

# KSBi-BIML 2024

Bioinformatics & Machine Learning(BIML)  
Workshop for Life and Medical Scientists

**생명정보학 & 머신러닝 워크숍 (온라인)**



## Introduction to Next Generation Sequencing data analysis with Galaxy

이동성 \_ 서울시립대



**KSBI**  
KOREAN SOCIETY FOR  
BIOINFORMATICS

| 한국생명정보학회



본 강의 자료는 한국생명정보학회가 주관하는 BIML 2024 워크샵 온라인 수업을 목적으로 제작된 것으로 해당 목적 이외의 다른 용도로 사용할 수 없음을 분명하게 알립니다.

이를 다른 사람과 공유하거나 복제, 배포, 전송할 수 없으며 만약 이러한 사항을 위반할 경우 발생하는 **모든 법적 책임은 전적으로 불법 행위자 본인에게 있음을 경고**합니다.

# KSBI-BIML 2024

## Bioinformatics & Machine Learning(BIML) Workshop for Life and Medical Scientists

안녕하십니까?

한국생명정보학회가 개최하는 동계 교육 워크숍인 BIML-2024에 여러분을 초대합니다. 생명정보학 분야의 연구자들에게 최신 동향의 데이터 분석기술을 이론과 실습을 겸비해 전달하고자 도입한 전문 교육 프로그램인 BIML 워크숍은 2015년에 시작하여 올해로 벌써 10년 차를 맞이하게 되었습니다. BIML 워크숍은 국내 생명정보학 분야의 최초이자 최고 수준의 교육프로그램으로 크게 인공지능과 생명정보분석 두 개의 분야로 구성되어 있습니다. 올해 인공지능 분야에서는 최근 생명정보 분석에서도 응용이 확대되고 있는 다양한 인공지능 기반 자료모델링 기법들에 대한 현장 강의를 진행될 예정이며, 관련하여 심층학습을 이용한 단백질구조예측, 유전체분석, 신약개발에 대한 이론과 실습 강의를 함께 제공될 예정입니다. 또한 단일세포오믹스, 공간오믹스, 메타오믹스, 그리고 롱리드염기서열 자료 분석에 대한 현장 강의는 많은 연구자의 연구 수월성 확보에 큰 도움을 줄 것으로 기대하고 있습니다.

올해 BIML의 가장 큰 변화는 최근 연구 수요가 급증하고 있는 의료정보자료 분석에 대한 현장 강의를 추가하였다는 것입니다. 특히 의료정보자료 분석을 많이 수행하시는 의과학자 및 의료정보 연구자들께서 본 강좌를 통해 많은 도움을 받으실 수 있기를 기대하고 있습니다. 또한 다양한 생명정보학 분야에 대한 온라인 강좌 프로그램도 점차 증가하고 있는 생명정보 분석기술의 다양화에 발맞추기 위해 작년과 비교해 5강좌 이상을 신규로 추가했습니다. 올해는 무료 강좌 5개를 포함하여 35개 이상의 온라인 강좌가 개설되어 제공되며, 연구 주제에 따른 연관된 강좌 추천 및 강연료 할인 프로그램도 제공되며, 온라인을 통한 Q&A 세션도 마련될 예정입니다. BIML-2024는 국내 주요 연구 중심 대학의 전임 교원이자 각 분야 최고 전문가들의 강의로 구성되었기에 해당 분야의 기초부터 최신 연구 동향까지 포함하는 수준 높은 내용의 강의를 될 것이라 확신합니다.

BIML-2024을 준비하기까지 너무나 많은 수고를 해주신 운영위원회의 정성원, 우현구, 백대현, 김태민, 김준일, 김상우, 장혜식, 박종은 교수님과 KOBIC 이병욱 박사님께 커다란 감사를 드립니다. 마지막으로 부족한 시간에도 불구하고 강의 부탁을 흔쾌히 허락하시고 훌륭한 현장 강의와 온라인 강의를 준비하시는데 노고를 아끼지 않으신 모든 강사분들께 깊은 감사를 드립니다.

2024년 2월

한국생명정보학회장 이 인 석

# Introduction to Next Generation Sequencing data analysis with Galaxy

최근 생성되는 바이오정보 데이터의 크기는 점점 커지고 있지만, 저장 공간과 시간의 제약으로 이러한 빅데이터를 하나의 머신으로 처리하는데 많은 어려움이 따릅니다. 또한 다양한 데이터들이 매일같이 쏟아져 나오는 가운데 이러한 데이터들을 얻고 다루기 위해서는 그에 맞는 환경을 구축해야 하지만 이를 배우고 싶어하는 학생들이나 많은 연구자들이 비용적, 시간적, 환경적인 제약을 받고 있습니다.

이에 본 강의에서는 생명정보 데이터를 효과적이고 빠르게 처리하기 위해 널리 쓰이고 있는 web-base 플랫폼인 Galaxy를 소개하겠습니다. 데이터 가져오기, 도구 실행, history를 이용한 작업, workflow 생성 및 작업 공유와 같은 기본 작업을 수행하는 방법을 설명하며 이를 통해 빅데이터를 빠르고 손쉽게 처리할 수 있는 기법을 배우고, 이를 실제 바이오 데이터에 적용하여 효율적이고 효과적인 분석을 할 수 있는 핵심 역량을 갖추는 것을 목표로 합니다.

강의는 다음의 내용을 포함한다:

- Galaxy 개요
- Public 데이터 가져오기
- 데이터 분석하기

\* 참고강의교재: Galaxy (<https://usegalaxy.org.au/>)

\* 교육생준비물: 노트북 (메모리 8GB 이상, 디스크 여유공간 30GB 이상)

\* 강의 난이도: 초급

\* 강의: 이동성 교수 (서울시립대학교 생명과학과)

## Curriculum Vitae

**Speaker Name: Hong-Gil Dong, Ph.D.**



### ► Personal Info

Name Dongsung Lee  
Title Assistant Professor  
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### Research Interest

Translational bioinformatics, Machine learning and computational genomics

### Educational Experience

2010 B.S. in Life Science, Korea University, Korea  
2015 Ph.D. in Medical Science, Seoul National University, Korea

### Professional Experience

2001-2007 Assistant Professor, Department of Life Science, University of Seoul, Korea  
2016-2020 Post-doc research fellow, Salk Institute for Biological Studies, USA

### Selected Publications (5 maximum)

1. Simultaneous profiling of 3D genome structure and DNA methylation in single human cells. Nature Methods. (2019)
2. A noncanonical BRD9-containing BAF chromatin remodeling complex regulates naive pluripotency in mouse embryonic stem cells. Nat Commun. (2018)
3. An epigenomic roadmap to induced pluripotency reveals DNA methylation as a reprogramming modulator. Nature Commun. (2014).
4. Genome-wide characterization of the routes to induced pluripotency. Nature (2014)
5. Divergent reprogramming routes lead to alternative stem-cell states. Nature (2014)

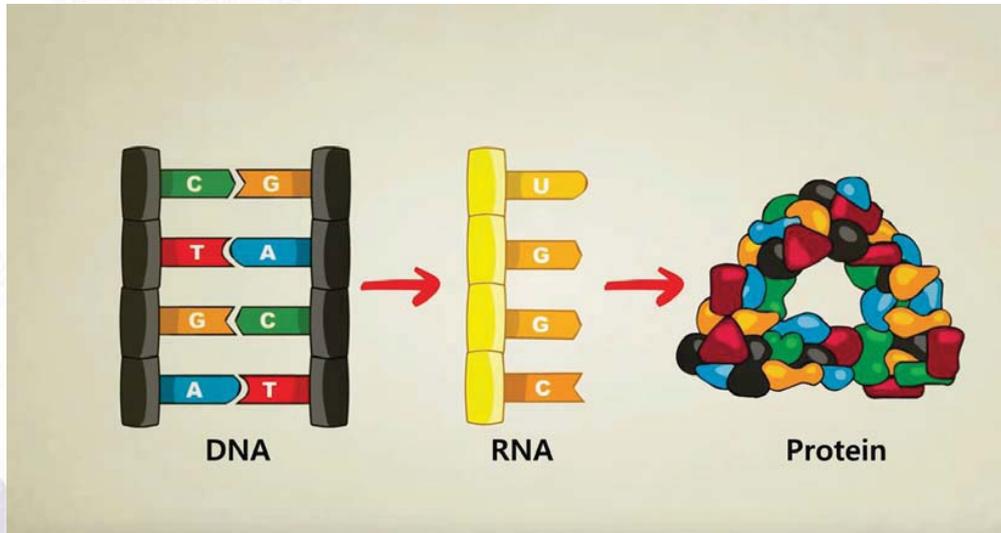
# KSBi-BIML

Introduction to Next Generation Sequencing  
data analysis with Galaxy

서울시립대학교  
생명과학과  
이동성



# Central Dogma, 생명현상의 중심 원리



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## In February 2001 the 'First Draft' of the Human Genome is Published



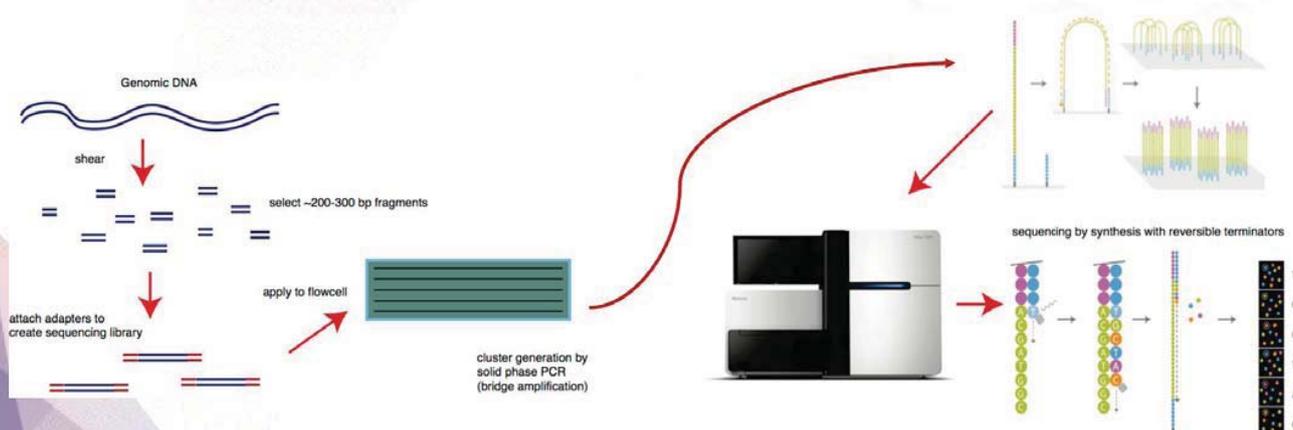
Venter et al., Celera, Science, 2001



International Human Genome Sequencing Consortium, Lander et al., Nature, 2001

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# Next Generation Sequencing (NGS)



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## NGS Applications

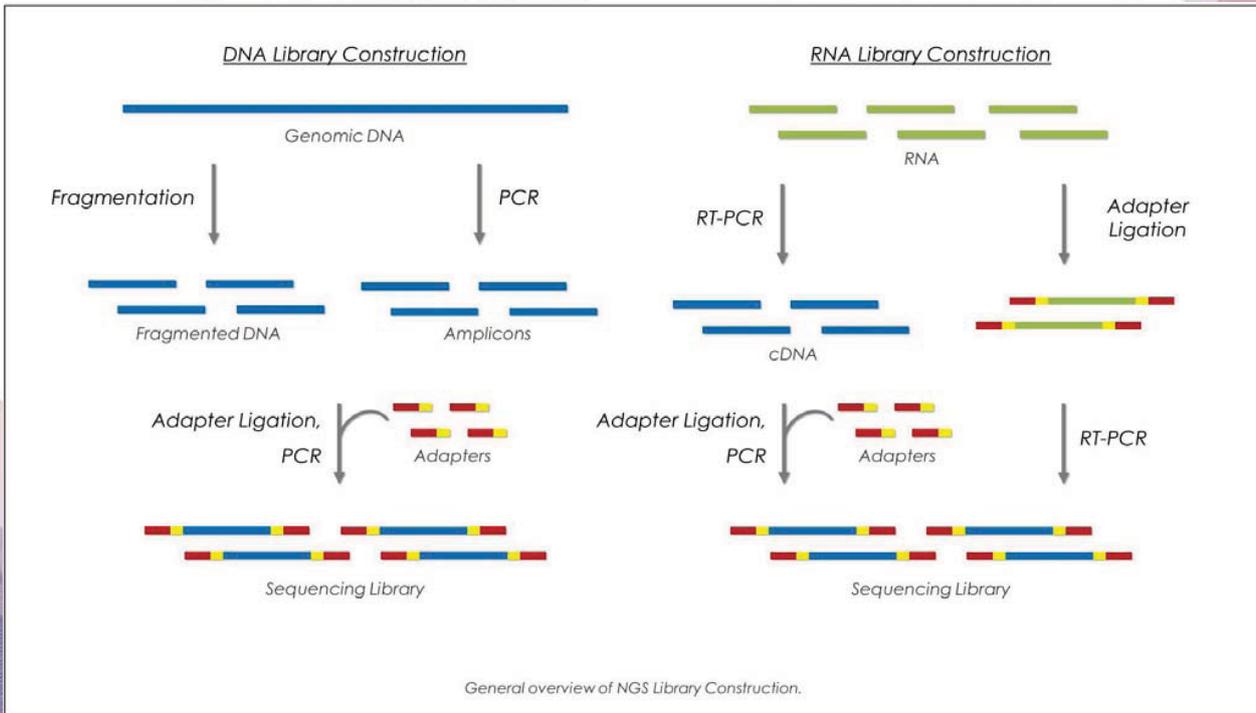
RNA	RNA seq
DNA	Whole Genome Seq
	Target Seq
	Bisulfite Seq
	ChIP-seq
	ATAC-seq
	Hi-C seq



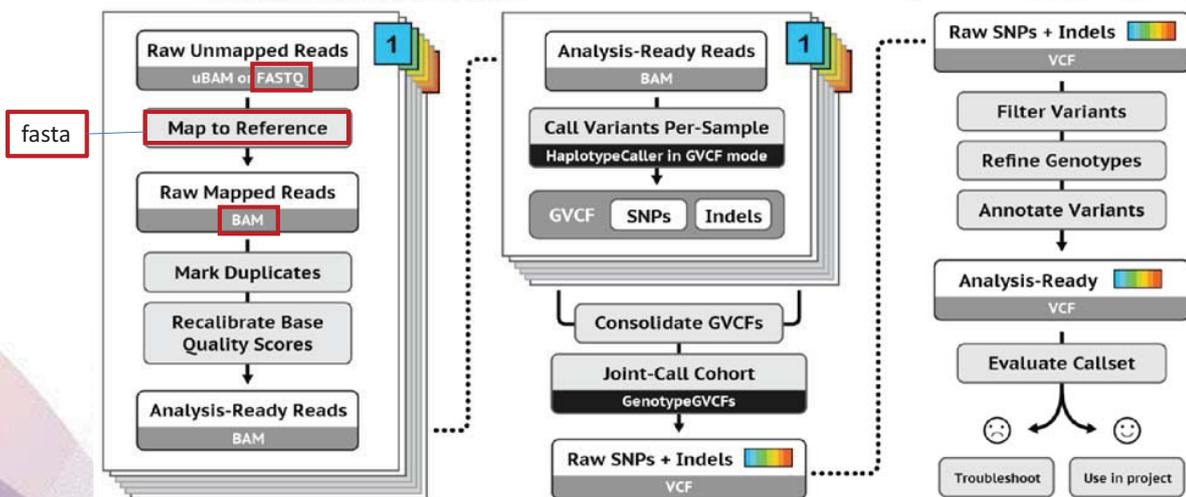
**Single cell / Multi-omic**

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# Sequencing library preparation



# Genome Sequencing data analysis pipeline



GATK Best Practice





# Phred quality score

- phred score가 크면 클수록 맞을 확률이 높고 틀릴 확률이 적은 것이 된다. Phred score의 최소값은 0으로, 이는 무조건 해당 염기가 틀리다는 이야기가 된다. 보통 phred score는 0부터 40사이에 존재하는데, 이는 40보다 정확도가 높기는 어렵기 때문이다. 해당 서열의 phred score를 직접 텍스트로 저장한다면 한 염기 당 2 개의 글자가 필요하다. 이를 절약하기 위해서 ASCII code를 사용한다. ASCII code란 computer의 글자를 8개의 bit로 저장하는 규약이다 (256개의 글자를 저장할 수 있다). ASCII code는 화면을 출력할 때 base pair마다 quality를 한 글자로 출력할 수 있고 파일 용량을 감소 시킨다는 점에서 quality를 표시하기에 알맞은 형식이다. ASCII code 중에서 첫 32개는 화면 제어용 문자라서 키보드에 매핑되는 글자가 없고 따라서 화면에 가독성 있는 글자로 표시되지 않는다. 숫자와 영문, 그리고 특수문자 텍스트를 표현하는데는 십진수로 32~126까지의 95개를 사용한다. 일반적으로 Phred score에 +33을 해준 값을 ASCII code로 바꿔서 fastq 파일에 저장하는데, 예전 버전의 Illumina 데이터들은 +64를 사용한 적이 있었지만, 지금은 +33을 사용한다. 즉 이를 ASCII code로 전환하면 0 ~ 40의 phred score가 ! 부터 I 사이의 문자로 표시된다는 것이다. Quality가 알파벳 대문자로 출력 된다면 이는 굉장히 high quality임을 의미하는 것이다.

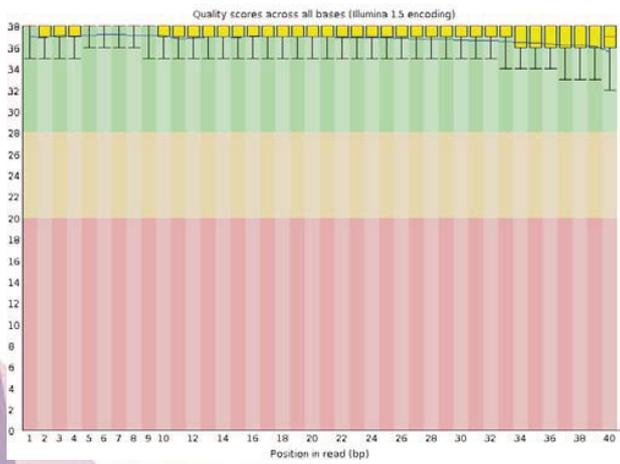
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# FASTQ파일의 전반적인 QC

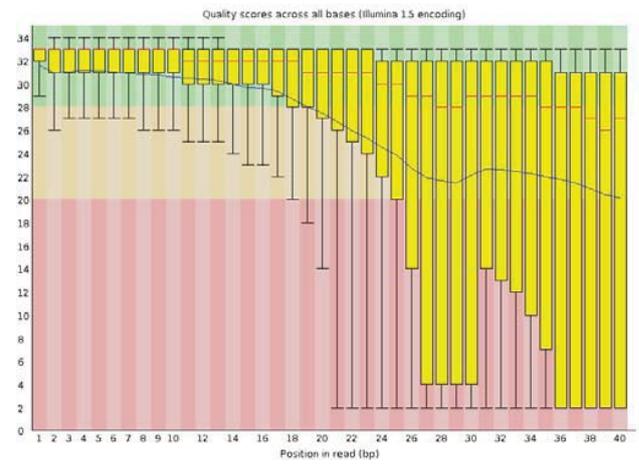
- <https://www.bioinformatics.babraham.ac.uk/projects/fastqc/>
- FastQC aims to provide a simple way to do some quality control checks on raw sequence data coming from high throughput sequencing pipelines. It provides a modular set of analyses which you can use to give a quick impression of whether your data has any problems of which you should be aware before doing any further analysis.
- The main functions of FastQC are
- Import of data from BAM, SAM or FastQ files (any variant)

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# FASTQC -Per base sequence quality

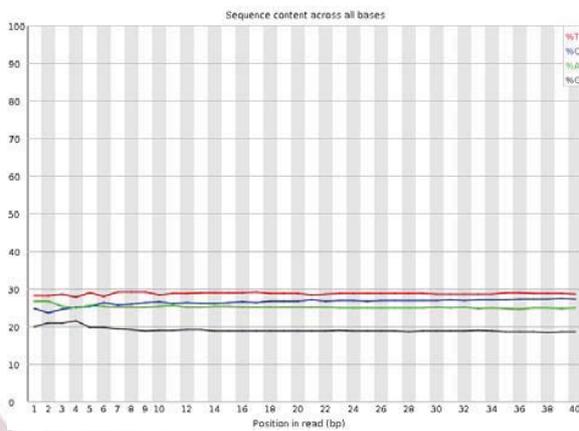


Good

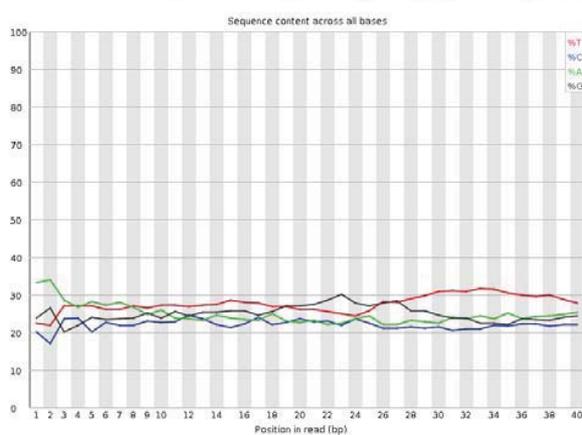


Bad

# FASTQC-Per base sequence content



Good



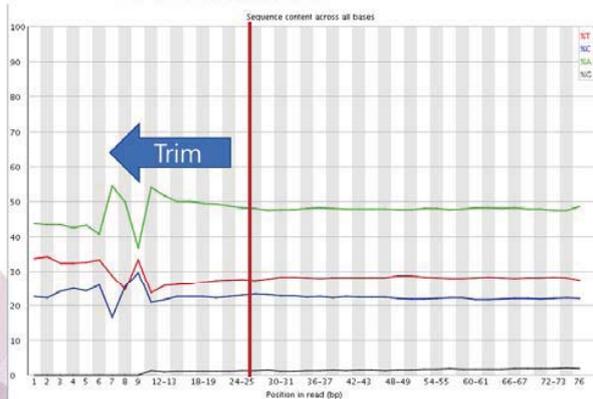
Bad

# First\_Alignment (Bismark\_bowtie1\_no\_Trim)

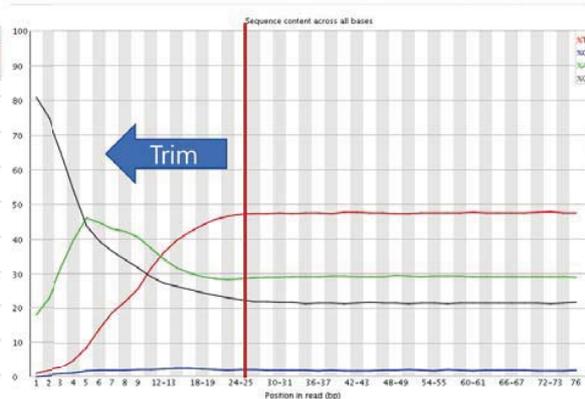
Low mappability due to weird sequence in the beginning of reads. Probably adaptor/index

BOWTIE1 (428-n.1) notrim, non-directional

Sample	Total_read	Mapped_read	Both mapped	Intrachromosomal<1000bp	intrachromosomal>=1000bp	interchromosomal
CYL-1_S22_L001_merged.bam_query_sorted.bam	321058	33859(10.55%)	2608(7.7%)	1436(5.06%)	422(16.18%)	750(28.76%)
CYL-2_S23_L001_merged.bam_query_sorted.bam	378236	42943(11.35%)	3338(7.77%)	1670(5.03%)	634(18.99%)	1034(30.98%)
CYL-3_S24_L001_merged.bam_query_sorted.bam	427360	46059(10.78%)	3894(8.45%)	2298(59.01%)	458(11.76%)	1138(29.22%)
CYL-4_S25_L001_merged.bam_query_sorted.bam	396658	45056(11.36%)	3858(8.56%)	2368(61.38%)	458(11.87%)	1032(26.75%)
SC-128_S8_L001_merged.bam_query_sorted.bam	1914840	1401672(73.2%)	1204754(85.95%)	763718(63.39%)	256950(21.33%)	184086(15.28%)
SC-129_S9_L001_merged.bam_query_sorted.bam	1411308	958019(67.88%)	704656(73.55%)	55668(7.9%)	46720(66.3%)	181780(25.8%)



Per base sequence content: read1



Per base sequence content: read2

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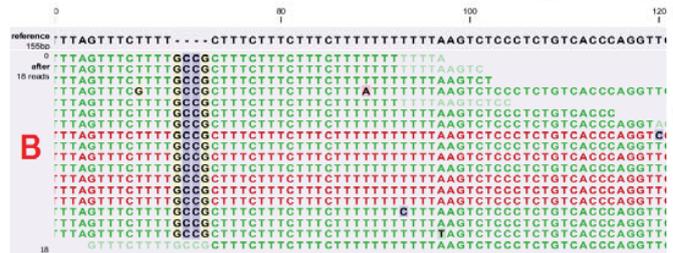
## Trimming

- 처음 받은 raw data (fastq)파일들의 QC 결과 특정 부위의 quality가 나쁘거나 특정 부위에 이상이 발견되면 이 부분들을 본격적인 분석 전에 제거하고 시작할 수 있다. 이 과정을 "trimming"이라 한다.
- 다양한 trimming 프로그램들이 존재한다.
  - trimmomatic
  - FASTX-Toolkit
  - FastProNGS
  - google에 "NGS trim software"를 검색해보자.

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# Alignment, Mapping

GCTGATGTGCCGCCTCACTTCGGTGGTGAAGGTG	Reference sequence
CTGATGTGCCGCCTCACTTCGGTGGT	Short read 1
TGATGTGCCGCCTCACTACGGTGGTGA	Short read 2
GATGTGCCGCCTCACTTCGGTGGTGA	Short read 3
GCTGATGTGCCGCCTCACTACGGTGA	Short read 4
GCTGATGTGCCGCCTCACTACGGTGA	Short read 5



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## Alignment

- Next-generation sequencing generally produces *short reads* or *short read pairs*, meaning short sequences of  $<\sim 200$  bases. To compare the DNA of the sequenced sample to its reference sequence, we need to find the corresponding part of that sequence for each read in our sequencing data. This is called **aligning** or **mapping** the reads against the reference sequence. Once this is done, we can look for variation (e.g. SNPs) within the sample.

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# Alignment, mapping

- blast: <https://www.ncbi.nlm.nih.gov/>
- blat: <http://genome.ucsc.edu/>
- high throughput data aligner
  - bwa
  - bowtie
  - gsnap
  - hisat
  - star

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Software packages [edit | edit source]

Software	Type	Supported technologies	Interface	Notes
Partek	Commercial	All	GUI	<ul style="list-style-type: none"> <li>• Free trial</li> <li>• Easy to use, no command line</li> <li>• Vast choice of publicly available aligners recommended by Illumina &amp; Life Technologies, Ion Torrent</li> <li>• Guidance on alignment choice</li> </ul>
BWA <sup>[7]</sup>	Free software	Illumina SOLID 454	Command line	<ul style="list-style-type: none"> <li>• The SAM/BAM output adhere to SAM format, contains mapped and unmapped data, easy to parse</li> <li>• Not fully threaded, same and same can only utilize 1 CPU, bwa-sw (454 longer reads) can be fully threaded, though</li> <li>• Not as sensitive as Stampy and Novoalign</li> <li>• May be outperformed by BWA-MEM for 70-100bp Illumina reads.</li> </ul>
Bowtie <sup>[10]</sup>	Free software	Illumina SOLID	Command line	<ul style="list-style-type: none"> <li>• Discussed in the SeqAnswers forum<sup>[8]</sup></li> <li>• Fast</li> <li>• No mapping quality reported</li> <li>• Not as sensitive as Stampy and Novoalign</li> </ul>
Stampy <sup>[11]</sup>	Free software	Illumina	Command line	<ul style="list-style-type: none"> <li>• Balance of speed and sensitivity</li> <li>• Can be slow even using BWA as premapper</li> </ul>
SHRIMP2	Free software	Illumina	Command line	<ul style="list-style-type: none"> <li>• Higher sensitivity than BWA</li> <li>• One step mapping, indexing of genome is not needed</li> <li>• Alignment can take less time than BWA if the reference sequence is short, e.g. mapping of reads against a targeted region</li> <li>• Alignment speed is slow if mapping is done onto a large genome</li> </ul>
TMAP	Free software	IonTorrent	Command line	<ul style="list-style-type: none"> <li>• Uses a selection of algorithms to balance speed and sensitivity</li> </ul>
SNP-o-matic <sup>[12]</sup>	Free software	Illumina	Command line	<ul style="list-style-type: none"> <li>• Very fast, especially on genomes &lt;100mbp</li> <li>• Unlimited de novo variation discovery</li> <li>• Also works as a genotyper</li> </ul>
CLC workstation	Commercial	All	GUI	<ul style="list-style-type: none"> <li>• Easy to use</li> <li>• Expensive</li> <li>• Alignment is spurious based on our dataset</li> <li>• Alignment speed is NOT impressive at all compared to BWA or Bowtie (7.860 + 16GB memory, windows 2008 R2-64bit)</li> </ul>
NextGenMap <sup>[13]</sup>	Open source	Illumina, Ion Torrent	Command Line	<ul style="list-style-type: none"> <li>• Fast and accurate, self adjusting to the underlying data. Robust for high polymorphism</li> <li>• Easy to use</li> <li>• Fast and accurate</li> <li>• Robust to SNPs</li> <li>• Self adapts to the data set</li> </ul>
Novoalign	Commercial for multi-threaded version, single threaded version is free	Illumina	Command Line	Fast and accurate. Probably the best aligner as of 2013.
GSMapper	Commercial	454	GUI	/
SSAHA2	Free software	454	Command line	Fast and accurate for all reads it can map
BLAT	Free software	454	Command line	Not designed for NGS data.
Mosaik	Free software	All	Command line	Tedious steps, Alignment speed can be slow. Huge memory requirement.
BWA-SW <sup>[14]</sup>	Free software	454, IonTorrent	Command line	<ul style="list-style-type: none"> <li>• For long sequences ranged from 70bp to 1Mbp.</li> <li>• Authors recommend to use BWA-MEM (which is the latest) instead of BWA-SW.</li> </ul>
BWA-MEM <sup>[15]</sup>	Free software	454, IonTorrent	Command line	<ul style="list-style-type: none"> <li>• For long sequences ranged from 70bp to 1Mbp.</li> <li>• Newer version of BWA-SW, so recommended to use instead of BWA-SW.</li> <li>• May outperform BWA for 70-100bp Illumina reads</li> <li>• May outperform Novoalign for variants call<sup>[14]</sup></li> </ul>
Bfast <sup>[16]</sup>	Free software	SOLID	Command Line	Speed of alignment may be too slow for large NGS data <sup>[16]</sup>
TopHat <sup>[17]</sup>	Free software	Illumina	Command Line	Transcriptome data only
SpliceMap	Free software	Illumina	Command Line	Transcriptome data only
MapSplice	Free software	Illumina	Command Line	Transcriptome data only
AbMapper	Free software	Illumina	Command Line	Transcriptome data only
ERNI-map (yANA) <sup>[18]</sup>	Free software	Illumina	Command line	<ul style="list-style-type: none"> <li>• Sensitive and efficient</li> <li>• Can be paired with an independent trimming module (ERNI-filter) and a bisulfite-treated-specific read aligner program (ERNI-bis)<sup>[11]</sup></li> <li>• Slow when dealing with gapped alignments</li> </ul>
msiFAST-Ultra <sup>[19]</sup>	Free software	Illumina	Command line / GUI	<ul style="list-style-type: none"> <li>• Full sensitivity</li> <li>• Fast and efficient</li> <li>• Multi-threaded</li> </ul>

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# sam 파일 다루기-samtools & picard

- Alignment를 하고 sam 파일을 시작으로 다양한 pre-processing 과정이 필요하다.
- convert to bam: binary file로 바꾸어 줌으로써 파일 사이즈를 줄이고 indexing을 통해 빠르게 분석할 수 있도록 한다.
- Sort: bam을 다루기 쉽도록 하기 위해 align된 위치 순서에 따라 read를 재배열 한다.
- Deduplication: Library preparation 과정 중 PCR에서 생긴 Duplication을 제거한다.
- 위 과정들을 해주는 다양한 프로그램들이 존재하며 특히 samtools와 picard가 널리 쓰이고 있다.

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# CLI (Command-line User Interface)

```
root@main:~# ping -q namu.wiki
PING namu.wiki (153.149.99.38) 56(84) bytes of data:
0:
...
root@main:~# curl https://namu.wiki && echo |n
Found. Redirecting to /w/NEBK2K9BE9KACB4NECK9CB4NE0K82NA4:NEBKACB@NEBKACB8B
root@main:~# pwd
/root
root@main:~# cd /var
root@main:/var# ls -la
total 120
drwxr-xr-x 15 root root 4096 9월 20 2016 .
drwxr-xr-x 25 root root 4096 8월 18 13:41 ..
drwxr-xr-x 2 root root 4096 8월 27 22:27 backups
drwxr-xr-x 25 root root 4096 7월 9 11:04 cache
drwxrwsrwt 2 root whoopsie 4096 9월 6 16:05 CF33
drwxr-xr-x 88 root root 4096 8월 27 11:52 lib
drwxrwsr-x 2 root staff 4096 8월 10 2016 local
lrwxrwxrwx 1 root root 9 5월 27 2016 lock -> /run/lock
drwxrwxr-x 16 root syslog 4096 9월 6 16:05 log
drwxrwsr-x 2 root mail 4096 2월 17 2016 mail
drwxrwsrwt 2 root whoopsie 4096 2월 17 2016 opt
drwxr-xr-x 2 root root 4096 2월 17 2016 opt
lrwxrwxrwx 1 root root 4 5월 27 2016 run -> /run
drwxr-xr-x 2 root root 4096 9월 1 2016 snap
drwxr-xr-x 8 root root 4096 9월 20 2016 spool
drwxrwxrwt 431 root root 61440 9월 6 17:28 tmp
drwxr-xr-x 3 root root 4096 6월 17 2016 www
root@main:/var# apt update
更新:1 http://dl.google.com/linux/chrome/deb stable InRelease
소스:2 http://dl.google.com/linux/chrome/deb stable Release
소스:14 https://dl.winehq.org/wine-builds/ubuntu xenial InRelease
소스:15 https://packagecloud.io/3onosGroeger/soundnode/ubuntu xenial InRelease
取得:16 https://download.01.org/gfx/ubuntu/16.04/main xenial InRelease [3,651 B]
위 [archive.ubuntu.com <호출>, C.I.P.F.] [security.ubuntu.com <호출>, C.I.P.F.] [archive.com
```

- 명령 줄 인터페이스 (CLI) 는 Command-Line Interface 또는 Character User Interface이다.
- 가장 대표적인 예시로는 도스, 명령 프롬프트, bash로 대표되는 유닉스 셸 환경
- CLI만의 장점: 자원을 적게 잡아 먹으면서 안정적이고 빠르다. 게다가 원격으로 작업할 때 웬만한 네트워크 환경에서도 안정적으로 작업할 수 있으며 사용되는 데이터 양 역시 압도적으로 적다. 특히 서버 쪽에서는 작업 자동화와 원격 작업이 필요한 경우가 많은데 CLI는 이 분야에서 압도적인 효율을 보여준다.
- GUI 프로그래밍에 비해 사전지식이 매우 적게 요구되며, 적당한 기본 지식이 있으면 필요한 프로그램을 쉽게 만들 수 있다.

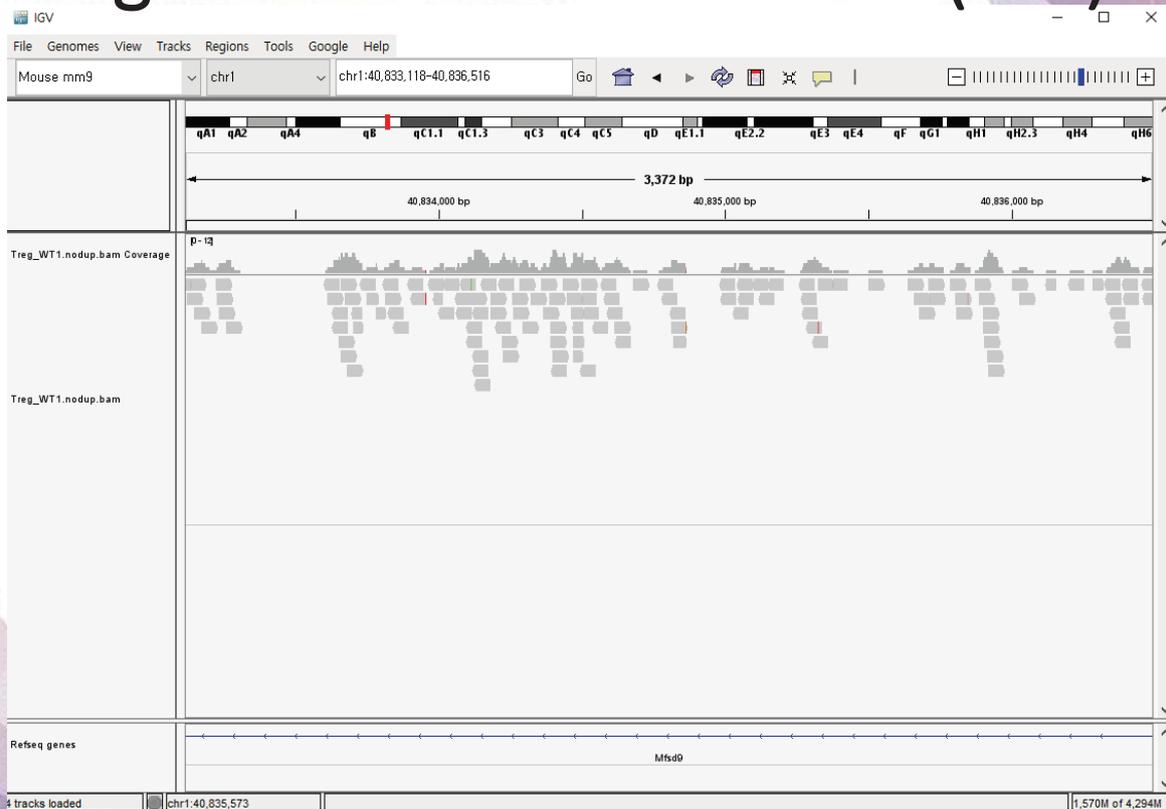
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# Galaxy

- <https://usegalaxy.org.au/> : Galaxy 호주
- <https://usegalaxy.org/> 가 오리지날이지만 호주가 더 빠르다

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## Integrative Genomics Viewer (IGV)



<https://software.broadinstitute.org/software/igv/download>

- Data Intensive *analysis* for everyone
- Versatile and reproducible workflows
- Web platform
- Open source under Academic Free License
- Developed at Penn State, Johns Hopkins, OHSU and Cleveland Clinic with substantial outside contributions

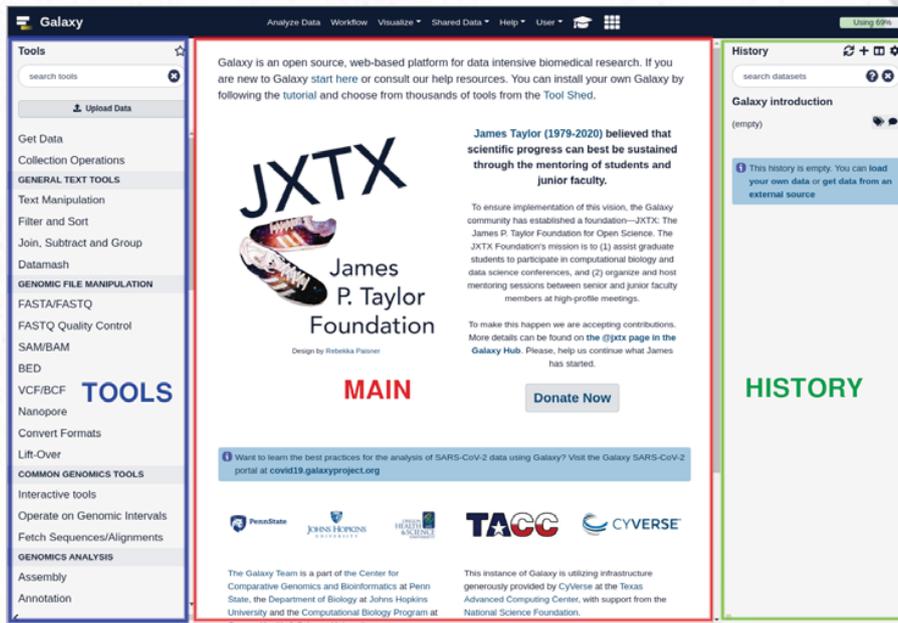
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## Core values

- **Accessibility**
  - Users without programming experience can easily upload/retrieve data, run complex tools and workflows, and visualize data
- **Reproducibility**
  - Galaxy captures information so that any user can understand and repeat a complete computational analysis
- **Transparency**
  - Users can share or publish their analyses (histories, workflows, visualizations)
  - Pages: online Methods for your paper

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# Main Galaxy interface



- Three main panels
  - **Left:** Available Tools
  - **Middle:** View your data and run tools
  - **Right:** Full record of your analysis history

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# Top menu



Link	Usage
Analyze Data	go back to the homepage
Workflow	access existing workflows or create new one using the editable diagrammatic pipeline
Visualize	create new visualisations and launch Interactive Environments
Shared Data	access data libraries, histories, workflows, visualizations and pages shared with you
Help	links to Galaxy Help Forum (Q&A), Galaxy Community Hub (Wiki), and Interactive Tours
User	your preferences and saved histories, datasets, pages and visualizations

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# Tools

The screenshot shows the Galaxy web interface. On the left is a 'Tools' sidebar with a search bar and a list of tool categories. The 'Join' tool is highlighted with a red box. The main panel displays the configuration for the 'Join the intervals of two datasets side-by-side (Galaxy Version 1.0.0)' tool. It includes dropdowns for 'First dataset' (1: Exons) and 'Second dataset' (2: SNPs), a 'with min overlap' field set to '1 (bp)', and a 'Return' dropdown set to 'Only records that are joined (INNER JOIN)'. An 'Execute' button is at the bottom. A 'History' panel on the right shows a list of datasets, including 'Galaxy 101' and '1: Exons', with search and management icons.

- The tool search helps in finding a tool in a crowded toolbox

# Tool interface

The screenshot shows a tool form for 'Sort data in ascending or descending order (Galaxy Version 1.1.0)'. It features a 'Sort Dataset' dropdown with '1: RB01.fasta (as tabular)' selected. Below are fields for 'on column', 'with flavor' (set to 'Numerical sort'), and 'everything in' (set to 'Descending order'). There is a 'Column selection' section with an '+ Insert Column selection' button and a 'Number of header lines to skip' field set to '0'. At the bottom, there is an 'Email notification' section with 'Yes' and 'No' radio buttons, and an 'Execute' button.

- A tool form contains:
  - input datasets and parameters
  - help, citations, metadata
  - an **Execute** button to start a job, which will add some output datasets to the history

# Tool Shed

**Galaxy Tool Shed** Repositories Groups Help User

6532 valid tools on Dec 04, 2018

**Search**

- Search for valid tools
- Search for workflows

**Valid Galaxy Utilities**

- Tools
- Custom datatypes
- Repository dependency definitions
- Tool dependency definitions

**All Repositories**

- Browse by category

**Available Actions**

- Login to create a repository

**Repositories by Category**

search repository name, description

Name	Description	Repositories
<a href="#">Assembly</a>	Tools for working with assemblies	128
<a href="#">ChIP-seq</a>	Tools for analyzing and manipulating ChIP-seq data.	65
<a href="#">Combinatorial Selections</a>	Tools for combinatorial selection	10
<a href="#">Computational chemistry</a>	Tools for use in computational chemistry	76
<a href="#">Constructive Solid Geometry</a>	Tools for constructing and analyzing 3-dimensional shapes and their properties	12
<a href="#">Convert Formats</a>	Tools for converting data formats	114
	Tools for exporting data to various	

- Free "app" store: [Galaxy Tool Shed](#) Thousands of tools already available
- Most software can be integrated

# History

- Location of all analyses
  - collects all datasets produced by tools
  - collects all operations performed on the data
- For each dataset (the heart of Galaxy's reproducibility), the history tracks
  - name, format, size, creation time, datatype-specific metadata
  - tool id, version, inputs, parameters
  - standard output (stdout) and error (stderr)
  - state (waiting, running, success, failed)
  - hidden, deleted, purged
- Three buttons
  - View the file
  - Edit attributes
    - e.g. change name
  - Delete file

History

search datasets

**Galaxy 101**  
7 shown  
9.07 MB

**7: Compare two Datasets on data 6 and data 1**

5 regions  
format: **bed**, database: **hg38**

join (GNU coreutils) 8.22  
Copyright (C) 2013 Free Software Foundation, Inc.  
License GPLv3+: GNU GPL version 3 or later <<http://gnu.org/licenses/gpl.html>>.  
This is free software: you are free to change and redistribute it. There is NO WARRANTY, to the extent

display in IGB [view](#)  
display with IGV [local](#) [Human hg38](#)  
display at UCSC [main](#) [test](#)

1	Chrom	2	start	3	end	4	Name
chr22	46256560	46263322	uc003bhh..				
chr22	15690077	15690709	uc010gpp..				
chr22	15528158	15529139	uc011agd..				
chr22	15690245	15690709	uc062bek..				
chr22	22376182	22376505	uc062cbe..				

**6: Select first on data 5**

**5: Sort on data 4**

**4: Group on data 3**

**3: Join on data 2 and data 1**

**2: SNPs**

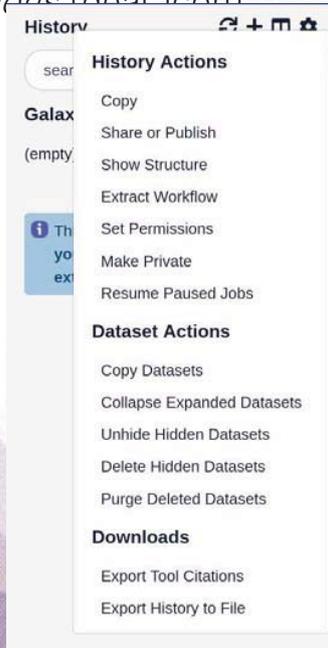
# Multiple histories

- You can have as many histories as you want
  - each history should correspond to a **different analysis**
  - and should have a **meaningful name**

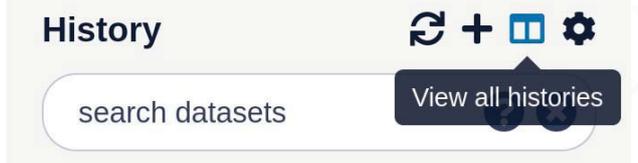


# History options menu

History behavior is controlled by the *History options* (gear icon)



- *Create new history* (+ icon) will **not** make your current history disappear
- To see all of your histories, use the history switcher



- *Copy Datasets* from one history to another and save disk space for your quota

# Importing data

- Copy/paste some text
- Upload files from your **local computer**
- Upload data from an internet **URL**
- Upload data from online **databases**: UCSC, BioMart, ENCODE, modENCODE, Flymine etc.
- Import from Shared Data (libraries, histories, pages)
- Upload data from FTP

# Datatypes

- Tools only accept input datasets with the appropriate datatypes
- When uploading a dataset, its datatype can be either:
  - automatically detected
  - assigned by the user
- Datasets produced by a tool have their datatype assigned by the tool
- To change the datatype of a dataset, either:
  - *Edit attributes* and *Datatypes* (if original wrong), or
  - *Edit attributes* and *Convert*

# Reference datasets

## Example: reference Genome

- Genome build specifies which genome assembly a dataset is associated with
  - e.g. mm10, hg38...
- Can be assigned by a tool or by the user
- Users can create custom genome builds
- New builds can be added by the admin

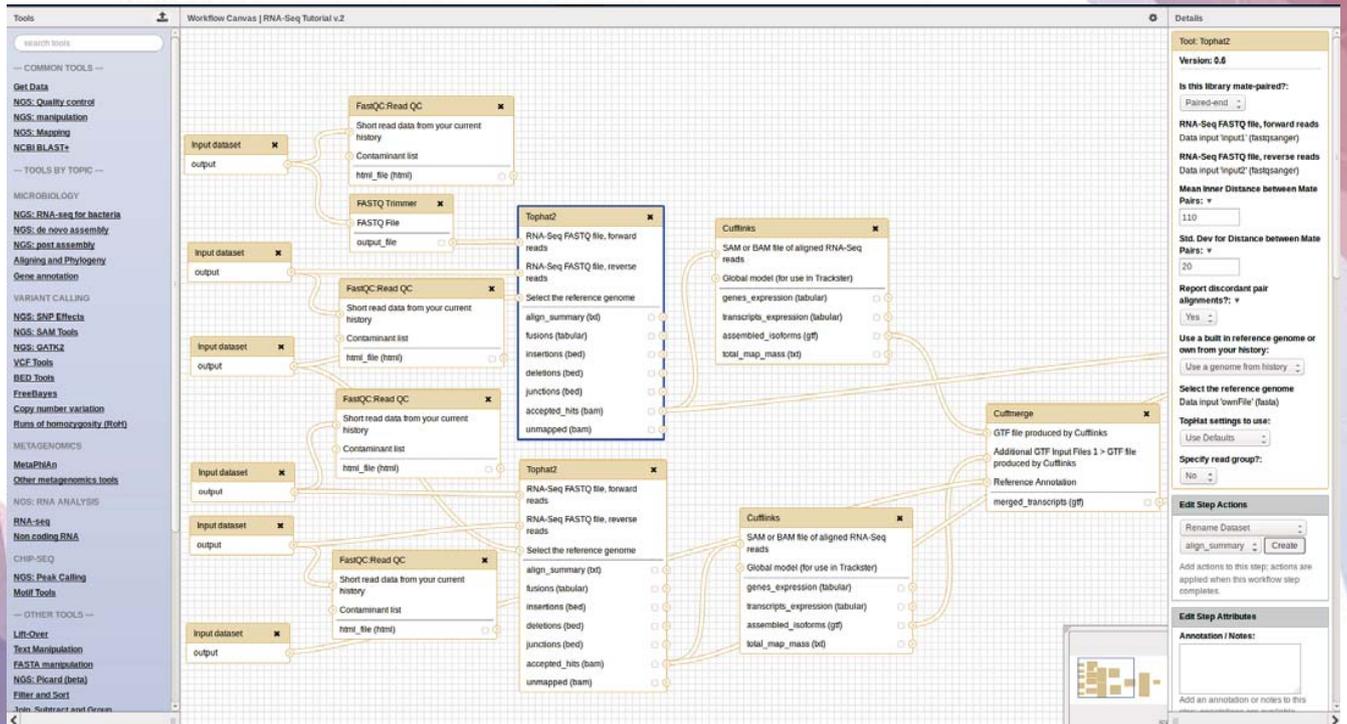
### Database/Build

Mouse July 2007 (NCBI37/mm9) (mm9)

Burmese python Sep. 2013 (Python_molurus_bivittatus-5.0.2/pytbiv1) (pytbiv1)
Burton's mouthbreeder Oct 2011 (AstBur1.0/hapBur1) (hapBur1)
Bushbaby Mar. 2011 (Broad/otoGar3) (otoGar3)
Bushbaby Dec. 2006 (Broad/otoGar1) (otoGar1)
C. angaria Oct. 2010 (WS225/caeAng1) (caeAng1)
C. brenneri Nov. 2010 (C. brenneri 6.0.1b/caePb3) (caePb3)
C. brenneri Feb. 2008 (WUGSC 6.0.1/caePb2) (caePb2)
C. brenneri Jan. 2007 (WUGSC 4.0/caePb1) (caePb1)

# Workflows

# Workflow Editor

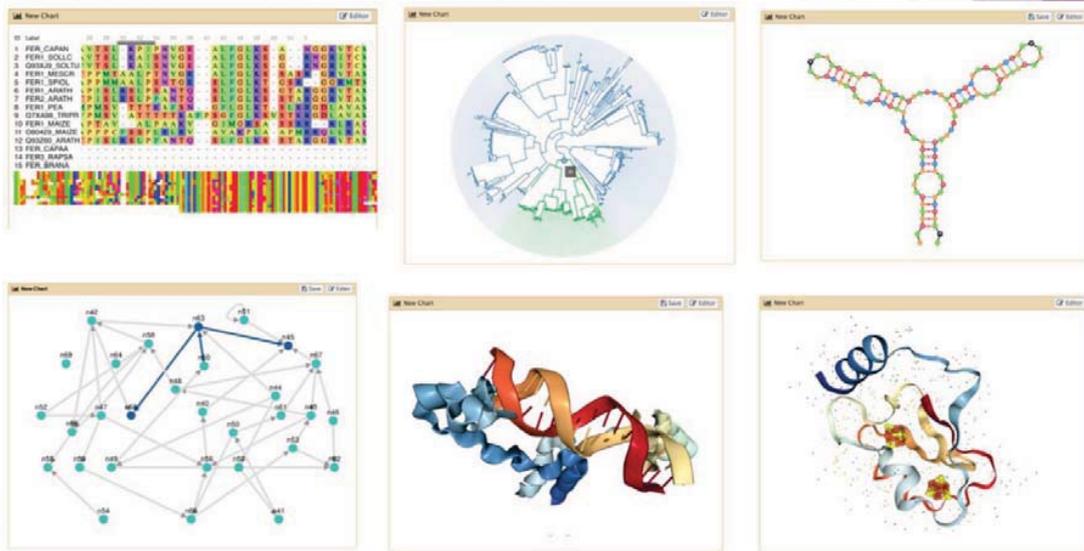


- Extracted from a history
- Built manually by adding and configuring tools using the canvas
- Imported using an existing shared workflow

## Why would you want to create workflows?

- Re-run the same analysis on different input data sets
- Change parameters before re-running a similar analysis
- Make use of the workflow job scheduling
  - jobs are submitted as soon as their inputs are ready
- Create sub-workflows: a workflow inside another workflow
- Share workflows for publication and with the community

# Visualizations



- Datatypes know what tools can be used to visualize data
  - Sequencing data has a button for visualizing in IGV
  - Tabular data will prompt you to build charts
  - Protein data can be seen in a 3D viewer
- Interactive environments: Jupyter, RStudio, etc

# Sharing data

- Share everything you do in Galaxy – histories, workflows, and visualizations
  - Directly using a Galaxy account's email addresses on the same instance
  - Using a web link, with anyone who knows the link
  - Using a web link and publishing it to make it accessible to everyone from the *Shared Data* menu

# Training

<https://usegalaxy.org/training-material/>

**Galaxy Training!** Contributors Help Extras Search Tutorials

## Welcome to Galaxy Training!

Collection of tutorials developed and maintained by the worldwide Galaxy community

### Galaxy for Scientists

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Computational chemistry	6
Ecology	6
Epigenetics	6
Genome Annotation	5
Imaging	4
Metabolomics	4
Metagenomics	7
Proteomics	21
Sequence analysis	2
Statistics and machine learning	13
Transcriptomics	29
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### Galaxy Tips & Tricks

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### Galaxy for Developers and Admins

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### How to contribute?

First off, thanks for taking the time to contribute!

You can report mistakes or errors, create more contents, etc. Whatever is your background, there is probably a way to do it: via the GitHub website, via command-line. If you feel it is too much, you can even write it with any text editor and contact us: we will work together to integrate it.

To get you started, check our dedicated tutorials or our Frequently Asked Questions

### Galaxy for Contributors and Instructors

Topic	Tutorials
Contributing to the Galaxy Training Material	11
Teaching and Hosting Galaxy training	6

# SARS-CoV2 실습

## Material

Search x

Lesson	Slides	Hands-on	Input dataset	Workflows	Galaxy tour	Galaxy instances
Introduction to Variant analysis						
Calling variants in diploid systems						
Calling variants in non-diploid systems <b>prokaryote</b>						
Exome sequencing data analysis for diagnosing a genetic disease						
From NCBI's Sequence Read Archive (SRA) to Galaxy: SARS-CoV-2 variant analysis <b>covid19</b>						
Identification of somatic and germline variants from tumor and normal sample pairs						
M. tuberculosis Variant Analysis <b>prokaryote</b>						
Mapping and molecular identification of phenotype-causing mutations						
Microbial Variant Calling <b>prokaryote</b>						

# INDEL realignment



## Final Alignment file visualization with IGV

- <https://drive.google.com/drive/folders/1I9b5gaKcFzwk4ArJWr05qc-JRB1i59w-?usp=sharing>

## SARS-Cov-2 mutation 역사와 이동

- <https://observablehq.com/@spond/distribution-of-sars-cov-2-sequences-that-have-a-particular>
- [https://nextstrain.org/ncov/global?c=gt-nuc\\_28960&m=div](https://nextstrain.org/ncov/global?c=gt-nuc_28960&m=div)

**감사합니다**