# taxize - taxonomic search and retrieval in R

Scott Chamberlain  $^{1,*}$  and Eduard Szöcs  $^{2,\dagger}$ 

 $^1 Biology\ Department,\ Simon\ Fraser\ University,\ Canada.$   $^2 Institute\ for\ Environmental\ Sciences,\ University\ Koblenz-Landau,\ Forststraße\ 7,\ 76829\ Landau,\ Germany$ 

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\* E-mail: myrmecocystus@gmail.com † E-mail: szoe8822@uni-landau.de

#### I. ABSTRACT

All species are hierarchically related to one another, and we use taxonomic names to label the nodes in this hierarchy. Taxonomic data is becoming easily available on the web, but scientists need a way to access taxonomic data on the web in a programmatic fashion, which is fast and reproducible. We have developed taxize, an open-source software package (freely available from <a href="http://cran.r-project.org/web/packages/taxize/index.html">http://cran.r-project.org/web/packages/taxize/index.html</a>) for the R language. taxize provides a simple, programmatic access to taxonomic data for 13 data sources around the web. We discuss the need for a taxonomic toolbelt in R, and outline a suite of use cases for which taxize is ideally suited (including a full workflow as an appendix). The taxize package will facilitate open and reproducible science by allowing taxonomic data collection to be done in the open-source R platform.

#### II. INTRODUCTION

Evolution by natural selection has led to a hierarchical relationship among all living organisms. Thus, species are categorized using a taxonomic hierarchy, starting with the binomial species name (e.g, *Homo sapiens*), moving up to genus (*Homo*), then family (*Hominidae*), and on up to Domain (*Eukarya*). Biologists, whether studying organisms at the cell, organismal, or community level, can put their study taxa into taxonomic context, allowing them to know close and distant relatives, find relevant literature, and more. Discovering the correct taxonomic names is, unfortunately, not straightforward. Taxonomic names often change due to name changes at the generic or specific levels, lumping or splitting lower taxa (genera, species) among higher taxa (families), and name spelling changes. In addition, there is no one authoritative taxonomic names source. Instead, there are essentially competing sources (e.g., uBio, Tropicos, ITIS) that may have different accepted names for the same taxon. The goal of taxize, an R package in development, is to make all use cases having to do with taxonomy easy and replicable.

Taxonomic data is getting easier to obtain through web interfaces (e.g., http://eol.org/). However, there are a number of good reasons to obtain taxonomic information programatically rather than through a web interface. First, if you have more than a few names to lookup on a website, it can take quite a long time to enter each name, get data, and repeat for each species. Second, programatically getting taxonomic names solves the first problem by looping over a list of names, and is reproducible. With increasing reports of irreproducibility in science [1, 2], it is extremely important to make science workflows repeatable.

The R language is the dominant language used by biologists (reference), and now has over 4,000 packages on the main repository (CRAN) and more than 2,500 packages on other repositories to extend R. R is great for manipulating, visualizing and fitting statistical models to data. However, the key missing piece in R is the ability to get data within R. Increasingly, data is available from the web via API's, or application programming interfaces. These are bits of code that allow computers to talk to one another. Web APIs define a number of methods that allow users to search for a species name, or retrieve the synonyms for a species name, for example. One can then write functions in any programming language to interact with the API, allowing users to interact with the web API without having to know the details of the code. In taxize, we have written a suite of R functions that interact with many taxonomic data sources via their web APIs (Table I). The interface to each function is usually a simple list of species names, just as user would do with a web API.

# III. WHY TAXIZE?

There are a large suite of applications developed around the problem of searching for, resolving, and getting higher taxonomy for species names. For example, Linnaeus http://linnaeus.sourceforge.net/provides ability to search for taxonomic names in documents and normalize names. In addition, there are many web interfaces to search for and normalize names such as Encyclopedia of Life's Global Names Resolver http://resolver.globalnames.org/, uBio tools http://www.ubio.org/index.php?pagename=sample\_tools, and iPlant's Taxonomic Name Resolution Service http://tnrs.iplantcollaborative.org/.

All of these tools provide great ways to search for taxonomic names and resolve them in some cases. However, scientists ideally need a tool that can be used programmatically, and thus be made reproducible, and highly customizeable. The goal of taxize is to make it easy to create reproducible and easy to use workflows for searching for taxonomic names, resolving them, getting higher taxonomic names, and other tasks related to research dealing with species.

### IV. DATA SOURCES

taxize uses many data sources (Table I), and more can easily be added. There are two common tasks provided by the data sources: name search and name resolution. Other functionality in taxize includes retrieving a classification tree for a species, or retrieving child taxa of a focal taxon. One of the data sources (Phylomat) returns phylogenies, while another (NCBI) returns genetic sequence data. However, there are other R packages that are focused solely on sequence data, such as rsnps [3], rentrez [4], BoSSA [5], and ape [6].

Some of the data sources taxize interacts with require authentication. That is, in addition to the search terms you provide (e.g., *Homo sapiens*), they require an alphanumeric identification key so that they can better manage their data. The services that do require an API key are: Encyclopedia of Life (EOL), the Universal Biological Indexer and Organizer (uBio), Tropicos, and Plantminer. You can easily obtain an API key by visiting the website of each service (see (Table I) for links to each site).

Source name	Name search	Name resolution	Phylogeny	Sequences	URL
Encyclopedia of Life	Yes	See GNR below	No	No	http://eol.org/
Integrated Taxonomic Information System	Yes	Synonyms	No	No	http://www.itis.gov/
iPlant Taxonomic Name Resolution Service	Yes	Yes	No	No	http://bit.ly/16dHkBy
Phylomatic	No	No	Yes	No	http://bit.ly/P0pjMz
uBio	Yes	Yes	No	No	http://www.ubio.org/
Global Names Resolver	Yes	Yes	No	No	http://bit.ly/11R3Pbr
Global Names Index	Yes	No	No	No	http://bit.ly/11R3RQB
IUCN Red List	Yes	No	No	No	http://bit.ly/11R3RQC
Tropicos	Yes	Yes	No	No	http://www.tropicos.org/
Plantminer	Yes	No	No	No	http://www.plantminer.com/
The Plant List	Yes	Yes	No	No	http://www.theplantlist.org/
Catalogue of Life	Yes	Yes	No	No	http://bit.ly/11R3S75
National Center for Biotechnology Information	Yes	X	Yes <sup>a</sup>	Yes	http://www.ncbi.nlm.nih.gov/

TABLE I. Data sources used in taxize, tasks available, and links to them

### V. USE CASES

There are a variety of use cases for which taxize is ideally suited, and few side cases in which taxize can be useful. We discuss five ideal use cases for taxize at length, and highlight the side cases in brief.

# A. Installing taxize

First, let's install taxize. There are two versions of taxize, a stable release that can be installed from the R package repository, CRAN, and from GitHub, where the code is developed.

Installing from CRAN or GitHub

```
## From CRAN
install.packages("taxize")

## From GitHub
install.packages("devtools")
require(devtools)
install_github("taxize_", "ropensci")
```

Loading taxize into your R session

```
library(taxize)
```

<sup>&</sup>lt;sup>a</sup> Web only, no API, see http://l.usa.gov/11R446a

### B. Resolve taxonomic names

This is a common task in biology. We often have a list of species names and we want to know if a) we have the most up to date names, b) our names are spelled correctly, and c) if we have common names, we likely need the scientific names. One way to resolve names is via the Global Names Resolver (GNR) service provided by the Encyclopedia of Life (http://resolver.globalnames.org/).

```
# Here, we are searching for two misspelled names
temp <- gnr_resolve(names = c("Helianthos annus", "Homo saapiens"), returndf = TRUE)
# Let's take a peek at the data, excluding the data source ID and score
# columns
temp[, -c(1, 4)]
    submitted_name
                                   name_string
                                                                  title
1 Helianthos annus
                                                      Catalogue of Life
                          Helianthus annuus L.
3 Helianthos annus
                              Helianthus annus GBIF Taxonomic Backbone
4 Helianthos annus
                              Helianthus annus
                                                                    EOL
5 Helianthos annus
                           Helianthus annus L.
                                                                    EOL
6 Helianthos annus
                              Helianthus annus
                                                          uBio NameBank
    Homo saapiens Homo sapiens Linnaeus, 1758
                                                      Catalogue of Life
```

It looks like the correct spellings are *Helianthus annuus* and *Homo sapiens*. Another approach uses the Taxonomic Name Resolution Service via the Taxosaurus API (http://taxosaurus.org/).

```
# A list of species names, some of which are misspelled
mynames <- c("Helianthus annuus", "Pinus contort", "Poa anua", "Abis magnifica",
    "Rosa california", "Festuca arundinace", "Sorbus occidentalos", "Madia sateva")
# And we'll call the API with the thrs function, and remove a few columns
tnrs(query = mynames)[, -c(5:7)]
        submittedName
                             acceptedName
                                             sourceId score
7
   Helianthus annuus
                        Helianthus annuus iPlant_TNRS
                                                       1.00
4
        Pinus contort
                         Pinus contorta iPlant_TNRS
                                                       0.98
5
             Poa anua
                                Poa annua iPlant_TNRS
                                                       0.96
3
                          Abies magnifica iPlant_TNRS
       Abis magnifica
                                                       0.96
8
      Rosa california
                         Rosa californica iPlant_TNRS
                                                       0.99
  Festuca arundinace Festuca arundinacea iPlant_TNRS
2
                                                       0.99
1 Sorbus occidentalos Sorbus occidentalis iPlant_TNRS
                                                       0.99
                             Madia sativa iPlant_TNRS
```

It looks like there are a few corrections: e.g., *Madia sateva* should be *Madia sativa*, and *Rosa california* should be *Rosa californica*.

taxize takes the approach that the user should be able to make decisions about what resource to trust, rather than taxize making the decision. Both the EOL GNR and the TNRS services provide data from a variety of data sources. The use may trust a specific data source, thus may want to use the names from that data source.

# C. Retrieve higher taxonomic names

Another task biologists often face is getting higher taxonomic names for a taxa list. Having the higher taxonomy allows you to put into context the relationships of your species list (i.e., Species A and B are in Family C), as opposed to not knowing that Species A and B are closely related. This also makes it easy to aggregate/standardize data to a specific taxonomic level (e.g., family level) or to match data to other databases with different taxonomic resolution (e.g., trait data).

Two data sources provide this type of capability: ITIS and NCBI. The principle in both is the same - first you need to get an identifier for the queried species and then can retrieve additional information with this ID.

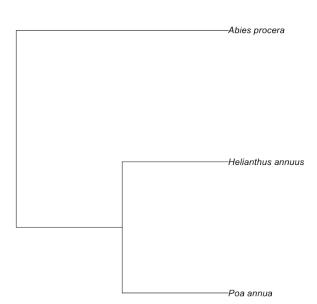
```
specieslist <- c("Abies procera", "Pinus contorta")</pre>
classification(get_tsn(specieslist, "sciname"))
Retrieving data for species ' Abies procera '
Retrieving data for species ' Pinus contorta '
[[1]]
        parentName parentTsn
                                   rankName
                                                   taxonName
                                                                 tsn
1
                                    Kingdom
                                                     Plantae 202422
2
                       202422
           Plantae
                                 Subkingdom
                                              Viridaeplantae 846492
3
                               Infrakingdom
    Viridaeplantae
                       846492
                                                Streptophyta 846494
4
      Streptophyta
                       846494
                                   Division
                                                Tracheophyta 846496
5
      Tracheophyta
                       846496
                                Subdivision Spermatophytina 846504
6
   Spermatophytina
                       846504 Infradivision
                                                Gymnospermae 846506
7
      Gymnospermae
                       846506
                                      Class
                                                   Pinopsida 500009
8
                                      Order
         Pinopsida
                       500009
                                                     Pinales 500028
9
           Pinales
                                                    Pinaceae 18030
                       500028
                                     Family
                       18030
                                                       Abies 18031
10
          Pinaceae
                                      Genus
             Abies
11
                        18031
                                    Species
                                               Abies procera 181835
[[2]]
        parentName parentTsn
                                   rankName
                                                   taxonName
                                                                 tsn
1
                                    Kingdom
                                                     Plantae 202422
2
           Plantae
                       202422
                                 Subkingdom
                                              Viridaeplantae 846492
3
    Viridaeplantae
                       846492
                               Infrakingdom
                                                Streptophyta 846494
4
      Streptophyta
                       846494
                                   Division
                                                Tracheophyta 846496
5
                       846496
      Tracheophyta
                                Subdivision Spermatophytina 846504
6
   Spermatophytina
                       846504 Infradivision
                                                Gymnospermae 846506
7
      Gymnospermae
                       846506
                                      Class
                                                   Pinopsida 500009
                                                     Pinales 500028
8
         Pinopsida
                       500009
                                      Order
9
           Pinales
                       500028
                                     Family
                                                    Pinaceae 18030
10
          Pinaceae
                        18030
                                                       Pinus 18035
                                      Genus
             Pinus
                        18035
11
                                    Species
                                             Pinus contorta 183327
```

It turns out both species are in the family Pinaceae. You can also get this type of information from the NCBI by doing classification(get\_uid(specieslist)).

Instead of a full classification, you may only want a single name, say a family name for your species of interest. The function  $tax\_name$  is built just for this purpose. And you can specify the data source you retrieve the taxonomic name from with the db parameter.

# D. Retrieve a phylogeny

Many biologists are not adequately trained in reconstructing phylogenies. However, there are some sources for getting a phylogeny without having to now how to build one; one of these is for angiosperms, called Phylomatic [7]. We have created a workflow in taxize that lets you input a simple species list, and then taxize works behind the scenes to get higher taxonomic names, which are required by Phylomatic to get a phylogeny. Here is a short example.



thing shit butt

Behind the scenes the function *phylomatic\_tree* retrieves a Taxonomic Serial Number (TSN) from ITIS for each species name, then a string is created for each species like this. These strings are submitted to the Phylomatic API, and if no errors occur, a phylogeny in newick format is returned. The *phylomatic\_tree* also cleans up the newick string

and converts to a ape *phylo* object. The output from *phylomatic\_tree* is a *phylo* object, which can be used for plotting, phylogenetic analyses, etc.

### E. What taxa are in children of my taxon of interest?

If you aren't a taxonomic specialist on a particular taxon you likely don't know what children taxa are within a family, or within a genus. You can of course go to a website like Wikispecies (http://species.wikimedia.org/wiki/Main\_Page) or Encyclopedia of Life (http://eol.org/). taxize provides an easy way for you to search for downstream taxa, both for the Catalogue of Life (CoL; http://www.catalogueoflife.org/) and the Integrated Taxonomic Information Database (http://www.itis.gov/). Here is a short example using the CoL in which we want to find all the species within the genus Apis (honey bees).

```
col_downstream(name = "Apis", downto = "Species")[[1]]
  childtaxa_id
                   childtaxa_name childtaxa_rank
1
       6971712 Apis andreniformis
                                          Species
2
                                          Species
       6971713
                      Apis cerana
                                          Species
3
       6971714
                     Apis dorsata
                                          Species
4
                      Apis florea
       6971715
5
       6971716 Apis koschevnikovi
                                          Species
6
       6845885
                   Apis mellifera
                                          Species
7
                 Apis nigrocincta
                                          Species
       6971717
```

### F. IUCN Status

There are a number of things we can do once we have the correct taxonomic names. One thing we can do is ask about the conservation status of a species. We have provided a set of functions, *iucn\_summary* and *iucn\_status*, to search for species names, and extract the status information, respectively. Here, we search for the Panther and Lynx.

It turns out that the Panther is endangered (EN) and the Lynx is of least concern (LN).

# VI. CONCLUSION

some text here

### VII. FUNDING

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### VIII. ACKNOWLEDGEMENTS

The taxize package is part of the rOpenSci project http://ropensci.org/.

### IX. APPENDICES

 $\bullet$  Appendix A. A complete reproducible workflow, from a species list to a phylogeny.

[1] Victoria C Stodden, "Reproducible research: Addressing the need for data and code sharing in computational science," Computing in Science & Engineering 12, 8–12 (2010).

<sup>[2]</sup> Carl Zimmer, "A sharp rise in retractions prompts calls for reform," New York Times (2012).

<sup>[3]</sup> Scott Chamberlain and Kevin Ushey, rsnps: Interface to SNP data on the web. (2013), r package version 0.0.4.

<sup>[4]</sup> David Winter, rentrez: Entrez in R (2013), r package version 0.2.1.

<sup>[5]</sup> Pierre Lefeuvre, BoSSA: a Bunch of Structure and Sequence Analysis (2010), r package version 1.2.

<sup>[6]</sup> E. Paradis, J. Claude, and K. Strimmer, "APE: analyses of phylogenetics and evolution in R language," Bioinformatics 20, 289–290 (2004).

<sup>[7]</sup> Campbell O Webb and Michael J Donoghue, "Phylomatic: tree assembly for applied phylogenetics," Molecular Ecology Notes 5, 181–183 (2005).