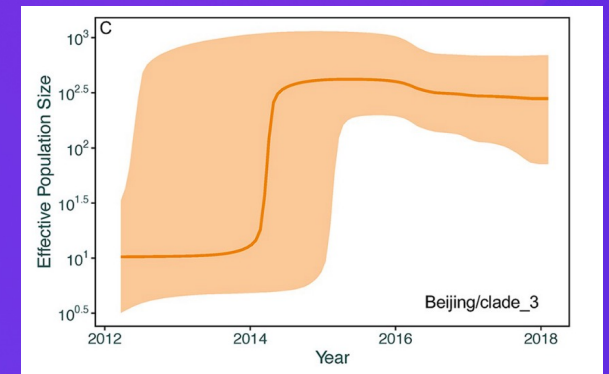
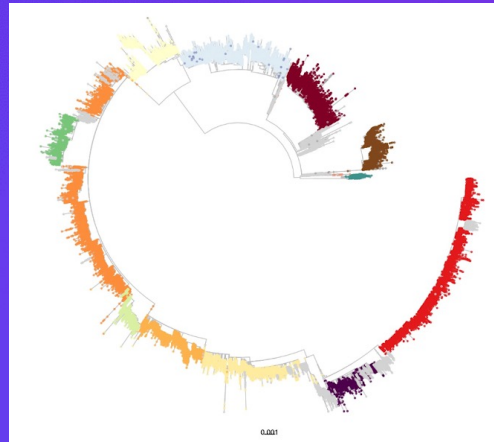


Genomic Analysis and Phylodynamics

Workshop: Simon Fraser University – 5th – 9th February 2024



Instructor: Dr. Ben Sobkowiak
Yale University / University College London

Purpose of the workshop

- Familiarize participants with genomic sequence data and 'demystify' genomic epidemiology
- Process whole genome sequence data - from raw sequences to phylogenetic, phylodynamic and molecular evolution analyses
- Introduce the benefits of employing genomic data to public health and basic science research
- Gain confidence using command-line interface and R language tools

Workshop schedule

Monday 5th February 10am – 11.30pm	Lecture 1: Introduction and key concepts	<ul style="list-style-type: none">• Course outline• Genomic sequencing and data analysis• Introduction to genomic epidemiology
Monday 5th February 12:15pm – 4:30pm	Practical session 1: Whole genome sequence data analysis	<ul style="list-style-type: none">• Obtaining sequencing data• Raw sequencing data manipulation – Quality control, cleaning, and visualization• Reference-based mapping
Tuesday 6th February 9.30am – 10:30am	Lecture 2: Variant detection and phylogenetic trees	<ul style="list-style-type: none">• What is a variant?• How do we call variants?• Variant calling software and quality control• What are phylogenetic trees?• Different types of phylogenies• Phylogenetic uncertainty – bootstrapping etc.
Tuesday 6th February 10:45am – 4:30pm	Practical session 2: Variant calling and maximum likelihood trees	<ul style="list-style-type: none">• Variant calling from sequence alignment file• SNP filtering and QC• Building SNP matrices• Aligning consensus sequences• Maximum likelihood tree construction

Workshop schedule

Wednesday 7th February 9.30am – 1pm	Practical session 3: Timed phylogenetic trees	<ul style="list-style-type: none">• Continue ML tree construction• One-step timed phylogenetic tree with BEAST2• Two-step timed phylogenies using ML + Bayesian frameworks
Thursday 8th February 9.30am – 10:30am	Lecture 3: Phylogeography and phylodynamics	<ul style="list-style-type: none">• What are phylogeography and phylodynamics?• Analysis tools and software• Applications to real-world datasets – what can we learn
Thursday 8th February 10:45am – 4:30pm	Practical session 4: Phylogeography and phylodynamic analysis	<ul style="list-style-type: none">• Phylodynamic analysis in BEAST2• Testing for sites under selection• Ancestral state reconstruction• Genome Wide Association Studies

Workshop schedule

Friday 9th
February
9.30am – 1pm

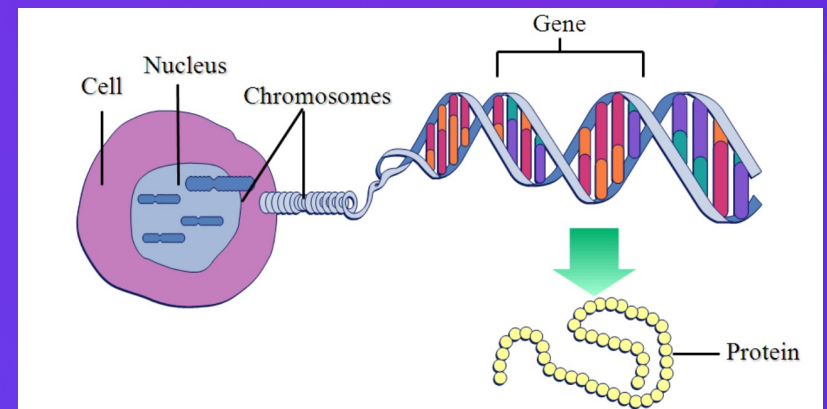
Practical session 5: Self-guided practical

- Applying the skills learned to a novel dataset
 - From raw sequence data to phylogenetic and phylodynamic analysis
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Lecture 1: Introduction to sequencing and genomic sequence analysis

Genetics vs Genomics

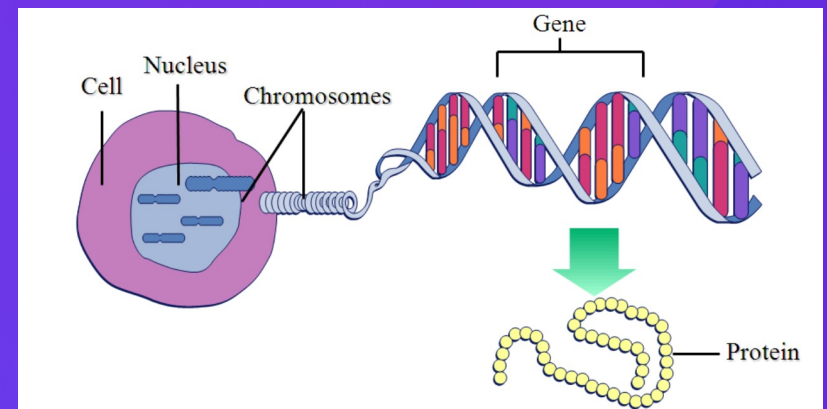
- Genetics is the study of single genes – inherited units of DNA or RNA
- Genes are coding - instructions to make proteins to inform cellular function
- Regions of non-coding DNA - can still be integral for activity within the cell – transcription, promoters, enhancers, DNA structure



Lecture 1: Introduction to sequencing and genomic sequence analysis

Genetics vs Genomics

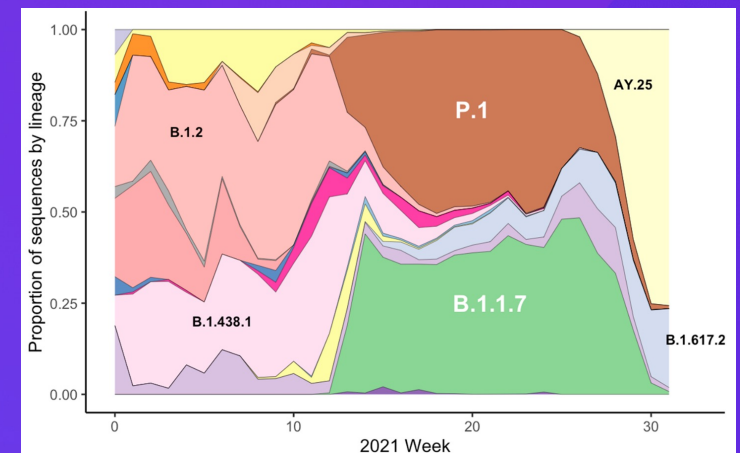
- Genomics takes all the genes of the organism, and intergenic regions, together – the whole genome.
- The majority of traits are not determined by single genes – multi-locus genes, epistatic interaction
- Can investigate the interaction between the multiple genes and the environment
- Also, more complex characteristics, population effects, novel variation and environmental changes



Lecture 1: Introduction to sequencing and genomic sequence analysis

The impact whole genome sequencing for investigating pathogens

- Genomic epidemiology - the use of genomic data to understand the patterns, causes, and effects of health and disease conditions in populations.
- It's particularly crucial in studying the transmission and evolution of infectious pathogens.
- Incorporating whole-genome sequencing, phylogenetic analysis, and comparative genomics, it enables the tracking of pathogen transmission, identification of outbreak sources, and understanding pathogen evolution and resistance.

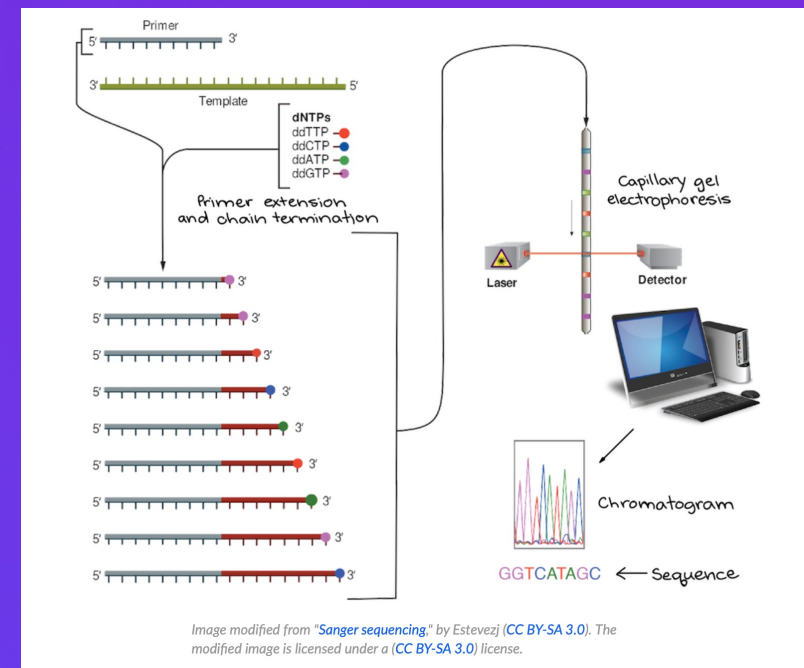


From Sobkowiak, Colijn et al. 2022

Lecture 1: Introduction to sequencing and genomic sequence analysis

Early approaches to sequencing

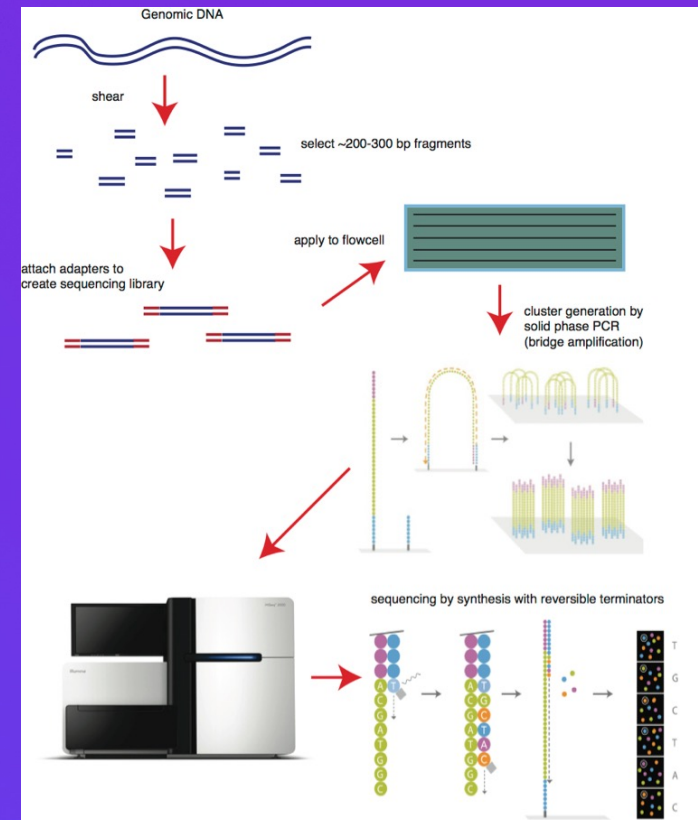
- Fred Sanger developed method in 1970s – “First-Generation” Sanger Sequencing
- Used in the Human Genome Project to sequence short stretches of DNA
 - Very time-consuming and expensive
- Although we now typically use other methods that are faster and cheaper, Sanger sequencing is still in wide use for the sequencing of individual pieces of DNA, or targeted sequencing



Lecture 1: Introduction to sequencing and genomic sequence analysis

Next generation sequencing (NGS)

- Massively parallel, high-throughput sequencing – can sequence whole genomes quickly and deeply
 - Pivotal in large-scale genomics projects and complex genetic analyses
- “Second-Generation” (short-read) sequencing involves the preparation of amplified libraries – random fragments of cloned DNA or reverse transcribed RNA – usually sequenced on Illumina platforms
- Results in (hopefully) 100,000s or millions of short (~100 – 250bp) stretches of sequenced genome called ‘reads’

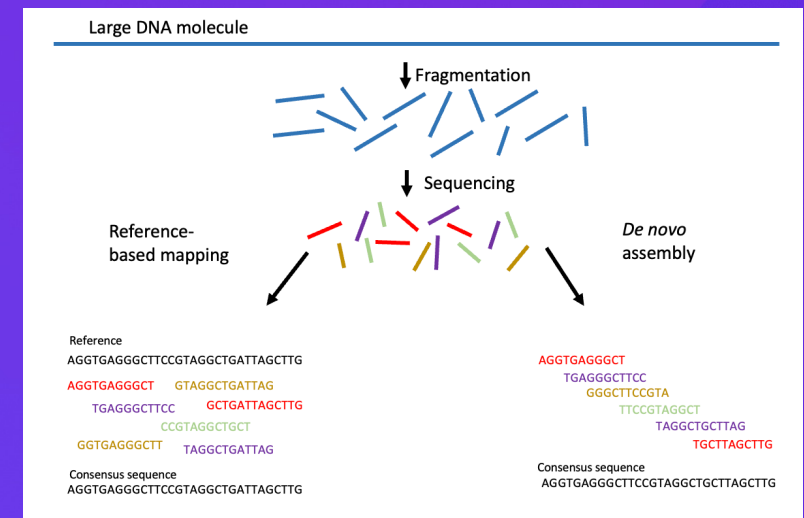


Lecture 1: Introduction to sequencing and genomic sequence analysis

Next generation sequencing (NGS)

- Computationally intensive task to re-assemble these short 'reads' into full genomes
- The format of the files that are produced by the sequencer are called FASTQ
- Different approaches are available to reconstruct the genome from these reads, the choice depends on the data and research question
- Reference-based mapping/alignment or *de novo* assembly?

```
1 @M01637:250:000000000-BP8GK:1:1101:17234
2 GTCTAGAGACCGGGGACTTATCAGCCAACCTGTTACTAGA
3 +
4 CCCCCFFFFDGGGGGGGGGGHHHHHHGGHHHHHHHHHH
```



Lecture 1: Introduction to sequencing and genomic sequence analysis

Reference-based mapping/alignment

- Most commonly-used method to reconstruct genomes from short-read sequence data
- The sequence in each read is aligned to a known reference genome
- There are different algorithms for reference-mapping
 - Trade-off between efficiency and sensitivity
 - Map sequence in reads to the reference whilst allowing for some error, mismatches etc.

Reference

AGGTGAGGGCTTCCGTAGGCTGATTAGCTTG

AGGTGAGGGCT GTAGGCTGATTAG

 TGAGGGCTTCC GCTGATTAGCTTG

 CCGTAGGCTGCT

 GGTGAGGGCTT TAGGCTGATTAG

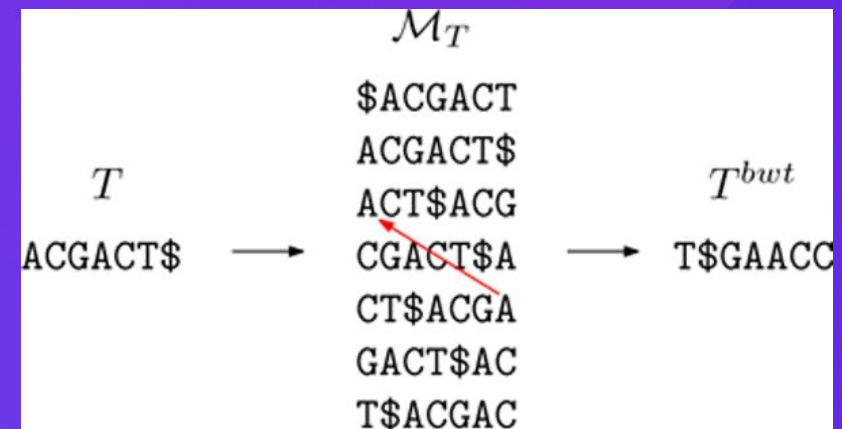
Consensus sequence

AGGTGAGGGCTTCCGTAGGCTGATTAGCTTG

Lecture 1: Introduction to sequencing and genomic sequence analysis

Reference-based mapping/alignment

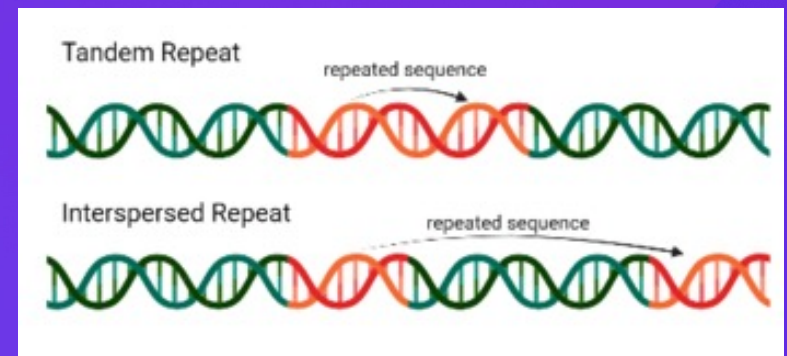
- Burrows-Wheeler Transform is a method widely used by software to map reads to a reference (e.g., BWA and Bowtie)
- It reorders the characters in a string (sequence) into runs of similar characters, allowing for compression of the data and efficient searching of matching sequences
- More information at: *Short Read Mapping: An Algorithmic Tour* – Canzar & Salzburg 2015



Lecture 1: Introduction to sequencing and genomic sequence analysis

Reference-based mapping/alignment

- Requires a well-characterized reference strain to be effective
- May not provide sufficient information to resolve ambiguous or repetitive regions of the genome
- Also, may miss novel genetic variants or full genes if not present in the reference sequence

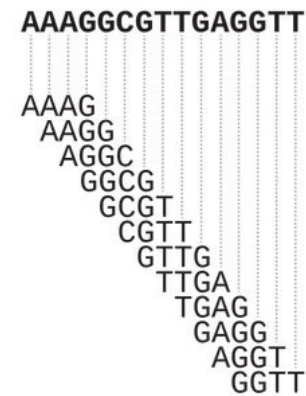


Lecture 1: Introduction to sequencing and genomic sequence analysis

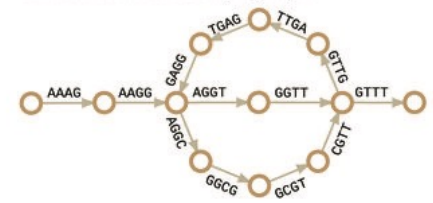
De novo assembly

- Most tools employ De Bruijn graph approach to *de novo* assemble genomes without a reference (e.g., SPAdes, Velvet)
- Transform short-read sequences into a graph structure where each node represents a k-mer). The edges connect overlapping k-mers, facilitating the reconstruction of the original sequence
- Can still be complex to resolve due to repetitive sequences and sequencing errors

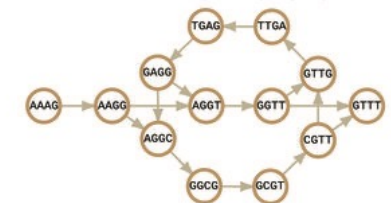
A. Short read to k-mers ($k=4$)



B. Eulerian de Bruijn graph



C. Hamiltonian de Bruijn graph

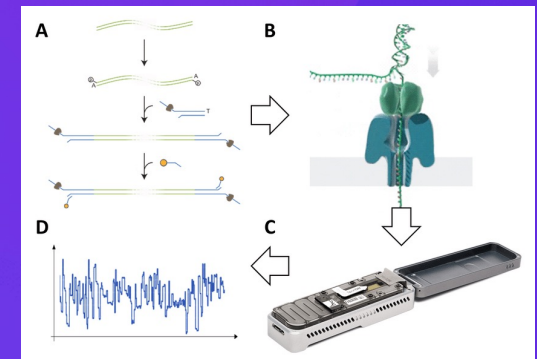
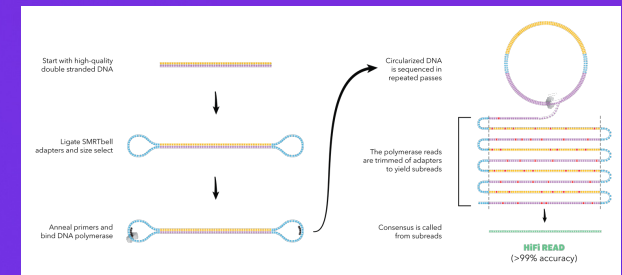


From Sohn & Nam, 2016

Lecture 1: Introduction to sequencing and genomic sequence analysis

Third generation sequencing

- **Single molecule long-read sequencing** e.g. PacBio, Oxford Nanopore MinION/GridION/PromethION
 - Reads can be MBs or even GBs in length
- Even greater resolution (Identify rare variants and full complete the genome)
- Requires more genetic material as input and error rates typically higher than Illumina – though improving
- Potential for real-time outbreak analysis, drug susceptibility testing etc.



Practical 1: Whole genome sequence data analysis and reference-based mapping

1. Obtaining sequencing data
 2. Viewing raw sequence data (FASTQ) files
 3. Quality control (QC) of FASTQ files
 4. Cleaning and filtering FASTQ files
 5. Mapping/aligning sequence data to a reference genome
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