Galaxy for NGS Data Analysis A Hands-on Workshop

Plant & Animal Genome XXII San Diego, January 14, 2014

Dave Clements Johns Hopkins University http://galaxyproject.org/

Anushka Brownley The BioTeam http://bioteam.net



The Agenda

4:00 Introduction to Galaxy
Hands-on Analysis
Running a Local Galaxy
Community Resources
6:10 Done

-Galaxy @

Plant and Animal Genome XXII (PAG 2014)

UCSC Genome Browser Sat 4:00-6:10, California Room Robert Kuhn

The Banana Genome Hub Tues 11:50-12:10, Pacific Salon 6-7 Gaëtan Droc, *et al.*

Galaxy for NGS Analysis A Hands-on Workshop

Tues 4:00-6:10, California Room Dave Clements, Anushka Brownley

This workshop will introduce the Galaxy platform and walk participants through a multi-step next generation sequencing data analysis, starting with quality control. We will review common choices in NGS data analysis, and demonstrate them within the context of Galaxy, taking advantage of Galaxy's tool set and visualization capabilities.

We will also provide a brief overview of what is needed to set up your own local Galaxy instance. This complements the *Galaxy CloudMan* talk on Wednesday

P988: The South Green Bioinformatics Platform,

P1050: Integrative System for Gene Family Gathering

and Analysis in a Context of Crops' Stress Response

Mon 10:00-11:30

Mathieu Rouard, et al.

Study, Delphine Lavivière, et al.

URGI Plant and Fungi Platform Distributed Resources Through GMOD Tools Wed 11:10-11:50, GMOD Workshop Golden West Joelle Amselem, *et al.*

Galaxy CloudMan A Gentle Introduction to Data Analysis on the Cloud

Wed 11:50-12:30, GMOD Workshop, Golden West Dave Clements

Galaxy is open-source and web-based, with over 50 publicly accessible Galaxy servers and hundreds of private installations around the world. Galaxy can also be run on compute clouds using *Galaxy CloudMan*.

This talk will briefly introduce Galaxy, Galaxy CloudMan, and some basic cloud concepts. We'll then show a live demonstration of how to setup a Galaxy server on Amazon Web Services (one of several supported cloud infrastructures) using CloudMan, add a dynamically scalable compute cluster to perform analysis, customize the server by adding new tools, and then shut the server down. All steps can be done through a web browser, without ever using a command line interface.

Poster Sessions

Mon 3:00-4:30

- P135: SNP Genotyping to Accelerate Rice Breeding, Michael Thomson, *et al.*
- P1041: RepeatExplorer: Collection of Tools for Mining of Repetitive Elements from NGS Data, Petr Novak, et al.

The Galaxy Project

Galaxy is an open source web-based platform for data integration and analysis in life sciences research.

The Galaxy Project is supported by a large and active community.

http://galaxyproject.org

This workshop complements tomorrow's talks:

http://bit.ly/gxypag2014



Not The Agenda

This workshop will not cover

- details of how tools are implemented, or
- new algorithm designs, or
- which assembler or mapper or peak caller or ... is best for you.

This workshop is *not* about learning how to do a specific type of analysis.

Goal is to demonstrate how Galaxy can help you explore and learn options, perform analysis, and then share, repeat, and reproduce your analyses.

What is Galaxy?

- A free (for everyone) web service
- Open source software
- These options result in several ways to use Galaxy

http://galaxyproject.org

As a free (for everyone) web service integrating a wealth of tools, compute resources, terabytes of reference data and permanent storage http://usegalaxy.org

However, a centralized solution cannot scale to meet the analysis needs of the entire world.

• As a free (for everyone) web service http://usegalaxy.org

• As open source software

http://getgalaxy.org Anushka will cover this more later

• As a free (for everyone) web service http://usegalaxy.org

• As open source software http://getgalaxy.org



• On the Cloud

We are using this today.

Galaxy CloudMan: A Gentle Introduction to Data Analysis on the Cloud

Wed, 11:50, Golden West

http://aws.amazon.com/education http://wiki.galaxyproject.org/Cloud

- As a free (for everyone) web service
- As open source software
- On the Cloud



- With Commercial Support
 - A ready-to-use appliance (BioTeam) Cloud-based solutions (ABgenomica, AIS, Appistry, GenomeCloud)
 - Consulting & Customization (Arctix, Deena Bioinformatics)

Galaxy Project: Further reading & Resources

http://galaxyproject.org http://usegalaxy.org http://getgalaxy.org http://wiki.galaxyproject.org/Cloud http://bit.ly/gxychoices

Agenda

 4:00 Introduction to Galaxy Hands-on Analysis Quality Control
 Running a Local Galaxy Community Resources
 6:10 Done

What is our path?

- Will walk through an NGS example.
- Will adjust content based on this audience's experience level
- Will get as far as we get.

http://cloud1.galaxyproject.org/ http://cloud2.galaxyproject.org/ http://cloud3.galaxyproject.org/

NGS Data Analysis Experience?

Novice

Middling

Expert

l'm getting a terabyte of data! That's a good thing, isn't it? I've done some, but there has to be an easier way.

Just here to see if Galaxy can help others less fortunate than myself.

NGS Data Quality Control

- Introduce FASTQ format
- Examine quality in an RNA-Seq dataset
- Trim/filter as we see fit, hopefully without breaking anything.

Quality Control is not sexy. It is vital.

What is **FASTQ**?

Specifies sequence (FASTA) and quality scores (PHRED)

• Text format, 4 lines per entry



• FASTQ is such a cool standard, there are 3 (or 5) of them!

SSSSSSSSSSSSSSS	SSSSSSSSSSSS	SSS	SSSSSSS	SSSSS	SSSS	SSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSS	SSSSSSSSSSSSSSSS	SSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSS
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!"#\$%&'()*+ ,- ./()123456789 :;	;<=>	>?@ABCDI	EFGHI	JKLMN	NOPQRSTUVWXYZ $[\]^{}$	`abcdefghijklmno	<pre>opqrstuvwxyz{ }~</pre>
33	59)	64	73			104	126
S – Sanger	Phred+33,	93	values	(0,	93)	(0 to 60 expected	in raw reads)	
I - Illumina 1.3	Phred+64,	62	values	(0,	62)	(0 to 40 expected	in raw reads)	
X – Solexa	Solexa+64,	67	values	(-5,	62)	(-5 to 40 expected	d in raw reads)	

http://en.wikipedia.org/wiki/FASTQ_format

NGS Data Quality Exercise

Create new history (cog) \rightarrow Create New Get some data Shared Data → Data Libraries → UC Davis RNA-Seq Human* → Select MeOH_REP1_R1, MeOH_REP1_R2 and then Import to current history



* RNA-Seq example datasets from the 2013 UC Davis Bioinformatics Short Course. http://bit.ly/ucdbsc2013 NGS Data Quality: Assessment tools Options 1 & 2:

- 1. NGS QC and Manipulation → Compute Quality Statistics NGS QC and Manipulation → Draw quality score boxplot No control over how it is calculated or presented, statistics in text and graphic formats.
- 2. NGS QC and Manipulation → FastQ Summary Statistics, Graph / Display Data → Boxplot of quality statistics Lots of control over what the box plot looks like, statistics in text and graphic formats

NGS Data Quality: Assessment tools

Option 3:

- 3. NGS QC and Manipulation \rightarrow FastQC
 - Gives you a lot a lot more information but little control over how it is calculated or presented.

http://bit.ly/FastQCBoxPlot

NGS Data Quality: Sequence bias at front of reads?



From a sequence specific bias that is caused by use of random hexamers in library preparation.

Hansen, et al., "Biases in Illumina transcriptome sequencing caused by random hexamer priming" *Nucleic Acids Research*, Volume 38, Issue 12 (2010)

NGS Data Quality: Trim as we see fit

- Trim as we see fit: Option 1
 - NGS QC and Manipulation →
 FASTQ Trimmer by column
 - Trim same number of columns from every record
 - Can specify different trim for 5' and 3' ends





NGS Data Quality: Base Quality Trimming

- Trim Filter as we see fit: Option 2
 - NGS QC and Manipulation →
 Filter FASTQ reads by quality
 score and length
 - Keep or discard whole reads
 - Can have different thresholds for different regions of the reads.
 - Keeps original read length.



NGS Data Quality: Base Quality Trimming

- Trim as we see fit: Option 3
 - NGS QC and Manipulation →
 FASTQ Quality Trimmer by sliding window
 - Trim from both ends, using sliding windows, until you hit a high-quality section.
 - Produces variable length reads





Trim? As we see fit?

- Introduced 3 options
 - One preserves original read length, two don't
 - One preserves number of reads, two don't
 - Two keep/make every read the same length, one does not
 - One preserves pairings, two don't

Trim? As we see fit?

Choice depends on downstream tools

- Find out assumptions & requirements for downstream tools and make appropriate choice(s) now.
- How to do that?
 - Read the tool documentation
 - http://biostars.org/
 - http://seqanswers.com/
 - http://galaxyproject.org/search





NGS Data Quality: Base Quality Trimming



- I really want to use Option 3:
- NGS QC and Manipulation →
 FASTQ Quality Trimmer by
 sliding window

but ...

"Mixing paired- and single- end reads together is not supported." Tophat Manual

"If you are performing RNA-seq analysis, there is no need to filter the data to ensure exact pairs before running Tophat." Jen Jackson

Galaxy User Support Person Extraordinaire

"Dang."

Dave C, mortal

Running Tophat on *no-longer-cleanly-paired* data *does map the reads*, but, it no longer keeps track of read pairs in the SAM/BAM file.

Keeping paired ends paired: Options

- Don't bother.
- Run a workflow that removes any unpaired reads before mapping.
- Run the Picard Paired Read Mate Fixer after mapping reads.
- Use sliding windows for QC, but keep empty reads.

NGS Data Quality: Base Quality Trimming



- I'll use Option 3! (but with the special sauce):
- NGS QC and Manipulation → FASTQ
 Quality Trimmer by sliding window
 - Check "Keep reads with zero length"
- Run again:
- NGS QC and Manipulation → FastQC on trimmed dataset

NGS Data Quality: Base Quality Trimming

Distribution of sequence lengths over all sequences Sequence Length 41 43 45 47 49 51 53 55 Sequence Length (bp)

New Problem? Now some reads are so short they are just noise and can't be meaningfully mapped

Option 2 can fix this (but break pairings).

Or, your mapper may have an option to ignore shorter reads

NGS Data Quality: Sequencing Artifacts

Repeat this process with MeOH Rep1 R2 (the reverse reads) ... and there's a problem in Overrepresented sequences:

Overrepresented sequences

Sequence	Count	Percentage	Possible Source
CTGTGTATTTGTCAATTTTCTTCTCCACGTTCTTCTCGGCCTGTTTCCGTAGCCT	590	0 3541692929220167	No Hit
TTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTT	342	0.2052981325073385	No Hit
CGGCCACAAATAAACACAGAAATAGTCCAGAATGTCACAGGTCCAGGGCAGAGGA	325	0.19509325457568719	No Hit
CTGCATTATAAAAAGGACAGCCAGATATCAACTGTTACAGAAATGAAAATAAGACG	230	0.13806599554587093	No Hit
CGGCCGCAAATAAACACAGAAATAGTCCAGAATGTCACAGGTCCAGGGCAGAGGA	199	0.11945710049403614	No Hit
GTCAGCTCAACTTGTAGGCCCCCAAAAGAAAACAGCGTCTTACTGGGGAGGGA	197	0.11825652661972422	No Hit

NGS QC and Manipulation \rightarrow Remove sequencing artifacts But this will break pairings.

NGS Data Quality: Done with 1st Replicate!

Now, only 5 more to go!

Workflows:

Create a QC workflow that does all these steps

(Or, cheat and import the shared workflow.)

Load the MeOH_REP2, R3G_REP1, and R3G_REP2 replicates into your history, and

Run them through your workflow.

NGS Data Quality: Further reading & Resources

FastQC Documenation

Read Quality Assessment & Improvement by Joe Fass From the UC Davis 2013 Bioinformatics Short Course Manipulation of FASTQ data with Galaxy

by Blankenberg, et al.

Agenda

4:00 Introduction to Galaxy Hands-on Analysis Mapping with TopHat Running a Local Galaxy Community Resources
6:10 Done

RNA-seq Exercise: Mapping with Tophat Create a new history Import all datasets from library: UC Davis RNA-Seq \rightarrow RNA-Seq reads filtered Get all datasets, and UC Davis RNA-Seq \rightarrow Chr12 Get genes_chr12.gtf NGS: RNA Analysis \rightarrow TopHat for Illumina

RNA-seq Exercise: Mapping with Tophat

- Tophat looks for best place(s) to map reads, and best places to insert introns
- Imagine pages and pages of discussion on the intricacies and pitfalls of RNA-seq mapping here.

Mapping with Tophat: mean inner distance

Expected distance between paired ends

- Has to be provided to you by sequencing core!
- We'll use 90* for mean inner distance
- We'll use 50 for standard deviation

The library was constructed with the typical Illumina TruSeq protocol, which is supposed to have an average insert size of 200 bases. Our reads are 55 bases (R1) plus 55 bases (R2). So, the Inner Distance is estimated to be 200 - 55 - 55 = 90

From the 2013 UC Davis Bioinformatics Short Course

Mapping with Tophat: Use Existing Annotations?

You can bias Tophat towards known annotations

- Use Own Junctions \rightarrow Yes
 - Use Gene Annotation → Yes
 - Gene Model Annotation → genes_chr12.gtf
- Use Raw Junctions → Yes (tab delimited file)
- Only look for supplied junctions → Yes

Mapping with Tophat: Make it quicker?

Warning: Here be dragons!

• Allow indel search \rightarrow No

Use Coverage Search → No (wee dragons)

TopHat generates its database of possible splice junctions from two sources of evidence. The first and strongest source of evidence for a splice junction is when two segments from the same read (for reads of at least 45bp) are mapped at a certain distance on the same genomic sequence or when an internal segment fails to map - again suggesting that such reads are spanning multiple exons. With this approach, "GT-AG", "GC-AG" and "AT-AC" introns will be found *ab initio*. The second source is pairings of "coverage islands", which are distinct regions of piled up reads in the initial mapping. Neighboring islands are often spliced together in the transcriptome, so TopHat looks for ways to join these with an intron. We only suggest users use this second option (--coverage-search) for short reads (< 45bp) and with a small number of reads (<= 10 million). This latter option will only report alignments across "GT-AG" introns

TopHat Manual

Mapping with Tophat: Max # of Alignments Allowed

- Some reads align to more than one place equally well.
- For such reads, how many should Tophat include?
- If more than the specified number, Tophat will pick those with the best mapping score.
- Tophat break ties randomly.
- Tophat assigns equal fractional credit to all *n* mappings

Instructs TopHat to allow up to this many alignments to the reference for a given read, and choose the alignments based on their alignment scores if there are more than this number. The default is 20 for read mapping. Unless you use --report-secondary-alignments, TopHat will report the alignments with the best alignment score. If there are more alignments with the same score than this number, TopHat will randomly report only this many alignments. In case of using --report-secondaryalignments, TopHat will try to report alignments up to this option value, and TopHat may randomly output some of the alignments with the same score to meet this number.

TopHat Manual

Mapping with Tophat: How did we do? NGS: SAM Tools \rightarrow flagstat

Mapping with Tophat: Lets do it some more! NGS: RNA Analysis → TopHat for the remaining 3 replicates **RNA-Seq Mapping With Tophat: Resources**

RNA-Seq Concepts, Terminology, and Work Flows by Monica Britton

<u>Aligning PE RNA-Seq Reads to a Genome</u> by Monica Britton

both from the UC Davis 2013 Bioinformatics Short Course

<u>RNA-Seq Analysis with Galaxy</u> by <u>Jeroen F.J. Laros</u>, <u>Wibowo Arindrarto</u>, <u>Leon Mei</u>

from the GCC2013 Training Day

<u>RNA-Seq Analysis with Galaxy</u> by Curtis Hendrickson, David Crossman, Jeremy Goecks

from the GCC2012 Training Day

Tophat Manual

Agenda

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Galaxy Resources and Community: Mailing Lists http://wiki.galaxyproject.org/MailingLists

Galaxy-Announce

Project announcements, low volume, moderated Low volume (47 posts in 2013, 3400+ members) Galaxy-User

Questions about using Galaxy and usegalaxy.org High volume (1328 posts in 2013, 2600+ members) Galaxy-Dev

Questions about developing for and deploying Galaxy High volume (5200 posts in 2013, 900+ members)

Community: Public Galaxy Instances http://bit.ly/gxyServers

Interested in:

ChIP-chip and ChIP-seq? ✓ Cistrome **Statistical Analysis?** ✓ Genomic Hyperbrowser Protein synthesis? ✓ GWIPS-viz de novo assembly? ✓ CBIIT Galaxy **Reasoning with ontologies?** ✓ OPPL Galaxy **Repeats!** ✓ RepeatExplorer **Everything**? ✓ Andromeda

Over 50 public Galaxy servers

Unified Search: http://galaxyproject.org/search

Coogle" Custom Search Search the entire set of Galaxy web sites and mailing lists using Google. Run this search at Google.com (useful for bookmarking) Want a different search? Project home



Community can create, vote and comment on issues



http://bit.ly/gxyissues

http://wiki.galaxyproject.org

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Ga	alaxy	Galaxy @ PAG/GMOD
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Galaxy's public service web site makes analysis tools, genomic data, tutorial demonstrations, persistent workspaces, and publication services available to any scientist. Extensive user documentation (applicable to any public or local Galaxy instance) is available on this wiki and elsewhere.	 Galaxy is open source for all organizations. Local Galaxy servers can be set up by downloading and customizing the Galaxy application. Admin Cloud Galaxy Appliance 	Communicate Support • News S Events • Twitter Mailing Lists (search)
-usegalaxy.org	-getgalaxy.org	Deploy Galaxy Get Galaxy • Cloud Admin • Tool Config Tool Shed • Search
Community & Project	Contribute	
Galaxy has a large and active user community and many ways to Get Involved. • Community	 Users: Share your histories, workflows, visualizations, data libraries, and Galaxy Pages, enabling others to use and learn from them. 	SLESTREAM CARE Selery made easy.
News Events	 Deployers and Developers: Contribute tool definitions to the Galaxy Tool Shed (making it easy for others to use those tools on 	Tool Shed • Share
Support	their installations), and code to the core release.	Issues & Requests

Events

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	Date	Topic/Event	Venue/Location	Contact		Galaxy on Twitter	November 2013 Galaxy Update
		Galaxy for NGS Data Analysis: A Hands-on Computer Demo		Dave Clements, Anu	shka Brownley	 Learn Support About the Galaxy Project 	GCC2014: Save These Dates! Galaxy Day, 4 décembre à Paris
January 11-15	January 11-15	Galaxy Cloudman: A Gentle Introduction to Data Analysis on the Cloud Part of the GMOD Workshop	Plant and Animal Genome XXII (PAG 2014), San Diego, California, United States	Dave Clements, Scott Cain		News Items	News Archive
	Plus 3 more talks and 4 posters	-	See list		January 2014 CloudMan Release		
	January 16-17	2014 GMOD Meeting	San Diego, California, United States	Dave Clements, Scott Cain		We just released an update to Galaxy CloudMan. CloudMan offers an easy way to get a personal and completely functional instance of Galaxy	R
	February 5-6	Mosquito Informatics	EBI, Hinxton, United Kingdom	Dan Lawson <lawson at="" do<="" ebi="" td=""><td>T ac DOT uk></td><td>in the cloud in just a few minutes, without any manual configuration. This update brings a large number of updates and new features, the</td><td>WCloudMan</td></lawson>	T ac DOT uk>	in the cloud in just a few minutes, without any manual configuration. This update brings a large number of updates and new features, the	WCloudMan



BALTIMORE, MD | JUNE 30 - JULY 2, 2014

http://bit.ly/gcc2014







Galaxy Resources & Community: Videos



"How to" screencasts on using and deploying Galaxy

Talks from previous meetings.

http://vimeo.com/galaxyproject

Galaxy Resources & Community: CiteULike Group

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by Shaun Webb, Ralph Hector, Grzegorz Kudla, Sander Granneman posted to tools by galaxyproject to the group Galaxy keyed Webb2014PARCLIP on 2014-01-11 03:03:36 **/ along with 1 person

http://bit.ly/gxycul

Over 1300 papers

17 different tags

Thanks



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clements@galaxyproject.org

Anushka Brownley The BioTeam http://bioteam.net