# HowTo: Querying online Data 

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## 1 Overview

This article demonstrates how you can make use of the tools that have been provided for on-line querying of data resources. These tools rely on others (such as the NLM and NCBI) providing and documenting appropriate web interfaces. The tools described here allow you to either retrieve the data (usually in XML) or have it rendered in a browser on the local machine. To do this you will need the Biobase, XML, and annotate packages. The functionality in this article was first described in (Gentleman and Gentry, 2002), although some enhancements have been made since the writing of that article.

Assembling and using meta-data annotation is a non-trivial task. In the Bioconductor Project we have developed tools to support two different methods of accessing meta-data. One is based on obtaining data from a variety of sources, of curating it and packaging it in a form that is suitable for analysing microarray data. The second method is to make use of on-line resources such as those provided by NLM and NCBI. The functions described in this vignette provide infrastructure for that second type of meta-data usage.

We first describe the functions that allow users to specify queries and open the appropriate web page on their local machine. Then, we investigate the much richer set of tools that are provided by NLM for accessing and working with PubMed data.

## 2 Using the Browser

There are currently four functions that provide functionality for accessing online data resources. They are:
genbank Users specify GenBank identifiers and can request them to be rendered in the browser or returned in XML.
pubmed Users specify PubMed identifiers and can request them to be rendered in the browser or returned in XML. More details on parsing and manipulating the XML are given below.
locuslinkByID Users specify LocusLink identifiers and the appropriate links are opened in the browser. LocusLink does not provide XML so there is no download option, currently. The user can request that the URL be rendered or returned.
locuslinkQuery Users specify a string that will be used as the LocusLink query and the species of interest (there can be several). The user can request either that the URL be rendered or returned.

Both genbank and pubmed can return XML versions of the data. These returned values can subsequently be processed using functionality provided by the XML package (Temple Lang, 2000). Specific details and examples for PubMed are given in Section 3 .

The function locuslinkByID takes a set of known LocusLink identifiers and constructs a URL that will have these rendered. The user can either save the URL (perhaps to send to someone else or to embed in an HTML page, see the vignette on creating HTML output for more details).

The function locuslinkQuery takes a character string to be used for querying PubMed. For example, this function call,

```
locuslinkQuery("leukemia", "Hs")
```

will find all Human genes that have the word leukemia associated with them in their LocusLink records. Note that the R code is merely an interface to the services provided by NLM and NCBI and users are referred to those sites for complete descriptions of the algorithms they use for searching etc.

## 3 Accessing PubMed information

In this section we demonstrate how to query PubMed and how to operate on the data that are returned. As noted above, these queries generate XML which must then be parsed to provide the specific data items of interest. Our example is based on the eset data from the package Biobase. Users should be able to easily replace these data with their own.

```
> library("annotate")
> data(sample.exprSet.1)
> affys <- geneNames(sample.exprSet.1) [490:500]
> affys
```

```
[1] "31729_at" "31730_at" "31731_at" "31732_at" "31733_at" "31734_at"
```

[1] "31729_at" "31730_at" "31731_at" "31732_at" "31733_at" "31734_at"
[7] "31735_at" "31736_at" "31737_at" "31738_at" "31739_at"

```

Here we have selected an arbitrary set of 10 genes to be interested in from our sample data. However, sample.exprSet. 1 provided us with Affymetrix identifiers, and for the pubmed function, we need to use PubMed ID values. To obtain these, we can use the annotation tools within annotate.
```

> library("hgu95av2")
> ids <- getPMID(affys, "hgu95av2")
> ids <- unlist(ids, use.names = FALSE)
> ids <- unique(ids[!is.na(as.numeric(ids))])
> ids

```
\begin{tabular}{|c|c|c|c|c|c|}
\hline & & - & , & \(1{ }^{\prime \prime}\) & " \\
\hline & "8680883" & "8764009" & "8764062" & "8849451" & "9054383" \\
\hline [11] & "9695952" & "12878157" & "1889752" & "8175896" & "8325638" \\
\hline [16] & "9119399" & "9765591" & "9809674" & "10529182" & "12408966" \\
\hline [21] & "12477932" & "9199346" & "9315667" & "9858531" & "9858600" \\
\hline [26] & "11583618" & "12679040" & "14576168" & "14638676" & "15563468" \\
\hline [31] & "15592428" & "15710417" & "16061479" & "1572287" & "2005217" \\
\hline [36] & "2040595" & "6548702" & "6548703" & "7829601" & "7916973" \\
\hline [41] & "7958621" & "8735594" & "9730618" & "10601981" & "10750025" \\
\hline [46] & "11313185" & "12198562" & "12506116" & "12590922" & "12614168" \\
\hline [51] & "14525934" & "14681466" & "15070778" & "15956696" & "15956711" \\
\hline [56] & "15956719" & "15956727" & "15956728" & "15956746" & "15967869" \\
\hline [61] & "16049981" & "16381900" & "16580233" & "7566110" & 7566120" \\
\hline [66] & "9016352" & "9221902" & "11069162" & "12270951" & 8270" \\
\hline [7 & "14520770" & "15331767 & "15475563" & "1358459" & 46 \\
\hline [76] & "2574852" & "2878432" & "8646877" & "9582375" & 7506 \\
\hline [81 & "7949733" & "11076525" & "11883959" & "11948623" & "648524" \\
\hline [86] & "1074709" & "1383230" & "1544421" & "1808202" & "2161834 \\
\hline [91] & "2395459" & "2455687" & "2907503" & "2936753" & "3793760" \\
\hline [96] & "3842206" & "6190133" & "6865942" & "6893424" & "7503723" \\
\hline [101] & "7680654" & "7703225" & "7780165" & "7816144" & 861" \\
\hline [106] & "7908020" & "7908614" & "8258301" & "8413665" & "8422497 \\
\hline [111] & "8567732" & "8612804" & "8999969" & "9199170" & "9214391" \\
\hline [116] & "9251807" & "9298982" & "9417078" & "9490638" & "9512503" \\
\hline [121] & "9645951" & "9668039" & "9724539" & "9792688" & "9832551" \\
\hline [126] & "9852149" & "10072583" & "10224093" & "10366597" & "10438535" \\
\hline [131] & "10508519" & "10559237" & "10564664" & "10575001" & "10581178" \\
\hline [136] & "10583954" & "10601340" & "10628374" & "10666339" & "10793131" \\
\hline [141] & "10882740" & "10984435" & "11018051" & "11027608" & "11053353" \\
\hline [146] & "11071908" & "11090452" & "11106625" & "11171322" & "11259305" \\
\hline [151] & "11309382" & "11333380" & "11415434" & "11429692" & "11438522" \\
\hline [156] & "11461920" & "11468283" & "11481347" & "11524436" & "11536049" \\
\hline [161] & "11580270" & "11583571" & "11701614" & "11707283" & "11795944" \\
\hline [166] & "11812134" & "11821948" & "11839310" & "11850458" & "11877456" \\
\hline [171] & "11889126" & "11950878" & "11969288" & "12006649" & "12019270" \\
\hline [176] & "12033495" & "12044158" & "12048248" & "12119014" & "12127568" \\
\hline [181] & "12163017" & "12383268" & "12388543" & "12417594" & "12466270" \\
\hline [186] & "12475945" & "12480535" & "12534372" & "12571245" & "12665555" \\
\hline [191] & "12714565" & "12721663" & "12849983" & "12857853" & "14506234" \\
\hline 96] & "14523566" & '14576350" & '14640694 & 14 & 1 \\
\hline
\end{tabular}
```

[201] "14702039" "15072110" "15107502" "15152255" "15198992"
[206] "15236405" "15336687" "15454575" "15468086" "15494313"
[211] "15507486" "15520409" "15679046" "16427282" "1602151"
[216] "7590364" "8619474" "9110174" "12204115" "15302935"
[221] "15308636" "15466936" "15952740" "16130169" "16236267"
[226] "16396496" "10997877" "11448995" "11717165" "11814696"
[231] "12527750" "12631729" "15013951" "15146197" "15185077"

```

We use getPMID to obtain the PubMed identifiers that are related to our probes of interest. Then we process these to leave out any that have no PMIDs and we remove duplicates as well. The mapping to PMIDs are actually based on LocusLink identifiers and since the mapping from Affymetrix IDs to LocusLink is many to one there is some chance of duplication. From our initial 11 Affymetrix identifiers we see that there are 235 unique PubMed identifiers (ie papers).

For each of these papers we can obtain information, such as the title, the authors, the abstract, the LocusLink identifiers for genes that are referred to in the paper and many other pieces of information. Again, for a complete listing and description the reader is referred to the NLM website.

We next generate the query and store the results in a variable named x . This object is of class XMLDocument and to manipulate it we will use functions provided by the XML package.
```

> x <- pubmed(ids)
> a <- xmlRoot(x)
> numAbst <- length(xmlChildren(a))
> numAbst

```
[1] 235
Our search of the 235 PubMed IDs (from the 11 Affymetrix IDs) has resulted in 235 abstracts from PubMed (stored in R using XML format). The annotate package also provides a pubMedAbst class, which will take the raw XML format from a call to pubmed and extract the interesting sections for easy review.
```

> arts <- vector("list", length = numAbst)
> absts <- rep(NA, numAbst)
> for (i in 1:numAbst) {

+ arts[[i]] <- buildPubMedAbst(a[[i]])
+ absts[i] <- abstText(arts[[i]])
+ }
> arts[[7]]
An object of class 'pubMedAbst':
Title: Mutations in the carboxy-terminal domain of TBP affect
the synthesis of human immunodeficiency virus type 1
full-length and short transcripts similarly.
PMID: 8764009

```

Authors: PS Pendergrast, D Morrison, WP Tansey, N Hernandez
Journal: J Virol
Date: Aug 1996
In the \(S\) language we say that the pubMedAbst class has a number of different slots. They are:
authors The vector of authors.
pmid The PubMed record number.
abstText The actual abstract (in text).
articleTitle The title of the article.
journal The journal it is published in.
pubDate The publication date.
These can all be individually extracted utilizing the provided methods, such as abstText in the above example. As you can see, the pubMedAbst class provides several key pieces of information: authors, abstract text, article title, journal, and the publication date of the journal.

Once the abstracts have been assembled you can search them using any of the standard search techniques. Suppose for example we wanted to know which abstracts have the term cDNA in them, then the following code chunk shows how to identify these abstracts.
```

> found <- grep("cDNA", absts)
> goodAbsts <- arts[found]
> length(goodAbsts)

```
[1] 38
So 38 of the articles relating to our genes of interest mention the term cDNA in their abstracts.

Lastly, as a demonstration for how one can use the query toolset to cross reference several databases, we can use the same set of PubMed IDs with another function. In this example, the genbank function is used with the argument type="uid". By default, the genbank function assumes that the id values passed in are Genbank accession numbers, but we currently have PubMed ID values that we want to use. The type="uid" argument specifies that we are using PubMed IDs (aka NCBI UID numbers).
```

> y <- genbank(ids[1:10], type = "uid")
> b <- xmlRoot(x)

```

At this point the object b can be manipulated in a manner similar to a from the PubMed example.

Also, note that both pubmed and genbank have an option to display the data directly in the browser instead of XML, by specifying disp="browser" in the parameter listing.

\section*{4 Generating HTML output for your abstracts}

Many users find it useful to have a web page created with links for all of their abstracts, leading to the actual PubMed page online. These pages can then be distributed to other people who have an interest in the abstracts that you have found. There are two formats for this, the first provides for a simple HTML page which has a link for every abstract, and the other provides for a framed HTML page with the links on the left and the resulting PubMed page in the main frame. For these examples, we will be using temporary files:
```

> fname <- tempfile()
> pmAbst2HTML(goodAbsts, filename = fname)
> fnameBase <- tempfile()
> pmAbst2HTML(goodAbsts, filename = fnameBase, frames = TRUE)

```

\section*{5 Session Information}

The version number of R and packages loaded for generating the vignette were:
\(R\) version 2.4.0 (2006-10-03)
x86_64-unknown-linux-gnu
locale:
LC_CTYPE=en_US;LC_NUMERIC=C;LC_TIME=en_US;LC_COLLATE=en_US;LC_MONETARY=en_US;LC_MESSAGES=en_
attached base packages:
```

[1] "tools" "methods" "stats" "graphics" "grDevices"
[6] "utils" "datasets" "base"

```
other attached packages:
\begin{tabular}{rrrrr} 
XML & GO & Rgraphviz geneplotter & graph \\
"1.2-0" & "1.14.1" & "1.12.1" & "1.12.0" & "1.12.0" \\
xtable & hgu95av2 & annotate & Biobase & \\
"1.4-2" & "1.14.0" & "1.12.1" & "1.12.2" &
\end{tabular}

\section*{References}
R. Gentleman and J. Gentry. Querying pubmed. \(R\) News, 2(2):28-31, June 2002. URL http://CRAN.R-project.org/doc/Rnews/.

Duncan Temple Lang. Tools for parsing and generating xml within r and s-plus. CRAN, 2000. URL http://www. omegahat. org/RSXML.
\begin{tabular}{|c|c|}
\hline \multicolumn{2}{|l|}{BioConductor Abstract List} \\
\hline Article Title & Publication
Date \\
\hline Cloning and characterization of hTAFII18, hTAFII20 and hTAFII28: three subunits of the human transcription factor TFIID. & Apr 1995 \\
\hline Generation and initial analysis of more than 15,000 full-length human and mouse cDNA sequences. & Dec 2002 \\
\hline Expression, purification and characterization of human prorelaxin-like-protein H 2 in Escherichia colil & Sep 2002 \\
\hline Isolation and analysis of the \(3^{\prime}\)-untranslated regions of the human relaxin H 1 and H 2 genes, & Apr 2000 \\
\hline Two human relasin genes are on chromosome 9. & Oct 1984 \\
\hline Relaxin gene expression in human ovaries and the predicted structure of a human preprorelaxin by analysis of CDNA clones. & Oct 1984 \\
\hline Expression of the human relaxin H 1 gene in the decidua, trophoblast, and prostate. & Apr 1991 \\
\hline Molecular characterization and pharmacological properties of the human P2X3 purinoceptor. & Jul 1997 \\
\hline Characterization of recombinant human P2X4 receptor reveals pharmacological differences to the rat homologue. & Jan 1997 \\
\hline The HOXC11 homeodomain protein interacts with the lactase-phlorizin hydrolase promoter and stimulates HNF1 alpha-dependent transcription. & May 1998 \\
\hline The human HOX gene family. & Dec 1989 \\
\hline Identification of the alternative splice products encoded by the human protein phosphatase inhibitor-1 gene. & Mar 2002 \\
\hline Identification and characterization of a novel protein inhibitor of type 1 protein phosphatase. & Nov 2000 \\
\hline Isolation and characterization of full-length cDNA clones for human alpha-, beta-, and gamma-actin mRNAs: skeletal but not cytoplasmic actins have an amino-terminal cysteine that is subsequently removed. & May 1983 \\
\hline Isolation and characterization of cDNA clones for human skeletal muscle alpha actin. & Jun 1983 \\
\hline Large-scale concatenation CDNA sequencing. & Apr 1997 \\
\hline Cloning and sequencing of the CDNA encoding human P5. & Oct 1995 \\
\hline
\end{tabular}

Figure 1: pmAbst2HTML without frames


Figure 2: pmAbst2HTML with frames```

