mainr

August 11, 2021

1 TWAS plot

```
[1]: suppressMessages({library(data.table)
                       library(dplyr)
                       library(ggplot2)
                       })
[2]: pgc2_file = '/ceph/projects/v4_phase3_paper/inputs/sz_gwas/pgc2_clozuk/
      →map_phase3/_m/libd_hg38_pgc2sz_snps.tsv'
     pgc2_df = fread(pgc2_file)
[3]: twas_dat = read.delim(paste0('/ceph/projects/v4_phase3_paper/analysis/twas/',
                                   'gene_weights/fusion_pgc2/summary_stats/_m/

¬fusion_associations.txt'))
     twas_dat = merge(twas_dat, pgc2_df, by.x='BEST.GWAS.ID', by.y='our_snp_id',__
      ⇔suffixes=c('_TWAS', '_PGC3'))
     twas_dat$group = 'Up'
     twas_dat$group[twas_dat['TWAS.Z'] < 0] = "Down"</pre>
     for(xx in seq_along(twas_dat$ID)){
         if(twas_dat$ID[xx] == ''){
             twas_dat$New_ID[xx] = as.character(twas_dat$FILE[xx])
         } else {
             twas_dat$New_ID[xx] = as.character(twas_dat$ID[xx])
         }
     }
[4]: nCHR <- length(unique(twas_dat$CHR_TWAS))
     twas dat$BPcum <- NA
     s <- 0
     nbp <- c()
     for (i in sort(unique(twas_dat$CHR_TWAS))){
         nbp[i] <- max(twas_dat[twas_dat$CHR_TWAS == i,]$hg38pos)</pre>
         twas_dat[twas_dat$CHR_TWAS == i, "BPcum"] <- twas_dat[twas_dat$CHR_TWAS ==__
      \rightarrowi,"hg38pos"] + s
```

```
s <- s + nbp[i]
}
```

```
[5]: axis.set <- twas_dat %>%
    group_by(CHR_TWAS) %>%
    summarize(center = (max(BPcum) + min(BPcum)) / 2)
#axis.set
```

1.0.1 All TWAS, Caudate

```
[6]: df = twas_dat[twas_dat$Bonferroni < 0.05, ]
df = head(df[order(df$Bonferroni), ], 10)
df</pre>
```

```
CHR TWAS
                          BEST.GWAS.ID
                                            FILE
                                                              ID
                                                                                              Ρ(
                          <chr>
                                            <chr>
                                                              <chr>
                                                                                 <int>
                                                                                              < i
                                                              ZSCAN12
                    6842
                          chr6:28744470:A:G
                                            ENSG00000158691
                                                                                6
                                                                                              28
                    6831
                          chr6:28426903:C:T
                                            ENSG00000219891
                                                              ZSCAN12P1
                                                                                6
                                                                                              28
                    6912
                          chr6:31793436:G:A
                                            ENSG00000244731
                                                              C4A
                                                                                6
                                                                                              31
                    6913
                          chr6:31793436:G:A
                                           ENSG00000204338
                                                              CYP21A1P
                                                                                6
                                                                                              32
A data.frame: 10 \times 49
                    6876
                          chr6:30762705:G:T ENSG00000280128
                                                              ENSG00000280128
                                                                                              30
                                                                                6
                    6921
                          chr6:32231204:C:T ENSG00000228962
                                                              HCG23
                                                                                6
                                                                                              32
                          chr6:31348749:T:C ENSG00000213722
                    6905
                                                              DDAH2
                                                                                6
                                                                                              31
                    6853
                          chr6:29445226:C:T ENSG00000235963
                                                              MCCD1P1
                                                                                6
                                                                                              29
                          chr6:29591461:T:C ENSG00000066379
                    6861
                                                              ZNRD1
                                                                                6
                                                                                              30
                    6828
                         chr6:28071151:G:A ENSG00000275221
                                                              HIST1H2AK
                                                                                6
                                                                                              27
```

```
[7]: manhplot1 <- (ggplot(twas_dat, aes(x=BPcum, y=TWAS.Z)) +
                    geom_point(aes(color=as.factor(CHR_TWAS)), alpha=0.75, size=1.25)
      \hookrightarrow+
                    geom_point(data=twas_dat[twas_dat$FDR < 0.05, ], color="red",_</pre>
      →alpha=0.75) +
                    scale color manual(values = rep(c("grey40", "grey60"), nCHR)) +
                    scale_x_continuous(label = axis.set$CHR_TWAS, breaks = axis.
      ⇒set$center) +
                    scale_y_continuous(expand = c(0,0), limits = c(-15, 15)) + labs(x_{\perp}
      \Rightarrow= NULL, v = "Z-score") +
                    geom_hline(yintercept = 0, color = "black", linetype = "solid") +
                    ggrepel::geom_text_repel(data=df, fontface = "bold", #hjust=1,__
      \rightarrow vjust=1,
                                                #position=position_jitter(width=1,__
      \rightarrow height=1),
                                                aes(x=BPcum, y=TWAS.Z, label=New_ID)) +
                    theme minimal(base size=20) +
                    theme(legend.position="none", panel.border=element_blank(),
```

```
panel.grid.major=element_blank(), panel.grid.

improselement_blank())

)
manhplot1
```

15 ZSCAN12P1 CYP21A1P C4A DDAH2 10 ZNR 1 5 Z-score -5 HIST1H2AK -10 MCCD1P1 HCG23 ENSG00000280128 ZSCAN12 -15 5 6 7 8 9 101112131415678292912 1

1.0.2 Overlapping tissue

```
[8]: overlapping = read.delim(paste0('../.m/overlapping_tissue_twasList.txt'))
overlapping = subset(overlapping, select=c('our_snp_id', 'FILE', 'ID',

→'CHR_TWAS', 'BEST.GWAS.ID', 'P', 'TWAS.Z', 'TWAS.P', 'FDR'))
overlapping = overlapping[order(overlapping$FDR), ]
merge(head(overlapping['FILE'], 10), twas_dat, by='FILE')
```

```
FILE
                                            BEST.GWAS.ID
                                                                 ID
                                                                                    CHR TWAS
                         <chr>
                                                                 <chr>
                                            <chr>
                                                                                    <int>
                         ENSG00000122687
                                            chr7:1981360:G:A
                                                                 MRM2
                         ENSG00000129933
                                            chr19:19457850:T:C
                                                                 MAU2
                                                                                    19
                         ENSG00000130921
                                            chr12:123148383:G:A
                                                                 C12orf65
                                                                                    12
                         ENSG00000163016
                                            chr2:73404084:G:A
                                                                 ALMS1P1
                                                                                    2
    A data.frame: 10 \times 49
                                                                                    3
                         ENSG00000163634
                                            chr3:63881679:A:G
                                                                 THOC7
                         ENSG00000169592
                                            chr16:29971798:G:T
                                                                 INO80E
                                                                                    16
                         ENSG00000198951
                                            {\rm chr}22{:}42207808{:}{\rm C:}{\rm T}
                                                                 NAGA
                                                                                    22
                                                                                    2
                         ENSG00000226124
                                            chr2:199850665:T:G
                                                                 FTCDNL1
                         ENSG00000243696
                                            chr3:53141001:G:A
                                                                 ENSG00000243696
                                                                                    3
                                                                                    22
                         ENSG00000281538 chr22:42207808:C:T
                                                                 ENSG00000281538
[9]: df = merge(overlapping['FILE'], twas dat, by='FILE')
     df = df[order(df$FDR), ]
     manhplot2 <- (ggplot(twas_dat, aes(x=BPcum, y=TWAS.Z)) +</pre>
                    geom point(aes(color=as.factor(CHR TWAS)), alpha=0.4, size=1.25) +
                    geom_point(data=twas_dat[twas_dat$FDR < 0.05, ], color="red",_</pre>
      \rightarrowalpha=0.4) +
                    geom_point(data=df, color="blue", alpha=0.6) +
                    scale_color_manual(values = rep(c("grey40", "grey60"), nCHR)) +
                    scale_x_continuous(label = axis.set$CHR_TWAS, breaks = axis.
      →set$center) +
                    scale_y_continuous(expand = c(0,0), limits = c(-15, 15)) + labs(x_{\perp}
      \Rightarrow= NULL. v = "Z-score") +
                    geom_hline(yintercept = 0, color = "black", linetype = "solid") +
                    #geom_text(data=head(df, 10), fontface = "bold", #hjust=1,__
      \rightarrow v just=1,
                               #position=position_jitter(width=1, height=1),
                                aes(x=BPcum, y=TWAS.Z, label=New_ID)) +
                    theme minimal(base size=20) +
                    theme(legend.position="none", panel.border=element_blank(),
                          panel.grid.major=element_blank(),panel.grid.

→minor=element_blank())
                  )
     manhplot2
```

P0

 $\langle int \rangle$

223423

193206

123232

736449

638338

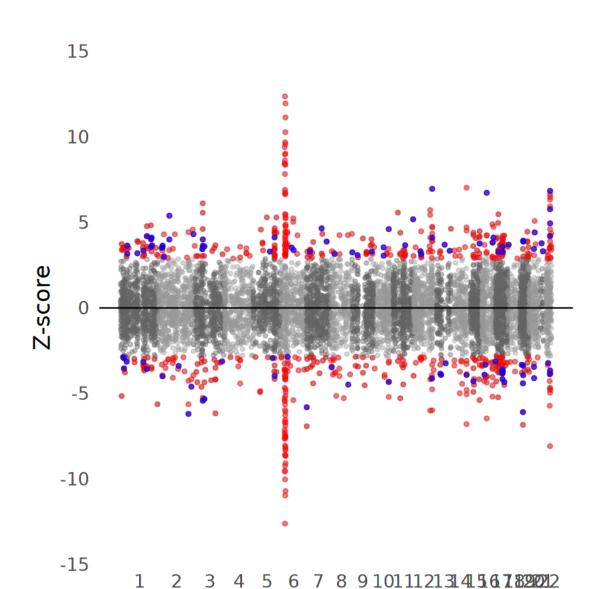
299952

420583

199760

528132

421380



```
[10]: save_plots <- function(p, fn){
    for(ext in c('.png', '.pdf', '.svg')){
        ggsave(pasteO(fn,ext), p, width=30, height=15, units="cm")
    }
}</pre>
```

1.0.3 Save plots

```
[11]: save_plots(manhplot1, 'caudateOnly_twas_manhattanplot')
save_plots(manhplot2, 'twas_manhattanplot')
```

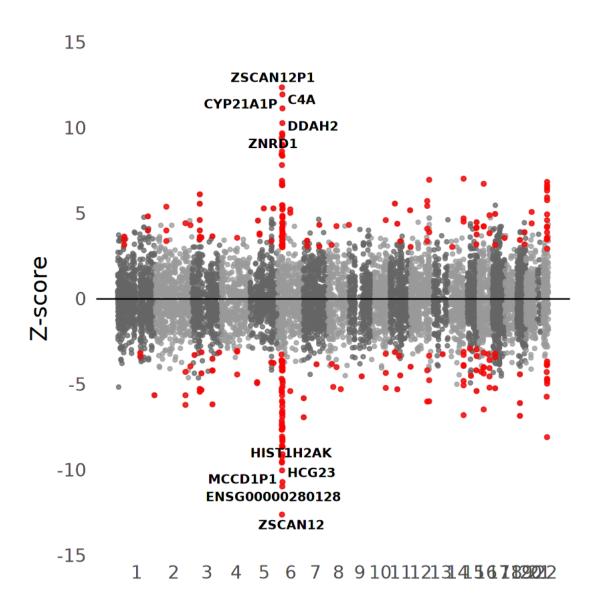
1.0.4 TWAS in GWAS loci, caudate

```
[12]: df = twas_dat[twas_dat$Bonferroni < 0.05 & twas_dat$P<5e-8, ]
df = head(df[order(df$FDR), ], 10)
df</pre>
```

```
BEST.GWAS.ID
                                            FILE
                                                              ID
                                                                                 CHR TWAS
                                                                                              Ρ(
                          <chr>
                                            <chr>
                                                              <chr>
                                                                                 <int>
                                                                                               <i
                                                              ZSCAN12
                                                                                              28
                    6842
                          chr6:28744470:A:G
                                            ENSG00000158691
                                                                                 6
                                                              ZSCAN12P1
                    6831
                          chr6:28426903:C:T
                                            ENSG00000219891
                                                                                 6
                                                                                              28
                    6912
                          chr6:31793436:G:A ENSG00000244731
                                                              C4A
                                                                                 6
                                                                                              31
                                                              CYP21A1P
                                                                                              32
                    6913
                          chr6:31793436:G:A
                                            ENSG00000204338
                                                                                 6
A data.frame: 10 \times 49
                    6876
                          chr6:30762705:G:T
                                            ENSG00000280128
                                                              ENSG00000280128
                                                                                 6
                                                                                              30
                    6921
                          chr6:32231204:C:T
                                            ENSG00000228962
                                                              HCG23
                                                                                 6
                                                                                              32
                    6905
                          chr6:31348749:T:C
                                            ENSG00000213722
                                                              DDAH2
                                                                                 6
                                                                                              31
                                                                                              29
                    6853
                          chr6:29445226:C:T
                                            ENSG00000235963
                                                              MCCD1P1
                                                                                 6
                    6861
                          chr6:29591461:T:C
                                            ENSG00000066379
                                                              ZNRD1
                                                                                 6
                                                                                              30
                    6828
                         chr6:28071151:G:A ENSG00000275221
                                                              HIST1H2AK
                                                                                 6
                                                                                              27
```

```
[13]: manhplot1 <- (ggplot(twas dat, aes(x=BPcum, y=TWAS.Z)) +
                     geom_point(aes(color=as.factor(CHR_TWAS)), alpha=0.75, size=1.25)_
                     geom_point(data=twas_dat[twas_dat$FDR < 0.05 & twas_dat$P<5e-8,_</pre>
       \rightarrow], color="red", alpha=0.75) +
                     scale_color_manual(values = rep(c("grey40", "grey60"), nCHR)) +
                     scale x continuous(label = axis.set$CHR TWAS, breaks = axis.
       ⇒set$center) +
                     scale_y_continuous(expand = c(0,0), limits = c(-15, 15)) + labs(x_{\sqcup}
       \Rightarrow= NULL, y = "Z-score") +
                     geom_hline(yintercept = 0, color = "black", linetype = "solid") +
                     ggrepel::geom text repel(data=df, fontface = "bold", #hjust=1,__
       \rightarrow v just=1,
                                                #position=position_jitter(width=1,__
       \rightarrow height=1),
                                                aes(x=BPcum, y=TWAS.Z, label=New ID)) +
                     theme_minimal(base_size=20) +
                     theme(legend.position="none", panel.border=element_blank(),
                            panel.grid.major=element_blank(),panel.grid.

→minor=element_blank())
      manhplot1
```



1.0.5 Overlapping tissue in significant GWAS loci

```
overlapping = read.delim('../../_m/overlapping_tissue_twasList.txt')

overlapping = subset(overlapping, P>5e-8, select=c('our_snp_id', 'FILE', 'ID', 

→'CHR_TWAS',

'BEST.GWAS.ID', 'P', 'TWAS.

→Z', 'TWAS.P', 'FDR'))

overlapping = overlapping[order(overlapping$FDR), ]

merge(head(overlapping['FILE'], 10), twas_dat, by='FILE')
```

```
FILE
                                                                              CHR TWAS
                                                                                            P0
                          <chr>
                                             <chr>
                                                                  <chr>
                                                                              <int>
                          ENSG00000088298
                                             chr20:35145275:T:C
                                                                 EDEM2
                                                                              20
                                                                                            35115357
                          ENSG00000108384
                                             chr17:58681018:A:G
                                                                 RAD51C
                                                                              17
                                                                                            58692573
                          ENSG00000113141
                                             chr5:140841554:G:A
                                                                 ΙK
                                                                              5
                                                                                            140647058
                          ENSG00000115649
                                             chr2:219196879:T:C
                                                                 CNPPD1
                                                                              2
                                                                                            219171897
     A data.frame: 10 \times 49
                          ENSG00000117593
                                             chr1:173743105:T:C
                                                                 DARS2
                                                                              1
                                                                                            173824503
                          ENSG00000140265
                                                                 ZSCAN29
                                                                              15
                                             chr15:43782086:A:G
                                                                                            43358172
                          ENSG00000146830
                                             chr7:100717894:A:G
                                                                 GIGYF1
                                                                              7
                                                                                            100679507
                                                                              12
                          ENSG00000157837
                                             chr12:121244248:T:C
                                                                 SPPL3
                                                                                            120762510
                          ENSG00000164758
                                            chr8:117545237:G:A
                                                                 MED30
                                                                              8
                                                                                            117520713
                          ENSG00000238083 chr17:46288008:C:T
                                                                 LRRC37A2
                                                                             17
                                                                                            46511511
[15]: df = merge(overlapping['FILE'], twas dat, by='FILE')
      df = df[order(df$FDR), ]
      manhplot2 <- (ggplot(twas_dat, aes(x=BPcum, y=TWAS.Z)) +</pre>
                     geom point(aes(color=as.factor(CHR TWAS)), alpha=0.75, size=1.25),
       \hookrightarrow+
                     #qeom_point(data=twas_dat[twas_dat$FDR < 0.05 & twas_dat$P<5e-8,_
       \rightarrow], color="red", alpha=0.75) +
                     geom point(data=df, color="blue", alpha=0.75) +
                     scale_color_manual(values = rep(c("grey40", "grey60"), nCHR)) +
                     scale x continuous(label = axis.set$CHR TWAS, breaks = axis.
       ⇒set$center) +
                     scale_y_continuous(expand = c(0,0), limits = c(-15, 15)) + labs(x_{\sqcup}
       ⇒= NULL, y = "Z-score") +
                     geom_hline(yintercept = 0, color = "black", linetype = "solid") +
                     ggrepel::geom_text_repel(data=head(df, 10), fontface = "bold", __
       \rightarrow#hjust=1, vjust=1,
                                               #position=position jitter(width=1,...
       \rightarrow height=1),
                                               aes(x=BPcum, y=TWAS.Z, label=New ID)) +
                     theme_minimal(base_size=20) +
                     theme(legend.position="none", panel.border=element blank(),
                           panel.grid.major=element_blank(),panel.grid.
       →minor=element blank())
      manhplot2
```

ID

BEST.GWAS.ID

Ρ

<

35

58

14

21

17

43

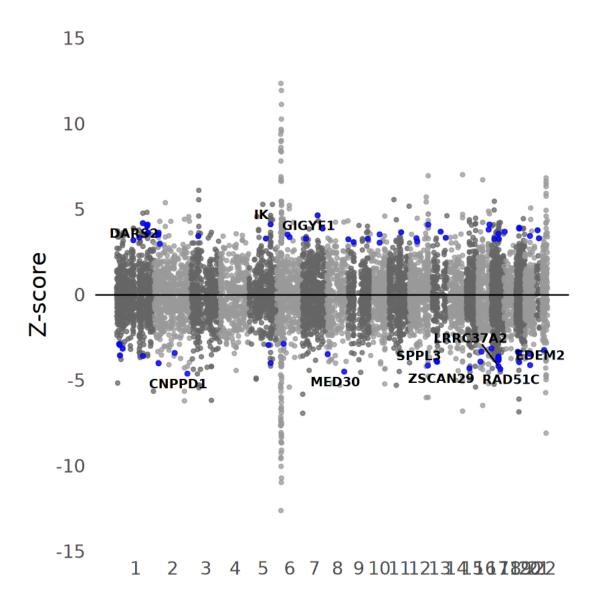
10

 1^2

11

46

<int>



1.0.6 Caudate only in significant GWAS loci

```
FILE
                                                                  ID
                                                                                     CHR TWAS
                                             BEST.GWAS.ID
                          <chr>
                                             <chr>
                                                                  < chr >
                                                                                     <int>
                                                                                     2
                          ENSG00000153820
                                             chr2:228452776:C:T
                                                                  SPHKAP
                          ENSG00000178917
                                             chr3:44034110:G:A
                                                                  ZNF852
                                                                                     3
                          ENSG00000183379
                                             chr14:74416653:A:C
                                                                  SYNDIG1L
                                                                                     14
                          ENSG00000183831
                                             chr1:173743105:T:C
                                                                  ANKRD45
                                                                                     1
     A data.frame: 10 \times 49
                          ENSG00000204963
                                             chr5:140841554:G:A
                                                                  PCDHA7
                                                                                     5
                          ENSG00000242866
                                                                  STRC
                                             chr15:43782086:A:G
                                                                                     15
                          ENSG00000262074
                                             chr17:19250104:T:C
                                                                  SNORD3B-2
                                                                                     17
                          ENSG00000269938
                                             chr12:123996254:A:G
                                                                  ENSG00000269938
                                                                                     12
                          ENSG00000279726
                                             chr5:140841554:G:A
                                                                  ENSG00000279726
                                                                                     5
                          ENSG00000283361 chr13:114134675:T:C
                                                                  ENSG00000283361
                                                                                    13
[17]: df2 = merge(caudate only['FILE'], twas dat, by='FILE')
      df2 = df2[order(df2$FDR), ]
      manhplot3 <- (ggplot(twas_dat, aes(x=BPcum, y=TWAS.Z)) +</pre>
                     geom point(aes(color=as.factor(CHR TWAS)), alpha=0.75, size=1.25);;
       \hookrightarrow+
                     #qeom_point(data=twas_dat[twas_dat$FDR < 0.05 & twas_dat$P<5e-8,_
       \rightarrow], alpha=0.75, color="red") +
                     #geom point(data=df, color="blue", alpha=0.75) +
                     geom_point(data=df2, color="green", alpha=0.75) +
                     scale color manual(values = rep(c("grey40", "grey60"), nCHR)) +
                     scale_x_continuous(label = axis.set$CHR_TWAS, breaks = axis.
       ⇒set$center) +
                     scale_y_continuous(expand = c(0,0), limits = c(-15, 15)) + labs(x_{\sqcup}
       \Rightarrow= NULL, v = "Z-score") +
                     geom hline(yintercept = 0, color = "black", linetype = "solid") +
                     ggrepel::geom text repel(data=head(df2, 10), fontface = "bold",,,
       \hookrightarrow#hjust=1, vjust=1,
                                               #position=position_jitter(width=1,__
       \rightarrow height=1),
                                               aes(x=BPcum, y=TWAS.Z, label=New_ID)) +
                     theme minimal(base size=20) +
                     theme(legend.position="none", panel.border=element_blank(),
                           panel.grid.major=element blank(),panel.grid.
       →minor=element_blank())
      manhplot3
```

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227979

444989

744058

173609

140834

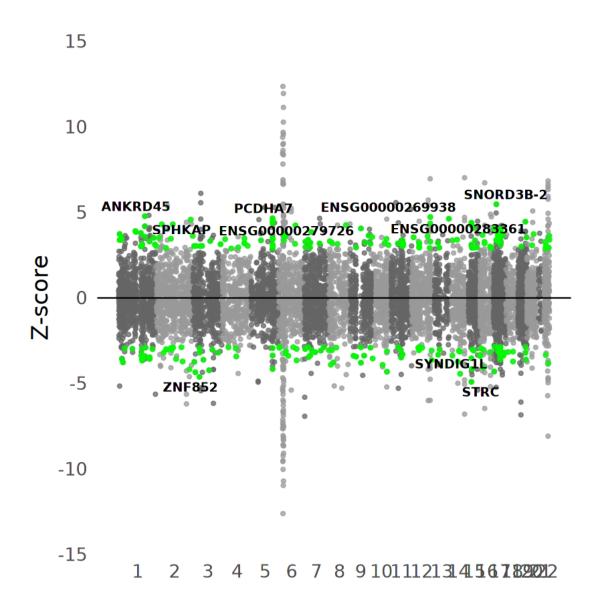
435993

190633

123968

140788

114179



1.0.7 No labels

```
scale_y_continuous(expand = c(0,0), limits = c(-15, 15)) + labs(x_□

⇒= NULL, y = "Z-score") +

geom_hline(yintercept = 0, color = "black", linetype = "solid") +

#geom_text(data=subset(twas_dat, FDR < 0.05), hjust=-0.2,□

→aes(x=BPcum, y=TWAS.Z, label=ID)) +

theme_minimal(base_size=20) +

theme(legend.position="none", panel.border=element_blank(),

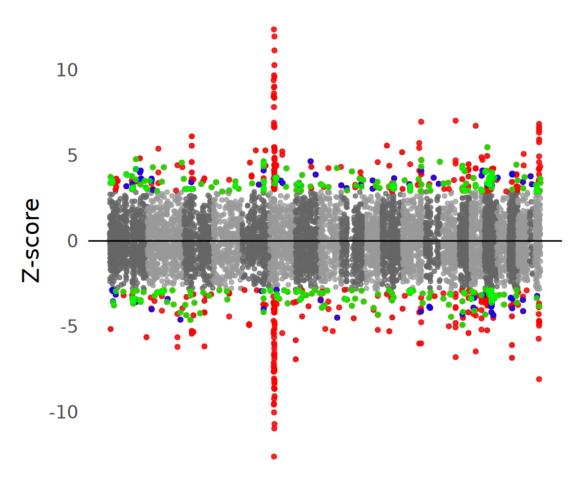
panel.grid.major=element_blank(),panel.grid.

→minor=element_blank())

)

manhplot0
```





-15 1 2 3 4 5 6 7 8 9 10111213**1.4.5.6.7.82021**2

1.1 Save plots

```
[19]: save_plots(manhplot0, 'noLabel_twas_manhattanplot')
save_plots(manhplot1, 'topSig_twas_manhattanplot')
save_plots(manhplot2, 'sharedTop_twas_manhattanplot')
save_plots(manhplot3, 'caudateTop_twas_manhattanplot')
```