# Genetics 211 - 2018 Lecture 1

Genome Sequencing Gavin Sherlock gsherloc@stanford.edu January 9<sup>th</sup> 2018

## **Overview of My Lectures**

- Genome Sequencing (Lecture 1)
  - Sanger Sequencing
    - Whole Genome Sequencing
    - Sequencing Theory
    - Genome Assembly
  - High Throughput Sequencing Technologies
    - Illumina
    - PacBio
    - Oxford Nanopore
- Short Read Genome (Re)sequencing (Lecture 2)
  - Making DNA sequence libraries
  - Data formats
  - Read alignment
  - Variant calling
  - De novo assembly from short reads
  - Gaining longer contiguity information
- Functional Genomics (Lecture 3)
  - Chromatin state
  - ChIP-Seq and Transcription factor binding sites
- Expression
  - RNA-Seq
  - Cluster Analysis

## What to Sequence and Why?

Structure

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#### De novo whole genome sequencing

- requires de novo whole genome assembly

• **Polymorphism discovery** (distinct from genotyping)

- Targeted approaches (exome)
- Whole genome
- SNPs, copy number variations, insertions, deletions, etc.
- Expressed sequence discovery and functional genomics
  - Expression profiling/RNA-Seq
  - ChIP
  - Nucleosome positioning
  - RNA editing
  - Hi-C
  - etc.

Function

## Four Fundamentally Different Approaches to DNA Sequencing

- Chemical degradation of DNA
  - Maxam-Gilbert
  - obsolete
- Sequencing by synthesis ("SBS")
  - uses DNA polymerase in a primer extension reaction
  - most common approach
  - Sanger developed it ("Sanger sequencing")
  - Illumina, Pacific Biosciences, Ion Torrent, 454
- Ligation-based
  - sequencing using short probes that hybridize to the template
  - SOLiD, Complete Genomics
- Nanopore
  - Inferring sequence by change in electrical current as ssDNA is pulled though a nanopore
  - Oxford Nanopore, NABsys, Genia, Illumina

#### **Commercially Available Sequencers Timeline**



### **Developments in Sequencing**



## 5' and 3'



If I throw in DNA polymerase and free nucleotide, which end gets extended?

Adapted From Berg et al: Biochemistry 5th ed. Freeman+Co, 2002

## **Sanger Sequencing Templates**



In Sanger sequencing, Crick is the template and Watson's synthesis starts at the primer's 3'OH

## **The Chain Terminator**

• Dideoxy nucleotides cannot be further extended, and so terminate the sequence chain



Adapted From Berg et al: Biochemistry 5th ed. Freeman+Co, 2002

### Original Sanger Sequencing with Radioactive Signal



Recombinant DNA: Genes and Genomes. 3rd Edition (Dec06). WH Freeman Press.



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#### This is great, but...

Wouldn't it be great to run everything in one lane? - Save space and time, more efficient

Also, would be nice to read everything at the same point in the gel

- Unable to read sequence near the top, as the bands get closer and closer together.

Fluorescently label the ddNTPs so that they each appear a different color, and can be read by a laser at a fixed point

### Fluorescent Sanger Sequencing: "Dyeterminators"

Each of the 4 ddNTPs is labeled with a different fluorescent dye (instead of radioactivity)



ddGTP

ddATP

Recombinant DNA: Genes and Genomes. 3rd Edition (Dec06). WH Freeman Press.

### **Fluorescent Sanger Sequencing**



### Fluorescent Sanger Sequencing Trace

Lane signal



### Sanger Base Calling



Quality score =  $-10 * \log(\text{probability of error})$  or P=10^-Q/10 For Q20, probability of error = 1/100 For Q99, probability of error ~10<sup>-10</sup>

### Phred: *The* base-calling program

- Algorithm based on ideas about what might go wrong in a sequencing reaction and in electrophoresis
- Tested the algorithm on a huge dataset of "gold standard" SEQUENCES (finished human and *C. elegans* sequences generated by highly-redundant sequencing)
- Compared the results of phred with the ABI Basecaller
- Phred was considerably more accurate (40-50% fewer errors), particularly for indels and particularly for the higher quality sequences

(Ewing et al., 1998, Genome Research 8: 175-185; Ewing and Green 1998, Genome Research 8: 186-194)

### **Progress of Sanger Sequencing Technology**



Radioactive polyacrylamide slab gel Low throughput, labor intensive



AB slab gel sequencers (370, 373, 377) Fluorescent sequencing 1990-1999 6 runs/day 96 reads/run 500 bp/read 288,000 bp/day



AB capillary sequencers (3700, 3730) 1998-now 24 runs/day 96 reads/run 550 – 1,000 bp/read 1-2 million bp/day

~1,000-fold increase in throughput since 1985 accomplished by incremental improvements of the same underlying technology

2<sup>nd</sup> Generation Sequencing Technologies have up to 1e6x more throughput than 3730

## Whole Genome Sequencing

- Two main challenges:
  - Getting sufficient "coverage" of the genome
    - A function of read length, number of reads, complexity of library, and size of genome
  - Assembling the sequence reads into a complete genome
    - A function of coverage, and repeat size (relative to read lengths) and repeat frequency

## How much sequence do you need?

- Let *L* = read Length; *G* = Genome size.
- Assume *L*<<*G*.
- $P_{obs\_with\_a\_given\_read} = L/G$
- P<sub>not\_obs\_with\_a\_given\_read</sub> = 1-L/G
- $P_{\text{not_obs_with_N_reads}} = (1-L/G)^N$
- $P_{\text{covered_by_at_least_one_read}} = 1 (1-L/G)^N$
- Rearranging gives:  $N = \ln(1-P)/\ln(1-L/G)$

## Example Calculation, Sanger Sequencing

- *E. coli* genome G = 4.6Mb, read length L = 800bp
- How many reads do I need to have a certain probability of observing any particular piece of my genome?
- Remember  $N = \ln(1-P)/\ln(1-L/G)$
- *P* = 0.9 => ~13,000 ~2.3x coverage
- *P* = 0.95 => ~17,000 ~3x coverage
- P = 0.99 => ~26,500 ~4.6x coverage

## Back of the Envelope

- Remember,  $P = 1 (1 L/G)^N$
- Given  $(1-L/G)^N \approx e^{-NL/G}$
- And, coverage, R = NL/G
- Then,  $P \approx 1 e^{-R}$
- This is a widespread back of the envelope calculation for any project involving redundancy.

## Probability as a Function of Coverage



## **Overcoming repeats**

- Most problematic when:
  - Repeats are longer than read lengths
  - Repeats are present in many copies
- Recognize based on coverage
- Resolve with longer range continuity information:
  - Paired-end reads
  - Multiple insert size libraries
    - Plasmids
    - Fosmids
    - BAC ends
    - Other tricks (which I'll come to later)

#### Whole Genome Sequencing Approaches

**Hierarchical Shotgun Approach** 



#### Whole Genome Sequencing Approaches

Shotgun Approach



Genomic DNA

Shotgun Clones



### **Rationale for Hierarchical Strategy**

- Better for a repeat-rich genome
  - less misassembly of finished genome
    - long-range misassembly largely eliminated and short-range reduced
- Better for an outbred organism
  - each clone from an individual and no polymorphisms in the final sequence.
  - (Added bonus: get SNPs from regions of overlapping clones)
  - Can also get some haplotype information, if individual BACs shotgun sequenced.
- Better if there are cloning biases
  - use minimum tiling path, so the same coverage for each region
- Easier to identify and fill gaps (from unclonable regions) sooner
  BUT
  - Time consuming and expensive to make minimum tiling path

### De Novo Whole Genome Sequencing



## Sequencing Read

GCTCATGAAGCCTTGGAGATAAATGAGTAAGTGGGGGGAAAATCTTGCTGTTAAAAAGGAAATCTCATCCTTTGCTGAATATATT CAGTTGCCATTGATAGGATACTTAAATTAAACTGCATTTGAACTGGAGGATTATTTGGGGGAGTTATTACTCTATTTAAAAAAGT TTTTTTTTAAATGAAGGACAGCCACCATGTGGAGGTGGTTTTAGTCATTTTATGAATTCAATGGCTTTGCTGTGATCCTAAAT GAAAATTTTCCAGATGTAGAATGCTCATCTGCACTAGAACATTTTCTAGTAGAACTTCTGCTAGTGGGGAAAACATGATAACAA CATAAGGTTTAAAAAAAAAATTTTAGAAAATACTTCAAGATTAAGACAAAGATAAGAGGAAATGCTGTCTTGAGTGTTGTTAAA CATTCTGTGGGTTACCAAGGAAGGCTGGGAAATCTCTTCTGGAGATCTCAGAAAATGAGAAAGATTCTTAAAGTTGGAGTCATA ΔΑΔΑΛΤΓΑGGGTTGGCAGAGACCTTAAAGGTCACTTAGCTGAACCACCCATCTGGTGCTTGAATCACCTCAACACTATCCTTGC CAGTTTCTTGTCATCTACAAATTCGATATGCCTGCCTTCTGTGTGTCATCCATATTTCTGAGAAAAATATGAAGGCCAGGAATA GAGCCCTGTGACATGACATAGAAACTACCCTCCAGGTTCATGTCTTCATGAATCACCATCTTTTGTATTGTTCACTCAATTACT AAGCCACCCAGTTACACTGTGACTCAGCTCATATTTCTCCATTTGGATCTTAAGAATGCCAATCGTAGCTGCGGATCTTAAATT CTACTTTCTTTTTAAAGTGCTTGGAGACCATTCCTTTAATAATCCATTAGAATATCTTTCCAAATCACTGTGTTCTGTAGTTTG GGAAGTCTGCCTTCTTCCCCTTTTTGAAAATTTATGCTACATTTATCATCTCATCTTCTAGCACCTCTCCATTCTTTGTGATTC CTCAACTATCCACAGAGAGCAATTCCATGGCCTGCCTACAAGGTCTTTCGGTTTCCTGGGATTTGCCCCATCCAGTCCAGTAATT CATTTAGAATGGATCAATTATTTGCTATCTTACATCTTTTTACCCATTTTAGAGTTTAATTTCTTCTCCCCTTTTTCAGTCTGAC GGCCTTAAATATAATTTTAAAATAGGGAATAAATGGTTGTCTTTAGTATTTTATTTGTT ΤΤΔΤΤΔΤΤΔΤΤΔΤΤΔΤΤΔΤΤΔΤΤΔΤΤ TGCAAGCTTCAGCTAATTTGGAATTGTAGCTCTCCTGACATTATTCTTATAAGCTCATTCCACTCTCTTATAGACCATCA TTACATGCCCTCTTTCCATCTTTTAAAATATGTCCTTTAAAAATCTGACCTGGGAGAAATCTCTGTGAAGCCGTGTTGGTTACT TAAGTGCCACCCCTCTTTTCTTCCTGAGAGGATCATTTGTGATTGCAGTTACAGTTGA

## Paired End Sequencing Reads



### Assembly: Contigs and Supercontigs

"Supercontig" or "Scaffold"



### Why Different Insert Sizes are Useful



Longer (fosmid) mate pairs connect assembly pieces that are not connected by shorter (plasmid) paired ends

### Key Concepts in Assembly

#### Contig N50

- 50% of the genome assembly is in contigs larger than this size

#### • Supercontig (scaffold) N50

- same, but for scaffolds

#### • k-mer

- string of bases of length k
- for computational efficiency, long sequences such as sanger reads are often chopped up into their constituent k-mers; usually *overlapping* k-mers are used because converting a sequence into nonoverlapping k-mers loses information

#### High-quality mismatch

- A position in two well-aligning reads in which the base calls are *high quality* but *disagree*
- Indicative of allelism or paralogy

The first three overlapping 22-mers and their positions in a Sanger read	
Read 0	tagcgactacctgaactggacctttgaacgag tagcgactacctgaactggacc
1	agcgactacctgaactggacct
2	gcgactacctgaactggacctt

A high-quality mismatch: High Phred scores (like Q99) on both mismatched bases Read 1 ..actacctgaactggacctttgaacg... Read 2 ..actacctgaactagacctttgaacg...

### **Assemblies are not Perfect**

- Sequence coverage may vary
  - missing regions; strong fragmentation
- Some regions don't clone well
  - results in low sequence coverage
  - which causes gaps in assembly
- Some regions don't sequence well
  - extreme GC content
  - homopolymeric or otherwise low-complexity runs
- Some regions don't assemble well
  - mobile elements
    - high identity, large copy number
  - segmental duplications
    - Repeats are the single biggest impediment to assembly
- Polymorphism
- Best way to improve assemblies is longer reads and better long range continuity

## High Throughput Sequencing

"The cost of DNA sequencing has plunged orders of magnitude in the last 25 years. Back in 1990, sequencing 1 million nucleotides cost the equivalent of 15 tons of gold (adjusted to 1990 price). At that time, this amount of material was equivalent to the output of all United States gold mines combined over two weeks. Fastforwarding to the present, sequencing 1 million nucleotides is equivalent to the value of ~30 g of aluminum. This is approximately the amount of material needed to wrap five breakfast sandwiches at a New York City food car."

Erlich Y. (2015). A vision for ubiquitous sequencing. Genome Res. 25(10):1411-6.

## The Players

- Commercially available now:
  - Illumina most prevalent technology
  - SOLiD (Life Technologies)
  - Ion Torrent (Life Technologies)
  - Pacific Biosciences
  - Complete Genomics aquired by BGI, possibly dead
  - 454, Helicos both commercially dead
- Next generation approaches
  - Oxford Nanopore
  - Illumina Nanopore (nothing released yet)
    - Recently licensed an alternative nanopore technology
  - NABsys, Genia, Noblegen might all be dead

## **Sequencing Template Approaches**

- Clonal Amplification of Single Molecules
  - Single molecule only briefly needed as a template
  - Thousands of identical molecules boost signal
  - Two different methods
    - Bridge amplification of molecules immobilized on surface
      - Illumina
    - Emulsion PCR
      - SOLiD and Ion Torrent, 454
- Single DNA molecule as a sequencing template.
  - Challenges include:
    - Keeping single molecules stable during insults of sequencing
    - Signal to noise ratio in base detection BUT
    - Avoid amplification biases
  - Pacific Biosciences, Oxford Nanopore, Helicos

## **Recommended Reading**

#### Early Sequencing Technology:

- Maxam, A.M., Gilbert, W. (1977). A new method for sequencing DNA. *Proc Natl Acad Sci USA* **74(2)**:560-4.
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#### New Sequencing Technologies:

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- Rothberg J.M., Hinz, W. et al (2011). An integrated semiconductor device enabling non-optical genome sequencing. *Nature* **475(7356)**:348-52. **IonTorrent**
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- Ashton, P.M., Nair, S., Dallman, T., Rubino, S., Rabsch, W., Mwaigwisya, S., Wain, J., O'Grady, J. (2015). MinION nanopore sequencing identifies the position and structure of a bacterial antibiotic resistance island. *Nat Biotechnol.* 33(3):296-300.
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## **Recommended Reading**

#### Landmark Genome Sequencing Papers:

- Fiers, W., Contreras, R., Duerinck, F., Haegeman, G., Iserentant, D., Merregaert, J., Min Jou, W., Molemans, F., Raeymaekers, A., Van den Berghe, A., Volckaert, G. and Ysebaert, M. (1976). Complete nucleotide sequence of bacteriophage MS2 RNA: primary and secondary structure of the replicase gene. *Nature* 260(5551):500-7. First viral RNA genome
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## **Recommended Reading**

#### **Recent Reviews:**

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- Feng, Y., Zhang, Y., Ying, C., Wang, D., Du, C. (2015). Nanopore-based fourth-generation DNA sequencing technology. *Genomics Proteomics Bioinformatics* **13(1)**:4-16.
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