

FAST: FAST Analysis of Sequences Toolbox

Travis J. Lawrence 1 , Kyle T. Kauffman 2 , Katherine C.H. Amrine 1,3 , Dana L. Carper 1 , Raymond S. Lee 4 , Peter J. Becich 2 , Claudia J. Canales 4 and David H. Ardell 1,2*

Correspondence*:

David H. Ardell

Molecular Cell Biology Unit, School of Natural Sciences, University of California, Merced, 5200 North Lake Road, Merced, CA, 95343, USA, dardell@ucmerced.edu

ABSTRACT

FAST (FAST Analysis of Sequences Toolbox) provides simple, powerful open source 3 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 make it easy to rapidly prototype expressive bioinformatic workflows in a compact and generic command vocabulary. Compact combinatorial encoding 7 of data workflows with FAST commands can simplify the documentation and reproducibility of bioinformatic protocols, supporting better transparency in biological data science. Interface selfconsistency and conformity with conventions of GNU, Matlab, Perl, BioPerl, R and GenBank 10 help make FAST easy and rewarding to learn. FAST automates numerical, taxonomic, and textbased sorting, selection and transformation of sequence records and alignment sites based on content, index ranges, descriptive tags, annotated features, and in-line calculated analytics, including composition and codon usage. Automated content- and feature-based extraction of 14 sites and support for molecular population genetic statistics makes FAST useful for molecular 15 evolutionary analysis. FAST is portable, easy to install and secure thanks to the relative matu-16 rity of its Perl and BioPerl foundations, with stable releases posted to CPAN. Development as 17 well as a publicly accessible Cookbook and Wiki are available on the FAST GitHub repository 18 at https://github.com/tlawrence3/FAST. The default data exchange format in FAST is Multi-FastA (specifically, a restriction of BioPerl FastA format). Sanger and Illumina 1.8+ FastQ formatted files are also supported. 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; **Stothard**, 2000; **Rampp**

¹Quantitative and Systems Biology Program, University of California, Merced, CA, USA

²Molecular Cell Biology Unit, School of Natural Sciences, University of California, Merced, CA, USA

³Dept. of Viticulture and Enology, University of California, Davis, CA, USA

 $^{^4}$ School of Engineering, University of California, Merced, CA, USA

et al., 2006; Librado and Rozas, 2009; Waterhouse et al., 2009; Gouy et al., 2010). However, the monolithic application paradigm is easily outscaled by today's big biological data, particularly Next Generation Sequencing (NGS) data at gigabyte- and terabyte-scales. Better empowerment of non-programmers for genome-scale analytics of big biological data 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) such as emacs org-mode (Delescluse et al., 2012) 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-throughput and high-dimensional measurements 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). Peer review and publication of the data science protocols associated to scientific studies stems temptation to overinterpret results and encourages more objectivity in data science (Boulesteix, 2010). The ultimate remedy for these problems is to expand literacy in modern computational and statistical data science for science students in general (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 bioinformatics specialists and programmers through Application Programming Interfaces (APIs) such as BioPerl and Ensembl (**Yates et al.**, 2015).

Yet workflow design suites and programming APIs require dedication and time to learn. There is a need for more bioinformatics software in between GUIs and APIs, that empowers non-programmer scientists and researchers to interactively and reproducibly control, process and analyze their data without manual interventions. Closer inspection of data and interactive construction and control of data workflows makes it so much easier to rapidly prototype error-free workflows, nipping errors in the bud that can completely confound downstream analyses. In scientific computing, the time-tested paradigm for rapid prototyping of reproducible data workflows is the Unix command-line.

In this tradition we here 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). FAST workflows are completely automated; no manual interventions to data are required. FAST falls between a GUI and an API, because it is used through a Command-Line Interface (CLI). Although the FAST tools are written in Perl using BioPerl packages (**Stajich et al.**, 2002), FAST users do not need to be able to program Perl or know BioPerl. FAST users only need basic competence in Unix and the modest skill to compose command pipelines in the Unix shell. FAST therefore supports an emerging movement to empower non-programmer biologists to learn Unix for scientific computing. Books and courses in this emerging market include the recent "UNIX and Perl to the Rescue!" (**Bradnam and Korf**, 2012) and the Software Carpentry and Data Carpentry Foundations workshops (**Wilson**, 2014).

81

85 86

87

88 89

90 91

92

93 94

95

96

97

Unix command pipe-lines are the paradigmatic example of the "pipes and filters" design pattern that embodies serial processing of data through sequences of modular and reuseable computations. The "pipes 78 79 and filters" design pattern is a special case of component-based software engineering (Mcilroy, 1969) and a core paradigm in software architecture (Garlan and Shaw, 1994). The component-wise organization of 80 FAST affords access to an infinite variety of customizable queries and workflows on biological sequence data using a small command vocabulary and combinatorial logic. Component-based software is easier to 82 learn, maintain and extend. It also makes it easy for users to interactively develop new protocols through 83 the modular extension and recombination of existing protocols. As shown from the examples below, 84 non-trivial computations may be expressed on a single line of the printed page. Thus, FAST can help empower non-biologist programmers to develop and communicate powerful and reproducible bioinformatic workflows for scientific investigations and publishing.

Open-source 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 over pipes. Similarly, FaBox (Villesen, 2007) 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). A toolsuite called bp-utils, with a similar design philosophy and some overlapping functionality with FAST, has recently been released at http://diverge.hunter.cuny.edu/labwiki/Bioutils.

98 We have written extensive documentation for each FAST utility along with useful error messages following recommended practice (**Seemann**, 2013). FAST is free and open source; its code is freely available 99 100 to anyone to re-use, verify and extend through its GitHub repository.

DESIGN AND IMPLEMENTATION OF FAST TOOLS

THE FAST DATA MODEL 2.1

- 101 The Unix Coreutils paradigm allows users to treat plain-text files and data streams as databases in which 102 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 103 to treat collections of files and streams of multi-line sequence records as databases for complex queries, 104 105 transformations and analytics. The Coreutils model is generalized exactly by FAST because it models
- sequence record descriptions as an ordered collection of description fields (see below). 106
- 107 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 108 by the Unix shell, and to output analogously to standard output. It is this facility that allows FAST 109 tools to be serially composed in Unix *pipelines* that compactly represent an infinite variety of expressive 110 bioinformatic workflows. 111
- The default data exchange format for FAST tools is the universally recognized FastA format (**Lipman** 112 and Pearson, 1985). While no universal standard exists for this format, for FAST, "FastA format" 113 means what is conventionally called "multi-fasta" format of sequence or alignment data, largely as 114 implementated in BioPerl in the module Bio::SeqIO::fasta (Stajich et al., 2002). 115
- In the FAST implementation of FastA format, multiple sequence records may appear in a single file or 116 input stream. Sequence data may contain gap characters. The logical elements (or fields) of a sequence 117 record are its *identifier*, its *description* and its *sequence*. The identifier (indicated with id in the illustration 118
- below) and description (desc) together make the identifier line of a sequence record, which must begin 119
- with the sequence record start symbol > on a single line. The description begins after the first block of 120

- 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.
- 123 In FAST, users may alter how description fields are defined in sequence records by using Perl-style
- 124 regular expressions to define delimiters (indicated by <delim>). FAST uses one-based indexing of
- 125 description fields.
- The FAST data model is illustrated as follows:

```
>seq1-id<space>seq1-desc-field1<delim>seq1-desc-field2<delim>...
127
128
   seq1-sequence
   seq1-sequence
129
130
131
   seq1-sequence
132 >seq2-id<space>seq2-desc-field1<delim>seq2-desc-field2<delim>...
133
   seq2-sequence
   seq2-sequence
134
135
136
   seq2-sequence
```

- In FAST, the sequence identifier is thought as the zeroth 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
- 139 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
- 141 record descriptions. Tagged values are name-value pairs with a format "name=value" as common in Gen-
- 142 eral Feature Format (GFF) used in sequence annotation (see e.g. https://www.sanger.ac.uk/
- 143 resources/software/gff/) or an alternative "name:value" format that certain FAST tools them-
- selves can append to sequence records. Support for tagged values in FAST makes it possible to operate
- on sequence records with unordered or heterogeneous description fields.

2.2 OVERVIEW OF THE FAST TOOLS

- 146 FAST utilities may be assigned to categories according to their default behavior and intended use.
- 147 There are FAST tools for selection of data from sequence records, transformation of data, annota-
- 148 tion of sequence record descriptions with computed characteristics of the data, and analysis. A complete
- 149 description of all utilities included in the first major release of FAST is shown in Table 1.
- The **analysis** class is distinguished from the other classes because by default, these utilities output tables
- 151 of plain-text data rather than sequence record data in FastA format. Two other tools, fasconvert and
- 152 gbfcut, are designed to either input or output FastA format sequence records by default. Standardization
- of the FAST data model allows users to serially compose FAST tools into pipelines at the Unix command-
- 154 line, which is indicated as the "main workflow" in the overview of the project shown in Figure 1.

2.3 GENERAL IMPLEMENTATION AND BENCHMARKING

- 155 The BioPerl backend of FAST 1.x is version 1.6.901 downloaded in January, 2012. Bio::SeqIO 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
- 158 BioPerl code-base, primarily to enable the translation of sequences containing gaps. All of the BioPerl
- 159 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
- 161 analyzed with the Cava packager (http://www.cavapackager.com).

163

165

166

167

168

169

Table 1. Utilities in first major release of FAST

Tool/Category	Function	Coreutil analog	Operates by default upon	
Selection				
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	records	
fastail	order-based selection of records	tail	records	
fascut	index-based selection and reordering of data	cut	sequences	
gbfcut	extract sequences by regex matching on features		features	
alncut	selection of sites by content		sites	
gbfalncut	selection of sites by features		sites	
Transformation				
fassort	numerical or text sorting of records	sort	identifiers	
fastaxsort	taxonomic sorting of records		identifiers	
fasuniq	remove or count redundant records	uniq	records	
faspaste	merging of records	paste	sequences	
fastr	character transformations on records	tr	identifiers	
fassub	regex substitutions on records		identifiers	
fasconvert	convert sequence formats		records	
Annotation				
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	
Analysis				
alnpi	molecular population genetic statistics		sites	
faswc	tally sequences and characters	WC	sequences	

Nearly all FAST utilities process sequence records inline and therefore have linear runtime complexity in the number of sequences. Exceptions are fassort and fastail which both require some paging of data into temporary files. We performed benchmarking of FAST tools using randomly generated sequences of even composition sourced generated in Python and the Benchmark v1.15 Perl module on a MacBook Pro 2.5 Ghz Intel i7, with 8 Gb of RAM. We examined average CPU runtime over 100 replicates, comparing input sizes of 25K, 250K, or 1M sequence records of length 100, 10K, 100K, or 1M bp. Our benchmarking results show that despite data paging, fassort runtimes scale linearly with input size (fig 2).

FAST is not designed to be fastest at computing its solutions. Rather the fastness of FAST lies in how quickly an adept user can interactively prototype, develop, and express bioinformatic workflows with it.

2.4 INSTALLATION AND DEPENDENCIES

- 172 FAST requires a working Perl installation, with official releases distributed through the Comprehensive
- 173 Perl Archive Network (CPAN). A small footprint of BioPerl dependencies has been packaged together
- in the FAST namespace. Other CPAN dependencies may be detected and installed by the cpan pack-
- 175 age manager. A fully automated install from CPAN may on many systems be initiated by executing
- 176 perl -MCPAN -e 'install FAST'. A manual install follows standard Perl install procedure.
- 177 After downloading and unpacking the source directory, change into that directory and execute: perl
- 178 Makefile.PL; make; make test; (sudo) make install.

We recommend that first-time users first complete the automated install from CPAN which will handle prerequisites, and then download and open the source code directory in order to practice the example usage commands (such as those in the sequel) on sample data provided within.

2.5 IMPLEMENTATION AND USAGE OF INDIVIDUAL TOOLS

- 182 Further implementation and usage details of individual FAST tools follows. Usage examples for indi-
- 183 vidual tools refer to example data that ships with the FAST source-code installer, available from CPAN.
- 184 The most recent version at the time of publication is 1.04, available from http://search.cpan.
- 185 org/~dhard/FAST-1.04/. These usage examples should be able to run from within the installation
- 186 directory after installation has completed.

fasgrep supports regular expression-based selection of sequence records. FAST uses Perl-style regular expressions, which are documented freely online and within Perl, and are closely related to Unix extended regular expressions. For reference on Perl regular expressions, try executing man perlre or perldoc perlre. For example, to print only protein sequences that do not start with M for methionine, execute:

```
fasgrep -s -v "^M" t/data/P450.fas
```

In the above command the -s option directs fasgrep to search the sequence data of each record. The -v option directs fasgrep to print records that *do not* match the pattern given by its argument, which is the regular expression ^M, in which the *anchor* ^ specifies the beginning of the sequence data. fasgrep uses the BioPerl Bio::Tools::SeqPattern library to support ambiguity expansion of IUPAC codes in its regular expression arguments. Thus, to show that a segment of *Saccharomyces cerevisiae* chromosome 1 contains at least one instance of an "Autonomous Consensus Sequences" characteristic of yeast origins of replication (**Leonard and Mchali**, 2013), look whether the following command outputs a sequence or not:

```
fasgrep -se 'WTTTAYRTTTW' t/data/chr01.fas
```

which is equivalent to:

192 193

194

195

196

197

198

199 200

201202

203204

205206207

208209

210

211

212

213

214

215

216

217

218 219

220 221

```
fasgrep -se '[AT]TTTA[CT][AG]TTT[AT]' t/data/chr01.fas
```

These examples demonstrate queries on sequence data, but fasgrep may be directed to search against other parts of sequence records including identifiers, descriptions, fields and more.

fasfilter supports precise numerical-based selections of sequence records from numerical data in identifiers, descriptions, fields or tagged-values in descriptions. fasfilter supports *open ranges* such as 100-, meaning "greater than or equal to 100", closed ranges like 1e6-5e8 (meaning 1×10^6 to 5×10^8) and compound ranges such as 200-400, 500-. Ranges may be specified in Perl-style (or GenBank coordinate style) like from..to, in R/Octave-style like from:to or UNIX cut-style as in from-to. For example, to print records with gi numbers between 200 million and 500 million, try executing:

```
fasfilter -x "gi\|(\d+)" 2e8..5e8 t/data/P450.fas
```

This example uses the -x option which directs fasfilter to filter on the value within the *capture buffer* which occurs within the left-most pair of parentheses of the argument, here (\d+), and \d+ is a regular expression matching a string of one or more digits from 0 to 9. The backslash after gi in the first argument quotes the vertical bar character to make it literal, since the vertical bar character is a special character in regular expressions.

fascut supports index-based selections of characters and fields in sequence records allowing repetition, reordering, variable steps, and reversals. Ranges are specified otherwise similarly to fasfilter. Negative indices count backwards from last characters and fields. fascut outputs the concatenation of data selections for each sequence record. Variable step-sizes in index ranges conveniently specify first, second or third codon positions in codon sequence records, for example. Examples using this syntax appear in the sequel. To print the last ten residues of each sequence, execute:

```
fascut -10..-1 t/data/P450.fas
```

alncut implements content-based selection of sites in alignments including gap-free sites, non-allgap sites, variable or invariant sites and parsimoniously informative sites, or their set-complements, all with the option of state-frequency-thresholds applied per site. By default, alncut prints only invariant sites. To print the set-complement or only variable sites, use the -v option:

```
alncut -v t/data/popset_32329588.fas
```

To print sites in which no more than two sequences contain gaps, execute:

```
alncut -gf 2 t/data/popset_32329588.fas
```

gbfcut allows annotation-based sequence-extraction from GenBank format sequence files, useful for extracting all sequences that correspond to sets of the same type of annotated features in genome data. For example, to output 5' and 3' Untranslated Region (UTR) sequences from a GenBank formatted sequence of a gene, we use the -k option to restrict matching to features whose "keys" match the regular expression "UTR":

```
gbfcut -k UTR t/data/AF194338.1.gb
```

gbfcut can handle split features such as a coding region (CDS) that is split over several exons:

```
gbfcut -k CDS t/data/AF194338.1.qb
```

More fine-grained queries of features are possible using qualifiers defined with the $\neg q$ option. Multiple qualifiers may be provided at once, specifying the selection of records for which all qualifiers apply (conjunction). For example, compare the output of the following two commands:

```
gbfcut -k tRNA t/data/mito-ascaris.gb
gbfcut -k tRNA -q product=Ser -q note^AGN t/data/mito-ascaris.gb
```

The second command queries for features with key "tRNA" containing at least one qualifier "/product" whose value matches the string literal "Ser" and no qualifiers of type "/note" whose values match the string literal "AGN."

gbfalncut automates the selection of sites from alignments that correspond to one or more features annotated on one of the sequences in a separate GenBank record. This workflow eliminates the need for manual entry of coordinates and implements a useful bioinformatic query in terms of known and reproducible quantities from public data and sequence records, allowing users to query sites based on biological vocabularies of sequence features. For an example of its use see the section "Composing Workflows in FAST" in the sequel.

faspaste concatenates data from records input oin parallel from multiple data-streams or files, record-by-record. The user may paste data from the standard input stream and from multiple input files, in an order defined by the arguments. Records from standard input may be used multiple times in concatenating data. Like in some implementions of the Unix tool paste, a hyphen input argument – to faspaste refers to the standard input stream and may be used more than once as an input argument. For maximum configurability, faspaste concatenates only one data field type (*i.e.* sequences or descriptions) at a time. Users may select which data stream will provide templates to receive concatenated

269 270

271

272

273

274 275

276

277

278 279

280

281 282

283

284

285 286

287

288 289

290 291

292

293

294 295

296 297

298

299

300

301 302

303

304

305

306

307 308

309

310

311

312

data in output records. For example, to paste sequences of corresponding records from two data-files together and output them with the identifiers and descriptions of the data in the first file, execute: 268

```
faspaste data1.fas data2.fas
```

See the sequel for more advanced usage examples with faspaste.

fassort and fasuniq are designed to be often used together in Unix pipelines. The fassort utility implements numerical and textual sorting of sequence records by specific fields. The fasuniq utility removes (and optionally counts) records that are redundant with respect to a specific field, such as sequences or identifiers. In the implementation of fassort, 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. Like its Unix Coreutil analog uniq, fasuniq compares only immediately successive input records. Therefore, users will usually want to first sort data with fassort before passing it to fasuniq. To illustrate, the following example combines and sorts input records from two instances of the same file, and then counts and removes each redundant record:

```
fassort -s t/data/P450.fas t/data/P450.fas | fasuniq -c
```

This example illustrates that the same file may be specified as an input stream more than once to any FAST command.

fastax and fastaxsort implement taxonomic searching and sorting of sequence records, whose records are already annotated with NCBI taxonomic identifiers using taxonomic data from NCBI taxonomy (Benson et al., 2009; Sayers et al., 2009). For example, a query of "Metazoa" would match records labeled "Homo sapiens," "Drosophila melanogaster," and "Lepidoptera" but not "Candida albicans" or "Alphaproteobacteria." Taxonomic selections may be logically negated and/or restricted to only those records containing valid NCBI taxonomic identifiers. Purely for historical reasons, the internal implementation of NCBI taxonomic data is custom to FAST rather than the Bio:: Taxonomy libraries in BioPerl. A sample of data from tRNAdb-CE (Abe et al., 2014), in which data records are annotated with valid NCBI taxonomic identifiers in specific description fields, is included with the FAST installation package. After downloading datafiles "nodes.dmp" and "names.dmp" from NCBI Taxonomy, the following command filters sequences from Rhizobiales, assuming that records are labeled with their species (and strain) of origin in the third field of the description of the sample data file:

```
fastax -f 3 -S " \| " nodes.dmp names.dmp \
Rhizobiales t/data/tRNAdb-CE.sample2000.fas
```

fastr and fassub handle, respectively, character- and string-based transformations of sequence records. The utility fastr handles character-based transliterations, deletions and "squashing" (deletion of consecutive repeats), sequence degapping, and restriction or remapping of sequence data to strict or IUPAC ambiguity alphabets. For example, to lower-case all sequence characters, execute:

```
fastr -s 'A-Z' 'a-z' t/data/P450.fas
```

Degapping requires only the simple command:

```
fastr --degap t/data/P450.clustalw2.fas
```

The utility fassub allows more arbitrary substitutions on sets of strings matched to Perl regexes, implemented through direction of the Perl s / / / substitution operator on specific fields. Capture buffers may be used to refer to matched data in substitutions, for example, to reverse the order of genus and species in a file in which scientific names occur in descriptions enclosed with square brackets:

```
fassub -d' \setminus [(\w+) (\w+) \setminus ]'' [$2 $1]' t/data/P450.fas
```

fascomp, fasxl and fascodon provide for annotation and analytics of compositions, translations, and codon usage frequencies of sequence records (with start and stop codons counted distinctly,

Table 2. Molecular Population Genetic Statistics in FAST

Statistic	Symbol	Citation
Number of sequences	n	
Number of alleles/distinct sequences	$k_{\widetilde{\alpha}}$	
Number of segregating sites	S	
Fraction of segregating sites	s	
Average number of pairwise differences		(Nei and Li, 1979)
Nucleotide Diversity	π	(Nei and Li, 1979)
Watterson estimator	$ heta_W$	(Watterson, 1975)
Expected number of alleles	E(K)	(Ewens, 1972)
Tajima's D	D $$	(Tajima , 1989)
Fu and Li's D*	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	η_S	(Fu and Li, 1993)
Fu and Li's Eta	η	(Fu and Li , 1993)

in the last case). All genetic codes included in BioPerl, ultimately from NCBI Entrez, are supported. 313

314

316

317

318

319

320

315 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. Data and command examples are provided to reproduce the tables and sliding window analyses of statistics published in (Ardell et al., 2003). Purely for historical reasons, alnpi does not use the perlymorphism routines in the BioPerl library Bio::PopGen (Stajich and Hahn, 2005). However, 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, 2004).

321 322 323

COMPOSING WORKFLOWS IN FAST

- Here we show how to interactively prototype a pipeline that computes the sliding window profile of Tajima's D of Figure 4A in (Ardell et al., 2003) from a publicly available datafile. The datafile associated 325 to this figure is an NCBI PopSet with accession ID 32329588 containing an alignment of a fully anno-326 tated ciliate gene (accession AF194338.1) against several partially sequenced allelic variants. One of the 327 variants with accession ID AY243496.1 appears to be partly non-functionalized. 328
- 329 First to see this data, we view it in the pager less (press "q" to quit and "space" to page):
- less t/data/popset_32329588.fas 330
- A key feature of the Unix shell allows users to recall previous commands in their so-called *history*, usually 331 by typing the "up-arrow" for possble re-use and editing. To check the number of sequences and characters 332 333 in the alignment, execute:
- 334 faswc t/data/popset_32329588.fas
- To compute our population genetic statistics we wish to remove the annotated reference sequence, the 335 deactivated allele, and one potentially spurious additional haplotype from analysis, which we can do using 336 fasgrep, and verify that it reduced data by the correct number of records (six) by piping to faswc (the 337 command is broken over two lines here but may be entered as one line on the Unix prompt):

```
fasgrep -v "(AF194|349[06])" t/data/popset_32329588.fas \
| faswc
```

341 We can check the identifier lines by modifying the end of this pipeline:

```
fasgrep -v "(AF194|349[06])" t/data/popset_32329588.fas \
grep \>
```

To avoid statistical complications for downstream analysis, we can extract only gap-free sites from the alignment using alneut, and verify that we reduced the size of the alignment using faswe:

Molecular population genetic analyses are sensitive to the presence of ambiguous sequence characters, which we can check for by outputing a composition table:

```
350 fasgrep -v "(AF194|349[06])" t/data/popset_32329588.fas \
351 | alncut -q | fascomp --table
```

To remap ambiguities to gap characters, which will cause them to be ignored by alnpi, we use fastr and check the result in fascomp:

```
fasgrep -v "(AF194|349[06])" t/data/popset_32329588.fas \
lancut -q | fastr --strict -N - | fascomp --table
```

Finally, with confidence in the integrity of our pipeline developed so far, we pass the latest output to *alnpi* for sliding-window analysis of Tajima's D:

```
fasgrep -v "(AF194|349[06])" t/data/popset_32329588.fas \
lancut -g | fastr --strict -N - | alnpi --window 100:25:d
```

4 FURTHER FAST WORKFLOW EXAMPLES

4.1 SELECTING SITES FROM ALIGNMENTS BY ANNOTATED FEATURES

Another example, that reproduces a published result from (**Ardell et al.**, 2003), demonstrates the utility of combining gbfalncut with alnpi, allowing users to select sites from alignments corresponding to features annotated on one of the sequences in a separate GenBank file. For example, to calculate a Tajima's D statistic for 5' UTRs, corresponding to the the last line in Table 1 of that work, execute:

4.2 SELECTING SEQUENCES BY ENCODED MOTIFS

An advantage of the annotation approach in FAST is the ability to select and sort sequences by attributes 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 motif (**Kornfeld and Kornfeld**, 1985), one could execute:

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

- 372 The first command in the pipeline translates each sequence and appends the translation to the description
- 373 with the tag "xl0" (indicating translation in the zeroth reading frame). The second command in the pipeline
- 374 uses a regular expression to represent the N-glycosylation amino acid motif pattern as the value of a
- "name:value" pair in the description with tag "x10", hence processing the annotations produced by fasx1.
- 376 The regex argument to fasqrep is quoted to protect the argument from interpretation by the shell. The
- last command in the pipeline removes the last field in the description, restoring records as they were before
- 378 they were annotated by fasxl.

4.3 SORTING RECORDS BY THIRD CODON POSITION COMPOSITION

- 379 Another example illustrates the powerful expression of ranges in fascut. An optional "by" parameter
- 380 in ranges allows increments or decrements in steps larger than one. To extract third-position bases from
- 381 codon sequence records, compute and annotate their compositions into record descriptions, ultimately
- 382 sorting records by their third-position adenosine contents, do:
- 383 fascut 3:-1:3 cds.fas | fascomp | fassort -nt comp A

4.4 MORE ADVANCED MERGING OF DATA RECORDS

- 384 More advanced usage of faspaste requires Unix pipelines. For example to join both descriptions and
- 385 sequences from two data-files, execute:
- 386 faspaste data1.fas data2.fas | faspaste -d data2.fas
- 387 The hyphen second argument (-) to the second instance of faspaste refers to the input received from
- 388 standard input through the pipe. This example works because by default, faspaste uses records from
- 389 the first data stream
- 390 To prepend the first sequence of one file repeatedly to every sequence in another file, execute:

```
391 fashead -n 1 t/data/fasxl_test4.fas \
392  | faspaste -r - t/data/fasxl_test4.fas
```

- 393 To prepend the first sequence of one file repeatedly to every other sequence in another file, using identifiers
- and descriptions from the second file in the output, execute:

```
395 fashead -n 1 t/data/fasxl_test3.fas \
396  | faspaste -r -R 2 - t/data/fasxl test4.fas
```

5 FURTHER DOCUMENTATION AND USAGE EXAMPLES

Upon installation, FAST generates and installs a complete man page for each FAST utility, which should be accessible by one or both of the following commands, *e.g.*:

In addition, a FAST Cookbook has been contributed by the authors and is available with the source code distribution or from the project GitHub repository at https://github.com/tlawrence3/FAST.

6 CONCLUDING REMARKS AND FUTURE DIRECTIONS

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

AVAILABILITY

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

DISCLOSURE/CONFLICT-OF-INTEREST STATEMENT

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

AUTHOR CONTRIBUTIONS

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

ACKNOWLEDGEMENT

- 419 We acknowledge Christopher Clark for help in establishing a Git repository for FAST and Peter Becich for
- 420 contributing some testing of the installer. D.H.A. gratefully acknowledges Professors Laura Landweber,
- 421 Siv Andersson and Leif Kirsebom in whose laboratories the FAST tools were first developed as well as
- 422 the Linnaeus Centre for Bioinformatics at Uppsala University.
- 423 Funding: D.H.A. gratefully acknowledges an NSF-DBI Postdoctoral Fellowship in Biological Informat-
- 424 ics and awards from UC Merced's Graduate Research Council and a Chancellor's Award from UC
- 425 Merced's second Chancellor Sung-Mo Kang, as well as the NSF-funded program in Undergraduate
- 426 Research in Computational Biology at UC Merced (DBI-1040962).

REFERENCES

- 427 Abe, T., Inokuchi, H., Yamada, Y., Muto, A., Iwasaki, Y., and Ikemura, T. (2014), tRNADB-CE: tRNA
- 428 gene database well-timed in the era of big sequence data, Frontiers in Genetics, 5, 114, doi:10.3389/
- 429 fgene.2014.00114
- 430 Ardell, D. H. (2004), SCANMS: adjusting for multiple comparisons in sliding window neutrality tests,
- 431 *Bioinformatics*, 20, 12, 1986–1988, doi:10.1093/bioinformatics/bth187

- 432 Ardell, D. H., Lozupone, C. A., and Landweber, L. F. (2003), Polymorphism, recombination and alternative unscrambling in the DNA polymerase alpha gene of the ciliate *stylonychia lemnae* (alveolata;
- 434 *class spirotrichea*), *Genetics*, 165, 4, 1761–1777
- Baggerly, K. A. and Coombes, K. R. (2009), Deriving chemosensitivity from cell lines: Forensic bioinformatics and reproducible research in high-throughput biology, *The Annals of Applied Statistics*, 3, 4, pp. 1309–1334
- Baggerly, K. A. and Coombes, K. R. (2011), What information should be required to support clinical omics publications?, *Clinical Chemistry*, 57, 5, 688–690, doi:10.1373/clinchem.2010.158618
- 440 Barnes, N. (2010), Publish your computer code: it is good enough, *Nature*, 467, 7317, 753–753
- Benson, D. A., Karsch-Mizrachi, I., Lipman, D. J., Ostell, J., and Sayers, E. W. (2009), GenBank., *Nucleic acids research*, 37, Database issue, D26–31, doi:10.1093/nar/gkn723
- Blankenberg, D. and Hillman-Jackson, J. (2014), Analysis of next-generation sequencing data using Galaxy, in B. L. Kidder, ed., Stem Cell Transcriptional Networks, volume 1150 of *Methods in Molecular Biology* (Springer New York), 21–43, doi:10.1007/978-1-4939-0512-6_2
- Boulesteix, A.-L. (2010), Over-optimism in bioinformatics research, *Bioinformatics*, 26, 3, 437–439, doi:10.1093/bioinformatics/btp648
- Bradnam, K. and Korf, I. (2012), UNIX and Perl to the Rescue!: A Field Guide for the Life Sciences (and
 Other Data-rich Pursuits) (Cambridge University Press)
- Casadevall, A., Steen, R. G., and Fang, F. C. (2014), Sources of error in the retracted scientific literature, *The FASEB Journal*, 28, 9, 3847–3855, doi:10.1096/fj.14-256735
- Cunningham, F., Amode, M. R., Barrell, D., Beal, K., Billis, K., Brent, S., et al. (2015), Ensembl 2015,
 Nucleic Acids Research, 43, D1, D662–D669, doi:10.1093/nar/gku1010
- Delaglio, F., Grzesiek, S., Vuister, G. W., Zhu, G., Pfeifer, J., and Bax, A. (1995), NMRPipe: a multidimensional spectral processing system based on unix pipes, *Journal of Biomolecular NMR*, 6, 3, 277–293
- Delescluse, M., Franconville, R., Joucla, S., Lieury, T., and Pouzat, C. (2012), Making neurophysiological data analysis reproducible: why and how?, *Journal of Physiology, Paris*, 106, 3-4, 159–170, doi:10. 1016/j.jphysparis.2011.09.011
- Ewens, W. J. (1972), The sampling theory of selectively neutral alleles, *Theoretical population biology*, 3, 1, 87–112
- 462 Fu, Y. X. and Li, W. H. (1993), Statistical tests of neutrality of mutations., Genetics, 133, 3, 693–709
- 463 Garlan, D. and Shaw, M. (1994), An Introduction to Software Architecture, *Computer Science* 464 *Department*
- 465 Gordon, A. (2009), FASTX Toolkit, http://cancan.cshl.edu/labmembers/gordon/ 466 fastx_toolkit/index.html, [Online; accessed 25-January-2015]
- Gouy, M., Guindon, S., and Gascuel, O. (2010), SeaView version 4: a multiplatform graphical user interface for sequence alignment and phylogenetic tree building, *Molecular biology and evolution*, 27, 2, 221–224
- Huang, Y. and Gottardo, R. (2013), Comparability and reproducibility of biomedical data, *Briefings in Bioinformatics*, 14, 4, 391–401, doi:10.1093/bib/bbs078
- 472 Hutson, S. (2010), Data handling errors spur debate over clinical trial, *Nature medicine*, 16, 6, 618
- Ioannidis, J. P. A., Allison, D. B., Ball, C. A., Coulibaly, I., Cui, X., Culhane, A. C., et al. (2008), Repeatability of published microarray gene expression analyses, *Nat Genet*, 41, 2, 149–155
- Joppa, L. N., McInerny, G., Harper, R., Salido, L., Takeda, K., O'Hara, K., et al. (2013), Troubling trends in scientific software use, *Science*, 340, 6134, 814–815, doi:10.1126/science.1231535
- 477 Knuth, D. E. (1984), Literate programming, The Computer Journal, 27, 2, 97–111
- Kornfeld, R. and Kornfeld, S. (1985), Assembly of asparagine-linked oligosaccharides, *Annual Review of Biochemistry*, 54, 1, 631–664, doi:10.1146/annurev.bi.54.070185.003215, pMID: 3896128
- Leonard, A. C. and Mchali, M. (2013), DNA Replication Origins, *Cold Spring Harbor Perspectives in Biology*, 5, 10, a010116, doi:10.1101/cshperspect.a010116

- Li, H., Handsaker, B., Wysoker, A., Fennell, T., Ruan, J., Homer, N., et al. (2009), The sequence alignment/map format and SAMtools, *Bioinformatics*, 25, 16, 2078–2079, doi:10.1093/bioinformatics/btp352
- Librado, P. and Rozas, J. (2009), DnaSP v5: a software for comprehensive analysis of DNA polymorphism data, *Bioinformatics*, 25, 11, 1451–1452, doi:10.1093/bioinformatics/btp187
- Lipman, D. J. and Pearson, W. R. (1985), Rapid and sensitive protein similarity searches, *Science*, 227, 4693, 1435–1441
- Lushbough, C. M., Jennewein, D. M., and Brendel, V. P. (2011), The bioextract server: a web-based bioinformatic workflow platform, *Nucleic Acids Research*, 39, suppl 2, W528–W532, doi:10.1093/nar/ gkr286
- Markowitz, V. M., Chen, I.-M. A., Palaniappan, K., Chu, K., Szeto, E., Pillay, M., et al. (2014), IMG 4
 version of the integrated microbial genomes comparative analysis system, *Nucleic Acids Research*, 42, D1, D560–D567, doi:10.1093/nar/gkt963
- Mcilroy, D. (1969), Mass-produced Software Components, in J. Buxton, P. Naur, and B. Randell, eds., Proceedings of the 1st International Conference on Software Engineering, Garmisch Pattenkirchen, Germany, 138–155
- 498 Morin, A., Urban, J., Adams, P. D., Foster, I., Sali, A., Baker, D., et al. (2012), Shining light into black boxes, *Science*, 336, 6078, 159–160, doi:10.1126/science.1218263
- Nei, M. and Li, W. H. (1979), Mathematical model for studying genetic variation in terms of restriction endonucleases., *Proc Natl Acad Sci U S A*, 76, 10, 5269–5273
- 502 Oinn, T., Greenwood, M., Addis, M., Alpdemir, M. N., Ferris, J., Glover, K., et al. (2006), Taverna: lessons in creating a workflow environment for the life sciences, *Concurrency and Computation:* Practice and Experience, 18, 10, 1067–1100, doi:10.1002/cpe.993
- Peek, J. (2001), Why Use a Command Line Instead of Windows?, http://www.linuxdevcenter. com/pub/a/linux/2001/11/15/learnunixos.html
- Peng, R. D. (2009), Reproducible research and biostatistics, *Biostatistics*, 10, 3, 405–408, doi:10.1093/biostatistics/kxp014
- 509 Peng, R. D. (2011), Reproducible research in computational science, *Science*, 334, 6060, 1226–1227, doi:10.1126/science.1213847
- Rampp, M., Soddemann, T., and Lederer, H. (2006), The MIGenAS integrated bioinformatics toolkit for web-based sequence analysis., *Nucleic acids research*, 34, Web Server issue, W15–9, doi:10.1093/nar/gkl254
- Rice, P., Longden, I., and Bleasby, A. (2000), EMBOSS: The European Molecular Biology Open Software
 Suite, *Trends in Genetics*, 16, 6, 276–277, doi:10.1016/S0168-9525(00)02024-2
- Rosenbloom, K. R., Armstrong, J., Barber, G. P., Casper, J., Clawson, H., Diekhans, M., et al. (2015), The UCSC Genome Browser database: 2015 update, *Nucleic Acids Research*, 43, D1, D670–D681, doi:10.1093/nar/gku1177
- Sayers, E. W., Barrett, T., Benson, D. A., Bryant, S. H., Canese, K., Chetvernin, V., et al. (2009), Database
 resources of the National Center for Biotechnology Information., *Nucleic acids research*, 37, Database
 issue, D5–15, doi:10.1093/nar/gkn741
- 522 Seemann, T. (2013), Ten recommendations for creating usable bioinformatics command line software., 523 *GigaScience*, 2, 1, 15, doi:10.1186/2047-217X-2-15
- 524 Simonsen, K. L., Churchill, G. A., and Aquadro, C. F. (1995), Properties of statistical tests of neutrality 525 for DNA polymorphism data., *Genetics*, 141, 1, 413–429
- 526 Smith, S. W., Overbeek, R., Woese, C. R., Gilbert, W., and Gillevet, P. M. (1994), The genetic data environment an expandable GUI for multiple sequence analysis., *Computer applications in the biosciences* : *CABIOS*, 10, 6, 671–5
- 529 Stajich, J. E., Block, D., Boulez, K., Brenner, S. E., Chervitz, S. A., Dagdigian, C., et al. (2002), The 530 Bioperl toolkit: Perl modules for the life sciences., *Genome research*, 12, 10, 1611–8, doi:10.1101/gr. 531 361602
- 532 Stajich, J. E. and Hahn, M. W. (2005), Disentangling the effects of demography and selection in human history, *Molecular Biology and Evolution*, 22, 1, 63–73, doi:10.1093/molbev/msh252

- Stothard, P. (2000), The sequence manipulation suite: JavaScript programs for analyzing and formatting protein and DNA sequences, *BioTechniques*, 28, 6, 1102, 1104
- 536 Stutz, M. (2000), Linux and the Tools Philosophy, http://www.linuxdevcenter.com/pub/a/linux/2000/07/25/LivingLinux.html
- Tajima, F. (1989), Statistical method for testing the neutral mutation hypothesis by DNA polymorphism., *Genetics*, 123, 3, 585–595
- The Gene Ontology Consortium (2015), Gene ontology consortium: going forward, *Nucleic Acids Research*, 43, D1, D1049–D1056, doi:10.1093/nar/gku1179
- 542 Villesen, P. (2007), FaBox: an online toolbox for fasta sequences, *Molecular Ecology Notes*, 7, 6, 965–968, doi:10.1111/j.1471-8286.2007.01821.x
- Waterhouse, A. M., Procter, J. B., Martin, D. M. A., Clamp, M., and Barton, G. J. (2009), Jalview Version
 2-a multiple sequence alignment editor and analysis workbench, *Bioinformatics (Oxford, England)*, 25,
 9, 1189–1191, doi:10.1093/bioinformatics/btp033
- Watterson, G. (1975), On the number of segregating sites in genetical models without recombination, Theoretical population biology, 7, 2, 256–276
- 549 Wilson, G. (2014), Software Carpentry: lessons learned, *F1000Research*, doi:10.12688/f1000research. 550 3-62.v1
- Yates, A., Beal, K., Keenan, S., McLaren, W., Pignatelli, M., Ritchie, G. R. S., et al. (2015), The Ensembl REST API: ensembl data for any language, *Bioinformatics*, 31, 1, 143–145, doi:10.1093/bioinformatics/btu613

FIGURES

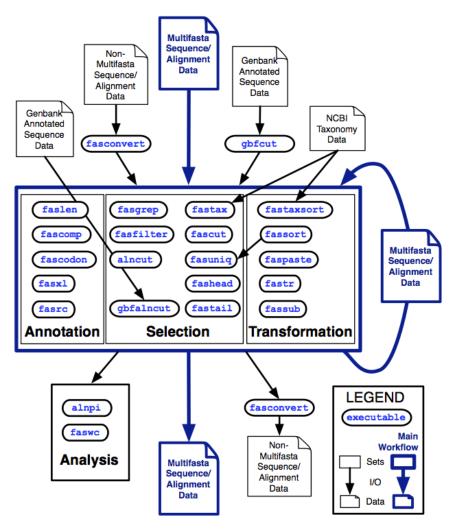


Figure 1. Overview of the first major release of FAST with data and workflow dependencies indicated. Inputs to FAST tools are shown at the top of the figure with outputs at the bottom. Outlined in blue is the primary working model, in which Multifasta sequence or alignment data is successively annotated, selected upon and transformed into new Mutifasta sequence alignment data, or fed into a utility in the **analysis** category for tabular output of data summaries. Many of the utilities in the **annotation** category are also optionally capable of tabular output.

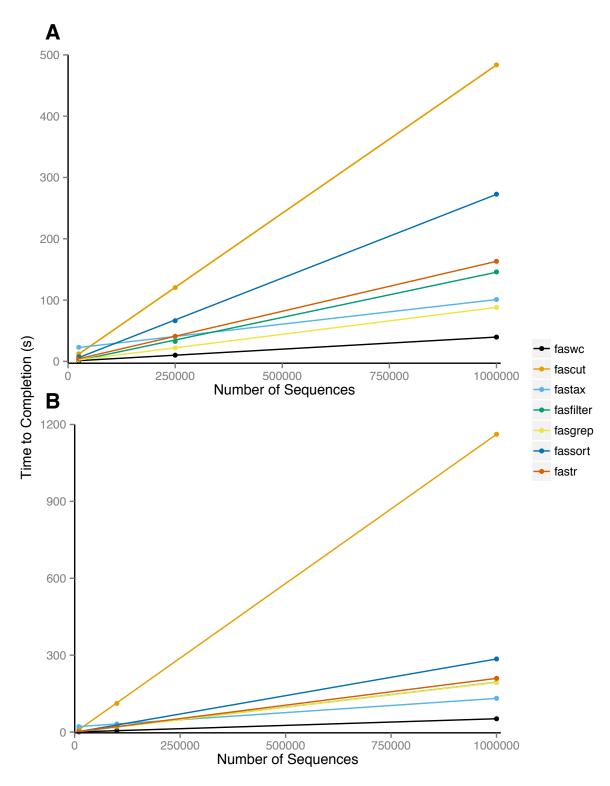


Figure 2. Average processor time of 100 repetitions required to complete analysis using indicated utility. Utilities were run on six datasets consisting of (a) 25000, 250000, and 1000000 100bp sequences and (b) 10000, 100000, and 1000000 1000bp sequences.