## Building and Using Ensembl-based Annotation Packages with ensembldb

Johannes Rainer<sup>1</sup>

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## Johannes Rainer (EURAC), BioC 2016, Stanford

## Clone me @GitHub:

http://github.com/jotsetung/Bioc2016-ensembldb.

- TxDb objects from GenomicFeatures provide gene model annotations:
  - Used for RNA-seq, CHiP-seq, etc.
  - Providing mostly UCSC annotations.
- ensembldb package defines the EnsDb class:
  - Same functionality as TxDb objects, plus:
  - Designed for Ensembl: all genes, attributes gene biotype and tx biotype.
  - Allows to query specific annotations using a simple filter framework.
- Available methods to extract data:
  - genes
  - transcripts
  - transcriptsBy
  - exons

- exonsBy
- cdsBy

1

2

3 4

5

- fiveUTRsByTranscripts
- threeUTRsByTranscripts

library(EnsDb.Hsapiens.v81)

edb <- EnsDb.Hsapiens.v81

Example: get all genes' annotations.

## Load an EnsDb package matching Ensembl version 81

```
## Now just get all genes
genes(edb)
ENSG00000185220
                       1 Γ248906196, 2489199467 + I ENSG00000185220
                       1 [248912690, 248912795] - | ENSG00000200495
ENSG00000200495
                       1 [248936581, 248937043]
FNSG00000233084
                                                   + | ENSG00000233084
                             gene biotype seq_coord_system
 gene_name entrezid
<character> <character>
                             <character>
                                              <character>
ENSG00000278806 AF065393.4
                                                   miRNA
                                                                scaffold
ENSG00000210049
                    MT-TF
                                                 Mt_tRNA
                                                              chromosome
                                                 Mt_rRNA
ENSG00000211459 MT-RNR1
                                                              chromosome
ENSG00000185220
                    PGBD2
                              267002
                                           protein_coding
                                                              chromosome
FNSG00000200495 RNU6-1205P
                                                   snRNA
                                                              chromosome
FNSG00000233084
               RPL23AP25
                                     processed pseudogene
                                                              chromosome
seginfo: 338 seguences from GRCh38 genome
```

4□ > 4同 > 4 = > 4 = > ■ 900

Example: get all genes encoded on chromosome Y.

```
## Retrieve genes encoded on chromosome Y.
1
2
   ## Create a filter object
    sf <- SegnameFilter("Y")</pre>
3
4
   ## Retrieve the data
5
   genes(edb, filter=sf)
   ENSG00000237917 Y [26594851, 26634652] - | ENSG00000237917
                      Y [26626520, 26627159] - | ENSG00000231514
   ENSG00000231514
   ENSG00000235857
                      Y [56855244, 56855488] + | ENSG00000235857
    gene_name entrezid gene_biotype
   <character> <character> <character>
   LRG_186 LRG_186 1438
                                           LRG_gene
   FNSG00000251841 RNU6-1334P
                                                     snRNA
                                  6736
   ENSG00000184895 SRY
                                             protein_coding
   ENSG00000237917 PARP4P1
                                      unprocessed pseudogene
   ENSG00000231514 FAM58CP
                                        processed_pseudogene
   ENSG00000235857 CTBP2P1
                                        processed pseudogene
   seq_coord_system
       <character>
   LRG 186
               chromosome
   ENSG00000251841
                      chromosome
   ENSG00000184895
                     chromosome
   ENSG00000237917
                      chromosome
   FNSG00000231514
                      chromosome
   FNSG00000235857
                      chromosome
   seginfo: 1 seguence from GRCh38 genome
```

- Use of filters can speed up queries.
- For genes:
  - GeneidFilter
  - GenenameFilter
  - EntrezidFilter
  - GenebiotypeFilter
- · For transcripts:
  - TxidFilter
  - TxbiotypeFilter
- For exons:
  - ExonidFilter
  - ExonrankFilter
- Generic filters:
  - SeqnameFilter
  - SeqstrandFilter
  - SegstartFilter



- SeqendFilter
- GRangesFilter: condition can be within or overlapping.
- Multiple filters are combined with a logical AND.
- Each filter supports 1:n values and also a *like* condition.
- Example: combine filters.

```
## Example for a GRangesFilter:
 1
     grf <- GRangesFilter(GRanges(17, IRanges(59000000, 59200000)),
2
                          condition="within")
 3
 4
     ## Get all genes encoded in this region.
 5
     genes(edb, filter=grf, columns=c("gene_name", "gene_biotype"))
6
 7
8
     ## Combine with a GenebiotypeFilter to get all genes in the region
     ## EXCEPT pre-miRNAs and snRNAs.
q
10
     genes(edb. filter=list(grf.
                            GenebiotypeFilter(c("miRNA", "snRNA"),
11
                                               condition="!=")))
12
```

```
GRanges object with 7 ranges and 3 metadata columns:
                       ranges strand |
                                              gene_id
  segnames
    <R1e>
                    <IRanges> <Rle> |
                                       <character>
 ENSG00000263558
                      17 [59059226, 59059493]
                                                  + 1 ENSG00000263558
 FNSG00000224738
                      17 Γ59106598, 591182677
                                                  + I ENSG00000224738
 ENSG00000182628
                      17 Γ59109951, 591552697
                                                  - I ENSG00000182628
                      17 [59129276, 59129458]
 ENSG00000252212
                                                  - | ENSG00000252212
 FNSG00000211514
                      17 Γ59137758. 591378727
                                                  - I ENSG00000211514
  ENSG00000207996
                      17 [59151136, 59151221]
                                                  - □ ENSG00000207996 = > = < < < >
```

```
ENSG00000266537
                      17 [59174983, 59181787]
                                                   - L ENSG00000266537
                      gene biotype
  gene name
 <character>
                       <character>
FNSG00000263558
                  RN7SI 716P
                                          misc RNA
FNSG00000224738
                 AC099850 1
                                         antisense
ENSG00000182628
                       SKA2
                                    protein_coding
FNSG00000252212
                   RNI12-58P
                                             snRNA
 ENSG00000211514
                     MTR454
                                             miRNA
ENSG00000207996
                    MTR301A
                                             miRNA
FNSG00000266537
                   SPDYE22P unprocessed_pseudogene
 seginfo: 1 seguence from GRCh38 genome
GRanges object with 4 ranges and 5 metadata columns:
segnames
                       ranges strand L
                                               gene id
   <R1e>
                    <IRanges> <Rle> |
                                           <character>
FNSG00000263558
                      17 Γ59059226, 590594937
                                                   + I ENSG00000263558
                      17 [59106598, 59118267]
ENSG00000224738
                                                   + | ENSG00000224738
FNSG00000182628
                      17 F59109951, 591552697
                                                   - I ENSG00000182628
ENSG00000266537
                      17 [59174983, 59181787]
                                                   - L ENSG00000266537
  gene name
               entrezid
                                  gene biotype
<character> <character>
                                   <character>
ENSG00000263558
                  RN7SL716P
                                                      misc RNA
 FNSG00000224738 AC099850 1
                                                     antisense
FNSG00000182628
                       SKA2
                                 348235
                                                protein coding
                   SPDYE22P
                                        unprocessed_pseudogene
ENSG00000266537
 sea coord system
     <character>
 ENSG00000263558
                      chromosome
FNSG00000224738
                      chromosome
ENSG00000182628
                      chromosome
FNSG00000266537
                      chromosome
 -----
 seginfo: 1 seguence from GRCh38 genome
```

- EnsDb support all AnnotationDbi methods with filters.
- Example: use AnnotationDbi's select method to fetch annotations.

```
## Get all data for the gene SKA2
     Res <- select(edb, keys="SKA2", keytype="GENENAME")
2
     head(Res. n=3)
3
4
5
     ## Or: pass filters with keys parameter to have more control:
     ## For the gene SKA2: get all exons except exons 1 and 2
     ## for all tx targeted for nonsense mediated decay.
7
     select(edb, keys=list(GenenameFilter("SKA2"),
                           TxbiotypeFilter("nonsense_mediated_decay"),
9
                           ExonrankFilter(1:2, condition="!=")))
10
```

```
ENTREZID EXONID EXONIDX EXONSEQEND EXONSEQSTART GENEBIOTYPE
  348235 ENSE00001324111 1 59155269 59155131 protein_coding
2 348235 ENSE00003636954 2 59131367 59131281 protein_coding
3 348235 ENSE00003478713 3 59119495 59119319 protein_coding
  GENEID GENENAME GENESEQEND GENESEQSTART ISCIRCULAR SEQCOORDSYSTEM
1 ENSG00000182628 SKA2 59155269 59109951
                                                  chromosome
2 ENSG00000182628 SKA2 59155269 59109951 0
                                                  chromosome
3 ENSG00000182628 SKA2 59155269 59109951 0
                                                  chromosome
 SEQLENGTH SEQNAME SEQSTRAND TXBIOTYPE TXCDSSEQEND TXCDSSEQSTART
1 83257441 17 -1 protein_coding 59155163 59112277
2 83257441 17 -1 protein_coding 59155163 59112277
3 83257441 17 -1 protein_coding 59155163
                                              59112277
   TXID TXNAME TXSEOEND TXSEOSTART
1 ENST00000330137 ENST00000330137 59155269 59109951
2 ENST00000330137 ENST00000330137 59155269 59109951
3 FNST00000330137 FNST00000330137 59155269 59109951
 ENTREZID
```

1		E0000271099			24428		4307 proteir	
2	348235 ENS	E0000355256	7	4 5911	9495	5911	9319 proteir	n_coding
3	348235 ENS	E0000272909	3	5 5911	2345	5911	1890 proteir	n_coding
4	348235 ENS	E0000359413	5	3 5911	9495	5911	9319 proteir	n coding
5		E0000269501			2345		2262 proteir	-
J			-				SEQCOORDSYS	_ 0
-			•	-			•	
- 1	ENSG00000182				591099		0	chromosome
2	ENSG00000182	628 SKA	.2 5915	5269	591099	51	0	chromosome
3	ENSG00000182	628 SKA	.2 5915	5269	591099	51	0	chromosome
4	ENSG00000182	628 SKA	2 5915	5269	591099	51	0	chromosome
5	ENSG00000182	628 SKA	.2 5915	5269	591099	51	0	chromosome
	SEQLENGTH SE	ONAME SEOST	RAND		TXBI	OTYPE	TXCDSSE0END	TXCDSSEQSTART
1	83257441	17		sense me	diated_		•	59124363
2	83257441	17		_	diated_			
3				_	_			
_	83257441	17		_	diated_			
4	83257441	17			ediated_			
5	83257441	17	-1 non	sense_me	diated_	decay	59155083	59119474
TXID TXNAME TXSEQEND TXSEQSTART								
1	ENST00000578	519 ENST000	00578519	5915518	32 591	11890		
2	ENST00000578	519 ENST000	00578519	5915518	32 591	11890		
3						11890		
1	ENST00000578					12262		
4								
5	ENST00000583	9/0 ENS1000	879783976	5915517	7 591	12262		

- exonsBy: provide gene model information for feature counting.
- Example: feature counting using GenomicAlignments' summarizeOverlaps method.

```
## Get exons by gene, for chromosomes 1:22, X, Y, excluding also locus reference
 1
     ## genomic genes (LRG)
2
     exns <- exonsBy(edb, by="gene", filter=list(SegnameFilter(c(1:22, "X", "Y")),
3
                                                   GeneidFilter("ENSG%", "like")))
 4
 5
     exns
6
     ## Load the required libraries.
7
8
     library(GenomicAlignments)
     library(BiocParallel)
9
10
     ## Get the Bam files.
11
     bfl <- BamFileList(dir("data/bam", pattern=".bam$", full.names=TRUE),</pre>
12
                         asMates=TRUE, vieldSize=1e+6, obevOname=TRUE)
13
     ## Define a ScanBamParam with a mapping quality filter.
14
     sbp <- ScanBamParam(mapqFilter=30)</pre>
15
16
     ## Do the gene counting
17
     geneCounts <- bplapplv(bfl. FUN=summarizeOverlaps. features=exns.</pre>
18
                             mode="IntersectionStrict", ignore.strand=TRUE,
19
                             singleEnd=FALSE, fragments=TRUE, param=sbp)
20
     geneCounts <- do.call(cbind, geneCounts)</pre>
21
```

```
## Convert the exon list to SAF format
saf <- toSAF(exns)

head(saf)

###
## Do the feature counting using the Rsubread package
library(Rsubread)
bamf <- dir("data/bam", pattern=".bam$", full.names=TRUE)
cnts <- featureCounts(files=bamf, annot.ext=saf, isPairedEnd=TRUE, nthreads=1)</pre>
```

UCSC and Ensembl use different chromosome naming styles.

• Example: How to integrate Ensembl based annotation with UCSC data?

```
## Get chromosome names
 1
     head(seglevels(edb))
2
     ## Different from UCSC style: chr1...
3
4
     ## Get genes on chromosome Y, UCSC style.
5
     genes(edb, filter=SegnameFilter("chrY"))
6
7
8
     ## Solution: change the chromosome naming style:
q
     sealevelsStvle(edb) <- "UCSC"
10
     ## Get chromosome names
11
     head(seglevels(edb))
12
13
     genes(edb, filter=SegnameFilter("chrY"))
14
15
16
17
     ## Use case:
     ## Get mRNA sequences for SKA2 using BSgenome.
18
     library(BSgenome.Hsapiens.UCSC.hg38) ## <- UCSC based</pre>
19
20
     ## Get exons by transcript
21
     ska2tx <- exonsBy(edb, by="tx", filter=GenenameFilter("SKA2"))</pre>
22
23
^{24}
     ## Use GenomicFeatures' extractTranscriptSegs
     head(extractTranscriptSegs(BSgenome.Hsapiens.UCSC.hg38, ska2tx))
25
26
27
     ## Alternative (preferred) way:
28
     seglevelsStyle(edb) <- "Ensembl"</pre>
29
     ## Using AnnotationHub:
30
     ## Get the genomic fasta file matching the package's genome version:
31
     faf <- getGenomeFaFile(edb)</pre>
32
     extractTranscriptSegs(faf, exonsBy(edb, by="tx",
33
                                          filter=GenenameFilter("SKA2")))
34
```

```
Γ17 "1" "10" "11" "12" "13" "14"
GRanges object with 0 ranges and 5 metadata columns:
  segnames ranges strand | gene_id gene_name entrezid gene_biotype
     <Rle> <IRanges> <Rle> | <character> <character> <character> <character>
  sea coord system
<character>
 seginfo: no seguences
[1] "chr1" "chr10" "chr11" "chr12" "chr13" "chr14"
Warning message:
In .formatSegnameByStyleFromQuery(x, sn, ifNotFound) :
 More than 5 segnames with seglevels style of the database (Ensembl) could not be mapped to t
 ENSG00000237917 chrY [26594851, 26634652]
                                                - L ENSG00000237917
 ENSG00000231514 chrY [26626520, 26627159] - | ENSG00000231514
 ENSG00000235857
                   chrY [56855244, 56855488]
                                                + I ENSG00000235857
   gene_name entrezid
                                gene_biotype
 <character> <character> <character>
 LRG_186 LRG_186 1438
                                           LRG_gene
 ENSG00000251841 RNU6-1334P
                                                     snRNA
 FNSG00000184895
                       SRY
                                 6736
                                             protein coding
 FNSG00000237917 PARP4P1
                                      unprocessed pseudogene
 ENSG00000231514 FAM58CP
                                        processed pseudogene
 ENSG00000235857 CTBP2P1
                                        processed_pseudogene
 sea coord system
      <character>
 LRG 186
              chromosome
 FNSG00000251841 chromosome
 ENSG00000184895
                    chromosome
 FNSG00000237917
                     chromosome
 ENSG00000231514 chromosome
                                               ◆□▶ ◆□▶ ◆□▶ ◆□▶ □ りなべ
```

ENSG00000235857 chromosome seginfo: 1 seguence from GRCh38 genome A DNAStringSet instance of length 6 width sea names [1] 2798 AATGAGTGCGAGATGTTGAGTGA...AACCTACAATCCTCTTTCTAAAA ENST00000330137 Γ27 625 GCCGCGGTCTGCGGAATGTCAAC...AATGAGAATAAAACGATTTAAAT ENST00000437036 [3] 689 GCGGAATGTCAACTATTCAACAT...TGTACATTTCAGTCATTCGGTAT ENST00000578105 894 GGAATGTCAACTATTCAACATGG...TATGTACATTTCAGTCATTCGGT ENST00000578519 Γ47 689 GCGGAATGTCAACTATTCAACAT...TACATTTCAGTCATTCGGTATGT ENST00000580541 Γ51 595 GACAGCTGTCCAATGGAGGCCCT...TTGCATCTGTTTTCTTAA ENST00000581068 Γ61 snapshotDate(): 2016-06-06 loading from cache '/Users/io/.AnnotationHub/55651' '/Users/jo/.AnnotationHub/55652' A DNAStringSet instance of length 10 width sea names 2798 AATGAGTGCGAGATGTTGAGTGA...ACCTACAATCCTCTTTCTAAAA ENST00000330137 Γ27 625 GCCGCGGTCTGCGGAATGTCAAC ATGAGAATAAAACGATTTAAAT FNST00000437036 [3] 689 GCGGAATGTCAACTATTCAACAT...GTACATTTCAGTCATTCGGTAT ENST00000578105 Γ47 894 GGAATGTCAACTATTCAACATGG...ATGTACATTTCAGTCATTCGGT ENST00000578519 Γ51 689 GCGGAATGTCAACTATTCAACAT ACATTTCAGTCATTCGGTATGT FNST00000580541 [6] 595 GACAGCTGTCCAATGGAGGCCCT...TGCATCTGTTTTCTTAA ENST00000581068 Γ71 583 AACTATTCAACATGGAGGCGGAG GAAGGGCAGATAATATATGAAT FNST00000583380 Γ87 533 GAGATGTTGAGTGACAGCTGTCC...TTTTTCTAAGTCATGATAATAT ENST00000583927 570 GTCAACTATTCAACATGGAGGCG...TTTATGAAGAAATGGACTTGGA ENST00000583976 [9]

Sequence names are mapped between styles using the GenomeInfoDb package.

229 CTTAGTAAACTCAAGATAAAAAG GAGCAGAAAGAGAGTAAGAGCC FNST00000584089

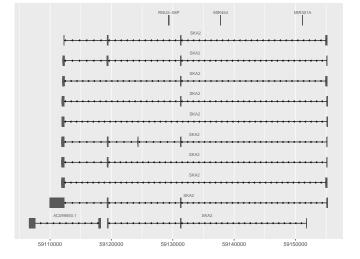
Γ107

• ggbio and Gviz: plot data along genomic coordinates.

• ggbio: support for EnsDb objects and filters integrated.

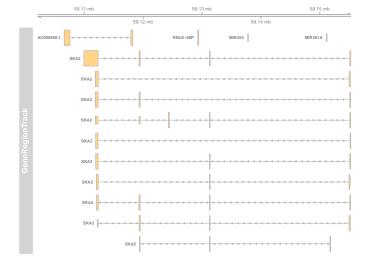
• Example: use ggbio and ensembldb to plot a chromosomal region.

```
library(ggbio)
 1
 2
     ## Plot the SKA2 gene model by passing a filter to the function.
3
     autoplot(edb, GenenameFilter("SKA2"))
 5
     ## To plot all genes in the region:
6
     ## Get the gene SKA2
     ska2 <- genes(edb, filter=GenenameFilter("SKA2"))</pre>
     strand(ska2) <- "*"
q
10
     ## Plot the genomic region; we're using the gene name as labels for the transcripts.
11
     autoplot(edb, GRangesFilter(ska2, condition="overlapping"),
12
              names.expr="gene_name")
13
```



- Gviz: getGeneRegionTrackForGviz method to extract Gviz-formatted data.
- Example: plot genes encoded on a chromosomal region using Gviz

```
library(Gviz)
 1
2
     ## Get all genes in the same genomic region and return as GRanges
3
     ## formatted for Gviz.
4
     grt <- getGeneRegionTrackForGviz(edb, chromosome=seqlevels(ska2),</pre>
 5
                                        start=start(ska2), end=end(ska2))
6
     ## Alternatively, using a GRangesFilter
7
     strand(ska2) <- "*"
8
     grt <- getGeneRegionTrackForGviz(edb, filter=GRangesFilter(ska2,</pre>
9
                                                                   condition="overlapping"))
10
11
     geneTrack <- GeneRegionTrack(grt)</pre>
12
     ## Plot the chromosomal region.
13
     plotTracks(list(GenomeAxisTrack(), geneTrack), transcriptAnnotation="symbol",
14
                 chromosome=seqlevels(ska2))
15
```



- The ensembldb shiny app allows interactive annotation look-up.
- Example: search for a gene using the shiny app and return the result to R.

```
## Run the shiny app:
Result <- runEnsDbApp()

## Inspect the result:
Result</pre>
```

- ensDbFromAH: build an EnsDb database from an AnnotationHub (gtf) resource.
- Example: create an EnsDb using AnnotationHub.

```
library(AnnotationHub)
 1
 2
     ah <- AnnotationHub()
 3
     ## Ouerv for available Ensembl gtf files for release 83.
 4
     query(ah, pattern=c("ensembl", "release-83", "gtf"))
5
     ## Select one: in this case: Anolis carolinensis (lizard)
 7
     edbSq183 <- ensDbFromAH(ah=ah["AH7537"])
8
9
10
     ## Let's see what we've got.
     db <- EnsDb(edbSq183)
11
     genes(db, filter=SeqnameFilter("2"))
12
13
     ## Make a package.
14
     makeEnsembldbPackage(ensdb=edbSq183, version="1.0.0".
15
                          maintainer="Johannes Rainer <johannes.rainer@eurac.edu>",
16
                          author="J Rainer")
17
```

- But: no NCBI Entrez Gene IDs available.

- Should work with all gtf and gff files from Ensembl.
- But: gtf files don't provide NCBI Entrez Gene IDs.
- <u>Example</u>: create an EnsDb from a GTF file downloaded from ftp://ftp.ensembl.org.

```
## Create an EnsDb from an Ensembl GTF file.
 1
 2
     ## Create the SQLite database file:
     ## o Eventually define 'organism' and 'genomeVersion'.
     ## o Needs also an internet connection to retrieve the 'seglengths'.
 5
     edbSql <- ensDbFromGtf("data/gtf/Canis_familiaris.CanFam3.1.84.gtf.gz")
6
 7
     edbSa1
8
9
     ## Use the makeEnsembldbPackage to create a package, or load and use it.
10
     dogDb <- EnsDb(edbSql)</pre>
11
12
     dogDb
13
14
     ## Fully functional, except we don't have Entrez gene ids.
15
     head(genes(dogDb, filter=SegnameFilter("X")))
16
```

- Requires:
  - Perl.
  - Ensembl Perl API (and Bioperl).
- fetchTablesFromEnsembl to fetch the annotations from Ensembl.

- makeEnsemblSQLiteFromTables to create the SQLite database from the tables.
- makeEnsembldbPackage to create a package containing and providing the annotation.
- Example: create an EnsDb using the Perl API.

```
## Create an EnsDb using the Ensembl Perl API:
 1
2
     ## This takes quite some time...
3
     fetchTablesFromEnsembl(version="81",
 4
                             ensemblapi="/Users/jo/ensembl/81/API/ensembl/modules",
 5
6
                             species="dog")
 7
     ## Create an SQLite database from the generated txt files
8
     dbf <- makeEnsemblSQLiteFromTables()</pre>
9
10
     ## Finally, create the package
11
     makeEnsembldbPackage(ensdb=dbf, version="1.0.0",
12
                           maintainer="Johannes Rainer <johannes.rainer@eurac.edu>",
13
                           author="Johannes Rainer")
14
```

## Thank you for your attention!