



**BGGN 213**

**Genome Informatics**

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UC San Diego

<http://thegrantlab.org/bggn213>

## TODAYS MENU:

### › What is a Genome?

- Genome sequencing and the Human genome project

### › What can we do with a Genome?

- Comparative genomics

### › Modern Genome Sequencing

- 1st, 2nd and 3rd generation sequencing

### › Workflow for NGS

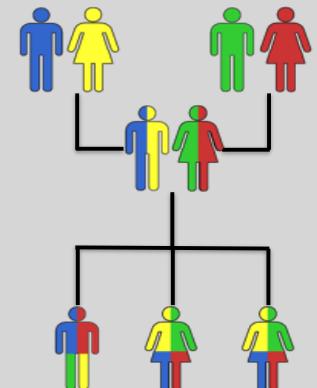
- RNA-Sequencing and Discovering variation

## Genetics and Genomics

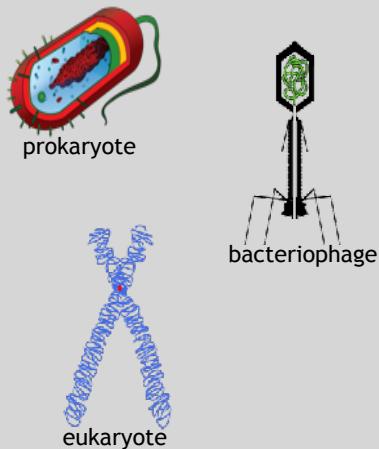
- **Genetics** is primarily the study of individual genes, mutations within those genes, and their inheritance patterns in order to understand specific traits.
- **Genomics** expands upon classical genetics and considers aspects of the entire genome, typically using computer aided approaches.

## What is a Genome?

The total genetic material of an organism by which individual traits are encoded, controlled, and ultimately passed on to future generations



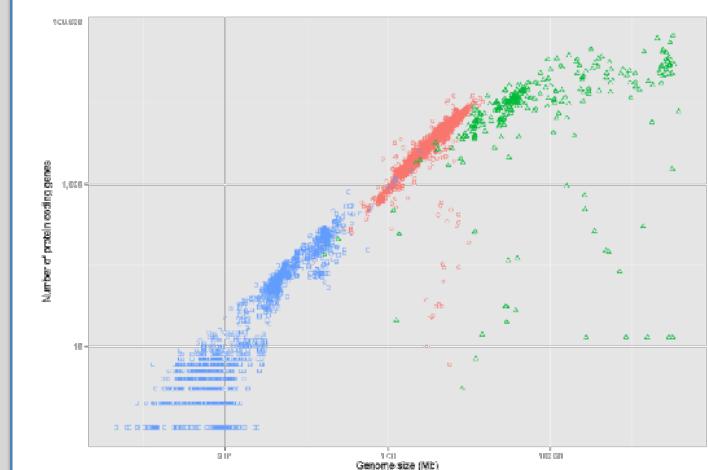
## Genomes come in many shapes



- Primarily DNA, but can be RNA in the case of some viruses
- Some genomes are circular, others linear
- Can be organized into discrete units (chromosomes) or freestanding molecules (plasmids)

Prokaryote by [Mariana Ruiz Villarreal](#) | Bacteriophage image by [Solierte](#) / CC BY-SA | Eukaryote image by [Magnus Manske](#) / CC BY-SA

## Genomes come in many sizes



Modified from image by [Eternz](#) / CC BY-SA

## Genome Databases

NCBI Genome:

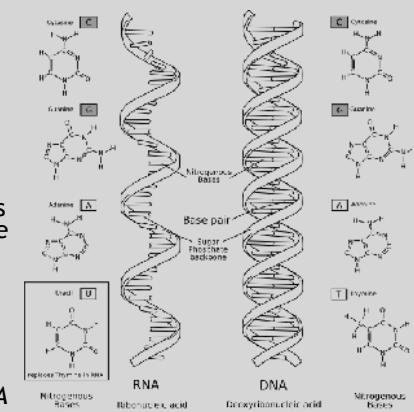
<http://www.ncbi.nlm.nih.gov/genome>

This screenshot shows the homepage of the NCBI Genome database. The main content area features a large image of a karyotype and a brief description: "This resource organizes information on genomes including sequences, maps, chromosomes, assemblies, and delivery". Below this are several search and browse options: "Using Genome", "Using Tools", "Using Databases", and "Using Analytic Tools". On the right side, there are sections for "Using Resources", "Using Analytic Tools", and "Using Databases". At the bottom, there's a "Help" section with links to "How to Use", "FAQs", and "Helpful Links". The footer contains copyright information and links to other NCBI resources like PubMed and PDB.

## Characteristics of Genomes

- All genomes are made up of nucleic acids
  - DNA and RNA: Adenine (A), Cytosine (C), Guanine (G)
  - DNA Only: Thymine (T)
  - RNA Only: Uracil (U)
- Typically (but not always), DNA genomes are double stranded (double helix) while RNA genomes are single stranded
- Genomes are described as long sequences of nucleic acids, for example:

**GGACTTCAGGCAACTGCAACTACCTTAGGA**



Darryl Leja, Courtesy: National Human Genome Research Institute

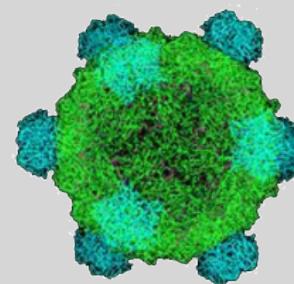
## Early Genome Sequencing



- Chain-termination “Sanger” sequencing was developed in 1977 by Frederick Sanger, colloquially referred to as the “Father of Genomics”
- Sequence reads were typically 750-1000 base pairs in length with an error rate of ~1 / 10000 bases

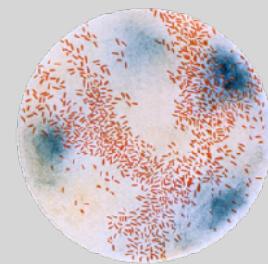
[http://en.wikipedia.org/wiki/Frederick\\_Sanger](http://en.wikipedia.org/wiki/Frederick_Sanger)

## The First Sequenced Genomes



Bacteriophage φ-X174

- Completed in 1977
- 5,386 base pairs, ssDNA
- 11 genes



Haemophilus influenzae

- Completed in 1995
- 1,830,140 base pairs, dsDNA
- 1740 genes

[http://en.wikipedia.org/wiki/Phi\\_X\\_174](http://en.wikipedia.org/wiki/Phi_X_174)

<http://phil.cdc.gov/>

## The Human Genome Project

- The Human Genome Project (HGP) was an international, public consortium that began in 1990
  - Initiated by James Watson
  - Primarily led by Francis Collins
  - Eventual Cost: \$2.7 Billion
- Celera Genomics was a private corporation that started in 1998
  - Headed by Craig Venter
  - Eventual Cost: \$300 Million
- Both initiatives released initial drafts of the human genome in 2001
  - ~3.2 Billion base pairs, dsDNA
  - 22 autosomes, 2 sex chromosomes
  - ~20,000 genes



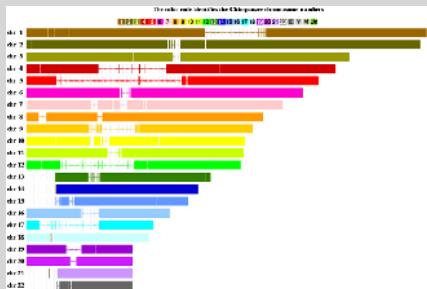
Jane Ades, Courtesy: National Human Genome Research Institute.

## What can we do with a Genome?

- We can *compare* genomes, both within and between species, to identify regions of variation and of conservation
- We can *model* genomes, to find interesting patterns reflecting functional characteristics
- We can *edit* genomes, to add, remove, or modify genes and other regions for adjusting individual traits

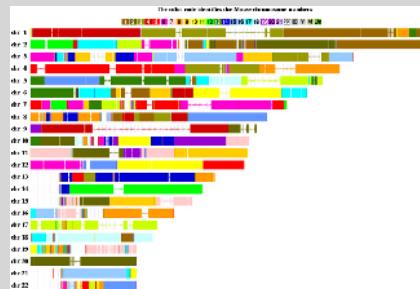
## Comparative Genomics

~6-7 million years



[http://cbse.soe.ucsc.edu/research/comp\\_genomics/human\\_chimp\\_mouse](http://cbse.soe.ucsc.edu/research/comp_genomics/human_chimp_mouse)

~60-70 million years



## Conservation Suggests Function

- Functional regions of the genome tend to mutate slower than nonfunctional regions due to selective pressures
- Comparing genomes can therefore indicate segments of high similarity that have remained conserved across species as candidate genes or regulatory regions

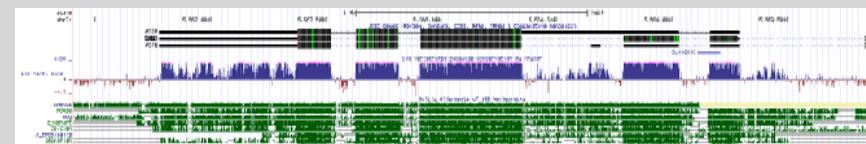


figure generated from: <http://genome.ucsc.edu/>

## Conservation Indicates Loss

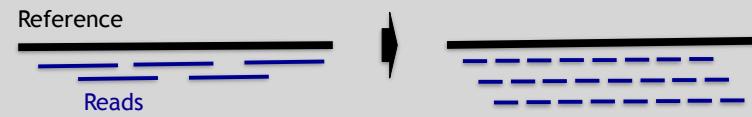
- Comparing genomes allows us to also see what we have lost over evolutionary time
- A model example of this is the loss of “penile spines” in the human lineage due to a human-specific deletion of an enhancer for the androgen receptor gene (McLean et al, Nature, 2011)

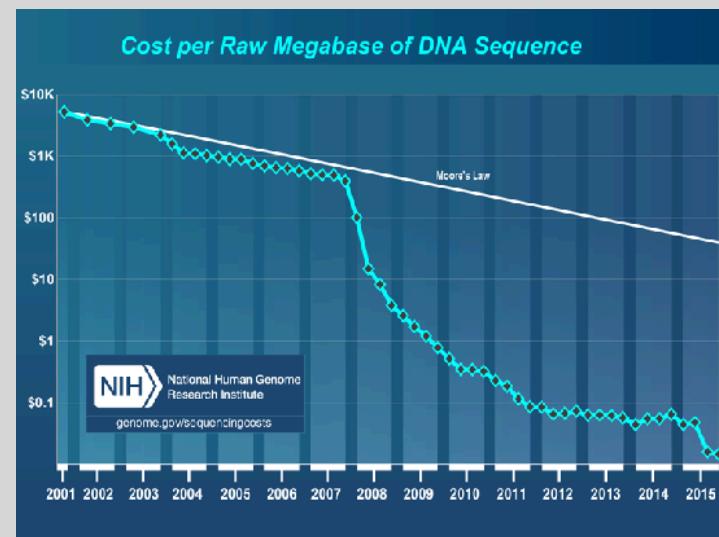
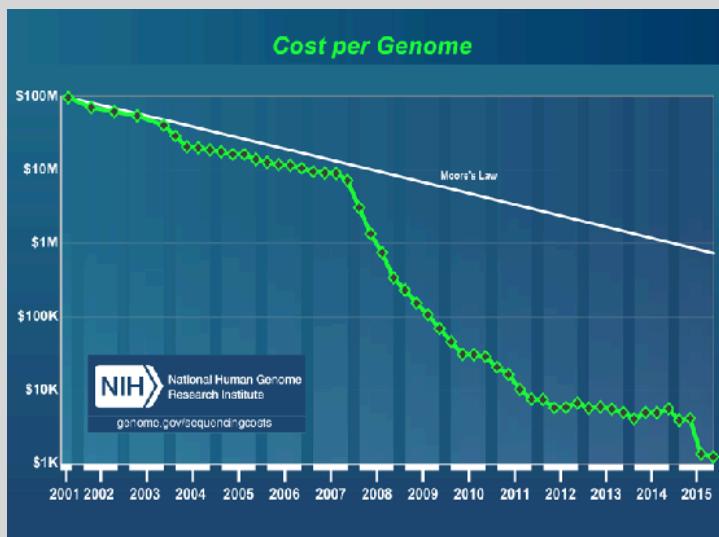


figure generated from: <http://genome.ucsc.edu/>

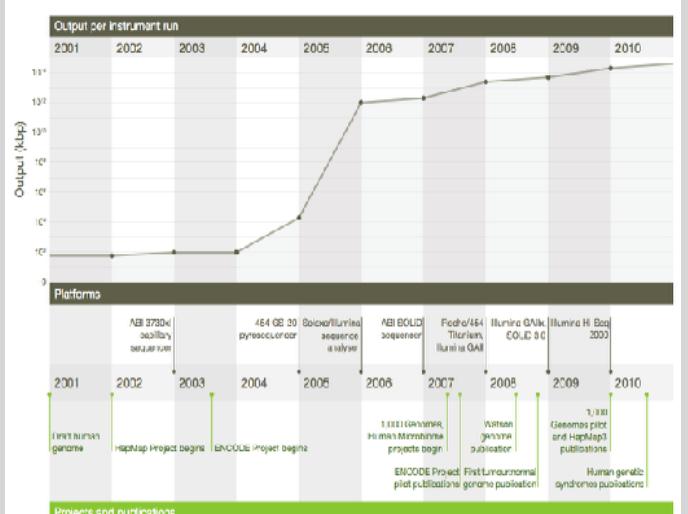
## Modern Genome Sequencing

- Next Generation Sequencing (NGS) technologies have resulted in a paradigm shift from long reads at low coverage to short reads at high coverage
- This provides numerous opportunities for new and expanded genomic applications





## Timeline of Sequencing Capacity



Mardis, ER (2011), Nature, 470, pp. 198-203

## DNA Sequencing Concepts

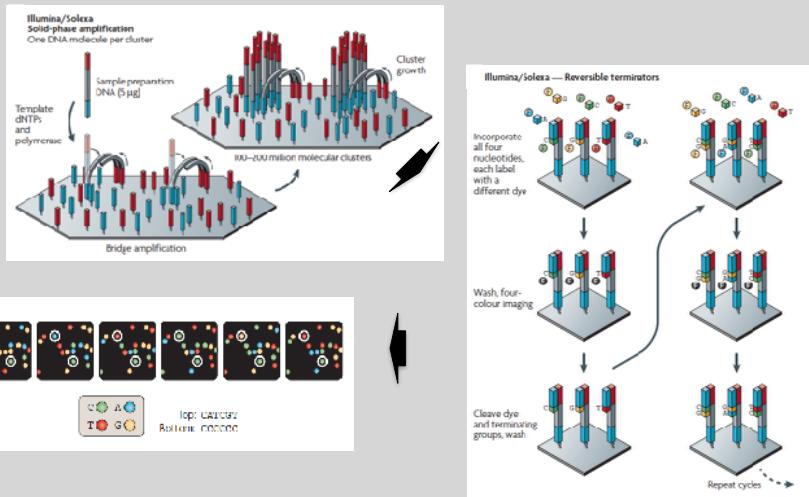
- **Sequencing by Synthesis:** Uses a polymerase to incorporate and assess nucleotides to a primer sequence
  - 1 nucleotide at a time
- **Sequencing by Ligation:** Uses a ligase to attach hybridized sequences to a primer sequence
  - 1 or more nucleotides at a time (e.g. dibase)

# Modern NGS Sequencing Platforms

	Roche/454	Life Technologies SOLiD	Illumine Hi Seq 2300
Library amplification method	emPCR® on bead surface	emPCR® on bead surface	Enzymatic amplification on glass surface
Sequencing method	Polymerase-mediated incorporation of unlabelled nucleotides	Ligase-mediated addition of 2-base encoded fluorescent oligonucleotides	Polymerase-mediated incorporation of end-blocked fluorescent nucleotides
Detection method	Light emitted from secondary reactions initiated by release of PPI	Fluorescent emission from ligated dye-labelled oligonucleotides	Fluorescent emission from incorporated dye-labelled nucleotides
Post incorporation method	NA (unlabelled nucleotides are added in base-specific fashion, followed by detection)	Chemical cleavage removes fluorescent dye and 3' end of oligonucleotide	Chemical cleavage of fluorescent dye and 3' blocking group
Error model	Substitution errors rare, insertion/deletion errors at homopolymers	End of read substitution errors	End of read substitution errors
Read length (fragment/paired end)	400 bp/variable length mate pairs	75 bp/50+25 bp	150 bp/100+100 bp

Modified from Mardis, ER (2011), Nature, 470, pp. 198-203

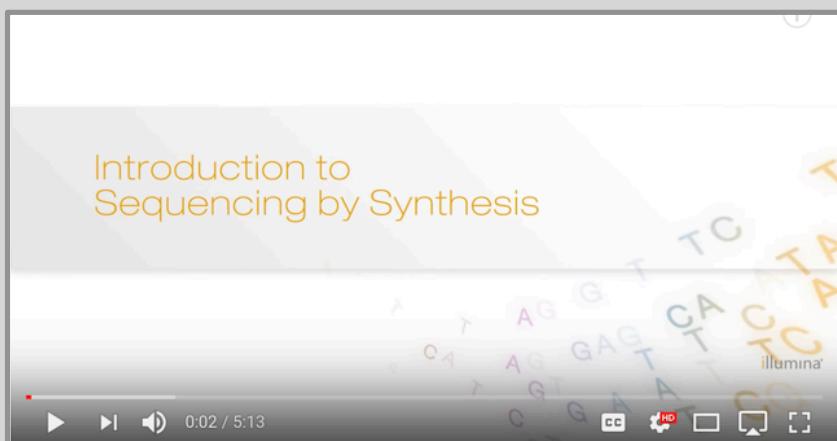
# Illumina - Reversible terminators



(other sequencing platforms summarized at end of slide set)

Metzker, ML (2010), Nat. Rev. Genet., 11, pp. 31-46

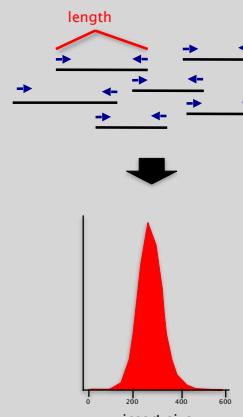
## Illumina Sequencing - Video



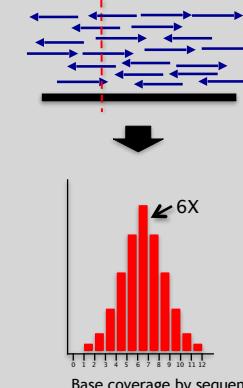
[https://www.youtube.com/watch?src\\_vid=womKfikWlxM&v=fCd6B5HRaZ8](https://www.youtube.com/watch?src_vid=womKfikWlxM&v=fCd6B5HRaZ8)

## NGS Sequencing Terminology

### Insert Size



### Sequence Coverage





## Generic Workflow for NGS

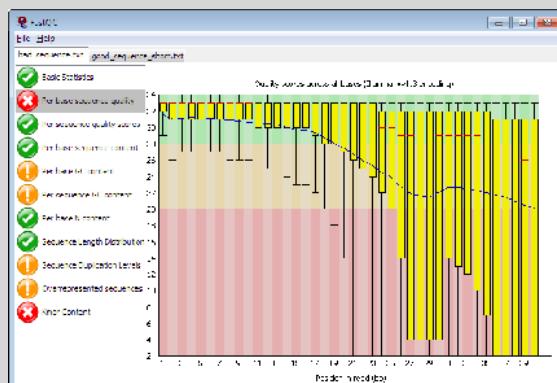
- There are many different ways to analyze sequences generated from NGS, depending on the specific question you are investigating
- For the analysis of genomic sequence data, a typical (if generic) approach is as follows



## FASTQC

FASTQC is one approach which provides a visual interpretation of the raw sequence reads

– <http://www.bioinformatics.babraham.ac.uk/projects/fastqc/>



## Quality Control (QC)

- Quality checks of raw sequence data are **very** important
- Common problems can include:
  - Sample mix-up
  - Sample contamination
  - Machine interruption
  - DNA quality
- It is crucial that investigators examine their sequences upon first receipt before any downstream analysis is conducted

## Sequence Alignment

- Once sequence quality has been assessed, the next step is to align the sequence to a reference genome
- There are *many* distinct tools for doing this; which one you choose is often a reflection of your specific experiment and personal preference

BWA  
Bowtie  
SOAP2  
Novoalign  
mr/mrsFast  
Eland  
Blat  
Bfast

BarraCUDA  
CASHx  
GSNAP  
Mosiak  
Stampy  
SHRIMP  
SeqMap  
SLIDER

RMAP  
SSAHA  
etc



# RNA Sequencing

The absolute basics

Normal Cells

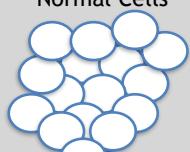


Mutated Cells

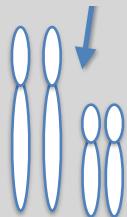


- The **mutated cells** behave differently than the **normal cells**
- We want to know what genetic mechanism is causing the difference
- One way to address this is to examine differences in gene expression via RNA sequencing...

Normal Cells



Each cell has a bunch  
of chromosomes



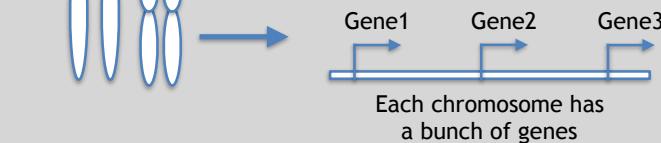
Mutated Cells

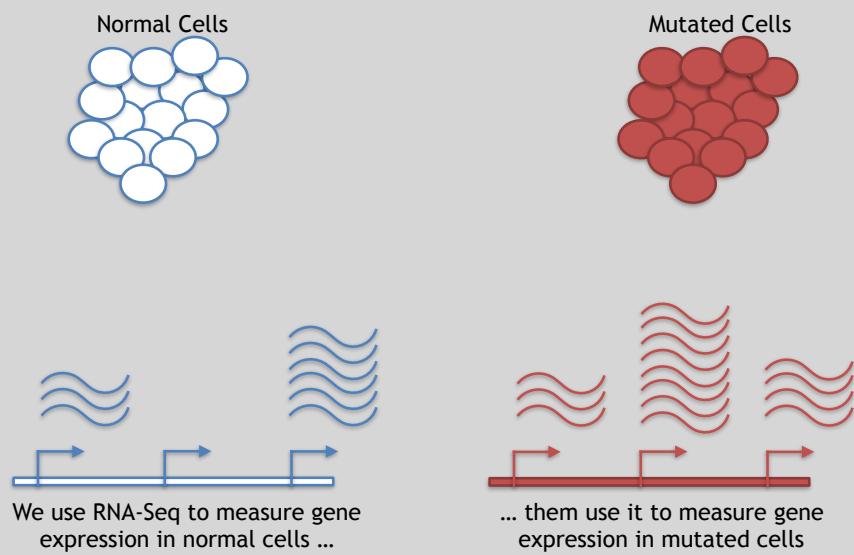
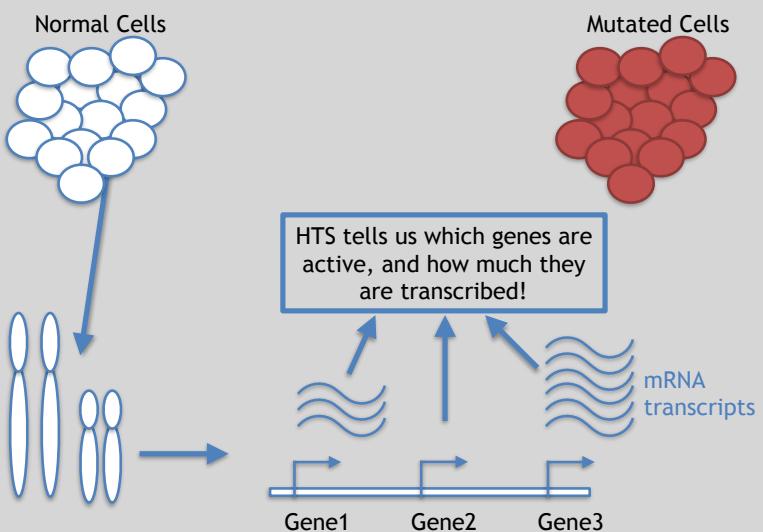
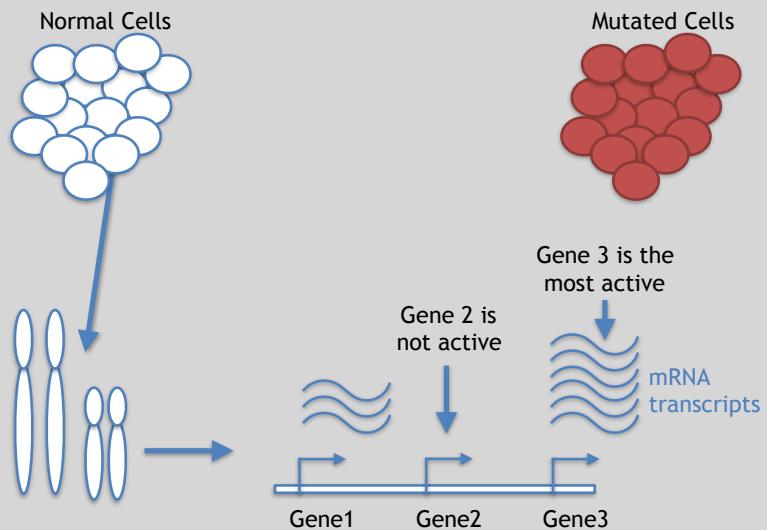
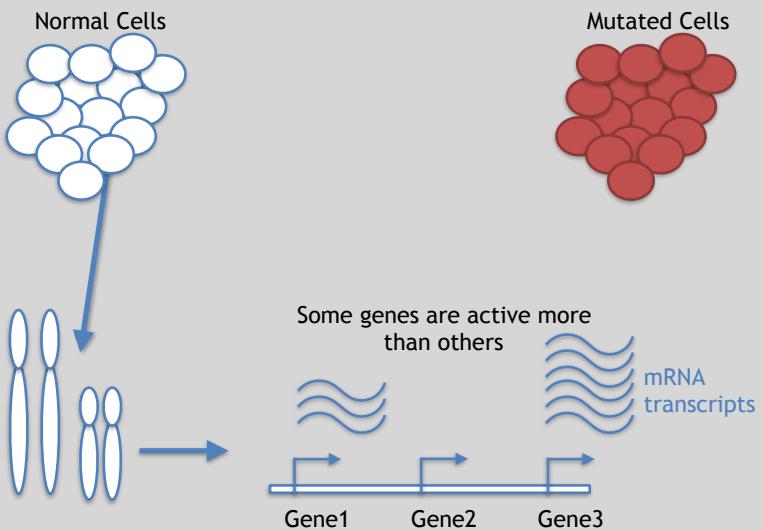


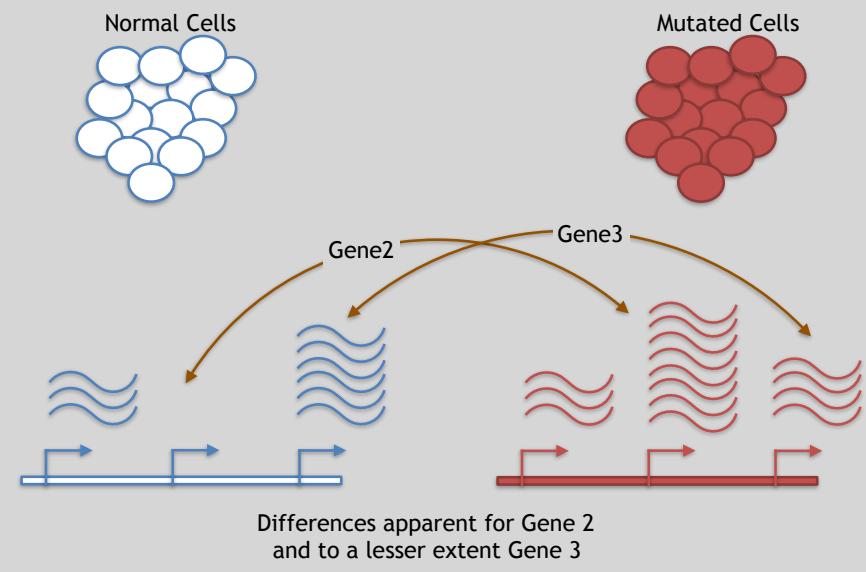
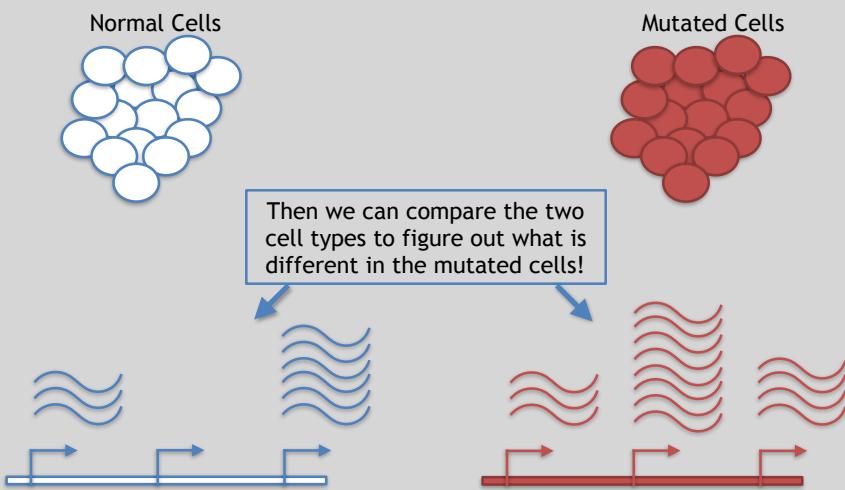
Normal Cells



Mutated Cells







### 3 Main Steps for RNA-Seq:

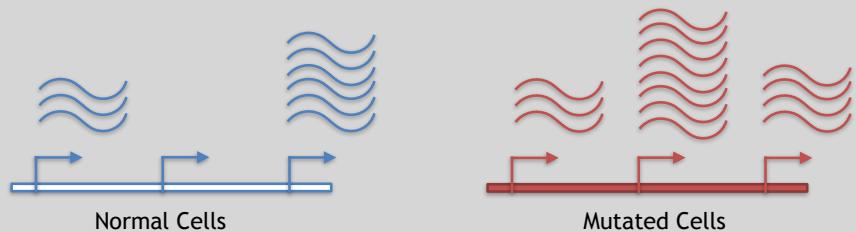
- 1) Prepare a sequencing library**  
(RNA to cDNA conversion via reverse transcription)
- 2) Sequence**  
(Using the same technologies as DNA sequencing)
- 3) Data analysis**  
(Often the major bottleneck to overall success!)

We will discuss each of these steps in detail  
(particularly the 3rd) next day!

Lets skip ahead to the start of step 3

Gene	WT-1	WT-2	WT-3	...
A1BG	30	5	13	...
AS1	24	10	18	...
...	...	...	...	...

We sequenced, aligned, counted the reads per gene in each sample and normalized to arrive at our data matrix



Step 1 in any analysis is always the same:

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**PLOT THE DATA!!**

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- If there were only two genes, then plotting the data would be easy

Gene	WT-1	WT-2	WT-3
A1BG	30	5	13
AS1	24	10	18

Step 1 in any analysis is always the same:  
**PLOT THE DATA!!**

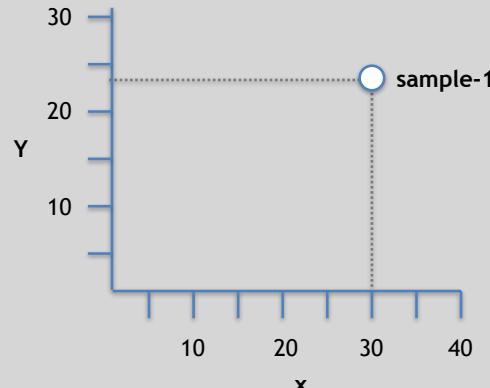
- If there were only two genes, then plotting the data would be easy

Gene	WT-1	WT-2	WT-3
x	30	5	13
y	24	10	18

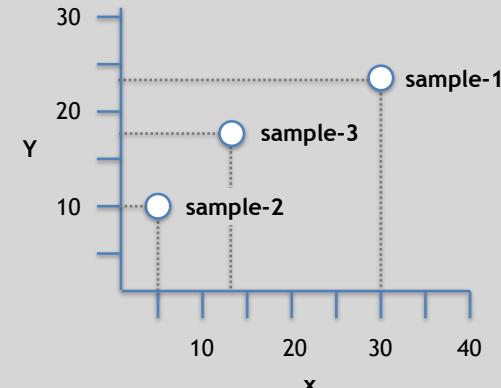
Just replace the gene names  
with “x” and “y” and plot!



	sample-1	sample-2	sample-3
x	30	5	13
y	24	10	18



	sample-1	sample-2	sample-3
x	30	5	13
y	24	10	18



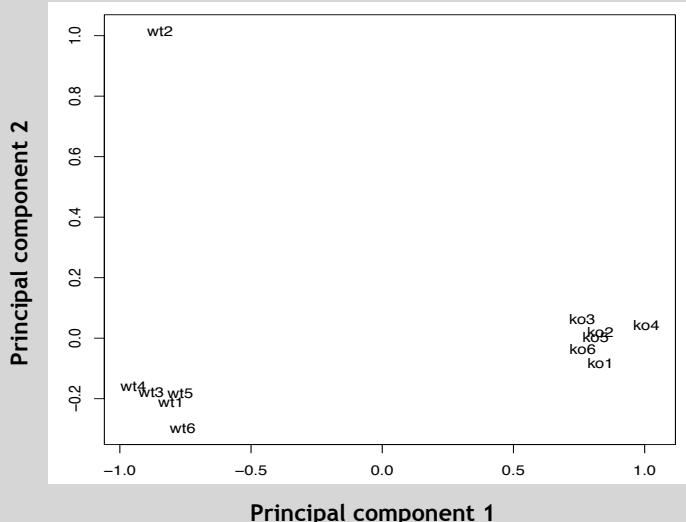
But we have 20,000 genes...

So we would need a graph with 20,000 axes to plot the data!

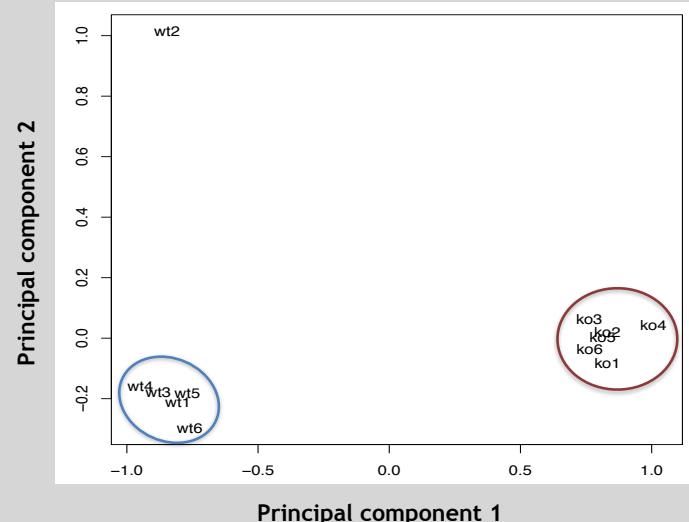
So we use PCA (principal component analysis) or something like it to plot this data.

PCA reduces the number of axes you need to display the important aspects of the data.

This is a PCA plot from a real RNA-seq experiment done on neural cells. The “wt” samples are “normal”. The “ko” samples are samples that were mutated.



This is a PCA plot from a real RNA-seq experiment done on neural cells. The “wt” samples are “normal”. The “ko” samples are samples that were mutated.

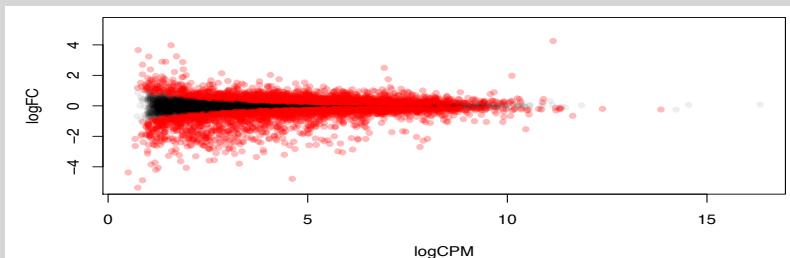


### Plotting the data:

- (1) Tells us if we can expect to find some interesting differences
- (2) Tells us if we should exclude some samples from any down stream analysis.

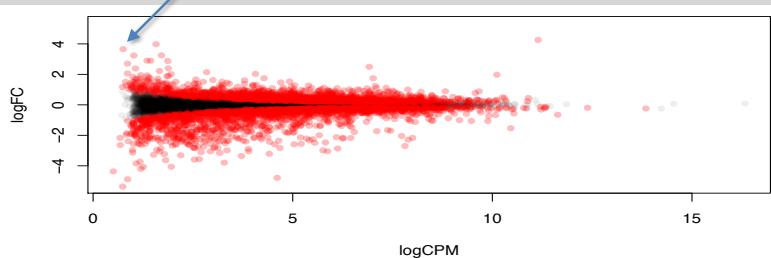
### Step 2: Identify differentially expressed genes between the “normal” and “mutant” samples

This is typically done using R with either the **edgeR** or **DESeq2** packages and the results are generally displayed using graphs like this one

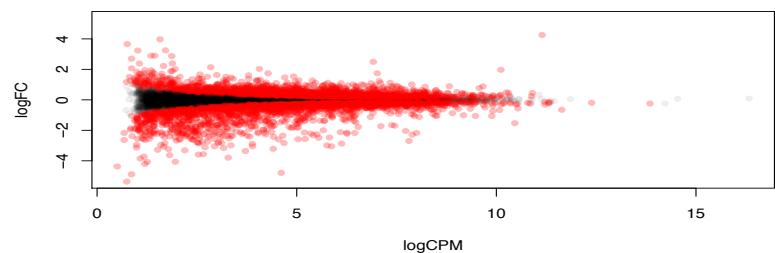


## Step 2: Identify differentially expressed genes between the “normal” and “mutant” samples

A Red dot is a gene that is different between “normal” and “mutant” samples (black dots are the same).



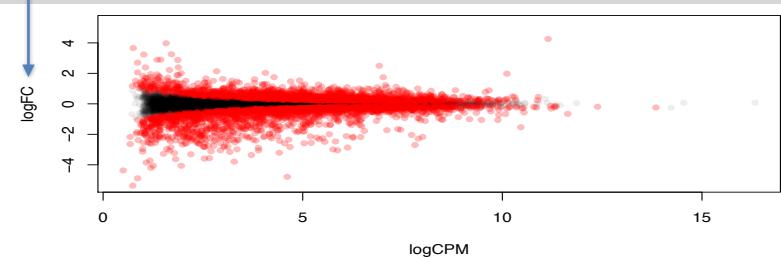
## Step 2: Identify differentially expressed genes between the “normal” and “mutant” samples



The x axis tells us how much each gene is transcribed (CPM stands for Counts Per Million)

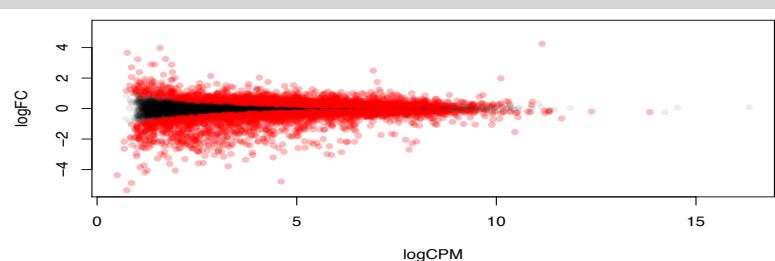
## Step 2: Identify differentially expressed genes between the “normal” and “mutant” samples

The y axis tells you how big the relative difference is between “normal” and “mutant” (FC stands for Fold change)



The x axis tells us how much each gene is transcribed (CPM stands for Counts Per Million)

## Step 3 and beyond: We’ve identified interesting genes, now what?



1. If you know what you’re looking for, you can see if the experiment validated your hypothesis.
2. If you don’t know what you’re looking for, you can see if certain pathways are enriched in either the normal or mutant gene sets.

# DNA- and RNA-Seq Databases

NCBI Short Read Archive (SRA):  
<http://www.ncbi.nlm.nih.gov/sra>

# Protected Data - dbGaP

NCBI Database of Genotypes and Phenotypes (dbGaP):  
<http://www.ncbi.nlm.nih.gov/sra>

## Today we will use Galaxy

- Galaxy is a useful web-based application for the manipulation of NGS data sets
  - <https://main.g2.bx.psu.edu/>
- It contains many common analysis utilities and provides a somewhat standardized approach to analyzing NGS data
- However, it requires the uploading of data to their server, which typically precludes its application to protected data sets (e.g. human samples) - Or you have to build your own server
- You are also limited to only those tools which have been incorporated into their system

## Galaxy Website

## Hands-on Time!

[https://bioboot.github.io/bggm213\\_f17/class-material/lecture14-BGGN213\\_F17.pdf](https://bioboot.github.io/bggm213_f17/class-material/lecture14-BGGN213_F17.pdf)

Additional Slides follow for Reference

## Population Scale Analysis

We can now begin to assess genetic differences on a very large scale, both as naturally occurring variation in human and non-human populations as well somatically within tumors



“Variety’s the very spice of life”

—William Cowper, 1785

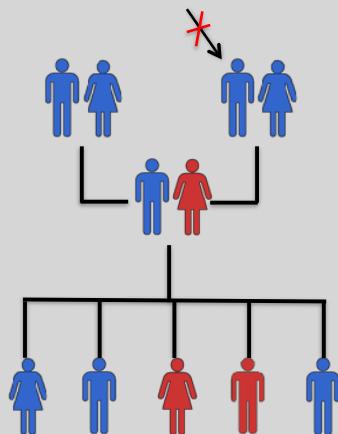
“Variation is the spice of life”

—Kruglyak & Nickerson, 2001

- While the sequencing of the human genome was a great milestone, the DNA from a single person is not representative of the millions of potential differences that can occur between individuals
- These unknown genetic variants could be the cause of many phenotypes such as differing morphology, susceptibility to disease, or be completely benign.

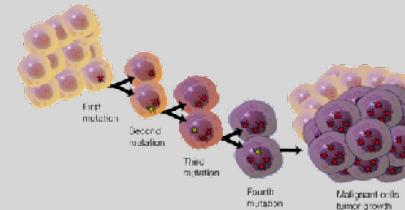
## Germline Variation

- Mutations in the germline are passed along to offspring and are present in the DNA over every cell
- In animals, these typically occur in meiosis during gamete differentiation



## Somatic Variation

- Mutations in non-germline cells that are not passed along to offspring
- Can occur during mitosis or from the environment itself
- Are an integral part in tumor progression and evolution



Darryl Leja, Courtesy: National Human Genome Research Institute.

## Mutation vs Polymorphism

- A mutation must persist to some extent within a population to be considered polymorphic
  - >1% frequency is often used
- Germline mutations that are not polymorphic are considered rare variants

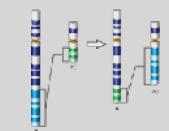
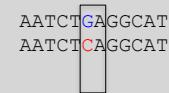
*"From the standpoint of the neutral theory, the rare variant alleles are simple those alleles whose frequencies within a species happen to be in a low-frequency range ( $0, q$ ), whereas polymorphic alleles are those whose frequencies happen to be in the higher-frequency range ( $q, 1-q$ ), where I arbitrarily take  $q = 0.01$ . Both represent a phase of molecular evolution."*

- Motoo Kimura

Kimura M (1983) Mol. Biol. Evol., 1(1), pp. 84-93

## Types of Genomic Variation

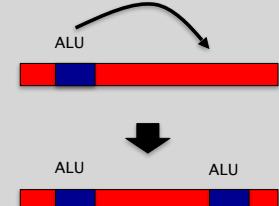
- Single Nucleotide Polymorphisms (SNPs) - mutations of one nucleotide to another
- Insertion/Deletion Polymorphisms (INDELS) - small mutations removing or adding one or more nucleotides at a particular locus
- Structural Variation (SVs) - medium to large sized rearrangements of chromosomal DNA



Darryl Leja, Courtesy: National Human Genome Research Institute.

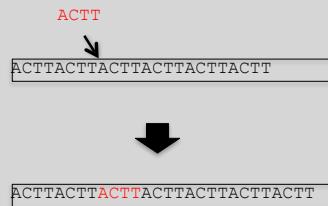
## Variant Subtypes: Repetitive Elements

### Mobile Elements / Retrotransposons

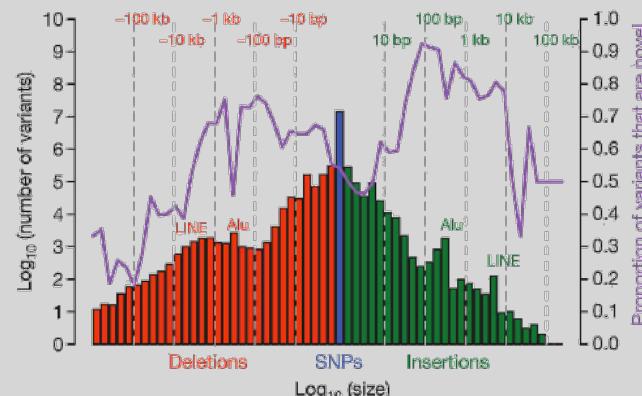


(in humans, primarily ALU, LINE, and SVA)

### Repeat Expansions



## Variant Length Distribution



1000 Genomes Project, Nature, 2010

## Differences Between Individuals

The average number of genetic differences in the germline between two random humans can be broken down as follows:

- 3,600,000 single nucleotide differences
- 344,000 small insertion and deletions
- 1,000 larger deletion and duplications

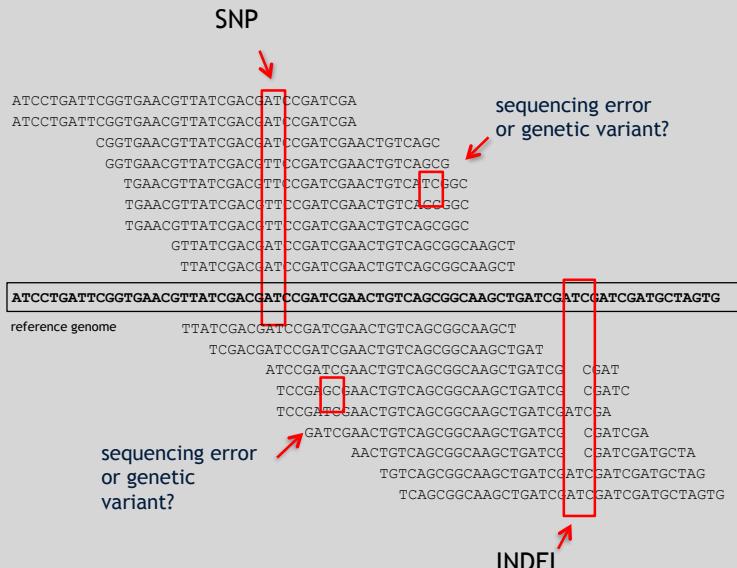
Numbers change depending on ancestry!

1000 Genomes Project, Nature, 2012

## Discovering Variation: SNPs and INDELs

- Small variants require the use of sequence data to initially be discovered
- Most approaches align sequences to a reference genome to identify differing positions
- The amount of DNA sequenced is proportional to the number of times a region is covered by a sequence read
  - More sequence coverage equates to more support for a candidate variant site

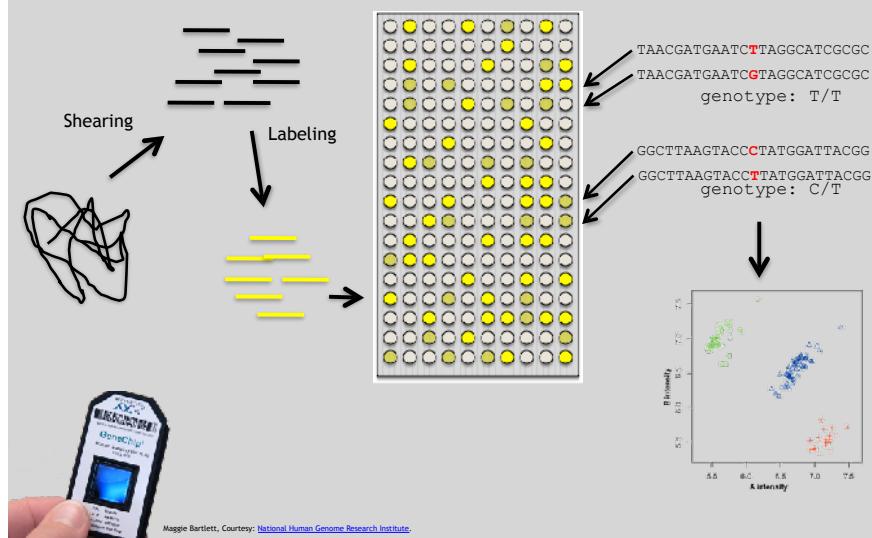
## Discovering Variation: SNPs and INDELs



## Genotyping Small Variants

- Once discovered, oligonucleotide probes can be generated with each individual allele of a variant of interest
- A large number can then be assessed simultaneously on microarrays to detect which combination of alleles is present in a sample

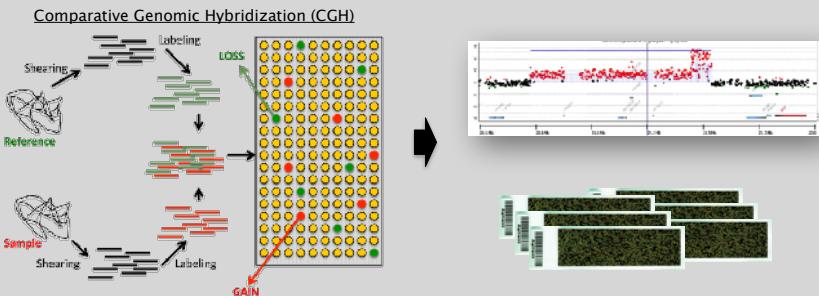
## SNP Microarrays



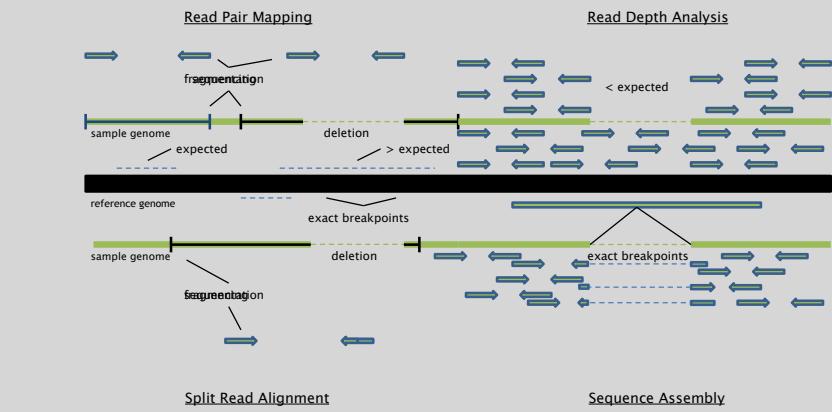
## Discovering Variation: SVs

- Structural variants can be discovered by both sequence and microarray approaches
- Microarrays can only detect genomic imbalances, specifically copy number variants (CNVs)
- Sequence based approaches can, in principle, identify all types of structural rearrangements

## Microarray-based CNV Discovery



## Sequenced-based SV Discovery



## Variant Databases and Formats

- dbSNP - repository for SNP and small INDELs
  - <http://www.ncbi.nlm.nih.gov/SNP/>
- VCF - variant call format for reporting variation
  - <https://github.com/samtools/hts-specs>

## VCF Format Example

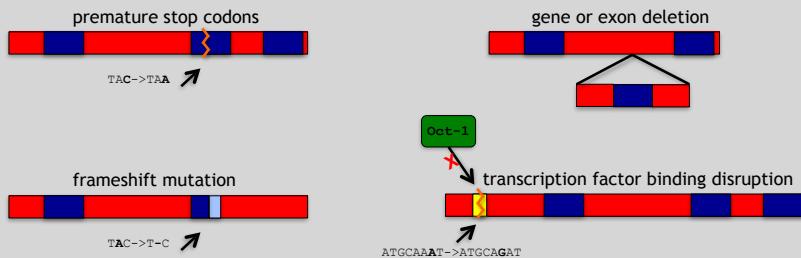
```

##fileformat=VCFv4.2
##fileDate=20090805
##source=myImputationProgramV3.1
##reference=file:///seq/references/1000GenomesPilot-NCBI36.fasta
##contig=<ID=20,length=62435964,assembly=B36,md5=f126cdf8a6e0c7f379d618ff6beb2da,species="Homo sapiens",taxonomy=x>
##phasing=partial
##INFO<ID=NS,Number=1,Type=Integer,Description="Number of Samples With Data">
##INFO<ID=DP,Number=1,Type=Integer,Description="Total Depth">
##INFO<ID=AF,Number=A,Type=Float,Description="Allele Frequency">
##INFO<ID=DB,Number=0,Type=Flag,Description="dbSNP membership, build 129">
##INFO<ID=H2,Number=0,Type=Flag,Description="HapMap2 membership">
##FILTER<ID=q10,Description="Quality below 10">
##FILTER<ID=s50,Description="Less than 50% of samples have data">
##FORMAT<ID=GT,Number=1,Type=String,Description="Genotype">
##FORMAT<ID=GQ,Number=1,Type=Integer,Description="Genotype Quality">
##FORMAT<ID=DP,Number=1,Type=Integer,Description="Read Depth">
##FORMAT<ID=HQ,Number=2,Type=Integer,Description="Haplotype Quality">
#CHROM POS ID REF ALT QUAL FILTER INFO FORMAT NA00001 NA00002 NA00003
20 14370 rs6054257 G A 29 PASS NS=3;DP=14;AF=0.5;DB;H2 GT:GQ:DP:HQ 0|0:48:1:51,51 1|0:48:5:51,51 1/1:43:5:...
20 17330 . T A 3 q10 NS=3;DP=11;AF=0.017 GT:GQ:DP:HQ 0|0:49:3:58,50 0|1:3:5:65,3 0/0:41:3
20 1110696 rs60403355 A G,T 67 PASS NS=2;DP=10;AF=0.333,0.667;AA=T;DB GT:GQ:DP:HQ 1|2:21:6:23,27 2|1:2:0:18,2 2/2:35:4
20 1230237 . T . 47 PASS NS=3;DP=13;AA=T GT:GQ:DP:HQ 0|0:54:7:56,60 0|0:48:4:51,51 0/0:61:2
21 1234567 microsat1 GTC G,GTCT 50 PASS NS=3;DP=9;AA=G GT:GQ:DP 0|1:35:4 0/2:17:2 1/1:40:3

```

## Impact of Genetic Variation

There are numerous ways genetic variation can exhibit functional effects



## Variant Annotation Classes

**High Impact**

- exon\_deleted
- frame\_shift
- splice\_acceptor
- splice\_donor
- start\_loss
- stop\_gain
- stop\_loss
- non\_synonymous\_start
- transcript\_codon\_change

**Medium Impact**

- non\_syn\_coding
- inframe\_codon\_gain
- inframe\_codon\_loss
- inframe\_codon\_change
- codon\_change\_del
- codon\_change\_ins
- UTR\_5\_del
- UTR\_3\_del
- other\_splice\_variant
- mature\_miRNA
- regulatory\_region
- TF\_binding\_site
- regulatory\_region\_ablation
- regulatory\_region\_amplification
- TFBS\_ablation
- TFBS\_amplification

**Low Impact**

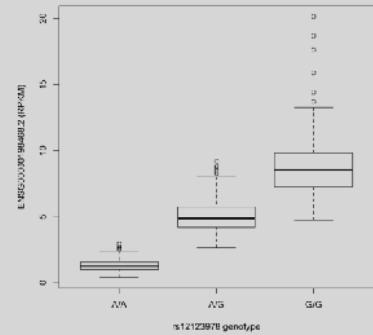
- synonymous\_stop
- synonymous\_coding
- UTR\_5\_prime
- UTR\_3\_prime
- intron
- CDS
- upstream
- downstream
- intergenic
- intragenic
- gene
- transcript
- exon
- start\_gain
- synonymous\_start
- intron\_conserved
- nc\_transcript
- NMD\_transcript
- transcript\_codon\_change
- incomplete\_terminal\_codon
- nc\_exon
- transcript\_ablation
- transcript\_amplification
- feature\_elongation
- feature\_truncation

## Variant Annotation

- Variants are *annotated* based on their potential functional impact
- For variants falling inside genes, there are a number of software packages that can be used to quickly determine which may have a functional role (missense/nonsense mutations, splice site disruption, etc)
- A few examples are:
  - ANNOVAR (<http://www.openbioinformatics.org/annovar/>)
  - VAAST (<http://www.yandell-lab.org/software/vaast.html>)
  - VEP ([http://grch37.ensembl.org/Homo\\_sapiens/Tools/VEP](http://grch37.ensembl.org/Homo_sapiens/Tools/VEP))
  - SeattleSeq (<http://snp.gs.washington.edu/SeattleSeqAnnotation134/>)
  - snpEff (<http://snpeff.sourceforge.net/>)

## Variation and Gene Expression

- Expression quantitative trait loci (eQTLs) are regions of the genome that are associated with expression levels of genes
- These regions can be nearby (cis) or far away (trans) from the genes that they affect
- Genetic variants in eQTL regions are typically responsible through changes to regulatory elements



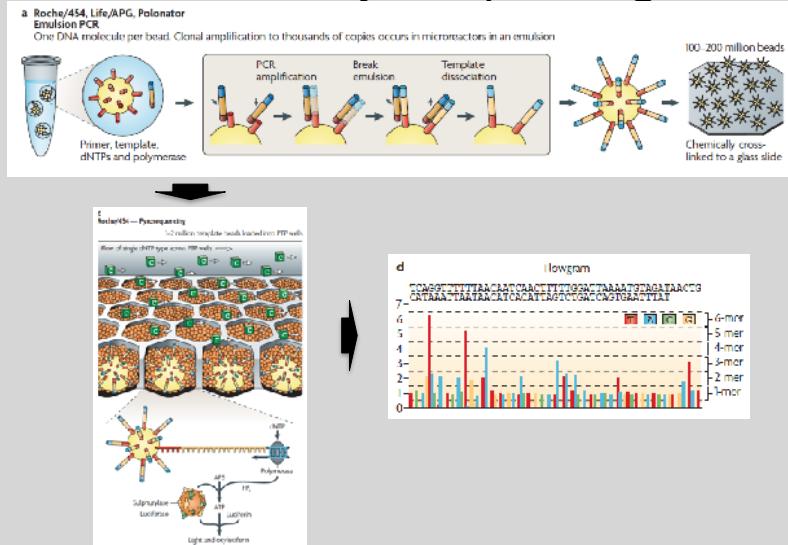
# Geuvadis Consortium

<http://www.geuvadis.org/web/geuvadis>

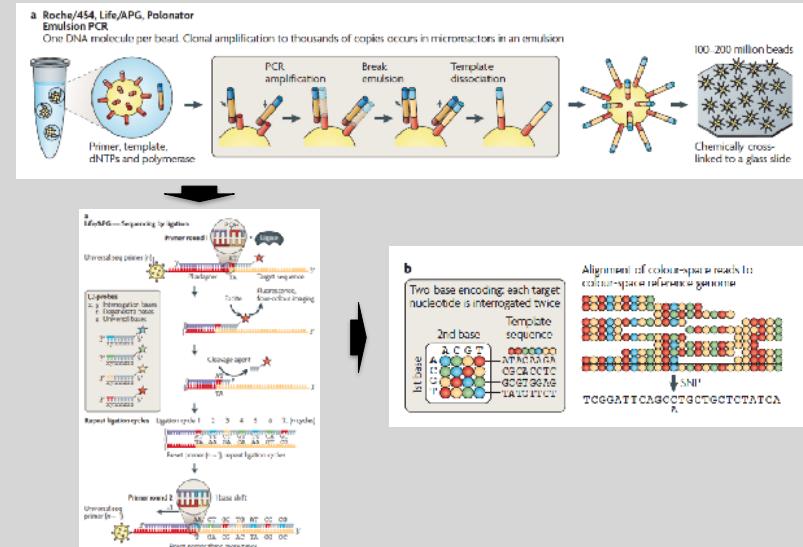


## Additional Reference Slides on Sequencing Methods

### Roche 454 - Pyrosequencing

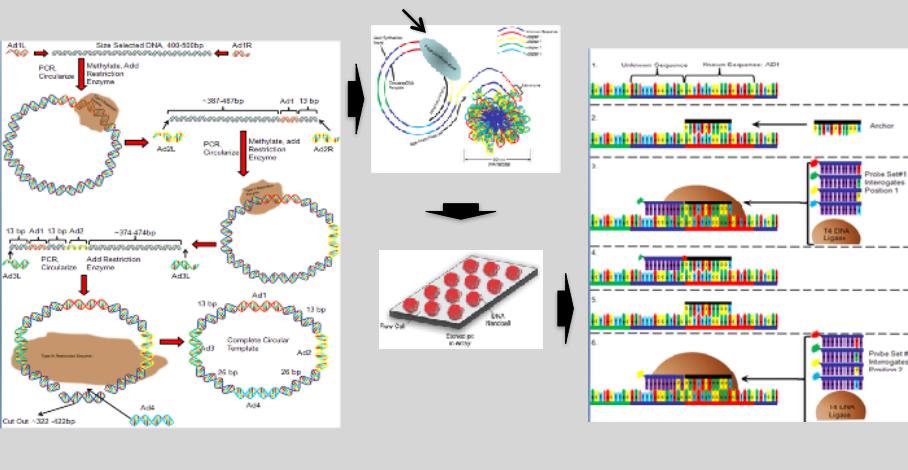


### Life Technologies SOLiD - Sequence by Ligation



## Complete Genomics - Nanoball Sequencing

Has proofreading ability!



Niedringhaus, TP et al (2011), *Analytical Chem.*, 83, pp. 4327-4341

Wikipedia, "DNA Nanoball Sequencing", September 26, 2012

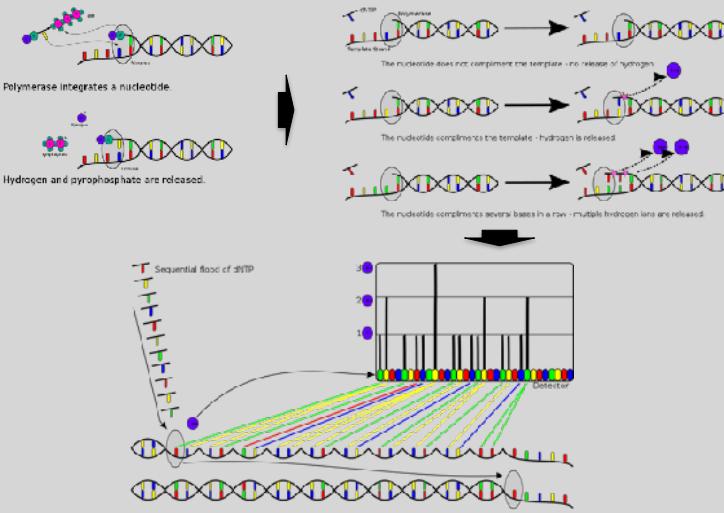
## "Benchtop" Sequencers

- Lower cost, lower throughput alternative for smaller scale projects
- Currently three significant platforms
  - Roche 454 GS Junior
  - Life Technology Ion Torrent
    - Personal Genome Machine (PGM)
    - Proton
  - Illumina MiSeq

Platform	List price	Approximate cost per run	Minimum throughput (read length)	Run time	Cost/Mb	Mb/h
454 GS Junior	\$108,000	\$1,100	35 Mb (400 bases)	8 h	\$31	4.4
Ion Torrent PGM (314 chip)	\$80,490 <sup>a,b</sup>	\$225 <sup>c</sup>	10 Mb (100 bases)	3 h	\$22.5	3.3
(316 chip)		\$425	100 Mb (100 bases)	3 h	\$4.25	33.3
(318 chip)		\$625	1,000 Mb (100 bases)	3 h	\$0.63	333.3
MiSeq	\$125,000	\$750	1,500 Mb (2 x 150 bases)	27 h	\$0.5	55.5

Loman, NJ (2012), *Nat. Biotech.*, 30, pp. 434-439

## PGM - Ion Semiconductor Sequencing



Wikipedia, "Ion Semiconductor Sequencing", September 26, 2012