

LONG READS

"Chasing perfection"

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LONG-READS VERSUS SHORT-READS

Assembly of DNA fragments with repeated sequences



Several contigs \rightarrow incomplete assembly, underestimation of repeats

Long reads assembly

LONG-READS VERSUS SHORT-READS



Detection of splicing isoforms



The 3rd generation winning technologies



 $\frac{\text{Sequel - Pacific Biosciences}}{\text{Single molecules}}$ Up to 150 kbp long
Error rate \approx 10-15 % - CCS: <1%



 $\frac{\text{MinION} - \text{Oxford Nanopore}}{\text{Single molecules}}$ $\frac{\text{Up to 1 Mbp long}}{\text{Error rate} \approx 10-15 \%}$ Compensated by coverage

PacBio : Single Molecule Real Time (SMRT) sequencing

PacBio DNA-seq library







ZMW : optical waveguide that guides light energy into a volume that is small compared to the wavelength of the light

As each ZMW is illuminated from below, the wavelength of the light is too large to allow it to pass through the waveguide

A DNA template-polymerase complex is immobilized at the bottom of the ZMW





Phospholinked nucleotides are introduced into the ZMW chamber



As a base is held in the detection volume, a light pulse is produced

Contra Contra

Telle II all

G





Eid, J., et al. Science (2009)



- Length of PacBio reads



Improvement with new chemistry : Circular Consensus Sequence (CCS)

Circular consensus sequencing (CCS) reads are obtained when the SMRT bell template is replicated several times by the polymerase

A STREET ALLAST

Circular Consensus Sequences (CCS): HIFI READS



— GENOME ASSEMBLY WITH CCS





— GENOME ASSEMBLY WITH CCS

Circular consensus assembly of a human genome Wenger et al. *Nat. Biotechnol.* (2019)



— 1. GENOME ASSEMBLY WITH CCS

Circular consensus assembly of a human genome

Wenger et al. Nat. Biotechnol. (2019)

CCS reads alone : high quality contiguous genome : concordance of 99.997%

Assembler	Total size (Gb)	Contigs	N50 (Mb)	Ensembl genes (%)
Canu	3.42	18,006	22.78	93.2
FALCON	2.91	2,541	28.95	97.6
wtdbg2	2.79	1,554	15.43	96.1

Canu assembly

 genome size > expected haploid genome because it resolves some heterozygous alleles into separate contigs

Majority of CCS read discordances

- 3.4% mismatches
- 4.6% indels in non homopolymers.
- 92.0% indels in homopolymers
- → 1 mismatch every 13,048 bp
- → 1 non-homopolymer indel every 9,669 bp
- → 1 homopolymer indel every 477 bp

Comparison with NovaSeq

- CCS mismatch rate is 17× lower than reads from NovaSeq
- CCS indel rate is 181× higher than reads from NovaSeq

— 2. GENOME ASSEMBLY WITH CCS

Haplotype-resolved diverse human genomes and integrated analysis of structural variation Ebert et al. *Science* April 2021

New methodology to produce fully phased diploid genome assemblies that combines :

- long-read PacBio
- Strand-seq Illumina

Methodology

- 1. generation of a non-haplotype-resolved clustered assembly
- 2. clustering of assembled contigs into "chromosome" clusters based on Strand-seq Illumina
- 3. calling of single-nucleotide variants (SNVs) relative to the clustered assembly
- 4. chromosome-wide phasing
- 5. tagging of input long reads by haplotype
- 6. phased genome assembly based on haplotagged long reads



64 ASSEMBLED HAPLOTYPES FROM 32 DIVERSE HUMAN GENOMES

- Comparison of these 32 Highly contiguous phased haplotype assemblies allows identification of :
 - 107,590 structural variants of which 68% not discovered by short-read sequencing
 - By contrast, analysis of 2,504 short-read sequenced genomes (1000GP) reported 69,000 SVs

— 3. GENOME ASSEMBLY WITH CCS

High-throughput, single-copy sequencing reveals SARS-CoV-2 spike variants coincident with mounting humoral immunity during acute COVID-19 Ko S.H. et al. *PLOS Pathogens* 2021

Study of intra-individual evolution of SARS-CoV-2 : standard sequencing yields single consensus sequence for each sample, rather than multiple sequences representing virus quasispecies diversity.



— 3. GENOME ASSEMBLY WITH CCS



27,356 Nucleotide positions (WA-1) Amino acid changes 215 8 NTD RBD F 3a E м 6 HNN · · · ND · · · · HSTGTHTNSPRRARSVAST Т % of Sample consensus HNN · · · ND · · · · HSTGTHTNSPRRARSVAST single genomes NTD variant haplotypes NN · · · ND · · · · HSTGTHTNSPRRARSVAST HKN • • • ND • • • • HSTGTHTNSPRRARSVAST HNKLNYND · · · · HSTGTHTNSPRRARSVAS HNN • • • KD • • • • HSTGTHTNSPRRARS HNN • • • NH • • • • HSTGTHTNSPRRARS HNN · · · NN · · · · HSTGTHTNSPRRARSV/ HNN • • • NH • • • • HSTGTHTNSPRRARSVAS1 HNN · · · NDKLRSHSTGTHTNSPRRARSVAST HNN · · · ND · · · · RSTGTHTNSPRRARSVAST HNN · · · ND · · · · HRTGTHTNSPRRARSVAST HNN · · · ND · · · · HSKGTHTNSPRRARSVAST HNN · · · ND · · · · HSTRTHTNSPRRARSVAST F region variant haplotypes HNN · · · ND · · · · HSTG | HTNSPLRARSVAST HNN · · · ND · · · · HSTGTHTNSPRRARGVAST П Other haplotypes HNN · · · ND · · · · HSTGTHTNSPRRARSVAS HNN · · · ND · · · · HSTGTHTNSPRRARSVAST 0 10 20 30 40 50 С NTD mutations H69R N74K N99KLNY محصوف والاملا H245R 0000 S247R 0 0008 T259K 0 00 G261R N185K D215H/N Insertion KLRS T3071 K 200 N Furin site mutations 0 00 ∆TNSPRRARSVAS 2 R682L -------S686G 700 800 600 H655\ Φ Read count of consensus

Each sequence corresponds to a single viral genome

Ko S.H. et al. PLOS Pathogens 2021

cDNA SEQUENCING

Hybrid full-length transcriptome in metastatic ovarian cancer Jing et al. *Oncogene* 2019



Long-read full-length transcriptome analysis :

• improves molecular diagnostic

SINGLE CELL PacBio cDNA SEQUENCING

Altered cell and RNA isoform diversity in aging Down syndrome brains Palmer et al. PNAS Aug. 2021

Down syndrome (trisomy 21) :

- single-nucleus long read RNA sequencing
- >170,000 cells from 29 aging DS and control brains •





from Fusberg et al. Nature Methods (2010)

Detection of 5mA with strong influence of sequence contexts : requires high coverage

Feng et al. PLOS Comput Biol (2013)

DETECTION OF DNA m6A WITH CCS

Single-molecule regulatory architectures captured by chromatin fiber sequencing Stergachis et al. *Science* (2020)



DETECTION OF DNA m6A WITH CCS

Single-molecule regulatory architectures captured by chromatin fiber sequencing Stergachis et al. *Science* (2020)



Next Generation Sequencing





BASIC CONCEPTS



SEQUENCING PROCESS

SEQUENCING









PromethION : 144000 pores (48 x 3000)

- BASE CALLING



- SIZE OF SEQUENCED DNA FRAGMENTS

"Ultra long" reads (lab.loman.net, March 2017)



- READ QUALITY



Recent improvements: "Two readers" nanopore

"One-reader" pore has difficulty to read homopolymers



New pore accurately calls homopolymers

- A pore with a longer or multiple "readers" has more bases dominating the signal
- Longer homopolymers are "seen" by the pore and can be decoded with high accuracy

The Q20+ chemistry enables users to generate raw read sequencing data to an accuracy greater than Q20 (99%+)



— 1 - GENOME ASSEMBLY WITH NANOPORE

Linear Assembly of a Human Y Centromere using Nanopore Long Reads Jain et al., *bioRxiv*, 2017



2 - GENOME ASSEMBLY WITH NANOPORE

Telomere-to-telomere gapless chromosomes of banana using nanopore sequencing Belser et al. *Communications Biology* Sept 2021

- haploid genome :
 - ~500 Mbp,
 - 11 chromosomes:
- 3 samples of reads:
 - 177X of all reads
 - 30X of the longest reads
 - 30X of the Filtlong highest-score reads
- assembler: NECAT11,
- 124 contigs polished with:
 - Racon (nanopore reads)
 - Medaka (nanopore reads)
 - Hapo-G (Illumina reads) : incorporates phasing information (Aury & Istace, NAR Apr. 2021)
- Bionano:
 - validate order and orient the contigs:
 - all contigs but 1 in accordance with optical maps
- 5 chromosomes reconstructed telomere to telomere
- reveal centromeres, clusters of paralogous genes
- Ex. : in previous versions : 130 5S rDNA genes
- New version : 7696 rDNA genes



Fine structure of repeated elements

3 - GENOME ASSEMBLY WITH NANOPORE

Long-read and chromosome-scale assembly of the hexaploid wheat genome Aury et al., *bioRxiv*, Aug 2021

- First hexaploid wheat genome based on ONT long-reads
- hexaploid genome (15.5 Gb)
- sequencing began in 2005 : International Wheat Genome Sequencing Consortium (IWGSC)
- first sequence in 2018
- This work:
 - ✓ organize contigs in chromosomes using:

ONT

- 20 ONT flow cells (2 MinION and 18 PromethION)
- produced 12M reads representing 1.1 Tb
- base calling: (i) guppy 2.0 and then guppy 3.6 (High Accuracy)
- coverage: 63x, N50: 24.6 kb
- 3.1M reads > 50 kb, coverage: 14x

Bionano Genomics (BNG) Saphyr

- direct Label and Stain Chemistry (DLS) with the DLE-1 enzyme
- total size: 14.9 Gb, N50: 37.5 Mb

Hi-C

- 4 Hi-C libraries, Arima Genomics protocol
- Illumina sequencing -> 537 Gb, 35x
- We used a sample of 240 million read pairs (72 Gb, 5x) to build a Hi-C map



- GENOME SEQUENCING : TARGETED NANOPORE SEQUENCING

Targeted nanopore sequencing with Cas9-guided adaptor ligation Gilpatrick et al. *Nature Biotechnology* April 2020



nCATS = nanopore Cas9-targeted sequencing : enrichment strategy using targeted cleavage of DNA to ligate adapters for nanopore

nCATS can simultaneously assess :

- haplotype-resolved single-nucleotide variants (SNVs)
- structural variations (SVs)
- CpG methylation...
- Best median sequencing coverage : 680 X
- nCATS uses only \sim 3 µg of genomic DNA + can target a large number of loci in a single reaction.

cDNA NANOPORE SEQUENCING

Dynamic nanopore long-read sequencing analysis of HIV-1 splicing events during the early steps of infection Quang et al. *Retrovorology* 2020

- 53 viral RNA isoforms, including 14 new ones
- Relative levels highly correlated with qPCR
- First dynamic picture of the cascade of events occurring between 12 and 24 h of viral infection
- -> importance of non-coding exons in viral RNA transcriptome regulation



NANOPORE and SINGLE CELL cDNA SEQUENCING

High-throughput targeted long-read single cell sequencing reveals the clonal and transcriptional landscape of lymphocytes Singh et al., *bioRxiv*, 2018

RAGE-seq (Repertoire And Gene Expression sequencing) : combines targeted long-read sequencing with short-read transcriptome of barcoded single cell libraries



NANOPORE and SINGLE CELL cDNA SEQUENCING

High-throughput targeted long-read single cell sequencing reveals the clonal and transcriptional landscape of lymphocytes Lebrigand et al., *Nature Communications*, 2020

ScNaUmi-seq : Single-cell Nanopore sequencing with UMIs (10x Genomics)

- High accuracy cellBC and UMI assignment
- Analysis of splicing and sequence variation at the single-cell level





DETECTION OF MODIFIED DNA BASES



- DETECTION OF MODIFIED DNA BASES : 5mCpG in CANCER GENOMES

Same-day genomic and epigenomic diagnosis of brain tumors (gliomas, medulloblastomas) with nanopore sequencing Euskirchen et al., *Acta Neuropathol.* (2017)





- point mutations
- CpG methylation profiling

Single device with negligible capital cost :

- outperforms hybridization-based and current sequencing technologies
- makes precision medicine possible for every cancer patient

DIRECT RNA SEQUENCING

Library preparation





- No PCR bias
- Quantitative



RNA spike in

Garalde et al. Nat. Methods 2018

DIRECT RNA SEQUENCING vs ILLUMINA



Sessegolo et al. Sci. Reports 2019

DIRECT RNA SEQUENCING: TRANSCRIPT HAPLOTYPE



DIRECT RNA SEQUENCING: DETECTION OF MODIFIED RNA

RNA modifications (> 150) play important roles in regulating RNA fate :

- RNA folding and structure
- base pairing
- recruitment of RNA-binding proteins
- can be dynamic and reversible

In mRNAs (translation, stability, splicing..)

- *6mA* most abundant and better characterized
- pseudoU

Also found in ncRNAs

- microRNAs (miRNAs)
- long non-coding RNAs (IncRNAs)
- circular RNAs (circRNAs)

Viral RNAs contain high levels of modifications (modulate virus cycle)

- HIV RNA rich in :
 - 6mA
 - 5mC
 - 2'O-methyl

- DIRECT RNA SEQUENCING: DETECTION OF m6A

Accurate detection of m6A RNA modifications in native RNA sequences Liu et al. *Nat. Comm.* 2019



- DIRECT RNA SEQUENCING : DETECTION OF pseudo-U

Detection of pseudouridine modifications and type I/II hypermodifications in human mRNAs using direct long-read sequencing. Tavakoli et al. *bioRxiv* Nov. 2021

Detection of pseudo-U sites

- U-to-C base-calling errors occur at pseudouridines
- benchmarked against sites previously identified
- Pipeline for direct identification, quantification, and detection of pseudouridine modifications and
- Controls :
 - 1000mer synthetic RNA with single pseudouridine in center position
 - U-to-C occurs at the site of pseudouridylation
- Discovery of human mRNAs with up to 7 unique sites of pseudouridine modification



- DIRECT RNA SEQUENCING : DETECTION OF pseudo U

Detection of pseudouridine modifications and type I/II hypermodifications in human mRNAs using direct long-read sequencing. Tavakoli et al. *bioRxiv* Nov. 2021





Recent advances : Nanopore and 10x Genomics Visium

The spatial landscape of gene expression isoforms in tissue sections Lebrigand et al., *bioRxiv*, 2020

Spatial Isoform Transcriptomics (SiT) : Genome-wide approach to explore and discover in a tissue context :

- Isoform expression (bi-allelic expression)
- Sequence heterogeneity (SNP expression)



- 2001: Celera Genomics and the International Human Genome Sequencing Consortium published their initial drafts of the human genome
- But, due to technological limitations, many other complex regions were left unfinished or incorrectly assembled for over 20 years
- \implies 8% of the genome
- T2T assembly : largest addition of new content to the human genome in the past 20 years

Main publications

- 1 The structure, function, and evolution of a complete human chromosome 8. Logsdon et al., *Nature*, May 2021
- 2 The complete sequence of a human genome. Nurk et al., *bioRxiv* May 2021
- 3 Chasing perfection: validation and polishing strategies for telomere-to-telomere genome assemblies. Cartney et al., *bioRxiv* July 2021

1 - The structure, function, and evolution of a complete human chromosome 8 Logsdon et al., *Nature*, May 2021

- Cell line : "complete hydatidiform mole" (CHM) derived from abnormal form of pregnancy
- Almost completely homozygous and therefore easier to assemble than heterozygous diploid genomes
- 20-fold sequence coverage of ONT ultra-long reads
- 32.4-fold coverage of PacBio HiFi



- 1 The structure, function, and evolution of a complete human chromosome 8 Logsdon et al., *Nature*, May 2021
- Barcoded Ultra-long Nanopore reads assembled into a scaffold
- Regions within the scaffold with high sequence identity with PacBio HiFi contigs are replaced, thereby improving the base accuracy to >99.99%.



- First complete linear assembly of a human autosomal chromosome.
- It resolves the sequence of five previously long-standing gaps :
 - 2.08 Mbp centromeric α-satellite array
 - 644 kbp defensin copy number polymorphism
 - 863 kbp variable number tandem repeat at chromosome 8q21.2 (neocentromere)
 - etc..

2 - The complete sequence of a human genome Nurk et al. *bioRxiv* May 2021

SEQUENCING

Strand-seq

•

Data were obtained with a "complete hydatidiform mole" (CHM13) cell line:

- 30× PacBio circular consensus sequencing (HiFi)
- 120× Oxford Nanopore ultra-long read sequencing (ONT)
- 100× Illumina PCR-Free sequencing
- 70× Illumina / Arima Genomics Hi-C (Hi-C)
- BioNano optical maps (11)



2 - The complete sequence of a human genome Nurk et al. *bioRxiv* May 2021

ASSEMBLY

- HiFi-based string graph constructed using a purpose-built method that combines components from
 - HiCanu
 - Miniasm
 - specialized graph processing



2 - The complete sequence of a human genome Nurk et al. *bioRxiv* May 2021



3 - Chasing perfection: validation and polishing strategies for telomere-to-telomere genome assemblies Cartney et al. *bioRxiv* July 2021

Recent Telomere-to-Telomere (T2T) human genome assembly

- this assembly has evidence of small errors and structural misassemblies
- polishing strategy :
 - ✓ Make corrections in large repeats without over-correction
 - ✓ Ultimately fixing 51% of errors and improving the assembly QV to 73.9
 - ✓ show sequencing biases in PacBio HiFi and ONT reads that cause errors that can be correcte



- ✓ replacing a total of 12,234,603 bp with 10,152,653 bp
- ✓ ultimately leading to the first complete human genome ever assembled

Summary

PacBio

- Maximum read length : 200 kb
- CCS sequencing (HiFI reads) :
 - Very low error rate, better genome assembly
 - Sequencing of cDNAs (resolution of alternative splicing)
 - Detection of modified DNA (6mA >> 5mC)
 - cDNA :
 - RNA-seq
 - Efficient for splicing isoforms detection

Nanopore

- Very light sequencing system
- Very long reads : maximum length >> 200 kb
- Detection of modified DNA (5mC >> 6mA)
- Direct sequencing of RNA :
 - Direct RNA sequencing :
 - RNA-seq
 - splicing isoforms detection
 - Detection of modified RNA (6mA, pseudo U)

<u>Conclusion</u> :

Whereas ultra-long nanopore sequencing excels at spanning long, identical repeats, HiFi sequencing excels at differentiating subtly diverged repeat copies or haplotypes

For large genomes, using these technologies simultaneously will likely improve the assembly



Remark

- ✓ Haplotype-resolved diverse human genomes and integrated analysis of structural variation Ebert et al. Science April 2021
 - 65 authors, 29 affiliations : 18 USA, 5 Germany, 2 Spain, 3 China, 1 UK
- ✓ The complete sequence of a human genome. Nurk et al. *bioRxiv* May 2021
 - 98 authors, 51 affiliations : 39 USA (68 authors), 5 Russia, 2 Germany, 2 UK, 1 Switzerland, 1 Croatia, 1 India
- Chasing perfection: validation and polishing strategies for telomere-to-telomere genome assemblies Cartney et al. *bioRxiv* July 2021
 - 20 authors, 14 affiliations : 10 USA, 1 Russia, 1 UK, 1 India, 1 Croatia