## BIO 337

## Tuesday, Feb 182014

## Fred Sanger

13 August 1918 - 19 November 2013


Nobel Prize in Chemistry, 1958 for protein sequencing (insulin)
Nobel Prize in Chemistry, 1980 for DNA sequencing

## Dideoxy sequencing

## Automated dye-terminator sequencing

4-fluorescently labelled dideoxy dye terminators ddATP ddGTP
ddCTP pool and load in a single well or capillary
ddTTP - scan with laser + detector specific for each dye

- automated base calling
- very long reads (~ 1000 bases)/run




February 2001

## nature



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October 2010

## Functional genomics by sequencing

Used sequencing chemistry invented by Fred Sanger in 1977

In the last 3-5 years, radically new sequencing approaches have been invented and employed for functional genomics, termed

- Next-generation sequencing (NGS, $2^{\text {nd }}, 3^{\text {rd }}$ generation)
- Ultra high-throughput sequencing
- Single-molecule sequencing
- Deep sequencing


## Table 1 Next gen sequencing developers

| Company | Technology overview | On market? |
| :---: | :---: | :---: |
| Complete Genomics | Optical analysis of arrays of 'DNA nanoballs' | Yes |
| Genapsys Redwood City, California | Electronic detection of thermal/pH changes accompanying nucleotide addition | No |
| Genia Technologies | Pairing biological nanopores with semiconductor detection | No |
| GnuBio | Microfluidic system analyzes DNA nanodroplets with fluorescent primers | Alpha testing |
| Illumina | Sequencing by synthesis with fluorescently labeled reversible terminators | Yes |
| Lasergen Houston | Sequencing by synthesis with fluorescently labeled reversible terminators | No |
| Life Technologies (Ion Torrent) | Semiconductor sensor arrays detect protons released by nucleotide addition | Yes |
| NabSys <br> Providence, Rhode Island | Single-molecule analysis revealing genomic location of sequencing probes | No |
| Noblegen Biosciences | Optical detection of 'expanded' DNA templates passing through synthetic pores | No |
| Oxford Nanopore Technologies | Detects changes in current as DNA strands pass through protein nanopores | No |
| Pacific Biosciences | Uses 'zero-mode waveguides' to optically detect real-time nucleotide addition | Yes |
| Qiagen (Intelligent BioSystems) | Sequencing by synthesis with fluorescently labeled reversible terminators | No |
| Roche (454) | Pyrosequencing of template-laden beads prepared by emulsion PCR | Yes |
| Stratos Genomics Seattle | Optical sequencing of fluorescently labeled, synthetically expanded templates | No |

## Table 2 Next-generation DNA sequencing instruments

|  | Cost per base ${ }^{\text {a }}$ | Read length (bp) | Speed | Capital cost $^{\text {c }}$ |
| :--- | :--- | :--- | :--- | :--- |
| Minimum cost per base |  |  |  |  |
| Complete Genomics | Low | Short | 3 months | None (service) |
| HiSeq 2000 (Illumina) | Low | Mid | 8 days | +++++++ |
| SOLiD 5500xI (Life Technologies) | Low | Short | 8 days | +++ |
| Maximum read length |  |  |  |  |
| 454 GS FLX+ (Roche) | High | Long | 1 day | +++++ |
| RS (Pacific Biosciences) | High | Very long | $<1$ day | +++++++ |
| Maximum speed, minimum capital cost and minimum footprint |  |  |  |  |
| 454 GS Junior (Roche) | High | Mid | $<1$ day | + |
| lon Torrent PGM (Life Technologies) | Mid | Mid | $<1$ day | + |
| MiSeq (Illumina) | Mid | Long | 1 day | + |
| Combined prioritization of speed and throughput |  | $<1$ day | ++ |  |
| lon Torrent Proton (Life Technologies) | Low | Mid | 2 days | ++++++++ |
| HiSeq 2500 (Illumina) | Low | Mid | ++ |  |

${ }^{\text {a }}$ 'Low' is $<\$ 0.10$ per megabase, 'mid' is in-between and 'high' is > \$ 1 per megabase. ${ }^{\text {b }}$ 'Short' is $<200 \mathrm{bp}$, 'mid' is 200-400 bp, 'long' is > 400 bp and 'very long' is $>1,000 \mathrm{bp}$. 'Each " + " corresponds to $\sim \$ 100,000$. We list only commercialized instruments that can be purchased and for which performance data are publically available (as opposed to a comprehensive list of companies developing next-generation sequencing technologies). The categorizations refer to the aspect of sequencing performance to which the technology and/or its implementation in a specific instrument are primarily geared. These estimates were made at the time of publication, and the pace at which the field is moving makes it likely that they will be quickly outdated.

## Next Generation Sequencing: Illumina <br> a Illumina's library-preparation work flow


 Incorporate Detect Deblock Cleave fluor
 erminator


## Next Generation Sequencing: Illumina <br> a



Prepare genomic DNA sample
Randomly fragment genomic DNA and ligate adapters to both ends of the fragments.



## Attach DNA to surface

Bind single-stranded fragments randomly to the inside surface of the flow cell channels.

## Next Generation Sequencing: Illumina



First chemistry cycle: determine first base

To initiate the first sequencing cycle, add all four labeled reversible terminators, primers, and DNA polymerase enzyme to the flow cell.


Before initiating the

Image of first chemistry cycle
After laser excitation, capture the image of emitted fluorescence from each cluster on the flow cell. Record the identity of the first base for each cluster.
next chemistry cycle The blocked 3' terminus and the fluorophore from each incorporated base are removed.


Sequence read over multiple chemistry cycles
Repeat cycles of sequencing to determine the sequence of bases in a given fragment a single base at a time.

## Paired-end and mate paired libraries



## b <br> b IDUIIDUIID




Ligate adapters

Generate clusters


Sequence first end


Regerate Regerate
clusters and sequence paired end

## Emulsion PCR for clonal amplification

Used in next-gen sequencing by Roche/454 and Life/Applied Biosystems platforms


Anneal sstDNA to an excess of DNA capture beads


Emulsify beads and PCR reagents in water-in-oil microreactors


Clonal amplification occurs inside microreactors


Break microreactors and enrich for DNA-positive beads

## Pyrosequencing

1-2 million template beads loaded into PTP wells



TCAGGTTTTTTAACAATCAACTTTTTGGATTAAAATGTAGATAACTG CATAAATTAATAACATCACATTAGTCTGATCAGTGAATTTAT


## Ion Torrent pH based sequencing


b


## Single-molecule sequencing: Pacific Biosystems



Nature Rev. Genet. (2010) 11:31-46

## Single-molecule sequencing: Pacific Biosystems



## Nanopore sequencing



Nanopores can be

- biological: formed by a pore-forming protein in a membrane such as a lipid bilayer
- solid-state: formed in synthetic materials such as silicon nitride or graphene
- hybrid: formed by a pore-forming protein set in synthetic material


## Features of next-gen sequencing

- Short reads (35 bp - 400 bp)
- Millions of reads per run $\left(10^{7}-5 \times 10^{8}\right)$
- Higher error rate per basepair raw
- No cloning in E. coli
- Huge amounts of data per experiment (20 GB primary/2 TB raw)
- Large data storage and computational analysis requirements


- Genome sequencing and variant discovery
- de novo assembly of bacterial and other small genomes
- DNA-protein interactions
- Chromatin and epigenetics


## ChIP-seq

Methyl-seq

- RNA expression levels (profiling)

RNA-seq

- ncRNA/small RNA discovery and profiling
- Metagenomics
- Sequencing extinct species (museomics)

Table 1 Applications of next-generation DNA sequencing


## Gene expression profiling with RNA-seq



Nature Methods Supplement (2009) 6: S22

## Metagenomics



A

B


E

PLoS Comput. Biol. (2010) 6(2): e1000667







## Finding copy number variants with NGS



## Deletions and amplifications with paired end sequencing



## Whole-genome sequencing to identify disease gene



## Genotyping to confirm disease allele

## A SH3TC2 Genotype and Phenotype




## Chromatin immunoprecipitation (ChIP)-seq




$X^{*}=$ Windows-only GUI or cross-platform command line interface
$\mathrm{X}^{\star *}=$ optional if sufficient data is available to split control data
$X^{\prime}=$ method exludes putative duplicated regions, no treatment of deletions


A

## Sequence of the human genome <br> One dimension

## ATCGATCCGTCCGAGACCTAGTC GATCGATCGCCAAATCGATCGGA TCGACTGTCTTAGCGCTAGCCGA GATCTGCTAGGTCGTGTGACAAA



1 Crosslinkinteracting
protein-DNA $\begin{gathered}2 \text { Sonicate } \\ \text { chromatin }\end{gathered} \quad 3$ immuno- $\begin{gathered}\text { precipitation }\end{gathered} 4$ Attach


B Genomic rearrangements by paired-end sequencing Two dimensions


D Longitudinal sequencing



Table I The various NGS assays employed in the ENCODE project to annotate the human genome

| Feature | Method | Description | Reference |
| :---: | :---: | :---: | :---: |
| Transcripts, small RNA and transcribed regions | RNA-seq | Isolate RNA followed by HT sequencing | (Waern et al, 2011) |
|  | CAGE | HT sequencing of 5'-methylated RNA | (Kodzius et al, 2006) |
|  | RNA-PET | CAGE combined with HT sequencing of poly-A tail | (Fullwood et al, 2009c) |
|  | ChIRP-Seq | Antibody-based pull down of DNA bound to lncRNAs followed by HT sequencing | (Chu et al, 2011) |
|  | GRO-Seq | HT sequencing of bromouridinated RNA to identify transcriptionally engaged PolII and determine direction of transcription | (Core et al, 2008) |
|  | NET-seq | Deep sequencing of $3^{\prime}$ ends of nascent transcripts associated with RNA polymerase, to monitor transcription at nucleotide resolution | (Churchman and <br> Weissman, 2011) |
|  | Ribo-Seq | Quantification of ribosome-bound regions revealed uORFs and non-ATG codons | (Ingolia et al, 2009) |
| Transcriptional machinery and protein-DNA interactions | ChIP-seq | Antibody-based pull down of DNA bound to protein followed by HT sequencing | (Robertson et al, 2007) |
|  | DNAse footprinting | HT sequencing of regions protected from DNAse1 by presence of proteins on the DNA | (Hesselberth et al, 2009) |
|  | DNAse-seq | HT sequencing of hypersensitive non-methylated regions cut by DNAse 1 | (Crawford et al, 2006) |
|  | FAIRE | Open regions of chromatin that is sensitive to formaldehyde is isolated and sequenced | (Giresi et al, 2007) |
|  | Histone modification | ChIP-seq to identify various methylation marks | (Wang et al, 2009a) |
| DNA methylation | RRBS | Bisulfite treatment creates C to U modification that is a marker for methylation | (Smith et al, 2009) |
| Chromosomeinteracting sites | 5C | HT sequencing of ligated chromosomal regions | (Dostie et al, 2006) |
|  | ChIA-PET | Chromatin-IP of formaldehyde cross-linked chromosomal regions, followed by HT sequencing | (Fullwood et al, 2009a) |


www.illumina.com

The HiSeq $X^{\text {тм }}$ Ten, composed of $10 \mathrm{HiSeq} X$ Systems, is the first sequencing platform that breaks the $\$ 1000$ barrier for a $30 x$ human genome.

## Raw NGS data (FASTQ file)

## 4 lines per sequence

```
@HWI-ST1097:104:D13TNACXX:4:1101:18100:2240 1:Y:0:CAACTA
TGAGGCAAACCCAACTTATATGGGTCAATATAATGGTAAAGAAGGTTTAAA\longleftarrow Sequence
+ \leftarrowOptional Read ID
=7=<+2<AACAA<A+<A97AB7<7+2?ABBA@@B4A1?7A<*::;00=AAA \longleftarrow Base quality
@HWI-ST1097:104:D13TNACXX:4:1101:18326:2181 1:N:0:CAACTA SCores
CATACATCAAATTTTTACAAAACTCGAATCTCGGTGGTATTATTCCGACAG
+
CCCFFFFFHHHHGJJJIIIGJGHJIHGIGHGDEIGIHFFHIIIIGG>?DH6
```

@HWI-ST1097:104:D13TNACXX:4:1101:18259:2224 1:N:0:CAACTA
CAGGTGGAGGGACCGGGTAGTGCCGGATCAAGTAGTGTAGTATTTATTGTA
$+$
@C@DBDFDHHGHHI<DHGH1CFGHIIBHBIIIEHIIGFDGAGE>GGHGC@E
@HWI-ST1097:104:D13TNACXX:4:1101:18256:2243 1:N:0:CAACTA
GATAGGTTTGTATGATCTAATTGGTGGCAACTGGGTCCCTCCCATCCTAGC
$+$
@@@FFFDDDFDFHGIJGIJJIICGHIJJAHGGGHGBFGGIHIFGGEAADHG
@HWI-ST1097:104:D13TNACXX:4:1101:18728:2073 1:N:0:CAACTA
TTTСТTTCGAAGGAACCССТСТTTСТСАТGСТTTGTGСТАСТСТGAGGCAA
$+$
@@@DDDDDHHD1<AEHGGGG<FHGIEHEH9CDDA*? ? $<$ DDHHAG<?1?1?
Filesize: few hundred Mb to 1 or $2 \mathrm{~Gb}, \sim 100$ million lines
for one experiment!

## Encoding quality scores

| Quality character | ! "\#\$\% ' ( ) *+,-./0123456789: ; <=> ? @ABCDEFGHI |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | \| |  |  |  |  |
| ASCII Value | 33 | 43 | 53 | 63 | 73 |
| ```Base Quality (Q) (ASCII-33)``` | 0 | 10 | 20 | 30 | 40 |

## Probability of error $=10^{-Q / 10}$

This is a Phred score, a standard measure of sequencing quality

| Phred Quality Score | Probability of incorrect base call | Base call accuracy |
| :---: | :---: | :---: |
| 10 | 1 in 10 | $90 \%$ |
| 20 | 1 in 100 | $99 \%$ |
| 30 | 1 in 1000 | $99.9 \%$ |
| 40 | 1 in 10000 | $99.99 \%$ |
| 50 | 1 in 100000 | $99.999 \%$ |

## NGS aligners



## NGS aligners

| Mapper | O.S. | Seq. Plat. | Input | Output | Min. RL | $\begin{aligned} & \text { Max. } \\ & \text { RL } \\ & \hline \end{aligned}$ | Mismatches | Indels | Gaps | Splicing |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| BFAST | Linux,Mac | I, So, 4, Hel | (C)FAST(A/Q) | SAM TSV |  | * | Y | Y | Y | N |
| Blat | Linux,Mac | N | FASTA | TSV BLAST | 11 | 5000K | Score | Score | Y | De novo |
| Bowtie | Linux,Mac,Win dows | I,So,4,Sa,P | (C)FAST(A/Q) | SAM TSV | 4 | 1K | Score | Score | N | N |
| Bowtie2 | Linux,Mac,Win dows | 1,4,Ion | FASTA/Q | SAM TSV |  | 5000K | Score | Score | Y | N |
| BS-Seeker2 | Linux, Unix, Mac | I | $\begin{aligned} & \text { FASTA/Q, } \\ & \text { qseq } \end{aligned}$ | SAM BAM | 10 | 200 | Score | Score | Y | N |
| BWA | Linux,Mac,Win dows | I,So,4,Sa, P | FASTA/Q | SAM | 4 | 200 | Y |  | Y | N |
| CloudBurst | Linux,Mac,Win dows | N | FASTA | TSV |  | 1K | Y | Y | Y | N |
| ELAND | Linux, Unix, Mac | 1 | FASTA |  | 15 | 150 |  | Score | N | N |
| GMAP | Linux,Unix,Ma <br> c,Windows | I, | FASTA/Q | SAM GFF Native | 8 | * | Y | Y | Y | De novo |
| MapReads | Linux,Mac,Win dows | So | FASTA/Q | TSV | 10 | 120 | Score |  | N | N |
| MAQ | Linux,Mac | I, So | (C)FAST(A/Q) | TSV | 8 | 63 | Y | Y | N | N |
| MOSAIK | Linux,Unix,Ma <br> c,Windows | $\begin{aligned} & \text { I,So, } \\ & \text { 4,Sa,Hel,Ion,P } \end{aligned}$ | (C)FAST(A/Q) | BAM | 15 | 1000 | Y | Y | Y | N |
| mrFAST | Linux,Unix | 1 | FASTA/Q | SAM DIVET | 25 | 1000 | Score |  | N | N |
| Novoalign( CS) | Linux | I,So,4,Hel,Ion | (C)FAST(A/Q) Illumina | SAM Native | 1 | 250 | Y | Y | Y | Lib |
| RMAP | Linux,Mac | 1,So,4 | (C)FAST(A/Q) | BED | 11 | 10K | Y |  | N | N |
| SHRiMP2 | $\begin{aligned} & \text { Linux, Unix, } \\ & \text { Mac } \\ & \hline \end{aligned}$ | I, So, 4 | FASTA/Q | SAM | 30 | 1K | Y | Score | N | N |
| SOAP2 | Linux | 1 | FASTA/Q | SAM TSV | 27 | 1K |  |  | Y | N |
| SOAPSplice | Linux,Mac | 1,4 | FASTA/Q | TSV | 13 | 3 K |  | 5 | Y | De novo |
| SSAHA2 | Linux,Mac | 1,4,Sa | FASTA/Q | SAM |  | 48K | Score | Score | N | N |
| TopHat 2 | Linux,Mac | 1 | FASTA/Q | BAM |  |  |  |  | N | De novo |
| VMATCH | Linux,Mac | N | FASTA | TSV |  |  | Score | Score | Y | N |

## FASTQC

Quality scores across all bases (Sanger / Illumina 1.9 encoding)


## Aligning to a reference genome



## Variant calling with GATK

## NGS DATA PROCESSING



VARIANT DISCOVERY AND GENOTYPING


## INTEGRATIVE ANALYSIS



# Variant calling 

|  |  | 1 kb |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Chr 1 | 159,066,500 | 159,067,000 | 159,067,500 | 159,068,000 | 159,068,500 |

## A/G



## RNA-seq alignments



Processed mRNA



## What lies ahead...?

- End-to-end genome sequencing
- Sequencing entire pedigrees
- Sequencing within intact cells
- Single-cell genomes, transcriptomes, epigenomes
- Protein-protein interactions by sequencing
- Cell fate mapping
- Single molecule protein sequencing

