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Abstract

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1 Introduction

2 Using TFBSfindR: A quick overview

Here TFBSfindR is run in its most simplified way. Analysing the example variant dataset provided with TFBSfindR.

```
library(TFBSfindR)
data <- system.file("extdata", "variant.dataset.fasta", package = "TFBSfindR")
data <- read.input.file(input = data, ref.genome = BSgenome.Hsapiens.UCSC.hg19)
data <- TFBS.findR(data, motiflist = MotifDb)</pre>
```

3 In depth overview

3.1 Step 1 | Object initialization

Here we look more into detail in TFBSfindR and it's customizable functions. First we select the example variant dataset provided with TFBSfindR.

```
library(TFBSfindR)
data <- system.file("extdata", "variant.dataset.fasta", package = "TFBSfindR")</pre>
```

Next, we select the reference genome, we want to compare the variant data to.

```
library(BSgenome.Hsapiens.UCSC.hg19)
ref.genome <- BSgenome.Hsapiens.UCSC.hg19</pre>
```

Finally, we give our sample a name, which can be anything, and read the input file and output a GRangesobject. ATAC.only can be used to filter variants in FASTA of there presence in ATAC peaks. In order to do these filter steps, ATAC.only needs to be a string with the location of a BED file, which consists of variants present in ATAC data. For now, we set ATAC.only to FALSE as it is set as default. read.input.file outputs a GRangesobject with sample.name, rs number, allel, reference and alternative nucleotide and their sequences including 20 nucleotides before and after the variant.

```
sample.name <- "example.dataset"</pre>
data <- read.input.file(input = data, ref.genome = ref.genome,</pre>
   sample.name = sample.name, ATAC.only = FALSE)
head(data)
## GRanges object with 6 ranges and 7 metadata columns:
##
                seqnames
                                      ranges strand |
                                                               Sample
##
                  <Rle>
                                   <IRanges> <Rle> |
                                                          <character>
     rs60216355 chr1 [11046517, 11046558]
##
                                                 + | example.dataset
##
    rs58092391 chr1 [11046539, 11046580]
                                                  + | example.dataset
##
    rs113663169
                   chr1 [11046544, 11046585]
                                                  + | example.dataset
    rs112732333 chr1 [11046576, 11046617]
                                                  + | example.dataset
##
    rs72868197 chr1 [11046634, 11046675]
                                                  + | example.dataset
     rs60216355 chr1 [11046517, 11046558]
##
                                                  - | example.dataset
```

```
Allel
                                                     REF
##
                         SNP
                                                                     ALT
##
                 <character> <character> <DNAStringSet> <DNAStringSet>
##
      rs60216355 rs60216355
                                     * | *
                                                                       C
                                                       Т
##
      rs58092391 rs58092391
                                      * | *
                                                       Α
                                                                       G
     rs113663169 rs113663169
                                                       Т
                                                                       C
##
                                     * | *
##
     rs112732333 rs112732333
                                                       G
                                                                       Α
                                     * | *
##
     rs72868197 rs72868197
                                                       Т
                                                                       Α
                                     * | *
##
      rs60216355 rs60216355
                                     * | *
                                                       Τ
                                                                       C
##
                            REF.sequence
                                                     ALT.sequence
##
                          <DNAStringSet>
                                                   <DNAStringSet>
##
     rs60216355 CGTGTTAGCC...CCTCGTGATC CGTGTTAGCC...CCTCGTGATC
     rs58092391 ATCTCCTGAC...CCTCCCAAAG ATCTCCTGAC...CCTCCCAAAG
     rs113663169 CTGACCTCGT...CAAAGTGCTG CTGACCTCGT...CAAAGTGCTG
##
     rs112732333 AAAGTGCTGG...CGCCCGGTCA AAAGTGCTGG...CGCCCGGTCA
##
##
     rs72868197 ATAGTTGGAA...AGCCCCAGCA ATAGTTGGAA...AGCCCCAGCA
     rs60216355 GCACAATCGG...GGAGCACTAG GCACAATCGG...GGAGCACTAG
##
     seqinfo: 93 sequences (1 circular) from hg19 genome
```

3.2 Step 2| Motif selection

In order to analyse the variant dataset we have to select motifs to compare our dataset to. A usefull library is MotifDb, which consists of several motif databases. Here we have selected only human motifs provided by the JASPARCORE database. This database consists of 66 well known Transcription factor motifs.

```
library(MotifDb)
JASPARCORE <- query(MotifDb, "JASPAR_CORE")</pre>
JASPARCORE <- query(JASPARCORE, "hsapiens")</pre>
JASPARCORE
## MotifDb object of length 66
## | Created from downloaded public sources: 2013-Aug-30
## | 66 position frequency matrices from 1 source:
## |
            JASPAR_CORE:
## | 1 organism/s
## |
               Hsapiens:
                           66
## Hsapiens-JASPAR_CORE-TFAP2A-MA0003.1
## Hsapiens-JASPAR_CORE-NR2F1-MA0017.1
## Hsapiens-JASPAR_CORE-E2F1-MA0024.1
## Hsapiens-JASPAR_CORE-NFIL3-MA0025.1
## Hsapiens-JASPAR_CORE-ELK1-MA0028.1
## ...
## Hsapiens-JASPAR_CORE-SPI1-MA0080.2
## Hsapiens-JASPAR_CORE-AP1-MA0099.2
## Hsapiens-JASPAR_CORE-SP1-MA0079.2
## Hsapiens-JASPAR_CORE-ESR2-MA0258.1
## Hsapiens-JASPAR_CORE-HIF1A::ARNT-MA0259.1
```

Additionally in our library we provide the hocomoco core position count matrix in text format. This is an example, on how to provide your own motif database (currently only possible in .txt).

```
motifs <- system.file("extdata", "hocomoco.core.txt", package = "TFBSfindR")</pre>
motifs <- read.motif.database(motifs)</pre>
motifs
## List of length 401
## names(401): >AHR_HUMAN.H11M0.0.B ... >ZSC31_HUMAN.H11M0.0.C
```

3.3 Step 3 | Motif analysis

In Step 3, the motifs from JASPARCORE are compared to our variants provided earlier.

```
data <- TFBS.findR(data, motiflist = JASPARCORE, motif.type = "PPM",</pre>
    pseudocount = "log.of.reads", prior = 0.1, BPPARAM = bpparam)
```

Data analysis 4

```
some plots ...
```

```
snp <- data[data$SNP %in% "rs113663169"]</pre>
snp.plot(snp, method = "both", motif = "TFAP2A", strand = "+")
            а
                                                                 b 5-
                                                                Delta.PWM.score
                                                        colour
                -15·
                                                                      0
                                                                                   10
                                                                                                               30
                                                                                                 20
                               motif index
                                                                                        motif index
                                                                 d
            С
                                                                 Delta. Kuma. score
               0.15
             Kuma.score
                                                        colour
               0.05
               0.00 -
                                                                    0.00
                                                                                     10
                                       20
                                                                                                  20
                               motif index
                                                                                          motif index
```

update to data.frame

```
data <- data.update(data)</pre>
head(data)
     segnames
                   start
                               end width strand
                                                            Sample
                                                                             SNP Allel
```

```
chr1 11046563 11046571
                                     + example.dataset rs113663169
                               7
                                     - example.dataset rs72868197
## 2
        chr1 11046654 11046660
                                                                  * | *
        chr1 11046594 11046598
                               5
                                    + example.dataset rs112732333
                                                                 * | *
                              7
        chr1 11046590 11046596
                                    + example.dataset rs112732333
                                                                 * | *
## 5
        chr1 11046536 11046541
                              6
                                    + example.dataset rs60216355
                                                                 * | *
        chr1 11046593 11046598
## 6
                               6
                                     + example.dataset rs112732333 *|*
##
    REF ALT Snp.loc Sequence MotifDB provider Motif Ref.score Alt.score
               2 GTCTCAGCC JASPAR_CORE MA0003.1 TFAP2A -0.333
## 1
     Т
        C
## 2
    T A
               1 AACCGGT JASPAR_CORE MA0099.2 AP1 -0.102
                                                                3.098
## 3
     G
         Α
                3 GCGTG JASPAR_CORE MA0036.1 GATA2 -1.096
                                                                2.185
## 4 G A
                7 ACAGGCG JASPAR_CORE MA0081.1 SPIB -0.998
                                                                2.900
## 5
    T C
               2 TTGATC JASPAR_CORE MA0095.1 YY1 -0.193
                                                                2.088
## 6 G A
               4 GGCGTG JASPAR_CORE MA0095.1 YY1 -1.195
                                                                2.024
    Delta.score Kuma.ref.score Kuma.alt.score Kuma.delta.score
## 1
         4.961
                          0
                                  0.186
                                                  4.293
## 2
         3.200
                          0
                                    0.164
                                                   4.124
         3.281
## 3
                                                   4.109
                          0
                                    0.163
## 4
         3.898
                          0
                                    0.155
                                                   4.049
## 5
         2.280
                          0
                                    0.134
                                                   3.847
## 6
         3.219
                                    0.130
                                                   3.811
```

4.1 Extra p-value calculations

Pvalue calculations can be done as follows

```
data <- p.value.calculation(data, motiflist = JASPARCORE, background = c(A = 0.25, A)
   C = 0.25, G = 0.25, T = 0.25), motif.type = "PPM", pseudocount = "log.of.reads")
head(data)
## segnames
               start
                         end width strand
                                                Sample
                                                              SNP Allel
## 1
       chr1 11046563 11046571 9 + example.dataset rs113663169 *|*
       chrl 11046654 11046660
                                     - example.dataset rs72868197
                                                                   * | *
        chr1 11046594 11046598 5
                                    + example.dataset rs112732333 *|*
## 3
        chr1 11046590 11046596 7
## 4
                                      + example.dataset rs112732333
                              6 + example.dataset rs60216355
## 5
        chr1 11046536 11046541
    REF ALT Snp.loc Sequence MotifDB provider Motif Ref.score Alt.score
## 1
     T C
                2 GTCTCAGCC JASPAR_CORE MA0003.1 TFAP2A -0.333
                                                                 4.628
                1 AACCGGT JASPAR_CORE MA0099.2 AP1
## 2
      Τ
         Α
                                                       -0.102
                                                                 3.098
## 3 G A
               3 GCGTG JASPAR_CORE MA0036.1 GATA2 -1.096
                                                                 2.185
## 4 G A
               7 ACAGGCG JASPAR_CORE MA0081.1 SPIB -0.998
                                                                 2.900
## 5 T C
               2 TTGATC JASPAR_CORE MA0095.1 YY1
                                                       -0.193
                                                                 2.088
    Delta.score Kuma.ref.score Kuma.alt.score Kuma.delta.score pvalue.REF
## 1
         4.961
                         0
                               0.186
                                                  4.293 0.03458023
## 2
         3.200
                          0
                                    0.164
                                                   4.124 0.06378174
                                                   4.109 0.15429688
## 3
         3.281
                          0
                                    0.163
## 4
                          0
                                    0.155
                                                   4.049 0.06262207
         3.898
         2.280
                         0
                                    0.134
                                                  3.847 0.05737305
     pvalue.ALT
## 1 0.002155304
## 2 0.006958008
```

```
## 3 0.018554688
## 4 0.006774902
## 5 0.012939453
```

5 SessionInfo

```
sessionInfo()
## R version 3.4.4 (2018-03-15)
## Platform: x86_64-pc-linux-gnu (64-bit)
## Running under: Ubuntu 16.04.6 LTS
## Matrix products: default
## BLAS: /usr/lib/openblas-base/libblas.so.3
## LAPACK: /usr/lib/libopenblasp-r0.2.18.so
##
## locale:
## [1] LC_CTYPE=en_US.UTF-8
                                 LC_NUMERIC=C
## [3] LC_TIME=en_US.UTF-8
                                 LC_COLLATE=en_US.UTF-8
## [5] LC_MONETARY=en_US.UTF-8
                                 LC_MESSAGES=en_US.UTF-8
## [7] LC_PAPER=en_US.UTF-8
                               LC_NAME=C
## [9] LC_ADDRESS=C
                                 LC_TELEPHONE=C
## [11] LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C
## attached base packages:
                parallel stats graphics grDevices utils
## [1] stats4
                                                                 datasets
## [8] methods
                base
## other attached packages:
                                         BSgenome.Hsapiens.UCSC.hg19_1.4.0
## [1] MotifDb_1.20.0
## [3] BSgenome_1.46.0
                                         rtracklayer_1.38.3
## [5] Biostrings_2.46.0
                                        XVector_0.18.0
## [7] GenomicRanges_1.30.3
                                        GenomeInfoDb_1.14.0
## [9] IRanges_2.12.0
                                        S4Vectors_0.16.0
## [11] BiocGenerics_0.24.0
                                        TFBSfindR_0.1.0
## [13] BiocParallel_1.12.0
                                        knitr_1.22
## [15] BiocStyle_2.6.1
## loaded via a namespace (and not attached):
## [1] Biobase_2.38.0
                                httr_1.4.0
## [3] RMySQL_0.10.16
                                 bit64_0.9-7
## [5] assertthat_0.2.1
                                 blob_1.1.1
## [7] GenomeInfoDbData_1.0.0
                                 Rsamtools_1.30.0
## [9] yaml_2.2.0
                                  progress_1.2.0
## [11] pillar_1.3.1
                                 RSQLite_2.1.1
## [13] lattice_0.20-38
                                  glue_1.3.1
## [15] digest_0.6.18
                                  colorspace_1.4-1
## [17] cowplot_0.9.4
                                 htmltools_0.3.6
## [19] Matrix_1.2-15
                                 plyr_1.8.4
```

```
## [21] XML_3.98-1.17
                                  pkgconfig_2.0.2
## [23] biomaRt_2.34.2
                                  bookdown_0.9
## [25] zlibbioc_1.24.0
                                  purrr_0.3.2
## [27] scales_1.0.0
                                 tibble_2.1.1
## [29] ggplot2_3.1.1
                                 SummarizedExperiment_1.8.1
## [31] GenomicFeatures_1.30.3
                                 TFMPvalue_0.0.8
## [33] lazyeval_0.2.2
                                 splitstackshape_1.4.6
## [35] magrittr_1.5
                                 crayon_1.3.4
## [37] memoise_1.1.0
                                 evaluate_0.13
## [39] data.table_1.12.0
                                 tools_3.4.4
## [41] prettyunits_1.0.2
                                 hms_{-}0.4.2
## [43] formatR_1.5
                                 matrixStats_0.54.0
## [45] stringr_1.4.0
                                 munsell_0.5.0
## [47] DelayedArray_0.4.1
                                 AnnotationDbi_1.40.0
## [49] compiler_3.4.4
                                 rlang_0.3.4
## [51] grid_3.4.4
                                 RCurl_1.95-4.11
## [53] VariantAnnotation_1.24.5
                                 labeling_0.3
## [55] bitops_1.0-6
                                  rmarkdown_1.11
## [57] gtable_0.3.0
                                  codetools_0.2-16
## [59] DBI_1.0.0
                                 R6_2.4.0
## [61] GenomicAlignments_1.14.2 dplyr_0.8.0.1
## [63] bit_1.1-14
                                  stringi_1.4.3
## [65] Rcpp_1.0.1
                                  tidyselect_0.2.5
## [67] xfun_0.6
```