# HW2: RNA-seq Ver2

#### **BCB 5250 Introduction to Bioinformatics II**

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## Getting started with HISAT, StringTie, and Ballgown

https://www.nature.com/articles/nprot.2016.095#an1



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Transcript-level expression analysis of RNA-seq experiments with HISAT, StringTie and Ballgown

Mihaela Pertea, Daehwan Kim, Geo M Pertea, Jeffrey T Leek & Steven L Salzberg <sup>™</sup>

## Getting started with HISAT, StringTie, and Ballgown

\$ wget ftp://ftp.ccb.jhu.edu/pub/RNAseq\_protocol/chrX\_data.tar.gz

You can copy the data from /public/ahnt/courses/bcb5250/rna\_seq\_lab/chrX\_data.tar.gz

### Required tools

#### **EQUIPMENT**

- Data (example RNA-seq reads, indexes and gene annotations for use in this protocol are available at ftp://ftp.ccb.jhu.edu/pub/RNAseq\_protocol; see Equipment Setup for details)
- HISAT2 software (http://ccb.jhu.edu/software/hisat2 or http://github.com/infphilo/hisat2, version 2.0.1 or later)
- StringTie software (http://ccb.jhu.edu/software/stringtie or https://github.com/gpertea/stringtie, version 1.2.2 or later)
- SAMtools (http://samtools.sourceforge.net, version 0.1.19 or later)
- R (https://www.r-project.org, version 3.2.2 or later)
- Hardware (64-bit computer running either Linux or Mac OS X (10.7 Lion or later); 4 GB of RAM (8 GB preferred); see Equipment Setup)

/public/ahnt/courses/bcb5250/rna\_seq\_lab/software/

Add each program path into your bashrc

<u>Ballgown</u> is a Bioconductor package, so we need to install that using R. While we are at it, we will install various dependencies too.

```
install.packages("devtools")
install.packages("dplyr")

source("https://www.bioconductor.org/biocLite.R")
biocLite(c("alyssafrazee/RSkittleBrewer", "ballgown", "genefilter"))
```

### Mapping

- Mapping is performed using HISAT2 and usually the first step, prior to mapping, is to create an index of the reference genome. The indices are provided in the data folder but let's create them again.
  - \$ cd chrX\_data
  - \$ mkdir my\_index
  - \$ cd my\_index
  - \$ /public/ahnt/courses/bcb5250/rna\_seq\_lab/software/hisat2-2.0.0-beta/extract\_splice\_sites.py ../genes/chrX.gtf > chrX.ss
  - \$ /public/ahnt/courses/bcb5250/rna\_seq\_lab/software/hisat2-2.0.0-beta/extract\_exons.py ../genes/chrX.gtf > chrX.exon
  - \$ head -3 chrX.ss
  - \$ head -3 chrX.exon
  - \$ hisat2-build -p 8 --ss chrX.ss --exon chrX.exon ../genome/chrX.fa chrX\_tran

### Mapping

#### \$ mkdir map

#### \$ cat map.sh

hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188044\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188044\_chrX\_2.fastq.gz -S map/ERR188044\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188104\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188234\_chrX\_2.fastq.gz -S map/ERR188234\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188245\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188245\_chrX\_2.fastq.gz -S map/ERR188245\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188257\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188257\_chrX\_2.fastq.gz -S map/ERR188257\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188273\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188273\_chrX\_2.fastq.gz -S map/ERR188273\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR18837\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR18837\_chrX\_2.fastq.gz -S map/ERR188337\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188383\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188383\_chrX\_2.fastq.gz -S map/ERR188383\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188401\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188401\_chrX\_2.fastq.gz -S map/ERR188401\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188428\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188428\_chrX\_2.fastq.gz -S map/ERR188428\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188428\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188454\_chrX\_2.fastq.gz -S map/ERR188454\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_tran -1 chrX\_data/samples/ERR188454\_chrX\_1.fastq.gz -2 chrX\_data/samples/ERR188454\_chrX\_2.fastq.gz -S map/ERR188454\_chrX.sam
 hisat2 -p 8 -dta -x chrX\_data/indexes/chrX\_t

### Mapping

#### Sort

- \$ cat sort.sh
- samtools view -@ 8 -S -b map/ERR188044\_chrX.sam | samtools sort -@ 8 map/ERR188044\_chrX
- samtools view -@ 8 -S -b map/ERR188104\_chrX.sam | samtools sort -@ 8 map/ERR188104\_chrX
- samtools view -@ 8 -S -b map/ERR188234\_chrX.sam | samtools sort -@ 8 map/ERR188234\_chrX
- samtools view -@ 8 -S -b map/ERR188245\_chrX.sam | samtools sort -@ 8 map/ERR188245\_chrX
- samtools view -@ 8 -S -b map/ERR188257\_chrX.sam | samtools sort -@ 8 map/ERR188257\_chrX
- samtools view -@ 8 -S -b map/ERR188273\_chrX.sam | samtools sort -@ 8 map/ERR188273\_chrX
- samtools view -@ 8 -S -b map/ERR188337\_chrX.sam | samtools sort -@ 8 map/ERR188337\_chrX
- samtools view -@ 8 -S -b map/ERR188383\_chrX.sam | samtools sort -@ 8 map/ERR188383\_chrX
- samtools view -@ 8 -S -b map/ERR188401\_chrX.sam | samtools sort -@ 8 map/ERR188401\_chrX
- samtools view -@ 8 -S -b map/ERR188428\_chrX.sam | samtools sort -@ 8 map/ERR188428\_chrX
- samtools view -@ 8 -S -b map/ERR188454\_chrX.sam | samtools sort -@ 8 map/ERR188454\_chrX
- samtools view -@ 8 -S -b map/ERR204916\_chrX.sam | samtools sort -@ 8 map/ERR204916\_chrX

### **Assembly**

- Now we need to assemble the mapped reads into transcripts. StringTie can assemble transcripts with or without annotation; as noted in the protocol, annotation can be helpful when the number of reads for a transcript is too low for an accurate assembly.
  - \$ mkdir assembly
  - \$ cat stringtie.sh
  - stringtie map/ERR188044 chrX.bam -I ERR188044 -p 8 -G chrX data/genes/chrX.gtf -o assembly/ERR188044 chrX.gtf
  - stringtie map/ERR188104\_chrX.bam -I ERR188104 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188104\_chrX.gtf
  - stringtie map/ERR188234\_chrX.bam -I ERR188234 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188234\_chrX.gtf
  - stringtie map/ERR188245\_chrX.bam -I ERR188245 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188245\_chrX.gtf
  - stringtie map/ERR188257 chrX.bam -I ERR188257 -p 8 -G chrX data/genes/chrX.gtf -o assembly/ERR188257 chrX.gtf
  - stringtie map/ERR188273\_chrX.bam -I ERR188273 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188273\_chrX.gtf
  - stringtie map/ERR188337\_chrX.bam -I ERR188337 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188337\_chrX.gtf
  - stringtie map/ERR188383\_chrX.bam -I ERR188383 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188383\_chrX.gtf
  - stringtie map/ERR188401\_chrX.bam -I ERR188401 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188401\_chrX.gtf
  - stringtie map/ERR188428\_chrX.bam -I ERR188428 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188428\_chrX.gtf
  - stringtie map/ERR188454\_chrX.bam -I ERR188454 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR188454\_chrX.gtf
  - stringtie map/ERR204916\_chrX.bam -I ERR204916 -p 8 -G chrX\_data/genes/chrX.gtf -o assembly/ERR204916\_chrX.gtf

### Assembly

- Before merging we need to modify mergelist.txt. The modified mergelist.txt should look like this:
  - \$ cat chrX\_data/mergelist.txt
  - assembly/ERR188044\_chrX.gtf
  - assembly/ERR188104\_chrX.gtf
  - assembly/ERR188234\_chrX.gtf
  - assembly/ERR188245\_chrX.gtf
  - assembly/ERR188257\_chrX.gtf
  - assembly/ERR188273\_chrX.gtf
  - assembly/ERR188337\_chrX.gtf
  - assembly/ERR188383\_chrX.gtf
  - assembly/ERR188401\_chrX.gtf
  - assembly/ERR188428\_chrX.gtf
  - assembly/ERR188454\_chrX.gtf
  - assembly/ERR204916\_chrX.gtf

### Assembly

- Merge
  - \$ stringtie --merge -p 8 -G chrX\_data/genes/chrX.gtf -o stringtie\_merged.gtf chrX\_data/mergelist.txt
  - \$ cat stringtie\_merged.gtf | head
- How many transcripts?
  - cat stringtie\_merged.gtf | grep -v "^#" | awk '\$3=="transcript" {print}' | wc -l
- compare the assembled transcripts to known transcripts
  - \$ gffcompare -r chrX\_data/genes/chrX.gtf -G -o merged stringtie\_merged.gtf
  - 2343 reference transcripts loaded.
  - 241 duplicate reference transcripts discarded.
  - 3547 query transfrags loaded.

### Estimate their abundances

- Now that we have our assembled transcripts, we can estimate their abundances.
  - \$ cat estimate.sh
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188044/ERR188044\_chrX.gtf map/ERR188044\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188104/ERR188104\_chrX.gtf map/ERR188104\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188234/ERR188234\_chrX.gtf map/ERR188234\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188245/ERR188245\_chrX.gtf map/ERR188245\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188257/ERR188257\_chrX.gtf map/ERR188257\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188273/ERR188273\_chrX.gtf map/ERR188273\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188337/ERR188337\_chrX.gtf map/ERR188337\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188383/ERR188383\_chrX.gtf map/ERR188383\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188401/ERR188401\_chrX.gtf map/ERR188401\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188428/ERR188428\_chrX.gtf map/ERR188428\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR188454/ERR188454\_chrX.gtf map/ERR188454\_chrX.bam
  - stringtie -e -B -p 8 -G stringtie\_merged.gtf -o ballgown/ERR204916/ERR204916\_chrX.gtf map/ERR204916\_chrX.bam

### Differential expression

- Ballgown is a Bioconductor package, so we need to install that using R. While we are at it, we will install various dependencies too.
  - install.packages("devtools")
  - install.packages("dplyr")
  - install.packages("ggplot2")
  - install.packages("cowplot")

- source("https://www.bioconductor.org/biocLite.R")
- biocLite(c("alyssafrazee/RSkittleBrewer", "ballgown", "genefilter"))

### Differential expression

Let me provide the R script separately.