

Searching help pages of R packages

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Abstract The **sos** package provides a means to quickly and flexibly search the help pages of contributed packages, finding functions and datasets in seconds or minutes that could not be found in hours or days by any other means we know. Its `findFn` function accesses Jonathan Baron's *R Site Search* database and returns the matches in a data frame of class "findFn", which can be further manipulated by other **sos** functions to produce, for example, an Excel file that starts with a summary sheet that makes it relatively easy to prioritize alternative packages for further study. As such, it provides a very powerful way to do a literature search for functions and packages relevant to a particular topic of interest and could become virtually mandatory for authors of new packages or papers in publications such as *The R Journal* and the *Journal of Statistical Software*.

Introduction

The **sos** package provides a means to quickly and flexibly search the help pages of contributed packages, finding functions and datasets in seconds or minutes that could not be found in hours or days by any other means we know.

The main capability of this package is the `findFn` function, which scans the "function" entries in Jonathan Baron's *R site search* database (Baron, 2009) and returns the matches in a data frame of class "findFn". Baron's site is one of five search capabilities currently identified under "Search" from the main <http://www.r-project.org/> web site. It includes options to search the help pages of R packages contributed to CRAN (the Comprehensive R Archive Network) plus a few other publicly available packages, as well as selected mailing list archives—primarily R-help. The `findFn` function focuses only on the help pages in this database. (CRAN grew from 1700 contributed packages and bundles on 2009-03-11 to 1954 on 2009-09-18, adding over 40 packages per day, an annual growth rate of 31 percent.)

The print method for objects of class "findFn" displays the results as a table in a web browser with links to the individual help pages, sorted by package, displaying the results from the package with the most matches first. This behaviour differs from that of the `RSiteSearch` function in the **utils** package in more ways than the sort order. First, `findFn` returns the results in R as a data frame, which can be further manipulated. Second, the ultimate display in a web browser is a table, unlike the list produced by

`RSiteSearch`.

Other **sos** functions provide summaries with one line for each package, support the union and intersection of "findFn" objects, and translate a "findFn" object into an Excel file with three sheets: (1) **PackageSum2**, which provides an enhanced summary of the packages with matches, (2) the `findFn` table itself, and (3) the `call` used to produce it.

Three examples are considered below: First we find a data set containing a variable `Petal.Length`. Second, we study R capabilities for splines, including looking for a function named `spline`. Third, we search for contributed R packages with capabilities for solving differential equations.

Finding a variable in a data set

Chambers (2009, pp. 282-283) uses a variable `Petal.Length` from a famous Fisher data set but without naming the data set nor indicating where it can be found nor even if it exists in any contributed R package. The sample code he provides does not work by itself. To get his code to work to produce his Figure 7.2, we must first obtain a copy of this famous data set in a format compatible with his code.

To look for this data set, one might first try the `help.search` function. Unfortunately, this function returns nothing in this case:

```
> help.search('Petal.Length')
```

```
No help files found with alias or concept or title
matching 'Petal.Length' using regular expression
matching.
```

When this failed, many users might then try

```
> RSiteSearch('Petal.Length')
```

```
A search query has been submitted to http://search.r-project.org
The results page should open in your browser shortly
```

This produced 80 matches when it was tried one day (and 62 matches a few months later). `RSiteSearch('Petal.Length', 'function')` will identify only the help pages. We can get something similar and for many purposes more useful, as follows:

```
> library(sos)
> PL <- findFn('Petal.Length')
```

```
found 34 matches; retrieving 2 pages
2
```

PL is a data frame of class "findFn" identifying all the help pages in Jonathan Baron's data base matching the search term. An alias for `findFn` is `???`, and this same search can be performed as follows:

```
> PL <- ???Petal.Length
```

```
found 34 matches; retrieving 2 pages
2
```

(The `???` alias only works in an assignment, so to print immediately, you need something like `(PL <- ???Petal.Length)`.)

This data frame has columns `Count`, `MaxScore`, `TotalScore`, `Package`, `Function`, `Date`, `Score`, `Description`, and `Link`. `Function` is the name of the help page, not the name of the function, as multiple functions may be documented on a single help page, and some help pages document other things such as data sets. `Score` is the index of the strength of the match. It is used by Baron's search engine to decide which items to display first. `Package` is the name of the package containing `Function`. `Count` gives the total number of matches in `Package` found in this `findFn` call. By default, the `findFn` object is sorted by `Count`, `MaxScore`, `TotalScore`, and `Package` (to place the most important `Package` first), then by `Score` and `Function`.

The summary method for such an object prints a table giving for each `Package` the `Count` (number of matches), `MaxScore` (max of `Score`), `TotalScore` (sum of `Score`), and `Date`, sorted like a Pareto chart to place the `Package` with the most help pages first:

```
> # the following table has been
> # manually edited for clarity
> summary(PL)
```

```
Call:
findFn(string = "Petal.Length")
```

```
Total number of matches: 34
Downloaded 34 links in 16 packages.
```

```
Packages with at least 1 match using pattern
'Petal.Length'
  Package Count MaxScore TotalScore      Date
yaImpute     8         1         8 2010-03-24
<...>
datasets     1         2         2 2010-04-23
<...>
```

(The `Date` here is the date that this package was added to Baron's database.)

One of the listed packages is **datasets**. Since it is part of the default R distribution, we decide to look there first. We can select that row of `PL` just like we would select a row from any other data frame:

```
> PL[PL$Package == 'datasets', 'Function']
```

```
[1] iris
```

Problem solved in less than a minute! Any other method known to the present authors would have taken substantially more time.

Finding packages with spline capabilities

Almost four years ago, the lead author of this article decided he needed to learn more about splines. A literature search began as follows:

```
> RSiteSearch('spline')
```

(using the `RSiteSearch` function in the **utils** package). While preparing this manuscript, this command identified 1032 documents as of 2010-06-22. That is too many. It can be restricted to functions as follows:

```
> RSiteSearch('spline', 'fun')
```

This identified only 830 one day (631 a few months earlier). That's an improvement over 1032 but is still too many. To get a quick overview of these 830, we can proceed as follows:

```
> splinePacs <- findFn('spline')
```

This downloaded a summary of the 400 highest-scoring help pages in the 'RSiteSearch' data base in roughly 5-15 seconds, depending on the speed of the Internet connection. To get all 830 matches, increase the `maxPages` argument from its default 20:

```
> splineAll <- findFn('spline', maxPages = 999)
```

If we want to find a function named `spline`, we can proceed as follows:

```
> selSpl <- splineAll[, 'Function'] == 'spline'
> splineAll[selSpl, ]
```

This has 0 rows, because there is no help page named `spline`. This does not mean that no function with that exact name exists, only that no help page has that name.

To look for help pages whose name includes the characters 'spline', we can use `grepFn`:

```
> grepFn('spline', splineAll, ignore.case = TRUE)
```

This returned a "findFn" object identifying 93 help pages. When this was run while preparing this manuscript, the sixth row was `cSplineDes` in the **mgcv** package, which has a `Score` of 35. (On another day, the results could be different, because CRAN changes over time.) This was the sixth row in this table, because it is in the **mgcv** package, which had a total of 24 help pages matching the search term, but this was the only one whose name matched the pattern passed to `grepFn`.

We could next print the `splineAll` "findFn" object. However, it may not be easy to digest a table with 93 rows.

`summary(splineAll)` would tell us that the 830 help pages came from 218 different packages and display the first `minPackages = 12` such packages. (If other packages had the same number of matches as

the twelfth package, they would also appear in this summary.)

A more complete view can be obtained in MS Excel format using the `writeFindFn2xls` function:

```
> writeFindFn2xls(splineAll)
```

(`findFn2xls` is an alias for `writeFindFn2xls`. We use the longer version here, as it may be easier to remember.)

If either the **WriteXLS** package and compatible Perl code are properly installed or if you are running Windows with the **RODBC** package, this produces an Excel file in the working directory named 'splineAll.xls', containing the following three worksheets:

- The **PackageSum2** sheet includes one line for each package with a matching help page, enhanced by providing information for locally installed packages not available in the "findFn" object.
- The **findFn** sheet contains the search results.
- The **call** sheet gives the call to `findFn` that generated these search results.

If `writeFindFn2xls` cannot produce an Excel file with your installation, it will write three 'csv' files with names 'splineAll-sum.csv', 'splineAll.csv', and 'splineAll-call.csv', corresponding to the three worksheets described above. (Users who do not have MS Excel may like to know that Open Office Calc can open a standard 'xls' file and can similarly create such files (Openoffice.org, 2009).)

The **PackageSum2** sheet is created by the `PackageSum2` function, which adds information from installed packages not obtained by `findFn`. The extended summary includes the package title and date, plus the names of the author and the maintainer, the number of help pages in the package, and the name(s) of any vignettes. This can be quite valuable in prioritizing packages for further study. Other things being equal, we think most people would rather learn how to use a package being actively maintained than one that has not changed in five years. Similarly, we might prefer to study a capability in a larger package than a smaller one, because the rest of the package might provide other useful tools or a broader context for understanding the capability of interest.

These extra fields, package title, etc., are blank for packages in the "findFn" object not installed locally. For installed packages, the `Date` refers to the *packaged* date rather than the date the package was added to Baron's database.

Therefore, the value of `PackageSum2` can be increased by running `install.packages` (from the

utils package) to install packages not currently available locally and `update.packages()` to ensure the local availability of the latest versions for all installed packages.

To make it easier to add desired packages, the **sos** package includes an `installPackages` function, which checks all the packages in a "findFn" object for which the number of matches exceeds a second argument `minCount` and installs any of those not already available locally; the default `minCount` is the square root of the largest `Count`. Therefore, the results from `PackageSum2` and the **PackageSum2** sheet created by `writeFindFn2xls` will typically contain more information after running `installPackages` than before.

To summarize, three lines of code gave us a very powerful summary of spline capabilities in contributed R packages:

```
> splineAll <- findFn('spline', maxPages = 999)
> # Do not include in auto test
> #installPackages(splineAll)
> writeFindFn2xls(splineAll)
```

The resulting 'splineAll.xls' file can help establish priorities for further study of the different packages and functions. An analysis of this nature almost four years ago led the lead author to the **fda** package and its companion books, which further led to a collaboration that has produced joint presentations at three different conferences and a joint book (Ramsey et al., 2009).

Combining search results

The lead author of this article recently gave an invited presentation on "Fitting Nonlinear Differential Equations to Data in R"¹. A key part of preparing for that presentation was a search of contributed R code, which proceeded roughly as follows:

```
> de <- findFn('differential equation')
> des <- findFn('differential equations')
> de. <- de | des
```

The object `de` has 70 rows, while `des` has 145. If this search engine were simply searching for character strings, `de` would be larger than `des`, rather than the other way around. The last object `de.` is the union of `de` and `des`; `'|'` is an alias for `unionFindFn`. The `de.` object has 171 rows, which suggests that the corresponding intersection must have $(70 + 145 - 171 = 44)$. This can be confirmed via `nrow(de & des)`. (`'&'` is an alias for `intersectFindFn`.)

To make everything in `de.` locally available, we can use `installPackages(de., minCount = 1)`. This installed all referenced packages except `rmutil` and a dependency `Biobase`, which were not available on

¹Workshop on Statistical Methods for Dynamic System Models, Vancouver, 2009: http://stat.sfu.ca/~dac5/workshop09/Spencer_Graves.html

CRAN but are included in Jonathan Baron's R Site Search data base.

Next, `writeFindFn2xls(de.)` produced a file 'de.xls' in the working directory. (The working directory can be identified via `getwd().`)

The **PackageSum2** sheet of that Excel file provided a quick summary of packages with matches, sorted to put the package with the most matches first. In this case, this first package was **deSolve**, which provides, "General solvers for initial value problems of ordinary differential equations (ODE), partial differential equations (PDE) and differential algebraic equations (DAE)". This is clearly quite relevant to the subject. The second package was **PKfit**, which is "A Data Analysis Tool for Pharmacokinetics". This may be too specialized for general use. I therefore would not want to study this first unless my primary interest here was in pharmacokinetic models.

By studying the summary page in this way, I was able to decide relatively quickly which packages I should consider first. In making this decision, I gave more weight to packages with one or more vignettes and less weight to those where the Date was old, indicating that the code was not being actively maintained and updated. I also checked the conference information to make sure I did not embarrass myself by overlooking a package authored or maintained by another invited speaker.

Discussion

We have found `findFn` in the **sos** package to be very quick, efficient and effective for finding things in contributed packages. The `grepFn` function helps quickly look for functions (or help pages) with particular names. The capabilities in `unionFindFn` and `intersectFindFn` (especially via their '|' and '&' aliases) can be quite useful where a single search term seems inadequate; they make it easy to combine multiple searches to produce something closer to what is desired. An example of this was provided with searching for both "differential equation" and "differential equations".

The **PackageSum2** sheet of an Excel file produced by `writeFindFn2xls` (after also running the `installPackages` function) is quite valuable for understanding the general capabilities available for a particular topic. This could be of great value for authors to find what is already available so they don't duplicate something that already exists and so their new contributions appropriately consider the contents of other packages.

The `findFn` capability can also reduce the risk of "the researcher's nightmare" of being told after substantial work that someone else has already done it.

Users of **sos** may also wish to consult Crantastic (<http://www.crantastic.org/>), which allows users to tag, rate, and view packages. (The coverage of Crantastic includes current and orphaned CRAN

packages, while Baron (2009) also includes 'most of the default packages from Bioconductor and all of Jim Lindsey's packages.')

Acknowledgments

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