AnnotationDbi: Introduction To Bioconductor Annotation Packages

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Figure 1: Annotation Packages: the big picture

Bioconductor provides extensive annotation resources. These can be gene centric, or genome centric. Annotations can be provided in packages curated by Bioconductor, or obtained from web-based resources. This vignette is primarily concerned with describing the annotation resources that are available as packages. More advanced users who wish to learn about how to make new annotation packages should see the vignette titled "Creating select Interfaces for custom Annotation resources" from the AnnotationForge package.

Gene centric AnnotationDbi packages include:

- Organism level: e.g. org.Mm.eg.db.
- Platform level: e.g. hgu133plus2.db, hgu133plus2.probes, hgu133plus2.cdf.
- Homology level: e.g. hom.Dm.inp.db.
- System-biology level: GO.db

Genome centric GenomicFeatures packages include

- Transcriptome level: e.g. TxDb.Hsapiens.UCSC.hg19.knownGene, EnsDb.Hsapiens.v75.
- Generic genome features: Can generate via GenomicFeatures

One web-based resource accesses biomart, via the biomaRt package:
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- Query web-based ‘biomart’ resource for genes, sequence, SNPs, and etc.

The most popular annotation packages have been modified so that they can make use of a new set of methods to more easily access their contents. These four methods are named: `columns`, `keytypes`, `keys` and `select`. And they are described in this vignette. They can currently be used with all chip, organism, and `TxDb` packages along with the popular GO.db package.

For the older less popular packages, there are still convenient ways to retrieve the data. The *How to use bimaps from the "db" annotation packages* vignette in the `AnnotationDbi` package is a key reference for learning about how to use bimap objects.

Finally, all of the `.db` (and most other *Bioconductor* annotation packages) are updated every 6 months corresponding to each release of *Bioconductor*. Exceptions are made for packages where the actual resources that the packages are based on have not themselves been updated.

### 0.1 AnnotationDb objects and the select method

As previously mentioned, a new set of methods have been added that allow a simpler way of extracting identifier based annotations. All the annotation packages that support these new methods expose an object named exactly the same as the package itself. These objects are collectively called `AnnotationDb` objects for the class that they all inherit from. The more specific classes (the ones that you will actually see in the wild) have names like `OrgDb`, `ChipDb` or `TxDb` objects. These names correspond to the kind of package (and underlying schema) being represented. The methods that can be applied to all of these objects are `columns`, `keys`, `keytypes` and `select`.

In addition, another accessor has recently been added which allows extraction of one column at a time. The `mapIds` method allows users to extract data into either a named character vector, a list or even a SimpleCharacterList. This method should work with all the different kinds of `AnnotationDb` objects described below.

### 0.2 ChipDb objects and the select method

An extremely common kind of Annotation package is the so called platform based or chip based package type. This package is intended to make the manufacturer labels for a series of probes or probesets to a wide range of gene-based features. A package of this kind will load an `ChipDb` object. Below is a set of examples to show how you might use the standard 4 methods to interact with an object of this type.

First we need to load the package:

```r
library(hgu95av2.db)
```

If we list the contents of this package, we can see that one of the many things loaded is an object named after the package "hgu95av2.db":

```r
library(hgu95av2.db)
```
We can look at this object to learn more about it:

hgu95av2.db

## ChipDb object:
## | DBSCHEMAVERSION: 2.1
## | Db type: ChipDb
## | Supporting package: AnnotationDbi
## | DBSCHEMA: HUMANCHIP_DB
## | ORGANISM: Homo sapiens
## | SPECIES: Human
## | MANUFACTURER: Affymetrix
## | CHIPNAME: Human Genome U95 Set
## | MANUFACTURERURL: http://www.affymetrix.com/support/technical/byproduct.affx?product=hgu95
## | EGSOUREDNAME: Entrez Gene
## | CENTRALID: ENTREZID
## | TAXID: 9606
## | GOSOURCENAME: Gene Ontology
## | GOSOURCENAME: Gene Ontology
## | GOSOURCENAME: Gene Ontology
## | GOSOURCENAME: Gene Ontology
## | GOSOURCENAME: Gene Ontology
## | KEGGSOUREDNAME: KEGG GENOME
## | KEGGSOUREDDATE: 2011-Mar15
## | GPSOURCENAME: UCSC Genome Bioinformatics (Homo sapiens)
## | GPSOURCENAME: UCSC Genome Bioinformatics (Homo sapiens)
## | GPSOURCENAME: UCSC Genome Bioinformatics (Homo sapiens)
If we want to know what kinds of data are retrievable via `select`, then we should use the `columns` method like this:

```r
columns(hgu95av2.db)
```

```
## [1] "ACCSNUM"   "ALIAS"   "ENSEMBL"   "ENSEMBLPROT"
## [5] "ENSEMBLTRANS" "ENTREZID" "ENZYME"   "EVIDENCE"
## [9] "EVIDENCEALL" "GENENAME" "GO"       "GOALL"
## [13] "IPI"     "MAP"   "OMIM"    "ONTOLGY"
## [17] "ONTOLOGYALL" "PATH"     "PFAM"     "PMID"
## [21] "PROBEID" "PROSITE" "REFSEQ" "SYMBOL"
## [25] "UCSCKG" "UNIGENE" "UNIPROT"
```

If we are further curious to know more about those values for columns, we can consult the help pages. Asking about any of these values will pull up a manual page describing the different fields and what they mean.

```r
help("SYMBOL")
```

If we are curious about what kinds of fields we could potentially use as keys to query the database, we can use the `keytypes` method. In a perfect world, this method will return values very similar to what was returned by `columns`, but in reality, some kinds of values make poor keys and so this list is often shorter.

```r
keytypes(hgu95av2.db)
```

```
## [1] "ACCSNUM"   "ALIAS"   "ENSEMBL"   "ENSEMBLPROT"
## [5] "ENSEMBLTRANS" "ENTREZID" "ENZYME"   "EVIDENCE"
## [9] "EVIDENCEALL" "GENENAME" "GO"       "GOALL"
## [13] "IPI"     "MAP"   "OMIM"    "ONTOLGY"
## [17] "ONTOLOGYALL" "PATH"     "PFAM"     "PMID"
## [21] "PROBEID" "PROSITE" "REFSEQ" "SYMBOL"
## [25] "UCSCKG" "UNIGENE" "UNIPROT"
```

If we want to extract some sample keys of a particular type, we can use the `keys` method.
And finally, if we have some keys, we can use `select` to extract them. By simply using appropriate argument values with `select` we can specify what keys we want to look up values for (keys), what we want returned back (columns) and the type of keys that we are passing in (keytype).

```r
# 1st get some example keys
k <- head(keys(hgu95av2.db,keytype="PROBEID"))
# then call select
select(hgu95av2.db, keys=k, columns=c("SYMBOL","GENENAME"), keytype="PROBEID")
```

And as you can see, when you call the code above, `select` will try to return a data.frame with all the things you asked for matched up to each other.

Finally if you wanted to extract only one column of data you could instead use the `mapIds` method like this:

```r
# 1st get some example keys
k <- head(keys(hgu95av2.db,keytype="PROBEID"))
# then call mapIds
mapIds(hgu95av2.db, keys=k, column=c("GENENAME"), keytype="PROBEID")
```
## 0.3 OrgDb objects and the select method

An organism level package (an ‘org’ package) uses a central gene identifier (e.g. Entrez Gene id) and contains mappings between this identifier and other kinds of identifiers (e.g. GenBank or Uniprot accession number, RefSeq id, etc.). The name of an org package is always of the form org.<Ab>.<id>.db (e.g. org.Sc.sgd.db) where <Ab> is a 2-letter abbreviation of the organism (e.g. Sc for Saccharomyces cerevisiae) and <id> is an abbreviation (in lower-case) describing the type of central identifier (e.g. sgd for gene identifiers assigned by the Saccharomyces Genome Database, or eg for Entrez Gene ids).

Just as the chip packages load a ChipDb object, the org packages will load a OrgDb object. The following exercise should acquaint you with the use of these methods in the context of an organism package.

**Exercise 1**
Display the OrgDb object for the org.Hs.eg.db package.

*Use the columns method to discover which sorts of annotations can be extracted from it. Is this the same as the result from the keytypes method? Use the keytypes method to find out.*

*Finally, use the keys method to extract UNIPROT identifiers and then pass those keys in to the select method in such a way that you extract the gene symbol and KEGG pathway information for each. Use the help system as needed to learn which values to pass in to columns in order to achieve this.*

### Solution:

```r
library(org.Hs.eg.db)
columns(org.Hs.eg.db)
## [1] "ACCNUM" "ALIAS" "ENSEMBL" "ENSEMBLPROT"
## [5] "ENSEMBLTRANS" "ENTREZID" "ENZYME" "EVIDENCE"
## [9] "EVIDENCEALL" "GENENAME" "GO" "GOALL"
## [13] "IPI" "MAP" "OMIM" "ONTOLOGY"
## [17] "ONTOLOGYALL" "PATH" "PFAM" "PMID"
```
So how could you use `select` to annotate your results? This next exercise should help you to understand how that should generally work.

**Exercise 2**

*Please run the following code snippet (which will load a fake data result that I have provided for the purposes of illustration)*:

```r
load(system.file("extdata", "resultTable.Rda", package="AnnotationDbi"))
head(resultTable)
```

<table>
<thead>
<tr>
<th>logConc</th>
<th>logFC</th>
<th>LR.statistic</th>
<th>PValue</th>
<th>FDR</th>
</tr>
</thead>
<tbody>
<tr>
<td>100418920</td>
<td>-9.639471</td>
<td>-4.679498</td>
<td>378.0732</td>
<td>3.269307e-84</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>3.269307e-84</td>
<td>2.613484e-80</td>
</tr>
</tbody>
</table>

---

**Helpful Resources**

- `PROSITE`
- `REFSEQ`
- `SYMBOL`
- `UCSCKG`
- `UNIGENE`
- `UNIPROT`

**Key Types**

```r
keytypes(org.Hs.eg.db)
```

```
[1] "ACCNUM"  "ALIAS"  "ENSEMBL"  "ENSEMBLPROT"
[5] "ENSEMBLTRANS"  "ENTREZID"  "ENZYME"  "EVIDENCE"
[9] "EVIDENCEALL"  "GENENAME"  "GO"  "GOALL"
[13] "IPI"  "MAP"  "OMIM"  "ONTOLOGY"
[17] "ONTOLOGYALL"  "PATH"  "PFAM"  "PMID"
[21] "PROSITE"  "REFSEQ"  "SYMBOL"  "UCSCKG"
[25] "UNIGENE"  "UNIPROT"
```

```r
uniKeys <- head(keys(org.Hs.eg.db, keytype="UNIPROT"))
cols <- c("SYMBOL", "PATH")
select(org.Hs.eg.db, keys=uniKeys, columns=cols, keytype="UNIPROT")
```

```
## 'select()' returned 1:many mapping between keys and columns

<table>
<thead>
<tr>
<th>UNIPROT</th>
<th>SYMBOL</th>
<th>PATH</th>
</tr>
</thead>
<tbody>
<tr>
<td>P04217</td>
<td>A1BG</td>
<td>&lt;NA&gt;</td>
</tr>
<tr>
<td>V9HWD8</td>
<td>A1BG</td>
<td>&lt;NA&gt;</td>
</tr>
<tr>
<td>P01023</td>
<td>A2M</td>
<td>04610</td>
</tr>
<tr>
<td>P18440</td>
<td>NAT1</td>
<td>00232</td>
</tr>
<tr>
<td>P18440</td>
<td>NAT1</td>
<td>00983</td>
</tr>
<tr>
<td>P18440</td>
<td>NAT1</td>
<td>01100</td>
</tr>
<tr>
<td>Q400J6</td>
<td>NAT1</td>
<td>00232</td>
</tr>
<tr>
<td>Q400J6</td>
<td>NAT1</td>
<td>00983</td>
</tr>
<tr>
<td>Q400J6</td>
<td>NAT1</td>
<td>01100</td>
</tr>
<tr>
<td>F5H5R8</td>
<td>NAT1</td>
<td>00232</td>
</tr>
<tr>
<td>F5H5R8</td>
<td>NAT1</td>
<td>00983</td>
</tr>
<tr>
<td>F5H5R8</td>
<td>NAT1</td>
<td>01100</td>
</tr>
</tbody>
</table>
```
The rownames of this table happen to provide entrez gene identifiers for each row (for human). Find the gene symbol and gene name for each of the rows in resultTable and then use the merge method to attach those annotations to it.

Solution:

```r
annots <- select(org.Hs.eg.db, keys=rownames(resultTable),
                 columns=c("SYMBOL","GENENAME"), keytype="ENTREZID")
## 'select()' returned 1:1 mapping between keys and columns
resultTable <- merge(resultTable, annots, by.x=0, by.y="ENTREZID")
head(resultTable)
```

<table>
<thead>
<tr>
<th>SYMBOL</th>
<th>GENENAME</th>
</tr>
</thead>
<tbody>
<tr>
<td>SLCO4A1-AS1</td>
<td>SLCO4A1 antisense RNA 1</td>
</tr>
<tr>
<td>LOC100131223</td>
<td>ADP ribosylation factor like GTPase 8B pseudogene</td>
</tr>
<tr>
<td>RPS28P8</td>
<td>ribosomal protein S28 pseudogene 8</td>
</tr>
<tr>
<td>MPVQTL1</td>
<td>Mean platelet volume QT1</td>
</tr>
<tr>
<td>&lt;NA&gt;</td>
<td>&lt;NA&gt;</td>
</tr>
<tr>
<td>TTTY13B</td>
<td>testis-specific transcript, Y-linked 13B</td>
</tr>
</tbody>
</table>

0.4 Using select with GO.db

When you load the GO.db package, a GODb object is also loaded. This allows you to use the columns, keys, keytypes and select methods on the contents of the GO ontology. So if for example, you had a few GO IDs and wanted to know more about it, you could do it like this:

```r
library(GO.db)
GOIDs <- c("GO:0042254", "GO:0044183")
select(GO.db, keys=GOIDs, columns="DEFINITION", keytype="GOID")
```
## Using select with TxDb packages

A `TxDb` package (a `TxDb` package) connects a set of genomic coordinates to various transcript oriented features. The package can also contain Identifiers to features such as genes and transcripts, and the internal schema describes the relationships between these different elements. All `TxDb` containing packages follow a specific naming scheme that tells where the data came from as well as which build of the genome it comes from.

**Exercise 3**

*Display the `TxDb` object for the `TxDb.Hsapiens.UCSC.hg19.knownGene` package.*

As before, use the `columns` and `keytypes` methods to discover which sorts of annotations can be extracted from it.

*Use the `keys` method to extract just a few gene identifiers and then pass those keys in to the `select` method in such a way that you extract the transcript ids and transcript starts for each.*

**Solution:**

```r
library(TxDb.Hsapiens.UCSC.hg19.knownGene)
## Loading required package: GenomicFeatures
## Loading required package: GenomeInfoDb
## Loading required package: GenomicRanges
txdb <-TxDb.Hsapiens.UCSC.hg19.knownGene
txdb
## # TxDb object:
## ## # Db type: TxDb
## ## # Supporting package: GenomicFeatures
## ## # Data source: UCSC
## ## # Genome: hg19
## ## # Organism: Homo sapiens
## ## # Taxonomy ID: 9606
```
## UCSC Table: knownGene

- Resource URL: http://genome.ucsc.edu/
- Type of Gene ID: Entrez Gene ID
- Full dataset: yes
- miRBase build ID: GRCh37
- transcript_nrow: 82960
- exon_nrow: 289969
- cds_nrow: 237533
- Db created by: GenomicFeatures package from Bioconductor
- GenomicFeatures version at creation time: 1.21.30
- RSQLite version at creation time: 1.0.0
- DBSCHEMAVERSION: 1.1

### columns(txdb)

```r
[1] "CDSCHROM" "CDSEND" "CDSID" "CDSNAME" "CDSSTART"
[6] "CDSSTRAND" "EXONCHROM" "EXONEND" "EXONID" "EXONNAME"
[11] "EXONRANK" "EXONSTART" "EXONSTRAND" "GENEID" "TXCHROM"
[16] "TXEND" "TXID" "TXNAME" "TXSTART" "TXSTRAND"
[21] "TXTYPE"
```

### keytypes(txdb)

```r
[1] "CDSID" "CDSNAME" "EXONID" "EXONNAME" "GENEID" "TXID"
[7] "TXNAME"
```

```r
keys <- head(keys(txdb, keytype="GENEID"))
cols <- c("TXID", "TXSTART")
select(txdb, keys=keys, columns=cols, keytype="GENEID")
```

### 'select()' returned 1:many mapping between keys and columns

```r
  GENEID TXID TXSTART
  1 70455 58858172
  2 70456 58859832
  3 10 31944 18248755
  4 100 72132 43248163
  5 1000 65378 25530930
  6 1000 65379 25530930
  7 10000 7895 243651535
  8 10000 7896 243663021
  9 10000 7897 243663021
  10 100008586 75890 49217763
```
As is widely known, in addition to providing access via the `select` method, `TxDb` objects also provide access via the more familiar `transcripts`, `exons`, `cds`, `transcriptsBy`, `exonsBy` and `cdsBy` methods. For those who do not yet know about these other methods, more can be learned by seeing the vignette called: *Making and Utilizing TxDb Objects* in the *GenomicFeatures* package.

### 0.6 Using `select` with EnsDb packages

Similar to the `TxDb` objects/packages discussed in the previous section, `EnsDb` objects/packages provide genomic coordinates of gene models along with additional annotations (e.g. gene names, biotypes etc) but are tailored to annotations provided by Ensembl. The central methods `columns`, `keys`, `keytypes` and `select` are all implemented for `EnsDb` objects. In addition, these methods allow also the use of the `EnsDb` specific filtering framework to retrieve only selected information from the database (see vignette of the `ensembldb` package for more information).

In the example below we first evaluate which columns, keys and keytypes are available for `EnsDb` objects and fetch then the transcript ids, genomic start coordinate and transcript biotype for some genes.

```r
library(EnsDb.Hsapiens.v75)
## Loading required package: ensembldb
## Loading required package: AnnotationFilter

## Attaching package: 'ensembl'
## The following object is masked from 'package:stats':
## filter
edb <- EnsDb.Hsapiens.v75
edb

## EnsDb for Ensembl:
## |Backend: SQLite
## |Db type: EnsDb
## |Type of Gene ID: Ensembl Gene ID
## |Supporting package: ensembldb
## |Db created by: ensembldb package from Bioconductor
## |script_version: 0.3.0
## |Creation time: Thu May 18 09:15:45 2017
## |ensembl_version: 75
## |ensembl_host: localhost
## |Organism: homo_sapiens
## |taxonomy_id: 9606
```
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```r
## genome_build: GRCh37
## DBSCHEMAVERSION: 2.0
## No. of genes: 64102.
## No. of transcripts: 215647.
## Protein data available.

## List all columns
columns(edb)
##
## [1] "ENTREZID"   "EXONID"   "EXONIDX"
## [4] "EXONSEQEND" "EXONSEQSTART" "GENEBIOTYPE"
## [7] "GENEID" "GENENAME" "GENESEQEND"
## [10] "GENESEQSTART" "INTERPROACCESSION" "ISCIRCULAR"
## [13] "PROTDOMEND" "PROTDOMSTART" "PROTEINDOMAINID"
## [16] "PROTEINDOMAINSOURCE" "PROTEINID" "PROTEINSEQUENCE"
## [19] "SEQCOORDSYSTEM" "SEQLENGTH" "SEQNAME"
## [22] "SEQSTRAND" "SYMBOL" "TXBIOTYPE"
## [25] "TXCDSESEQEND" "TXCDSEQSTART" "TXID"
## [28] "TXNAME" "TXSEQEND" "TXSEQSTART"
## [31] "UNIPROTDB" "UNIPROTID" "UNIPROTMAPPINGTYPE"

## List all keytypes
keytypes(edb)
##
## [1] "ENTREZID"   "EXONID"   "GENEBIOTYPE"   "GENEID"
## [5] "GENENAME" "PROTEINDOMAINID" "PROTEINID" "SEQNAME"
## [9] "SEQSTRAND" "SYMBOL" "TXBIOTYPE" "TXID"
## [13] "TXNAME" "UNIPROTID"

## Get the first
keys <- head(keys(edb, keytype="GENEID"))

## Get the data
select(edb, keys=keys, columns=c("TXID", "TXSEQSTART", "TXBIOTYPE"),
       keytype="GENEID")
```
We can modify the queries above to retrieve only genes encoded on chromosome Y. To this end we use filter objects available for EnsDb objects and its methods.

```r
## Retrieve all gene IDs of all lincRNAs encoded on chromosome Y
linkY <- keys(edb, 
    filter=list(GenebiotypeFilter("lincRNA"), SeqnameFilter("Y")))

## Warning: ‘GenebiotypeFilter’ is deprecated.
## Use ‘GeneBiotypeFilter’ instead.
## See help("Deprecated")
## Warning: ‘SeqnameFilter’ is deprecated.
## Use ‘SeqNameFilter’ instead.
## See help("Deprecated")

length(linkY)
## [1] 48

## We get now all transcripts for these genes.
txs <- select(edb, keys=linkY, columns=c("TXID", "TXSEQSTART", "TXBIOTYPE"), 
    keytype="GENEID")
```
nrow(txs)
## [1] 66

## Alternatively, we could specify/pass the filters with the keys argument.

txs <- select(edb, keys=list(GenebiotypeFilter("lincRNA"), SeqnameFilter("Y")),
              columns=c("TXID", "TXSEQSTART", "TXBIOTYPE"))

## Warning: ‘GenebiotypeFilter’ is deprecated.
## Use ‘GeneBiotypeFilter’ instead.
## See help("Deprecated")

## Warning: ‘SeqnameFilter’ is deprecated.
## Use ‘SeqNameFilter’ instead.
## See help("Deprecated")

## Note: ordering of the results might not match ordering of keys!

nrow(txs)
## [1] 66

The version number of R and packages loaded for generating the vignette were:

## R Under development (unstable) (2017-12-05 r73840)
## Platform: x86_64-pc-linux-gnu (64-bit)
## Running under: Ubuntu 16.04.3 LTS
##
## Matrix products: default
## BLAS: /home/biocbuild/bbs-3.7-bioc/R/lib/libRblas.so
## LAPACK: /home/biocbuild/bbs-3.7-bioc/R/lib/libRlapack.so
##
## locale:
## [1] LC _CTYPE=en_US.UTF-8 LC _NUMERIC=C
## [3] LC _TIME=en_US.UTF-8 LC _COLLATE=C
## [5] LC _MONETARY=en_US.UTF-8 LC _MESSAGES=en_US.UTF-8
## [7] LC _PAPER=en_US.UTF-8 LC _NAME=C
## [9] LC _ADDRESS=C LC _TELEPHONE=C
##
## attached base packages:
## [1] parallel stats4 stats graphics grDevices utils datasets
## [8] methods base
##
## other attached packages:
## [1] EnsDb.Hsapiens.v75_2.99.0
## [2] ensembldb_2.3.5
## [3] AnnotationFilter_1.3.0
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```r
## [5] GenomicFeatures_1.31.1
## [6] GenomicRanges_1.31.1
## [7] GenomeInfoDb_1.15.1
## [8] GO.db_3.5.0
## [9] hgu95av2.db_3.2.3
## [10] AnnotationForge_1.21.0
## [11] org.Hs.eg.db_3.5.0
## [12] AnnotationDbi_1.41.4
## [13] IRanges_2.13.4
## [14] S4Vectors_0.17.12
## [15] Biobase_2.39.0
## [16] BiocGenerics_0.25.0
## [17] DBI_0.7
## [18] knitr_1.17

## loaded via a namespace (and not attached):
## [1] SummarizedExperiment_1.9.3 progress_1.1.2
## [3] lattice_0.20-35 htmltools_0.3.6
## [5] rtracklayer_1.39.3 yaml_2.1.15
## [7] blob_1.1.0 XML_3.98-1.9
## [9] rlang_0.1.4 BiocParallel_1.13.0
## [11] bit64_0.9-7 matrixStats_0.52.2
## [13] GenomeInfoDbData_0.99.2 ProtGenerics_1.11.0
## [15] stringr_1.2.0 zlibbioc_1.25.0
## [17] Biostrings_2.47.0 memoise_1.1.0
## [19] evaluate_0.10.1 biomaRt_2.35.0
## [21] curl_3.0 highr_0.6
## [23] Rcpp_0.12.14 backports_1.1.1
## [25] DelayedArray_0.5.7 XVector_0.19.1
## [27] bit_1.1-12 Rsamtools_1.31.0
## [29] BiocStyle_2.7.1 RMySQL_0.10.13
## [31] digest_0.6.12 stringi_1.1.6
## [33] rprojroot_1.2 grid_3.5.0
## [35] tools_3.5.0 bitops_1.0-6
## [37] magrittr_1.5 lazyeval_0.2.1
## [39] RCRul_1.95-4.8 tibble_1.3.4
## [41] RSQLite_2.0 pkgconfig_2.0.1
## [43] Matrix_1.2-12 prettyunits_1.0.2
## [45] assertthat_0.2.0 rmarkdown_1.8
## [47] R6_2.2.2 GenomicAlignments_1.15.2
## [49] compiler_3.5.0
```