nls() non-linear regression

predict() predict with models

residuals () residuals, the difference between observed values and fitted values

gls() fit a linear model using generalized least squares (nlme)

gnls () fit a nonlinear model using generalized least squares (nlme)

#### **Packages**

nlme linear and nonlinear mixed effects models

## Clustering

## **Partitioning based Clustering**

partition the data into k groups first and then try to improve the quality of clustering by moving objects from one group to another

kmeans () perform k-means clustering on a data matrix

pam() the Partitioning Around Medoids (PAM) clustering method (cluster)

**kmeansCBI()** interface function for clustering methods (fpc)

**kmeansruns ()** call kmeans for the k-means clustering method and includes estimation of the number of clusters and finding an optimal solution from several starting points (*fpc*)

**pamk ()** the Partitioning Around Medoids (PAM) clustering method with estimation of number of clusters (fpc)

clara() Clustering Large Applications (cluster)

**fanny** (x, k, ...) compute a fuzzy clustering of the data into k clusters (cluster)

kcca () k-centroids clustering (flexclust)

ccfkms () clustering with Conjugate Convex Functions

apclusterK() affinity propagation clustering to get K clusters (apcluster)
cclust() Convex Clustering, incl. k-means and two other clustering algorithms (cclust)

**KMeansSparseCluster()** sparse k-means clustering (*sparcl*)

tclust(x,k,alpha,...) trimmed k-means with which a proportion alpha of observations may be trimmed (tclust)

## **Hierarchical Clustering**

a hierarchical decomposition of data in either bottom-up (agglomerative) or top-down (divisive) way

hclust (d, method, ...) hierarchical cluster analysis on a set of dissimilarities d using the method for agglomeration

pvclust() hierarchical clustering with p-values via multi-scale bootstrap
 resampling (pvclust)

agnes () agglomerative hierarchical clustering (cluster)

diana() divisive hierarchical clustering (cluster)

mona () divisive hierarchical clustering of a dataset with binary variables only (cluster)

rockCluster() cluster a data matrix using the Rock algorithm (cba)
proximus() cluster the rows of a logical matrix using the Proximus algorithm (cba)

isopam() Isopam clustering algorithm (isopam)

LLAhclust () hierarchical clustering based on likelihood linkage analysis (LLAhclust)

**flashClust()** optimal hierarchical clustering (*flashClust*)

fastcluster() fast hierarchical clustering (fastcluster)

cutreeDynamic(), cutreeHybrid() detection of clusters in hierarchical clustering dendrograms (dynamicTreeCut)

### **Model based Clustering**

Mclust() model-based clustering (mclust)

HDDC () a model-based method for high dimensional data clustering (HD-classif)

**fixmahal ()** Mahalanobis Fixed Point Clustering (fpc)

**fixreg()** Regression Fixed Point Clustering (fpc)

**mergenormals ()** clustering by merging Gaussian mixture components (fpc)

## **Density based Clustering**

generate clusters by connecting dense regions

dbscan(data,eps,MinPts,...) generate a density based clustering
 of arbitrary shapes, with neighborhood radius set as eps and density
 threshold as MinPts (fpc)

pdfCluster() clustering via kernel density estimation (pdfCluster)

## **Other Clustering Techniques**

mixer() random graph clustering (mixer)

orclus () ORCLUS subspace clustering (orclus)

## **Plotting Clustering Solutions**

plotcluster() visualisation of a clustering or grouping in data (fpc)

plot.hclust() plot clusters (fpc)

plot.agnes(), plot.diana(), plot.mona(),

plot.partition() plot clusters (cluster)

**bannerplot ()** a horizontal barplot visualizing a hierarchical clustering (cluster)

#### **Cluster Validation**

**silhouette()** compute or extract silhouette information (*cluster*)

**cluster.stats()** compute several cluster validity statistics from a clustering and a dissimilarity matrix (fpc)

clValid() calculate validation measures for a given set of clustering algorithms and number of clusters (clValid)

clustIndex() calculate the values of several clustering indexes, which can be independently used to determine the number of clusters existing in a data set

## **Packages**

cluster cluster analysis

*fpc* various methods for clustering and cluster validation

mclust model-based clustering and normal mixture modeling

pvclust hierarchical clustering with p-values

apcluster Affinity Propagation Clustering

cclust Convex Clustering methods, including k-means algorithm, On-line Update algorithm and Neural Gas algorithm and calculation of indexes for finding the number of clusters in a data set

cba Clustering for Business Analytics, including clustering techniques such as Proximus and Rock

bclust Bayesian clustering using spike-and-slab hierarchical model, suitable for clustering high-dimensional data

 $\emph{biclust}$  algorithms to find bi-clusters in two-dimensional data

clue cluster ensembles

*clues* clustering method based on local shrinking

clValid validation of clustering results

clv cluster validation techniques, contains popular internal and external cluster validation methods for outputs produced by package cluster

clustTool GUI for clustering data with spatial information

bayesclust tests/searches for significant clusters in genetic data

clustvarsel variable selection for model-based clustering

clustsig significant cluster analysis, tests to see which (if any) clusters are statistically different

clusterfly explore clustering interactively

clusterSim search for optimal clustering procedure for a data set

clusterGeneration random cluster generation

clusterCons calculate the consensus clustering result from re-sampled clustering experiments with the option of using multiple algorithms and parameter

gcExplorer graphical cluster explorer

hybridHclust hybrid hierarchical clustering via mutual clusters

**Modalclust** hierarchical modal Clustering

*iCluster* integrative clustering of multiple genomic data types

EMCC evolutionary Monte Carlo (EMC) methods for clustering

**rEMM** extensible Markov Model (EMM) for data stream clustering

SGCS Spatial Graph based Clustering Summaries for spatial point patterns

## **Outlier Detection**

#### **Functions**

boxplot.stats()\$out list data points lying beyond the extremes of the
 whiskers

**lofactor()** calculate local outlier factors using the LOF algorithm (DMwR or dprep)

**lof()** a parallel implementation of the LOF algorithm (*Rlof*)

## **Packages**

extremevalues detect extreme values in one-dimensional data mvoutlier multivariate outlier detection based on robust methods outliers some tests commonly used for identifying outliers Rlof a parallel implementation of the LOF algorithm

# **Time Series Analysis**

### **Construction & Plot**

ts() create time-series objects (stats)

plot.ts() plot time-series objects (stats)

**smoothts ()** time series smoothing (ast)

**sfilter()** remove seasonal fluctuation using moving average (ast)

## **Decomposition**

**decomp ()** time series decomposition by square-root filter (timsac)

**decompose()** classical seasonal decomposition by moving averages (stats)

**stl()** seasonal decomposition of time series by loess (*stats*)

tsr() time series decomposition (ast)

**ardec ()** time series autoregressive decomposition (ArDec)

## **Forecasting**

 ${\tt arima}$  () fit an ARIMA model to a univariate time series ( ${\it stats}$ )

predict.Arima forecast from models fitted by arima (stats)

## **Packages**

timsac time series analysis and control program

ast time series analysis

ArDec time series autoregressive-based decomposition

ares a toolbox for time series analyses using generalized additive models
 dse tools for multivariate, linear, time-invariant, time series models
 forecast displaying and analysing univariate time series forecasts

# Text Mining

### **Functions**

Corpus () build a corpus, which is a collection of text documents (tm) tm.map () transform text documents, e.g., stemming, stopword removal (tm)

tm\_filter() filtering out documents (tm)

TermDocumentMatrix(), DocumentTermMatrix() construct a term-document matrix or a document-term matrix (m)

**Dictionary ()** construct a dictionary from a character vector or a term-document matrix (tm)

**findAssocs ()** find associations in a term-document matrix (tm)

**findFreqTerms ()** find frequent terms in a term-document matrix (tm)

**stemDocument()** stem words in a text document (tm)

stemCompletion() complete stemmed words (tm)

 $\label{termFreq} \textbf{()} \ \ \text{generate a term frequency vector from a text document } (\textit{tm})$ 

**stopwords (language)** return stopwords in different languages (tm)

removeNumbers(), removePunctuation(), removeWords()
 remove numbers, punctuation marks, or a set of words from a text
 document (tm)

**removeSparseTerms ()** remove sparse terms from a term-document matrix (tm)

textcat() n-gram based text categorization (textcat)

SnowballStemmer() Snowball word stemmers (Snowball)

### **Packages**

tm a framework for text mining applications

*tm.plugin.dc* a plug-in for package *tm* to support distributed text mining *tm.plugin.mail* a plug-in for package *tm* to handle mail

RcmdrPlugin.TextMining GUI for demonstration of text mining concepts and tm package

textir a suite of tools for inference about text documents and associated sentiment

tau utilities for text analysis

textcat n-gram based text categorization

YjdnJlp Japanese text analysis by Yahoo! Japan Developer Network

# **Social Network Analysis**

### **Functions**

#### **Packages**

egonet ego-centric measures in social network analysis

sna social network analysis

snort social network-analysis on relational tables

igraph network analysis and visualization

bipartite visualising bipartite networks and calculating some (ecological) indices

blockmodeling generalized and classical blockmodeling of valued networks

diagram visualising simple graphs (networks), plotting flow diagrams

**NetCluster** clustering for networks

NetData network data for McFarland's SNA R labs

**NetIndices** estimating network indices, including trophic structure of foodwebs in R

NetworkAnalysis statistical inference on populations of weighted or unweighted networks

tnet analysis of weighted, two-mode, and longitudinal networks

triads triad census for networks

## **Spatial Data Analysis**

#### **Functions**

## **Packages**

spdep spatial dependence: weighting schemes, statistics and models

## **Statistics**

### **Summarization**

summary () summarize data

**describe ()** concise statistical description of data (*Hmisc*)

boxplot.stats() box plot statistics

## **Analysis of Variance**

aov () fit an analysis of variance model (stats)

**anova ()** compute analysis of variance (or deviance) tables for one or more fitted model objects (*stats*)

#### **Statistical Test**

t.test() student's t-test (stats)

prop.test() test of equal or given proportions (stats)

binom.test() exact binomial test (stats)

## **Mixed Effects Models**

lme () fit a linear mixed-effects model (nlme)

nlme () fit a nonlinear mixed-effects model (nlme)

#### **Principal Components and Factor Analysis**

princomp() principal components analysis (stats)

prcomp () principal components analysis (stats)

#### **Other Functions**

var(), cov(), cor() variance, covariance, and correlation (stats)

density() compute kernel density estimates (stats)

### **Packages**

nlme linear and nonlinear mixed effects models

## **Graphics**

### **Functions**

plot () generic function for plotting (graphics)

**boxplot ()** box-and-whisker plot (*graphics*)

stripchart() one dimensional scatter plot (graphics)

dotchart () Cleveland dot plot (graphics)

qqnorm(), qqplot(), qqline() QQ (quantile-quantile) plot (stats)

coplot () conditioning plot (graphics)

splom() conditional scatter plot matrices (lattice)

pairs () a matrix of scatterplots (graphics)

cpairs () enhanced scatterplot matrix (gclus)

parcoord() parallel coordinate plot (MASS)

cparcoord() enhanced parallel coordinate plot (gclus) paracoor () parallel coordinates plot (denpro) parallel () parallel coordinates plot (lattice) **densityplot()** kernel density plot (*lattice*) contour(), filled.contour() contour plot (graphics) levelplot(), contourplot() level plots and contour plots (lattice) sunflowerplot() a sunflower scatter plot (graphics) **assocplot()** association plot (graphics) mosaicplot() mosaic plot (graphics) matplot () plot the columns of one matrix against the columns of another **fourfoldplot()** a fourfold display of a  $2 \times 2 \times k$  contingency table **persp()** perspective plots of surfaces over the xy plane (graphics) cloud(), wireframe() 3d scatter plots and surfaces (lattice) interaction.plot() two-way interaction plot (stats) iplot(), ihist(), ibar(), ipcp() interactive scatter plot, histogram, bar plot, and parallel coordinates plot (iplots) pdf(), postscript(), win.metafile(), jpeg(), bmp(), png(), tiff() save graphs into files of various formats **Packages** lattice a powerful high-level data visualization system, with an emphasis on multivariate data ggplot2 an implementation of the Grammar of Graphics vcd visualizing categorical data denpro visualization of multivariate, functions, sets, and data iplots interactive graphics google Vis an interface between R and the Google Visualisation API to create interactive charts **Data Manipulation Functions** scale () scaling and centering of matrix-like objects t () matrix transpose aperm() array transpose sample() sampling table(), tabulate(), xtabs() cross tabulation (stats) stack(), unstack() stacking vectors reshape () reshape a data frame between "wide" format and "long" format (stats) merge () merge two data frames aggregate() compute summary statistics of data subsets (stats) by () apply a function to a data frame split by factors Clustering: tapply () apply a function to each cell of a ragged array melt(), cast() melt and then cast data into the reshaped or aggregated form you want (reshape) Filters: na.fail, na.omit, na.exclude, na.pass handle missing values reshape flexibly restructure and aggregate data Tokenizers: Data Access **Functions** 

save (), load () save and load R data objects

read.csv(), write.csv() import from and export to .CSV files

read.table(), write.table(), scan(), write() read and write data write.matrix() write a matrix or data frame (MASS) **sqlQuery ()** submit an SQL query to an ODBC database (*RODBC*) odbcConnect(), odbcClose() open/close connections to ODBC databases (RODBC) dbSendQuery execute an SQL statement on a given database connection dbConnect(), dbDisconnect() create/close a connection to a DBMS (DBI) **Packages** RODBC ODBC database access DBI a database interface (DBI) between R and relational DBMS RMySOL interface to the MySOL database RJDBC access to databases through the JDBC interface ROracle Oracle database interface (DBI) driver RpgSOL DBI/RJDBC interface to PostgreSQL database **RODM** interface to Oracle Data Mining xlsReadWrite read and write Excel files WriteXLS create Excel 2003 (XLS) files from data frames **Generating Reports Sweave ()** mixing text and R/S code for automatic report generation (*utils*) **R2HTML** making HTML reports **R2PPT** generating Microsoft PowerPoint presentations **Interface to Weka** Package RWeka is an R interface to Weka, and enables to use the following Weka functions in R Association rules: Apriori(), Tertius() Regression and classification: LinearRegression(), Logistic(), SMO() Lazy classifiers: IBk(), LBR() Meta classifiers: AdaBoostM1(), Bagging(), LogitBoost(), MultiBoostAB(), Stacking(), CostSensitiveClassifier() Rule classifiers: JRip(), M5Rules(), OneR(), PART()

Regression and classification trees: J48(), LMT(), M5P(), DecisionStump() Cobweb(), FarthestFirst(), SimpleKMeans(), XMeans(), DBScan() Normalize(), Discretize() IteratedLovinsStemmer(), LovinsStemmer() AlphabeticTokenizer(), NGramTokenizer(), WordTokenizer() Tinn-R a free GUI for R language and environment

# **Editors/GUIs**

RStudio a free integrated development environment (IDE) for R

rattle graphical user interface for data mining in R

**Rvad** workbook-style, web-based interface to R

**RPMG** graphical user interface (GUI) for interactive R analysis sessions

## Other R Reference Cards

R Reference Card, by Tom Short

http://rpad.googlecode.com/svn-history/r76/Rpad\_homepage/ R-refcard.pdf or

http://cran.r-project.org/doc/contrib/Short-refcard.pdf

R Reference Card, by Jonathan Baron

http://cran.r-project.org/doc/contrib/refcard.pdf

R Functions for Regression Analysis, by Vito Ricci

http://cran.r-project.org/doc/contrib/Ricci-refcard-regression.

R Functions for Time Series Analysis, by Vito Ricci

http://cran.r-project.org/doc/contrib/Ricci-refcard-ts.pdf

# **RDataMining Website, Twitter & Groups**



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