main

September 14, 2021

1 eQTL boxplot

This is script ported from python to fix unknown plotting error.

```
[1]: suppressPackageStartupMessages({
    library(tidyverse)
    library(ggpubr)
})
```

1.1 Functions

```
[2]: feature = "genes"
tissue = "Caudate"
```

1.1.1 Cached functions

```
[3]: get_residualized_df <- function(){</pre>
         expr_file = "../../_m/genes_residualized_expression.csv"
         return(data.table::fread(expr_file) %>% column_to_rownames("gene_id"))
     memRES <- memoise::memoise(get_residualized_df)</pre>
     get_biomart_df <- function(){</pre>
         biomart = data.table::fread("../_h/biomart.csv")
     memMART <- memoise::memoise(get_biomart_df)</pre>
     get_pheno_df <- function(){</pre>
         phenotype_file = paste0('/ceph/projects/v4_phase3_paper/inputs/',
                                   'phenotypes/_m/merged_phenotypes.csv')
         return(data.table::fread(phenotype_file))
     memPHENO <- memoise::memoise(get_pheno_df)</pre>
     get_tissue_eqtls <- function(){</pre>
         mashr_file = paste0("../../mashr/summary_table/_m/",
                              "BrainSeq_sexGenotypes_4features_3regions_pgc2.txt.gz")
         return(data.table::fread(mashr_file) %>%
```

```
filter(Type == "Gene", Tissue == "Caudate") %>%
           select(gene_id, variant_id, lfsr))
memTISSUE <- memoise::memoise(get_tissue_eqtls)</pre>
get_eqtl_df <- function(){</pre>
    fastqtl_file = paste0("../../../prep_eqtl_analysis/",tolower(tissue),
                          "/genes/prepare_expression/fastqtl_nominal/",
                          "multiple_corrections/_m/Brainseq_LIBD.txt.gz")
    eqtl_df = data.table::fread(fastqtl_file) %>%
        filter(gene id %in% unique(memTISSUE()$gene id)) %>%
        arrange(BF)
    return(eqtl_df)
memEQTL <- memoise::memoise(get_eqtl_df)</pre>
get_genotypes <- function(){</pre>
    traw_file = paste0("/ceph/projects/brainseq/genotype/download/topmed/
 "filter_maf_01/a_transpose/_m/LIBD_Brain_TopMed.traw")
    traw = data.table::fread(traw file) %>% rename with(~ gsub('\\ .*', '', .x))
    return(traw)
memSNPs <- memoise::memoise(get_genotypes)</pre>
get_snp_df <- function(variant_id, gene_id){</pre>
    zz = get_geno_annot() %>% filter(SNP == variant_id)
    xx = get_snps_df() %>% filter(SNP == variant_id) %>%
        column_to_rownames("SNP") %>% t %>% as.data.frame %>%
        rownames to column("BrNum") %>% mutate(COUNTED=zz$COUNTED, ALT=zz$ALT)_
 →%>%
        rename("SNP"=all of(variant id))
    yy = memRES()[gene_id, ] %>% t %>% as.data.frame %>%
        rownames to column("RNum") %>% inner join(memPHENO(), by="RNum")
    ## Annotated SNPs
    letters = c()
    for(ii in seq_along(xx$COUNTED)){
        a0 = xx$COUNTED[ii]; a1 = xx$ALT[ii]; number = xx$SNP[ii]
        letters <- append(letters, letter_snp(number, a0, a1))</pre>
    }
    xx = xx %>% mutate(LETTER=letters, ID=paste(SNP, LETTER, sep="\n"))
    df = inner_join(xx, yy, by="BrNum") %>% mutate_if(is.character, as.factor)
    return(df)
memDF <- memoise::memoise(get_snp_df)</pre>
```

1.1.2 Simple functions

```
[4]: get_geno_annot <- function(){
         return(memSNPs() %>% select(CHR, SNP, POS, COUNTED, ALT))
     get_snps_df <- function(){</pre>
         return(memSNPs() %>% select("SNP", starts_with("Br")))
     }
     letter_snp <- function(number, a0, a1){</pre>
         if(is.na(number)){ return(NA) }
         if( length(a0) == 1 & length(a1) == 1){
             seps = ""; collapse=""
         } else {
             seps = " "; collapse=NULL
         return(paste(paste0(rep(a0, number), collapse = collapse),
                      pasteO(rep(a1, (2-number)), collapse = collapse), sep=seps))
     }
     save_ggplots <- function(fn, p, w, h){</pre>
         for(ext in c('.pdf', '.png', '.svg')){
             ggsave(paste0(fn, ext), plot=p, width=w, height=h)
         }
     }
     get_gene_symbol <- function(gene_id){</pre>
         ensemblID = gsub("\\..*", "", gene_id)
         geneid = memMART() %>% filter(ensembl_gene_id == gsub("\\..*", "", gene_id))
         if(dim(geneid)[1] == 0){
             return("")
         } else {
             return(geneid$external_gene_name)
         }
     }
     plot_simple_eqtl <- function(fn, gene_id, variant_id, eqtl_annot){</pre>
         bxp = memDF(variant_id, gene_id) %>%
             ggboxplot(x="ID", y=gene_id, fill="Sex", color="Sex", add="jitter",
                       facet.by="Region", panel.labs.font=list(face='bold'),
                       xlab=variant_id, ylab="Residualized Expression", outlier.
      ⇒shape=NA,
                       add.params=list(alpha=0.5), alpha=0.4, legend="bottom",
                       palette="npg", ggtheme=theme_pubr(base_size=20, border=TRUE))__
             font("xy.title", face="bold") +
```

```
ggtitle(paste(get_gene_symbol(gene_id), gene_id, eqtl_annot, sep='\n'))

theme(plot.title = element_text(hjust = 0.5, face="bold"))
print(bxp)
save_ggplots(fn, bxp, 10, 7)
}
```

1.1.3 GWAS plots

```
[5]: get_gwas_snps <- function(){</pre>
         gwas_snp_file = paste0('/ceph/projects/v4_phase3_paper/inputs/sz_gwas/
      →pgc2_clozuk/',
                                'map_phase3/_m/libd_hg38_pgc2sz_snps_p5e_minus8.tsv')
         gwas_df = data.table::fread(gwas_snp_file) %>% arrange(P)
         return(gwas_df)
     }
     memGWAS <- memoise::memoise(get_gwas_snps)</pre>
     get_gwas_snp <- function(variant){</pre>
         return(memGWAS() %>% filter(our_snp_id == variant))
     }
     get risk allele <- function(variant){</pre>
         gwas_snp = get_gwas_snp(variant)
         if(gwas_snp$OR > 1){
             ra = gwas_snp$A1
         }else{
             ra = gwas snp$A2
         return(ra)
     }
     get_eqtl_gwas_df <- function(){</pre>
         return(memTISSUE() %>% inner_join(memGWAS(),__
     get_gwas_ordered_snp_df <- function(variant_id, gene_id,__</pre>
      →pgc2_a1_same_as_our_counted, OR){
         df = memDF(variant_id, gene_id)
         if(!pgc2_a1_same_as_our_counted){ # Fix bug with matching alleles!
             if(OR < 1){ df = df %>% mutate(SNP = 2-SNP, ID=paste(SNP, LETTER, _
      →sep="\n")) }
         } else {
             if(OR > 1){ df = df %>% mutate(SNP = 2-SNP, ID=paste(SNP, LETTER, __
      \rightarrow sep="\langle n"\rangle) }
```

```
return(df)
}
plot_gwas_eqtl <- function(fn, gene_id, variant_id,__</pre>
 →pgc2_a1_same_as_our_counted, OR, title){
    dt = get gwas ordered snp df(variant id, gene id, ...
→pgc2_a1_same_as_our_counted, OR)
    y0 = quantile(dt[[gene_id]], probs=c(0.05))[[1]] - 0.26
    y1 = quantile(dt[[gene_id]], probs=c(0.95))[[1]] + 0.26
    bxp = dt %>% mutate_if(is.character, as.factor) %>%
        mutate(Region=gsub("HIPPO", "Hippocampus", Region)) %>%
        ggboxplot(x="ID", y=gene id, fill="Sex", color="Sex", add="jitter",
                   facet.by="Region", panel.labs.font=list(face='bold'),
                   xlab=variant_id, ylab="Residualized Expression", outlier.
 \rightarrowshape=NA,
                   add.params=list(alpha=0.5), alpha=0.4, legend="bottom", __
\rightarrowlims=c(y0,y1),
                   palette="npg", ggtheme=theme_pubr(base_size=20, border=TRUE))_
 \hookrightarrow+
        font("xy.title", face="bold") + ggtitle(title) +
        theme(plot.title = element_text(hjust = 0.5, face="bold"))
    print(bxp)
    save_ggplots(fn, bxp, 10, 7)
}
```

1.2 Plot eQTL

1.2.1 Top 5 GWAS associated eQTLs

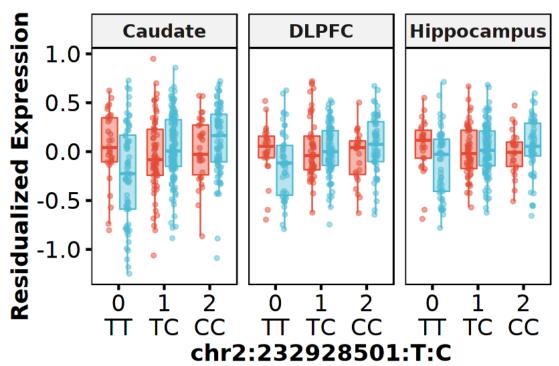
```
pgc2_a1_same a
                     variant id
                                          gene_id
                                                                slope
                                                                            BF
                     <chr>
                                          <chr>
                                                                 <dbl>
                                                                            <dbl>
                                                                                           \langle lgl \rangle
A grouped_df: 3 \times 7 chr2:\overline{232928501:T:C}
                                          ENSG00000182600.9
                                                                0.424601
                                                                            1.085450e-01
                                                                                          FALSE
                     chr6:29688639:T:G
                                                                                          FALSE
                                          ENSG00000227262.3
                                                                0.499502
                                                                            5.440699e-02
                                                                                          FALSE
                     chr6:31867387:G:C
                                          ENSG00000244731.7 -0.632753
                                                                            7.852384e-05
```

```
[7]: for(num in seq_along(eqtl_gwas_df$gene_id)){
    fn = paste("top",num,"interacting_eqtl_in_gwas_significant_snps", sep="_")
    variant_id = eqtl_gwas_df$variant_id[num]
    gene_id = eqtl_gwas_df$gene_id[num]
    pgc2_a1_same_as_our_counted = eqtl_gwas_df$pgc2_a1_same_as_our_counted[num]
    OR = eqtl_gwas_df$OR[num]
```

```
#eqtl_annot = paste("eQTL q-value:", signif(eqtl_gwas_df$BF[num], 2))
gwas_annot = paste("SZ GWAS pvalue:", signif(eqtl_gwas_df$P[num], 2))
risk_annot = paste("SZ risk allele:",__

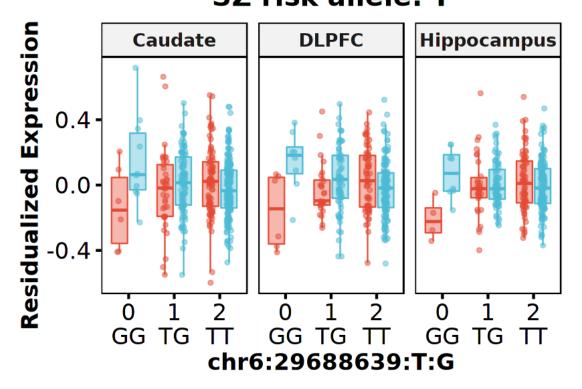
get_risk_allele(eqtl_gwas_df$variant_id[num]))
title = paste(get_gene_symbol(gene_id), gene_id, gwas_annot, risk_annot,__
sep='\n')
plot_gwas_eqtl(fn, gene_id, variant_id, pgc2_a1_same_as_our_counted, OR,__
title)
}
```

SNORC ENSG00000182600.9 SZ GWAS pvalue: 1.6e-12 SZ risk allele: C

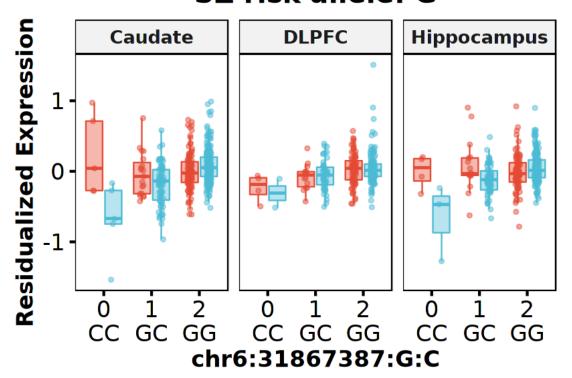


Sex 🖶 Female 🖶 Male

HCG4B ENSG00000227262.3 SZ GWAS pvalue: 6.9e-15 SZ risk allele: T



C4A ENSG00000244731.7 SZ GWAS pvalue: 1.1e-29 SZ risk allele: G



Sex = Female = Male

1.3 Session Info

```
[8]: Sys.time()
    proc.time()
    options(width = 120)
    sessioninfo::session_info()

[1] "2021-09-14 15:31:46 EDT"

    user system elapsed
    1247.496 203.687 253.504

    Session info
    setting value
```

version R version 4.0.3 (2020-10-10)

os Arch Linux

system x86_64, linux-gnu

ui X11 language (EN)

collate en_US.UTF-8
ctype en_US.UTF-8
tz America/New_York

date 2021-09-14

Packages

| package | * | version | date | lib | source | |
|------------|---|----------|------------|-----|--------|-----------|
| abind | | 1.4-5 | 2016-07-21 | [1] | CRAN | (R 4.0.2) |
| assertthat | | 0.2.1 | 2019-03-21 | [1] | CRAN | (R 4.0.2) |
| backports | | 1.2.1 | 2020-12-09 | [1] | CRAN | (R 4.0.2) |
| base64enc | | 0.1-3 | 2015-07-28 | [1] | CRAN | (R 4.0.2) |
| broom | | 0.7.9 | 2021-07-27 | [1] | CRAN | (R 4.0.3) |
| cachem | | 1.0.6 | 2021-08-19 | [1] | CRAN | (R 4.0.3) |
| Cairo | | 1.5-12.2 | 2020-07-07 | [1] | CRAN | (R 4.0.2) |
| car | | 3.0-11 | 2021-06-27 | [1] | CRAN | (R 4.0.3) |
| carData | | 3.0-4 | 2020-05-22 | [1] | CRAN | (R 4.0.2) |
| cellranger | | 1.1.0 | 2016-07-27 | [1] | CRAN | (R 4.0.2) |
| cli | | 3.0.1 | 2021-07-17 | [1] | CRAN | (R 4.0.3) |
| colorspace | | 2.0-2 | 2021-06-24 | [1] | CRAN | (R 4.0.3) |
| crayon | | 1.4.1 | 2021-02-08 | [1] | CRAN | (R 4.0.3) |
| curl | | 4.3.2 | 2021-06-23 | [1] | CRAN | (R 4.0.3) |
| data.table | | 1.14.0 | 2021-02-21 | [1] | CRAN | (R 4.0.3) |
| DBI | | 1.1.1 | 2021-01-15 | [1] | CRAN | (R 4.0.2) |
| dbplyr | | 2.1.1 | 2021-04-06 | [1] | CRAN | (R 4.0.3) |
| digest | | 0.6.27 | 2020-10-24 | [1] | CRAN | (R 4.0.2) |
| dplyr | * | 1.0.7 | 2021-06-18 | [1] | CRAN | (R 4.0.3) |
| ellipsis | | 0.3.2 | 2021-04-29 | [1] | CRAN | (R 4.0.3) |
| evaluate | | 0.14 | 2019-05-28 | [1] | CRAN | (R 4.0.2) |
| fansi | | 0.5.0 | 2021-05-25 | [1] | CRAN | (R 4.0.3) |
| farver | | 2.1.0 | 2021-02-28 | [1] | CRAN | (R 4.0.3) |
| fastmap | | 1.1.0 | 2021-01-25 | [1] | CRAN | (R 4.0.2) |
| forcats | * | 0.5.1 | 2021-01-27 | [1] | CRAN | (R 4.0.2) |
| foreign | | 0.8-80 | 2020-05-24 | [2] | CRAN | (R 4.0.3) |
| fs | | 1.5.0 | 2020-07-31 | [1] | CRAN | (R 4.0.2) |
| generics | | 0.1.0 | 2020-10-31 | [1] | CRAN | (R 4.0.2) |
| ggplot2 | * | 3.3.5 | 2021-06-25 | [1] | CRAN | (R 4.0.3) |
| ggpubr | * | 0.4.0 | 2020-06-27 | [1] | CRAN | (R 4.0.2) |
| ggsci | | 2.9 | 2018-05-14 | [1] | CRAN | (R 4.0.2) |
| ggsignif | | 0.6.2 | 2021-06-14 | [1] | CRAN | (R 4.0.3) |
| glue | | 1.4.2 | 2020-08-27 | [1] | CRAN | (R 4.0.2) |
| gtable | | 0.3.0 | 2019-03-25 | [1] | CRAN | (R 4.0.2) |
| haven | | 2.4.3 | 2021-08-04 | [1] | CRAN | (R 4.0.3) |
| hms | | 1.1.0 | 2021-05-17 | [1] | CRAN | (R 4.0.3) |

```
htmltools
              0.5.2
                        2021-08-25 [1] CRAN (R 4.0.3)
httr
               1.4.2
                        2020-07-20 [1] CRAN (R 4.0.2)
IRdisplay
              1.0
                        2021-01-20 [1] CRAN (R 4.0.2)
               1.2
                        2021-05-11 [1] CRAN (R 4.0.3)
IRkernel
jsonlite
              1.7.2
                        2020-12-09 [1] CRAN (R 4.0.2)
              0.4.2
                        2020-10-20 [1] CRAN (R 4.0.2)
labeling
lifecycle
              1.0.0
                        2021-02-15 [1] CRAN (R 4.0.3)
lubridate
              1.7.10
                        2021-02-26 [1] CRAN (R 4.0.3)
                        2020-11-17 [1] CRAN (R 4.0.2)
magrittr
              2.0.1
memoise
              2.0.0
                        2021-01-26 [1] CRAN (R 4.0.2)
                        2020-05-19 [1] CRAN (R 4.0.2)
modelr
              0.1.8
              0.5.0
                        2018-06-12 [1] CRAN (R 4.0.2)
munsell
              4.2.4
                        2021-06-16 [1] CRAN (R 4.0.3)
openxlsx
pbdZMQ
              0.3 - 5
                        2021-02-10 [1] CRAN (R 4.0.3)
pillar
              1.6.2
                        2021-07-29 [1] CRAN (R 4.0.3)
              2.0.3
                        2019-09-22 [1] CRAN (R 4.0.2)
pkgconfig
            * 0.3.4
                        2020-04-17 [1] CRAN (R 4.0.2)
purrr
R.methodsS3
               1.8.1
                        2020-08-26 [1] CRAN (R 4.0.3)
R.oo
              1.24.0
                        2020-08-26 [1] CRAN (R 4.0.3)
R.utils
              2.10.1
                        2020-08-26 [1] CRAN (R 4.0.3)
                        2021-08-19 [1] CRAN (R 4.0.3)
R6
              2.5.1
                        2021-07-07 [1] CRAN (R 4.0.3)
               1.0.7
Rcpp
readr
            * 2.0.1
                        2021-08-10 [1] CRAN (R 4.0.3)
              1.3.1
                        2019-03-13 [1] CRAN (R 4.0.2)
readxl
              1.1.3
                        2021-01-21 [1] CRAN (R 4.0.2)
repr
              2.0.1
                        2021-08-05 [1] CRAN (R 4.0.3)
reprex
                        2021-06-21 [1] CRAN (R 4.0.3)
              0.5.27
rio
rlang
              0.4.11
                        2021-04-30 [1] CRAN (R 4.0.3)
              0.7.0
                        2021-02-13 [1] CRAN (R 4.0.3)
rstatix
              0.13
                        2020-11-12 [1] CRAN (R 4.0.2)
rstudioapi
              1.0.1
                        2021-07-26 [1] CRAN (R 4.0.3)
rvest
scales
              1.1.1
                        2020-05-11 [1] CRAN (R 4.0.2)
sessioninfo
              1.1.1
                        2018-11-05 [1] CRAN (R 4.0.2)
               1.7.4
                        2021-08-25 [1] CRAN (R 4.0.3)
stringi
            * 1.4.0
                        2019-02-10 [1] CRAN (R 4.0.2)
stringr
svglite
              2.0.0
                        2021-02-20 [1] CRAN (R 4.0.3)
systemfonts
               1.0.2
                        2021-05-11 [1] CRAN (R 4.0.3)
tibble
            * 3.1.4
                        2021-08-25 [1] CRAN (R 4.0.3)
                        2021-03-03 [1] CRAN (R 4.0.3)
tidyr
            * 1.1.3
tidyselect
               1.1.1
                        2021-04-30 [1] CRAN (R 4.0.3)
tidyverse
            * 1.3.1
                        2021-04-15 [1] CRAN (R 4.0.3)
tzdb
              0.1.2
                        2021-07-20 [1] CRAN (R 4.0.3)
utf8
              1.2.2
                        2021-07-24 [1] CRAN (R 4.0.3)
uuid
              0.1 - 4
                        2020-02-26 [1] CRAN (R 4.0.2)
vctrs
              0.3.8
                        2021-04-29 [1] CRAN (R 4.0.3)
withr
              2.4.2
                        2021-04-18 [1] CRAN (R 4.0.3)
xm12
              1.3.2
                        2020-04-23 [1] CRAN (R 4.0.2)
              2.2.0
                        2021-05-31 [1] CRAN (R 4.0.3)
zip
```

- [1] /home/jbenja13/R/x86_64-pc-linux-gnu-library/4.0
 [2] /usr/lib/R/library