# mRNA-Seq

- Basic processing
- Read mapping (shown here, but optional. May due if time allows)
  - Tophat
- Gene expression estimation
  - cufflinks
  - Confidence intervals
- Gene expression changes (separate use case)
  - Sample groups
  - cuffdiff

## Use case of RNA-Seq tools

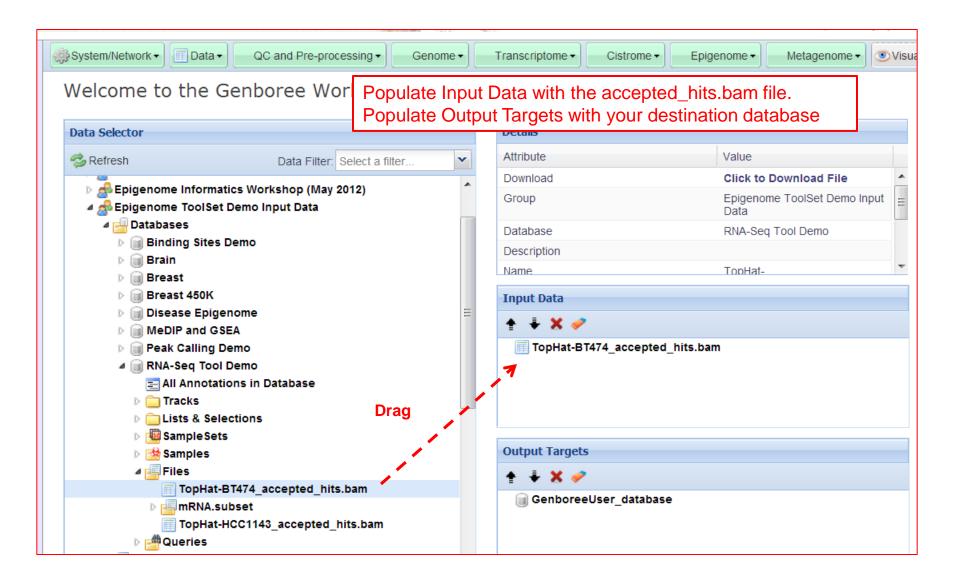
## 2 breast cancer cell lines

- Joe Gray 51 breast cancer cell lines panel
- Neve RM, Chin K, Fridlyand J, Yeh J, Baehner FL, Fevr T, Clark L, Bayani N, Coppe JP, Tong F, Speed T, Spellman PT, DeVries S, Lapuk A, Wang NJ, Kuo WL, Stilwell JL, Pinkel D, Albertson DG, Waldman FM, McCormick F, Dickson RB, Johnson MD, Lippman M, Ethier S, Gazdar A, Gray JW. "A collection of breast cancer cell lines for the study of functionally distinct cancer subtypes." *Cancer Cell*. 2006 Dec;10(6):515-27.

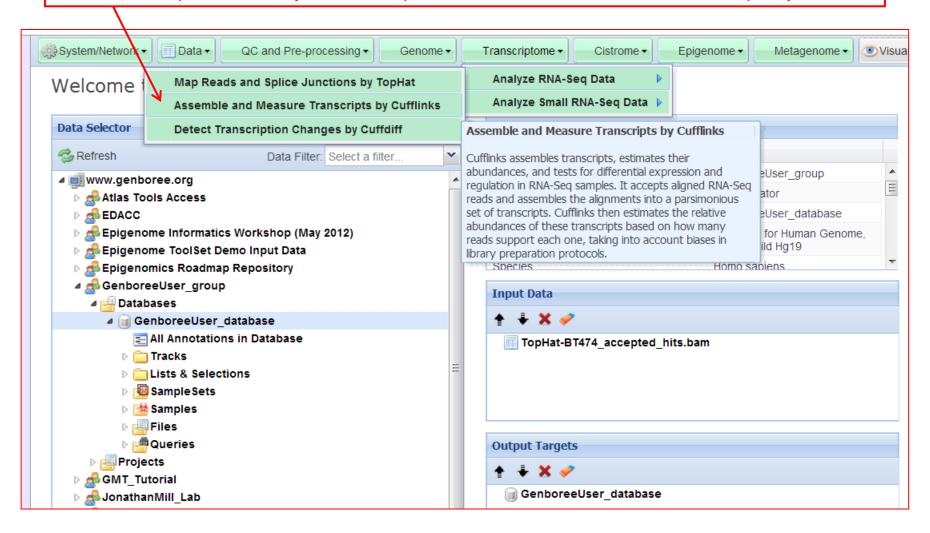
# **Evaluating Gene Expression Differences**

Sample	Luminal/Basal	ER status	PR status	Her2/ERBB2 status
BT474	Luminal	+	-	+
HCC1143	BasalA	-	-	-

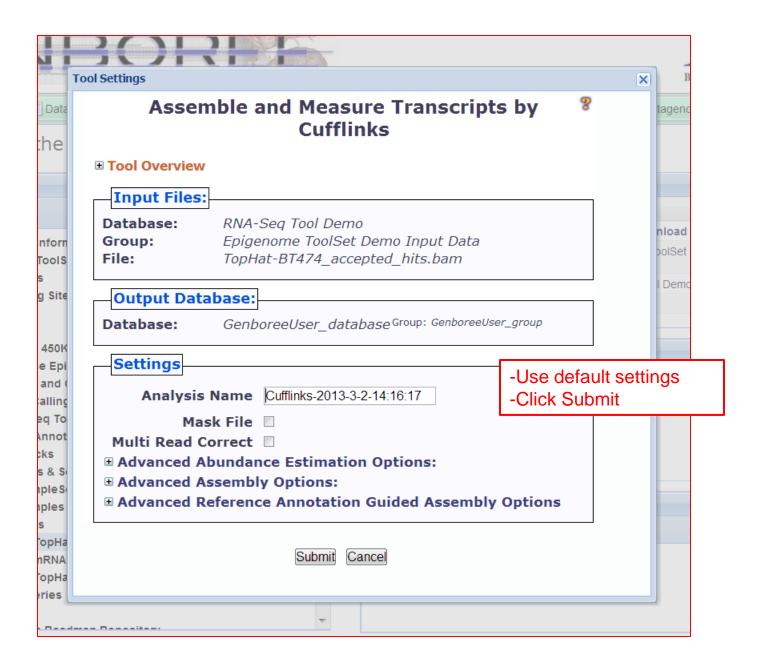
## Run Cufflinks in The Genboree Workbench

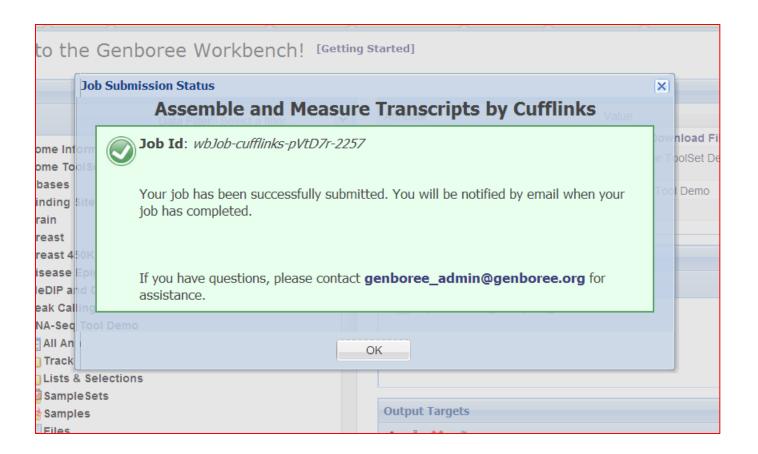


### Select Transcriptome → Analyze RNA-Seq Data → Assemble and Measure Transcripts by Cufflinks



**Cufflinks**: Trapnell et al, "Transcript assembly and quantification by RNA-Seq reveals unannotated transcripts and isoform switching during cell differentiation" *Nature Biotechnology*, 28 (5), May, 2010.





### You will receive an email with the following message when your job is finished:

Hello Genboree User,

Your Assemble and Measure Transcripts by Cufflinks job completed successfully.

### Job Summary:

JobID - wbJob-cufflinks-pVtD7r-2257

### Additional Info:

Database: 'GenboreeUser\_database'

Group: 'GenboreeUser\_group'

You can download result files from the 'Cufflinks-2013-3-2-14:16:17' folder under the 'Cufflinks' directory.

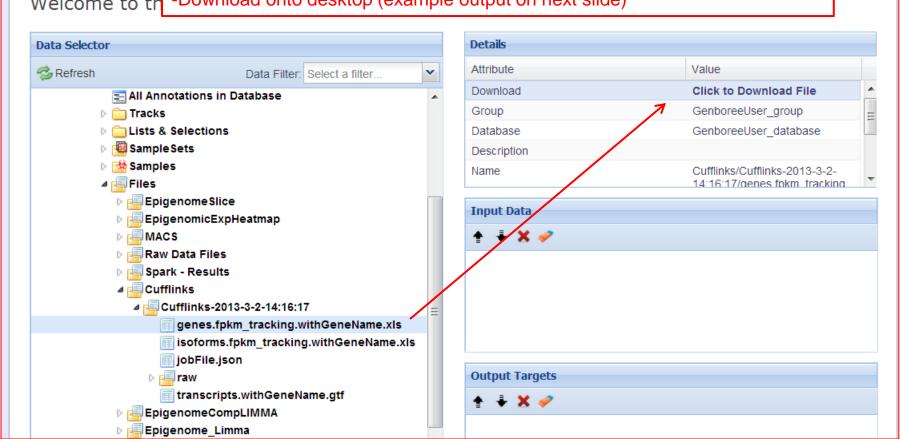
- The Genboree Team

Cufflinks files are deposited in the Data Selector in your user group.

- -Expand "Databases"
- -Expand "Files"

System/Network ▼

- -Expand "Cufflinks"
- -Click on the file of interest to highlight it in Details
- Welcome to th -Download onto desktop (example output on next slide)



Visualiz

## Cufflinks output file: Genes.fpkm\_tracking.withGeneName.Cufflinks

The gene\_name
Attribute of the reference GTF
record for this transcript

Fragments Per
Kilobase of exon model per Million
mapped fragments

Lower and upper limits of 95% FPKM confidence interval

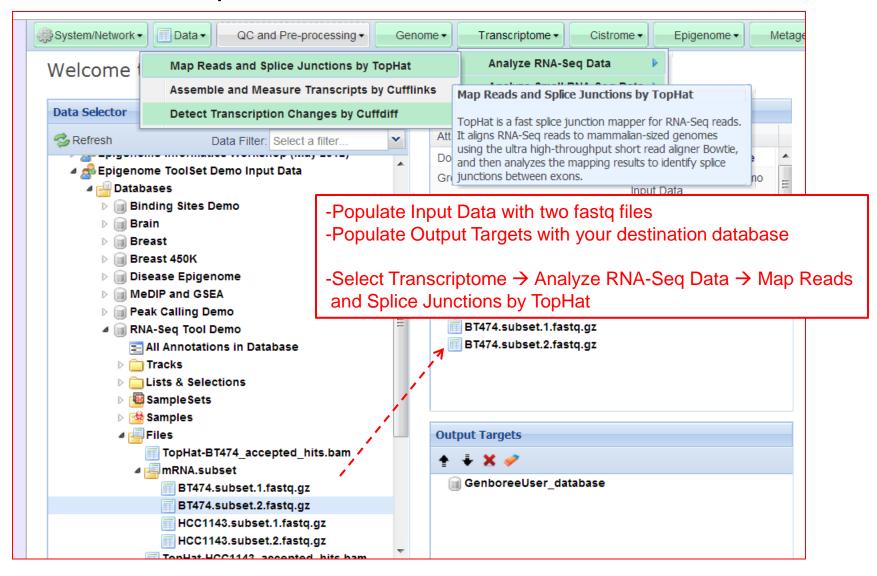
	А	В	С	D	Е	F	G	Н
1	tracking_id	gene_Name	gene_id	locus	FPKM	FPKM_conf_lo	FPKM_conf_hi	FPKM_status
2	NR_026818	FAM138A	NR_026818	chr1:34610-36081	0	0	0	OK
3	NM_001005484	OR4F5	NM_001005484	chr1:69090-70008	0	0	0	OK
4	NR_039983	LOC729737	NR_039983	chr1:134772-140566	2.53257	2.11926	2.94588	OK
5	NR_046018	DDX11L1	NR_046018	chr1:11873-14408	0	0	0	OK
6	NR_024540	WASH7P	NR_024540	chr1:14361-29370	8.29061	6.90868	9.67254	OK
7	NM_001005221	OR4F29	NM_001005221	chr1:367658-368597	0	0	0	OK
8	NR_028322	LOC100132287	NR_028322	chr1:323891-328581	0	0	0	OK
9	NR_028327	LOC100133331	NR_028327	chr1:323891-328581	1.37383	1.02514	1.72252	OK
10	NM_001005221	OR4F29	NM_001005221	chr1:621095-622034	0	0	0	OK
11	NR_028327	LOC100133331	NR_028327	chr1:661138-665731	1.75903	1.36669	2.15137	OK
12	NR_033908	LOC100288069	NR_033908	chr1:700244-714068	5.58483	4.26695	6.90271	OK
13	NR_024321	LINC00115	NR_024321	chr1:761585-762902	0.408129	0.0430874	0.773171	OK
14	NR_015368	LOC643837	NR_015368	chr1:763063-789740	4.20914	3.14288	5.27541	OK
15	NR_027055	FAM41C	NR_027055	chr1:803450-812182	0.205156	0	0.427136	OK
16	NR_026874	LOC100130417	NR_026874	chr1:852952-854817	0	0	0	OK
17	NM_198317	KLHL17	NM_198317	chr1:895966-901099	3.14807	2.45698	3.83916	OK

**Note:** 6 columns have been removed from the spreadsheet since they are empty. Those columns are: class\_code, nearest\_ref\_id, gene\_short\_name, tss\_id, length, and coverage.

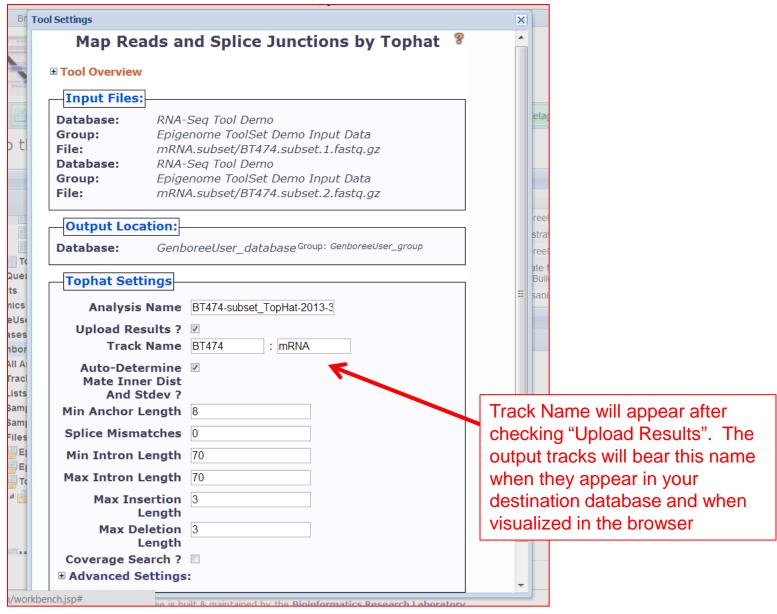
## Mapping with TopHat

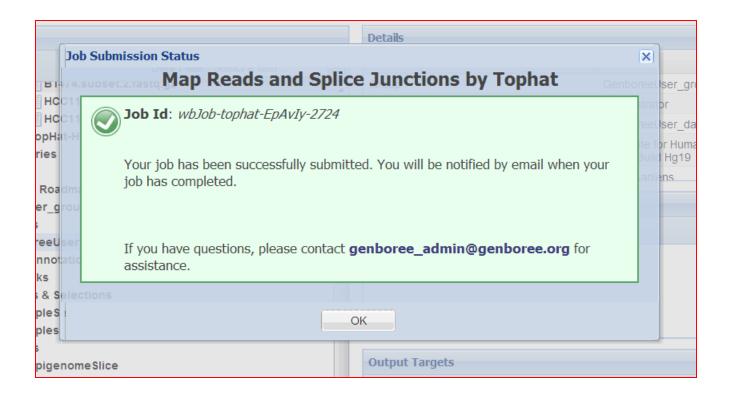
- Process data subset of one of the cell lines
  - BT474
  - Visualization in Genboree Browser and UCSC Browser

## Run TopHat in The Genboree Workbench



TopHat will map your reads by running Bowtie, and deposit results in a TopHat Files Folder in your destination database





You will receive an email with the following message when your job is finished:

Hello Genboree User,

Your Map Reads and Splice Junctions by Tophat job completed successfully.

Job Summary:

JobID - wbJob-tophat-EpAvly-2724

Additional Info:

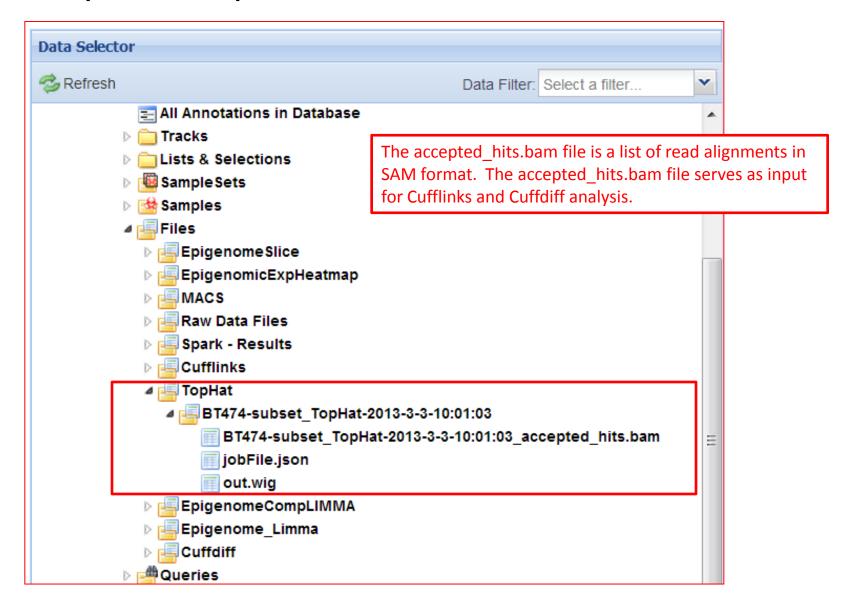
Database: 'GenboreeUser\_database'

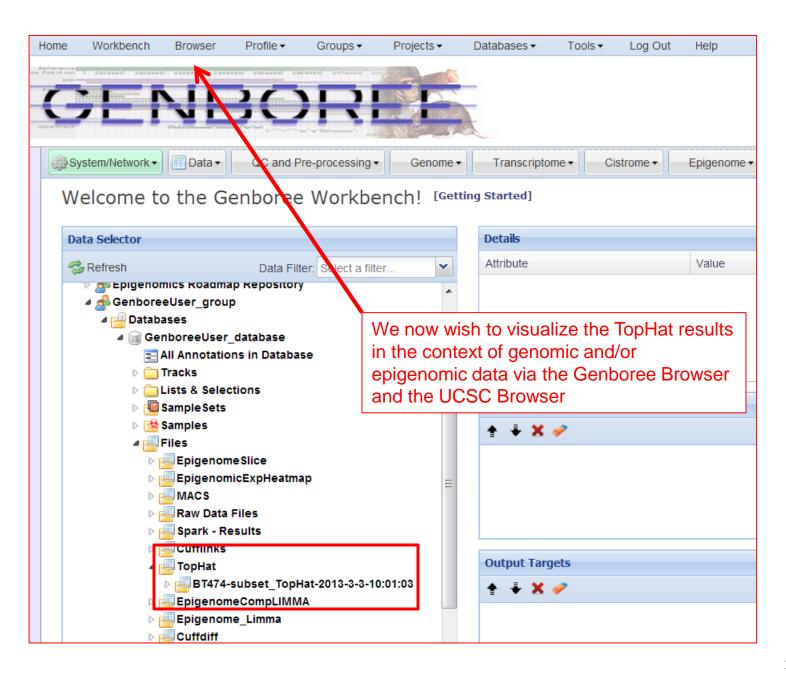
Group: 'GenboreeUser\_group'

You can download result files from the 'BT474-subset\_TopHat-2013-3-3-10:01:03' folder under the 'TopHat' directory.

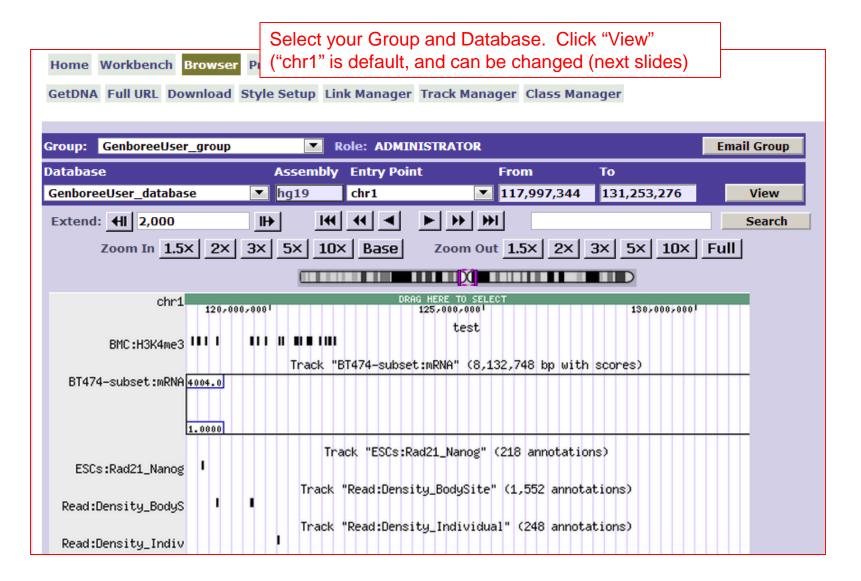
- The Genboree Team

## TopHat Output Files in the Data Selector

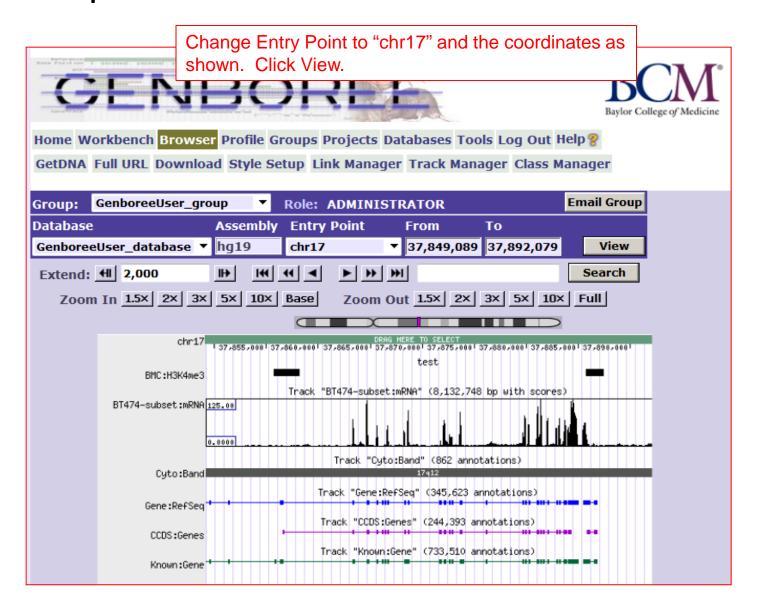




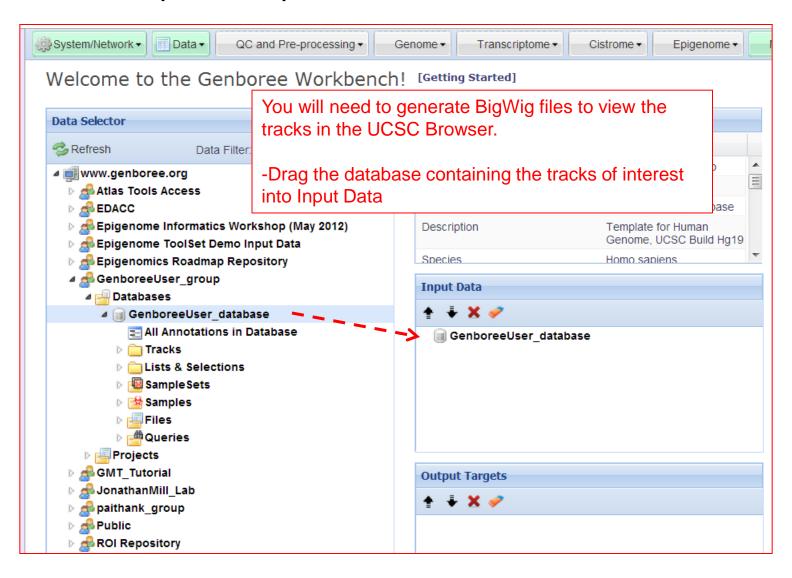
## Tell the Genboree Browser What You Wish to View



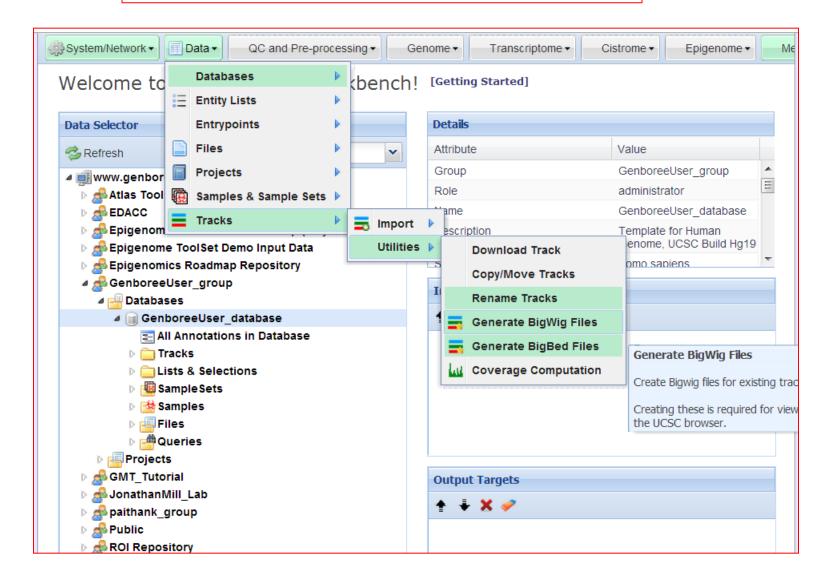
## View TopHat Results in the Genboree Browser



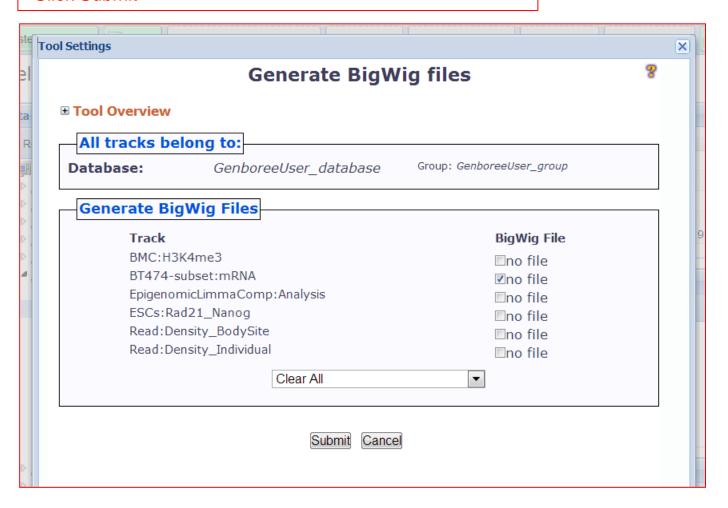
## Visualize TopHat output in the UCSC Genome Browser

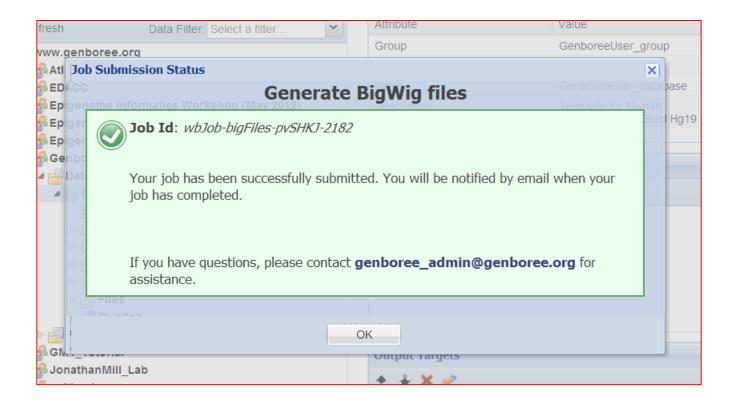


### Select Data → Tracks → Utilities → Generate BigWig Files



- -Select the tracks for which you wish to generate igWig Files
- -Click Submit





You will receive an email with the following message when your job is finished:

Hello Genboree User,

Your Generate BigWig Files job completed successfully.

### Job Summary:

JobID - wbJob-bigFiles-pvSHKJ-2182

### Additional Info:

You can use the following links to either download the big\* files or visualize the data in the UCSC genome browser (if the database has been unlocked)

### BT474-subset:mRNA:

### Download bigWig file:

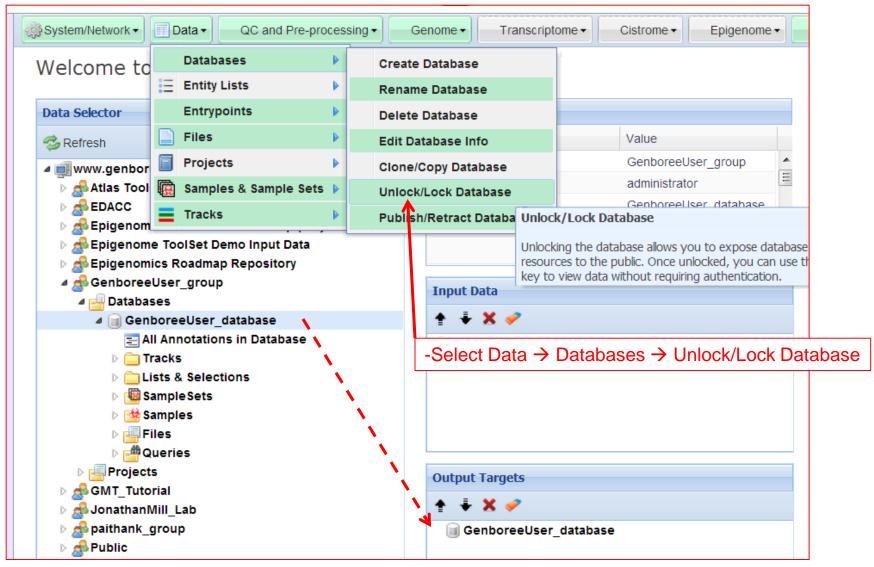
http://www.genboree.org/REST/v1/grp/GenboreeUser\_group/db/GenboreeUser\_database/trk/BT474-subset% 3AmRNA/bigWig?gbKey=eb8oft3v

Use this link to view the track in the UCSC browser.

http://genome.ucsc.edu/cgi-bin/hgTracks?db=hg19&hgt.customText=http%3A%2F%2Fwww.genboree.org%2FREST% 2Fv1%2Fgrp%2FGenboreeUser\_group%2Fdb%2FGenboreeUser\_database%2Ftrk%2FBT474-subset%253AmRNA% 3FgbKey%3Deb8oft3v%26format%3Ducsc browser%26ucscType%3DbigWig

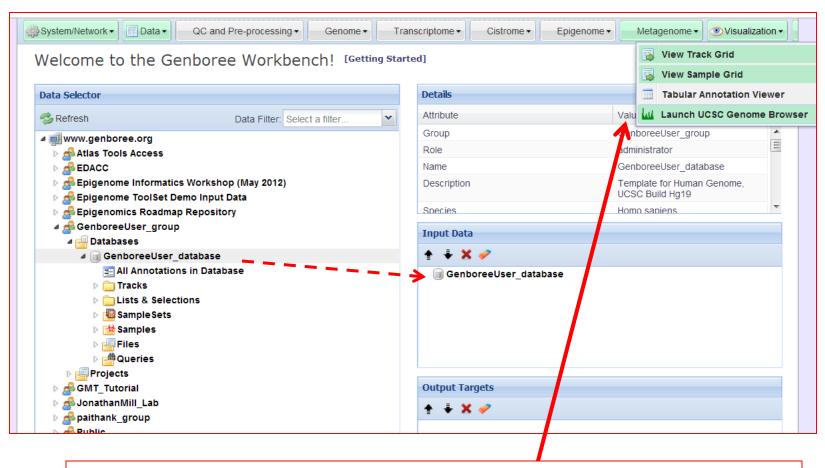
-Your Database is secure, and will need to be unlocked before the viewing the BigWig files in the UCSC Browser

-Drag your database with the tracks of interest into Output Targets

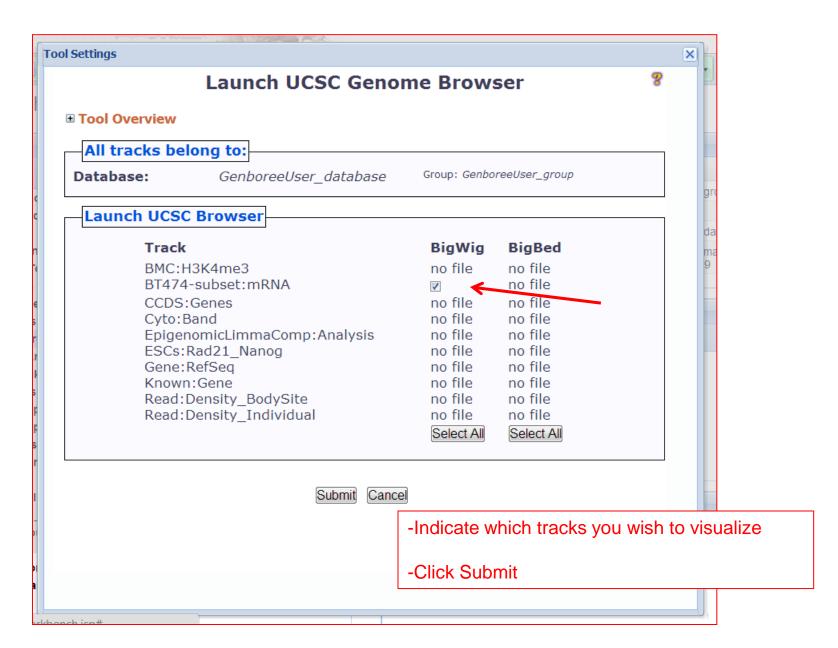






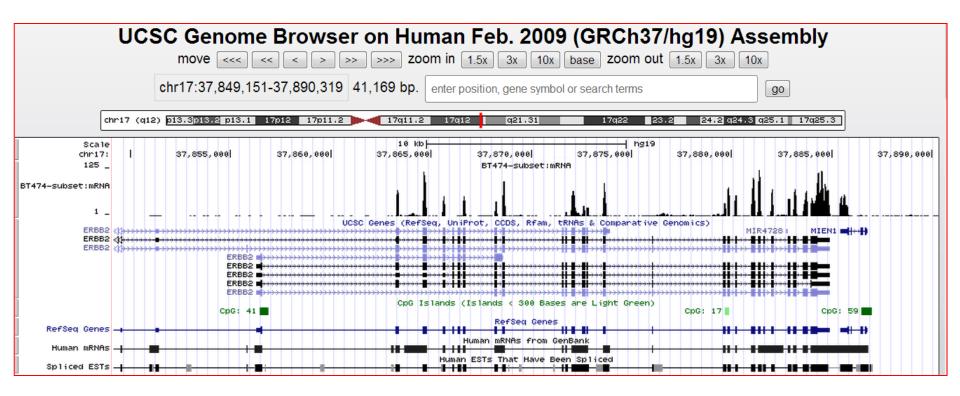


- -Populate Input Data with the database containing the tracks of interest
- -Select Visualization → Launch UCSC Genome Browser





# Tophat output in the Context of the UCSC Genome Browser



# Exercise plan

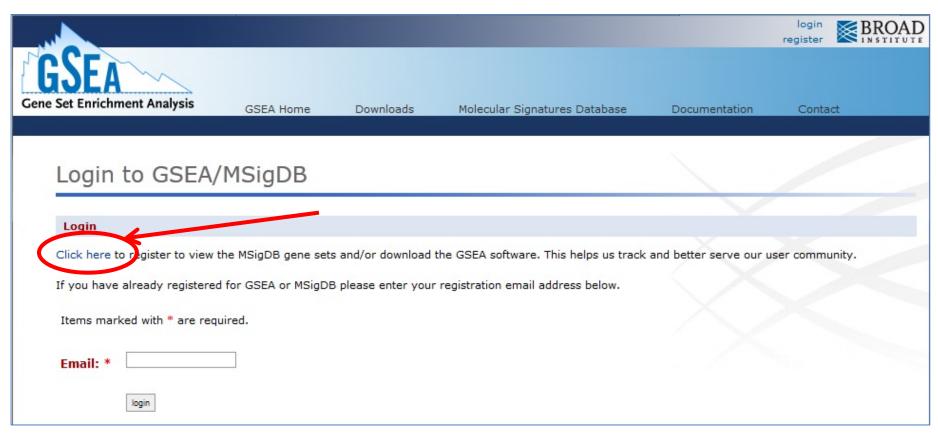
- Process subset of one of the cell lines
  - BT474
  - Visualization in Genboree Browser and UCSC Browser
  - Gene enrichment via GSEA/MSigDB

# GSEA/MSigDB

- Gene Set Enrichment Analysis
  - Subramanian, Tamayo, et al. 2005, PNAS 102, 15545-15550
  - Mootha, Lindgren, et al. 2003, Nat Genet 34, 267-273
- Molecular Signatures Database
  - Subramanian, Tamayo, et al. 2005, PNAS 102, 15545-15550
- Exposed as a web service
- Future plan
  - integrate into the Epigenome Toolset

# Register to MSigDB

http://www.broadinstitute.org/gsea/login.jsp



## Register to MSigDB

## GSEA/MSigDB Registration and License Agreement

### Instructions to obtain GSEA software and/or MSigDB gene sets. Please Read carefully.

- 1. Fill in the form below.
- 2. The software and gene sets are freely available to individuals in academic and private institutions. There are no licensing fees.
- 3. Source code is freely available.
- Read the license agreement and make sure you agree with the terms of the agreement.
   If so, click the 'I Agree button' at the end of the form and you will be transferred to the GSEA download page.

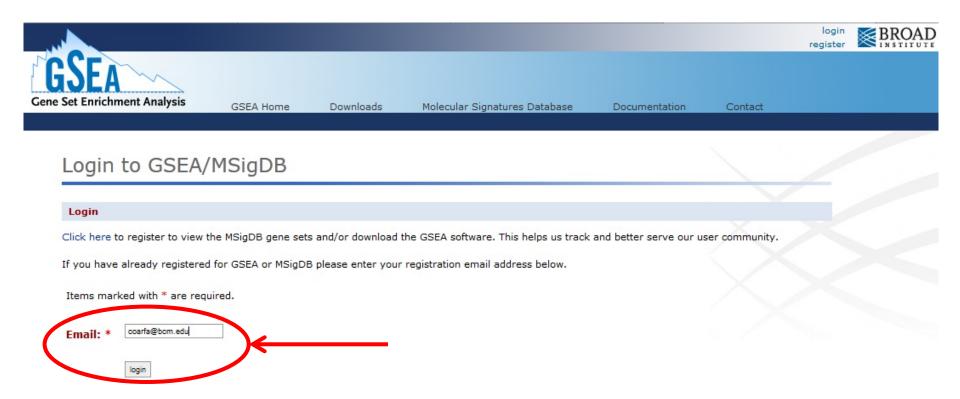
Items marked with \* are required.

Name: *		
Email: *	(You will receive a registration notification email.)	
Organization: *		
Country: *	select a country	
Join mailing list:	notify me of GSEA updates (You will receive a confirmation email. Reply to join the list.)	
Comments:		
	.44	
GSEA and MSigDB license agreements:	**** GSEA/MSigDB LICENSE AGREEMENT ****	<u>*</u>
	MASSACHUSETTS INSTITUTE OF TECHNOLOGY SINGLE USER LICENSE AGREEMENT FOR INTERNAL RESEARCH PURPOSES ONLY	
	This Agreement is made between Massachusetts Institute of Technology with a principal address at 77	_
	Massachusetts Avenue, Cambridge, MA 02139 ("MIT") and the subscriber above ("LICENSEE"), and is effective at the date the development is completed and proper registration/licensee	ati

**I AGREE** 

# Login to MSigDB

http://www.broadinstitute.org/gsea/login.jsp



### Investigate Gene Sets

Gain further insight into the biology behind a gene set by using the following tools:

- compute overlaps with other gene sets in MSigDB (more...)
- display the gene set expression profile based on a selected compendium of expression data (more...)
- categorize members of the gene set by gene families (more...)

### **Gene Identifiers Compute Overlaps** C1: positional gene sets C2: curated gene sets CGP: chemical and genetic perturbations ? CP: canonical pathways CP:BIOCARTA: BioCarta gene sets CP:KEGG: KEGG gene sets 2 CP:REACTOME: Reactome gene sets 1 C3: motif gene sets MIR: microRNA targets TFT: transcription factor targets C4: computational gene sets 2 CGN: cancer gene neighborhoods 12 CM: cancer modules 2 C5: GO gene sets BP: GO biological process CC: GO cellular component MF: GO molecular function show top 10 v genesets

compute overlaps

#### Compendia expression profiles

- Human tissue compendium (Novartis)
- Global Cancer Map (Broad Institute)
- NCI-60 cell lines (National Cancer Institute)

display expression profile

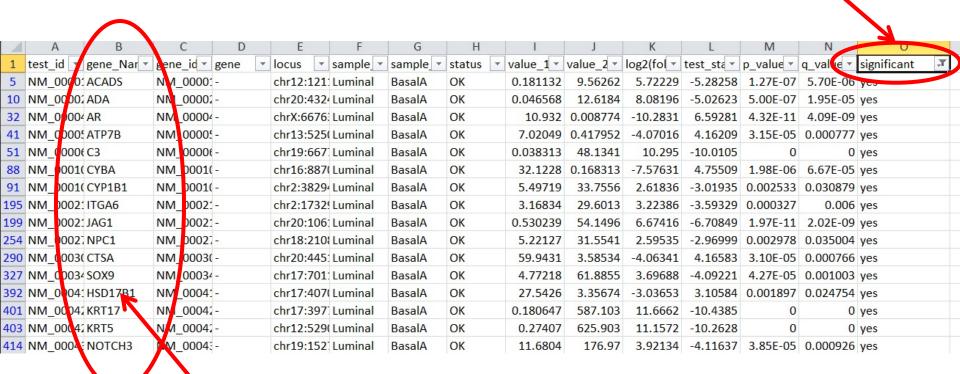
#### Gene families

show gene families

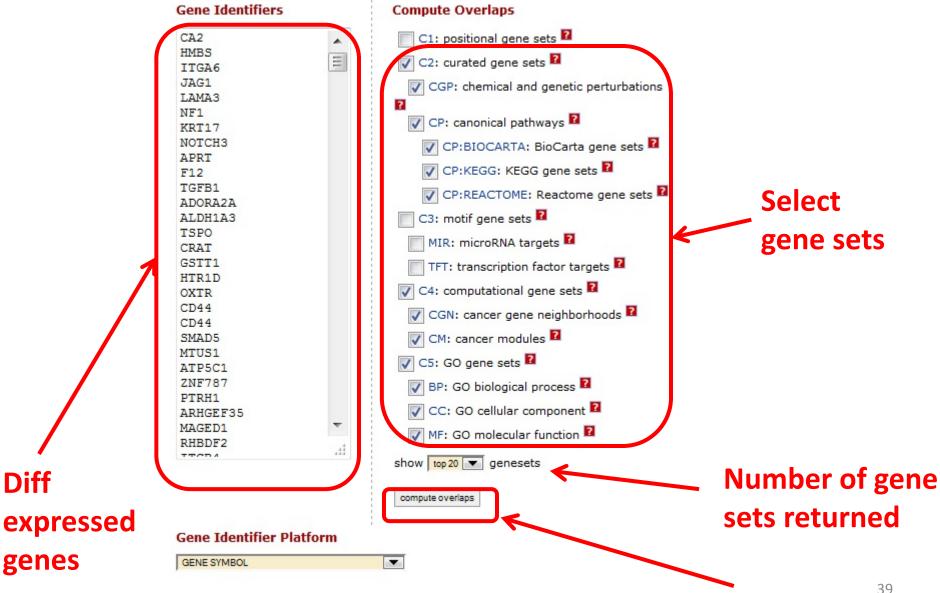
**Gene Identifier Platform** 

## Gene expression differences

Filter by "significant," column



Copy "official" gene symbol



### Compute Overlaps for Selected Genes

Converted 701 submitted identifiers into 599 gene symbols, click here for details.

Collections	# Overlaps	# Gene Sets in	# Genes in Comparison	# Genes in Collections
	Shown	Collections	(n)	(N)
C2, C4, C5	10	5607	599	22684

Click the gene set name to see the gene set page. Click the number of genes [in brackets] to download the list of genes.

Color bar shading from light green to black, where lighter colors indicate more significant p values (< 0.05) and black indicates less significant p values (>= 0.05).

Export: Excel

Gene Set Name [# Genes (K)]	Description	# Genes in Overlap (k)	k/K	p value 🛭
NUYTTEN_NIPP1_TARGETS_DN [777]	Genes down-regulated in PC3 cells (prostate cancer) after knockdown of NIPP1 [Gene	67		0 e <sup>0</sup>
CHANGE CONTROL DAGAL ON [242]	Consider and to be a			
SMID_BREAST_CANCER_BASAL_DN [713]	Genes down-regulated in basal subtype of breast cancer samles.	65		0 e <sup>0</sup>
SMID_BREAST_CANCER_LUMINAL_B_DN [599]	Genes down-regulated in the luminal B subtype of breast cancer.	63		0 e <sup>0</sup>
CREIGHTON_ENDOCRINE_THERAPY_RESISTANCE NCE_5 [482]	The 'group 5 set' of genes associated with acquired endocrine therapy resistance in breast tumors expressing ESR1 but not ERBB2 [Gene ID=2099, 2004].	54		0 e <sup>C</sup>
SMID_BREAST_CANCER_BASAL_UP [676]	Genes up-regulated in basal subtype of breast cancer samles.	78		0 e <sup>0</sup>
CHARAFE_BREAST_CANCER_LUMINAL_VS_BASAL SAL_DN [456]	Genes down-regulated in luminal-like breast cancer cell lines compared to the basal-like	59		0 e <sup>0</sup>

SMID_BREAST_CANCER_BASAL_DN [713]	Genes down-regulated in basal subtype of breast cancer samles.	65	0 e <sup>0</sup>
SMID_BREAST_CANCER_LUMINAL_B_DN [599]	Genes down-regulated in the luminal B subtype of breast cancer.	63	0 e <sup>0</sup>
SMID_BREAST_CANCER_BASAL_UP [676]	Genes up-regulated in basal subtype of breast cancer samles.	78	0 e <sup>0</sup>
CHARAFE_BREAST_CANCER_LUMINAL_VS_BASAL SAL_DN [456]	Genes down-regulated in luminal-like breast cancer cell lines compared to the basal-like ones.	59	0 e <sup>0</sup>

# **Enrichments for gene sets differentiating luminal vs basal breast cancer cells**