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The rtracklayer package Manipulating and visualizing genomic annotations

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3 Interacting with a Genome Browser

Starting and loading tracks into a session Displaying and configuring browser views The browser as a data resource

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Tracks and experimental data analysis

- Many data types have natural mapping to genome:
 - SNPs
 - Chip-seq peaks
 - Methylation
- Annotation databases contain wealth of knowledge:
 - Genes and exons (biomaRt)
 - Conservation scores
 - Transcription factor binding sites, TransFac

Tracks and experimental data analysis

- Many data types have natural mapping to genome:
 - SNPs
 - Chip-seq peaks
 - Methylation
- Annotation databases contain wealth of knowledge:
 - Genes and exons (biomaRt)
 - Conservation scores
 - Transcription factor binding sites, TransFac

Goal

Integrate the analysis of experimental data with existing annotations.

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The rtracklayer package

The *rtracklayer* package is an interface (or *layer*) between **R**, genome browsers and genomic annotations.

Feature overview

- Annotation track representation and import/export (files and online databases)
- The control and querying of external genome browser sessions and views.
- Currently supports UCSC browser and database.

Case Study: Gene expression and microRNAs

Data Microarray time course of human stem cell differentiation

- Source Tewari lab at the FHCRC
- Question Are microRNAs regulating gene expression during differentiation?

Analysis

- 1 Find the differentially expressed genes
- Oreate a track with microRNA target sites on DE genes
- Opload track to genome browser to view in genomic context

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Storing data on intervals The RangedData object

- *RangedData* objects, defined by the *IRanges* package, hold data on (genomic) intervals.
- Two components
 - 1 The interval starts and widths, segregated by chromosome
 - **2** The variables describing the intervals

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Prepa	aring the	data		

- Used limma to find genes with changed expression after differentiation
- Obtained microRNA target sites from MiRBase, available from *microRNA* package

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- Filtered the target sites for those near DE genes
- Available as dataset in *rtracklayer* package

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- Used limma to find genes with changed expression after differentiation
- Obtained microRNA target sites from MiRBase, available from *microRNA* package

- Filtered the target sites for those near DE genes
- Available as dataset in rtracklayer package

Code

- > library(rtracklayer)
- > data(targets)

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Constructing a track object

Constructing the RangedData instance

Construct *IRanges* instance holding the endpoints of each target site

2 Construct RangedData with ranges, strand, chromosome and Ensembl transcript IDs Outline Introduction

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Constructing a track object

Constructing the RangedData instance

Construct *IRanges* instance holding the endpoints of each target site

Code

> targetRanges <- IRanges(targets\$start, targets\$end)</pre>

2 Construct RangedData with ranges, strand, chromosome and Ensembl transcript IDs Outline Introduct

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Constructing a track object

Constructing the RangedData instance

- Construct *IRanges* instance holding the endpoints of each target site
- 2 Construct RangedData with ranges, strand, chromosome and Ensembl transcript IDs

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Constructing a track object

Constructing the RangedData instance

- Construct *IRanges* instance holding the endpoints of each target site
- 2 Construct RangedData with ranges, strand, chromosome and Ensembl transcript IDs

Code

```
> targetTrack <- with(targets,
+ GenomicData(targetRanges, target,
+ strand = strand,
+ chrom = chrom, genome = "hg18"))
```

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Accessing feature information

Accessing built-in attributes

Each built-in feature attribute has a corresponding accessor method: start, end, chrom, strand, genome

Exam	iple		
> he	ad(start(t	argetTrack))	
[1]	7762840	11957570 91921292	
[4]	86981576	54270236 195970022	

Exercises

- 1 Get the strand of each feature in the track
- **2** Get the genome for the track

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Accessing feature information

Accessing built-in attributes

Each built-in feature attribute has a corresponding accessor method: start, end, chrom, strand, genome

Exercises 1 Get the strand of each feature in the track > head(strand(targetTrack)) [1] + + - + - Levels: - + * 2 Get the genome for the track

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Accessing feature information

Accessing built-in attributes

Each built-in feature attribute has a corresponding accessor method: start, end, chrom, strand, genome

Exercises

① Get the strand of each feature in the track
> head(strand(targetTrack))
[1] + + - + - -

Levels: - + *

2 Get the genome for the track

> genome(targetTrack)

[1] "hg18"

Accessing feature information

Accessing data columns

Any data column (including strand) is accessible via \$ and [[.

Example

> head(targetTrack\$target)

- [1] ENST0000054666 ENST00000196061
- [3] ENST00000212355 ENST00000212369
- [5] ENST00000234831 ENST00000235453
- 34507 Levels: ENST0000000233 ...

Exercise

Reconstruct (partially) the targets data.frame

Accessing feature information

Accessing data columns

Any data column (including strand) is accessible via \$ and [[.

Example

- > head(targetTrack\$target)
- [1] ENST0000054666 ENST00000196061
- [3] ENST00000212355 ENST00000212369
- [5] ENST00000234831 ENST00000235453
- 34507 Levels: ENST0000000233 ...

Exercise

Reconstruct (partially) the targets data.frame

>	<pre>data.frame(chrom</pre>	=	<pre>chrom(targetTrack),</pre>
+	start	=	<pre>start(targetTrack),</pre>
+	end =	er	nd(targetTrack),
+	strand	1 =	<pre>strand(targetTrack)</pre>

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Subsetting tracks

Overview of *RangedData* subsetting

- Often need to subset track features and data columns
- Example: limit the amount transferred to a genome browser
- Matrix style: track[i, j], where i is feature index and j is column index
- By chromosome: track[i], where i indexes the chromosome

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Subsetting tracks

Subsetting examples and exercises

Examples

- > ## get the first 10 targets
- > first10 <- targetTrack[1:10,]</pre>
- > ## get pos strand targets
- > posTargets <- targetTrack[strand(targetTrack)=="+",]</pre>
- > ## get chromosome 1 features
- > chr1Targets <- targetTrack[1]</pre>

Exercise

Subset the track for all features on the negative strand of chromosome $\ensuremath{\mathbf{2}}$

Subsetting tracks

Subsetting examples and exercises

Examples

- > ## get the first 10 targets
- > first10 <- targetTrack[1:10,]</pre>
- > ## get pos strand targets
- > posTargets <- targetTrack[strand(targetTrack)=="+",]</pre>
- > ## get chromosome 1 features
- > chr1Targets <- targetTrack[1]</pre>

Exercise

Subset the track for all features on the negative strand of chromosome 2

> chr2 <- targetTrack["2"]</pre>

> negChr2 <- chr2[strand(chr2) == "-",]</pre>

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Exporting and importing tracks

Overview of import/export

Supported formats

- BED Browser Extended Display, display-oriented, native format of UCSC
- WIG Wiggle, sparse format for quantitative data
- GFF General Feature Format (versions 1, 2, and 3), general storage, popular at EBI
- Functions: import and export
- Extensible via plugin system

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Exporting and importing tracks

Import/export examples and exercises

Examples

- > export(targetTrack, "targets.bed")
- > restoredTrack <- import("targets.bed")</pre>
- > ## as character vector
- > targetChar <- export(targetTrack, format = "gff1")</pre>

Exercises

- 1 Output the track to a file in the "gff" format.
- 2 Read the track back into R.

Exporting and importing tracks

Import/export examples and exercises

Examples

- > export(targetTrack, "targets.bed")
- > restoredTrack <- import("targets.bed")</pre>
- > ## as character vector
- > targetChar <- export(targetTrack, format = "gff1")</pre>

Exercises

1 Output the track to a file in the "gff" format.

- > export(targetTrack, "targets.gff")
- 2 Read the track back into R.

Exporting and importing tracks

Import/export examples and exercises

Examples

- > export(targetTrack, "targets.bed")
- > restoredTrack <- import("targets.bed")</pre>
- > ## as character vector
- > targetChar <- export(targetTrack, format = "gff1")</pre>

Exercises

+

- 1 Output the track to a file in the "gff" format.
 - > export(targetTrack, "targets.gff")
- 2 Read the track back into R.
 - > targetGff <- import("targets.gff",</pre>

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The genome browser interface

- rtracklayer interfaces with the UCSC genome browser
- Easily extended to support other browsers
- Workflow
 - 1 Start a browser session
 - 2 Load one or more tracks
 - Open one or more browser views of specific regions
 - 4 Possibly download interesting annotations into R

Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser	Conclusion			
Starting an	Starting and loading tracks into a session						
Start	ing a bro	wser session					

Code

> session <- browserSession("UCSC")</pre>

The session object is a *BrowserSession* instance. With a session object, one may:

- Upload and download tracks to/from the genome browser
- Create browser views

The argument "UCSC" creates a session for the UCSC browser. To list all supported browsers:

Code

> genomeBrowsers()

[1] "UCSC"

Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser	Conclusion			
Starting ar	Starting and loading tracks into a session						
Layir	ig the tar	get site track					

Tracks may be loaded into a session with the track<-, [[<- and <- functions.

Example

- > track(session, "targets") <- targetTrack</pre>
- > ## equivalently
- > session\$targets <- targetTrack</pre>

Exercise

Lay a track with the first 100 features of targetTrack

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Starting an	Starting and loading tracks into a session							
Layin	ig the tar	get site track						

Tracks may be loaded into a session with the track<-, [[<- and <- functions.

Example

- > track(session, "targets") <- targetTrack</pre>
- > ## equivalently
- > session\$targets <- targetTrack</pre>

Exercise

Lay a track with the first 100 features of targetTrack

> session\$target100 <- targetTrack[1:100,]</pre>

Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser	Conclusion				
Displaying a	Displaying and configuring browser views							
Choo	sing a re	gion to view						

- The range function returns an object representing the genomic range of a track
- Assume we want to view a region around the first target site

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- 1 Get the range of the first feature
- **2** Zoom out by a factor of 10

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Choo	sing a re	gion to view					

- The range function returns an object representing the genomic range of a track
- Assume we want to view a region around the first target site
 - 1 Get the range of the first feature



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Displaying a	Displaying and configuring browser views							
Choo	sing a re	gion to view						

- The range function returns an object representing the genomic range of a track
- · Assume we want to view a region around the first target site
 - 1 Get the range of the first feature
 - 2 Zoom out by a factor of 10

Code > region <- region * -10

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Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser	Conclusion
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Creat	ting a vie	W		

Code

> view <- browserView(session, region)</pre>

The view object is a *BrowserView* instance. With a view object, one may:

- Change the currently visible region (pan/zoom)
- Change the visibility of tracks (show/hide)

Exercise

Create a new view with the same region as view, except zoomed out 2X.

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Code

> view <- browserView(session, region)</pre>

The view object is a *BrowserView* instance. With a view object, one may:

- Change the currently visible region (pan/zoom)
- Change the visibility of tracks (show/hide)

Exercise

Create a new view with the same region as view, except zoomed out 2X.

> viewOut <- browserView(session, range(view) * -2)</pre>

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A sho	ortcut			

All of the above in a single step:

>	browseGenome(targetTrack,		
+	<pre>range = range(targetTrack[1,])</pre>	* -1())

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A session is started, the track is loaded and a view is created around the first target site.

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Chan	ging view	/ range		

The range<- function sets a new visible range on a view.



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Exercise

Shift the view to the second target site

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Displaying a	Displaying and configuring browser views					
Changing view range						

The range<- function sets a new visible range on a view.

Example

- > ## zoom in 2X
- > range(view) <- range(view) * 2</pre>

Exercise

Shift the view to the second target site

```
> range(view) <- range(targetTrack[2,]) * -5</pre>
```

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Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser	Conclusion		
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Chang	Changing track visibility					

Tracks may be shown or hidden with the visible<- function.

Example > ## hide the Conservation track > visible(view)["Conservation"] <- FALSE

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Exercise

Make the "Ensembl Genes" track visible

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Displaying a	Displaying and configuring browser views						
Changing track visibility							

Tracks may be shown or hidden with the visible<- function.

Example

- > ## hide the Conservation track
- > visible(view)["Conservation"] <- FALSE</pre>

Exercise

Make the "Ensembl Genes" track visible

> visible(view)["Ensembl Genes"] <- TRUE</pre>

Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser	Conclusion		
The browser	The browser as a data resource					
Over	view					

- Many browsers are built upon large databases
- Often want to incorporate the data into an R analysis

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• For UCSC, this interacts with the table browser

The browser as a data resource Retrieving browser tracks	Outline	Introduction	Managing Genomic Data (Tracks) 00000000	Interacting with a Genome Browser ○○○○○○○●	Conclusion			
Retrieving browser tracks	The browser	The browser as a data resource						
	Retrieving browser tracks							

- 1 List available tracks
- 2 Download named track (e.g. "Conservation") in currently viewed region

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The browser as a data resource

Retrieving browser tracks

1 List available tracks

Code

> head(trackNames(session))

targets	Base Position
"ct_targets"	"ruler"
Chromosome Band	STS Markers
"cytoBand"	"stsMap"
FISH Clones	Recomb Rate
"fishClones"	"recombRate"

2 Download named track (e.g. "Conservation") in currently viewed region

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The browser as a data resource						
Retrieving browser tracks						

- 1 List available tracks
- 2 Download named track (e.g. "Conservation") in currently viewed region

Code

+

```
> cons <- track(session, "Conservation")</pre>
```

```
> ## or specific region
```

```
> cons <- track(session, "Conservation",</pre>
```

```
range(view) * 2)
```

```
> ## shortcut
```

```
> cons <- session$Conservation</pre>
```

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Beyond rtracklayer

• rtracklayer operates in the context of genome browsers

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- Bioconductor has other sources of annotations:
 - The annotation packages
 - biomaRt

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Sessi	on info			

```
> sessionInfo()
R version 2.9.0 Under development (unstable) (--)
i686-pc-linux-gnu
locale:
С
attached base packages:
[1] stats graphics grDevices
[4] utils datasets methods
[7] base
other attached packages:
[1] rtracklayer_1.3.7 RCurl_0.91-0
loaded via a namespace (and not attached):
[1] BSgenome_1.11.9
[2] Biostrings_2.11.18
[3] IRanges_1.1.33
[4] Matrix 0.999375-17
[5] XML_1.98-1
[6] grid_2.9.0
[7] lattice 0.17-20
[8] tools_2.9.0
```