# **Entrez Direct Reference**

Searching, Retrieving, and Parsing Data from NCBI

**Databases through the Unix Command Line** 



# Introduction

Entrez Direct (EDirect) provides access to the NCBI's suite of interconnected databases from a Unix terminal window. Search terms are entered as command-line arguments. Individual operations are connected with Unix pipes to construct multi-step queries. Selected records can then be retrieved in a variety of formats.

## **Programmatic Access**

EDirect connects to Entrez through the Entrez Programming Utilities interface. It supports searching by indexed terms, looking up precomputed neighbors or links, filtering results by date or category, and downloading record summaries or reports.

Navigation programs (**esearch**, **elink**, **efilter**, and **efetch**) communicate by means of a small structured message, which can be passed invisibly between operations with a Unix pipe. The message includes the current database, so it does not need to be given as an argument after the first step.

Accessory programs (**nquire**, **transmute**, and **xtract**) can help eliminate the need for writing custom software to answer ad hoc questions. Queries can move seamlessly between EDirect programs and Unix utilities or scripts to perform actions that cannot be accomplished entirely within Entrez.

All EDirect programs are designed to work on large sets of data. Intermediate results are either saved on the Entrez history server or instantiated in the hidden message. For best performance, obtain an API Key from NCBI, and place the following line in your .bash\_profile and .zshrc configuration files:

```
export NCBI API KEY=unique api key
```

Each program also has a **-help** command that prints detailed information about available arguments.

# **Navigation Functions**

Esearch performs a new Entrez search using terms in indexed fields. It requires a **-db** argument for the database name and uses **-query** for the search terms. For PubMed, without field qualifiers, the server uses automatic term mapping to compose a search strategy by translating the supplied query:

```
esearch -db pubmed -query "selective serotonin reuptake inhibitor"
```

Search terms can also be qualified with a bracketed field name to match within the specified index:

```
esearch -db nuccore -query "insulin [PROT] AND rodents [ORGN]"
```

Elink looks up precomputed neighbors within a database, or finds associated records in other databases, or uses the NIH Open Citation Collection service (see PMID 31600197) to follow reference lists:

```
elink -related
elink -target gene
elink -cited
elink -cites
```

Efilter limits the results of a previous query, with shortcuts that can also be used in esearch:

```
efilter -molecule genomic -location chloroplast -country sweden -mindate 1985
```

Efetch downloads selected records or reports in a style designated by **-format**:

```
efetch -format abstract
```

Individual query commands are connected by a Unix vertical bar pipe symbol:

```
esearch -db pubmed -query "tn3 transposition immunity" | efetch -format medline
```

There is no need to use a script to loop over records in small groups, or write code to retry after a transient network or server failure, or add a time delay between requests. All of those features are already built into the EDirect commands.

#### **Accessory Programs**

Nquire retrieves data from remote servers with URLs constructed from command line arguments:

```
nquire -get https://icite.od.nih.gov api/pubs -pmids 2539356 |
```

Transmute converts a concatenated stream of JSON objects or other structured formats into XML:

```
transmute -j2x |
```

Xtract can use waypoints to navigate a complex XML hierarchy and obtain data values by field name:

```
xtract -pattern data -element cited by |
```

The resulting output can be post-processed by Unix utilities or scripts:

```
fmt -w 1 | sort -V | uniq
```

# **Discovery by Navigation**

PubMed related articles are calculated by a statistical text retrieval algorithm using the title, abstract, and medical subject headings (MeSH terms). The connections between papers can be used for making discoveries. An example of this is finding the last enzymatic step in the vitamin A biosynthetic pathway.

Lycopene cyclase in plants converts lycopene into  $\beta$ -carotene, the immediate biochemical precursor of vitamin A. An initial search on the enzyme finds 306 articles. Looking up precomputed neighbors returns 19,146 papers, some of which might be expected to discuss other enzymes in the pathway:

```
esearch -db pubmed -query "lycopene cyclase" | elink -related |
```

β-carotene is known to be an essential nutrient, required in the diet of herbivores. This indicates that lycopene cyclase is not present in animals (with a few exceptions caused by horizontal gene transfer), and that the enzyme responsible for converting β-carotene into vitamin A is not present in plants.

Applying this knowledge, by linking the publication neighbors to their associated protein records and then filtering those candidates using the NCBI taxonomy, can help locate the desired enzyme.

Linking from pubmed to the protein database finds 604,878 protein sequences:

```
elink -target protein |
```

Limiting to mice excludes plants, fungi, and bacteria, which eliminates the earlier enzymes:

```
efilter -organism mouse -source refseq |
```

This matches only 32 sequences, which is small enough to examine by retrieving the individual records:

```
efetch -format fasta
```

As anticipated, the results include the enzyme that splits  $\beta$ -carotene into two molecules of retinal:

```
>NP_067461.2 beta,beta-carotene 15,15'-dioxygenase isoform 1 [Mus musculus] MEIIFGQNKKEQLEPVQAKVTGSIPAWLQGTLLRNGPGMHTVGESKYNHWFDGLALLHSFSIRDGEVFYR SKYLQSDTYIANIEANRIVVSEFGTMAYPDPCKNIFSKAFSYLSHTIPDFTDNCLINIMKCGEDFYATTE
```

## **XML Data Extraction**

The ability to obtain Entrez records in structured format, and to easily extract the underlying data, allows the user to ask novel questions that are not addressed by existing analysis software.

The xtract program uses command-line arguments to direct the conversion of data in eXtensible Markup Language format. It allows record detection, path exploration, element selection, conditional processing, and report formatting to be controlled independently.

The **-pattern** command partitions an XML stream by object name into individual records that are processed separately. Within each record, the **-element** command does an exhaustive, depth-first search to find data content by field name. Explicit paths to objects are not needed.

#### **Format Customization**

By default, the -pattern argument divides the results into rows, while placement of data into columns is controlled by -element, to create a tab-delimited table.

Formatting commands allow extensive customization of the output. The line break between -pattern rows is changed with **-ret**, while the tab character between -element columns is modified by **-tab**.

Multiple instances of the same element are distinguished using **-sep**, which controls their separation independently of the -tab command. The following query:

```
efetch -db pubmed -id 6271474,6092233,16589597 -format docsum | xtract -pattern DocumentSummary -sep "|" -element Id PubDate Name
```

returns a tab-delimited table with individual author names separated by vertical bars:

```
6271474 1981 Casadaban MJ|Chou J|Lemaux P|Tu CP|Cohen SN 6092233 1984 Jul-Aug Calderon IL|Contopoulou CR|Mortimer RK 16589597 1954 Dec Garber ED
```

The -sep value also applies to distinct -element arguments that are grouped with **commas**. This can be used to keep data from multiple related fields in the same column:

```
-sep " " -element Initials,LastName
```

The **-def** command sets a default placeholder to be printed when none of the comma-separated fields in an -element clause are present:

```
-def "-" -sep " " -element Year, Month, MedlineDate
```

Repackaging commands (**-wrp**, **-enc**, and **-pkg**) wrap extracted data values with bracketed XML tags given only the object name. For example, "-wrp Word" issues the following formatting instructions:

```
-pfx "<Word>" -sep "</Word>\Word>" -sfx "</Word>"
```

Additional commands (-tag, -att, -atr, -cls, -slf, and -end) allow generation of XML attributes.

#### **Element Variants**

Derivatives of -element were created to eliminate the inconvenience of having to write post-processing scripts to perform otherwise trivial modifications or analyses on extracted data. Examples include positional (-first, -even), numeric (-inc, -max, -mod, -log), text (-upper, -title, -words, -letters), and sequence (-revcomp, -fasta, -ncbi2na, -molwt) commands. Substitute for -element as needed.

The original -element prefix shortcuts, "#" and "%", are redirected to **-num** and **-len**, respectively.

# **Exploration Control**

Exploration commands provide fine control over the order in which XML record contents are examined, by separately presenting each instance of the chosen subregion. This limits what subsequent commands "see" at any one time, and allows related fields in an object to be kept together.

In contrast to the simpler DocumentSummary format, records retrieved as PubmedArticle XML:

```
efetch -db pubmed -id 1413997 -format xml |
```

have authors with separate fields for last name and initials:

```
<Author>
    <LastName>Mortimer</LastName>
    <Initials>RK</Initials>
</Author>
```

Without being given any guidance about context, an -element command on initials and last names:

```
xtract -pattern PubmedArticle -element Initials LastName
```

will explore the current record for each argument in turn, printing all initials followed by all last names:

```
RK CR JS Mortimer Contopoulou King
```

Inserting a **-block** command adds another exploration layer between -pattern and -element, and redirects data exploration to present the authors one at a time:

```
xtract -pattern PubmedArticle -block Author -element Initials LastName
```

Each time through the loop, the -element command only sees the current author's values. This restores the correct association of initials and last names in the output:

```
RK Mortimer CR Contopoulou JS King
```

Grouping the two author subfields with a comma, and adjusting the -sep and -tab values:

```
xtract -pattern PubmedArticle -block Author \
  -sep " " -tab ", " -element Initials, LastName
```

produces a more traditional formatting of author names:

```
RK Mortimer, CR Contopoulou, JS King
```

#### **Nested Exploration**

Exploration command names (**-group**, **-block**, and **-subset**) are assigned to a precedence hierarchy:

```
-pattern > -group > -block > -subset > -element
```

and are combined in ranked order to control object iteration at progressively deeper levels in the XML data structure. Each command argument acts as a "nested for-loop" control variable, retaining information about the context, or state of exploration, at its level.

A nucleotide or protein sequence record can have multiple features. Each feature can have multiple qualifiers. And every qualifier has separate name and value nodes. Exploring this natural data hierarchy, with **-pattern** for the sequence, **-group** for the feature, and **-block** for the qualifier:

```
efetch -db nuccore -id NG_008030.1 -format gbc |
xtract -pattern INSDSeq -element INSDSeq_accession-version \
    -group INSDFeature -deq "\n\t" -element INSDFeature_key \
    -block INSDQualifier -deq "\n\t\t" \
    -element INSDQualifier name INSDQualifier value
```

keeps qualifiers, such as gene and product, associated with their parent features, and keeps qualifier names and values together on the same line:

```
NG 008030.1
    source
                 organism
                                     Homo sapiens
                 mol type
                                     genomic DNA
                 db xref
                                     taxon:9606
     gene
                 gene
                                     COL5A1
     mRNA
                                     COL5A1
                 gene
                                     collagen type V alpha 1 chain, transcript variant 1
                 product
                 transcript id NM 000093.4
     CDS
                 gene
                                     COL5A1
                 product
                                     collagen alpha-1(V) chain isoform 1 preproprotein
                product collagen alpha-I(v) chain isoloim i preproprotein_id NP_000084.3 translation MDVHTRWKARSALRPGAPLLPPLLLLLLWAPPPSRAAQP ...
```

#### Saving Data in Variables

A value can be recorded in a variable and used wherever needed. Variables are created by a hyphen followed by a name consisting of a string of capital letters or digits (e.g., **-KEY**). Variable values are retrieved by placing an ampersand before the variable name (e.g., **"&KEY"**) in an -element statement:

```
efetch -db nuccore -id NG_008030.1 -format gbc |
xtract -pattern INSDSeq -element INSDSeq_accession-version \
    -group INSDFeature -KEY INSDFeature_key \
    -block INSDQualifier -deq "\n\t" \
    -element "&KEY" INSDQualifier name INSDQualifier value
```

This prints the feature key on each line before the qualifier name and value, even though the feature key is now outside of the visibility scope (which is the current qualifier):

```
NG_008030.1

source organism Homo sapiens
source mol_type genomic DNA
source db_xref taxon:9606
gene gene COL5A1
mRNA gene COL5A1
mRNA product collagen type V alpha 1 chain, transcript variant 1
mRNA transcript_id NM_000093.4
...
```

Variables can be (re)initialized with an explicit literal value inside parentheses:

```
-block Author -sep " " -tab "" -element "&COM" Initials,LastName -COM "(, )"
```

A variable can also save the modified data resulting from an -element variant operation. This can allow multiple sequential transitions within a single xtract command:

```
-END -sum "Start, Length" -MID -avg "Start, &END"
```

#### Conditional Execution

Conditional processing commands (**-if**, **-unless**, **-and**, **-or**, and **-else**) restrict object exploration by data content. They check to see if the named field is within the scope, and may be used in conjunction with string, numeric, or object constraints to require an additional match by value. For example:

```
esearch -db pubmed -query "Havran W [AUTH]" |
efetch -format xml |
xtract -pattern PubmedArticle -if Language -equals eng \
   -block Author -if LastName -is-not Havran \
        -sep ", " -tab "\n" -author LastName, Initials[1:1] |
sort-uniq-count-rank
```

selects papers written in English and prints a table of the most frequent collaborators, using a range to keep only the first initial so that variants like "Berg, CM" and "Berg, C" are combined:

```
35 Witherden, D
15 Boismenu, R
12 Jameson, J
10 Allison, J
10 Fitch, F
```

Numeric constraints can also compare the integer values of two fields. This can be used to find genes that are encoded on the minus strand of a nucleotide sequence:

```
-if ChrStart -gt ChrStop
```

Object constraints will compare the string values of two named fields, and can look for internal inconsistencies between fields whose contents should (in most cases) be identical:

```
-if Chromosome -differs-from ChrLoc
```

Multiple conditions are specified with **-and** and **-or** commands:

```
-if Class -contains Protein -and Type -starts-with Missense
```

## **Multi-Step Transformations**

Although xtract provides -element derivatives to do simple data manipulation, more complex tasks may be broken up into a series of simpler transformations, also known as "processing chains".

BioSample document summaries:

```
efetch -db biosample -id SAMN38051082 -format docsum |
```

store preferred qualifier names in a "harmonized\_name" XML attribute:

```
<Attribute harmonized_name="strain">BALB/c</Attribute>
<Attribute harmonized_name="isolate">Mtb infected Spleen MZB-2</Attribute>
<Attribute harmonized_name="geo_loc_name">Singapore</Attribute>
...
```

Piping the data to the first xtract command, and using the "@" sign to select the attribute:

```
xtract -rec BioSampleInfo -pattern DocumentSummary \
   -wrp Accession -element Accession \
   -wrp Title -element DocumentSummary/Title \
   -wrp Link -sep "|" -numeric Links/Link \
   -group Attribute -if @harmonized_name \
   -TAG -lower @harmonized name -wrp "&TAG" -element Attribute |
```

generates an intermediate form, with XML tag names taken from the original XML attributes:

```
<BioSampleInfo>
   <Accession>SAMN38051082</Accession>
   <Title>20180306 Mtb infected Spleen MZB-2</Title>
   <Link>1034093</Link>
   <strain>BALB/c</strain>
   <isolate>Mtb infected Spleen MZB-2</isolate>
   <geo_loc_name>Singapore</geo_loc_name>
   ...
```

Desired fields can then be selected by name in the last line of the second xtract command:

```
xtract -pattern BioSampleInfo -def "-" -first Accession Title Link \
geo_loc_name strain isolate
```

# **Biological Data in Entrez**

EDirect provides additional functions, scripts, and exploration constructs to simplify the extraction of complex data obtained from the interconnected Entrez biological databases.

#### Sequence Qualifiers

The NCBI data model for sequence records (see PMID 11449725) is based on the central dogma of molecular biology. Features contain information about the biology of a given region, including the transformations involved in gene expression. Each feature can have multiple qualifiers, which store specific details about that feature (e.g., name of the gene, genetic code used for protein translation, accession of the product sequence, cross-references to external databases).

As a convenience for exploring sequence records, the **-insd** helper function generates the appropriate nested extraction commands from feature and qualifier names on the command line. (Two computed qualifiers, **sub\_sequence** and **feat\_location**, are also supported.) A search on cone snail venom:

```
esearch -db protein -query "conotoxin" -feature mat_peptide |
efetch -format gpc |
xtract -insd complete mat_peptide "%peptide" product mol_wt peptide |
grep -i conotoxin | sort-table -u -k 2,2n
```

prints the accession number, mature peptide length, product name, calculated molecular weight, and amino acid sequence for a sample of neurotoxic peptides:

```
ADB43131.1
                   15
                           conotoxin Cal 1b
                                                                    LCCKRHHGCHPCGRT
                  16 conotoxin Cal 5.1
ADB43128.1
                                                        1829 DPAPCCOHPIETCCRR
AIC77105.1 17 conotoxin Lt1.4

ADB43129.1 18 conotoxin Cal 5.2

ADD97803.1 20 conotoxin Cal 1.2

AIC77085.1 21 conotoxin Bt14.8

ADB43125.1 22 conotoxin Cal 14.2
                                                        1705 GCCSHPACDVNNPDICG
                                                         2008
                                                                    MIQRSQCCAVKKNCCHVG
                                                         2206
                                                                    AGCCPTIMYKTGACRTNRCR
                                                         2574
                                                                    NECDNCMRSFCSMIYEKCRLK
                           conotoxin Cal 14.2
                                                         2157
                                                                    GCPADCPNTCDSSNKCSPGFPG
```

## Genes in a Region

Records for protein-coding genes on the human X chromosome are retrieved by running:

```
esearch -db gene -query "Homo sapiens [ORGN] AND X [CHR]" |
efilter -status alive -type coding | efetch -format docsum |
```

Gene names and chromosomal positions are extracted by piping the records to:

```
xtract -pattern DocumentSummary -NAME Name -DESC Description \
  -block GenomicInfoType -if ChrLoc -equals X \
  -min ChrStart,ChrStop -element "&NAME" "&DESC" |
```

with the -if statement eliminating coordinates from pseudoautosomal gene copies present on the Y chromosome telomeres. Results can now be sorted by position, and then filtered and partitioned:

```
sort-table -k 1,1n | cut -f 2- |
grep -v pseudogene | grep -v uncharacterized | grep -v hypothetical |
between-two-genes AMER1 FAAH2
```

to produce an ordered table of known genes located between two markers flanking the centromere:

```
FAAH2 fatty acid amide hydrolase 2
SPIN2A spindlin family member 2A
ZXDB zinc finger X-linked duplicated B
NLRP2B NLR family pyrin domain containing 2B
ZXDA zinc finger X-linked duplicated A
SPIN4 spindlin family member 4
ARHGEF9 Cdc42 guanine nucleotide exchange factor 9
AMER1 APC membrane recruitment protein 1
```

## Taxonomic Lineage

When xtract explores a recursively-defined data structure, such as Taxon and Gene-commentary, entry to an internal object is normally blocked when its name matches the current exploration container. Recursive data can be fully explored with a **double star / child** construct:

```
efetch -db taxonomy -id 9606 -format xml |
xtract -pattern Taxon -first TaxId -tab "\n" -element ScientificName \
   -block "**/Taxon" -if Rank -is-not "no rank" -and Rank -is-not clade \
   -tab "\n" -element Rank, ScientificName
```

which removes the search constraint and visits every child object, regardless of nesting depth, to print all of the individual internal lineage nodes:

```
9606 Homo sapiens superkingdom Eukaryota kingdom Metazoa phylum Chordata subphylum Craniata
```

#### SNP-Modified Product Pairs

Single nucleotide polymorphisms in human can represent different substitutions at the same position, but variation records do not explicitly match a modified CDS to its modified protein product:

```
efetch -db snp -id 11549407 -format docsum |
snp2hgvs | hgvs2spdi | spdi2tbl | tbl2prod
```

The hgvs2spdi script converts HGVS data ("NM\_000518.5:c.118C>T;...;NP\_000509.1:p.Gln40Lys") into the 0-based, sequence-relative convention of SPDI format. The tbl2prod script translates coding sequences (after nucleotide modification), and sorts them with protein sequences (after residue replacement), to produce adjacent matching CDS/protein pairs:

```
NM 000518.5:167:C:T
                                       MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWT*R ...
rs11549407
              NP 000509.1:39:Q:*
rs11549407
                                       MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWT*R ...
rs11549407
rs11549407
rs11549407
rs11549407
rs11549407
              NM 000518.5:167:C:G
                                       MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWTER ...
              NP 000509.1:39:Q:E
                                       MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWTER ...
              NM 000518.5:167:C:A
                                     MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWTKR ...
              NP 000509.1:39:Q:K
                                    MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWTKR ...
              NM 000518.5:167:C:+
                                      MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWTQR ...
rs11549407
              NP 000509.1:39:Q:+
                                       MVHLTPEEKSAVTALWGKVNVDEVGGEALGRLLVVYPWTQR ...
```

The "+" sign indicates the unmodified "wild-type" nucleotide or amino acid.

# **Sequence Analysis**

EDirect sequence processing functions are provided by the transmute program. No special coding techniques or custom data structures are required. For example, the nucleotide sequence in a GenBank record can be reverse-complemented and saved in FASTA format with:

```
cat U00096.gbf | gbf2fsa | transmute -revcomp | transmute -fasta -width 50
```

## **Pattern Searching**

The pBR322 cloning vector is a circular plasmid with unique restriction sites in two antibiotic resistance genes. The transmute **-search** function takes a list of sequence patterns with optional labels (such as restriction enzyme names), and uses a finite-state algorithm to simultaneously search for all patterns:

```
efetch -db nuccore -id J01749 -format fasta | transmute -search -circular GGATCC:BamHI GAATTC:EcoRI CTGCAG:PstI
```

The starting positions and labels for each match are printed in a two-column table:

```
374 BamHI
3606 PstI
4358 EcoRI
```

#### **Feature Locations**

A table of coding region locations and gene names can be saved directly as XML with xtract **-insdx**:

```
efetch -db nuccore -id NC_000011 -format gb -style master |
xtract -insdx CDS gene feat location > cds loc.xml
```

The human β-globin coding region location is retrieved and stored in a Unix shell variable with:

```
loc=$(
   xtract -input cds_loc.xml -pattern Rec \
    -if gene -equals HBB -element feat_location
)
```

Location intervals are shown in biological order, where start is greater than stop on the minus strand:

```
5227021..5226930,5226799..5226577,5225726..5225598
```

## **Sequence Transformations**

The repercussions of a genomic SNP can be followed with transmute functions: **-replace** applies the substitution, **-extract** uses the location to isolate the altered coding sequence, and **-cds2prot** translates the modified CDS into protein with the designated genetic code:

```
efetch -db nuccore -id NC_000011 -format fasta |
transmute -replace -offset 5226773 -delete G -insert A |
transmute -extract -1-based "$loc" |
transmute -cds2prot -gcode 1 -every -trim
```

# **External Data Integration**

The nquire program uses command-line arguments to obtain data from external RESTful, CGI, or FTP servers. Results in various formats can be converted to XML by the transmute program.

## **JSON Arrays**

Human β-globin information from a Scripps Research data integration project (see PMID 23175613):

```
nquire -get http://mygene.info/v3 gene 3043 |
```

contains a multi-dimensional JavaScript Object Notation array of exon coordinates:

```
"position": [
    [ 5225463, 5225726 ],
    [ 5226576, 5226799 ],
    [ 5226929, 5227071 ]
],
"strand": -1,
```

This can be converted to XML with transmute **-j2x** (or the **json2xml** shortcut script):

```
transmute -j2x |
```

with the default "-nest element" argument assigning distinct tag names to each level:

```
<position>
  <position_E>5225463</position_E>
  <position_E>5225726</position_E>
  </position>
```

## JSON Mixtures

A query for the human green-sensitive opsin gene:

```
nquire -get http://mygene.info/v3/gene/2652 |
transmute -j2x |
```

returns data containing a heterogeneous mixture of objects in the pathway section:

The **parent / star** construct is used to visit the individual components of a parent object without needing to explicitly specify their names. For printing, the name of a child object is indicated by a question mark:

```
xtract -pattern opt -group "pathway/*" \
-pfc "\n" -element "?,name,id"
```

This displays a table of pathway database references:

```
reactome Signal Transduction R-HSA-162582 reactome Disease R-HSA-1643685 ...
reactome Diseases of the neuronal system R-HSA-9675143 wikipathways GPCRs, Class A Rhodopsin-like WP455
```

#### Tables to XML

Tab-delimited files are easily converted to XML with transmute **-t2x** (or **tbl2xml**):

```
nquire -ftp ftp.ncbi.nlm.nih.gov gene/DATA gene_info.gz |
gunzip -c | grep -v NEWENTRY | cut -f 2,3 |
transmute -t2x -set Set -rec Rec -skip 1 Code Name
```

This takes a series of command-line arguments with tag names for wrapping the individual columns, and skips the first line of input, which contains header information, to generate a new XML file:

Similarly, transmute **-c2x** (or **csv2xml**) will convert comma-separated values (CSV) files to XML.

#### GenBank Download

The most recent GenBank virus release file can also be downloaded from NCBI servers:

```
nquire -lst ftp.ncbi.nlm.nih.gov genbank |
grep "^gbvrl" | grep ".seq.gz" | sort -V |
tail -n 1 | skip-if-file-exists |
nquire -asp ftp.ncbi.nlm.nih.gov genbank
```

If Aspera Connect is not installed on your computer, nquire **-asp** will default to **-dwn** and use FTP transfer. GenBank flatfile records can be selected by organism name or taxon identifier, or by presence or absence of an arbitrary text string, with transmute **-gbf** (or **filter-genbank**). The subset is converted to INSDSeq XML with transmute **-g2x** (or **gbf2xml**):

```
gunzip -c *.seq.gz | filter-genbank -taxid 11292 | gbf2xml |
```

The XML can then be piped to xtract -insd to obtain feature location intervals and underlying sequences of individual coding regions:

```
xtract -insd CDS gene product feat location sub sequence
```

#### **Local PubMed Archive**

Fetching data from Entrez works well when a few thousand records are needed, but it does not scale for much larger sets of data, where the time it takes to download becomes a limiting factor.

#### **Local Record Cache**

EDirect can now preload over 38 million live PubMed records onto an inexpensive external 500 GB solid-state drive as individual files for rapid retrieval. For example, PMID 2539356 would be stored at:

```
/pubmed/Archive/02/53/93/2539356.xml.gz
```

using a hierarchy of folders to organize the data for random access to any record.

The local archive is a completely self-contained turnkey system, with no need for the user to download, configure, and maintain complicated third-party database software.

Set an environment variable in your configuration file(s) to reference a section of your external drive:

```
export EDIRECT LOCAL ARCHIVE=/Volumes/external drive name/
```

Then run **archive-pubmed** to download the PubMed release files and distribute each record on the drive. This process will take several hours to complete, but subsequent updates are incremental, and should finish in minutes.

Retrieving over 125,000 compressed PubMed records from the local archive:

```
esearch -db pubmed -query "PNAS [JOUR]" -pub abstract |
efetch -format uid | stream-pubmed | gunzip -c |
```

takes about 20 seconds. Retrieving those records from NCBI's network service, with efetch -format xml, would take around 40 minutes.

Even modest sets of PubMed query results can benefit from using the local cache. A reverse citation lookup on 191 papers:

```
esearch -db pubmed -query "Cozzarelli NR [AUTH]" | elink -cited |
```

requires 13 seconds to match 9620 subsequent articles. Retrieving them from the local archive:

```
efetch -format uid | xfetch -db pubmed |
```

takes just over one second. Printing the names of all authors in those records:

```
xtract -pattern PubmedArticle -block Author \
  -sep " " -tab "\n" -author LastName, Initials[1:1] |
```

allows creation of a frequency table that lists the authors who most often cited the original papers:

```
sort-uniq-count-rank
```

Fetching from the network service would extend the 14 second running time to over 2 minutes.

#### **Local Search Index**

A similar strategy is used to create a local information retrieval system suitable for large data mining queries. Run **archive-pubmed -index** to populate retrieval index files from records stored in the local archive. The initial indexing will also take a few hours. Since PubMed updates are released once per day, it may be convenient to schedule reindexing to start in the late evening and run during the night.

For PubMed titles and primary abstracts, the indexing process deletes hyphens after specific prefixes, removes accents and diacritical marks, splits words at punctuation characters, corrects encoding artifacts, and spells out Greek letters for easier searching on scientific terms. It then prepares inverted indices with term positions, and uses them to build distributed term lists and postings files.

For example, the term list that includes "cancer" in the title or abstract would be located at:

```
/pubmed/Postings/TIAB/c/a/n/c/canc.TIAB.trm
```

A query on cancer thus only needs to load a very small subset of the total index. The software supports expression evaluation, wildcard truncation, phrase queries, and proximity searches.

The **xinfo**, **xsearch**, **xlink**, **xfilter**, and **xfetch** scripts provide access to the local search system.

Names of indexed fields, all terms for a given field, and terms plus record counts, are shown by:

```
xinfo -fields
xinfo -terms TITL
xinfo -totals PROP
```

Terms are truncated with trailing asterisks, and can be expanded to show individual postings counts:

```
xinfo -count "catabolite repress*"
xinfo -counts "catabolite repress*"
```

Query evaluation includes Boolean operations and parenthetical expressions:

```
xsearch -query "(literacy AND numeracy) NOT (adolescent OR child)"
```

Adjacent words in the query are treated as a contiguous phrase:

```
xsearch -query "selective serotonin reuptake inhibitor"
```

Each plus sign will replace a single word inside a phrase, and runs of tildes indicate the maximum distance between sequential phrases:

```
xsearch -query "vitamin c + + common cold"
xsearch -query "vitamin c ~ ~ common cold"
```

An exact substring match, without special processing of Boolean operators or indexed field names, can be obtained with -title (on the article title) or -exact (on the title or abstract), while ranked partial term matching in any field is available with -match:

```
xsearch -title "Genetic Control of Biochemical Reactions in Neurospora."
xsearch -match "tn3 transposition immunity [PAIR]" | just-top-hits 1
```

MeSH identifier code, MeSH hierarchy key, and year of publication are also indexed, and MESH field queries are supported by internally mapping to the appropriate CODE or TREE entries:

```
xsearch -query "C14.907.617.812* [TREE] AND 2015:2019 [YEAR]"
xsearch -query "Raynaud Disease [MESH]"
```

The xfilter -query command allows PMIDs to be generated by an EDirect search and then incorporated as a component in a local query.

#### **Data Analysis and Visualization**

All query commands return a structured message containing the database name and a list of UIDs, which can be piped directly to xfetch to retrieve the uncompressed records. For example:

```
xsearch -query "selective serotonin ~ ~ ~ reuptake inhibit*" |
xfetch |
xtract -pattern PubmedArticle -num AuthorList/Author |
sort-uniq-count -n | reorder-columns 2 1 |
head -n 25 | align-columns -q 4 -a 1r
```

performs a proximity search with dynamic wildcard expansion (matching phrases like "selective serotonin and norepinephrine reuptake inhibitors") and fetches 14,978 PubMed records from the local archive. It then counts the number of authors for each paper (a consortium is treated as a single author), printing a frequency table of the number of papers per number of authors.

The cumulative size of PubMed can be calculated with a running sum of the annual record counts. Exponential growth over time will appear as a roughly linear curve on a semi-logarithmic graph:

```
xinfo -totals YEAR |
print-columns '$2, $1, total += $1' |
print-columns '$1, log($2)/log(10), log($3)/log(10)' |
filter-columns '$1 >= 1800 && $1 < YR' |
xy-plot annual-and-cumulative.png</pre>
```

## **Natural Language Processing**

NLM's Biomedical Text Mining Group performs computational analysis to extract chemical, disease, and gene references from article contents (see PMID 31114887). NLM indexing of PubMed records assigns Gene Reference into Function (GeneRIF) mappings (see PMID 14728215).

Running **archive-nlmnlp -index** periodically (monthly) will automatically refresh any out-of-date support files and then index the connections in CHEM, DISZ, GENE, GRIF, GSYN, and PREF fields:

```
xinfo -terms DISZ | grep -i Raynaud
xinfo -counts "Raynaud* [DISZ]"
xsearch -query "Raynaud Disease [DISZ]"
```

#### **Following Citation Links**

Running **archive-nihocc -index** will download the latest NIH Open Citation Collection monthly release and build CITED and CITES indices, the local equivalent of elink -cited and -cites commands.

Citation links are retrieved by piping one or more PMIDs to xlink -target:

```
xsearch -db pubmed -query "Havran W* [AUTH]" |
xlink -target CITED |
```

This returns PMIDs for 6504 articles that cite the original 96 papers. The records are then fetched, and the xtract **-histogram** shortcut builds a journal frequency table from the subsequent articles:

```
xfetch |
xtract -pattern PubmedArticle -histogram Journal/ISOAbbreviation |
sort-table -nr | head -n 10
```

## **User-Specified Term Index**

Running **custom-index** with a PubMed indexer script and the names of the fields it populates:

```
custom-index $( which idx-grant ) GRNT
```

integrates user-specified indices into the local search system. The **idx-grant** script:

```
xtract -set IdxDocumentSet -rec IdxDocument -pattern PubmedArticle \
  -wrp IdxUid -element MedlineCitation/PMID -clr -rst -tab "" \
  -group PubmedArticle -pkg IdxSearchFields \
  -block PubmedArticle -wrp GRNT -element Grant/GrantID
```

has reusable boilerplate in its first three lines, and indexes PubMed records by Grant Identifier:

Note that "MedlineCitation/PMID" uses the **parent / child** construct to prevent the display of additional PMID items that might be present later in CommentsCorrections objects.

# **Scripting**

A shell script can be used to repeat the same sequence of operations on a number of input values. The Unix shell is a command interpreter that supports user-defined variables, conditional statements, and repetitive execution loops. Scripts are usually saved in a file, and referenced by file name.

Given a tab-delimited file of feature keys and values, where each gene is followed by its coding regions:

```
gene matK
CDS maturase K
gene ATP2B1
CDS ATPase 1 isoform 2
CDS ATPase 1 isoform 7
```

the **cat** command can pipe the file contents to a shell script that reads the data one line at a time.

Dissecting the script, the first line selects the Bash shell on the user's machine:

```
#!/bin/bash
```

The latest gene name is stored in the "gene" variable, which is first initialized to an empty string:

```
gene=""
```

The **while** command sequentially reads each line of the input file, **IFS** indicates tab-delimited fields, and **read** saves the first field in the "feature" variable and the remaining text in the "product" variable:

```
while IFS=$'\t' read feature product
do
```

The statements between the **do** and **done** commands are executed once for each input line. The **if** statement retrieves the current value stored in the feature variable (indicated by placing a dollar sign (\$) in front of the variable name) and compares it to the word "gene":

```
if [ "$feature" = "gene" ]
```

If the feature key was "gene", it runs the **then** section, which copies the contents of the current line's "product" value into the persistent "gene" variable:

```
then
gene="$product"
```

Otherwise the **else** section prints the saved gene name and the current coding region product name:

```
else
  echo "$gene\t$product"
```

separated by a tab character. The conditional block is terminated with a **fi** instruction ("if" in reverse):

```
fi
done
```

The resulting output lines, printed by the **echo** command, have the gene name and subsequent CDS product names in separate columns on individual rows:

```
matK maturase K
ATP2B1 ATPase 1 isoform 2
ATP2B1 ATPase 1 isoform 7
```

In addition to else, the **elif** command can allow a series of mutually-exclusive conditional tests.

A variable can be set to the result of commands that are enclosed between "\$(" and ")" symbols.

# **Python Integration**

Controlling EDirect from Python scripts is easily done with assistance from the **edirect.py** library file, which is included in the EDirect archive.

At the beginning of your program, import the edirect module with the following commands:

```
#!/usr/bin/env python3
import sys
import os
import shutil
sys.path.insert(1, os.path.dirname(shutil.which('xtract')))
import edirect
```

The first argument to **edirect.execute** is the Unix command you wish to run. It can be a string:

```
("efetch -db nuccore -id NM 000518.5 -format fasta")
```

or a sequence of strings, which allows a variable's value to be substituted for a specific parameter:

```
accession = "NM_000518.5"
(('efetch', '-db', 'nuccore', '-id', accession, '-format', 'fasta'))
```

An optional second argument accepts data to be passed to the Unix command through stdin. Multiple steps are chained together by using the result of the previous command as the data argument in the next command:

```
seq = edirect.execute("efetch -db nuccore -id NM_000518.5 -format fasta")
sub = edirect.execute("transmute -extract -1-based -loc 51..494", seq)
prt = edirect.execute(('transmute', '-cds2prot', '-every', '-trim'), sub)
```

Data piped to the script itself is relayed by using "sys.stdin.read()" as the second argument.

Alternatively, the **edirect.pipeline** function can execute a string containing several piped commands:

or can accept a sequence of individual command strings to be piped together for execution:

An **edirect.efetch** shortcut that uses named arguments is also available:

```
edirect.efetch(db="nuccore", id="NM 000518.5", format="fasta")
```

To run a custom shell script, make sure the execute permission bit is set, supply the full execution path, and follow it with any command-line arguments:

```
db = "pubmed"
res = edirect.execute(("./datefields.sh", db), "")
```

# **Programming**

A program written in a compiled language is translated into a computer's native machine instruction code, and will run much faster than an interpreted script. Piping FASTA data to the basecount binary executable (compiled from the basecount.go source code file, below):

```
efetch -db nuccore -id J01749, U54469 -format fasta | basecount
```

will return rows containing an accession number followed by counts for each base:

```
J01749.1 A 983 C 1210 G 1134 T 1034
U54469.1 A 849 C 699 G 585 T 748
```

Programs in Google's Go language ("golang") start with **package main** and then **import** additional software libraries (many included with Go, others residing in commercial repositories like github.com):

```
package main
import (
     "eutils"
     "fmt"
     "os"
     "sort"
)
```

Each compiled Go binary has a single **main** function, which is where program execution begins:

```
func main() {
```

The fsta **variable** is assigned to a data **channel** that streams individual FASTA records one at a time:

```
fsta := eutils.FASTAConverter(os.Stdin, false)
```

The countLetters **subroutine** will be called with the identifier and sequence of each FASTA record:

```
countLetters := func(id, seq string) {
```

An empty counts **map** is created for each sequence, and its memory is freed when the subroutine exits:

```
counts := make(map[rune]int)
```

A **for** loop on the **range** of the sequence string visits each sequence letter. The map keeps a running count for each base or residue, with "++" incrementing the current value of the letter's map entry:

```
for _, base := range seq {
   counts[base]++
}
```

Maps are not returned in a defined order, so map keys are loaded to a keys **array**, which is then sorted:

```
var keys []rune
for ky := range counts {
    keys = append(keys, ky)
}
sort.Slice(keys, func(i, j int) bool { return keys[i] < keys[j] })</pre>
```

(The second argument passed to sort.Slice is an **anonymous** function literal used to control the sort order. It is also a **closure**, implicitly inheriting the keys array from the enclosing function.)

The sequence identifier is printed in the first column:

```
fmt.Fprintf(os.Stdout, "%s", id)
```

Iterating over the array prints letters and base counts in alphabetical order, with tabs between columns:

```
for _, base := range keys {
    num := counts[base]
    fmt.Fprintf(os.Stdout, "\t%c %d", base, num)
}
```

A newline is printed at the end of the row, and then the subroutine exits, clearing the map and array:

```
fmt.Fprintf(os.Stdout, "\n")
}
```

The remainder of the main function uses a loop to **drain** the fsta channel, passing the identifier and sequence string of each successive FASTA record to the countLetters function. The main function then ends with a final closing brace:

```
for fsa := range fsta {
     countLetters(fsa.SeqID, fsa.Sequence)
}
```

Save the following script to a file named **build.sh**, in the same directory as the **basecount.go** file. Adjust optional GOOS and GOARCH environment variables to cross-compile for a different platform:

```
#!/bin/bash

if [ ! -f "go.mod" ]
then
    go mod init "$( basename $PWD )"
    echo "replace eutils => $HOME/edirect/eutils" >> go.mod
    go get eutils

fi
    if [ ! -f "go.sum" ]
then
        go mod tidy
fi

for fl in *.go
do
    env GOOS=darwin GOARCH=arm64 go build -o "${fl%.go}" "$fl"
done
```

The build script creates module files used to track dependencies and retrieve imported packages. It also computes the path for finding the local **eutils** helper library included with EDirect. Set the Unix execution permission bit for the build script and compile the program(s) by running:

```
chmod +x build.sh
./build.sh
```

#### Installation

EDirect consists of a set of scripts and programs that are downloaded to the user's computer. To install the software, open a terminal window and execute one of the following two commands:

```
sh -c "$(curl -fsSL https://ftp.ncbi.nlm.nih.gov/entrez/entrezdirect/install-edirect.sh)"
sh -c "$(wget -q https://ftp.ncbi.nlm.nih.gov/entrez/entrezdirect/install-edirect.sh -O -)"
```

One installation is complete, run the following to set the PATH for the current terminal session:

```
export PATH=${HOME}/edirect:${PATH}
```

# **Solid-State Drive Preparation**

To initialize a solid-state drive for hosting the local archive on a Mac, log into an admin account, run Disk Utility, choose View -> Show All Devices, select the top-level external drive, and press the Erase icon. Set the Scheme popup to GUID Partition Map, and APFS will appear as a format choice. Set the Format popup to APFS, enter the desired name for the volume, and click the Erase button.

To finish the drive configuration, disable Spotlight indexing on the drive with:

```
sudo mdutil -i off "${EDIRECT_LOCAL_ARCHIVE}"
sudo mdutil -E "${EDIRECT_LOCAL_ARCHIVE}"

and turn off FSEvents logging with:

sudo touch "${EDIRECT_LOCAL_ARCHIVE}/.fseventsd/no_log"
```

Also exclude the drive from being backed up by Time Machine or scanned by a virus checker.

## **Documentation**

Documentation for EDirect is on the web at:

```
http://www.ncbi.nlm.nih.gov/books/NBK179288
```

Information on how to obtain an API Key is described in this NCBI blogpost:

```
https://ncbiinsights.ncbi.nlm.nih.gov/2017/11/02/new-api-keys-for-the-e-utilities
```

Introductions to shell scripting for non-programmers, and to the Go programming language, are at:

```
https://missing.csail.mit.edu/2020/shell-tools/
https://cacm.acm.org/research/the-go-programming-language-and-environment/
```

Instructions for downloading and installing the Go compiler are at:

```
https://golang.org/doc/install#download
```

Questions or comments on EDirect may be sent to info@ncbi.nlm.nih.gov.

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