# Analysis of ChIP-seq data from

### Sulfolobus acidocaldarius DSM 639

# 1 Get Ready

For this exercise we will use Bowtie to align the reads. Bowtie is available as a module on Abel, so we just have to load it. Bowtie is for readlengths <~50 and Bowtie2 is for readlengths >~50. Our reads are ~50 basepairs long, so each one of them would be ok.

module load bowtie

You can find the data for these exercises in /work/projects/chip/data, and the programs in /work/projects/chip/programs. Make your own chip directory inside the workflows directory, cd into it and copy the two directories there. To make the programs runnable, use chmod

cp -r /work/projects/norbis/workflow/chip/data.

cp -r /work/projects/norbis/workflow/chip/programs .

chmod a+rx programs/\*

# 2 Alignment

You now have the reference genome sequence as a fasta file in the data directory, and can cd into the data directory and make a Bowtie index like this:

bowtie-build -f data/saci.fasta data/saci

The alignment can be parallelized with the -p option.

bowtie -p 7 -S -v 2 -m 1 data/saci data/N1\_CHIP.fastq > N1\_CHIP.sam bowtie -p 7 -S -v 2 -m 1 data/saci data/N1\_INPUT.fastq > N1\_INPUT.sam bowtie -p 7 -S -v 2 -m 1 data/saci data/T1\_CHIP.fastq > T1\_CHIP.sam bowtie -p 7 -S -v 2 -m 1 data/saci data/T1\_INPUT.fastq > T1\_INPUT.sam

Option	Explanation
-p 7	Launch 7 parallel search threads
-S	Output in SAM format

-v 2	No more than 2 mismatches
-m 1	Suppress all alignments for a read if more than 1 reportable alignments exist

Write down the number of aligned reads, and compute the size normalization factor. We will use these numbers later.

	4 - 5	# -f -l:	Size normalization factors
	# of reads	# of aligned reads	#of aligned reads/1000000
N1 CHIP			
N1 INPUT			
T1 CHIP			
T1 INPUT			

# 3 Making bigwig files:

Resulting SAM files can be very big, so for some purposes, like uploading the files to view them in a browser, the bigwig format may be useful. Description of many kinds of file formats can be found here:

### https://genome.ucsc.edu/FAQ/FAQformat.html

Making bigwig files from the alignment files requires several steps that are described below. Some of the steps require samtools and bedtools, so these have to be loaded first.

module load samtools module load bedtools

## **Getting BAM file from SAM file:**

```
samtools view T1_CHIP.sam -bS > T1_CHIP.bam
samtools view N1_INPUT.sam -bS > N1_INPUT.bam
samtools view T1_INPUT.sam -bS > T1_INPUT.bam
```

Option	Explanation
-b	Output is BAM format
-S	Input in SAM format

# Sorting the BAM file with samtools:

The next step (genomeCoverageBed) requires a sorted file as input. This is done with samtools sort.

```
samtools sort N1_INPUT.bam N1_INPUT_sorted
samtools sort T1_INPUT.bam T1_INPUT_sorted
samtools sort T1_CHIP.bam T1_CHIP_sorted
samtools sort N1_CHIP.bam N1_CHIP_sorted
```

#### Getting bedGraph files with genomeCoverageBed:

At this step, a bedGraph file is made from the sorted BAM.

 $\label{lem:coverageBed-ibam N1_CHIP_sorted.bam -bg -g ../sacisizes.txt} > N1\_CHIP.bedGraph$   $\label{lem:coverageBed-ibam T1_CHIP_sorted.bam -bg -g ../sacisizes.txt} > T1\_CHIP.bedGraph$   $\label{lem:coverageBed-ibam T1_INPUT_sorted.bam -bg -g ../sacisizes.txt} > T1\_INPUT.bedGraph$   $\label{lem:coverageBed-ibam N1_INPUT_sorted.bam -bg -g ../sacisizes.txt} > N1\_INPUT.bedGraph$ 

Option	Explanation
-ibam	Input file in BAM format
-bg	Report bedGraph depth
-g	File with chromosome sizes

#### Sorting bedGraph files based on column 1, then column 2:

The next step (bedGraphToBigWig) needs sorted input. This is done with unix sort. The file is first sorted by column1, then by column 2 (n – numerically).

```
sort -k1,1 -k2,2n N1_INPUT.bedGraph > N1_INPUT_sorted.bedGraph
sort -k1,1 -k2,2n T1_INPUT.bedGraph > T1_INPUT_sorted.bedGraph
sort -k1,1 -k2,2n T1_CHIP.bedGraph > T1_CHIP_sorted.bedGraph
sort -k1,1 -k2,2n N1_CHIP.bedGraph > N1_CHIP_sorted.bedGraph
```

## Making bigWig files from bedGraph:

programs/bedGraphToBigWig -unc N1\_INPUT\_sorted.bedGraph data/sacisizes.txt N1\_INPUT\_bigWig.bwig programs/bedGraphToBigWig -unc T1\_INPUT\_sorted.bedGraph data/sacisizes.txt T1\_INPUT\_bigWig.bwig programs/bedGraphToBigWig -unc T1\_CHIP\_sorted.bedGraph data/sacisizes.txt T1\_CHIP\_bigWig.bwig programs/bedGraphToBigWig -unc N1\_CHIP\_sorted.bedGraph data/sacisizes.txt N1\_CHIP\_bigWig.bwig

Option	Explanation
-unc	Not using compression

The program needs the size of each chromosome as input, these are listed in the file sacisizes.txt. This file is in the data folder.

# 4 Peak calling:

There are a lot of peak callers out there. We will use MACS 14 to do the peak calling. This is available as a module on Abel.

module load macs

The commands for calling the peaks are as follows:

```
macs14 -t N1_CHIP.sam -c N1_INPUT.sam -n N1 -g 2.23e6 -f SAM macs14 -t T1_CHIP.sam -c T1_INPUT.sam -n T1 -g 2.23e6 -f SAM
```

Option	Explanation
-t	Treatment file

-C	Control file
-n	Experiment name
-g	Effective genome size
-f	Format

Find the number of peaks for each sample and write them down

Samples	# of peaks
N1	
T1	

Check this link if you want an overview of command line options and a description of the output files from MACS:

http://liulab.dfci.harvard.edu/MACS/00README.html

# Finding read counts for each peak

Getting one file with all the peaks and sorting it:

```
cat N1_peaks.bed T1_peaks.bed > N1_T1_peaks.bed
sort -k1,1 -k2,2n N1_T1_peaks.bed > N1_T1_sorted_peaks.bed
```

Running bedtools merge for peaks found in N1 and T1 to have the complete set for comparison:

 $bed tools \ merge \ \hbox{-i N1\_T1\_sorted\_peaks.bed} > \hbox{N1\_T1\_merged\_peaks.bed}$ 

#### Running intersectBed to find all reads that intersect with the peaks:

```
intersectBed -bed -wb -abam \ N1\_CHIP\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > N1\_CHIP\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_CHIP\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_CHIP\_intersect.txt \\ intersectBed -bed -wb -abam \ N1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > N1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_intersect.txt \\ intersectBed -bed -wb -abam \ T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks.bed > T1\_INPUT\_sorted.bam -b \ N1\_T1\_merged\_peaks
```

# Using cut to get out the columns for chr, start and end for the peaks. Sorting and counting them to find the number of reads that overlap them:

```
 \begin{array}{l} {\rm cut}\ -f13,14,15\ N1\_CHIP\_intersect.txt\ |\ sort\ |\ uniq\ -c\ > N1\_CHIP\_ib\_count.txt\\ {\rm cut}\ -\ f13,14,15\ T1\_CHIP\_intersect.txt\ |\ sort\ |\ uniq\ -c\ > T1\_CHIP\_ib\_count.txt\\ {\rm cut}\ -\ f13,14,15\ T1\_INPUT\_intersect.txt\ |\ sort\ |\ uniq\ -c\ > N1\_INPUT\_ib\_count.txt\\ {\rm cut}\ -\ f13,14,15\ N1\_INPUT\_intersect.txt\ |\ sort\ |\ uniq\ -c\ > N1\_INPUT\_ib\_count.txt\\ \end{array}
```

#### Using awk to make a format R reads properly, with no spaces between chr, start and end:

# Normalization, comparing N1 and T1 and making plots in R:

#### #Reading in the files

```
N1cCHIP<-read.table("N1_CHIP_countR.txt", sep="\t")
T1cCHIP<-read.table("T1_CHIP_countR.txt", sep="\t")
T1cINPUT<-read.table("T1_INPUT_countR.txt", sep="\t")
N1cINPUT<-read.table("N1_INPUT_countR.txt", sep="\t")
```

# #Setting the column names

```
colnames(N1cCHIP)=c("peak", "N1cCHIPcount")
colnames(T1cCHIP)=c("peak", "T1cCHIPcount")
colnames(T1cINPUT)=c("peak", "T1cINPUTcount")
colnames(N1cINPUT)=c("peak", "N1cINPUTcount")
```

#Merging the four count tables into one, and setting missing values (no reads) to 0.

```
readcounts <- merge(N1cCHIP, N1cINPUT, by="peak", ALL=T) readcounts <- merge(readcounts,T1cCHIP, by="peak", ALL=T) readcounts <- merge(readcounts,T1cINPUT, by="peak", ALL=T) readcounts[is.na(readcounts)]=0
```

#Adding four columns with size normalization counts (calculation of normalization factor is shown in #the Alignment section).

readcounts\$N1cCHIPsizenorm<-readcounts\$N1cCHIPcount/1.21 readcounts\$N1cINPUTsizenorm<-readcounts\$N1cINPUTcount/1.02 readcounts\$T1cCHIPsizenorm<-readcounts\$T1cCHIPcount/1.12 readcounts\$T1cINPUTsizenorm<-readcounts\$T1cINPUTcount/1.34

#Importing the package preprocessCore (used for quantile normalization)

library(preprocessCore)

#Getting a table with the CHIP counts for normalization

fornorm<-cbind(readcounts\$N1cCHIPcount, readcounts\$T1cCHIPcount)

#### #Normalizing

normcounts<-normalize.quantiles(as.matrix(fornorm), copy=TRUE)

#Adding two columns with the normalized counts in the readcount table

readcounts\$N1cCHIPnorm<-normcounts[,1] readcounts\$T1cCHIPnorm<-normcounts[,2]

#Adding columns with the logfold change values for each of the three CHIP-counts

 $readcounts \$logfold Change Raw <- log2 ( (readcounts \$N1c CHIP count+1) / (readcounts \$T1c CHIP count+1) ) \\ readcounts \$logfold Change Snorm <- log2 ( (readcounts \$N1c CHIP size norm+1) / (readcounts \$T1c CHIP size norm+1) ) \\ readcounts \$logfold Change Qnorm <- log2 ( (readcounts \$N1c CHIP norm+1) / (readcounts \$T1c CHIP norm+1) ) \\ \\$ 

```
#Sorting the readcount table based on logfoldChange for the quantile normalized counts and write it #to file
```

```
ordered readcounts <- readcounts[order(readcounts$logfoldChangeQnorm),]
write.table(ordered readcounts, "ordered readcounts.txt", sep="\t", quote=FALSE, row.names=F)
#Plot CHIP vs INPUT for N1 using size normalized counts
pdf("readcount_plot_N1c.pdf")
plot(log2(readcounts$N1cCHIPsizenorm+1), log2(readcounts$N1cINPUTsizenorm+1), main="Size normalized readcounts
N1c", xlab="CHIP", ylab="INPUT", pch=16, xlim=c(1,12), ylim=c(1,12))
abline(0,1,col="red")
dev.off()
#Plot CHIP vs INPUT for T1 using size normalized counts
pdf("readcount_plot_T1c.pdf")
plot(log2(readcounts$T1cCHIPsizenorm+1), log2(readcounts$T1cINPUTsizenorm+1), main="Size normalized readcounts
T1c", xlab="CHIP", ylab="INPUT", pch=16, xlim=c(1,12), ylim=c(1,12))
abline(0,1,col="red")
dev.off()
#Plot the quantile normalized counts of N1c vs T1c
pdf("readcount_plot_CHIP_N1c_T1c.pdf")
plot(log2(readcounts$N1cCHIPnorm+1), log2(readcounts$T1cCHIPnorm+1), main="N1c vs T1c", xlab="N1c log2(normalized
counts)", ylab="T1c log2(normalised counts)", pch=16, xlim=c(1,13), ylim=c(1,13))
abline(0,1,col="red")
dev.off()
#Plot histograms of logfoldChange for raw count, size normalized count and quantile normalized
#counts
pdf("histogram_logfoldChange_quantile_normalized_counts.pdf")
hist(readcounts$logfoldChangeQnorm, breaks=60, col="yellow", main="log2((N1cCHIPnorm+1)/(T1cCHIPnorm+1))")
abline(v=0, col="red", lwd=2)
dev.off()
pdf("histogram_logfoldChange_size_normalized_counts.pdf")
hist(readcounts$logfoldChangeSnorm, breaks=60, col="yellow", main="log2( (N1cCHIPsizenorm+1)/(T1cCHIPsizenorm+1)
)") abline(v=0, col="red", lwd=2)
dev.off()
pdf("histogram_logfoldChange_raw_counts.pdf")
hist(readcounts$logfoldChangeRaw, breaks=60, col="yellow", main="log2( (N1cCHIPcounts+1)/(T1cCHIPcounts+1) )")
abline(v=0, col="red", lwd=2)
```

dev.off()