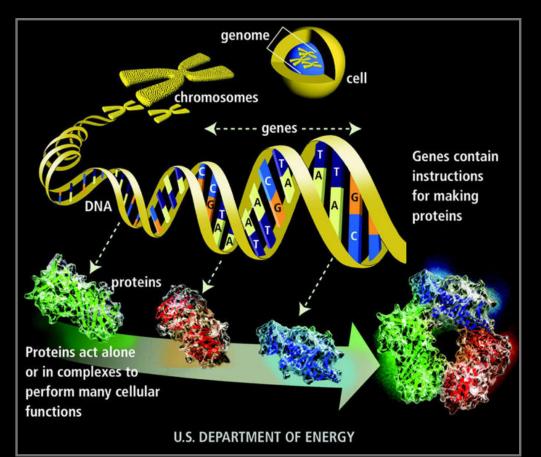
# Galaxy: A Web-based Platform for Accessible, Reproducible, and Transparent High-throughput (Genome) Biology

Jeremy Goecks Depts. of Biology and Math & Computer Science Emory University

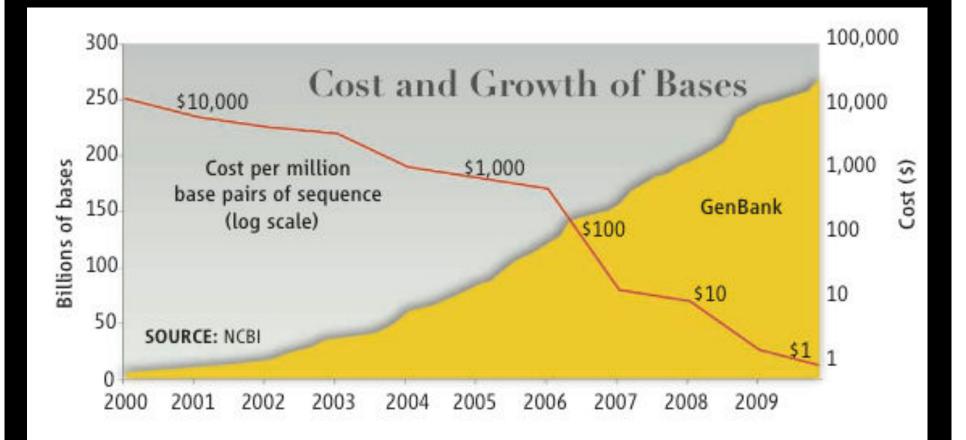
### Genomics

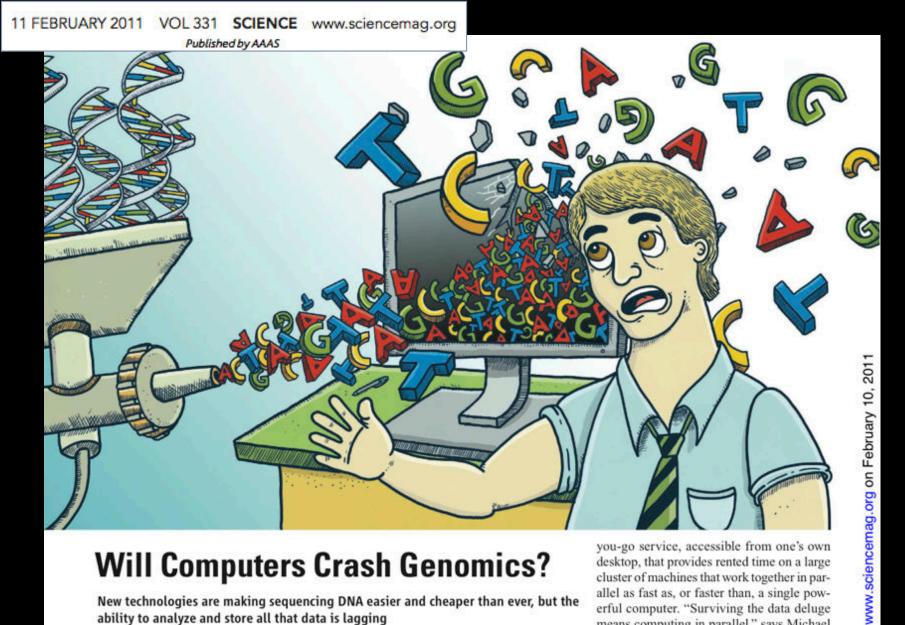


Identify and annotate all functional genomic elements

Understand interactions among elements

Apply genome knowledge to address biomedical challenges



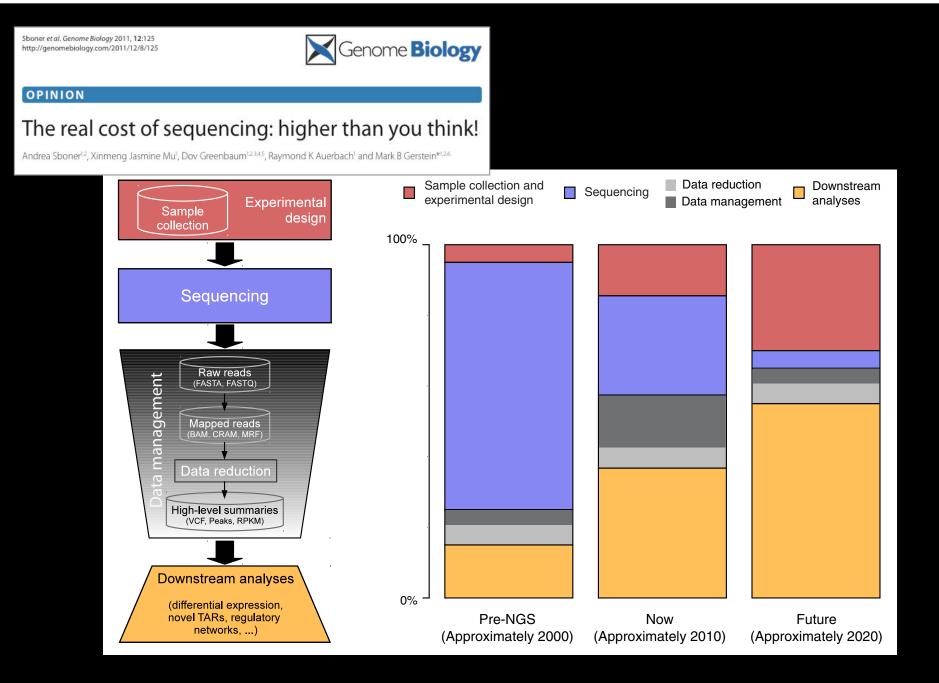


# Will Computers Crash Genomics?

New technologies are making sequencing DNA easier and cheaper than ever, but the ability to analyze and store all that data is lagging

you-go service, accessible from one's own desktop, that provides rented time on a large cluster of machines that work together in parallel as fast as, or faster than, a single powerful computer. "Surviving the data deluge means computing in parallel," says Michael

"Will Computers Crash Genomics?", Pennisi, E., Science, Feb 11, 2011



# A Key Challenge in Genomics

Generating data is easy

- high-throughput/next-generation sequencing (HTS/NGS) technologies improving rapidly
- datasets are many MBs or GBs

Analyzing data is THE bottleneck

computation is essential due to dataset size

### **Computation in Science?**

Scientists unfamiliar with computation

Reproducibility hindered by complexity: systems, scripts, tools, parameters

Collaboration and publishing difficult because current media do not support computational artifacts well

# Galaxy Project: Fundamental Questions

When Biology (or any science) becomes dependent on computational methods:

- how best to make methods accessible to scientists?
- how best to ensure that analyses are reproducible?
- how best to enable transparent communication and reuse of analyses?

# Vision

Galaxy is an open, Web-based platform for accessible, reproducible, and transparent computational biomedical research

### What is Galaxy?

### **GUI for genomics**

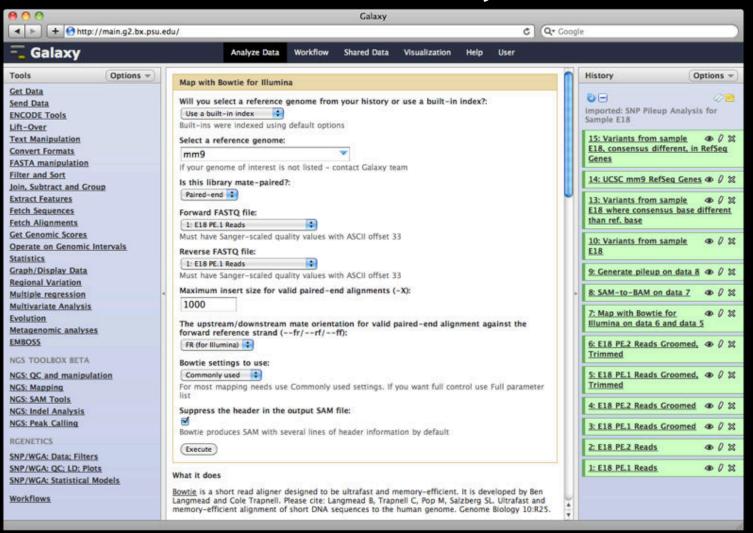
+ for complete analyses: analyze, visualize, share, publish

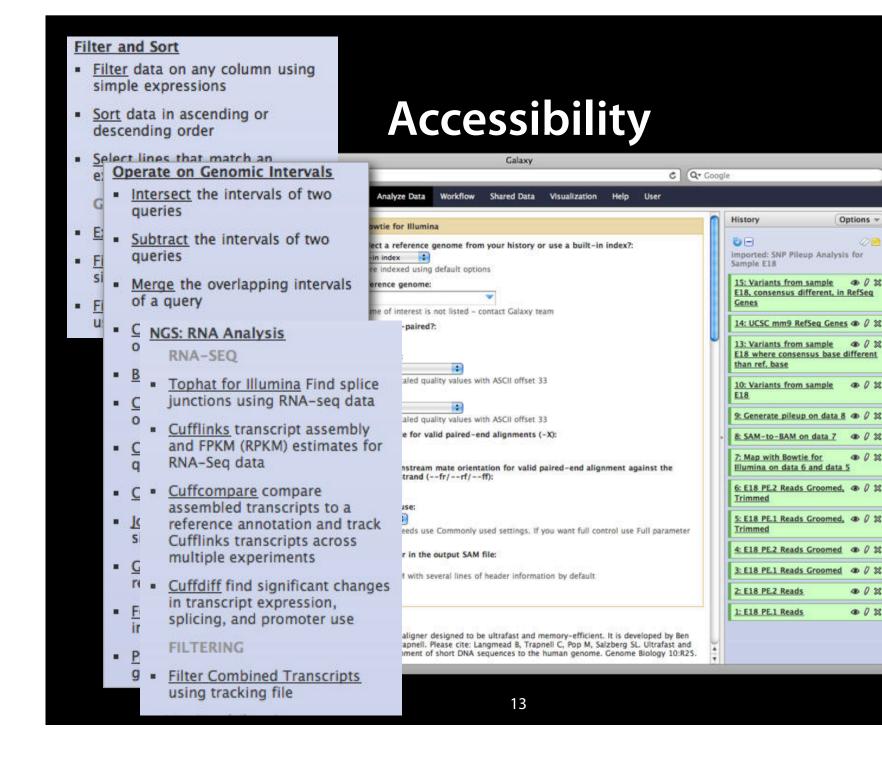
A free (for everyone) web service integrating a wealth of tools, compute resources, terabytes of reference data and permanent storage

**Open source software** that makes integrating your own tools and data and customizing for your own site simple

### Accessibility

### Accessibility





Options \*

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### Filter and Sort

Filter data on any colu	nn using	
simple expressions	Filter pileup	
Sort data in ascending descending order	Select dataset:	
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9 Filter Combi using tracking	ned Transcripts	A

#### **Filter and Sort** Filter data on any column using simple expressions Filter pileup Sort data in ascending Options ablaSelect dataset: History descending order 10: Variants from sample E18 -Select lines that match () 📄 which contains: **Operate on Genom** PI Pileup with six columns (simple) Variant Analysis for Sample E18 Intersect the interview of the interv See "Types of pileup datasets" below for examples queries 15: Intersect to get Variants @ 0 🕅 Do not consider read bases with quality lower than: E Subtract the interior from sample E18, consensus different, 20 aueries in RefSeq Genes No variants with quality below this value will be reported FI si Do not report positions with coverage lower than: Merge the overla 14: UCSC mm9 RefSeg Genes @ 0 💥 3 of a query Fi Pileup lines with coverage lower than this value will be skipped u C . NGS: RNA Ana 13: Filter to get Variants from @ Ø 💥 Only report variants?: 0 sample E18 where consensus base RNA-SEO Yes ‡ different than ref. base See "Examples 1 and 2" below for explanation Tophat for Convert coordinates to intervals?: junctions up • 10: Filter pileup to get • 1 X No 🛟 0 Cufflinks tri Variants from sample E18 See "Output format" below for explanation and FPKM ( C Print total number of differences?: RNA-Seg da a 9: Generate pileup on data 8 No 🛟 • / X Cuffcompar See "Example 3" below for explanation assembled 8: SAM-to-BAM on data 7 • 1 X Print quality and base string?: • ]0 reference ai Yes 🛟 S Cufflinks tri See "Example 4" below for explanation 7: Map with Bowtie for • / X multiple ex • G Illumina on data 6 and data 5 Execute re Cuffdiff find in transcript expression, 000X 6: E18 PE.2 Reads Groomed, F splicing, and promoter use ir Trimmed aligner designed to be ultrafast and memory-efficient. It is develo apnell. Please cite: Langmead B, Trapnell C, Pop M, Salzberg SL, L FILTERING ment of short DNA sequences to the human genome. Genome Bit P 5: E18 PE.1 Reads Groomed, • () % a Filter Combined Transcripts Trimmed using tracking file 15

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# **Galaxy Accessibility**

Only a Web browser is required

Standardization

tools, parameters, outputs all look the same

Easy to use output of one tool as input for another tool

# **Accessibility for Tool Developers**

0	00	cluster.xml
1 2	<pre><tool id="gops_cluster_1" nam<="" th=""><th>e="Cluster"&gt; e intervals of a query</th></tool></pre>	e="Cluster"> e intervals of a query
3 4 5	<pre><command interpreter="pytho&lt;br&gt;gops_cluster.py \$input1 \$&lt;br&gt;-d \$dista&lt;/pre&gt;&lt;/th&gt;&lt;th&gt;Cluster&lt;/th&gt;&lt;/tr&gt;&lt;tr&gt;&lt;th&gt;28&lt;/th&gt;&lt;td&gt;&lt;/command&gt;&lt;br&gt;&lt;inputs&gt;&lt;br&gt;&lt;param format=" interval"<br=""/><label>Cluster interval" <label>max distance bet <param names"minregions"<br=""/><label>min number of in <param names"returntype"<br=""/><option value="1">Merge <option value="1">Merge <option value="2">Find <option value="2">Find <option value="3">Find <option value="3">Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find Find <td>Cluster intervals of: 1: UCSC Main on Humane (genome) max distance between intervals: 1 (bp) min number of intervals per cluster: 2 Return type: Merge clusters into single intervals Execute</td></option></option></option></option></option></option></label></label></label></pre>	Cluster intervals of: 1: UCSC Main on Humane (genome) max distance between intervals: 1 (bp) min number of intervals per cluster: 2 Return type: Merge clusters into single intervals Execute
34 35 36	<pre>**Screencasts!** See Galaxy Interval OperationScreencasts: http://www.b</pre>	<b>() TIP:</b> If your query does not appear in the pulldown menu, it means that it is not in interval format. Use "edit attributes" to set chromosome, start, end, and strand columns.
42 43 44 45 46	**Syntax** - **Maximum distance** is gre - **Minimum intervals per clu - **Merge clusters into singl - **Find cluster intervals; p - **Find cluster intervals;	Screencasts! See Galaxy Interval Operation <u>Screencasts</u> (right click to open this link in another window).
Line	e: 87 Column: 8 💽 XML	Syntax  • Maximum distance is greatest distance in base

pairs allowed between intervals that will be

Defined via abstract interface:

- inputs & outputs
- parameters
- how to generate command line

As simple as possible but allows for rigorous

#### NGS: QC and manipulation

**ILLUMINA DATA** 

- FASTQ Groomer convert between various FASTQ quality formats
- <u>FASTQ splitter</u> on joined paired end reads
- <u>FASTQ joiner</u> on paired end reads
- <u>FASTQ Summary Statistics</u> by column

**ROCHE-454 DATA** 

- Build base quality distribution
- Select high quality segments
- <u>Combine FASTA and QUAL</u> into FASTQ

**AB-SOLID DATA** 

- · Convert SOLiD output to fastq
- <u>Compute quality statistics</u> for SOLID data
- <u>Draw quality score boxplot</u> for SOLID data

GENERIC FASTQ MANIPULATION

- <u>Filter FASTQ</u> reads by quality score and length
- FASTQ Trimmer by column
- <u>FASTQ Quality Trimmer</u> by sliding window

FASTO Masker by quality score

FASTQC: FASTQ/SAM/BAM

 <u>Fastqc: Fastqc QC</u> using FastQC from Babraham

#### Evolution

#### Metagenomic analyses Human Genome Variation EMBOSS

NGS TOOLBOX BETA

### NGS: QC and manipulation NGS: Mapping

ILLUMINA

- Map with Bowtie for Illumina
- <u>Map with BWA</u> for Illumina

ROCHE-454

- <u>Lastz</u> map short reads against reference sequence
- <u>Megablast</u> compare short reads against htgs, nt, and wgs databases
- Parse blast XML output
   AB-SOLID
- Map with Bowtie for SOLID

NGS: SAM Tools NGS: Indel Analysis NGS: Peak Calling NGS: RNA Analysis

#### RGENETICS

SNP/WGA: Data; Filters SNP/WGA: QC; LD; Plots SNP/WGA: Statistical Models

#### Workflows

#### NGS: Picard (beta)

#### QC/METRICS FOR SAM/BAM

- BAM Index Statistics
- <u>Sam/bam Alignment Summary</u> <u>Metrics</u>
- Sam/bam GC Bias Metrics
- Estimate Library Complexity
- Insertion size metrics for PAIRED data
- <u>Sam/bam Hybrid Selection</u> <u>Metrics</u> For (eg exome) targeted data

#### **BAM/SAM CLEANING**

- Add or Replace Groups
- Reorder SAM
- Replace Sam Header
- <u>Paired Read Mate Fixer</u> for paired data
- Mark Duplicate reads

#### NGS: GATK Tools

#### REALIGNMENT

- <u>Realigner Target Creator</u> for use in local realignment
- Indel Realigner perform local realignment

BASE RECALIBRATION

- <u>Count Covariates</u> on BAM files
- Table Recalibration on BAM files
- <u>Analyze Covariates</u> perform local realignment

GENOTYPING

 <u>Unified Genotyper</u> SNP and indel caller

### NGS: SAM Tools

#### NGS: Indel Analysis

- Filter Indels for SAM
- <u>Extract indels</u> from SAM
- Indel Analysis

#### NGS: Peak Calling

- <u>MACS</u> Model-based Analysis of ChIP-Seq
- <u>GeneTrack indexer</u> on a BED file
- <u>Peak predictor</u> on GeneTrack index

#### NGS: RNA Analysis

RNA-SEQ

- <u>Tophat</u> Find splice junctions using RNA-seq data
- <u>Cufflinks</u> transcript assembly and FPKM (RPKM) estimates for RNA-Seq data
- <u>Cuffcompare</u> compare assembled transcripts to a reference annotation and track Cufflinks transcripts across multiple experiments
- <u>Cuffdiff</u> find significant changes in transcript expression, splicing, and promoter use

FILTERING

 Filter Combined Transcripts using tracking file

RGENETICS

Dozens of tools for different HTS applications packaged with Galaxy

## Amplification

Many tools available in a single place means that tools can be combined in novel ways

Users, developers, community benefit

Reproducibility

# **Reproducibility in Genomics**

18 *Nat. Genetics* experiments in microarray gene expression

<50% of reproducible

### Problems

- missing data (38%)
- missing software, hardware details (50%)
- missing method, processing details (66%)

Ioannidis, J.P.A. et al. "Repeatability of published microarray gene expression analyses." Nat Genet 41, 149-155 (2009)

## **Reproducibility in Genomics**

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Ioannidis, J.P.A. et al. "Repeatability of published microarray gene expression analyses." Nat Genet 41, 149-155 (2009) 14 re-sequencing experiments in *Nat. Genetics, Nature, Science* 

### 0% reproducible?

### Problems

- missing primary data (50%)
- tools unavailable (50%)
- missing parameter setting, tool versions (100%)

"Devil in the details," Nature, vol. 470, 305-306 (2011).

### Metadata = Reproducibility

### **Automatic Metadata**

7: Map with Bowtie for							
	~						
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HWI-EAS269:3:1:709:832	147	сhı					
HWI-EAS269:3:1:1422:1087	99	сhı					
HWI-EAS269:3:1:1422:1087	147	сhı					
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#### Map with Bowtie for Illumina Will you select a reference genome from your history or use a built-in index?: \$ Use a built-in index Built-ins were indexed using default options Select a reference genome: mm9 if your genome of interest is not listed - contact Galaxy team Is this library mate-paired?: Paired-end Forward FASTQ file: 5: E18 PE.1 Reads Gr..ed, Trimmed Must have Sanger-scaled quality values with ASCII offset 33 **Reverse FASTO file:** 6: E18 PE.2 Reads Gr..ed, Trimmed 🛟 Must have Sanger-scaled quality values with ASCII offset 33 Maximum insert size for valid paired-end alignments (-X): 1000 The upstream/downstream mate orientation for valid paired-end alignment against the forward reference strand (--fr/--rf/--ff): FR (for Illumina) Bowtie settings to use: Commonly used For most mapping needs use Commonly used settings. If you want full control use Full parameter list Suppress the header in the output SAM file: ~ Bowtie produces SAM with several lines of header information by default Execute 25

### User Metadata

History	Options -
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demo x sample:e18	2 🔏
Annotation / Notes: Perform a variant analysis w parameters to identify varian E18 that lie in annotated ge	nts in sample

10: Variants from sample E18Image: Comparison of the sample compar	
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pileup x sample:e18 x	
snps 🗙 🔏	
Annotation:	
Find variants with coverage >= 30 and quality score >= 20.	
display at UCSC <u>main</u>   view in <u>GeneTrack</u>   display at Ensembl <u>Current</u>	
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chr10 14243075 14243076 G G 96 (	
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chr10 14465083 14465084 G K 144 :	
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### Galaxy Workflow System

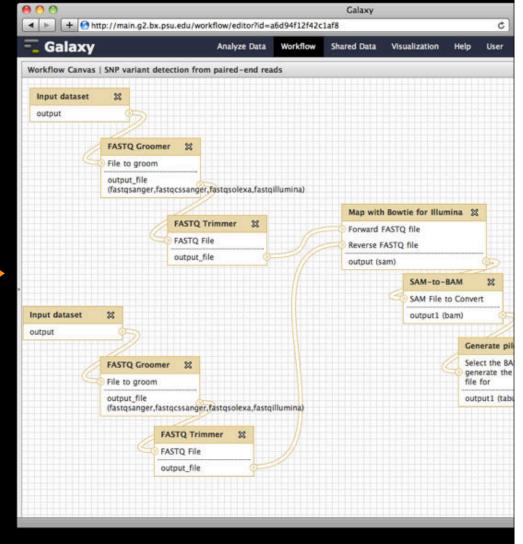
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Inputs							

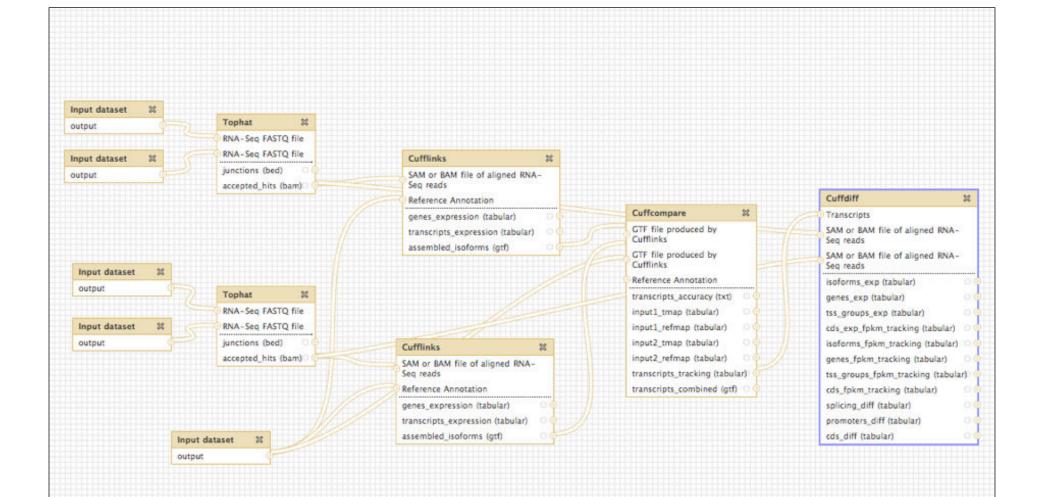
Workflows can be constructed from scratch *or* extracted from existing analysis histories

Facilitate reuse and provide precise reproducibility of a complex analysis

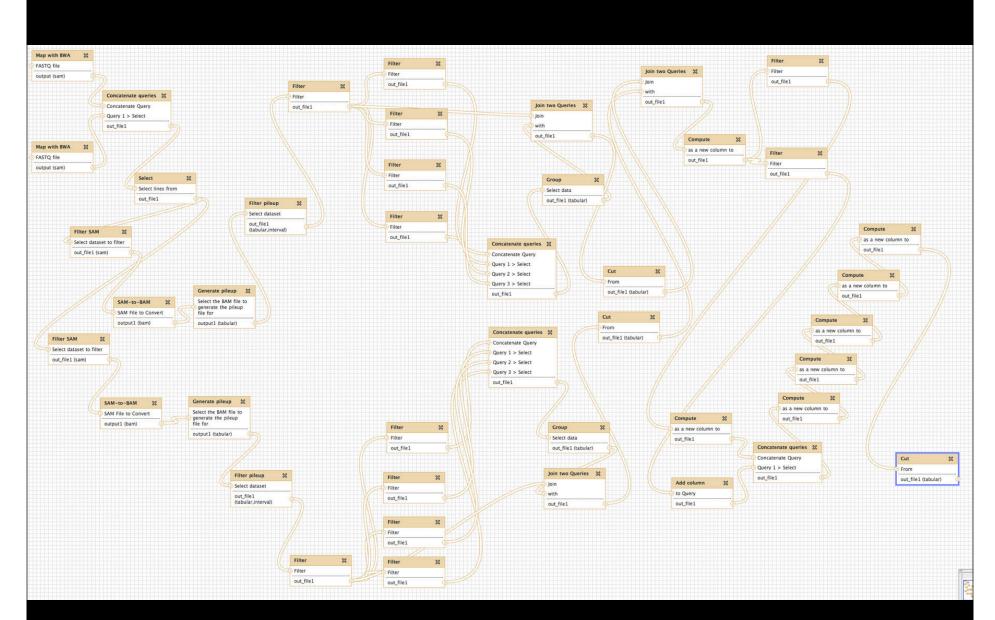
# **Galaxy Workflows**

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# **Example**: Workflow for differential expression analysis of RNA-seq using Tophat/Cufflinks tools



**Example**: Diagnosing low-frequency heterosplasmic sites in two tissues from the same individual

### Transparency ~ Sharing, Publishing, Reusing

### Everything can be shared

### Sharing and Publishing History 'Variant Analysis for Sample E18'

#### Making History Accessible via Link and Publishing It

This history accessible via link and published.

Anyone can view and import this history by visiting the following URL:

http://main.g2.bx.psu.edu/u/jgoecks/h/variant-analysis-for-sample-e18

This history is publicly listed and searchable in Galaxy's Published Histories section.

You can:

#### Unpublish History

Removes history from Galaxy's Published Histories section so that it is not publicly listed or searchable.

#### Disable Access to History via Link and Unpublish

Disables history's link so that it is not accessible and removes history from Galaxy's <u>Published Histories</u> section so that it is not publicly listed or searchable.

#### Sharing History with Specific Users

You have not shared this history with any users.

Share with a user

Back to Histories List

and the second		istory   Variant Analysis for Sample E18	
+ Ohttp://main.g2.bx.psu.edu/u/jgoecks/h/variant-analysis-1	for-sample-	e18 C Q Google	
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Galaxy History ' Variant Analysis for Sample E18' Annotation: Perform a pileup analysis with default parameters to identify var Dataset 1: E18 PE.1 Reads	Author jgoecks Related Histories		
2: E18 PE.2 Reads	٩	Reverse reads from sample E18.	All published histories Published histories by igoecks Rating
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7: Map with Bowtie for Illumina on data 6 and data 5 8: SAM-to-BAM on data 7	۲	Map paired-end reads with default parameters. * Need to convert Bowtie SAM to BAM so that pileup analysis can be performed.	(sample) Yours: (snp x) (pileup x) (bowtie x)
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10: Filter pileup to get Variants from sample E18 13: Filter to get Variants from sample E18 where consensus base different than ref. base	•	Find variants with coverage >= 30. Filter pileup to find variants where the consensus base is different than the reference base.	
14: UCSC mm9 RefSeq Genes	۹	UCSC mm9 RefSeq genes.	
15: Intersect to get Variants from sample E18, consensus different, in RefSeq Genes	۲	Variants with consensus different that occur in RefSeq genes.	

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metagenomic analysis		aunl	*****	(metagenomics) (galaxy)	Mar 19, 2010	
5M_1186088	Datasets correspond to our paper published in Science by Peleg et al. entitled : Altered histone acetylation is associated with age-dependent memory impairment. Experiment layout: This history contains 4 datasets in the form of BED files of uniquely mapped reads produced after chip-seq for histone modifications H4K12ac and H3K9ac in mouse hippocampus of 3 months (young) and 16 months (old) mice after fear conditioning. For detailed information please refer to supplementary materials and methods of the respective work by peleg et al.	fischerlab	****		Apr 19, 2010	
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EKLE		yzc109	****		Aug 24, 2010	

# **Galaxy Pages**

A web-based, interactive medium for presenting all aspects of an analysis: data, methods, visualization, and results



### Dynamics of mitochondrial heteroplasmy in three families: A fully reproducible re-sequencing study

Hiroki Goto<sup>1</sup>, Benjamin Dickins<sup>2</sup>, Enis Afgan<sup>3,5</sup>, Ian M. Paul<sup>4</sup>, James Taylor<sup>3,5</sup>, Kateryna D. Makova<sup>1</sup>, and Anton Nekrutenko<sup>2,5</sup>

Correspondence should be addressed to KDM, JT, or AN.

#### 1. How to use this document

This document is a live copy of supplementary materials for the manuscript. It provides access to all the data as well as to exact analyses and workflows discussed in the paper, so you can play with them by re-running, changing parameters, or even applying them to your own sequencing data. To import workflows you must create a Galaxy account (unless you already have one) – a hassle-free procedure where you are only asked for a username and password. To make this even easier, we created several screencasts (very short movies) to help you:

- access our datasets
- · re-use workflows listed on this page
- view and import histories listed on this page

In addition, we created two longer screenacasts:

- · Watch the analysis of one family (F7) from start (Illumina reads) to finish (a list of variable position);
- · Watch how the complete analysis can be performed on the Amazon Cloud.

If you experience any problems while using this page, please e-mail our bug report list and we will get back to you.

#### 2. Accessing the Data

All datasets discussed in the paper can be found in two places:

- A Galaxy Library called mtProject;
- An S3 bucket on the Amazon Cloud

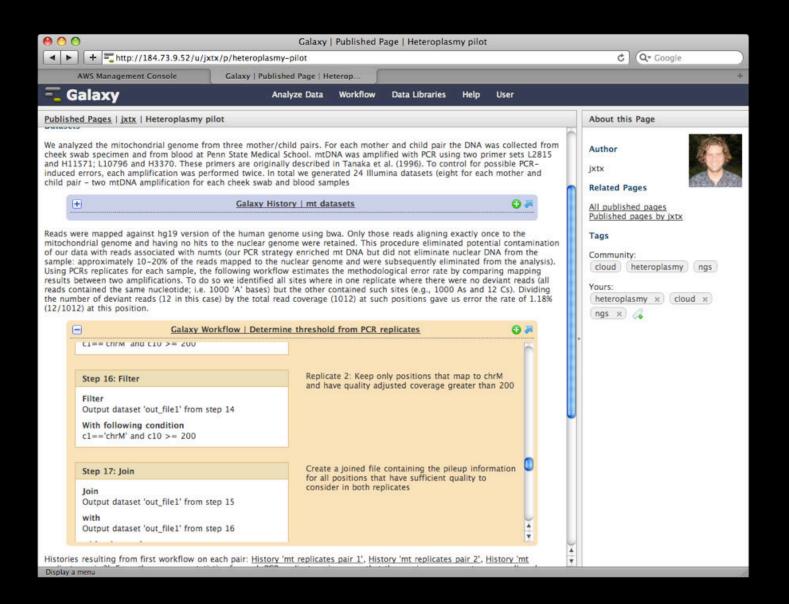
Galaxy Page for a recent study on mitochondrial heteroplasmy

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Đ	E Galaxy History   F4						
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<b>3.3 Generating initial</b> In the previous step we ide	in original Illumina datasets and summary datasets ntified variable sites in all sample ecutions into a new history calle	es. Now we need to	merge the results by				
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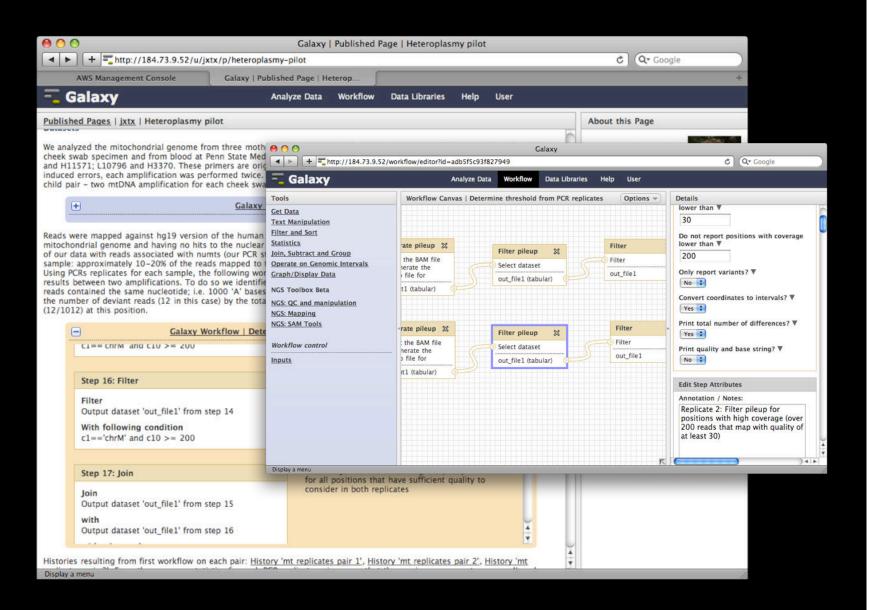
Actual histories and datasets directly accessible from the text

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Histories can be imported and the exact parameters inspected



Workflows and other entities can also be embedded



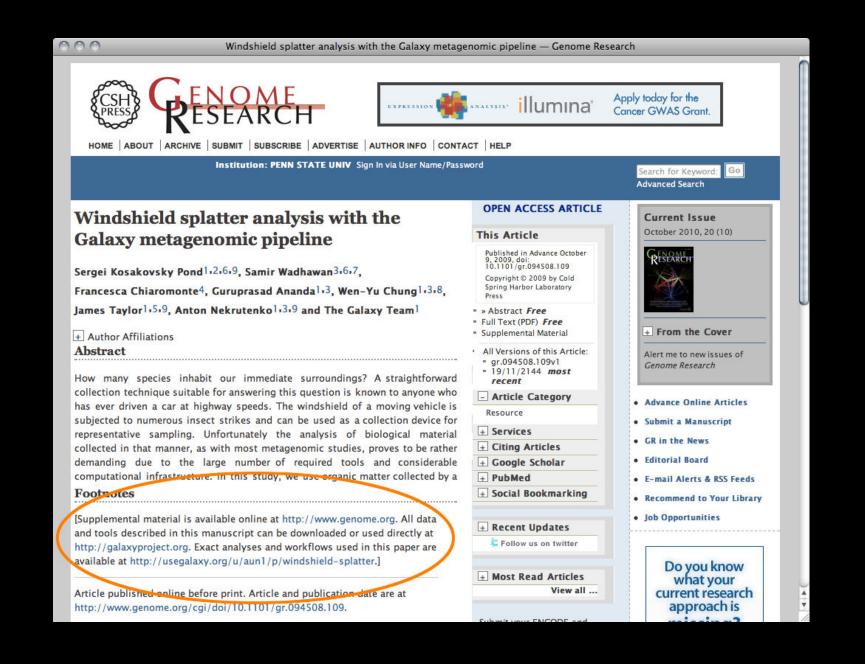
And imported for inspection, verification, and reuse

#### The Power of Galaxy Publishing

Galaxy's publishing features facilitate access and reproducibility without any extra leg work

One click grants access to the *actual analysis* you performed to generate your original results

- not just data access, the full pipeline + annotations
- anyone can import your work and immediately reproduce or build on it



#### Three Ways to Use Galaxy

1. Public Website (http://usegalaxy.org)

2. Download and run locally

3. Run on the cloud

# Galaxy main site (http://usegalaxy.org)

Public Website, anybody can use

~500 new users per month, ~100 TB of user data, ~130,000 analysis jobs per month, every month is our busiest month ever...

Will continue to be maintained and enhanced, but with limits and quotas

Centralized solution cannot scale to meet data analysis demands

### **Download and Run Locally**

No configuration needed but everything can be configured

- + tools
- computing cluster integration
- proxy server and authentication

Prominent local installations at:

- Cold Spring Harbor Lab
- Dept. of Energy's Joint Genome Institute
- Harvard School of Public Health
- U of Texas System
- Netherlands Bioinformatics Center
- Oxford College

Requires computing resources, technical expertise, and maintenance

## Galaxy on the Cloud

For extended or particular resource needs

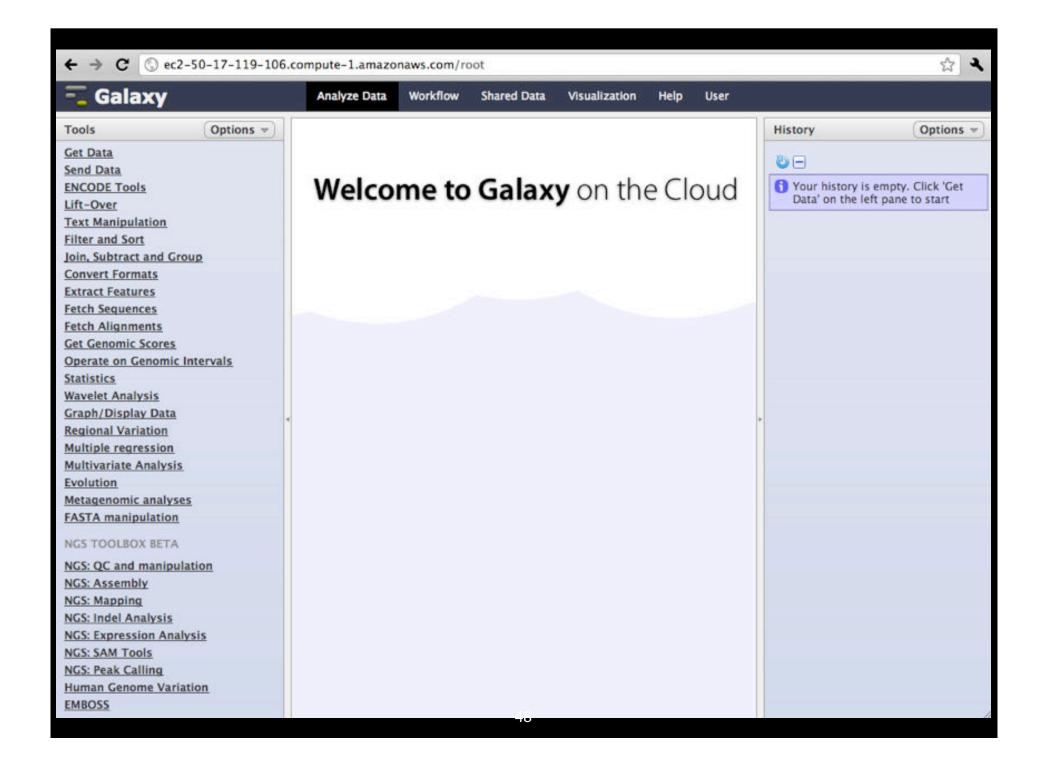
- customization necessary
- oscillating data volume

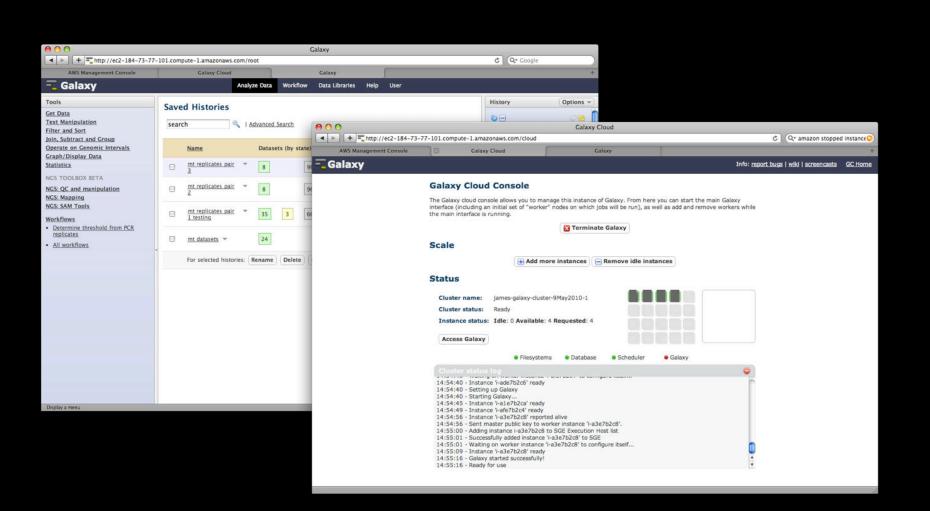
For when informatics expertise or infrastructure is limited

Work done by Enis Afgan

#### Using Amazon EC2: Startup in 3 steps

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Like any other Galaxy instance plus:

- additional compute nodes acquired and released automatically as needed
- can share or publish an instance

## **Challenges Going Forward**

Promoting community involvement

- tools, assays, analyses growing too fast for us alone
- facilitate community contributions and usage of contributions

Scaling to many, many Galaxies

- moving objects between Galaxies while ensuring reproducibility
- enabling users to find useful "stuff"

Novel application areas

genomics ideal application area -- what next?











Dannon Baker



**Dave Clements** 



Jeremy Goecks



Dan Blankenberg



Jennifer Jackson



Anton Nekrutenko



Nate Coraor



Greg von Kuster



James Taylor

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### **Thanks! Questions?**

#### http://galaxyproject.org

- Galaxy								
Data intensive biology for everyone.								
<u>Galaxy</u> is an open, web-based platform for data intensive biomedical research. Whether on the <u>free public server</u> or <u>your own instance</u> , you can perform, reproduce, and share complete analyses.								
Use Galaxy	Get Galaxy	Learn Galaxy	Get Involved					
	$\blacksquare$	Advanced fastQ manipulation https://www.manipulation	Image: State of the state o					
Use the free public server	Install locally or in the cloud	Screencasts, Galaxy 101,	Mailing lists, Tool Shed, wiki					

Galaxy publications: http://galaxyproject.org/wiki/Citing

Galaxy is hiring! http://galaxyproject.org/wiki/GalaxyisHiring

jeremy.goecks@emory.edu