

## bcSeq

Fast Sequence Alignment for High-throughput shRNA and CRISPR Screens

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This document provides comprehensive instructions and examples for using the bcSeq package to perform alignment of CRISPR or shRNA reads to a library of sequences. The alignment is based on a 'Trie' data structure, a tree like data structure for fast searching. The algorithm is implemented in C++, and ported to R by Rcpp.

Features of this package include:

- 1  $O(N\bar{m})$  computational complexity (where  $N$  is the number of sequence reads in the sample, and  $\bar{m}$  is the average read length.)
- 2 Short sequences alignment that can be applied to barcode matching and similar problems.
- 3 Allows errors during the alignment. Supports both hamming and edit distance matching with constraints.
- 4 Alignment qualities are evaluated and ambiguous alignments are resolved using Bayes' classifier.
- 5 Support for user-defined matching probability models in evaluating the alignment quality.

Note: using the 'Trie' data structure only unique barcode sequences in the library are kept.

## bcSeq\_hamming

```
bcSeq_hamming(sampleFile, libFile, outFile, mismatch = 2, tMat = NULL,  
              numThread = 4, count_only = TRUE, detail_info = FALSE)
```

bcSeq\_hamming can be used for performing alignment using hamming distance.  
Function arguments:

- sampleFile:** (string or DNASTringSet) If a string it is the sample filename and needs to be a fastq file.
- libFile:** (string or DNASTringSet) If a string it is the library filename, needs to be a fasta or fastq file. libFile and sampleFile must have the same type.
- outFile:** (string) output filename.
- mismatch:** (integer) the number of maximum mismatches or indels allowed in the alignment.
- tMat:** (two column dataframe) prior probability of a mismatch given a sequence. The first column is the prior sequence, the second column is the prior error probability. The default values of prior error probability for all different sequences are 1/3.
- numThread:** (integer) the number of threads for parallel computing. The default is 4.

Function arguments continued:

`count_only`: (bool) option for function returns (default is TRUE). If set to FALSE, returns a list contains a vector of read IDs, and a vector of barcode IDs, and an alignment probability matrix between all the reads and barcodes. The vectors of read/barcode IDs serve as the row and column names for the alignment probability matrix respectively. Examples of the probability matrix are provided in the example section. Note that the probability matrix is a sparse matrix.

`detail_info`: (bool) option for controlling function returns, default to be FALSE. If set to TRUE, a file contain read indexes and library indexes reads aligned will be created with filename `$(outFile).txt`.

Function returns:

**default:** A csv count table is created and written to user specified file. The .csv file contains two columns, the first column is the sequences of the barcodes, and the second columns is the number of reads that aligned to the barcodes. A list containing a vector of read IDs and barcode IDs is returned to R.

Extra optional returns:

**count\_only = FALSE:** If set to FALSE, bcSeq will return a sparse matrix in the list containing the vectors of read IDs and barcode IDs. The rows of the matrix correspond to the vector of read IDs, and the columns correspond to the vector of barcode IDs.

## bcSeq\_edit

```
bcSeq_edit(sampleFile, libFile, outFile, mismatch = 2, tMat = NULL,  
  numThread = 4, count_only = TRUE, userProb = NULL,  
  gap_left = 2, ext_left = 1, gap_right = 2,  
  ext_right = 1, pen_max = 5, detail_info = FALSE)
```

bcSeq\_edit can be used for performing alignment using edit distance. Function arguments for bcSeq\_edit:

- sampleFile:** (string or DNASTringSet) If a string it is the sample filename and needs to be a fastq file.
- libFile:** (string or DNASTringSet) If a string it is the library filename, needs to be a fasta or fastq file. libFile and sampleFile must have the same type.
- outFile:** (string) output filename.
- mismatch:** (integer) the number of maximum mismatches allowed in the alignment.
- tMat:** (two column dataframe) prior probability of a mismatch given a sequence. The first column is the prior sequence, the second column is the error rate. The default value for all prior sequences is 1/3.
- numThread:** (integer) the number of threads for parallel computing, default to be 4.

Function arguments continued:

**count\_only:** (bool) option for function returns (default is TRUE). If set to FALSE, returns a list contains a vector of read IDs, and a vector of barcode IDs, and an alignment probability matrix between all the reads and barcodes. The vectors of read/barcode IDs serve as the row and column names for the alignment probability matrix respectively. Examples of the probability matrix are provided in the example section. Note that the probability matrix is a sparse matrix.

**userProb:** (function) an vectorized R function taking three arguments: `userProb(max_pen, prob, pen_val)`, `max_pen` is the maximum penalty allowed, `prob` is a vector containing the combined match/misMatch probabilities for each unique alignment between a given read and barcode, `pen_val` is a vector containing total penalties for the reads and barcodes in the same order. `userProb` is a way for the user to control which alignments are considered. The default value is NULL, indicating the alignment probabilities are to be computed following the model presented in the Alignment Probability Model section and a comprehensive example is given there.

**detail\_info:** (bool) option for controlling function returns, default to be FALSE. If set to TRUE, a file contain read indexes and library indexes reads aligned will be created with filename `$(outFile).txt`. Not available for user-defined probability model case.



Extra function arguments for tuning alignment based on edit distance:

`gap_left`: (double) Penalty score for deleting a base for the reads.

`ext_left`: (double) Penalty score for extending a deletion of base for the reads.

`gap_right`: (double) Penalty score for inserting a base

`ext_right`: (double) Penalty score for extending an insertion

`pen_max`: (double) Maximum penalty allowed for any alignment

Function returns:

**default:** A csv count table is created and written to user specified file. The .csv file contains two columns, the first column is the sequences of the barcodes, and the second columns is the number of reads that aligned to the barcodes. A list containing a vector of read IDs and barcode IDs is returned to R.

Extra optional returns:

**count\_only = FALSE:** If set to FALSE, bcSeq will return a sparse matrix in the list containing the vectors of read IDs and barcode IDs. The rows of the matrix correspond to the vector of read IDs, and the columns correspond to the vector of barcode IDs.

# Example Library and Read simulation

Generating a library fasta file:

```
lFName    <- "./libFile.fasta"
bases     <- c(rep('A', 4), rep('C',4), rep('G',4), rep('T',4))
numOfBars <- 7
Barcodes  <- rep(NA, numOfBars*2)
for (i in 1:numOfBars){
  Barcodes[2*i-1] <- paste0(">barcode_ID: ", i)
  Barcodes[2*i]   <- paste(sample(bases, length(bases)), collapse = '')
}
write(Barcodes, lFName)
```

Generating a read fastq file:

```
rFName    <- "./readFile.fastq"
numOfReads <- 8
Reads     <- rep(NA, numOfReads*4)
for (i in 1:numOfReads){
  Reads[4*i-3] <- paste0("@read_ID_", i)
  Reads[4*i-2] <- Barcodes[2*sample(1:numOfBars,1,
    replace=TRUE, prob=seq(1:numOfBars))]
  Reads[4*i-1] <- "+"
  Reads[4*i]   <- paste(rawToChar(as.raw(
    33+sample(20:30, length(bases), replace=TRUE))),
    collapse='')
}
write(Reads, rFName)
```

# Alignment by bcSeq\_hamming

Alignment using default mapping probability and output

```
library(Matrix)
library(bcSeq)
ReadFile <- "./readFile.fastq"
BarFile <- "./libFile.fasta"
outFile <- "./count.csv"
res <- bcSeq_hamming(ReadFile, BarFile, outFile, misMatch = 2,
  tMat = NULL, numThread = 4, count_only = TRUE )

## Running hamming search with 2 sequences per thread in 4 threads
## Compiling results
```

The function writes the read counts to a .csv file, the file name can be set through argument outFile.

```
res <- read.csv(outFile, header=FALSE)
res[1:3,]

##           V1 V2
## 1 GCGTCGTACAAGTTCA 2
## 2 GTCATTCTCCAAGGAG 0
## 3 GCTACCTGGAATCAGT 0
```

There are two columns in the output .csv file, the first column is the barcode sequence, and the second column is the corresponding number of reads aligned to the barcode.

## Alignment using bcSeq\_hamming with Optional Return

The package also provides an option for the user to output more detailed information for the alignments. The current version can return the alignment probability between the reads and the barcodes by setting argument `count_only` to "FALSE".

```
outFile <- "./count2.csv"
bcSeq_hamming(ReadFile, BarFile, outFile, misMatch = 2, tMat = NULL,
  numThread = 4, count_only=FALSE )
```

# Alignment by bcSeq\_edit

Alignment using default mapping probability and output format

```
res <- bcSeq_edit(ReadFile, BarFile, outFile, misMatch = 2,
  tMat = NULL, numThread = 4, count_only = TRUE,
  gap_left = 2, ext_left = 1, gap_right = 2, ext_right = 1,
  pen_max = 7)

## Running levenshtein search with 2 sequences per thread in 4 threads
## Compiling results
```

The function writes the read counts to a .csv file, the file name can be set through argument outFile.

```
res <- read.csv(outFile, header=FALSE)
res[1:3,]

##           V1 V2
## 1 GCGTCGTACAAGTTCA 2
## 2 GTCATTCTCCAAGGAG 0
## 3 GCTACCTGGAATCAGT 0
```

There are two columns in the output .csv file, the first column is the barcode sequence, and the second column is the corresponding number of reads aligned to the barcode.

## Alignment using bcSeq\_edit with Optional Return

The package also provides an option for the user to output more detailed information for the alignments. The current version can return the alignment probability between the reads and the barcodes by setting argument `count_only` to "FALSE".

```
outFile <- "./count2.csv"
bcSeq_edit(ReadFile, BarFile, outFile, misMatch = 2, tMat = NULL,
  numThread = 4, count_only = FALSE, gap_left = 2, ext_left = 1,
  gap_right = 2, ext_right = 1, pen_max = 5)
```

# General Alignment Probability Model in bcSeq

Let  $\mathbb{P}(\tilde{\mathbf{r}}^k|\mathbf{r}) := \mathbb{P}(\tilde{R} = \tilde{\mathbf{r}}^k | R = \mathbf{r})$  denote the probability that the read originated from barcode  $k$ , with the corresponding sequence  $\tilde{\mathbf{r}}^k$ , given that the sequence of the observed read is  $\mathbf{r} = [r_1, \dots, r_L]$ . bcSeq models the joint probability distribution of the originating reads conditional on the corresponding observed reads,  $\mathbb{P}(\tilde{\mathbf{r}}^k|\mathbf{r})$ , under the assumption of conditional independence, as

$$\begin{aligned}\mathbb{P}(\tilde{\mathbf{r}}^k|\mathbf{r}) &= \mathbb{P}(\tilde{R} = \tilde{\mathbf{r}}^k | R = \mathbf{r}) \\ &= \mathbb{P}(\tilde{R} = [\tilde{r}_1, \dots, \tilde{r}_L] | R = [r_1, \dots, r_L]) \\ &= \prod_{i=1}^L \mathbb{P}(\tilde{R}_i = \tilde{r}_i | R = [r_1, \dots, r_L]) \\ &= \prod_{i=1}^L \mathbb{P}(\tilde{R}_i = \tilde{r}_i | R_i = r_i).\end{aligned}$$

The marginal conditional probability is modeled as

$$\mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = r_j) = \begin{cases} 1 - \epsilon_j, & \tilde{r}_j = r_j \\ \frac{\epsilon_j}{3}, & \tilde{r}_j \neq r_j, \end{cases}$$

where  $\epsilon_j = 10^{-q_j/10}$  is the base-calling error probability corresponding to the observed Phred score  $q_j$ .



bcSeq provides two approaches for the user to defined their own alignment probability

- User-defined Marginal Conditional Probability
- User-defined  $\mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = r_j)$

Redefine marginal conditional probability:

$$\begin{aligned} & \mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = r_j) \\ & \equiv \mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = [r_{j-n}, \dots, r_j]) \\ & = \begin{cases} 1 - \epsilon_j, & \tilde{r}_j = r_j \\ f(\epsilon_j)_{r_{j-n}, \dots, r_j} & \tilde{r}_j \neq r_j, \end{cases} \end{aligned}$$

This definition assumes that sequences before position  $j$  has influence on the error rate. The option can be activated by providing a dataframe to the argument `tMat`. The first column of this dataframe is a vector of sequences  $[r_{j-n}, \dots, r_j]$  and the second column is the corresponding value of  $f(\epsilon_j)_{[r_{j-n}, \dots, r_j]}$ . If a sequence is not in the dataframe the default values  $\frac{\epsilon_j}{3}$  are used.

## User-defined $\mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = r_j)$

Customized  $\mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = r_j)$  are also supported by bcSeq for bcSeq\_edit. The user can define a function userProb to compute the alignment score. userProb is a vectorized R function taking three arguments: userProb(max\_pen, prob, pen\_val), max\_pen is the maximum penalty allowed, prob is a vector containing the combined match/misMatch probabilities for each unique alignment between a given read and barcode, pen\_val is a vector containing total penalties for the reads and barcodes in the same order. userProb is a way for the user to control which alignments are considered.

```
customizeP <- function(max_pen, prob, pen_val)
{
  prob * (1 - log(2) + log(1 + max_pen / (max_pen + pen_val) ) )
}
bcSeq_edit(sampleFile, libFile, outFile, misMatch = 2, tMat = NULL,
  numThread = 4, count_only = TRUE, userProb = comstomizeP,
  gap_left = 2, ext_left = 1, gap_right = 2,
  ext_right = 1, pen_max = 5)
```

Note: the using of user-defined  $\mathbb{P}(\tilde{R}_j = \tilde{r}_j | R_j = r_j)$  can add extra computation time. As defined here, customizeP is equivalent to the default model.

The customized `userProb` function can also be defined using `sourceCpp` in a non-vectorized fashion. The function signature is `Rcpp::NumericVector(double, Rcpp::NumericVector, Rcpp::NumericVector)`.

```
library(Rcpp)
sourceCpp(code='
#include<Rcpp.h>
using namespace Rcpp;
// [[Rcpp::export]]
NumericVector cpp_fun(double m, NumericVector prob, NumericVector pen){
    NumericVector ret;
    for(int i = 0; i < prob.size(); ++i){
        ret.push_back(prob[i] * (1 - log(2) + log(1 + pen[i]/(m + pen[i]))));
    }
    return ret;
}')

bcSeq_edit(sampleFile, libFile, outFile, misMatch = 2, tMat = NULL,
    numThread = 4, count_only = TRUE, userProb = cpp_fun,
    gap_left = 2, ext_left = 1, gap_right = 2,
    ext_right = 1, pen_max = 5)
```

## Practical Alignment Example

The sequencing library used in the benchmarking analysis can be downloaded from the MAGECK website:

`ftp://ftp.sra.ebi.ac.uk/vol1/fastq/ERR376/ERR376998/ERR376998.fastq.gz`

The reference barcode library can also be downloaded from Kosuke Yusa laboratory:

`https://www.nature.com/nbt/journal/v32/n3/extref/nbt.2800-S7.xlsx`

get read and library file

```
wget ftp://ftp.sra.ebi.ac.uk/vol1/fastq/ERR376/ERR376998/ERR376998.fastq.gz
```

```
-P ./src/
```

```
wget https://www.nature.com/nbt/journal/v32/n3/extref/nbt.2800-S7.xlsx
```

```
-P ./src
```

Process library data to fasta format

```
library(gdata)
x <- read.xls("./nbt.2800-S7.xlsx")
fName <- "./libgRNA.fasta"
size <- nrow(x)
for(i in 1:size){
  cat(">seq ID", "\n", file=fName, append=TRUE)
  cat(as.character(x$gRNA.sequence[i]), "\n", file=fName, append=TRUE)}
fName <- "./libgRNA.csv"
size <- nrow(x)
for(i in 1:size){
  cat(as.character(x$gRNA.sequence[i]), "\n", file=fName, append=TRUE)}
```

# Practical Alignment Example

Unzip the reads and trim the adaptor

gunzip ERR376998.fastq.gz

Ad hoc C++ function for trimming adaptor (trimMAGeCK.cpp)

```
#include <iostream>
#include <fstream>
using namespace std;
int main(int argc, char *argv[]){
    int length = 0;
    string line;
    ifstream myfile (argv[1]);
    ofstream outfile (argv[2]);
    if (myfile.is_open()){
        while ( getline (myfile,line) ){
            outfile << line <<endl;
            getline (myfile,line);
            length = line.length() - 31;
            outfile << line.substr(23, length) <<endl;
            getline (myfile,line);
            outfile << line <<endl;
            getline (myfile,line);
            outfile << line.substr(23, length) <<endl;}
        myfile.close();}
    return 0;
}
```

# Practical Alignment Example

Ad hoc C++ function to remove duplicated barcodes (uniqueBar.cpp)

```
#include <iostream>
#include <fstream>
#include <unordered_set>
using namespace std;
int main(int argc, char *argv[]){
    int length = 0; string line;
    std::unordered_set<std::string> myset;
    ifstream myfile (argv[1]); ofstream outfile (argv[2]);
    if (myfile.is_open()){
        while ( getline (myfile,line) )
            getline (myfile,line); myset.insert(line);
        myfile.close();}
    for(const std::string& x: myset)
        outfile << ">fake_ID_"<<x<< endl<<x<<endl;
    return 0;
}
```

# Practical Alignment Example

Compile trim code and trim adoptor

```
g++ -std=c++11 trimMAGeCK.cpp -o trim.exe  
./trim.exe ERR376998.fastq ERR376998_trimed.fastq
```

Remove duplicated barcodes

```
g++ -std=c++11 uniqueBar.cpp -o uniBar.exe  
./uniBar.exe ./libgRNA.fasta ./libgRNAUni.fasta  
mv libgRNAUni.fasta libgRNA.fasta
```

Perform alignment

```
library(bcSeq)  
readFileName <- "ERR376998_trimed.fastq"  
libFileName <- "libgRNA.fasta"  
alignedFile <- "SampleAligned.txt"  
bcSeq_hamming(readFileName, libFileName, alignedFile, misMatch = 2,  
              tMat = NULL, numThread = 4, count_only = TRUE)
```



## Session Information

- R version 3.5.2 Patched (2018-12-20 r75875), x86\_64-apple-darwin15.6.0
- Running under: OS X El Capitan 10.11.6
- Matrix products: default
- BLAS:  
/Library/Frameworks/R.framework/Versions/3.5/Resources/lib/libRblas.0.dylib
- LAPACK:  
/Library/Frameworks/R.framework/Versions/3.5/Resources/lib/libRlapack.dylib
- Base packages: base, datasets, grDevices, graphics, methods, stats, utils
- Other packages: Matrix 1.2-15, bcSeq 1.4.1, knitr 1.21
- Loaded via a namespace (and not attached): BiocGenerics 0.28.0, Biostrings 2.50.2, IRanges 2.16.0, Rcpp 1.0.0, S4Vectors 0.20.1, XVector 0.22.0, compiler 3.5.2, evaluate 0.12, grid 3.5.2, highr 0.7, lattice 0.20-38, magrittr 1.5, parallel 3.5.2, stats4 3.5.2, stringi 1.2.4, stringr 1.3.1, tools 3.5.2, xfun 0.4, zlibbioc 1.28.0

```
## [1] "Start Time Fri Jan 4 21:32:58 2019"  
## [1] "End Time Fri Jan 4 21:33:02 2019"
```