Using Bioconductor Packages

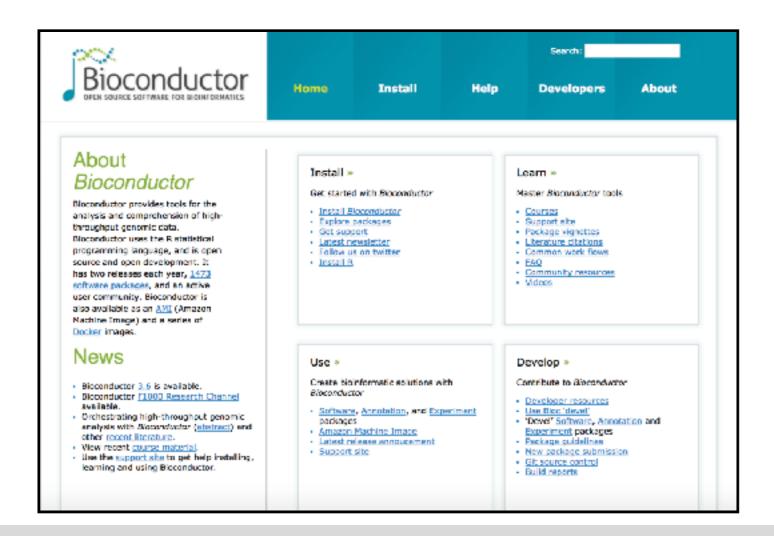
R for Beginners 2





What is Bioconductor?

- https://www.bioconductor.org/
- Provides tools for the analysis and comprehension of high-throughput genomic data
 - Sequencing: RNASeq, ChIPSeq, variants, copy number, ...
 - Microarrays: expression, SNP, ...
 - o Flow cytometry, proteomics, images, ...



What is Bioconductor (cont.)?

- Distributes as R PackagesOpen Source and open development
- Started in 2001
- Has 2 releases each year (every 6 months)
- As of Jan 2018 Bioconductor version 3.6 (Release)
 - 1473 software packages
 - 908 annotation packages
 - 325 experiment packages



Packages are the fundamental units of reproducible R code

Improve existing base R functionalities, or by adding new ones.

Include R functions, documentation that describes how to use them and

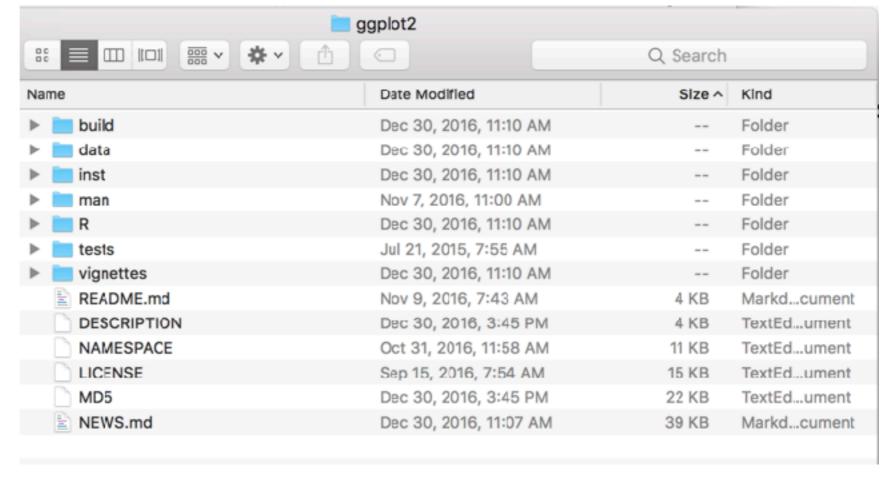
sample data

R Functions

Documentation

Sample data

Package Folder



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sample data

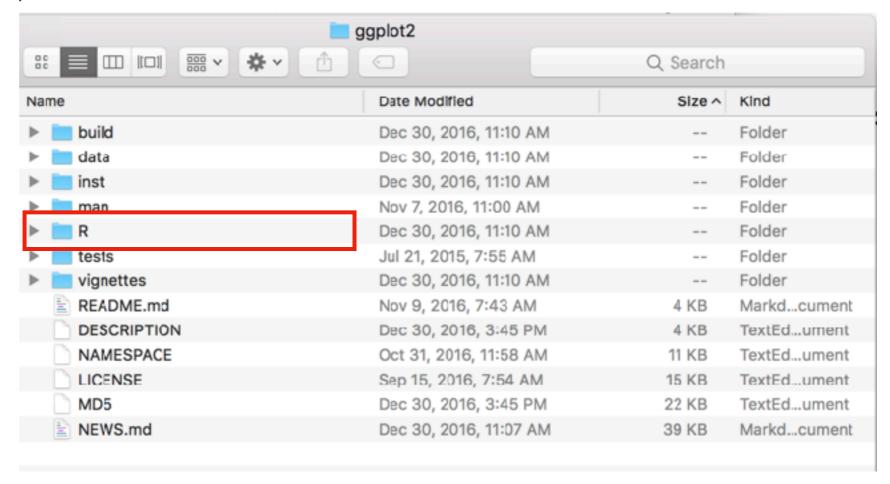
R Functions

Documentation

Sample data

Package Folder

R Folder



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sample data

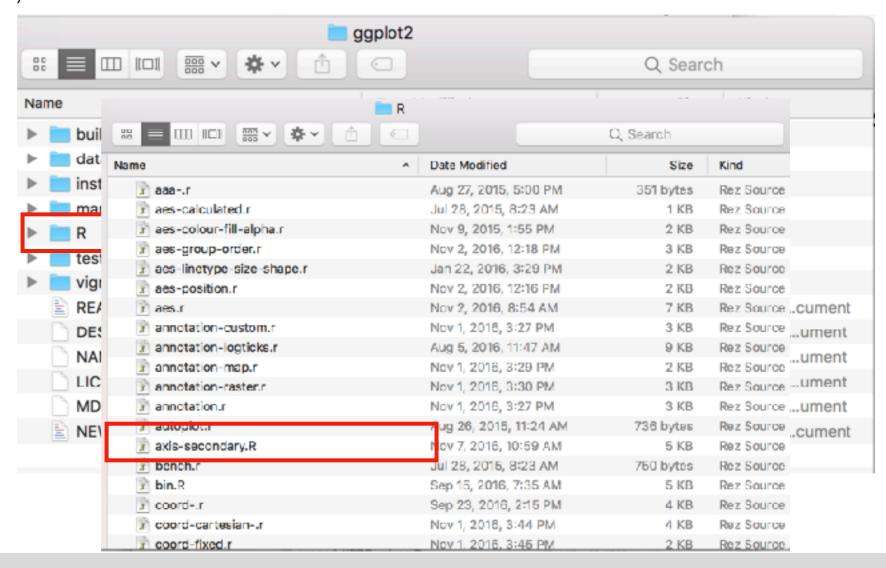
R Functions

Documentation

Sample data

Package Folder

- R Folder
 - .R Files





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sample data

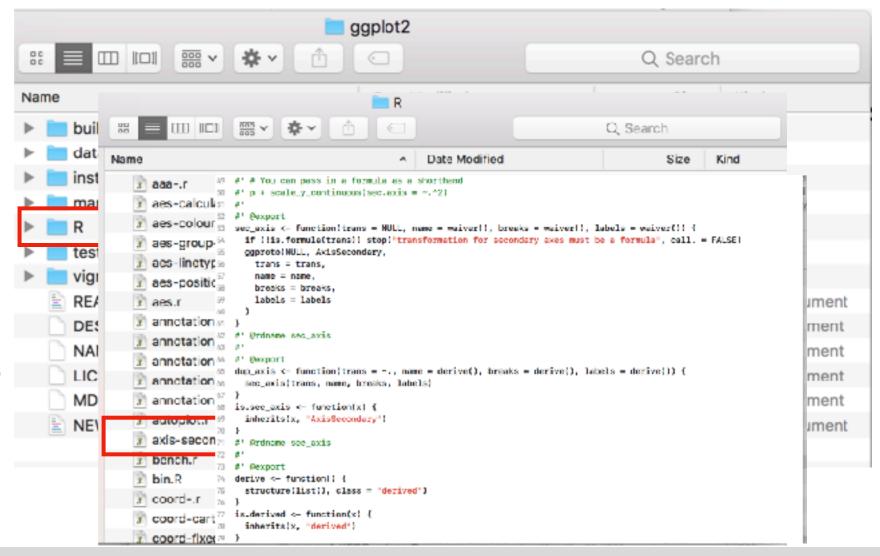
R Functions

Documentation

Sample data

Package Folder

- R Folder
 - .R Files
 - Functions written in R code



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sample data

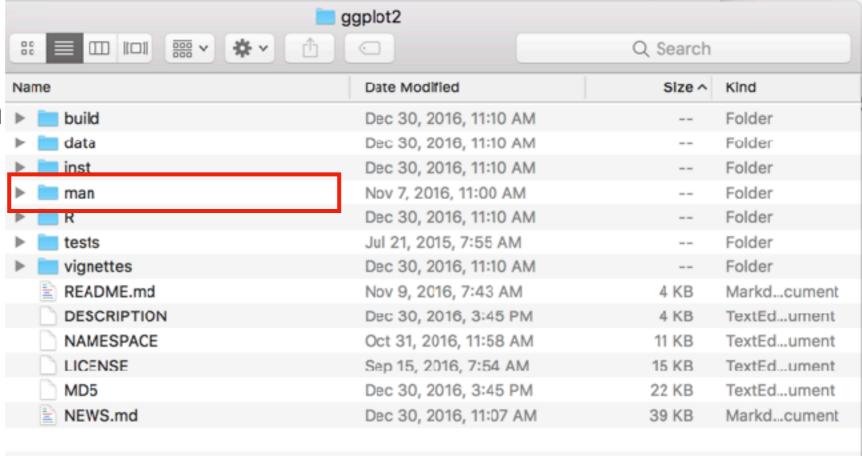
R Functions

Documentation

Sample data

Package Folder

man Folder



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sample data

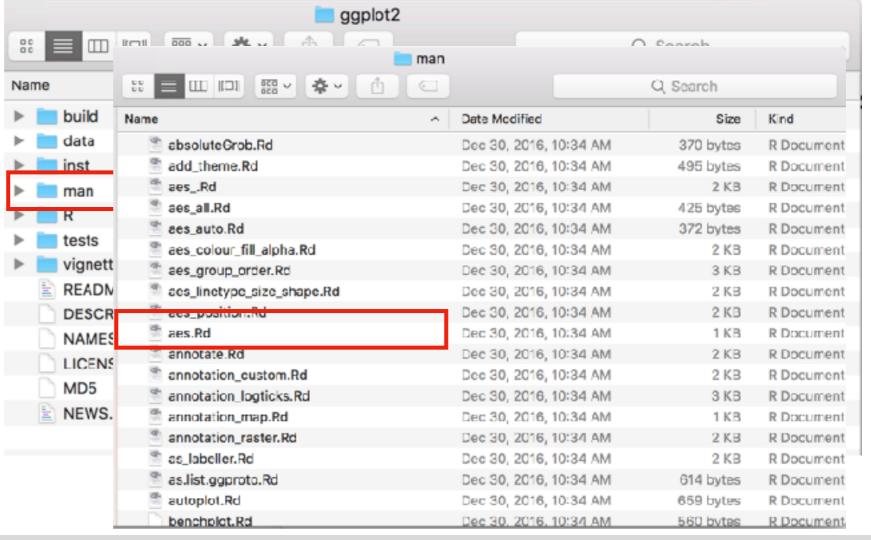
R Functions

Documentation

Sample data

Package Folder

- man Folder
 - .Rd files



• Packages are the fundamental units of reproducible R code

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Include R functions, documentation that describes how to use them and

sample data

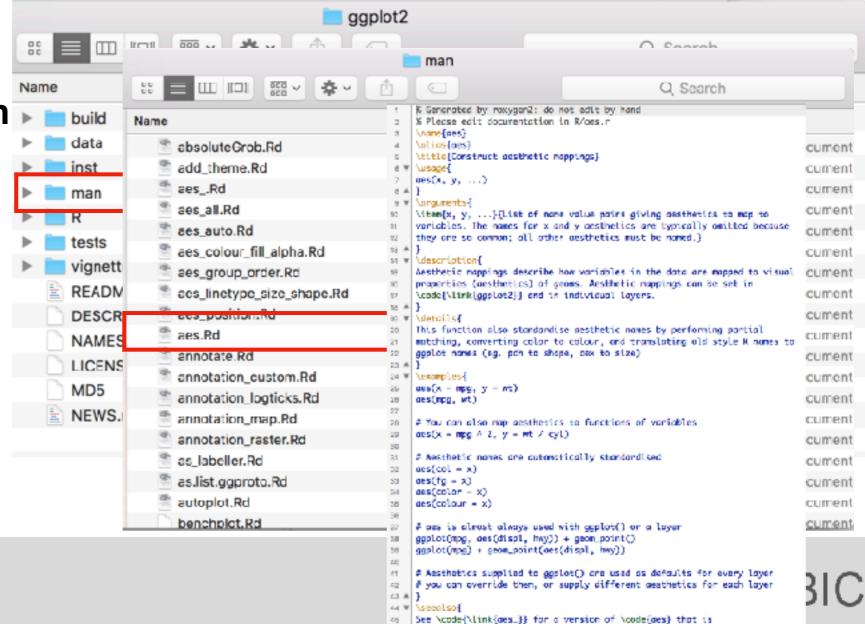
R Functions

Documentation

• Sample data

Package Folder

- man Folder
 - .Rd files
 - Code used to generate standard manual



more suitable for programming with.

Packages are the fundamental units of reproducible R code

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sample data

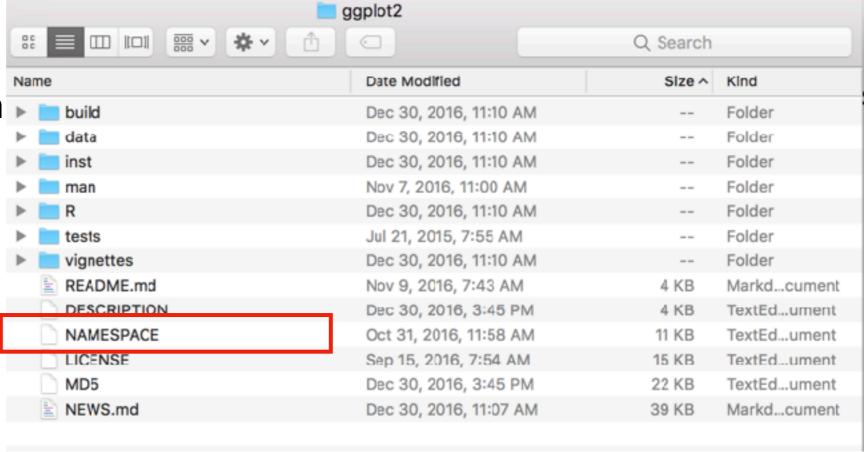
R Functions

Documentation

Sample data

Package Folder

• NAMESPACE



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sample data

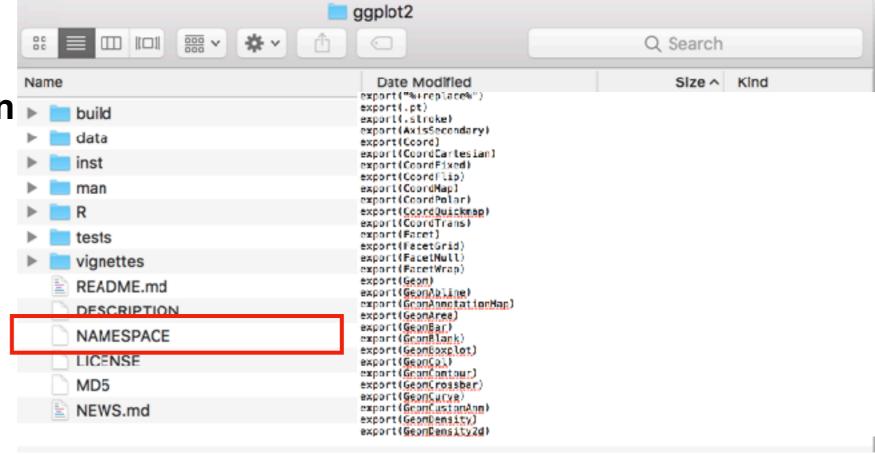
R Functions

Documentation

Sample data

Package Folder

- NAMESPACE
- Specifies what functions and objects are exposed



Packages are the fundamental units of reproducible R code

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sample data

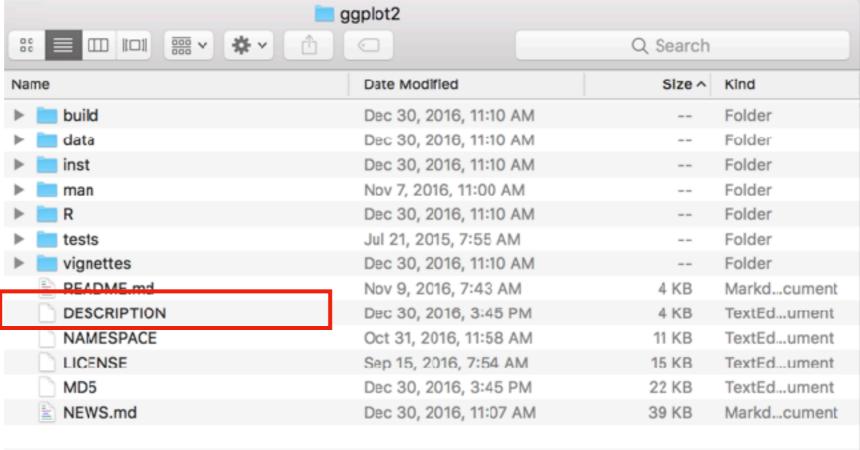
R Functions

Documentation

Sample data

Package Folder

DESCRIPTION



Packages are the fundamental units of reproducible R code

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sample data

R Functions

Documentation

Sample data

Package Folder

- DESCRIPTION
 - Dependencies
 - Package Imports
 - System Requirements
 - Suggested Packages

```
ggplot2
                                                                                 Q Search
                                           Date Modified
                                                                                      Size ^ Kind
             Package: ggplot2
             Version: 2.2.1
             Title: Create Elegant Data Visualisations Using the Grammar of Graphics
             Description: A system for 'declaratively' creating graphics,
                  based on "The Granmar of Graphics". You provide the data, tell 'ggplot2'
inst
                  how to map variables to aesthetics, what graphical primitives to use,
                  and it takes care of the details.
                 person("Hadley", "Wickham", , "hadley@rstudio.com", c("aut", "cre")),
person("Winston", "Chang", , "winston@rstudio.com", "aut"),
person("RStudio", role = c("cph"))
tests
             Depends: R (>= 3.1)
DEADME my Imports: digest, grid, gtable (>= 0.1.1), MASS, plyr (>= 1.7.1),
                      reshape2, scales (>= 0.4.1), stats, tibble, lazyeval
DESCRIPTIC Suggests: covr, ggplot2movies, hexbin, Hmisc, lattice, mapproj, maps,
                      maptools, mgcv, multconp, nlme, testthat (>= 0.11.0), quantreg,
NAMESPAC
                      knitr, rpart, rmarkdown, svglite
LICENSE
             License: GPL-2 | file LICENSE
MD5
             URL: http://ggplot2.tidyverse.org, https://github.com/tidyverse/ggplot2
             BugReports: https://github.com/tidyverse/ggplot2/issues
NEWS.md
             Collate: 'ggproto.r' 'aaa-.r' 'aes-calculated.r'
                       'aes-colour-fill-alpha.r' 'aes-group-order.r'
                      'aes-linetype-size-shape.r' 'aes-position.r' 'utilities.r'
                      'ees.r' 'legend-draw.r' 'geom-.r' 'annotation-custom.r' 'annotation-logticks.r' 'geom-polygon.r' 'geom-map.r'
                       'annotation-map.r' 'geom-raster.r' 'annotation-raster.r'
                       'annotation.r' 'autoplot.r' 'axis-secondary.R' 'bench.r'
```

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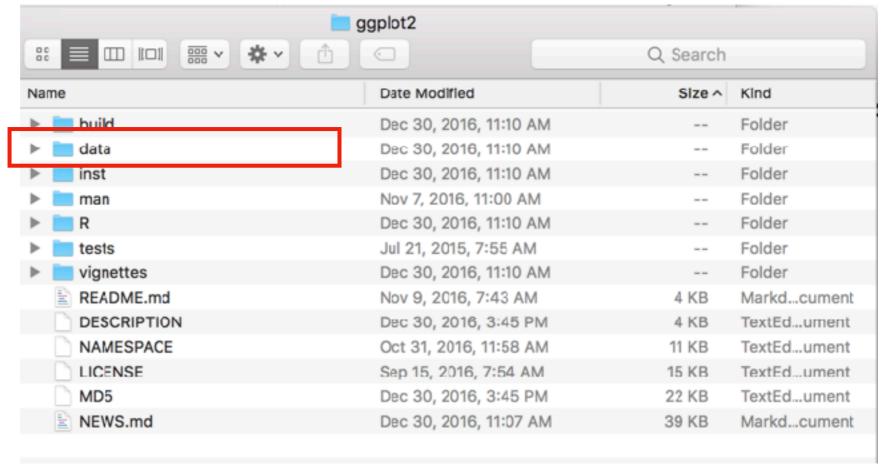
sample data

R Functions

Documentation.

• Sample data Package Folder

data Folder



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sample data

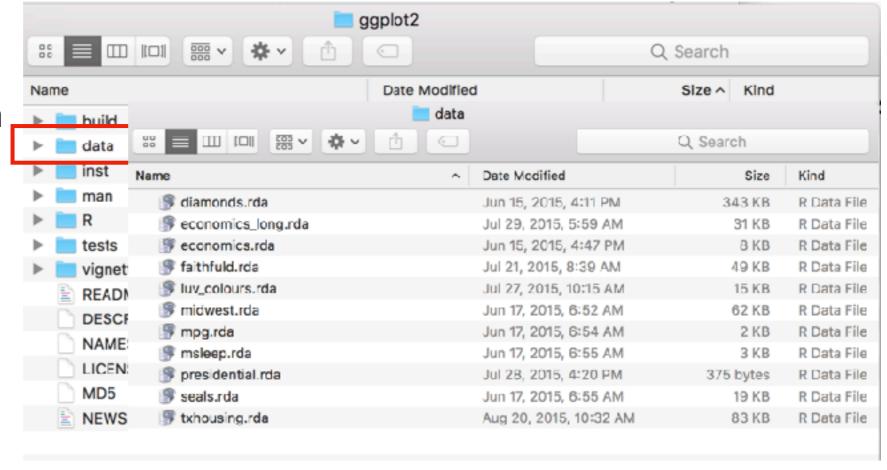
R Functions

Documentation.

Sample data

Package Folder

- data Folder
- .Rda files
 - Intrinsic to function utility
 - Run example successfully



What is a Bioconductor Package?

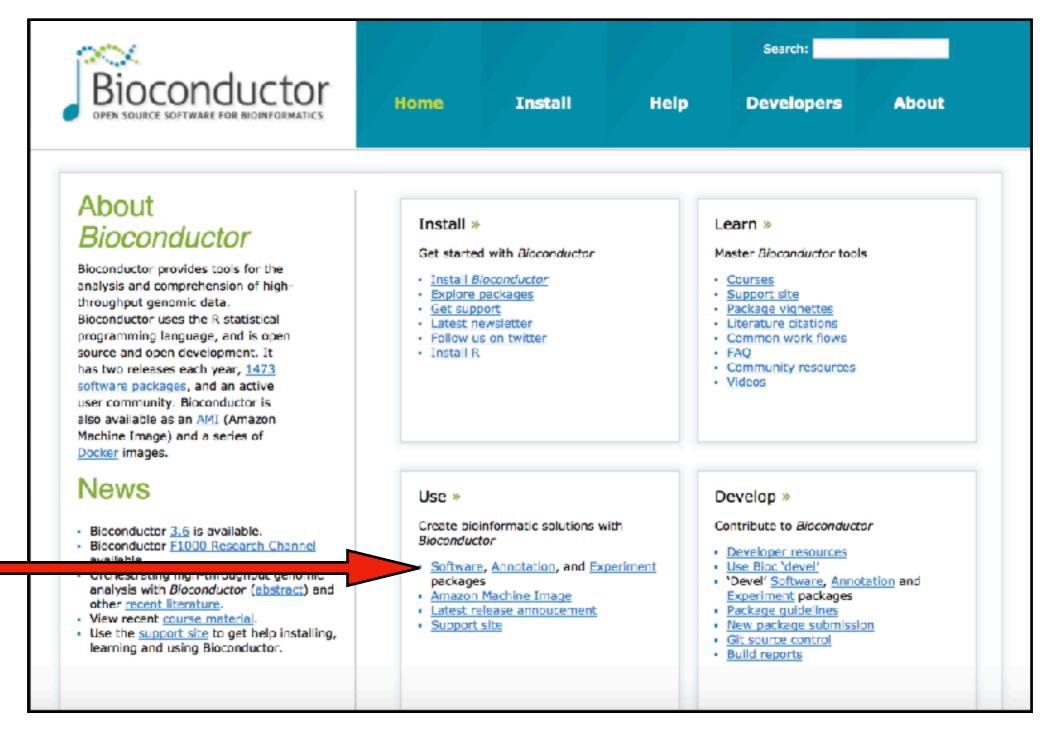
- Packages that meet requirements for R packages and aligned with goals set by Bioconductor project
 - To provide widespread access to a broad range of <u>powerful</u> statistical and <u>graphical methods</u> for the analysis of <u>genomic</u> <u>data</u>.
 - To facilitate the inclusion of <u>biological metadata</u> in the analysis of genomic data, e.g. literature data from PubMed, annotation data from Entrez genes.
 - To provide a common <u>software platform</u> that enables the rapid development and deployment of extensible, scalable, and interoperable software.
 - To further scientific understanding by producing high-quality documentation and reproducible research.



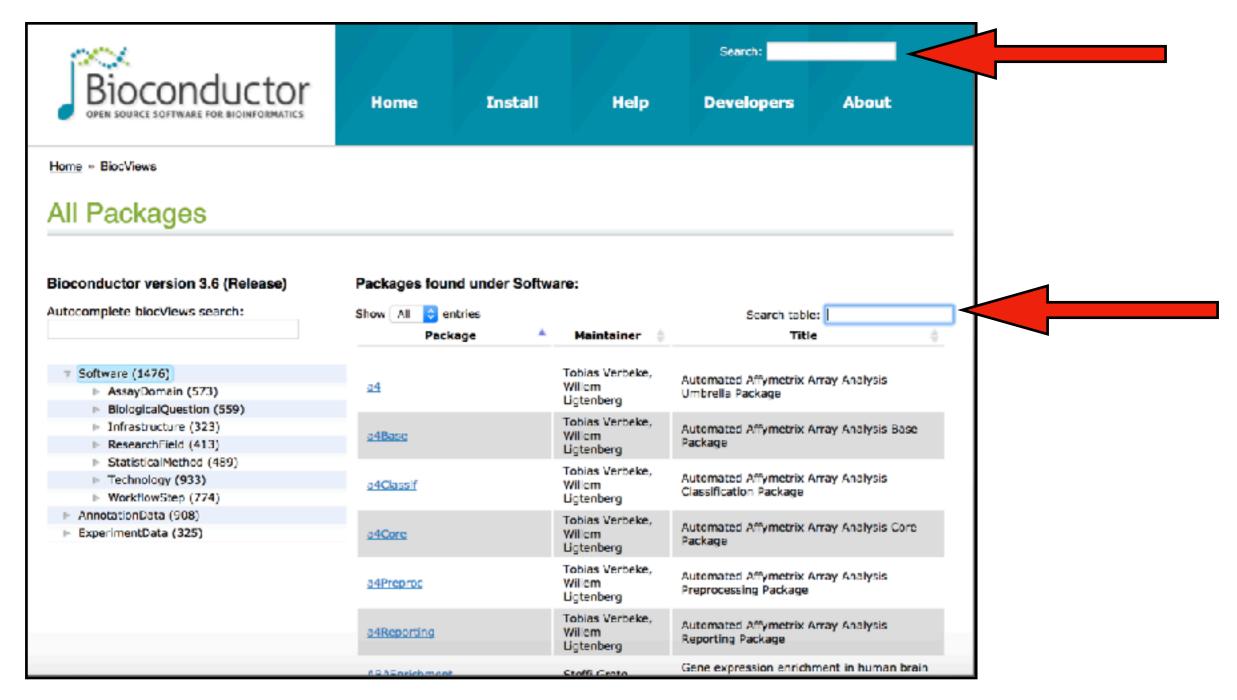
Types of Bioconductor Packages

- Software Packages: perform analytic calculations
- Annotation Packages: database-like packages that provide information linking identifies (e.g Entrez Gene name) to other information (e.g. chromosomal location)
- Experiment data Packages: provide data sets that are used by software packs to illustrate particular analysis. Contain curated data from an experiment, teaching course or publication.

Bioconductor Landing Page



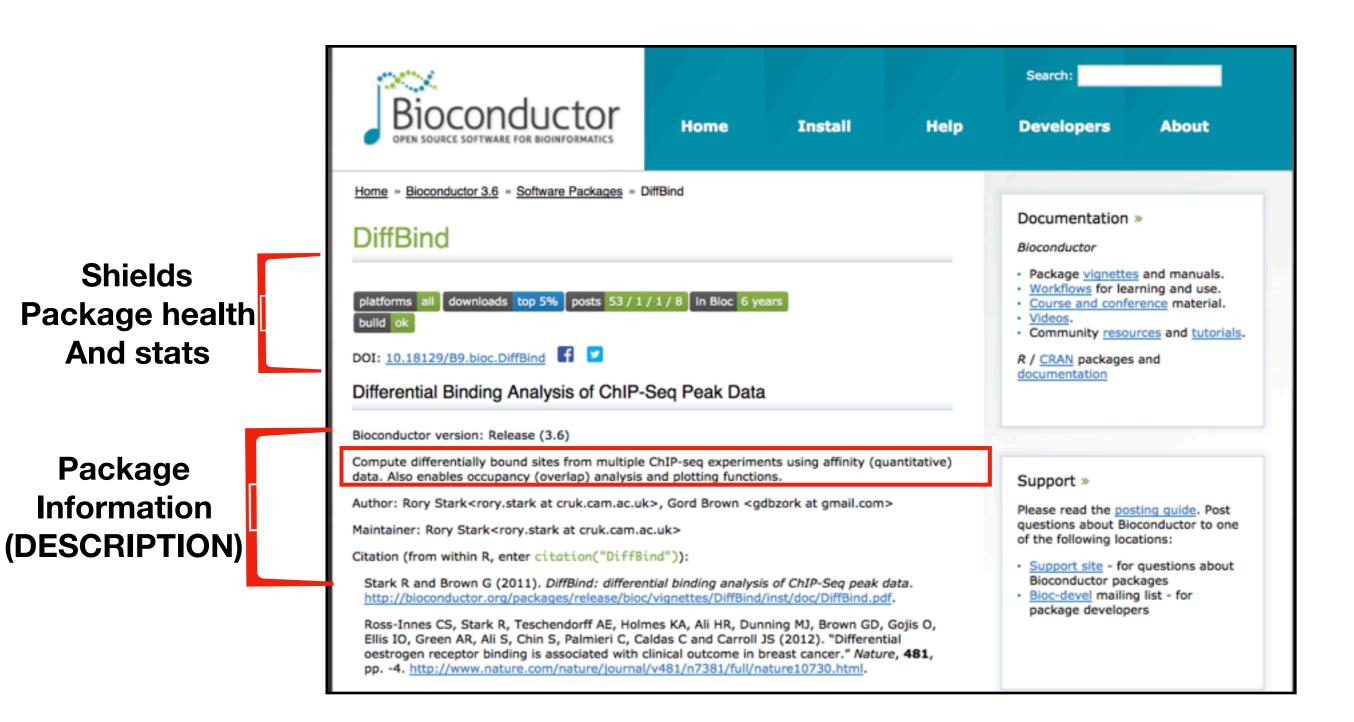
Bioconductor Search/Discover Packages (biocView)



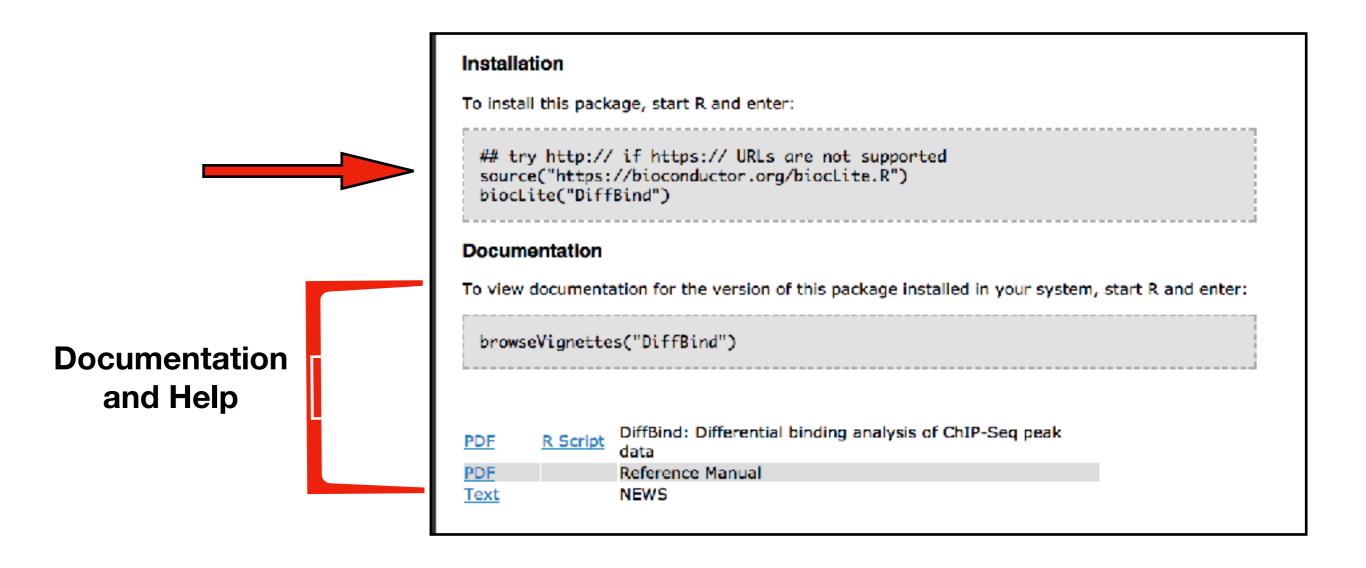
Bioconductor Landing Page

- Title
- author / maintainer
- short description
- citation
- installation instructions
- shields
- documentation
- download statistics

Bioconductor Landing Page



Bioconductor Landing Page (cont)



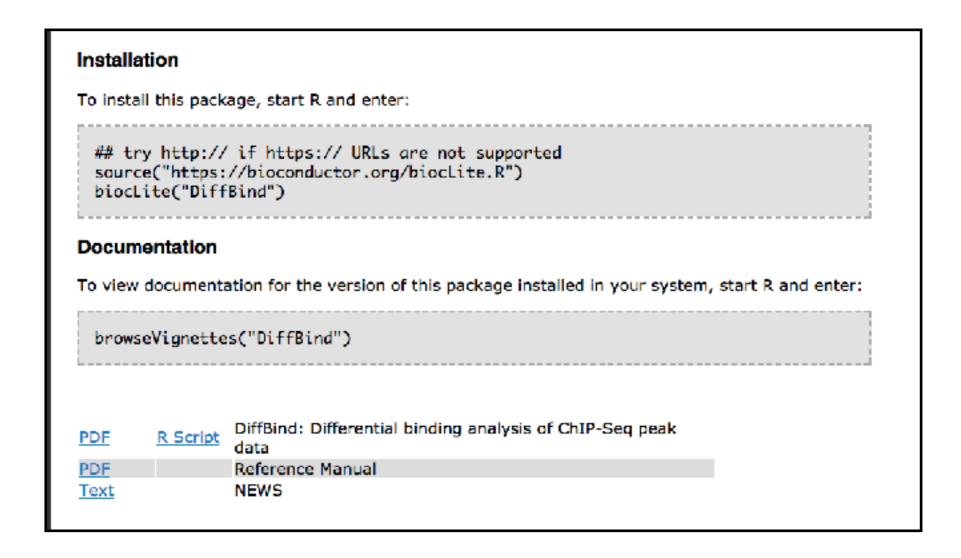
Bioconductor Packages Page (cont)



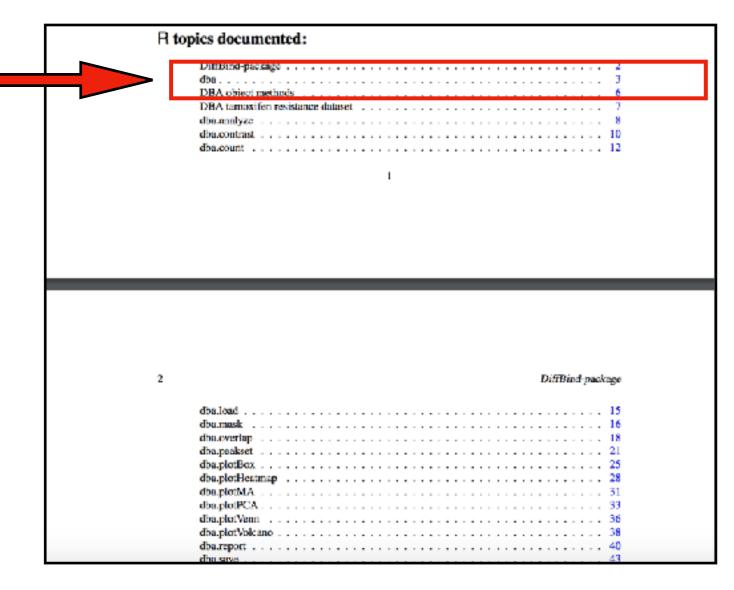
| Details | |
|--------------------------|--|
| biocViews | ChIPSeq, DifferentialPeakCalling, Sequencing, Software |
| Version | 2.6.5 |
| In Bioconductor since | BioC 2.9 (R-2.14) (6 years) |
| License | Artistic-2.0 |
| Depends | R (>= 3.4), GenomicRanges, SummarizedExperiment |
| Imports | RColorBrewer, amap, edgeR, gplots, grDevices, limma, GenomicAlignments, locfit, stats, utils, IRanges, zlibbioc, lattice, systemPipeR, tools, Rcpp, dplyr, ggplot2, BiocParallel, parallel, S4Vectors, Rsamtools, DESeq2, methods, graphics, ggrepel |
| LinkingTo | Rsamtools(>= 1.19.38), Rcpp |
| Suggests | DESeq, BiocStyle, testthat |
| SystemRequirements | \$ |
| Enhances | rgl, XLConnect |
| URL | |
| Depends On Me | ChIPQC, vulcan |
| Imports Me | |
| Suggests Me | |
| Build Report | |

Bioconductor Landing Documentation

- Manual
- Vignettes

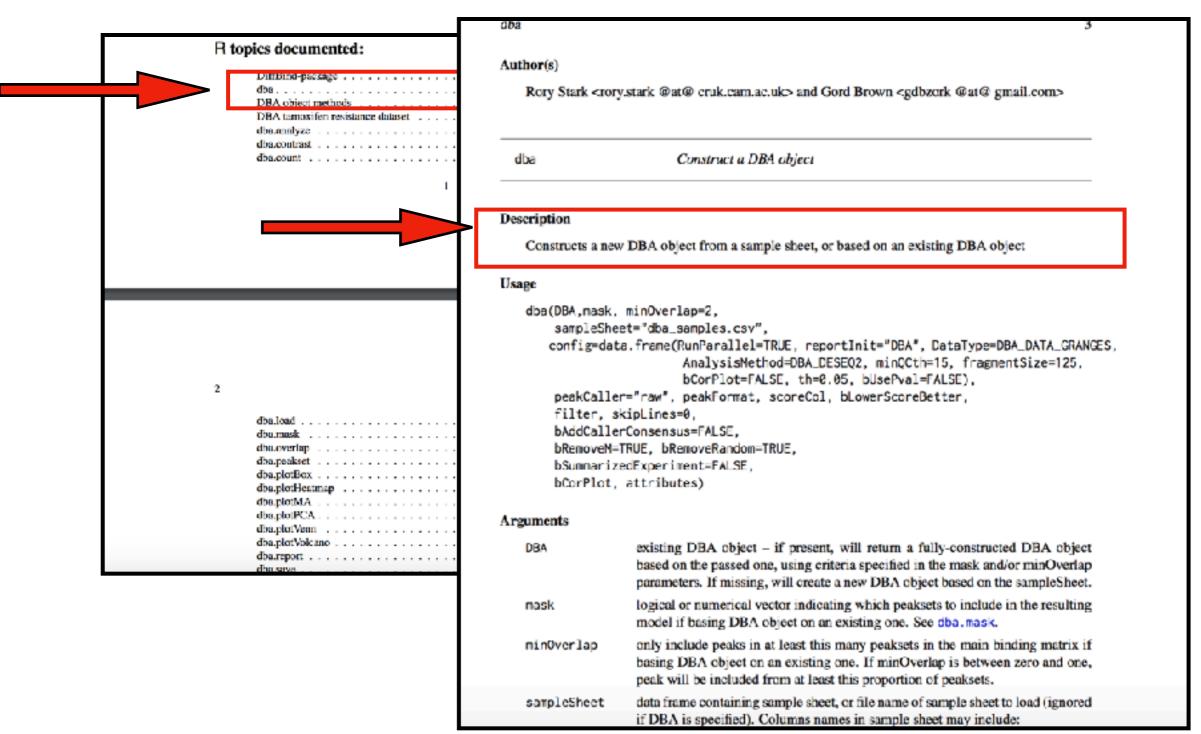


Bioconductor Packages Manual

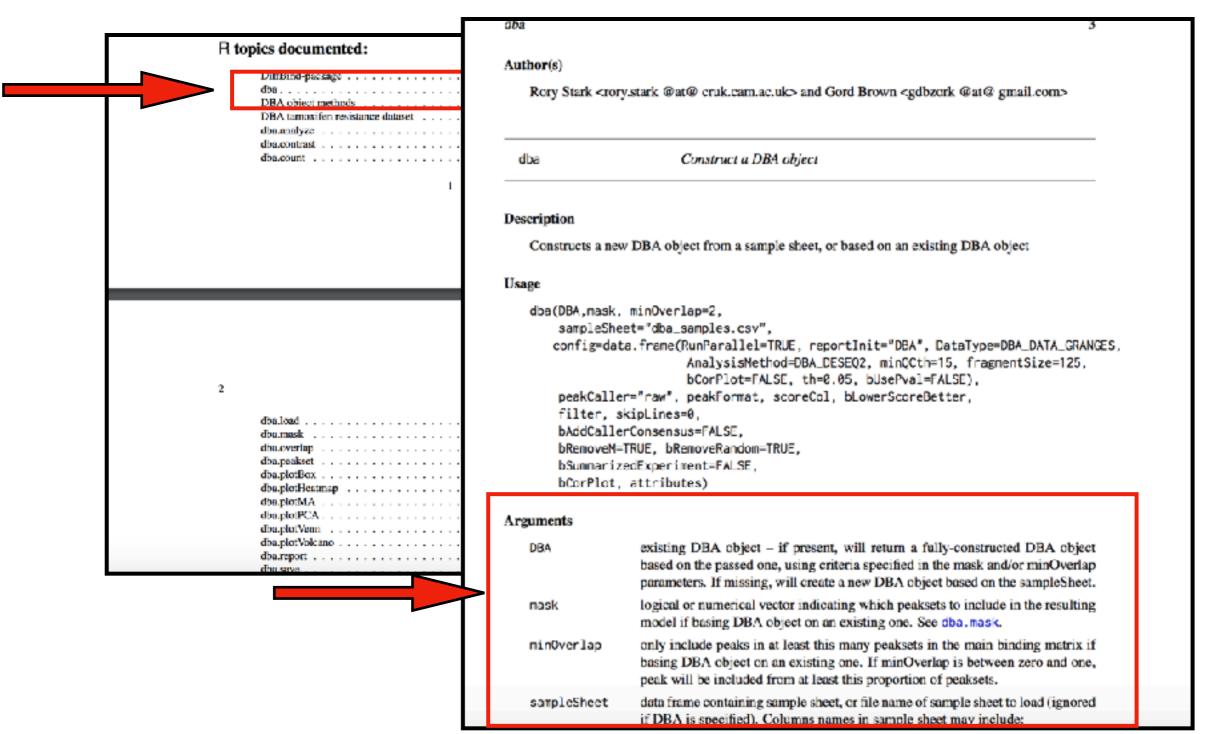


Contains entries for each function contained in the package

Bioconductor Packages Manual



Bioconductor Packages Manual



Bioconductor Packages Vignettes

- A vignette is an executable document consisting of a collection of code chunks and documentation text chunks.
- Vignettes provide <u>dynamic</u>, <u>integrated</u>, and <u>reproducible</u>
 documents that can be automatically updated if either data or
 analyses are changed.
- Provides a task oriented description of package functionality



Bioconductor Packages Vignettes PDF

3 Example: Obtaining differentially bound sites



This section offers a quick example of how to use *DiffBind* to identify significantly differentially bound sites using affinity (read count) data.

The dataset for this example consists of ChIPs against the transcription factor ERa using five breast cancer cell lines ([2]). Three of these cell lines are responsive to tamoxifen treatment, while two others are resistant to tamoxifen. There are at least two replicates for each of the cell lines, with one cell line having three replicates, for a total of eleven sequenced libraries. Of the five cell lines, two are based on MCF7 cells: the regular tamoxifen responsive line, as well as MCF7 cells specially treated with tamoxifen until a tamoxifen resistant cell line is obtained. For each sample, we have one peakset originally derived using the MACS peak caller ([1]), for a total of eleven peaksets. Note that to save space in the package, only data for chromosome 18 is used for the vignette. The metadata and peak data are available in the extra subdirectory of the *DiffBind* package directory; you can make this your working directory by entering:

- > library(DiffBind)
- > setwd(system.file("extra", package="DiffBind"))

Obtaining the sites significantly differentially bound (DB) between the samples that respond to tamoxifen and those that are resistant can be done in a five-step script:

```
Code —
```

```
> print(savewd)
> tamoxifen <- dba(sampleSheet="tamoxifen.csv")</pre>
```

- > tamoxifen <- dba.count(tamoxifen)
- > tamoxifen <- dba.contrast(tamoxifen)
- > tamoxifen <- dba.analyze(tamoxifen)
- > tamoxifen.DB <- dba.report(tamoxifen)

The following subsections describe these steps in more detail

Bioconductor Packages Vignettes R Script

```
### R code from vignette source 'DiffBind.Rnw'
                                **********************************
                                ### code chunk number 1: style
                                BiocStyle::latex()
                                savewd <- getwd()
                                ***********************************
                                ### code chunk number 2: DiffBind.Rnw:136-140
                                *************************************
                                tmp <- tempfile(as.character(Sys.getpid()))</pre>
                                pdf(tmp)
                                savewarn <- options("warn")
                                options(warn=-1)
                                **********************************
                                ### code chunk number 3: DiffBind.Rnw:144-146
                                **************************************
                                library(DiffBind)
                                setwd(system.file("extra", package="DiffBind"))
                                ### code chunk number 4: DiffBind.Rnw:151-157 (eval = FALSE)
                                ***********************************
                                ## print(savewd)
                                ## tamoxifen <- dba(sampleSheet="tamoxifen.csv")
Code
                                ## tamoxifen <- dba.count(tamoxifen)
                                ## tamoxifen <- dba.contrast(tamoxifen)
                                ## tamoxifen <- dba.analyze(tamoxifen)
                                ## tamoxifen.DB <- dba.report(tamoxifen)
                                ### code chunk number 5: sampSheet
                                *************************************
                                samples <- read.csv(file.path(system.file("extra", package="DiffBind"),</pre>
                                                                  tamoxifen.csv"))
                                names(samples)
                                samples
                                ### code chunk number 6: dbaConstruct
                                **************************************
                                tamoxifen <- dba(sampleSheet="tamoxifen.csv")</pre>
```

Install Bioconductor Packages

Use the biocLite.R script to install Bioconductor, CRAN and github packages. To install core packages, type the following in an R command window:

try http:// if https:// URLs are not supported source("https://bioconductor.org/biocLite.R") biocLite()

Install specific packages using:

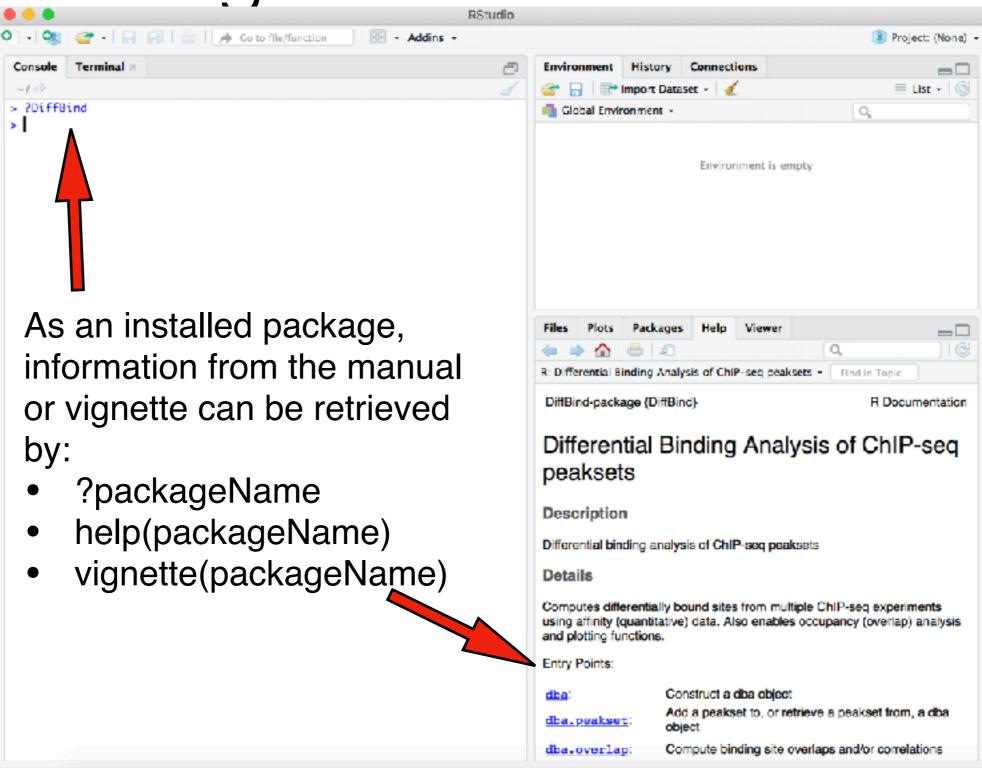
biocLite("DiffBind")

Once installed, the package can be load into an R session

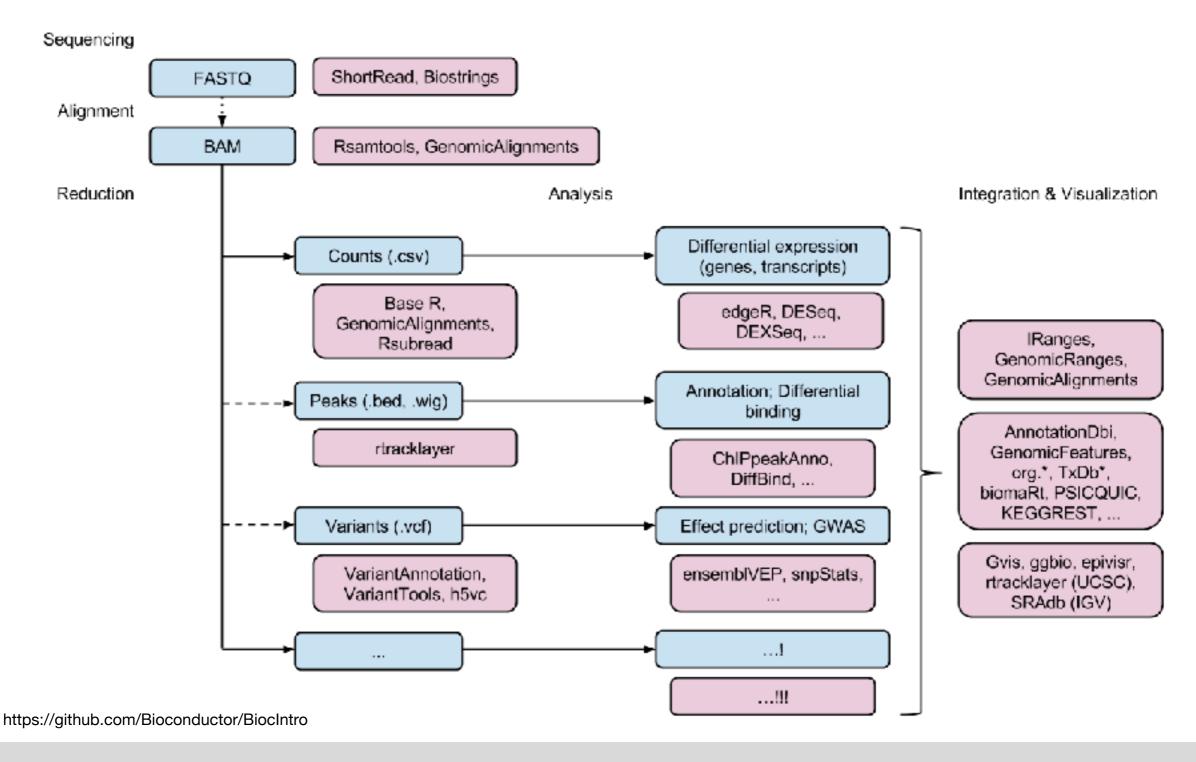
library("DiffBind")



Accessing Manual From RStudio



Bioconductor NGS Workflow



Bioconductor Infrastructure

- Biological Sequences: Biostrings
- Genomic Coordinates: GenomicRanges
- Aligned Reads: GenomicAlignment
- Multiple Assay and Experiments: SummarizedExperiment
- Annotation Resources

Biological Sequences: Biostrings

Manipulation of Biological Sequences

- DNA
- RNA
- Protein

```
> library(Biostrings)
Loading required package: XVector

Attaching package: 'Biostrings'

The following object is masked from 'package:DelayedArray':
    type

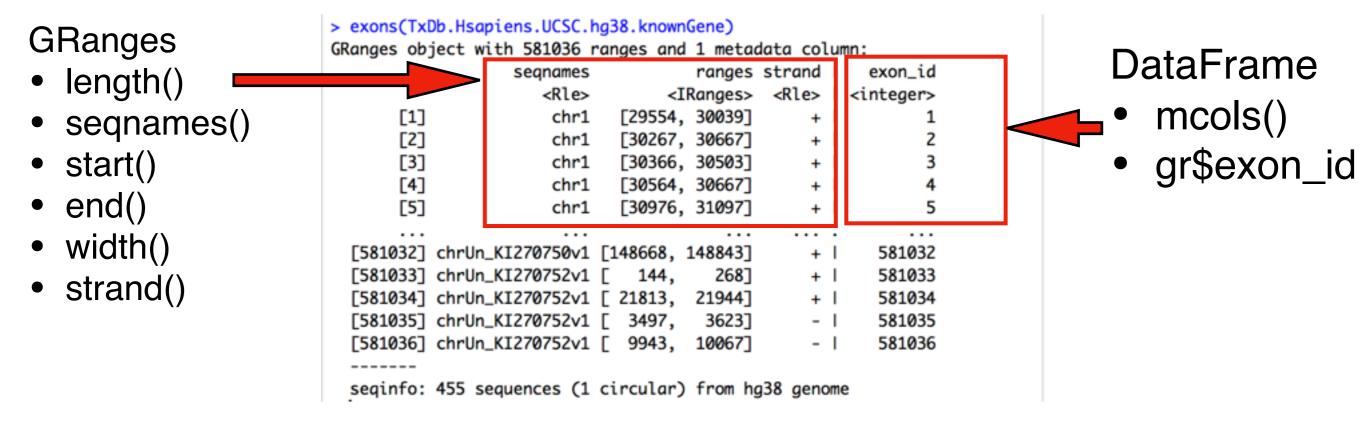
The following object is masked from 'package:base':
    strsplit

> dna <- DNAStringSet(c("AACAT", "GGCGCCCT"))
> reverseComplement(dna)
    A DNAStringSet instance of length 2
    width seq
[1]    5 ATGTT
[2]    7 AGGCGCC
> |
```

Genomic Coordinates: GenomicRanges

GRanges: Genomic coordinates to represent:

- annotations (exons, genes, regulatory marks, ...)
- data (called peaks, variants, aligned reads)



Genomic Coordinates: GenomicRanges

GRangesList: genomic coordinates grouped into list elements (e.g., paired-end reads; exons grouped by transcript)

GRangesList

- length()
- range()
- shift()

```
Terminal ×
> exonsBy(TxDb.Hsapiens.UCSC.hg38.knownGene, 'tx')
GRangesList object of length 197782:
GRanges object with 3 ranges and 3 metadata columns:
                                         exon_id exon_name
                              <Rle> | <integer> <character>
                    <IRanges>
          chr1 [29554, 30039]
 [1]
  [2]
                                                         <NA>
          chr1 [30564, 30667]
          chr1 [30976, 31097]
      exon_rank
      <integer>
 [1]
  [2]
  [3]
GRanges object with 2 ranges and 3 metadata columns:
                       ranges strand | exon_id exon_name exon_rank
 [1]
          chr1 [30267, 30667]
                                                     <N4>
                                                                  1
                                                                  2
  [2]
          chr1 [30976, 31109]
GRanges object with 1 range and 3 metadata columns:
                       ranges strand | exon_id exon_name exon_rank
          chr1 [30366, 30503]
<197779 more elements>
seginfo: 455 sequences (1 circular) from hg38 genome
```

GRanges

- grl[[2]]
- grl\$2



Aligned Reads: GenomicAlignment

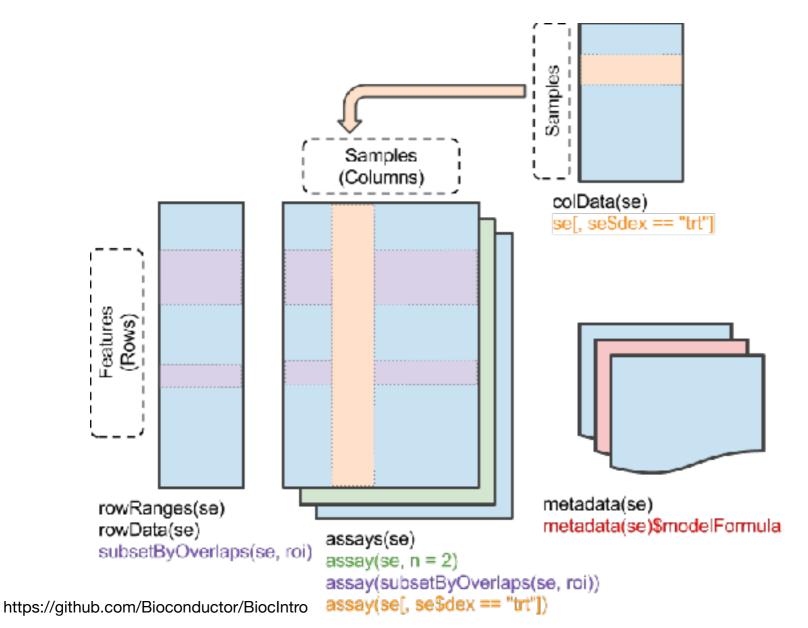
Representation of aligned reads

```
> aln1_file <- system.file("extdata", "ex1.bam", package="Rsamtools")</pre>
> aln1 <- readGAlignments(aln1_file)</pre>
> aln1
GAlignments object with 3271 alignments and 0 metadata columns:
         segnames strand
                                          awidth
                                                     start
                                                                  end
                   <Rle> <character> <integer> <integer> <integer>
     [1]
                                              36
             seq1
     [2]
                                  35M
                                                                   37
             seq1
     [3]
                                  35M
                                                                   39
             seq1
                                                                   41
     4
             seq1
                                  36M
                                  35M
                                                                   43
             seq1
                                                      1524
  3267
                                  35M
                                              35
                                                                 1558
             seq2
  [3268]
                                  35M
                                                      1524
                                                                 1558
             seq2
                                  35M
                                              35
                                                      1528
                                                                 1562
  [3269]
             seq2
  [3270]
                                                      1532
             seg2
                                                                 1566
                                                      1533
  [3271]
             seq2
                                                                 1567
             width
         <integer> <integer>
     [1]
     [2]
                35
     [3]
                35
     4
                            0
                36
     [5]
                35
                            0
  [3267]
                35
                            0
  [3268]
                35
                35
  [3269]
  [3270]
  [3271]
```

seginfo: 2 sequences from an unspecified genome

Multiple Assay and Experiments: SummarizedExperiment

The SummarizedExperiment container contains one or more assays, each represented by a matrix-like object of numeric or other mode. The rows typically represent genomic ranges of interest and the columns represent samples.



- · Coordinate feature x sample 'assays' with row (feature) and column (sample) descriptions.
- coldata() data frame for desciption of samples
- rowRanges()
 GRanges / GRangeList or
 data frame for description of
 features
- exptData() to describe the entire object
- assays() can be any matrix-like object

Annotation Resources

- Bioconductor provides extensive access to 'annotation' resources (see the AnnotationData biocViews hierarchy)
 - Packages for querying on-line resources; each of these have informative vignettes.
 - biomaRT
 - KEGGREST
- AnnotationDbi is a standard package:
 - **org** packages (e.g. org.Hs.eg.db) contain maps between different gene identifiers (e.g. ENTREZ and SYMBOL).
 - **TxDb** packages (e.g. TxDb.Hsapiens.UCSC.hg38.knownGene) contain gene models (e.g., exon coordinates, exon/transcript relationships) drived from common sources.
 - BSgeneome packages (e.g. BSgenome.Hsapiens.UCSC.hg38) contain whole genome of organism
- VariantAnnotation and ensembIVEP provide access to sequence annotation facilities, e.g., to identify coding variants.



Other Resources

- Bioconductor provided training Resources:
 - https://bioconductor.org/help/coursematerials/
- Support Site:
 - https://support.bioconductor.org/
- Basic Introduction to analyze data:
 - https://bioconductor.org/help/workflows/