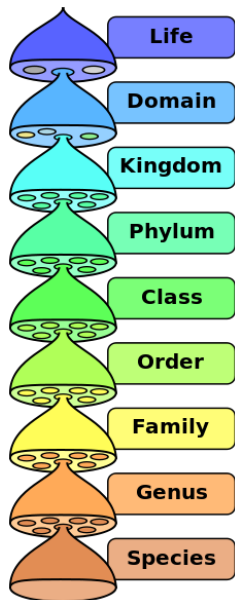


Taxa and metacoder: R packages for parsing, visualization, and manipulation of taxonomic data

Zachary Foster, Scott Chamberlain, Thomas Sharpton, and
Niklaus Grunwald

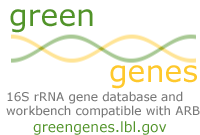
The challenges of taxonomic data



- ▶ Taxonomic data is hierarchical
- ▶ Associated with tabular data
- ▶ Can be names, classifications, or IDs
- ▶ Many different taxonomic systems
- ▶ Many different data formats
- ▶ Hierarchical visualization is difficult

Sources of taxonomic data

DNA sequence databases



Species occurrence databases



Museum records



Sources of taxonomic data: DNA sequences

NCBI Genbank

AC073210.8 Homo sapiens BAC clone RP11-460N20 from 7, complete sequence

UNITE

SH099456.05FU_FJ357315_refs k__Fungi;p__Ascomycota;c__Dothideomycetes;
o__Pleosporales;f__Pleosporaceae;g__Embellisia;s__Embellisia_planifunda

RDP

S000448483 Sparassis crispa; MBUH-PIRJO&ILKKA94-1587/ss5
Lineage=Root;rootrank ;Fungi;domain;Basidiomycota;phylum;Agaricomycetes;
class;Polyporales;order ;Sparassidaceae;family;Sparassis;genus

SILVA

GCVF01000431.1.2369
Bacteria;Proteobacteria;Gammaproteobacteria;Oceanospirillales
;Alcanivoraceae;Alcanivorax;Thalassiosira rotula

Sources of taxonomic data: Occurrence records

Global Biodiversity Information Facility : Archea database

```
readr::read_tsv("datasets/gbif_archea.csv")[4:8]
```

```
# A tibble: 19,013 x 5
```

	kingdom <chr>	phylum <chr>	class <chr>	order <chr>	family <chr>
1	Archaea	Euryarchaeota	Halobacteria	Halobacteriales	Halobacteriaceae
2	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
3	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
4	Archaea	Crenarchaeota	Thermoprotei	Desulfurococcales	Desulfurococcaceae
5	Archaea	Crenarchaeota	Thermoprotei	Desulfurococcales	Pyrodictiaceae
6	Archaea	Crenarchaeota	Thermoprotei	Thermoproteales	Thermoproteaceae
7	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
8	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
9	Archaea	Euryarchaeota	Halobacteria	Halobacteriales	Halobacteriaceae
10	Archaea	Euryarchaeota	Halobacteria	Halobacteriales	Halobacteriaceae

```
# ... with 19,003 more rows
```

Sources of taxonomic data: Museum records

Smithsonian Museum of Natural History: Mammal database

```
readr::read_csv("datasets/SNMNH.csv")[9]
```

```
# A tibble: 5,000 x 1
```

```
  `Name Hierarchy`
```

```
  <chr>
```

```
1 Abditomys latidens : Muridae : Rodentia : Mammalia : Chordata
```

```
2 Abrawayaomys ruschii : Cricetidae : Rodentia : Mammalia : Chordata
```

```
3 Abrawayaomys ruschii : Cricetidae : Rodentia : Mammalia : Chordata
```

```
4 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
5 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
6 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
7 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
8 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
9 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
10 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
# ... with 4,990 more rows
```

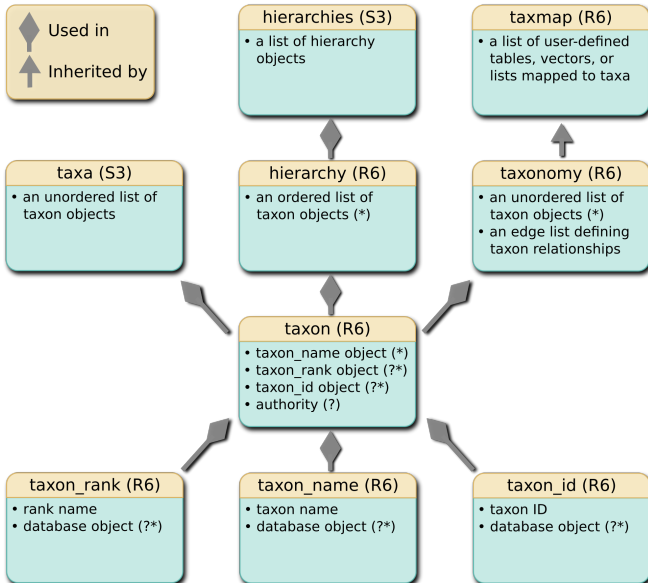
The taxa package

build passing codecov 87% repo status WIP downloads 311/month CRAN 0.2.1

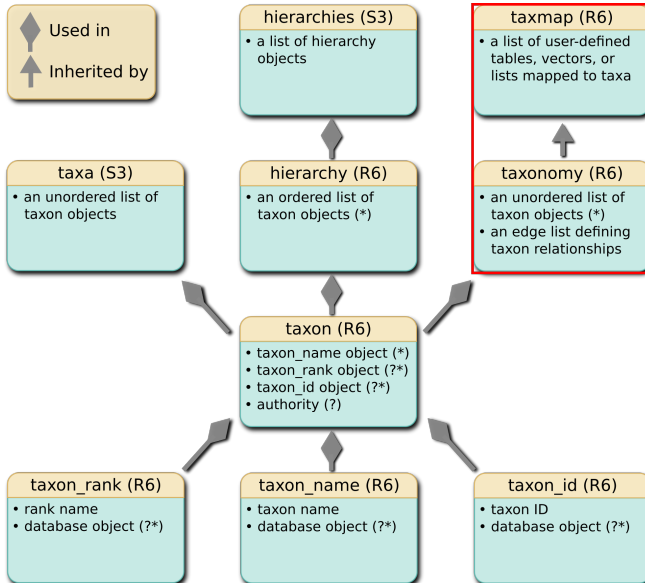
The taxa package is designed to be a solid foundation for using taxonomic data in R.

- ▶ Classes to hold taxa, taxonomies, and associated data
- ▶ Flexible parsers to convert raw data to these classes
- ▶ Dplyr-inspired functions to manipulate these classes
- ▶ Functions to get data associated with each taxon in a taxonomy

Classes defined by taxa: Relationships



Classes defined by taxa: Relationships



Classes defined by taxa: The taxmap class

```
> ex_taxmap
```

```
<Taxmap>
```

```
17 taxa: b. Mammalia, c. Plantae, d. Felidae ... p. sapiens, q. lycopersicum, r. tuberosum
```

```
17 edges: NA->b, NA->c, b->d, b->e, b->f, c->g, d->h ... h->m, i->n, j->o, k->p, l->q, l->r
```

```
4 data sets:
```

```
info:
```

```
# A tibble: 6 x 4
```

```
  taxon_id name  n_legs dangerous
```

```
  <chr>    <chr> <dbl> <lgl>
```

```
1 m      tiger    4. TRUE
```

```
2 n      cat      4. FALSE
```

```
3 o      mole     4. FALSE
```

```
# ... with 3 more rows
```

```
phylopic_ids: a named vector of 'character' with 6 items
```

```
  m. e148eabb-f138-43c6-b1e4-5cda2180485a ... r. 63604565-0406-460b-8cb8-1abe954b3f3a
```

```
foods: a list of 6 items named by taxa:
```

```
  m, n, o, p, q, r
```

```
abund:
```

```
# A tibble: 8 x 5
```

```
  taxon_id code  sample_id count taxon_index
```

```
  <chr>    <fct> <fct>    <dbl>    <int>
```

```
1 m      T    A        1.        1
```

```
2 n      C    A        2.        2
```

```
3 o      M    B        5.        3
```

```
# ... with 5 more rows
```

Input data format

Input type

	Simple	Embedded	Raw string
	<pre>> print(data) [1] "input_1" "input_2" [3] "input_3"</pre>	<pre>> print(data) x input y 1 a input_1 100 2 b input_2 200 3 c input_3 300</pre>	<pre>> print(data) [1] ">id:a-tax:input_1" [2] ">id:b-tax:input_2" [3] ">id:c-tax:input_3"</pre>
Classification Primates;Hominidae;Homo;sapiens	<pre>> print(data) [1] "Primates;Hominidae;Hom... [2] "Primates;Haplorhini;Cr..." > parse_tax_data(data, class_sep = ";")</pre>	<pre>> print(data) x class y 1 a Primates;Hominidae;... 100 2 b Primates;Haplorhini... 200 > parse_tax_data(data, class_cols = "class", class_sep = ";")</pre>	<pre>> print(data) [1] ">id:a-tax:Primates;Hom..." [2] ">id:b-tax:Primates;Hap..." > extract_tax_data(data, regex = ">id:(.+)-tax:(.+)", key = c("info", "class"), class_sep = ";")</pre>
Taxon ID 9606	<pre>> print(data) [1] "9606" "100937" ... > lookup_tax_data(data, type = "taxon_id")</pre>	<pre>> print(data) x id y 1 a 9606 100 2 b 100937 200 > lookup_tax_data(data, type = "taxon_id", column = "id")</pre>	<pre>> print(data) [1] ">id:a-tax:9606" [2] ">id:b-tax:100937" > extract_tax_data(data, regex = ">id:(.+)-tax:(.+)", key = c("info", "taxon_id"), database = "ncbi")</pre>
Taxon name Homo sapiens	<pre>> print(data) [1] "Homo sapiens" [2] "Primates" ... > lookup_tax_data(data, type = "taxon_name")</pre>	<pre>> print(data) x name y 1 a Homo sapiens 100 2 b Primates 200 > lookup_tax_data(data, type = "taxon_name", column = "name")</pre>	<pre>> print(data) [1] ">id:a-tax:Homo sapiens" [2] ">id:b-tax:Primates" > extract_tax_data(data, regex = ">id:(.+)-tax:(.+)", key = c("info", "taxon_name"), database = "ncbi")</pre>
Sequence ID AC073210	<pre>> print(data) [1] "AC073210" "KC312885" ... > lookup_tax_data(data, type = "seq_id")</pre>	<pre>> print(data) x ncbi_id y 1 a AC073210 100 2 b KC312885 200 > lookup_tax_data(data, type = "seq_id", column = "ncbi_id")</pre>	<pre>> print(data) [1] ">id:a-tax:AC073210" [2] ">id:b-tax:KC312885" > extract_tax_data(data, regex = ">id:(.+)-tax:(.+)", key = c("info", "seq_id"), database = "ncbi")</pre>

Parsing: vectors of classifications

```
x <- c("Mammalia;Theria;Metatheria;Diprotodontia;Macropodiformes",  
      "Mammalia;Theria;Eutheria;Primates;Haplorrhini;Simiiformes")  
  
parse_tax_data(x, class_sep = ";")
```

```
## <Taxmap>  
## 9 taxa: b. Mammalia, c. Theria ... j. Simiiformes  
## 9 edges: NA->b, b->c, c->d, c->e, d->f, e->g, f->h, g->i, i->j  
## 1 data sets:  
## tax_data: a named vector of 'character' with 2 items  
## h. Mammalia;Theria;[truncated] ... j. Mammalia;Theria;[truncated]  
## 0 functions:
```

Parsing: vectors of names

```
x <- c("Homo sapiens", "Macropus", "Chordata")
```

```
lookup_tax_data(x, type = "taxon_name", database = "ncbi")
```

```
## <Taxmap>
```

```
## 35 taxa: 131567. cellular organisms ... 9606. Homo sapiens
```

```
## 35 edges: NA->131567, 131567->2759 ... 207598->9605, 9605->9606
```

```
## 2 data sets:
```

```
## tax_data:
```

```
## # A tibble: 35 x 4
```

```
## taxon_id ncbi_name ncbi_rank ncbi_id
```

```
## <chr> <chr> <chr> <chr>
```

```
## 1 131567 cellular organisms no rank 131567
```

```
## 2 2759 Eukaryota superkingdom 2759
```

```
## 3 33154 Opisthokonta no rank 33154
```

```
## # ... with 32 more rows
```

```
## query_data: a named vector of 'character' with 3 items
```

```
## 9606. Homo sapiens, 9312. Macropus, 7711. Chordata
```

```
## 0 functions:
```

Parsing: vectors of taxon IDs

```
x <- c("9606", "207598", "7711") # NCBI taxon IDs
```

```
lookup_tax_data(x, type = "taxon_id", database = "ncbi")
```

```
## <Taxmap>
## 31 taxa: 131567. cellular organisms ... 9606. Homo sapiens
## 31 edges: NA->131567, 131567->2759 ... 207598->9605, 9605->9606
## 2 data sets:
##   tax_data:
##     # A tibble: 31 x 4
##       taxon_id ncbi_name      ncbi_rank  ncbi_id
##       <chr>    <chr>        <chr>    <chr>
## 1 131567    cellular organisms no rank    131567
## 2 2759      Eukaryota          superkingdom 2759
## 3 33154     Opisthokonta       no rank    33154
##   # ... with 28 more rows
##   query_data: a named vector of 'character' with 3 items
##     9606. 9606, 207598. 207598, 7711. 7711
## 0 functions:
```

Parsing: vectors of sequence IDs

```
x <- c("AC073210", "MG014608", "AE006468") # NCBI sequence IDs
```

```
lookup_tax_data(x, type = "seq_id", database = "ncbi")
```

```
## <Taxmap>
## 46 taxa: 131567. cellular organisms ... 9606. Homo sapiens
## 46 edges: NA->131567, 131567->2759 ... 207598->9605, 9605->9606
## 2 data sets:
##   tax_data:
##     # A tibble: 46 x 4
##       taxon_id ncbi_name      ncbi_rank  ncbi_id
##       <chr>    <chr>        <chr>    <chr>
## 1 131567    cellular organisms no rank    131567
## 2 2759      Eukaryota          superkingdom 2759
## 3 33154     Opisthokonta       no rank     33154
##   # ... with 43 more rows
##   query_data: a named vector of 'character' with 3 items
##     9606. AC073210, 9316. MG014608, 99287. AE006468
## 0 functions:
```

Parsing: tables

Global Biodiversity Information Facility : Archea database

```
readr::read_tsv("datasets/gbif_archea.csv")[4:8]
```

```
# A tibble: 19,013 x 5
```

	kingdom	phylum	class	order	family
	<chr>	<chr>	<chr>	<chr>	<chr>
1	Archaea	Euryarchaeota	Halobacteria	Halobacteriales	Halobacteriaceae
2	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
3	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
4	Archaea	Crenarchaeota	Thermoprotei	Desulfurococcales	Desulfurococcaceae
5	Archaea	Crenarchaeota	Thermoprotei	Desulfurococcales	Pyrodictiaceae
6	Archaea	Crenarchaeota	Thermoprotei	Thermoproteales	Thermoproteaceae
7	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
8	Archaea	Euryarchaeota	Thermococci	Thermococcales	Thermococcaceae
9	Archaea	Euryarchaeota	Halobacteria	Halobacteriales	Halobacteriaceae
10	Archaea	Euryarchaeota	Halobacteria	Halobacteriales	Halobacteriaceae

```
# ... with 19,003 more rows
```


Parsing: tables

```
x = readr::read_tsv("datasets/gbif_archaea.csv")  
  
parse_tax_data(x, class_cols = 4:8)
```

<Taxmap>

95 taxa: ab. Archaea, ac. Euryarchaeota ... dr. Methermicoccaceae

95 edges: NA->ab, ab->ac, ab->ad ... aw->dp, at->dq, ax->dr

1 data sets:

tax_data:

A tibble: 19,013 x 45

	taxon_id	gbifid	datasetkey	occurrenceid	kingdom	phylum	class
	<chr>	<int>	<chr>	<chr>	<chr>	<chr>	<chr>
1	br	1.84e9	3c6e7390~	D7C42A39-3A~	Archaea	Eurya~	Halo~
2	bs	1.83e9	863efcc4~	<NA>	Archaea	Eurya~	Ther~
3	bs	1.83e9	863efcc4~	<NA>	Archaea	Eurya~	Ther~

... with 1.901e+04 more rows, and 38 more variables:

order <chr>, family <chr>, genus <chr>, species <chr>,
infraspecific epithet <chr>, taxonrank <chr>,
scientificname <chr>, countrycode <chr>, locality <chr>,
publishingorgkey <chr>, ...

0 functions:

Parsing: tables

Smithsonian Museum of Natural History: Mammal database

```
readr::read_csv("datasets/SNMNH.csv")[9]
```

```
# A tibble: 5,000 x 1
```

```
  `Name Hierarchy`
```

```
  <chr>
```

```
1 Abditomys latidens : Muridae : Rodentia : Mammalia : Chordata
```

```
2 Abrawayaomys ruschii : Cricetidae : Rodentia : Mammalia : Chordata
```

```
3 Abrawayaomys ruschii : Cricetidae : Rodentia : Mammalia : Chordata
```

```
4 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
5 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
6 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
7 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
8 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
9 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
10 Abrocoma bennettii bennettii : Abrocomidae : Rodentia : Mammalia : Chordata
```

```
# ... with 4,990 more rows
```

Parsing: tables

```
x = readr::read_csv("datasets/SNMNH.csv")

parse_tax_data(x, class_cols = "Name Hierarchy",
               class_sep = " : ", class_reversed = TRUE)
```

<Taxmap>

141 taxa: ab. Chordata ... fl. Allactaga williamsi

141 edges: NA->ab, ab->ac, ac->ad ... ay->fj, ay->fk, ay->fl

1 data sets:

tax_data:

A tibble: 5,000 x 53

taxon_id Museum `Museum Abbreviation` `Catalog Number`

<chr> <chr> <chr> <chr>

1 az <NA> USNM 357244

2 ba <NA> USNM 552416

3 ba <NA> USNM <NA>

... with 4,997 more rows, and 49 more variables: `Special

Collections` <chr>, `Kind of Object` <chr>, `Specimen

Count` <int>, `Current Identification` <chr>, `Other

Identifications` <chr>, `Name Hierarchy` <chr>,

Order <chr>, Family <chr>, `Type Status` <chr>, `Type

Citations` <chr>, ...

0 functions:

Parsing: complex strings (NCBI Genbank)

```
x = c("AC073210.8 Homo sapiens BAC clone RP11-460N20 from 7, complete sequence"  
      "AE006468.2 Salmonella enterica subsp. enterica serovar Typhimurium",  
      "MG014608.1 Macropus fuliginosus Csflr gene, enhancer")  
  
extract_tax_data(x, database = "ncbi", regex = "([A-Z0-9.]+) (.+)",  
                 key = c(my_ncbi_id = "seq_id", my_desc = "info"))
```

<Taxmap>

```
46 taxa: 131567. cellular organisms ... 9606. Homo sapiens  
46 edges: NA->131567, 131567->2759 ... 207598->9605, 9605->9606  
2 data sets:
```

tax_data:

```
# A tibble: 46 x 4
```

	taxon_id	ncbi_name	ncbi_rank	ncbi_id
	<chr>	<chr>	<chr>	<chr>
1	131567	cellular organisms	no rank	131567
2	2759	Eukaryota	superkingdom	2759
3	33154	Opisthokonta	no rank	33154

```
# ... with 43 more rows
```

query_data:

```
# A tibble: 3 x 4
```

	taxon_id	my_ncbi_id	my_desc	input
	<chr>	<chr>	<chr>	<chr>
1	9606	AC073210.8	Homo sapiens BAC cl~	AC073210.8 Homo sap~
2	99287	AE006468.2	Salmonella enterica~	AE006468.2 Salmonel~