# $\texttt{fur } 3.0: \underbrace{Find\ Unique\ Genome\ Regions}_{\texttt{https://github.com/haubold/fur}} Regions$

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### **Chapter 1**

## Make fur Database, makeFurDb

#### 1.1 Introduction

The program fur<sup>1</sup> requires a database to run, which is computed with makeFurDb. MakeFurDb takes as input a directory containing the target genomes and a directory containing the neighbor genomes. It generates a directory containing the macle index and the BLAST database required by fur.

#### 1.2 Implementation

The program consists of an include section, function declarations and definitions, and the main function.

#### Program 1.1.

```
\langle makeFurDb.c \ 1a \rangle \equiv
\langle Include \ headers, P. \ 1.1 \ 2b \rangle
\langle Function \ declarations, P. \ 1.1 \ 3c \rangle
\langle Function \ definitions, P. \ 1.1 \ 3d \rangle
\langle Main \ function, P. \ 1.1 \ 1b \rangle
```

The main function interacts with the user, reads the input data, writes the database, and frees any memory still allocated.

```
1b \langle Main\ function,\ P.\ 1.1\ 1b \rangle \equiv int main(int argc, char **argv) { \langle Interact\ with\ user,\ P.\ 1.1\ 2a \rangle fprintf(stderr, "# Reading data..."); \langle Read\ data,\ P.\ 1.1\ 2h \rangle fprintf(stderr, "done.\n"); \langle Write\ database,\ P.\ 1.1\ 4c \rangle \langle Free\ memory,\ P.\ 1.1\ 2e \rangle }
```

 $<sup>^{1}</sup>$ https://github.com/haubold/fur

#### 1.2.1 User Interaction

The most fundamental user interactions are error messages, which require the name of the program sending the message. This is set for future reference.

2a  $\langle Interact \ with \ user, P. \ 1.1 \ 2a \rangle \equiv$  (1b)  $2c \triangleright$  setprogname(argv[0]);

The function setprogname is defined in bsd/stdlib.h.

2b  $\langle Include\ headers,\ P.\ 1.1\ 2b \rangle \equiv$  (1a) 2d  $\triangleright$  #include  $\langle bsd/stdlib.h \rangle$ 

The user interacts with the program via a set of options and their arguments.

2c  $\langle Interact\ with\ user,\ P.\ 1.1\ 2a \rangle + \equiv$  (1b)  $\triangleleft$  2a 2f Args \*args = getArgs(argc, argv);

The Args data structure and the functions for handling it are defined in mfdbI.h.

2d  $\langle Include\ headers,\ P.\ 1.1\ 2b\rangle +\equiv$  (1a)  $\triangleleft$  2b  $2i \triangleright$  #include "mfdbI.h"

The arguments container is freed at the end.

2e  $\langle Free\ memory, P.\ 1.1\ 2e \rangle \equiv$  (1b) 4b $\triangleright$  freeArgs(args);

If the user asks for help or an error has occurred, a usage message—also defined in mfdbI.h—is printed and the program exits.

2f  $\langle Interact \ with \ user, P. \ 1.1 \ 2a \rangle + \equiv$  (1b)  $\triangleleft 2c \ 2g \triangleright$  if (args->h || args->err) printUsage();

Similarly, the user might like to know the program version, in response to which a (small) splash is made before exiting.

2g  $\langle Interact\ with\ user,\ P.\ 1.1\ 2a \rangle + \equiv$  (1b)  $\triangleleft$  2f if (args->v) printSplash(args);

The interaction with the user is now finished and the program on its way.

#### 1.2.2 Construct Database

Database construction begins by reading the targets and the neighbors.

2h  $\langle Read\ data,\ P.\ 1.1\ 2h \rangle \equiv$  (1b) SeqArr \*ta, \*ne;  $\langle Read\ targets,\ P.\ 1.1\ 3a \rangle$   $\langle Read\ neighbors,\ P.\ 1.1\ 4a \rangle$ 

Sequences and sequence arrays are defined in seq.h. This header also defines the functions for manipulating these data structures.

2i  $\langle Include\ headers,\ P.\ 1.1\ 2b\rangle +\equiv$  (1a)  $\triangleleft$  2d 3b  $\triangleright$  #include "seq.h"

The targets are read from a directory passed by the user. Every entry in that directory except for "." and ".." is assumed to be a sequence file.

3a

The previous code chunk refers to a number of preexisting objects, including the directory, DIR, and its entries, dirent, both declared in dirent.h. The function eopendir is an error-aware version of opendir declared in error.h. The function readdir is again declared in dirent.h, and strcmp in string.h.

```
3b \langle Include\ headers,\ P.\ 1.\ 1\ 2b\rangle +\equiv (1a) 42i\ 3eb #include 4irent.\ h> #include 4rent.\ h> #include "error.\ h" #include 4rent.\ h> #include 4rent.\ h>
```

Now readSeq still needs to be declared. It is a function of the sequence array to be added to, the directory path, and the name of the sequence file.

```
3c \langle Function \ declarations, P. 1.1 \ 3c \rangle \equiv void readSeq(SeqArr *sa, char *dir, char *file); (1a)
```

Its main work is to concatenate the directory path and the file name into the file path that serves as the argument to getJoinedSeq.

The only function called in readSeq not yet declared is free, which is part of in strlib.h.

```
3e \langle Include\ headers, P.\ 1.1\ 2b \rangle + \equiv (1a) \triangleleft 3b #include \langlestdlib.h\rangle
```

Reading the neighbors is similar to reading the targets.

The targets and neighbors are freed at the end.

```
4b \langle Free\ memory,\ P.\ 1.1\ 2e \rangle + \equiv (1b) \triangleleft 2e freeSeqArr(ta); freeSeqArr(ne);
```

The data just read is now converted into the fur database. The database is a directory, which is constructed first. It contains two kinds of files, the macle index, and the BLAST database.

```
4c \langle Write\ database,\ P.\ 1.1\ 4c \rangle \equiv  (1b) \langle Create\ database\ directory,\ P.\ 1.1\ 4d \rangle  \langle Write\ macle\ index,\ P.\ 1.1\ 5a \rangle  \langle Write\ BLAST\ database,\ P.\ 1.1\ 6 \rangle
```

Creation of the database directory depends on whether the directory already exists or not.

```
4d \langle Create\ database\ directory,\ P.\ 1.1\ 4d \rangle \equiv struct stat sb; if (stat(args->d, &sb) != -1) { \langle Directory\ exists,\ P.\ 1.1\ 4e \rangle } else { \langle Directory\ does\ not\ exist,\ P.\ 1.1\ 4f \rangle }
```

If the directory already exists and the user allows it to be overwritten by using option -o, the directory is simply left unchanged. Without overwriting, an error is thrown.

```
4e  ⟨Directory exists, P. 1.1 4e⟩≡
        if (!args->o)
        error("%s already exists.\n", args->d);
        If the directory doesn't exist, it is created.

4f  ⟨Directory does not exist, P. 1.1 4f⟩≡
        char cmd[1024];
        sprintf(cmd, "mkdir %s", args->d);
        if (system(cmd) < 0)
        error("couldn't run system command %s\n", cmd);</pre>
```

The macle index consists of a representative target and the neighbors. These are passed to  $macle^2$  using the pipe mechanism. Since their names are mainly relevant for internal usage, the representative is called ti, where i is its index in the target array, and the neighbors are called ni.

5a

```
\langle \textit{Write macle index}, \textit{P. 1.1 5a} \rangle \equiv (4c) int r = 0; \langle \textit{Find representative target}, \textit{P. 1.1 5b} \rangle char *tmpl = "macle -s > %s/macle.idx", cmd[1024]; sprintf(cmd, tmpl, args->d); FILE *pp = epopen(cmd, "w"); fprintf(stderr, "# Making macle index with target representative \"%s\"...", ta->arr[r]->name); fprintf(pp, ">t%d\n%s\n", r, ta->arr[r]->data); for (int i = 0; i < ne->n; i++) fprintf(pp, ">n%d\n%s\n", i, ne->arr[i]->data); pclose(pp); fprintf(stderr, "done.\n");
```

If the name of the representative target is given by the user, this is converted to the index in the target sequence array. Otherwise the longest sequence is picked as the representative.

```
5b \langle Find\ representative\ target,\ P.\ 1.1\ 5b \rangle \equiv (5a) if (args->r) { \langle Convert\ representative\ name\ to\ index,\ P.\ 1.1\ 5c \rangle } else { \langle Find\ longest\ target,\ P.\ 1.1\ 5d \rangle }
```

When searching the names of the targets for the representative, a partial match suffices. Multiple or no matches are an error.

```
\langle Convert representative name to index, P. 1.1 5c \rangle \equiv
5c
                                                                                        (5b)
         r = -1;
         for (int i = 0; i < ta -> n; i++)
            if (strstr(ta->arr[i]->name, args->r)) {
              if (r == -1)
                   r = i;
              else
                   error("%s is ambiguous.\n", args->r);
            }
         if (r == -1)
            error("couldn't find %s.\n", args->r);
       \langle Find\ longest\ target,\ P.\ 1.1\ 5d \rangle \equiv
5d
                                                                                        (5b)
         int max = -1;
         for (int i = 0; i < ta->n; i++)
            if (max < ta->arr[i]->l) {
              max = ta->arr[i]->1;
              r = i;
            }
```

<sup>&</sup>lt;sup>2</sup>https://github.com/evolbioinf/macle

The BLAST database consists of the targets and neighbors, named i and i, respectively. The program makeblastdb computes the database, its option parse\_seqids allows later retrieval of the representative target by fur.

# Chapter 2

# Find Unique Regions, fur

#### 2.1 Introduction

The design of diagnostic PCR primers is often hampered by an excess of candidates that also amplify off-target regions. To minimize the chance of cross-amplification, primers should be designed from template sequences that are unique to the target strain. The program fur *finds unique regions* by comparing the genomes of a sample of target strains to the genomes of the closest relatives the targets are to be distinguished from. The underlying heuristic is that any region that distinguishes a target from its closest relatives, also distinguishes it from all other sequences out there.

Consider, for example, *Escherichia coli* ST131, a multi-drug resistant strain that causes urinary tract and blood infections in humans [5]. *E. coli* ST131 belongs to the B2 phylogenetic subgroup, which corresponds to serotype O25b:H4. Figure 2.1 shows the phylogeny of  $105 \, E. \, coli \, B2$  strains. The clade marked ST131 comprises 95 strains newly sequenced by [5], plus three STS131 reference genomes, SE15, NA114, and EC958. This clade defines the *targets* marked  $\mathcal{T}$  in Figure 2.1. The seven remaining *E. coli* strains are the *neighbors*,  $\mathcal{N}$ . They also belong to the B2 group, but not to ST131 [5]. The aim is to find regions specific to ST131. In Section 7.1 a tutorial-style analysis of this data set shows how to do this using fur.

The program takes as input a database computed using makeFurDb<sup>1</sup> from two directories of sequence files, the first contains one or more target genomes, the second one or more neighbor genomes. fur uses macle [6] to identify candidate regions that are unique to a representative target when compared to all neighbors. These candidate regions are then checked for presence in all targets using phylonium [4] and absence from all neighbors using BLAST [1]. The resulting templates are finally printed to screen. They are now ready for submission to a primer design program like primer3 [7].

#### 2.2 Implementation

The program is based on arrays of sequences and arrays of intervals on those sequences. Arrays of sequences are defined in seq.h, while intervals and their arrays are still to be defined. Apart from data structures for intervals and their arrays, the program consists of the usual include section, declarations and definitions of functions, and finally the main function.

```
Program 2.1 (fur.c). \langle fur.c|8 \rangle \equiv #include "seq.h" \langle Include|headers, P. 2.1|10e \rangle \langle Data|structures, P. 2.1|10a \rangle \langle Function|declarations, P. 2.1|10d \rangle \langle Function|definitions, P. 2.1|11d \rangle
```

<sup>1</sup>https://github.com/haubold/makeFurDb/

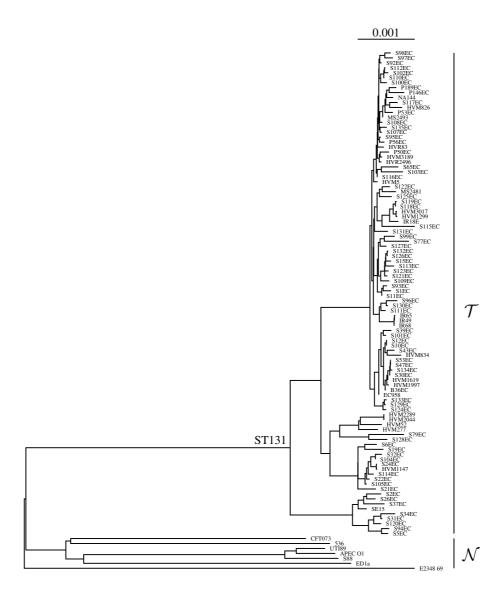


Figure 2.1: Phylogeny of 105 strains of *Eschericia coli* computed from whole genome sequences using and [2]. The scale bar is the number of substitutions per site. The clade marked ST131 contains the pathogenic targets  $(\mathcal{T})$ , the remaining seven strains are the neighbors  $(\mathcal{N})$ .

#### 2.2.1 Arrays of Intervals

Intervals and their arrays are the basic building blocks of fur still undefined, so they are defined first. Intervals have a start and an end.

```
10a
         \langle Data\ structures,\ P.\ 2.1\ 10a \rangle \equiv
                                                                                                 (8) 10b ⊳
            typedef struct intv {
              int s, e;
            } Intv;
             An arbitrary number of n intervals is stored in an interval array.
         \langle Data\ structures,\ P.\ 2.1\ 10a \rangle + \equiv
10b
                                                                                                 (8) ⊲ 10a
            typedef struct intvArr {
              Intv **arr;
              int n;
            } IntvArr;
             Interval arrays require functions for construction, freeing, and addition. Construc-
         tion is declared with start and end positions supplied as parameters.
         \langle Function \ declarations, P. 2.1 \ 10c \rangle \equiv
10c
                                                                                                 (8) 10f ⊳
            Intv *newIntv(int s, int e);
             These positions are saved once space has been allocated for them.
         \langle Function \ definitions, P. 2.1 \ 10d \rangle \equiv
10d
                                                                                                 (8) 10g ⊳
            Intv *newIntv(int s, int e) {
              Intv *i = (Intv *)emalloc(sizeof(Intv));
              i \rightarrow s = s;
              i \rightarrow e = e;
              return i;
            }
             The function emalloc is declared in error.h.
         \langle Include\ headers,\ P.\ 2.1\ 10e \rangle \equiv
10e
                                                                                                 (8) 11f⊳
            #include "error.h"
             Next, the construction of an interval array is declared.
         \langle Function \ declarations, P. 2.1 \ 10c \rangle + \equiv
                                                                                           (8) ⊲10c 10h⊳
10f
            IntvArr *newIntvArr();
             Its definition returns an empty array of intervals.
         \langle Function \ definitions, P. 2.1 \ 10d \rangle + \equiv
                                                                                           (8) ⊲10d 11a⊳
10g
            IntvArr *newIntvArr() {
              IntvArr *ia = (IntvArr *)emalloc(sizeof(IntvArr));
              ia->arr = NULL;
              ia->n = 0;
              return ia;
            }
             Freeing of an interval array is declared.
         \langle Function \ declarations, P. 2.1 \ 10c \rangle + \equiv
10h
                                                                                           (8) ⊲ 10f 11b⊳
            void freeIntvArr(IntvArr *ia);
```

In its definition each interval is freed in turn before the interval array itself is freed.

```
11a \langle Function\ definitions,\ P.\ 2.1\ 10d \rangle + \equiv void freeIntvArr(IntvArr *ia) {
	for (int i = 0; i < ia->n; i++)
	free(ia->arr[i]);
	free(ia->arr);
	free(ia);
}
```

Declare the addition of an interval to an existing interval array.

```
| 11b | \langle Function \ declarations, P. 2.1 \ 10c \rangle + \equiv | (8) \triangleleft 10h | void intvArrAdd(IntvArr *ia, Intv *i);
```

The definition makes space for the newly arrived interval and then adds it.

```
11c \langle Function\ definitions,\ P.\ 2.1\ 10d \rangle + \equiv void intvArrAdd(IntvArr *ia, Intv *i) { ia->arr = (Intv **) erealloc(ia->arr, (ia->n + 1) * sizeof(Intv *)); ia->arr[ia->n++] = i; }
```

Interval arrays are now ready to be used. This is done in the main function, which first interacts with the user, then analyzes the targets and neighbors, and finally prints the desired templates. At the end of the program, any memory still allocated is freed.

```
11d \langle Main function, P. 2.1 \text{ 11d} \rangle \equiv int main(int argc, char **argv) { \langle Interact \ with \ user, P. 2.1 \ 11e \rangle \langle Analyze \ sequences, P. 2.1 \ 12d \rangle \langle Print \ templates, P. 2.1 \ 12a \rangle } }
```

#### 2.2.2 User Interaction

Whenever the program interacts with the user, it identifies itself, so its name is set.

```
11e \langle Interact \ with \ user, P. \ 2.1 \ 11e \rangle \equiv (11d) 11g \triangleright setprogname(argv[0]);
```

The function setprogname is declared in the standard part of the BSD library.

```
11f \langle Include\ headers, P.\ 2.1\ 10e \rangle + \equiv (8) \triangleleft 10e 11h \triangleright #include \triangleleft 4b \triangleleft 5d/stdlib.h>
```

The user interaction is mediated via a container holding the options and their arguments.

```
11g \langle Interact \ with \ user, P. \ 2.1 \ 11e \rangle + \equiv (11d) \triangleleft 11e 12b\triangleright Args *args = getArgs(argc, argv);
```

The Args data structure and the getArgs function are declared in interface.h.

```
11h \langle Include\ headers,\ P.\ 2.1\ 10e \rangle + \equiv (8) \triangleleft 11f 15b\triangleright #include "interface.h"
```

The argument container is freed at the end.

```
12a \langle Free\ memory,\ P.\ 2.1\ 12a \rangle \equiv (11d) 13c \triangleright freeArgs(args);
```

The options passed via args might include a request for help, or indicate an error. In that case, printUsage, which is also declared in interface.h, emits a usage message before exiting.

```
12b \langle Interact \ with \ user, P. \ 2.1 \ 11e \rangle + \equiv (11d) \triangleleft 11g 12c \triangleright if (args->h || args->err) printUsage();
```

Alternatively, the user might request information about the program, whereupon it makes a modest splash and exits.

```
12c \langle Interact \ with \ user, P. \ 2.1 \ 11e \rangle + \equiv (11d) \triangleleft 12b if (args->v) printSplash(args);
```

#### 2.2.3 Find Unique Templates

Analysis of the targets and neighbors proceeds in three steps:

- Identify unique regions, U<sub>1</sub>, by comparing one representative target to all neighbors.
- 2. Intersect  $\mathcal{U}_1$  with the targets to get unique regions present in all targets,  $\mathcal{U}_2$ .
- 3. Subtract the neighbors from  $\mathcal{U}_2$  to get regions truly unique to the targets,  $\mathcal{U}_3$ . In theory, all regions in  $\mathcal{U}_2$  should be unique with respect to the neighbors, so  $\mathcal{U}_2 = \mathcal{U}_3$ . However, the construction of  $\mathcal{U}_1$  is less sensitive than the subtraction step. So in practice we have  $\mathcal{U}_2 \supset \mathcal{U}_3$ .

To summarize, a set of unique regions is created (step 1) and then reduced to ensure its sensitivity (step 2) and specificity (step 3) as markers of the targets.

```
12d \langle Analyze\ sequences,\ P.\ 2.1\ 12d \rangle \equiv \langle Identify\ unique\ regions,\ P.\ 2.1\ 12e \rangle \langle Intersect\ with\ targets,\ P.\ 2.1\ 18b \rangle \langle Subtract\ neighbors,\ P.\ 2.1\ 21d \rangle (11d)
```

Unique regions are identified using the external program macle<sup>2</sup> [6]. This operates by traversing a pre-computed index. The index is part of the fur database and contains the neighbors augmented by the representative target. This index is used to compute local complexity values for identifying unique intervals.

```
12e \langle Identify\ unique\ regions,\ P.\ 2.1\ 12e \rangle \equiv \langle Get\ representative\ target,\ P.\ 2.1\ 12f \rangle \langle Construct\ unique\ intervals,\ P.\ 2.1\ 14 \rangle (12d)
```

To obtain the representative target, its name is needed, which allows retrieval of its sequence.

```
12f \langle Get\ representative\ target,\ P.\ 2.1\ 12f \rangle \equiv char rn[256];

Seq *rs = NULL;

\langle Get\ representative\ name,\ P.\ 2.1\ 13a \rangle

\langle Get\ representative\ sequence,\ P.\ 2.1\ 13b \rangle
```

<sup>&</sup>lt;sup>2</sup>https://github.com/evolbioinf/macle

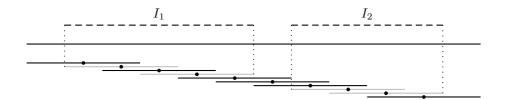


Figure 2.2: Sliding window analysis of a genome sequence. The overlapping windows are centered on their mid-points (dots) and their complexity is either greater than the threshold, which makes them unique (lightgray), or not (black). Unique windows are summarized into the unique intervals  $I_1$  and  $I_2$  (dashed).

The representative name is obtained from the macle index, where it tops the name list, an ordering is ensured by makeFurDb.

With the name as handle, the corresponding sequence is extracted from the BLAST database.

```
13b  ⟨Get representative sequence, P. 2.1 13b⟩≡
    tmpl = "blastdbcmd -entry %s -db %s/blastdb";
    sprintf(cmd, tmpl, rn, args->d);
    pp = epopen(cmd, "r");
    Seq *sp;
    while ((sp = getSeq(pp)) != NULL)
        rs = sp;
    pclose(pp);
(12f)
```

The representative target is freed at the end of the program.

```
13c \langle Free\ memory,\ P.\ 2.1\ 12a \rangle + \equiv (11d) \triangleleft 12a freeSeq(rs);
```

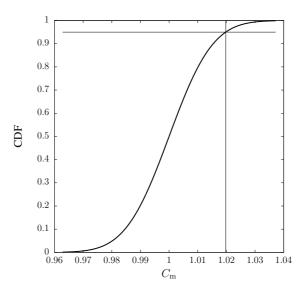


Figure 2.3: Cumulative distribution function (CDF) of the match complexity ( $C_{\rm m}$ ) in 500 bp windows over a 35.5 Mb data set with GC-content 0.5 [6]. The parameter choice corresponds to the neighbors depicted in Figure 2.1. The vertical line indicates the complexity threshold for a cumulative value of 0.95.

To construct unique intervals, the complexity threshold indicating uniqueness is computed as preparation for the sliding window analysis of local complexity. Figure 2.2 shows a cartoon of a sliding window analysis. The overlapping windows returned by macle are characterized by their mid-points (dots) and are either unique (lightgray) or not (black). Unique windows are summarized into unique intervals (dashed). The user is told about the size of the preliminary template set, and the array of unique intervals is eventually converted to an array of unique sequences, the template candidates.

The complexity threshold is a function of aggregate sequence length, GC-content, window length, and the inverse of the cumulative distribution function (CDF) of the match length null distribution. Figure 2.3 shows this function and how choosing a particular CDF-value on the y-axis, 0.95 in the example, corresponds to a complexity-threshold on the x-axis, 0.019. Sequence length and GC content are looked up in the macle index, window length and probability supplied by the user.

```
\langle Include\ headers,\ P.\ 2.1\ 10e \rangle + \equiv (8) \triangleleft 11h\ 20d \triangleright #include "matchLen.h"
```

A sliding window analysis by macle returns pairs of values,  $(m, C_{\rm m})$ , where m is the window midpoint and  $C_{\rm m}$  its complexity. Let t be the uniqueness threshold; if  $C_{\rm m} \geq t$ , the corresponding window is deemed unique. Such a window also belongs to a unique interval of one or more overlapping unique windows. As the algorithm parses the windows from left to right, it toggles between being inside or outside a unique interval.

```
| 15c | \langle Sliding\ window\ analysis,\ P.\ 2.1\ 15c \rangle \equiv \langle Prepare\ sliding\ window\ analysis,\ P.\ 2.1\ 16a \rangle  | while (fscanf(pp, "%f %f", &m, &c) != EOF) { \langle Determine\ window\ start\ and\ end,\ P.\ 2.1\ 16b \rangle if\ (in) { \langle Inside\ unique\ interval,\ P.\ 2.1\ 16c \rangle \rangle\ else\ { \langle Outside\ unique\ interval,\ P.\ 2.1\ 16d \rangle\ } \} \]
| pclose(pp);
```

15b

<sup>&</sup>lt;sup>3</sup>https://github.com/evolbioinf/matchLen

The sliding window analysis requires the opening of a pipe for reading macle output. The pipe command consists of three steps. The first calls macle, the second cuts the  $(m, C_{\rm m})$  pairs from the output, and the third removes windows without reliable sequence data, where  $C_{\rm m}=-1$ . In addition, the sliding window analysis requires variables for holding the current midpoint and complexity values, the interval array, and a variable to indicate whether the program is inside a unique interval or not.

The start and end points of a window are calculated roughly as  $m \pm w/2$ , where w is the window length. To get the borders exactly right, consider a sequence of length 100, for which macle prints a mid-point of 50. To recover the correct start and end positions of 1 and 100 from this, compute

```
start = m - w/2 + 1
end = m + w/2
```

Since positions in strings are zero-based, while macle output is one-based, the final start and end values are shifted by one position to the left.

```
16b \langle Determine\ window\ start\ and\ end,\ P.\ 2.1\ 16b \rangle \equiv int ws = m - args->w / 2; int we = m + args->w / 2 - 1;
```

If a unique *window* overlaps an existing unique *interval*, the interval is extended to the right (Figure 2.2). If the unique window lies beyond the existing interval, the interval is "closed" at the endpoint found in the last extension and added to the interval array. Note that the interval is *not* closed as soon as it cannot be extended. Such a rule would break up  $I_1$  in Figure 2.2 into two overlapping and hence redundant intervals.

If a unique window is found outside a unique interval, a new unique interval is created.

```
16d \langle Outside\ unique\ interval,\ P.\ 2.1\ 16d \rangle \equiv (15c)

if (c >= mc) {

in = 1;

is = m - args->w / 2;

ie = m + args->w / 2 - 1;

}
```

The result of the sliding window analysis is reported.

```
\langle Report\ result\ of\ sliding\ window\ analysis,\ P.\ 2.1\ 17a \rangle \equiv
17a
                                                                                   (14)
         int nn = 0, nm = 0;
          (Parse result of sliding window analysis, P. 2.1 17b)
         char *h1 = "# Step
                                                     Sequences Nucleotides "
            "Mutations (N)";
         char *h2 = "# -----
            "----":
         fprintf(stderr, "%s\n", h1, h2);
         tmpl = "# Sliding window
                                                    %6d
                                                             %8d
                                                                           %6d\n";
         fprintf(stderr, tmpl, ia->n, nn, nm);
```

The result of the sliding window analysis is parsed by looking at residue to count Ns and everything else.

The array of unique intervals is now converted to the corresponding array of sequences. The templates are numbered and the fragment coordinates are included in the headers. Once the templates have been written, the interval array is freed. For debugging purposes, the program can also print the unique sequences.

```
\langle Prepare\ array\ of\ unique\ sequences,\ P.\ 2.1\ 17c \rangle \equiv
17c
                                                                                         (14)
          SeqArr *sa = newSeqArr();
          char name[1024];
          for (int i = 0; i < ia->n; i++) {
             Intv *iv = ia->arr[i];
             sprintf(name, "template_%d %d-%d\n", i + 1, iv->s + 1,
                         iv -> e + 1);
             Seq *s = newSeq(name);
             ⟨Copy sequence data, P. 2.1 18a⟩
             seqArrAdd(sa, s);
          }
          freeIntvArr(ia);
          ⟨Print unique sequences? P. 2.1 17d⟩
            After printing the unique sequences, the program exits.
17d
        \langle Print\ unique\ sequences?\ P.\ 2.1\ 17d \rangle \equiv
                                                                                         (17c)
          if (args->u) {
             for (int i = 0; i < sa->n; i++)
               printSeq(stdout, sa->arr[i], -1);
             exit(0);
```

}

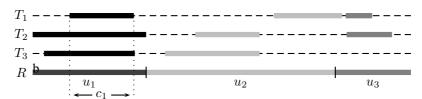


Figure 2.4: Intersect unique regions and targets. The three unique regions,  $\{u_1, u_2, u_3\}$  are concatenated to form the reference sequence, R. The target sequences,  $\{T_1, T_2, T_3\}$  are aligned to R and the gapped positions removed to leave the candidate templates. In this cartoon there is only one such candidate,  $c_1$ .

To copy the sequence data, memory is allocated, each nucleotide copied, and the sequence string terminated by the null character.

```
18a \langle Copy\ sequence\ data,\ P.\ 2.1\ 18a \rangle \equiv (17c) 
s->data = emalloc(iv->e - iv->s + 2); 
for (int j = iv->s; j <= iv->e; j++) 
s->data[s->l++] = rs->data[j]; 
s->data[s->l] = '\0';
```

The intervals in hand are candidates for template sequences. But before they are printed, they are reduced to those regions present in all targets and absent from all neighbors.

#### 2.3 Intersect with Targets

At this point the template candidates come from a single target sequence, the representative. To ensure they also occur in all other targets, the templates are intersected with the remaining targets using a second external program, phylonium [4]. Phylonium takes as input a set of sequences, one of which is designated the reference. In the context of fur, the reference is made up of the template candidates just identified. All contigs of the reference are concatenated. For example, in Figure 2.4 the reference, R, consists of three unique candidate regions,  $u_1$ ,  $u_2$ , and  $u_3$ . The remaining targets— $T_1$ ,  $T_2$ , and  $T_3$  in the example—get aligned to R. Region  $u_1$  now has overlapping matches from all three targets, region  $u_2$  has matches from the three targets, but only those from  $T_2$  and  $T_3$  overlap, and region  $u_3$  has no match from  $T_3$ . The intersection between R and  $T_1$ – $T_3$  is formed by removing all positions with gaps, resulting in one template candidate,  $c_1$ .

```
| 18b | \langle Intersect \ with \ targets, P. \ 2.1 \ 18b \rangle \equiv \langle Write \ templates \ to \ file, P. \ 2.1 \ 19a \rangle  | \langle Write \ targets \ to \ files, P. \ 2.1 \ 19b \rangle | \langle Run \ phylonium, P. \ 2.1 \ 19d \rangle | \langle Delete \ template \ and \ target \ files, P. \ 2.1 \ 21a \rangle | \langle Report \ result \ of \ intersection, P. \ 2.1 \ 21b \rangle | \langle Print \ ubiquitous \ templates \ and \ exit? P. \ 2.1 \ 21c \rangle
```

The templates are written to the file r.fasta inside the database directory by iterating across the template array and printing headers and sequences.

```
19a \langle Write\ templates\ to\ file,\ P.\ 2.1\ 19a \rangle \equiv (18b) tmpl = "%s/r.fasta"; sprintf(name, tmpl, args->d); FILE *fp = efopen(name, "w"); for (int i = 0; i < sa->n; i++) printSeq(fp, sa->arr[i], -1); fclose(fp);
```

The remaining targets are read from the BLAST database and written to individual files inside the database array. The program blastdbcmd, which is part of the BLAST package, allows access to BLAST databases. This adds a blank to the end of each header, which we remove again to ensure accurate identification later.

```
19b \langle \textit{Write targets to files}, \textit{P. 2.1 19b} \rangle \equiv (18b)

in = 1;

tmpl = "blastdbcmd -entry all -db %s/blastdb | sed 's/ $//'";

sprintf(cmd, tmpl, args->d);

pp = epopen(cmd, "r");

\langle \textit{Iterate across BLAST database}, \textit{P. 2.1 19c} \rangle

pclose(pp);
```

When iterating across the BLAST database, we avoid neighbors and the target representative.

To run phylonium, we construct and execute the appropriate command, then save the results. These consist of a set of FASTA entries with headers containing information about mutations in the fragments. The mutations are marked in the sequences to inform primer construction later.

```
19d \langle Run \text{ phylonium, } P. \ 2.1 \ 19d \rangle \equiv \langle Construct \ and \ execute \ phylonium \ command, \ P. \ 2.1 \ 19e \rangle \langle Save \ phylonium \ results, \ P. \ 2.1 \ 20a \rangle \langle Mark \ mutations, \ P. \ 2.1 \ 20b \rangle (18b)
```

Phylonium is applied to the target files just constructed. It writes the intersection to the file p. fasta. All output to stdout or stderr is discarded.

```
19e ⟨Construct and execute phylonium command, P. 2.1 19e⟩≡ (19d)

tmpl = "phylonium -p %s/p.fasta -r %s/r.fasta %s/*.fasta "

"> /dev/null 2> /dev/null";

sprintf(cmd, tmpl, args->d, args->d);

if (system(cmd) < 0)

error("couldn't run system call %s\n", cmd);
```

The intersecting sequence fragments in p. fasta are saved if long enough.

```
20a
        \langle Save \text{ phylonium } results, P. 2.1 \text{ 20a} \rangle \equiv
                                                                                         (19d)
          sprintf(name, "%s/p.fasta", args->d);
          fp = efopen(name, "r");
          freeSegArr(sa);
          sa = newSegArr();
          while ((sp = getSeq(fp)) != NULL)
             if (sp->l >= args->n)
               seqArrAdd(sa, sp);
             else
               freeSeq(sp);
          fclose(fp);
           Phylonium returns entries of the form
```

```
>part_i (s..e) n p_1 p_2 ... p_n
```

where n is the number of mutations found at positions  $p_1, p_2, ..., p_n$ . These positions are set to the unknown nucleotide, N, so they can later be avoided when designing primers.

```
\langle Mark \ mutations, P. \ 2.1 \ 20b \rangle \equiv
20b
                                                                                                     (19d)
            for (int i = 0; i < sa->n; i++) {
               (Determine the number of mutations, P. 2.1 20c)
               (Iterate across mutations, P. 2.1 20e)
            }
```

The number of mutations is found by looking for the closing bracket of the fragment's interval. Using the -x option, the user can request only exact matches.

```
\langle Determine\ the\ number\ of\ mutations,\ P.\ 2.1\ 20c \rangle \equiv
20c
                                                                                       (20b)
          char *h = strstr(sa->arr[i]->name, ")");
          h += 2;
          int j = atoi(strtok(h, " "));
          if (j == 0) {
            continue;
          } else if (args->x) {
             freeSeq(sa->arr[i]);
             sa->arr[i] = NULL;
             continue;
          }
```

The functions strstr for looking up the first occurrence of a character and strtok to iterate across string tokens are both declared in string.h.

```
20d
          \langle Include\ headers,\ P.\ 2.1\ 10e \rangle + \equiv
                                                                                                         (8) ⊲15b 22f⊳
              #include <string.h>
```

All integers following the number of mutations are one-based positions.

```
\langle Iterate\ across\ mutations,\ P.\ 2.1\ 20e \rangle \equiv
20e
                                                                                           (20b)
           char *t = strtok(NULL, " ");
          while (t != NULL) {
             int p = atoi(t) - 1;
             sa->arr[i]->data[p] = 'N';
             t = strtok(NULL, " ");
           }
```

```
The files used by phylonium are deleted.
```

```
\langle Delete \ template \ and \ target \ files, P. 2.1 \ 21a \rangle \equiv
21a
                                                                                          (18b)
           tmpl = "rm %s/*.fasta";
           sprintf(cmd, tmpl, args->d);
           if (system(cmd) < 0)
             error("couldn't run system call %s\n", cmd);
           The user is told about the number of sequences, nucleotides, and Ns in the targets.
21b
        \langle Report\ result\ of\ intersection,\ P.\ 2.1\ 21b \rangle \equiv
                                                                                          (18b)
           int ns = 0;
          nn = nm = 0;
           for (int i = 0; i < sa->n; i++) {
             if (!sa->arr[i]) continue;
             for (int j = 0; j < sa->arr[i]->l; j++)
               if (sa->arr[i]->data[j] == 'N') nm++;
               else nn++;
           }
          tmpl = "# Presence in targets
                                                         %6d
                                                                  %81d
                                                                                   %6d\n";
           fprintf(stderr, tmpl, ns, nn, nm);
           The ubiquitous templates can be inspected.
        \langle Print \ ubiquitous \ templates \ and \ exit? P. 2.1 \ 21c \rangle \equiv
21c
                                                                                          (18b)
           if (args->U) {
             for (int i = 0; i < sa->n; i++)
               if (sa->arr[i])
                    printSeq(stdout, sa->arr[i], -1);
```

#### 2.4 Subtract Neighbors

exit(0);

Any neighbor sequences still present among the remaining templates are removed (subtracted) using a third external program, blastn [1]. The candidate templates are searched in the BLAST database and the hits written to file. This file is read back into fur, and the regions with homologs among the neighbors are again set to N, unless the "exact" option, -x, is set.

```
21d \langle Subtract\ neighbors,\ P.\ 2.1\ 21d \rangle \equiv \langle Search\ neighbors,\ P.\ 2.1\ 21e \rangle  \langle Mark\ regions\ found\ among\ neighbors,\ P.\ 2.1\ 22c \rangle  \langle Report\ result\ of\ subtraction,\ P.\ 2.1\ 23d \rangle
```

The neighbors are searched by constructing the blastn pipe and then running the neighbor sequences through it.

```
21e \langle Search \ neighbors, P. \ 2.1 \ 21e \rangle \equiv \langle Construct \ neighbor \ pipe, P. \ 2.1 \ 22a \rangle \langle Write \ templates \ to \ neighbor \ pipe, P. \ 2.1 \ 22b \rangle (21d)
```

In the neighbor pipe we write the subject accession and query coordinates to the output file, o.txt, inside the database directory.

The template candidates are written to this pipe with their index numbers as identifiers.

```
22b \langle Write\ templates\ to\ neighbor\ pipe,\ P.\ 2.1\ 22b \rangle \equiv for (int i = 0; i < sa->n; i++) if (sa->arr[i]) fprintf(pp, ">%d\n%s\n", i, sa->arr[i]->data); pclose(pp);
```

BLAST may return overlapping regions. These are summarized before marking them.

```
22c ⟨Mark regions found among neighbors, P. 2.1 22c⟩≡ tmpl = "%s/o.txt";
sprintf(name, tmpl, args->d);
fp = efopen(name, "r");
⟨Summarize neighbor BLAST output, P. 2.1 22d⟩
fclose(fp);
⟨Set homologous neighbor regions to N, P. 2.1 23b⟩
⟨Free BLAST resources, P. 2.1 23c⟩
```

To summarize the output of the BLAST search among neighbors, space for the results is created before the results themselves are scanned.

```
22d \langle Summarize\ neighbor\ BLAST\ output,\ P.\ 2.1\ 22d \rangle \equiv \langle Allocate\ space\ for\ output\ of\ neighbor\ BLAST,\ P.\ 2.1\ 22e \rangle \langle Scan\ output\ of\ neighbor\ BLAST,\ P.\ 2.1\ 23a \rangle (22c)
```

We allocate space for the start and end positions of each homologous regions and initialize these to values that allow us to later summarize overlapping intervals.

```
22e \langle Allocate\ space\ for\ output\ of\ neighbor\ BLAST,\ P.\ 2.1\ 22e \rangle \equiv int\ *start = emalloc(sa->n\ *\ sizeof(int)); int\ *end = emalloc(sa->n\ *\ sizeof(int)); for\ (int\ i = 0;\ i < sa->n;\ i++) \{ start[i] = INT_MAX; end[i] = -1; \}
```

INT\_MAX is the maximum value an integer may take and is defined in limits.h.

```
22f \langle Include\ headers,\ P.\ 2.1\ 10e \rangle + \equiv (8) \triangleleft 20d #include <1imits.h>
```

During the scan of the BLAST output, intervals are extended to the left and the right.

The regions with homology among the neighbors are set to N, bearing in mind that BLAST-coordinates are 1-based, character arrays 0-based. As the arrays with the start and end coordinates are not needed any more afterwards, they are freed.

The resources used up by the BLAST run, the output file and the arrays of start and end positions, are freed again.

```
23c  \langle Free BLAST resources, P. 2.1 23c \rangle \end{align*} 
tmpl = "rm %s/o.txt";
sprintf(cmd, tmpl, args->d);
if (system(cmd) < 0) {
    fprintf(stderr, "couldn't run system call %s\n", cmd);
    exit(0);
}
free(start);
free(end);</pre>
```

In order to report the results of the subtraction step, we iterate over all residues in all sequences and count the number of mutations. At this point we can also classify the sequences into those fit for subsequent analysis and those that aren't.

```
23d \langle Report\ result\ of\ subtraction,\ P.\ 2.1\ 23d \rangle \equiv nn = nm = ns = 0;

for (int i = 0; i < sa->n; i++) {

   if (!sa->arr[i]) continue;

   \langle Count\ mutations,\ P.\ 2.1\ 24a \rangle

   \langle Classify\ sequences,\ P.\ 2.1\ 24b \rangle

}

tmpl = "# Absence from neighbors %6d %8ld %6d\n";

fprintf(stderr, tmpl, ns, nn, nm);
```

The mutations are counted by again looking at every residue in the current result set. An N is counted as a mutation, everything else as a nucleotide.

```
\langle Count \ mutations, P. \ 2.1 \ 24a \rangle \equiv
24a
                                                                                             (23d)
           int cn = 0, cm = 0;
           for (int j = 0; j < sa->arr[i]->1; j++)
              if (sa->arr[i]->data[j] == 'N')
                cm++;
              else
                cn++;
            Sequences are classified as fit for printing if they contain enough nucleotides.
        \langle Classify\ sequences,\ P.\ 2.1\ 24b \rangle \equiv
24b
                                                                                             (23d)
           if (cn \ge args - n) {
             ns++;
             nm += cm;
             nn += cn;
           } else {
              freeSeq(sa->arr[i]);
              sa->arr[i] = NULL;
           }
            The last step in fur is to print the template sequences just identified.
        \langle Print\ templates,\ P.\ 2.1\ 24c \rangle \equiv
24c
                                                                                             (11d)
           for (int i = 0; i < sa->n; i++)
             if (sa->arr[i])
                printSeq(stdout, sa->arr[i], -1);
           freeSeqArr(sa);
```

Fur is now ready to be used.

## **Chapter 3**

# Compute the Sensitivity and Specificity of fur, senSpec

#### 3.1 Introduction

Given a set of templates proposed by fur, we'd like to know how many of the nucleotides were found among the targets compared to how many should have been found. This is called the *sensitivity* [3, p. 121f]:

$$S_{\rm n} = \frac{t_{\rm p}}{t_{\rm p} + f_{\rm n}},\tag{3.1}$$

where  $t_{\rm p}$  is the number of true positives—the number of nucleotides hit—and  $f_{\rm n}$  the number of targets that should have been but weren't.

We'd also like to compare the number of nucleotides in target hits to the number of nucleotides in neighbor hits, which is called the *specificity*:

$$S_{\mathbf{p}} = \frac{t_{\mathbf{p}}}{t_{\mathbf{p}} + f_{\mathbf{p}}},\tag{3.2}$$

where  $f_p$  is the number false positive nuleotides.

 $S_{\rm n}$  and  $S_{\rm p}$  are bounded by 0 and 1, the greater they both are, the better. However, there is no gain in maximizing just one of them at the expense of the other, so their correlation is often used to measure classification accuracy [3, p. 122]:

$$C = \frac{t_{\rm p}t_{\rm n} - f_{\rm p}f_{\rm n}}{\sqrt{(t_{\rm p} + f_{\rm p})(t_{\rm n} + f_{\rm n})(t_{\rm n} + f_{\rm p})(t_{\rm p} + f_{\rm n})}}.$$
(3.3)

C ranges between -1 and 1, with 1 indicating perfect classification—all targets and no neighbors are hit—0 indicates no discrimination, and -1 perfect anti-classification, where all neighbors are hit and no targets. When comparing the results of a fur run to the underlying database, the sensitivity, the specificity, and their correlation should be 1

#### 3.2 Implementation

The program senSpec takes as input a query consisting of the set of template sequences computed by fur and a fur database. It returns the specificity, sensitivity, and correlation of that fur run.

Initially the user is prompted for input, before the query lengths are saved. Then the number of targets and neighbors is computed. This is followed by counting the true positive nucleotides,  $t_{\rm p}$ , and their complement, the false negative nucleotides,  $f_{\rm n}$ . Then we count the false positive nucleotides,  $f_{\rm p}$ , and their complement, the true negative nucleotides,  $t_{\rm n}$ . At the end, the sensitivity,  $S_{\rm n}$ , the specificity,  $S_{\rm p}$ , and their correlation, C, are printed.

#### Program 3.1 (senSpec).

```
26  ⟨senSpec 26⟩≡

#!/usr/bin/awk -f

BEGIN {

⟨Interact with user, P. 3.1 27a⟩

⟨Save query lengths, P. 3.1 27b⟩

⟨Count targets, P. 3.1 27c⟩

⟨Count neighbors, P. 3.1 27d⟩
```

```
\langle Compute\ t_{\rm p}\ and\ f_{\rm n},\ P.\ 3.1\ 27e \rangle
               \langle Compute f_p \text{ and } t_n, P. 3.1 \text{ 29b} \rangle
               \langle Print S_n, S_p, and C, P. 3.1 29e \rangle
             The user is prompted for a set of query sequences and the name of a fur database.
27a
         \langle Interact \ with \ user, P. \ 3.1 \ 27a \rangle \equiv
                                                                                                      (26)
            defEvalue = 1e-5
            if (!query || !db) {
               print "Usage: senSpec -v query=<query.fasta> -v db=<furDb>"
               printf "\t[-v evalue=<evalue>; default: %.1e]\n", defEvalue
               exit
            }
            if (!evalue)
               evalue = defEvalue
             The query lengths are saved by traversing the query file.
         \langle Save\ query\ lengths,\ P.\ 3.1\ 27b \rangle \equiv
27b
                                                                                                      (26)
            cmd = "cat " query
            while (cmd | getline) {
               if (/^>/) {
                 h = $1;
                 sub(">", "", h)
                 ql[h] = 0
               } else
                 ql[h] += length(\$0)
            }
             The targets are counted by filtering for them in the BLAST part of the fur database.
27c
         \langle Count \ targets, P. \ 3.1 \ 27c \rangle \equiv
                                                                                                      (26)
            tmpl = "blastdbcmd -entry all -db %s/blastdb | grep -c '^>%s'"
            cmd = sprintf(tmpl, db, "t")
            cmd | getline
            nt = $1
            close(cmd)
             The neighbors are counted in a similar way.
27d
         \langle Count \ neighbors, P. 3.1 \ 27d \rangle \equiv
                                                                                                      (26)
            cmd = sprintf(tmpl, db, "n")
            cmd | getline
            nn = $1
            close(cmd)
             To count the true positive and false negative nucleotides, we run a BLAST and
         traverse its results before computing the individual statistics.
         \langle Compute\ t_{\rm p}\ and\ f_{\rm n},\ P.\ 3.1\ 27e \rangle \equiv
27e
                                                                                                      (26)
            (Construct BLAST command, P. 3.1 28a)
            ⟨Traverse BLAST results, P. 3.1 28b⟩
            \langle Compute \ t_D, P. \ 3.1 \ 28d \rangle
            \langle Compute f_n, P. 3.1 29a \rangle
```

The BLAST search returns four values:

- 1. sacc: Subject accession
- 2. qacc: Query accession
- 3. qstart: Query start in alignment
- 4. qlen: Query end in alignment

They are first filtered for *targets* and then sorted by subject, query, and query start, in that order.

```
28a \langle Construct\ BLAST\ command,\ P.\ 3.1\ 28a \rangle \equiv tmpl = "blastn -outfmt \"6 sacc qacc qstart qend\" " tmpl = tmpl "-task blastn -query %s -db %s/blastdb -evalue %s " tmpl = tmpl "| awk '$1 ~ /^%s/' " tmpl = tmpl "| sort -k 1,1 -k 2,2 -k 3,3n" cmd = sprintf(tmpl, query, db, evalue, "t")
```

During traversal of the BLAST results, we sum the number of nucleotides hit one or more times in the subject.

```
28b \langle Traverse\ BLAST\ results,\ P.\ 3.1\ 28b \rangle \equiv (27e 29b)

s = 0 qstart = 0 qend = -1 while (cmd | getline) { \langle Analyze\ BLAST\ hit,\ P.\ 3.1\ 28c \rangle } close(cmd)
```

Each BLAST hit either extends an existing interval on the query or starts a new interval. Starting a new interval implies closure of a previous one, at which point the number of nucleotides contained in that interval is added to the sum.

```
28c  \( \langle Analyze BLAST hit, P. 3.1 28c \rangle \) if (sacc == $1 && qacc == $2) {
    if ($3 <= qend && $4 > qend)
        qend = $4
    } else {
        s += qend - qstart + 1
        sacc = $1
        qacc = $2
        qstart = $3
        qend = $4
    }
```

To compute the final value of  $t_{\rm p}$ , we take the sum so far and add the nucleotides from the last BLAST hit.

```
28d \langle Compute\ t_p, P.\ 3.1\ 28d \rangle \equiv (27e)

tp = s + qend - qstart + 1
```

The count of false negatives nucleotides is the difference between the observed  $t_{\rm p}$  and its maximum value.

```
29a \langle Compute\ f_n,\ P.\ 3.1\ 29a \rangle \equiv for (a in ql) m \ += \ ql[a] \ * \ nt fn = m \ - \ tp (27e)
```

To compute the false positive and true negative nucleotides, we first construct the BLAST command to filter for *neighbors*, parse its results, and then compute the desired quantities.

```
29b \langle Compute\ f_{\rm p}\ and\ t_{\rm n},\ P.\ 3.1\ 29b \rangle \equiv cmd = sprintf(tmpl, query, db, evalue, "n") \langle Traverse\ BLAST\ results,\ P.\ 3.1\ 28b \rangle \langle Compute\ f_{\rm p},\ P.\ 3.1\ 29c \rangle \langle Compute\ t_{\rm n},\ P.\ 3.1\ 29d \rangle
```

The false positive nucleotides are the sum coming out of the traversal of the BLAST results plus the nucleotides in the last hit.

29c 
$$\langle Compute \ f_p, P. \ 3.1 \ 29c \rangle \equiv$$
 (29b) fp = s + qend - qstart + 1

The true negatives are the difference to the maximum value  $f_{\rm p}$  could take.

```
29d \langle Compute\ t_n,\ P.\ 3.1\ 29d \rangle \equiv (29b)  m = \emptyset  for (a in ql)  m += \ ql[a] \ * \ nn   tn = m - fp
```

Now we use equation (3.1) to compute the sensitivity, equation (3.2) for the specificity, and equation (3.3) for their correlation.

```
29e \langle Print \, S_n, \, S_p, \, and \, C, \, P. \, 3.1 \, 29e \rangle \equiv (26) 

sn = tp / (tp + fn) 

sp = tp / (tp + fp) 

d = tp * tn - fp * fn 

n = (tp + fp) * (tn + fn) * (tn + fp) * (tp + fn) 

n = sqrt(n) 

c = d / n 

print \, "\#S_n \ S_p \ C
```

# **Chapter 4**

Convert Unique Regions to Input for primer3, fur2prim

#### 4.1 Introduction

Primers are designed in several steps. First, fur identifies diagnostic regions in a template sequence. Then a program for designing primers, for example primer3 is used to find primer pairs in the diagnostic regions. However, converting the output of fur to primer3 input can be tricky and fur2prim is designed to automate this.

## 4.2 Implementation

fur2prim reads fur output and prints a text file for driving a primer3 run. The program first prints a usage message, if so desired, and then the primer3 input.

```
Program 4.1 (fur2prim).

32a ⟨fur2prim 32a⟩≡
#!/usr/bin/awk -f
BEGIN {
⟨Print usage, P. 4.1 32b⟩
}
{
⟨Parse template sequence, P. 4.1 33a⟩
}
END {
⟨END action, P. 4.1 34d⟩
```

There is no mandatory input, but there are a number of parameters like oligo and product length, and melting temperature to be specified as we work through the implementation. These can be specified by the user or left in their default state.

```
32b  ⟨Print usage, P. 4.1 32b⟩ ≡
  ⟨Define default parameter values, P. 4.1 33e⟩
  if (h || help) {
    print "fur2prim: Convert fur output to primer3 input"
    print "Usage: fur2prim furOutput.fasta"
    ⟨Query parameter values, P. 4.1 34a⟩
    ex = 1
    exit
  }
  ⟨Assign parameter values, P. 4.1 34b⟩
```

The fur output consists of FASTA formatted unique regions extracted from the target representative. For each unique region a primer3 entry is printed terminated by =.

```
33a  ⟨Parse template sequence, P. 4.1 33a⟩ ≡ (32a)

if (/^>/) {

if (n) {

⟨Print primer3 input, P. 4.1 33b⟩

print "="

}

seq = ""

n++

} else

seq = seq $0
```

The input for primer3 consists of two parts, one constant, the other variable.

```
33b \langle Print \text{ primer3 } input, P. 4.1 \text{ 33b} \rangle \equiv \langle Print \text{ constant primer3 } input, P. 4.1 \text{ 33c} \rangle \langle Print \text{ variable primer3 } input, P. 4.1 \text{ 33d} \rangle (33a 34d)
```

In the constant input we request the construction of pairs of primers, each augmented by an internal oligo.

```
33c ⟨Print constant primer3 input, P. 4.1 33c⟩≡ (33b)

print "PRIMER_TASK=generic"

print "PRIMER_PICK_LEFT_PRIMER=1"

print "PRIMER_PICK_RIGHT_PRIMER=1"

print "PRIMER_PICK_INTERNAL_OLIGO=1"
```

The variable input concerns first of all the primer and product size.

```
33d ⟨Print variable primer3 input, P. 4.1 33d⟩≡ (33b) 34c⊳

printf "PRIMER_MIN_SIZE=%d\n", primMinSize
printf "PRIMER_MAX_SIZE=%d\n", primMaxSize
printf "PRIMER_PRODUCT_SIZE_RANGE=%d-%d\n", prodMinSize, prodMaxSize
printf "PRIMER_MIN_TM=%.1f\nf", primMinTm
printf "PRIMER_MAX_TM=%.1f\n", primMaxTm
printf "PRIMER_INTERNAL_MIN_TM=%.1f\n", inMinTm
printf "PRIMER INTERNAL_MAX_TM=%.1f\n", inMaxTm
```

At the beginning of the program these parameters are given default values.

```
33e ⟨Define default parameter values, P. 4.1 33e⟩≡
defPrimMinSize = 15
defPrimMaxSize = 25
defProdMinSize = 70
defProdMaxSize = 150
defPrimMinTm = 54
defPrimMaxTm = 58
defInMinTm = 43
defInMaxTm = 47
```

Later, they are queried.

Any as yet undefined parameter is assigned its default value.

```
34b  ⟨Assign parameter values, P. 4.1 34b⟩≡
    if (!primMinSize) primMinSize = defPrimMinSize
    if (!primMaxSize) primMaxSize = defPrimMaxSize
    if (!prodMinSize) prodMinSize = defProdMinSize
    if (!prodMaxSize) prodMaxSize = defProdMaxSize
    if (!primMinTm) primMinTm = defPrimMinTm
    if (!primMaxTm) primMaxTm = defPrimMaxTm
    if (!inMinTm) inMinTm = defInMinTm
    if (!inMaxTm) inMaxTm = defInMaxTm
```

As the last step in the construction of the input for primer3, the template sequence is appended.

```
34c \langle Print \ variable \ primer3 \ input, P. 4.1 \ 33d \rangle + \equiv (33b) \triangleleft 33d printf "SEQUENCE_TEMPLATE=%s\n", seq
```

When the program enters the END block, it might do so after an exit in the BEGIN block. In that case it exits again. Otherwise, the last entry is printed, unless there was no input.

```
34d \langle END\ action,\ P.\ 4.1\ 34d \rangle \equiv (32a) if (ex) exit if (n) { \langle Print\ primer3\ input,\ P.\ 4.1\ 33b \rangle print "=" }
```

# **Chapter 5**

# Extract Primers from primer3 Output, prim2fasta

#### 5.1 Introduction

The program primer3 generates output in its own format. However, primer sequences are subsequently often checked using BLAST, which requires input in FASTA format. The program prim2fasta extracts primer pairs from primer3 output and writes each pair in a separate file for subsequent checking.

## 5.2 Implementation

The program requests the base name of the output files, b, and then prints each primer-pair in a file called b1.fasta, b2.fasta, and so on.

```
Program 5.1 (prim2fasta).

\langle prim2fasta \ 36a \rangle \equiv
#!/usr/bin/awk -f
```

```
BEGIN {

⟨Request base name, P. 5.1 36b⟩
}
⟨Extract forward primer, P. 5.1 36c⟩
⟨Extract reverse primer, P. 5.1 37⟩
```

If no base name is supplied, the user is prompted for one.

```
36b ⟨Request base name, P. 5.1 36b⟩≡ (36a)

if (!file) {

print "prim2fasta: Extract primer sequences from primer3 output"

print "Usage: prim2fasta -v file=<fileBaseName> primer3.out"

exit
}
```

The forward primer is reported as, for example

```
PRIMER_LEFT_0_SEQUENCE=TTCTGTATCGTTTCTCCA
```

It is printed before the reverse primer, so encountering a forward primer opens a new file.

```
36c ⟨Extract forward primer, P. 5.1 36c⟩≡

/PRIMER_LEFT_.*_SEQUENCE/ {

n++

f = file n ".fasta"

print "Writing", f

printf ">f%d\n", n > f

split($1, a, "=")

printf "%s\n", a[2] >> f

(36a)
```

The reverse primer is extracted in a similar way, except that now the output file is closed rather than opened.

```
37 \langle Extract\ reverse\ primer,\ P.\ 5.1\ 37 \rangle \equiv (36a) 
 /PRIMER_RIGHT_.*_SEQUENCE/ \{ printf\ ">r%d\n",\ n >> f 
 split(\$1,\ a,\ "=") 
 printf\ "%s\n",\ a[2] >> f 
 close(f) }
```

# **Chapter 6**

Check Primers, checkPrim

#### 6.1 Introduction

PCR primers designed to amplify a specific region may also unintentionally amplify other regions in the same genome or in the genomes of other organisms. To guard against such off-target amplification, primers are compared to a suitable sequence database and all potential amplification products in a particular set of organisms reported. There already exists an excellent web-based program to do this, Primer-BLAST. Intended foremost as a tool for designing primers from scratch, it also contains a module for checking primer specificity. However, running programs over the internet is usually less convenient than running them locally. Our aim is therefore to write a stand-alone version of this module, checkPrim.

## **6.2** Implementation

checkPrim takes as input a set of primers, a BLAST database, and an organism identified by an NCBI taxon-id. It returns the virtual PCR products, or amplicons, found in members of that taxon. It can also do the opposite, return the amplicons found outside the members of the focal taxon.

The program first switches the field separator from default white space to tab. It then interacts with the user, sets optional parameters to their default values, and constructs the BLAST command for looking up the primer matches. It then searches these matches for potential amplicons.

#### Program 6.1 (checkPrim).

```
40 ⟨checkPrim 40⟩≡
#!/usr/bin/awk -f
BEGIN {
FS = "\t"
⟨Interact with user, P. 6.1 41a⟩
⟨Set default values of optional parameters, P. 6.1 41d⟩
⟨Construct BLAST command, P. 6.1 42a⟩
⟨Save BLAST results, P. 6.1 42b⟩
⟨Analyze BLAST results, P. 6.1 43b⟩
}
```

The user is asked to supply three parameters: A file containing one or more primers (query), a BLAST database (db), and a taxon-id that is interpreted either as the target (taxid) or its complement (negativeTaxid). If one of them is not supplied, a usage message is printed prompting for complete input. In addition, optional parameters can be set.

There are also optional parameters: The maximum number of mismatches (maxMism), the maximum length of an amplicon (maxLen), the number of threads used by BLAST (numThreads), and the E-value (evalue). I took the default maximum number of mismatches and the maximum amplicon size from the Primer-BLAST website, and the E-value from the documentation of stand-alone blastn.

```
41b \langle Initialize\ default\ values\ of\ optional\ parameters,\ P.\ 6.1\ 41b \rangle \equiv  (41a) defMaxMism = 5 defMaxLen = 4000 defNumThreads = 1 defEvalue = 10
```

The optional parameters are queried using the standard -v notation of AWK.

```
41c \langle Query\ optional\ parameters,\ P.\ 6.1\ 41c \rangle \equiv printf "[-v maxMism=<maxMism>; default: %d]\n", defMaxMism printf "[-v maxLen=<maxLen>; default: %d]\n", defMaxLen printf "[-v numThreads=<numThreads>; default: %d]\n", defNumThreads printf "[-v evalue=<evalue>; default: %d]\n", defEvalue
```

Any undefined optinal parameters are set to their default values.

```
41d ⟨Set default values of optional parameters, P. 6.1 41d⟩≡

if (!maxMism)

maxMism = defMaxMism

if (!maxLen)

maxLen = defMaxLen

if (!numThreads)

numThreads = defNumThreads

if (!evalue)

evalue = defEvalue
```

The BLAST search is based on the blastn-short mode of the blastn program. This mode is optimized for sequences shorter than 50 nucleotides. Five aspects of each BLAST hit are saved: The query and subject accessions, the number of mismatches, the start and end positions on the subject, and two items of taxonomic information on the subject: the taxon id and its scientific name. In addition, we set the outfmt option such that the lengths of the query and the alignment are printed. This allows us filter for full-length matches. By default, BLAST results are sorted first by the input order of the query—all matches of the first query followed by all matches to the second, and so on—and then by their subject position. For identifying spurious amplicons, it is more convenient to group the results by subject and then sort by position within each subject.

```
\langle Construct \ BLAST \ command, \ P. \ 6.1 \ 42a \rangle \equiv
42a
          tmpl = "blastn -task blastn-short -query %s -db %s -outfmt "
          tmpl = tmpl "\"6 gacc sacc mismatch sstart send staxid ssciname "
          tmpl = tmpl "qlen length\" -num_threads %d -evalue %d "
          if (taxid)
            tmpl = tmpl "| awk '$6 == \"%s\"' "
          else {
            taxid = negativeTaxid
            tmpl = tmpl "| awk '$6 != \"%s\"' "
          tmpl = tmpl "| awk '$3 <= %d && $8 == $9'"
          tmpl = tmpl "| sort -k 2,2 -k 4,4n"
          cmd = sprintf(tmpl, query, db, numThreads, evalue, taxid, maxMism)
           The BLAST command is run and the results are saved.
       \langle Save\ BLAST\ results,\ P.\ 6.1\ 42b \rangle \equiv
                                                                                   (40)
42b
          n = 1 - 1
          while (cmd | getline) {
            qacc[n] = $1
            sacc[n] = $2
            staxid[n] = $6
            ssciname[n] = $7
            (Decide strand, P. 6.1 43a)
            n++
          }
          close(cmd)
```

 $p_{\rm f}$ 

```
5'—TGACCGCCAATATTGCCAGT—3'
                    5'—TTCTTACGGGGAGACGCAAC—3'
               p_{\rm r}
5'→
            TGACCGCCAATATTGCCAGT
                                                                            \rightarrow 3
            TGACCGCCAATATTGCCAGT
                                            GTTGCGTCTCCCCGTAAGAA
                                                                             →3'
3'←
            ACTGGCGGTTATAACGGTCA
                                                                            ←5'
                                            CAACGCAGAGGGGCATTCTT
3'←
                                                                            ←5′
```

CAACGCAGAGGGGCATTCTT

Figure 6.1: Forward and reverse PCR primers,  $p_{\rm f}$  and  $p_{\rm r}$ , along the forward or reverse strands of a template,  $t_{\rm f}$  and  $t_{\rm r}$ .

DNA is double-stranded and all PRC reactions take double-stranded DNA as template, regardless of the actual nucleotide molecule investigated. To visualize the primer configuration we are looking for in our BLAST search, consider the forward and reverse primers  $p_{\rm f}$  and  $p_{\rm r}$  depicted in Figure 6.1. They bind the forward and reverse strands of a template,  $t_{\rm f}$  and  $t_{\rm r}$ . So regardless of which template strand has been sequenced, the 5'-primer of a potential amplicon is on the forward, the 3'-primer on the

BLAST encodes strand in the start and end positions of a match. If the start is less than the end, the match is on the forward strand; otherwise, the match is on the reverse strand. I found it more convenient to think of all matches in the customary 5' to 3' direction, which means I invert the coordinates of matches on the reverse strand and explicitly store the strand, 0 for forward, 1 for reverse.

```
\langle Decide\ strand,\ P.\ 6.1\ 43a \rangle \equiv
43a
                                                                                             (42b)
           if ($4 < $5) {
             sstart[n] = $4
             send[n] = $5
             strand[n] = 0
           } else {
             sstart[n] = $5
             send[n] = $4
             strand[n] = 1
```

When iterating over the results, every 5' match on the forward strand is paired with all 3' matches on the reverse strand closer than the maximum amplicon length. Any such pair of primers is a potential amplicon and is reported with the subject accession, the start and end positions of the amplicon on that subject, and the subject taxonomy.

```
\langle Analyze\ BLAST\ results,\ P.\ 6.1\ 43b \rangle \equiv
43b
            (Print header, P. 6.1 44a)
           for (i = 0; i < n - 1; i++) {
              j = i + 1
              l = send[j] - sstart[i] - 1
              while (sacc[i] == sacc[j] \&\& j < n \&\& l <= maxLen) {
                 if (strand[i] == 0 && strand[j] == 1)
                      \langle Print \ result, P. 6.1 \ 44b \rangle
                j++
              }
           }
```

The header is tab-delimited and marked by a hash in the first column.

```
44a ⟨Print header, P. 6.1 44a⟩≡ (43b)

printf "# qacc\tqacc\tsacc\tsstart\tsend\tstaxid\t"

print "ssciname"

Each row of results is also printed as a tab-delimited row.

44b ⟨Print result, P. 6.1 44b⟩≡ (43b)

printf("%s\t%s\t%d\t%d\t%d\t%s\n",

qacc[i], qacc[j], sacc[i], sstart[i], send[j], staxid[i],

ssciname[i])
```

We can now use checkPrim to check pairs of primers. An example application is shown in Section 7.3.

# **Chapter 7**

# **Tutorial**

#### 7.1 fur

46d

To demonstrate fur, it is used to find regions specific to the pathogenic *E. coli* strain ST131 in the example data shown in Figure 2.1. The first step is to get the data. This is converted into a fur database and analyzed in an initial pass before the investigation is refined by varying the parameters of fur.

#### Program 7.1 (furTut.sh).

```
46a \langle furTut.sh \ 46a \rangle \equiv \langle Get \ tutorial \ data, P. \ 7.1 \ 46b \rangle \langle Make \ fur \ database, P. \ 7.1 \ 46c \rangle \langle Analyze \ tutorial \ data, P. \ 7.1 \ 46d \rangle \langle Refine \ tutorial \ analysis, P. \ 7.1 \ 48b \rangle
```

The example data is copied from a networked computer and unpacked.

```
46b \langle Get\ tutorial\ data,\ P.\ 7.1\ 46b \rangle \equiv wget guanine.evolbio.mpg.de/fur/eco105.tar.gz tar -xvzf eco105.tar.gz
```

This generates two directories of genomes in FASTA format, targets with 98 genomes, and neighbors with seven. These are converted to a fur database using makeFurDb (Chapter 1), which takes approximately half a minute.

```
46c \langle Make \ fur \ database, P. \ 7.1 \ 46c \rangle \equiv makeFurDb -t targets -n neighbors -d furDb (46a)
```

Unique templates are found by applying fur to this database, which takes roughly fifteen seconds. The template sequences are stored in tmpl.fasta.

```
\langle Analyze \ tutorial \ data, P. 7.1 \ 46d \rangle \equiv
                                                                   (46a) 47a ⊳
  fur -d furDb > tmpl.fasta
  # Step
                              Sequences Nucleotides Mutations (N)
                                    1005
  # Sliding window
                                                681264
                                                                      0
  # Presence in targets
                                   267
                                               76006
                                                                    224
  # Absence from neighbors
                                     91
                                                 46844
                                                                   4309
```

The hash-tagged progress information lists the three steps of the algorithm and the number of sequences and nucleotides contained in the template set after each one. So the initial sliding window analysis uncovers 1005 sequences totaling 681.3 kb and containing no unknown nucleotide, N. After checking for presence in the targets, 170 sequences with 69.4 kb remain. This step is carried out by intersecting the result of the previous step with the targets using phylonium (Figure 2.4). Here the matches between the reference sequence and the targets may contain mutations. Hence our result set is now sprinkled with 151 mutations (Ns). The final step of subtracting the neighbors leaves 91 sequences with 46.8 kb as the template set. In this step BLAST hits are set to N, hence the number of "mutations" has now grown to 4309. That is, 4.3 kb of N in addition to 46.8 kb of non-N.

The file tmpl.fasta consists of headers followed by sequence data. Each header in turn consists of a name and the start and end positions on the target representative. Get the first ten lines of tmpl.fasta.

 $\langle Analyze\ tutorial\ data,\ P.\ 7.1\ 46d \rangle + \equiv$  (46a)  $\vartriangleleft 46d\ 48a 
ight
angle$  head tmpl.fasta

They happen to be:

47a

GTCCAGATACAGCTTTTGATAGTTTATTATCCTGGATGATATCAGGAGCGATATCTATAAAGTTTATGCA

The consists of a name, coordinates within the concatenated reference sequence, and the number of mutations.

The file tmpl.fasta is supposed to contain 91 sequences with 46844 nucleotides, 4309 N, totaling 46844+4309=51153 residues. To check this is actually the case, we write the AWK script count.awk. It counts the headers and sums the sequence lengths before reporting the number of templates and nucleotides.

#### Program 7.2 (count.awk).

```
47b ⟨count.awk 47b⟩≡
{
    if (/^>/)
        c++
    else {
        t += length($1)
        n += gsub("N", "")
    }
}
END {
    printf "# %s tmpl, %d nuc, %d N, %d total\n", c, t - n, n, t
}
```

Run the script to find the expected 91 templates with 51.1 kb.

48a  $\langle Analyze\ tutorial\ data,\ P.\ 7.1\ 46d \rangle + \equiv$  awk -f count.awk tmpl.fasta # 91 tmpl, 46844 nuc, 4309 N, 51153 total

To make the process of template selection more transparent, the -u option allows printing of the unique regions found in the sliding window analysis before exiting.

The file unique1.fasta now contains 1005 sequences with 681,264, which is checked again.

```
48c \langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv (46a) \triangleleft 48b \triangleleft 48d \triangleright awk -f count.awk unique1.fasta # 1005 tmpl, 681264 nuc, 0 N, 681264 total
```

Similarly, the 170 regions present in all targets can be inspected using the -U option.

Check that unique2.fasta contains 170 sequences with 69407+151=69558 bp.

```
48e \langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv (46a) \triangleleft 48d \triangleleft 48f \triangleright awk -f count.awk unique2.fasta # 170 tmpl, 69407 nuc, 151 N, 69558 total
```

Two fur parameters are of interest, the window length and the *E*-value of the BLAST search during the subtraction step. Let's begin with the window length, which by default is 80 bp. Much longer windows result in sequences that are more difficult to find as exact matches among all targets. For example, with 1 kb windows, there are 111 candidate regions, of which 26 are present in all targets. The final tally is 18 regions with 18027 nucleotides and 2990 N. So the final yield is quite different in spite of the fact that the amount of nucleotides returned from the sliding window analysis, 635 kb, is similar to the 681 kb found with 80 bp windows.

	is similar to the oor ko found wit	n oo op winde	ws.		
48f	$\langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv$			(46a) ⊲48e 49a⊳	
	fur -d furDb -w 1000 > tm				
	# Step	Sequences	Nucleotides	Mutations (N)	
	#				
	# Sliding window	111	634900	0	
	# Presence in targets	26	28730	108	
	# Absence from neighbors	18	18027	2990	

On the other hand, a small increase in window length to 90 bp happens to yield 174 templates with 53.6 kb template material. Clearly, fur is highly sensitive to the window length and this should be borne in mind when investigating other pathogens.

 $\langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv$  (46a)  $\triangleleft 48f\ 49b \triangleright$  fur -d furDb -w 90 > tmpl.fasta

	Step	•	Nucleotides	Mutations (N)
#				
#	Sliding window	1610	609930	0
#	Presence in targets	246	72184	167
#	Absence from neighbors	174	53570	2922

The second parameter we explore is the E-value for the BLAST-search among the neighborhood sequences, which is  $10^{-5}$  by default. When decreased to, say,  $10^{-20}$ , the yield increases from the original 91 fragments with 46.8 kb to 102 fragments with 50.5 kb. However, the candidates might now be less specific.

 $\langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv$  (46a)  $\triangleleft 49a\ 49c \triangleright$ 

fur -d furDb -e 1e-20 > tmpl.fasta

# Ste	ер	Sequences	Nucleotides	Mutations (N)
#				
# S1:	iding window	1005	681264	0
# Pre	esence in targets	170	69407	151
# Abs	sence from neighbors	102	50516	2573

So it might well be worth varying the window length (-w), and the *E*-value (-e), in your own analyses. This can be done conveniently, as each run of fur is reasonably fast once the underlying database has been computed.

## 7.2 Making Primers, fur2prim & prim2fasta.awk

Each template is now converted to an entry in the input to primer3.

```
\langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b\rangle+\equiv (46a) △49b\ 49d ▷ ./build/fur2prim.awk tmpl.fasta > prim.txt
```

The command-line version of primer3 is run on the input file just created.

```
49d \langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv (46a) \triangleleft 49c 49e \triangleright primer3_core prim.txt > prim.out
```

```
\langle Refine\ tutorial\ analysis,\ P.\ 7.1\ 48b \rangle + \equiv (46a) \triangleleft 49d ./build/prim2fasta.awk -v file=primer prim.out
```

This generates the primer files

```
primer1.fasta
primer2.fasta
```

49a

49b

49c

49e

### 7.3 Checking Primers, checkPrim. awk

Primers are often checked by comparing them to the complete NCBI nucleotide database, nt. To avoid the overhead associated with handling this huge database, I constructed a smaller example for this Tutorial. The file p. fa contains a pair of candidate forward and reverse primers that might be diagnostic for SARS-CoV-2. To check their potential for spurious amplification, we need two BLAST databases, a sequence database, and the BLAST taxonomy database to classify any hits we might find in the sequence database. Then two questions are asked. First, does the primer pair amplify SARS-CoV-2? This is the positive control. And then, does it amplify anything else? This is the negative control.

```
Program 7.3 (checkTut.sh).
```

```
50a ⟨checkTut.sh 50a⟩≡
⟨Get BLAST sequence database, P. 7.3 50b⟩
⟨Get BLAST taxonomy database, P. 7.3 50c⟩
⟨Carry out positive control, P. 7.3 50d⟩
⟨Carry out negative control, P. 7.3 50e⟩
```

The BLAST database needs to be housed in a suitable directory. In this tutorial we use the data directory that is part of this software package. Our data are Betacoronavirus sequences supplied by the NCBI. This is downloaded using the program

```
update_blastdb.pl
```

50b

which is part of the BLAST package.

```
\langle \textit{Get BLAST sequence database}, \textit{P. 7.3 50b} \rangle \equiv \\ \text{cd ../data} \\ \text{update\_blastdb.pl --decompress Betacoronavirus}
```

The taxonomy database is downloaded in the same way. To make BLAST aware of its location, the BLASTDB environment variable is set. Once the BLAST database has been constructed, we return to the base directory of the package.

```
50c \langle Get\ BLAST\ taxonomy\ database,\ P.\ 7.3\ 50c \rangle \equiv update_blastdb.pl --decompress taxdb export BLASTDB=$(pwd) cd ... (50a)
```

For the positive control, we check that the candidate primers amplify a single region in SARS-CoV-2. The virus is identified by its taxonomy-id, which can be looked up on the NCBI taxonomy web site and happens to be 2697049. If everything is working, a single interval is returned for most if not all of the many SARS-CoV-2 sequences contained in the database.

```
50d ⟨Carry out positive control, P. 7.3 50d⟩≡
./build/checkPrim.awk -v query=data/p1.fa \
-v db=data/Betacoronavirus \
-v taxid=2697049 (50a)
```

For the negative control, all hits to sequences not classified as SARS-CoV-2 are printed.

```
50e \langle Carry\ out\ negative\ control,\ P.\ 7.3\ 50e \rangle \equiv (50a) ./build/checkPrim.awk -v query=data/p1.fa \ -v db=data/Betacoronavirus \ -v negativeTaxid=2697049
```

If there is no cross-amplification, or the spurious amplicons are found in acceptable taxa, the searches should be repeated in a larger database, ideally the complete collection of known nucleotide sequences, nt. The full list of available databases is show by

```
update_blastdb.pl --showall
```

While we are primarily interested in spotting "wrong" amplicons, that is, in the results of the negative control, it is a good idea to always also perform the positive control to make sure the primers can actually be found in the test database.

## List of code chunks

```
(Convert representative name to index, P. 1.1 5c)
(Create database directory, P. 1.1 4d)
⟨Directory does not exist, P. 1.1 4f⟩
(Directory exists, P. 1.1 4e)
⟨Find longest target, P. 1.1 5d⟩
⟨Find representative target, P. 1.1 5b⟩
⟨Free memory, P. 1.1 2e⟩
⟨Function declarations, P. 1.1 3c⟩
⟨Function definitions, P. 1.1 3d⟩
(Include headers, P. 1.1 2b)
(Interact with user, P. 1.1 2a)
\langle Main function, P. 1.1  1b\rangle
(makeFurDb.c 1a)
\langle Read\ data,\ P.\ 1.1\ 2h \rangle
(Read neighbors, P. 1.1 4a)
\langle Read \ targets, P. 1.1 \ 3a \rangle
(Write BLAST database, P. 1.1 6)
⟨Write database, P. 1.1 4c⟩
⟨Write macle index, P. 1.1 5a⟩
(Allocate space for output of neighbor BLAST, P. 2.1 22e)
(Analyze sequences, P. 2.1 12d)
(Classify sequences, P. 2.1 24b)
(Compute complexity threshold, P. 2.1 15a)
(Construct and execute phylonium command, P. 2.1 19e)
(Construct neighbor pipe, P. 2.1 22a)
(Construct unique intervals, P. 2.1 14)
(Copy sequence data, P. 2.1 18a)
(Count mutations, P. 2.1 24a)
(Data structures, P. 2.1 10a)
(Delete template and target files, P. 2.1 21a)
(Determine the number of mutations, P. 2.1 20c)
(Determine window start and end, P. 2.1 16b)
⟨Free BLAST resources, P. 2.1 23c⟩
\langle Free\ memory,\ P.\ 2.1\ 12a \rangle
⟨Function declarations, P. 2.1 10c⟩
⟨Function definitions, P. 2.1 10d⟩
\langle fur.c \ 8 \rangle
⟨Get representative name, P. 2.1 13a⟩
```

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