# A quick gene selection, annotation and GO analysis

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### 1 Introduction

Most gene expression studies undergo one phase where, after gene selection has been performed, one wishes to:

- 1. Annotate the genes or transcripts, that is associate, to each probeset or transcript, some identifiers in the appropriate databases that can be used to understand better the results or that are needed to proceed with further analyses (for instance GO Analysis needs "Entrez" identifiers).
- 2. Do some type of Gene Set Enrichment Analyses such as Overrepresentation Analysis (ORA) or classical Gene Set Enrichment Analysis (GSEA).

This document is an illustration which does not intend to be exhaustive, on how to do this with some of these packages.

#### 1.1 Obtaining gene lists

The first step in annotation analysis is to obtain the gene lists, usually as the output of some differential expression analysis.

```
[1] "SymbolsA"
                    "EntrezsA"
                                 "logFC"
                                             "AveExpr"
    [7] "adj.P.Val" "B"
                                 "A.PF14"
                                             "A.PF19"
                                                                      "A.PF39"
                    "B.PF24"
  [13] "A.PF46"
##
                                 "B.PF25"
                                             "B.PF28"
                                                                      "B.PF42"
##
               SymbolsA EntrezsA logFC AveExpr
                                                                   P. Value
## 204667_at
                  FOXA1
                             3169 -3.038
                                           8.651 -14.362 0.00000000005742
## 215729_s_at
                  VGLL1
                            51442 3.452
                                           6.138
                                                 12.815 0.0000000034398
                  SPDEF
                            25803 -3.016
                                           9.522 -10.859 0.0000000433750
## 220192_x_at
## 214451_at
                 TFAP2B
                             7021 -5.665
                                           7.433 -10.830 0.00000000451941
## 217528_at
                  CLCA2
                             9635 -5.622
                                           6.763
                                                  -9.666 0.00000002431610
## 217284_x_at
                 SERHL2
                          253190 -4.313
                                           9.133
                                                  -9.528 0.00000002996253
```

```
adj.P.Val
                                 B A.PF14 A.PF19 A.PF23 A.PF39 A.PF46 B.PF24
## 204667_at
               0.0000003572 14.649
                                                  9.919
                                                          9.601
                                    9.822
                                           9.514
                                                                 9.592
## 215729_s_at 0.0000010699 13.149
                                    4.737
                                           4.761
                                                  6.255
                                                          4.820
                                                                 4.848
                                                                        8.266
## 220192_x_at 0.0000070288 10.928 10.484 10.915 10.511 11.510 10.265
                                                                        7.824
## 214451 at
               0.0000070288 10.891 10.177 10.060 11.201 10.889 10.404
## 217528_at
               0.0000302541
                             9.363 10.534 10.036 11.326
                                                          8.053 10.619
                                                                        4.581
## 217284_x_at 0.0000310662
                             9.171 11.727
                                           9.741 11.436 12.819 12.687
                                                                        7.274
               B.PF25 B.PF28 B.PF34 B.PF42
##
                       7.001
                              6.685
## 204667_at
                6.551
                                     6.535
## 215729_s_at
               8.963
                       8.304
                              8.769
                                     8.381
## 220192_x_at 7.810
                       7.522
                              8.427
                                     7.020
## 214451_at
                4.784
                       4.976
                              4.912
## 217528_at
                4.538
                       4.519
                              4.357
                                     4.463
## 217284_x_at 7.298 7.491 7.562
                                     7.217
```

## 2 Annotating the genes

This table has already been "annotated" in the script that has performed the original analysis, but, what would we have had to do if it hadn't been?

We might have used either a specific annotation package for the array or the BioMaRt package.

### 2.1 Using a microarray annotation package

If we hadn't had 'Entrez' Identifiers, but only the probeset identifiers which depend on the array type we might have done as follows:

```
[1] "ACCNUM"
                         "ALIAS"
                                          "ENSEMBL"
                                                           "ENSEMBLPROT"
##
                                                                           "ENSEMBLTRANS"
    [6]
        "ENTREZID"
                         "ENZYME"
                                          "EVIDENCE"
                                                           "EVIDENCEALL"
                                                                           "GENENAME"
        "GO"
                         "GOALL"
                                          "IPI"
                                                           "MAP"
                                                                           "MIMO"
##
   [11]
   [16]
        "ONTOLOGY"
                         "ONTOLOGYALL"
                                          "PATH"
                                                           "PFAM"
                                                                           "PMID"
   [21]
        "PROBEID"
                                          "REFSEQ"
                                                           "SYMBOL"
                                                                           "UCSCKG"
                         "PROSITE"
##
   [26]
        "UNIGENE"
                         "UNIPROT"
##
##
          PROBEID ENTREZID SYMBOL
## 1 215729_s_at
                      51442
                             VGLL1
## 2
       205044_at
                       2568
                             GABRP
## 3
       209337_at
                      11168
                             PSIP1
## 4
       209786_at
                      10473
                             HMGN4
## 5
       204061_at
                       5613
                               PRKX
## 6
       207039_at
                       1029 CDKN2A
```

#### 2.2 Using BiomaRt

Biomart is a powerful engine for linking identifiers. It is a bit cryptic at the first approach because in order to use it we must define *filters* (what we input for searching), *attributes* (what we output) and *values* (which values we input).

```
## [11] "falbicollis_gene_ensembl"
                                          "mdomestica_gene_ensembl"
## [13] "rnorvegicus_gene_ensembl"
                                          "drerio_gene_ensembl"
## [15] "lafricana_gene_ensembl"
                                          "amelanoleuca_gene_ensembl"
## [17] "pcapensis_gene_ensembl"
                                          "hsapiens_gene_ensembl"
## [19] "xtropicalis_gene_ensembl"
                                          "saraneus_gene_ensembl"
  [21] "amexicanus_gene_ensembl"
                                          "celegans_gene_ensembl"
## [23] "oniloticus_gene_ensembl"
                                          "dmelanogaster_gene_ensembl"
## [25] "xmaculatus_gene_ensembl"
                                          "ttruncatus_gene_ensembl"
## [27] "mmulatta_gene_ensembl"
                                          "trubripes_gene_ensembl"
## [29] "gmorhua_gene_ensembl"
                                          "sharrisii_gene_ensembl"
## [31] "mgallopavo_gene_ensembl"
                                          "mfuro_gene_ensembl"
## [33] "ocuniculus_gene_ensembl"
                                          "ggorilla_gene_ensembl"
## [35]
        "mmusculus_gene_ensembl"
                                          "etelfairi_gene_ensembl"
## [37] "ggallus_gene_ensembl"
                                          "csavignyi_gene_ensembl"
## [39] "pformosa_gene_ensembl"
                                          "btaurus_gene_ensembl"
## [41] "acarolinensis_gene_ensembl"
                                          "oanatinus_gene_ensembl"
## [43] "pvampyrus_gene_ensembl"
                                          "olatipes_gene_ensembl"
## [45] "dordii_gene_ensembl"
                                          "mmurinus_gene_ensembl"
## [47] "mlucifugus_gene_ensembl"
                                          "panubis_gene_ensembl"
## [49] "itridecemlineatus_gene_ensembl"
                                          "eeuropaeus_gene_ensembl"
  [51]
        "vpacos_gene_ensembl"
                                          "sscrofa_gene_ensembl"
  [53] "gaculeatus_gene_ensembl"
                                          "oaries_gene_ensembl"
  [55] "tnigroviridis_gene_ensembl"
                                          "cfamiliaris_gene_ensembl"
## [57] "psinensis_gene_ensembl"
                                          "cjacchus_gene_ensembl"
## [59] "tbelangeri_gene_ensembl"
                                          "cintestinalis_gene_ensembl"
## [61] "tguttata_gene_ensembl"
                                          "ecaballus_gene_ensembl"
## [63] "dnovemcinctus_gene_ensembl"
                                          "nleucogenys_gene_ensembl"
## [65] "scerevisiae_gene_ensembl"
                                          "aplatyrhynchos_gene_ensembl"
## [67]
       "meugenii_gene_ensembl"
                                          "lchalumnae_gene_ensembl"
## [69] "csabaeus_gene_ensembl"
## Error in '[.data.frame'(filters, u133aDatasets, ): object 'u133aDatasets' not found
## Error in u133aFilters[3, 1]: incorrect number of dimensions
## Error in eval(expr, envir, enclos): object 'myu133aFilter' not found
## [1] "entrezgene"
## Error in getBM(filters = myu133aFilter, attributes = c(myentrezAtribut, : object 'myu133aFilter'
not found
## Error in head(entrezfromProbesUp): object 'entrezfromProbesUp' not found
```

### 2.3 The gene list for pathway Analysis

In this example we had already had the Entrez and Symbol identifiers so we can extract these directly from the topTable.

Although we skip it here it may be interesting to compare the entrez identifiers obtained from the three distinct approaches. They should be identical, but there may be small discrepancies...

```
## [1] 365
## [1] 268
## [1] 6221
```

## 3 Pathway Analysis

We start by removing NA's (if any) and ensuring that we have unique identifiers. We will use the GOstats package which proceeds in two steps:

- 1. First we create the appropriate objects
- 2. Next we use them to do the enrichment analysis
- 3. In a final step we generate an html report with the test results

First we create the appropriate objects Next we use them to do the enrichment analysis

```
## GO
##
                      Pvalue OddsRatio ExpCount Count Size
         GOBPID
                                          32.925
## 1 GD:0000278 0.0000001734
                                  2.263
                                                     63
                                                         564
## 2 GD:0000070 0.0000042038
                                  4.321
                                           4.845
                                                     17
                                                          83
## 3 GD:0000819 0.0000051295
                                  4.032
                                           5.429
                                                     18
                                                          93
## 4 GD:0007049 0.0000066093
                                  1.846
                                          51.840
                                                     82
                                                         888
## 5 GD:0035556 0.0000069666
                                  1.757
                                          68.010
                                                    101 1165
## 6 GD:0051782 0.0000072695
                                  5.411
                                           3.094
                                                     13
                                                          53
##
                                      Term
## 1
                       mitotic cell cycle
## 2 mitotic sister chromatid segregation
           sister chromatid segregation
## 3
## 4
                                cell cycle
        intracellular signal transduction
## 6 negative regulation of cell division
## KEGG
##
     KEGGID
              Pvalue OddsRatio ExpCount Count Size
## 1
     04110 0.001294
                         2.878
                                   5.724
                                            14
## 2 04114 0.002082
                          3.167
                                   4.116
                                            11
                                                  64
     04914 0.002461
                         3.590
## 3
                                   3.023
                                             9
                                                 47
## 4 04010 0.004909
                         2.352
                                   7.267
                                            15
                                                113
## 5
     04062 0.006140
                          2.452
                                   6.045
                                            13
                                                  94
## 6
     04971 0.007421
                         4.082
                                   1.801
                                             6
                                                  28
##
                                         Term
## 1
                                   Cell cycle
## 2
                               Oocyte meiosis
## 3 Progesterone-mediated oocyte maturation
## 4
                      MAPK signaling pathway
## 5
                 Chemokine signaling pathway
                      Gastric acid secretion
## 6
```

In a final step we generate an html report with the test results