Now,  
we could be curious about the occurrence of these birds in *scientific  
work*. In this post, we will query the scientific literature and an open  
scientific data repository for species names: what have these birds been  
studied for? Read on if you want to learn how to use R packages allowing  
to do so!

**Getting a list of 50 species from occurrence data**

The single difference is our adding a step to keep only data for the  
most recent years.

# polygon for filtering

landkreis\_konstanz <- osmdata::getbb("Landkreis Konstanz",

format\_out = "sf\_polygon")

crs <- sf::st\_crs(landkreis\_konstanz)

# get and filter data

f\_out\_ebd <- "ebird/ebd\_lk\_konstanz.txt"

library("magrittr")

ebd <- auk::read\_ebd(f\_out\_ebd) %>%

sf::st\_as\_sf(coords = c("longitude", "latitude"),

crs = crs)

in\_indices <- sf::st\_within(ebd, landkreis\_konstanz)

ebd <- dplyr::filter(ebd, lengths(in\_indices) > 0)

ebd <- as.data.frame(ebd)

ebd <- dplyr::filter(ebd, approved, lubridate::year(observation\_date) > 2010)

For the sake of simplicity, we shall only use the 50 species observed  
the most often.

species <- ebd %>%

dplyr::count(common\_name, sort = TRUE) %>%

head(n = 50) %>%

dplyr::pull(common\_name)

The species are Carrion Crow, Eurasian Blackbird, Mallard, Eurasian  
Coot, Great Tit, Great Crested Grebe, Mute Swan, Great Cormorant,  
Eurasian Blue Tit, Gray Heron, Black-headed Gull, Common Chaffinch,  
Common Chiffchaff, Tufted Duck, European Starling, White Wagtail,  
European Robin, Little Grebe, Common Wood-Pigeon, Red-crested Pochard,  
Ruddy Shelduck, Graylag Goose, Red Kite, Common Buzzard, Eurasian  
Blackcap, Great Spotted Woodpecker, Eurasian Magpie, Gadwall, Common  
Pochard, Eurasian Nuthatch, Green-winged Teal, House Sparrow, Eurasian  
Jay, Yellow-legged Gull, Yellowhammer, Eurasian Green Woodpecker, Eared  
Grebe, Eurasian Reed Warbler, Barn Swallow, Northern Shoveler, Eurasian  
Moorhen, Black Redstart, Great Egret, White Stork, Eurasian Wren,  
Long-tailed Tit, Common House-Martin, Eurasian Kestrel, European  
Goldfinch and European Greenfinch  
[(glue::glue\_collapse(species, sep = ", ", last = " and "))](https://twitter.com/LucyStats/status/1031938964796657665?s=19).

**Querying the scientific literature**

Just like rOpenSci has a taxonomic toolbelt  
(taxize) and a species  
occurrence data toolbelt (SPOCC),  
it has a super package for querying the scientific literature:  
fulltext package! This package  
supports search for “PLOS via the rplos package, Crossref via the  
rcrossref package, Entrez via the rentrez package, arXiv via the aRxiv  
package, and BMC, Biorxiv, EuroPMC, and Scopus via internal helper  
functions”.

We shall use fulltext to retrieve the titles and abstracts of  
scientific articles mentioning each species, and will use tidytext to  
compute the most prevalent words in these works.

We first define a function retrieving the titles and abstracts of works  
obtained as result when querying one species name.

We use dplyr::bind\_rows because we want all results for one species at  
once, while fulltext returns a list of data.frames with one data.frame  
by data source.

.get\_papers <- function(species){

species %>%

tolower() %>%

fulltext::ft\_search() %>%

fulltext::ft\_get() %>%

fulltext::ft\_collect() %>%

fulltext::ft\_chunks(c("title", "abstract")) %>%

fulltext::ft\_tabularize() %>%

dplyr::bind\_rows()

}

.get\_papers(species[1]) %>%

dplyr::pull(title)

## [1] "Great spotted cuckoo nestlings have no antipredatory effect on magpie or carrion crow host nests in southern Spain"

## [2] "Donor-Control of Scavenging Food Webs at the Land-Ocean Interface"

## [3] "Formal comment to Soler et al.: Great spotted cuckoo nestlings have no antipredatory effect on magpie or carrion crow host nests in southern Spain"

## [4] "Socially Driven Consistent Behavioural Differences during Development in Common Ravens and Carrion Crows"

## [5] "Behavioral Responses to Inequity in Reward Distribution and Working Effort in Crows and Ravens"

## [6] "Early Duplication of a Single MHC IIB Locus Prior to the Passerine Radiations"

## [7] "Investigating the impact of media on demand for wildlife: A case study of Harry Potter and the UK trade in owls"

## [8] "New Caledonian Crows Rapidly Solve a Collaborative Problem without Cooperative Cognition"

## [9] "Nest Predation Deviates from Nest Predator Abundance in an Ecologically Trapped Bird"

## [10] "Dietary Compositions and Their Seasonal Shifts in Japanese Resident Birds, Estimated from the Analysis of Volunteer Monitoring Data"

If we were working on a scientific study, we’d add a few more filters,  
e.g. having the species mentioned in the abstract, and not only  
somewhere in the paper which is probably the way the different  
literature search providers define a match. But we’re not, so we can  
keep our query quite free!   
Because it’s a fun and important scientific question, and is supported  
by open data (by the way you can access CITES trade data (international  
trade in endangered species) in R using  
cites R package and CITES  
Speciesplus database using rcites).

We then apply this function to all 50 species and keep each article only  
once.

get\_papers <- ratelimitr::limit\_rate(.get\_papers,

rate = ratelimitr::rate(1, 2))

all\_papers <- purrr::map\_df(species, get\_papers)

nrow(all\_papers)

## [1] 522

all\_papers <- unique(all\_papers)

nrow(all\_papers)

## [1] 378

Now, we get the most common words from titles and abstracts. For that we  
first append the title to the abstract which is a quick hack.

library("tidytext")

library("rcorpora")

stopwords <- corpora("words/stopwords/en")$stopWords

all\_papers %>%

dplyr::group\_by(title, abstract) %>%

dplyr::summarise(text = paste(title, abstract)) %>%

dplyr::ungroup() %>%

unnest\_tokens(word, text) %>%

dplyr::filter(!word %in% stopwords) %>%

dplyr::count(word, sort = TRUE) -> words

So, what are the most common words in these papers?

head(words, n = 10)

## word n

## 1 species 754

## 2 birds 514

## 3 virus 270

## 4 avian 268

## 5 bird 262

## 6 study 243

## 7 breeding 231

## 8 wild 227

## 9 populations 217

## 10 population 213

Not too surprising, and obviously less entertaining than looking at  
individual species’ results. Maybe a wordcloud can give us a better idea  
of the wide area of topics of studies involving our 50 most frequent  
bird species. We use the [wordcloud  
package](https://cran.r-project.org/web/packages/wordcloud/index.html).

library("wordcloud")

with(words, wordcloud(word, n, max.words = 100))

wordcloud of titles and abstracts of scientific
papers

We see that topics include ecological words such as “foraging” but also  
epidemiological questions since “influenza” and “h5n1” come up. Now, how  
informative as this wordcloud can be, it’s a bit ugly, so we’ll prettify  
it using the wordcloud2 package instead.

bird <- words %>%

head(n = 100) %>%

wordcloud2::wordcloud2(figPath = "bird.png",

color = "black", size = 1.5)

# https://www.r-graph-gallery.com/196-the-wordcloud2-library/

htmlwidgets::saveWidget(bird,

"tmp.html",

selfcontained = F)

I wasn’t able to webshot the resulting html despite increasing the  
delay parameter so I screenshot it by hand!

magick::image\_read("screenshot.png")



wordcloud shaped as a bird

The result is a bit kitsch, doesn’t include the word “species”, one  
needs to know it’s the silhouette of a bird to recognize it, and we’d  
need to work a bit on not reshaping the silhouette, but it’s fun as it  
is.

**Querying scientific open data**

There are quite a few scientific open data repositories out there, among  
which the giant [DataONE](https://www.dataone.org/) that has an API  
interfaced with an R package. We shall use it to perform a search  
similar to the previous section, but looking at the data indexed on  
DataONE. Since DataONE specializes in ecological and environmental data,  
we expect to find rather ecological data.

We first define a function to retrieve metadata of datasets for one  
species. It looks the species names in the abstract.

.get\_meta <- function(species){

cn <- dataone::CNode("PROD")

search <- list(q = glue::glue("abstract:{species}"),

fl = "id,title,abstract",

sort = "dateUploaded+desc")

result <- dataone::query(cn, solrQuery = search,

as="data.frame")

if(nrow(result) == 0){

NULL

}else{

# otherwise one line by version

result <- unique(result)

tibble::tibble(species = species,

title = result$title,

abstract = result$abstract)

}

}

Note that DataONE searching could be more precise: one can choose to  
search from a given data source only for instance..

get\_meta <- ratelimitr::limit\_rate(.get\_meta,

rate = ratelimitr::rate(1, 2))

all\_meta <- purrr::map\_df(species, get\_meta)

nrow(all\_meta)

## [1] 266

length(unique(all\_meta$species))

## [1] 35

35 species are represented.

all\_meta <- unique(all\_meta[,c("title", "abstract")])

nrow(all\_meta)

## [1] 104

We then extract the most common words.

all\_meta %>%

dplyr::group\_by(title, abstract) %>%

dplyr::summarise(text = paste(title, abstract)) %>%

dplyr::ungroup() %>%

unnest\_tokens(word, text) %>%

dplyr::filter(!word %in% stopwords) %>%

dplyr::count(word, sort = TRUE) -> data\_words

head(data\_words, n = 10)

## # A tibble: 10 x 2

## word n

##

## 1 data 153

## 2 species 120

## 3 birds 94

## 4 breeding 87

## 5 feeding 75

## 6 population 65

## 7 bird 60

## 8 genetic 58

## 9 study 56

## 10 effects 54

Data is the most common word which is quite logical for metadata of  
actual datasets. Let’s also have a look at a regular wordcloud.

with(data\_words, wordcloud(word, n, max.words = 100))

wordcloud of titles and abstracts of scientific
metadata

As expected, the words seem more focused on ecology than when looking at  
scientific papers. DataONE is a gigantic data catalogue, where one could

* study the results of such queries (e.g. meta studies of number of,  
  say, versions by datasets)
* or find data to integrate to a new study. If you want to *download*  
  data from DataONE, refer to the [download data  
  vignette](https://github.com/DataONEorg/rdataone/blob/master/vignettes/download-data.Rmd).

**Conclusion**

In this post, we used the rOpenSci fulltext package, and the DataONE  
dataone package, to search for bird species names in scientific papers  
and scientific open datasets. We were able to draw wordclouds  
representing the diversity of topics of studies in which the birds had  
been mentioned or studied. Such a search could be fun to do for your  
favourite bird(s)! And in general, following the same approach you could  
answer your own specific research question.

**Scientific literature access**

As a reminder, the pipeline to retrieve abstracts and titles of works  
mentioning a bird species was quite smooth:

species %>%

tolower() %>%

fulltext::ft\_search() %>%

fulltext::ft\_get() %>%

fulltext::ft\_collect() %>%

fulltext::ft\_chunks(c("title", "abstract")) %>%

fulltext::ft\_tabularize() %>%

dplyr::bind\_rows()

fulltext gives you a lot of power!

**No more birding? No, your turn!**

This was the last post of this series, that hopefully provided an  
overview of how rOpenSci packages can help you learn more about birds,  
and can support your workflow. As a reminder, in this series we saw

* [How to identify spots for birding using open geographical  
  data](https://ropensci.org/blog/2018/08/14/where-to-bird/).  
  Featuring opencage for geocoding, bbox for bounding box  
  creation, osmdata for OpenStreetMap’s Overpass API querying,  
  osmplotr for map drawing using OpenStreetMap’s data.
* [How to obtain bird occurrence data in  
  R](https://ropensci.org/blog/2018/08/21/birds-radolfzell/).  
  Featuring rebird for interaction with the eBird’s API, and auk  
  for munging of the whole eBird dataset.
* [How to extract text from old natural history  
  drawings](https://ropensci.org/blog/2018/08/28/birds-ocr/).  
  Featuring magick for image manipulation, tesseract for Optical  
  Character Recognition, cld2 and cld3 for language detection, and  
  taxize::gnr\_resolve for taxonomic name resolution.
* [How to complement an occurrence dataset with taxonomy and trait  
  information](https://ropensci.org/blog/2018/09/04/birds-taxo-traits/).  
  Featuring taxize, taxonomic toolbelt for R, and traits,  
  providing access to species traits data.
* How to query the scientific literature and scientific open data  
  repositories. This is the post you’ve just read!