Dynamic Report - TFM

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1 Initial instructions

1.1 Downloading expression file from GTEx

The first step to correctly generate all expression information from your initial coordinates is to download the GTEx_Analysis_2016-01-15_v7_RNASeQCv1.1.8_gene_median_tpm.gct file from: https://gtexportal.org/home/datasets. Gene expression on the GTEx Portal are shown in Transcripts per Million (TPM), and the samples come from the 1000 genomes project. The downloaded file contains median gene counts (in TPM) by tissue (53 in total).

1.2 General instructions to update input file

All R-scripts are in the first part of the document Scripts-TFM.R. However, the corresponding Dynamic report-TFM.Rmd can be used to generate the new set of output files automatically.

IMPORTANT: Fist read 'Dynamic report-TFM.pdf' for 'input file format'. Then, you need to copy your input document in the folder containing 'Dynamic report-TFM.Rmd' and indicate in the next lines your input CVS file name.

To change the **input file** you need to change the name of the .csv (NUMTs_coord.csv) document in the beginning of this document:

```
| ↓ | | | ABC | | ✓ Knit → ∰ →
                                                                  👣 Insert 🗸 │ 🎧 🔠 Run 🗸 │ 🥌 🔻 🗎
1 +
 2 title: "Dynamic Report - TFM"
    author: "Marta Sanchez Delgado"
 3
    date: '`r format(Sys.Date(),"%e de %B, %Y")`'
 5
    output:
 6
      pdf_document:
         fig_caption: yes
 7
8
        number_sections: yes
 9
        toc: yes
10
    geometry: margin=1in
11
    params:
12
      file1: NUMTs_coord.csv
13
    header-includes:
14
      \usepackage{float}
15
      \usepackage[most]{tcolorbox}
16
      \definecolor{light-yellow}{rgb}{1, 0.95, 0.7}
17
      \newtcolorbox{myquote}{colback=light-yellow,grow to right by=-10mm,grow to left
18
      by=-10mm, boxrule=0pt,boxsep=0pt,breakable}
    - \newcommand{\INSTRUCTIONS}[1]{\begin{myquote} \textbf{IMPORTANT:} \emph{\#1} \end{myquote}}
20 linkcolor: blue
21
    classoption: a4paper
    hibliography: Ref TFM bib
# Dynamic Report - TFM $
                                                                                                 R Markdown
```

Figure 1: Screenshot instruction to change the name of the 'input file'. In the begining of the document you have the 'params' subsection, the 'file1:' corresponds to the 'input file' with the initial coordinates.

Now all the output files and all the information on Dynamic report-TFM documents will be generated with your new .csv data-table named NUMTs_coord.csv.

IMPORTANT: Once you have done this first step, you can generate your new .html, which will have all data updated by pressing 'Knit' (See next figure). Maybe this will take more than an hour.

The following pages will be generated with the new information. Now you have all data, statistics and tables updated with the coordinates in document NUMTs coord.csv.

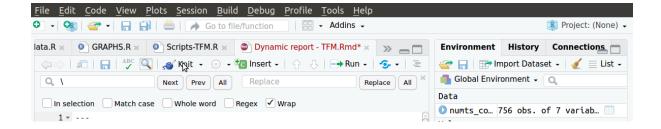


Figure 2: Screenshot instruction for generate the new .html file. In RStudio, by using R Markdown, we can generate the corresponding .html file by pression 'Knit' (in the upper-left part of the first square in RStudio).

2 Context

The following scripts were generated for the final master's project in Bioinformatics and Biostatistics (*Universitat Oberta de Catalunya*) entitle **Are Nuclear Insertions of Mitochondrial Origin Pseudogenes?**.

This Master's project focussed on the study of Nuclear mitochondrial DNA sequences (NUMTs). NUMTs are the result of a continuous DNA transfer from mitochondria to the nucleus (Boogaart, Samallo, and Agsteribbe 1982; Tsuzuki et al. 1983).

In 2011, in a published work led by Dr Cristina Santos, it was identified 755 NUMTs in the human genome (Ramos et al. 2011). They compared the human mtDNA (NC_012920) against human genome (GRCh37/hg19 assembly), and they described different aspects of this comparisons: frequency, distribution and size of NUMTs for each chromosome; % identity between NUMTs and mtDNA sequence... Based on this information and **NUMTs coordinates**, in the present master's final project, we want to clarify whether or not these NUMTs origin pseudogenes.

The present dynamic report generates a set of intermediate (.txt documents) and a final file called **FINAL_OUTPUT_TABLE.txt** with all relevant genetic content and with a more in-depth expression and gene ontology study in the genes encoded in this NUMTs. Additionally, we also perform a small conservation study of these regions in the genome of other primates. By changing the **input document**, and following the next instruction, it is possible to generate a new set of intermediate and final documents with the new outputs.

3 Visualization of NUMTs in UCSC genome browser

First of all, with the NUMTs coordinates publically available by Ramos et al. (2011), we created the file bed_NUMTs-ID.txt, which can be uploaded to *UCSC genome browser* -> custom track to visualise our NUMTs.

The bed_NUMTs-ID.txt also include the corresponding mitochondrial regions for each NUMT, with the same NUMT ID by adding "mt" in the beginning.

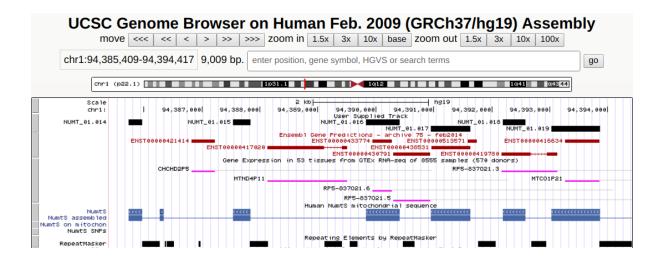


Figure 3: Custom Track NUMNTs visualization in UCSC Genome Browser. The first track on the picture is our Custom Track from the document "bed_NUMTsID.txt".

4 Installing only packages we need

Depending on the computer and session, we already have some R packages installed. To install only the ones we need we will use the following script:

However, to generate our data, we also need to download special packages from Bioconductor:

IMPORTANT: If you cannot install Bioconductor's biomaRt package by using 'biocLite("biomaRt")', in Linux, if you have administrative privileges, you can write in the command line: 'sudo apt-get install r-bioc-biomart' to install it.

5 Input file format

The document must be .csv with comma (",") separator, which is the one automatically used in most programmes like Excel or LibreOffice Calc when we save the data as .csv. The first line of the document will be the Column names. The First column will name as id (with any ID you wanted to use), second column chr (with the number of the corresponding chromosome), third start_n with the starting bp coordinate and then end_n with the end pb coordinate. The last three columns will be additional information. In the case of the original document created for this final master's project corresponds to the coordinates mapping these regions in the mitochondrial: 6th column entitle mt and in all cases "mt" because is how mitochondrial DNA is recognised, and then both, initial start_mt and final end_mt coordinates in the mitochondrial DNA.

```
##
   'data.frame':
                     756 obs. of 7 variables:
##
    $ id
              : Factor w/ 756 levels "NUMT_01.001",..: 1 2 ...
              : Factor w/ 24 levels "1", "10", "11", ...: 1 1 ....
    $ start_n : int
                     564461 5614806 ...
##
                     570304 5614937 ...
    $ end_n
              : int
              : Factor w/ 1 level "mt": 1 1 ...
##
    $ start mt: int
                     3911 9453 ...
    $ end_mt : int
                     9755 9583 ...
##
              id chr
                       start_n
                                  end_n mt start_mt end_mt
## 1 NUMT_01.001
                        564461
                                 570304 mt
                                                3911
                                                       9755
                   1
## 2 NUMT_01.002
                       5614806
                                5614937 mt
                                                9453
                                                       9583
                   1
## 3 NUMT_01.003
                       5910318
                                5910528 mt
                                                2466
                                                       2675
                   1
## 4 NUMT_01.004
                   1
                       8969802
                                8969967 mt
                                                8040
                                                       8205
## 5 NUMT 01.005
                       9634687
                                9634887 mt
                                                 907
                                                       1117
## 6 NUMT_01.006
                    1 11202904 11202975 mt
                                               12293
                                                      12358
```

The file NUMTs coord.csv contains a total of 756 rows with coordinates.

6 All intermediate files and the final table

6.1 File 1 and 2: "All attributes.txt" & "All filters.txt"

To download the list of genes within our initial coordinates and its associated phenotype description, gene ontology (GO) and conservation in other species, we use biomaRt package from Bioconductor:

6.1.1 The biomaRt package

```
##
## To cite the biomaRt package in publications use:
##
     Mapping identifiers for the integration of genomic datasets with
##
##
     the R/Bioconductor package biomaRt. Steffen Durinck, Paul T.
     Spellman, Ewan Birney and Wolfgang Huber, Nature Protocols 4,
##
##
     1184-1191 (2009).
##
     BioMart and Bioconductor: a powerful link between biological
##
     databases and microarray data analysis. Steffen Durinck, Yves
##
##
     Moreau, Arek Kasprzyk, Sean Davis, Bart De Moor, Alvis Brazma
     and Wolfgang Huber, Bioinformatics 21, 3439-3440 (2005).
##
##
## To see these entries in BibTeX format, use 'print(<citation>,
## bibtex=TRUE)', 'toBibtex(.)', or set
## 'options(citation.bibtex.max=999)'.
```

6.1.2 Preparing Package 'biomaRt'

We set up the dataset we will use, specifically, ensembl_MART_ensembl, which is working with the version:

It is automatically generated the first two files: All_attributes.txt (with all attributes you can download with biomaRt package) and All_filters.txt (with all filters to select the information to use from your input file).

The dimensions of File 1 are: 1416, 3 and the dimensions of File 2: 303, 2

6.2 File 3: "gene_results.txt"

Filtering by our initial coordinates, we create the file gene_results.txt with all genes which coordinates and our initial coordinates overlaps partially or totally.

```
##
                        chromosome_name start_position
##
    NUMT_04.035:
                   11
                        2
                                :153
                                         Min.
##
    NUMT_05.022:
                   11
                        7
                                : 70
                                         1st Qu.: 38039816
##
    NUMT_02.043:
                   10
                        Х
                                : 63
                                         Median: 80736542
##
    NUMT_01.001:
                    8
                               : 59
                                         Mean
                                                : 86166624
                        1
##
    NUMT_02.058:
                    8
                                : 58
                                         3rd Qu.:120972370
    NUMT_05.030:
                    8
                        (Other):511
                                         Max.
                                                 :240713167
##
    (Other)
               :1099
                        NA's
                               :241
                                         NA's
                                                 :241
##
     end_position
                             strand
                                                hgnc_symbol
##
    Min.
               564813
                         Min.
                                 :-1.00000
                                             MLPH
                                                       : 17
          :
                         1st Qu.:-1.00000
##
    1st Qu.: 38078249
                                             LINC00630: 13
                                             LINC00882:
                         Median: 1.00000
##
    Median: 80925878
##
    Mean
           : 86268873
                         Mean
                                 : 0.03939
                                             ZNF540
                                                          7
##
    3rd Qu.:120974671
                         3rd Qu.: 1.00000
                                             ZNF571
                                                          7
##
    Max.
           :240775449
                         Max.
                                 : 1.00000
                                             (Other)
                                                       :480
                                             NA's
##
    NA's
           :241
                         NA's
                                                       :624
                                 :241
##
          ensembl_gene_id_version
                                           ensembl_gene_id transcript_count
##
    ENSG00000115648.9 : 17
                                    ENSG00000115648: 17
                                                            Min.
                                                                  : 1.000
    ENSG00000223546.2 : 13
                                    ENSG00000223546: 13
                                                            1st Qu.: 1.000
##
    ENSG00000171817.12:
                                    ENSG00000171817:
                                                            Median : 1.000
                          7
                                                      7
##
   ENSG00000180479.9:
                          7
                                    ENSG00000180479:
                                                      7
                                                                   : 3.953
                                                            Mean
   ENSG00000242759.2:
                          7
                                    ENSG00000242759:
                                                      7
                                                            3rd Qu.: 5.000
    (Other)
                       :863
                                    (Other)
                                                    :863
                                                            Max.
                                                                    :32.000
##
   NA's
                       :241
                                    NA's
                                                    :241
                                                            NA's
                                                                    :241
```

The dimensions of File 3 are: 1155, 9

In total, gene_results.txt contains 733 genes and 241/756 NUMTs do not overlap with any gene.

6.3 File 4 and 5: "up gene results.txt" and "down gene results.txt"

Genes in gene_results.txt also includes large gene coding proteins where the NUMTs are probably located in intronic regions. To eliminate this genes, an additional two other lists were generated with new coordinates obtained from the upstream or downstream part of the original NUMTs coordinates (between 100 - 1000 bp from the initial coordinates). Once we get this two new list of genes associated to different NUMTs, we eliminate from the initial list in gene_results.txt that genes also present upstream AND downstream the initial coordinates. However, we ALWAYS associated gene with NUMTs, and also those genes associated to specific NUMT is eliminate (to conserve genes which includes more than one NUMT).

```
'data.frame':
                    891 obs. of 9 variables:
##
   $ id
                             : Factor w/ 756 levels "NUMT_01.001",..: 1 1 ...
                             : Factor w/ 24 levels "1","10","11",...: 1 1 ...
##
   $ chromosome_name
##
   $ start_position
                               int
                                     536816 562757 ...
                                     659930 564390 ...
   $ end_position
                              : int
##
   $ strand
                              : int
                                     -1 -1 ...
##
   $ hgnc_symbol
                             : Factor w/ 275 levels "ABCA8", "ACSM3", ...: NA NA ...
   $ ensembl_gene_id_version: Factor w/ 414 levels "ENSG00000003400.10",..: 262 213 ...
   $ ensembl gene id
                             : Factor w/ 414 levels "ENSG00000003400",..: 262 213 ...
   $ transcript_count
                             : int 51 ...
##
                    905 obs. of 9 variables:
## 'data.frame':
##
   $ id
                             : Factor w/ 756 levels "NUMT 01.001",..: 1 2 ...
   $ chromosome_name
                             : Factor w/ 24 levels "1","10","11",...: 1 NA ...
## $ start_position
                             : int 536816 NA ...
## $ end_position
                              : int
                                    659930 NA ...
```

```
## $ strand : int -1 NA ...
## $ hgnc_symbol : Factor w/ 274 levels "ABCA8","ACSM3",..: NA NA ...
## $ ensembl_gene_id_version: Factor w/ 425 levels "ENSG00000003400.10",..: 264 NA ...
## $ ensembl_gene_id : Factor w/ 425 levels "ENSG000000003400",..: 264 NA ...
## $ transcript_count : int 5 NA ...
```

In the upstream part of NUMTs coordinates we find 414 and in the downstream region 425 genes. Once we have the three list of genes, we wanted to compare all of them and select the ones originated by a NUMT insertion.

The dimensions of File 4 are: 891, 9 and the dimensions of File 5: 905, 9

6.4 File 6: "genes.txt"

The distribution of the genes within NUMTs in the different chromosomes is:

```
##
## 1 10 11 12 13 14 15 16 17 18 19 2 20 21 22 3 4 5 6 7 8 9 X Y
## 45 16 14 4 8 5 9 13 18 2 3 80 5 4 8 24 36 32 16 39 19 23 28 5
```

Of the 733 initial genes, after our filtering, we have 456 genes within the initial input coordinates.

The dimensions of File 6 are: 456, 1

6.5 File 7: "go results.txt"

```
##
      hgnc_symbol ensembl_gene_id_version
                                                go_id
                                                                 name 1006
## 1
         MTRNR2L4
                        ENSG00000232196.2 GO:0005576 extracellular region
## 2
         MTRNR2L4
                        ENSG00000232196.2 GD:0005737
                                                                 cytoplasm
## 3
                        ENSG00000249860.2 GO:0005576 extracellular region
         MTRNR2L5
                        ENSG00000249860.2 GD:0005737
                                                                 cytoplasm
## 4
         MTRNR2L5
## 5
         MTRNR2L9
                        ENSG00000255633.3 GO:0005576 extracellular region
## 6
         MTRNR2L9
                        ENSG00000255633.3 GD:0005737
                                                                 cytoplasm
                        ENSG00000255823.1 GO:0005576 extracellular region
## 7
        MTRNR2L8
                        ENSG00000255823.1 GD:0005737
## 8
         MTRNR2L8
                                                                 cytoplasm
        MTRNR2L10
                        ENSG00000256045.1 GO:0005576 extracellular region
## 9
## 10
        MTRNR2L10
                        ENSG00000256045.1 GD:0005737
                                                                 cytoplasm
                        ENSG00000256222.1 GO:0005576 extracellular region
## 11
        MTRNR2L3
## 12
        MTRNR2L3
                        ENSG00000256222.1 GO:0005737
                                                                 cytoplasm
## 13
                        ENSG00000256618.1 GO:0005576 extracellular region
        MTRNR2L1
## 14
        MTRNR2L1
                        ENSG00000256618.1 GO:0005737
                                                                 cytoplasm
## 15
        MTRNR2L7
                        ENSG00000256892.1 GO:0005576 extracellular region
## 16
         MTRNR2L7
                        ENSG00000256892.1 GO:0005737
                                                                 cytoplasm
                        ENSG00000269028.2 GO:0005576 extracellular region
## 17
        MTRNR2L12
## 18
        MTRNR2L12
                        ENSG00000269028.2 GO:0005737
                                                                 cytoplasm
## 19
                        ENSG00000270672.1 GO:0005576 extracellular region
        MTRNR2L6
## 20
         MTRNR2L6
                        ENSG00000270672.1 GD:0005737
                                                                 cytoplasm
                        ENSG00000271043.1 GO:0005576 extracellular region
## 21
         MTRNR2L2
## 22
                        ENSG00000271043.1 GD:0005737
         MTRNR2L2
                                                                 cytoplasm
```

Only 11 of the 456 genes originated by NUMTs insertion are anotated in Gene Ontology Consortium. However, as we can see in Figure 3, they are associated with different GO terms.

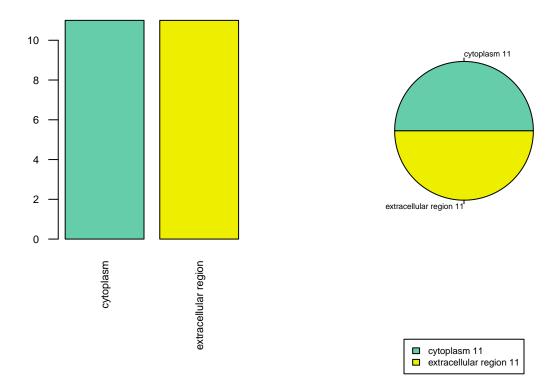


Figure 4: GO terms annotated for our list of genes.

The dimensions of File 7 are: 22, 5

6.6 File 8: "phenotype_results.txt"

```
##
      hgnc_symbol
                         ensembl_gene_id_version transcript_count
##
    MIR4461 :
                    ENSG00000198744.5: 1
                                                  Min.
                                                         :1.000
    MIR4484 :
##
               1
                    ENSG00000198868.3:
                                                  1st Qu.:1.000
    MTATP6P1:
                    ENSG00000216713.1:
                                                  Median :1.000
##
               1
##
    MTATP6P2:
               1
                    ENSG00000216853.1: 1
                                                  Mean
                                                         :1.002
    MTATP6P3:
              1
                    ENSG00000217044.1: 1
                                                  3rd Qu.:1.000
    (Other) :182
                    ENSG00000217083.1: 1
                                                          :2.000
##
                                                  Max.
    NA's
                    (Other)
##
            :268
                                      :450
##
            gene_biotype
##
    antisense
    lincRNA
##
##
    miRNA
##
    protein_coding: 13
    pseudogene
                   :436
##
    snRNA
                   : 1
##
##
                                                                                    description
    microRNA 4461 [Source: HGNC Symbol; Acc: 41656]
                                                                                             2
##
    hsa-mir-6723 [Source:miRBase;Acc:MI0022558]
                                                                                             1
    microRNA 4484 [Source: HGNC Symbol; Acc: 41799]
    mitochondrially encoded ATP synthase 6 pseudogene 1 [Source: HGNC Symbol; Acc: 44575]:
    mitochondrially encoded ATP synthase 6 pseudogene 2 [Source: HGNC Symbol; Acc: 44576]:
##
    (Other)
                                                                                          :183
##
    NA's
                                                                                          :267
```

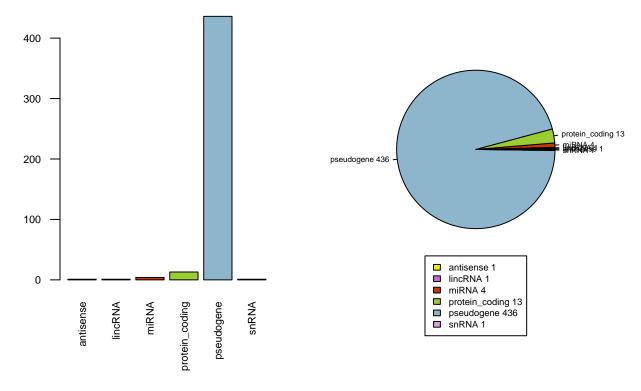


Figure 5: Gene biotype annotated for our list of genes.

For the 456 whithin our NUMTs, 456

In this case, all genes within our NUMTs are classified in ensembl-Biotype

The dimensions of File 8 are: 456, 5

6.7 File 9: "mean_tpm_GTEx.txt"

We then search in GTEx_Analysis_2016-01-15_v7_RNASeQCv1.1.8_gene_median_tpm.gct document our list of genes included in genes.txt.

Initially, we save all data existing for all our genes and calculate the mean and total TGM per gene.

The dimensions of File 9 are: 452, 58

6.8 File 10: "subset_expressed.txt"

In nrow(mean_tpm_GTEx).txt document, for the 456 within our initial coordinates, 452 have expression data in GTEx Portal. However, some of them are not expressed in any tissue. To subset the expressed genes, we will create an additional table containing genes with > 0.5 TMP in at least, one tissue:

```
Adipose...Subcutaneous Adipose...Visceral..Omentum. Adrenal.Gland
##
    Min.
                0.0000
                             Min.
                                         0.000
                                                             Min.
                                                                         0.000
##
    1st Qu.:
                0.0770
                             1st Qu.:
                                         0.025
                                                             1st Qu.:
                                                                         0.000
##
    Median:
                0.1716
                             Median:
                                         0.149
                                                             Median:
                                                                         0.151
               58.5435
                                        69.756
##
    Mean
                             Mean
                                                             Mean
                                                                        92.348
    3rd Qu.:
                                                             3rd Qu.:
##
                0.9008
                             3rd Qu.:
                                         0.930
                                                                         1.105
##
    Max.
            :3108.0000
                             Max.
                                     :3881.000
                                                             Max.
                                                                     :5478.500
    Artery...Aorta
                          Artery...Coronary
                                                Artery...Tibial
##
    {\tt Min.}
                                      0.0000
                                                            0.0000
                0.0000
                                               Min.
                          Min.
##
                0.0847
                                      0.0338
                                                            0.0000
    1st Qu.:
                          1st Qu.:
                                                1st Qu.:
##
    Median:
                0.1850
                          Median:
                                      0.1776
                                                Median:
                                                            0.1688
               30.3727
                                     38.8836
    Mean
                          Mean
                                               Mean
                                                           33.3114
```

```
3rd Qu.: 0.6637
                     3rd Qu.: 0.7224
                                       3rd Qu.: 0.7664
        :1767.0000
##
                   Max. :2189.0000
   Max.
                                       Max. :1917.0000
     Bladder
##
                     Brain...Amygdala
## Min. : 0.0000
                    Min. : 0.000
## 1st Qu.: 0.0000
                    1st Qu.: 0.000
                    Median: 0.096
## Median: 0.2607
## Mean : 47.6647
                     Mean : 108.916
##
   3rd Qu.: 1.0280
                     3rd Qu.: 1.393
##
   Max. :2810.0000
                     Max. :6332.500
   Brain...Anterior.cingulate.cortex..BA24. Brain...Caudate..basal.ganglia.
##
## Min. : 0.000
                                       Min. : 0.000
                                                 0.000
## 1st Qu.: 0.000
                                        1st Qu.:
## Median: 0.090
                                       Median: 0.128
## Mean : 107.712
                                       Mean : 128.959
## 3rd Qu.: 1.179
                                        3rd Qu.: 1.656
## Max.
        :6276.000
                                       Max.
                                             :7405.000
## Brain...Cerebellar.Hemisphere Brain...Cerebellum Brain...Cortex
## Min. : 0.000
                             Min. : 0.000 Min. : 0.000
## 1st Qu.: 0.000
                              1st Qu.: 0.072
                                               1st Qu.:
                                                        0.000
## Median: 0.513
                             Median : 0.535
                                              Median :
                                                        0.106
## Mean : 66.819
                             Mean : 78.096
                                              Mean : 106.524
## 3rd Qu.: 1.500
                             3rd Qu.: 1.649
                                               3rd Qu.: 1.288
## Max. :4014.500
                             Max. :4581.000
                                              Max. :6114.500
##
   Brain...Frontal.Cortex..BA9. Brain...Hippocampus Brain...Hypothalamus
## Min. : 0.000
                            Min. : 0.000
                                              Min. : 0.000
## 1st Qu.: 0.000
                                      0.000
                                              1st Qu.:
                                                        0.000
                            1st Qu.:
## Median: 0.097
                            Median: 0.095
                                              Median: 0.127
## Mean : 91.629
                            Mean : 114.700
                                              Mean : 105.871
## 3rd Qu.: 1.076
                             3rd Qu.: 1.387
                                              3rd Qu.: 1.257
                            Max. :6642.000
                                              Max. :6173.000
## Max. :5363.000
   Brain...Nucleus.accumbens..basal.ganglia. Brain...Putamen..basal.ganglia.
##
## Min. : 0.000
                                        Min. : 0.000
## 1st Qu.: 0.000
                                        1st Qu.: 0.000
                                        Median : 0.083
## Median: 0.156
## Mean : 114.504
                                        Mean : 134.231
## 3rd Qu.: 1.483
                                        3rd Qu.: 1.594
## Max. :6691.000
                                        Max. :7739.000
   Brain...Spinal.cord..cervical.c.1. Brain...Substantia.nigra
##
   Min. : 0.000
                                  Min. : 0.000
##
##
   1st Qu.:
             0.000
                                  1st Qu.:
                                            0.000
## Median: 0.180
                                            0.082
                                  Median :
## Mean : 82.647
                                  Mean : 109.764
## 3rd Qu.: 1.136
                                  3rd Qu.:
## Max. :4649.000
                                  Max. :6209.000
## Breast...Mammary.Tissue Cells...EBV.transformed.lymphocytes
## Min. : 0.000
                    Min. : 0.0000
           0.075
                                 0.0689
##
  1st Qu.:
                        1st Qu.:
                                 0.1672
## Median: 0.178
                        Median :
## Mean : 62.097
                        Mean : 27.4373
## 3rd Qu.: 0.931
                        3rd Qu.:
                                  0.6375
## Max. :3424.500
                        Max.
                              :1650.5000
## Cells...Transformed.fibroblasts Cervix...Ectocervix Cervix...Endocervix
## Min. : 0.0000
                               Min. : 0.0000
                                                 Min. : 0.0000
## 1st Qu.:
            0.0000
                               1st Qu.:
                                         0.0712
                                                 1st Qu.:
                                                           0.0525
##
   Median :
           0.1602
                               Median :
                                         0.2128
                                                 Median :
                                                           0.3654
## Mean : 23.3810
                               Mean : 31.2416
                                                 Mean : 36.8054
## 3rd Qu.: 0.6394
                               3rd Qu.: 0.5674
                                                 3rd Qu.: 0.8342
## Max. :1379.0000
                               Max. :1818.5000
                                                 Max. :2113.0000
```

```
## Colon...Sigmoid
                     Colon...Transverse
##
   Min. :
             0.000
                     Min. :
                               0.000
   1st Qu.:
             0.000
                     1st Qu.:
##
                               0.027
             0.241
## Median :
                     Median:
                               0.198
                     Mean : 73.790
## Mean : 62.345
##
   3rd Qu.:
            1.560
                     3rd Qu.: 1.222
                     Max. :4288.500
##
   Max. :3499.000
##
   Esophagus...Gastroesophageal.Junction Esophagus...Mucosa
   Min. : 0.000
##
                                       Min. :
                                                 0.0000
             0.000
                                                 0.0000
##
   1st Qu.:
                                       1st Qu.:
   Median :
            0.221
                                       Median :
                                                 0.1515
##
##
   Mean : 62.036
                                       Mean : 34.0182
   3rd Qu.: 1.227
                                       3rd Qu.:
                                                0.8776
##
   Max.
        :3503.000
                                       Max. :1995.0000
   Esophagus...Muscularis Fallopian.Tube
##
                                            Heart...Atrial.Appendage
##
   Min.
        : 0.000
                         Min. : 0.0000
                                           Min. : 0.000
##
   1st Qu.:
             0.000
                         1st Qu.:
                                   0.0000
                                            1st Qu.:
                                                      0.026
##
                         Median :
   Median :
             0.192
                                   0.1970
                                            Median :
                                                      0.159
                         Mean : 39.7982
##
   Mean
        : 63.550
                                            Mean : 114.793
   3rd Qu.:
            1.092
                         3rd Qu.:
                                            3rd Qu.:
##
                                   0.9203
                                                      1.566
##
   Max.
         :3619.500
                         Max. :2240.0000
                                            Max. :6837.000
##
   Heart...Left.Ventricle Kidney...Cortex
                                              Liver
##
   Min. : 0.000
                         Min. : 0.000
                                           Min. :
                                                     0.000
##
   1st Qu.:
             0.000
                         1st Qu.:
                                   0.000
                                           1st Qu.:
                                                     0.000
##
   Median :
             0.106
                         Median :
                                   0.111
                                           Median :
                                                     0.101
##
   Mean : 138.808
                                           Mean : 89.514
                         Mean : 105.737
##
   3rd Qu.: 1.867
                         3rd Qu.:
                                   1.099
                                           3rd Qu.: 1.591
                                           Max. :5360.000
   Max. :8294.000
                         Max.
                               :6276.000
##
                      Minor.Salivary.Gland Muscle...Skeletal
        Lung
   Min. :
                      Min. : 0.0000
                                          Min. :
##
             0.0000
                                                    0.000
##
   1st Qu.:
             0.1118
                      1st Qu.:
                                0.0516
                                          1st Qu.:
                                                    0.000
##
   Median :
             0.2510
                      Median :
                                0.2162
                                          Median:
                                                    0.072
##
         : 38.2883
                           : 43.3947
                                               : 81.281
   Mean
                      Mean
                                          Mean
##
   3rd Qu.:
                      3rd Qu.:
                                          3rd Qu.:
             1.0390
                                0.9248
                                                    1.391
##
   Max.
          :2172.0000
                      Max.
                           :2473.0000
                                          Max.
                                                :4844.500
## Nerve...Tibial
                          Ovary
                                            Pancreas
##
   Min. :
             0.0000
                                0.0000
                                         Min. :
                                                   0.0000
                      Min. :
   1st Qu.:
                      1st Qu.:
                                         1st Qu.:
##
             0.1156
                                0.0748
                                                   0.0000
   Median:
             0.3490
                      Median :
                                0.2573
                                         Median :
                                                   0.0933
##
##
   Mean : 40.9083
                      Mean : 37.8839
                                         Mean : 25.3360
   3rd Qu.:
##
            1.6265
                      3rd Qu.:
                                1.2463
                                         3rd Qu.: 0.4781
##
   Max.
         :2221.0000
                      Max. :2238.0000
                                         Max. :1411.0000
##
     Pituitary
                         Prostate
## Min.
             0.0000
                      Min. :
                                0.000
        :
             0.0000
##
   1st Qu.:
                      1st Qu.:
                                0.000
##
   Median :
             0.2112
                      Median :
                                0.237
   Mean : 43.4484
                      Mean : 69.723
##
##
   3rd Qu.: 0.8588
                      3rd Qu.:
                                0.847
## Max.
         :2510.0000
                      Max. :4062.500
   Skin...Not.Sun.Exposed..Suprapubic. Skin...Sun.Exposed..Lower.leg.
##
## Min. : 0.0000
                                     Min. : 0.0000
## 1st Qu.:
             0.1222
                                     1st Qu.:
                                               0.1173
##
   Median :
             0.2482
                                     Median :
                                               0.2667
                                     Mean : 45.4228
##
   Mean : 49.3496
##
   3rd Qu.:
             1.0835
                                     3rd Qu.:
                                               1.0277
##
   Max. :2779.0000
                                     Max. :2536.0000
##
   {\tt Small.Intestine...Terminal.Ileum}
                                      Spleen
                                                        Stomach
   Min. : 0.000
                                  Min. : 0.0000 Min. :
```

```
## 1st Qu.: 0.080
                             1st Qu.: 0.0743 1st Qu.: 0.000
## Median: 0.206
                             Median: 0.1682 Median: 0.178
## Mean : 70.835
                             Mean : 40.7322 Mean : 74.691
## 3rd Qu.: 1.375
                              3rd Qu.: 0.7227
                                              3rd Qu.: 1.343
## Max. :4085.000
                              Max. :2440.0000 Max. :4273.500
##
   Testis
                   Thyroid
                                       Uterus
## Min. : 0.0000
                   Min. : 0.0000
                                   Min. : 0.0000
                                   1st Qu.: 0.0653
                           0.0541
##
   1st Qu.:
          0.2186
                   1st Qu.:
   Median : 0.5612
                   Median: 0.3035
                                   Median: 0.3013
##
## Mean : 48.9623 Mean : 52.4518
                                   Mean : 38.8625
## 3rd Qu.: 1.0517
                   3rd Qu.: 0.9350
                                    3rd Qu.: 0.8382
## Max. :2798.0000 Max. :3056.5000 Max. :2252.0000
##
                   Whole.Blood
   Vagina
                                  tissue_means
## Min. : 0.0000
                  Min. : 0.0000 Min. : 0.012
## 1st Qu.: 0.1260
                   1st Qu.: 0.0000 1st Qu.: 0.088
                   Median: 0.0769 Median: 0.240
## Median :
           0.2664
                   Mean : 8.2614 Mean : 66.619
## Mean : 34.3699
## 3rd Qu.: 0.8346
                   3rd Qu.: 0.3096
                                   3rd Qu.: 1.100
## Max. :1989.0000 Max. :487.0000 Max. :3854.066
##
      sum
## Min. :
             0.65
## 1st Qu.:
            4.74
           12.99
## Median :
   Mean : 3597.43
##
## 3rd Qu.: 59.41
## Max. :208119.57
```

The dimensions of File 10 are: 72, 58

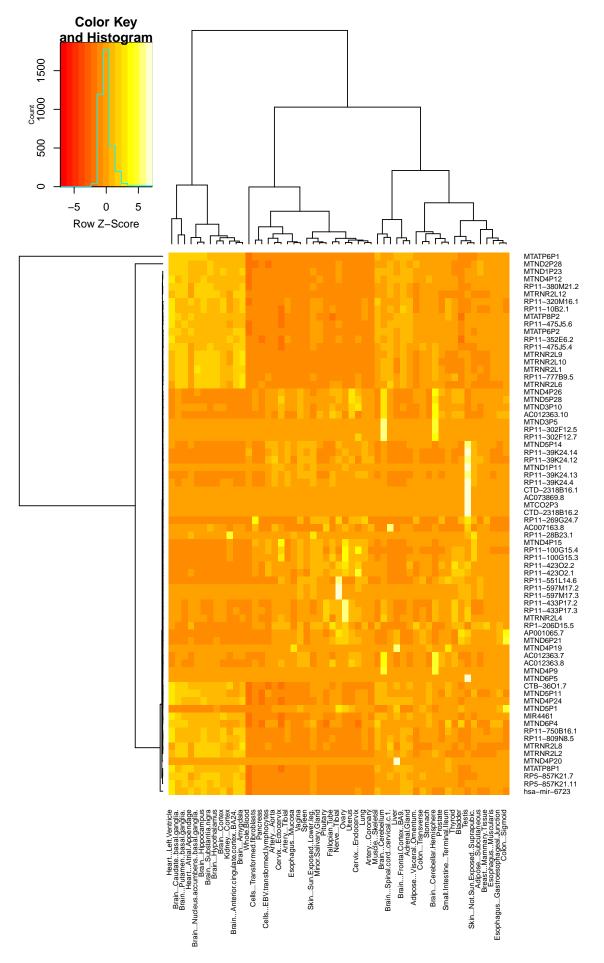


Figure 6: Heatmap of all expressed genes normalized by row (to see the different expression profile of each gene for the different tissues). 14

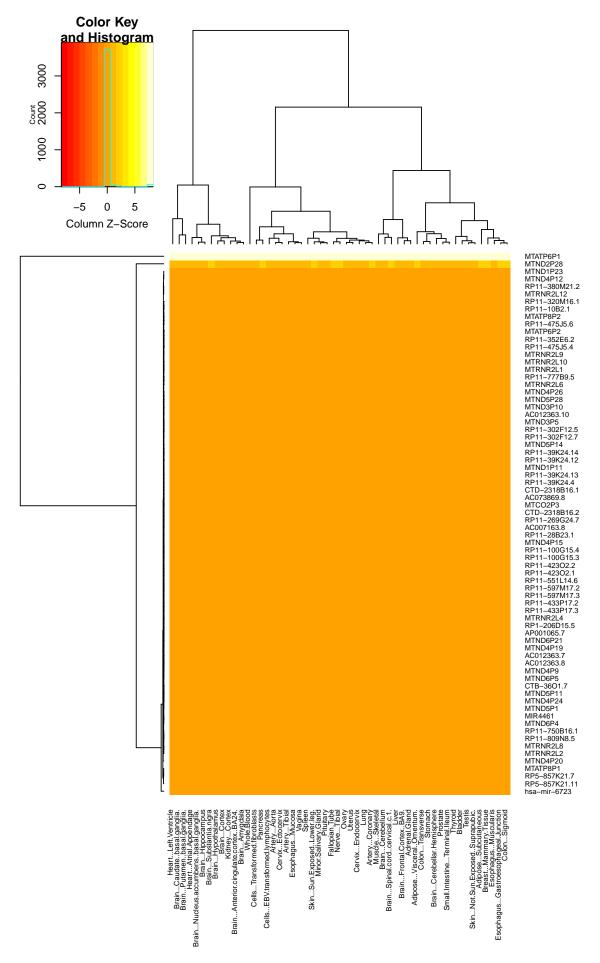


Figure 7: Heatmap of all expressed genes normalized by column (to see the different expression profile of the different gene for each tissue). 15

TPM/Tissue

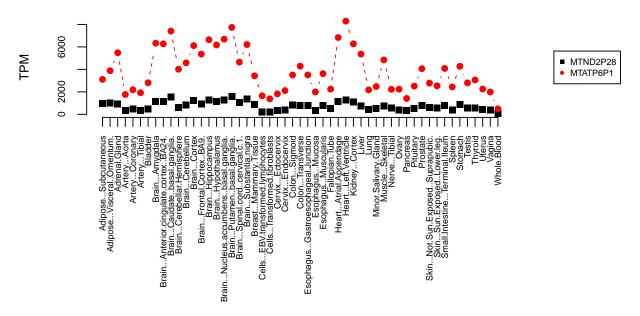


Figure 8: Graphical representation: expression profile of hight expressed genes (>=1000 TMP).

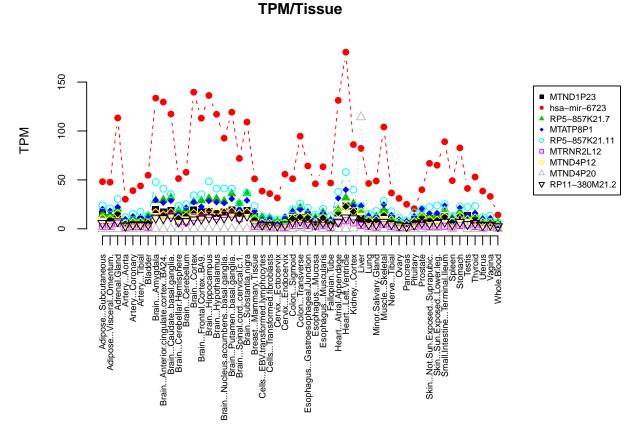


Figure 9: Graphical representation: expression profile of medium expressed genes (between 10 and 1000 TMP).

Of the 452 of our set of genes included in GTEx Portal, 72 are expressed in at least, one tissue (with \geq 0.5 TPM). But the EMBL-EBI Expression Atlas classified genes in: - low expressed (between 0.5 and 10 TPM), - medium expressed (\geq 10 to 1000 TPM) and - high expressed (more than 1000 TPM).

6.9 File 11: "FINAL OUTPUT TABLE.txt"

Finally, the final table FINAL_OUTPUT_TABLE.txt will include relevant information from all the analysis perform in this Dynamic Report. The first 6 lines of our finall document will be:

The dimensions of File 11 are: 998, 75

```
##
               id localization chr start n end n mt start mt end mt
## 1 NUMT_01.001
                      intronic
                                  1
                                     564461 570304 mt
                                                            3911
                                                                   9755
## 2 NUMT_01.001
                                     564461 570304 mt
                                                            3911
                      intronic
                                  1
                                                                   9755
## 3 NUMT_01.001
                                     564461 570304 mt
                                                            3911
                      intronic
                                  1
                                                                   9755
## 4 NUMT_01.001
                                     564461 570304 mt
                                                            3911
                                                                   9755
                      intronic
                                  1
## 5 NUMT_01.001
                                     564461 570304 mt
                                                            3911
                                                                   9755
                      intronic
                                  1
                                                            3911
                                                                   9755
                                     564461 570304 mt
## 6 NUMT_01.001
                      intronic
                                  1
##
     hgnc_symbol
                   Description gene_biotype name_1006 ensembl_gene_id_version
##
        MTND1P23
                      MTND1P23
                                  pseudogene
                                                   <NA>
                                                               ENSG00000225972.1
## 2
        MTND2P28
                      MTND2P28
                                  pseudogene
                                                   <NA>
                                                               ENSG00000225630.1
## 3
                                                               ENSG00000237973.1
             <NA> hsa-mir-6723
                                  pseudogene
                                                   <NA>
                                                               ENSG00000229344.1
## 4
             <NA> RP5-857K21.7
                                  pseudogene
                                                   <NA>
## 5
                                                               ENSG00000240409.1
        MTATP8P1
                      MTATP8P1
                                  pseudogene
                                                   <NA>
## 6
        MTATP6P1
                      MTATP6P1
                                  pseudogene
                                                   <NA>
                                                               ENSG00000248527.1
##
                                              sum GTEx_gene_id_version
     transcript_count tissue_means
## 1
                     1
                            11.81000
                                        637.7400
                                                     ENSG00000225972.1
## 2
                     1
                          743.85943
                                      40168.4094
                                                     ENSG00000225630.1
## 3
                                       3781.5996
                                                     ENSG00000237973.1
                     1
                           70.02962
## 4
                     1
                            17.58864
                                        949.7866
                                                     ENSG00000229344.1
## 5
                     1
                            18.09815
                                        977.3002
                                                     ENSG00000240409.1
                         3854.06604 208119.5660
                                                     ENSG00000248527.1
## 6
##
     Adipose...Subcutaneous Adipose...Visceral..Omentum. Adrenal.Gland
##
                       14.90
                                                      11.65
                                                                    14.900
   1
##
   2
                      941.20
                                                     989.00
                                                                   907.000
##
  3
                       48.22
                                                      47.65
                                                                   113.350
## 4
                       14.90
                                                      14.15
                                                                    20.115
## 5
                       20.14
                                                      18.35
                                                                    22.235
## 6
                     3108.00
                                                                  5478.500
                                                    3881.00
##
     Artery...Aorta Artery...Coronary Artery...Tibial
                                                          Bladder
## 1
               6.127
                                   7.57
                                                   8.285
                                                             7.068
## 2
             324.700
                                 492.50
                                                 354.500
                                                          483.100
## 3
              30.280
                                  39.04
                                                  43.870
                                                            54.780
## 4
               8.122
                                  10.61
                                                  10.400
                                                            13.040
## 5
               9.655
                                  12.64
                                                  11.930
                                                            11,290
## 6
            1767.000
                                2189.00
                                                1917.000 2810.000
     Brain...Amygdala Brain...Anterior.cingulate.cortex..BA24.
## 1
                19.735
                                                             17.41
## 2
              1152.500
                                                           1152.00
## 3
               133.600
                                                            129.60
##
                29.125
                                                             29.60
  4
## 5
                29.345
                                                             26.89
## 6
             6332.500
                                                           6276.00
##
     Brain...Caudate..basal.ganglia. Brain...Cerebellar.Hemisphere
                                18.905
## 1
                                                                12.685
## 2
                              1555.500
                                                               609.750
## 3
                               117.350
                                                                51.345
## 4
                                31.985
                                                                18.430
## 5
                                28.835
                                                                15.000
## 6
                              7405.000
                                                              4014.500
```

```
Brain...Cerebellum Brain...Cortex Brain...Frontal.Cortex..BA9.
## 1
                   16.01
                                 19.405
                                                                 17.34
## 2
                  830.60
                               1226.500
                                                                938.60
## 3
                  57.81
                                139.650
                                                                113.10
## 4
                                 27.690
                  19.61
                                                                 28.83
## 5
                   21.56
                                 27.285
                                                                 22.59
## 6
                4581.00
                               6114.500
                                                               5363.00
##
     Brain...Hippocampus Brain...Hypothalamus
## 1
                    17.79
                                          15.52
## 2
                  1259.00
                                        1132.00
## 3
                  136.30
                                         117.10
## 4
                    31.15
                                          30.63
## 5
                    28.54
                                          27.31
## 6
                  6642.00
                                        6173.00
##
     Brain...Nucleus.accumbens..basal.ganglia.
## 1
## 2
                                         1258.00
## 3
                                           92.65
## 4
                                           28.33
## 5
                                           26.34
## 6
                                         6691.00
     Brain...Putamen..basal.ganglia. Brain...Spinal.cord..cervical.c.1.
## 1
                               19.175
                                                                      15.74
## 2
                             1584.500
                                                                   1065.00
## 3
                              119.200
                                                                     71.95
## 4
                               35.845
                                                                     25.97
## 5
                               30.600
                                                                     20.05
                             7739.000
                                                                   4649.00
##
     Brain...Substantia.nigra Breast...Mammary.Tissue
## 1
                        18.965
                                                 12.810
## 2
                      1369.000
                                                885.850
## 3
                       109.100
                                                 51.145
## 4
                        36.065
                                                 14.110
## 5
                        29.060
                                                 17.995
## 6
                      6209.000
                                               3424.500
     Cells...EBV.transformed.lymphocytes Cells...Transformed.fibroblasts
## 1
                                   4.9045
                                                                       6.306
## 2
                                 214.1500
                                                                    201.900
## 3
                                   38.5500
                                                                     35.980
## 4
                                   11.7400
                                                                     11.150
## 5
                                    9.4795
                                                                       9.593
## 6
                                1650.5000
                                                                   1379.000
     Cervix...Ectocervix Cervix...Endocervix Colon...Sigmoid
## 1
                  5.8515
                                        8.977
                                                          10.64
## 2
                                       406.100
                                                         820.00
                343.5500
## 3
                  31.5950
                                        55.840
                                                          51.19
## 4
                   7.5350
                                         7.978
                                                          17.63
## 5
                   6.1220
                                        12.430
                                                          17.71
## 6
               1818.5000
                                      2113.000
                                                        3499.00
##
     Colon...Transverse Esophagus...Gastroesophageal.Junction
## 1
                  11.685
                                                          10.059
## 2
                796.650
                                                         783.550
## 3
                  94.690
                                                          64.255
## 4
                  21.585
                                                          16.555
## 5
                  19.725
                                                          16.950
## 6
               4288.500
                                                        3503.000
##
     Esophagus...Mucosa Esophagus...Muscularis Fallopian.Tube
## 1
                  5.892
                                          9.8765
                                                           6.905
```

```
## 2
                330.600
                                       781.4500
                                                        507.000
                                                         46.840
## 3
                  46.060
                                         63.4000
## 4
                                                          8.796
                  11.350
                                         16.9150
## 5
                  10.320
                                         16.1100
                                                          9.232
## 6
               1995.000
                                      3619.5000
                                                       2240.000
##
     Heart...Atrial.Appendage Heart...Left.Ventricle Kidney...Cortex
                                                                          Liver
## 1
                         16.28
                                                 23.28
                                                                          10.46
                                                                  17.89
## 2
                       1123.00
                                               1274.00
                                                                1076.00 754.30
## 3
                        131.30
                                                180.60
                                                                  86.12
                                                                          82.20
## 4
                                                 31.66
                                                                  25.74
                         19.48
                                                                          19.13
## 5
                         31.32
                                                 39.95
                                                                  23.26
                                                                          23.38
## 6
                       6837.00
                                               8294.00
                                                                6276.00 5360.00
                                                                          Ovary
##
         Lung Minor.Salivary.Gland Muscle...Skeletal Nerve...Tibial
## 1
        9.282
                              8.829
                                                              10.0085
                                               16.825
                                                                          5.858
## 2
      444.700
                            512.100
                                               752.100
                                                             582.7500 382.900
                                                                         31.140
## 3
       46.400
                             48.900
                                               104.050
                                                              36.6450
## 4
       12.760
                             12.650
                                                19.170
                                                              11.6500
                                                                          7.806
## 5
       13.220
                                                              14.0150
                                                                          9.465
                             12.410
                                                24.810
## 6 2172.000
                           2473.000
                                              4844.500
                                                            2221.0000 2238.000
      Pancreas Pituitary Prostate Skin...Not.Sun.Exposed..Suprapubic.
## 1
        5.5455
                   7.311
                             9.680
                                                                   10.33
## 2 340.5500
                 514.000
                           805.200
                                                                  597.10
## 3
      25.0950
                                                                   66.93
                  20.530
                           39.980
## 4
        6.5620
                  11.850
                            15.595
                                                                   13.39
## 5
        7.5835
                  12.560
                            20.450
                                                                   15.73
## 6 1411.0000 2510.000 4062.500
                                                                 2779.00
     Skin...Sun.Exposed..Lower.leg. Small.Intestine...Terminal.Ileum
                               11.57
                                                                  12.79
                                                                           7.647
## 2
                              555.30
                                                                 772.20 366.550
## 3
                               65.01
                                                                  89.01
                                                                          49.295
## 4
                               14.31
                                                                  20.03
                                                                          11.250
## 5
                               15.96
                                                                  23.55
                                                                          10.225
## 6
                             2536.00
                                                                4085.00 2440.000
##
                                             Vagina Whole.Blood
      Stomach Testis
                         Thyroid
                                   Uterus
## 1
       12.655
                13.64
                          8.7245
                                    6.845
                                              6.069
                                                          4.364
## 2 884.200
               566.70
                        557.8000 433.800
                                          377.200
                                                         56.350
## 3
       82.760
                41.27
                         52.9750
                                   38.600
                                             33.100
                                                         14.170
## 4
       17.605
                12.63
                         14.4550
                                    9.581
                                             9.288
                                                          5.665
## 5
       21.275
                13.79
                         16.0350
                                   10.120
                                             10.740
                                                          4.042
## 6 4273.500 2798.00 3056.5000 2252.000 1989.000
                                                        487.000
##
                                                                               description
## 1
                                     MT-ND1 pseudogene 23 [Source: HGNC Symbol; Acc: 42092]
## 2
                                     MT-ND2 pseudogene 28 [Source: HGNC Symbol; Acc: 42129]
## 3
                                              hsa-mir-6723 [Source:miRBase;Acc:MI0022558]
## 4
## 5 mitochondrially encoded ATP synthase 8 pseudogene 1 [Source: HGNC Symbol; Acc: 44571]
## 6 mitochondrially encoded ATP synthase 6 pseudogene 1 [Source: HGNC Symbol; Acc: 44575]
##
     chromosome_name start_position end_position strand
## 1
                                            564813
                              564442
                   1
## 2
                              565020
                                            566063
                                                        1
                   1
## 3
                              566454
                                            567996
                                                        1
                   1
## 4
                              568137
                                            568818
                                                        1
                   1
## 5
                              568915
                                            569121
                   1
                                                        1
## 6
                   1
                              569076
                                            569756
```

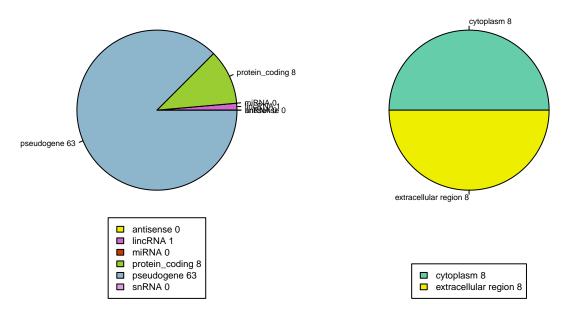


Figure 10: Gene biotype and GO term annotated for our list of expressed genes.

7 References

Boogaart, Paul van den, John Samallo, and Etienne Agsteribbe. 1982. "Similar Genes for a Mitochondrial Atpase Subunit in the Nuclear and Mitochondrial Genomes of Neurospora Crassa." *Nature* 298 (5870). Nature Publishing Group: 187.

Ramos, Amanda, Elena Barbena, Ligia Mateiu, María del Mar González, Quim Mairal, Manuela Lima, Rafael Montiel, Maria Pilar Aluja, and Cristina Santos. 2011. "Nuclear Insertions of Mitochondrial Origin: Database Updating and Usefulness in Cancer Studies." *Mitochondrion* 11 (6). Elsevier: 946–53.

Tsuzuki, Teruhisa, Hisayuki Nomiyama, Chiaki Setoyama, Shuichiro Maeda, and Kazunori Shimada. 1983. "Presence of Mitochondrial-Dna-Like Sequences in the Human Nuclear Dna." *Gene* 25 (2). Elsevier: 223–29.

```
# General knitr options for RMarkdown ----
knitr::opts_chunk$set(external=TRUE, warning=FALSE, message=FALSE,
                       fig.align='center', fig.pos='H')
# Setting working directory ----
## IN R-STUDIO:
### Session --> Set working directory --> Choose directory
## WORKING DIRECTORY (THIS FOLDER):
library(rstudioapi)
current_path <- getActiveDocumentContext()$path</pre>
setwd(dirname(current_path))
getwd() # to show the pathway
####### PART 1: Scripts from Dynamic_report_TFM.Rmd ########
# Installing package if needed ----
list.of.packages <- c("rstudioapi", "dplyr", "xlsx", "rJava", "gplots",
                       "devtools", "ggplot2")
new.packages <- list.of.packages[!(list.of.packages %in%)</pre>
                                      installed.packages()[,"Package"])]
if(length(new.packages)) install.packages(new.packages)
# Conneting with Bioconductor ----
source("https://bioconductor.org/biocLite.R")
# Installing & loading Bioconductor packages ----
biocLite()
biocLite("biomaRt")
## If biocLite("biomaRt") do not work:
### LINUX COMAND LINE: sudo apt-get install r-bioc-biomart
# Uploading .csv input file ---
numts_coord <- read.csv(file=params$file1, sep = ",", header = TRUE)</pre>
str(numts_coord, vec.len = 1)
head(numts_coord)
# The biomaRt package ----
library("biomaRt")
citation("biomaRt") # Package citation
## Preparing Package 'biomaRt'
gene_mart = useMart(biomart="ENSEMBL_MART_ENSEMBL",
                    host="grch37.ensembl.org",
                    path="/biomart/martservice",
                    dataset="hsapiens_gene_ensembl")
listMarts(gene_mart) # ensembl version used
## Creating "All_attributes.txt" and "All_filters.txt" with all options:
All_attributes <- listAttributes(gene_mart)</pre>
All_filters <- listFilters(gene_mart)</pre>
write.table(All attributes, file = "All attributes.txt", sep = "\t",
            row.names = FALSE, quote = FALSE)
write.table(All_filters, file = "All_filters.txt", sep = "\t",
            row.names = FALSE, quote = FALSE)
# Extracting all genes within NUMTs coordinates ----
library(plyr); library(dplyr)
## Adapting coordenates to download attributes
numts_coord$coord_n <- do.call(paste, c(numts_coord[,2:4], sep = ":"))</pre>
numts_vector <-as.vector(t(numts_coord$coord_n))</pre>
id <-as.vector(t(numts_coord$id))</pre>
## Setting attributes and filters
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### Our attributes
attributes_gene = c("chromosome_name", "start_position", "end_position", "strand",
                     "hgnc_symbol", "ensembl_gene_id_version", "ensembl_gene_id",
                     "transcript count")
## Getting values: gene_results.txt (loop)
gene_results <- numeric(0)</pre>
i <- 1
for (i in 1:length(numts_vector)) {
  gene_results_b = getBM(attributes_gene,
                          filters = c("chromosomal_region"),
                          values = list(chromosomal_region=numts_vector[b]),
                          mart = gene_mart)
  if (length(gene_results_b[,1]) == 0) {
    gene_results <- rbind(gene_results, c(rep("", length(attributes_gene)),</pre>
                                            do.call(paste, list(numts_coord[b,1]))))
    gene_results_b$id <- do.call(paste, list(numts_coord[b,1]))</pre>
    gene_results <- rbind(gene_results, gene_results_b)</pre>
  i <- i + 1
gene_results[gene_results==""] <- NA</pre>
## Reordering columns (gene_results.txt)
gene_results <- gene_results %>% dplyr::select("id", everything())
## Sorting results (gene_results.txt)
gene_results <- gene_results[order(gene_results$id,</pre>
                                     gene_results$chromosome_name,
                                     gene_results$start_position),]
## Saving the results (gene_results.txt)
write.table(gene_results, file = "gene_results.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
## Uploading intermediate documents
gene_results <- read.table("gene_results.txt", header = TRUE, sep = "\t")</pre>
summary(gene results)
# Extracting all genes upstream and downstream from the NUMTs coordinates ----
library(plyr); library(dplyr)
  ## Indicating new coordinates
up_start <- numts_coord[3] - 1000</pre>
up_end <- numts_coord[3] - 100
down_start <- numts_coord[4] + 100</pre>
down_end <- numts_coord[4] + 1000</pre>
up_numts_coord <- data.frame(numts_coord$id,
                              numts_coord$chr,
                              up_start,
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up_end)
down_numts_coord <- data.frame(numts_coord$id,</pre>
                                numts_coord$chr,
                                down_start,
                                down_end)
  ## Adapting coordenates to download attributes
up_numts_coord$coord_n <- do.call(paste, c(up_numts_coord[,2:4], sep = ":"))
up_numts_vector <-as.vector(t(up_numts_coord$coord_n))</pre>
down_numts_coord$coord_n <- do.call(paste, c(down_numts_coord[,2:4], sep = ":"))</pre>
down_numts_vector <-as.vector(t(down_numts_coord$coord_n))</pre>
## Getting values: up_gene_results.txt (loop)
up_gene_results <- numeric(0)</pre>
i <- 1
for (i in 1:length(up_numts_vector)) {
  b<-i
  up_gene_results_b = getBM(attributes_gene,
                          filters = c("chromosomal_region"),
                          values = list(chromosomal_region=up_numts_vector[b]),
                          mart = gene_mart)
  if (length(up_gene_results_b[,1]) == 0) {
    up_gene_results <- rbind(up_gene_results,
                              c(rep("", length(attributes_gene)),
                                do.call(paste, list(numts_coord[b,1]))))
  } else {
    up_gene_results_b$id <- do.call(paste, list(numts_coord[b,1]))</pre>
    up_gene_results <- rbind(up_gene_results, up_gene_results_b)</pre>
  i <- i + 1
up_gene_results[up_gene_results==""] <- NA
### Reordering columns (up_gene_results.txt)
up_gene_results <- up_gene_results %>% dplyr::select("id", everything())
### Sorting results (up_gene_results.txt)
up_gene_results <- up_gene_results[order(up_gene_results$id,
                                           up gene results$chromosome name,
                                           up_gene_results\start_position),]
### Saving the results (up_gene_results.txt)
write.table(up_gene_results, file = "up_gene_results.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
## Getting values: down_gene_results.txt (loop)
down_gene_results <- numeric(0)</pre>
i <- 1
```

```
for (i in 1:length(down_numts_vector)) {
 b<-i
 down_gene_results_b = getBM(attributes_gene,
                         filters = c("chromosomal_region"),
                          values = list(chromosomal_region=down_numts_vector[b]),
                         mart = gene_mart)
  if (length(down_gene_results_b[,1]) == 0) {
    down_gene_results <- rbind(down_gene_results,</pre>
                              c(rep("", length(attributes_gene)),
                                do.call(paste, list(numts_coord[b,1]))))
 } else {
    down gene results b$id <- do.call(paste, list(numts coord[b,1]))</pre>
    down_gene_results <- rbind(down_gene_results, down_gene_results_b)</pre>
 i <- i + 1
down_gene_results[down_gene_results==""] <- NA</pre>
### Reordering columns (down_gene_results.txt)
down_gene_results <- down_gene_results %>% dplyr::select("id", everything())
### Sorting results (down_gene_results.txt)
down_gene_results <- down_gene_results[order(down_gene_results$id,</pre>
                                              down_gene_results$chromosome_name,
                                              down_gene_results$start_position),]
### Saving the results (down_gene_results.txt)
write.table(down_gene_results, file = "down_gene_results.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
## Uploading intermediate documents
up_gene_results <- read.table("up_gene_results.txt", header = TRUE, sep = "\t")
str(up_gene_results, vec.len = 1)
down_gene_results <- read.table("down_gene_results.txt", header = TRUE, sep = "\t")</pre>
str(down_gene_results, vec.len = 1)
# Extracting genes originated by NUMT insertions ----
## Total genes
TOTAL_GENES <- as.character(na.omit(unique(gene_results$ensembl_gene_id_version)))
UP_GENES <- as.character(na.omit(unique(up_gene_results$ensembl_gene_id_version)))</pre>
DOWN_GENES <- as.character(na.omit(unique(down_gene_results$ensembl_gene_id_version)))
## Common genes present in all three list of genes
## (gene_results, upstream and downstream)
library(plyr); library(dplyr)
data_joined <- dplyr::inner_join(up_gene_results, down_gene_results)</pre>
## Creating column "Localization"
data_joined$localization <- data_joined$ensembl_gene_id
data_joined$localization[!is.na(data_joined$localization)] <- "intronic"</pre>
data_joined$localization[is.na(data_joined$localization)] <- "intergenic"
## Genes in gene_results.txt but not in upper and downstream regions
int_gene_results <- anti_join(gene_results, data_joined)</pre>
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#### START of exclusive from my dataset (TFM) ####
## Excluding the gene ARHGAP15
for (i in 1:nrow(int_gene_results)) {
  if (!is.na(int_gene_results$hgnc_symbol[i])) {
    if (int_gene_results$hgnc_symbol[i] == "ARHGAP15") {
      int_gene_results[i,c(2:ncol(int_gene_results))] <- NA</pre>
    } else {
      int_gene_results$hgnc_symbol[i] <- int_gene_results$hgnc_symbol[i]</pre>
    i <- i + 1
 } else {
    int_gene_results$hgnc_symbol[i] <- NA</pre>
}
#### END ####
## Saving genes.txt
genes <- as.character(na.omit(unique(int_gene_results$ensembl_gene_id)))</pre>
write.table(genes, file="genes.txt",col.names = F, sep="\t",quote=F,row.names=F)
## Uploading intermediate documents
genes <- read.table("genes.txt", header = FALSE, sep = "\t")</pre>
table_numts_genes <- gene_results[gene_results$ensembl_gene_id
                                   %in% genes$V1,]
chrom <- (unique(table_numts_genes[c(2,7)]))</pre>
# Number of genes per chromosome
table(chrom[1])
# GO terms (go_results.txt) ----
## Setting attributes and filters
 ### Our attributes
attributes_go = c("hgnc_symbol", "ensembl_gene_id_version",
                   "go_id", "name_1006", "definition_1006")
go_results = getBM(attributes_go,
                   filters = c("ensembl_gene_id"),
                   values = list(ensembl_gene_id=genes$V1),
                   mart = gene_mart)
go_results[go_results==""] <- NA</pre>
go_results <- go_results[order(go_results$ensembl_gene_id_version, go_results$go_id),]</pre>
go_results <- go_results[complete.cases(go_results$name_1006), ]</pre>
write.table(go_results, file = "go_results.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
go_results <-read.table("go_results.txt", header = TRUE, sep = "\t")</pre>
go_results[c(1:4)]
## Plotting GO results
par(mfrow=c(1,2))
par(mar = c(8.5, 2.5, 2.5, 4), xpd=TRUE)
ensembl_go <- na.omit(unique(go_results[c("hgnc_symbol", "name_1006")]))</pre>
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ensembl_go <- ensembl_go[complete.cases(ensembl_go), ]</pre>
colors = c("aquamarine3", "yellow2", "azure3",
          "darkgoldenrod1", "lawngreen", "plum",
          "gray9", "deeppink1", "cornflowerblue",
          "antiquewhite3", "slategrey", "tomato")
### Bar plot
barplot(table(ensembl_go$name_1006), las=2, cex.main = 1.2,
        cex.axis = 0.7, cex = 0.7, col = colors)
### pie chart
counts = table(ensembl_go$name_1006) ## get counts
labs = paste(levels(ensembl_go$name_1006), counts) ## create labels
pie(counts, labels = labs, col = colors, cex=0.5) ## plot
legend("bottom", inset=c(0,-0.6), labs, cex=0.6, fill=colors)
# phenotype_results.txt ----
## Setting attributes and filters
### Our attributes
attributes_phenotype = c("hgnc_symbol", "ensembl_gene_id_version", "transcript_count",
                         "gene_biotype", "description")
## Getting values: phenotype_results ----
phenotype_results = getBM(attributes_phenotype,
                              filters = c("ensembl_gene_id"),
                              values = list(ensembl_gene_id=genes$V1),
                              mart = gene_mart)
# class(phenotype_results) # data.frame
phenotype_results[phenotype_results==""] <- NA</pre>
phenotype_results <- phenotype_results[order(phenotype_results$ensembl_gene_id_version),]</pre>
write.table(phenotype_results, file = "phenotype_results.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
## Uploading intermediate documents
phenotype_results <-read.table("phenotype_results.txt",</pre>
                               header = TRUE, sep = "\t")
summary(phenotype_results)
## Plotting Gene biotype results
par(mfrow=c(1,2))
par(mar = c(6, 2.5, 2.5, 2.5), xpd=TRUE)
ensembl_biotype <- na.omit(unique(phenotype_results[c("ensembl_gene_id_version",</pre>
                                                       "gene_biotype")]))
colors = c("yellow2", "orchid3", "orangered3",
          "olivedrab3", "lightskyblue3", "plum")
### Bar plot
barplot(table(ensembl_biotype$gene_biotype), las=2, cex.main = 1.2,
        cex.axis = 0.7, cex = 0.7, col = colors)
### pie chart
```

```
counts = table(ensembl_biotype$gene_biotype) ## get counts
labs = paste(levels(ensembl_biotype$gene_biotype), counts) ## create labels
pie(counts, labels = labs, col = colors, cex=0.5) ## plot
legend("bottom", inset=c(0, -0.2), labs, cex=0.6, fill=colors)
# EXPRESSION STUDY ----
## Uploading GTEx means in TPM
GTEx_mean_tpm <-</pre>
  read.table(file = params$file2, skip = 2,
             header = TRUE, sep = "\t")
## Creating mean_tpm_GTEx.txt
library(plyr); library(dplyr)
GTEx tpm <- GTEx mean tpm
colnames(GTEx tpm)[1] <- "GTEx gene id version"</pre>
gene_id <- GTEx_mean_tpm$gene_id</pre>
GTEx_genes <- numeric(0)</pre>
for (i in 1:length(GTEx_mean_tpm$gene_id)){
    x <- unlist(strsplit(as.character(GTEx_mean_tpm[i,1]), split='.', fixed=TRUE))[1]</pre>
    GTEx_genes <- rbind(GTEx_genes, x)</pre>
}
GTEx_mean_tpm$gene_id <- GTEx_genes</pre>
mean_tpm_fromGTEx <- numeric(0)</pre>
for (i in 1:nrow(genes)){
    y <- subset(GTEx_mean_tpm, gene_id == genes[i,1])
    mean_tpm_fromGTEx <- rbind(mean_tpm_fromGTEx, y)</pre>
}
tissue_means <- rowMeans(mean_tpm_fromGTEx[,3:length(mean_tpm_fromGTEx)])</pre>
mean_tpm_fromGTEx$tissue_means <- tissue_means</pre>
mean tpm fromGTEx$sum <- rowSums(mean tpm fromGTEx[,3:length(mean tpm fromGTEx)])</pre>
mean_tpm_fromGTEx$gene_id <- as.character(mean_tpm_fromGTEx$gene_id)
mean_tpm_GTEx <- dplyr::inner_join(mean_tpm_fromGTEx,</pre>
                                  GTEx_tpm)
mean_tpm_GTEx <- mean_tpm_GTEx %>% dplyr::select("gene_id", "GTEx_gene_id_version",
                                                    everything())
colnames(mean_tpm_GTEx)[1] <- "ensembl_gene_id"</pre>
str(mean_tpm_GTEx)
# Saving results
write.table(mean_tpm_GTEx, file = "mean_tpm_GTEx.txt", sep = "\t",
             quote = FALSE, row.names = FALSE)
## Uploading intermediate documents
mean_tpm_GTEx <- read.table("mean_tpm_GTEx.txt", header = TRUE,</pre>
                                  sep = "\t", dec = ".")
# subset_expressed.txt ----
## Creating subset of genes with >= 0.5 TPM (expressed)
GTEx <- mean_tpm_GTEx</pre>
subset_expressed <- subset(GTEx, GTEx[4] >= 0.5 | GTEx[5] >= 0.5 | GTEx[6] >= 0.5 |
                               GTEx[7] >= 0.5 \mid GTEx[8] >= 0.5 \mid GTEx[9] >= 0.5 \mid
                               GTEx[10] >= 0.5 | GTEx[11] >= 0.5 | GTEx[12] >= 0.5 |
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GTEx[13] >= 0.5 \mid GTEx[14] >= 0.5 \mid GTEx[15] >= 0.5 \mid
                                GTEx[16] >= 0.5 \mid GTEx[17] >= 0.5 \mid GTEx[18] >= 0.5 \mid
                                GTEx[19] >= 0.5 \mid GTEx[20] >= 0.5 \mid GTEx[21] >= 0.5 \mid
                                GTEx[22] >= 0.5 \mid GTEx[23] >= 0.5 \mid GTEx[24] >= 0.5 \mid
                                GTEx[25] >= 0.5 \mid GTEx[26] >= 0.5 \mid GTEx[27] >= 0.5 \mid
                                GTEx[28] >= 0.5 \mid GTEx[29] >= 0.5 \mid GTEx[30] >= 0.5 \mid
                                GTEx[31] >= 0.5 \mid GTEx[32] >= 0.5 \mid GTEx[33] >= 0.5 \mid
                                GTEx[34] >= 0.5 \mid GTEx[35] >= 0.5 \mid GTEx[36] >= 0.5 \mid
                                GTEx[37] >= 0.5 \mid GTEx[38] >= 0.5 \mid GTEx[39] >= 0.5 \mid
                                GTEx[40] >= 0.5 \mid GTEx[41] >= 0.5 \mid GTEx[42] >= 0.5 \mid
                                GTEx[43] >= 0.5 \mid GTEx[44] >= 0.5 \mid GTEx[45] >= 0.5 \mid
                                GTEx[46] >= 0.5 \mid GTEx[47] >= 0.5 \mid GTEx[48] >= 0.5 \mid
                                GTEx[49] >= 0.5 | GTEx[50] >= 0.5 | GTEx[51] >= 0.5 |
                                GTEx[52] >= 0.5 \mid GTEx[53] >= 0.5 \mid GTEx[54] >= 0.5 \mid
                                GTEx[55] >= 0.5 \mid GTEx[56] >= 0.5 \mid GTEx[57] >= 0.5
## saving results
write.table(subset_expressed, file = "subset_expressed.txt", sep = "\t",
             quote = FALSE, row.names = FALSE)
## Uploading intermediate documents
subset_expressed <- read.table("subset_expressed.txt", header = TRUE,</pre>
                                   sep = "\t", dec = ".")
summary(subset_expressed[c(4:ncol(subset_expressed))])
## Heatmap of all expressed genes.
library(gplots)
par(oma=c(10,4,4,2))
subset_mean_tpm <- subset_expressed</pre>
subset_mean_tpm[1] <- NULL</pre>
rownames(subset_mean_tpm) <- subset_mean_tpm$Description</pre>
subset mean tpm[1] <- NULL</pre>
subset_mean_tpm[1] <- NULL</pre>
heatmap.2(data.matrix(subset_mean_tpm[1:53]), trace='none', scale = "row",
           cexRow=0.6. cexCol = 0.6)
## Heatmap of all expressed genes.
library(gplots)
par(oma=c(10,4,4,2))
subset_mean_tpm <- subset_expressed</pre>
subset_mean_tpm[1] <- NULL</pre>
rownames(subset_mean_tpm) <- subset_mean_tpm$Description</pre>
subset_mean_tpm[1] <- NULL</pre>
subset_mean_tpm[1] <- NULL</pre>
heatmap.2(data.matrix(subset mean tpm[1:53]), trace='none', scale = "column",
           cexRow=0.6, cexCol = 0.6)
## Graphical representation: expression profile of
## hight expressed genes (>=1000 TMP)
par(mar = c(10.5, 4, 4, 7.5), xpd=TRUE)
GTEx1 <- subset_mean_tpm</pre>
subset_mean_tpm2 <- subset(GTEx1, GTEx1[1] >= 1000.0 |GTEx1[2] >= 1000.0 |
                                GTEx1[3] >= 1000.0 | GTEx1[4] >= 1000.0 |
                                GTEx1[5] >= 1000.0 \mid GTEx1[6] >= 1000.0 \mid
                                GTEx1[7] >= 1000.0 \mid GTEx1[8] >= 1000.0 \mid
                                GTEx1[9] >= 1000.0 | GTEx1[10] >= 1000.0 |
```

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GTEx1[11] >= 1000.0 | GTEx1[12] >= 1000.0 |
                              GTEx1[13] >= 1000.0 \mid GTEx1[14] >= 1000.0 \mid
                              GTEx1[15] >= 1000.0 | GTEx1[16] >= 1000.0 |
                              GTEx1[17] >= 1000.0 \mid GTEx1[18] >= 1000.0 \mid
                              GTEx1[19] >= 1000.0 | GTEx1[20] >= 1000.0 |
                              GTEx1[21] >= 1000.0 | GTEx1[22] >= 1000.0 |
                              GTEx1[23] >= 1000.0 \mid GTEx1[24] >= 1000.0 \mid
                              GTEx1[25] >= 1000.0 | GTEx1[26] >= 1000.0 |
                              GTEx1[27] >= 1000.0 \mid GTEx1[28] >= 1000.0 \mid
                              GTEx1[29] >= 1000.0 \mid GTEx1[30] >= 1000.0 \mid
                              GTEx1[31] >= 1000.0 \mid GTEx1[32] >= 1000.0 \mid
                              GTEx1[33] >= 1000.0 \mid GTEx1[34] >= 1000.0 \mid
                              GTEx1[35] >= 1000.0 | GTEx1[36] >= 1000.0 |
                              GTEx1[37] >= 1000.0 | GTEx1[38] >= 1000.0 |
                              GTEx1[39] >= 1000.0 | GTEx1[40] >= 1000.0 |
                              GTEx1[41] >= 1000.0 \mid GTEx1[42] >= 1000.0 \mid
                              GTEx1[43] >= 1000.0 \mid GTEx1[44] >= 1000.0 \mid
                              GTEx1[45] >= 1000.0 \mid GTEx1[46] >= 1000.0 \mid
                              GTEx1[47] >= 1000.0 \mid GTEx1[48] >= 1000.0 \mid
                              GTEx1[49] >= 1000.0 | GTEx1[50] >= 1000.0 |
                              GTEx1[51] >= 1000.0 | GTEx1[52] >= 1000.0 |
                              GTEx1[53] >= 1000.0)
matplot(t(data.matrix(subset_mean_tpm2[1:53])), type = "b",
        col = c(1:ncol(subset_mean_tpm2)),
        cex.main = 1, cex.lab = 0.8, ylab = "TPM", pch=c(15:18,21:25),
        main = "TPM/Tissue", axes = FALSE)
axis(2, cex.axis=0.7)
axis(side=1,at=1:ncol(subset_mean_tpm2[1:53]), cex.axis=0.6, las = 2,
     labels=colnames(subset_mean_tpm2[1:53]))
legend("right", inset=c(-0.25, 1), legend=rownames(subset_mean_tpm2[1:53]),
       col=c(1:ncol(subset_mean_tpm2)),pch= c(15:18,21:25),
       cex = 0.6, bg= ("white"), horiz=F)
## Graphical representation: expression profile of
## medium expressed genes (between 10 and 1000 TMP)
subset_mean_tpm3 <- subset(GTEx1, GTEx1[1] >= 10.0 |GTEx1[2] >= 10.0 |
                              GTEx1[3] >= 10.0 | GTEx1[4] >= 10.0 |
                              GTEx1[5] >= 10.0 | GTEx1[6] >= 10.0 |
                              GTEx1[7] >= 10.0 | GTEx1[8] >= 10.0 |
                              GTEx1[9] >= 10.0 | GTEx1[10] >= 10.0 |
                              GTEx1[11] >= 10.0 | GTEx1[12] >= 10.0 |
                              GTEx1[13] >= 10.0 | GTEx1[14] >= 10.0 |
                              GTEx1[15] >= 10.0 | GTEx1[16] >= 10.0 |
                              GTEx1[17] >= 10.0 | GTEx1[18] >= 10.0 |
                              GTEx1[19] >= 10.0 | GTEx1[20] >= 10.0 |
                              GTEx1[21] >= 10.0 | GTEx1[22] >= 10.0 |
                              GTEx1[23] >= 10.0 | GTEx1[24] >= 10.0 |
                              GTEx1[25] >= 10.0 | GTEx1[26] >= 10.0 |
                              GTEx1[27] >= 10.0 | GTEx1[28] >= 10.0 |
                              GTEx1[29] >= 10.0 | GTEx1[30] >= 10.0 |
                              GTEx1[31] >= 10.0 | GTEx1[32] >= 10.0 |
                              GTEx1[33] >= 10.0 | GTEx1[34] >= 10.0 |
                              GTEx1[35] >= 10.0 | GTEx1[36] >= 10.0 |
                              GTEx1[37] >= 10.0 | GTEx1[38] >= 10.0 |
                              GTEx1[39] >= 10.0 | GTEx1[40] >= 10.0 |
```

```
GTEx1[41] >= 10.0 | GTEx1[42] >= 10.0 |
                             GTEx1[43] >= 10.0 | GTEx1[44] >= 10.0 |
                             GTEx1[45] >= 10.0 | GTEx1[46] >= 10.0 |
                             GTEx1[47] >= 10.0 | GTEx1[48] >= 10.0 |
                             GTEx1[49] >= 10.0 | GTEx1[50] >= 10.0 |
                             GTEx1[51] >= 10.0 | GTEx1[52] >= 10.0 |
                             GTEx1[53] >= 10.0)
subset_mean_tpm3 <- subset_mean_tpm3[!rownames(subset_mean_tpm3) %in%</pre>
                                       rownames(subset_mean_tpm2), ]
par(mar = c(10.5, 4, 4, 7.5), xpd=TRUE)
matplot(t(data.matrix(subset_mean_tpm3[1:53])), type = "b",
        col = c(1:ncol(subset mean tpm3)),
        cex.main = 1, cex.lab = 0.8,
                                       ylab = "TPM", pch=c(15:18,21:25),
       main = "TPM/Tissue", axes = FALSE)
axis(2, cex.axis=0.7)
axis(side=1,at=1:ncol(subset_mean_tpm3[1:53]), cex.axis=0.6, las = 2,
     labels=colnames(subset_mean_tpm3[1:53]))
legend("right", inset=c(-0.25, 1), legend=rownames(subset_mean_tpm3[1:53]),
       col=c(1:ncol(subset_mean_tpm3)),pch= c(15:18,21:25), cex = 0.6,
       bg= ("white"), horiz=F)
# FINAL TABLE: FINAL_OUTPUT_TABLE.txt ----
library(plyr); library(dplyr)
## Cheking genes and creating table
table_numts_genes <- gene_results[gene_results$ensembl_gene_id
                                  %in% genes$V1,]
str(table_numts_genes)
length(unique(table_numts_genes$ensembl_gene_id))
summary(table_numts_genes)
table_numts_genes <- dplyr::full_join(numts_coord,
                         table_numts_genes)
table_numts_genes <- dplyr::full_join(data_joined[c("id", "localization")],
                         table_numts_genes)
table_numts_genes$localization[is.na(table_numts_genes$localization)] <- "partial_gene"
table_numts_genes <- dplyr::full_join(phenotype_results[c("ensembl_gene_id_version",
                                             "gene_biotype", "description")],
                               table_numts_genes)
table numts go <- dplyr::full join(go results[c("ensembl gene id version",
                                      "name 1006")],
                         table_numts_genes)
table_numts_exp <- dplyr::full_join(mean_tpm_GTEx,
                         table_numts_go)
table_numts <- table_numts_exp %>% dplyr::select("id", "localization", "chr",
                                                 "start_n", "end_n", "mt",
                                                 "start_mt", "end_mt",
                                                 "hgnc_symbol", "Description",
                                                  "gene_biotype", "name_1006",
                                                  "ensembl_gene_id_version",
```

```
"transcript_count",
                                                  "tissue_means", "sum",
                                                  everything())
## Removing columns
table_numts\ensembl_gene_id = NULL
## Sorting results (gene_results.txt) ----
table_numts <- table_numts[order(table_numts$id,</pre>
                                  table_numts$chr,
                                  table_numts$start_n,
                                  table_numts\start_position),]
table_numts <- table_numts[!duplicated(table_numts), ]</pre>
## Saving results
write.table(table_numts, file="FINAL_OUTPUT_TABLE.txt",
            sep="\t",quote=F,row.names=F)
## Uploading intermediate documents
table_numts <- read.table("FINAL_OUTPUT_TABLE.txt", header = TRUE, sep = "\t")
## Showing 6 first data from FINAL TABLE "FINAL_OUTPUT_TABLE.txt"
head(table_numts)
library(plyr); library(dplyr)
only_expressed <- table_numts[table_numts$ensembl_gene_id</pre>
                                   %in% subset_expressed$GTEx_gene_id_version,]
## Plotting Gene biotype results
par(mfrow=c(1,2))
par(mar = c(6, 2.5, 2.5, 2.5), xpd=TRUE)
ensembl_biotype_ex <- na.omit(unique(only_expressed[c("ensembl_gene_id_version",</pre>
                                                        "gene_biotype")]))
ensembl_go_ex <- na.omit(unique(only_expressed[c("ensembl_gene_id_version",</pre>
                                                       "name_1006")]))
colors = c("yellow2", "orchid3", "orangered3",
          "olivedrab3", "lightskyblue3", "plum")
### pie chart
counts = table(ensembl_biotype_ex$gene_biotype) ## get counts
labs = paste(levels(ensembl_biotype$gene_biotype), counts) ## create labels
pie(counts, labels = labs, col = colors, cex=0.5) ## plot
legend("bottom", inset=c(0, -0.2), labs, cex=0.6, fill=colors)
## Plotting GO results
ensembl_go <- ensembl_go_ex[complete.cases(ensembl_go_ex), ]</pre>
colors = c("aquamarine3", "yellow2", "azure3",
          "darkgoldenrod1", "lawngreen", "plum",
          "gray9", "deeppink1", "cornflowerblue",
          "antiquewhite3", "slategrey", "tomato")
### pie chart
counts = table(ensembl_go$name_1006) ## get counts
labs = paste(levels(ensembl_go$name_1006), counts) ## create labels
pie(counts, labels = labs, col = colors, cex=0.5) ## plot
```

```
legend("bottom", inset=c(0, -0.2), labs, cex=0.6, fill=colors)
####### PART 2: Additional scripts for TFM #########
#install.packages("overlap")
#install.packages("DescTools")
library(DescTools)
library(plyr)
library(dplyr)
library(biomaRt)
# First, we will check general data from our analysis:
table <- gene_results[gene_results$ensembl_gene_id
                                   %in% genes$V1,]
# Genes per NUMT
numt_t <- table(table[1])</pre>
# NUMTS WITHOUT GENES
sum(numt_t == 0)
x <- numeric(0)
# Loop for the rest:
for (i in 0:length(unique(numt_t))){
x[i] = paste("NUMTs containing ", i, " genes:", sum(numt_t == i))
}
х
# NUMTs per gene
numt_g <- table(table_numts_genes[7])</pre>
#Genes deleted after filtering:
sum(numt_g == 0)
y <- numeric(0)
# Loop for the rest:
for (j in 0:length(unique(numt_g))){
y[j] = paste("Genes included in ", j, " NUMTs:", sum(numt_g == j))
}
У
# File 12: "gene_result_mt.txt" -----
# Input file ----
numts_coord <- read.csv("NUMTs_coord.csv", sep = ",", header = TRUE)</pre>
numts coord$coord mt <- do.call(paste, c(numts coord[,5:7], sep = ":"))</pre>
numts_vector_mt <-as.vector(t(numts_coord$coord_mt))</pre>
attributes_mt = c("chromosome_name", "start_position", "end_position", "strand",
                  "hgnc_symbol", "ensembl_gene_id", "transcript_count", "gene_biotype")
gene_results_mt <- numeric(0)</pre>
i <- 1
for (i in 1:length(numts_vector_mt)) {
  b<-i
  gene_results_b = getBM(attributes_mt,
                         filters = c("chromosomal_region"),
```

```
values = list(chromosomal_region=numts_vector_mt[b]),
                         mart = gene_mart)
  if (length(gene_results_b[,1]) == 0) {
    gene_results_mt <- rbind(gene_results_mt, c(rep("", length(attributes_mt)),</pre>
                                                do.call(paste, list(numts_coord[b,1]))))
    gene_results_b$id <- do.call(paste, list(numts_coord[b,1]))</pre>
    gene_results_mt <- rbind(gene_results_mt, gene_results_b)</pre>
  i <- i + 1
}
str(gene_results_mt)
class(gene_results_mt) # data.frame
gene_results_mt[gene_results_mt==""] <- NA</pre>
## Reordering columns ----
gene_mt <- gene_results_mt %>% dplyr::select("id", "hgnc_symbol", everything())
## Sorting results ----
gene_results_mt <- gene_mt[order(gene_results_mt$id,</pre>
                                 gene_results_mt$start_position),]
head(gene_results_mt)
ncol(gene_results_mt) # columns: 9
nrow(gene_results_mt) # rows: 3954
length(unique(gene_results_mt$hgnc_symbol)) # num. mito genes: 38
## Saving the results (gene_results_mt.txt) ----
write.table(gene_results_mt, file = "gene_results_mt.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
# IDENTIFICATION OF CORRESPONDING MITOCHONDRIAL GENE FOR EACH NEW
# NUCLEAR GENE WITHIN NUMTs
## Ordering
table_mito_genes <- full_join(numts_coord[c("id", "mt",
                                            "start_mt", "end_mt")],
                              gene_results_mt)
table mito <- table mito genes %>% dplyr::select("id", "mt", "start mt", "end mt",
                                                 "hgnc symbol", "ensembl gene id",
                                                 "transcript_count", "gene_biotype",
                                                 everything())
# CONDITION:
## if gene is strand is +1:
### START: (gene start - NUMT start) and END: (gene end - NUMT start)
## if gene is strand -1:
###START: (NUMT end - gene end) and END: (NUMT end - gene start)
str(table_mito)
table_mito$start_mt <- as.numeric(table_mito$start_mt)</pre>
```

```
table_mito\start_position <- as.numeric(table_mito\start_position)
table_mito$end_mt <- as.numeric(table_mito$end_mt)</pre>
table_mito$end_position <- as.numeric(table_mito$end_position)</pre>
table_mito$start_ref = NULL
table_mito$end_ref = NULL
for (i in 1:nrow(table_mito)) {
  if (!is.na(table_mito$strand[i])) {
    if (table_mito$strand[1] == 1) {
      table_mito\start_ref[i] <- table_mito\start_position[i] - table_mito\start_mt[i]
      table_mito$end_ref[i] <- table_mito$end_position[i] - table_mito$start_mt[i]</pre>
      } else {
        table_mito\start_ref[i] <- table_mito\send_mt[i] - table_mito\send_position[i]
        table mito send ref[i] <- table mito end mt[i] - table mito start position[i]
        }
    i <- i + 1
  } else {
    table_mito\start_ref[i] <- NA
    table_mito$end_ref[i] <- NA
}
table_mito$start_ref <- as.numeric(table_mito$start_ref)</pre>
table_mito$end_ref <- as.numeric(table_mito$end_ref)</pre>
str(table_mito)
head(table_mito)
table_mito$from_numt <- NULL</pre>
table_mito$from_numt <- substr(table_mito$id, 6,11)</pre>
table_mito$from_numt <- gsub("\\.", "", table_mito$from_numt)</pre>
table_mito$from_numt <- gsub("\\X", "23", table_mito$from_numt)</pre>
table_mito\from_numt <- gsub("\\Y", "24", table_mito\from_numt)
table_mito$from_numt <- as.numeric(table_mito$from_numt)</pre>
# In reference interval, replace negative numbers by 0
table mito$start ref[table mito$start ref<0] <- 0
table_mito$end_ref[table_mito$end_ref<0] <- 0</pre>
max(table_mito$start_ref,na.rm=T)
max(table_mito$end_ref,na.rm=T)
# Creating a exclusive numerical code ("comparable coordinates")
# Exclusive for each NUMT to compare mitocondrial and nuclar genes
# included in same NUMT
table_mito\from_numt <- table_mito\from_numt * 100000
table mito$start mtnumt <- table mito$start ref + table mito$from numt
table_mito\send_mtnumt <- table_mito\send_ref + table_mito\send_numt
mt_genes_coord <- data.frame("mt_hgnc_symbol" = table_mito$hgnc_symbol,</pre>
                              "mt_start_numt" = table_mito$start_mtnumt,
                              "mt_end_numt" = table_mito$end_mtnumt)
head(table_mito)
ncol(table_mito)
nrow(table_mito)
# Same process with nuclear genes -----
table_numts <- read.table("FINAL_OUTPUT_TABLE.txt", header = TRUE, sep = "\t")
```

```
length(duplicated(table_numts)[duplicated(table_numts)==TRUE])
head(table_numts)
str(table_numts)
# Removing duplicated rows
table_numts <- table_numts[!duplicated(table_numts), ]</pre>
table numts$start n <- as.numeric(table numts$start n)</pre>
table_numts$start_position <- as.numeric(table_numts$start_position)</pre>
table_numts$end_n <- as.numeric(table_numts$end_n)</pre>
table_numts$end_position <- as.numeric(table_numts$end_position)</pre>
table_numts$start_ref = NULL
table_numts$end_ref = NULL
for (i in 1:nrow(table_numts)) {
  if (!is.na(table_numts$strand[i])) {
    if (table_numts$strand[1] == 1) {
      table_numts$start_ref[i] <- table_numts$start_position[i] - table_numts$start_n[i]
      table_numts$end_ref[i] <- table_numts$end_position[i] - table_numts$start_n[i]
    } else {
      table_numts$start_ref[i] <- table_numts$end_n[i] - table_numts$end_position[i]
      table_numts$end_ref[i] <- table_numts$end_n[i] - table_numts$start_position[i]
    i <- i + 1
 } else {
    table_numts$start_ref[i] <- NA
    table_numts$end_ref[i] <- NA
 }
}
table_numts$start_ref <- as.numeric(table_numts$start_ref)</pre>
table_numts$end_ref <- as.numeric(table_numts$end_ref)</pre>
str(table_numts)
head(table_numts)
table_numts$from_numt <- NULL</pre>
table_numts\from_numt <- substr(table_numts\from_6,11)
table_numts$from_numt <- gsub("\\.", "", table_numts$from_numt)</pre>
table_numts\from_numt <- gsub("\\X", "23", table_numts\from_numt)
table_numts\from_numt <- gsub("\\Y", "24", table_numts\from_numt)
table_numts$from_numt <- as.numeric(table_numts$from_numt)</pre>
# In reference interval, replace negative numbers by 0
table numts$start ref[table numts$start ref<0] <- 0
table_numts$end_ref[table_numts$end_ref<0] <- 0</pre>
max(table_numts$start_ref,na.rm=T)
max(table_numts$end_ref,na.rm=T)
table_numts\from_numt <- table_numts\from_numt * 100000
table_numts$start_numt <- table_numts$start_ref + table_numts$from_numt
table_numts$end_numt <- table_numts$end_ref + table_numts$from_numt</pre>
n_genes_coord <- data.frame("n_hgnc_symbol" = table_numts$hgnc_symbol,</pre>
                              "n_start_numt" = table_numts$start_numt,
                              "n_end_numt" = table_numts$end_numt)
head((mt_genes_coord))
head((n_genes_coord))
```

```
c(n_genes_coord[1,2], n_genes_coord[1,3]) %overlaps%
  c(mt_genes_coord[1,2], mt_genes_coord[1,3])
c(n_genes_coord[1,2], n_genes_coord[1,3]) %overlaps%
  c(mt_genes_coord[1,2], mt_genes_coord[1,3])
# Searching for overlaping
i <- 1
b <- 1
overlaping <- NULL
for (i in 1:nrow(n_genes_coord)) for (b in 1:nrow(mt_genes_coord))
  if (!is.na(n_genes_coord$n_start_numt[i] & n_genes_coord$n_end_numt[i] &
             mt_genes_coord$mt_start_numt[b] & mt_genes_coord$mt_end_numt[b])){
    if (c(n genes coord$n start numt[i], n genes coord$n end numt[i]) %overlaps%
        c(mt_genes_coord$mt_start_numt[b],
          mt_genes_coord$mt_end_numt[b]))
      overlaping_b <- data.frame("n_hgnc_symbol" = n_genes_coord$n_hgnc_symbol[i],
                                  "mt_hgnc_symbol" = mt_genes_coord$mt_hgnc_symbol[b],
                                  "n_start_numt" = n_genes_coord$n_start_numt[i],
                                  "n_end_numt" = n_genes_coord$n_end_numt[i],
                                  "mt_start_numt" = mt_genes_coord$mt_start_numt[b],
                                  "mt_end_numt" = mt_genes_coord$mt_end_numt[b])
      overlaping <- rbind(overlaping, overlaping_b)</pre>
    }
  }
overlaping <- overlaping[!duplicated(overlaping), ]</pre>
head(overlaping)
overlaping$n_lenght <- overlaping$n_end_numt - overlaping$n_start_numt</pre>
overlaping$mt lenght <- overlaping$mt end numt - overlaping$mt start numt
for (i in 1:nrow(overlaping)) {
overlaping$ov[i] <- (min(c(overlaping$n_end_numt[i],</pre>
                          overlaping$mt_end_numt[i]))
                     - max(c(overlaping$n_start_numt[i],
                              overlaping$mt_start_numt[i])))
}
overlaping$percent_n <- overlaping$ov/overlaping$n_lenght</pre>
overlaping$percent_mt <- overlaping$ov/overlaping$mt_lenght
head(overlaping)
# To focuss on nuclear genes that are mainly originated from mitochondrial genes
# we filter the output for at least, 70% of representation of mitochondrial gene
# or 70% of nuclear gene originated from a mitochondrial gene
total_overlaping <- overlaping</pre>
# CREATING TABLE total
write.table(total_overlaping, file = "total_overlaping.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
overlaping <- subset(overlaping, percent_n >= 0.7 |
```

```
percent_mt >= 0.7 )
# ORDERING DATA ----
head(table_mito)
mito \leftarrow table_mito[c(1,2,3,4,5,6,8,10,11,12,13,14,16,17)]
head(mito)
colnames(mito)[5] <- "mt_hgnc_symbol"</pre>
colnames(mito)[6] <- "mt_ensembl_gene_id"</pre>
colnames(mito)[7] <- "mt_gene_biotype"</pre>
colnames(mito)[8] <- "mt_start_position"</pre>
colnames(mito)[9] <- "mt_end_position"</pre>
colnames(mito)[10] <- "mt strand"</pre>
colnames(mito)[11] <- "mt start ref"</pre>
colnames(mito)[12] <- "mt_end_ref"</pre>
colnames(mito)[13] <- "mt_start_numt"</pre>
colnames(mito)[14] <- "mt_end_numt"</pre>
head(mito)
head(overlaping)
nrow(mito)
nrow(overlaping)
table_overlap <- dplyr::inner_join(mito, overlaping)
head(table numts)
head(data)
data <- table_numts[c(1:13,72:76,78,79,14:70)]
head(data)
colnames(data)[9] <- "n_hgnc_symbol"</pre>
colnames(data)[11] <- "n_gene_biotype"</pre>
colnames(data)[12] <- "GO_term"</pre>
colnames(data)[14] <- "n_start_position"</pre>
colnames(data)[15] <- "n_end_position"</pre>
colnames(data)[16] <- "n_strand"</pre>
colnames(data)[17] <- "n_start_ref"</pre>
colnames(data)[18] <- "n_end_ref"</pre>
colnames(data)[19] <- "n_start_numt"</pre>
colnames(data)[20] <- "n_end_numt"</pre>
data <- data[!duplicated(data), ]</pre>
nrow(data)
all_data <- dplyr::full_join(data, table_overlap)</pre>
all_data <- all_data[!duplicated(all_data), ]</pre>
nrow(all_data)
# Ordering
all_data$n_start_numt <- NULL</pre>
all_data$n_end_numt <- NULL
all_data$mt_start_numt <- NULL</pre>
```

```
all_data$mt_end_numt <- NULL</pre>
all_data$NUMT_size <- all_data$end_n - all_data$start_n</pre>
all_data <- all_data %>% dplyr::select("id", "localization",
                                       "chr", "start_n", "end_n",
                                       "NUMT_size",
                                       "mt", "start_mt", "end_mt",
                                       "Description", "n_gene_biotype",
                                       "mt_hgnc_symbol", "mt_gene_biotype",
                                       "ensembl_gene_id_version",
                                       "n strand",
                                       "n_start_position", "n_end_position",
                                       "mt_ensembl_gene_id",
                                       "mt strand",
                                       "mt_start_position", "mt_end_position",
                                       "n_start_ref", "n_end_ref",
                                       "mt_start_ref", "mt_end_ref",
                                       "n_lenght", "mt_lenght",
                                       "ov", "percent_n", "percent_mt",
                                       "n_hgnc_symbol",
                                       everything())
# # # # # # CREATING DEFINITIVE TABLE "all_data_70.txt" # # # # # # #
write.table(all_data, file = "all_data_70.txt", sep = "\t",
            quote = FALSE, row.names = FALSE)
# # # # # # MITOCHONDRIAL GENES EXPRESSION # # # # # # #
# Saving complete list of mitochondrial genes ( "mito_genes.txt")
gene_results_mt$ensembl_gene_id
mito_genes <- as.character(na.omit(unique(gene_results_mt$ensembl_gene_id)))</pre>
length(mito_genes)
write.table(mito_genes, file="mito_genes.txt",col.names = F,
            sep="\t",quote=F,row.names=F)
# Generating expression data "mean_tpm_GTExMITO.txt"
genes <- read.table("mito_genes.txt", header = FALSE, sep = "\t")</pre>
GTEx_mean_tpm <-</pre>
 read.table("GTEx Analysis 2016-01-15 v7 RNASeQCv1.1.8 gene median tpm.gct",
             skip = 2, header = TRUE, sep = "\t")
library(plyr); library(dplyr)
GTEx_tpm <- GTEx_mean_tpm</pre>
colnames(GTEx_tpm)[1] <- "GTEx_gene_id_version"</pre>
gene_id <- GTEx_mean_tpm$gene_id</pre>
GTEx_genes <- numeric(0)</pre>
for (i in 1:length(GTEx_mean_tpm$gene_id)){
    x <- unlist(strsplit(as.character(GTEx_mean_tpm[i,1]), split='.', fixed=TRUE))[1]
   GTEx_genes <- rbind(GTEx_genes, x)</pre>
```

```
}
GTEx_mean_tpm$gene_id <- GTEx_genes</pre>
mean_tpm_fromGTEx <- numeric(0)</pre>
for (i in 1:nrow(genes)){
    y <- subset(GTEx_mean_tpm, gene_id == genes[i,1])
    mean_tpm_fromGTEx <- rbind(mean_tpm_fromGTEx, y)</pre>
}
tissue_means <- rowMeans(mean_tpm_fromGTEx[,3:length(mean_tpm_fromGTEx)])</pre>
mean_tpm_fromGTEx$tissue_means <- tissue_means</pre>
mean_tpm_fromGTEx$sum <- rowSums(mean_tpm_fromGTEx[,3:length(mean_tpm_fromGTEx)])</pre>
mean_tpm_fromGTEx$gene_id <- as.character(mean_tpm_fromGTEx$gene_id)</pre>
mean_tpm_GTExMITO <- inner_join(mean_tpm_fromGTEx,</pre>
                                  GTEx_tpm)
mean_tpm_GTExMITO <- mean_tpm_GTExMITO %>%
  select("gene_id", "GTEx_gene_id_version", everything())
colnames(mean_tpm_GTExMITO)[1] <- "ensembl_gene_id"</pre>
str(mean_tpm_GTExMITO)
# Saving results
write.table(mean_tpm_GTExMITO, file = "mean_tpm_GTExMITO.txt",
             sep = "\t", quote = FALSE, row.names = FALSE)
mean_tpm_GTExMITO <- read.table("mean_tpm_GTExMITO.txt", header = TRUE,</pre>
                                   sep = "\t", dec = ".")
nrow(genes)
ncol(genes)
nrow(mean_tpm_GTExMITO)
ncol(mean_tpm_GTExMITO)
head(mean_tpm_GTExMITO[c(1,2,3)])
GTEx <- mean_tpm_GTExMITO</pre>
subset_expressed <- GTEx</pre>
# fiq.cap= "Heat map of all expressed genes."
library(gplots)
par(oma=c(10,4,4,2))
subset_mean_tpm <- subset_expressed</pre>
subset_mean_tpm[1] <- NULL</pre>
rownames(subset_mean_tpm) <- subset_mean_tpm$Description</pre>
subset_mean_tpm[1] <- NULL</pre>
subset_mean_tpm[1] <- NULL</pre>
heatmap.2(data.matrix(subset_mean_tpm[1:53]), trace='none', scale = "row",
           cexRow=0.6, cexCol = 0.6)
# fiq.cap= "Heat map of all expressed genes."
library(gplots)
```

```
par(oma=c(10,4,4,2))
subset_mean_tpm <- subset_expressed</pre>
subset_mean_tpm[1] <- NULL</pre>
rownames(subset_mean_tpm) <- subset_mean_tpm$Description</pre>
subset_mean_tpm[1] <- NULL</pre>
subset_mean_tpm[1] <- NULL</pre>
heatmap.2(data.matrix(subset_mean_tpm[1:53]),
         trace='none', scale = "column",
         cexRow=0.6, cexCol = 0.6)
# # # # # # # # # # # # # sessionInf() # # # # # # # # # # # # # #
devtools::session info()
## setting value
## version R version 3.4.4 (2018-03-15)
## system
            x86_64, linux-gnu
## ui
            X11
##
   language en_US
##
   collate en_US.UTF-8
## tz
            Europe/Madrid
##
   date
            2018-06-05
##
## package
                 * version date
                                      source
                           2018-04-19 Bioconductor
## AnnotationDbi 1.40.0
##
   assertthat
                  0.2.0
                           2017-04-11 CRAN (R 3.4.4)
##
   backports
                  1.1.2
                           2017-12-13 CRAN (R 3.4.4)
## base
                * 3.4.4 2018-03-16 local
## bindr
                  0.1.1
                           2018-03-13 CRAN (R 3.4.4)
                  0.2.2 2018-03-29 CRAN (R 3.4.4)
## bindrcpp
## Biobase
                 2.38.0 2018-04-25 Bioconductor
## BiocGenerics 0.24.0 2018-04-19 Bioconductor
## BiocInstaller * 1.28.0 2018-04-19 Bioconductor
              * 2.34.2 2018-05-20 Bioconductor
## biomaRt
## bit
                  1.1-13 2018-05-15 CRAN (R 3.4.4)
## bit64
                 0.9-7
                           2017-05-08 CRAN (R 3.4.4)
## bitops
                 1.0-6
                           2013-08-17 CRAN (R 3.4.4)
## blob
                 1.1.1
                           2018-03-25 CRAN (R 3.4.4)
                           2014-09-10 CRAN (R 3.4.4)
## caTools
                 1.17.1
                 3.4.4
## compiler
                           2018-03-16 local
## datasets
                 * 3.4.4
                           2018-03-16 local
## DBI
                  1.0.0
                           2018-05-02 CRAN (R 3.4.4)
                 1.13.5 2018-02-18 CRAN (R 3.4.4)
## devtools
## digest
                  0.6.15 2018-01-28 CRAN (R 3.4.4)
                           2018-05-19 CRAN (R 3.4.4)
## dplyr
                * 0.7.5
## evaluate
                 0.10.1
                           2017-06-24 CRAN (R 3.4.4)
## gdata
                 2.18.0 2017-06-06 CRAN (R 3.4.4)
## glue
                  1.2.0
                           2017-10-29 CRAN (R 3.4.4)
                 * 3.0.1
                           2016-03-30 CRAN (R 3.4.4)
##
   gplots
##
                * 3.4.4
                           2018-03-16 local
   graphics
##
                 * 3.4.4
                           2018-03-16 local
   grDevices
## gtools
                           2015-05-29 CRAN (R 3.4.4)
                  3.5.0
## htmltools
                 0.3.6
                           2017-04-28 CRAN (R 3.4.4)
## httr
                  1.3.1
                           2017-08-20 CRAN (R 3.4.4)
                 2.12.0
                           2018-04-19 Bioconductor
## IRanges
                2.23-15 2015-06-29 CRAN (R 3.4.0)
## KernSmooth
## knitr
                           2018-02-20 CRAN (R 3.4.4)
                  1.20
```

```
## magrittr 1.5
## memoise 1.1.0
                               2014-11-22 CRAN (R 3.4.4)
                    1.1.0
## memoise
                               2017-04-21 CRAN (R 3.4.4)
## methods
                               2018-03-16 local
                  * 3.4.4
## parallel
                   3.4.4 2018-03-16 local
## pillar
                   1.2.2 2018-04-26 CRAN (R 3.4.4)
                   2.0.1
                              2017-03-21 CRAN (R 3.4.4)
## pkgconfig
## plyr
                   * 1.8.4 2016-06-08 CRAN (R 3.4.4)
## prettyunits 1.0.2
## progress 1.1.2
                            2015-07-13 CRAN (R 3.4.4)
                              2016-12-14 CRAN (R 3.4.4)
                   0.2.4
## purrr
                               2017-10-18 CRAN (R 3.4.4)
## R6
                   2.2.2
                              2017-06-17 CRAN (R 3.4.4)
                   0.12.17 2018-05-18 CRAN (R 3.4.4)
## Rcpp
## RCurl
                   1.95-4.7 2015-06-30 CRAN (R 3.2.2)
                   0.2.0 2018-02-20 CRAN (R 3.4.4)
## rlang
               1.9 2018-03-01 CRAN (R 3.4.4)

1.3-2 2018-01-03 CRAN (R 3.4.4)

2.1.1 2018-05-06 CRAN (R 3.4.4)

0.16.0 2018-04-19 Bioconductor
## rmarkdown
## rprojroot
## RSQLite
## S4Vectors
                  * 3.4.4 2018-03-16 local
## stats
## stats4
                   3.4.4
                              2018-03-16 local
                              2018-05-02 CRAN (R 3.4.4)
## stringi
                   1.2.2
## stringr 1.3.1 2018-05-10 CRAN (R 3.4.4) ## tibble 1.4.2 2018-01-22 CRAN (R 3.4.4) ## tidyselect 0.2.4 2018-02-26 CRAN (R 3.4.4) ## tools 3.4.4 2018-03-16 1003
## tools
                   3.4.4
                              2018-03-16 local
## utils
                              2018-03-16 local
                  * 3.4.4
                  2.1.2 2018-03-15 CRAN (R 3.4.4)
## withr
## XML
                   3.98-1.3 2015-06-30 CRAN (R 3.2.1)
## yaml
                   2.1.19 2018-05-01 CRAN (R 3.4.4)
```