

# **FAST: FAST Analysis of Sequences Toolbox**

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#### ABSTRACT

FAST (FAST Analysis of Sequences Toolbox), built on BioPerl, provides simple, powerful open 3 source command-line tools to filter, transform, annotate and analyze biological sequence data. Modeled after the GNU (GNU's Not UNIX) Textutils such as grep, cut, and tr, FAST tools such 5 as fasgrep, fascut, and fastr are designed for rapid prototyping of expressive bioinformatic 7 workflows in a compact and generic command vocabulary. FAST is intended to bring the analytic power of Perl and BioPerl to non-programmers and extend the UNIX tools paradigm to popular bioinformatics data formats. Compact combinatorial encoding of data workflows with FAST can 10 facilitate better documentation and reproducibility of bioinformatic protocols, supporting better transparency in big biological data science. Interface self-consistency and conformity with conventions of GNU, Matlab, Perl, BioPerl, R and GenBank, help make FAST easy to learn. FAST automates numerical, text-based, sequence-based and taxonomic searching, sorting, selection and transformation of sequence records and alignment sites based on indices, ranges, tags and feature annotations, analytics for composition and codon usage. Automated content- and 15 feature-based extraction of sites and support for molecular population genetic statistics makes 16 FAST useful for molecular evolutionary analysis. FAST is portable, easy to install, and secure, 17 with stable releases posted to CPAN and development on Github. The default data exchange 18 format in FAST is Multi-FastA (specifically, a restriction of BioPerl FastA format). Sanger and Illumina 1.8+ FASTQ formatted files are also supported. The command-line basis of FAST makes it easier for non-programmer biologists to interactively investigate and control biological data at the speed of thought.

3 Keywords: Unix philosophy, MultiFASTA, pipeline, bioinformatic workflow, open source, BioPerl, regular expression, NCBI Taxonomy

#### 1 INTRODUCTION

Bioinformatic software for non-programmers is traditionally implemented for user convenience in monolithic applications with Graphical User Interfaces (GUIs) (**Smith et al.**, 1994; **Rampp et al.**, 2006;

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**Librado and Rozas**, 2009; **Gouy et al.**, 2010). However, today, the monolithic application paradigm can be easily outscaled by big biological data, particularly Next Generation Sequencing (NGS) data at gigabyte and terabyte-scale. Better empowerment of non-programmers for genome-scale analytics has been achieved through web-based genome browser interfaces (**Cunningham et al.**, 2015; **Rosenbloom et al.**, 2015; **Markowitz et al.**, 2014). On the other hand, for smaller datasets, sequence and alignment editor applications encourage manual manipulation of data, which is error-prone and essentially irreproducible. To reduce error and increase reproducibility in the publishing of bioinformatic and biostatistical protocols it is important to facilitate the documentation and automation of data science workflows through scripts and literate programming facilities (**Knuth**, 1984) that both completely document and encode scientific workflows for machine processing of biological data.

Reproducibility in bioinformatics and biostatistics protocols is crucial to maintaining public trust in the value of its investments in high-dimensional analysis of complex biological systems (**Baggerly and Coombes**, 2009; **Hutson**, 2010; **Baggerly and Coombes**, 2011; **Huang and Gottardo**, 2013). In one analysis, only two of 18 published microarray gene-expression analyses were completely reproducible, in part because key analysis steps were made with proprietary closed-source software (**Ioannidis et al.**, 2008). Furthermore, even though analytical errors are a major source of retractions in the scientific literature (**Casadevall et al.**, 2014), peer-review and publication of scientific data processing protocols is generally not yet required to publish scientific studies. Adequate documentation of bioinformatic and biostatistical workflows and open source sharing of code upon publication (**Peng**, 2009) facilitates crowd-sourced verification, correction and extension of code-based analyses (**Barnes**, 2010; **Morin et al.**, 2012), and reuse of software and data to enable more scientific discovery returns from public data (**Peng**, 2011). Review and publication of open data science protocols may also help reduce temptations to overinterpret data and encourage more objectivity in data science (**Boulesteix**, 2010), although perhaps it is expanded computational and statistical literacy and training for all scientists that is the ultimate remedy for these problems (**Morin et al.**, 2012; **Joppa et al.**, 2013).

Web-based open-source workflow suites such as Galaxy (**Blankenberg and Hillman-Jackson**, 2014), Taverna (**Oinn et al.**, 2006) and BioExtract (**Lushbough et al.**, 2011) are a recent innovation in the direction of greater reproducibility in bioinformatics protocols for genome-scale analytics. However, the most powerful, transparent and customizable medium for reproducible bioinformatics work is only available to specialists through programming Application Programming Interfaces (APIs) such as BioPerl and Ensembl (**Yates et al.**, 2015). Both workflow design suites and programming APIs require dedication and time to learn.

There is a need for more software falling between GUIs and APIs, that provides non-programmers greater bioinformatic power and more direct, real-time access to their biological data for interactive and reproducible exploration, control, and analysis. Closer inspection of data and interactive construction and control of data flows makes it so much easier to rapidly prototype error-free workflows and better avoid errors that can completely confound downstream analyses. The time-tested paradigm in scientific computing for rapid prototyping of reproducible data workflows is the UNIX command-line.

In this tradition we present FAST: FAST Analysis Sequences Toolbox, modeled after the standard Unix toolkit (**Peek**, 2001), now called Coreutils. The FAST tools follow the Unix philosophy to "do one thing and do it well" and "write programs to work together." (**Stutz**, 2000). Command-line utilities for bioinformatics such as the EMBOSS package (**Rice et al.**, 2000), the FASTX tools (**Gordon**, 2009) or the scripts that come with BioPerl (**Stajich et al.**, 2002) typically offer suites of tools with simple, well-defined functions that lend themselves to scripting, but are not necessarily designed according to the UNIX toolbox philosophy specifically to interoperate through serial composition. Similarly, FaBox is a free and open online server with functions that overlap with FAST tools, but is not designed for serial composition. On the other hand, the UNIX toolbox model has been used before in more or less more specialized bioinformatics applications such as the popular SAMTools suite (**Li et al.**, 2009) and in the processing of NMR data (**Delaglio et al.**, 1995).

**Table 1. FAST 1.0 utilities** 

Tool	Function	Textutil analog	Default element processed
fasgrep	regex selection of records	grep	identifiers
fasfilter	numerical selection of records		identifiers
fastax	taxonomic selection of records		descriptions
fashead	order-based selection of records	head	
fastail	order-based selection of records	tail	
fascut	index-based selection and reordering of data	cut	sequences
fasuniq	record reduction by content and order	uniq	sequences
alncut	selection of sites by content		sequences
gbfalncut	selection of sites by features		sequences
fassort	numerical or text sorting of records	sort	identifiers
fastaxsort	taxonomic sorting of records		identifiers
faspaste	merging of records	paste	sequences
fastr	character transformations on records	tr	identifiers
fassub	regex substitutions on records		identifiers
faslen	annotate sequence lengths		descriptions
fascomp	annotate monomeric compositions		descriptions
fascodon	annotate codon usage		descriptions
fasxl	annotate biological translations		descriptions
fasrc	annotate reverse complements		descriptions
fasconvert	convert format of records		-
gbfcut	emit sequences by regex matching on features	grep	features
ālnpi	molecular population genetic statistics	_	
faswc	tally sequences and characters	WC	sequences

The FAST tools are written in Perl using BioPerl packages (**Stajich et al.**, 2002). This makes FAST utilities easy to adopt if you are familiar with the Unix toolbox and allows fast sequence analysis even on large datasets. Extensive documentation has been developed for each FAST utility along with useful error messages following recommended practice (**Seemann**, 2013). FAST is free and open source, available to anyone for re-use, verification and extension. This is in line with the call to make science generally more accessible, open, and reproducible by other scientists and the public (**Groves and Godlee**, 2012).

#### 2 DESIGN

The UNIX textutils paradigm allows users to treat plain-text files as databases in which *records* correspond to single lines containing *fields* separated by *delimiters* such as commas, tabs, or strings of white-space characters. FAST extends this paradigm to biological sequence data, allowing users to treat collections of files of sequence data as databases for complex queries, transformations and analytics. The textutils model is generalized exactly by FAST because it models sequence record *descriptions* as an ordered collection of fields (see below).

Another design feature of UNIX tools that also characterizes the FAST tools is their ability to accept input not only from one or more files but also from what is called *standard input*, a data-stream supported by the UNIX shell, and to output analogously to *standard output*. It is this facility that allows FAST tools to be serially composed in UNIX *pipelines* that compactly represent an infinite variety of expressive bioinformatic workflows. The serial composability of FAST tools is represented in the overview of the project shown in Figure 1. FAST utilities may be categorized as for selection, transformation, and annotation and analysis. Utilities in the selection category select sequences or alignment sites based on various criteria. For example, fasgrep selects sequence records by matching regular expressions against identifiers, descriptions, sequences or specified components of descriptions. A full description of all utilities included in FAST 1.0 is shown in Table 1.

- The default data exchange format for FAST tools is the universally recognized FastA format (**Lipman** and **Pearson**, 1985). While no universal standard exists for this format, for FAST, "FastA format" means what is conventionally called "multi-fasta" format of sequence or alignment data, largely as implementated in BioPerl in the module Bio::SeqIO::fasta (**Stajich et al.**, 2002).
- In the FAST implementation of FastA format, multiple sequence records may appear in a single file or input stream. Sequence data may contain gap characters. The logical elements of a sequence record are its *identifier*, its *description* and its *sequence*. The identifier (indicated with id in the example below) and description (desc) together make the *identifier line* of a sequence record, which must begin with the sequence record start symbol > on a single line. The description begins after the first block of white-space on this line (indicated with <space>). The *sequence* of a record appears immediately after its identifier line and may continue over multiple lines until the next record starts.
- In FAST, users may specify fields in sequence records using delimiters (indicated by <delim>) quite generally using perl-style *regular expressions*. FAST uses one-based indexing of fields as indicated in this example:

```
111 >seq1-id<space>seq1-desc-field1<delim>seq1-desc-field2<delim>...
112 seq1-sequence
113 seq1-sequence
114 ...
115 seq1-sequence
116 >seq2-id<space>seq2-desc-field1<delim>seq2-desc-field2<delim>...
117 seq2-sequence
118 seq2-sequence
119 ...
120 seq2-sequence
```

- In FAST, the sequence identifier is thought as the zero<sup>th</sup> field of the identifier line. One-based indexing of description fields in FAST is therefore consistent with zero-based indexing in Perl and one-based indexing of sequence coordinates, making all indexing consistent and uniform in FAST.
- Most FAST tools extend the field-based paradigm further by supporting *tagged values* in sequence record descriptions. Tagged values are name-value pairs with a format "name=value" as common in General Feature Format (GFF) used in sequence annotation. Support for tagged values makes it possible to operate on sequence records using unordered or heterogeneous annotations in descriptions. Also, many FAST tools have an "annotation" option directing them to augment sequence records with their own output calculations, vastly expanding the types of operations and queries that FAST can represent.

#### 3 IMPLEMENTATION DETAILS AND BENCHMARKING

- 130 Nearly all FAST utilities process sequence records inline and therefore have linear runtime complexity
- 131 in the number of sequences. Exceptions are fassort and fastail which both require some paging
- 132 of data into temporary files. We performed benchmarking of FAST tools using randomly generated se-
- quences and the Benchmark v1.15 perl module on a MacBook Pro 2.5 Ghz Intel i7, with 8 Gb of RAM.
- 134 We examined average CPU runtime over 100 replicates, comparing input sizes of 25K, 250K, or 1M se-
- 135 quence records of length 100, 10K, 100K, or 1M bp. Our benchmarking results show that despite data
- 136 paging, fassort runtimes scale linearly with input size (fig 2).
- The BioPerl backend of FAST 1.0 is version 1.6.901 downloaded in January, 2012. Bio::SegIO com-
- ponents were updated to version 1.6.923 on June 4, 2014 and some Bio::Root components were updated
- on July 10, 2014 (github commit 50f87e9a4d). We introduced a small number of customizations to the

- BioPerl code-base, primarily to enable the translation of sequences containing gaps. All of the BioPerl
- 141 dependencies of FAST are isolated under its own FAST name-space.
- To help reduce the overall installation footprint of FAST, BioPerl dependencies of FAST scripts were
- 143 analyzed with the Cava packager (http://www.cavapackager.com).
- Further implementation details of individual FAST tools follows.

### 3.1 FASGREP

- 145 Mainly for fine-grained regular expression-based searching and selection of sequence records, fasqrep
- also supports motif-based sequence selections and general analysis of sequence patterns as represented by
- 147 Perl regular expressions. The BioPerl Bio::Tools::SeqPattern library supports optional ambigu-
- 148 ity expansion of IUPAC codes for nucleotides and proteins in regular expression arguments. All of the
- search and selection utilities in FAST support optional complementation and case-insensitive searching.

### 3.2 FASFILTER

- 150 fasfilter supports precise numerical-based selections of sequence records from numerical data in
- 151 identifiers, descriptions, fields or tagged-values in descriptions. Both open, closed and compound ranges
- 152 are supported in different syntax.

#### 3.3 FASCUT

- 153 fascut supports index-based selections of characters and fields in sequence records allowing repetition,
- 154 reordering, variable steps, and reversals. A sequence of selection indices and index-ranges are specified
- 155 conventionally by comma-separated lists of integers and integer ranges in Perl-style or Genbank coordi-
- 156 nate style ("from..to") in R/Octave-style ("from:to") or UNIX cut-style ("from-to"). Negative indices
- 157 count backwards from last characters and fields. fascut outputs the concatenation of data selections for
- 158 each sequence record. Variable step-sizes in index ranges conveniently specify first, second or third codon
- 159 positions in codon sequence records, for example.

### 3.4 ALNCUT

- 160 Content-based selection of sites in alignments including gap-free sites, non-allgap sites, variable or
- 161 invariant sites and parsimoniously informative sites, or their set-complements, all with the option of
- 162 state-frequency-thresholds applied per site.

### 3.5 GBFCUT

- 163 Allows annotation-based sequence-extraction from GenBank format sequence files, useful for extracting
- 164 all sequences that correspond to sets of genes or other annotated features in genome data.

### 3.6 FASSORT

- 165 Our implementation of fassort handles numerical and textual sorting of records by their components,
- 166 including reversals. Pages of data are sorted with optimized routines in Perl Sort:: Key that if necessary
- are written to temporary files and merged with Sort::MergeSort.

#### 3.7 FASUNIQ

- 168 With fasuniq the user may remove records that are duplicates with respect to a specified component or
- 169 field. Like their UNIX Coreutil analogs, fasuniq only compares subsequent records on input, usually
- 170 requiring that its input is sorted first by fassort.

#### 3.8 FASTAX AND FASTAXSORT

- 171 Taxonomic searching and sorting of sequence records, when those records are already annotated with
- 172 NCBI taxonomic identifiers, is enabled by the FAST tools fastax and fastaxsort using taxonomic
- 173 data from NCBI taxonomy (Benson et al., 2009; Sayers et al., 2009). Taxonomic selections may be
- 174 logically negated and/or restricted to valid NCBI taxonomic identifiers. A sample of data from tRNAdb-
- 175 CE (Abe et al., 2014), which includes taxonomic names from NCBI Taxonomy, is included with the
- 176 package and referred to in the documentation, showing how these utilties may be used.

### 3.9 FASTR AND FASSUB

- 177 fastr handles all character-based transformations of sequence records including transliterations, dele-
- 178 tions and "squashing" (deletion of consecutive repeats). Includes support to restrict or remap sequence
- 179 data to strict or IUPAC ambiguity alphabets and removal of gap characters from sequencing. fassub
- allows more arbitrary substitutions on sets of strings matched to Perl regexes, analogous to the Perl s / / /
- 181 substitution operator.

### 3.10 FASCOMP, FASXL AND FASCODON

- 182 Annotation and analytics of compositions, translations, and codon usage frequencies of sequence records
- 183 (with start and stop codons counted distinctly, in the last case). All genetic codes included in BioPerl,
- 184 ultimately from NCBI Entrez, are supported.

### 3.11 ALNPI

- 185 alnpi outputs molecular population genetic statistics cited in Table 2 for each alignment on input. It can
- output a set of statistics for each alignment on input in plain text or LATEX format. alnpi also supports
- sliding window and pairwise analysis of input data. This code computed the sliding window analyses
- published in (Ardell et al., 2003). All of the code for these calculations has been reviewed and compared
- against calculations produced from DNASP (Librado and Rozas, 2009) as described previously (Ardell,
- 190 2004).

### 4 INSTALLATION AND USAGE EXAMPLES

### 4.1 INSTALLATION AND DEPENDENCIES

- 191 FAST requires a working Perl installation and is distributed through the Comprehensive Perl Archive
- 192 Network (CPAN). In a manual install, after download, installation follows standard Perl install proce-
- 193 dure: perl Makefile.PL; make; make test; (sudo) make install. A small footprint
- 194 of BioPerl dependencies has been packaged together in the FAST namespace. Other CPAN dependencies
- 195 can be detected and installed by the cpan package manager. A fully automated install may on many
- 196 systems be initiated by executing perl -MCPAN -e 'install FAST'.

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**Table 2.** Molecular Population Genetic Statistics in FAST

Statistic	Symbol	Citation
Number of sequences	n	
Number of alleles/distinct sequences	k	
Number of segregating sites	S	
Fraction of segregating sites	s	
Average number of pairwise differences	Pi	(Nei and Li, 1979)
Nucleotide Diversity	$\pi$	(Nei and Li, 1979)
Watterson estimator	$ heta_W$	(Watterson, 1975)
Expected number of alleles	E(K)	(Ewens, 1972)
Tajima's D	D`´	( <b>Tajima</b> , 1989)
Fu and Li's F	D*	(Fu and Li, 1993)
Fu and Li's F*	F*	(Fu and Li, 1993; Simonsen et al., 1995)
Fu and Li's Eta S	$\eta_S$	(Fu and Li, 1993)
Fu and Li's Eta	$\tilde{\eta}$	(Fu and Li, 1993)

#### 4.2 TEST SUITE AND DOCUMENTATION

FAST includes rudimentary test suites for each utility, and a FAST Cookbook has been contributed to the 197 installation package. 198

#### SELECTING SEQUENCES BY ENCODED MOTIFS

An advantage of the annotation approach in FAST is the ability to select and sort sequences by at-199 tributes computed and annotated into data by utilities upstream in the pipeline. For example, to select protein-coding genes from a file cds. fas whose translations contain the N-glycosylation amino acid 201 motif (Kornfeld and Kornfeld, 1985), one could execute: 202

```
203 fasxl -a cds.fas | fasgrep -t xl0 "N[^P][ST][^P]" | fascut -f 1..-2
```

The first command in the pipeline translates each sequence and appends the translation to the description with the tag "x10" (indicating translation in the zeroth reading frame). The second command in the pipeline 205 does a regex match using the specified motif pattern on the value of a "name:value" pair in the description with tag "xl0", hence processing the annotations produced by fasx1. The regex argument to fasqrep is quoted to protect the argument from interpretation by the shell. The last command in the pipeline removes 208 the last field in the description, restoring records as they were before they were annotated by fasxl. 209

#### 4.4 SORTING RECORDS BY THIRD CODON POSITION COMPOSITION

- 210 Another example illustrates the powerful expression of ranges in fascut. An optional "by" parameter in ranges allows increments or decrements in steps larger than one. To extract third-position bases from 211
- codon sequence records, compute and annotate their compositions into record descriptions, ultimately 212
- 213 sorting records by their third-position adenosine contents, do:

```
fascut 1:-1:3 cds.fas | fascomp | fassort -nt comp_A
```

#### 5 CONCLUDING REMARKS AND FUTURE DIRECTIONS

- Planned additions in future versions of FAST include fasrand and alnrand for automated sampling,
- permutations and bootstrapping of sequences and sites, respectively, and fasqo and fasqosort for 216
- 217 selection and sorting of records by Gene Ontology categories (**The Gene Ontology Consortium**, 2015).

### **AVAILABILITY**

- 218 Stable versions of FAST are released through the Comprehensive Perl Archive Network (CPAN) at
- 219 http://search.cpan.org/~dhard/. Development of FAST is through its GitHub at https:
  220 //github.com/tlawrence3/FAST. For latest news on the FAST project please check the Ardell
- Lab homepage at http://compbio.ucmerced.edu/ardell/software/FAST/.

### DISCLOSURE/CONFLICT-OF-INTEREST STATEMENT

- The authors declare that the research was conducted in the absence of any commercial or financial
- 223 relationships that could be construed as a potential conflict of interest.

### **AUTHOR CONTRIBUTIONS**

- 224 D.H.A. conceived, designed, and wrote much of FAST. T.J.L. contributed major code factorizations and
- reorganization and fastail. K.T.K. contributed code including faspaste, and fashead. R.S.L. 225
- 226 contributed an analysis of code dependencies for the FAST installer. P.J.B. tested installation and running
- on Windows using Strawberry Perl. All authors, especially D.L.C. and C.J.C., contributed documenta-227
- tion, testing, and code fixes. K.C.H.A. and D.H.A. wrote the FAST Cookbook. D.H.A. wrote the paper 228
- with major contributions from D.L.C. and T.J.L. All authors made minor contributions to the manuscript, 229
- 230 reviewed the final version of the manuscript and agree to be accountable for its contents.

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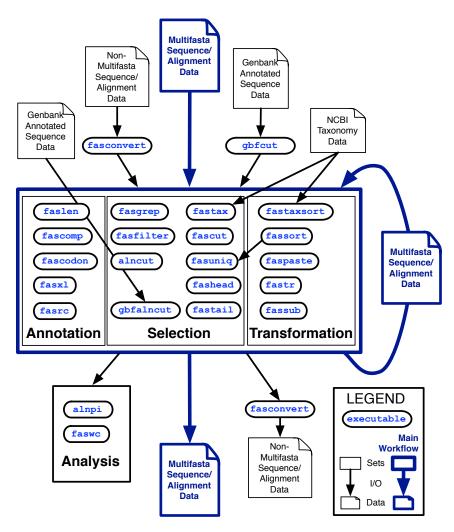
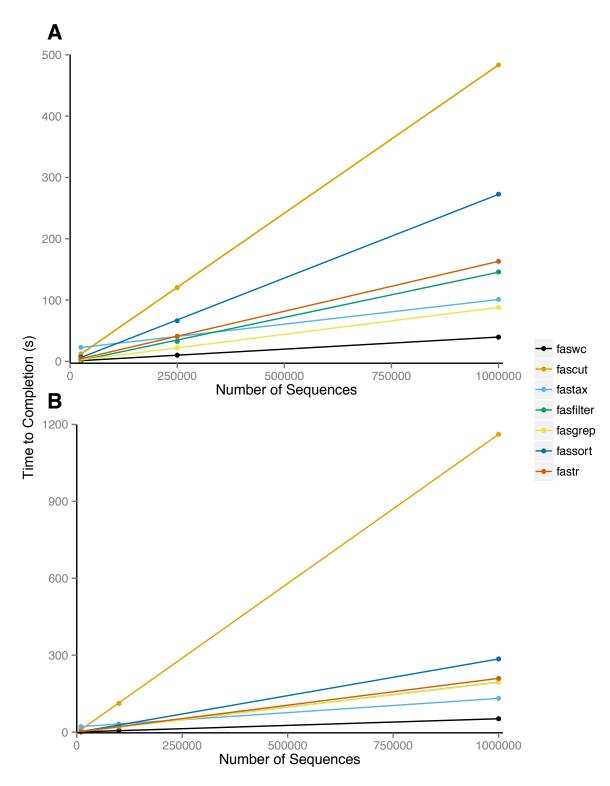


Figure 1. FAST version 1.0 with data and workflow dependencies indicated.

## **FIGURES**



**Figure 2.** Average processor time of 100 repetitions required to complete analysis using indicated utility. Utilities were run on six datasets consisting of (a) 25000, 250000, and 1000000 100bp sequences and (b) 10000, 100000, and 1000000 1000bp sequences.