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Intervals and Data on Intervals in BioC The IRanges Package

November 18, 2009

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- Representation of information on chromosomes/contigs
 - Intervals with or without associated data
 - Piecewise constant measures (e.g. coverage)
- Vector and interval operations for these representations

- Interval overlap calculations
- Coverage area within peak regions
- Metadata scheme for self-documenting objects



Two most important classes in IRanges

- *RangedData* intervals and associated data on chromosomes/contigs. It can be conceptualized as a data table that is sorted by the chromosomes/contigs indicator column.
- *RleList* coverage (or other piecewise constant measures) on chromosomes/contigs. RLE is an initialism for run length encoding, a standard compression method in signal processing.

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- Genomic coordinates consist of chromosome, position, and potentially strand information
- Each coordinate or set of coordinates may have additional values associated with it, such as GC content or alignment coverage
- A collection of intervals with data are commonly called tracks in genome browsers

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 Naive Approach in R

Naive representation of intervals with data row (1/2)

• Tables in R are commonly stored in *data.frame* objects.

data.frame approach

```
> chr <- c("chr1", "chr2", "chr1")</pre>
> strand <- c("+", "+", "-")
> start <- c(3L, 4L, 1L)
> end <- c(7L, 5L, 3L)
> naiveTable <- data.frame(chr = chr,</pre>
+ strand = strand, start = start,
 end = end)
+
> naiveTable
  chr strand start end
1 chr1
         + 3 7
2 chr2 + 4 5
                     3
3 chr1
                 1
```



Naive representation of intervals with data row (2/2)

 data.frame objects are poorly suited for this data because operations are constantly performed within chromosome/contig.

Using by to loop over data.frame

```
> by(naiveTable, naiveTable[["chr"]],
+ function(x) range(x[c("start",
+ "end")]))
naiveTable[["chr"]]: chr1
[1] 1 7
------
naiveTable[["chr"]]: chr2
[1] 4 5
```


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RangedData construction

- Instances are created using the RangedData constructor.
- Interval starts and ends are wrapped in an *IRanges* constructor.
- Chromosome/contig information is supplied to space argument.
- > rdTable <- RangedData(ranges = IRanges(start = start,</pre>

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+ end = end), strand = strand, space = chr)



- The *RangedData* class sacrifices table row order flexibility for faster computational timings.
- > rdTable

RangedData with 3 rows and 1 value column across 2 spaces space ranges | strand <character> <IRanges> | <character> 1 chr1 [3, 7] | + 2 chr1 [1, 3] | -3 chr2 [4, 5] | +

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RangedData Representation

RangedData computation

Simplified looping

```
> range(ranges(rdTable))
```

```
CompressedIRangesList of length 2

$chr1

IRanges of length 1

start end width

[1] 1 7 7

$chr2

IRanges of length 1

start end width
```

```
\begin{bmatrix} 1 \end{bmatrix} \quad 4 \quad 5 \quad 2 \end{bmatrix}
```

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RangedData Representation

RangedData class decomposition

RangedData

- *RangesList* intervals on chromosomes/contigs. Extracted using the ranges function.
 - *Ranges* intervals for a specific chromosome/contig. Most common subclass is *IRanges*.
- *SplitDataFrameList* data on chromosomes/contigs. Extracted using the values function.
 - DataFrame data for a specific chromosome/contig.

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Interval Operations

Creating a new RangedData object

New object to use in interval operations



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Lo	w level data acc	ess		
				_
	Accessors			
	> start(rd)			

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[1] 1 8 14 15 19 34 40

> end(rd)

[1] 12 13 19 29 24 35 46

> width(rd)

[1] 12 6 6 15 6 2 7

RangedData subsetting

> rd[1:5,]

RangedData with 5 rows and 1 value column across 1 space space ranges strand <character> <IRanges> | <character> chr1 [1, 12] | 1 2 chr1 [8, 13] | + 3 chr1 [14, 19] | + 4 chr1 [15, 29] | 5 chr1 [19, 24] |

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Interval Ope	rations			
Shifti	ng intervals			

- If your interval bounds are off by 1, you can shift them.
- > rd2 <- rd
- > ranges(rd2) <- shift(ranges(rd2), 1)</pre>

> rd2

Ra	angedData wit	th 7 rows	and	d 1 value	column	across	1	spa	ce
	space	ranges	5	stra	and				
	<character></character>	<iranges></iranges>	•	<characte< td=""><td>er></td><td></td><td></td><td></td><td></td></characte<>	er>				
1	chr1	[2,13]	Ι		+				
2	chr1	[9, 14]	Ι		+				
3	chr1	[15, 20]	Ι		+				
4	chr1	[16, 30]	Ι		+				
5	chr1	[20, 25]	Ι		-				
6	chr1	[35, 36]	Ι		-				
7	chr1	[41, 47]	Ι		-				
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 One common operation in ChIP-seq experiments is to "grow" and alignment interval to an estimated fragment length.

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- > rd3 <- rd
- > pos <- values(rd3)[, "strand"] == "+"
- > ranges(rd3)[pos] <- resize(ranges(rd)[pos],</pre>

+ 120)

- > ranges(rd3)[!pos] <- resize(ranges(rd)[!pos],</pre>
- + 120, start = FALSE)

Intervals with Data <u>000000</u>0**000000000000**0000

Positional Piecewise Constant Measures

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Interval Operations

Resizing intervals (2/2)

> rd3

Ra	ngedData wit	h 7 r	ows ar	nd	1 val	ue	column	across	1	space
	space	r	anges	Ι		str	rand			
	<character></character>	<ira:< td=""><td>nges></td><td>Ι</td><td><char< td=""><td>ract</td><td>er></td><td></td><td></td><td></td></char<></td></ira:<>	nges>	Ι	<char< td=""><td>ract</td><td>er></td><td></td><td></td><td></td></char<>	ract	er>			
1	chr1	[1,	120]				+			
2	chr1	[8,	127]				+			
3	chr1	[14,	133]	Ι			+			
4	chr1	[15,	134]	Ι			+			
5	chr1	[-95,	24]	Ι			-			
6	chr1	[-84,	35]	Ι			-			
7	chr1	[-73,	46]				-			

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Interval Operations						

Restricting interval bounds

- The previous operation created some negative start values. We can "clip" those negative values.
- > ranges(rd3) <- restrict(ranges(rd3),</pre>
- + 1)
- > rd3

RangedData with 7 rows and 1 value column across 1 space space ranges strand <character> <IRanges> | <character> 1 chr1 [1, 120] | + 2 chr1 [8, 127] | + 3 chr1 [14, 133] | + 4 chr1 [15, 134] | + 5 chr1 [1, 24] | 6 chr1 [1, 35] | 7 chr1 [1, 46] ・
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Interval Operations							
Norm	alizing inte	rvals					

- Ranges can represent a set of integers
- *NormallRanges* formalizes this, with a compact, normalized representation

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reduce normalizes ranges

Code

> reduce(ranges(rd))



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Set ope	erations				

- Ranges as set of integers: intersect, union, gaps, setdiff
- Each range as integer set, in parallel: pintersect, punion, pgap, psetdiff

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Example: gaps

> gaps(ranges(rd))



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Interval Operation	ons						
Disjoini	Disjoining intervals						

- Disjoint ranges are non-overlapping
- disjoin returns the widest ranges where the overlapping ranges are the same

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Code

> disjoin(ranges(rd))



disjoin(ranges(rd))[["chr1"]]



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Interval Operation	ons			
Overlap	detection			

- overlap detects overlaps between two Ranges objects
- Uses interval tree for efficiency

Code

- > ol <- findOverlaps(ranges(rd), reduce(ranges(rd)))</pre>
- > as.matrix(ol)

query subject [1,]1 [2,] 2 [3,] 3 [4,] 4 5 [5,] [6,] 6 2 [7,] 7 3



coverage counts number of ranges over each position





- nearest finds the nearest neighbor ranges (overlapping is zero distance)
- precede, follow find non-overlapping nearest neighbors on specific side

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Background RLEs





Positional piecewise constant measures

- The number of genomic positions in a genome is often in the billons for higher organisms, making it challenging to represent in memory.
- Some data across a genome tend to be sparse (i.e. large stretches of "no information")
- The *IRanges* packages solves the set of problems for positional measures that tend to have consecutively repeating values.
- The *IRanges* package *does not* address the more general problem of positional measures that constantly fluxuate, such as conservation scores.

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RLEs				

Run-Length Encodings (RLEs)

Our example has many repeated values:

Code
> sum(diff(s) == 0)
[1] 133

Good candidate for compression by run-length encoding:

Code
> sRle <- Rle(s) > sRle
'numeric' Rle of length 156 with 23 runs
Lengths: 40 1 2 3 1 2 3 1 2 3
Values : 0 1 2 3 4 5 6 7 8 9

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Compression reduces size from 156 to 46.

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Rle or	perations			

The *Rle* object shares many method interfaces with vector:

Basic				
> sRle > 0 rev(sRle) > 0				
'logical' Rle of length 156 with 3 runs				
Lengths: 40 76 40				
Values : FALSE TRUE FALSE				

Summary

> sum(sRle > 0)

[1] 66

Statistics

> cor(sRle, rev(sRle))

[1] 0.5142557

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- Associates a Ranges object with a sequence
- Sequences can be *Rle* or (in Biostrings) *XString*
- Extends Ranges, so supports the same operations

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Slicing a Sequence into Views

Goal: find regions above cutoff of 3



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Sli	cing a Sequence	e into Views					
	Goal: find regions	above cutoff of 3					
	Using Rle						
	<pre>> Views(sRle, as(sRle > 3, "IRanges"))</pre>						
	Views on a 156-length Rle subject						
	views:						
	start end w	idth					
	[1] 47 67	21 [4 5 5 6 6 6]					
	[2] 86 100	15 [5 5 5 5 5 5 5 5 5]					

Convenience

- > sViews <- slice(sRle, 4)</pre>
- > sViewsList <- RleViewsList(slice(sRle,</pre>
- + 4), slice(rev(sRle), 4))

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Summarizing windows

- Could sapply over each window
- Native functions available for common tasks: viewMins, viewMaxs, viewSums, ...

Code

```
> viewSums(sViews)
```

```
[1] 150 72
```

```
> viewSums(sViewsList)
```

SimpleNumericList of length 2 [[1]] 150 72 [[2]] 72 150

> viewMaxs(sViews)

[1] 10 5

> viewMaxs(sViewsList)