## Sequencing and assembly

## Sanger sequencing

- Invented by Frederick Sanger in 1970
- Starts with a primer templatea short sequence complementary to the sequence of interest
- Specific
- Read length up to 800
- Accurate
- Still used today to sequence clones or verify NGS results

(b) Primer elongation, chain termination upon incorporation of ddNTP, separation, detection

5, ПTITITTTT $3^{\prime}$ oligonucleotide primer (hybridizes to template)
$3^{\prime}$ ( $5^{\prime}$ DNA template

$5^{\prime}$ คTTITITTM ${ }^{3}$
$5^{\prime}$ HTTITTITT ${ }^{\circ} 3^{\prime}$ Chain termination via incorporation of ddGTP
$5^{\prime}$,




5' ПTTITITTIT Pareape $3^{\prime}$ Chain termination via incorporation of ddTTP
$5^{\prime}$ /TTITITTTT




Capillary gel electrophoresis to separate DNA fragments by size $\dagger$
Laser detection of labeled ddNTPs
Det
Determination of DNA sequence inferred by pattern of chain termination

## Next Generation Sequencing (NGS)

- A series of different technologies enabling fast automated sequencing
- Most technologies have short read length
- Cost is dramatically reduced
- Each technology has its own error profile


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MIT
Technology
Review
```



## Illumina

- DNA is randomly fragmented followed by size selection
- Adapters are ligated at each end so that the fragment can bind to the flow cell surface
- Each single fragment is amplified in place with "bridge amplification"
- There are 4 reversible terminators which are added at the same time
- Locations of the added bases is read out by laser scanning
- Most widely used platform



## ABI Solid

- Library prep is the same
- Amplification is emulsion based
- DNA sequenced by ligation
- Very low error rate
- Complex error model



## Ion Torrent

- Direct detection of nucleotide incorporation
- Basically a very good pH meter
- Very fast
- Used for clinical sequencing
- High error rate
- Non-trivial error model
- Sequential nucleotide addition --problems counting consecutive identical nucleotides



## Pacific Biosciences

- Immobilized polymerase
- Allows for fluorescent pulse detection
- Very long read length
- Can span repetitive elements

- Can be used in hybrid sequencing, combining short and long reads


## Comparison

| Platform | Read length | Reads per <br> run | Run time | Cost per <br> megabsse | Accuracy | Error type |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Sanger | $400-900$ |  | <3hours | 2400 | 99.9 | Single nucleotide <br> substitutions |
| Illumina | $50-250$ | 3 billion | $1-10$ days | $\sim 0.10$ | 98 | Single nucleotide <br> substitutions |
| SOLiD | 50 | $\sim 1.4$ billion | $7-14$ days | 0.13 | 99.9 | AT bias |
| Ion torrent | 200 | $<5$ million | 2 hours | 2 | 99 | deletions |
| PacBio | 2900 | 75,000 | $<2$ hours | 2 | 99 | GC deletions |

## What do we sequence

- Human genome-want to look for variation
- Cancer genome often looks very different from reference
- Human exome- looking for variation in coding genes
- A new organism's genome
- A new organisms transcriptome
- Much smaller than genome
- Produces sequence of mRNA only
- Sequence from functional assays
- Transcript quantification-RNAseq
- Chromatin (histones, transcription factors, etc.) capture


## Output:Fastq

- Sequence followed by quality line
- Most platforms can sequence fragments at both ends - two matches fastq files
- Paired sequence information is crucial in assembly task
- Mate pairs—should be in the correct orientation and approximately the right distance apart

Sequence

## @FORJUSP02AJWD1

CCGTCAATTCATTTAAGTTTTAACCTTGCGGCCGTACTCCCCAGGCGGT $+$
AAAAAAAAAAAA: :99@: : : : ??@@: :FFAAAAACCAA: : : : BB@@?A?

```
Q scores (as ASCII chars)
```

```
Base=T, Q=':'=25
```

Adapter Left DNA Insert Adapter Right


Using a reference genome: Alignment of reads to a reference


## Structural variation

| SV class | Assembly | Read pair | Read depth | Split read |
| :---: | :---: | :---: | :---: | :---: |
| Deletion |  | $\because$ |  |  |
| Novel sequence insertion |  |  | Not applicable |  |
| Mobileelement insertion |  | $\begin{array}{\|c\|c\|} \hline \text { Annotated transposon } \\ \rightarrow-\alpha-\alpha-1 \end{array}$ | Not applicable |  |
| Inversion |  |  | Not applicable |  |
| Interspersed duplication |  |  | $\equiv y^{3}=$ |  |
| Tandem duplication |  |  | $\overline{y=3}$ |  |

## Sequencing a new genome

- We want a complete assembly with all nucleotides of each chromosome in the right order
- Human genome projectreads spanning 800bp are put together into 3biliion pairs
- Some definitions
- Contig: a continuous piece of DNA sequence where base pair identity is known with high confidence
- Scaffold: a series of contigs assembled in the correct order but possibly with gaps


## Assembly strategies

- Overlap layout consensus
- Greedy
- Merge largest overlap
- Proceed until no overlaps remain
- Uses local information only
- Graph based
- Create a graph representing sequence overlaps
- Reduce/prune
- Find consensus contigs
- Can use global information such as mate-pair distance
- Graph representation
- Overlap
- DeBruijn graph


## Two graph representations



Vertices are $k$-mers
Edges are pairwise alignments.


Genome: ATGGCGTGCAATG

Hamiltonian cycle Visit each vertex once (harder to solve)

Vertices are ( $k-1$ )-mers
$\ddots$ Edges are $k$-mers
$\ddots^{\prime} \ddots_{1}$


Eulerian cycle
Visit each edge once
(easier to solve)

## Sequencing errors

- Reads contain errors
- We allow for imperfect overlap in overlap graphs
- In DeBruijn graphs errors
 are bulges specifying alternative paths
- Bulges are pruned based on read number, error model, and other heuristics
- Overlap graph
- Works well with large reads: sanger sequenced genomes
- Human genome project
- Computationally expensive
- Doesn't handle repeats well
- DeBruijn graph
- Preferred for shorter reads
- Path finding is more efficient
- Compactly handles repeats
(a) DNA sequence with a triple repeat

(b) layout graph


[^0]

## DeBruijn graph with repeats



## Repeats in Human Genome

- Repetitive DNA makes up a very large part of big eukaryotic genomes.
- Characterized by size and abundance.
- Many of these elements are remnants of virus-like sequences that once hopped around our genome.
- All but the SINEs contain functional sequence encoding genes such as transposase that are responsible for this hopping behavior. Most are inactive.
- The most abundant SINES family are the Alu repeats, with over 1 million copies comprising $10 \%$ of the genome.
- Also, families of recently duplicated genes

| Element | Lengt <br> $\mathrm{h}(\mathrm{kb})$ | Human <br> number | Genome <br> Fraction |
| :---: | :---: | :---: | :---: |
| Retroviruses/ <br> Retroposons | $1-11$ | 450,000 | $8 \%$ |
| LINES (long <br> interspersed <br> elements) | $6-8$ | 850,000 | $17 \%$ |
| SINES (short <br> interspersed <br> elements) | $\sim 0.3$ | $1,500,000$ | $15 \%$ |
| Transposons | $2-3$ | 300,000 | $3 \%$ |



## Mis-assembled repeats



## Human Genome assembly is not complete

- chr1_random chr2_random chr3_random chr4_random chr5_random chr6_random chr7_random chr8_random chr9_random chr10_random chr11_random chr13_random chr15_random chr16_random chr17_random chr18_random chr19_random chr21_random chr22_random chrX_random


## Handling repeats

## Repeat detection

- pre-assembly: find fragments that belong to repeats
- statistically (most existing assemblers)
- repeat database (RepeatMasker)
- during assembly: detect graph structures indicative of repeats and resolve them

- Use mate-pair information
- post-assembly: find repetitive regions and potential mis-assemblies.
- RepeatMasker
- "unhappy" mate-pairs (too close, too far, misoriented)



## Statistical repeat detection

- Significant deviations from average coverage flagged as repeats.
- frequent k-mers are ignored
- "arrival" rate of reads in contigs compared with theoretical value
(e.g., 800 bp reads \& 8x coverage - reads "arrive" every 100 bp)

Problem 1: assumption of uniform distribution of fragments - leads to false positives
non-random libraries
Problem 2: repeats with low copy number are missed - leads to false negatives

## Most widely used genome sequence is filtered for repeats

- hg38.fa.gz - "Soft-masked" assembly sequence in one file. Repeats from RepeatMasker and Tandem Repeats Finder (with period of 12 or less) are shown in lower case; non-repeating sequence is shown in upper case.
- hg38.fa.masked.gz - "Hard-masked" assembly sequence in one file. Repeats are masked by capital Ns; non-repeating sequence is shown in upper case.
- RepeatMasker screens DNA sequences for interspersed repeats and low complexity DNA sequences.
- Tandem Repeat Finder looks for short tandem repeats - ATGATGATGATG


## Aligning to a reference - not necessarily so simple

- RNAseq quantification by sequencing
- Genes producing more transcripts will have more reads
- We need to map each read to the right gene


- Problems
- Genes overlap-often in the UTR

Gene function analysis



- Homologous genes
- Sequencing errors in high abundance genes can map to a completely different location


## One solution—RSEM

- Assign ambiguous reads in proportion with unambiguous reads



## RNAseq-identifying complete transcripts

- Reads contained in an exon don't tell us how the exons are connected
- Junction spanning reads tell us local connectivity
- Such reads do not align continuously in the genome and present an alignment challenge



## Assembling transcripts

- splice graph, nodes represent exons or parts of exons, and paths through the graph represent possible splice variants supported by junction reads
- StringTie
- Find maximum flow through "heaviest" path
- Assemble transcript
- Compute expression
- Remove reads that contributed to the total expression
- Repeat


Compute minimum path cover to generate transcripts


Maximum likelihood abundance estimation



[^0]:    (c) Construction of de Bruijn graph by gluing repeats
    (d) de Bruijn graph

