Building a genome-wide gRNA database

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Introduction

In this tutorial, we provide reproducible code to design and annotate gRNAs against all human protein-coding genes using the nuclease SpCas9.

Loading necessary packages

We first load the necessary packages:

```
library(crisprBase)
library(crisprScore)
library(crisprDesign)
library(crisprDesignData)
library(BSgenome.Hsapiens.UCSC.hg38)
```

Specifying the genome

We specify a BSGenome object that contains the DNA sequence of the human genome in hg38 coordinates: bsgenome <- BSgenome.Hsapiens.UCSC.hg38

Specifying the genome index

We specify the file path of the Bowtie index that we will need for off-target alignment:

```
bowtie_index <- "/Users/fortinj2/crisprIndices/bowtie/hg38/hg38"</pre>
```

For instructions on how to build a Bowtie index from a given reference genome, see the genome index tutorial.

Specifying a SNP VCF file

To flag gRNAs overlapping common SNPs, we specify a VCF file obtained from the dbSNP website containing common SNPs from the dbSNP151 release:

```
vcf <- "/Users/fortinj2/crisprIndices/snps/dbsnp151.grch38/00-common_all.vcf.gz"</pre>
```

The VCF file was obtained from NCBI.

Specifying the nuclease

We load a CrisprNuclease object representing the SpCas9 nuclease from the crisprBase package:

```
data(SpCas9, package="crisprBase")
crisprNuclease <- SpCas9</pre>
```

To learn how to specify or build a custom nuclease, see the nuclease tutorial.

Specifying on-target scoring methods

We specify which on-target scoring methods should be used to score the gRNAs:

```
scoring_methods <- c("deephf", "deepspcas9")</pre>
```

One can see which scoring methods are available for a given nuclease using the following command:

crisprScore::scoringMethodsInfo

```
nuclease left right
##
          method
                                                       label len
                                             type
                     SpCas9 -24
## 1
        ruleset1
                                        On-target
                                                    RuleSet1
                                                              30
## 2
         azimuth
                     SpCas9
                            -24
                                     5 On-target
                                                     Azimuth
                                                              30
                     SpCas9
                                     2 On-target
                             -20
                                                      DeepHF
                                                              23
## 3
          deephf
                     SpCas9
## 4
          lindel
                             -33
                                    31 On-target
                                                      Lindel
                                                              65
                     SpCas9
                             -20
                                     2 Off-target
                                                              23
## 5
             mit
                                                         TIM
## 6
             cfd
                     SpCas9
                             -20
                                     2 Off-target
                                                         CFD
                                                              23
## 7
        deepcpf1
                   AsCas12a
                              -4
                                    29 On-target
                                                    DeepCpf1
                                                              34
## 8
         enpamgb enAsCas12a
                              -4
                                    29 On-target
                                                     EnPAMGB
                                                              34
                     SpCas9 -26
## 9
     crisprscan
                                    8 On-target CRISPRscan
                                                              35
                      CasRx
## 10
         casrxrf
                             NA
                                    NA On-target
                                                    CasRx-RF
                                                              NΑ
## 11
        crisprai
                     SpCas9
                             -19
                                     2
                                        On-target
                                                    CRISPRai
                                                              22
                     SpCas9
## 12 crisprater
                             -20
                                    -1 On-target CRISPRater
                                                              20
## 13 deepspcas9
                     SpCas9
                             -24
                                     5 On-target DeepSpCas9
## 14
        ruleset3
                     SpCas9
                             -24
                                     5 On-target
                                                    RuleSet3
```

Specifying gene models and TSS annotations

To annotate gRNAs with a gene and TSS annotation, we need to specify a gene model formatted as a GRangesList object, as well as a TSS annotation with a GRanges object. The crisprDesignData contains such objects for both the human and mouse genomes, in GRCh38 (hg38) and GRCm38 (mm10) coordinates, respectively. Ensembl gene models were used to generate such objects. We load those objects:

```
data(txdb_human, package="crisprDesignData")
data(tss_human, package="crisprDesignData")
txObject <- txdb_human
tssObject <- tss_human</pre>
```

See the gene annotation tutorial to learn how to build such objects. The crisprDesignData also has tons of useful information.

Specifying repeat elements

To avoid designing gRNAs targeting repeat elements, we will specify a GRanges object containing repeats coordinates for the human genome. Here, we use the object gr.repeats.hg38 in crisprDesignData. It contains genomic coordinates of the RepeatMasker UCSC track, for the hg38 reference genome:

```
data(gr.repeats.hg38, package="crisprDesignData")
grRepeats <- gr.repeats.hg38</pre>
```

Building a complete annotation for a given gene

The designCompleteAnnotation function in crisprDesign provides a one-step workflow to design and annotate all gRNAs targeting a given gene. The function was designed to be as comprehensive as possible to design and annotate gRNAs in one step. It does the following:

• Extract the DNA/RNA sequences with queryTxspqueryTxDB

- Design gRNAs with findSpacers
- Remove gRNAs targeting repeat elements with removeRepeats
- Characterize spacer sequences with addSequenceFeatures
- Find on- and off-targets with addSpacerAlignmentsIterative
- Add gene annotation with addGeneAnnotation
- Add TSS annotation with addTssAnnotation
- Add on-target efficiency scores with addOnTargetScores
- Add off-target specificity scores with addOffTargetScores
- Add SNP annotation with addSNPAnnotation
- Add restriction enzymes information with addRestrictionEnzymes

Here, we design all CRISPRko gRNAs targeting the human KRAS gene (ENSG00000133703):

```
gs <- designCompleteAnnotation(queryValue="ENSG00000133703",
                               queryColumn="gene id",
                               modality="CRISPRko",
                                bsgenome=bsgenome,
                               bowtie_index=bowtie_index,
                                crisprNuclease=SpCas9,
                                txObject=txObject,
                               tssObject=tssObject,
                               grRepeats=grRepeats,
                               vcf=vcf,
                               n_mismatches=1,
                               scoring_methods=scoring_methods)
## [designCompleteAnnotation] Adding sequence statistics
## [designCompleteAnnotation] Adding spacer alignments
## Loading required namespace: crisprBwa
## [runCrisprBowtie] Using BSgenome.Hsapiens.UCSC.hg38
## [runCrisprBowtie] Searching for SpCas9 protospacers
## [runCrisprBowtie] Using BSgenome.Hsapiens.UCSC.hg38
## [runCrisprBowtie] Searching for SpCas9 protospacers
## [designCompleteAnnotation] Adding gene annotation
## [designCompleteAnnotation] Adding on-target scores
## [addOnTargetScores] Adding deephf scores.
## snapshotDate(): 2022-08-23
## see ?crisprScoreData and browseVignettes('crisprScoreData') for documentation
## loading from cache
## [addOnTargetScores] Adding deepspcas9 scores.
## [designCompleteAnnotation] Adding CFD scores annotation
## [designCompleteAnnotation] Adding SNP annotation
## [designCompleteAnnotation] Adding composite scores
The resulting object is a GuideSet object. To learn more about what are GuideSet objects, and how to
interact with them, see the CRISPRko gRNA design tutorial.
gs
```

GuideSet object with 56 ranges and 28 metadata columns:

##

##

##

```
##
      ENSG00000133703 2
                           chr12 25209896
                                                + | TTCTCGAACTAATGTATAGA
                                                - | AAATGCATTATAATGTAATC
##
      ENSG00000133703 3
                           chr12 25215438
##
      ENSG00000133703 4
                           chr12 25215477
                                                - | AGCAAAGAAGAAAAGACTCC
                                                + | TTTTTAATTTTCACACAGCC
##
      ENSG00000133703_5
                           chr12 25215477
##
                                   ...
                            . . .
##
     ENSG00000133703 52
                           chr12 25245349
                                                - | CTTGTGGTAGTTGGAGCTGG
##
     ENSG00000133703 53
                           chr12 25245352
                                                - | AAACTTGTGGTAGTTGGAGC
                                                - | GAATATAAACTTGTGGTAGT
##
     ENSG00000133703 54
                           chr12 25245358
##
     ENSG00000133703 55
                           chr12 25245365
                                                - | AATGACTGAATATAAACTTG
##
                                                + | TATATTCAGTCATTTTCAGC
     ENSG00000133703_56
                           chr12 25245392
##
                                   pam pam_site cut_site
                                                              region inRepeats
##
                        <DNAStringSet> <numeric> <numeric> <character> <logical>
##
      ENSG00000133703 1
                                   TGG 25209843
                                                  25209846
                                                             region_8
                                                                           FALSE
##
                                   AGG 25209896 25209893
                                                              region_8
                                                                           FALSE
      ENSG00000133703_2
##
      ENSG00000133703_3
                                   TGG 25215438 25215441
                                                              region_4
                                                                           FALSE
##
      ENSG00000133703_4
                                   TGG 25215477
                                                  25215480
                                                              region_4
                                                                           FALSE
##
      ENSG00000133703_5
                                   AGG 25215477
                                                  25215474
                                                              region_4
                                                                           FALSE
##
                                                              . . .
                                  . . .
                                                                            . . .
                                             . . .
                                   TGG 25245349
##
     ENSG00000133703 52
                                                  25245352
                                                              region_1
                                                                           FALSE
                                   TGG 25245352 25245355
                                                            region_1
##
     ENSG00000133703 53
                                                                           FALSE
##
    ENSG00000133703_54
                                   TGG 25245358 25245361
                                                            region_1
                                                                           FALSE
##
     ENSG00000133703 55
                                   TGG 25245365
                                                  25245368
                                                              region_1
                                                                           FALSE
##
     ENSG00000133703_56
                                   AGG 25245392 25245389
                                                              region_1
                                                                           FALSE
##
                        percentGC
                                      polyA
                                                polyC
                                                          polyG
                                                                    polyT
##
                        <numeric> <logical> <logical> <logical> <logical>
##
      ENSG00000133703 1
                               30
                                       TRUE
                                               FALSE
                                                          FALSE
                                                                    FALSE
##
      ENSG00000133703_2
                               30
                                      FALSE
                                                FALSE
                                                          FALSE
                                                                    FALSE
                               20
                                                FALSE
                                                          FALSE
                                                                    FALSE
##
      ENSG00000133703_3
                                      FALSE
##
                               40
                                      TRUE
                                                FALSE
      ENSG00000133703_4
                                                          FALSE
                                                                    FALSE
                               30
                                                FALSE
##
      ENSG00000133703_5
                                      FALSE
                                                          FALSE
                                                                     TRUE
##
                              . . .
                                                          . . .
##
     ENSG00000133703_52
                               55
                                      FALSE
                                                FALSE
                                                          FALSE
                                                                    FALSE
##
                               45
                                      FALSE
     ENSG00000133703_53
                                                FALSE
                                                          FALSE
                                                                    FALSE
##
                               30
                                      FALSE
                                                                    FALSE
     ENSG00000133703_54
                                                FALSE
                                                          FALSE
##
     ENSG00000133703 55
                               25
                                      FALSE
                                                FALSE
                                                          FALSE
                                                                    FALSE
##
     ENSG00000133703 56
                               30
                                      FALSE
                                                FALSE
                                                          FALSE
                                                                     TRUE
##
                        startingGGGGG
                                             n0
                                                 n0 c
                                                           n0 p
##
                            <logical> <numeric> <numeric> <numeric> <numeric>
##
      ENSG00000133703 1
                               FALSE
                                              1
                                                        1
                                                                  0
##
      ENSG00000133703_2
                                FALSE
                                              1
                                                        1
                                                                  Λ
                                                                             1
##
      ENSG00000133703 3
                                FALSE
                                              1
                                                                             0
##
      ENSG00000133703 4
                                FALSE
                                              1
                                                        1
                                                                  0
                                                                             0
      ENSG00000133703 5
                                FALSE
                                              1
                                                        1
                                                                  0
                                                                             0
##
##
     ENSG00000133703_52
                                FALSE
##
                                              1
                                                        1
                                                                             1
                                                                  0
##
     ENSG00000133703_53
                                FALSE
                                              1
                                                        1
                                                                             1
                                              1
                                                                  0
                                                                             1
##
     ENSG00000133703_54
                                FALSE
                                                                             2
##
                                              2
     ENSG00000133703_55
                                FALSE
##
     ENSG00000133703_56
                                FALSE
                                              2
                                                                             1
##
                             n1_c
                                       n1_p
##
                        <numeric> <numeric>
##
                                          0
      ENSG00000133703_1
                                0
##
     ENSG00000133703_2
                                0
                                          0
##
     ENSG00000133703 3
                                0
```

```
##
      ENSG00000133703 4
##
      ENSG00000133703 5
                                0
                                           0
##
     ENSG00000133703 52
##
                                0
                                           0
##
     ENSG00000133703 53
                                0
                                           0
##
     ENSG00000133703 54
                                0
                                           0
     ENSG00000133703 55
                                           0
##
                                0
##
     ENSG00000133703 56
                                           0
##
                                                                     alignments
##
                                                                  <GRangesList>
##
      ENSG00000133703_1
                         chr12:25209843:-,chr8:68551391:-,chr6:54771089:+,...
##
      ENSG00000133703 2
                                              chr12:25209896:+,chr6:54771050:-
##
      ENSG00000133703 3
                                                               chr12:25215438:-
##
      ENSG00000133703_4
                                                               chr12:25215477:-
##
      ENSG00000133703_5
                                                               chr12:25215477:+
##
##
     ENSG00000133703_52
                                              chr12:25245349:-,chr6:54770618:+
##
     ENSG00000133703 53
                                              chr12:25245352:-,chr6:54770615:+
##
                                              chr12:25245358:-,chr6:54770609:+
     ENSG00000133703_54
##
     ENSG00000133703 55 chr12:25245365:-,chr6:54770602:+,chr13:60822020:-,...
##
     ENSG00000133703 56
                            chr12:25245392:+,chr6:54770575:-,chr1:210618123:-
##
                                                                              geneAnnotation
##
                                                                        <SplitDataFrameList>
      ENSG00000133703 1 chr12:25209846:-:...,chr12:25209846:-:...,chr12:25209846:-:...,
##
      ENSG00000133703_2 chr12:25209893:+:...,chr12:25209893:+:...,chr12:25209893:+:...
##
##
      ENSG00000133703 3
                                                                        chr12:25215441:-:...
##
      ENSG00000133703_4
                                                                        chr12:25215480:-:...
##
      ENSG00000133703_5
                                                                        chr12:25215474:+:...
##
     ENSG00000133703_52 chr12:25245352:-:...,chr12:25245352:-:...,chr12:25245352:-:...,...
##
##
     ENSG00000133703_53 chr12:25245355:-:...,chr12:25245355:-:...,chr12:25245355:-:...,...
##
     ENSG00000133703_54 chr12:25245361:-:...,chr12:25245361:-:...,chr12:25245361:-:...,
     ENSG00000133703_55 chr12:25245368:-:...,chr12:25245368:-:...,chr12:25245368:-:...,...
##
##
     ENSG00000133703_56 chr12:25245389:+:...,chr12:25245389:+:...,chr12:25245389:+:...,
##
                              enzymeAnnotation score deephf score deepspcas9
##
                         <SplitDataFrameList>
                                                  <numeric>
                                                                    <numeric>
##
      ENSG00000133703 1 FALSE:FALSE:FALSE:...
                                                   0.450868
                                                                  0.427276688
##
      ENSG00000133703_2 FALSE:FALSE:FALSE:...
                                                   0.428607
                                                                  0.204131565
##
      ENSG00000133703_3 FALSE:FALSE:FALSE:...
                                                   0.292229
                                                                  0.029736991
##
      ENSG00000133703_4 FALSE:FALSE:FALSE:...
                                                   0.612286
                                                                  0.477413216
      ENSG00000133703 5 FALSE:FALSE:FALSE:...
                                                                  0.000671324
##
                                                   0.183310
##
     ENSG00000133703 52 FALSE:FALSE:FALSE:...
##
                                                   0.644286
                                                                    0.5256023
##
     ENSG00000133703_53 FALSE:FALSE:FALSE:...
                                                   0.439317
                                                                    0.3657698
##
     ENSG00000133703_54 FALSE:FALSE:FALSE:...
                                                   0.433265
                                                                    0.2556772
##
     ENSG00000133703_55 FALSE:FALSE:FALSE:...
                                                   0.671397
                                                                    0.6270906
##
     ENSG00000133703_56 FALSE:FALSE:FALSE:...
                                                   0.320574
                                                                    0.0444068
##
                        score_cfd score_mit
                                                hasSNP
##
                         <numeric> <numeric> <logical>
                                                            <SplitDataFrameList>
##
      ENSG00000133703_1 0.425027 0.426600
                                                  TRUE rs1137282:25209843:0:...
##
      ENSG00000133703_2 0.500000 0.577367
                                                 FALSE
                                                                        : . . . . . . .
                                                                        :...,...
##
      ENSG00000133703_3 1.000000
                                   1.000000
                                                 FALSE
##
      ENSG00000133703 4 1.000000
                                   1.000000
                                                 FALSE
                                                                        : . . . , . . .
      ENSG00000133703 5 1.000000 1.000000
##
                                                 FALSE
                                                                        : . . . , . . .
```

```
##
                                . . .
                                                      . . .
##
     ENSG00000133703 52 0.500000 0.547046
                                                    FALSE
                                                                            : . . . , . . .
                           0.500000
##
     ENSG00000133703 53
                                     0.619963
                                                    FALSE
##
     ENSG00000133703_54
                           0.777778
                                     0.759301
                                                    FALSE
##
     ENSG00000133703 55
                           0.458599
                                     0.489579
                                                    FALSE
     ENSG00000133703 56
                                                    FALSE
##
                           0.442623
                                     0.464868
                                                                            : . . . , . . .
##
                          score composite
                                <numeric>
##
##
      ENSG00000133703 1
                                      25.5
##
      ENSG00000133703_2
                                      16.0
##
      ENSG00000133703_3
                                       7.0
##
      ENSG00000133703_4
                                      37.0
##
      ENSG00000133703 5
                                       3.0
##
##
     ENSG00000133703_52
                                      43.0
##
     ENSG00000133703_53
                                      19.5
##
                                      17.5
     ENSG00000133703_54
##
     ENSG00000133703 55
                                      51.5
##
     ENSG00000133703_56
                                       8.0
##
##
     seqinfo: 640 sequences (1 circular) from hg38 genome
##
     crisprNuclease: SpCas9
```

Converting the GuideSet object to a list of data.frames

The flattenGuideSet function in crisprDesign is a convenience function to convert a GuideSet object into a set of data.frames that can be saved as plain text files:

```
dfs <- flattenGuideSet(gs)</pre>
```

We can look at the names of the data.frames:

```
names(dfs)
```

```
## [1] "primary" "alignments" "geneAnnotation" "enzymeAnnotation"
## [5] "snps"
```

As an example, let's look at the first rows of the primary data.frame:

head(dfs\$primary)

```
##
                    TD
                                     spacer
                                                     protospacer
                                                                   chr
                                                                          start
## 1 ENSG00000133703_1 AAAGAAAAGATGAGCAAAGA AAAGAAAAGATGAGCAAAGA chr12 25209844
## 2 ENSG00000133703_2 TTCTCGAACTAATGTATAGA TTCTCGAACTAATGTATAGA chr12 25209876
## 3 ENSG00000133703 3 AAATGCATTATAATGTAATC AAATGCATTATAATGTAATC chr12 25215439
## 4 ENSG00000133703 4 AGCAAAGAAGAAGACTCC AGCAAAGAAGACTCC chr12 25215478
## 5 ENSG00000133703 5 TTTTTAATTTTCACACAGCC TTTTTAATTTTCACACAGCC chr12 25215457
## 6 ENSG00000133703_6 TTTTTTTCAATCTGTATTGT TTTTTTCAATCTGTATTGT chr12 25215500
##
          end strand pam pam_site cut_site
                                             region inRepeats percentGC polyA
                   - TGG 25209843 25209846 region_8
                                                        FALSE
                                                                     30 TRUE
## 1 25209863
## 2 25209895
                   + AGG 25209896 25209893 region_8
                                                        FALSE
                                                                     30 FALSE
## 3 25215458
                   - TGG 25215438 25215441 region_4
                                                        FALSE
                                                                     20 FALSE
## 4 25215497
                   - TGG 25215477 25215480 region_4
                                                        FALSE
                                                                     40 TRUE
## 5 25215476
                   + AGG 25215477 25215474 region_4
                                                        FALSE
                                                                     30 FALSE
## 6 25215519
                                                                     20 FALSE
                   + CGG 25215520 25215517 region_4
                                                        FALSE
     polyC polyG polyT startingGGGGG n0 n0_c n0_p n1 n1_c n1_p score_deephf
## 1 FALSE FALSE FALSE
                               FALSE 1
                                           1
                                                0 4
                                                           0
                                                                  0.4508680
                                                        0
```

```
## 2 FALSE FALSE FALSE
                              FALSE 1
                                          1
                                               0 1
                                                                 0.4286066
## 3 FALSE FALSE FALSE
                              FALSE 1
                                          1
                                               0
                                                                 0.2922295
                                                       0
                                                            0
## 4 FALSE FALSE FALSE
                              FALSE 1
                                               0
                                                  0
                                                            0
                                                                 0.6122858
## 5 FALSE FALSE TRUE
                              FALSE 1
                                               0 0
                                                       Λ
                                                            0
                                                                 0.1833103
## 6 FALSE FALSE TRUE
                              FALSE 1
                                          1
                                               0
                                                            0
                                                                 0.1669266
     score deepspcas9 score cfd score mit hasSNP score composite
        0.4272766876 0.4250273 0.4266001
                                           TRUE
## 1
                                                           25.5
        0.2041315651 0.5000000 0.5773672 FALSE
                                                           16.0
## 2
## 3
        0.0297369909 1.0000000 1.0000000 FALSE
                                                            7.0
        0.4774132156 1.0000000 1.0000000 FALSE
                                                           37.0
## 4
        0.0006713235 1.0000000 1.0000000 FALSE
                                                            3.0
        0.0166297376 0.5212645 0.8835838 FALSE
## 6
                                                            3.5
```

Building a complete gRNA database across all protein-coding genes

We first get all possibles genes from our gene model:

```
gene_ids <- unique(tx0bject$cds$gene_id)
head(gene_ids)

## [1] "ENSG00000186092" "ENSG00000187634" "ENSG00000187961" "ENSG00000187583"

## [5] "ENSG00000187608" "ENSG00000188157"

and specify where to save the GuideSet objects:

dir <- "./crisprko_cas9_hg38"

if (!dir.exists(dir)){
    dir.create(dir, recursive=TRUE)
}</pre>
```

We are now looping over all genes to generate the data:

This loop can be modified by the user to use an embarrassingly-parallel approach, using the BiocParallel package, for instance.

Building a database for CRISPRa and CRISPRi applications works similarly See ?designCompleteAnnotation for more information.

Reproducibility

```
sessionInfo()
## R version 4.2.1 (2022-06-23)
## Platform: x86_64-apple-darwin17.0 (64-bit)
## Running under: macOS Catalina 10.15.7
##
## Matrix products: default
          /Library/Frameworks/R.framework/Versions/4.2/Resources/lib/libRblas.0.dylib
## BLAS:
## LAPACK: /Library/Frameworks/R.framework/Versions/4.2/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
## attached base packages:
## [1] stats4
                 stats
                           graphics grDevices utils
                                                         datasets methods
## [8] base
## other attached packages:
## [1] BSgenome.Hsapiens.UCSC.hg38_1.4.4 BSgenome_1.65.2
## [3] rtracklayer_1.57.0
                                          Biostrings_2.65.2
## [5] XVector_0.37.0
                                          GenomicRanges_1.49.1
## [7] GenomeInfoDb_1.33.5
                                          IRanges_2.31.2
## [9] S4Vectors_0.35.1
                                          crisprDesignData_0.99.17
## [11] crisprDesign_0.99.133
                                          crisprScore_1.1.14
## [13] crisprScoreData_1.1.3
                                          ExperimentHub_2.5.0
## [15] AnnotationHub_3.5.0
                                          BiocFileCache_2.5.0
## [17] dbplyr_2.2.1
                                          BiocGenerics_0.43.1
## [19] crisprBowtie 1.1.1
                                          crisprBase 1.1.5
## [21] crisprVerse_0.99.8
                                          rmarkdown_2.15.2
##
## loaded via a namespace (and not attached):
## [1] rjson_0.2.21
                                      ellipsis_0.3.2
## [3] Rbowtie 1.37.0
                                      bit64 4.0.5
## [5] interactiveDisplayBase_1.35.0 AnnotationDbi_1.59.1
## [7] fansi_1.0.3
                                      xm12_1.3.3
## [9] codetools_0.2-18
                                      cachem_1.0.6
## [11] knitr_1.40
                                      jsonlite_1.8.0
## [13] Rsamtools_2.13.4
                                      png_0.1-7
## [15] shiny_1.7.2
                                      BiocManager_1.30.18
## [17] readr_2.1.2
                                      compiler_4.2.1
## [19] httr_1.4.4
                                      basilisk_1.9.2
## [21] assertthat_0.2.1
                                      Matrix_1.4-1
## [23] fastmap_1.1.0
                                      cli_3.3.0
## [25] later_1.3.0
                                      htmltools_0.5.3
## [27] prettyunits_1.1.1
                                      tools 4.2.1
## [29] glue_1.6.2
                                      GenomeInfoDbData 1.2.8
## [31] dplyr_1.0.9
                                      rappdirs_0.3.3
## [33] tinytex_0.41
                                      Rcpp_1.0.9
## [35] Biobase_2.57.1
                                      vctrs_0.4.1
## [37] crisprBwa 1.1.3
                                      xfun_0.32
## [39] stringr_1.4.1
                                      mime 0.12
## [41] lifecycle_1.0.1
                                      restfulr_0.0.15
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##	[43]	XML_3.99-0.10	zlibbioc_1.43.0
##	[45]	basilisk.utils_1.9.1	vroom_1.5.7
##	[47]	VariantAnnotation_1.43.3	hms_1.1.2
##	[49]	promises_1.2.0.1	<pre>MatrixGenerics_1.9.1</pre>
##	[51]	parallel_4.2.1	SummarizedExperiment_1.27.1
##	[53]	yaml_2.3.5	curl_4.3.2
##	[55]	memoise_2.0.1	reticulate_1.25
##	[57]	biomaRt_2.53.2	stringi_1.7.8
##	[59]	RSQLite_2.2.16	BiocVersion_3.16.0
##	[61]	highr_0.9	BiocIO_1.7.1
##	[63]	randomForest_4.7-1.1	GenomicFeatures_1.49.6
##	[65]	filelock_1.0.2	BiocParallel_1.31.12
##	[67]	rlang_1.0.4	pkgconfig_2.0.3
##	[69]	matrixStats_0.62.0	bitops_1.0-7
##	[71]	evaluate_0.16	lattice_0.20-45
##	[73]	purrr_0.3.4	GenomicAlignments_1.33.1
##	[75]	bit_4.0.4	tidyselect_1.1.2
##	[77]	magrittr_2.0.3	R6_2.5.1
		generics_0.1.3	DelayedArray_0.23.1
##	[81]	DBI_1.1.3	pillar_1.8.1
##	[83]	KEGGREST_1.37.3	RCurl_1.98-1.8
##	[85]	tibble_3.1.8	dir.expiry_1.5.0
##	[87]	crayon_1.5.1	utf8_1.2.2
		tzdb_0.3.0	progress_1.2.2
##	[91]	grid_4.2.1	blob_1.2.3
##	[93]	digest_0.6.29	xtable_1.8-4
##	[95]	httpuv_1.6.5	Rbwa_1.1.0