

# fastJT

Efficient Jonckheere-Terpstra Test Statistics for Robust Machine  
Learning and Genome-Wide Association Studies

2020-11-04

# Outline

Introduction

Examples

Session Information

# Introduction

- ▶ This document provides an example for using the `fastJT` package to calculate the Jonckheere-Terpstra test statistics for large data sets (multiple dependent and independent variables) commonly encountered in machine learning or GWAS. The functionality is also included to perform k-fold cross validation or feature sets.
- ▶ The calculation of the standardized test statistic employs the null variance equation as defined by Hollander and Wolfe (1999, eq. 6.19) to account for ties in the data.
- ▶ The major algorithm in this package is written in C++, which is ported to R by `Rcpp`, to facilitate fast computation.
- ▶ Features of this package include:
  - 1  $O(N \times \log(N))$  computational complexity (where  $N$  is the number of the samples)
  - 2 OpenMP supported parallelization
  - 3 Customized output of top  $m$  significant independent variables for each dependent variable

# fastJT

```
res <- fastJT(Y, X, outTopN=15, numThreads=1, standardized=TRUE)
```

Function arguments:

**Y:** Matrix of continuous values, representing dependent variables, with sample IDs as row names and variable names as column names.

**X:** A matrix of integer values, representing independent variables, with sample IDs as row names and feature IDs as column names.

**outTopN:** Number of top statistics to return (i.e., the largest standardized statistics). The default value is 15. If outTopN is set to NA, all results will be returned.

**numThreads:** Number of threads to use for parallel computation. The default value is 1 (sequential computation).

**standardized:** A boolean to specify whether to return standardized statistics or non-standardized statistics. The default value is TRUE, returning standardized statistics.

Users may wish to consider the `dplyr::recode()` function for converting non-numeric group indices into ordinal values for argument X.

# Returned Values

Function returns:

- J:** A matrix of standardized/non-standardized Jonckheere-Terpstra test statistics, depending on option `standardized`, with column names from input `Y`. If `outTopN` is not `NA`, results are sorted within each column.
- XIDs:** If `outTopN` is not `NA`, this is a matrix of column names from `X` associated with top standardized Jonckheere-Terpstra test statistics from `J`. Otherwise this is an unsorted vector of column names from input `X`.

## fastJT.select

```
res <- fastJT.select(Y, X, cvMesh=NULL, kFold=10L,  
                    selCrit=NULL, outTopN=15L, numThreads=1L)
```

Function arguments:

- Y**: Matrix of continuous values, representing dependent variables, with sample IDs as row names and variable names as column names.
- X**: Matrix of integer values, representing independent variables, with sample IDs as row names and feature IDs as column names.
- cvMesh**: A user-defined function to specify how to separate the data into training and testing parts. The inputs of this function are a vector of the sample IDs and `kFold`, an integer representing the number of folds for cross validation. The output of this function is a list of `kFold` vectors of sample IDs forming the testing subset for each fold. The default value is `NULL`, and if no function is specified, the data are partitioned sequentially into `kFold` equal sized subsets. Optional.

## fastJT.select

Function arguments continued:

**kFold**: An integer to indicate the number of folds. Optional. The default value is 10.

**selCrit**: A user-defined function to specify the criteria for selecting the top features. The inputs of this function include J, the matrix of statistics resulting from fastJT, and P, the matrix of p-values from pvalues(J). The output is a data frame containing the selected feature IDs for each trait of interest. Optional. The default value is NULL, and if no function is specified, the features the largest standardized Jonckheere-Terpstra test statistics are selected.

**outTopN**: An integer to indicate the number of top hits to be returned when selCrit=NULL. Unused if selCrit!=NULL. Optional. The default value is 15.

**numThreads**: A integer to indicate the number of threads to be used in the computation. Optional. The default value is 1 (sequential computation).

The function withholds one subset while the remaining kFold-1 subsets are used to test the features. The process is repeated kFold times, with each of the subsets withheld exactly once as the validation data.

# Returned Values

Function returns: Three lists of length `kFold`:

- J**: A list of matrices of standardized Jonckheere-Terpstra test statistics, one for each cross validation.
- Pval**: A list of matrices of p-values, one for each cross validation.
- XIDs**: A list of matrices of the selected feature IDs, one for each cross validation.



# Simulate Data

- 1 Define the number of markers, samples, and features:

```
num_sample    <- 100
num_marker    <- 4
num_feature   <- 50
```

- 2 Create two matrices containing marker levels and feature information.
  - a. Data contains the samples' marker levels.
  - b. Feature contains the samples' feature values.

```
set.seed(12345);
Data      <- matrix(rnorm(num_sample*num_marker),
                   num_sample, num_marker)
Feature  <- matrix(rbinom(num_sample*num_feature,2,0.5),
                   num_sample, num_feature)
colnames(Data)      <- paste0("Mrk:",1:num_marker)
colnames(Feature)  <- paste0("Ftr:",1:num_feature)
```

# Load Package

Load fastJT (after installing its dependent packages):

```
library(fastJT)
```

# Example Execution

```
JTStat <- fastJT(Y=Data, X=Feature, outTopN=10)
summary(JTStat, Y2Print=1:4, X2Print=1:5)
```

```
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
```

```
##
##
##              Johkcheere-Terpstra Test for Large Matrices
##              P-values for Top Standardized Statistics
## -----

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##              Mrk:1|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##              Mrk:2|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'
```

# Example Execution: Statistics in the Summary

```
summary(JTStat, Y2Print=1:4, X2Print=1:5, printP=FALSE)
```

```
##
##
##           Johckheere-Terpstra Test for Large Matrices
##           Top Standardized Statistics
## -----

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##           Mrk:1|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##           Mrk:2|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##           Mrk:3|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##           Mrk:4|
## -----
##           SNPID      J*|      SNPID      J*|      SNPID      J*|      SNPID      J*|
## -----
##           Ftr:35  -2.390|      Ftr:35  -2.331|      Ftr:20   2.350|      Ftr:46   2.505|
##           Ftr:17  -2.388|           Ftr:7   1.905|      Ftr:49  -2.106|      Ftr:34   2.396|
##           Ftr:27  -1.813|      Ftr:46  1.693|      Ftr:26  -2.072|      Ftr:47  -2.089|
##           Ftr:28  1.813|      Ftr:40  1.676|      Ftr:47  1.914|      Ftr:23   2.000|
##           Ftr:14  1.706|      Ftr:29  1.432|      Ftr:30  -1.662|      Ftr:16   1.955|
```

## Example Execution: Sorting in the Summary

```
JTAll <- fastJT(Y=Data, X=Feature, outTopN=NA)
summary(JTAll, Y2Print=1:4, outTopN=3)
```

```
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
## Warning in sprintf("%19s|", x, quote = F): one argument
not used by format '%19s|'
```

```
##
##
##              Johkcheere-Terpstra Test for Large Matrices
##              P-values for Top Standardized Statistics
## -----

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##              Mrk:1|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'

##              Mrk:2|

## Warning in sprintf("%19s|", x, quote = F): one argument not used by format '%19s|'
```

## Example Execution: fastJT.select

```
fastJT.select(Y=Data, X=Feature, cvMesh=NULL, kFold=5,  
             selCrit=NULL, outTopN=5, numThreads=1)
```

```
## $J  
## $J[[1]]  
##           Mrk:1      Mrk:2      Mrk:3      Mrk:4  
## [1,] -2.449202 -2.401972  2.402878  2.491444  
## [2,] -2.356094  1.863353  2.159547  2.333146  
## [3,] -1.798716  1.662280 -2.066804 -2.185883  
## [4,]  1.796900  1.662069 -1.902853  2.004838  
## [5,]  1.754959  1.399926 -1.893419  1.955443  
##  
## $J[[2]]  
##           Mrk:1      Mrk:2      Mrk:3      Mrk:4  
## [1,] -2.449202 -2.401972  2.402878  2.491444  
## [2,] -2.356094  1.863353  2.159547  2.333146  
## [3,] -1.798716  1.662280 -2.066804 -2.185883  
## [4,]  1.796900  1.662069 -1.902853  2.004838  
## [5,]  1.754959  1.399926 -1.893419  1.955443  
##  
## $J[[3]]  
##           Mrk:1      Mrk:2      Mrk:3      Mrk:4  
## [1,] -2.449202 -2.401972  2.402878  2.491444  
## [2,] -2.356094  1.863353  2.159547  2.333146  
## [3,] -1.798716  1.662280 -2.066804 -2.185883  
## [4,]  1.796900  1.662069 -1.902853  2.004838  
## [5,]  1.754959  1.399926 -1.893419  1.955443  
##  
## $J[[4]]  
##           Mrk:1      Mrk:2      Mrk:3      Mrk:4  
## [1,] -2.449202 -2.401972  2.402878  2.491444  
## [2,] -2.356094  1.863353  2.159547  2.333146  
## [3,] -1.798716  1.662280 -2.066804 -2.185883  
## [4,]  1.796900  1.662069 -1.902853  2.004838  
## [5,]  1.754959  1.399926 -1.893419  1.955443  
##  
## $J[[5]]
```

## Example User-Defined cvMesh Function

```
Mesh <- function(rownamesData, kFold){  
  numSamples <- length(rownamesData)  
  res <- NULL  
  subSampleSize <- floor(numSamples/kFold)  
  for (i in 1:kFold){  
    start <- (i-1)*subSampleSize + 1  
    if(i < kFold)  
      end <- i*subSampleSize  
    else  
      end <- numSamples  
    if(i == 1)  
      res <- list(c(start:end))  
    else  
      res[[i]] <- c(start:end)  
  }  
  res  
}
```

## Example User-Defined selCrit Function

```
whichpart <- function(x, n=30) {
  nx <- length(x)
  p <- nx-n
  xp <- sort(x, partial=p)[p]
  which(x > xp)
}

selectCrit <- function(J, P){
  pcut <- 0.95
  hit <- NULL
  for(i in 1:ncol(P)){
    if(i == 1)
      hit <- list(rownames(P)[whichpart(P[,i], 4)])
    else
      hit[[i]] = rownames(P)[whichpart(P[,i], 4)]
  }
  res <- do.call(cbind, hit)
  colnames(res) <- colnames(P)
  res
}
```



# Example Execution with User-Defined Functions

```
fastJT.select(Data, Feature, cvMesh=Mesh, kFold=5,  
              selCrit=selectCrit, outTopN=5, numThreads=1)
```

```
## $J  
## $J[[1]]  
##           Mrk:1      Mrk:2      Mrk:3      Mrk:4  
## Ftr:1  1.044871948  0.30810327 -0.52243597 -1.41325629  
## Ftr:2  0.064765493 -0.57607202  0.48744556  0.91694304  
## Ftr:3  0.708932518 -0.93211498  0.38072302 -0.99775688  
## Ftr:4  0.177698249 -0.10530267  1.24388774  0.13820975  
## Ftr:5 -0.135648047  0.29164330 -1.58029974  1.23439722  
## Ftr:6  0.626045363  0.20007635 -1.20691219 -0.61313721  
## Ftr:7 -1.007934807  1.86335316  0.53712315  1.32623001  
## Ftr:8  0.382152784 -1.08715878 -1.30459054  0.17789871  
## Ftr:9 -0.627298931 -1.04772268  0.28695589  1.08776304  
## Ftr:10 -0.552417489 -1.03827865  0.62562945 -0.54576186  
## Ftr:11  0.718808299  0.69218577  0.79867589 -0.06655632  
## Ftr:12  0.214931358 -0.73882654 -1.25600512 -1.24928852  
## Ftr:13 -0.637403711 -1.34635274 -0.27317302 -0.61138723  
## Ftr:14  1.754958762 -0.17582763 -0.27535270  0.53411788  
## Ftr:15 -0.987651750  0.20792668  0.01299542 -1.13709905  
## Ftr:16  1.487980337  0.09875976  0.72423822  1.95544319  
## Ftr:17 -2.356093867 -0.36605978  0.00000000 -1.92347776  
## Ftr:18  0.846622444  1.31915590  0.22970376  0.01312593  
## Ftr:19  0.006991013  0.34955065  0.78998447 -1.37023855  
## Ftr:20 -0.055126760 -0.45074233  2.40287819  0.49614084  
## Ftr:21 -0.201986904  0.05212565 -0.19547120 -0.81446332  
## Ftr:22 -0.242183804 -0.22254728  0.88364361 -0.96873521  
## Ftr:23 -0.359172943  0.58773754  0.34611211  2.00483806  
## Ftr:24  0.661565280 -0.17050652 -1.35041160  1.05032014  
## Ftr:25  0.892047636  0.20079301  1.25413339 -0.41146109  
## Ftr:26  0.275352698 -0.93221817 -2.06680399  0.82605809  
## Ftr:27 -1.798716484 -0.26774787 -0.46684245  0.51489976  
## Ftr:28  1.796899533  1.09120808  0.31364065  1.17615242  
## Ftr:29  0.364631969  1.39992631  0.20184984 -0.71624137  
## Ftr:30  0.451127576  0.81993260 -1.89341866  1.28752469  
## Ftr:31 -0.868212309 -0.42431429  0.41125846  0.15014198
```

## References

Hollander, M. and Wolfe, D. A., *Nonparametric Statistical Methods*. New York, Wiley, 2nd edition, 1999.

## Session Information

- ▶ R version 4.4.1 (2024-06-14), x86\_64-pc-linux-gnu
- ▶ Running under: Ubuntu 24.04.1 LTS
- ▶ Matrix products: default
- ▶ BLAS:  
/usr/lib/x86\_64-linux-gnu/openblas-pthread/libblas.so.3
- ▶ LAPACK:  
/usr/lib/x86\_64-linux-gnu/openblas-pthread/libopenblas-p-r0.3  
; LAPACK version 3.12.0
- ▶ Base packages: base, datasets, grDevices, graphics, methods, stats, utils
- ▶ Other packages: fastJT 1.0.6, knitr 1.48
- ▶ Loaded via a namespace (and not attached): Rcpp 1.0.13, buildtools 1.0.0, compiler 4.4.1, evaluate 1.0.1, highr 0.11, maketools 1.3.1, sys 3.4.3, tools 4.4.1, xfun 0.48

```
## [1] "Start Time Tue Oct 22 06:21:58 2024"  
## [1] "End Time Tue Oct 22 06:21:59 2024"
```