## GO enrichment

## HBG

## 11/4/2018

This script perform GO enrichment using topGO for a set of genes that show high (top 10%)

Bayes factors in tumor cells, but low or moderate (0%-50%) BF in normal cells

```
topGO analysis
```

```
# loading the libraries
library(topGO)
## Loading required package: BiocGenerics
## Loading required package: parallel
##
## Attaching package: 'BiocGenerics'
## The following objects are masked from 'package:parallel':
##
##
       clusterApply, clusterApplyLB, clusterCall, clusterEvalQ,
##
       clusterExport, clusterMap, parApply, parCapply, parLapply,
       parLapplyLB, parRapply, parSapply, parSapplyLB
##
## The following objects are masked from 'package:stats':
##
##
       IQR, mad, sd, var, xtabs
## The following objects are masked from 'package:base':
##
##
       anyDuplicated, append, as.data.frame, basename, cbind,
##
       colMeans, colnames, colSums, dirname, do.call, duplicated,
##
       eval, evalq, Filter, Find, get, grep, grepl, intersect,
       is.unsorted, lapply, lengths, Map, mapply, match, mget, order,
##
##
       paste, pmax, pmax.int, pmin, pmin.int, Position, rank, rbind,
##
       Reduce, rowMeans, rownames, rowSums, sapply, setdiff, sort,
       table, tapply, union, unique, unsplit, which, which.max,
##
       which.min
## Loading required package: graph
## Loading required package: Biobase
## Welcome to Bioconductor
##
##
       Vignettes contain introductory material; view with
       'browseVignettes()'. To cite Bioconductor, see
       'citation("Biobase")', and for packages 'citation("pkgname")'.
##
## Loading required package: GO.db
```

```
## Loading required package: AnnotationDbi
## Loading required package: stats4
## Loading required package: IRanges
## Loading required package: S4Vectors
## Attaching package: 'S4Vectors'
## The following object is masked from 'package:base':
##
##
       expand.grid
##
## Loading required package: SparseM
##
## Attaching package: 'SparseM'
## The following object is masked from 'package:base':
##
##
       backsolve
##
## groupGOTerms:
                    GOBPTerm, GOMFTerm, GOCCTerm environments built.
##
## Attaching package: 'topGO'
## The following object is masked from 'package: IRanges':
##
##
       members
library(biomaRt)
library(ensembldb)
## Loading required package: GenomicRanges
## Loading required package: GenomeInfoDb
## Loading required package: GenomicFeatures
##
## Attaching package: 'GenomicFeatures'
## The following object is masked from 'package:topGO':
##
##
       genes
## Loading required package: AnnotationFilter
##
## Attaching package: 'ensembldb'
## The following object is masked from 'package:stats':
##
##
       filter
#library(mygene) ## it may be useful for gene name conversion
library(EnsDb.Hsapiens.v86)
library(GenomicFeatures)
library(GO.db)
```

```
## some packages are installed using the package 'BioManager'
## the package 'GenomicFeatures' is needed to install 'EnsDb.Hsapiens.v86'
## install_github('https://github.com/Bioconductor/GenomicFeatures')
## the library 'devtools' is needed to install GenomicFeatures from GitHub repository
# the BF data file
panc.file <- read.csv("../rnf43.csv",header=TRUE,stringsAsFactors=F)</pre>
panc.gene <- panc.file$gene</pre>
panc.panc <- panc.file$panc.mean</pre>
panc.np <- panc.file$nonpanc.mean</pre>
quant <- quantile(panc.panc, probs = seq(0,1,1/20))
quant.np <- quantile(panc.np, probs=seq(0,1,1/20))</pre>
# top 10% BF genes (1718) in tumor cells
panc.top10 <- panc.gene[which(panc.panc > quant[19])]
length(panc.top10)
## [1] 1718
# genes (8458) of 0% to 50% BF factors in normal cells
np.bottom50 <- panc.gene[which(panc.np < quant.np[11])]</pre>
length(np.bottom50)
## [1] 8458
# the overlap genes between top 10% tumor and (0-50%) normal cells
genes=panc.gene[which(panc.top10 %in% np.bottom50)]
length(genes)
## [1] 51
GeneNameFilter(genes)
## class: GeneNameFilter
## condition: ==
## value: FZD5 WLS HNF1A RBM15 PPCS PORCN TPK1 ADRBK1 NANS PPARG SLC2A1 STK40 MPI ALG3 WNT3 TRIB1 STX4
# Gene names need be converted to Ensembl IDs
library(EnsDb.Hsapiens.v86)
ensembl.id <- genes(EnsDb.Hsapiens.v86,
                    filter=list(GeneNameFilter(genes),GeneIdFilter("ENSG", "startsWith")),
                    return.type="data.frame", columns=c("gene_id"))
write.table(ensembl.id, file="hs.rnf43.gene.set.csv", sep=",", row.names = F, col.names = F, quote = F)
ensembl.id
##
              gene_id gene_name
## 1 ENSG0000100412
                           ACO2
## 2 ENSG00000214160
                           ALG3
## 3 ENSG00000086848
                           ALG9
## 4 ENSG00000161203
                          AP2M1
## 5 ENSG00000137135 ARHGEF39
## 6 ENSG0000067248
                          DHX29
## 7 ENSG00000133884
                           DPF2
## 8 ENSG0000179151
                           EDC3
## 9 ENSG00000156030 ELMSAN1
## 10 ENSG00000204930 FAM221B
```

```
## 11 ENSG00000079459
                           FDFT1
## 12 ENSG00000163251
                           FZD5
  13 ENSG00000117308
                            GALE
  14 ENSG00000147533
                          GOLGA7
  15 ENSG00000135100
                          HNF1A
  16 ENSG00000186625
                          KATNA1
  17 ENSG00000142515
                           KLK3
## 18 ENSG00000053747
                          LAMA3
  19 ENSG00000132763
                          MMACHC
  20 ENSG00000115275
                           MOGS
  21 ENSG00000178802
                             MPI
  22 ENSG00000116984
                             MTR
  23 ENSG00000124275
                            MTRR
  24 ENSG00000095380
                            NANS
  25 ENSG00000072864
                            NDE1
  26 ENSG00000275911
                            NDE1
  27 ENSG00000141458
                           NPC1
  28 ENSG00000166228
                           PCBD1
  29 ENSG0000013375
                           PGM3
  30 ENSG00000102312
                           PORCN
  31 ENSG00000132170
                          PPARG
  32 ENSG00000138621
                          PPCDC
## 33 ENSG00000127125
                           PPCS
  34 ENSG00000011485
                           PPP5C
  35 ENSG00000126464
                          PRR12
  36 ENSG00000117425
                          PTCH2
  37 ENSG00000204764
                         RANBP17
   38 ENSG00000162775
                           RBM15
  39 ENSG00000080345
                            RIF1
  40 ENSG00000100075
                         SLC25A1
## 41 ENSG00000117394
                          SLC2A1
  42 ENSG00000196182
                           STK40
  43 ENSG00000103496
                           STX4
  44 ENSG00000029639
                          TFB1M
## 45 ENSG00000196511
                           TPK1
  46 ENSG00000173334
                          TRIB1
## 47 ENSG00000119541
                           VPS4B
## 48 ENSG00000162923
                           WDR26
## 49 ENSG00000116729
                             WLS
## 50 ENSG00000108379
                            WNT3
## 51 ENSG00000277626
                            WNT3
## 52 ENSG00000277641
                            WNT3
ensembl.id$gene_id
##
##
```

## [1] "ENSG00000100412" "ENSG00000214160" "ENSG00000086848" [4] "ENSG00000161203" "ENSG00000137135" "ENSG00000067248" [7] "ENSG00000133884" "ENSG00000179151" "ENSG00000156030" ## "ENSG00000204930" "ENSG00000079459" "ENSG00000163251" ## [10] "ENSG00000117308" "ENSG00000147533" "ENSG00000135100" ## [13] "ENSG00000186625" "ENSG00000142515" "ENSG00000053747" [16] "ENSG00000132763" "ENSG00000115275" "ENSG00000178802" [19] ## [22] "ENSG00000116984" "ENSG00000124275" "ENSG00000095380" "ENSG00000072864" "ENSG00000275911" "ENSG00000141458" [25] ## [28] "ENSG00000166228" "ENSG00000013375" "ENSG00000102312"

```
## [31] "ENSG00000132170" "ENSG00000138621" "ENSG00000127125"
## [34] "ENSG00000011485" "ENSG00000126464" "ENSG00000117425"
## [37] "ENSG00000204764" "ENSG00000162775" "ENSG00000080345"
## [40] "ENSG00000100075" "ENSG00000117394" "ENSG00000196182"
## [43] "ENSG00000103496" "ENSG00000029639" "ENSG00000196511"
## [46] "ENSG00000173334" "ENSG00000119541" "ENSG00000162923"
## [49] "ENSG00000116729" "ENSG00000108379" "ENSG00000277626"
## [52] "ENSG00000277641"
# Enrichment analysis
mart <- useDataset("hsapiens_gene_ensembl", mart=useMart("ensembl"))</pre>
all_ensembl_gene_id <- getBM(attributes = "ensembl_gene_id",</pre>
                             values = "*", mart = mart)
all <- factor(as.integer (all_ensembl_gene_id[,1] %in% ensembl.id$gene_id))
names(all) <- all_ensembl_gene_id[,1]</pre>
GOdata <- new("topGOdata", ontology="BP",
              allGenes = all, geneSel=function(p) p == 1,
              description = "P.not.NP", annot=annFUN.org, mapping="org.Hs.eg.db", ID="Ensembl")
##
## Building most specific GOs .....
## Loading required package: org.Hs.eg.db
##
##
   ( 12078 GO terms found. )
##
## Build GO DAG topology .....
   ( 16113 GO terms and 38254 relations. )
##
## Annotating nodes ......
   ( 20504 genes annotated to the GO terms. )
result.test <- runTest(GOdata, algorithm = "classic", statistic = "fisher")
##
##
             -- Classic Algorithm --
##
##
         the algorithm is scoring 1966 nontrivial nodes
##
         parameters:
##
             test statistic: fisher
resultKS.test <- runTest(GOdata, algorithm = "classic", statistic = "ks")
##
##
             -- Classic Algorithm --
##
##
         the algorithm is scoring 16113 nontrivial nodes
##
         parameters:
##
             test statistic: ks
##
             score order: increasing
resultKS.elim.test <- runTest(GOdata, algorithm = "elim", statistic = "ks")
```

```
##
##
             -- Elim Algorithm --
##
         the algorithm is scoring 16113 nontrivial nodes
##
##
         parameters:
             test statistic: ks
##
             cutOff: 0.01
##
             score order: increasing
##
##
##
     Level 20: 1 nodes to be scored
                                         (0 eliminated genes)
##
     Level 19: 5 nodes to be scored
                                         (0 eliminated genes)
##
##
     Level 18: 22 nodes to be scored
##
                                         (0 eliminated genes)
##
##
     Level 17: 52 nodes to be scored
                                         (13 eliminated genes)
##
##
     Level 16: 120 nodes to be scored (31 eliminated genes)
##
##
     Level 15: 255 nodes to be scored (195 eliminated genes)
##
##
     Level 14: 499 nodes to be scored (354 eliminated genes)
##
     Level 13: 919 nodes to be scored (1156 eliminated genes)
##
##
##
     Level 12: 1374 nodes to be scored (3460 eliminated genes)
##
##
     Level 11: 1786 nodes to be scored (6096 eliminated genes)
##
##
     Level 10: 2092 nodes to be scored (7714 eliminated genes)
##
##
     Level 9:
                2191 nodes to be scored (9857 eliminated genes)
##
     Level 8:
                2088 nodes to be scored (12111 eliminated genes)
##
##
     Level 7:
                1942 nodes to be scored (13740 eliminated genes)
##
##
##
     Level 6:
                1453 nodes to be scored (15133 eliminated genes)
##
     Level 5:
                779 nodes to be scored (16447 eliminated genes)
##
##
##
     Level 4:
                375 nodes to be scored (17342 eliminated genes)
##
##
     Level 3:
                135 nodes to be scored (17551 eliminated genes)
```

```
Level 2:
                                         (17895 eliminated genes)
##
               24 nodes to be scored
##
##
     Level 1:
                1 nodes to be scored
                                         (17905 eliminated genes)
allRes <- GenTable(GOdata, classicFisher = result.test, classicKS = resultKS.test, elimKS = resultKS.el
allRes
##
           GO.ID
                                                          Term Annotated
## 1 GO:0045944 positive regulation of transcription by ...
                                                                    1273
      GO:0000122 negative regulation of transcription by ...
                                                                     904
## 3
     GD:0008283
                                           cell proliferation
                                                                    2322
                     post-translational protein modification
## 4 GD:0043687
                                                                     401
## 5 GO:0051301
                                                cell division
                                                                     625
## 6 GO:0045893 positive regulation of transcription, DN...
                                                                    1621
## 7 GO:0008584
                                       male gonad development
                                                                     137
## 8 GO:1990830 cellular response to leukemia inhibitory...
                                                                      99
## 9 GO:0035556
                            intracellular signal transduction
                                                                    3075
## 10 GO:0046777
                                  protein autophosphorylation
                                                                     245
## 11 GO:0007411
                                                                     267
                                                axon guidance
## 12 GD:0001701
                                                                     338
                               in utero embryonic development
## 13 GD:0006406
                                     mRNA export from nucleus
                                                                     123
## 14 GO:0043547
                      positive regulation of GTPase activity
                                                                     456
## 15 GO:0018105
                              peptidyl-serine phosphorylation
                                                                     294
## 16 GD:0007601
                                            visual perception
                                                                     226
## 17 GO:0045471
                                          response to ethanol
                                                                     132
## 18 GO:0010628
                      positive regulation of gene expression
                                                                    2104
## 19 GO:0043627
                                                                      74
                                         response to estrogen
## 20 GO:0035735 intraciliary transport involved in ciliu...
      Significant Expected Rank in classicFisher classicFisher classicKS
## 1
                5
                      3.04
                                             1101
                                                           0.186
                                                                   5.9e-23
## 2
                2
                      2.16
                                             1810
                                                           0.643
                                                                   2.7e-13
## 3
                9
                      5.55
                                              795
                                                           0.097
                                                                   3.2e-18
## 4
                0
                      0.96
                                             1966
                                                           1.000
                                                                   1.2e-11
## 5
                4
                      1.49
                                                           0.062
                                                                   7.3e-18
                                              631
## 6
                      3.87
                                             1105
                                                           0.188
                                                                   < 1e-30
## 7
                0
                      0.33
                                                                   1.5e-10
                                             1967
                                                           1.000
## 8
                1
                      0.24
                                             1176
                                                           0.211
                                                                   3.6e-09
## 9
                6
                      7.35
                                                           0.764
                                                                   < 1e-30
                                             1888
## 10
                0
                      0.59
                                                           1.000
                                                                   8.0e-09
                                             1968
## 11
                      0.64
                                                                   8.9e-10
                3
                                             386
                                                           0.026
                                                                   6.3e-11
## 12
                1
                      0.81
                                             1745
                                                           0.558
                      0.29
## 13
                0
                                             1969
                                                           1.000
                                                                   7.9e-08
## 14
                0
                      1.09
                                             1970
                                                           1.000
                                                                   8.6e-08
                      0.70
## 15
                0
                                             1971
                                                           1.000
                                                                   4.7e-11
                                             1972
## 16
                0
                      0.54
                                                           1.000
                                                                   1.3e-07
## 17
                0
                      0.32
                                             1973
                                                           1.000
                                                                   1.3e-07
## 18
               10
                      5.03
                                             381
                                                           0.025
                                                                   < 1e-30
## 19
                1
                      0.18
                                             1029
                                                           0.163
                                                                   2.3e-07
## 20
                      0.10
                                             1974
                                                           1.000
                                                                   2.5e-07
##
       elimKS
## 1 6.6e-22
## 2 2.7e-13
```

##

- ## 3 1.1e-12
- ## 4 1.2e-11
- ## 5 3.2e-10
- ## 6 9.1e-10
- ## 7 1.4e-09
- ## 8 3.6e-09
- ## 9 5.0e-09
- ## 10 8.0e-09
- ## 11 1.6e-08
- ## 12 5.4e-08
- ## 13 7.9e-08
- ## 14 8.6e-08
- ## 15 1.1e-07
- ## 16 1.3e-07
- ## 17 1.3e-07
- ## 18 1.4e-07
- ## 19 2.3e-07
- ## 20 2.5e-07

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