FunciSNP: Functional Identification of SNPs with Phenotype by Coincidence with Chromatin Biofeatures Vignette

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Introduction

Load FunciSNP+other useful libraries

```
> #When package is offically posted in Bioconductor, uncomment next 2 lines.
> #source("http://bioconductor.org/biocLite.R")
> #biocLite("FunciSNP");
> ## Following two packages and options() are not required to run 'FunciSNP' but
> #will enhance the analysis experience.
> #library(setwidth); ## Automatically set the value of options("width") when the
> #terminal emulator is resized
> #library(colorout); ## colorize R output on terminal emulators
> options(width=80);
> ##FunciSNP library and other related libraries needed.
> library("org.Hs.eg.db");
> library("gplots");
> library("gtools");
> library("gtools");
> library("matlab");
```

```
> library(FunciSNP);
> package.version("FunciSNP");
[1] "0.1.7"
```

Identify Func-y-SNP using published GWAS SNPs and publicly available biological features (ENCODE ChIPseq peaks)

FunciSNP()

This is the main funtion of FunciSNP. It will identify correlated SNPs which are in linkage disequilibrium (LD) to a known disease associated tagSNP. It will also determine if the correlated SNP in LD to the tagSNP overlaps a genomic biological feature. Correlated SNPs are directly imported from the current public release of the 1000 genomes database. 1000 genomes ftp servers available for the 1000 genomes public data: 1) National Center for Biotechnology Information (NCBI) ftp://ftp-trace.ncbi.nih.gov/1000genomes/; 2) European Bioinformatics Institute (EBI) ftp://ftp.1000genomes.ebi.ac.uk/vol1/.

Correlated SNPs in LD to a tagSNP and overlapping genomic biological features are known as putative functional SNPs (also defined as 'Func-y-SNP' elsewhere in the package.).

As an example, we collected SNPs identified by GWAS for Glioblastoma multiforme (GBM). In this example, GBM includes lower grade glioma, thus we label all objects with 'glioma'.

```
> ## Full path to the example GWAS SNP regions file for Glioblastoma
> # (collected from SNPedia on Jan 2012)
> glioma.snp <- file.path(system.file('data', package='FunciSNP'),
+ dir(system.file('data',package='FunciSNP'), pattern='.snp$'));
> glioma.snp;
[1] "/home/houtan/R/x86_64-pc-linux-gnu-library/2.14/FunciSNP/data/glioma.snp"
> ## Full path to the example biological features BED files
> # derived from the ENCODE project for Glioblastoma U-87 cell lines.
> glioma.bio <- system.file('extdata',package='FunciSNP');</pre>
> glioma.bio;
[1] "/home/houtan/R/x86_64-pc-linux-gnu-library/2.14/FunciSNP/extdata"
> ## FunciSNP analysis, extracts correlated SNPs from the
> # 1000 genomes db ("ncbi" or "ebi") and finds overlaps between
> # correlated SNP and biological features and then
> # calculates LD (Rsquare, Dprime, distance, p-value).
> glioma <- FunciSNP(snp.regions.file=glioma.snp, bio.features.loc = glioma.bio,
+ bio.features.TSS=FALSE);
Func-y-SNPs identified!!
Annotation will begin
```

~ ~

Adding lincRNA ... done Adding gene annotations

Adding symbol ... done Adding refseq ... done prepare output ... done

Adding genomic annotations ... done

Now do the FunciStuff!

> glioma;

TagSNP List with 9 Tag SNPs and

969 nearby, potentially correlated SNPs, that overlap at least one biofeature $\$ R squared: 0.1

	Total	R.squared.cuff.0.1	Percent
tagSNPs	7	5	71.43
1kSNPs	969	79	8.15
bio.features	3	3	100.00

\$`R squared: 0.5`

Total R.squared.cuff.0.5 Percent tagSNPs 7 3 42.86 1kSNPs 969 44 4.54 bio.features 2 2 100.00

\$`R squared: 0.9`

Total R.squared.cuff.0.9 Percent tagSNPs 7 1 14.29 1kSNPs 969 15 1.55 bio.features 2 2 100.00

> summary(glioma);

TagSNP List with $\, 9 \,$ Tag SNPs and

969 nearby, potentially correlated SNPs, that overlap at least one biofeature Number of potentially correlated SNPs

overlapping at least ${\tt x}$ biofeatures, per Tag SNP at an R squared of

\$`R squared: 0.1 in 6 Tag SNPs with a total of `

	bio.1	bio.2	bio.3	bio.4
rs11979158	4	1	0	0
rs2252586	1	0	0	0
rs4977756	3	0	0	0
rs498872	12	8	2	2
rs6010620	59	53	9	9
TOTAL # CORRELATED SNPS	79	62	11	11

rs4977756	2	0	0	0
rs498872	2	2	0	0
rs6010620	40	39	2	2
TOTAL # CORRELATED SNPS	44	41	2	2

\$`R squared: 0.9 in 2 Tag SNPs with a total of `

rs6010620 bio.1 bio.2 TOTAL # CORRELATED SNPS 15 12

- > ## The glioma example set can also be called by the following line if you don't
- > #want to redo the initial analysis.
- > data(glioma);
- > glioma;

TagSNP List with 9 Tag SNPs and

	Total	R.squared.cuff.0.1	Percent
tagSNPs	7	5	71.43
1kSNPs	969	79	8.15
bio.features	3	3	100.00

\$`R squared: 0.5`

Total R.squared.cuff.0.5 Percent tagSNPs 7 3 42.86 1kSNPs 969 44 4.54 bio.features 2 2 100.00

\$`R squared: 0.9`

Total R.squared.cuff.0.9 Percent tagSNPs 7 1 14.29 1kSNPs 969 15 1.55 bio.features 2 2 100.00

> summary(glioma);

TagSNP List with 9 Tag SNPs and

969 nearby, potentially correlated SNPs, that overlap at least one biofeature Number of potentially correlated SNPs

overlapping at least ${\tt x}$ biofeatures, per Tag SNP at an R squared of

\$`R squared: 0.1 in 6 Tag SNPs with a total of `

	bio.1	bio.2	bio.3	bio.4
rs11979158	4	1	0	0
rs2252586	1	0	0	0
rs4977756	3	0	0	0
rs498872	12	8	2	2
rs6010620	59	53	9	9
TOTAL # CORRELATED SNPS	79	62	11	11

```
bio.1 bio.2 bio.3 bio.4
rs4977756
                              2
                                     0
                                            \cap
rs498872
                              2
                                     2
                                            0
                                                  0
rs6010620
                             40
                                    39
                                            2
                                                  2
TOTAL # CORRELATED SNPS
                             44
                                    41
                                            2
                                                  2
$`R squared: 0.9 in 2 Tag SNPs with a total of `
                          bio.1 bio.2
rs6010620
                             15
                                    12
TOTAL # CORRELATED SNPS
                                    12
                             15
```

FunciSNPAnnotateSummary()

All known genomic features (exon, intron, 5'UTR, 3'UTR, promoter, lincRNA or in gene desert (intergentic)) are used to annotate the newly identified Funcy-SNP. Information described in this data.frame is used for all summary plots, table, and bed file generations.

```
> glioma.anno <- FunciSNPAnnotateSummary(glioma);</pre>
> summary(glioma.anno);
 chromosome
                    bio.feature.start bio.feature.end
Length: 1800
                    Min.
                           :1.20e+06
                                        Min.
                                               :1.20e+06
Class : character
                    1st Qu.:6.23e+07
                                        1st Qu.:6.23e+07
Mode :character
                    Median :6.23e+07
                                        Median :6.23e+07
                            :6.96e+07
                                                :6.96e+07
                    Mean
                                        Mean
                    3rd Qu.:6.24e+07
                                        3rd Qu.:6.24e+07
                    Max.
                                                :1.31e+08
                            :1.31e+08
                                        Max.
             bio.feature
                                     corr.snp.id
                                                   corr.snp.position
knownGene.TSS.hg19: 695
                            chr11:118442863:
                                                           :1.20e+06
TFBS_Nrsf_U87
                      26
                            chr11:118443036:
                                                   1st Qu.:6.23e+07
TFBS_Pol2_U87
                   :1079
                            chr11:118443046:
                                               4
                                                   Median :6.23e+07
                                                           :6.96e+07
                            chr11:118478342:
                                               4
                                                   Mean
                            chr20:62289690 :
                                               4
                                                   3rd Qu.:6.24e+07
                            chr20:62289873 :
                                               4
                                                   Max.
                                                           :1.31e+08
                            (Other)
                                           :1776
                                          D.prime
      tag.snp.id
                   tag.snp.position
                                                             R.squared
rs11979158: 143
                   Min.
                          :1.29e+06
                                              :7.84e-04
                                                           Min.
                                                                  :9.52e-08
                                       Min.
rs2252586 :
              17
                   1st Qu.:6.23e+07
                                       1st Qu.:9.13e-01
                                                           1st Qu.:1.17e-03
                   Median :6.23e+07
rs2736100 :
              96
                                       Median :1.00e+00
                                                          Median :5.45e-03
rs4295627 :
              37
                   Mean
                          :6.96e+07
                                       Mean
                                              :8.87e-01
                                                           Mean
                                                                  :1.40e-01
rs4977756 :
              25
                   3rd Qu.:6.23e+07
                                       3rd Qu.:1.00e+00
                                                           3rd Qu.:8.70e-02
rs498872 : 332
                   Max.
                          :1.31e+08
                                       Max.
                                              :1.00e+00
                                                           Max.
                                                                  :1.00e+00
                                       NA's
                                                           NA's
                                                                  :1.12e+03
rs6010620 :1150
                                              :1.12e+03
   p.value
                     distance.from.tag population.count population
        :2.11e-163
                     Min.
                            :-100000
                                        Min.
                                               :286
                                                          ASN:837
1st Qu.: 1.00e+00
                     1st Qu.:
                                 -731
                                        1st Qu.:286
                                                          EUR:963
Median : 1.00e+00
                                        Median:379
                     Median :
                               15546
Mean
      : 8.21e-01
                     Mean
                                 8971
                                        Mean
                                              :336
3rd Qu.: 1.00e+00
                     3rd Qu.:
                                27362
                                        3rd Qu.:379
```

```
nearest.lincRNA.ID nearest.lincRNA.distancetoFeature
 TCONS_00010241: 96
                         Min.
                                :-375171
 TCONS_00013806: 160
                         1st Qu.:-160171
                         Median: 57264
 TCONS_00014564: 37
 TCONS_00015797: 25
                         Mean : -21083
 TCONS_00020001: 332
                         3rd Qu.: 71934
 TCONS_00027984: 52
                         Max.
                                : 246019
 TCONS_00028269:1098
                             nearest.TSS.GeneSymbol
 nearest.lincRNA.coverage
 downstream: 1105
                          TNFRSF6B
                                        :610
          : 21
 inside
                          PHLDB1
                                        :172
 upstream : 674
                          ZGPAT
                                        :136
                          EGFR
                                        : 77
                          RTEL1; TNFRSF6B: 74
                          (Other)
                                        :391
                          NA's
                                        :340
     nearest.TSS.ensembl nearest.TSS.coverage nearest.TSS.distancetoFeature
 ENSG00000243509:610
                          downstream:240
                                               Min.
                                                      :-93691
                          inside
                                  :664
                                               1st Qu.: -3652
 ENSG00000019144:172
 ENSG00000197114:136
                          upstream :896
                                               Median :
                                               Mean
 ENSG00000229299:118
                                                      : 2926
 ENSG00000224057: 82
                                               3rd Qu.: 2781
 ENSG00000146648: 77
                                               Max.
                                                      : 80077
 (Other)
 Promoter
                        Exon
                                  Intron
                                             utr3
                                                       Intergenic
             utr5
 NO:1495
            NO:1725
                       NO:1629
                                  NO:811
                                            NO:1508
                                                       NO:1670
 YES: 305
            YES: 75
                       YES: 171
                                  YES:989
                                            YES: 292
                                                       YES: 130
> dim(glioma.anno)
[1] 1800
           28
> head(glioma.anno)
                                                chromosome bio.feature.start
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                         7
                                                                     55085725
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                          7
                                                                     55085725
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                          7
                                                                     55085725
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                          7
                                                                     55086315
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                          7
                                                                     55085725
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                                     55086315
                                                bio.feature.end
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                       55086824
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                       55086824
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                       55086824
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                       55087150
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                       55086824
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                       55087150
```

Max.

: 1.00e+00

Max.

: 95365

:379

Max.

```
bio.feature
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19 knownGene.TSS.hg19
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19 knownGene.TSS.hg19
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19 knownGene.TSS.hg19
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                      TFBS_Pol2_U87
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19 knownGene.TSS.hg19
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                      TFBS_Pol2_U87
                                                   corr.snp.id corr.snp.position
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19 chr7:55085731
                                                                         55085731
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19 chr7:55085897
                                                                         55085897
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19 chr7:55086373
                                                                         55086373
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                                         55086373
                                                 chr7:55086373
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19 chr7:55086393
                                                                         55086393
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                 chr7:55086393
                                                                         55086393
                                                 tag.snp.id tag.snp.position
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19 rs11979158
                                                                     55159349
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19 rs11979158
                                                                     55159349
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19 rs11979158
                                                                     55159349
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                 rs11979158
                                                                     55159349
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19 rs11979158
                                                                     55159349
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                 rs11979158
                                                                     55159349
                                                 D.prime R.squared p.value
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                      NA
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                      NA
                                                                NΑ
                                                                          1
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                      NΑ
                                                                NΑ
                                                                          1
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                      NA
                                                                NA
                                                      NA
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                      NA
                                                                NA
                                                 distance.from.tag
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                            -73618
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                            -73452
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                            -72976
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                            -72976
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                            -72956
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                            -72956
                                                 population.count population
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                              379
                                                                          EUR
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                              379
                                                                          EUR
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                              379
                                                                          EUR
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                              379
                                                                          EUR
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                              379
                                                                          EUR
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                                          EUR
                                                              379
                                                 nearest.lincRNA.ID
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                     TCONS_00013806
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                     TCONS_00013806
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                     TCONS_00013806
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                     TCONS_00013806
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                     TCONS_00013806
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                     TCONS_00013806
```

nearest.lincRNA.distancetoFeature

```
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                                            -206188
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                                            -206354
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                                            -206830
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                                            -206830
                                                                            -206850
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                                            -206850
                                                 nearest.lincRNA.coverage
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                                  upstream
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                                  upstream
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                                  upstream
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                                  upstream
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                                  upstream
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                                  upstream
                                                 nearest.TSS.GeneSymbol
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                                    EGFR
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                                    EGFR
                                                                    EGFR
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                                    EGFR
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                                    EGFR
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                                    EGFR
                                                 nearest.TSS.ensembl
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                     ENSG00000146648
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                     ENSG00000146648
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                     ENSG00000146648
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                     ENSG00000146648
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                     ENSG00000146648
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                     ENSG00000146648
                                                 nearest.TSS.coverage
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                             upstream
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                             upstream
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                             upstream
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                             upstream
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                             upstream
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                             upstream
                                                 nearest.TSS.distancetoFeature
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                                           -983
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                                           -817
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                                           -341
                                                                           -341
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                                           -321
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                                           -321
                                                 Promoter utr5 Exon Intron utr3
                                                                  NO
                                                                         NO
                                                                              NO
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19
                                                      YES
                                                            ΝO
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19
                                                      YES
                                                            NO
                                                                  NO
                                                                         NO
                                                                              NO
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19
                                                      YES
                                                            NO
                                                                  NO
                                                                         NO
                                                                              NO
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87
                                                      YES
                                                            NO
                                                                  NO
                                                                         NO
                                                                              NO
                                                                         NΩ
                                                                              NO
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19
                                                      YES
                                                            NΩ
                                                                  NO
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87
                                                      YES
                                                            NO
                                                                  NO
                                                                         NO
                                                                              NO
```

Intergenic

```
rs11979158:EUR.chr7:55085731.knownGene.TSS.hg19 NO
rs11979158:EUR.chr7:55085897.knownGene.TSS.hg19 NO
rs11979158:EUR.chr7:55086373.knownGene.TSS.hg19 NO
rs11979158:EUR.chr7:55086373.TFBS_Pol2_U87 NO
rs11979158:EUR.chr7:55086393.knownGene.TSS.hg19 NO
rs11979158:EUR.chr7:55086393.TFBS_Pol2_U87 NO
```

> names(glioma.anno)

```
[1] "chromosome"
                                           "bio.feature.start"
 [3] "bio.feature.end"
                                           "bio.feature"
 [5] "corr.snp.id"
                                           "corr.snp.position"
 [7] "tag.snp.id"
                                           "tag.snp.position"
[9] "D.prime"
                                           "R.squared"
[11] "p.value"
                                           "distance.from.tag"
[13] "population.count"
                                           "population"
[15] "nearest.lincRNA.ID"
                                           "nearest.lincRNA.distancetoFeature"
[17] "nearest.lincRNA.coverage"
                                           "nearest.TSS.GeneSymbol"
[19] "nearest.TSS.refseq"
                                           "nearest.TSS.ensembl"
[21] "nearest.TSS.coverage"
                                           "nearest.TSS.distancetoFeature"
[23] "Promoter"
                                           "utr5"
[25] "Exon"
                                           "Intron"
[27] "utr3"
                                           "Intergenic"
```

FunciSNPtable()

Using a specified Rsquare value (0-1) to subset the data, a table is generated which summarizes the total number of Func-y-SNPs, associated tagSNPs, and number of overlapping biofeatures. This will provide user a first look at the total number of available Func-y-SNP at a particular Rsquare cutoff. If geneSum is set to TRUE, a list of gene names is reported instead.

> FunciSNPtable(glioma.anno, rsq=0.5);

```
Total R.squared.cuff.0.5 Percent tagSNPs 7 3 42.86 1kSNPs 969 44 4.54 bio.features 2 2 100.00
```

> FunciSNPtable(glioma.anno, rsq=0.5, geneSum=T);

```
Gene_Names

CDKN2B

LIME1

PHLDB1

SLC2A4RG

TNFRSF6B

TREH

ZGPAT

RTEL1;TNFRSF6B
```

FunciSNPsummaryOverlaps()

> FunciSNPsummaryOverlaps(glioma.anno)

	bio.1	bio.2	bio.3	bio.4
rs11979158	55	2	0	0
rs2252586	5	0	0	0
rs2736100	41	0	0	0
rs4295627	13	0	0	0
rs4977756	12	0	0	0
rs498872	82	18	2	2
rs6010620	294	119	17	17
TOTAL # CORRELATED SNPS	502	139	19	19

> FunciSNPsummaryOverlaps(glioma.anno, rsq=0.5)

	bio.1	bio.2	bio.3	bio.4
rs4977756	2	0	0	0
rs498872	2	2	0	0
rs6010620	40	39	2	2
TOTAL # CORRELATED SNPS	44	41	2	2

FunciSNPidsFromSummary()

> FunciSNPidsFromSummary(glioma.anno, tagsnpid="rs6010620", num.features=3, + rsq=0.5)

	chromosome bio.feature.start
rs6010620:ASN.rs1291209.knownGene.TSS.hg19	20 62329895
rs6010620:ASN.rs1291209.TFBS_Pol2_U87	20 62326155
rs6010620:EUR.rs1291209.knownGene.TSS.hg19	20 62329895
rs6010620:EUR.rs1291209.TFBS_Pol2_U87	20 62326155
rs6010620:ASN.rs1295810.knownGene.TSS.hg19	20 62329895
rs6010620:ASN.rs1295810.TFBS_Pol2_U87	20 62326155
rs6010620:EUR.rs1295810.knownGene.TSS.hg19	20 62329895
rs6010620:EUR.rs1295810.TFBS_Pol2_U87	20 62326155
	bio.feature.end bio.feature
rs6010620:ASN.rs1291209.knownGene.TSS.hg19	62330994 knownGene.TSS.hg19
rs6010620:ASN.rs1291209.TFBS_Pol2_U87	62337392 TFBS_Po12_U87
rs6010620:EUR.rs1291209.knownGene.TSS.hg19	62330994 knownGene.TSS.hg19
rs6010620:EUR.rs1291209.TFBS_Pol2_U87	62337392 TFBS_Po12_U87
rs6010620:ASN.rs1295810.knownGene.TSS.hg19	62330994 knownGene.TSS.hg19
rs6010620:ASN.rs1295810.TFBS_Pol2_U87	62337392 TFBS_Po12_U87
rs6010620:EUR.rs1295810.knownGene.TSS.hg19	62330994 knownGene.TSS.hg19
rs6010620:EUR.rs1295810.TFBS_Pol2_U87	62337392 TFBS_Po12_U87
	corr.snp.id corr.snp.position
rs6010620:ASN.rs1291209.knownGene.TSS.hg19	rs1291209 62330439
rs6010620:ASN.rs1291209.TFBS_Pol2_U87	rs1291209 62330439
rs6010620:EUR.rs1291209.knownGene.TSS.hg19	rs1291209 62330439
rs6010620:EUR.rs1291209.TFBS_Pol2_U87	rs1291209 62330439
rs6010620:ASN.rs1295810.knownGene.TSS.hg19	rs1295810 62330484

```
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                              rs1295810
                                                                 62330484
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                              rs1295810
                                                                 62330484
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                              rs1295810
                                                                 62330484
                                            tag.snp.id tag.snp.position D.prime
rs6010620: ASN.rs1291209.knownGene.TSS.hg19
                                                               62309839 0.9032
                                             rs6010620
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                               62309839 0.9032
                                             rs6010620
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                                62309839 0.9204
                                             rs6010620
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                             rs6010620
                                                                62309839 0.9204
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                             rs6010620
                                                                62309839
                                                                         0.9032
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                             rs6010620
                                                                62309839
                                                                         0.9032
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                                62309839
                                                                         0.9204
                                             rs6010620
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                             rs6010620
                                                                62309839
                                                                         0.9204
                                            R.squared
                                                         p.value
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                               0.5696
                                                       2.786e-75
                                               0.5696 2.786e-75
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                               0.8092 1.555e-127
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                               0.8092 1.555e-127
rs6010620: ASN.rs1295810.knownGene.TSS.hg19
                                               0.5696 2.786e-75
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                               0.5696 2.786e-75
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                               0.8092 1.555e-127
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                               0.8092 1.555e-127
                                            distance.from.tag population.count
rs6010620: ASN.rs1291209.knownGene.TSS.hg19
                                                        20600
                                                                            286
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                        20600
                                                                            286
                                                                            379
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                        20600
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                                            379
                                                        20600
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                        20645
                                                                            286
                                                                            286
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                        20645
                                                                            379
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                        20645
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                        20645
                                                                            379
                                            population nearest.lincRNA.ID
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                                   ASN
                                                           TCONS_00028269
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                   ASN
                                                           TCONS_00028269
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                   EUR
                                                           TCONS_00028269
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                   EUR
                                                           TCONS_00028269
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                           TCONS_00028269
                                                   ASN
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                   ASN
                                                           TCONS_00028269
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                           TCONS_00028269
                                                   EUR
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                   EUR
                                                           TCONS 00028269
                                            nearest.lincRNA.distancetoFeature
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                                                         71755
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                                         71755
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                                         71755
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                                         71755
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                                         71800
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                                         71800
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                                         71800
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                                         71800
                                            nearest.lincRNA.coverage
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
```

downstream

```
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                          downstream
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                          downstream
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                          downstream
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                          downstream
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                          downstream
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                          downstream
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                          downstream
                                            nearest.TSS.GeneSymbol
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                                          TNFRSF6B
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                          TNFRSF6B
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                          TNFRSF6B
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                          TNFRSF6B
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                          TNFRSF6B
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                          TNFRSF6B
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                          TNFRSF6B
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                          TNFRSF6B
                                             nearest.TSS.refseq
rs6010620:ASN.rs1291209.knownGene.TSS.hg19 NM_003823;NP_003814
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                            NM_003823; NP_003814
rs6010620:EUR.rs1291209.knownGene.TSS.hg19 NM_003823;NP_003814
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                            NM_003823; NP_003814
rs6010620:ASN.rs1295810.knownGene.TSS.hg19 NM_003823;NP_003814
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                            NM_003823; NP_003814
rs6010620:EUR.rs1295810.knownGene.TSS.hg19 NM_003823;NP_003814
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                            NM_003823; NP_003814
                                            nearest.TSS.ensembl
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                                ENSG00000243509
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                ENSG00000243509
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                ENSG00000243509
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                ENSG00000243509
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                ENSG00000243509
                                                ENSG00000243509
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                ENSG00000243509
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                ENSG00000243509
                                            nearest.TSS.coverage
rs6010620: ASN.rs1291209.knownGene.TSS.hg19
                                                      downstream
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                      downstream
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                      downstream
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                      downstream
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                      downstream
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                      downstream
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                      downstream
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                      downstream
                                            nearest.TSS.distancetoFeature
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                                                     2418
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                                     2418
                                                                     2418
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                                     2418
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                                     2463
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                                     2463
```

```
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                                       2463
                                                                       2463
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                            Promoter utr5 Exon Intron utr3
rs6010620: ASN.rs1291209.knownGene.TSS.hg19
                                                  NΩ
                                                        NO
                                                             NΩ
                                                                    ΝO
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                  NO
                                                        NO
                                                             NO
                                                                    NO
                                                                        YES
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                  NO
                                                        NO
                                                             NO
                                                                    NO
                                                                        YES
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                   NO
                                                        NO
                                                             NO
                                                                    NO
                                                                        YES
rs6010620:ASN.rs1295810.knownGene.TSS.hg19
                                                   NO
                                                        NΩ
                                                             NΩ
                                                                    NΩ
                                                                        YES
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
                                                   NO
                                                        NΩ
                                                             NΩ
                                                                    NO
                                                                        YES
                                                   NO
                                                        NO
                                                             NO
                                                                    NO
                                                                        YES
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                   NO
                                                        NO
                                                             NO
                                                                    NO
                                                                        YES
                                             Intergenic
rs6010620:ASN.rs1291209.knownGene.TSS.hg19
                                                     NO
rs6010620:ASN.rs1291209.TFBS_Pol2_U87
                                                     NO
rs6010620:EUR.rs1291209.knownGene.TSS.hg19
                                                     NO
rs6010620:EUR.rs1291209.TFBS_Pol2_U87
                                                     NO
rs6010620: ASN.rs1295810.knownGene.TSS.hg19
                                                     NΩ
                                                     NO
rs6010620:ASN.rs1295810.TFBS_Pol2_U87
rs6010620:EUR.rs1295810.knownGene.TSS.hg19
                                                     NO
rs6010620:EUR.rs1295810.TFBS_Pol2_U87
                                                     NO
```

FunciSNPplot()

FunciSNPplot is a function developed to plot various types of plots to summarize and assist end-user in making informed discoveries of FunciSNP results. Plots can be stored in a folder for future reference.

number of correlated SNPs at each tagSNP overlapping each biological feature. Rsquare cutoff at 0.5. This plot is most informative if used with a 'rsq' value.

Will output two plots per biofeature. The first plot is a scatter plot showing the relationship between Rsquare and Distance to tagSNP for each Func-y-SNP. The second plot is a histogram distribution of number of correlated SNPs at each Rsquare value. Each set of plot is further divided by tagSNP. Best if used with 'rsq' value.

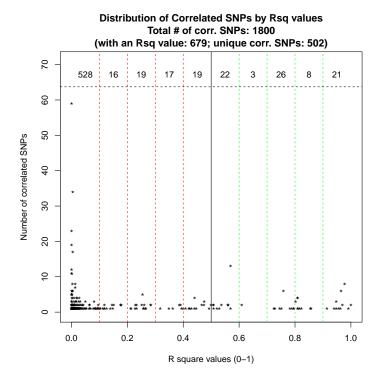


Figure 1: Distribution of Rsquare values of all Correlated SNPs

```
> ## Following will output a series of plots for each biofeature at rsq=0.5
> FunciSNPplot(glioma.anno, tagSummary=T, rsq=0.5)

Finished plotting 1 / 3
Finished plotting 2 / 3
Finished plotting 3 / 3
```

FunciSNPbed()

FunciSNPbed outputs a unique BED file which can be used to view in any genomic browser compatible with BED formats. To learn more about BED formats, see UCSC Genome Browser FAQ (http://genome.ucsc.edu/FAQ/FAQformat). Each tagSNP which is in LD to a corresponding Func-y-SNP overlapping at least one biofeature is colored black, while the Func-y-SNP is colored red. The initial position is provided by the first tagSNP and the first linked Func-y-SNP. We recommend using UCSC genome browser to view your BED files. This is useful so you can view all public and private tracks in relation to FunciSNP results.

```
> ## will output to current working directory.
> FunciSNPbed(glioma.anno, rsq=0.5);
Total corSNP (RED): 44
Total tagSNP (BLK): 3
```

Distribution of correlated SNPs for each tagSNP

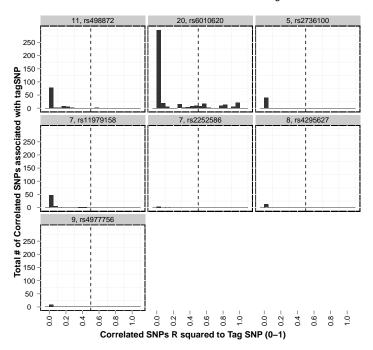


Figure 2: Distribution of Rsquare values of all Correlated SNPs divided by the tagSNP and it's location.

> sessionInfo()

R version 2.14.1 (2011-12-22)

Platform: x86_64-pc-linux-gnu (64-bit)

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=C LC_NAME=C

[9] LC_ADDRESS=C LC_TELEPHONE=C

[11] LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C

attached base packages:

[1] stats graphics grDevices datasets utils grid methods

[8] base

other attached packages:

[1]	FunciSNP_0.1.7	<pre>GenomicFeatures_1.6.7</pre>	<pre>GenomicRanges_1.6.4</pre>
[4]	IRanges_1.12.5	matlab_0.8.9	gplots_2.10.1
[7]	KernSmooth_2.23-7	caTools_1.12	bitops_1.0-4.1
[10]	gdata_2.8.2	gtools_2.6.2	org.Hs.eg.db_2.6.4

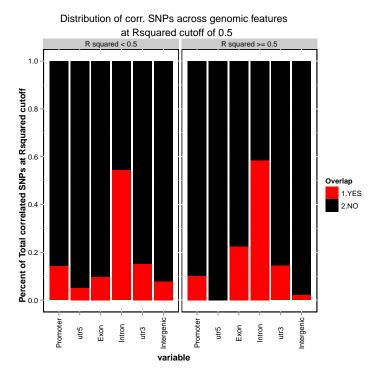


Figure 3: Stacked bar chart summarizing all correlated SNPs for each of the identified genomic features (exon, intron, 5'UTR, 3'UTR, promoter, lincRNA or in gene desert (intergentic)). Rsquare cutoff at 0.5. This plot is most informative if used with a 'rsq' value.

[13]	RSQLite_0.11.1	DBI_0.2-5	AnnotationDbi_1.16.11
[16]	Biobase_2.14.0	BiocInstaller_1.2.1	ggplot2_0.8.9
[19]	proto_0.3-9.2	reshape_0.8.4	plyr_1.7.1
[22]	setwidth_0.9-4	colorout_0.9-9	

loaded via a namespace (and not attached):

- [1] annotate_1.32.1
- [2] biomaRt_2.10.0
- [3] Biostrings_2.22.0
- [4] bit_1.1-8
- [5] BSgenome_1.22.0
- [6] ChIPpeakAnno_2.2.0
- [7] digest_0.5.1
- [8] ff_2.2-4
- [9] genefilter_1.36.0
- [10] GGBase_3.14.0
- [11] GGtools_4.0.0
- [12] GO.db_2.6.1
- [13] lattice_0.20-0

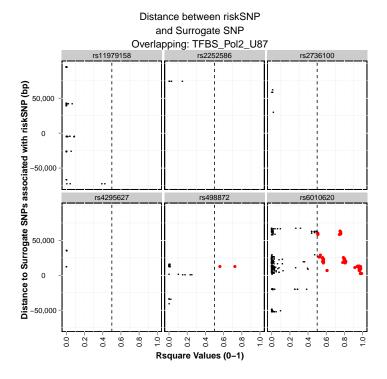


Figure 4: Scatter plot showing the relationship between Rsquare and Distance to tagSNP for each Func-y-SNP $\,$

- [14] limma_3.10.2
- [15] MASS_7.3-16
- [16] Matrix_1.0-3
- [17] multtest_2.10.0
- [18] parallel_2.14.1
- [19] RCurl_1.9-5
- [20] Rsamtools_1.6.3
- [21] rtracklayer_1.14.4
- [22] snpStats_1.4.1
- [23] splines_2.14.1
- [24] survival_2.36-12
- [25] tools_2.14.1
- [26] TxDb.Hsapiens.UCSC.hg19.knownGene_2.6.2
- [27] VariantAnnotation_1.0.5
- [28] XML_3.9-2
- [29] xtable_1.6-0
- [30] zlibbioc_1.0.0

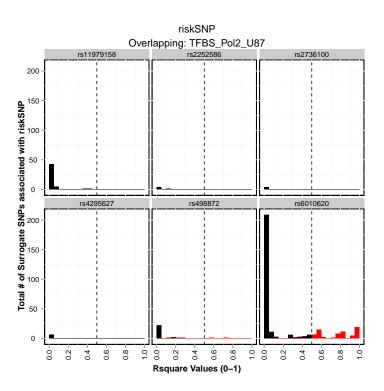


Figure 5: Histogram distribution of number of correlated SNPs at each Rsquare value $\,$