main

July 10, 2021

1 Visualize results, local splicing

1.1 Load Libraries

```
[1]: library(tidyverse)
    library(ggplot2)
    library(DT)
    library(leafcutter)
    library(reshape2)
    library(gridExtra)
    library(intervals) # needed for pretty strand arrow placement
    library(foreach)
    library(grid)
    library(gtable)
    library(ggrepel)
```

tidyverse

```
1.3.1

ggplot2 3.3.5 purrr 0.3.4
tibble 3.1.2 dplyr 1.0.7
tidyr 1.1.3 stringr 1.4.0
```

Conflicts

readr

tidyverse_conflicts()

1.4.0

Attaching packages

```
dplyr::filter() masks stats::filter()
dplyr::lag() masks stats::lag()
```

Loading required package: Rcpp

Attaching package: 'reshape2'

The following object is masked from 'package:tidyr':

forcats 0.5.1

smiths

```
The following object is masked from 'package:dplyr':
        combine
    Attaching package: 'intervals'
    The following object is masked from 'package:purrr':
        reduce
    The following object is masked from 'package:tidyr':
        expand
    Attaching package: 'foreach'
    The following objects are masked from 'package:purrr':
        accumulate, when
    1.2 Summary of results
[2]: lname = load('../../_m/leafviz.RData')
     lname
    1. 'introns' 2. 'clusters' 3. 'counts' 4. 'meta' 5. 'exons_table' 6. 'pca' 7. 'intron_summary' 8. 'clus-
    ter_summary' 9. 'introns_to_plot' 10. 'cluster_ids' 11. 'sample_table' 12. 'annotation_code'
    13. 'code'
[3]: levels(meta$group) <- c("Female", "Male")
     sample_table
```

Attaching package: 'gridExtra'

```
A data frame: 2 \times 2 \frac{\text{group count}}{<\text{chr}>} \frac{<\text{chr}>}{F} \frac{114}{M} \frac{245}{M}
```

[4]: cluster_summary

| A data.frame: 3×2 | Results | n |
|----------------------------|---|----------|
| | <chr></chr> | <int $>$ |
| | Number of differentially spliced clusters at $FDR = 0.05$ | 352 |
| | Fully annotated | 160 |
| | Contain unannotated junctions | 192 |

[5]: intron_summary

| | Results | n |
|----------------------------|---|----------|
| A data.frame: 5×2 | <chr></chr> | <int $>$ |
| | Number of fully annotated junctions | 1249 |
| | Number of junctions with cryptic 5' splice site | 119 |
| | Number of junctions with cryptic 3' splice site | 145 |
| | Number of junctions with two cryptic splice sites | 38 |
| | Number of novel junctions that connect two annotated splice sites | 118 |

[6]: clusters['gene'] <- gsub("</i>", "", gsub("<i>", "", clusters\$gene))
head(clusters)

```
clusterID
                                                  coord
                                                                                                     FDR
                                                                             gene
                                                                                         annotation
                                          <dbl>
                         <chr>
                                                  <chr>
                                                                             <chr>
                                                                                         <chr>
                                                                                                     <dbl
                    352
                         clu_755_-
                                          3
                                                  chrX:53217966-53220839
                                                                             KDM5C
                                                                                         annotated
                                                                                                     2.27e
                         clu 744 -
                                                  chrX:53176622-53193437
                    350
                                          10
                                                                             KDM5C
                                                                                         cryptic
                                                                                                     3.64e
A data.frame: 6 \times 6
                    282
                         clu_109096_+
                                         9
                                                  chr6:72292046-72390598
                                                                             RIMS1
                                                                                         cryptic
                                                                                                     1.89e
                    291
                         clu 143938 -
                                          22
                                                  chr6:130863718-130885096
                                                                             EPB41L2
                                                                                         cryptic
                                                                                                     1.89e
                    340
                         clu_61504_+
                                          3
                                                  chrX:47199106-47199480
                                                                             UBA1
                                                                                         cryptic
                                                                                                     2.45e
                    227
                         clu_21090_-
                                          11
                                                  chr3:197066754-197081051
                                                                             DLG1
                                                                                         cryptic
                                                                                                     2.32e
```

```
[7]: write.table(clusters, file="cluster_ds_results_annotated.txt", sep="\t", quote=FALSE, row.names=FALSE)
```

1.3 Generate plots

1.3.1 Define functions

```
[8]: filter_intron_table <- function(introns, clu){
    d < - introns %>% filter(clusterID == clu) %>%
        select(chr, start, end, verdict, deltapsi) %>%
        arrange(desc(abs(deltapsi))) %>%
        rename("APSI" = deltapsi)
    row.names(d) <- letters[1:nrow(d)] # letters is just a:z
    return(d)</pre>
```

```
}
getGeneLength <- function(gene_name, exons_table){</pre>
              <- exons_table[ exons_table$gene_name == gene_name, ]</pre>
    geneStart <- min(exons$start)</pre>
             <- max(exons$end)
    geneEnd
    geneLength <- geneEnd - geneStart</pre>
    if( geneLength >1e6){
        pixels <- 5000
    } else if ( geneLength > 5e5 & geneLength < 1e6){
        pixels <- 3000
    } else if ( geneLength > 1.5e5 & geneLength <= 5e5){</pre>
        pixels <- 2000
    } else {
        stopifnot(geneLength <= 1.5e5)</pre>
        pixels <- "auto"</pre>
    return(pixels)
}
select_data <- function(sel, clusters, exons_table){</pre>
    gene <- clusters[ sel, ]$gene</pre>
    width <- getGeneLength(gene, exons_table)</pre>
    clusterID <- clusters[ sel, ]$clusterID</pre>
    coord <- clusters[ sel, ]$coord</pre>
    return(list(gene = gene, width = width, cluster = clusterID, coord = coord))
}
```

1.3.2 Plot top 6 clusters

```
dev.off()
    if (is.numeric(mydata$width)) {
        new_width = mydata$width / 100
    } else {
        new_width = mydata$width
    }
    pdf(file=pasteO(dir, gene_name, '_allClusters_top_',num,'.pdf'),
        width=new_width, height=6)
    try(print(make_gene_plot(mydata$gene,
                         counts = counts,
                         introns = introns,
                         exons_table = exons_table,
                         cluster_list = clusters,
                         clusterID = mydata$cluster,
                         introns_to_plot = introns_to_plot, debug=F)))
    dev.off()
}
```

1.4 Plot splicing

```
[10]: dir.create("top10")
      for(num in 1:10){
          ii = plot_cluster(num, clusters, "top10/")
      }
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
             cells
                      name
                                      grob
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'mode(width)' differs between new and previous
              ==> NOT changing 'width'"
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
       z
             cells
                      name
                                      grob
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'mode(width)' differs between new and previous
```

```
==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
       cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
       cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
       cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
```

```
TableGrob (2 x 1) "arrange": 2 grobs
             cells
       z
                      name
                                     grob
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'guides(<scale> = FALSE)' is deprecated. Please use 'guides(<scale> = "none")'
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
             cells
                      name
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'mode(width)' differs between new and previous
              ==> NOT changing 'width'"
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
             cells
                      name
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
[11]: dir.create("x_chromosome")
      x_clu = clusters %>% filter(str_detect(coord, "chrX"), FDR < 0.05)</pre>
      x_clu
```

```
<dbl>
                         < chr >
                                                <chr>
                                                                          <chr>
                                                                                    <chr>
                         clu 755 -
                                                chrX:53217966-53220839
                                                                         KDM5C
                                                                                    annotated
                         clu 744 -
                                       10
                                                chrX:53176622-53193437
                                                                         KDM5C
                                                                                    cryptic
                         clu 61504 +
                                                                          UBA1
                                       3
                                                chrX:47199106-47199480
                                                                                    cryptic
                         clu\ 62902\ +
                                       10
                                                chrX:153765580-153769162
                                                                         PLXNB3
                                                                                    cryptic
                         clu 1810 -
                                       3
                                                                         PNMA5
                                                                                    cryptic
                                                chrX:152989331-152991916
                         clu 752 -
                                                                         KDM5C
                                       3
                                                chrX:53210576-53211497
                                                                                    cryptic
                         clu 62904 +
                                       7
                                                                         PLXNB3
                                                chrX:153771081-153771864
                                                                                    cryptic
                         clu 62916 +
                                       5
                                                                         PLXNB3
                                                chrX:153777688-153778396
                                                                                    cryptic
                         clu 62431 +
                                       3
                                                chrX:115636978-115640408
                                                                         PLS3
                                                                                    annotated
                         clu_261_-
                                       11
                                                                         AP1S2
                                                                                    cryptic
                                                chrX:15825984-15845379
     A data.frame: 22 \times 6
                         clu_206_-
                                       5
                                                chrX:13785808-13938507
                                                                         GPM6B
                                                                                    annotated
                         clu 1841 -
                                       9
                                                chrX:154032557-154097604
                                                                         MECP2
                                                                                    cryptic
                         clu 1482 -
                                        3
                                                chrX:120428626-120441730
                                                                         LAMP2
                                                                                    annotated
                         clu 60959 +
                                       9
                                                chrX:2861722-2910874
                                                                         GYG2
                                                                                    cryptic
                         clu 62906 +
                                       5
                                                                         PLXNB3
                                                chrX:153772287-153773230
                                                                                    cryptic
                         clu 62231 +
                                       4
                                                chrX:103310981-103330984
                                                                         TCEAL7
                                                                                    cryptic
                         clu 480 -
                                       3
                                                chrX:41610025-41626604
                                                                         CASK
                                                                                    annotated
                         clu 12601 ?
                                                                         LAMP2
                                       4
                                                chrX:120428626-120441730
                                                                                    cryptic
                         clu 62948 +
                                       5
                                                chrX:154399941-154400702
                                                                         RPL10
                                                                                    cryptic
                         clu 61084 +
                                       6
                                                chrX:13735220-13736656
                                                                         OFD1
                                                                                    cryptic
                         clu_62377_+
                                       3
                                                chrX:108584525-108586615
                                                                         COL4A5
                                                                                    cryptic
                         clu 61903 +
                                                chr X:71167800-71171654
                                                                         NLGN3
                                                                                    cryptic
[12]: for(num in 1:dim(x_clu)[1]){
          plot_cluster(num, x_clu, "x_chromosome/")
      }
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
              cells
                       name
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'mode(width)' differs between new and previous
               ==> NOT changing 'width'"
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
              cells
                                       grob
                       name
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
```

clusterID

Ν

coord

FDR

< dbl >

2.27e-43

3.64e-40

2.45e-16

 $1.06\mathrm{e}\text{-}09$

4.00e-09

8.61e-09

1.38e-07

1.14e-06

7.28e-06

1.37e-04

1.53e-04

9.14e-04

1.94e-03

8.68e-03

8.68e-03

1.14e-02

1.23e-02

1.70e-02

2.73e-02

3.09e-02

4.60e-02

4.93e-02

annotation

gene

```
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
       cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
       cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
Warning message:
"Removed 1 row(s) containing missing values (geom_path)."
Warning message:
"Removed 1 row(s) containing missing values (geom_path)."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
```

```
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
```

```
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
                                grob
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
                                grob
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
                                grob
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
```

```
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
       cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                 name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
TableGrob (2 x 1) "arrange": 2 grobs
        cells
                name
1 1 (1-1,1-1) arrange gtable[layout]
2 2 (2-2,1-1) arrange gtable[layout]
Warning message:
"'mode(width)' differs between new and previous
         ==> NOT changing 'width'"
Warning message:
"`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
instead."
```

```
TableGrob (2 x 1) "arrange": 2 grobs
       z
             cells
                      name
                                      grob
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'mode(width)' differs between new and previous
              ==> NOT changing 'width'"
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     TableGrob (2 x 1) "arrange": 2 grobs
             cells
                      name
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
     instead."
     Warning message:
     "Removed 1 row(s) containing missing values (geom_path)."
     Warning message:
     "Removed 1 row(s) containing missing values (geom_path)."
     TableGrob (2 x 1) "arrange": 2 grobs
       7.
             cells
                      name
                                      grob
     1 1 (1-1,1-1) arrange gtable[layout]
     2 2 (2-2,1-1) arrange gtable[layout]
     Warning message:
     "'mode(width)' differs between new and previous
              ==> NOT changing 'width'"
     Error: Aesthetics must be either length 1 or the same as the data (1): x, xend,
     group and colour
[13]: dir.create("ank3")
      ank3 = clusters %>% filter(gene == 'ANK3')
      ank3
                                                                                       FDR.
                       clusterID
                                    Ν
                                            coord
                                                                    gene
                                                                            annotation
                        <chr>
                                     <dbl>
                                             <chr>
                                                                    <chr>
                                                                            <chr>
                                                                                       <dbl>
     A data.frame: 2 \times 6
                       clu 22299 -
                                    3
                                            chr10:60059430-60063111
                                                                    ANK3
                                                                            annotated
                                                                                       0.00159
                       clu 22304 -
                                            chr10:60139087-60166824
                                                                    ANK3
                                                                            annotated
                                                                                       0.00895
                                    3
[14]: for(num in 1:dim(ank3)[1]){
          plot_cluster(num, ank3, "ank3/")
      }
     Warning message:
     "`guides(<scale> = FALSE)` is deprecated. Please use `guides(<scale> = "none")`
```